Law, Governance and Technology Series 5

# **Ephraim Nissan**

Computer Applications for Handling Legal Evidence, Police Investigation and Case Argumentation

Volume 1



## COMPUTER APPLICATIONS FOR HANDLING LEGAL EVIDENCE, POLICE INVESTIGATION AND CASE ARGUMENTATION

### VOLUME 5

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# COMPUTER APPLICATIONS FOR HANDLING LEGAL EVIDENCE, POLICE INVESTIGATION AND CASE ARGUMENTATION

by

Ephraim Nissan Goldsmiths' College, University of London, UK

> with a chapter by the VIRTOPSY team;

a chapter by Richard Leary;

sections by Jonathan Yovel; by John Zeleznikow with Andrew Stranieri and John Yearwood, or with Richard Leary and Wim Vandenberghe; by Louis Akin; and by Jeroen Keppens;

and sections co-authored by S. Eyal Shimony and E. Nissan; by Aldo Franco Dragoni and E. Nissan; and by Carmelo Asaro, E. Nissan, and Antonio A. Martino.

Foreword by John Zeleznikow



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This book is dedicated to the memory of Marco Somalvico (1941–2002). The thematic connection to the subject of this paper is provided by his encouragement – after a talk on ALIBI which as being his guest, I gave at my alma mater, the Technical University of Milan – to persist and further develop this direction of research, which on the evidence of the talk he considered very promising.<sup>1</sup> What I owe to Marco Somalvico is much more than that.<sup>2</sup>

<sup>&</sup>lt;sup>1</sup> The next step in my actual induction into the discipline of AI & Law was the warm reception that Prof. Antonio Martino gave a talk of mine on ALIBI in Lisbon in 1989. I had originally been thinking of it mainly as an AI planning system for the generation of explanations; the latter also still is a thriving area of research in artificial intelligence.

<sup>&</sup>lt;sup>2</sup> Cf. Nissan (2003i, 2007d); Colombetti, Gini, and Nissan (2007, 2008a, 2008b); Nissan, Gini, and Colombetti (2008 [2009], 2009a, 2009b).

# Foreword

As a thirteen year old boy, the only articles I would read were the sporting columns of Melbourne daily newspapers. My mother was exasperated, how could she get her son to read books. Then she hit upon an excellent idea – *may be he would read novels by Sherlock Holmes*.

From that day in 1963, I became a voracious reader of stories about Sherlock Holmes – not only the countless short stories and four long stories, but also anything the author of the Holmes' stories, Sir Arthur Conan Doyle had written. And my interest included books about other detectives (such as Poirot and Maigret) and related movies.

But despite my interest in detective stories, for the next thirty-seven years I did not exhibit any interest in forensic science.<sup>3</sup> Then, in late 2000, Colin Aitken, then a reader in statistics at the University of Edinburgh, offered me the position as research director of a new centre for forensic statistics and legal reasoning. Having accepted the exciting position, I needed to explore the domain of forensic statistics and legal reasoning. And what an exciting trip it was.

When I arrived at the University of Edinburgh, I realised that Sir Arthur Conan Doyle had been a medical student there. One of his professors was Dr. Joseph Bell, a forensic pathologist. Bell was the man who inspired the character of Sherlock Holmes and shared many qualities with the famous detective. Thus we opened the Joseph Bell Centre for Forensic Statistics and Legal Reasoning. Its remit was to analyse, evaluate, interpret and present evidence using the skills in artificial intelligence, law and statistics from the University of Edinburgh, Glasgow Caledonian University and the Lothian and Borders Police Force Forensic Science Laboratory. Our goal was to develop software for the mathematically sound and legally permissible interpretation of scientific evidence. Then we needed to communicate and represent this knowledge to lawyers and juries at the trial stage. This requires interactions between different agencies – many police forces, forensic science laboratories, procurators fiscal, judges, advocates and juries.

The first areas of research at the Joseph Bell Centre for Forensic Statistics and legal reasoning were:

<sup>&</sup>lt;sup>3</sup> As opposed to artificial intelligence for law (AI & Law).

- the definition and description of legal procedures for building a case based on evidence;
- the identification and application of mathematically acceptable techniques for interpreting and drawing conclusions from forensic evidence;
- the determination of the validity of conclusions drawn from analogous data or from a particular data sample;
- the investigation of the possibility of a common source for several samples of forensic significance;
- the identification and analysis of risk factors as part of the European anti-fraud initiative;
- the representation and implementation of all the above on a computer in an accessible format;
- the development of legal decision support systems.

The construction of such computer systems is a daunting task. Our initial approach has been to build small-scale knowledge-based systems in specific domains. Projects undertaken were:

- (1) the value of trace evidence in linking a scene to a suspect, or a scene to a scene;
- (2) the assessment of cross-transfer evidence;
- (3) protocols for determination of sample size in criminal investigations;
- (4) the reliability of eyewitness testimony;
- (5) the examination of trends in European financial fraud;
- (6) the role of statistical evidence in cases of suspected excess deaths in a medical context;
- (7) the role of statistical evidence in cases of suspected credit card fraud; and
- (8) the distinction between homicide, suicide and lawful deaths.

But the most daunting question was how could we integrate the vast multitude of knowledge required to undertake such a gigantic task. In his monumental book, *Computer Applications for Handling Legal Evidence, Police Investigation, and Case Argumentation,* Dr. Ephraim Nissan addresses this task. Rather than investigate biology, chemistry, law or statistics, Nissan focuses upon using computer techniques to organise the evidence and to enhance the analysis of forensic evidence. But even this is a major task, as can be seen by the size of his monograph.

Dr. Nissan's book of about one thousand three hundred pages investigates large areas of law, computer science, and some statistics, also addressing topics in the forensic disciplines, but mostly leaving the significant biological and forensic science topics to other treatises. See however the important Chapter 9 by the VIRTOPSY team in Bern. As Dr. Nissan states in his preface, his book provides an overview of computer techniques and tools for handling legal evidence, police intelligence, crime analysis or detection, and forensic testing, as well as investigating the modelling of argumentation and narratives. Whilst, over the past decade, there have been numerous publications discussing how computers can be used to evaluate legal

evidence, Dr. Nissan's monograph is the first book to attempt this task. We are very grateful for the monumental book he has produced.

Dr. Nissan commences by investigating how one can reason with evidence. He looks at both logical and statistical models for modelling evidence and conducts an in depth investigation of his ALIBI system and Paul Thagard's work on the Claus von Bülow Trials, using ECHO, a Coherence Network, and Bayesian networks. He also informs readers about the Bayesian controversy among legal scholars. Becoming aware of the arguments put forth by Ron Allen is crucial, for readers entering the field covered by this book, whether one sides with the Bayesians, or accepts the critique. It is important to realise the reference-class problem, itself a source of disagreement among forensic statisticians.

Chapter 3 involves a detailed investigation of argumentation. Argumentation has been used in knowledge engineering in two distinct ways; with a focus on the use of argumentation to structure knowledge (i.e. non-dialectical emphasis) and with a focus on the use of argumentation to model discourse (i.e. dialectical emphasis). Dialectical approaches typically automate the construction of an argument and counter arguments normally with the use of a non-monotonic logic where operators are defined to implement discursive primitives such as *attack, rebut*, or *accept*.

In applications of argumentation to model dialectical reasoning, argumentation is used specifically to model discourse and only indirectly used to structure knowledge. The concepts of conflict and of argument preferences map directly onto a discursive situation where participants are engaged in dispute. In contrast, many uses of argumentation for knowledge engineering application do not model discourse. This corresponds more closely to a non-dialectical perspective. The analysis of argument advanced by Toulmin (1958) does not distinguish dialectical argumentation from non-dialectical argumentation. By illustrating that logic can be viewed as a kind of generalised jurisprudence rather than as a science, Toulmin (1958) advanced a structure of rhetoric that captures the layout of arguments. Jurisprudence focuses attention on procedures by which legal claims are advanced and attacked. Toulmin (1958) sought to identify procedures by which any claim is advanced. He identified a layout of arguments that was constant regardless of the content of the argument.

As well as the important argumentation theory of Toulmin, Dr. Nissan also devotes as much attention to the early work of analysis evidence of John Henry Wigmore. Wigmore developed a graphical method for evidence analysis. Wigmore's evidence rules are still used by many U.S. courts. His graphical method is used by some scholars, such as Dave Schum, Terence Anderson, and William Twining. Dr. Nissan also considers the argumentation schemes of Doug Walton, Katia Sycara (Persuader) and Tom Gordon (Carneades). Chapter 5 discusses in detail the related topic of narratives, considering what artificial intelligence offers for their treatment, as well as related legal scholarship.

Chapter 4 involves a lengthy examination of appropriate decision support systems (it concludes with a section about relevance and formalism, by Jonathan Yovel). As Oatley, Ewart and Zeleznikow (2006) say 'there exists very little literature about predictive models for police decision support'. Early work included the use of neural networks for the prediction of repeat victimisation (Oatley et al., 2002). This research predicted the occurrence of the next crime, and the expected time interval for this perpetration. The best neural network models trained on this data for predicting the next crime achieved an average performance, and it was impossible to find a neural network model for predicting the time interval without either obvious over-training, or extremely poor performance and it is unfortunate that in that earlier study there was no time to use a dataset where the time intervals were not left as single point values.

Until recently, very few computer systems have attempted to make decisions using evidence sources. Tillers and Schum (1998) and Schum (1994) discussed Wigmore's pioneering approach (Wigmore, 1913) to proof in litigation. Wigmore's method of diagramming the body of evidence in a case is the central method behind Walton's (2002) treatise on legal argumentation and evidence. Schum and Tillers (1991) examined marshalling legal evidence. Kadane and Schum (1996) used probability and Wigmore's diagrams of evidence to analyse the trial of the American anarchists Sacco and Vanzetti.<sup>4</sup> There is a controversy about Bayesianism in law. It should not be ignored. Some applications are less controversial; these are not about the judicial decision, or about strength claimed for the evidence in court, but rather for costs/benefits analysis, for the prosecutor to evaluate whether to prosecute, and for subservient tasks that do not affect the evaluation of the evidence (e.g., statistics inside tools for data mining is unlikely to be controversial among legal scholars). The real challenge for the application of artificial intelligence to legal evidence is to produce accounts of plausibility (ones that would take into account narrative coherence) that would not be the irritant that Bayesian accounts are within legal scholarship of evidence.

Various techniques have been used to construct criminal investigation decision support systems. Statistics has been used to analyse evidence (Aitken, 1995; Schum, 1994). Areas investigated include DNA testing, fingerprints, footwear and ballistics.

Chapter 6 involves a very thorough examination of crime data mining. In investigating the topic, Oatley, Ewart, and Zeleznikow stated (2006, p. 24):

In 2003/2004, approximately 5.9 million crimes were notified to 43 Police Services in England and Wales. Property crimes such as theft and burglary account for 78% of recorded crimes and over 430,000 (14%) of these involve the burglary of a domestic dwelling.

Once notified, the Police must investigate. Sometimes this will constitute only the recording of the details of the offence from the victim. More often, the investigation will comprise a detailed examination of the crime scene, the collection of forensic material and recording of witness and victim statements. This level of process is not just reserved for serious crimes, but is routine practice even for relatively minor ones.

It is apparent that regardless of the level of investigation, a single recorded crime will generate a considerable amount and diversity of information. The challenge is not only to

<sup>&</sup>lt;sup>4</sup> Combining Bayesianism and Wigmore Charts is also what is done in Dawid, Hepler, and Schum's (2011) "Inference Networks: Bayes and Wigmore". Also see Hepler et al. (2007).

store this information, but to use it to facilitate the investigative process. The features of one case at a particular point in time may have little value but the ability to retrospectively interrogate such a comprehensive crime database is a powerful investigative tool.

The value of this technological challenge is best understood through considering the task of the investigator. In general terms, it is worth noting that the detection of crime in many Police Services will involve not just Police Officers, but civilian crime analysts and scene of crimes officers (SOCOs). In respect of crime detection, Canter (2000) describes the nature of forensic decision making. It is how the investigators draw inferences and conclusions from the data they have available in order to embark upon the most appropriate way forward in order to identify and prosecute the culprit.

However, there is an established literature on the problems of information processing and inference that may beset human decision making. It should be evident that decision making with the forensic domain is problematic. This may be a contributory factor in the detection rate for a volume crime such as burglary is as low as 13% of recorded incidents.

Computer Science methodologies have the ability to select and display such information to the investigator. In this way, the salience of crime features is revealed. These are aspects of the crime which have most potential to assist the investigation in a number of ways, including the identification of crime patterns, linking offences and the identification of suspects.

Chapter 7, by Richard Leary, is about the FLINTS software for link analysis. That chapter enables a closer look at one of the kinds of tools that were discussed in Chapter 6. Chapter 8 looks at forensic techniques. Here and elsewhere in the book, one finds coverage of work by my former colleagues at the Joseph Bell Centre for Forensic Statistics and Legal Reasoning. Chapter 8 begins with coverage of research by Jeroen Keppens into the use of model based reasoning to evaluate possible scenarios at crime scenes, whilst a section inside Chapter 4 is concerned with Michael Bromby's ADVOKATE, a system developed to evaluate eye-witness identification. Chapter 8 also discusses the contexts of processing human faces, such as the generation of facial composites. A number of forensic disciplines are covered more concisely, before discussing fingerprint research more extensively. Controversies concerning both fingerprints and DNA are mentioned. Chapter 9 is about virtual autopsies by means of computer imaging, and was authored by a team in Bern.

Dr. Nissan's treatise offers a panoramic view of topics, techniques and tools. It is understandable to forensic scientists, statisticians and practitioners of Artificial Intelligence and Computer Science. Also legal scholars and practitioners will be interested. So will an audience within police science. Appropriate tools for legal professionals and law enforcement agencies are investigated in detail.

In order to deal with hypotheses, representations and tools for the organisation of arguments are useful; therefore research into argumentation is cited, and argumentation tools or methods that are useful for reasoning about the evidence are surveyed. The final part of the book is devoted to data mining and to a variety of forensic techniques. There is a useful glossary (a few of the entries are like brief sections providing additional discussion), and of course the bibliography is very large.

Dr. Nissan has compiled a monumental book. I strongly commend it as a book to be both read and referenced.

Melbourne, Victoria, Australia

John Zeleznikow

# Acknowledgements

I am grateful to Ron Allen, Peter Tillers, and Bernard Jackson for specific comments on earlier drafts, to two extremely perceptive anonymous referees of the book the way it was submitted, as well as to an anonymous referee (of a related work) who provided a useful critique from the Bayesian camp (even though I have been trying to be neutral in the Bayesianism controversy among legal scholars or forensic statisticians). I am grateful to John Zeleznikow for sustained encouragement in this project, to Lars Ebert and his co-authors from the VIRTOPSY project in Bern, and to Richard Leary, to Jonathan Yovel, to John Zeleznikow, Andrew Stranieri, John Yearwood, and Wim Vanderberghe, to Louis Akin, and to Jeroen Keppens for their respective efforts in contributing to this volume the texts that appear under their names. Moreover, one of the sections in this book appears under Solomon Eyal Shimony's and my own names, the result of fruitful collaboration years ago. Another section is jointly authored by Aldo Franco Dragoni and myself, also based on a joint project of ours. The section on DAEDALUS, a tool developed by Carmelo Àsaro, is partly based on previous work I co-authored with him and Antonio Martino.

Charlie Frowd kindly provided an explanation about EvoFIT, as well as two screenshots reproduced in this book. Deirdre Hogan of Aprilage in Toronto kindly provided images generated by their age-progression software. Moreover, my gratitude goes to Laurance Donnelly and Alastair Ruffell, for enabling me to find out more about forensic geology. "Polo" Chau, his team leader Christos Faloutsos, and the latter's executive assistant Marilyn Walgora from Carnegie Mellon University generously enabled the reproduction of several images describing the team's NetProbe and Polonium systems. Louis Akin, a crime scene analyst from Austin, Texas, contributed a brief section, as well as several photographs. Richard Leary's chapter also comprises photographs from crime scene analysis, as well as many screenshots of the software he describes. From Milan, Mario Arrigoni Neri of Nova Semantics kindly drew a graph expressly for this book; it appears as Figure 6.1.7.3.2, and is intended in order to clarify a detail from a screenshot from software of his, appearing as 6.1.7.3.1 (for the permission to reproduce this, I also thank Marco Colombetti).

John Zeleznikow wrote the Foreword. Others provided encouraging comments on drafts. As to co-investigators, I am especially grateful to Aldo Franco Dragoni and Eyal Shimony: I present some of the results of joint research with each in turn, previously published as articles. The section about *Daedalus* is mostly based on Asaro, Martino, and Nissan (2001), and is indebted to Carmelo Àsaro's input to that article of ours, apart from *Daedalus* having been programmed by Judge Asaro himself, and all screen snapshots in that section having been made by him. Much reading went into the making of this book, but in particular, reading an excellent book by Jesús Mena (2003) gave me an idea not of replication, but of how to arrange the presentation in my chapter on data mining for criminal investigation or intelligence. Amina Memon's course handouts at her website helped me to better understand how to present the literature about eyewitness psychology.

Attending the workshop on Archaeology and Forensic Science, held at the British Academy in London on 27 February 2007, was very useful. Prof. Aron Vecht's explanations about the chemistry of a forensic application are gratefully acknowledged. Over the years, contacts with other scholars have helped me to improve specific parts of this book as it was taking shape. They include forensic geologists Laurance Donnelly and Alastair Ruffell, as well as Jeimy Cano, whose field of expertise is digital anti-forensics. I gratefully acknowledge extensive help from Mrs. Ann Aldridge, at the Inter-Library Loans Department of the Library at Goldsmiths' College of the University of London. Besides, I am grateful to Yaakov HaCohen-Kerner in Jerusalem for signalling to me a few articles.

Within my own family, this work would not have been possible without my mother's patience and abnegation. Words could not capture a "thank you" big enough. On one dramatic occasion in the early second century C.E., the renowned Rabbi Akiva, in fortuitous circumstances when coming home, introduced to his many pupils the lady to whom, rather than to him – he acknowledged – they owed what he had been able to teach them.<sup>5</sup>

On a very different plane, I acknowledge with gratitude the patience of Nachum Dershowitz, the joint editor with me of a jubilee volume, also published with Springer: that other project, also in its very final phases, had to queue as this one was getting its final touches. Eamonn Martin, a technician, recovered my file system in early 2011, when for weeks it wasn't clear whether the files of this and other projects were affected, which would have required reconstituting much of the work.

At Springer in Dordrecht in the Netherlands, my thanks go to Neil Olivier and Diana Nijenhuijzen. My contacts were initially especially with the former, and afterwards especially with the latter. Their role and patient support have been crucial in respectively the earlier phase and final phase of the process of getting this book accepted and then into shape. At Integra in Pondicherry in India, I thank Manoj

<sup>&</sup>lt;sup>5</sup> There is no reason not to start giving proper citations already in the Acknowledgement section. Accounts of that episode were given in both the *Babylonian Talmud* (in two of its tractates: *Ketubbot* 62b; *Nedarim* 50a; cf. *Shabbat* 59a–b), and the *Jerusalem Talmud* (again, in two tractates: *Shabbat* 6:1, 7d; and *Sotah* 9:15, 24c), as well as in *Avot de-Rabbi Nathan* (in Version A, chapter 6, and in Version B, chapter 12). See however Tal Ilan's (2005) summary of current scholarly interpretations of that story.

Raju, Sangeetha Sathiamurthy, and Gandhimathi Ganesan, who in turn were assiduously in contact with me, during the quite demanding production process. There surely also were, among the typesetters, (to me) anonymous clever hands for whom I do not have a name by which to thank them.

Many persons have contributed to this book, and I had the benefit of advice from several scholars; I am responsible for any conceptual imperfections which remain in this work. Between the undertaking of this writing project, and the submission of the revised manuscript of over 1,500 pages in large type in late May, early June 2011, five years had elapsed. In January and February I was blocked by a computer crash, and it wasn't until February that I was relieved to hear that my file system could be recovered. Even after the recovery, large Word files with many figures belonging to my other writing projects, and which I was checking upon recovery, kept crashing at the press of the 'Save' button, and had to be recovered again from the burnt computer.

Miraculously I would say, the huge file of this book was recovered in good shape, and augmenting it (imagine the apprehension) did not result in the file being damaged by further crashes, even though separate small files had to be provided afterwards, especially footnotes. Needless to say, Since the recovery from the crash I was keeping backups of this book's main file on a very frequent basis. During the autumn of 2011, upon the instructions from the typesetters, I had to redraw many of the figures of this book, to ensure better reproduction. Then during the winter until the early spring, my task of correcting the proofs and providing index entries was very exacting, more exacting than any proof correction I had ever done in decades. It swallowed a huge amount of work in daylight and by night, on occasion into the little hours of the morning.

Come March, I only allowed the festival of Purim the half hour it took me to read aloud the Scroll of Esther in the original Hebrew with the traditional cantillation, as customarily required, and meanwhile, the huge reams of paper never left my kitchen table, except on Friday late afternoons for the entry of the Sabbath (in which case they remained stacked away until the end of the same). On the day after (the normatively joyful festival of) Purim, I was chagrined to find in an email that I was sternly given one more week with weekends at both ends to complete this project. Hardly the 'Thank you' I expected. Even though I tried to obtain a reprieve (a futile attempt), the correction process being curtailed means that typos or instances of misformatting from Chapter 6 to Chapter 9 and beyond (in the Glossary and Bibliography) could not be as thoroughly eliminated as from Chapters 1 to 5 and 10. I beg the benevolence and leniency of the reader for such typos and perhaps instances of misformatting that are left. At least, I hope I managed to catch broken cross-references. Meanwhile, a jubilee volume I had to complete for the Berlin offices of Springer had to wait one year, and I am thankful to my joint editor in that other project, to its many authors, and to the Jubilaris of that book for their patience.

Admittedly, the scope of the book you are now reading is very wide, so ideally there should have been more than one author; the participation of other authors for specific topics responds to this need. Even though the book is large, there still are various things that could be fleshed out. I have tried to take on board all the advice I was given, within the timescales that this publication project required. Citations could be even more numerous, and the field keeps growing.

Along with the detailed, four-level table of contents, and with the cross-references in many of the entries of the Glossary, also this Subject Index is an important point of entry for accessing information in this book. Making it so detailed was indispensable. A thorough, detailed index is a crucial need for very long books with a broad scope such as this one. The rule of adequacy of the indexing is a linear function,<sup>6</sup> not a constant proportion: the longer the book, the more a thorough subject index becomes absolutely indispensable (obviously, also depending upon the kind of the book: a telephone directory needs no indexing...).<sup>7</sup>

The indexing of Chapters 2 to 5 is especially meticulous. Had I been allowed more time, I would have indexed as thoroughly – which was my intention to do also Chapter 6 (the longest of this book: it takes about 200 pages), and Chapter 8. Hopefully also the indexing of Chapters 6 to 9 will be found to be adequate by the benevolent reader. Some sketchy indexing is also provided for the Glossary. Even just browsing the Subject Index will hopefully awaken the curiosity of those giving it a try. Try 'Forest spotted owlet', 'Walrus', and 'Whale'. Or then try and 'Footwear'. What do they do in an AI & Law book? Check in the index, to find out.

<sup>&</sup>lt;sup>6</sup> The general formula y = a + bx expresses a linear function. Let y be the percentage of a book length to be allocated to adequate indexing.

<sup>&</sup>lt;sup>7</sup> The formula y = 0 + 0x expresses the particular case of a phone directory.

# Contents

### Volume 1

1	A Preliminary Historical Perspective				
2	Models of Forming an Opinion				13
	2.1		• •	ators' Shifts of Opinion	13
		2.1.1		ries	13
		2.1.2	Distribute	ed Belief Revision for Modelling	
			the Dyna	mics of Adjudicators' Opinion	16
			by Ald	o Franco Dragoni and Ephraim Nissan	
		2.1.3	Further C	Considerations, and Suggestions	
			of Possib	le Refinements	26
		2.1.4	Devices of	of Manipulation of Incoming	
			Informati	on in Court	28
		2.1.5	Remarks	About Procedures and Jurisdictions	29
		2.1.6	A Taxono	my of Quantitative Models	31
		2.1.7	An Exces	sive Focus on Juries?	36
	2.2			Charge and Explanations: Seminal	
		Tools fi	rom the Late	e 1980s and Their Aftermath	39
		2.2.1	ECHO, a	nd PEIRCE's Remake of the Peyer Case	39
			2.2.1.1	Thagard's 1989 Simulation of the	
				Jury at the Peyer Case	39
			2.2.1.2	Thagard's Principles of	
				Explanatory Coherence	40
			2.2.1.3	Thagard's Neural Network	
				Algorithm in ECHO	41
			2.2.1.4	Thagard's Greedy Algorithm for	
				Simulating a Trial	43
			2.2.1.5	Josephson's Abducer, PEIRCE-IGTT	44
			2.2.1.6	Abductive Reasoning, and	
				Inference to the Best Explanation	47
			2.2.1.7	The von Bülow Trials	49

		2.2.1.8	Thagard's Treatment of the von				
			Bülow Trials: Using ECHO				
			and a Coherence Network, vs.				
			Producing a Bayesian Network				
			with JavaBayes	51			
	2.2.2	ALIBI, a	Planner for Exoneration	53			
		2.2.2.1	1989: An Annus Mirabilis?	53			
		2.2.2.2	Workings and Structure of ALIBI	54			
		2.2.2.3	Examples of ALIBI's Output	57			
		2.2.2.4	Knowledge Representation in ALIBI	61			
		2.2.2.5	An Illustration of the Conceptual				
			Factors Involved in Common				
			Sense About the Jeweller's Example	69			
		2.2.2.6	An Afterlife of Some ALIBI Sessions	75			
		2.2.2.7	Extension with the Dramatis				
			Personae Approach	79			
		2.2.2.8	Wells and Olson's Taxonomy of Alibis	95			
2.3	A Quic	k Survey of	Some Bayesian and Naive Bayesian				
			·	99			
	by A	ndrew Stran	ieri and John Zeleznikow				
	2.3.1		ng Concepts	99			
	2.3.2		plications in Law	104			
2.4	The Co		oncerning the Probabilistic Account				
				107			
2.5			of Some Probabilistic Applications	111			
	2.5.1	5.1 Poole's Independent Choice Logic and					
		Reasonin	g About Accounts of a Crime	111			
	2.5.2	Dynamic	Uncertain Inference Concerning				
		Criminal	Cases, and Snow and Belis's				
		Recursive	e Multidimensional Scoring	115			
2.6	Kappa	Calculus in	the Service of Legal Evidence	117			
	by So	olomon Eya	l Shimony and Ephraim Nissan				
	2.6.1	Prelimina	ary Considerations	117			
	2.6.2	A Review	v of Åqvist's Scheme	119			
	2.6.3	A Review	v of Kappa Calculus	120			
	2.6.4	A Compa	arison of the Schemes	121			
		2.6.4.1	Equivalence of Kappa-Calculus to				
			Grading Mechanisms	121			
		2.6.4.2	Reintroducing the Probabilities	124			
	2.6.5		d Solution	125			
	2.6.6	Contextu	al Assessment of the Method	126			
	2.6.7	An Appli	cation to Relative Plausibility?				
		Consider	ations About a Role for the Formalism	126			

3	Argu	mentation	ι		129	
	3.1	Types of	f Arguments		129	
	3.2	Wigmore Charts vs. Toulmin Structure for Representing				
		Relatior	ns Among A	rguments	130	
		3.2.1		ries	130	
		3.2.2		ion of Wigmore Charts	132	
		3.2.3		rean Analysis of an Example	133	
			3.2.3.1	The Case, the Propositions, and		
				the Wigmore Chart	133	
			3.2.3.2	Considerations About the		
				Situation at Hand	136	
		3.2.4	Another E	Example: An Embarrassing Situation		
					137	
			3.2.4.1	An Episode During a Trial	137	
			3.2.4.2	The Propositions and Their		
				Wigmore Charts	139	
	3.3	Pollock	's Inference	Graphs and Degrees of Justification	146	
	3.4	Beliefs			149	
		3.4.1		Some Artificial Intelligence Systems	149	
		3.4.2		nal Beliefs vs. Dispositions to Believe	152	
		3.4.3	Common	Knowledge, and Consequentialism	153	
		3.4.4		ent vs. Belief: Walton's Approach	154	
			3.4.4.1	The Problem of Recognising		
				Belief, Based on Commitment	154	
			3.4.4.2	Walton's Argument Schemes and		
				Critical Questions for Argument		
				from Commitment	156	
			3.4.4.3	Walton's Argument Scheme and		
				Critical Questions for Telling		
				Out Belief Based on Commitment	157	
			3.4.4.4	Another Approach to Critical Questions .	159	
	3.5	Argume	ents in PERS	UADER	161	
	3.6	Represe	nting Argun	nents in <i>Carneades</i>	164	
		3.6.1	Carneade	$s$ vs. Toulmin $\ldots$ $\ldots$ $\ldots$ $\ldots$ $\ldots$ $\ldots$	164	
		3.6.2	Proof Star	ndards in <i>Carneades</i>	165	
		3.6.3	The Notat	ion of <i>Carneades</i>	165	
	3.7	Some C	omputer Too	ols that Handle Argumentation	166	
	3.8	Four La	yers of Lega	l Arguments	168	
	3.9			erature on Computational Models		
		of Argu	mentation .		169	
		3.9.1	Within AI	& Law	169	
		3.9.2	Within Ot	her Research Communities	171	
	3.10	Comput		els of Legal Argumentation About Evidence	174	
		3.10.1		ly and Ongoing Research	174	
		3.10.2	Stevie		176	

3.11 Argumentation for Dialectical Situations,							
	vs. for Structuring Knowledge Non-dialectically,						
		and an I	ntegration o	f the Two	177		
		by Ar	ndrew Strani	eri, John Zeleznikow, and John Yearwood			
		3.11.1		egories of Concepts Grouping			
				of Argumentation	177		
		3.11.2		Toulmin Argument Structure,			
				neric Actual Argument Model	178		
		3.11.3		l vs. Non-Dialectical Argumentation	179		
		3.11.4		of Toulmin's Structure	181		
		5.11.7	3.11.4.1	Johnson's Variation of the	101		
			5.11.4.1	Toulmin Layout	183		
			3.11.4.2	The Freeman and Farley Variation	105		
			5.11.4.2	on Toulmin Warrants	184		
			2 1 1 4 2		164		
			3.11.4.3	Bench-Capon's Variation of the	106		
			2 1 1 4 4	Toulmin Layout	186		
			3.11.4.4	Considerations Concerning	107		
			. ~ .	Toulmin Variations	187		
		3.11.5		e Non-dialectical Model of			
			Argumentation: The Generic Actual Argument				
				AAM)	187		
			3.11.5.1	The Argument Template	187		
			3.11.5.2	Discussion	191		
			3.11.5.3	Representing Actual Arguments	192		
		3.11.6	Applicatio	ons of the Generic/Actual Argument Model.	195		
			3.11.6.1	The Split Up System for			
				Negotiating a Divorce	195		
			3.11.6.2	The Embrace System for			
				Assessing Refugee Status	200		
			3.11.6.3	The GetAid System for Legal Aid			
				Eligibility	202		
			3.11.6.4		203		
		3.11.7	Envoi		205		
4	C				207		
4	-			or Insights into, Organisational Aspects	207		
	4.1	-	-	Organising	207		
		4.1.1		l-Support Systems for Organising	• • •		
				nce: CaseNote, MarshalPlan, Daedalus	207		
		4.1.2		Procedure	210		
		4.1.3		a Procedural-Support Tool for the			
				amining Magistrate and Prosecutor	212		
			by Carn	nelo Asaro, Ephraim Nissan,			
			and Ant	onio A. Martino			
			4.1.3.1	Background of the Project, and Its Users .	212		
			4.1.3.2	General Remarks About Italian			
				Procedural Law	213		

		4.1.3.3	The Phases of an Inquiry in Italy	215
		4.1.3.4	The Criteria of an Inquiry	218
		4.1.3.5	Once the Decision to Prosecute is Taken .	221
		4.1.3.6	A Sample Session: The Bindi	
			Extortion Case	222
		4.1.3.7	Effects of the Jurisdiction:	
			Why Is Daedalus' Emphasis	
			on Step-by-Step Validation So	
			Important in Italy? And Why	
			Is the Statute of Limitations So	
			Important in <i>Itaca</i> ?	236
			by Ephraim Nissan	
		4.1.3.8	Further Considerations About	
			Daedalus, and About Select	
			Aspects of the Human Process It Subserves	237
			by Ephraim Nissan	
4.2	On Som	e Criminal Ju	istice Information Systems	
				239
	4.2.1		Decision Support, vs. Tools	
			ng a Procedure	239
	4.2.2		o High Data Concentration	240
	4.2.3		om User Communities,	
			estowed from Above	241
	4.2.4		New Cases, and Using the Former	
			er	243
	4.2.5	Prosecutori	al Discretion and Judicial Discretion	246
4.3	Evaluati	ng Costs and	Benefits	249
	4.3.1	Evaluating	Costs and Benefits	
		While Prep	aring a Case	249
		4.3.1.1	Ways Economics and Evidence	
			Meet: The Rules of Evidence in	
			Terms of Economic Rationality	249
		4.3.1.2	Alvin Goldman's Concept of	
			Epistemic Paternalism	250
		4.3.1.3	The Litigation Risk Analysis Method	252
		4.3.1.4	Bargaining, and Game Theory	253
	4.3.2	Evaluating	the Effects of Obtaining	
		or Renound	ring a Piece of Evidence	255
	4.3.3	Benefits, C	osts, and Dangers of Argumentation	256
	4.3.4	Costs and E	Benefits of Digital Forensic Investigations .	260
4.4	ADVO	KATE, and As	ssessing Eyewitness Suitability	
	and Rel	iability		263
	4.4.1	The Turnbu		263
	4.4.2	The ADVO	KATE Project	266
	4.4.3		axonomies of Factors	270

	4.5	Policing: Organisational Aspects of Intelligence,			
		and the	Handling of	f Suspects	273
		4.5.1	Organisat	tional Problems of Police Intelligence	
			Systems		273
		4.5.2	Handling	the Suspects: Equipment,	
			Techniqu	es, and Crucial Problems	281
			4.5.2.1	Polygraph Tests: A Deeply	
				Controversial Tool	281
			4.5.2.2	A Caution Against Unquestioned	
				Assumptions: A Digression	
				on Juridic Cultures and	
				the Evidentiary Value of	
				Self-Incriminating Confessions	287
			4.5.2.3	Computerised Identity Parades (Lineups) .	290
	4.6	Releva	nce		298
		4.6.1	Definition	ns	298
		4.6.2	Legal For	rmalism, Artificial Intelligence	
			and the Ir	ndeterminacy of Relevance	301
			by Jon	athan Yovel	
			4.6.2.1	Relevance, Within Law as Being a	
				System for Processing Information	301
			4.6.2.2	Relevance: Why It Is Difficult for	
				Formal Systems	302
			4.6.2.3	Relevance and Legal Formalism	305
			4.6.2.4	Relevance, Evidence and Beyond:	
				Three Theoretical Approaches	308
			4.6.2.5	Considerations About Applying	
				Relevance Logic	314
			4.6.2.6	A Refutation of the Argument	
				from the Distinction Between	
				Relevance and Admissibility	315
			4.6.2.7	Conclusion of the Section About	
				Relevance	316
		4.6.3	Relevanc	e Logic	317
			4.6.3.1	A Gentle Introduction to the Main	
				Concepts	317
			4.6.3.2	Any Potential for Application in	
				Automated Tools for Law?	321
5	The l	Varrative	Dimension		323
5	5.1				323
	5.1	5.1.1		Varrative Plausibility: Preliminaries	323
		5.1.2		to Narratives from the "New	525
		5.1.2		Scholarship"	324
		5.1.3		Ind Generalisations	328
		5.1.4	0	act of Modes of Communication	334
		U.T. I	ine impo	et et integes et communication	<i>J J T</i>

	5.1.5	Pitfalls to	Avoid: There Is No Shortcut				
		for the Pr	actically Minded, and No Alternative				
		to Readin	g the Legal Literature on Evidence	335			
5.2	An Ove	An Overview of Artificial Intelligence Approaches					
	to Narra	tives		336			
	5.2.1	What Is in	n a Narrative?	336			
	5.2.2	A Fable	Gone Awry: An Example				
			Generation with TALE-SPIN	337			
	5.2.3	A Few Ch	nallenges	339			
	5.2.4		of Reconstructing the Facts	342			
	5.2.5		-Driven vs. Goal-Driven Processing				
		of Stories	Propp's Precedent	344			
	5.2.6		ot Simplify the 1970s: A More				
		Populated	Pool of Approaches, and More				
			Distinctions	349			
	5.2.7		mputational Narrative Processing				
			rom the 1970s, 1980s, 1990s, and Later	351			
	5.2.8		Acts in the Conceptual Dependency				
			1	357			
	5.2.9		Goals, Plans, MOPs, and TAUs				
		in the Co	nceptual Dependency Approach	358			
		5.2.9.1	Goals	358			
		5.2.9.2	Scripts in Cullingford's SAM	359			
		5.2.9.3	I-Links and MOPS (Memory				
			Organization Packages) in Dyer's BORIS	361			
		5.2.9.4	Evidence for a Divorce Case, in BORIS .	363			
		5.2.9.5	Thematic Abstraction Units				
			(TAUs) in Dyer's BORIS	364			
		5.2.9.6	Other Kinds of Knowledge				
			Sources in BORIS	365			
		5.2.9.7	Contractual Situations and Shady				
			Deals in STARE	371			
	5.2.10	SWALE a	and Related Systems for Generating				
		Explanati	ons from Precedents	373			
	5.2.11	Input fror	n Earlier Research into More Recent				
		Research	in Automated Story Understanding	376			
	5.2.12	Other Sys	stems for Automated Story Understanding .	378			
	5.2.13	Automate	ed or Interactive Story Generation	380			
	5.2.14	eChronic	le Systems	389			
	5.2.15		mbodied Agents	394			
	5.2.16	Story-Ger	neration with MINSTREL	397			
	5.2.17	Environm	nents For Storytelling	399			
	5.2.18	Bias in N	arrative Reporting, and Nonlinear Retelling.	403			
	5.2.19	Self-Exor	neration with ALIBI, in the				
		Perspectiv	ve of Narrative Inventiveness	404			

494

494

504

		5.2.20	Crime St	ories, Mediation by the Media,	
			and Crim	e Fiction: Any Lesson to Be Learnt	
				iter Models?	406
			5.2.20.1	Criminal Investigation and	
				Criminal Trials Within the Remit	
				of Literary Studies	406
			5.2.20.2	When Life Imitates Art	410
			5.2.20.3	The JAMA Model: Modelling an	
				Outcry for Failing to Prosecute.	
				On the Impinging Cultural Effects	
				of a Repertoire of Former Narratives	411
			5.2.20.4	Episodic Similarities vs. Character	711
			5.2.20.4	Similarities	417
		5.2.21	Mathema	tical Logic and Crime Stories from	717
		J.2.21		<i>ne Scene Investigation</i> <sup>TM</sup> : Löwe,	
				d Saraf's Representation, Building	
				nd Algorithm	418
		5.2.22		proaches	418
	5.3		-	•	427
	5.5			- f - Mathad - f Damaantation	428
		5.3.1		of a Method of Representation	400
		520		tives and Legal Narratives	428
		5.3.2		tion of Episodic Formulae	435
		5.3.3		ple: From Suspects and Allegations	
				ic Testing of the Stuffed Birds	
				einertzhagen Collection	444
			5.3.3.1	The Background, and the	
				Narrative Represented	444
			5.3.3.2	Preliminaries of the Formal	
				Representation for the Stuffed	
				Birds Case: Formulae About	
				Meinertzhagen and His Bird Collection .	454
			5.3.3.3	A Notation for Biographies	458
			5.3.3.4	Formalising the Allegations	
				About Meinertzhagen's Stuffed Birds	464
	5.4			Combining Stories and Arguments	
				oftware for Crime Investigation	476
	5.5	Persuasi	ion Stories	vs. Arguments	481
Vol	ume 2				
6	Acco	unting for	r Social, Spa	atial, and Textual Interconnections	483
	6.1	-	-	· · · · · · · · · · · · · · · · · · ·	483
				luction	483

Social Networks, and Link Analysis . . . . . . . .

Social Networks and Their Visualisation .

Link Analysis

6.1.2

6.1.2.1

6.1.2.2

	6.1.2.3	Link Analysis Tools for Criminal	
		Investigation	508
	6.1.2.4	Various Tools Applied to Criminal	
		Intelligence	511
	6.1.2.5	Gianluigi Me's Investigation	
		Strategy for Tackling Internet	
		Child Pornography	511
6.1.3	Assessing	the Risk of Crimes	512
6.1.4	-	c Information Systems for Mapping	
			513
6.1.5	Detection		518
	6.1.5.1	General Considerations	518
	6.1.5.2	Complex Tools' Vulnerability to	
		Manipulation by Perpetrators	520
6.1.6	Autonomo	us Agents	524
	6.1.6.1	From Blackboard to Multiagent Systems .	524
	6.1.6.2	Multiagent Systems, Simulation	
		and Geographic Space, in Tools	
		for Training Police Officers	534
6.1.7	The Challe	enge of Handling a Disparate Mass	
		· · · · · · · · · · · · · · · · · · ·	536
	6.1.7.1	Data Warehousing	536
	6.1.7.2	XML for Interoperability Between	
		Data Sources	537
	6.1.7.3	Ontologies	544
	6.1.7.4	Legal Ontologies	553
		by Andrew Stranieri	
		and John Zeleznikow	
	6.1.7.5	An Application of Ontologies	
		to Eliminating Sensitive	
		Information While Declassifying	
		Documents: The Case	
		of Accounts of Crime Investigation	559
	6.1.7.6	A Digression – Maurice v. Judd	
		(New York, 1818): Is Whale Oil a	
		Kind of Fish Oil? When the Jury	
		Had to Decide About Ontology	561
	6.1.7.7	Legal Modelling, and Financial	001
	0.1././	Fraud Ontology Transnational	
		Online Investment Fraud	566
		by Richard Leary, Wim Vandenberghe,	200
		and John Zeleznikow	
6.1.8	Automatic	Text (and Multimedia) Summarisation	587
0.1.0	6.1.8.1	An Overview	587
	6.1.8.2	Text Summarisation Projects for Law	595
	0.1.0.2	by Andrew Stranieri and John Zeleznikow	595
		by Andrew Strament and John Zerezhikow	

6.1.9	Text Mini	ng	598
	6.1.9.1	General Considerations	598
	6.1.9.2	Examples of text Mining as	
		Applied to Law	602
		by Andrew Stranieri and John Zeleznikow	,
	6.1.9.3	Support Vector Machines, and	
		Their Use for Information	
		Retrieval, Text Classification and Matching	603
		by Andrew Stranieri, John Zeleznikow,	
		and Ephraim Nissan	
6.1.10	Stylometr	ics, Determining Authorship,	
011110	•	ing, and Questioned Documents	
		· · · · · · · · · · · · · · · · · · ·	611
6.1.11		tion, Clustering, Series Analysis,	011
0.1.11		ciation in Knowledge Discovery	
		al Databases	618
		Irew Stranieri and John Zeleznikow	010
	6.1.11.1	Classification	618
	6.1.11.2	Clustering	621
	6.1.11.3	•	622
	6.1.11.4		623
	6.1.11.5	On Interestingness. Commonplace	020
	0.1111.0	Cases, Rather Than Leading	
		(Interesting, Landmark) Cases,	
		Are Suitable in Training Sets	
		for Legal Knowledge Discovery	
		Algorithms	625
6.1.12	Inconsiste	ent Data	628
011112		Irew Stranieri and John Zeleznikow	020
	6.1.12.1	Reasons for Inconsistency	628
	6.1.12.2	Noise and Outliers	628
	6.1.12.3	Judicial Error as a Source of	020
	01111210	Inconsistency	630
	6.1.12.4	Dealing with Contradictory Data:	
		An Example from <i>Split Up</i>	633
	6.1.12.5	Inconsistencies Due to New	
		Legislation or Precedents	635
	6.1.12.6	How to Deal with Inconsistent Data	636
6.1.13			637
011110		rew Stranieri and John Zeleznikow	007
	6.1.13.1	Preliminaries	637
	6.1.13.2	Pattern Interestingness	638
	6.1.13.3	Features of, and Difficulties with,	
	0.1.10.0	Rule Induction Systems	639
	6.1.13.4	Examples of Rule Induction in Law	642
	0.1.10.1		<u>.</u>

	6.1.14	Using Neural Networks		
		by Andr	ew Stranieri and John Zeleznikow	
		6.1.14.1	Historical Background	643
		6.1.14.2	Feed Forward Networks	645
		6.1.14.3	Back Propagation of Errors	650
		6.1.14.4	Setting Up a Neural Network	650
		6.1.14.5	Training a Neural Network	652
		6.1.14.6	Learning Rate	653
		6.1.14.7	Momentum and Bias	654
		6.1.14.8	Training Stopping Criteria	654
		6.1.14.9	Application to Law of Neural Networks .	656
		6.1.14.10	Application to Classification	658
		6.1.14.11	Application to Rule Defeasibility	659
		6.1.14.12	Vagueness	661
		6.1.14.13	Application to Modelling	
			Discretionary Legal Domains	662
		6.1.14.14	Unsupervised Neural Networks	663
		6.1.14.15	Text Clustering with	
			Self-Organising Maps (Kohonen	
			Neural Networks)	664
	6.1.15	Using Fuz	zy Logic	666
			ew Stranieri and John Zeleznikow	
	6.1.16		netic Algorithms in Data Mining	668
			ew Stranieri, John Zeleznikow,	
		•	raim Nissan	
		6.1.16.1	Evolutionary Computing and	
			Genetic Algorithms	668
		6.1.16.2	Genetic and Other Methods	
		01111012	as Applied to Transforming	
			Pre-processed Data Upstream of	
			the Data Mining Phase	671
		6.1.16.3	Nearest Neighbours Approaches	071
		0.1110.0	and Their Integration with Genetic	
			Algorithms	674
6.2	Case Stu	idies of Link	Analysis and Data Mining	675
0.2	6.2.1		esources and Uncovering	070
	0.2.1		on: Email Mining, Computer	
			and Intrusion Detection	675
		6.2.1.1	Email Mining	675
		6.2.1.2	The Enron Email Database as an	0,0
		3.2.1.2	Opportunity for Research	677
		6.2.1.3	Discovering Social Coalitions	011
		0.2.1.5	with the SIGHTS Text Mining System	679
		6.2.1.4	Recursive Data Mining	682
		0.2.1.7		002

		6.2.1.5	The Disciplinary Context: A Brief	
			Introduction to Computer Forensics	685
		6.2.1.6	Digital Steganography	689
		6.2.1.7	Digital Forensics and Bayesian Networks	692
		6.2.1.8	Intrusion Detection in	
			Computer Resources A Glimpse	
			of an Intruder's Modus Operandi	695
		6.2.1.9	A Classification of Intrusion	
			Detection Systems	697
		6.2.1.10	Intrusion Detection by Means of	
		0.2.1110	Various Learning Techniques	701
		6.2.1.11	Masquerading and Its Detection	703
		6.2.1.12	Honeypots for Trapping Intruders	706
	6.2.2		ad States' Anti-Drug Network (ADNET)	712
	6.2.3		ing Internet Auction Fraud	714
	0.2.5	6.2.3.1	What the Problem Is	714
		6.2.3.2	Data Mining and Online	, 1 1
		0.2.3.2	Auction Fraud: Techniques	
			in the Background of NetProbe	721
		6.2.3.3	How NetProbe Works	730
		6.2.3.4	A Non-Mining Model for	750
		0.2.3.4	Reasoning on the Evidence of	
			Online Auction Fraud	736
	6.2.4	Graph Mi	ning for Malware Detection, Using	750
	0.2.4		· · · · · · · · · · · · · · · · · · ·	740
		6.2.4.1	Preliminaries About Graph Mining	740
		6.2.4.2	The <i>Polonium</i> System	742
	6.2.5		lysis with <i>Coplink</i>	748
	6.2.6		Project for the U.S. Federal Defense	/ 10
	0.2.0		Accounting Service	752
	6.2.7		on Extraction Tools for Integration	152
	0.2.7		nk Analysis Tool, Developed	
			e 1990s by Sterling Software	754
	6.2.8		an Ontology Model for the Link	751
	0.2.0		of Fuel Fraud	758
	6.2.9		ud Detection with the Pisa SNIPER Project	762
			-	102
7			Investigation and Intelligence	
			hard Leary explained by its author	767
			ations and History of the Project	767
				769
				771
			wn" Offenders	773
			ntification of Unknown Offenders	774
	7.6 Link D	etection		778

	7.7	The Fire	st Generation of FLINTS	780			
	7.8	Integrat	tion, Linking and Analysis Tools	781			
	7.9			783			
	7.10		e Crimes and Volume Suspects: Not Single				
				785			
	7.11			785			
	7.12			787			
	7.13			800			
	7.14			801			
	7.15	A Case	Study in Linked Burglary	802			
	7.16			808			
	7.17	Second		815			
	7.18			817			
	7.19			820			
	7.20			820			
	7.21		ying Modified Wigmorean Charts: Graphical				
				821			
	7.22	Geogra	phical Analysis	824			
	7.23			826			
	7.24	Prolific (Volume) Offenders Search					
	7.25			828			
	7.26			833			
	7.27	Vehicle	e Searching	835			
	7.28			836			
8	The F	Forensic I	Disciplines: Some Areas of Actual or Potential				
			*	841			
	8.1	Crime Scenario Modelling: The Dead Bodies Project,					
				841			
		8.1.1		841			
		8.1.2	The Structure of ATMS Inference				
				850			
		8.1.3	An Extension with Bayesian Networks,				
			Entropy, and Returned Evidence Collection				
				852			
		8.1.4		855			
			by Jeroen Keppens				
	8.2	Process		858			
		8.2.1	Computer Tools for Face Processing:				
				858			
		8.2.2		859			
			8.2.2.1 Facial Recognition Classification,				
				859			
			-				

xxix

		8.2.2.2	Reconstructing a Face from				
			Verbal Descriptions: Mug Shots,				
			vs. Sketches and Composites	861			
		8.2.2.3	FacePrints for Generating Facial				
			Composites	864			
		8.2.2.4	The CRIME-VUs and EvoFIT Projects	864			
	8.2.3	Age-Prog	ression Software and Post-Surgery				
			ognition	868			
	8.2.4		pression Recognition	871			
	8.2.5	Digital In	nage Forensics	871			
	8.2.6		construction from Skeletal Remains	874			
	8.2.7	Considera	ations about Socio-Cultural Factors				
			ture That Have Been Analysed				
			odic Formulae	877			
8.3	The Bu		rensic Disciplines of Expert Opinion	879			
	8.3.1		Considerations, and Some of the				
			es	879			
	8.3.2	-	Comes into the Picture	886			
	8.3.3		pre Forensic Disciplines	890			
8.4	The Co		Forensic Science of Anthropology				
				893			
	8.4.1		Archaeology and Anthropology	893			
	8.4.2		volved in Forensic Anthropology	896			
		8.4.2.1	Preliminaries	896			
		8.4.2.2	Ante-mortem Skeletal Pathology,				
			and Para-, Peri-, and Post-mortem				
			Traumas	897			
		8.4.2.3	A Digression on Formal Models of Time .	898			
		8.4.2.4	Software Tools for Human Anatomy	901			
8.5	Aspects	s of the Con	tribution to Forensic Science				
	of Geol	of Geology, Geophysics, and Botany					
	8.5.1	Forensic	Geology	905			
	8.5.2	Techniqu	es from Geophysics in Forensic				
			ogy vs. in Archaeology	908			
	8.5.3	A Clarific	cation About Time Slicing	913			
	8.5.4	From Soi	l to Scent: Between Current Practice				
			ining the Digital Potential	915			
		8.5.4.1	Scent-Detection, Odorology,				
			Cadaver Dogs, and Gas Soil				
			Surveying: The Detection of the				
			Scent of an Individual, vs. the				
			Detection of a Kind (Graves)	915			
		8.5.4.2	Electronic Noses	916			
	8.5.5		Palynology	924			
	8.5.6	Computir	ng in Environmental Forensics	928			

9

8.6	Forensi	c Engineeri	ng	935	
8.7	Individual Identification				
	8.7.1	The Cult	ural Context: The History		
			ication Methods	937	
	8.7.2		l Fingerprints	943	
		8.7.2.1	DNA Evidence: A Brief Introduction	943	
		8.7.2.2	Statisticians' Disagreements		
			About How to Evaluate DNA Samples	946	
		8.7.2.3	Human Fingerprints	948	
		8.7.2.4	Fingerprints from Dead Bodies	952	
		8.7.2.5	The Problem of Assessing		
			Fingerprint Sufficient Similarity	952	
	8.7.3	Computa	tional Techniques for Fingerprint		
		-			
		8.7.3.1	General Considerations	957 957	
		8.7.3.2	Bistarelli, Santini, and Vaccarelli's	201	
			Algorithm, Suiting the Hardware		
			Constraints of a Smartcard Architecture .	963	
		8.7.3.3	The Tohoku Algorithm for		
		0171010	Fingerprint Matching Based on		
			Band-Limited Phase-Only		
			Correlation	967	
8.8	Bloods	tain Pattern	Analysis, and the Use of Software	201	
0.0			e Angle of Impact of Blood Drops	973	
	8.8.1		cs	973	
	8.8.2			977	
	8.8.3		Area of Origin	978	
	8.8.4		ncerning Software	981	
	8.8.5		f Velocity on Blood Drops and Blood	201	
	0.0.2			983	
		-	lis Akin	200	
		8.8.5.1		983	
		8.8.5.2	Photography, and	200	
		0.0.2.2	Traditional Determination		
			of Velocities of Blood		
			Spatter	985	
		8.8.5.3	Blood Spatter Flight Characteristics	987	
		8.8.5.4	Point of Convergence (POC)	988	
		8.8.5.5	Determining the Angle of Impact	200	
		0.0.5.5	(AOI), and the Point of Origin	989	
			opsy	991	
			as Ruder, David Zimmermann,		
			uck, Antoine Roggo,		
		ali, and Gar		0.01	
9.1	Introdu	ction		991	

		9.1.1	Preliminary Considerations	991	
		9.1.2	Indications for Virtopsy	992	
	9.2	Technical Aspects of Virtopsy: Imaging Modalities			
		and Techniques			
		9.2.1	The Virtobot System	993	
		9.2.2	Photogrammetry and Surface Scanning	994	
		9.2.3	Post-mortem Computer Tomography (PMCT)	995	
			9.2.3.1 CT Scanners	995	
			9.2.3.2 Identification by Means of CT Scanning .	996	
		9.2.4	Magnetic Resonance Imaging (MRI)	996	
		9.2.5	Post-mortem CT Angiography	998	
		9.2.6	Tissue/Liquid Sampling	999	
		9.2.7	Virtopsy Workflow	1000	
	9.3	Visualisa	tion: The Main Concepts for Storage,		
		Processing and Visualization of Medical Image Data			
		9.3.1	Data Storage	1002	
		9.3.2	Imaging in Two Dimensions (2D Imaging)	1002	
		9.3.3	Imaging in Three Dimensions (3D Imaging)	1003	
		9.3.4	Animation	1005	
		9.3.5	Segmentation	1006	
		9.3.6	Image Fusion	1007	
		9.3.7	Rapid Prototyping	1007	
		9.3.8	Post-mortem vs. Ante-mortem Imaging	1008	
		9.3.9	Medical Image Data for Radiologists		
			and Pathologists	1008	
		9.3.10	Medical Image Data for Medical Laypersons	1010	
	9.4	Virtopsy	and the Swiss Justice System	1011	
		9.4.1	Advantages of Virtopsy in Court	1011	
		9.4.2	Virtopsy in the Current Legal System		
			and Practice of Switzerland	1012	
		9.4.3	Criminal Procedure in Switzerland: The Legal		
			Basis for Virtopsy Imaging Methods?	1012	
			9.4.3.1 Background	1012	
			9.4.3.2 Legal Basis for Virtopsy in Switzerland .	1013	
			9.4.3.3 Evidence Law in Switzerland	1013	
10	Concl	uding Rer	narks	1017	
Appe	endix:	Glossary		1021	
Refe	rences			1123	
Auth	or Ind	ex		1269	
Subj	ect Ind	lex		1301	

# Abstract

This book caters to a broad audience, and provides an overview of computer techniques and tools for handling legal evidence, police intelligence, crime analysis or detection, and forensic testing, with a chapter on the modelling of argumentation and its application to these, as well as with a chapter on how to handle narratives by computer. We also briefly address costs and benefits of obtaining more evidence while preparing a case, as a factor in deciding whether to prosecute or to litigate. Notwithstanding a few seminal precursors from the late 1980s, it is only with the new century that the modelling of reasoning on legal evidence has emerged as a significant area within the well-established field of AI & Law (active since the 1970s). An overview such as this one has never been attempted before between two covers. It offers a panoramic view of topics, techniques and tools. It is intended to clarify the broader picture for the specialist, as well as to introduce practitioners of AI or other computer scientists into this subject. For its newcomers, it is essential not to simplistically blunder into such design choices that would results in flaws making the tools unusable by legal professionals, so it is important to be aware of ongoing controversies. Other tools are appropriate for law enforcement, e.g., tools assisting in crime analysis. In order to deal with hypotheses, representations and tools for the organisation of arguments are useful; therefore, research into argumentation is cited, and argumentation tools or methods that are useful for reasoning about the evidence are surveyed. The final part of the book is devoted to data mining, and next, to a panoply of forensic techniques. For example, the book includes a chapter from the VIRTOPSY team in Bern, about how computer imaging can be used in order to plan autopsies by making them less invasive. The large bibliography is preceded by an extensive glossary, being a useful resource for many of the subjects covered in this book. Several of the entries afford an opportunity for further discussion of select topics.

# **Abstracts of the Chapters**

### **Chapter 1 A Preliminary Historical Perspective**

This introductory chapter makes considerations about the thematics, the organisation of the book, and (along very broad lines) the state of the art, the latter's historical development, and its publication forums. The book is organised around three poles: the modelling of reasoning, the modelling of argumentation and its application to narratives, and a cluster of data mining techniques and the specifics of forensic science disciplines. We mention the controversy, among legal scholars, among those willing to accept probabilistic models, and those who want instead a ranking of the relative plausibility of alternative accounts of a legal narratives, without committing to a Bayesian framework. Artificial intelligence is able to contribute to both camps, and has already done so. Bayesian networks are often applied to causality also in the legal domain, but those arguing against probabilistic quantification are at present vindicated by the rise of the plausibility ranking of legal narratives (Section 5.4) within argumentation research (Chapter 3). AI practitioners need to exercise care, lest methodological flaws vitiate their tools in the domain with some legal scholars, let alone opponents in litigation. There would be little point for computer scientists to develop tools for legal evidence, if legal scholars would find them vitiated ab initio. This is especially true of tools that would reason about the evidence in criminal cases, in view of fact-finding in the courtroom: whether to convict or not – this being different from the situation of the police, whose aim is to detect crime and to find suspects, without having the duty of proving their guilt beyond reasonable doubt, which is the task of the prosecutors. Tools helping the prosecutor to predict an outcome and choose whether to prosecute are not as central to the Bayesian controversy, as prescriptive models of judicial decision-making. This chapter also says something about the communities of users that may benefit from advances in AI & Law technology. In particular, we devote some discussion to computer assistance in policing.

### **Chapter 2 Models of Forming an Opinion**

This chapter is concerned with models of reasoning about the evidence. We consider, in turn, "metre models" of the shifts of opinion in the adjudicators' mind as items of information come in, and a distributed belief revision model for such dynamics. We discuss the weight given jury research in North America. Then we consider some seminal computer tools modelling the reasoning about a charge and explanations: Thagard's ECHO (and its relation to Josephson's PEIRCE-IGTT), and Nissan's ALIBI, a planner seeking exoneration and producing explanations minimising liability. A quick survey of Bayesian approaches in law is followed with a discussion of the controversy concerning applications of Bayesianism to modelling juridical decision-making. We quickly sample some probabilistic applications (Poole's Independent Choice Logic and reasoning about accounts of a crime, and next, dynamic uncertain inference concerning criminal cases, and Snow and Belis's recursive multidimensional scoring). Finally, we consider Shimony and Nissan's application of the kappa calculus to grading evidential strength, and then argue for trying to model relative plausibility.

### **Chapter 3 Argumentation**

We begin this chapter about argumentation, by considering types of arguments, and contrast Wigmore Charts to Toulmin's structure of argument. We develop two examples in detail, and then turn to Pollock's inference graphs and degrees of justification. We then discuss beliefs. From Walton's approach to commitment vs. belief and to argument schemes, we turn to Bench-Capon & Atkinson's approach to critical questions concerning a story of alleged crime. We consider arguments in PERSUADER, in *Carneades*, and in *Stevie*. We survey computer tools for argumentation, and computational models of argumentation, especially as far as they relate to legal argument. We distinguish between argumentation for dialectical situations, vs. for structuring knowledge non-dialectically: a section by Stranieri, Zeleznikow, and Yearwood discusses an integration of those two uses of argumentation in a legal context, in the Generic Actual Argument Model (GAAM), also considering a few applications of the latter.

### Chapter 4 Computer Assistance for, or Insights into, Organisational Aspects

We first consider computer help for organising tasks relevant for managing the evidence. We consider the Lund procedure, as well as a few tools: CaseNote, MarshalPlan, and from Italy's judiciary, Daedalus. We develop in particular a discussion of the latter, which is a tool for the examining magistrate and then the prosecution. We then turn to criminal justice information systems, and discuss prosecutorial vs. judiciary discretion. We discuss facets of evaluating costs and benefits, beginning with the costs and benefits while preparing a case (discussing, in turn, the rules of evidence in terms of economic rationality, Alvin Goldman's concept of epistemic paternalism, the Litigation Risk Analysis method, and bargaining in relation to game theory). We then turn to evaluating the effects of obtaining or renouncing a piece of evidence, then to the benefits, costs, and dangers of argumentation, and finally to the costs and benefits of digital forensic investigations. Next, we discuss Bromby's ADVOKATE, for assessing eyewitness suitability and reliability (we also consider the Turnbull rules, and further elaborate on taxonomies of factors). In the section about policing, we consider organisational aspects of intelligence, and the handling of suspects, and deal in turn with organisational problems of police intelligence systems, with handling the suspects (equipment, techniques, and crucial problems), with polygraph tests and their controversial status, with the evidentiary value of self-incriminating confessions being culture-bound rather than universal in juridical cultures, and with computerised identity parades (lineups) and concerns about identity parades. This chapter concludes with a section (by Jonathan Yovel) on relevance, in relation to legal formalism as well as to logic formalism and artificial intelligence. A refutation is proposed, of the argument from the distinction between relevance and admissibility.

### **Chapter 5 The Narrative Dimension**

We begin by discussing legal narratives, and overall narrative plausibility. We consider approaches from the New Evidence scholarship, discuss background generalisations, as well as the impact of modes of communication (the pragmatics of the delivery in court of a legal narrative), and then warn about pitfalls to avoid, in consideration of what controversy within legal scholarship implies about the need for the modelling of legal narratives with artificial intelligence techniques to meet with approval from legal scholars. We then undertake a long overview (in over twenty subsections) of artificial intelligence approaches to narratives. Historically, a legal context for narratives was involved in tools such as BORIS and STARE. Among the other things, we consider the JAMA model, and then conclude the overview with a project from quarters different from those traditionally associated with storyprocessing in the artificial intelligence research community: namely, Löwe, Pacuit and Saraf's application of mathematical logic to crime stories. We then explain episodic formulae, and develop an example: the controversy concerning a collection of stuffed birds amid allegations that items were stolen and restuffed. We finally consider Bex's approach to combining stories and arguments in sense-making software for crime investigation, and then Bex and Bench-Capon's undertaken project concerning persuasion stories vs. arguments.

### Chapter 6 Accounting for Social, Spatial, and Textual Interconnections Link Analysis and Data Mining for Criminal Investigation

This is a chapter about what link analysis and data mining can do for criminal investigation. It is a long and complex chapter, in which a variety of techniques and topics are accommodated. It is divided in two parts, one about methods, and the other one about real-case studies. We begin by discussing social networks and their visualisation, as well as what unites them with or distinguishes them from link analysis (which itself historically arose from the disciplinary context of ergonomics). Having considered applications of link analysis to criminal investigation, we turn to crime risk assessment, to geographic information systems for mapping crimes, to detection, and then to multiagent architectures and their application to policing. We then turn to the challenge of handling a disparate mass of data, and introduce the reader to data warehousing, XML, ontologies, legal ontologies, and financial fraud ontology. A section about automated summarisation and its application to law is followed by a discussion of text mining and its application to law, and by a section on support vector machines for information retrieval, text classification, and matching. A section follows, about stylometrics, determining authorship, handwriting identification and its automation, and questioned documents evidence. We next discuss classification, clustering, series analysis, and association in knowledge discovery from legal databases; then, inconsistent data; rule induction (including in law); using neural networks in the legal context; fuzzy logic; and genetic algorithms. Before turning to case studies of link analysis and data mining, we take a broad view of digital resources and uncovering perpetration: email mining, computer forensics, and intrusion detection. We consider the Enron email database; the discovery of social coalitions with the SIGHTS text mining system, and recursive data mining. We discuss digital forensics, digital steganography, and intrusion detection (the use of learning techniques, the detection of masquerading, and honeypots for trapping intruders). Case studies include, for example: investigating Internet auction fraud with *NetProbe*; graph mining for malware detection with *Polonium*; link analysis with *Coplink*; a project of the U.S. Federal Defense Financial Accounting Service; information extraction tools for integration with a link analysis tool; the Poznan ontology model for the link analysis of fuel fraud; and fiscal fraud detection with the Pisa SNIPER project.

#### Chapter 7 FLINTS, a Tool for Police Investigation and Intelligence Analysis

This chapter presents and discusses, in 28 sections, a link analysis tool for the British police, FLINTS. The chapter considers, in turn, the motivations and history of the project; the early beginning resulting in FLINTS 1; identifying "unknown" offenders, and systemising it; link detection; more about the first generation of FLINTS; integrations, linking and analysis tools; expanding FLINTS to other police areas; volume crimes and volume suspects; performance monitoring and system identification; a tour of FLINTS as the user sees it; the intellectual foundations; and what stands out in FLINTS. We turn to a case study in linked burglary. We then discuss forensic decision-making; second-generation FLINTS; access to the system (searching vs. surfing); asking questions about people and suspects; asking questions about crimes and events; displaying modified Wigmore Charts, and the graphical results in FLINTS; geographical analysis; temporal analysis; prolific (volume) offenders search; using geography to identify prolific offenders; hot spot searches; vehicle searching; and analytical audit trails.

# Chapter 8 The Forensic Disciplines: Some Areas of Actual or Potential Application

We first begin with an artificial intelligence approach to crime scenario modelling once a dead body has been found. We then turn to a panoply of contexts and approaches to the processing of human faces: face recognition methods and tools for identification; foreseeing how aging would affect a face (e.g., of a child who went missing); facial expression recognition; digital image forensics (with doctored photographs); facial reconstruction from skeletal remains; and factors in portraiture analysed in the TIMUR episodic formulae model. Having begun with these two major areas (crime scenario modelling, and face processing), we take a broad view of the forensic disciplines of expert opinion, and the sometimes controversial role of statistics in them. We then consider the contribution to forensic science of anthropology and archaeology, as well as software tools for human anatomy. Next, we turn to forensic geology and techniques from geophysics; scent-detection and electronic noses; forensic palynology and its databases; computing in environmental forensics; and forensic engineering. Two large sections, each internally subdivided into nine units, conclude this chapter: "Individual Identification", and "Bloodstain Pattern Analysis, and the Use of Software for Determining the Angle of Impact of Blood Drops". The former begins with a history of identification methods, and continues with DNA evidence, and a controversy among statisticians concerning this; we then discuss human fingerprints, and growing skepticism concerning reliability of identification by fingerprints. We then turn to computational techniques for fingerprint recognition, and having surveyed these, we proceed to describe in detail two such techniques.

#### **Chapter 9 Virtopsy: The Virtual Autopsy**

This chapter provides an overview of the Virtopsy procedure, a computerised approach to autopsy, lessening the need for invasive examination. Invasiveness results in the loss of evidence, and of the structural integrity of organs; it is also offensive to some worldviews. At the Institute of Forensic Medicine of the University of Bern, the Virtopsy project has unfolded during the 2000s, its aim being the application of high tech methods from the fields of measurement engineering, automation and medical imaging to create a complete, minimally invasive, reproducible and objective forensic assessment method. The data generated can be digitally stored or quickly sent to experts without a loss of quality. If new questions arise, the data can be revised even decades after the incident. This chapter describes technical aspects of the Virtopsy procedure, including imaging modalities and techniques (the Virtobot system, photogrammetry and surface scanning, post-mortem computer tomography, magnetic resonance imaging, post-mortem CT angiography, tissue/liquid sampling), then turning to the workflow of Virtopsy, and to a technical discussion of visualisation. Medical image data are for either radiologists and pathologists, or medical laypersons (such as in a courtroom situation). The final part of this chapter discusses Virtopsy in relation to the Swiss justice system.

#### **Chapter 10 Concluding Remarks**

This chapter briefly recapitulates which chapter discussed which topics. Then, in a few diagrams, an overarching view is taken of part of the broad set of domains we have been considering in this book. The themes in the book up to the conclusions chapters are supplemented with a Glossary following Chapter 10, and whose entries are often substantial and contain discussion. The bibliography is very large, as could be expected given the broad scope of the book, along with the latter often delving into details.

# **Call for Information**

Future editions will hopefully appear in due course. I would appreciate it if readers will inform me about their research as it progresses, or their tools as they become available, and would provide me with copy of publications as they appear, in view of possible coverage in a future edition. I can be contacted by email (ephraimnissan@hotmail.com). Readers wishing to use the graphic files or the Latex code for the symbols of episodic formulae (see Section 5.3) are welcome to ask for them; I would be glad to provide copy of such files, and would like to learn about the applications.

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<sup>&</sup>lt;sup>8</sup> See for example http://www.forensic-pathways.com/PDFs/FPL\_Overview\_of\_Analytics.pdf

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# **Chapter 1 A Preliminary Historical Perspective**

Basically, this book is organised around three poles:

- Artificial intelligence applications to the modelling of reasoning about legal evidence, as well as to the handling of narratives;
- The modelling of argumentation, especially as applied to law, and computer tools for that purpose; and
- The specifics of disciplines within forensic science, especially in relation to actual or potential applications of computing.

The organisation of this book, by thematic clusters, is reflected accurately by the detailed table of contents. Apart from the chapters in this book, also several of the entries in the "Glossary" are substantial, and in some cases (e.g., s.vv. "mens rea", "examination", "time", and "hearsay") they can be considered as short sections providing further important information on given subjects. These are things that any practitioner of computing and in particular artificial intelligence, if setting to develop an application to legal evidence, other than by mere implementation of an extant design, ought to know. This is all the more the case if for the requirements analysis, the input from legal professionals is not articulate. A project leader should be very careful with such issues, lest he or she should be sorry later. In fact, it will not be enough to obtain functioning software; this software will have to be acceptable to strict scrutiny, to either law enforcement, or legal professional practice. The incentive for finding fault is that during litigation, if a procedural or substantive legal inadequacy can be apportioned (and this objection is upheld) to the use made of a given piece of software, then this may have an even major impact on the outcome of the judicial case at hand.

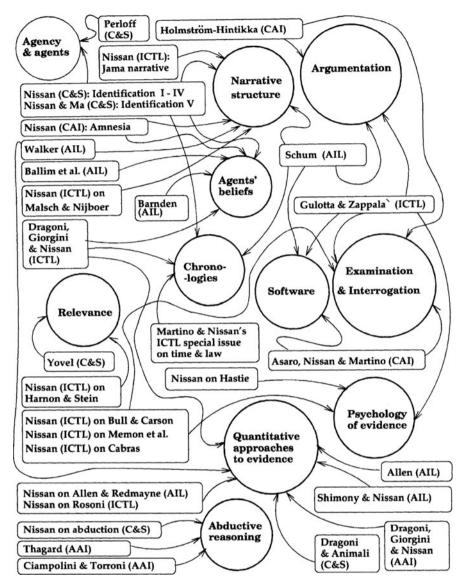
That we should be able to offer such a caveat, depends on a state of affairs in which information technology, as well as the pool of techniques from artificial intelligence, already have results to show, in the domain of legal evidence or of police investigations. The story of how we got there, is something that by itself deserves to be told. In the 1990s, AI applications to legal evidence were at most a desideratum, apart from some pioneering projects whose results catered to scholars in artificial intelligence or in cognitive science, yet were not operational in the application domain. There used to be computer tools for disparate kinds of forensic testing, but in all likelihood the first time that the several disciplines within forensic science are brought together with AI modelling of reasoning about legal evidence and with AI modelling of argumentation, is in the present treatment in this book. This was a good reason to have a unified treatment.

Popular perceptions of trials, through printed or cinematic whodunit stories, emphasise evidence. Undeniably, evidence plays a major role in law.<sup>1</sup> It is by no means the case that research in legal computing, or even more specifically in artificial intelligence and law (AI & Law), has been mainly concerned with legal evidence. Quite on the contrary, until the early 2000s evidence has been a surprisingly inconspicuous subject within AI & Law. Strangely, it took AI & Law three decades for Evidence to emerge conspicuously. In the 1970s, much work in AI & Law was on *deontic logics*, which are *modal logics* of *obligation* and *permission*.

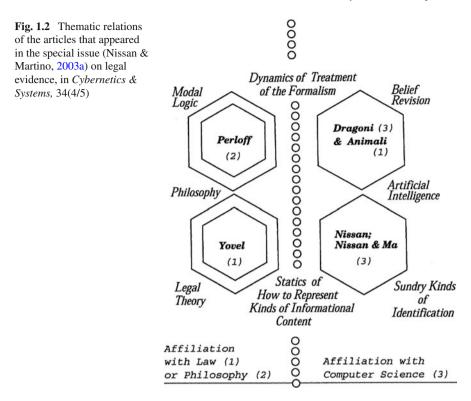
Even as impressive practical tools emerged, with an array of topics active in AI & Law, still evidence was, in a sense, the unseen Cinderella. Some reference to evidence may have occurred, within treatments of other subjects within AI & Law. It can be safely stated that the turning point, for the status of evidence on the stage of AI & Law, was my own first initiative for a journal special issue on the subject, the proposal for which was accepted by the late Donald Berman qua regular editor of Artificial Intelligence and Law, as early as 1996. That initiative was not intended to record the state of the art as available at the time. Rather, it was about bootstrapping a pool of research and papers into existence, where these had been sorely absent. The initiative involved bringing together scholars from different disciplinary compartments, and this spurred interest and collaboration before we went to press. By-products included a conference session I co-chaired in Amsterdam in December 1999: whereas the audience was of legal scholars, some of the speakers were from AI, not necessarily previously associated with AI & Law. Eventually, several journal special issues resulted, and other people who hadn't been among the authors started their own projects, or even undertook initiatives such as workshops.

Already in a guest editorial (Nissan & Martino, 2003b) of a special issue published in 2003 (namely, Nissan & Martino, 2003a), I was able to plot a graph (See Fig. 1.1), in which themes each appeared inside a circle, and showing the sundry thematic relations of the papers (identified by the authors' names) that had appeared in the journal special issues in AI & Law which I had guest-edited up to that point, including the issue whose editorial it was (and for which, the thematic relations in Fig. 1.2 hold). Already at the time, I felt able to state that Fig. 1.1, "due to its intricacy, may look perhaps like a dish of pasta" (Nissan & Martino, 2003b, p. 239).

<sup>&</sup>lt;sup>1</sup> For evidence in legal scholarship, see, e.g., Twining (1985, 1989, 1990), Stein (2005), Nicolson (1994). A textbook on Evidence in England and Wales is Templeman and Reay (1999). From outside Anglo-Saxon jurisdictions, see, e.g., Tonini (1997).



**Fig. 1.1** Thematic relations of the articles that appeared in the journal special issues *Artificial Intelligence and Law (AIL)*, 9(2/3), in 2001; *Computing and Informatics (CAI)*, 20(6), in 2001; *Cybernetics & Systems (C&S)*, 34(4/5) and 34(6/7), in 2003; in *Applied Artificial Intelligence (AAI)*, 18(3/4), in 2004; in *Information and Communications Technology Law (ICTL)*,10(1), and also on pp. 231–264, ibid., 10(2), in 2001. Also included are the papers on the representation of time in legal contexts, in the special issue of *Information and Communications Technology Law*, 7(3), in 1998. All those journal issues were guest-edited by Antonio Martino and Ephraim Nissan, except *Information and Communications Technology Law*, 10(2), whose scope was more broadly in AI & Law, and whose guest-editors were Donald Peterson, John Barnden, and Ephraim Nissan



At present, Evidence is a viable, pursued, subdomain within AI & Law. Even some AI & Law scholars who had chosen not to take part in the journal special issues initiative, typically and admittedly because of being at a remove from a concern with evidence, eventually turned to working on such projects in which evidence features conspicuously. The trend leaked into other areas pursued in AI & Law, mainly the modelling of legal argumentation. Moreover, contacts and even joint initiatives unfolded and continue to take place between such scholars and legal evidence scholars, who in turn had started to move in that direction after I turned to them (of course initially mainly for advice) with Don Berman's agreement to the special issue in my hand. That the new trend keeps going now in such a sustained manner is an unmistakable indicator of successful emergence of the theme within AI & Law.

Let us turn to argumentation, which since the 1990s has been a very active field within AI & Law. It is definitely not the case that historically, all computational techniques for handling argumentation have been necessarily applied to legal arguments, let alone to legal evidence. Until the mid-1990s it would have been strange to combine treatment of computer tools for handling arguments (at the time, an emerging field within AI & Law, yet not about evidence), with a discussion of formal, computational approaches to legal evidence, as until that time formalisms for evidence used to be a hot topic among some legal scholars and statisticians, whereas within

AI & Law the field had yet to emerge. Emerging trends make it cogent and stimulating to treat argumentation as well as other kinds of models of reasoning about the evidence within the same compass. Current developments in both fields are such that there is some synergism in dealing with both of them in the same overview.

AI & Law is more specific than the field of legal computing. Zeleznikow (2004) discussed the construction of intelligent legal decision-support systems in over fifty pages. Within AI & Law, with some seminal work from the end of the 1980s and then organically from the late 1990s, a new area has been developing, which applies AI techniques to how to reason on legal evidence, which requires also capturing within a formal setting at least some salient aspects of the legal narrative at hand. In turn, the subdomain of AI & Law that is mainly concerned with evidence is distinct from the application of computing, and of AI techniques in particular, in the various individual forensic disciplines, e.g., computer imaging or computer graphic techniques for reconstructing from body remains a set of faces in three dimensions, practically fleshing out a skull, which show what a dead person may have looked like – a method that is not without its critics, by comparison to photographs of the dead person once this has been identified. By way of exemplification from the forensic sciences, chapters or sections 6.1.10 and 6.2.1.5.

AI & Law is a field that is either the sole specialty of its typical journals, or a specialty along with law for information and computing technology. Artificial Intelligence and Law (Kluwer/Springer) is the standard journal of the former category, whereas both areas are hosted by Information and Communications Technology Law (Taylor & Francis), a journal whose previous title used to be Law, Computers, and Artificial Intelligence (Carfax). An older journal than both is Informatica e Diritto (in Florence). Oxford University Press publishes the International Journal of Law and Information Technology. In Australia, the University of Tasmania publishes the Journal of Law and Information Science. The website of the University of Warwick (England) hosts an e-journal called Journal of Information Law & Technology.<sup>2</sup> In 2010, Taylor and Francis launched the journal Argument & Computation, whose scope is important for the domain of AI & Law. As to Law, Probability and Risk: A Journal for Reasoning Under Uncertainty, launched by Oxford University Press in 2002, it is a journal of legal scholars and statisticians that also publishes relevant papers in AI & Law: "The journal is intended mainly for academic lawyers, mathematicians and statisticians. The journal seeks to publish papers that deal with topics on the interface of law and probabilistic reasoning" (from its blurb when launched). There exists as well the Kluwer journal, edited in Florence, Information Technology and the Law: An International Bibliography. "Artificial intelligence and legal reasoning" is category 023 in that journal.

It is important to understand that vis-à-vis artificial intelligence in general, applications to law have not been only at the receiving end: there has also been a flow of

<sup>&</sup>lt;sup>2</sup> http://elj.warwick.ac.uk/jilt

techniques which, once they proved effective in as fine-textured, "soft" and complex a field as law is, have become available within AI for an array of other applications. Basic research in AI has benefited from there being research ongoing in AI & Law. Another thing of which one should be aware, it that in the process by which the modelling of reasoning on legal evidence has begun to emerge within AI & Law, and then to move from the periphery to the mainstream of AI & Law, it was not the latter which contributed techniques to the new subdomain; rather, the new subdomain used techniques from the general field of AI, and insights from legal evidence scholarship concerned with probability and plausibility,<sup>3</sup> before techniques which are conspicuous within the pool of tools that had already been developed within AI & Law also came to fruition.

In a sense, it could have been expected that in order to make progress, one should look for AI techniques outside AI & Law: the latter had been rather neglecting evidence for the very reason that its tools had not been adequate as yet for dealing with evidence thoroughly. In contrast, AI in general had been much concerned with evidentiary reasoning. It stands to reason that such results from AI could have been promptly applied, if only (and this is the crux of the matter) the status of quantitative models for decision-making in criminal cases (as opposed to civil cases) weren't a hotly disputed topic among legal scholars.

AI practitioners need to exercise care, lest methodological flaws vitiate their tools in the domain with some legal scholars, let alone opponents in litigation. There would be little point for computer scientists to develop tools for legal evidence, if legal scholars would find them vitiated ab initio. This is especially true of tools that would reason about the evidence in criminal cases, in view of fact-finding in the courtroom: whether to convict or not; this being different from the situation of the police, whose aim is to detect crime and to find suspects, without having the duty of proving their guilt beyond reasonable doubt, which is the task of the prosecutors.

It was crucial to get legal scholars of evidence on board, or at least sympathetically interested, and to obtain their input and feedback when steering the new direction of research within AI & Law, in trying to promote the development of credible computer tools or abstract techniques to deal with legal evidence. Besides, legal scholars and statisticians fiercely supporting or opposing Bayesianism in handling probabilities in judicial contexts (e.g., Allen & Redmayne, 1997; Nissan, 2001a; Tillers & Green, 1988) had come to realise the desirability of models of plausibility, rather than of just (strictly) probability. The participants in the debate about Bayesianism in law or more in general, about probabilities in law, are in practice continuing a controversy that started in the early modern period (Nissan, 2001b), with Voltaire being sceptical of probabilities in judicial decision-making, whereas

<sup>&</sup>lt;sup>3</sup> *Plausibility* may be understood to be either more general than *probability*, or something different altogether. "Polya developed a formal characterisation of qualitative human reasoning as an alternative to probabilistic methods for performing commonsense reasoning. He identified four patterns of plausible inference: inductive patterns, successive verification of several consequences, verification of improbable consequences and inference from analogy" (Stranieri & Zeleznikow, 2005a, Glossary, s.v. *plausible inference*).

in the 19th century Boole, of Boolean algebra fame, believed in the formalism's potential applicability to law. An anonymous referee for an article by the present author has remarked: "This particular intellectual battle should also be better placed in the broader context [...]. The fight has raged, and at least still burns, across the disciplines of statistics, philosophy, artificial intelligence and rather more derivatively in medicine and law". It is true that also in epistemology, i.e., the philosophy of knowledge, there is a controversy about Bayesianism. In Dragoni and Nissan (2004, p. 297), we remarked<sup>4</sup>:

In the literature of epistemology, objections and counterobjections have been expressed concerning the adequacy of Bayesianism. One well-known critic is Alvin Plantinga (1993a, Chap. 7; 1993b, Chap. 8). In a textbook, philosopher Adam Morton (2003, Chap. 10) gave these headings to the main objections generally made by some epistemologists: "Beliefs cannot be measured in numbers", "Conditionalization gives the wrong answers", "Bayesianism does not define the strength of evidence", and, most seriously, "Bayesianism needs a fixed body of propositions" (ibid., pp. 158-159). One of the Bayesian responses to the latter objection about "the difficulty of knowing what probabilities to give novel propositions" (ibid., p. 160), "is to argue that we can rationally give a completely novel proposition any probability we like. Some probabilities may be more convenient or more normal, but if the proposition is really novel, then no probability is forbidden. Then we can consider evidence and use it, via Bayes' theorem, to change these probabilities. Given enough evidence, many differences in the probabilities that are first assigned will disappear, as the evidence forces them to a common value" (ibid.). For specific objections to Bayesian models of judicial decision making, the reader is urged to see the ones made in Ron Allen's lead article [(1997)] in Allen and Redmayne (1997).

We shall come back to this topic, not as superficially as here in the introduction. Among the "Bayesian enthusiasts" concerning legal evidence, perhaps none is more so than Robertson and Vignaux<sup>5</sup>; whereas Ron Allen is prominent, and cogently articulate,<sup>6</sup> among the "Bayesio-skeptics"; see e.g. Allen (2001a) on his desiderata vis-à-vis artificial intelligence modelling of the plausibility of legal narratives (cf. Allen, 2008a, 2008b). Such charged labels are on occasion objected to, and the denotationally yet not connotationally equivalent labels, respectively "Bayesians" and "skeptics", appear to be preferable. No application of statistics to the evaluation of evidence has won as much acclaim, even from Bayesio-skeptics, as Kadane and Schum's<sup>7</sup> (1996) evaluation of the evidence in the Sacco and Vanzetti case from the 1920s, but in a sense the Bayesio-skeptics could afford to be generous, because that

<sup>&</sup>lt;sup>4</sup> Some readers may feel that throughout this long book, the exposition is somewhat marred by overquotation, but I preferred to take this risk, or rather considered this an acceptable cost: I adopted, in a sense, a documentaristic approach, and often quote verbatim. The scope of the topics touched upon in this book is so vast, as to make it necessary to give readers direct access to some passages in which relevant notions have already been well formulated by other authors.

<sup>&</sup>lt;sup>5</sup> E.g., Robertson and Vignaux (1995); cf. Aitken (1995), Taroni, Aitken, Garbolino, and Biedermann (2006).

<sup>&</sup>lt;sup>6</sup> Also see e.g. Jonathan Cohen's (1977) *The Probable and the Provable*.

<sup>&</sup>lt;sup>7</sup> By Dave Schum, see also, e.g., 'Probability and the processes of discovery, proof, and choice' (Schum, 1986), and *Evidential Foundations of Probabilistic Reasoning* (Schum, 1994). On cascaded inference, see Schum and Martin (1982).

project had taken years to develop, and therefore is of little "real time" practical use in ongoing judicial settings.<sup>8</sup>

It was in this context, that it took a systematic, organic effort in order to promote the new subdomain of modelling the reasoning on evidence within AI & Law. This was mainly done through several editorial initiatives, as well as workshops, of the present writer and of others (Martino & Nissan, 2001; Nissan & Martino,<sup>9</sup> 2001, 2003a, 2004a; MacCrimmon & Tillers, 2002, on which see Nissan, 2004),<sup>10</sup> and this in turn involved spurring scholars from disparate disciplinary quarters to develop some piece of research to specification, and then to have referees from different specialties evaluate the resulting papers again and again.

For example, such practitioners of AI or of logic who had never before been concerned with legal applications, contributed some important applied techniques to a pool, until there was a critical mass of research visible enough to spur scholars within AI & Law the way it had been before, to enter the new subdomain and contribute their own techniques. Among the latter, it was perhaps argumentation techniques, a hotly pursued area of research within AI & Law during the 1990s, which constitute the most spectacular contribution.

Let us say something about the communities of users that may benefit from advances in AI & Law technology. Most often, computer tools used by legal professionals are technologically unambitious (at any rate, this is the case from the viewpoints of scholars in artificial intelligence, and in particular of AI & Law): legal professionals are likely to be using tools for document processing, and legal databases. Even simple tools for organising the evidence and the structure of how to argue a case may make a difference, in terms of work facilitation.

As to police officers, while in the office they may be using standard office tools, as well as (in Britain) the Police National Computer. Some police stations use computer tools for the way identity parades are carried out (see Section 4.5.2.3), but also intelligence and crime analysts use specialist tools (see Section 4.5.1 and Chapters 6 and 7).

Yet here, too, there are tools that may be of much help when carrying out investigations, e.g., Richard Leary's FLINTS (Force Linked Intelligence System), a tool for criminal intelligence analysis, performing *network link analysis;* it was originally applied it in the West Midlands Police (see Chapter 7). There is considerable

<sup>&</sup>lt;sup>8</sup> The statistics of identification of perpetrators from DNA samples is the one area in which the statisticians could be thought, on the face of it, to prevail upon the sceptics, were it not for the contradictions of the several ways in which DNA samples can be interpreted statistically, quite a worrying problem that that has been popularised by Geddes (2010). See Section 8.7.2 below.

<sup>&</sup>lt;sup>9</sup> Another journal special issue on AI & Law, but one in which only part of the papers are on evidence, is Peterson, Barnden, and Nissan (2001). Meanwhile, Kaptein, Prakken, and Verheij have published (2009) the paper-collection *Legal Evidence and Proof: Statistics, Stories, Logic.* 

<sup>&</sup>lt;sup>10</sup> I published about select topics in legal evidence as a challenge for AI in Nissan (2008a). Nissan (2009a) is a survey that served me as a blueprint for the present book. Brief encyclopaedic entries on AI for legal evidence or on computer tools for argumentation that I published include Nissan (2008b, 2008c, 2008d, 2008e). That material is either expanded, or incorporated in the present book.

research ongoing into the use of data mining techniques assisting with criminal link analysis (see Chapter 6).

There exists a body of research into the general organisational problems that have occurred on the ground when police forces adopted computer technology as part of *intelligence-led policing*.<sup>11</sup> There are socio-legal studies that deal with this. See Section 4.5.1. Let us just cite here a few articles by James Sheptycki (2004) and by his collaborator Jerry Ratcliffe (2005, 2007). For example, concerning intelligence-led policing, Ratcliffe writes (2005, p. 437):

The ability to employ new methods of information management to better understand and respond to the criminal environment is not the sole domain of intelligence-led policing. There is overlap with the way that crime analysis is used within problem-oriented policing (Scott, 2000; Tilley, 2003), both for problem definition and evaluation analysis. High volume crime analysis, including the use of mapping, has become a core activity of crime analysts (Cope, 2003) and is central to CompStat. CompStat is an operational management process and is much more than just maps of crime, however, the mapping of volume crime patterns does form an integral part of the overall strategy (McGuire, 2000). CompStat combines computer technology, operational strategy, and managerial accountability, and is inherently data-driven (Walsh, 2001).

Ratcliffe described as follows some organisational problems arising from having to copy paper records into digital format (2005, pp. 442–443):

Interpretation of the criminal environment does not just require a suitable intelligence structure; it also requires appropriate data sources and analytical tools. One district commander mentioned that his officers had 'done an internal audit and found a 50% error rate in data recording.' Clearly any intelligence is only as good as the data it originates from, and a 50% error rate is a serious cause for concern. For example, computer simulation of crime mapping scenarios suggests that 85% is a minimum acceptable geocoding rate for basic crime mapping (Ratcliffe, 2004), placing significant doubts about a 50% error rate in basic recording. The practice of entering paper records onto the local computer system was not only error-prone, it was also time-consuming and limited to two offense categories: burglary and vehicle crime. There was no time to record other offense categories.

As there is no requirement of patrol officers to enter data onto a computer, considerable time was spent on data entry in order to digitally transcribe paper records. At least one person in every intelligence office mentioned, during interviews, problems with data entry. The main issues were the lack of personnel, and the content of data entry training that had been available to those analysts who had received training. These individuals complained that the training had not covered hard skills such as those required to operate the various mapping and record management platforms operated by the NZP [i.e., New Zealand Police]. As a result, data entry was slow and hindered the ability of the organization to identify timely intelligence. An Inspector in charge of a district-level intelligence office pointed out that in an internal study it had been shown to take sixteen minutes to enter the details of a burglary on to the records management system, and that while they record data on modus operandi and the property stolen, 'nobody has time to analyze the stuff.'

<sup>&</sup>lt;sup>11</sup> Intelligence led policing is the subject of Ratcliffe (2002, 2003, 2005). Cf. Cope's article (2004) entitled "Intelligence led policing or policing led intelligence?". "Where intelligence-led policing differs from other strategies is in the focus on recidivist offenders, and the encouragement given to surveillance and the use of informants to gather intelligence that might not otherwise come to the attention of police [...]" (Ratcliffe, 2005, p. 437).

There also is a down-to-earth manner of noticing the impact of computer technology in law enforcement, on the pool of skills (including computer literacy) as expected from candidates for specific roles. Let us consider an advert from England, of the Kent Police in a local newspaper. The post advertised (in December 2007) is *Criminal Justice Unit Supervisor*. The pay is not impressive. What are the skills required? And which computer skills are required? The ad reads as follows:

You will be responsible for supervising the day-to-day work of the criminal justice unit, together with another supervisor, to ensure case papers are properly prepared and submitted to the prosecuting authorities within tight timescales, responding to inquiries quickly and efficiently.

You must have well developed communication skills to tactfully, but assertively, deal with witnesses and victims who can be angry and abusive in cases where they have received no compensation from the courts or feel let down by the justice system, distressed at having to attend court or just reluctant witnesses who do not feel that they have time to attend court.

An ability to communicate at all levels within the unit and as part of the wider interagency approach involving the court, CPS (Crown Prosecution Service), probation and other criminal justice partners is essential.

The ability to manage office work, supervising caseworkers to whom particular criminal cases are entrusted, plays an important part. One would expect some ability to exploit technology, but that will only come later on, in the ad:

You must evidence your ability to work under pressure and drive through change, which is essential for the role, as all work passed to the office is subject to strict time limits. The ability to prioritise and allocate work to Caseworkers and to plan ahead is also essential for the smooth running of the unit.

The nature of this work is often distressing and sensitive as the unit deals with cases involving rape, child abuse and other sexual offences, road traffic collisions, as well as murder and offences against the person. You must have the ability to keep the caseworkers motivated, complete regular performance reviews with staff and be aware of signs of stress. You have to be fully dedicated to the role, as the unit has no control over the amount of work that has to be produced during any given week. You must also demonstrate flexibility and be prepared to stay as required at the end of the day, in oder to ensure that all witnesses are warned for crown court the next day and any problems are resolved.

It is at this point in the advert, that information technology skills are mentioned. This is something similar to what is found in ads for other jobs with the police. Whereas a wide range of application is mentioned, this mainly pertains to standard office software. Also police databases are mentioned, though:

Proven evidence in the ability to utilise a full range of Microsoft Office applications is essential. Experience in the use of Genesis and Police National Computer, together with knowledge of the criminal justice procedures would be an advantage.

For a post of *Restorative Justice Administrator*, coordinating a young offenders' programme, and involving "reviewing case files from officers, checking that the relevant documents have been completed", and so forth, the ad stated: "Good IT skills are essential, with previous experience of the force's and national databases. You should be educated to at least GCSE standards or equivalent, including English Language and Mathematics". Realising that much is important and sobering. Fancy tools should not be such that would become a burden to often overburdened police

staff, and for one thing, in the U.K. it is well-known that office work is taking an inordinate percentage of time spent by the force, sometimes at the expense of patrolling. But sometimes it is the tasks that intelligence or crime analysts are given that are inappropriate for their skills, and they may be using software in order to produce inappropriate output (such as management statistics), just as they use software for what is their proper pool of skills. See Section 4.5.1. Some other computer tools for the police are intended for training.<sup>12</sup>

Now let us consider a Kent Police ad for a *Training Officer:* "an enthusiastic and self-motivated Area Training Officer to work within the Personnel and Training Unit". That one carries a better salary that the post of Criminal Justice Unit Supervisor. The Area Training Officer has to work with a police college "in the arranging of centralising training courses", and is "required to identify and analyse local training needs, arrange and deliver appropriate training, whilst prioritising the demands placed on the area". "You should be able to co-ordinate, design and deliver training in a range of styles, as well as having the ability to demonstrate practical experience of various training techniques". Some statistics skills are required of the post-holder:

You will be required to undertake training needs analysis on an individual or group basis and provide management reports and statistical information. This is seen by the area to be a key element of the role, as the link between performance management and training is key to the area business.

And here come the IT skills, in the ad considered:

You must be flexible in your working hours as there may be a requirement for you to work approximately one evening per week for ongoing training of staff. Strong IT skills are essential, along with excellent communication skills and the ability to negotiate with senior managers, supervisors and outside organisations. An understanding of police roles is desirable.

Again, there are IT skills and IT skills. There are such IT skills that it would be reasonable to require of staffs, and IT skills that would be, quite unhelpfully, an unreasonable burden, if imposed as a requirement. If we are to develop useful tools at the forefront of what the state of technology affords, it is essential that the new tools will not be resented, and will not complicate the life of users.

Lawyers and policemen have different educational backgrounds. Their attitudes to technology and to numerate skills may also be different, and are certainly different from those of academic computer scientists. It is essential to calibrate the intended use of tools we may conceive of, according to the real-world features and professional cultures of the communities of users. As a matter of fact, there is an array of several professional communities who are being addressed in this book as a readership, and there is an array of several professional communities that are the intended users of both extant and potential tools within the scope of this book.

 $<sup>^{12}</sup>$  We are going to see (in Section 6.1.6.2) that some AI computer tools with a graphic (actually, geographic) interface are intended for training at the police academy, such as *ExpertCop*, a tool developed by Vasco Furtado's team in Brazil (Furtado & Vasconcelos, 2007).

This book-form presentation was preceded by a less ambitious attempt at synthesis, in a couple of articles by this author (Nissan, 2008a, 2009a). They represent a preparatory stage in what was to become this book. The domain is mature for a volume such as the one you are reading now.

The range of techniques and tools explained, hopefully in an accessible manner, in this book is not presented in an overly technical manner. It is mainly an introduction, with indications of how (what to access in order) to pursue specific technical directions. Reading this book will hopefully result, for professionals in the fields concerned, in an ability to define requirements and perhaps commission a project; or then it will result in an ability for designers who are computer scientists, to see how to usefully direct their talents in this array of application domains.

# Chapter 2 Models of Forming an Opinion

## 2.1 Modelling Adjudicators' Shifts of Opinion

### 2.1.1 Preliminaries

It is far from being the case that trial by jury is universal, in criminal cases. Even in England and Wales there is an incipient shift away, in some circumstances, towards *bench trials*, i.e., such trials that the adjudicator is one or more trained judges. There are jurisdictions in Continental Europe that make room for a lay jury, and yet the reins are in the hands of professional judges to an extent one would not expect in the Anglo-American system.

Jury research is a domain, one of whose subdomain is *mathematical modelling* of judicial decision-making, presented as though it is the decision-making of a jury. Nevertheless, some of the mathematical research that has emerged from jury research especially in North America is arguably of interest also to scholars from such countries that their respective jurisdiction only has bench trials, because actually such mathematical models confine themselves to describe shifts of opinion on the part of the adjudicator, thus, possibly of a trained judge.

In fact, typically such mathematical models do not account for deliberations among jurors when they retire, and account instead for the impression that exposure to incoming items of evidence, or to arguments made by lawyers, makes on the cognition of the adjudicator (a lay juror, or a trained judge), to the extent that this impression is reduced to a measurable parameter that shifts between "not guilty" and "guilty". Such models are known as *metre-models* (*meter-models*).

For such readers who are not conversant with Law, it may be useful to point out the succession of events at the criminal trial in Anglo-Saxon countries:

#### Indictment;

The accused is asked to plea guilty or not guilty;

If the defendant pleas guilty — plea-bargain:

The court hears the facts from the prosecution (with no need to present evidence); Defence may intervene;

Sentence.

If the defendant pleas not guilty, the case will have to be prosecuted;

Adjournment to an agreed date;

Adjournment hearing (following adversarial lines);

Prosecution opening speech;

Prosecution calls witnesses;

Examination in chief;

Cross-examination;

(sometimes) re-examination;

Close of the prosecution case;

(The defence may submit that there is no call to answer.

If the court accepts this, the defendant is discharged.

Otherwise:)

Defence calls witnesses:

Examination in chief;

Cross-examination;

(sometimes) re-examination;

Defence's closing speech to the bench;

(Prosecution may have one more speech,

but then defence must have the last word.)

The magistrates retire to consider their decision

(the decision is taken either by a bench of lay

magistrates, i.e., a jury, or a stipendiary magistrate,

i.e., a trained judge);

The magistrates return and give a verdict (and state no reason); If the verdict is 'not guilty',

then the defendant is discharged;

If the verdict is 'guilty', then:

The court hears the facts from the prosecution (with no need to present evidence); Defence may intervene; Sentence.

The descriptive modelling of the decision-making process of jurors is an active area of research in psychology in North America. Sometimes, computer tools have been involved in simulations, most often with very strong simplifications. Apparently the first article published in an AI forum, and presenting a model simulating quantitatively how the opinion of a jury is shaped, was Gaines, Brown, and Doyle (1996), based on a BSc project by Gaines (1994).

Hastie (1993) is the standard reference about *metre-models* of juror decisionmaking, i.e., such quantitative models that are not themselves concerned with specific narrative details, even though these can be reduced to propositions and used as data when testing the models. Even though arguably it is unrealistic to disregard the details of the legal narrative at hand and how it is delivered in court, still the metre-models are a valuable pool of techniques which arguably could be used in combination with narrative models.

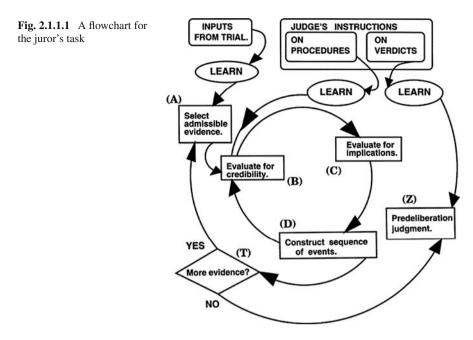
When we say "valuable", this is (alas) blue sky research. It is valuable for scholars, and it is not the case that anybody in the courtroom or in lawyers' offices is expected, or hoped, or desired to use those models. As we are going to see in this book, tools for legal professionals are something different. Starting with when we'll get to Paul Thagard's ECHO model (which measures strength of conviction on the part of a jury, in terms of how explanatorily coherent competing explanations are, for the criminal case being tried), it will make sense that even though past trials have been successfully simulated, such a tool could also be used by lawyers or prosecutors when evaluating the evidence they have, and the arguments they intend to use. That is to say, with a tool such as Thagard's ECHO, they could experiment with the degree of explanatory coherence<sup>1</sup> of what they provisionally have on their hands, and adjust their presentation of the evidence accordingly.

Hastie (1994, figure 1.1 on p. 7) describes trial events "in terms of the types of information presented to the juror." These include: indictment, defendant's plea, prosecution opening statement, defense opening statement, witnesses (comprising the sequence: statements of witness and judge, observations of witnesses, observations of judge), defense closing arguments, prosecution closing arguments, judge's instructions on procedures (the procedures being: presumption of innocence, determination of facts, admissibility, credibility, reasonable inference, and standard of proof), and judge's instructions on verdicts (where verdict categories have these features: identity, mental state, actions, and circumstances).

For the juror's task, Hastie proposes a flowchart of its tentative structure (Hastie, 1994, p. 8, figure 1.2), notwithstanding the differences of opinions that admittedly exist in the literature about how this takes place in the juror's cognition. Given inputs from the trial (witnesses, exhibits, and so forth), the juror has to encode meaning, the next step being (A) "Select admissible evidence". Later on in the trial events, given the judge's procedural instructions, the juror has to encode the meaning of the procedures (presumption of innocence, and so forth, as listed earlier), and this in turn has three outgoing arcs, to: (B) "Evaluate for credibility" (into which, an arc comes from A as well), (C) "Evaluate for implications", and (Z), for which see in the following.

There is a loop by which (B) "Evaluate for credibility" leads into (C) "Evaluate for implications", and then into (D) "Construct sequence of events", which in turn provides a feedback which affects B. Besides, D leads to a test: (T) "More evidence?" If there is indeed, one goes to A; otherwise, one goes to Z. Given the judge's instructions on verdicts, the juror has to learn verdict categories, and this in turn leads to (Z) "Predeliberation judgment". The flowchart from Hastie is redrawn here, with some simplification, in Fig. 2.1.1.1.

<sup>&</sup>lt;sup>1</sup> *Coherence* is crucial for how cogent legal narratives are. But *coherence* is also a crucial factor in argumentation, and coherence in this other sense has been formally modelled in Henry Prakken's (2005) "Coherence and flexibility in dialogue games for argumentation".



# 2.1.2 Distributed Belief Revision for Modelling the Dynamics of Adjudicators' Opinion

#### Aldo Franco Dragoni and Ephraim Nissan

Delivery of the evidence in court conforms with *dynamic uncertain inference*. "Dynamic uncertain inference is the formation of opinions based upon evidence or argument whose availability is neither disclosed to the analyst in advance nor disclosed all at once" (Snow & Belis, 2002, p. 397).<sup>2</sup> The present Section 2.1.2 presents a model for dealing with belief revision because of incoming information.

*Belief revision* is a well researched area within artificial intelligence. It studies, in terms of formal logic, the impact of the acquisition of incoming items of information. Let us consider what it may offer application to the modelling of how the opinions and beliefs of an adjudicator evolve as the trial goes on. New information and evidence integrate and corroborate the cognisance of the court, but other testimonies might cause conflicts. In this case, it seems natural that the acquisition of the new evidences should be accompanied by a reduction of the credibility of the

<sup>&</sup>lt;sup>2</sup> Reasoning on that kind of situation is also modelled in a project described in Section 2.5.2 below.

conflicting pieces of knowledge. If the juror's corpus of evidence is not a flat set of facts but contains rules, finding such conflicts and determining all the sentences involved in the contradictions can be hard. In dealing with these "changes of mind", if we are to adopt a formalism for belief revision, we have to heavily rely on symbolic logic, since as much as it contributed to the history of "thinking", logic could as well solve the problem of "thinking over". Generally speaking, AI researchers call this cognitive process *belief revision*.

Benferhat, Dubois, and Prade (2001) pointed out the similarities between belief revision and *database merging* (or *data fusion*): "Fusion and revision are closely related because revision can be viewed as a fusion process where the input information has priority over a priori beliefs, while fusion is basically considered as a symmetric operation. Both fusion and revision involve inconsistency handling".

Since the seminal, influential philosophical work of Alchourrón, Gärdenfors, and Makinson (1985), ideas on belief revision have been progressively refined (Gärdenfors, 1988) towards normative, effective and computable paradigms (Benferhat, Cayrol, Dubois, Lang, & Prade, 1993; Nebel, 1994). They introduced three rational principles which belief revision should obey.

- AGM1 Consistency: revision must yield a consistent knowledge space.
- AGM2 *Minimal Change*: revision should alter as little as possible the knowledge space.
- AGM3 *Priority to the Incoming Information*: incoming information always belongs to the revised knowledge space.

Aldo Franco Dragoni replaced the *principle of priority* of the incoming information with a *principle of recoverability* (also called *principle of persistence*), i.e., it should be possible to backtrack from how belief was revised, in case such backtracking is warranted by the arrival of new items of evidence. It was this new principle that made their model of belief revision interesting for application to modelling of a judicial context.

It is important, for belief revision models for such an application,

- to enable *iterating* the revision,
- to enable *combining* such items of evidence that are concomitant and consistent,
- to keep track of the *source* of an item of information, and to make use of the association between the information and its source,
- and not to throw away anything: alternative multiple context should be kept, and compared when this is suitable.

The model presented in Dragoni and Nissan (2004) builds upon Dragoni, Giorgini, and Nissan (2001), and fits among the metre-models as known from jury research, but is more sophisticated in that it applies a belief revision formalism, rather than the simpler formalisms previously used by jury research psychologists. Dragoni and Nissan (2004), being concerned with modelling the dynamics of how judicial

factfinders (judges or jurors) propend to either verdict, have incorporated in the architecture they describe a component which modifies (by feedback) the credibility of the source from which an item of information comes, according to how the credibility<sup>3</sup> of that item of information is currently faring. Their model takes into account how the degree of credibility of the different persons who provide different items of information is dynamically affected by how some information they supplied comes to be evaluated.<sup>4</sup>

That system works as follows (see Fig. 2.1.2.1, from Dragoni & Nissan, 2004, p. 290). Upon the arrival of a new {source, information} pair into the knowledge base (i.e., a set of extant {source, information} pairs), a truth-maintenance mechanism is applied, which finds all minimally inconsistent subsets, finds all maximally consistent subsets, and generates a set of maximally consistent subsets.

From this set and from a set of pairs {information source, source reliability score}, a statistical technique is applied (it may be Dempster-Shafer),<sup>5</sup> and a set

<sup>&</sup>lt;sup>3</sup> In distributed AI, dealing with societies of artificial agents, the topic of an agent's *reputation* has tended to be underresearched, but it ought to be an important topic for distributed AI just as it is for social psychology. A book on the subject is Conte and Paolucci (2002). The same considerations apply to trust among agents, also an important subject for AI modelling, just the way it is for social psychology, and which is the subject of a book by Castelfranchi and Falcone (2010). See a survey in Sabater and Sierra (2005).

<sup>&</sup>lt;sup>4</sup> In psychological research about detecting deception (e.g., Vrij, 2000; Porter & Yuille, 1995, 1996; Colwell, Hiscock-Anisman, Memon, Woods, & Yaeger, 2006) - a subject to which we are going to return (see fn 81 below) - "The Statement Validity Analysis (SVA), a memory-based approach, is the most widely used system of credibility assessment to date" (Colwell et al., 2006). It is traced back to Undeutsch's (1982) statement reality analysis. The latter became known as the Undeutch Hypothesis. It "which posits that memory for an actual event will differ from fabrication in structure, content, and quality; and that these systematic differences will be measurable. Recall of a genuine memory is expected to demonstrate a richness of detail, logical structure, and spontaneity or 'unstructured production'" (Colwell et al., 2006). "The cognitive approach to credibility/deception is based on the Information Manipulation Theory (IMT) [McCornack, 1992]. Maintaining deception in an interrogative atmosphere can be a cognitively demanding task. A deceiver must deal with his/her conflicting goals of disclosing enough information to please the interrogator while retaining sufficient control over the facts conveyed to avoid detection" (Colwell et al., 2006). According to IMT, which "highlights the complex and interactional nature of deception, emphasizing impression management and the deceiver's control over the information" (Colwell et al., 2006): "Deceivers usually convey less information than truth-tellers (less quantity), reply in a more irrelevant manner (less relevance), provide incoherent information (lower quality), and rarely engage in sarcasm (different manner of responding [(Porter & Yuille, 1995)]). These specific mechanisms, as well as others, can provide a multitude of channels for a deceiver to utilize." (Colwell et al., 2006).

<sup>&</sup>lt;sup>5</sup> "Dempster-Shafer theory [(Shafer, 1976)] has been developed to handle partially specified domains. It distinguishes between uncertainty and ignorance by creating belief functions. Belief functions allow the user to bound the assignment of probabilities to certain events, rather than give events specific probabilities. Belief functions satisfy axioms that are weaker than those for probability theory. When the probabilistic values of the beliefs that a certain event occurred are exact, then the belief value is exactly the probability that the event occurred. In this case, Dempster-Shafer theory and probability theory provide the same conclusions" (Stranieri & Zeleznikow, 2005a).

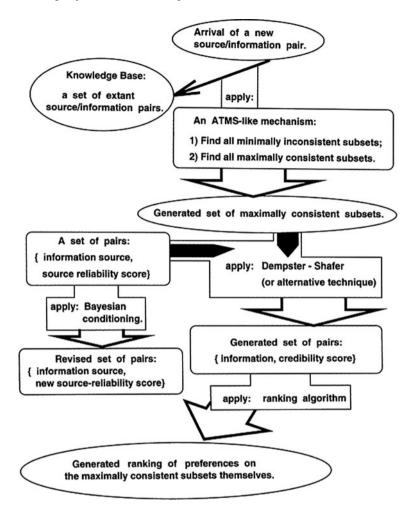


Fig. 2.1.2.1 Control flow in the approach to distributed belief revision described in Dragoni and Nissan (2004)

is generated of {information source, source reliability score} pairs. A ranking algorithm is applied, and a ranking of preferences is generated for the maximally consistent subsets themselves.

Moreover, by applying Bayesian conditioning, the reliability scores of the information sources are revised (Dragoni & Nissan, 2004; also see Dragoni & Animali, 2003). On credibility and probability, see Schum (1989).

The overall schema of the multi-agent belief revision system we proposed in Dragoni and Nissan (2004), as whown here in Fig. 2.1.2.1, incorporates the basic ideas, current in artificial intelligence, of:

- Assumption-based Truth Maintenance System (ATMS)<sup>6</sup> to keep different scenarios.
- Bayesian probability to recalculate the a-posteriori reliability of the sources of information.
- The Dempster-Shafer Theory of Evidence to calculate the credibility of the various pieces of information.

In Fig. 2.1.2.2, on the left side, one can see an incoming information,  $\beta$  (whose source, U, is identified), further to the set of beliefs already found in the knowledge base, namely, informations  $\alpha$  and  $\chi$ , which both come from source W, and moreover an information being a rule ("If  $\alpha$ , then not  $\beta$ "), which comes from source T.

The latter could, for example, be an expert witness, or then a fictitious character such as common sense. In the parlance of Anglo-American legal evidence

<sup>&</sup>lt;sup>6</sup> An ATMS is a mechanism that enables a problem solver to make inferences under different hypothetical conditions, by maintaining the assumptions on which each piece of information and each inference depends (de Kleer, 1986, 1988). An ATMS maintains how each piece of inferred information depends on presumed information and facts, and how inconsistencies arise. "A *Truth maintenance system* (TMS) may be employed to protect the logical integrity of the conclusions of an inferencing system" (Luger & Stubblefield, 1998, section 7.2.3, p. 275).

<sup>&</sup>quot;Jon Doyle (1979) created one of the earliest truth maintenance systems, called a *justification* based truth maintenance system or JTMS. Doyle was the first researcher to explicitly separate the truth maintenance system, a network of propositions and their justifications, from the reasoning system operating in some domain. The result of this split is that the JTMS communicates with the problem solver, perhaps an automated theorem prover, receiving information about new propositions and justifications and in turn supplying the problem solver with information about which propositions should be believed based on the current existing justifications. There are three main operations that are performed by the JTMS. First, the JTMS inspects the network of justifications. This inspection can be triggered by queries from the problem solver such as: Should I believe in proposition p? Why should I believe proposition p? What assumptions underlie proposition p? The second operation of the JTMS is to modify the dependency network, where modifications are driven by information supplied by the problem solver. Modifications include adding new propositions, adding or removing premises, adding contradictions, and justifying the belief in a proposition. The final operation of the JTMS is to update the network. This operation is executed whenever a change is made in the dependency network. The update operation recomputes the labels of all propositions in a manner that is consistent with existing justifications" (Luger & Stubblefield, 1998, section 7.2.3, pp. 276-277).

<sup>&</sup>quot;A second type [of] truth maintenance system is the *assumption-based truth maintenance system* (ATMS). The term *assumption-based* was first introduced by de Kleer (1984), although similar ideas may be found in Martins and Shapiro (1983). [Cf. Martins and Shapiro (1988), Martins (1990).] In these systems, the labels for nodes in the network are no longer IN and OUT but rather the sets of premises (assumptions) underlying their derivation. de Kleer also makes a distinction between premise nodes that hold universally and nodes that can be assumptions made by the problem solver and that may later be retracted. [...] The communication between the ATMS and the problem solver is similar to that between JTMS and its problem solver with operators for *inspection, modification,* and *updating.* The only difference is that with ATMS there is no longer a single state of belief but rather subsets of premises sufficient for the support of each node. This computation is done by propagating and combining labels, beginning with labels for the premises" (Luger & Stubblefield, 1998, section 7.2.3, pp. 278–279).

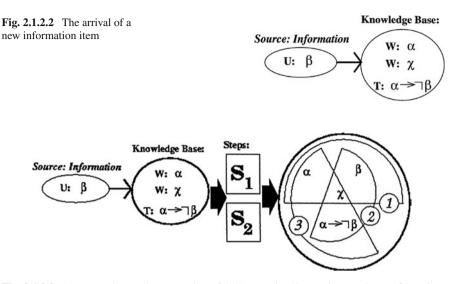


Fig. 2.1.2.3 The second step: the generation of all the maximally consistent subsets of KB (i.e., the knowledge base), plus the incoming information

theory, common sense is called "background generalizations", "common-sense generalizations", or "general experience" (see Twining, 1999).

Once past the knowledge base in the flowchart of Fig. 2.1.2.2, in order to revise the set of beliefs with the new information  $\beta$  coming from source U, two steps are undertaken. Refer to Fig. 2.1.2.3. The ATMS-like mechanism is triggered; it executes steps S1 and S2.

These are dual operations, respectively, as follows:

- Find all minimally inconsistent subsets (NOGOODSs).
- Find all maximally consistent subsets (GOODSs).

In the notation of set theory, the Venn diagram on the right side of Fig. 2.1.2.3 is intended to capture the following concept. Three GOODSs have been generated; the one labelled 1 includes  $\alpha$ ,  $\beta$ , and  $\chi$ ; the one labelled 2 includes B,  $\chi$ , and the rule "If  $\alpha$ , then not  $\beta$ "; whereas yet another GOODS, labeled 3, includes:  $\alpha$ ,  $\chi$ , and the same rule "If  $\alpha$ , then not  $\beta$ ".

Each one out of these three GOODSs is a candidate for being the preferred new cognitive state (rather than the only new cognitive state). The decision as to which cognitive state to select is taken based on Dempster-Shafer (see Table 2.1.2.1). Refer to Fig. 2.1.2.4.

Dempster-Shafer is resorted to in order to select the new preferred cognitive state, which consists of an assignment of degrees of credibility to the three competing GOODSs. Dempster-Shafer takes as input values of a priori source-reliability (this degree being set a priori is possibly a limitation), and translates them into a

 Table 2.1.2.1
 The role of the Dempster-Shafer theory of evidence

$\Omega$ : models of the finite language $\mathcal{L}$ add	opted in the trial under consideration
--	--

*S<sub>i</sub>*: a source of information

 $K_i$ : information received from S<sub>i</sub> expressed through  $\mathcal{L}$ 

 $[K_i] \subseteq \Omega$ : models of  $K_i$ 

 $R_i$ : a priori reliability of  $S_i$  (i.e., probability that  $S_i$  is reliable)

From the testimony of each  $S_i$  a basic probability assignment on  $2^{\Omega}$  can be extracted:

$$m_i(X) = \begin{cases} R_i & X = [K_i] \\ 1 - R_i & X = \Omega \\ 0 & \text{otherwise} \end{cases}$$

Dempster Rule of Combination of multiple evidence:

$$m(X) = \frac{\sum_{X_1 \cap \ldots \cap X_n = X} m_1(X_1) \cdot \ldots \cdot m_n(X_n)}{\sum_{X_1 \cap \ldots \cap X_n \neq \emptyset} m_1(X_1) \cdot \ldots \cdot m_n(X_n)}$$

Belief Function Bel(X): it assesses a degree of credibility for each formula of  $\mathcal{L}$  from the combined evidence m(X):

$$\operatorname{Bel}(X) = \sum_{X' \subseteq X} m(X')$$

ranking in terms of credibility of the items of information given by those sources. Yet, Dempster-Shafer could instead directly weigh the three GOODS, whereas we make it weigh the formulae instead. This choice stems from Dragoni's feeling that the behavior of Dempster-Shafer is unsatisfactory when evaluating the GOOD in its entirety. (In fact, as the GOOD is a formula, Dempster-Shafer could conceivably assign a weight to it directly.)

Next, from the ranking of credibility on the individual formulae, we can obtain (by means of algorithms not discussed here) a ranking of preferences on the GOODSs themselves. In the example, this highest ranking is for the GOOD with:  $\alpha$ ,  $\beta$ , and  $\chi$ . (Thus, provisionally discarding the contribution of source T, which here was said to be "common sense".) Nevertheless, our system generates a different output. The output actually generated by the system is obtained downstream of a recalculation of source reliability, achieved by trivially applying Bayes' theorem. In our example, it can be seen how it is source T ("common sense") which is most penalised by the contradiction that occurred. Thus, in output B', the rule which precludes  $\beta$  was replaced with  $\beta$  itself. Note that the selection of B' is merely a suggestion: the user of the system could make different choices, by suitably activating search functions, or then by modifying the reliability values of the sources.

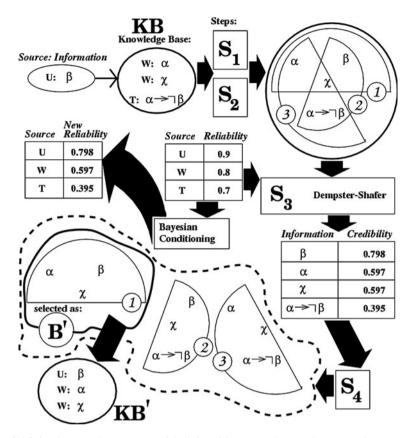


Fig. 2.1.2.4 The complete process of belief revision according to the approach proposed in Dragoni and Nissan (2004)

Once the next information arrives, everything will be triggered anew from the start, but with a new knowledge base, which will be the old knowledge base revised with the information. It is important to realise that the new knowledge base is not to be confused with B'. Therefore, any information provisionally discarded is recoverable later on, and if it will be recovered indeed, it will be owing to the maximal consistency of the GOODSs.

The Dempster-Shafer Theory of Evidence is a simple and intuitive way to transfer the sources' reliability to the information's credibility, and to combine the evidences of multiple sources. Notwithstanding these advantages there are shortcomings, including the requirement that the degrees of reliability of the sources be established a priori, as well as computational complexity, and also disadvantages stemming from epistemological considerations from legal theory. At any rate, the adoption of Dempster-Shafer in the present framework is a choice that could perhaps be called into question. A refinement is called for, because as it stands, the system requires (as said) associating with the sources an a priori degree of reliability and, moreover, application other than approximated of Dempster-Shafer is computationally very complex.

A few remarks of evaluation follow, first about consistency. Of course, we want to enforce or restore consistency: judiciary acts cannot stem from an inconsistent set of hypotheses. Yet, we want to avoid unduly dismissing any possibility altogether. Therefore we contrast all such GOODSs that are obtained from the set of information items (which are globally inconsistent) provided by the various sources involved. Sometimes the same source may be found in contradiction, or provide inconsistent information (self-inconsistency).

In 1981, Marvin Minsky, one of the founding fathers of artificial intelligence, stated: "I do not believe that consistency is necessary or even desirable in developing an intelligent system". "What is important is how one handles paradoxes or conflicts". Enforcing consistency produces limitations: "I doubt the feasibility of representing ordinary knowledge in the form of many small independently true propositions (context-free truths)". In our own approach, we have a single, global, never forgetting, inconsistent knowledge background, upon which many, specific, competitive, ever changing, consistent cognitive contexts are acting.

An important thing to bear in mind, concerning the model from Dragoni and Nissan (2004), is that the principle of *recoverability* only applies to *revision*, but not to *updating*. In fact, if I see an object in a position Y, I can no longer believe it to be in a position A. If then I am told that it is *not* in Y, this does not imply that it went back to position X. Perhaps the object went from position Y to position Z.

Another way to state this is as follows. If observation (or information item)  $\beta$  caused the removal of information item  $\alpha$ , this does not imply that if there is a further notification  $\gamma$  of change, that removes  $\beta$ , then we must recover and restore the information item  $\alpha$ .

In the words of Dragoni and Nissan (2004, p. 286):

An important follow-up of research [into belief revision] has been the sharp distinction made between "revision" and "updating". If the new information reports of some modification in the current state of a dynamic world, then the consequent change in the representation of the world is called "updating". If the new information reports of new evidence regarding a static world whose representation was approximate, incomplete, or erroneous, then the corresponding change is called "revision". With revision, the items of information which gradually arrive all refer to the same situation, which is fixed in time: such is the case of a criminal event whose narrative circumstances have to be reconstructed by an investigative team or by fact finders (a judge or a jury). In contrast, with updating, the items of information which gradually arrive refer to situations which keep changing dynamically: the use for such items of information is to make the current representation as corresponding as possible to the current state of the situation represented.

This applies, for example, to a flow of information on a serial killer still on the loose. For example, Cabras (1996) considers the impact of the construal in the mass media in Italy of a criminal case, on the investigation itself, and on the "giudici popolari" to whom the case could have gone (this is the "domesticated" version of a jury at criminal trials at a "Corte d'Assise" [the Assizes] in Italy, where trained judges are in control anyway). The case she selected is that of the so-called "Monster of Foligno", a serial killer who used to leave messages between crimes. A man eventually implicated himself by claiming that he

#### 2.1 Modelling Adjudicators' Shifts of Opinion

was the killer. He was released in due course, and later on, the real culprit was found. We didn't try our formalism on this case, yet arguably investigations on serial killers are a good example of updating instead of revision,<sup>7</sup> vis-à-vis recoverability in the sense we explained  $[\ldots]$ .

The issue of sources of information (or indeed of prediction) with different degrees of reliability has been discussed by Pollock (2010, p. 12), concerning defeasible reasoning<sup>8</sup> as being represented in *inference-graphs*:

For example, let P be "Jones says that it is going to rain", R be "Smith says that it is not going to rain", and Q be "It is going to rain". Given P and Q, and supposing you regard Smith and Jones as equally reliable, what should you believe about the weather? It seems clear that you should withhold belief, accepting neither Q nor  $\sim$ Q.

But now, suppose we do not regard Jones and Smith as equally reliable. E.g., Jones is a professional weatherman, with an enviable track record of successfully predicting whether it is going to rain. Suppose his predictions are correct 90% of the time. On the other hand, Smith predicts the weather on the basis of whether his bunion hurts, and although his predictions are surprisingly reliable, they are still only correct 80% of the time. Given just one of these predictions, we would be at least weakly justified in believing it. But given the pair of predictions, it seems clear that an inference on the basis of Jones' prediction would be defeated outright. What about the inference from Smith's prediction. Because Jones is significantly more reliable than Smith, we might still regard ourselves as weakly justified in believing that it is going to rain, but the degree of justification we would have for that conclusion seems significantly less than the degree of justification we would have in the absence of Smith's contrary prediction, even if Smith's predictions are only somewhat reliable. On the other hand, if Smith were almost as reliable as Jones, e.g., if Smith were right 89% of the time, then it does not seems that we would be even weakly justified in accepting Jones' prediction. The upshot is that in cases of rebutting defeat, if the argument for the defeater is almost as strong as the argument for the defeatee, then the defeatee should be regarded as defeated. This is not to say that its degree of justification should be 0, but it should be low enough that it could never been justified simpliciter.<sup>9</sup> On the other hand, if the strength of the argument for the defeater is significantly less than that for the defeatee, then the degree of justification of the defeatee should be lowered significantly, even if it is not rendered 0. In other words, the weakly justified defeaters acts as diminishers. So this

<sup>&</sup>lt;sup>7</sup> Another example that befits updating, rather than revision, is when, in the series of messages from the Red Brigades while they were holding prisoner the Italian politician Aldo Moro (who was abducted on 16 March 1978 from his car in Rome, the five men of his escort having been killed), there was a rather abnormal message which stated that Moro's body had been dumped in a lake in the mountains of central Italy, Lago della Duchessa. The bottom of the lake was searched by law enforcement staff, who found instead the body of a shepherd (it was an unrelated crime). But then the series of messages from the Red Brigades started again, with no reference to their prank of sending law enforcement agents scuttling to Lago della Duchessa.

<sup>&</sup>lt;sup>8</sup> "Nonmonotonic reasoning, because conclusions must sometimes be reconsidered, is called *defeasible*; that is, new information may sometimes invalidate previous results. Representation and search procedures that keep track of the reasoning steps of a logic system are called *truth maintenance systems* or TMS. In defeasible reasoning, the TMS preserves the consistency of the knowledge base, keeping track of conclusions that might later need be questioned" (Luger & Stubblefield, 1998, p. 270).

<sup>&</sup>lt;sup>9</sup> In Latin *simpliciter* means "simply", but here it has the following technical sense: "Justification simpliciter requires the degree of justification to pass a threshold, but the threshold is contextually determined and not fixed by logic alone." (Pollock, 2010, p. 8).

seems to be a fairly non-controversial case in which varying degrees of justification affect the defeat statuses of conclusions in inference-graphs.

# 2.1.3 Further Considerations, and Suggestions of Possible Refinements

An epistemologist, Laurence BonJour (1998, originally 1985), introduced five conditions for coherence, the first one being: "A system of beliefs is coherent only if it is logically consistent" (ibid., p. 217 as reprinted in 1998). While introducing the first condition, he remarked in note 7: "It may be questioned whether it is not an oversimplification to make logical consistency in this way an absolutely necessary condition for coherence. In particular, some proponents of relevance logics may want to argue that in some cases a system of beliefs which was sufficiently rich and complex but which contained some trivial inconsistency might be preferable to a much less rich system which was totally consistent..." (BonJour, ibid., p. 230). *Relevance logics* in this context are not necessarily very relevant to the concept of "relevance" in the judiciary parlance (in which sense, the term has to do with the admissibility of evidence as a matter of policy). See Section 4.6.3 on relevance logics.

Among the requirements or desiderata for a distributed belief revision framework, in Dragoni and Nissan (2004) we listed the desirability of the mechanism also displaying sensitivity to the syntax. Consider Fig. 2.1.3.1. Is it really necessary to consider different, yet logically equivalent formulations of set of propositions, to be equivalent when the syntactic difference represents a difference in presentation? How you present information in court may make or break your case. You do not want the information to be introduced in a clumsy manner. Are redundancies of information of no value at all?

Moreover, is even a local, peripheral inconsistency enough to invariably ditch a witness statement? The discovery of a pair of items of information in contradiction inside a rich-textured, articulate witness, should not necessarily invalidate the informational content of the entire deposition. That is to say: a set of propositions is not equivalent to their logic conjunction. This is a critique of what in belief revision research is known as "Dalal's Principle", by which two logically equivalent pieces of information should produce exactly the same revision. Arguably, Dalal's Principle is unworkable in practice, if we are to apply belief revision to the modelling of reasoning in court on incoming evidence, because it takes cognitive

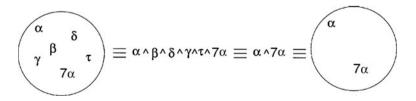


Fig. 2.1.3.1 An example of syntactic equivalence. (Based on a drawing by Aldo Franco Dragoni.)

arbitrariness to delimit the set. How fine-grained are the details to be? What about cross-examination tactics?

Desiderata include criteria for deciding about inconsistency containedness. How local is it to be? When can we just cut off the NOGOODSs and retain the rest? Within the architecture described earlier in Section 2.1.2, this would belong in the phases of recalculation of source reliability and information credibility. One more problem is *confabulation* in depositions (i.e., witnesses infer rather than merely reporting; this may be because, e.g., witnesses discussed their recollections, and this had an effect on what they later think they remember). In particular, if it was two eyewitnesses who saw the same event and they then discussed it, this may influence what they later claim to remember; this is sometimes referred to as *memory conformity*.

Whereas our present framework is too abstract to take narrative aspects into account, arguably our system could be a building block in an architecture with a complementary component to deal with narratives. In particular, a witness who reconstructs by inference instead of just describing what was witnessed is confabulating; this is precisely what traditional AI systems from the 1980s, whose function was to answer questions about an input narrative text, do when information does not explicitly appear in the text they analyse. Within the compass of this paper, we cannot address these issues. Nevertheless, in Dragoni and Nissan (2004, p. 296) we claimed that the formal framework described is as good as other metre-based formal approaches to modeling juror decision making, to the extent that such models do not explicitly handle narrative structure.

Yet a major problem stemming from the adoption of Dempster-Shafer is that it is apparently tilted towards *confirmationism* instead of *falsificationism*. Confirmationism<sup>10</sup> is also referred to sometimes as *cognitive dissonance*,<sup>11</sup> and what is meant is a bias of human decision-makers in favour of learning such information that confirms their preconceptions, over information that contradicts these.

Take the case of a terrorist or organised crime "supergrass" informing about accomplices and testifying in court. In Italy, such "pentiti" or "superpentiti" are not considered to be reliable until further proof is obtained; the supergrasses reliability is taken to be greater to the extent that greater is the extent to which the deposition matches further evidence. A shortcoming of this is that part of the deposition may be false and unaffected by such further proof. Dempster-Shafer, as described in the framework of the architecture introduced in Dragoni and Nissan (2004), falls short of not being tricked into unduly increasing the reliability of such an untruthful witness. Dempster-Shafer also tends to believe information from a source until contrary evidence is obtained. Such epistemological considerations affect not only

<sup>&</sup>lt;sup>10</sup> On *confirmation bias* as occurring in the police interrogation rooms, see e.g. Kassin, Goldstein, and Savitsky (2003), Meissner and Kassin (2002), and Hill, Memon, and McGeorge (2008).

<sup>&</sup>lt;sup>11</sup> This name for the concept was spread by a book by Leon Festinger (1919–1989), *A Theory of Cognitive Dissonance* (Festinger, 1957).

formal representations; they also affect the way, for example, the mass media may convey a criminal case or the proceedings in court. They may also affect what justice itself makes of witness statements made by children (i.e., child testimony). None of these issues is addressed in the formalism presented in Section 2.1.2.

The multi-agent approach described is appropriate when a flow of new items of information arrives from several sources, and each {information, source} pair has an unknown credibility degree. This befits the gradual delivery of the evidence in court, when a juror's opinion (or the opinion of the judges in a bench trial) is shaped concerning evidentiary strength. A formalism for dealing with evidentiary strength has been presented in Shimony and Nissan (2001); see Section 2.6 below.

### 2.1.4 Devices of Manipulation of Incoming Information in Court

The approach to incoming information could be refined, with respect to the idealised conditions of Dragoni and Nissan (2004), presented in Section 2.1.2 above. In the present Section 2.1.4, we suggest factors to take into account, such as rhetorical devices affecting the timing at which information arrives, in the courtroom.

Let us point out first of all that the acceptance of, or resistance to, incoming information (and attempts at persuasion)<sup>12</sup> is of course a wider topic than the trial by jury. Consider this assessment of the character of Charles I, King of England (the one who was beheaded, which was in 1649). In some respects he was a sound strategist during the Civil War. Yet he had flaws "which had a detrimental effect upon his generalship". Namely: "He was a bad judge of men, the readiness with which he listened to the accusations against Rupert is ample evidence of this". Moreover: "He compounded this weakness with a habit of agreeing with whoever last spoke to him – a fatal tendency, bearing in mind the poor quality of many of his advisers" (Young & Holmes, 1974, p. 336 in the 2000 edn.). This shows the influence of the makeup of the rationality and temperament of an individual decision-maker.

In a treatise on persuasion in the courtroom, Guglielmo Gulotta (one of Italy's leading forensic psychologists, who also intervenes in court in his capacity as a barrister) discusses the tactics of *inoculation*, which aims at making the recipient of the message resistant beforehand to the attempts at persuasion which the other side may be expected to enact (Gulotta, 2004, section 18.4, pp. 135–136). The following is quoted in my own translation:

<sup>&</sup>lt;sup>12</sup> In psychology, studies of *persuasion* include, e.g., Chaiken (1987), Chaiken, Liberman, and Eagly (1989), Chaiken, Wood, and Eagly (1996), Clark and Delia (1976). In the given disciplinary context of psychology, "the study of persuasion concerns the variables and processes that govern the formation and change of attitudes" (Chaiken et al., 1996, p. 702). *Message-based persuasion* is one strand of such research. Other traditions of persuasion research include "the influence of individuals' own behaviors and messages on their attitudes, social influence effects in group contexts and, to a lesser extent, the attitudinal effects of mere or repeated exposure to attitude objects and the selective effects of attitudes on information processing" (ibid.). Also see Cialdini (1993) about *influence*. Papageorgis and McGuire (1961) discussed *immunity to persuasion* produced by pre-exposure to weakened counterarguments. Persuasion is also the subject of, e.g., Stiff (1994), Sawyer (1981), Petty and Cacioppo (1986) and Petty, Wegener, and White (1998).

[Inoculation] suggests to anticipate, in an mitigated form, the theses which one's adversary will presumably develop, and to facilitate the elaboration of objections in such a way that, once the attempts at persuasion will be carried out, the recipient of the message will already possess elements to repel them. Research indicates that this effect is not merely due to warning the audience about forthcoming persuasory manoeuvres, but depends on the fact that the subject is enabled to anticipate his own reflections on the matter. This tends to neutralize the *recency* effect, by privileging the *primacy* effect.

Another way to manipulate primacy and recency is by *stealing thunder*, and in particular *revealing the worst first* is one way to accomplish this (Williams & Dolnik, 2001; Dolnik, Case, & Williams, 2003). "Sometimes, in order to cause 'immunity', a defence counsel would say things which discredit his client. This may be done, for example, by being the first one to reveal something negative for one's client, knowing that the other side may use this later. With mock juries, this technique appeared to be especially useful, as it mitigates, in the eyes of factfinders, its negative meaning, based on the principle that old news are no news" (Gulotta, 2004, p. 136, fn. 4 [my translation], citing Williams & Dolnik, 2001; Dolnik et al., 2003).

What does this mean, in respect of AI modelling? Rhetorical devices that, short of lying, manipulate perception have already come to the attention of AI research by the early 1980s. A program, IMP, was devised (Jameson, 1983), that was explicitly concerned with the relation between truth and manipulative presentation. IMP may try to mislead on purpose, without actually lying. A dialogue system, it impersonates a real estate agent, trying to rent moderately priced furnished rooms on the Hamburg market. Well-informed about the market, IMP assumes that the customer possesses the same general information, against which the customer assesses the qualities of the room considered. The program tries to convey a good impression about the goods, and about itself as well. It would not volunteer damaging information, unless a direct, specific relevant question is made. IMP has a goal of maintaining a neutral image of itself and an impression of completeness for its own answers; on occasion, it reportedly simulated insulted surprise if an intervening question by the customer seems to imply (by detailed questioning) that IMP is concealing information.

Having closed this digression, let us make some considerations about procedures and jurisdictions, before we turn to an encompassing view of attempts at devising a formal account of juror's decision-making, within jury research.

### 2.1.5 Remarks About Procedures and Jurisdictions

In this book, we are going to make the occasional comment about procedural issues. As these are not central to the thrust of this book, we do not really delve into these, but then the risk arises that what we do say about procedural issues would be overly simplistic. For example, take the rules of hearsay. It is essential to realise the difference among jursidictions, because the rules of admissibility of hearsay evidence vary substantially between the United Kingdom and the United States, and even between Scotland and England.

Therefore, readers should realise that whenever we do broach procedural issues, such statements are not to be applied sweepingly: such matters are jurisdiction

specific. The consequences of this for AI development is that oftentimes, applications will not be portable across jurisdictions. A project whose end-product is realistically expected to be used by legal professionals will need to focus on a specific jurisdiction, and if anything it will be useful to find out beforehand whether and how choices made will affect usefulness in some other jurisdiction, if this is of interest.

In his introduction to Hastie (1993), Hastie points out: "One development in traditional jurisprudential scholarship is a candidate for the role of a general theory of juror decision making; namely the utilitarian model of rational decision making that has been imported into jurisprudence from economics" (p. 4). Optimal decision making has been modelled, in the literature, not just for the role of the juror, but for the judge, attorney, police, and perpetrators of criminal behaviour, as well as the general principles of the legislator or of a judicial system.

For example, for the purpose of explaining why, according to economic rationality, it makes sense that hearsay be not admitted as evidence in court – incidentally, an expert system dealing with the hearsay rule is the Hearsay Rule Advisor (Blackman, 1988; MacCrimmon, 1989) – legal scholars Shapira (2002) and Callen (2002) discuss what went wrong in the reasoning of Shakespeare's character of Othello, when Othello believed rumours about Desdemona having supposedly betrayed him. Also see Stein (2001). By the way: the *hearsay rule* (in English and American law) "requires a court to exclude any written or oral statement not made in the course of the proceedings which is offered as evidence of the correctness of the matter asserted. A statement which is relevant independently of the real intention of the speaker [e.g., a contractually binding statement] or the truth of what is stated [e.g., an allegedly libellous statement] is not adduced for a testimonial purpose and is therefore outside the scope of the rule" (Pattenden, 1993, p. 138). This is not to say that in some jurisdictions hearsay is inadmissible; e.g., McNeal (2007) discusses hearsay at the Iraqi High Tribunal, in consideration of the legacy of international tribunals for war crimes or crimes against humanity. "The IHT allowed hearsay evidence and the reading of ex parte affidavits as evidence, two of the most criticized practices of the Nuremberg Tribunal. The IHT also allowed the admission of testimony by anonymous witnesses, a legacy of the Yugoslavia Tribunal which has since been rejected by that same court" (ibid., from the abstract).

Unlike the typical situation in the jurisdictions of Continental Europe, which expect the judge to provide a motivation for the adjudication and thereby rationalises his or her intimate conviction about how to find in the case at hand,<sup>13</sup> juries in Anglo-Saxon jurisdictions do not provide a motivation,<sup>14</sup> and therefore the rationale for the finding is not made explicit. By contrast, in Anglo-American jurisdiction there is an emphasis on abiding by the rules about how the evidence is acquired.

<sup>&</sup>lt;sup>13</sup> For example, Iacoviello's book (1997) discussed how the Court of Cassation in Italy check the motivation of the sentence given in criminal trials heard by the lower courts in Italy. Iacoviello (2006) invoked clearer rules about flaws in the motivation, and the effect they have in terms of mistrial.

<sup>&</sup>lt;sup>14</sup> It is sometimes said that this is because the jury replaces the medieval ordeal, in which the adjudication was taken to be supernatural.

Alex Stein's *Foundations of Evidence Law* (2000) provides a systematic examination of the underlying theory of evidence law (i.e., which evidence is admissible, and how the risk of error is apportioned) in Anglo-American legal systems. Stein adopted an interdisciplinary approach, which combines probability theory, epistemology, economic analysis, and moral philosophy. In Stein's Chapter 5, an economic analysis of evidence law is introduced:

This analysis makes an unqualified utilitarian assumption (subsequently softened in Chapters 6 and 7) that evidential rules and doctrines are geared towards cost-efficiency. Cost-efficiency requires adjudicators to minimize the aggregate cost of accuracy-enhancing procedures and fact-finding errors. Chapter 5 examines the evidential mechanisms to attain this goal. These mechanisms enhance cost-efficiency by eliminating the problem of private information and the misalignment between the private litigants' incentives and the social good. These mechanisms include decision rules that determine the burdens and the standards of proof.<sup>15</sup> as well as different process rules that determine what evidence is admissible and what fact-finding methodologies are allowed. Decision rules minimize the aggregate cost of accuracy and errors by applying a different technique. These rules attach fact-finding methodologies that are more meticulous and more expensive to adjudication in which the cost of error is relatively high. Adjudication in which the cost of error is relatively low is equipped with more rudimentary and correspondingly inexpensive fact-finding methodologies. Mechanisms geared towards cost-efficiency also include credibility rules. These special rules elicit credible signalling from litigants with private information through adjustment of penalties and rewards.

Chapters 6 and 7 shift from utility to fairness and, correspondingly, from economics to morality. They examine the apportionment of the risk of fact-finding error in criminal and civil adjudication, respectively. These chapters identify and analyse two fundamental precepts: the equality principle that controls the apportionment of the risk of error in civil litigation; and the 'equal best' standard that needs to be satisfied in every criminal case in order to convinct the accused. These precepts derive from political morality. [...] (Stein, ibid., p. xii).

### 2.1.6 A Taxonomy of Quantitative Models

Optimality for judicial decision making is too strong an assumption (Hastie, 1993, p. 5). The research in Hastie (1993) "focuses on the manner in which jurors behave before they enter the social context of deliberation in criminal felony cases" (ibid., p. 5), with "at least four competing approaches represented" among behavioural scientists' descriptive models of decision making (ibid., p. 10), namely, such that are "based on probability theory, 'cognitive' algebra, stochastic processes, and information processing theory" (ibid., pp. 10–11). Bayes' theorem is involved, in the former, for descriptive purposes in Hastie (1993) – being applied to the psychological processes in which a juror is engaged – rather than in prescribing how to evaluate evidence to reach a verdict, "or to evaluate and improve jurors' performance" (ibid., p. 12).

"The second class of approaches to juror's decision making fits among such psychological theories of mental processes that are couched in the form of algebraic

<sup>&</sup>lt;sup>15</sup> Cf. Bex and Walton's (2010) "Burdens and Standards of Proof for Inference to the Best Explanation". Also see Atkinson and Bench-Capon (2007a).

equations (Hastie, 1993, p. 17), with evidence being combined according to a weighted average equation" (Nissan, 2003f). "As in the Bayesian model, we are dealing with a single meter in which the results of all the subprocesses are summarized in a current belief and in which the ultimate 'categorical' verdict decision is based on the comparison of the final belief meter reading to a threshold to convict" (Hastie, 1993, p. 19), but belief updating in the algebraic approach is additive instead of multiplicative as in Bayesian models, and moreover extreme judgments are adjustable instead of final. "Stochastic process models are the third family; they differ from the previous two in that the larger process is assumed to behave in a random fashion, and what is probabilistic is state transitions over time. The fourth family adopts the information processing paradigm from cognitive psychology; they are typified by the room they make for mental representations, memory activation, elementary information processes, an executive monitor, and a specific cognitive architecture" (Nissan, 2003f).

Such categories of models are concerned with evaluating evidential strength (e.g., Shimony & Nissan, 2001; see Section 2.6 below). The following is quoted from Michon and Pakes (1995):

One key factor in the criminal justice procedure is the assessment of the 'strength of evidence'. Traditionally this has been a major topic in legal psychology (Pennington and Hastie, 1981; Holstein, 1985; Hastie, 1993). Strength of evidence is obviously involved in assessing likelihoods of the outcome of criminal trials and demands for pre-trial custody.<sup>16</sup> Several models have been proposed for describing how judges and jurors represent and evaluate the complex and often ambiguous information that is presented in a criminal trial. [...] A useful distinction can be made between bottom-up and top-down approaches.

## Namely (Michon & Pakes, 1995):

Bottom-up approaches take the evidence as piece-by-piece information. Each piece of information may cause the decision-maker to adjust his or her belief in the guilt or innocence of the suspect. In this case judgement formation is treated as a discrete, step-by-step process that can be logically described. Several models of this sort have been proposed (Schum and Martin, 1982; Thomas and Hogue, 1976). They can be characterised as 'fact-driven' because the actor in these models is supposed to be passive when it comes to the structuring and interpretation of the information presented. The actor performs a series of belief adjustments on the basis of factual information alone.

By contrast to such *fact-driven* models, there is a category of models that are driven by a hypothesis about the most likely narrative scenario (Michon & Pakes, 1995):

In contrast, top-down models can be characterised as 'hypothesis-driven'. In the latter models, the decision-maker attempts to build a cognitive representation of what happened. This representation is assumed to have the structure of a narrative (Bennett and Feldman, 1981). Pieces of evidence are selected and weighed in such a fashion that they support the most likely scenario of what may have actually happened. Judgements in these models

<sup>&</sup>lt;sup>16</sup> An example of the fallacies associated with subjective estimates of the likelihood of future things, is more clearly seen when it comes to how *post factum* one reports one's own evaluation of the likelihood beforehand. See Fischhoff and Beyth's (1975) ''I Knew It Would Happen'': Remembered Probabilities of Once-Future Things', as well as Merton's (1948) 'The Self-Fulfilling Prophecy'.

are not formed by weighing each piece of information separately, but come about when a substantial proportion of all the evidence is processed and represented in a coherent explanatory framework (Schank, 1986). The judgement is then based on this representation of the body of evidence as a whole.

*Bayesian* models are typical among *probabilistic* models, as being part of *belief updating* models, and these in turn are a quite conspicuous class of fact-driven models (ibid.):

A major example of the bottom-up or fact-driven approach is the Bayesian framework. [...] A decision-maker starts out with a prior probability that a certain event — a criminal action by a certain defendant - occurred. This probability is expressed as a likelihood ratio - that is, the ratio between the likelihood that the suspect is guilty divided by the likelihood that the suspect is innocent. When a new piece of evidence is presented, it may alter the prior likelihood ratio into a posterior probability concerning the event. When all the information is processed, a final likelihood concerning the occurrence of the event is obtained. The Bayesian approach is one particular instance of a class of belief updating models. Other models of this kind use weighed averages which determine the impact of pieces of evidence. Each new piece of evidence is assigned a value. The sign of this value is dependent on whether it implies guilt or innocence of the suspect and its weight is dependent on how much importance the piece of evidence is given. The main difference between Bayesian models (such as Schum and Martin, [1982]) and weighed average models is that in the Bayesian approach the revision of beliefs is modelled by a multiplicative computation. In the weighed average models, this computation is additive. Both models have been criticised as incomplete and incorrect (Pennington and Hastie, 1981; Einhorn and Hogarth, 1985). Both have, however, inspired a great deal of research concerning judgement formation in social and cognitive psychology, not only in the legal context but in many other contexts as well.

In Table 2.1.6.1, we contrast the Bayesian updating model, the algebraic sequential averaging model, and the stochastic Poissonian process model. Remember that in the latter, what is probabilistic is the state transitions in time.

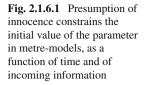
The parameter's range is between "not guilty" and "guilty", and because of the presumption of innocence, the initial value of the parameter must initially be on the former value. There is then a cycle by which new items of evidences are presented in court, and later on, the lawyers present their arguments. At each such step of new

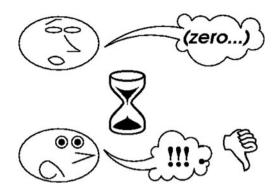
	Table 2.1.0.1 11	autional metre models	
Which model	Bayesian updating model	Algebraic sequential averaging model	Stochastic Poissonian <sup>17</sup> process model
Which parameter	Probability of guilt	Opinion	Weight of the evidence
Initial value	Prior probability	Initial "anchor" <sup>18</sup>	Initial opinion
Main operator	Multiplication	Sum	Weight adjustment

Table 2.1.6.1 "Traditional" metre models

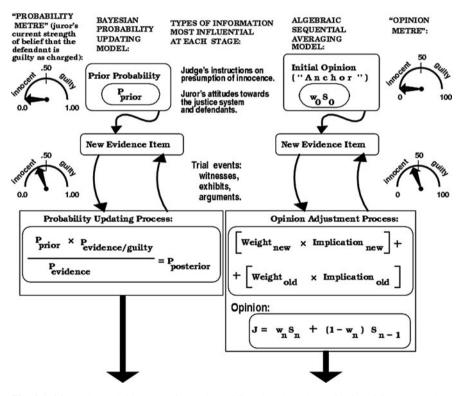
<sup>&</sup>lt;sup>17</sup> An intuitive explanation of the term is that, e.g., bus arrivals are Poissonian.

<sup>&</sup>lt;sup>18</sup> By "anchor", in the algebraic sequential averaging model, opinion is meant.

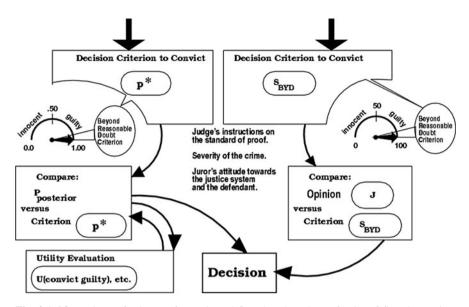




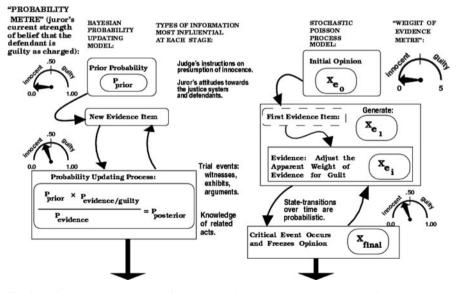
information arriving, there is the possibility that the value of the parameter be modified. Therefore, it can be said that the parameter we have been considering varies along the axis of time. See Fig. 2.1.6.1. The flowcharts in Figs. 2.1.6.2, 2.1.6.3, 2.1.6.4, and 2.1.6.5 contrast the metre-models.



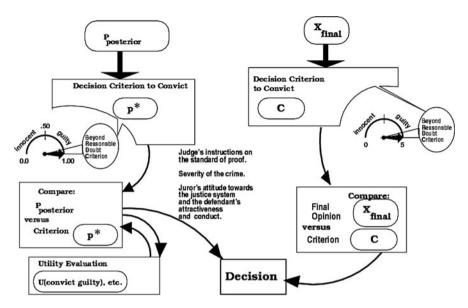
**Fig. 2.1.6.2** Redrawn initial part of a coalesced flowchart based on of pairs of flowcharts given in Hastie's introduction in Hastie (1993) for the Bayesian probability updating model, and the algebraic sequential averaging model of how jurors supposedly make their mind gradually, as the evidence is being delivered in court



**Fig. 2.1.6.3** Redrawn final part of a coalesced flowchart based on of pairs of flowcharts given in Hastie's introduction in Hastie (1993) for the Bayesian probability updating model, and the algebraic sequential averaging model of how jurors supposedly make their mind gradually, as the evidence is being delivered in court



**Fig. 2.1.6.4** Redrawn initial part of a coalesced flowchart based on of pairs of flowcharts given in Hastie's introduction in Hastie (1993) for the Bayesian probability updating model, and and the stochastic Poisson process model of how jurors supposedly make their mind gradually, as the evidence is being delivered in court



**Fig. 2.1.6.5** Redrawn final part of a coalesced flowchart based on of pairs of flowcharts given in Hastie's introduction in Hastie (1993) for the Bayesian probability updating model, and and the stochastic Poisson process model of how jurors supposedly make their mind gradually, as the evidence is being delivered in court

# 2.1.7 An Excessive Focus on Juries?

There is a caveat, apart from the limitations of quantitative models of jury decisionmaking. The excessive focus on juries is itself problematic. "Modelling judicial decision-making applies to both trained factfinders (trained judges in bench trials), and – in countries where there is a jury system – lay factfinders, i.e., jurors. Yet, there is much more that deserves attention, than trial by jury" (Nissan & Martino, 2004b).

Bench trials are such trials that it is the judge or judges, not a jury, who return a verdict. In the words of a British legal scholar, William Twining (1997): "[P]roblems of proof, information handling, and 'evidence' arise at all stages of legal processes" (ibid., p. 443). "There is also growing realisation that it is misleading to treat the contested trial, especially the contested jury trial, as the only or the main or even the paradigm arena in which decisions about questions of fact are taken, even in the United States. 'The jury model' still dominates much American evidentiary discourse and has an unfortunate effect on satellite fields, such as the agenda for psychological research into evidentiary problems" (ibid., p. 444).

"A striking example is the recent empirical work on the role of stories in fact-finding, which treats contested jury trials as the paradigm: e.g. [Bennett & Feldman (1981)]; and the important 'story model' of Nancy Pennington and Reid

Hastie (1986, 1988, 1992, 1993),<sup>19</sup> which is a by-product of jury research [in Hastie et al. (1983), Hastie (1993)]; *cf.* the distorting effect of the jury model on

Emplotting items of information into an explanatory narrative is also a subject of debate concerning historical explanation. In the journal *History and Theory*, David Carr's (2008) 'Narrative Explanation and Its Malcontents' gives this general example about how we figure out narrative explanations (ibid., pp. 19–20):

Suppose that on a busy city street we see a young man carrying a large potted plant that almost obscures his view, running so fast that he risks colliding with other pedestrians, and shouting the name of a woman in a very loud voice. When someone like this attracts our attention, his action puzzles us. We want to know why he's behaving in this strange way. We seek an explanation.

We learn that he has returned home to find a note from his girlfriend with whom he shared his apartment, but with whom he had been quarreling; indeed she had decided to leave him and move out, and in fact had removed her belongings and is gone. The man was shaken and distraught. Then he noticed that she left behind her favorite plant, and learned from a neighbor that she had left only a few minutes ago and is walking in the direction of a friend's apartment. Seizing on the plant as a pretext to find her and beg her to return, he picks it up and runs into the street, hoping to catch up with her.

Most of us would be satisfied with this account as an explanation of the man's action. We might ask for more details, but we don't really need them. Our perplexity goes away; our question has been answered. We now know why he did what he did.

What we have given is a typical narrative account. We have explained an action by telling a story about it. The narrative has all the standard elements of a good story: it has a central subject or protagonist. It has a beginning: we need not go any further back than his return to the empty apartment, though it helps to learn that the two had been quarreling before that. That sets the scene. The story has a middle, in which our hero reacts emotionally to the opening scene, assesses the situation with the help of some new information (that she had just left), and decides to take action. What he does then, running with the plant through the street and shouting his girlfriend's name, is where we came in, as it were. There is an element of suspense here: will he succeed? And the story has an end, even though we don't yet know exactly what it will be. He'll catch up with her or he won't. If he does, he'll be successful in winning her back, or he won't. But this range of alternatives, even though we don't know which of them will occur, is determined by the story so far. They belong to the story.

One thing to be noted about this explanation is that it is probably the same one that the man himself would give for his own action. Though we could have gotten this explanation from someone else, we could also have gotten it from him, if we had occasion to ask. This rather obvious fact suggests that the narrative mode is very close in form to the structure of action itself, from the agent's point of view. [...]

#### However (Carr, 2008, p. 21):

Of course, questions might arise about whether the man was telling the truth, especially if his story conflicted with another story — say, his girlfriend's story — of the same events. Here we would indeed have a legitimate reason to question the agent's narrative account of his own action. If it became important for some reason to settle the discrepancy, we might have to call in other witnesses and ask for their accounts of the same action.

<sup>&</sup>lt;sup>19</sup> Pennington and Hastie showed people a movie of a trial. They found that in order to make sense of the wealth of detail, the participants constructed stories about what happened. In another experiment, they found that when evidence was given in an order which made the story easy to construct, the participants were more likely to construct the same story. When the evidence was in story order, 78% of participants found the defendant guilty. Yet when the evidence was out of order, only 31% voted for the guilty verdict.

eyewitness identification research" (Twining, 1997, p. 444, fn. 16). In an edited volume published in Britain and entitled *The Jury Under Attack* (Findlay & Duff, 1988), McCabe felt able to ask, in the very title of an article: "Is Jury Research Dead?" (McCabe, 1988).

Juries may be swayed by a witness (typically, the alleged victim) that unwittingly recovers false memories,<sup>20</sup> with or without the help of a (misguided) psychotherapist; this danger is being increasingly recognised by legal psychologists, and the internationally most famous scholar carrying out such research is Elizabeth Loftus.<sup>21</sup> Over the years, results similar to hers have been obtained by independent teams, and she appears to be right in claiming that in various ways, human memory appears to be fluid. Whereas such a realisation may be troubling for the

This could take us from the everyday into the world of legal or juridical institutions, where someone — a judge or jury — would have to decide which account of the action to believe. A journalist might have similar concerns, wanting to reconstruct "what really happened" out of the varying accounts of the original events. Historians, too, often see their task as reconstruction of the past along these lines. Here the value of hindsight is that from its perspective it can reveal elements that augment the original story.

<sup>&</sup>lt;sup>20</sup> *False memories* of events that actually never happened in an individual's lifetime, and are nevertheless retrieved by that individual, have been researched by various scholars (especially concerning the susceptibility of children to the development of false memories), but are especially associated with research conducted by Elizabeth Loftus (http://www.seweb.uci.edu/faculty/loftus/). See, e.g., Brainerd and Reyna (2004), Garven, Wood, Malpass, and Shaw (1998), Howe (2005), Johnson, Hashtroudi, and Lindsay (1993), Lane and Zaragoza (2007), Strange, Sutherland, and Garry (2006), and Wade, Garry, Read, and Lindsay (2002), Wade, Sharman, Garry, Memon, Merckelbach, and Loftus (2007). In the late 2000s, Henry Otgaar has produced a steady flow of publications on false memories, especially in children (http://www.personeel.unimaas.nl/henry.otgaar/#Publications), e.g., Otgaar, Candel, and Merckelbach (2008), Otgaar, Candel, Merckelbach (2010), Otgaar, Candel, Scoboria, and Merckelbach (2010), Otgaar, Candel, Smeets, and Merckelbach (2010), Otgaar and Smeets (2010), Howe, Candel, Otgaar, Malone, and Wimmer (2010), and Otgaar (2009).

<sup>&</sup>lt;sup>21</sup> E.g., Loftus and Doyle (1997), Loftus (1979, 1981a, 1981b, 1987, 1997, 1998, 2002, 2003a, 2003b, 2005); cf. Loftus (1974, 1975, 1976, 1980, 1983, 1986a, 1986b, 1991, 1993a, 1993b); and see: Loftus and Greene (1980), Loftus and Ketcham (1994), Loftus and Pickrell (1995), Loftus and Rosenwald (1993), Loftus and Palmer (1974), Loftus and Hoffman (1989), Loftus and Loftus (1980), Loftus, Miller, and Burns (1978), Loftus, Weingardt, and Wagenaar (1985), Loftus, Loftus, and Messo (1987), Loftus, Donders, Hoffman, and Schooler (1989), Penrod, Loftus, and Winkler (1982), Garry, Manning, Loftus, and Sherman (1996), Mazzoni, Loftus, and Kirsch (2001), Wells and Loftus (1981), Schooler, Gerhard, and Loftus (1982), Castella and Loftus (2001), Nourkova, Bernstein, and Loftus (2004), and Harley, Carlsen, and Loftus (2004).

Neimark (1996) has written about Loftus. After teaching for 29 years at the University of Washington at Seattle, she moved to the University of California at Irvine. Nevertheless, her debunking the myth of "repressed memories" (cf., e.g., McNally, 2003) in relation to child abuse as alleged in the Jane Doe case had unpleasant consequences for the scholar (Tavris, 2002). She is much admired, while also controversial. Her results cannot be safely ignored.

justice system, its being inconvenient does not exempt from awareness and caution when accepting testimony.<sup>22</sup>

# 2.2 Reasoning About a Charge and Explanations: Seminal Tools from the Late 1980s and Their Aftermath

# 2.2.1 ECHO, and PEIRCE's Remake of the Peyer Case

#### 2.2.1.1 Thagard's 1989 Simulation of the Jury at the Peyer Case

The year 1989 saw the earliest publication of two projects, very different from each other, but which within a decade would prove to have been seminal for the modelling of reasoning about legal evidence. They are ECHO, and ALIBI. Let us start with ECHO. We point out right away that whereas the respective immediate purposes of both projects were theoretical, nevertheless a tool such as ECHO could be conceivably useful for lawyers or the prosecution using it while preparing a trial, in order to carry out a simulation of jury behaviour, based on the provisional state of the evidence and of the arguments intended or expected to be used.<sup>23</sup>

The input for ECHO simulations of a trial is constituted by sets of simple propositions, and these propositions include items of evidence, prosecution hypotheses, and defence hypotheses. Some other possible statements are identified as contradictions. Some other statements are instances of an *explains* function, followed by its parameter instances.<sup>24</sup> Such statements include prosecution explanations, defence explanations, and motives. Moreover, data are declared, within the input code, these data being testimonies uttered by the witnesses, thus being observed by everyone inside the courtroom.

The philosopher and cognitivist Paul Thagard first presented his ECHO project in a paper entitled 'Explanatory Coherence' (Thagard, 1989). He then went on using and refining ECHO, exemplifying it on different legal cases; e.g., see Thagard

<sup>&</sup>lt;sup>22</sup> A psychologist of law, Amina Memon, in her 2008 course handouts on *Psychology, Law and Eyewitness Testimony* at the University of Aberdeen in Scotland, stated: "The last 20 years has seen an explosion of research in the Psychology and Law field. The area that has grown more than any other is research on perceptions of credibility and accuracy of participants in the legal system. Psychologists have asked questions that have direct relevance in the legal arena: Are there reliable indicators of deception? Is it possible to persuade an innocent person that they may have committed a crime? Are juries biased? Can social pressure to remember result in false memory creation? [...]"

<sup>&</sup>lt;sup>23</sup> Code in the LISP programming language for ECHO is available at its originator's website. That is the website (http://cogsci.uwaterloo.ca) of Paul Thagard's computational epistemology laboratory.

<sup>&</sup>lt;sup>24</sup> The syntax (explains (H1 H2) E1) means that hypotheses H1 and H2 together explain evidence E1. Coding this in LISP is straightforward. "The relation *explains* is asymmetrical, but ECHO establishes a symmetrical link between a hypothesis and what it explains" (Thagard, 2004, p. 237).

(2004). In ECHO, neural computing<sup>25</sup> was (and is) resorted to, in order to model the reasoning of a jury on a murder case against California Highway police officer Craig Peyer, who was tried in San Diego for the murder of Cara Knott on 27 December 1986. The trial ended on 27 February 1988, in a hung jury.

Twenty-two young and attractive women (who therefore were like the victim) testified that Peyer had pulled them over. And it was known that Peyer had pulled the victim over, on the night of her death. The witnesses who had been pulled over by Peyer, also testified that Peyer talked to them longer than was necessary for just a ticket. Moreover, they were all pulled over near the stretch of road where the victim's body was found.

Thagard's ECHO is a tool which applies *abductive* reasoning. See, e.g., Walton (2004, 2010) about abductive reasoning. That in ECHO the modelling is of the reasoning of a jury, fits in the framework of jury research, a domain which, as mentioned earlier, is very active in North America. Using the Peyer case as his example in Thagard (1989), "Thagard encoded the problem into his ECHO system by treating each hypothesis and finding as a node in a neural network, with links connecting each hypothesis node to nodes corresponding to explained findings. Incompatible hypotheses were connected by inhibitory links. Thagard assigned each hypothesis the same initial confidence value, so we treated them similarly, giving each an initial confidence value of LIKELY" (Fox & Josephson, 1994, pp. 218–219).

#### 2.2.1.2 Thagard's Principles of Explanatory Coherence

Let us consider the technical aspects of using ECHO. ECHO is based on Thagard's theory of explanatory coherence, which consists of the following principles, quoted here from Thagard (2004, pp. 234–235):

*Principle E1. Symmetry.* Explanatory coherence is a symmetric relation, unlike, say, conditional probability. That is, two propositions, p and q, cohere each other equally.

*Principle E2. Explanation.* (a) A hypothesis coheres with what it explains, which can either be evidence or another hypothesis; (b) hypotheses that together explain some other proposition cohere with each other; and (c) the more hypotheses it takes to explain something, the lower the degree of coherence.

Principle E3. Analogy. Similar hypotheses that explain similar pieces of evidence cohere.

*Principle E4. Data priority.* Propositions that describe the results of observations have a degree of acceptability on their own.

Principle E5. Contradiction. Contradictory propositions are incoherent with each other.

*Principle E6. Competition.* If P and Q both explain a proposition, and if P and Q are not explanatorily connected, then P and Q are incoherent with each other. (P and Q are explanatorily connected if one explains the other or if together they explain something.)

*Principle E7. Acceptance.* The acceptability of a proposition in a system of propositions depends on its coherence with them.

<sup>&</sup>lt;sup>25</sup> Neural networks are the subject of Section 6.1.14 in this book.

How to determine coherence-based acceptance is not fully specified in those seven principles. There are various algorithmic solutions available (alternative to each other) that, along with those seven principles, can compute acceptance and rejection of propositions, on the basis of coherence relations.

## 2.2.1.3 Thagard's Neural Network Algorithm in ECHO

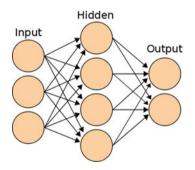
If the algorithm uses an artificial neural network (which is the case with ECHO), propositions are represented as *units*, i.e., artificial neurons. Pairs of these are linked by excitatory or inhibitory links. (Figure 2.2.1.3.1 shows an example of neural network. Neural networks are the subject of Section 6.1.14 in this book.)

- Coherence relations are represented by excitatory links.
- Inhibitory relations are represented by inhibitory links.

Explanatory coherence is dealt with as a constraint satisfaction problem to be solved. Positive constraints are the coherence relations established by explanation relations. Relations of contradiction or incompatibility between propositions are negative constraints. In the words of Thagard (2004, p. 235):

Acceptance or rejection of a proposition is represented by the degree of activation of the unit. The program ECHO spreads activation among all units in a network until some units are activated and others are inactivated, in a way that maximizes the coherence of all the propositions represented by the units.

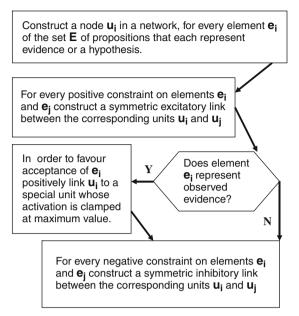
In Fig. 2.2.1.3.2, I drew a flowchart showing Thagard's neural network construction algorithm. This phase is followed by the initial activation and then by a cycle



**Fig. 2.2.1.3.1** An example of artificial neural network.<sup>26</sup> The network shown has one *hidden layer*. It is sandwiched between the input layer of nodes, and the output layer of nodes. Such nodes that are neither input nor oputput are called *hidden nodes*. In this example, all nodes of a given layer are connected to all nodes of the next layer (if any) and of the preceding layer (if any). Generally speaking, this need not be the case. In ECHO, only some of the possible connections are present, and the links are either inhibitory or excitatory

<sup>&</sup>lt;sup>26</sup> This image (http://en.wikipedia.org/wiki/File:Artificial\_neural\_network.svg) was made by C. Burnett and is in the public domain under the terms of the GNU Free Documentation License.

**Fig. 2.2.1.3.2** The neural network construction stage in Thagard's ECHO algorithm



of activations (these are called *propagations* of the neural networks, as shown in Fig. 2.2.1.3.3.

Thagard (2004, p. 236) explained the formulae of the cycle of activation in his neural network, according to one of the algorithms he has been using:

A number of equations are available for specifying how this updating is done (McClelland and Rumelhart, 1989). For example, on each cycle the activation of a unit *j*,  $a_j$ , can be updated according to the following equation:

$$a_i(t+1) = a_i(t)(1-d) + net_i(max - a_i(t))$$
 if  $net_i > 0$ ,

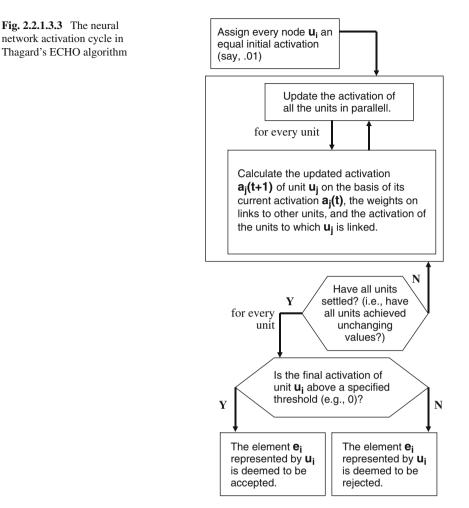
otherwise

$$net_i(a_i(t) - min)$$
.

Here *d* is a decay parameter (say, .05) that decrements each unit at every cycle, *min* is a minimum activation (–1), and *max* is maximum activation (1). Based on the weight  $w_{ij}$  between each unit *i* and *j*, we can calculate *net<sub>j</sub>*, the net input to a unit, by:

$$net_j = \sum_i w_{ij} a_i(t) \,.$$

Although all links in coherence networks are symmetrical, the flow of activation is not, because a special unit with activation clamped at the maximum value spreads activation to favored units linked to it, such as units representing evidence in the explanatory coherence model ECHO. Typically, activation is constrained to remain between a minimum (e.g., -1) and a maximum (e.g., 1).



#### 2.2.1.4 Thagard's Greedy Algorithm for Simulating a Trial

Thagard (2000a, p. 35) introduced a different algorithm for carrying out simulations by means of ECHO. This alternative algorithm does not require a neural network. It is quoted here from Thagard (2004, pp. 236–237); bear in mind that E is the set of elements each being a proposition, either evidence or a hypothesis. This algorithm belongs to the class of so-called *greedy* algorithms: this search algorithm is greedy because it never backtracks to reconsider its previous choices.

- 1. Randomly assign the elements of E into A (accepted) or R (rejected).
- 2. For each element e in E, calculate the gain (or loss) in the weight of satisfied constraints that would result from flipping e, i.e., moving it from A to R if it is in A, or moving it from R to A otherwise.

- 3. Produce a new solution by flipping the element that most increases coherence, i.e., move it from A to R or from R to A. In case of ties, choose randomly.
- 4. Repeat 2 and 3 until either a maximum number of tries have taken place or until there is no flip that increases coherence.

## 2.2.1.5 Josephson's Abducer, PEIRCE-IGTT

A team led by John Josephson reimplemented the Peyer case, using a different inference engine, PEIRCE-IGTT, also being an *abducer*, i.e., an engine for abductive reasoning.<sup>27</sup> "One point of comparison is that PEIRCE-IGTT can trace its reasoning process, and this reasoning process makes sense at every step. In contrast ECHO works by repeated cycles of propagating activations, and even if each spread of activation can be explained as a reasoning step that makes sense, ECHO took 78 cycles to settle, so its reasoning was much less direct. PEIRCE formed its conclusions quickly, and, in effect, produced an argument for innocence given the evidence. (In contrast ECHO leaned toward guilt, although it resisted complete rejection of the innocence hypothesis.)" (Fox & Josephson, 1994, p. 222).

Commenting on this passage in a previous draft of the present work, a legal scholar, Ron Allen, remarked about the "comparison of ECHO and PEIRCE-IGTT, one of which concludes the guy is innocent and the other guilty. The legal analyst, of course, wants to know which is right and why we should believe it" (in an e-mail of 14 April 2006).

Fox and Josephson (1994) go on explaining the workings of the tools: "It might be suggested that ECHO engages in a complex weighing of evidence in its attempt to maximize explanatory coherence, whereas PEIRCE makes too much of a small number of findings. We submit that PEIRCE's behaviour for the case was entirely reasonable. It considered all the evidence" (ibid., p. 222). "It could have found the case to be ambiguous and, like the jury, refused to come to a conclusion; but it did not. Instead it produced a conclusion, with a clear chain of reasoning leading to it" (ibid., p. 223).

According to the developers of PEIRCE (ibid., p. 223), the Peyer case used as an example

demonstrates that the fifth-generation [i.e., Machine 5] abductive-assembly strategy can generate chains of reasoning, and arrive at conclusions, even if all the hypotheses are given identical initial confidence values. The strategy makes good use of confidence differences if they are available, but it does not absolutely require them. It is able to solve a problem categorically, based on explanatory relationships and incomparabilities alone, or with the assistance of additional hypothesis interactions such as soft implications.

#### Moreover (Fox & Josephson, 1994, p. 223):

The Peyer example also illustrates how explanatory relationships can work synergistically with incompatibility relationships to reduce residual ambiguity. This is the phenomenon of *uncovered essentials*. What happens is that eliminating a hypothesis, based

<sup>&</sup>lt;sup>27</sup> Clearly the system PEIRCE was named after the philosopher Charles Sanders Peirce (1839– 1914), with whom the theory of abductive reasoning is mainly associated. An architecture for abductive reasoning was also described by Poole (1989).

on incompatibility with some proposition already accepted, eliminates a potential explainer for some finding, thereby allowing a rival explainer to stand up as superior. (This happens similarly for uncovered clear-bests and bests, where confidence is reduced, instead of the hypothesis being eliminated.) Thus, at a point in the processing where a finding is ambiguous (it has alternative explainers with no confident way to decide between them), the ambiguity may be broken or reduced by eliminating or downgrading of some of the rival explainers. [...] Moreover, the process of acceptance, leading to ambiguity reduction, followed by further acceptance and further ambiguity reduction, can potentially continue for many cycles, leading to a kind of spreading wave of ambiguity reduction as islands of high confidence are extended to cover data newly made unambiguous. We call this process *spreading disambiguation*.

The contribution of PEIRCE is to abductive reasoning within AI. This in turn is useful for modelling reasoning on judicial cases, as seen from exemplification on the Peyer case. The same case was used as an example by Ciampolini and Torroni (2004), who modelled it by using abductive logic-based agents and their ALIAS multi-agent architecture. "Agent behaviour in ALIAS can be expressed by means of the *Language for AbductIve Logic Agents*, LAILA. This language [enables the modelling of] agent actions and interactions in a logic programming style" (ibid., p. 260).<sup>28</sup>

Let us consider the steps of the default algorithm of PEIRCE-IGTT, which "presupposes that there is a means of generating or obtaining the findings for the case and a means of generating hypotheses to explain the findings" (Fox & Josephson, 1994, p. 216). Such "generated hypotheses must have initial confidence values, and they must have associations with the findings that each can explain" (ibid.). At the end of the algorithm, "either all findings have been accounted for, or there are no more hypotheses available to explain findings, or the only remaining hypotheses are too close in plausibility and explanatory power to decide between them" (ibid., p. 217).

Because of how the hytpotheses are categorised, "each pass through the loop portion of the algorithm further limits the confidence in any hypothesis newly included into the composite"<sup>29</sup> (Fox & Josephson, 1994, pp. 217–218). "Hypotheses may be

<sup>&</sup>lt;sup>28</sup> On abduction and logic programming, see Kakas, Kowalski, and Toni (1992, 1998), Toni and Kowalski (1995), Fung and Kowalski (1997), Eshghi and Kowalski (1989). On abductive logical models, also see sections 3.1 and 4 in Prakken and Renooij (2001), whereas Section 5 in that same paper is about argument-based reconstruction of a given case about a car accident. In MacCrimmon and Tillers (2002), Part Five comprises four articles on abductive inference as applied to fact investigation in law.

<sup>&</sup>lt;sup>29</sup> With reference to the RED-2 tool for abduction, the Josephsons' book states: "Logically, the composite hypothesis is a conjunction of little hypotheses, so, if we remove one of the conjuncts, the resulting hypothesis is distinctly more likely to be true because it makes fewer commitments. Superfluous hypothesis parts make factual commitments, expose themselves to potential falsity, with no compensating gain in explanatory power. To put it more classically: if hypothesis parts are treated as logical conjuncts, then an additional part introduces an additional truth condition to satisfy. Thus the hypothesis that is simpler (in not including an unneeded part) is more likely to be true. Thus the sense of parsimony we use here is such that *the more parsimonious hypothesis is more likely to be true*." (quoted from p. 84 in the same book: Josephson & Josephson, 1994).

Confirmed, Essential,<sup>30</sup> Clear-Best, Weak-Best, Guessed, Disbelieved (because of incompatibility), or Ruled-Out (because of a low confidence rating), and these judg-ments may be relative to Confirmeds, Essentials, Clear-Best, Weak-Best, or Guessed hypotheses" (ibid.). See the definitions in the following. The steps of the algorithm are quoted from Fox and Josephson (ibid., pp. 216–217):

- 1. Generate or obtain findings to be explained and generate hypotheses (with their confidence values and coverages).
- 2. Initialize the composite with any hypotheses predetermined to be in the composite (set up by the tool user who has decided to always include certain hypotheses or by the system user interactively while he or she explores alternative hypotheses).
- 3. When this algorithm is used in a layered-abduction machine,<sup>31</sup> expand expectations from higher levels (if a higher layer abductive conclusion has implications either positively or negatively for hypotheses at the current level). The expectations will cause the confidence values of the hypotheses in question to be adjusted. [...]
- 4. Propagate the effects of hypotheses initially accepted into the composite. This may rule out other hypotheses that are incompatible with those in the composite, or it may alter confidence values or other hypotheses that are implied by hypotheses in the composite.
- 5. Loop on the following, either until all findings are accounted for or until no more progress is made in extending the explanatory coverage.

 $<sup>^{30}</sup>$  Cf. in RED-2: "After parsimony criticism, a second process of criticism begins in which each hypothesis in the composite is examined to see if it is essential, that is, to see if part of what it explains can be explained in no other way. There are two ways to find essentials. The first is during the initial assembly process. If only one hypothesis offers to explain a finding on which attention is focused, that hypothesis is a *discovered essential*. The second way to discover essentials is that an attempt is made for each part of the composite hypothesis, not already known to be essential, to assemble a complete alternative hypothesis not including that part. If the attempt succeeds, it shows that there are other ways of explaining the same things, even though they may not be as good as the original. But if the attempt fails, it shows that there is something that has *no other plausible explanation* other than by using the hypothesis part in question [...] Note the distinction between hypothesis sparts that are nonsuperfluous relative to a particular composite, that is they cannot be removed without explanatory loss, and essential without which no complete explanations can be found in the whole hypothesis space. An essential hypothesis is very probably correct, especially if it was rated as highly plausible by its specialist" (Josephson & Josephson, 1994, pp. 84–85).

<sup>&</sup>lt;sup>31</sup> John R. Josephson, in the same book on p. 238, begins a chapter which "develops the hypothesis that perception is abduction in layers and that understanding spoken language is a special case"; it "present[s] a layered-abduction computational model of perception that unifies bottom-up and top-down processing in a single logical and information-processing framework. In this model the processes of interpretation are broken down into discrete layers where at each layer a bestexplanation composite hypothesis is formed of the data presented by the layer or layers below, with the help of information from above. The formation of such a hypothesis is an abductive inference process, similar to diagnosis or scientific theory formation."

#### 2.2 Reasoning About a Charge and Explanations: Seminal Tools

a. Find all Confirmed hypotheses and include them in the composite. A Confirmed hypothesis is (here) one that receives the highest possible confidence score (this is an optional feature that can be turned off by the system builder if top-scoring hypotheses should not be automatically included in the composite).

If Confirmed hypotheses are found, then propagate the effects to the latest inclusions and go back to the loop beginning, else continue.

- b. Find all Essential hypotheses<sup>32</sup> and include them in the composite.
   If Essential hypotheses are found, then propagate the effects of including them in the composite, and go back to the loop beginning, else continue.
- c. Find all Clear-Best hypotheses. To be a Clear-Best, a hypothesis must have a score higher than a given threshold and must surpass all other explanations for some finding by another given threshold. (Thresholds are established by the tool user at the time the system is built; they can be easily modified during or between cases; the tool provides defaults if no thresholds are specified.) If Clear-Best hypotheses are found, then propagate the effects of including them in the composite, and go back to the loop beginning, else continue.
- d. Find and include all the Weak-Bests. Here we may relax the criteria set for the Clear-Bests. This step is optional.If Weak-Best hypotheses are included in the composite, then propagate the effects and go back to the loop beginning, else continue.

End loop.

6. (Optional extended-guessing step) If there are still some unaccounted findings, attempt to guess among the remaining hypotheses that have not been ruled out. Guessing is accomplished by letting each unexplained finding vote for the highest rated hypotheses offering to explain it. This voting allows hypotheses to stand out from alternatives according to their power to help explain the unexplained remainder, if in no other way.

If any guessed hypotheses are included, then propagate the effects and go back to the loop beginning, else end.

## 2.2.1.6 Abductive Reasoning, and Inference to the Best Explanation

"In general, legal reasoning in trials such as those of Claus von Bülow's" – for which, see Section 2.2.1.7 – "can be characterized as inference to the best overall causal story" (Thagard, 2004, p. 231). Talking about "inference to the best overall

<sup>&</sup>lt;sup>32</sup> "In PEIRCE-IGTT, each pass through the loop leads to conclusions whose proper confidence is relative to the previous passes. A hypothesis judged to be Essential because a competing hypothesis was ruled out as a result of its being incompatible with a Clear-Best, is only an Essential hypothesis *relative* to Clear-Bests. An Essential from the first pass through the loop is more confidently an Essential than an Essential that is relative to Clear-Bests is. Similarly, any newly included hypothesis that is relative to guessing (that is, a hypothesis is included as a result of the effects of the inclusion of a guessed hypothesis) must be regarded as less confident than any hypothesis included before guessing began." (Fox & Josephson, 1994, p. 217).

causal story" is talking about a particular class of *inference to the best explanation*. The latter concept was formulated by the Princeton philosopher Gilbert Harman in his paper 'The Inference to the Best Explanation' (Harman, 1965). Arguably the idea goes back to Charles Sanders Peirce. "*Abduction*, or *inference to the best explanation*, is a form of inference that goes from data describing something to a hypothesis that best explains or accounts for the data. Thus abduction is a kind of theory-forming or interpretive inference" (Josephson & Josephson, 1994, p. 5). The name *abduction* in this sense was introduced by Peirce. One of the ways abduction has been described in artificial intelligence is as "modus ponens turned backwards". John Josephson (ibid., p. 5) prefers this pattern:

D is a collection of data (facts, observations, givens). H explains D (would, if true, explain D). No other hypothesis can explain D as well as H does. Therefore, H is probably true.

Wilbert Spooren (2001), reviewing Luuk Lagerwerf's linguistics doctoral dissertation (1998), explains as follows Lagerwerf's approach, next to a "mini-summary" entitled "Abduction revalidates flawed causality":

In abductive reasoning, causes are inferred from results. Logically this is invalid, as one can only validly infer a state of affairs Q from a state of affairs P if P is temporally prior to Q; nevertheless abductive reasoning is very common in everyday and scientific reasoning. Lagerwerf suggests that abductive causality is a case of epistemic causality (in which conclusions are inferred from arguments) that goes back to real world causality:

(5) (Q) Greta was ill, because (P) she stayed at home.

Being ill is a real world cause for a real world consequence 'staying at home'. In (5) the cause is inferred from the consequence. This then is a case of flawed causality. But Q is also a conclusion and P an argument. Since arguments are logically (if not temporally) prior to conclusions, the causality is revalidated.

Then, even though this is "an elegant treatment of abductive links" (Spooren, 2001, p. 138), Spooren wonders about "the extent to which Lagerwerf wants to equate epistemic causality with epistemic reasoning" (ibid.), and agrees with a statement in Lagerwerf (1998, p. 48) to the effect that: "Without abduction, epistemic interpretation is still possible" (Spooren, 2001, p. 139).

Scholars have discussed various modes of inference and considered their respective suitability as inference to the best explanation. For example, Harman himself considered in that respect *enumerative induction* (Harman, 1968). Another philosopher, Peter Lipton (2007), published 'Alien Abduction: Inference to the Best Explanation and the Management of Testimony'. His concern was with

how we decide whether to believe what we are told. Inference to the Best Explanation, a popular general account of non-demonstrative reasoning, is applied to this task. The core idea of this application is that we believe what we are told when the truth of what we are told would figure in the best explanation of the fact that we were told it. We believe the fact uttered when it is part of the best explanation of the fact of utterance. Having provided some articulation of this account of testimonial inference, the paper goes on to consider whether the account is informative and whether it is plausible.<sup>33</sup>

<sup>48</sup> 

<sup>&</sup>lt;sup>33</sup> Lipton (2007), from the abstract.

Peter Lipton also published the book *Inference to the Best Explanation* (Lipton, 2004: revised, augmented edition):

How do we go about weighing evidence, testing hypotheses, and making inferences? The model of 'inference to the best explanation' (IBE) — that we infer the hypothesis that would, if correct, provide the best explanation of the available evidence — offers a compelling account of inferences both in science and in ordinary life. Widely cited by epistemologists and philosophers of science, IBE has nonetheless remained little more than a slogan.<sup>34</sup>

And yet, computational research such as that conducted by Thagard, or by the Josephsons, is surely more than a slogan. It is something quite useful for modelling reasoning. In her own paper 'The Inference to the Best Explanation', Yemima Ben-Menahem (1990), a philosopher, remarked:

In a situation in which several explanations compete, is the one that is better qua explanation also the one we should regard as the more likely to be true? Realists usually answer in the affirmative. They then go on to argue that since realism provides the best explanation for the success of science, realism can be inferred to. Nonrealists, on the other hand, answer the above question in the negative, thereby renouncing the inference to realism.<sup>35</sup>

Her own approach in that paper was (ibid.) to

separate the two issues. In the first section it is argued that a rationale can be provided for the inference to the best explanation; in the second, that this rationale cannot justify an inference to realism. The defence of the inference rests on the claim that our standards of explanatory power are subject to critical examination, which, in turn, should be informed by empirical considerations. By means of a comparison of the realist's explanation for the success of science with that of conventionalism and instrumentalism it is then shown that realism does not offer a superior explanation and should not, therefore, be inferred to.

## 2.2.1.7 The von Bülow Trials

Thagard (2004) compares two models of causal inference: explanatory coherence in the ECHO tradition (which he prefers), and Bayesian networks,<sup>36</sup> applying both of them to the von Bülow trials. Claus von Bülow was tried for the episode in

<sup>&</sup>lt;sup>34</sup> Lipton (2004), from the publisher's blurb.

<sup>&</sup>lt;sup>35</sup> Ben-Menahem (1990), from the abstract.

<sup>&</sup>lt;sup>36</sup> A Bayesian network is a directed acyclic graph (i.e., a graph without loops, and with nodes and arrows rather than direction-less edges), such that the nodes represent propositions or variables, the arcs represent the existence of direct causal influences between the linked propositions, and the strengths of these influences are quantified by conditional probabilities. Whereas in an *inference network* the arrow is from a node standing for evidence to a node standing for a hypothesis, in a Bayesian network instead the arrow is from the hypothesis to the evidence. In an inference network, an arrow represents a relation of support. In a Bayesian network, an arrow represents a causal influence, and the arrow is from a cause to its effect. "Bayesian Networks (BNs) are an efficient and comprehensible means of describing the joint probability distribution over many variables over their respective domains. The variables are created and assigned a meaning by the compositional modeller, and their probability distributions are calculated from the combined response of the influences that affect them." (Keppens et al., 2005a, section 2.1). The classic book on Bayesian networks is by Judea Pearl (1988), the scholar who introduced and developed that formalism during the 1980s.

December 1980, when his wealthy wife, Martha von Bülow (nicknamed Sunny), lapsed into a coma. The husband was accused of having tried to kill her by injecting her with insulin, and her coma being a result of this. In a trial by jury in 1982, the husband was found guilty of two counts of assault with intent to murder, but when he was tried on appeal in 1985, he was acquitted on both counts.

Thagard (2004) provided a formal analysis of jury decision making as a kind of causal evidence, this being a case study of those two trials. "In general, legal reasoning in trials such as those of Claus von Bülow's can be characterized as inference to the best overall causal story" (ibid., p. 231).<sup>37</sup> For the account of the trials, Thagard relied on a book by one of the defence lawyers at both trials, Alan Dershowitz, who argued there (Dershowitz, 1986, p. 37, quoted in Thagard, 2004, p. 232) that the prosecution's case in the first trial "was based heavily on hard scientific evidence, eyewitness testimony and compelling motives".

The victim's maid testified at the first trial that she had found a bag of the husband containing insulin in the month before the wife went into a coma. The victim's son from a previous marriage testified that he found that bag in the husband's closet, after the inception of the coma, and that the bag contained three hypodermic needles, one of which was the needle that had been used when the victim went into a coma. Scientific tests found on that needle a residue of insulin, and moreover the victim's blood, taken and tested after she was taken from hospital, showed a high insulin level. As excess insulin can induce a coma or even death, the accusation was that the husband had injected the victim with excess insulin, his intent being murder. But nobody had seen the husband make that injection.

At the first trial, the husband's mistress testified that she had demanded that he divorce his wife, i.e., the victim. Moreover, the husband's banker testified that the accused stood to gain a large inheritance if his wife died, but would receive little if he divorced her. So there appeared to be both pecuniary and romantic motives to the accused perpetrating the crime for which he was standing trial. At the second trial, evidence was presented that the victim's maid and the victim's son may not be saying the truth. At the first trial, a witness for the defence claimed that she had frequently given the victim exercise instruction, and that the victim had told her that insulin injection was a good way to avoid gaining weight. To the defence, this supported a hypothesis that the victim had injected herself with insulin, and that her coma was caused by this self-injection. But the credibility of the alleged instructor suffered from records of the exercise studio showing that she had actually instructed the victim not as often as she had claimed, and that there were no records of her teaching the victim at all during the year when the victim supposedly told her about insulin use. Thereforte, indirect evidence (from trstimony) against the husband was strong, and indirect evidence that would exonerate him was weak. The jury found him guilty, which is not surprising, given that state of affairs.

At the second trial, the defence had been able to use access it had obtained, to the notes made by a private investigator hired by the victim's son. Based on those notes, the victim's maid was shown not to have mentioned finding insulin

<sup>&</sup>lt;sup>37</sup> See Section 2.2.1.6 above.

in the husband's bag until after the victim's coma had been identified as insulin related. It was suggested at the trial that the maid's terstimony was motivated by her dislike of the accused. The victim's son's testimony, too, was weakened, because a detective who had been with him when he found the husband's bag had seen no needles in the bag. Scientific experts for the defence cast doubt about the coma being insulin-induced. As to the needle with a residue of insulin on it, it was claimed by expert testimony that the insulin found on it may not have been there because of an injection. (Therefore, the defence no longer argued that the wife had injected herself, which at the first trial it had.) The husband's banker was not allowed to testify at the second trial about how much the husband stood to inherit. The defence at the second trial claimed that the victim's coma was likely to have been caused by her many health problem, by her taking many drugs, and by her failure to avoid eating ice cream sundae notwithstanding her having blood sugar problems.

# 2.2.1.8 Thagard's Treatment of the von Bülow Trials: Using ECHO and a Coherence Network, vs. Producing a Bayesian Network with JavaBayes

Thagard (2004, pp. 245–246) encoded the input for ECHO simulation of the first trial in 11 evidence propositions, other 11 propositions representing prosecution hypotheses, 3 propositions being defence hypotheses, one statement of contradiction, 10 statements being prosecution explanations, 7 statements (also being *explains* functions) being motives, 5 statements being defence explanations, and one statement of data.

Thagard (2004, pp. 247–249) encoded the input for ECHO simulation of the second trial in 13 evidence propositions, other 9 propositions representing prosecution hypotheses, 7 propositions representing defence hypotheses, 10 statements being prosecution explanations, 6 statements (also being *explains* functions) being motives, 9 statements being defence explanations, 2 statements of contradiction that also were part of the defence explanations, and one statement of data.

Thagard remarked (2004, p. 237):

Note how ECHO naturally encodes the two competing causal stories about why Sunny went into a coma. The theory of explanatory coherence and the computational model of ECHO are highly compatible with the predominant psychological theory of jury decisions, according to which jurors choose between competing stories of what happens (Pennington & Hastie, 1992, 1993; see also Byrne, 1995).

Concerning the results of the simulation for both trials, Thagard stated the following (2004, p. 238):

For the first trial, ECHO ends up accepting the hypothesis that Claus injected Sunny with insulin, but for the second trial ECHO ends up rejecting it. This result occurs regardless of whether the neural network or greedy algorithms are used to maximize constraint satisfaction. To simulate decision making in the first trial, the connectionist<sup>38</sup> algorithm

<sup>&</sup>lt;sup>38</sup> "Artificial neural networks are often referred to as connectionist networks, and the paradigm of neural networks is often referred to as 'connectionism'. Some scientists are interested in

requires 188 cycles of updating activations before the network has settled, and the greedy algorithm requires around 16 flips to reach the same partition of propositions into accepted and rejected. The connectionist algorithms can easily handle much larger networks.

Thagard (2004, p. 239) raised the issue of subjectivity of the numerical values, which could be a criticism of his approach, and felt able to reject such criticism:

How subjective is the analysis of two trials presented in the appendices [of his paper]? It may seem that ECHO simulations require many numerical values such as excitation, inhibition, and decay that depend on arbitrary decisions by the programmer. In fact, however, I use the same numerical values (e.g., .04 for excitation, -.06 for inhibition) in all ECHO runs, and sensitivity analyses have shown that the actual values do not much matter as long as excitation is greater than inhibition. More problematic is the specification of the "explains" relations which requires the programmer to understand the causal structure of the case. But the same understanding is required for simulations using Bayesian networks [which Thagard also discussed in the same paper]. Marking a proposition as "data" is not arbitrary: In the legal context, the data are the utterances made by witnesses that are observed by everyone in the room.

Thagard (2004) contrasted his ECHO simulation of the von Bülow trials, to a Bayesian network analysis of only the first trial, produced using a graphic software tool from Carnegie Mellon University, JavaBayes (Cozman, 2001). In the graph being a Bayesian network and produced on the screen, arrows indicate relations of probabilistic dependence, i.e., of conditional probability, and darker nodes are the ones observed to be true propositions. If there is an arrow from A to B, this represents the dependence of the probability of B on the probability of A.

This is also interpreted as a causal relation: the arrow from A to B indicates that A causally influences B. It is this interpretation of the arrows as causal relations that is used in the analysis of trials as Bayesian networks. Analysing the inferences in trials as Bayesian networks is typical of David Schum's work, such as in Kadane and Schum (1996). The connections in the Bayesian network are unidirectional, whereas the connections are bidirectional instead in the coherence network of propositions associated with Thagard's ECHO simulations.

Thagard (2004, pp. 240–241) criticised Bayesian network representations of trials, because of the need to estimate probabilities, for example: the need to give as input the estimated probability that what a given witness says is true, given that this witness says it. "Even more problematic was coming up with conditional probabilities in cases where there are two arrows coming into a node" (ibid., p. 240). Nevertheless, the Bayesian network simulating the jury at the first von Bülow trial found him guilty, like in the actual trial.

Thagard expressed his doubt about the Bayesian explanation juror reasoning at such trials as follows (ibid., p. 242):

These doubts derive from what I shall call the *interpretation problem* and the *implementation problem*. The interpretation problem is that there is no plausible meaning for the probabilities used in the Bayesian simulation. The network [he showed] is unproblematic if

artificial neural networks as a tool in helping to understand the neural networks in our own brain. 'Connectionist' is sometimes used to emphasize that neural nets are being used for the purpose of computing with no concern for biological realism'' (Callan, 1999, p. 223).

the arrows are interpreted as causal relations. [...] But Bayesian networks require also that the arrows have a probabilistic interpretation so that conditional probabilities can be specified [but Thagard] argue[d] that there is no satisfactory interpretation of the probabilities that would be needed for legal applications.

Of the two kinds of interpretations of probability, namely, frequency-type and belieftype, the former is not appropriate at all for judging a unique event about which the court is called to pass judgement. Proponents of Bayesian networks for analysing trials endorse belief-type probabilities. Thagard, like other critics of the probabilistic approach, found it to be problematic as a representation of how juries reason, because people's degrees of belief (abundant psychological evidence shows) do not conform to the calculus of probability. Therefore, Bayesian simulations of juries are not realistic.

One counterargument is that this is a defect of human adjudicators, and that it would be more rational if fact-finders (or human decision-making in everyday life) were educated enough to conform to the calculus of probabilities. That is to say, a *prescription* for fact-giving is given by supporters of probabilistic reasoning about legal narratives, whereas Thagard is rather interested in a *descriptive* simulation of human reasoning.

# 2.2.2 ALIBI, a Planner for Exoneration

#### 2.2.2.1 1989: An Annus Mirabilis?

As mentioned earlier, Thagard published his first paper on ECHO in 1989. The year 1989 also saw the very first publication on the ALIBI project, led by Ephraim Nissan (Kuflik, Nissan, & Puni, 1989). Interestingly, and quite independently, that same year 1989 also saw the publication of Lutomski (1989), on reasoning with statistical evidence, for assisting an attorney. Lutomski's paper appeared in the *Proceedings of the Second International Conference of Artificial Intelligence and Law*, thus, in a forum specifically devoted to AI & Law, unlike Thagard's first paper on simulating jury decision-making by using ECHO, and unlike Nissan's first paper on ALIBI. It cannot be said that Lutomski had at the time a following within AI & Law, either.

Intriguingly, 1989 was also the year of the earliest report about the *MarshalPlan* project (Schum & Tillers, 1989), about which, see in Section 4.1.1 below. Moreover, Robert W. Goldsmith, who had been publishing already before about probabilistic models of legal evidence, and who in 1989 was affiliated with the Department of Applied Psychology of the University of Lund in Sweden, on that year outlined a rather preliminary sketch of the "overall plan of a computer program under development". In practice, Goldsmith's contribution was a procedure, which could be applied manually or with the assistance of a computer. We are going to say something about that design, based on Goldsmith (1989), in Section 4.1.2. That will be in the context of our discussion *procedural-support systems* (Section 4.1). Before turning to such tools, we are going to discuss argumentation in Chapter 3, and at various places in this book we are going also to discuss the controversy about probabilistic models.

#### 2.2.2.2 Workings and Structure of ALIBI

In the rest of the present Section 2.2.2, we are going to focus on ALIBI. Apart from the paper on ALIBI that first appeared in press in 1989, my publications on ALIBI also included Fakher-Eldeen et al. (1993), Nissan and Rousseau (1997), Nissan and Dragoni (2000), Nissan and Martino (2004b, pp. 200–206). ALIBI is an AI planner which impersonates a person who is being accused. ALIBI receives as input a simple accusation, which includes some ascertained facts and interprets them as, say, burglary or robbery.

ALIBI decomposes the actions involved hierarchically, and separates the actions themselves from *deontic* (i.e., moral or legal) connotations: this way, e.g., stealing is interpreted as taking in given circumstances (somebody else's property, while the agent is unseen). See Fig. 2.2.2.2.1. Reasoning on effects is also carried out. An alternative plan is composed hierarchically, which claims exoneration or, in a version called ALIBI 3, pleads to a lesser computed liability.

"Processing has the program recursively decompose the actions in the input, into a tree<sup>39</sup> of actions, down to elementary, atomic actions. Moreover, actions are stripped of their deontic connotation. For example, 'stealing' is stripped down to 'taking', and it's up to the system to concoct such a plan where that act of taking fits in a way that is legitimate for the defendant. Generating the justification corresponds to a reconstitution of actions into a different tree. Then the terminal actions in the decomposition tree are differently reconstituted into alternative explanations that eliminate or minimize liability" (Nissan, 2000a).

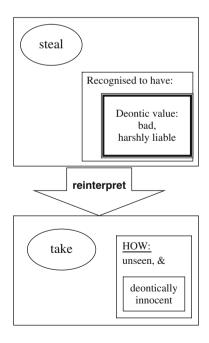
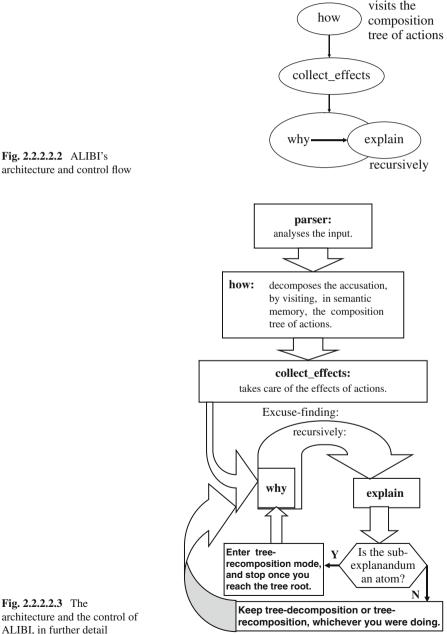


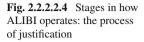
Fig. 2.2.2.2.1 Steal vs take in ALIBI

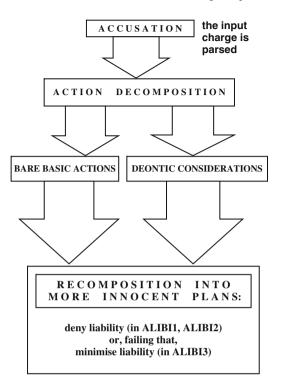
<sup>&</sup>lt;sup>39</sup> A *tree* is such a graph, that any two nodes are connected by exactly one path.

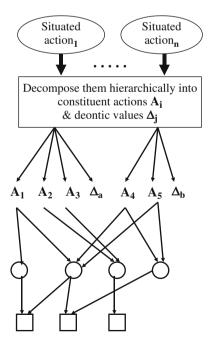
Figure 2.2.2.2.2 shows the architecture of ALIBI, and how its modules invoke each other. Also see Fig. 2.2.2.2.3 for further detail. Figure 2.2.2.2.4 shows the basic conceptual progression of the control. Figure 2.2.2.2.5 shows the hierarchical decomposition of situated actions included in the accusation, their separation from deontic values, and then their recomposition into a different narrative, such that the



architecture and control flow







**Fig. 2.2.2.5** *Actus reus* and *mens rea* separation in ALIBI. Hierarchical decomposition of imputed behaviour in a given episode, into constituent actions separate from deontic values; followed by recomposition into an alternative plan, i.e., a narrative that is claimed by the suspect to be the one fitting his intentions

actus reus is still there, or at any rate, the behaviour observed, per se is not challenged, and yet *mens rea* as imputed to the suspect in the input accusation is denied.

## 2.2.2.3 Examples of ALIBI's Output

"[I]n some instances the explanation or excuse the [suspect] caught red-handed would make is hilariously meagre in probatory terms. The latter, however, happened because the given situation was desperate, and ALIBI, while impersonating the suspect, was trying [so hard,] too hard to explain out the ascertained narrative elements by denying 'mens rea',<sup>40</sup> that the emplotment, however sensibly contrived, is unconvincing" (Nissan, 2000a).

For example, in one session the input accusation states that the accused broke the glass of a jeweller's display window, got inside, shot and wounded the jeweller, and then ran away carrying valuables with him. ALIBI states that "he" broke the glass accidentally, and that "he" got inside in order to leave a note with his coordinates. (If the accusation states that the accused opened, e.g., a drawer where money was held, or even the cash-register, then a possible pretext could be that he was looking for a pencil and paper, so he could leave his name and address.)

He was carrying a weapon in legitimate circumstances. He shot the jeweller accidentally. Or then, he may play the hero, and claim that he heard voices from which he reckoned that the jeweller was in danger, and then he got inside in order to help. Once the jeweller was wounded, the accused ran away in order to seek medical help, as he could not provide it himself. He took away the valuables in order to return them, because the wounded jeweller could not guard his own property (in fact, incapacitation is an effect of being wounded); the accused, while going out to seek medical help, would guard the goods in the meanwhile, on the owner's behalf.

While the first version of ALIBI used to take, as input, for example:

```
done(rob,diamonds_pack,jeweller-s_shop).
done(injure,sub-machine_gun,jeweller).
done(break,body,display_window).
done(sneak,display_window,jeweller-s_shop).
done(take,diamonds_pack,jeweller-s_shop).
```

#### the subsequent version, ALIBI2, accepts the equivalent English-like statement:

the defendant robbed the diamonds\_pack from a jewellers\_shop. he wounded the jeweller by a sub\_machine\_gun. he broke the display\_window with his body. he sneaked into the jewellers\_shop through the display\_window. he took\_away the diamonds\_pack from the jewellers\_shop.

<sup>&</sup>lt;sup>40</sup> Mens rea in relation to computerising criminal law was discussed by Bennun (1996).

The defendant is charged with having robbed a jeweller's shop, and carried away a pack of diamonds. He broke the display window, by throwing himself against it (a variant could be that he threw a stone at it). Then, he sneaked inside the shop through the broken glass. On seeing the jeweller, the defendant fired with a sub-machine gun and wounded the jeweller, and then took away the pack of diamonds.

Excuses are necessary for several details of this accusation. Let us start by the way the defendant entered the shop. First, he has the choice of claiming that

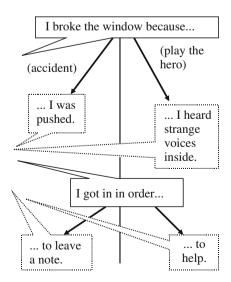
- either he broke the window intentionally,
- or it was an accident.

If he claims it was an accident, as he was pushed, so he fell, then it is sensible, perhaps, to have got in, in order to leave a note with one's address. That is, the defendant plays the righteous and law-abiding member of the public.

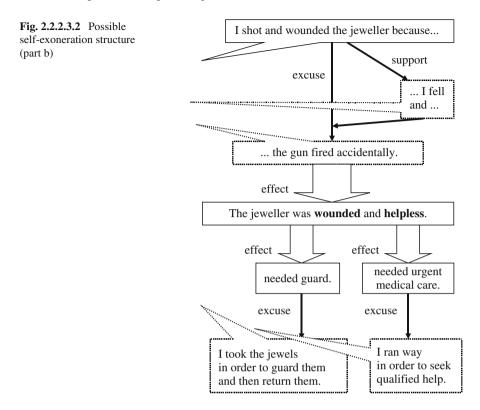
Otherwise, he may admit he broke the window on purpose, because inspired by heroic sentiments: he heard strange voices inside, so somebody needed help, or a crime had to be prevented, and the defendant got in as a saviour. See Fig. 2.2.2.3.1.

Now, an excuse is needed for the worst offence: the shooting of the jeweller. If accident there was, then the defendant may have shot on falling. Another possibility could have been if the defendant entered the shop in the dark: if he claims he got in to help, then he may have mistaken the jeweller for an evil-intentioned person unduly there.

Next, let us explain why the defendant took the jewels and run away. The wounded jeweller was helpless. He could not guard his property by himself, and he needed medical care. The defendant took the jewels in order to guard them, with the intention of giving them back. Medical care is a special kind of help that can be



**Fig. 2.2.2.3.1** Possible self-exoneration structure (part a)



given by qualified personnel: the defendant ran away to seek professional medical care. See Fig. 2.2.2.3.2.

Here is another accusation, which also was an input as early as the first version of ALIBI. In a session with ALIBI, involving armed threat at a bank teller, the accused claims forgetting about the weapon he was carrying (for some legitimate purpose unrelated to going to the bank) when entering the bank and facing the employee at the teller.

The defendant robbed a bank. He threatened the employee with a rifle (or with a knife instead), and snatched the money. An excuse is needed for the very fact of going around armed. ALIBI tries with this compound excuse: "I did not aim at the employee with the rifle." (Or, respectively: "with the knife.") And then, for the rifle: "I had the rifle because I went hunting." Or: "because I was on vacation from the army." (However, the police could easily check the latter.)<sup>41</sup> For a knife,

<sup>&</sup>lt;sup>41</sup> Colwell et al. (2006) claimed: "In general, truth-tellers provide more detailed accounts than deceivers. They are also more likely to include the time and location, unique or unusual facts (e.g., the perpetrator limped), portions of the conversation that took place (e.g., I yelled "HELP"), and interactions between the perpetrator and themselves. Deceivers, on the other hand, may offer fewer details to reduce the chance of contradicting themselves when asked to repeat the story. They might also lack the knowledge or are unable to imagine/create plausible, complex descriptions. Deceivers

ALIBI proposes the following excuse: "I held the knife because I was carrying it to a grinder to have it sharpened."<sup>42</sup> And then: "The employee panicked and gave me the money."

ALIBI resorts to common-sense knowledge on the workings and the effects of threatening. See Fig. 2.2.2.3.3. Armed threat involves holding a weapon. It is even more flagrant if the victim is aimed at with that arm. The effect is having the victim understand he or she is in a dilemma: to prevent being harmed, the victim is expected to comply. A major effect of *threat* is *fear*, which can motivate an employee at the teller to hand out cash without further ascertaining the intentions of the defendant.

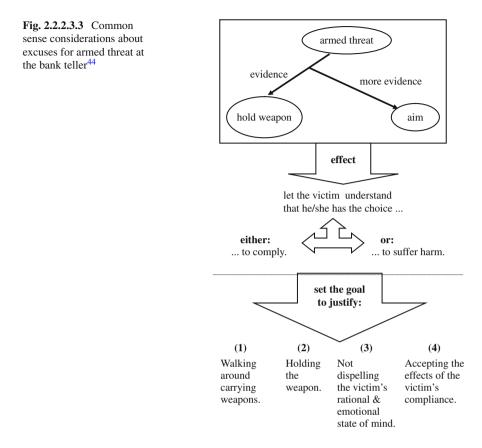
Several excuses are needed for armed threat and the acceptance of its effects, unless the defendant chooses to admit that he intended to threat the victim. The defendant did not try to dispel the fear of the employee, but he can claim he did not notice this emotional state in the victim (playing the absent-minded one, on this point, is in agreement with having forgotten about the arm he was carrying).<sup>43</sup> If the defendant had asked for a loan, then being offered money by the employee is not surprising.

rely on thoughts and logic to account for their actions within fabrications [...]. Since interrogators can investigate the fact's credibility, deceivers refrain from disclosing certain details that would reveal their lies. As mentioned earlier, truth-tellers customarily make spontaneous corrections to assure the accuracy of their story, while deceivers tend to give their accounts in chronological order, making their statements easier to detect."

ALIBI does not take into account the need for checking, e.g., such relevant temporal information as pertaining to the hunting season, or to having been inducted into the armed forces reserve. In 1991 in mid January, on the eve of the deadline of the Allied strike against Iraq and thus of Saddam's threat to attack Israeli cities with missiles possibly carrying nonconventional weapons, in Israeli cities people were in a hurry, sealing rooms and even baby cots against chemicals, so the sight of armed uniformed personnel queuing at a bank teller was clearly projected against the global situational backdrop – e.g., its being the eve of the first expected Scud missile strikes – as it was being interpreted by observers also queuing at the bank. I saw such a scene myself, at a bank in Beer-Sheva, and everybody was gloomy and as the impending attack that the civilian population would suffer was quite focal on people's mind (on the bus, a young mother was staring in a kind of disbelief or stupor at her toddler, as though this was to be the end of their lives), there were no suspicions that the uniformed, conspicuously armed personnel queuing at the bank would try to rob the bank. Which in fact they did not.

<sup>&</sup>lt;sup>42</sup> Bear in mind that in New York City, it did happen that policemen shot dead a man carrying a knife in the street. They misunderstood his motives for carrying the knife. He was a Jewish slaughterer, and therefore had precise rules to follow about the standards of his knife, and actually a slaughterer needs to have the knife regularly checked by a rabbi, who would verify compliance. There also was an episode in Britain, when a man who was carrying the leg of a piece of furniture was shot dead by the police, who miinterpreted his intentions.

<sup>&</sup>lt;sup>43</sup> Why did the person accused accept cash from the employee? An excuse for that could be that the accused misunderstood, and believed that he was entitled to receiving the money. Or then he may have been sort of a "distract professor", who for the very same reason did not realise that the employee was feeling under threat. But the circumstances are such, that we would find it hard to believe this. By contrast, there was no reason to conjecture ulterior motives, when I myself (then an undergraduate, in the late 1970s) and other students were leaving the classroom with our professor, and in the corridor he asked: "Where am I going?", and one of us students replied: "To your office".



#### 2.2.2.4 Knowledge Representation in ALIBI

The ALIBI1 version of ALIBI was developed in 1987–1988. It is a Prolog planner, synthesising alibis. The algorithm was already there in full: ALIBI1's input format was rudimentary, in Prolog propositions, but ALIBI1 analysed the actions involved, taking off their connotations (e.g., 'stealing' is reduced to 'taking' as in given circumstances); then, alternative explanations of the charged behaviour are put together and displayed. In the database of the system, semantic knowledge is stated about connotations (in terms of legality), component actions, and effects. Action verbs are decomposed into constitutive actions, hierarchically. As at run-time, compound actions are involved in the generation of an alibi, the planner core is recursively applied to semantic knowledge, and relates effects to actions, after having related

<sup>&</sup>lt;sup>44</sup> Bear in mind that whereas in ALIBI we didn't develop a model of the emotions, in artificial intelligence the emotions are not infrequently being modelled, in systems from the 1990s and 2000s. Nissan (2009c) is a survey of such approaches. Cf. Nissan (2009d); Nissan, Cassinis, and Morelli (2008); and Cassinis, Morelli, and Nissan (2007).

actions to "atomic" constitutive actions. ALIBI1 was implemented by two of my *Expert Systems* and *Prolog* students, namely, Tsvi Kuflik and Gilad Puni.

In the ALIBI2 version of ALIBI, developed in 1989, semantics was reorganised, in a format inspired by Fillmore's *case-grammars* (Fillmore, 1968). A simple English parser was added, which analysed the sentences of a small textual file given as input. ALIBI2 was implemented by two students of my *Computational Linguistics* course, Roni Salfati and Yuval Shaul, by reusing code from ALIBI1.

The ALIBI3 version of ALIBI, developed in 1990, was implemented in Lisp as an undergraduate project under my supervision by Auni Spanioli. The most important thing about ALIBI3 is that instead of just excluding incriminating excuses, a mechanism was included that explicitly computes a score of liability for plans, or parts thereof, being generated.

Moreover, in 1990, SKILL was implemented in Prolog as an undergraduate project by Fadel Fakher-Eldeen under my supervision. In SKILL, justification was extended to areas other than for criminal behaviour. Skills in performing at some task were judged by SKILL according to common-sense knowledge about the task, about classes of performers (e.g., age-groups), and about the environment. An important aspect of SKILL is that it represents some socially widespread prejudices about skills explicitly; for example, there is a widespread expectation than women (but not men) should be able to cook.

In the ALIBI2 version of ALIBI, the following simple generative grammar was used for parsing; it could have been refined in a subsequent version, by allowing, for example, recursion in sentences (and, thus, compound sentences):

sentence	$\rightarrow$	noun_phrase + verb_phrase
noun_phrase	$\rightarrow$	preposition + noun_phrase
noun_phrase	$\rightarrow$	determiner + mod_noun
noun_phrase	$\rightarrow$	mod_noun
verb_phrase	$\rightarrow$	verb + noun_phrase
verb_phrase	$\rightarrow$	verb + adverb + noun_phrase
verb_phrase	$\rightarrow$	verb + noun_phrase + adverb
mod_noun	$\rightarrow$	noun
mod_noun	$\rightarrow$	noun + noun_phrase
mod_noun	$\rightarrow$	<pre>mod_adjective + mod_noun</pre>
mod_adjective	$\rightarrow$	adjective
mod_adjective	$\rightarrow$	adverb + mod_adjective

The preliminary syntactical analysis yields predicates that are used during the following phase, which, in turn, is meant to produce a formal description of actions, to be used by the process of action decomposition. The second phase of parsing involves semantics, and a representation based, more or less, on *deep case grammars* (Fillmore, 1968; cf. e.g. Harris, 1985).

We were aware of the fact that separating syntax and semantics in cascaded phases is not the best choice. Not only that: semantic analysis should be enabled to exploit common-sense knowledge stored in the knowledge-base that ALIBI already exploits when looking for excuses. Knowledge – other than linguistic semantic knowledge – is episodic memory, and knowledge of usual (or likely) patterns of episodic knowledge.

In the ALIBI2 prototype, we dealt with syntax separately, as we had been trying to modularise as much as possible in the first instance, so we could spot more clearly elements needed in the architecture at the technically specific level: heuristics of justification. (By *heuristics*, we mean *rules of thumb*.) In due process, it should have been possible, we reckoned, to better realise which modules should be closely integrated.

We allow specific attributes that are particular kinds of deep cases; that way, for example, *target* is a particular case of *location*. For the action of throwing a stone on the glass, as stated in the input accusation, analysis yielded the following, as an element in episodic memory:

action:	throw
actor:	defendant
object:	stone
source:	defendant (by default, it's the defendant's hand)
target:	glass

The structure of the representation, for this given instance, is a nested list:

[	[	throw,	action	],	,
	[	defendant,	actor	],	,
	[	object,	stone	],	,
	[	target,	glass	]	]

As to the source of the motion of the stone thrown, this is, plausibly, the actor, and there is no need to include this as data in episodic memory, as it belongs in semantic memory on the act of throwing.

Bear in mind that in subtle ways, common sense tends to confuse facts and indictment. In human memory, incoming information may pollute the memories previously held. Also in natural-language processing, in Dyer's BORIS multi-paragraph story automated understander (Dyer, 1983a) – it is discussed in Section 5.2.9 below – there was a rather similar effect by which by querying BORIS and in so doing stating that given facts had taken place, BORIS could be tricked into incorporating them in its episodic memory, thus tacitly accepting that they took place.<sup>45</sup>

<sup>&</sup>lt;sup>45</sup> The subjectiveness of perception in eyewitness reports has been dealt with, for example, by Cesare Musatti (1931) in Italy. Elizabeth Loftus (already in Loftus, 1975, 1979) has observed that leading questions cause eyewitnesses to unwittingly complete their recollections by reconstruction; in Boris, a question-answering program for the analysis of narratives, a phenomenon was noticed that its developer, Dyer, first considered to be a bug, but then recognised that it is valuable, as it

For the same action of stone throwing just discussed in relation to ALIBI, it would have been possible to derive the following representation, according to knowledge on the usual pragmatics of throwing: focus is on the presumed target (it is already a conjecture), while the stone would be considered as merely an instrument, instead of the object, as the case is literally, at the surface level of verbal description:

```
[ [ PROPEL, action ],
  [ defendant, actor ],
  [ objective, glass ],
  [ instrument, stone ] ]
```

We recognised that ALIBI should avoid being tricked into such a representation, as it embeds a hidden assumption that is detrimental to the interests of the suspects: it predefines the suspect's intentions.

Values of attributes should not be restricted to names or nominal compounds: they may be internally defined symbols, which point to instances individuated (stone0 is the first instance of stone met), or to the internal representation of phrases or sentences. This is necessary in order to account for semantic compositionality. For example, in order to indicate the relative temporal order between actions, the temporal case could have as value a pointer to another elementary episode.

The semantic knowledge stored in ALIBI includes a representation of the structure of objects. Let us consider, for example, an accusation we have already seen earlier, and which has the defendant hitting the glass with a stone, thus causing the display window to be broken, which in turn allowed the defendant to get in.

ALIBI "knows" that in a display window, there is a glass, and it relates the two concepts, when they occur in the accusation. The defendant may have been stated to have hit a part (the glass), and ALIBI would understand that the whole (the display window) was broken, and vice versa.

The following predicate employs *PROPEL*, one of the primitive acts of Roger Schank's *conceptual dependency theory*,<sup>46</sup> as a general concept, and, according to the specific action imputed or claimed, select a suitable verb, and construct appropriate phrases – with *deep-case* arguments inserted – to accompany it (the coding here is like in the Prolog logic programming language):

select\_PROPEL\_act(hit, What) :- done(hit, \_ , What).
select\_PROPEL\_act(threw, Upon\_what) :- done(throw, \_ ,Upon\_what).

simulates the Loftus effect on recollections: episodic memory modifications occur during question answering (Dyer, 1983a, in subsections 1.5, 5.5, 12.1, 12.2).

 $<sup>^{46}</sup>$  See Sections 5.2.8 and 5.2.9 in this book, and see e.g. Schank (1972), Schank & Riesbeck (1981), Dyer (1983a).

that is to say: "Select the verb *hit* or *threw* according to the accusation stressing one action or the other." Moreover:

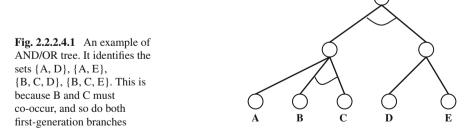
that is "A broader or a narrower concept may have been stated as being the target of the PROPEL act: a part of the whole may be hit implying that the whole was hit, or, vice versa, the whole may have been stated as being the target, whereas it is a particular component that was actually hit."

ALIBI "understands" as well the chain of enablements: removing an obstacle that guarded property, enables access to the property. Both the de/composition of actions, and the set of effects of actions, constitute an AND/OR tree, in our representation. An AND/OR tree is a simple data structure from computer science (and graph theory), such that in the various generations (i.e., levels) of the hierarchy (this is what *tree* means), a node requires subsets of its children nodes to co-occur (the graph edges reaching for them are united then by an arc, which imposes the AND condition), otherwise they can be alternative to each other (this is the OR condition). Figure 2.2.2.4.1 shows an example of AND/OR tree.

Let us go back to ALIBI. Predicates that, in semantic memory, state the constitution of compound actions, invoke effects as well. An example follows, drawn from Kuflik et al. (1989, section 4), of a rule coded in Prolog, and which describes the compound action of *threatening by means of a gun*:

compound\_action(threaten, [aim, hold]) :done(threaten,X,Threatened\_Victim), is\_a(X,gun), asserta(has as effect(frightened)),

and so forth. It is rendered, in English, by the statement<sup>47</sup>:



<sup>&</sup>lt;sup>47</sup> Within studies of the *pragmatics of communication*, Nicoloff (1989) has discussed *threats*. By contrast, Joel D. Hamkins and Benedikt Löwe (2008) have introduced a *modal logic of forcing*. In a study in psychology, Kassin and McNall (1991) discussed promises and threats in police interrogations, by pragmatic implication.

*"threaten* is a compound action that has to be assumed as constituted by the sequence of actions *aim* and *hold*, **if** the accusation ascribes to the defendant, the defendant's having threatened the victim by using a gun as an instrument. **If** this is the case indeed, **then** define, as being an **effect**, a predicate

#### has\_as\_effect(frightened).

where frightened is assumed to refer to the victim. (And so forth.)"

Then, the predicate has\_as\_effect will appear among the conditions belonging to the antecedent of at least one rule whose left part is the predicate explain with a suitable value as argument.

For example, stemming from an ascertained or claimed situation where threatening led to the victim being frightened, one possible heuristic for devising excuses in such a situation is expressed by:

```
asserta(goal(gave_in_panic, _, Threatened_Victim)).
```

which means "Define, as a goal to be currently pursued, the generation of an excuse claiming that the victim, in panic, gave the defendant property he is accused of having obtained unlawfully (robbed, as the situation requires the presence of the possessor)."

It is invoked in the antecedent of a rule, after the condition

has\_as\_effect(frightened).

which is itself included in the same antecedent. Note that in Prolog, an underline character \_ stands for an unspecified argument.

Besides, an effect predicate states the effects:

- help\_needed (for the victim), and
- guard\_needed (for property)

which follow the effect frightened:

The antecedent of explain predicates especially includes predicates of three kinds:

- done (a condition requiring that a certain kind of action be included in the accusation),
- has\_an\_effect (which selects one of the effects of such an action), and
- goal (which invokes the generation of an excuse according to a given heuristic that is suited for the particular situation).

For example, the following invokes, for the predicate explain (aim), the generation of two alternative excuses, claiming that the defendant aimed at the victim accidentally, because he had fallen through the way of access (say, a broken display-window), or denying that the defendant ever aimed at the victim:

explain(aim)	:-	done(threaten,X,Y), has_as_effect(fall_through), goal(accidentally_aim,X,Y).
explain(aim)	:-	done(threaten,X,Y), goal(not_aim,X,Y).

In case shooting, not just aiming, is part of the accusation, then a modified heuristic is invoked for the predicate explain(shoot).

Explanations are developed separately for the various actions imputed, but, if this is relevant, with knowledge of other actions having occurred, or having to be assumed. From the viewpoint of the discipline of *systems & control*, we could say that objective testimony belongs to the space of *observability*, and constitutes the basis of both the imputation and of possible excuses, which all exploit degrees of freedom in state estimation.

Whereas ALIBI provides alternative interpretations for the ascertained facts underlying the charge, ALIBI did not tackle the subjectiveness of perception or imperfect recollection on the part of witnesses.

Complications such as *complicity* were not accounted for, in the versions of ALIBI that were implemented, but then Nissan and Rousseau (1997) discussed how to combine the capabilities of a tool like ALIBI, with capabilities of a virtual theatre of characters, a system whose agents are characters in a story. See Section 2.2.2.7 below.

Moreover, bear in mind that the parties in a trial may explain differently not only the narrative upon which a charge of an offence revolves, i.e., alleged and charged behaviour of the defendant at a criminal case, but they may differ on any relevant detail militating towards their different legal narratives. For example, consider the following explanation, given by a man, Warder Cresson, whose wife and son had him declared a lunatic in court in Philadelphia,<sup>48</sup> but then this was overturned

<sup>&</sup>lt;sup>48</sup> Incidentally, the evolution of commitment law in the nineteenth century has been discussed by Appelbaum and Kemp (1982). "The generally accepted interpretation of the evolution of commitment law in the nineteenth century is challenged by means of an historical investigation of the law's development in a single state – Pennsylvania." (ibid., from the abstract). That is precisely the U.S. state relevant for Cresson. The abstract of Appelbaum and Kemp (1982) points out: "Rather than an abrupt switch from relaxed commitment procedures to a system of stringent safeguards, which most historical accounts of the period describe, examination reveals that Pennsylvania law underwent a slow accretion of procedural protections, with the essential discretionary role of families, friends, and physicians left undisturbed. The implications for current policy of this challenge to the traditional account are discussed".

on appeal in May 1851. The trial revolved upon his religious conversion, but his opponents had also sought to undermine his appearance of sanity with an anecdote, according to which he once drove his sleight on bare ground, there being no snow<sup>49</sup>:

To show how far persons can be influenced by every ridiculous and unjust means, in such cases of pretended Lunacy, to carry out their point, I will here mention one. It was asserted by my family "That I brought half a barrel of water in the bottom of my sleigh, all the way from the State of New York, upon bare ground." Now, is this possible to be true? for the very jumping of the sleigh would dash it all out, and all over me, before I drove three hours,

In Nissan (2010e), I discussed the phenomenon of cultural traits or ethnic or religious identities being sometimes medicalised, i.e., considered in medical terms. This was not infrequent in the 19th and early 20th century (cf. Nissan & Shemesh, 2010). But some disliked religion was only one context for mental flaws to be ascribed (Mark Twain summed it up nicely: "If the man doesn't believe in what we do, we say he is a crank, and that settles it. I mean, it does nowadays, because now we can't burn him"). Another context involved supposedly inferior races or cultures. For example, in the second half of the 19th century, just as both women and Jews were seeking emancipation, pseudo-scientific claims would be made about both groups's inferiority and predisposition for madness: "Jews, like women, possessed a basic biological predisposition to specific forms of mental illness. Thus, like women, who were also making specific political demands on the privileged group at the same moment in history, Jews could be dismissed as unworthy of becoming part of the privileged group because of their aberration." (Gilman, 1984, p. 157). "Jews, like women, possessed a basic biological predisposition to specific forms of mental illness. Thus, like women, who were also making specific political demands on the privileged group at the same moment in history, Jews could be dismissed as unworthy of becoming part of the privileged group because of their aberration" (ibid.). It was also claimed that Black people either freed or seeking freedom, while not ones accepting slavery, were mad (ibid.).

In one section of Nissan (2010e), I considered a trial for lunacy from Philadelphia. Warder Cresson (1798–1860) was born to a Quaker family, and grew up to become a farmer and preacher in the area of his native Philadelphia, where he eventually married and had six children (see on him Fox, 1971). While a young man, he experimented with millenarist groups. From the late 1820s, he published religious tracts. In 1844, he published a visionary tract about Jerusalem, and on that same year, he went there on pilgrimage. While in Jerusalem, his views changed, and he converted to Judaism. Bear in mind that by the mid 19th century, Jerusalem already had a clear Jewish majority, and this population was religious and economically sustainable because of alms from abroad. The standard discourse of Jerusalemite Judaism, by which Cresson let himself be convinced, was complex and cogent by its inner logic. This was something not visible in Cresson's original social environment in Philadelphia.

It is understandable that to a religious Protestant family in 1848, seeing a husband and father come back a Jew, it seemed to be a good explanation that he had lost his reason – apart from their goals of controlling his assets. To his family, he forfeited the salvation of his soul, by adopting an identity that was utterly unappealing – and ostensibly that of a defeated, despised creed and nation. At the same time, there was widespread religious effervescence among Protestant denominations in the Early Republic, and it clearly was a sign of civil maturity for the United States of America that a court of law (albeit not the lower court) resisted the proposition that choosing Judaism of all denominational options was proof of lunacy.

<sup>&</sup>lt;sup>49</sup> In his 1852 book *The Key of David* (which is now available online), Cresson pointed out in an appendix this argument to show his lunacy that the prosecution made in the case brought by his wife. In Appendix F (now accessible at http://www.jewish-history.com/cresson/cresson42.html) Cresson also pointed out that his son's testimony against him, concerning his joining the Shakers, was about events that took place when the son was only a few weeks old. "What a most remarkable *Precocious* Boy this, in his *malignity* to, and *persecution* of his *own father.*"

even if I had not taken the trouble just to take hold of the side-stays of the sleigh and turn it all out in a few seconds.

The truth is, in the winter of 1831, having made up my mind to come on from New Lebanon, State of New York, to my family near Philadelphia, and the snow being very deep, and the North River having been frozen all the way up for weeks and weeks; having two excellent match-horses and a sleigh, and finding, by reading the papers, that the sleighing was very good all the way on the Philadelphia, I concluded, as I could not come in my carriage, I would come in my sleigh, a distance of about 350 miles, which I completed in five and a half days; but the last day, when reaching as far as Trenton, it began to thaw, and, by the time I reached Philadelphia, the snow was partly gone in the middle of the turnpike, (as is generally the case,) although it was good on the sideroads. I reached my family, residing in Byberry, about half after ten o'clock upon the night of the sixth day, and, as is common, the thaw was succeeded by a rain during the night, which left two or three quarts of water in the bottom of my sleigh. So much for the "half a barrel of water from the State of New York that I brought in the bottom of my sleigh upon bare ground," just like the **snow-bank** tale in the Morgan Hinchman case, to try to make him out **Insane**.

This was part of a *cause célèbre* in antebellum America.<sup>50</sup>

# 2.2.2.5 An Illustration of the Conceptual Factors Involved in Common Sense About the Jeweller's Example

Figures 2.2.2.5.1 and 2.2.2.5.2 illustrate factors involved when a person hits the display window of a jeweller's, if the reason given is, say, killing a fly. That same person (like anybody else) is supposed to know that glass is fragile, that it is costly, and that it protects property, and as in comparison killing a fly is a trivial goal, that reason is not credible.

Let us discuss the rather complex Fig. 2.2.2.5.2, part by part. First of all, consider Fig. 2.2.2.5.3, which includes such items of common sense as a display window being part of a shop (within knowledge about shops), glass being part of a display window, glass being fragile, the likelihood being high that if something fragile is hit, then it would be broken.

<sup>&</sup>lt;sup>50</sup> When Cresson returned to Philadelphia, in order to settle his matters before going back to Jerusalem, he was involved in local Jewish life, regularly attended service at the Mikve Israel synagogue, and continued (as he was already doing from Jerusalem as early as 1844) to write for Isaac Leeser's magazine *The Occident.* His wife, Elizabeth Townsend, and his son Jacob applied to the court and obtained a commission in lunacy. This decision of the lower court was reversed in a trial that became a *cause célèbre*, with eminent counsel retained by both parties, and much attention from the press. The hearing extended over six days in May, 1851, and nearly one hundred witnesses were called. Upon his return to Jerusalem, Cresson married a Sephardic Jewish woman, Rachel Moleano, he used to dress as a Jerusalemite Sephardic Jew, and the community he joined honoured him so much that his funeral in 1860 was with honors befitting a prominent rabbi. It must be said that prior to his conversion, Cresson was very close to two prominent rabbis in Jerusalem, but when he converted in 1848, this took place once opposition was overcome, from the *beth din* (rabbinic court) and the chief rabbi, Abraham Chai Gagin. This was because of a general reluctance to proselitise was (and is) accompanied by wariness lest, if a request to be converted is fulfilled, the convert would not be up to his or her new duties.

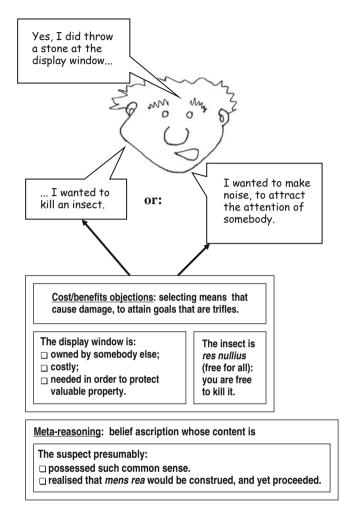
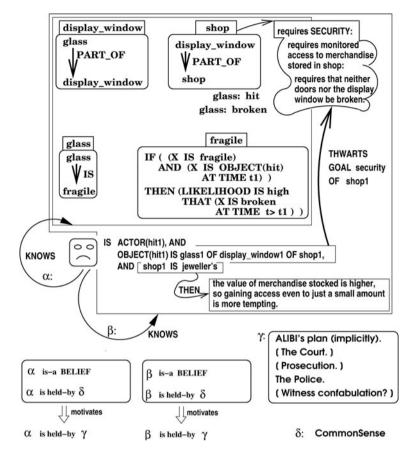


Fig. 2.2.2.5.1 Which excuses would not do

Moreover, there is rudimentary knowledge about shops, in that a shop requires security: a shop requires monitored access to merchandise stored in the shop. It is a requirement for the shop's security that neither doors, nor the display window be broken. This, too, is shown in Fig. 2.2.2.5.3. A more formal representation of the same is found in Fig. 2.2.2.5.4.

As shown in Fig. 2.2.2.5.5, adult persons who are "normal" (and we assume by default that the suspect is such a person) are socially competent enough, to possess such items (which we call  $\alpha$  in the figure) of common sense about glass, display windows, shops, and shop security. Items of common sense about glass, display windows, shops, and shop security. Besides, Fig. 2.2.2.5.5 also shows that "normal" adults, including the suspect, also possess item  $\beta$  of common sense, namely:

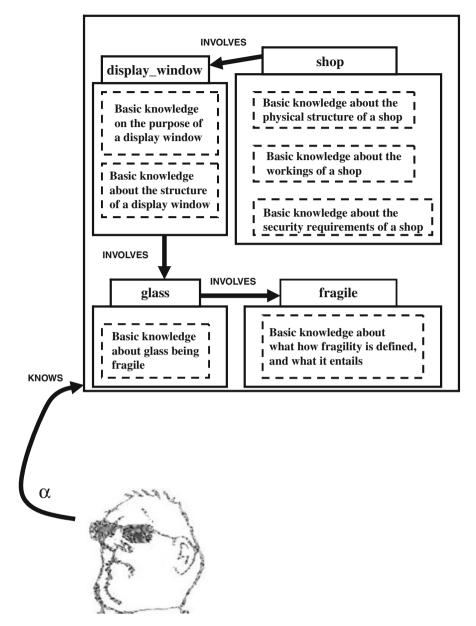


**Fig. 2.2.2.5.2** Common sense involved in interpreting a situation where a person has hit the glass of a jeweller's display window. A set of figures equivalent to the present one is given in Figs. 2.2.2.5.3 to 2.2.2.5.6, where the sense intended unfolds step by step. The bottom of this figure corresponds to Fig. 2.2.2.5.6

- that he or she, the suspect, is the actor of hitting episode hit1,
- that the object being hit was the glass of the given display window of the given shop, and
- that this particular shop is a jeweller's, and that therefore the value of the merchandise stored is higher than at your average shop, so gaining access to even just a small amount is more tempting.

Figure 2.2.2.5.6 contains further details from Fig. 2.2.2.5.2, namely:

- $\alpha$  and  $\beta$  are beliefs,
- $\alpha$  and  $\beta$  are held by  $\delta$  (i.e., by common sense),
- the previous two items motivate  $\alpha$  and  $\beta$  being held by  $\gamma$



**Fig. 2.2.2.5.3** Any competent person, including the suspect, can be expected to possess common sense about the concept *shop*, and in particular about how a shop works, how it is physically made, and the security requirements of a shop; about the concept *display window*, and its containing glass; about the concept *glass*, and its being fragile; and about the concept *fragile* (without the philosophical intricacies that empiricist philosophers recognise to the *disposition* of being fragile)

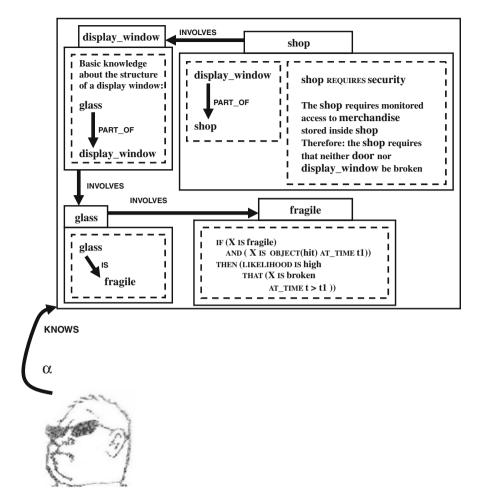
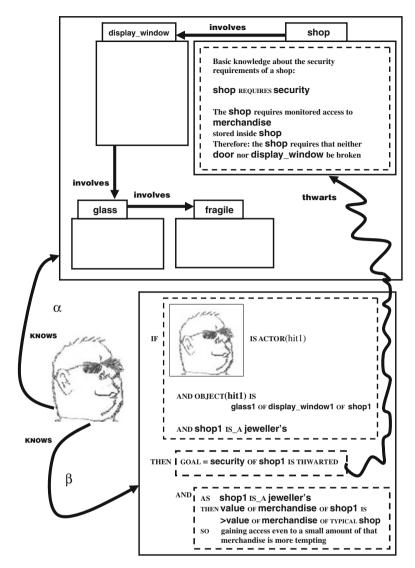


Fig. 2.2.2.5.4 Items of common sense about glass, display windows, shops, and shop security

•  $\gamma$  comprises ALIBI's plan, the police, and if this applies, also the court and the prosecution, as well as the witnesses (which in turn may involve witness confabulation, something undesirable for the veracity of testimony).<sup>51</sup>

<sup>&</sup>lt;sup>51</sup> *Confabulation* in depositions occur when a witness is inferring, rather than merely reporting. This may be an effect of witnesses having discussed their recollections, which has modified what they later think they remember. Witnesses must report what they perceived, not what they inferred. In particular, if it was two eyewitnesses who saw the same event and discussed it, this may influence what they later claim to remember; this is sometimes referred to as *memory conformity*. Concerning the latter, see, e.g., Memon and Wright (1999), Gabbert, Memon, and Allan (2003), Gabbert, Memon, Allan, and Wright (2004), Luus and Wells (1994), Meade and Roediger (2002), Meudell, Hitch, and Boyle (1995), Principe and Ceci (2002), Skagerberg (2007).



**Fig. 2.2.2.5.5** The suspect presumably possesses common sense about display windows and shop security. In particular, the suspect is expected to know that if he hits the glass of the display window of a shop, this will thwart the security goal of that shop, and moreover, that if the shop is a jeweller's, then gaining access to even a small amount of the merchandise is tempting more than with other kinds of shops, because the value of the merchandise at a jeweller's is higher

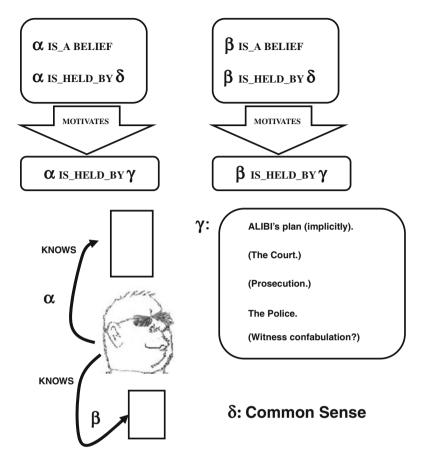


Fig. 2.2.2.5.6 Who holds which beliefs which are themselves items of commonsense?

## 2.2.2.6 An Afterlife of Some ALIBI Sessions

It is not only common sense that ALIBI relies upon. Prototypical behaviour is also affected, when people reason about it, by tropes. This may partly explain why ALIBI's sessions had an afterlife, so to speak. Especially ones that share something with folklore. Let us see how.

Interestingly, during several years following public lectures (including to nonspecialists) the present author gave about ALIBI, single-panel gag cartoons appeared in an Italian weekly, that either independently developed, or otherwise echoed the notion of a computer program that invents excuses; or, then, such cartoons in which either a suspect criminal or his lawyer makes excuses that are not very credible because of the damning circumstances.

If the evidence is damning, the accused's trying hard to explain it out by taking it apart into its constituent components may be funny, because of the evident effort invested in producing an explanation that falls short of being convincing. On occasion, this happens with the output of ALIBI. The following passage is quoted here from Nissan (1996):

This [quotation] is concerned with the mutants of items from the output of ALIBI [...] In folklore studies, it is being realized that assuming an ubiquitous progression from oral storytelling to written narrative is oversimplistic. As it turns out, some narratives have switched instead from literacy to oralcy. The following bears witness to a recession presumably from oral deliveries about ALIBI, through oralcy, into popular written/graphic media. The trigger may have been a talk I gave in Urbino, in May 1993, to a heterogeneous Italian audience. [Unless it was a talk given in 1990 at the Milan Technical University.] The sample set of inputs and outputs I had devised for ALIBI, has seemingly receded to oral jokes, reappearing in written form, as jokes or cartoons (and no mention of computing), in Italy's leading crosswords and trivia magazine. I had sporadic access to issues of Milan's *La Settimana Enigmistica*, from late 1994 and early 1995. Certain items in a few of them are relevant. [...] The Urbino lecture is the likeliest channel for the reappearance of at least two of the examples — respectively as a cartoon, and as a textual joke with a variant (also from the lecture) transposed into a cartoon. [...] The story is unmistakable:

"In court, the defendant – an ex-con – explains to the judge: 'It's quite false, that on the night of February 18 I plundered that shop! I just unwittingly knocked against the shop-window. the door opened, and I got inside to leave my name and address. If I was surprised by a cop with my hands inside the counter, it's just because I was looking for paper and pen, to write down my data'." [... §46162 in "Spigolature", *La Settimana Enigmistica*, year 64, no. 3276(1) (Milan, 7 Jan. 1995): p. 12.] This version from the magazine exhibits a few added or slightly modified details, with respect to the relevant example from ALIBI. [...]

Variants drawn out of the same pretext generated by ALIBI – to the effect that the defendant claims he fell on the jeweller's window because he was pushed – appeared in a one-panel gag cartoon in *La Settimana Enigmistica*, year 63, no. 3266 (29 Oct. 1994), p. 10. The moon shines in the dark. A grim-faced policeman, holding a cudgel, stands in front of two stereotyped underworld characters. These stand sheepishly, one in front and one on the side of a jeweller's broken window glass. The second offender fingers his companion, and says (as common sense has us ascribe to him the caption): "It's his fault: he pushed me." (Nissan, 1996).<sup>52</sup> See Fig. 2.2.2.6.1.

The cartoon in Fig. 2.2.2.6.2, instead, corresponds to no example from ALIBI, but it may have originated as a novel item in the same family of jokes. This one was published towards the end of October 1994 (*La Settimana Enigmistica*, year 63, no. 3266, 29 Oct. 1994, p. 10), 2 weeks before the issue in which the cartoon shown

<sup>&</sup>lt;sup>52</sup> A distinction is to be made between jokes about self-exoneration from crime that do resemble indeed some output from ALIBI, in that they try to explain out some ascertained facts from the charge either innocently, or in not as damning a manner, and jokes that invoke extenuating circumstances. A well-known joke of the latter kind is that of the son who kills his parents, and then expects mercy in court because he is an orphan. Another such joke, from the United States (Shebelsky, 1991), is about a defence lawyer who points out to the judge that his client was characterised as an incorrigible bank robber, without a single socially redeeming feature. The lawyer claims that he intends to disprove that. The judge asks how. The lawyer replies that it's by proving beyond a shadow of doubt that the note his client handed the teller was on recycled paper. What stands out in the latter joke is that the defendant is apparently pleading guilty, but is seeking extenuating circumstances. At any rate, the defendant admits he handed the teller a threatening note.

Fig. 2.2.2.6.1 "It's his fault: he pushed me."

Fig. 2.2.2.6.2 "I was unable to read the price of that

watch, through the glass: it was steamed up."



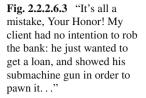
- E' colpa sua: mi ha dato una spinta.



 Non riuscivo a leggerlo, il prezzo di quell'orologio, attraverso il vetro appannato!

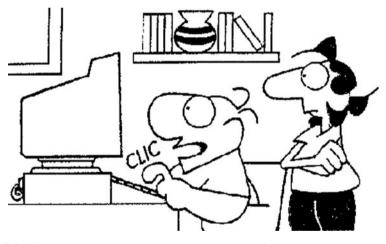
in Fig. 2.2.2.6.1 appeared. The following is an English translation of the caption in Fig. 2.2.2.6.2: "I was unable to read the price of that watch, through the glass: it was steamed up."

And then again, a different output from ALIBI reappeared as a cartoon in *La Settimana Enigmistica* (year 64, no. 3286, 18 March 1995, p. 8); it shows a lawyer, smiling sheepishly to the judge, and pleading the case of the ultimate ex-con cartoon character standing by, bald and unshaven. A halo on his head, the ex-con's eyes stare upwards, cunningly. The caption goes: "It's all a mistake, Your Honor! My client had no intention to rob the bank: he just wanted to get a loan, and showed his submachine gun in order to pawn it..." (Nissan, 1996). See Fig. 2.2.2.6.3.





— C'è stato un malinteso, signor giudice! Il mio cliente non intendeva affatto rapinare la banca: voleva semplicemente un prestito e mostrava il mitra come pegno...



**Fig. 2.2.2.6.4** "I am preparing on the computer a program of various excuses, so I could use them when you'll be mad at me". Was this cartoon inspired by rumours about ALIBI's existence? (The Italian caption was: "Sto preparando al computer un programma di scuse varie da usare nel momento in cui sarai arrabbiata con me.")

At the long last, in the issue of the weekly dated 23 August 1997 (year 66, no. 3413, p. 42), a cartoon appeared that arguably depicts the very notion that a computer program such as ALIBI exists. Refer to Fig. 2.2.2.6.4. In the caption, the man tells his wife: "I am preparing on the computer a program of various excuses, so I could use them when you'll be mad at me".

Apparently, however, this resulted from a simplification of the idea embodied in ALIBI, as the program in the cartoon may just be a trivial list of ready-made excuses, to be selected according to some rather simple input conditions. (It's a little bit like the supposedly smart politician who, asked by a broadcaster why an ongoing military operation was named "Grapes of Wrath", blurted out: "I don't know. The computer made it up".)

It must be said that some time later on, the same weekly published a cartoon – by the same cartoonist and with the same characters – showing a husband telling his wife he is developing a *database* of excuses; i.e., just a collection of ready-made pretexts. This much diminishes the task which, in contrast, ALIBI carried out. Perhaps this is how somebody, about to make use of the idea of such a program, made sense of it, whether or not he or she believed that such software actually existed.

If one explains out something inconvenient by providing a narrative account that happens to occur in jokes about making excuses, then one can expect to have a hard time sounding convincing. It may be that pretexts made up by ALIBI were successful as jokes, because they appear to be variants of the international tale type 1624, described as follows by the folktale scholar Hans-Jörg Uther (2004, Vol. 2, p. 335):

*Thief's Excuse: The Big Wind.* A man ([or in particular a] Gypsy) is caught stealing vegetables from a garden. He claims that the wind carried him over the fence and also uprooted the vegetables. When he is asked how the vegetables got into his sack, the thief says he was wondering about that himself.

In his classification of international tale types from folklore, Uther (ibid.) lists Latvian, Spanish, Flemish, German, Swiss, Hungarian, Serbian, Rumanian, Bulgarian, Greek, Byelorussian, Jewish, Gypsy, Kurdish, Armenian, and Iranian variants.

#### 2.2.2.7 Extension with the Dramatis Personae Approach

Complicitous agency is a particular kind of collaborative plans. It can possibly be dealt with in terms of the economic concept of *incentive contracting*, that has received attention in AI (Kraus, 1996).<sup>53</sup> Delegating in a society of agents is discussed in Castelfranchi and Falcone (1998; cf. 2010, a book whose focus is on trust, including and especially in a computational modelling framework).

<sup>&</sup>lt;sup>53</sup> Subcontracting in a multiagent system is the subject of Grant, Kraus, and Perlis (2005). "We present a formalism for representing the formation of intentions by agents engaged in cooperative activity. We use a syntactic approach presenting a formal logical calculus that can be regarded as a meta-logic that describes the reasoning and activities of the agents. Our central focus is on the evolving intentions of agents over time, and the conditions under which an agent can adopt and maintain an intention. In particular, the reasoning time and the time taken to subcontract are modeled explicitly in the logic" (ibid., p. 163).

It can be said that a *multiagent system* architecture<sup>54</sup> is conceivably suitable for a society of characters who carry out their respective behaviour within a narrative framework, with a character corresponding to an agent in the architecture; it is so, because "the encounters that occur among computing elements in a multiagent system are *economic* encounters, in the sense that they are encounters between *self-interested* entities" (Wooldridge, 2002, p. 9). In fact (ibid.):

the issues studied in the multiagent systems community have a rather different flavour to those studied in the distributed/concurrent systems community. We are concerned with issues such as how agents can reach agreement through negotiation on matters of common interest, and how agents can dynamically coordinate their activities with agents whose goals and motives are unknown.

Mutual beliefs are modelled in part of artificial intelligence's models of teamwork. We quote from an overview of multi-agent research within artificial intelligence, by Katia Sycara (1998, pp. 84–85):

[A particular] direction of research in cooperative multiagent planning has been focused on modeling teamwork explicitly. Explicit modeling of teamwork is particularly helpful in dynamic environments where team members might fail or be presented with new opportunities. In such situations, it is necessary that teams monitor their performance and reorganize based on the situation.

The *joint-intentions framework* (Cohen and Levesque, 1990) focuses on characterizing a team's mental state, called a *joint intention*. A team jointly intends a team action if the team members are jointly committed to completing the team action while mutually believing they were doing it. A *joint commitment* is defined as a joint persistent goal. To enter into a joint commitment, all team members must establish appropriate mutual beliefs and commitments, which is done through an exchange of request and confirm speech acts<sup>55</sup> (Cohen and Levesque, 1990). The commitment protocol synchronizes the team in that all members simultaneously enter into a joint commitment toward a team task. In addition, all team members must consent, using confirmation, to the establishment of a joint commitment goal. If a team member refuses, negotiation could be used; however, how it is done remains an open issue.

Nissan and Rousseau (1997) discussed how to combine the capabilities of a tool like ALIBI, with capabilities of a virtual theatre of characters, a system whose agents are characters in a story. Whereas ALIBI does not incorporate a mechanism specifically intended for handling complicitous action in a scenario where characters cooperate, Nissan and Rousseau (1997) discussed how to provide such an extension of ALIBI, and argued that management of the narrative's cast of characters could benefit from a multi-agent scenario (Rousseau, 1996), along with explicit modelling of the dialectic of actors' mental states and linguistic exchanges – in line with Rousseau's PSICO (Rousseau, 1995; Rousseau, Moulin, & Lapalme, 1996; Moulin & Rousseau, 1994).

With just ALIBI, even though the program itself does not have a strong model of episodes, to humans faced with ALIBI's input and output the reasoning has typically appeared to be definitely concerned with a coherent episode. The optimisation side of ALIBI (i.e., trying to minimise liability, instead of just trying to deny it) more

<sup>&</sup>lt;sup>54</sup> *Multiagent systems* are the subject of Section 6.1.6 below.

<sup>&</sup>lt;sup>55</sup> Speech acts are the subject of Searle (1969), the classic about this subject.

clearly entered the picture with the version named ALIBI3. This is because there was a subjective, built-in quantification of the deontic value of atomic actions in the knowledge representation, and such numeric values were just added up. The overall plan reconstituted and proposed as output had to exhibit as low a total liability as possible.

Like ALIB11 and ALIB12 (the latter enhanced with a simple natural-language processing interface), ALIB13 proposes several alternative accounts of the actions appearing in the charge, with an effort being made to exclude from the explanation such admissions that involve liability. Moreover, ALIB13 is also able, short of finding a totally innocent explanation, to propose such exonerating explanations that admit to some lesser offence than as emerging from the input rudimentary "police report".

In ALIBI's knowledge-base, information is stored in logic form about standard actions, effects, and situations. Distinguish between *typical* situations in the cognitive sense (cf. Nissan, 1995a), and *clear* cases in the legal sense. The court has to determine whether the extremes of certain sets of conditions apply to the case at hand. There is a debate, in jurisprudence, as to whether a demarcation can be found between *clear cases*, i.e., cases for which agreement between competent lawyers can be expected, and *hard cases*, which lead to expert disagreement. In the 1980s, Anne von der Lieth Gardner developed a celebrated program (Gardner, 1987) that tries to distinguish easy from hard cases.

ALIBI, instead, is not really concerned with a legal setting. Explanations are at the lay commonsense, not technically legal level. In ALIBI, excuse-finding exploits degrees of freedom within the non-observable part of the process whose ascertained part is interpreted in the given accusation: as an early phase of performing its task, ALIBI identifies mischievous elements ascribed in this accusation. Classificatory reasoning concerning this phase was the issue in a system developed by Jeffrey Meldman (1975) – cf. Gardner (1987, Section 4.4.1) – which tries to identify, in an input set of facts, intentional torts in cases of assault and battery; examples match exactly, or by replacement in an abstraction hierarchy of objects or kinds of events. ALIBI does not try to figure out whether there is going to be disagreement in court on *judicial* grounds. Instead, in a rudimentary and commonsensical manner, it tries to deny the broader, non-observed context implied by accusers, and it is that way that offences are denied or diminished, and at any rate, *mens rea* is denied.

Moreover, ALIBI is weak on the story coherence side. In handling the stories, I still feel it is important to be able to combine the lessons learnt from the conceptual-dependency school of narrative processing (e.g., Dyer, 1983a) – see on it Section 5.2.9 below – and such constraints as, in a sense, the undeniable elements in the charge which is the input to ALIBI.

Unlike Rousseau's PSICO (see below), ALIBI does not have an actual capability for dialogue. Moreover, to the extent that the narrative to be reasoned about embeds linguistic expression, ALIBI cannot handle it. Therefore, assessing verbal threats (as opposed to armed threat) is outside ALIBI's capabilities. Computational approaches to intentionality and ascription based on the analysis of natural-language utterances were discussed as early as Allen (1983a). In psychology, the ascription of intentions

is just a facet of *attribution*, i.e., "the ways in which ordinary people, acting as 'intuitive scientists', explain human actions and events to themselves" (Edwards & Potter, 1995, p. 87).

Distinguish between a situation in which a person is requested to provide an explanation about specific, circumscribed facts – as in a defence situation seeking exoneration – and, in general, a narration about the Self. In the latter kind, an account is conceptualised and proposed possibly of long spans out of one's biography. Like in testimony about oneself when seeking exoneration, such a task also requires coherent reorganisation of events and mental states (cf. Linde, 1993).

Even when no liability is involved, there is no way self-narration may fit a rigid schema ("emptying the sack", as though, where discrete, fixed objects are supposedly to be found). On top of the task of *re-storying one's experiences*, there is also the aspect of *story-connecting*, which introduces sharing experiences or agency with other agents; connecting to each other's stories occurs, e.g., when individual stories of spouses continue as a couple's story (Parry, 1991).

To augment a model such as ALIBI's with the ability to handle mental states and dialogue, consider Rousseau's PSICO. The latter (Rousseau, 1995; Rousseau et al., 1996; Moulin & Rousseau, 1994) is a prototype that simulates interactions between software agents which interpret, plan, and perform communicative acts as well as to reason on mental states such as goals and beliefs. The approach used in PSICO takes into account phenomena one encounters in human conversations, such as turn-taking, stereotyped sequences (openings, closings, and so forth), as well as interconnected speech acts.

It is a *desideratum*, for ALIBI, to enable reasoning about a story with a cast of characters, instead of just one individual, the accused as in ALIBI. The discussion in Nissan and Rousseau (1997) drew upon Barbara Hayes-Roth's *CyberCafe*, a Stanford project in which Daniel Rousseau had taken part (Rousseau, 1996). *CyberCafe* is an application of the *Virtual Theater* project (Hayes-Roth & van Gent, 1997). In a *Virtual Theater* application, synthetic actors (portraying characters) – either autonomous and fully improvising, or "avatars" directed in the main by users and only partly improvising – can interact with each other and with users to create interactive stories resorting to text, animation and possibly speech.

*CyberCafe* used to feature an autonomous actor playing the role of a waiter, and an avatar portraying a customer. The user-interface contains two windows: one presenting the actions that a user can select for his or her avatar, and one textually describing how the story unfolds in the current context. A user can direct his or her avatar by selecting buttons corresponding to actions that can be performed by the customer in the current context. Actions performed by any actor are displayed by a text animator in a window containing the description of the interaction.

*Cybercafe* is based on local improvisation, which means that all characters decide their behavior relying on the current state of the world and the actions that they can perform. Reasoning on mental states is quite simplified in the system. Possible states of the world, that can be considered as potential goals, and transitions between those states are modeled using state machines. Actions that an actor can perform to enact the (possibly multi-agent) transitions correspond to its abilities.

A synthetic actor knows a list of irrelevant actions for each potential state (e.g., a character who is seated can neither sit down, nor walk). The focus of the *CyberCafe* project was the expression of character personality, but characters enacted a (flexible) scenario. An abstract scenario is enacted by the characters, with freedom allowed up to some (variable) degree.

Other relevant capabilities are related to those of Anthony Jameson's IMP (Jameson, 1983; we mentioned it at the end of Section 2.1.4). IMP is a dialogue system (impersonating a real estate agent) that may try to mislead on purpose, without actually lying. It would not volunteer damaging information, unless a direct, specific relevant question is made. IMP has a goal of maintaining a neutral image of itself and an impression of completeness for its own answers. It was even reported to simulate insulted surprise if an intervening question by the customer seems to imply (by detailed questioning) that IMP is concealing information.

Nissan and Rousseau (1997) strove to propose a unified vision of how to formalise actions in a setting involving several agents, and the mental states that could be associated with them<sup>56</sup>: "Augmenting an ALIBI remake with such a (possibly syncretistic) formalism would enable the artificial defendant (or, possibly, any character from the investigative or legal narrative) to reason on the mental states and the actions to discover self-alibis that could be used to exculpate or incriminate someone accused of a crime".

The approach of Nissan and Rousseau (1997) distinguished between action schemas and action instantiations, as in planning systems like STRIPS (Fikes & Nilsson, 1971) and PSICO (Rousseau, 1995). An action schema is a generic definition of an action, commonly composed of parameters, preconditions, sub-actions, effects, and other useful characteristics. An action schema specifies the types of its parameters.

Most of these parameters take values once the schema is instantiated. Actions are simple or compound. A high-level action is composed of sub-actions, and is commonly called a *stereotyped plan* or *recipe*. Those sub-actions may have to be performed in a certain order, but not necessarily. An atomic action is not composed of sub-actions, and can be performed directly.

Let us consider the propositional content of an action first. An action's propositional content is what the action is about, its conceptual description. In order to describe the propositional content of an action, in Nissan and Rousseau (1997) we proposed to use a formalism based on *conceptual graphs* (Sowa, 1984), in linear form, i.e., by representing the graph by means of formulae.

Such graphs express the semantics of the parameters that are associated with the action. These express the action parameters semantics. They are an extension

<sup>&</sup>lt;sup>56</sup> A rather rudimentary, and application-specific device for representing formally concerted action between agents in a juridic setting was described in Nissan (1995b). The formal framework was SEPPHORIS, which combined a representation of events, stipulations, and legal prescriptions, with a kind of *graph-rewriting grammars* (i.e, a device for transforming parts of graphs, step by step). It actually was a *hypergraph-grammar*. A *hypergraph* can be conceived of as a set of sets. A much more flexible formalism I developed for representing narratives is *episodic formulae*, to which we shall come back elsewhere in this book. See Section 5.3.

of first-order logic predicates, because they draw on modal and upper-order logics. Also, they are very convenient for generating and understanding natural language sentences (Moulin, 1992).

For each parameter of a conceptual graph, we distinguish the conceptual relation and the concept. For instance, for the action prototype 'to steal' we get this graph (here represented in linear form):

Steal(AGT(v-agent), OBJ(v-object), PAT(v-agent2))

*AGT*, *OBJ*, and *PAT* are conceptual relations; *v-agent*, *v-object*, and *v-agent*2 are variables corresponding to concepts once they are instantiated. *AGT* indicates that *v-agent* performs the action of stealing. *OBJ* specifies that *v-object* is what is stolen. *PAT* shows that *v-agent*2 is the victim of the stealing. For example, "John steals Mary's wallet" could be modelled as:

A1: Steal(AGT(John), OBJ(wallet), PAT(Mary))

The conceptual relations we use are based on Sowa's set of relations he proposed (Sowa, 1984), but are not necessarily the same. This is especially true for the relations regarding time. In the previous example, no relation about time is necessary, because the instantiation is at the present tense by default. But we can specify the time an action is performed when it is necessary by using special relations. For instance, "John stole Mary's wallet" could be represented by:

### A2: Steal(AGT(John), OBJ(wallet), PAT(Mary), TENSE(Past))

"John stole Mary's wallet yesterday" could be represented by:

## A3: Steal(AGT(John), OBJ(wallet), PAT(Mary), TIME(yesterday))

However, weighty considerations from linguistics militate against coalescing the notions of time and of tense. We did not delve into problems of temporal representation, but these, especially in connection with the legal domain and legal narratives in particular, have been dealt with elsewhere.<sup>57</sup>

<sup>&</sup>lt;sup>57</sup> E.g., Poulin, Mackaay [sic], Bratley, and Frémont (1992), Vila and Yoshino (2005), Knight, Ma, and Nissan (1998), Zarri (1998), Farook and Nissan (1998), Valette and Pradin-Chézalviel (1998). Nissan (2011a) applies Petri nets to textual interpretation, other than in law. Spatial reasoning, which in particular may be in the legal domain (Nissan, 1997a, 1997b) – is amenable to commonsense modeling (Asher & Sablayrolles, 1995), possibly exhibiting similarities with modeling temporal relations (Cohn, Gotts, Cui, Randell, & Bennett, 1994; Bennett, 1994; Randell & Cohn, 1992).

Adderley and Musgrove (2003a), who applied neural networks to the *modus operandi* modelling of group offending (in particular, to burglaries carried out by gangs) remarked about temporal analysis: "Certain offenders have a propensity to offend within certain hours of the day and on particular days of the week. The detected crimes were compared against the crimes attributed to the

More simply in the present treatment, consider that here, AI, A2 and A3 are labels we associate with action instantiations in order to be able to refer to them easily; it is especially useful when we want to specify a temporal order between actions. For instance, that action A5 was performed before action A6 would be represented by: BEFORE(A5, A6).

A concept can be composed of several objects. For instance, "John and George stole Mary's wallet" could be represented by:

*A4:* Steal(AGT(John,George), OBJ(wallet), PAT(Mary), TENSE(Past)) We model an action schema using a formalism that adds to the usual characteristics of planning operators such information that could be useful to incriminate or exculpate someone. As an example, here is a possible action schema for stealing:

```
ACTION-SCHEMA:
                  Steal(AGT(v-agent),
                         OBJ(v-object),
                         PAT(v-agent2))
                  Own(AGT(v-agent2),OBJ(v-object))
PRECONDITIONS:
                  ~Int.to(v-agent2,Give(AGT(v-agent2),
                  RCPT(v-agent),OBJ(v-object)))
EFFECTS:
                  + Own(AGT(v-agent),OBJ(v-object))
                  - Own(AGT(v-agent2),OBJ(v-object))
                  + ~Int.to(v-agent, Give(AGT(v-agent),
                                           RCPT(v-agent2),
                                           OBJ(v-object)))
CONSTRAINT:
                  NON-EQUAL (v-agent, v-agent2)
ALTERNATIVES:
                  Take(AGT(v-agent),OBJ(v-object))
                  Borrow(AGT(v-agent),
                  OBJ(v-object),
                  FROM(v-agent2))
TRAIT: Honesty(-5)
```

The PRECONDITIONS specify the conditions that must be present before the action is applied. They can be physical or mental states. *Int.To* is an example of modal operator for a mental state like intention. It is based on Grosz and Kraus (1996), except in that we just use the first two parameters in an action schema, without considering time. *Int.To*(x,y) means that x has the intention to perform the action y. Negation is represented by the  $\sim$  operator used as a prefix.

The EFFECTS specify the new states after the performance of the action (preceded by a + sign) and the states that are no longer effective at that stage (preceded

Primary Network to ascertain whether there were similarities or differences between times and days. Temporal analysis presents problems within the field of crime-pattern analysis due to the difficulty of ascertaining the exact time at which the offense occurred. There are generally two times that are relevant: the time that the building was secured and the time that the burglary was discovered, the from time/date and the to time/date. [...]" (ibid., p. 187).

by a - sign). Constraints apply to the parameters of the action description. An alternative can be used to exculpate the agent performing the action by attenuating his or her action.

The set of preconditions and effects is slightly different for those alternatives to be less incriminating for the agent performing the action. In the example, stealing could be considered as a kind of taking if the agent did not know that the object belonged to somebody else.<sup>58</sup> It could be considered as a kind of borrowing if the agent had the intention to give back the object to its owner later.<sup>59</sup>

TRAITS specify how the action is evaluated with respect to some personality traits. For this purpose, use is made of a numeric scale going from -10 to 10. Provisionally, let us assume this kind of representation of traits is acceptable for the domain of application we have been envisioning. In the example considered, -5 would correspond to the dishonesty (or legal unacceptability) of the act of stealing, the negative value standing for it being an offence.

Clearly, in a legal context it may be questionable that a judgement that belongs in court be already attached to a core description of action, and moreover, that a quantification of severity be stated beforehand. The scoring in ALIBI3 is somewhat more sophisticated – in respect to the action (characters' TRAITS are ignored) – but the same remark applies to it as well. The representation of the scores of honesty, as shown here, is very simple; it is akin to the way the scoring of characters' traits works in *CyberCafe* (Rousseau et al., 1996).

More generally, considerations must be made concerning the rationale and the, so to speak, mechanics behind such a rating.<sup>60</sup> Personality traits can be very complex; they are in some relation to experienced and displayed emotions and attitudes toward others. For instance, a character can be very friendly in general (say, a value of 8), except when he or she is most angry at someone (value of -8). In the quite simple universe of *CyberCafe*, a character with such a personality would act violently only if he or she is angry, which restricts opportunities for violent behaviour.<sup>61</sup>

 $<sup>^{58}</sup>$  *Moral luck* is a broader issue. It is your moral luck in that you were not in a given kind of situation, and therefore did not have the opportunity to perpetrate something reprehensible that would fit that kind of situation.

<sup>&</sup>lt;sup>59</sup> Agents' beliefs about their own or others' obligations were discussed, for example, in Nissan and Shimony (1997).

<sup>&</sup>lt;sup>60</sup> Some probability or other likelihood factor could perhaps be associated with the PRECONDITIONS or EFFECTS. Such factors could be used to interpret events when some facts are missing, to understand clearly what happened.

<sup>&</sup>lt;sup>61</sup> In the early 1970s, the late Maria Nowakowska developed a *motivational calculus* (Nowakowska, 1973b, 1984, Vol. 1, chapter 6), and a *formal theory of actions* (Nowakowska, 1973a, 1973b, 1976a, 1978; cf. Nowakowski [sic] 1980), whose definitive treatment was in Nowakowska (1984, Vol. 2, chapter 9). She also developed a *formal theory of dialogues* (Nowakowska, 1976b, 1984, Vol. 2, chapter 7), and a *theory of multimedia units* for verbal and nonverbal communication (Nowakowska, 1986, chapter 3). In 'Theories of Dialogues', chapter 7 in her *Theories of Research*, Nowakowska (1984) devoted chapter 5 to a mathematical model of the "Emotional dynamics of a dialogue", and Section 5.3 to a formalization of a "Provocation threshold". This is relevant, and potentially useful for present-day conversational models involving

In natural-language processing (NLP), Kenneth Mark Colby's PARRY program (Colby, 1975, 1981) embodies in its response mechanism a model of symptoms of paranoia. PARRY used to run in conversational mode, taking as input sentences from a human interviewer. The program embodies in its response mechanism a model of symptoms of paranoia. PARRY impersonates a person experiencing negative emotions or emotional states, the latter being represented by numerical variables for 'anger', 'fear', and 'mistrust'. Colby (1981) "describes a computer simulation model embodying a theory that attempts to explain the paranoid mode of behavior in terms of strategies for minimizing and forestalling shame induced distress. The model consists of two parts, a parsing module and an interpretation-action module. To bring the model into contact with the conditions of a psychiatric diagnostic interview, the parsing module attempts to understand the interview input of clinicians communicating in unrestricted natural language. The meaning of the input is passed to an interpretation-action module made up of data structures and production rules that size up the current state of the interview and decide which (linguistic) actions to perform in order to fulfill the model's intentions. This module consists of an object system which deals with interview situations and a metasystem which evaluates how well the object system is performing to attain its ends" (ibid., from the abstract).

A psychiatrist from Harvard Medical School, Theo Manschreck (1983) – while conceding that "Colby's approach represents an ambitious undertaking, and in some respects it has been successful" (ibid., p. 340) – proposed a narrower interpretation of the results claimed by Colby for PARRY. For example: "Colby's theory sheds virtually no light on the pathogenesis of delusions, the reasons delusions remain fixed and unarguable, the rarity of some delusions and commonness of others, the transient nature of some delusions, the reasons delusions arise suddenly before associated features are present, or at times only when associated features have been persistently present, and so forth. Most clinicians and research psychopathologists would insist that these questions are central to the problem of paranoid behavior and even to the mode of paranoid thinking" (Manschreck, 1983, p. 341).

Colby retorted (1983). He remarked: "The theory presented in the target article proposes that the paranoid system described approximates an instance of a theoretical purposive-cognitive-affective algorithmic system physically realized in the model. Both in the target article and in my Response to the first round of commentaries, I stressed that *the theory proposed does not account for the initial origin of the paranoid mode*. It is limited to explaining in part how the empirical system *works now*. It is not an ontogenetic explanation of what factors in the patient's history resulted in the acquisition of his paranoid mode of processing information. It formulates proximate, not ultimate causes" (ibid., p. 342). It is important to realise that just as Manschreck was a psychiatrist, Colby, too, was affiliated with psychiatry: he was with the Neuropsychiatric Institute at the School of Medicine of the University of California, Los Angeles. The focus of Colby's interests, too, was in psychiatry.

A much more sophisticated NLP program than PARRY in respect of artificial intelligence (rather than of psychological claims), namely, BORIS, was developed by Michael Dyer (1983a), an author who afterwards made significant contributions to connectionist NLP, as well as to the emerging paradigm of "artificial life". BORIS, that by now must be put into a historical context, but still offers important insights, detects or conjectures characters' affect on processing narrative textual accounts. Reasoning is carried out according to this kind of information. For example, a character is likely to be upset because of a plan failure (which to BORIS heightens arousal: possibly anger, though not specifically frustration). Characters' plan failures within a plot are the central concept employed by BORIS for understanding the narrative. Such NLP processing requirements were the only criterion when designing the representation and treatment of affects in BORIS (Dyer, 1983a, p. 130). "BORIS is designed only to understand the conceptual significance of affective reactions on the part of narrative characters. To do so BORIS employs a representational system which

emotions, in the design of computer interfaces, or of software supporting the interaction among a group of human users.

Rating an action in terms of personality traits is just an indication about whether such an action would be likely to be selected by a character, based on his or her personality. It must said right away that whereas one may choose to incorporate such representations in an automated storytelling environment, such a choice is fraught with insurmountable difficulties if the model is intended for making sense of a legal narrative, or even as a predictor of behaviour or a descriptor of behaviour patterns of given individuals from real life.

First and foremost, people make moral choices, and the bottom line is that they are endowed with free will. The rationality of an individual's decision-making, in terms of normative models and expected utility, may vary subjectively or ideologically (cf. Baron, 1994). Moreover, there are cultural norms which are learned quite early while personality develops in a social context.

Emotional *displays* are not universal among cultures, in that differences have been pointed out in culture and emotion research about culture-bound social norms about acceptability, as well about patterns shaping emotion in ways that to some researchers can be conceptualised as being script-like. Cross-cultural psychology is a thriving area of research.<sup>62</sup> One direction of research is into how different cultures

A model of artificial emotions was proposed by Camurri and Ferrentino (1999). They argued for its inclusion in multimedial systems with multimodal adaptive user-interaction. Their applications are to dance and music. In its simplest form, to Camurri and Ferrentino, an artificial agent's "emotional state is a point in space, which moves in accordance with the stimuli (carrots and sticks) from the inside and the outside of the agent" (ibid., p. 35). The agent is robotic, and movements (for choreography) are detected. The stimuli change the agent's affective "character", which is a point in a space of two dimensions (ibid., p. 38).

The two axes represent the degree of affection of the agent towards itself and towards others, respectively. We call these two axes "Ego" and "Nos", from the Latin words [for] "I" and "We". A point placed in the positive x (Ego)-axis represents and agent whose character has in a good disposition towards itself. A point towards the left (negative) Ego would mean an agent fairly discouraged about itself. The emotion space is usually partitioned into regions [...] labeled by the kind of character the agent simulates.

shares AFFECTs to one another through decomposition and shared inferences" (ibid.). For example, somebody who has just been fired may go home and kick his dog; the former event explains the latter (ibid., p. 131). Admittedly, there was no intent to model emotions or emotional states as such. Also see Dyer (1983b, 1987) on affect in narratives, or on computer models of emotions.

Apart from BORIS, the treatment of emotion in OSCAR deserves mention. This program, described by John Pollock in his book *How to Build a Person* (1989), embodies a partial model of human cognitive states and emotions. Besides, William S. Faught (1978) described "a model based on conversational action patterns to describe and predict speech acts in natural language dialogs and to specify appropriate actions to satisfy the system's goals" (ibid., p. 383). Faught credits Izard's (1971) *differential emotion theory* (cf. Izard, 1977, 1982) and his own (Faught, 1975) "extension of it into affect as motivation for other thought processing" (Faught, 1978, p. 387).

<sup>&</sup>lt;sup>62</sup> In their textbook, Shiraev and Levy remarked (2007, pp. 22–23): "One of the assumptions in contemporary cross-cultural psychology is that it is not possible to fully understand the psychology of the people in a particular ethnic or any other social group without a complete understanding of the social, historic, political, ideological, and religious premises that have shaped people of this group. Indigenous theories, including indigenous psychology, are characterized by the use of

shape the expression of emotion (e.g., Kitayama & Markus, 1994; Nissan, 1997c). It must be said that the pendulum has been swinging between the cultural relativism – "revived in the 1980s" (Griffiths, 2003, p. 300) – of the social constructionists, in emotions research, and the universalists. But eventually, the two camps have become less incompatible (ibid.).<sup>63</sup>

Paul Griffiths also remarks: "It is true that [the universalist] Ekman has argued that the 'display rules' that modulate emotional behaviors according to social context are acquired, culturally specific, and do not interfere with the actual internal working of the automatic appraisal mechanism and the affect programs" (ibid., p. 299).<sup>64</sup>

Peter Stearns, himself the author of histories of specific emotions in U.S. history<sup>65</sup> (Stearns, 1989, 1994; Stearns & Haggerty, 1991; Stearns & Stearns, 1985, 1986, 1988), has elsewhere (Stearns, 1995) provided a clear description of the controversy about "nature or nurture" in emotions.<sup>66</sup> Constructionists argue, in contrast, that emotions are culture-specific: "Constructionism is the great new theoretical

conceptions and methodologies associated exclusively with the cultural group under investigation (Ho, 1998). [...] Maybe because of disappointing beliefs that contemporary psychologists cannot really comprehend all other cultures, a growing interest in indigenous psychologies has emerged." <sup>63</sup> So Griffiths (2003, pp. 300–301): "One influential argument starts from the widely accepted idea that an emotion involves a cognitive evaluation of the stimulus. In that case, it is argued, cultural differences in how stimuli are represented will lead to cultural differences in emotion. If two cultures think differently about danger, then, since fear involves an evaluation of a stimulus as dangerous, fear in these two cultures will be a different emotion. Adherents of Ekman's [universalist] basic emotions theory are unimpressed by this argument since they define emotions by their behavioral and physiological characteristics and allow that there is a great deal of variation in what triggers the same emotion in different cultures. Social constructionists also define the domain of emotion in a way that makes basic emotions research less relevant. The six of seven basic emotions seem to require minimal cognitive evaluation of the stimulus. Social constructionists often refuse to regard these physiological responses as emotions in themselves, reserving that term for the broader cognitive state of a person involved in a social situation in which they might be described as, for example, angry or jealous."

<sup>&</sup>lt;sup>64</sup> Discussing transactional theories of emotions, Griffiths (2003, p. 299) remarked: "To behave angrily *because* of the social effects of that behavior is to be angry insincerely. This, however, is precisely what transactional theories of emotion propose: emotions are 'nonverbal strategies of identity realignment and relationship reconfiguration' (Parkinson, 1995, p. 295). While this sounds superficially like the better-known idea that emotions are 'social constructions' (learnt social roles), the evolutionary rationale for emotions view, and the existence of audience effects in non-human animals, warn against any facile identification of the view that emotions are social transactional view may seem less paradoxical to many people once the idea that emotions are strategic, social behaviors is separated from the idea that they are learnt behaviors or that they are intentional actions."

<sup>&</sup>lt;sup>65</sup> Jan Plamper, who interviewed three leading practitioners in the history of the emotions, has pointed out: "The history of emotions is a burgeoning field – so much so, that some are invoking an 'emotional turn'" (Plamper, 2010, p. 237).

<sup>&</sup>lt;sup>66</sup> Stearns (1995, pp. 38–39): "The most belligerent camps in the emotions field involve naturalists or universalists on the one hand, and constructionists on the other. [...] [M]any scholars reject compromise [...]. Naturalists, often building from Darwinian beliefs about emotions' role in human survival, tend to argue for a series of innate emotions, essentially uniform (at least from one group of people to the other) and often, as with anger or fear, biologically grounded (Kemper [etc.]). [...]

paradigm of the late twentieth century in emotions research [...]. Naturalists focus on the functions that emotions offer individuals, though they may assume some societal response to uniform signals. Constructionists focus more clearly on connections between social needs that cause a particular kind of emotional display, and the social results that same display generates." (Stearns, 1995, p. 39). Another practitioner of the history of emotions, William Reddy, published an article entitled 'Against Constructionism' (Reddy, 1997). Also see his book Reddy (2001).

For actions in crime stories as per our *dramatis personae* approach, a higher-level plan would include a decomposition indicating the sub-actions that are components of the action schema. For instance, robbing a bank would include the following actions: entering the bank, getting the money, and leaving. Those actions should be executed in order to get the expected effects. We can use temporal relations between actions to specify their order (e.g., as in Knight, Ma, & Nissan, 1998).<sup>67</sup>

Mental states such as beliefs, mutual beliefs, intentions, commitments, and abilities are very important to determine the responsibility of an agent in any legally significant situations possibly involving being an accessory to crime.

In relation to agents' abilities, *incentive contracting* is possibly involved in complicitous action. In incentive contracting (Kraus, 1996; Sappington, 1984), an agent may contract out to another agent (that does not necessarily share the same goals) a task that the former cannot perform (either at all, or as effectively). Sarit Kraus noted (1996, p. 298):

There are two main ways to convince another self-motivated agent to perform a task that is not among its own tasks: by threatening to interfere with the agent carrying out its own tasks, or by promising rewards<sup>68</sup> [...]. This paper concentrates on subcontracting by rewards which may be accomplished in two forms: The first approach is a bartering system, where one agent may promise to help the other with future tasks in return for current help. However, as has long been recognized in economics, bartering is not an efficient basis for cooperation, particularly in a multi-agent environment. An agent wishing to subcontract a task to another agent may not have the ability to help it in the future, or one agent that can help in fulfilling another agent's task may not need help in carrying out its own tasks. The second approach is a monetary system which is developed for the provision of rewards, and which can later be utilized for other purposes.

In this paper we present a model of automated agents where incentive contracting is beneficial, We propose to use a monetary system in a multi-agent environment that allows for side payments and rewards between the agents, and where profits may be given to the

Other approaches to naturalism are possible that move away from fixed emotion lists while preserving the importance of an innate, physiological component. Psychoanalyst Daniel Stern (1985), utilizing studies of infants, has posited a set of 'vitality affects', defined as very general surges of emotional energy in infants that are then shaped by contacts with adult care-givers into discrete emotions. Possibly some combination approach will turn out to work well, with a few basic emotions (like fear) combined with the more general vitalities that can be moulded into a more variable array including such possibilities as jealousy (found in many cultures but not all, and probably involving a blend of several distinct emotions including grief, anger and fear) or guilt."

<sup>&</sup>lt;sup>67</sup> In Section 8.4.2.3 we are going to briefly deal with formal models of time.

<sup>&</sup>lt;sup>68</sup> Incidentally, in a study in the psychology of interrogations, Kassin and McNall (1991) discussed promises and threats in police interrogation, by pragmatic implication.

owners of the automated agents. The agents will be built to maximize expected utilities that increase with the monetary values, as will be explained below. Assuming that each agent has its own personal goals, contracting would allow the agents to fulfill their goals more efficiently as opposed to working on their own.

Nissan and Rousseau (1997) proposed to use a formalism based on Grosz and Kraus (1996) in order to model the modalities necessary to reason on mental states with respect to the action schemas. Namely, the following, as introduced by Grosz and Kraus, would be resorted to:

- $Bel(G,p,T_p,C_p)$ : agent G believes that the proposition p is true at time  $T_p$  in the context  $C_p$  (a proposition may be a state or any of the modalities described here);
- $MB(G_1, G_2, p, T_p, C_p)$ : agents  $G_1$  and  $G_2$  mutually believe that the proposition p is true at time  $T_p$  in context  $C_p$ ;
- *Int.To*( $G,a,T_i,T_a,C_a$ ): agent G has the intention, at time  $T_i$ , of performing action a at time  $T_a$  in context  $C_a$ ;
- *Int*.*Th*(*G*,*p*,*T<sub>i</sub>*,*T<sub>p</sub>*,*C<sub>p</sub>*): agent *G* has the intention, at time *T<sub>i</sub>*, that proposition *p* be true at time *T<sub>p</sub>* in context *C<sub>p</sub>*;
- *Pot.Int.To*( $G, a, T_i, T_a, C_a$ ): at time  $T_i$ , agent G considers the possibility of performing action a at time  $T_a$  in context C;
- *Pot.Int.Th*( $G, p, T_i, T_p, C_p$ ): at time  $T_i$ , agent G considers the possibility of wanting that proposition p be true at time  $T_p$  in context  $C_p$ ;
- *Exec*( $G,a,T_a,C_T$ ): agent G has the ability to perform action a at time  $T_a$  under the constraints  $C_T$ ;
- *Commit*( $G, a, T_a, T_i, C_a$ ): agent G commits him/her/itself at time  $T_i$  regarding the performance of action a at time  $T_a$  in context  $C_a$ ;
- $Do(G,a,T_a,C_T)$ : agent G performs action a at time  $T_a$  under constraints  $C_T$ .

Actions and propositions are described using conceptual graphs, as we do in action schemas. We can use those modalities in several ways with respect to the action schemas. Consider the following example:

John and George wanted money. They went to a bank. John pointed a revolver to a cashier and asked for money. George pointed a revolver to other people over there. After John got the money from the cashier, they ran away.

John and George clearly obtained the money from the bank by means of armed robbery. We can likely establish their responsibility because of the following mental states:

- John and George both believed that the cashier, representing the bank, had money;
- John and George shared the belief that they could get the money by force;
- John showed his intentions of robbery, by pointing a gun on the cashier;
- George showed his intention to unlawfully obtain the money by aiming a revolver at people who were at the bank while John was with the cashier;

• Once they had the money, they ran away, and there is no reason to believe<sup>69</sup> that they went into that trouble harbouring any intention to bring it back (an intention they didn't state, and of which they made no display).

Contrast the latter to another situation, in which somebody sharing your place (possibly a relative) takes a banknote from the table and rushes away before the post office closes down. You see, there is a bill to pay, and the person also blurted out something about the bill, the timetable, or the post office. You have no reason to entertain the hypothesis the the given person is about to elope (moreover leaving in place far more valuable property).

We could eventually have different possible types of mental states associated with an action. For instance, aiming with a revolver at someone for joke,<sup>70</sup> or, instead, to

The jeweller had been recently robbed twice, so he had a pistol hidden under the till, and he had already had the opportunity to use it in order to defend himself from a robbery (he had shot and wounded two robbers). Tabocchini was arrested, and tried 18 days later for unintentional excessive legitimate defence ("eccesso colposo di legittima difesa"). He was acquitted, as he had shot for putative legitimate defence ("legittima difesa putativa"). Comments about the tragedy pointed out that re Cecconi was one of the few players of Lazio who didn't own a firearm.

That episode is retold at: http://it.wikipedia.org/wiki/Luciano\_Re\_Cecconi and http://www. laziowiki.org/wiki/La\_tragedia\_della\_morte\_di\_Re\_Cecconi (a site of Lazio football club) The journalist Enzo Fiorenza published an instant book about that tragedy (Fiorenza, 1977), paradoxically with a publisher called "Centro dell'Umorismo Italia".

<sup>&</sup>lt;sup>69</sup> On the dynamics of epistemic states, cf. e.g. Gärdenfors (1988). We don't concern ourselves with the philosophical debate on whether true belief amounts indeed to knowledge (Sartwell, 1992), on epistemic luck (Engel, 1992), and so forth. Trenton Merricks (1995) takes issue with Alvin Plantinga's (1993a, 1993b) concept of *warrant*, i.e. – as quoted from Plantinga (1993a) by Merricks (1995, p. 841) with a correction – "that, whatever precisely it is, which makes the difference between knowledge and mere true belief". "A *warranted belief*, for our [i.e., Merricks'] purposes, is one that, given its content and context, has enough by way of warrant to be knowledge" (Merricks, 1995, p. 841, fn. 2), which is focal to a debate in the philosophy of knowledge, but is arguably a moot point for jurisprudence. On justified belief within the theory of justification in philosophy, cf Alston (1989), Goldman (1986), Sosa (1991), and Clay and Lehrer (1989). From the literature of AI, see, e.g., Maida (1991) and Ballim and Wilks (1991).

<sup>&</sup>lt;sup>70</sup> Luciano Re Cecconi, born in 1948, was a well-known football player in Italy (his club was Lazio). He was shot dead in Rome in the evening 18 January 1977 by a jeweller, Bruno Tabocchini, when Re Cecconi carried out a prank by posturing as though he was threatening him in order to rob him. Re Cecconi did so in the mistaken belief that he, being a celebrity, would be promptly recognised and the jeweller would realise he was just joking. Re Cecconi was accompanied by another well-known football player, Pietro Ghedin, and of Giorgio Fraticcioli, the owner of a perfumery. The purpose of the visit to the jeweller's was so that Fraticcioli could consign two perfume bottles he was ordered. On the spot, it occurred to Re Cecconi, with a raised collar, to simulate that his right hand inside a pocket of his coat was a pistol. He exclaimed: "Datemi tutto, questa è una rapina!" ("Give me everything, this is a robbery!"). The jeweller wasn't a football fan, and didn't recognise Re Cecconi, all the more so as he hadn't been looking at his visitors: Re Cecconi had shouted behind the back of the jeweller, so the latter turned and shot in the chest Re Cecconi, who died half an hour later. On falling, Re Cecconi whispered: "Era uno scherzo, era solo uno scherzo" ("It was a prank, just a prank"). Ghedin had raised his own hands, identified himself, turned towards Re Cecconi and told him to stand up as the prank was over, but then noticed that his companion was bleeding.

get something from that person or another person (or a group of persons including the one threatened: who on the other hand, could even be an accomplice), or, then, to kill that particular person.

Arguably, a model of complicitous action would benefit not only from extant formalism of collaborative action as well as incentive contracting, but also from Antonio Martino's *logic for politics*, originally introduced in an Italian-language article (Martino, 1997), but whose English-language version is now accessible online.<sup>71</sup>

Martino (1997) introduced two modal operators for political action: operator P stands for seeking authority or rights, whereas operator C stands for performing conformity as a form of support or obeisance, this being the price which those seeking rights (pressure groups, or citizens) pay those political individuals or bodies from which they hope to obtain them.

Moreover, Martino (ibid.) suggested that an operator or a relation may stand for each of various political functions (protection, arbitrage, jurisdiction, regulation, allocation). Other modal operators, according to Martino's proposal, would take care of possibility and necessity, which is in order to distinguish between actual and desirable states of affairs.

Yet other operators or types of operators would handle those preferences that sort out the political actors in order to (a) elect the candidates, and (b) elect policies, the preferences having to be defined by taking into account considerations on relations in general, and on hierarchical relations in particular. Martino avers that generally speaking, those who seek rights pay for these rights with their political support. But who it is who gives such support is often not interchangeable (as he stated while giving a talk in Pisa in 1997, the prime minister would be much more relieved, were it the boss of Fiat who rings him up and voices support, rather that Prof. So-and-So who is sitting here). One person, one vote, Martino noted, is fine for the elections, but in everyday actions, social actors are situated (*posizionati*), and their support depends not only (and not as much) on its quantity, but, as well, on its position with respect to violent or symbolic resources.

We only briefly quote here some introductory concepts from the English version of Martino (1997):

let us create an operator "P" as "political action".

A political action: A1...An⊢B PA1...PAn⊢PB

What is implied by political action as a whole is a political action. A1...An is any kind of whole (it can even be empty) and B is a statement or sequence that can also be empty but cannot be a sequence with more than one statement. Since B is a statement, it can be denied and in general all the operations can be done with it that are possible with statements.

Because it is a unitary operator P the formal characteristics very close to negation.

<sup>&</sup>lt;sup>71</sup> http://www.antonioanselmomartino.it/index.php?option=com\_content&task=view&id= 26&Itemid=64

We can even go further: "political action" is clear but generic. Positive political action is the search for guaranteed conformity, whereas passive political action is the giving of support or consensus. Thus we could limit operator P to the first kind of political action: search for guaranteed conformity and search for authority, whereas we can represent the giving of support or consensus with the operator C. C is not an independent operator but one that can be defined based on P as a complementary operator. For this we have to use the notions of complement in the class logic. Given a class of any a, its complement 'a' is the class of all the object that do not belong to a. This presupposes a universe where either one belongs to a or to its complement. From class logic it is very easy to pass to quantificational logic, given that, after all, classes are none other than the expression of classical categorical propositions.

A complement can also be a term and not a class [...] For example the complement of the term "voting" we write "non-voting" but the complement of the latter we would write "voting" instead of "non non-voting". Conversion, or the converse in categorical propositions could not be validly deduced for A; for example all dogs are animals, the converse "all animals are dogs" is not valid. Medieval logicians managed to solve the problem with the so-called conversion by limitation. The converse of a given proposition contains exactly the same terms as this (with the order inverted) and has the same quality. [...]

Our operator C, on the one hand is the "obverse" of P, in the sense that those that struggle for power have P with reference to all the others, B, C, D...N, whereas these are found in relation C with the A's. Moreover, not only is it the inverse but also the converse, given that changing the terms of the predicate subject and keeping its quality, P and C as operators can be interdefined.

A has P with reference to B, C,  $\dots$  N, and B, C,  $\dots$  N have C with reference to A.

Given that the meaning of logic signs is shown in a context of deduction using their usage and function, it is possible, once the context is specified, to give the criteria for introduction and elimination in such a context. A logic for politics consists in this. Then it is necessary to go to verify in pragmatic contexts what the rules are that best adapt themselves to this existing practice.

Of course, when it comes to evidence, that co-defendants were an accessory to the crime of which the other one is accused is something to be proven. For example, consider the following casenote, which I owe to Jeb McLeish of Edinburgh (pers. comm., 2010), and that comes from the Proceedings of the Old Bailey in London, which are now accessible online:

#### Sarah Gideon, Anne Wood, Grand Larceny, 10th of December 1712

Sarah Gideon and Anne Wood of the Parish of St. Mary Woolchurch, were indicted for stealing Eight Shillings and Six Pence from James Marriot on the 27th of November last, Mr. Marriot depos'd, that the Prisoners came into his Shop to buy Two Half-pounds of Rice; and while Wood was buying; Gideon fish'd the Money out of the Till with a piece of Whalebone and Birdlime; which he perceiving something of seiz'd her in the Fact the Money and Whalebone Being found upon her, and both clammy with the Birdlime. She had nothing to say in her Defence, but deny'd she knew Wood, as Wood did also that she knew her, and said she only went to buy the Rice; whereupon she was acquitted, and Gideon found Guilty of Felony.

This is a case in which either the co-defendants had not been complicitous and had only been believed to have been so when Sarah Gideon was caught red-handed, or then Anne Wood had been an accessory and had deliberately facilitated the crime of Sarah Gideon, but then the latter sought to exonerate her, and to protect her from conviction.

#### 2.2.2.8 Wells and Olson's Taxonomy of Alibis

Two forensic psychologists, Gary Wells and Elizabeth Olson, from Iowa State University, began their article (Wells & Olson, 2001)<sup>72</sup> by claiming: "We are interested in the psychology of alibis. Nevertheless, there is little if any empirical literature on alibis". Olson and Wells (2002, pp. 3–4) identified some relevant items from the scholarly literature:

Although an empirical literature on alibis has not yet been developed, there are a few empirical studies that have used alibis to test hypotheses about other issues, principally eyewitness identification issues. Leippe (1985) for example, used alibi testimony to examine mock juror judgments of various forms of eyewitness identification and non-identification evidence, but the alibi information was held constant, not manipulated. McAllister and Bregman (1989) manipulated whether an alibi witness positively identified the defendant (thereby corroborating the alibi) or not and, as expected, failure of the alibi witness to corroborate the defendant's alibi led to more guilty verdicts from mock jurors. Lindsay, Lim, Marando, and Cully (1986) manipulated whether or not an alibi witness was a relative of the defendant and found that only the nonrelative alibi witness was able to reduce convictions when there was an eyewitness who had identified the defendant as the culprit. Although all three of these studies used alibi witnesses, the studies were focused primarily on issues of eyewitness identification, not alibis. Alibis were used merely as tools to find out how people think about eyewitness identification issues. The only empirical study that we have been able to find that was devoted to alibis per se was one conducted by Culhane and Hosch (2002).<sup>73</sup> In their study, the alibi witness was either a neighbour or a girlfriend and the witness was either certain or not certain in making either an identification or non-identification of the defendant as being at his home during the time of the crime. Their results, like those of Lindsay et al., showed that mock jurors were persuaded by the alibi only if the alibi corroborator had no relationship with the defendant.

Clearly, the relationship between the defendant and the alibi corroborator affects the believability of the alibi. But this represents a small start to what seems to us to be a potentially rich literature. [...]

<sup>&</sup>lt;sup>72</sup> This, like a more extensive report, Olson and Wells (2002), also published at the website of Gary Wells (and accessed by myself in 2011), was based on Olson's master's thesis. Portions of the data in Olson and Wells (2002) were presented at the 2001 Biennial Meeting of the Society for Applied Research in Memory and Cognition. Olson and Wells (2002) included the description of the results of experimentation. "Participants were 252 students from a large Midwestern university recruited for an experiment titled 'Police Detective Reasoning Skills'" (ibid., p. 11).

<sup>&</sup>lt;sup>73</sup> Cf. Culhane and Hosch (2004). Incidentally, it is worthwhile to note that Culhane et al. (2004) researched possible bias on the part of crime victims serving as jurors, whereas Culhane and Hosch (2005) researched whether there is bias against the defendant on the part of law enforcement officers serving as jurors. Scott Culhane is affiliated with the Department of Criminal Justice at the University of Wyoming. He earned a Ph.D. in legal psychology at the University of Texas at El Paso in 2005.

Literally, an *alibi* is a plea that the suspect or defendant one wasn't at the scene of the crime, so that being removed therefrom, one cannot be the guilty party.<sup>74</sup> First of all, Wells and Olson (2001) distinguished between true and untrue alibis. Untrue alibis are either fabricated alibis, or mistaken alibis. In the latter, the person providing the alibi claims to have been at some given place by believing that claim to be true, because of an honest memory error. They mentioned the case of Ronald Cotton, who had claimed an untrue alibi, and this was a factor in his being found guilty and sent to prison, even though he was innocent.

So we know what an alibi *is*, but we don't know what makes an alibi *good*. In our opinion a strong, believable alibi is one that keeps the person providing the alibi OUT of hot water: either by keeping him or her out of prison or out of the suspect pool altogether.

To establish an alibi, that is to say, to make an alibi credible, some evidence has to be provided: "some type of evidence that solves a time/space problem: the evidence MUST speak to both the space one was in and the time that one occupied that space." In order "to help codify what is a strong, believable alibi", Wells and Olson (2001) proposed a taxonomy. Writing in 2001 their informal article (it is posted at the website of Gary Wells, itself a helpful resource for eyewitness research), they acknowledged that they kept refining that taxonomy, and that before using it, one would better find out with them what their current thinking is. (I accessed their posted paper in 2011.)

<sup>&</sup>lt;sup>74</sup> In some circumstances, it may even not be obvious to a perpetrator that he needs an alibi. But then an innocent person may also not have a provable alibi. Don Vito Cascio Ferro (1862-1943) had been an anarchist agitator in Sicily in 1892; he afterwards became a mafia boss, and moved to the United States, where, welcomed by the Mano Nera criminal organisation, allegedly he was the one who introduced the practice of protection money (or racket, in Sicilian u pizzu, i.e., their own "beak" that blackmailers want to wet). Having moved back to Sicily in 1904, he became well connected with persons in the institutions. When the New York City police detective Lieutenant Joe Petrosino came to Italy to investigate him, Cascio Ferro had him stalked all the way. In the evening of 12 March 1909, Petrosino was killed in Piazza Marina in Palermo. (Eventually, New York city hall dismissed the police chief, who was considered responsible for the secret of Petrosino's trip not being kept.) Baldassare Ceola, a Northerner who was questor (police chief of the province) in Palermo and had been questor in Milan earlier on, had Cascio Ferro arrested. Cascio Ferro appeared surprised, and did not even have an alibi. But the case was taken away from Ceola, who was moved elsewhere with the rank of prefect (governor of a province). The inquiry ended with Cascio Ferro not being prosecuted, because the evidence against him was considered insufficient. It was only in 1930 that Cascio Ferro got a life sentence for correità morale (as a moral accessory) in two other murders. While in prison, Cascio Ferro stated that he was the one who carried out Petrosino's murder, and that this was the only time he had personally killed somebody. He claimed that on the given evening, he was hosted at dinner by a member of Parliament, that he left for a while in order to kill Petrosino, and that then he returned to the dinner. That statement was published in the New York Times on 6 July 1942. Arrigo Petacco, in his biography of Petrosino (1972), disbelieved Cascio Ferro's claim, remarking that at the time of the murder, Cascio Ferro was a guest for dinner of a member of Parliament indeed, but that the place was Burgio, not Palermo, so Petrosino would not have had the time to also be in Palermo and kill Petrosino, then return to that dinner. It is usually conceded that Cascio Ferro had some role in the murder (Pallotta, 1977, pp. 24-28, 106-107). It is interesting that being a guest for dinner could be an alibi, unless a "momentary" absence is noticed. But when arrested for Petrosino's murder, Cascio Ferro did not have an alibi.

#### 2.2 Reasoning About a Charge and Explanations: Seminal Tools

Our taxonomy follows the approximate order with which we think alibis will be evaluated in terms of their credibility in the eyes of most people (including police, judges, lawyers, and jurors). Our taxonomy of alibis factorially combines multiple levels of two types of variables, namely physical evidence (such as receipts or video) and person evidence (someone who can vouch for your whereabouts).

Wells and Olson (2001) claimed that the *alibi process* operates in two general psychological domains: the *generation domain*, and the *believability domain*. "The *generation domain* includes within it issues of memory – the autobiographical memory of the alibi provider<sup>75</sup> as well as the memories of the people who are asked to corroborate an alibi". Wells and Olson (2001) identified two phases, within the generation domain, namely: the *Story Phase*, at which the alibi provider makes the memory statement, and the *Validation Phase*, at which "the evidence offered in support of the alibi is researched. This can be undertaken by many people, including the alibi provider and police investigators".

From the validation phase of the generation domain, the alibi process moves, according to Wells and Olson (2001), into the *believability domain*, which also has two phases. The first phase is the *Evaluation Phase*, "undertaken by anyone who experiences the alibi – police, newspaper consumers, lawyers. People decide for themselves the strength of the alibi". And finally, there is the fourth phase of the entire alibi process, that is, the second phase of the believability domain. This is the *Ultimate Evaluation Phase*, one that not all alibis reach. Some alibis do not reach this phase. This is when the (legal) truth of the alibi is decided in court. Having been presented in court, the fact-finder (either trained judges at a bench trial, or otherwise a jury) decides which account of the events to accept. "Other evidence surrounding the case will influence this phase".

Before turning to the taxonomy, Wells and Olson (2001) offered some propedeutic "Taxonomy Notes". They remarked that alibi generation is a time/space problem, so "all evidence you gather to support your alibi must speak to BOTH the space you occupied and the time you occupied it". They distinguished between *Physical Evidence* (which may be any of the following: nonexistent, easy to fabricate, or difficult to fabricate), and *Person Evidence*. The latter depends on how credible persons are, based on their respective expertise and trustworthiness.

Wells and Olson (2001) then proposed the roles of the Motivated Other, the Non-Motivated Stranger, and the Non-Motivated Familiar Other. A motivated other is concerned with the outcome, and whereas this person can rule out the possibility of mistake (that person's expertise is high), that same person's trustworthiness is low, because he or she is very likely to be motivated to lie. The non-motivated stranger, by contrast, is unconcerned with the outcome. This is a person who by definition only saw the accused once. Therefore, the trustworthiness is high, but expertise is low. Wells and Olson (2001) averred about the non-motivated stranger: "May be

<sup>&</sup>lt;sup>75</sup> Olson and Wells (2002, p. 27) supplied this definition: "The term *alibi provider* refers to the suspect or defendant who is being questioned regarding his or her whereabouts at the time of the crime. We call a person whose statements are put forward to support the alibi an *alibi corroborator*. Although an alibi corroborator is 'providing an alibi' for the suspect in the colloquial sense, we reserve the term *alibi provider* for the suspect him or herself."

mistaken (like an eyewitness) but people not likely to consider this. Scientists may be a little leery about this category but most people would not likely distinguish too much between these". The third role is that of the non-motivated familiar other. While unconcerned with the outcome, such a person "could be acquaintance or someone who sees you on a regular basis (bus driver) but does not know you (trustworthiness high, expertise moderate/high)". For the non-motivated roles, motivation to lie is unlikely, but some hidden motivation may affect the non-motivated familiar other.

Wells and Olson proposed a "Factorial Taxonomy" of the strength of the alibi, as well as a "Full-Page Taxonomy". In the factorial taxonomy (Table 2.2.2.8.1), the rows correspond to the categories of physical evidence, whereas the columns correspond to the categories of person evidence.

As to Wells and Olson's (2001) "Full-Page Taxonomy", its rows are degrees of alibi strength, whereas the columns are: "Alibi Strength", "Properties" (comprising two columns: "Person Evidence", and "Physical Evidence"), and "Examples". For alibi strength 1 ("No Alibi"), the value for both Person Evidence and Physical Evidence is "None", and examples include: "I don't even remember", and "I was home alone in bed". For alibi degree 2 ("Weak"), there are two rows. Of these, the first row has "None" for the person evidence, and "Easily Fabricated" for the physical evidence. Wells and Olson's (2001) examples are: "Computer file showing creation time", and "Store receipt for cash purchase". Also for alibi strength 2 ("Weak"), there also is this other row: the person evidence is "Motivated Other", and the physical evidence is "None". The example include: "I was home with Mom", and "My best friend and I were playing video games".

Also for alibi strength 3 ("Moderately Weak") there are two rows. The first of these has as person evidence "Stranger", and as physical evidence, "Easily Fabricated". The examples include: "Subway security officer", and "Elderly couple at the next campsite". The other row for alibi strength 3 ("Moderatly Weak") has as person evidence "Familiar Other Non Motivated", and as physical evidence "None". The example is: "Bus driver on your usual route".

For alibi strength 4 ("Moderately Strong"), again Wells and Olson (2001) have two rows. The first of these has as person evidence "Stranger", and as physical evidence, "Easily Fabricated". The example is: "Person in tour group corroborates and you have a dated/timed ticket stub". The other row for alibi strength 4 ("Moderatly Strong") has as person evidence "Familiar Other Non Motivated", and as physical evidence "Easily Fabricated". The example is: "Signed, dated receipts from shopping and your usual bus driver remembers".

<b>Table 2.2.2.8.1</b> Wells andOlson's (2001) factorialtaxonomy for alibi strength			Person evidence			
	Physical evidence	None	1	2	3	3
	-	Easy to fabricate	2	3	4	4
		Difficult to fabricate	5	5	5	5

For alibi strength 5 ("Strong"), Wells and Olson have four rows. All four rows have "Difficult to Fabricate" as physical evidence. Of these four rows for strong alibis, the first row has "None" as person evidence, and examples include: "Plane ticket stub", and "Security camera video at another location". The second row has "Motivated Other" as person evidence, and the example it this ascribed utterance: "I was flying to Vegas with my wife". The third row has "Stranger" as person evidence, and the example is: "Plane ticket and the flight attendant". The fourth and last row has "Familiar Other Non Motivated" as person evidence, and the example is: "On camera with retinal scan while checking through security at a defense contractor company". Retinal scan is a *biometric* method employed in *personal authentication systems*, and based on an individual person's body or sometimes behavioural features. Biometric methods are resorted to also in e-banking, e-commerce, smart cards, and access to sensitive databases, as well as (such as in the example) for access into premises with security requirements.

It appears from this that how easy it would be to fabricate the physical evidence was deemed to be stronger than ther person evidence. Olson and Wells claimed (2002, pp. 9–10):

Based on the ease-of-fabrication construct, we created multiple levels of person and physical evidence for the taxonomy. However, we felt that the ease-of-fabrication construct did not capture all of what needed to be captured for the person evidence dimension. A person who corroborates an alibi might be either lying or mistaken. A complete stranger runs the risk of misidentifying the alibi provider, but has no motive to lie. A person with a close relationship to the suspect (e.g., spouse), on the other hand, is unlikely to misidentify the alibi provider, but has a potential to lie for the suspect in order to protect him or her. Attribution theories show strong support for the principle of discounting in which the presence of one explanation leads observers to discount another explanation (Gilbert & Malone, 1995). Hence, attribution theory might predict that the focal explanation for the alibi corroborator's claim (i.e., the corroborator actually saw the suspect at the critical time) would be discounted by the possibility of mistaken identification in the stranger case and by lying in the close relationship case. Perhaps the most believable corroborator is one who is familiar with the alibi provider but not motivated to protect or lie for the alibi provider a non-motivated familiar other. Hence, we thought it would be important for the taxonomy to distinguish between three kinds of alibi corroborators: a motivated familiar other (who is not likely to be mistaken but might lie), a complete stranger (who is not motivated to lie but might be mistaken), and a non-motivated familiar other (who also is not motivated to lie for the person and also is not likely to have mistakenly identified the person).

# 2.3 A Quick Survey of Some Bayesian and Naive Bayesian Approaches in Law

#### Andrew Stranieri and John Zeleznikow

# 2.3.1 Underlying Concepts

The present Section 2.3 is based on section 28.1 in chapter 6 of our book *Knowledge Discovery from Legal Databases* (Stranieri & Zeleznikow, 2005a). Bayesian methods provide formalism for reasoning about partial beliefs under conditions of uncertainty. In this formalism, propositions are given numerical values, signifying

the degree of belief accorded to them. Bayesian classifiers are statistical classifiers that can predict class membership probabilities – such as the probability that a given sample belongs to a particular class. Han and Kamber (2001) claim that studies comparing classification algorithms have found that the *naïve Bayesian classifier* is comparable in performance with classifiers<sup>76</sup> based on either *decision trees*,<sup>77</sup> or *neural networks*.<sup>78</sup>

Naive Bayesian classifiers assume the effect of an attribute value on a given class is independent of the other attributes. This assumption is made to simplify computations – hence the use of the word *naive*. Bayesian belief networks are graphical models, which unlike naive Bayesian classifiers allow the representation of dependencies among subsets of attributes. Bayesian belief networks can also be used for classification. They depend upon Bayes' Theorem, which we now discuss.

Suppose we are considering two events A and B. Bayes Theorem states that there is a relationship between the "after the fact" or posterior probability of A occurring given that B has occurred, denoted as Pr(A|B) and:

(a) the probability that B occurred, and

(b) the probability that A occurred, and

(c) the probability that B occurs given that A occurred

Bayes theorem states that:

$$Pr(A|B) = Pr(A \& B) / Pr(B)$$
  
= Pr(B|A) \* Pr(A) / Pr(B)

where

Pr(A & B)	is the probability that A and B occur simultaneously and
Pr(B)	is the probability that B occurred.

An example outside law is illustrative. Suppose we have a hypothesis that asserts that copper will be discovered at a location:

- H1 We will find copper at location X
- E The rocks at location X are batholithic.

The probability of finding copper given that the rocks are batholithic, denoted as Pr(H1|E), is difficult to estimate directly. However, using Bayes theorem the problem is transformed to one of finding batholithic rocks given there is copper  $Pr(E|H_1)$ 

<sup>&</sup>lt;sup>76</sup> Classifiers will be discussed in Chapter 6, which is about *data mining*.

<sup>&</sup>lt;sup>77</sup> Lior Rokach and Oded Maimon's (2008) is the first book entirely dedicated to *decision trees* in *data mining*.

 $<sup>^{78}</sup>$  Neural networks are the subject of Section 6.1.14 in the present book.

and the probability of finding batholithic rocks Pr(E) and copper in isolation  $P(H_1)$ . These probabilities are typically easier to estimate in the real world. We need only to examine past sites where copper was discovered to estimate the probability of finding batholithic rocks given copper Pr(E|H1). The prevalence of copper and of batholithic rocks overall is also relatively easily estimated.

The next example illustrates a Bayesian approach to law. Let us take for example a hypothesis H, that a man killed his wife and the evidence (each piece of which is independent) consists of the following events:

- $E_1$  the man will receive \$1,000,000 from his wife's insurance policy in the case of her death;
- E<sub>2</sub> the wife was killed by the same make of gun, as one owned by the husband;
- E<sub>3</sub> the husband had the wife's blood on his clothes;
- E<sub>4</sub> an eyewitness saw the husband leave the marital home, five minutes after he heard a shot fired.

The total evidence is the union of events

$$\mathbf{E} = \mathbf{E}_1 \cup \mathbf{E}_2 \cup \mathbf{E}_3 \cup \mathbf{E}_4$$

and the probability of the hypothesis given the evidence is

$$Pr(H|E) = Pr(H\&E) / Pr(E) = Pr(E|H)^* Pr(H) / Pr(E)$$

Again, it is difficult to estimate the probability that the husband killed the wife given the direct evidence. So now, rather than working out the probability of the husband killing the wife given the evidence, we are focusing on the probability that the evidence is true given the husband killed the wife. We can achieve this by noting how many murders of a wife by her husband in the past involved the evidence in the current case.

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There are two main problems associated with the use of Bayes theorem in practice:

(a) The probability of each element of evidence and the hypothesis must be known, or accurately estimated in advance. This is often difficult to quantify. For example, how would one estimate the probability that a husband has his wife's blood on his clothes? (b) Bayes theorem assumes that A is defined to be independent of B if

$$\Pr(A\&B) = \Pr(A)^* \Pr(B).$$

In this case

$$\Pr(A|B) = \Pr(A)$$

as would be expected. This is often too strong an assumption to make in practice.

Let us turn to *Naive Bayes*: for a given sample we search for a class  $c_i$  that maximises the posterior probability

$$P(c_i|x; \theta')$$

by applying Bayes rule. Then x can be classified by computing

$$c_l = \arg \max_{c_i \in \mathbf{C}} \mathbf{P}(c_i | \theta') \mathbf{P}(x | c_i; \theta')$$

*Bayesian Belief Networks* developed by Pearl (1988) are graphs that, by making convenient assumptions about Bayes theorem, enable inferences to be drawn in the presence of uncertainty. There are many excellent books on the use of probabilistic reasoning for the construction of intelligent systems. Schum (1994) is one such text.

Figure 2.3.1.1 illustrates a Bayesian belief network example adapted from Heckerman (1997) and is related to credit card fraud. The nodes in the network represent relevant factors.

Building a network involves identifying relevant nodes, assigning a probability to the occurrence of each value on a node and establishing links between nodes that influence each other. The node *Fraud* in Fig. 2.3.1.1 has a probability of occurrence of 0.00001 that represents the prevalence of fraud. The probability that jewellery is the object of a fraud is dependent upon the age and sex of the purchaser and the prevalence of fraud. Age and sex are not factors that influence the probability of petrol fraud.

Bayesian belief networks provide a graphical model of causal relationships on which learning can be performed. *Bayesian belief networks* are also known as *belief networks*, *Bayesian networks* and *probabilistic networks*.

A Bayesian belief network is defined by two components:

(a) A directed acyclic graph where each node represents a random variable and each arc represents a probabilistic dependence. Each variable is conditionally dependent of its non-descendents in the graph, given its parents. The variables may be discrete or continuous.

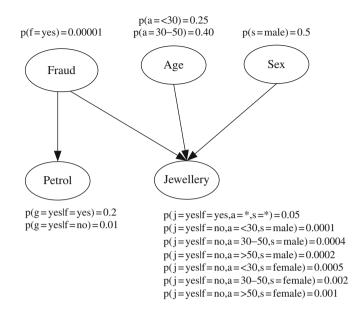


Fig. 2.3.1.1 A Bayesian belief network related to credit card fraud

(b) A conditional probability table (CPT) for each variable,

Pr (X|parents (X))

The network structure may be given in advance or inferred from the data. The network variables may be observable or hidden in all or some of the training samples. If the network structure is known and the variables are observable, then training the network consists of computing the CPT entries; similar to the case of computing the probabilities involved in naive Bayesian classification.

When the network structure is given and some of the variables are hidden, then a method of gradient descent can be used to train the Bayesian belief network. The object is to learn the values for the CPT entries. See Han and Kamber (2001) for details.

*Dempster-Shafer theory* (Shafer, 1976) has been developed to handle partially specified domains. It distinguishes between uncertainty and ignorance by creating belief functions. Belief functions allow the user to bound the assignment of probabilities to certain events, rather than give events specific probabilities. Belief functions satisfy axioms that are weaker than those for probability theory. When the probabilistic values of the beliefs that a certain event occurred are exact, then the belief value is exactly the probability that the event occurred. In this case, Dempster-Shafer theory and probability theory provide the same conclusions.

# 2.3.2 Some Applications in Law

Bayesian theory requires the specification of a complete probabilistic model before reasoning can commence (Pearl, 1988). This is not generally possible in the legal domain. However, as applications of Bayesian classification by Pearl (1988), Davis and Pei (2003), and Halliwell, Keppens, and Shen (2003) illustrate, the probabilities required for a Bayesian Belief network can be derived from expert heuristics, physics models or innovative applications of *fuzzy sets*.<sup>79</sup> As large datasets in law become prevalent, the probabilities required can conceivably be generated directly from real data.

Although the application of Bayesian approaches to modelling reasoning in the legal domain is relatively new, a number of innovative applications illustrate substantial potential. Two approaches will be reviewed here. Davis and Pei (2003) applied a Bayesian model to reconstruct the most plausible account of a traffic accident and Halliwell et al. (2003) applied Bayesian classification in forensics.

The reconstruction of a traffic accident involves the combination of evidence from a number of sources including eye-witnesses, skid marks, speed estimates, and weather conditions. Davis and Pei (2003) note that *counterfactual statements* are important for traffic accident reconstruction. These are statements of the form: "If the vehicle had not been speeding the collision would not have occurred" and are contrasted with statements that assert a fact such as "the vehicle was speeding". They identify three steps that are typically deployed in an accident reconstruction (a) the vehicle's initial speed is estimated, (b) a counterfactual value for the vehicle's initial speed is suggested, and (c) the initial speed estimate and the counterfactual

- (a)  $\mu(\sim p) = 1 \mu(p),$
- $(b) \qquad \mu(p{\wedge}q)=\min\{\ \mu(p),\,\mu(q)\},$
- (c)  $\mu(p \lor q) = max\{ \mu(p), \mu(q) \}$

Fuzzy logic is the subject of Section 6.1.15 in this book. Fuzzy logic is a many-valued propositional logic where each proposition P rather than taking the value T or F has a probability attached (thus between 0 and 1) of being true. It would take the value 0 if it were false and 1 if it were true. Logical operators and probability theory are then combined to model reasoning with uncertainty. Fuzzy rules capture something of the uncertainty inherent in the way in which language is used to construct rules. Fuzzy logic and statistical techniques can be used in dealing with uncertain reasoning.

<sup>&</sup>lt;sup>79</sup> Fuzzy set theory uses the standard logical operators  $\land$  (and),  $\lor$  (or),  $\sim$  (not). Thus given truth values (or membership values)  $\mu(p)$  for p and  $\mu(q)$  for q, we can develop truth values (or membership values) for  $p \land q$ ,  $p \lor q$  and  $\sim p$ . These values are determined by

Philipps and Sartor (1999) applied fuzzy reasoning as well as neural networks in an AI & Law context. Stranieri and Zeleznikow (2005a) remarked: "[Philipps & Sartor, 1999] argue that fuzzy logic is an ideal tool for modelling indeterminancy. But what is indeterminancy? Indeterminancy is not uncertainty. To quote the Roman maxim – *Mater semper certa est, pater semper incertus* – one can never be certain that a man was the real father of a child, even if he was the mother's husband. But the concept of a father is certainly determinate."

estimate are used to infer the likelihood that the vehicle could have stopped to avoid the collision.

In the study by Davis and Pei (2003), twin Bayesian Belief networks are built using forensic knowledge and models of mass and movement that derive from physics. The twin networks represent a possible world depicted by a counterfactual statement such as "If the vehicle had not been speeding the collision would not have occurred". By comparing the probabilities of key nodes in the belief network with those in the possible world network, an assessment of the plausibility of the alternate world can be made. The study was evaluated using four case studies. The evaluation results were promising.

Let us turn now to an example of Bayesian networks being used for forensic statistics. To attempt to avoid miscarriages of justice forensic statistics has emerged as an increasingly important discipline, by providing techniques, such as the like-lihood ratio (Balding & Donelly, 1995), to evaluate evidence in term of its relative support of claims made by the prosecution vs. claims made by the defence. Halliwell et al. (2003) claim that these methods provide a statistical characterisation of expert testimony. For example, that there is strong support for the defence or prosecution position. Due to the lack of experimental data, inferred probabilities often rely on subjective probabilities provided by experts. Because these are based on informed guesses, it is very difficult to express them accurately with precise numbers. Yet, conventional Bayesian Networks can only employ probabilities expressed as real numbers.

A central component of their work is the use of Bayesian Networks to compute the probability Pr(E|C) of obtaining certain pieces of evidence E given a claim C. An example of Pr(E|C) is the probability of finding a certain number of glass fragments in the clothes of a person assuming that that person has smashed a window. This is not a trivial task because many factors influence the production of evidence. In this example, the number of glass fragments retrieved in the laboratory from clothes worn by the suspect depends on the way the window was smashed, the movements of the perpetrator after the crime (which may cause some glass fragments to fall from the garment) and the laboratory techniques employed. Bayesian Networks provide an effective way of organising this knowledge. Additionally, they enable the use of efficient algorithms to compute the probability of interest.

A common criticism of the Bayesian approach is that it requires too much information in the form of prior and conditional probability tables, and that this information is often difficult or impossible to obtain. In principle, most values could be obtained through experimentation. Following the scenario above, for example, the probability of glass fragments being transferred to the suspect's garment, might be determined by smashing a representative population of glass panels of the same make as the shop window with a piece of fabric similar to that of the garment in question. But such experiments are obviously difficult to design and conduct correctly and are both time-consuming and expensive. In practice, therefore, it is often necessary to rely on subjective probability estimates provided by experts.

The difficulty of obtaining point estimates of (e.g. prior) probabilities in general has been widely reported. Moreover it has been reported (Zimmer, 1984) that verbal

expressions of probabilistic uncertainty were more accurate than numerical values in estimating the frequency of multiple attributes through experimental studies. In addition subjective probability assessments are not generally precise and it has been claimed that it is misleading to seek to represent them precisely. Various studies (e.g., Budescu & Wallsten, 1985), have concluded that point estimates of probability terms are highly variable between subjects and exhibit great overlap between terms. All this suggests that it would be useful to involve probabilistic terms directly in probabilistic models.

Halliwell et al. (2003) presented a novel approach to the representation of subjective probability assessments known as *linguistic probabilities*. Fuzzy sets have been widely used to represent the inherent *vagueness* in linguistic descriptions.<sup>80</sup> They have sometimes found application in AI & Law.<sup>81</sup> Furthermore, a number of psychometric studies have evaluated the claim that fuzzy sets may be used to model qualitative probabilities with generally positive conclusions. So, for example, Wallsten, Budescu, Rapoport, Zwick, & Forsyth (1986) have considered various methodological issues in detail, and established that experimentally obtained fuzzy sets do indeed seem to provide a model for everyday probabilistic assessments. The approach of Halliwell et al. (2003) approach allows for the expression of subjective probabilities as fuzzy numbers, which more faithfully respect expert opinion. By means of a practical example, they show that the accurate representation of this lack of precision in reasoning with subjective probabilities has important implications for the overall result.

Shortliffe and Buchanan (1975) developed the use of certainty factors as part of the MYCIN expert system for medical diagnosis.<sup>82</sup> They argued that a rigorous application of conditional probability and Bayes theorem is unwise. Instead, they used a belief measure that indicates an expert's confidence in her advice. Whilst Grady and Patil (1987) illustrate an early use of certainty factors in the legal expert system in pension planning (developed to assist screening by the Internal Revenue Service), certainty factor approaches to uncertainty are not prevalent. A brief overview of certainty factors is provided because data mining approaches can conceivably be applied to discover certainty factors if data-sets were sufficiently large. They introduced measures of belief,  $M_B$  and disbelief,  $M_D$  for a hypothesis H given evidence E. A new piece of evidence E changes the measures of belief and disbelief thus:

If Pr(H) = 1 then  $M_B(H|E) = 1$ 

<sup>&</sup>lt;sup>80</sup> Concerning vagueness, see in Sections 4.6.2.2 and 6.1.13.12 below. Fuzzy logic is discussed in Section 6.1.15.

<sup>&</sup>lt;sup>81</sup> Xu, Kaoru, and Yoshino (1999) constructed a case-based reasoner to provide advice about contracts under the United Nations Convention on Contracts for the International Sale of Goods (CISG). They adopted a fuzzy approach to case-based representation and inference in CISG. Philipps and Sartor (1999) applied fuzzy reasoning as well as neural networks in an AI & Law context.

<sup>&</sup>lt;sup>82</sup> Shortliffe (1976) is a book about MYCIN.

otherwise  $M_B(H|E) = \{\max[Pr(H|E), Pr(H)] - Pr(H)\}/(1-Pr(H))$ 

If Pr(H) = 0 then  $M_D(H|E) = 1$ otherwise  $M_D(H|E) = \{Pr(H) - min[Pr(H|E), Pr(H)] \}/(Pr(H))$ 

The certainty factor CF(H|E) is defined by

$$CF(H|E) = MB(H|E) - MD(H|E)$$

The certainty factor varies from -1 to +1. A positive certainty factor indicates that the new evidence supports the original hypothesis H, a negative certainty factor indicates it opposes the hypothesis.

Suppose we have an example where the original evidence E is that a wife killed her husband with a knife whilst he was asleep. She pleads not guilty by way of battered wife syndrome. New evidence becomes available suggesting that the husband had a history of beating his wife. Suppose that in general, the wife's probability of being acquitted is Pr(H) = 0.3. However her probability of being acquitted, given that her husband had a history of wife abuse, is Pr(H|E) = 0.8. Then

$$\begin{split} M_{B}(H|E) &= \{ \max[\Pr(H|E), \Pr(H)] - \Pr(H) \} / (1 - \Pr(H)) \\ &= \{ \max(0.8, 0.3) - 0.3 \} / 0.7 \\ &= 0.5 / 0.7 \\ &= 0.71 \end{split}$$
$$\begin{split} M_{D}(H|E) &= \{ \Pr(H) - \min[\Pr(H|E), \Pr(H)] \} / (\Pr(H)) \\ &= \{ 0.3 - \min[0.8, 0.3] \} / 0.3 \\ &= 0 \end{split}$$

Thus

#### CF(H|E) = 0.71

Hence the new evidence that the husband had a history of abusing his wife increases our belief that the wife will be acquitted of murder. There is no theoretical basis underlying certainty factors. Nor do the certainty factors associated with a MYCIN hypothesis correspond to the Bayesian probability model. However, certainty factors have proven to be effective in numerous fields outside law.

# 2.4 The Controversy Concerning the Probabilistic Account of Juridical Proof

Ronald Allen is a consistently articulate critic of the application of probability theory to juridical proof. Among the other things, Allen and Pardo (2007a, p. 109) find that scholarship pursuing that line of inquiry suffers from a deep conceptual problem that makes ambiguous the lessons that can be drawn from it - the problem of reference classes. The implications of this problem are considerable. To illustrate the problem, consider the famous blue bus hypothetical. Suppose a witness saw a bus strike a car but cannot recall the color of the bus; assume further that the Blue Company owns 75% of the buses in the town and the Red Company owns the remaining 25%. The most prevalent view in the legal literature of the probative value of the witness's report is that it would be determined by the ratio of the Blue Company buses to Red Company buses, whether this is thought of as or plays the role of a likelihood ratio or determines information gain (including an assessment of a prior probability) [...] But suppose the Red Company owns 75% (and Blue the other 25%) of the buses in the county. Now the ratio reverses. And it would do so again if Blue owned 75% in the state. Or in the opposite direction: it would reverse if Red owned 75% running in the street where the accident occurred (or on that side of the street) and so on. Or maybe the proper reference class has to do with safety standards and protocols for reporting accidents. Each of the reference classes leads to a different inference about which company is more likely liable, and nothing determines the correct class, save one: the very event under discussion, which has a likelihood of one and which we are trying to discover.<sup>83</sup>

"The blue bus hypothetical with which we began this paper exemplifies the general implications of reference classes, and those implications would hold for practically any attempt to quantify a priori the probative value of evidence" (ibid., p. 113). "The reference-class problem [...] is an epistemological limitation on attempts to establish the probative value of particular items of legal evidence" (ibid., p. 115, citing Pardo, 2005, pp. 374–383). This is so "because different classes may point in opposite directions and nothing, other than the event itself, necessarily privileges one over another" (ibid., p. 115).

Allen and Pardo (2007a) claimed their paper was making three contributions: "it is a further demonstration of the problematic relationship between algorithmic tools and aspects of legal decision making" (ibid., p. 110); "it points out serious pitfalls to be avoided for analytical or empirical studies of juridical proof", and "it indicates when algorithmic tools may be more or less useful in the evidentiary process" (ibid.).

They enumerated and exemplified "limitations on attempts to mathematically model the value of legal evidence" (ibid., p. 115). Namely (ibid., pp. 115–116):

First, and most important, the probative value of legal evidence cannot be equated with the probabilities flowing from any given reference class for which base-rate data are available. Related to this point, probative value likewise cannot be equated with the difference between prior and posterior probabilities on the basis of such data, nor is it sensible simply to translate directly an available statistic into a prior probability. Second, the above problem regarding establishing probative value cannot be solved by merely specifying the relevant classes with more detailed, complex, or "realistic" characteristics. Third, while

<sup>&</sup>lt;sup>83</sup> "How to specify the appropriate reference class for determining hypothesis confirmation has been a prominent issue in the philosophy of science. Hans Reichenbach (1949, p. 374) suggested we choose the smallest class for which reliable statistics were available; Wesley Salmon, by contrast, advocated that for single cases we ought to select the broadest homogeneous class. For a discussion of these positions see Salmon (1967, pp. 91, 124)" (Allen & Pardo, 2007a, p. 112, fn. 9). In legal theory, within the Bayesianist camp Tillers (2005) discussed reference classes.

switching from objective to subjective probability assessments better accommodates unstable probative values of evidence, it nevertheless still illustrates the pervasiveness of the reference-class problem because of its presence even when evaluating such subjective assessments. Finally, the reference-calss problem is so pervasive that it arises whenever one assesses the probative value of evidence, even when one is not trying to fix a specific numeric value to particular items of evidence – for example, when assessing whether evidence satisfies a standard of proof. [...] The limitations that are discussed, we contend, undermine the strong conclusions that are drawn from such models.

A referee committed to Bayesianism, commenting in 2006 on an article of mine – about computer tools for legal evidence and how to further develop the field – proposed this "future trend: more computer power. In view of which, an anti-Bayesian stance is somewhat like built-in obsolescence". Will the skeptics agree? This is not likely at all, and their arguments are weighty. There is a lot of cogency about them. Moreover, suppose the Bayesianists are right, and those who believe it to be somewhat in the same category as astrology are wrong. Society derives a sense of justice being made from there being a modicum of consensus about how verdicts are reached. Should verdicts in future increasingly rely on calculations of probabilities (through the intervention of expert witnesses making use of these), and should an important segment of legal scholars continue to view these calculations as utterly lacking credibility, the societal benefit from there being courts of law in operation would diminish.

The problems with Bayesian approaches go way beyond computational complexity. This is laid out, for example, in a paper by Ron Allen (1997) from a journal special issue (Allen & Redmayne, 1997) devoted to the controversy. There are deep incompatibilities between the structure of juridical proof and any probabilistic approaches. A more recent demonstration of this was provided e.g. by the already cited Allen and Pardo (2007a).<sup>84</sup> Nevertheless, the availability of more computer power undoubtedly spurs more work in a Bayesian or at least probabilistic framework.<sup>85</sup> Artificial intelligence practitioners should not be oblivious to the contentiousness of some approaches.

Arguably the real potential of artificial intelligence to make a significant contribution is in harnessing explanation-generation techniques, while also applying criteria of comparison among explanations that are offensive to neither camp in the Bayesianism controversy. That is to say, except in well-delimited domains such as DNA evidence, in which statistical methods are fairly cogent, applications of artificial intelligence would better not just plump for Bayesianism because it is there,

<sup>&</sup>lt;sup>84</sup> See Allen (1997, 2001b, 2003), Allen and Lively (2003 [2004]), and Allen and Pardo (2007a, 2008).

<sup>&</sup>lt;sup>85</sup> That same Bayesianist referee also claimed: "The Bayesian side of things is clearly in the ascendant, which the article might wish to note. And the largest reason for that, which the article might also wish to note [...] due to the availability of greater computational capacity, leading to success for Bayesian net technology in modeling, and Markov Chain Monte Carlo simulation methods in optimization and learning".

but instead, ambitiously, go the *explanationism* way,<sup>86</sup> which is something at which artificial intelligence harbours the potential of doing rather well, within tasks that should be explicitly circumscribed.

Even from the Bayesianist camp, there have been on occasion calls for caution, including in an informal forum. Consider the following cautionary comment made by Peter Tillers<sup>87</sup> about a paper by Martin Neil and Norman Fenton (Fenton & Neil, 2000) which supported the claim (against using knowledge of prior convictions against suspects) that there exists a so-called *Jury Observation Fallacy*; in so doing, Neil and Fenton made use of Bayesian networks to present probabilistic legal arguments, with the calculations carried out by a tool, HUGIN, which belongs in the category of Bayes/Belief Net software: "I think the paper's authors assume a bit too readily that evidence and inference problems in the courtroom are computationally tractable". Bear in mind that, even though here he was calling for caution, Tillers is prominent within the camp, among legal scholars, who support Bayesianism in law.<sup>88</sup> The skeptics' camp maintains that the conceptual limits of Bayesianism go way beyond computational power. The arguments are weighty. Sometimes one gets the feelings that they are not listened to as carefully as they deserve, as this is

<sup>87</sup> In an e-list posting from 2 July 2001 (at bayesian-evidence@vuw.ac.nz), Peter Tillers, a legal scholar who is a prominent supporter of Bayesianism in the Bayesianism debate.

<sup>88</sup> Here is a fuller quotation from Tillers' posting (the brackets are Tillers' own):

I think the paper's authors assume a bit too readily that evidence and inference problems in the courtroom are computationally tractable. Even with HUGIN, some real-world cases – many real-world cases – will be computationally intractable (even with the use of very powerful computers) unless the cases – the problems of evidence – are simplified. And the question of how complex inference problems should be simplified to make them computationally-tractable while assuring that the resulting probability computations are still informative and not misleading is not an easy one. (If the simplification cannot be done "mechanically" or "objectively," there is little to be said for the proposition that "experts" should decide how otherwise computationally-intractable complex [courtroom] cases and problems should be simplified.)

My quoting offhand comments from an email, or rather from an informal posting from a scholars' e-list, or then from a confidential referee report, itself calls for comment. Readers will have noticed that this book has a huge bibliography. When what is to be covered is such a wide range, it is very difficult to fully satisfy all criteria that are clearer or even obvious to specialists of given domains. Even with measures taken to be as precise as possible, a rather mundane problem that may occur sometimes, and that I freely acknowledge, is that citations are exemplificative, without following the historical development of debate within the given specialism. For example, it does happen sometimes that I cite rather derivative work, while not some seminal work. It should be clear that this is not to deny credit to the latter. This book is already long the way it is, and we cannot aim at tracing the history of all disciplines involved.

<sup>&</sup>lt;sup>86</sup> See Allen's paper (2008a) "Explanationism All the Way Down"; cf. Allen and Pardo (2008). Allen claims (2008a, p. 325):

A more promising approach to understanding juridical proof is that it is a form of inference to the best explanation. Conceiving of cases as involving the relative plausibility of the parties' claims (normally provided in story or narrative form) substantially resolves all the paradoxes and difficulties [...]

unfeasible in given institutional and biographical contexts, or rather because the mathematics looks so powerful and enticing, whether it is problematic or not. But should we look for a lost key under a lamppost, only because under a lamppost we can see better? My own feeling is that much remains to be done for develping acceptable models of plausibility that would not incur the kind of criticism that reliance on Bayesianism attracts.

Allen (1997) discussed what "those of us who have been branded Bayesian skeptics" (ibid., p. 256) consider to be at issue and what is not at issue. He formulated questions, and answered them. He was not contesting the formal validity of Bayes' theorem, or probability theory more generally, but rather contesting interpretation, application, and their implications (ibid.). Bayes' theorem is only normative if its necessary conditions are satisfied, but this is a tautology: "The question is whether the juridical context does, can or should generate the conditions necessary for the operation of Bayes' theorem", which is problematic (ibid., p. 257). Moreover (ibid., pp. 257–258):

Surely if juridical fact finding is typically like predicting the outcome of events like coin flipping, or if a person wishes to form and think about the relationship between subjective probabilities (and wants to form the immense number of numerical values such thinking requires, and has the computational capacity to compute them all [...]), then Bayes' theorem will surely be frequently useful, as it is in many statistical settings. But this again bears no obvious relationship to the inquiry into the nature of juridical fact finding. The Bayesian enthusiasts must show that juridical fact finding is generally like flipping coins or the formation of subjective belief states in a fashion amenable to the use of Bayes' theorem before they can demonstrate that the use of the theorem has any general utility at trial. The Bayesian skeptic has the opposite task.<sup>89</sup> [...]

# 2.5 A Quick Sampling of Some Probabilistic Applications

# 2.5.1 Poole's Independent Choice Logic and Reasoning About Accounts of a Crime

Tillers and Schum (1998) presented a theory of preliminary fact investigation. Jøsang and Bondi (2000) apply a subjective logic, using probability theory, to legal evidence. Dragoni and Animali (2003) developed a formal approach, based on belief

<sup>&</sup>lt;sup>89</sup> Answering his own question 4, namely, "Whether there are any juridical fact-finding contexts in which Bayes' theorem might be useful", Ron Allen answers it this way: "The Bayesian skeptic is not this skeptical. There may very well be situations involving virtually purely statistical evidential bases in which Bayes' theorem would be a useful analytical tool. It is even possible that Bayes' theorem might prove useful in some extremely impoverished nonstatistical evidential settings. The skeptical claim, by contrast, doubts that Bayes' theorem is very useful for real human decision making in the typical juridical context involving a rich, highly complex set of interdependent pieces of evidence" (ibid., p. 258).

revision and the Dempster-Shafer statistical approach (Shafer, 1976),<sup>90</sup> for representing inconsistencies among and inside witness assertions. Shyu, Fu, Cheng, and Lee (1989) described an evidential reasoning method based on Dempster-Shafer, but even though their paper appeared in the proceedings of a conference on legal computing, they didn't explicitly indicate how to apply their results in the judicial domain.

David Poole (2002) sketched and applied a formalism, he called Independent Choice Logic (ICL), to legal argumentation about evidence. Poole's formalism can be viewed as a "first-grade representation of Bayesian belief networks with conditional probability tables represented as first-order rules, or as a [sic] abductive/argument-based logic with probabilities over assumables" (ibid., p. 385). On the one hand: "It is a way to add Bayesian probability to the predicate logic" (ibid., p. 387). On the other hand: "It is a way to lift belief networks into first-order language. The belief network can be seen as a deterministic system with noise input. The deterministic system is modeled as a logic program", by "writing the conditional probability tables in rule form" (ibid.). Moreover: "It is a sound way to have probabilities over assumptions. Explaining observations means that we use abduction; we find the explanations (sets of hypotheses) that imply the observations, and from these we make predictions", by probabilistic inference (ibid., p. 388). Poole developed collections of clauses in order to represent a sample story proposed by Peter Tillers at the beginning of the same volume. The collection of observations as stated by Poole (ibid., p. 389) was:

Peter says that he went to the Happy Valley Store. Peter says that harry was a clerk at the Happy valley Store. Peter says that harry is a vicious SOB. Peter says that he observed a blinding flash. Peter said that the doctor said that he was shot. Peter said that the newspaper said harry disappeared.

For those propositions, Poole wrote quite simple logical clauses (ibid., p. 389), without any attempt to formally represent the temporal relations:

says(peter,wentto(peter,hvstore))
says(peter,clerk\_at(harry,hvstore))
says(peter,vicious\_sob(harry))
says(peter,observed(peter,blinding\_flash))

<sup>&</sup>lt;sup>90</sup> "Dempster-Shafer theory [Shafer, 1976] has been developed to handle partially specified domains. It distinguishes between uncertainty and ignorance by creating belief functions. Belief functions allow the user to bound the assignment of probabilities to certain events, rather than give events specific probabilities. Belief functions satisfy axioms that are weaker than those for probability theory. When the probabilistic values of the beliefs that a certain event occurred are exact, then the belief value is exactly the probability that the event occurred. In this case, Dempster-Shafer theory and probability theory provide the same conclusions." (Stranieri & Zeleznikow, 2005a).

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says(peter,says(doctor,shot(peter)))
says(peter,says(newspaper,disappeared(harry)))
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Poole (ibid., pp. 389–390) wrote clauses about witness honesty, stating that honest people rarely state deliberate lies, and that people assumed to be honest are more likely not to be honest once they have said a few lies. The clauses are as follows, the upper case letters standing for universally quantified variables, whereas truthful\_h(P,F) specifies the probability that person P, who is honest, would say something F by thinking it to be true and relevant, and by contrast, untruthful\_d(P,F) specifies the probability that person P, who is dishonest, would say something F by thinking it to be untrue:

 $says(P,F) \leftarrow thinks\_true(P,F) \& \\relevant(P,F) \& \\honest(P) \& \\truthful_h(P,F).$   $says(P,F) \leftarrow thinks\_true(P,F) \& \\relevant(P,F) \& \\dishonest(P) \& \\truthful_h(P,F).$   $says(P,F) \leftarrow honest(P) \& \\untruthful_h(P,F).$   $says(P,F) \leftarrow dishonest(P) \& \\untruthful_h(P,F).$ 

Poole provided examples specifying the alternatives and their respective probabilities:

 $\label{eq:random} \begin{array}{l} random([relevant(P,F):0.05; irrelevant(P,F):0.95]).\\ random([honest(P):0.999, dishonest(P):0.001]).\\ random([truthful_h(P,F):0.9999; untruthful_h(P,F):0.0001]).\\ random([truthful_d(P,F):0.998, untruthful_d(P,F):0.002]).\\ \end{array}$ 

Poole went on writing clauses representing commonsense rules, and sometimes (but not always) associating probabilities in the same format as given above. Some such commonsense rules were about someone thinking something is true while being or not being mistaken, or about having the means and opportunity to shoot someone if they are both at the same place, or about bad character as being a motive to shoot some people, or about likely explanations for a blinding flash (a picture being taken, vs. the person being shot).

Poole (ibid., pp. 394–395) formulated as follows the two most likely explanations for the observations. Here is the most likely explanation:

[Truthful\_h(peter,says(newspaper,disappeared(harry))), relevant(peter,says(newspaper,disappeared(harry))),

notmistaken t(peter,says(newspaper,disappeared(harry))), truthful h(newspaper,disappeared(harry)), honest(newspaper), relevant(newspaper.disappeared(harry)). notmistaken t(newspaper,disappeared(harry)), disappeared when criminal(harry), truthful h(peter,says(doctor,shot(peter))), relevant(peter,says(doctor,shot(peter))), notmistaken t(peter,says(doctor,shot(peter))), truthful\_h(doctor,shot(peter)), honest(doctor), relevant(doctor,shot(peter)), notmistaken t(doctor,shot(peter)), truthful\_h(peter,observed(peter,blinding\_flash)), relevant(peter,observed(peter,blinding\_flash)), notmistaken t(peter,observed(peter,blinding flash)), actually\_shot(harry,peter), vicious\_sob\_shot(harry,peter), truthful h(peter,vicious sob(harry)), relevant(peter,vicious sob(harry)), notmistaken t(peter,vicious sob(harry)), just\_true(vicious\_sob(harry)), truthful h(peter,clerk at(harry,hvstore)), relevant(peter,clerk at(harry,hvstore)), notmistaken t(peter, clerk at(harry, hvstore)), just true(clerk at(harry, hvstore)), truthful\_h(peter,wentto(peter,hvstore)), honest(peter), relevant(peter,wentto(peter,hvstore)), notmistaken(peter,wentto(peter,hvstore)), just\_true(wentto(peter,hvstore))].

Poole (ibid., p. 395) claimed for this a prior probability of 2.6485e-019. He wrote (ibid.) the second most likely explanation as follows, and stated that its prior probability is 1.15225e-019:

[untruthful\_d(peter,says(newspaper,disappeared(harry))), untruthful\_d((peter,says(doctor,shot(peter))), truthful\_h(peter,observed(peter,blinding\_flash)), relevant(peter,observed(peter,blinding\_flash)), picture\_taken(peter), untruthful\_d(peter,vicious\_sob(harry)), untruthful\_d(peter,clerk\_at(harry,hvstore)), truthful\_h(peter,wentto(peter,hvstore), dishonest(peter), relevant(peter,wentto(peter,hvstore), notmistaken\_t(peter,wentto(pedter,hvstore)), just\_true(wentto(peter,hvstore))].

This is a relatively simple example of applications among others that could have been presented here. Personally I feel uneasy with the ascription of probabilities, as it is unclear by reference to what they are determined. Poole averred (ibid., p. 395):

My goal is to allow people to determine whether the axioms are appropriate, whether they are true, whether they cover all of the cases, and whether the probabilities are appropriate. (Of course, my axioms for Tillers' example fail on all of these counts.)

Arguably the problem is that with increased sophistication, some fundamental problems might not just end under the carpet. For sure, there have been (including in the very same volume where that paper appeared) impressive applications, but when one is impressed, it is the right time to beware about the foundations. Still, there is something arrestingly elegant about a method, sophisticated and given a cultured motivation, in Snow and Belis (2002), in the same volume as Poole (2002). See Section 2.5.2.

# 2.5.2 Dynamic Uncertain Inference Concerning Criminal Cases, and Snow and Belis's Recursive Multidimensional Scoring

"Dynamic uncertain inference is the formation of opinions based upon evidence or argument whose availability is neither disclosed to the analyst in advance nor disclosed all at once" (Snow & Belis, 2002, p. 397). We have already considered in Section 2.1.2 a model by Dragoni and myself for dealing with that kind of situation. Another formal model is briefly discussed in the present Section 2.5.2.

Paul Snow and Marianne Belis (2002) analysed "a celebrated French murder investigation" (ibid., p. 397). Snow and Belis (2002) "apply ideas about credibility judgments structured by graphs to the problem of dynamic uncertain inference. By *dynamic*, we mean that assessments of credibility change over time without fore-knowledge as to the types of evidence that might be seen or the arguments that the [crime] analyst might entertain over time" (ibid., p. 397), in contrast with such "kind of belief change that occurs" when the possible outcomes of experiments "are typically known before one learns the actual outcomes" (ibid., pp. 397–398).

Snow and Belis (2002) contributed to how to model the emergence of hypotheses, a crux of this entire field of scholarly inquiry. The same murder case of which Omar Raddad was convicted (in Nice, France, in 1994) and then pardoned, is analysed in Snow and Belis (2002), and, in the same volume (MacCrimmon & Tillers, 2002), in the article by Tod Levitt and Kathryn Laskey. Levitt and Laskey (2002) apply Bayesian inference networks as being combined with knowledge representations from artificial intelligence, and, both elegantly and usefully (for those who do not have qualms about Bayesianism in law), develop the discussion in detail, with several diagrams corresponding to processing by an actual software tool.

Snow and Belis (2002) were conspicuously aware of the history of the ideas behind their own approach. For example (ibid., p. 399):

Probability was introduced into game theory by von Neumann in order to establish that all games of a certain class enjoyed a particular kind of equilibrium solution. As originally proposed, this was envisioned as an objective probability in the sense of being the output of a physical randomizing device. The gist of von Neumann's theorem was that a strategic problem could be transformed into a lottery and in that form would have the solution claimed, a solution based on the expected payoff of the plays. The expected utility of desirability

was added later, in reponse to criticism of the earlier result that average outcomes failed to describe people's preferences among lotteries.

The path was short from game theoretic expediency to promotion as the exclusive paradigm of rational deliberation. Bayesians had no difficulty substituting judgmental probability for the objective original. In that stroke, the domain of application became global.

Moreover (ibid., p. 403), "there is no sharp line between assessing desirability and assessing credibility."<sup>91</sup> Snow and Belis pointed out (ibid., p. 404): "There seems to be little interest among decision practitioners in applying multidimensional scaling techniques to questions of credibility. Elaboration of alternatives more directly exploits the Bayesian theory, which is, after all, a story about how the beliefs in some propositions determine the belief in others. The concept that credibility might be multidimensional in character is also contrary to the historical teachings." Nevertheless, Marianne Belis herself developed "a method for the assessment of probabilities that relies upon recognition of multiple dimensions of causal considerations" (ibid.), and "suggested a directed acyclic graph data structure to organize these calculations" (ibid.),<sup>92</sup> one advantage being in that such a "structure is also convenient for supporting automated explanations of the assessments made" (ibid.), and another advantage being in that "Belis's technique for probability is easily implemented on a spreadsheet. The ubiquitous computerized spreadsheet program is just a directed acyclic graph manager with a tabular interface" (ibid.).

Such methods are static, and Snow and Belis (2002) adopted a dynamic approach instead, because of the need to account for unexpected evidence. "Unexpected evidence poses the additional practical challenge of keeping track of what is going on and what relates to what, subject to revision at any time without notice. We hope to show that the recursive<sup>93</sup> application of scaling ideas expressed in a directed acyclic graph can provide structure to dynamic deliberation" (ibid., p. 404). Once dimensions along which things can be scaled are identified, those scales are projected onto a single-dimensional ordering, and this basic operation is applied repeatedly. In particular (ibid., p. 405):

If we have some hypotheses, then we identify dimensions along which they can be scored. To do a projection, we must have weights for those dimensions. Sometimes we can provide those weights easily. Where recursion comes in is that other times we cannot easily provide the weights, and so we approach that weighting task as an instance of the original problem type. We find other dimensions along which the first set of dimensions can be scaled to illuminate their relative importance to the original problem. If we cannot intuitively weight those dimensions, then we look for dimensions along which they can be scaled and try to weight the new dimensions. The process ends when we do have some intuitive notion about how to weight the dimensions in the derived problem. That information can then be sued to scale the dimensions in the derived problem's "children", which in turn scale their

<sup>&</sup>lt;sup>91</sup> The relations between causality, propension, and probability which take up the first part of Snow and Belis (2002), were also discussed by Marianne Belis, in French, in Belis (1995).

<sup>&</sup>lt;sup>92</sup> See Belis (1973), and Belis and Snow (1998).

<sup>&</sup>lt;sup>93</sup> *Recursion* is a mode of processing by which a procedure carries out some operations and then invokes itself, until a given condition is satisfied.

own children's dimensions, and so on, eventually determining the projection required in the original problem.

New evidence is evaluated for whether it suggests a dimension along which any known objects can be scaled, and is also evaluated for what weight might be given to its scaling. The accommodation to new evidence may also direct our attention to areas where our previous analysis was incomplete.

# 2.6 Kappa Calculus in the Service of Legal Evidence

#### Solomon Eyal Shimony and Ephraim Nissan

#### 2.6.1 Preliminary Considerations

The present Section 2.6 is based on our article Shimony and Nissan (2001).94 It concerns the use of kappa calculus in order to express evidentiary strength. The kappa value of a possible world is the "degree of surprise" in encountering that possible world, a degree measured in non-negative integer numbers. We applied that approach to a representation proposed in his paper 'Towards a Logical Theory of Legal Evidence' by Lennart Åqvist (1992), who had proposed a logical theory of legal evidence, based on the Bolding-Ekelöf degrees of evidential strength: see, e.g., Bolding (1960), Ekelöf (1964). Shimony and Nissan (2001) restated Åqvist's approach in terms of the probabilistic version of Spohn's introduction (Spohn, 1988) of kappa calculus as developed in artificial intelligence research. Nevertheless, we readily concede that proving the acceptability of the kappa-calculus based model in the legal context was beyond the scope of our argument in Shimony and Nissan (2001), albeit the epistemological debate about Bayesian Law clearly is an important caveat. It is a matter of how you are going to use it. If it is inside a tool for the prosecutor to decide whether to prosecute, to offer a plea bargain, or to renounce prosecuting, there is no real harm in using even Bayes theorem, as it's rather an evaluation in terms of costs/benefits. It would be quite different if one was to decide about guilt by means of statistics, and from this we demur.

Åqvist (1992) provides a grading mechanism on worlds, and then defines the degrees of evidential strength on the basis of the grading mechanism. The idea of using a probability measure as a grading mechanism is then explored in that paper. Åqvist's model draws its notion of degrees of evidential strength from two authors that are likewise Swedish legal scientists: as mentioned, Bolding (e.g., 1960) and Ekelöf (e.g., 1964). In this short section, instead, we would like to draw the reader's attention to a grading mechanism, the so-called *kappa calculus*, which bears several

<sup>&</sup>lt;sup>94</sup> In his formative period in the 1990s, Eyal Shimony's disciplinary affiliation within AI research was closely associated with belief networks and uncertainty as well as with abductive reasoning (e.g., Charniak & Shimony, 1990, 1994; Shimony & Charniak, 1990; Shimony, 1993; Santos & Shimony, 1994). These are subjects he is still pursuing in his current research (e.g., Shimony & Domshlak, 2003; Domshlak & Shimony, 2004).

similarities to Åqvist's scheme of degrees of evidence. The kappa calculus was originally developed by Spohn (1988), but then adapted for probabilistic reasoning in artificial intelligence, particularly for diagnostic reasoning and a qualitative decision theory for actions (Pearl, 1993; Henrion, Provan, Del Favero, & Sanders, 1994). In the present section, a semantic comparison between the schemes is made, followed by a discussion of each mechanism's advantages and deficiencies as relating to degrees of evidence in evidentiary reasoning. We then suggest ideas for overcoming deficiencies existing in both schemes. More generally, we offer cautionary comments relating to legal evidence.

Consider causal relations. Around 2000, entries from a debate at an e-list pondered, or rather wondered, about whether and how (if at all) AI approaches grounded in Judea Pearl's probabilistic belief networks dovetails with the goals of Bayes Law (whereas they clearly do not satisfy the skeptics in the controversy about Bayesianism in law). Whether or not this is appropriate for juridical proof, from the viewpoint of AI it can be observed that mutual amenability of Bayes and Pearl is not inconceivable, in terms of representational syntax. Even if ancillary evidence in the legal context was to require special treatment, then nevertheless (short of unnaturally making explicit such causal relations that still defy precise pinpointing) one could figure out some filter within an architecture, enabling such evidentiary contribution to be parametrically attuned; or then, perhaps, one could well envisage adopting, say, Igal Kvart's (1994) theory of overall positive causal impact (or opci). Kvart's theory is concerned with token causal relations (i.e., such that hold between particular actual event tokens), instead of type (i.e., generic) causal relations; and, most importantly, opci implies causal relevance, but is a weaker notion than causing or being a cause; furthermore, Kvart distinguishes opci from both "purely positive causal impact", and spci, i.e., "some positive causal impact" (in the rest of this book, we are not going to return to Kvart's approach).

Admittedly, representational sophistication by itself does not clear the way of epistemological concerns with whether, in principle, such a probabilistic approach would be true to its purpose of capturing likelihood in as complex a domain as legal evidence. Answering that question is beyond our present scope in this section. What we think all camps would eventually agree about, is that probability (in the Bayesian Law sense), or even *plausibility* (in Ron Allen's sense) is anyway part of a much broader picture: the commonsense of narrative conceptualisation, for example, is an enticing, perhaps exciting challenge for AI & Law, a challenge to which the research community will hopefully respond across traditional disciplinary compartments. In this sense, when we approached the task of rethinking Åqvist's paper, we were fully aware that it is merely concerned with the tip of an iceberg. How to calculate the threshold of persuasion, in a legal burdens of proof perspective, arguably is not as interesting as the entire process of conceptualising and handling whatever turns out in argumentation about evidence. Pinpointing truth values in a legal probative context would not be the right ambition, for AI modelling of legal evidence (even if we were to correctly distinguish between legal truth and factual truth; on truth

and verdicts, see, e.g., Jackson, 1998a, 1998b, 1998c). Supporting, by otherwise empowering, human judgment at such tasks arguably is the proper practical one, in the set of appropriate goals that the evidentiary subdiscipline within AI & Law should adopt.

# 2.6.2 A Review of Åqvist's Scheme

Several mechanisms were suggested in Åqvist's paper (1992), but rather than start with his 4-level scheme and proceed to the general mechanism, we begin with his generalised notion of a grading mechanism, in the interest of concision. The scheme uses a set W of disjoint, internally consistent, "possible worlds", consisting of all possible courses of events. Every fact X (a propositional logical formula) can be either true or false in each of the possible worlds. A formula thus corresponds to the set of worlds in which X is true. A grading mechanism is defined over the possible worlds. We begin with the formal definition of the grading mechanism, paraphrased from Åqvist's paper, and correcting a number of typos found there in the relevant passages.

A k-level grading mechanism on a set of possible worlds is a structure

$$G = (W, \geq, \{C_1, C_2, \dots, C_k\})$$

where:

- W is a non-empty, finite set of possible worlds.
- $\geq$  is a weak ordering, i.e. a transitive and total binary relation on *W*. For any worlds  $w, w' \in W$ , the relation  $w \geq w'$  means that *w* is at least as probable as *w'*.
- The set  $\{C_1, C_2, \dots, C_k\}$  is a partition of W, such that, if  $w \in C_i$  and  $w' \in C_j$ , then  $w \ge w'$  if and only if  $i \ge j$ .

Relative to the grading mechanism, Åqvist defines a notion of evidential strength, in support of any formula X, with  $P_i$  denoting positive evidence:

 $P_i X$  iff X is true in all the worlds in  $\bigcup_{j \ge i} C_j$ 

with  $P_1$  X denoting strongest possible evidence for X, and  $R_i$  denoting negative evidence:

 $R_i X$  iff X is false in all the worlds in  $\bigcup_{k \in i} C_i$ 

this time with  $R_k X$  denoting *strongest* possible evidence *against X*.

Åqvist shows that  $P_i X$  if and only if  $R_{k-i+1} \sim X$  (where  $\sim X$  is the negation of X, which we could have as well notated as  $\neg X$ , which is also a widespread notation), that  $P_i X$  is inconsistent with  $R_i X$  for any i, j, and that  $P_i X$  implies  $P_{i+1} X$  for

positive integer i < k. Åqvist proceeds to define a "non-vacuous" version of the above definition, where  $C_k$  must be non-empty.

In Åqvist's paper the initial definitions are in terms of k = 4, where the  $C_i$  are identified with legal evidential grades, as follows.  $C_1$  is identified with the set of "non approved" (*non approbatur*) members of W,  $C_2$  with "just approved" (*approbatur*),  $C_3$  with "approved, not without distinction" (*non sine laude approbatur*), and  $C_4$  with "approved with distinction" (*cum laude approbatur*).

The  $P_i$  X in this case are named "obvious" for i = 1, "certain" for i = 2, "probable" for i = 3, and "presumable" for i = 4.

A probability measure *p* is then imposed on the set *W*, consistent with the axioms of probability theory, and with the grading mechanism, such that  $w \ge w'$  if and only if  $p(w) \ge p(w')$ . The standard definitions of conditioning are introduced. In order to avoid the collapse of all the grading structure, the *principle of preponderance* is introduced, which requires that for any *X*, if  $P_i X$  then  $p(X) > \frac{1}{2}$ .

## 2.6.3 A Review of Kappa Calculus

As in Section 2.6.2, we have a set of disjoint possible worlds W and formulas can be true or false in each possible world. Again, a propositional formula  $\varphi$  is identified with the set of possible worlds in which it is true. Instead of a grading mechanism, each possible world is given a *kappa value*, where *kappa* is a function from worlds to non-negative integers:

$$\kappa: W \to \mathcal{N} \cup \{0\},\$$

such that  $\kappa(w) = 0$  for at least one  $w \in W$ . The kappa value of a possible world is the degree of surprise in encountering that possible world. Intuitively, the lower the kappa, the higher the probability, and worlds with  $\kappa = 0$  are considered serious possibilities. The definition of  $\kappa$  is extended to sets of possible worlds (propositions and propositional formulas) via Spohn's calculus, as the minimum for all such w that belong to  $\varphi$ , of all  $\kappa(w)$ , that is to say, as expressed by *Spohn's minimum formula*:

$$\varphi = \min_{w \in \varphi} \kappa(w)$$

where if  $\varphi$  is false in all possible worlds,  $\kappa(\varphi)$  is defined to be infinity,  $\infty$ , and moreover the definition of  $\kappa$  is also extended to conditioning, as expressed by *Spohn's conditioning formula*:

$$\kappa(\varphi|\psi) = \kappa \left(\varphi \land \psi\right) - \kappa \left(\psi\right)$$

The kappa assignment is frequently (Pearl, 1993) seen as an order-of-magnitude approximation of a probability function p(w) defined over W, as follows: write p(w) as a polynomial in some small quantity  $\varepsilon$ , and take the power of the most significant term of that polynomial to be the kappa, that is to say, as expressed by this

approximation formula:

$$p(w) \approx C \varepsilon^{\kappa(w)}$$

for some constant *C*. Treating  $\varepsilon$  as infinitesimally small, Spohn's calculus is consistent (and follows from) the axioms of probability theory. Note that seemingly the only way to state that a proposition  $\varphi$  is certain, or even very likely, is to state that the degree of surprise in encountering the negation of  $\varphi$ , that is to say,  $\sim \varphi$ , is high, i.e. stating that  $\kappa(\sim \varphi) > 0$ . Also, if  $\varepsilon < \frac{1}{2}$  then clearly  $\kappa(\varphi) > 0$  implies  $\kappa(\sim \varphi) = 0$ , but not vice versa (that is to say, it is certainly possible that  $\kappa(\varphi) = \kappa(\sim \varphi) = 0$ ).

## 2.6.4 A Comparison of the Schemes

We begin by comparing kappa-calculus to Åqvist's grading mechanisms without considering probabilities. Later on we introduce the probability distribution and continue the comparison.

#### 2.6.4.1 Equivalence of Kappa-Calculus to Grading Mechanisms

Ignoring for the moment the probability measure on the set of possible worlds, or the value of  $\varepsilon$  for kappa calculus as an order-of-magnitude probability approximation, we begin defining a natural mapping between the schemata. Given a *k*-level grading mechanism *G* over the set of possible worlds *W*, we define a function from worlds to positive integers

$$G: W \to \mathcal{N},$$

being the grade of a world, such that G(w) = i just when  $w \in C_i$  in the grading mechanism G. We now define a level-to-kappa mapping function, from positive integers to non-negative integers,

$$F_k: \mathcal{N} \to \mathcal{N} \cup \{0\}$$

as:

$$F_k\left(i\right) = k - i$$

The mapping from a grading mechanism to kappa calculus is simply defining

$$\kappa(w) = F_k(G(w))$$

for each  $w \in W$ , and extending the definition to sets of possible worlds as for the earlier definition of  $\kappa$  in Spohn's minimum equation with the special case  $\kappa(\emptyset) = \infty$  (that is to say,  $\kappa$  of the empty set is infinity). It is clear (by construction) that the

grading mechanism *G* is non-vacuous (that is,  $C_k$  is non-empty) if and only if there exists a world  $w \in W$  for which  $\kappa(w) = 0$ .

Likewise, define a kappa-to-*k*-level mapping function from non-negative integers to positive integers

$$F'_k: \mathcal{N} \cup \{0\} \to N,$$

as follows:

$$F'_k(i) = \max(1, k - i).$$

Now, given a set of possible worlds *W*, and a kappa ranking, we define the *k*-level grading mechanism over *W* as the partition uniquely determined by:

 $w \in C_i$  if and only if  $F'_k(\kappa(w))$ .

The following theorem follows from the definitions:

**Theorem 1**  $F'_k$  is the left-inverse of  $F_k$  (that is,  $F'_k(F_k(i)) = i$  for any  $k, i \in \mathcal{N}$ ), and the k-level grading mechanism is equivalent to  $\kappa$ -calculus where the  $\kappa$  values are limited to the range  $\{0, \ldots, k-1, \infty\}$ .

Obviously, since the mapping is semi-invertible, kappa-calculus subsumes Åqvist's grading mechanisms (and if we allowed grading mechanisms to have an infinite number of partitions, they would be equivalent). Åqvist could have just used kappa-calculus directly in his paper, instead of having to invent grading mechanisms.

The degrees of evidential strength in Åqvist's paper have no immediate counterpart in kappa-calculus, but we could define them as follows:

 $P_i X$  if and only if  $\kappa(\sim X) \ge k - i + 1$ , and  $R_i X$  if and only if  $\kappa(X) \ge i$ .

This definition is far more concise than the one given by Åqvist, yet it is essentially equivalent:

**Theorem 2**  $P_i X$  in a k-level grading mechanism G, if and only if  $P_i X$  in the respective kappa-calculus representation (and likewise for  $R_i X$ ).

*Proof* ( $\rightarrow$ ) Suppose  $P_i X$  in a *k*-level grading mechanism. Then for every  $j \ge i$ , we have

$$w \in C_i \rightarrow w \in X$$
,

and thus

$$G(w) \ge i \to w \in X,$$

or alternately, using the k-level to kappa mapping,  $F_k(i) = k - i$ , we have

$$\kappa(w) \le k - i \to w \in X.$$

Thus, since possible worlds are internally consistent, the is no  $w \in \mathcal{X}$  such that  $\kappa(w) \leq k - i$ , and since the kappa value of a set of possible worlds is the minimum kappa of the set, we have  $\kappa(\mathcal{X}) \geq k - i + 1$ , proving the implication.

 $(\leftarrow)$  Suppose  $P_i X$  in the kappa-calculus representation; that is, where

$$\kappa(w) = F_k(G(w)).$$

Then  $\kappa(\sim X) \ge k - i + 1$ , and thus

$$w \in \sim X \to \kappa(w) \ge k - i + 1 \to F'_k(\kappa(w)) \le i - 1.$$

Therefore,

$$w \in \sim X \rightarrow G(w) \leq i - 1$$

(since  $F'_k$  is the left-inverse of  $F_k$ ), and thus  $C_j X$  for all  $j \ge i$ .

Proof of the theorem for  $R_i X$  is similar, but also follows immediately from the proof for  $P_i X$  and the following theorem.

**Theorem 3** *The degrees of evidential strength defined above for kappa-calculus have the same properties as for grading mechanisms, i.e.* 

- $P_i X$  if and only if  $R_{k-i+1} \sim X$
- $P_i X$  is inconsistent with  $R_i X$  for any i, j
- $P_i X$  implies  $P_{i+1}X$  for positive integer i < k

*Proof* immediate from the definitions, as follows (item for item):

• By the already seen definition

 $P_i X$  if and only if  $\kappa(\sim X) \ge k - i + 1$ , and  $R_i X$  if and only if  $\kappa(X) \ge i$ .

 $P_i X$  if and only if  $\kappa(\sim X) \ge k - i + 1$ , and  $R_{k-i+1} \sim X$  if and only if  $\kappa(\sim X) \ge k - i + 1$ , which is exactly the same term as for  $P_i X$ .

• If  $P_i X$  for some  $1 \le i \le k$  then  $\kappa(\sim X) \ge k - i + 1 > 0$ . Suppose that  $R_j X$  for some  $1 \le j \le k$ . Then by same definition

 $P_i X$  if and only if  $\kappa(\sim X) \ge k - i + 1$ , and  $R_i X$  if and only if  $\kappa(X) \ge i$ .

this formula will be verified:  $\kappa(X) \ge j > 0$ . However, every possible world  $w \in W$  must satisfy either *X* or  $\sim X$  (using the same "excluded middle" assumption made by Åqvist), and there exists  $w \in W$  such that  $\kappa(w) = 0$ . If this possible world *w* 

is in *X*, then by Spohn's minimum equation, it will be  $\kappa(X) = 0$ , a contradiction. Likewise if  $w \in -X$ .

• By the definition

 $P_i X$  if and only if  $\kappa(\sim X) \ge k - i + 1$ , and  $R_i X$  if and only if  $\kappa(X) \ge i$ .

 $P_i X$  implies  $\kappa(\sim X) \ge k - i + 1 \ge k - i$ , and  $\kappa(\sim X) \ge k - i + 1 \ge k - i$  implies  $P_{i+1}X$ .

It is also possible to prove the theorem by applying Theorem 2.

#### 2.6.4.2 Reintroducing the Probabilities

Now that we have a mapping between grading mechanisms and kappa-calculus (which was just shown to be a variant, or slight extension, of grading mechanisms), we can introduce the probability distribution over possible worlds. Note that the common trend of using kappa-calculus as an approximation of order-of-magnitude probabilities, implies that the "principle of preponderance" is obeyed.

We must point out, however, that kappa-calculus is strictly consistent with the axioms of probability only if we use an infinitesimal  $\varepsilon$ . Thus, probabilities of possible worlds in different sets of the partition in the grading mechanism should also be stratified by "an order-of-magnitude" probability ratio. It is not clear that this is indeed the case in the definitions in legal reasoning. Nevertheless, perhaps the mere institution of these grades in legal reasoning is an indication that at least *subjectively* (i.e., probabilities subjectively assigned to such possible worlds by a human) this is the case.

The main problem in combining probabilities with a grading-system was typified by the example given in Åqvist's paper (for k = 4): a violation of the "principle of preponderance". That is, we get a case where a proposition is "presumable", yet is less likely than its negation. The suggestion (made by Åqvist) that we insist on  $p(C_4) > \frac{1}{2}$  is an obvious, albeit somewhat ad-hoc solution.

A more general statement of the problem is that, if probabilities in different sets (i.e., different  $C_i$ ) in the grading mechanism are not "orders of magnitude" apart, then in fact the disjunction of several propositions can "graduate" to a higher grade, if we only make such a disjunction into a primitive proposition (thereby modifying the set of possible worlds, W). It is thus the case that the grading mechanism is very sensitive to the syntax of the propositional formulas, and to the set of possible worlds which we allow to participate in the grading mechanism.

Forcing  $p(C_k) > \frac{1}{2}$  may prevent unlikely facts from being accepted as "probable" or "presumable" or "certain", but would not prevent us from passing merely "probable" facts as "certain" without really changing the probability distribution, but just the syntax of the propositional formulas. This is certainly an undesirable property of the grading scheme.

For example, paraphrasing Åqvist's "cause of death" example (Åqvist, 1992), with possible worlds:  $w_1$  = poisoned by wife,  $w_2$  = accidental liquid poisoning,  $w_3$  = taking poison deliberately (suicide),  $w_4$  = murdered by someone else (not wife),  $w_5$  = accidental gas poisoning,  $w_0$  = other cause of death. Suppose now (modifying the original example) that the evidence is such that (with a 4-level grading mechanism), we have  $C_4 = \{w_1\}$ ,  $C_3 = \{w_4\}$ ,  $C_2 = \{\}$ , and  $C_1 = \{w_0, w_2, w_3, w_5\}$ . Suppose the following probability distribution is assigned:  $p(w_1) = 0.7$  (thus obeying the "principle of preponderance"),  $p(w_4) = 0.1$ , and  $p(w_0) = p(w_2) = p(w_3) = p(w_5) = 0.05$ . Total probability is 1 as required.

Now, suppose we want to decide a case where the deceased's brother is a beneficiary of a life-insurance policy taken out on the deceased. The beneficiary is claiming for double-indemnity, to be awarded in case of murder. In this example, the proposition "death by murder", entitling claimant to double indemnity payments, is "certain" (since all possible worlds in  $C_4$ ,  $C_3$ ,  $C_2$  entail "death by murder"). In this case, the claimant would win his double-indemnity case if the required degree of evidence for such a claim were "certain", "probable" or "presumable".

However, one could claim that this is incorrect, and state: all accidental deaths are equivalent here, and thus we should *not* have both  $w_2$  and  $w_5$ , but instead some  $w_6$  = accidental poisoning, with a probability 0.1 (which is the same distribution, just changing the syntax and creating a predicate that stands for a disjunction). Intuitively, this should change nothing in the certainty of "death by murder", but this is not the case in this model. We have  $C_3 = \{w_4, w_6\}$  and since  $w_6$  not in "death by murder" is only "presumable". Now, if the requirement for the evidence level is "certain" or "probable", the claimant would now lose his double-indemnity case, where he would have otherwise won it!

#### 2.6.5 Suggested Solution

Observe that the above undesirable effect could not occur if we used kappacalculus with infinitesimal epsilon (or the equivalent probabilities in the grading mechanism). Nevertheless, this would require that we consider facts "approved not without distinction" as having infinitesimal probabilities, which is somewhat counterintuitive.

To avoid this problem, it is sufficient if we required the following constraint, in addition to  $C_k \neq \emptyset$  (i.e., being other than the empty set), for all  $w \in W$ :

$$w \in C_i \to p(w) > \sum_{j < i} \sum_{w' \in C_i} p(w')$$

This constraint implies that the principle of preponderance, and subsumes Åqvist's requirement that  $p(C_k) > \frac{1}{2}$ . Observe that the example in the previous section, while obeying the principle of preponderance, violates our constraint, since

$$p(w_4) = p(w_2) + p(w_5)$$

while  $w_4 \in C_3$  and  $w_2, w_5 \in C_1$ .

## 2.6.6 Contextual Assessment of the Method

However mathematically sound the restatement of the Åqvist model may be, its usefulness entirely depends on compatibility with the context that has to provide the qualitative grading of the elements of evidence, that in turn the Åqvist model uses as input. What makes the Åqvist model (and, perhaps all the more so, our probabilistic reformulation of it) problematic in the broad perspective of juridical proof, is that it is what lays upstream of it that perhaps defies modelling, and anyway is not addressed at all by either Åqvist's model, or our restatement of the method. The input is a subjective grading of the elements of evidence, and is supposed to be provided by human experts. In elaborating the input they are to provide, this is to be the end product of complex mental processing (not merely cognitive: consider colouring by emotion). Such mental processing involves both perception and "higher" (cognitive or noncognitive) functions which invoke each other recursively, or, anyway, are pervasively interwoven (even the cultural vs. bio- or physiological extremes are not uncontroversially demarcated; cf. Nissan, 1997c). Among the other things, a rather obvious aspect of this is that by reasoning, new goals for perception are set, in both the investigation, and, say, cross-examination. However, at the end of the day, the sad, inescapable fact remains that if anybody is to provide subjective estimates as input to an automated or otherwise formal component embodying the Åqvist model, then the diminutiveness of this component within the broad picture of legal evidence and proof is an inescapable fact.

Our contribution in the present Section 2.6 has been to show that the formalism proposed by Åqvist is entirely amenable to, and thus is fully compatible with, the statement in terms of probabilistic reasoning of the kappa calculus. Probabilistic reasoning is a well-researched, powerful tool outside as well as within artificial intelligence. It can contribute to Bayesian Law, or to its critique, or, perhaps more usefully if possible, to overcoming the divide (see Section 2.6.7). For the latter purpose, however, it is other facets of the extant panoply of AI & Law or just AI techniques that could most usefully contribute: such themes as argumentation, agents' epistemic states, narrative coherence, and so forth, are all facets that deserve development. (For example, culture-laden literary concepts of narrative improbability sometimes impinge on lay perceptions of a crime narrative as reported by the media: see Section 5.2.20.3 in this book, concerning the Jama narrative.)

# 2.6.7 An Application to Relative Plausibility? Considerations About a Role for the Formalism

One thing that can be expected to have been noticed by such readers who are already generally conversant with the subject to which Chapter 2 in this book is devoted, is that our proposal of a kappa-calculus based formalism is predicated upon the assumption that somebody or something upstream in the conceptual architecture will be providing quantified probative values, and that the architectural module

described here in Section 2.6 accepts this "no questions asked", because it is not its task to ask questions about what it is fed.

Arguably, leaving things noncommittal that way would not be entirely responsible, once one consider the state of the art. Such readers who would accept as obvious either conventional Bayesianism, or resorting to the integration into it of causality by means of Bayesian networks, the formalism introduced by Judea Pearl (see Pearl, 1988) – as scholar admittedly "only a half-Bayesian"<sup>95</sup> (Pearl, 2001) – may assume, *ex silentio*, that kappa calculus the way we employed it may be yet another frill of the same broad paradigm.

This however dodges the question of usefulness. Hopefully our formalism could be put to use in more innovative attempts to capture formally a framework of *relative plausibility*,<sup>96</sup> based on coherence and other facets of narrative accounts proposed to adjudicators in a judicial setting (or perhaps as well in tools for prosecutors pondering whether to prosecute).

Thirty years later, I am still a devout Bayesian in the sense of (i), but I now doubt the wisdom of (ii) and I know that, in general, (iii) is false. Like most Bayesians, I believe that the knowledge we carry in our skulls, be its origin experience, schooling or hearsay, is an invaluable resource in all human activity, and that combining this knowledge with empirical data is the key to scientific enquiry and intelligent behavior. Thus, in this broad sense, I am still a Bayesian. However, in order to be combined with data, our knowledge must first be cast in some formal language, and what I have come to realize in the past ten years is that the language of probability is not suitable for the task; the bulk of human knowledge is organized around causal, not probabilistic relationships, and the grammar of probability calculus is insufficient for capturing those relationships. Specifically, the building blocks of our scientific and everyday knowledge are elementary facts such as "mud does not cause rain" and "symptoms do not cause disease" and those facts, strangely enough, cannot be expressed in the vocabulary of probability calculus. It is for this reason that I consider myself only a half-Bayesian.

 $^{96}$  See in Section 5.1.2 below. "The distinction between the structure of proof and a theory of evidence is simple. The structure of proof determines what must be proven. In the conventional [probabilistic] theory [which Allen attacks] this is elements to a predetermined probability, and in the relative plausibility theory [which Ron Allen approves of] that one story or set of stories is more plausible than its competitors (and in criminal cases that there is no plausible competitor). A theory of evidence indicates how this is done, what counts as evidence and perhaps how it is processed" (Allen, 1994, p. 606). The central thesis of Allen (1991) was summarised in Allen's paper 'Explanationism All the Way Down' (2008a, p. 325) as: "A more promising approach to understanding juridical proof is that it is a form of inference to the best explanation. Conceiving of cases as involving the relative plausibility of the parties' claims (normally provided in story or narrative form) substantially resolves all the paradoxes and difficulties [...]". In Allen (2008b), the relationship between juridical proof and *inference to the best explanation (IBE*) was thoroughly examined.

<sup>&</sup>lt;sup>95</sup> Judea Pearl began his paper (2001) by claiming (ibid., p. 19, his brackets):

I turned Bayesian in 1971, as soon as I began reading Savage's monograph *The Foundations of Statistical Inference* [Savage, 1962]. The arguments were unassailable: (i) It is plain silly to ignore what we know, (ii) It is natural and useful to cast what we know in the language of probabilities, and (iii) If our subjective probabilities are erroneous, their impact will get washed out in due time, as the number of observations increases.

The challenge is to compare (in civil cases) the (non-Bayesian) plausibility of two competing narratives, or (in criminal cases) to find out whether the account of the prosecution has no *plausible* narrative competing with it at all. The latter is so, because the standard of proof in criminal cases must be "beyond reasonable doubt". It is not easy to figure out, for the time being, how to produce a computational comparator of plausibility, without falling back into Bayesianism, but this is worth trying. One may devise either a set of binary criteria of assessment for various aspects of a narrative or subnarrative, or instead some multi-valued formalism that is not binary, and therefore would have to quantify. The real challenge is to avoid the *reference-class problem* we mentioned in Section 2.4. In Chapter 5, those conceptual tools that artificial intelligence research has already produced and offers for processing narratives will be surveyed. Ideally this should be combined with argumentation tools like those discussed in Chapter 3.

# Chapter 3 Argumentation

# 3.1 Types of Arguments

In court, lawyers seek to *persuade* the adjudicator. By contrast, their attitude towards the other party is conflictual, *eristic*, and they do not expect to persuade the other party while in court. If however a settlement out of court is sought, then a solution for the conflict of interests is sought by *negotiation*. Walton and Krabbe (1995, p. 66) proposed a classification of dialogues through which argumentation unfold. See Table 3.1.1. Figure 3.1.1 shows how to determine the type of dialogue (Walton & Krabbe, 1995, p. 81).

MacCormick (1995, pp. 467–468) defined argumentation as follows:

Argumentation is the activity of putting arguments for or against something. This can be done in speculative or in practical contexts. In purely speculative matters, one adduces arguments for or against believing something about what is the case. In practical contexts, one adduces arguments which are either reasons for or against doing something, or reasons for or against holding an opinion about what ought to be or may be or can be done.

"A reason given for acting or not acting in a certain way may be on account of what so acting or not acting will bring about. Such is teleological reasoning. All teleological reasoning presupposes some evaluation" (p. 468). "Deontological reasoning appeals to principles of right or wrong, principles about what ought or ought not to be or be done, where these principles are themselves taken to be ultimate, not derived from some form of teleological reasoning" (p. 468).

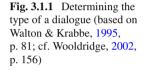
"Robert Summers [(1978)] has proposed the term 'reasons of substance' or 'substantive reasons' as a name for those reasons that have practical weight independently of authority" (MacCormick, p. 468). MacCormick discusses "institutional argumentation applying 'authority reasons' as grounds for legal decision" (p. 467), and "explores the three main categories of interpretative argument", namely, linguistic arguments, systemic arguments, and teleological and deontological arguments (p. 467).

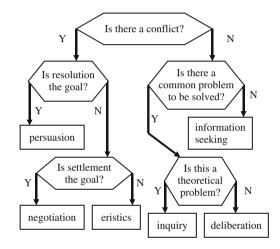
Systemic arguments are kinds of "arguments which work towards an acceptable understanding of a legal text seen particularly in its context as part of a legal system" (p. 473), e.g., the argument from precedent, the argument from analogy, and so forth.

129

Туре	Initial situation	Main goal	Participants aim
Persuasion	Conflict of opinions	Resolve the issue	Persuade the other
Negotiation	Conflict of interests	Make a deal	Get the best for oneself
Inquiry	General ignorance	Growth of knowledge	Find a "proof"
Deliberation	Need for action	Reach a decision	Influence outcome
Information seeking	Personal ignorance	Spread knowledge	Gain or pass on personal knowledge
Eristics	Conflict/antagonism	Reaching an accommodation	Strike the other party
Mixed	Various	Various	Various

**Table 3.1.1** Typology of argumentation. (based on Walton & Krabbe, 1995, p. 66; cf. Wooldridge, 2002, p. 155)





# 3.2 Wigmore Charts vs. Toulmin Structure for Representing Relations Among Arguments

# 3.2.1 Preliminaries

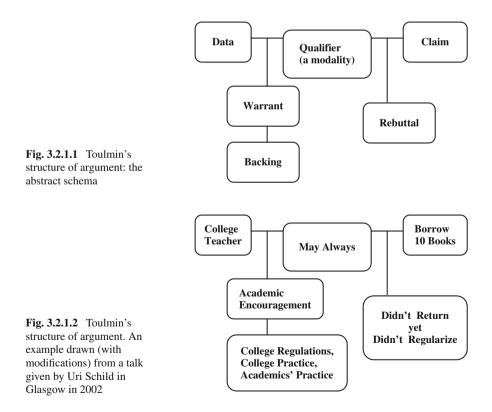
John Henry Wigmore (1863–1943) was a very prominent exponent of legal evidence theory (and of comparative law) in the United States. A particular tool for structuring argumentation graphically, called Wigmore Charts and first proposed by Wigmore in the *Illinois Law Review* (Wigmore, 1913), thus has been in existence for the best part of the twentieth century, yet was basically ignored (notwithstanding Wigmore's acknowledged prominence in other respects, among legal scholars) until it was resurrected in the 1980s.

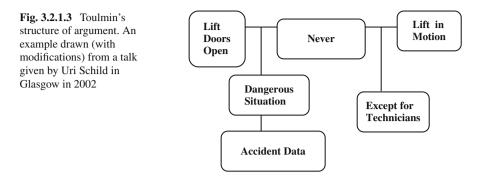
Wigmore Charts are a handy tool for organising a legal argument, or, for that matter, any argument. They are especially suited for organising an argument based on a narrative. Among legal scholars, Wigmore Charts had been "revived" by Terence Anderson and William Twining (1991); already in 1984, a preliminary circulation draft of that book was in existence; it includes (to say it with the subtitle of the draft) "text, materials and exercises based upon Wigmore's *Science of Judicial Proof*" (Wigmore, 1937). Anderson (1999a) discusses an example, making use of a reduced set of symbols from his modified version of Wigmore's original chart method.

David Schum (2001) made use of Wigmore Charts while introducing his and Peter Tillers' computer tool prototype for preparing a legal case, *MarshalPlan*, a hypertext tool whose design had already been described in 1991, and of which a prototype was being demonstrated in the late 1990s, and currently making use of *Revolution* development software. Also see Schum (1993), on how to use probability theory with Wigmore Charts.

In computer science, in order to represent an argument, it is far more common to find in use Toulmin's argument structure (Toulmin, 1958), possibly charted. See Figs. 3.2.1.1, 3.2.1.2, and 3.2.1.3.

Two or more arguments may be related to each other, in a Toulmin chart, because of the overlapping of one of the elements of Toulmin's structure. Basically, the use of Wigmore Charts and Toulmin's structure is equivalent, but Schum argues strongly in favour of the former. Some AI & Law scholars such as John Zeleznikow use Toulmin, whereas Henry Prakken when working on evidence uses Wigmore Charts.





#### 3.2.2 The Notation of Wigmore Charts

Consider, in Toulmin's structure from Fig. 3.2.1.1, how a rebuttal to a claim is notated. Anderson's modified Wigmore Charts resort to an "open angle" to identify an argument that provides an alternative explanation for an inference proposed by the other part to a case. An empty circle (which can be labelled with a number) stands for circumstantial evidence or an inferred proposition, whereas an empty square stands for a testimonial assertion. For example, proposition 2 being a rebuttal of proposition 1 is notated as shown in Fig. 3.2.2.1.

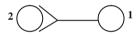


Fig. 3.2.2.1 Argument 2 attacks argument 1 in Wigmore Chart notation

Had the open angle been closed, i.e., a triangle, it would have stood for an argument corroborating the inference. In order to indicate what an inference is based upon, using the triangle is not the most usual practice. Rather, then in order to indicate the relation between a *factum probans* (supporting argument) and a *factum probandum* (what it is intended to prove), that relation is notated as a line with a directed arrow from the former to the latter. See the upper row in Table 3.2.2.1, whose remainder shows how to notate other kinds of relation between arguments.

An infinity symbol  $\infty$  notated near something indicates that this is sensory evidence (testimonial assertions being heard, of real evidence that will be perceived in court with other senses). A paragraph symbol ¶ notated near a circle, stands for "facts the tribunal will judicially notice or otherwise accept without evidential support" (Anderson, 1999a, p. 57), whereas **G** near a circle stands for a commonsensical background generalisation "that is likely to play a significant role in an argument in a case, but that is not a proposition that will be supported by evidence or that the tribunal will be formally asked to notice judicially" (ibid., p. 57).

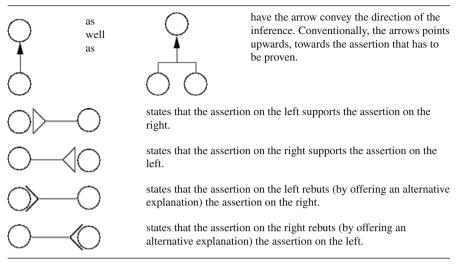


Table 3.2.2.1 Various relations in Wigmore Chart notation

#### 3.2.3 A Wigmorean Analysis of an Example

#### 3.2.3.1 The Case, the Propositions, and the Wigmore Chart

In this subsection, a Wigmorean analysis is given, for an example of reasoning about the evidence supporting or disconfirming an accusation. It is not from the judiciary. A boy is accused of having taken and eaten sweets without his mother's permission. On the face of it, one would think that it is a trivial matter. Yet, the argumentation is articulate, and deserves a Wigmore Chart.

Let us develop a Wigmorean analysis for an invented case. What is special about this case, is that the context is informal: a boy, Bill, is charged with having disobeyed his mother, by eating sweets without her permission. The envelopes of the sweets have been found strewn on the floor of Bill's room. Bill tries to shift the blame to his sister, Molly. The mother acts as both prosecutor, and factfinder: it is going to be she who will give a verdict. Dad is helping in the investigation, and his evidence, which may be invalid, appears to exonerate Bill. This is based on testimony which Dad elicited from Grandma (Dad's mother), who is asked to confirm or disconfirm an account of the events given by Bill, and which involves Grandma giving him permission to eat the sweets and share them with Molly.

Grandma's evidence is problematic: Dad's approach to questioning her was confirmationist. Grandma has received from Dad a description of the situation. She may be eager to spare Bill punishment. Perhaps this is why she is confirming his account. Yet, for Mum to make a suggestion to the effect that the truthfulness of her mother-in-law's testimony is questionable, is politically hazardous, and potentially explosive.

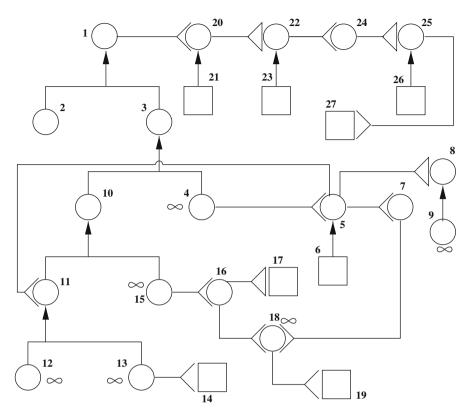


Fig. 3.2.3.1.1 A Wigmore Chart for the example of Bill and Molly

Key list of Fig. 3.2.3.1.1: Circles are claims or inferred propositions. Squares are testimony. An infinity symbol associated with a circle signals the availability of evidence whose sensory perception (which may be replicated in court) is other than listening to testimony. An arrow reaches the *factum probandum* (which is to be demonstrated) from the *factum probans* (evidence or argument) in support of it, or possibly from a set of items in support (in which case the arrow has one target, but two or more sources). A triangle is adjacent to the argument in support for the item reached by the line from the triangle. An open angle identifies a counterargument, instead.

A Wigmore Chart is given in Fig. 3.2.3.1.1, showing the argumentational relations between the propositions listed below.

- 1. Bill disobeyed Mum.
- Mum had instructed her children, Bill and Molly, not to eat sweets, unless they are given permission. In practice, when the children are given permission, it is Mum who is granting it.

- 3. Bill ate the sweets.
- 4. Many envelopes of sweets are strewn on the floor of Bill's room.
- 5. It was Molly, not Bill, who ate the sweets whose envelopes were found in Bill's room.
- 6. Bill says it was Molly who ate the sweets and placed the envelopes in his room, in order to frame him.
- 7. Molly is very well-behaved.
- 8. Bill would not have left around such damning evidence, implicating him as being the culprit.
- 9. The envelopes were very conspicuously strewn on the floor of Bill's room.
- 10. Medical evidence suggests that Bill ate the sweets.
- 11. Bill's teeth are aching, the reason being that he ate the sweets.
- 12. Bill has bad teeth.
- 13. Bill's teeth are aching at the time the charge against him is being made.
- 14. Bill says that his teeth were already aching on the previous two days.
- 15. Mum is a nurse, and she immediately performed a blood test on Bill, and found an unusually high level of sugar in his bloodstream.
- 16. If there was a mix-up, then Molly is the culprit, not Bill.
- 17. Bill rang up Dad and claimed that Bill insisted with Mum to test also Molly's blood, not only Bill's blood, and that Mum did so, but must have mixed up the results of the two tests.
- 18. Mum tested both Bill and Molly for sugar in their bloodstream, and both of them tested positive.
- 19. Molly says she only ate sweets because Bill was doing so and convinced her to do likewise.
- 20. Bill was justified in eating the sweets.
- 21. Bill rang up Dad, related to him his version of the situation, and claimed to him that Grandma had come on visit, and while having some sweets herself, instructed Bill to the effect that both Bill and Molly should also have some sweets, and Bill merely complied.
- 22. Dad's evidence confirms that Bill had Grandma's permission.
- 23. Dad rang up Grandma, and she confirmed that she gave Bill the permission to take and eat the sweets.
- 24. Dad's evidence is not valid, because Dad told Grandma about Bill's predicament, and Grandma wanted to save Bill from punishment.
- 25. What Dad admitted, confirms that his way of questioning Grandma may have affected whether she was being sincere.
- 26. Dad confirms that he told Grandma about Bill's predicament, and didn't just ask her whether she had come on visit first, and next, whether sweets were being had.
- 27. Dad: "How dare you question Grandma's sincerity?!".

#### 3.2.3.2 Considerations About the Situation at Hand

Proposing that exceeding benevolence and leniency for one's grandchildren is typical behaviour for grandmothers, is an example of background generalisation. This could have been one more proposition in the list. "Children are fond of sweets" and "Children are less likely to resist temptation for something they crave" are other generalisations. "Molly is very well-behaved" is an example of character evidence, and is related to a background generalisation, "A person who on record is very wellbehaved, is unlikely to be a perpetrator (if a suspect), or to be an offender again (if guilt is proven, but extenuating circumstances are invoked)".

In turn, a counterargument against this generalisation is yet another generalisation, conveyed by the English proverb "Who has once the fame to be an early riser, may sleep till noon" and equivalent proverbs from other languages (Arthaber, 1929, §476), or the more explicit Latin proverb *Saepe habet malus famam boni viri* ("Oftentimes, one who is wicked has a reputation of being an honest man"; cf. in the Italian dialect of Bergamo, also quoted in Augusto Arthaber's comparative anthology: *Se 'n balos l'è stimat bu, / Che 'l fassa mal, no i cred nissu* – "If a despicable fellow is deemed good, / Even if he does evil, nobody would believe it"). Proverbs belong in folklore, yet they encapsulate generalisations or, like in the latter case, a caveat. Also consider the English proverb: "The best horse will sometimes stumble", which is more charitable for Molly. Generalisations are dangerous in a judiciary context, if they are implicit and assumed uncritically.

Note that Molly is not necessarily lying, even in case Grandma actually gave Bill permission for both Bill and Molly, not in Molly's presence. Molly may simply have been suspicious of Bill's sincerity. It may be that she topped this up by littering his room with sweets envelopes, in order to have him ensconced as being the one responsible. Or then, Bill may have littered his room unthinkingly.

Some inconsistency in Bill's reports is not necessarily fatal for his case. Bill's insisting on Mum's testing also Molly's blood may be out of his desire for equal treatment as being a suspect, or then out of vindictiveness and spite (children hate being pricked with a needle, and less stoic than adults in this respect, so being pricked is already penalising Bill, and he would want the inconvenience shared by Molly, too, even in case she is innocent).

Importantly, Mum's having tested both Bill's and Molly's blood enables Bill to claim that there was a mix-up; yet, in case he is guilty, this trick only makes sense if he didn't expect also Molly to have a high sugar level, and whereas they both testing positive in as much as they both have a high sugar level suggests that both Bill and Molly ate sweets, perhaps Bill was under the impression that Molly was reluctant to partake. She may even have succumbed to the temptation for sweets at a later stage (not when she was witnessing, or perhaps approached by, Bill about the sweets), of which Bill is unaware.

"How dare you question Grandma's sincerity?!" is an example of a political consideration about the evidence. In the American law of evidence, rules of extrinsic policy (in Wigmore's terminology) are a category of exclusionary rules (i.e., rules excluding or restricting the use of admitted evidence), such that they give priority to other values over rectitude of decision. These are rules which are not so much directed at ascertaining the truth, but rather which serve the protection of personal rights and secrets. For a discussion of evidential rules and the judicial role in criminal trials, see Stein (2000).

Nissan (forthcoming b) is a very extensive analysis, in ca. 800 propositions and 100 Wigmore Charts, of the argumentation of the closing speech to the bench (by a barrister who is also among Italy's most prominent forensic psychologists) on February 2006 in a trial on recovered memories. The treatment is so detailed because it was done a posteriori, on the trascription of a long speech with features typical of oralcy. Incorporating in the Wigmore Charts not only the logical structure, but also the rhetorical tactics, is novel. It must be said that such an extensive analysis is warranted by rhetorical studies, whereas work on practical Wigmore Charts as intended for preparing a case in court can be expected to be much more contained.

#### 3.2.4 Another Example: An Embarrassing Situation in Court

#### 3.2.4.1 An Episode During a Trial

We are going to analyse the situation described in the following report from the free newspaper *Metro London* of Friday, January 21, 2000, p. 3, col. 5 (punctuation is reproduced without modification):

#### Lawyer: My dog ate the evidence

AS mitigation goes, barrister Stephen Rich knew it was going to sound pretty lame.

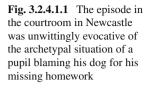
When the defence counsel arrived at Newcastle Crown Court without vital video evidence for a criminal trial he told the judge: 'The dog ate it, m'lud'.

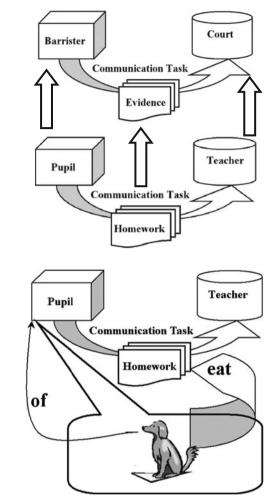
The schoolboy excuse received the same cool response from judge David Hodson as it has from generations of teachers and the case was adjourned.

Mr Rich, 58, whose bull mastiff, Nalla, devoured the tape after he left a box of evidence unattended, said: 'It was very embarrassing and the judge didn't seem too impressed.'

Fortunately, for Mr Rich, the video came from closed-circuit TV and he was able to get another copy.

This story is amenable to interesting analysis, because of the role that background generalisations play in it. Namely, the explanation the defence lawyer gave for the missing evidence was suspiciously all too similar to the classical schoolboy's excuse that his dog ate his homework. I have devoted a book, *All the Appearance of a Pretext* (Nissan, forthcoming a), to that archetype; as well as 'The Dog Ate It', in The American Journal of Semiotics (Nissan 2011f). In the situation at hand, there is mapping (Fig. 3.2.4.1.1) between patterns (the awkward real-life episode from the courtroom in Newcastle, and the cultural expectation of the classroom situation of a pupil making excuses), a mapping which was activated by the claim made by the defence barrister, an event which unwittingly evoked the archetypal situation of a pupil making excuses about his or her homework having been eaten by a pet dog belonging to the pupil (see Fig. 3.2.4.1.2, cf. Fig. 3.2.4.1.3).





situation of which the explanation given by the barrister in Newcastle was unwittingly evocative

Fig. 3.2.4.1.2 The archetypal



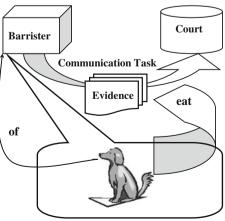


Fig. 3.2.4.1.3 The explanation given by the defence barrister in Newcastle concerning the missing evidence

# 3.2.4.2 The Propositions and Their Wigmore Charts

In this subsection, we are listing the propositions representing the arguments involved in the episode from the courtroom in Newcastle, and we also provide Wigmore Charts that capture the relations between those propositions.

- 1. Rich left a box of evidence unattended at home.
- 2. The tape was inside the box.
- 3. Nalla ate the tape.
- 4. The tape was destroyed.
- 5. The tape is no longer available.
- 6. Nalla did access the box.
- 7. Nalla could access the box.
- 8. Being able to access the box, while the tape was inside, would enable to access the tape, if the box is not safely closed.
- 9. Nalla is a dog.
- 10. Nalla is Rich's dog.
- 11. Nalla lives at Rich's home.
- 12. Pet dogs typically live at their owner's home.
- 13. A tape is not edible for dogs.
- 14. Dogs sometimes chew inedible things.
- 15. The dog could not conceivably swallow the box.
- 16. The box is too large.
- 17. It is unnecessary for the dog to swallow the box, for it to destroy the tape.
- 18. The box was not safely closed.
- 19. Did Nalla digest the tape? (a possible objection).
- 20. It is unnecessary for the dog to have fully digested the tape.
- 21. It is enough for the tape to be destroyed, that the dog would chew and damage it beyond repair.
- 22. Did Rich try to repair the tape? (a possible objection).
- 23. It is unnecessary for Rich to have actually tried to repair the tape.
- 24. Rich would be able to assess at sight the unrecoverability of the tape's functionality.
- 25. Rich is a barrister.
- 26. Rich was the defence counsel of a criminal suspect.
- 27. The box contained evidence for the defence at the given trial.
- 28. Evidence is necessary for a party to a trial to seek a favourable factfinding.
- 29. The unavailability of defence evidence which previously existed, weakens the prospects of the defence.
- 30. The destroyed tape is no longer available for the defence.
- 31. The tape contained video evidence which was vital for the defence.
- 32. The defence case was harmed, if the video evidence could not be presented.
- 33. Rich had to justify in court why evidence announced was now unavailable.
- 34. Rich explained that his dog had eaten that piece of evidence.
- 35. Rich told the judge: "The dog ate it, m'lud".

**Fig. 3.2.4.2.1** A preliminary argument-structure for assertions 1–5

**Fig. 3.2.4.2.2** A refinement of the argument-structure, for assertions 1–12

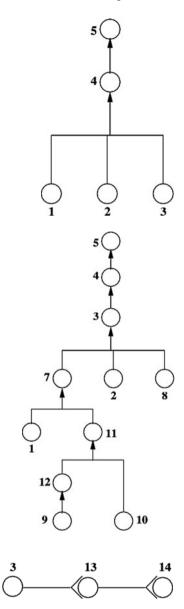


Fig. 3.2.4.2.3 A possible objection, and its refutation

The propositions given thus far are organised in Figs. 3.2.4.2.1, 3.2.4.2.2, 3.2.4.2.3, 3.2.4.2.4, 3.2.4.2.5, 3.2.4.2.6, 3.2.4.2.7, and 3.2.4.2.8. Figure 3.2.4.2.2 is a refinement with respect to Fig. 3.2.4.2.1, and can replace it. Whereas Fig. 3.2.4.2.1 only considers the assertions 1–5, in Fig. 3.2.4.2.2 the assertions involved are 1–12. Figure 3.2.4.2.3 shows a possible objection (assertion 13, objecting to assertion 3), and an objection to the objection: assertion 14 retorts to assertion 13, and thus corroborates assertion 3. Note that Fig. 3.2.4.2.3 is contained in Fig. 3.2.4.2.5.

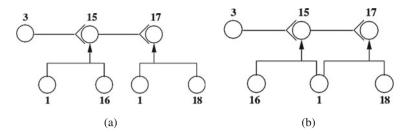
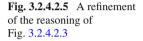
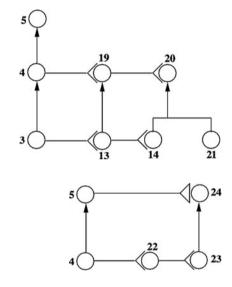


Fig. 3.2.4.2.4 (a) One more possible objection, and its refutation. (b) An enhanced Wigmore Chart, replacing (a)





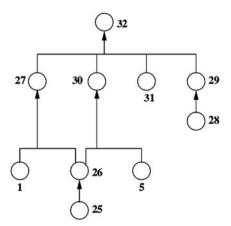
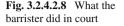


Fig. 3.2.4.2.6 How could Rich be sure that the tape had become useless?

**Fig. 3.2.4.2.7** Effect of the video evidence being unavailable



The Wigmore Chart of Fig. 3.2.4.1.4 is given here in two variants: Fig. 3.2.4.2.4 (a), and (b). The latter enables to avoid repeating the same node of the graph twice. In fact, the node labeled 1 (because it stands for assertion 1) has been put in the middle between node 16 and node 18, so that two-pronged arrow whose sources are node 16 and 1, as well as the two-pronged arrow whose sources are node 18, can share node 1 graphically. This also illustrates the convention that the order of the nodes from left to right, in a two-pronged or multi-pronged arrow, does not matter. It does matter, instead, that arrows go upwards, and never downwards, so that one can see at a glimpse what the direction of the inference is.

Let us continue listing the propositions concerning the episode in Newcastle:

- 36. When people don't manage to get it their way, they may be prone to resort to pretexts.
- 37. "The dog ate it" is a famous pretext.
- 38. "The dog ate it" is a pretext typically associated with pupils who didn't do their homework.
- 39. "The dog ate it" is a suspicious excuse, for a pupil to use.
- 40. "The dog ate it is a very poor excuse for grown-ups to use, if their aim is to be believed.
- 41. The judge took a dim view of the barrister claiming that his dog had eaten that important piece of evidence.

Figure 3.2.4.2.9 shows a Wigmore Chart with the argument structure of propositions 36–41.

We could further represent (which we are not going to do here) the argument that the loss of the tape was due to *force majeure*, thus beyond the control of the barrister, as well as one more factor: the barrister is expected to be careful with the evidence in his or her care. Therefore, for a dim view to emerge subsequently to the claim being made that the dog ate the evidence, the contributions include this being a culturally canonical typification of a poor excuse, as well as a consideration

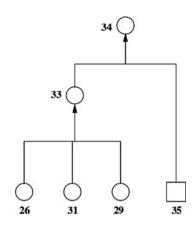
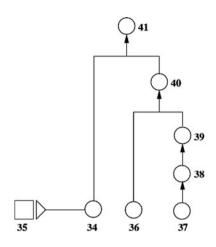


Fig. 3.2.4.2.9 The effect of the claim about the missing evidence



about professionalism. Fortunately for Mr. Rich, the loss was not irretrievable. Let us continue listing the propositions:

- 42. Later on Rich was able, within the timescale of the proceedings, to produce another copy of the video evidence.
- 43. The tape that was destroyed was only one copy of that given video sequence.
- 44. Another copy of the video evidence was in existence.
- 45. Being able to produce the video evidence "saved the day" for the defence, i.e., the effect was as though the evidence had been there with no delay.
- 46. There was no lasting negative impact of Rich making the suspicious claim about why the evidence was unavailable.
- 47. As the evidence was there after all, there is little reason to believe that Rich had made up the story of his dog having eaten the evidence.

Propositions 41–47 are structured in the Wigmore Chart of Fig. 3.2.4.2.10.

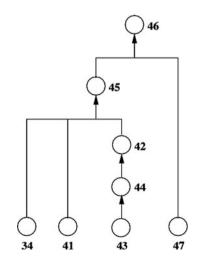
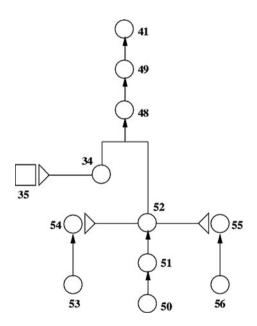


Fig. 3.2.4.2.10 Saving the day

Let us go on listing the propositions:

- 48. That Rich would claim that his dog had eaten the missing evidence had been very suspicious.
- 49. It was at least as likely as not that such evidence had never existed, or that a tape existed with evidence much less helpful than claimed.
- 50. Suppose that there was no such vital evidence in the first place.
- 51. The defence would have referred to it as though it had been in existence, as this would have hopefully been useful for its case.
- 52. Once unable to produce it, defence could still hope for some benevolence on the part of the factfinder.
- 53. The judiciary may resist the hypothesis that a barrister would allow himself such misconduct as deliberately telling an outright lie.
- 54. A barrister is likely to be aware of such reluctance.
- 55. After all, at modern trials, factfinding depends on what factfinders come to believe.
- 56. There no longer is a rigid dependence on being able to assess and measure the evidence when coming to a verdict.<sup>1</sup>

Propositions 48–56 are structured in the Wigmore Chart of Fig. 3.2.4.2.11. Figure 3.2.4.2.12 shows a unified chart replacing Figs. 3.2.4.2.1, 3.2.4.2.2, 3.2.4.2.3, 3.2.4.2.4, 3.2.4.2.5, and 3.2.4.2.6.



**Fig. 3.4.2.11** The adverse argument about the missing evidence

<sup>&</sup>lt;sup>1</sup> Unlike in the age of torture.

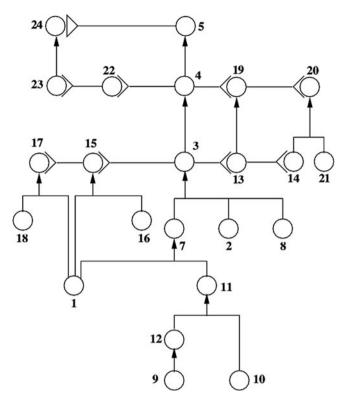


Fig. 3.4.2.12 A unified chart replacing Figs. 3.2.4.2.1, 3.2.4.2.2, 3.2.4.2.3, 3.2.4.2.4, 3.2.4.2.5, and 3.2.4.2.6

In fact, that the barrister was able, during the same hearing albeit on a different day, to produce a valid copy of the evidence that had been lost (eaten by his dog) is no longer evocative of the archetype of the pupil making excuses to his teacher, but rather of a different kind of situation that is also socio-culturally known (see Fig. 3.2.4.2.13).

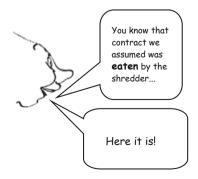


Fig. 3.2.4.2.13 Thought to be lost, yet recovered

## 3.3 Pollock's Inference Graphs and Degrees of Justification

Much of current research into argumentation resorts to graphs. Whereas Wigmore Charts are intended to be of practical use while preparing or analysing a legal case, graphs used by argumentation scholars are sometimes more formally defined. Nevertheless, the various graphical approaches tend to resemble each other.

John L. Pollock of the Department of Philosophy of the University of Arizona, Tucson, developed OSCAR, a cognitive architecture for intelligent (artificial) agents, and this agent architecture is based on defeasible reasoning,<sup>2</sup> this in turn being represented as a network of arguments, called an *inference-graph*. We quote from an article of 2009 that appeared posthumously (Pollock, 2010, p. 7):

The current state of a defeasible reasoner can be represented by an *inference-graph*. This is a directed graph, where the nodes represent the conclusions of arguments (or premises, which can be regarded as a special kind of conclusion). There are two kinds of links between the nodes. *Support-links* represent inferences, diagramming how a conclusion is supported via a single inference-scheme applied to conclusions contained in the inference-graph. *Defeatlinks* diagram defeat relations between defeaters and what they defeat. [...]

Inferences proceed via inference-schemes, which license inferences. We can take an inference scheme to be a datastructure one slot of which consists of a set of premises (written as open formulas), a second slot of which consists of the conclusion (written as an open formula), and a third slot lists the scheme variables, which are the variables occurring in the premises and conclusion. Inference schemes license new inferences, which is to say that they license the addition of nodes and inference-links to a pre-existing inference-graph. Equivalently, they correspond to clauses in the recursive definition of "inference-graph". The inference-graph representing the current state of the cognizer's reasoning "grows" by repeated application of inference-schemes to conclusions already present in the inference-graph and adding the conclusion of the new inference to the inference-graph. When a conclusion is added to an inference-graph, this may also result in the addition of new defeat-links to the inference-graph. A new link may either record the fact that the new conclusion is a defeater of some previously recorded inference in the inference-graph, or the fact that some previously recorded conclusion is a defeater for the new inference.

Pollock recognised "that arguments can differ in strength and conclusions can differ in their degree of justification" (ibid., p. 8). He measured degrees of justification "by either real numbers, or more generally by the extended reals (the reals with the addition of 1 and -1)" (ibid.). As a matter of convenience, Pollock represented by the value 0 being equally justified in believing a proposition and its opposite (but if convenient, Pollock would assume for this a value different from zero). Moreover (ibid.):

Justification simpliciter requires the degree of justification to pass a threshold, but the threshold is contextually determined and not fixed by logic alone. When we ignore degrees of justification, a semantics for defeasible reasoning just computes a value of "defeated" or "undefeated" for a conclusion, but when we take account of degrees of justification, we

<sup>&</sup>lt;sup>2</sup> "Nonmonotonic reasoning, because conclusions must sometimes be reconsidered, is called *defeasible*; that is, new information may sometimes invalidate previous results. Representation and search procedures that keep track of the reasoning steps of a logic system are called *truth maintenance systems* or TMS. In defeasible reasoning, the TMS preserves the consistency of the knowledge base, keeping track of conclusions that might later need be questioned" (Luger & Stubblefield, 1998, p. 270).

can view the semantics more generally as computing the degrees of justification for conclusions. Being defeated simpliciter will consist of having a degree of justification lower than some threshold.

There are two sources of variation of degrees of justification (ibid., p. 9):

[C]hanging the degrees of justification for the premises of an argument can result in different degrees of justification for the conclusion. But there is a second source of variation. New conclusions are added to the inference-graph by applying inference-schemes<sup>3</sup> to previously inferred conclusions. Some inference-schemes provide more justification than others for their conclusions even when they are applied to premises having the same degrees of justification.

If there are no arcs in the graph that reach a given node (that is to say, its *node-basis* is empty), then that node is initial. In particular, it gets no *node-defeaters*. Initial nodes are undefeated. "A non-initial node is undefeated iff all the members of its node-basis are undefeated and all node-defeaters are defeated" (ibid., p. 10). "Let us define an inference/defeat-descendant of a node to be any node that can be reached from the first node by following support-links and defeat-links (in the direction of the arrows)." (ibid.).

Pollock discussed inference/defeat loops (ibid.):

The general problem is that a node Q can have an inference/defeat-descendant that is a defeater of Q. I will say that a node is Q-dependent iff it is an inference/defeat-descendant of a node Q. So the recursion is blocked in inference-graph [...] by there being Q-dependent defeaters of Q and  $\sim$ Q-dependent defeaters of  $\sim$ Q.

where Q is a proposition, and  $\sim$ Q is "not Q". "Iff" stands for "if and only if". "Most of the different theories of defeasible reasoning differ in their assignments of degrees of justification only in how to handle inference/defeat-loops while making the assumption that all degrees of justification are either 0 or 1" (ibid.), but this assumption is too restrictive.

Pollock discussed "the ways in which allowing conclusions to have intermediate degrees of justification can affect the computation of degrees of justification and hence can affect the semantics for defeasible reasoning, focusing initially on loop-free inference-graphs." (ibid., p. 11). Pollock discussed three ways, starting with *diminishers*, exemplified through two different persons, Smith and Jones, whose reliability may be regarded to be different, who predict whether it is going to rain (ibid., p. 12). Jones is a professional weatherman, with a track record of successful predictions (ibid.).

Suppose his predictions are correct 90% of the time. On the other hand, Smith predicts the weather on the basis of whether his bunion hurts, and although his predictions are surprisingly reliable, they are still only correct 80% of the time. Given just one of these predictions, we would be at least weakly justified in believing it. But given the pair of predictions, it seems clear that an inference on the basis of Jones' prediction would be defeated outright. What about the inference from Smith's prediction. Because Jones is significantly more reliable than Smith, we might still regard ourselves as weakly justified in believing that it is going to rain, but the degree of justification we would have for that conclusion seems significantly less than the degree of justification we would have in the absence of

<sup>&</sup>lt;sup>3</sup> An example of an inference scheme is the statistical syllogism (ibid.).

Smith's contrary prediction, even if Smith's predictions are only somewhat reliable. On the other hand, if Smith were almost as reliable as Jones, e.g., if Smith were right 89% of the time, then it does not seems that we would be even weakly justified in accepting Jones' prediction. The upshot is that in cases of rebutting defeat, if the argument for the defeater is almost as strong as the argument for the defeatee, then the defeatee should be regarded as defeated. This is not to say that its degree of justification should be 0, but it should be low enough that it could never been justified simpliciter. On the other hand, if the strength of the argument for the defeater is significantly less than that for the defeatee, then the degree of justification of the defeatee should be lowered significantly, even if it is not rendered 0. In other others, the weakly justified defeaters acts as *diminishers*.

Moreover, consider reasoning from multiple premises to a conclusion. "[M]any philosophers have found it convincing that reasoning from multiple premises can produce conclusions with degrees of justification lower than the degrees of justification of the premises." (ibid.). This is the second way, of the three preannounced. The third way, is with multiple arguments supporting the same conclusion: "A widely shared intuition is that if we have two independent arguments for a conclusion, that renders the conclusion more strongly justified than if we just had only one of the arguments. If so, a theory of defeasible reasoning must tell us how to compute the degree of justification obtained by combining multiple independent arguments." (ibid., p. 13). This is the principle of *accrual of arguments* (ibid., p. 18). Pollock discussed whether this principle is true (ibid., pp. 19–20):

When we know the probability of a conclusion given each of two sets of evidence, the probability given the combined evidence is the joint probability. The preceding observation is that we often know that the joint probability is higher than either constituent probability, and this gives us a stronger reason for the conclusion, and we get this result without adopting an independent principle of the accrual of reasons. To further confirm that this is the correct diagnosis of what is going on, note that occasionally we will have evidence to the effect that the joint probability is lower than either of the constituent probabilities. For instance, suppose we know that Bill and Stew are jokesters. Each by himself tends to be reliable, but when both, in the presence of the other, tell us something surprising, it is likely that they are collaboratively trying to fool us. Knowing this, if each tells us that it is raining in Tucson in June, our wisest response is to doubt their joint testimony, although if either gave us that testimony in the absence of the other, it would justify us in believing it is raining in Tucson in June. So this is a case in which we do not get the effect of an apparent accrual of reasons, and it is explained by the fact that the instance of the statistical syllogism taking account of the combined testimony makes the conclusion less probable rather than more probable.

Pollock also considered other kinds of situations as well, and then proposed: "Having multiple arguments for a conclusion gives us only the degree of justification that the best of the arguments would give us." (ibid., p. 21). Pollock acknowledged: "Thus far, I have been unable to find a case in which taking account of degrees of justification has a significant impact on reasoning. All cases I have discussed can be handled by appealing to simple principles for computing the degrees of justifications, the most notable being the weakest link principle. Most importantly, there is no way to make the accrual of reasons work. However, there is one final case to be discussed in which I believe that a correct account of defeasible reasoning requires us to appeal more seriously to degrees of justification." (ibid.). That case is that of diminishers. "Perhaps the most compelling argument for diminishers is that if the degree of justification of a defeater is only marginally less than the strength of the argument it attacks, surely that should not leave the argument unscathed." (ibid.). "The upshot is that the only cases of defeasible reasoning in which we need something more serious than the weakest link principle to handle and implement defeasible reasoning are cases involving diminishers. To handle those cases correctly, we need a principle governing how diminishers lower degrees of justification." (ibid.).

#### **3.4 Beliefs**

#### 3.4.1 Beliefs, in Some Artificial Intelligence Systems

In communication, agents reason about the beliefs of their interlocutor. *Nested beliefs* have been used in various computational systems modelling dialogic argumentation, such as Sycara's PERSUADER (Sycara, 1989a, 1989b, 1990, 1992; Lewis & Sycara, 1993) – see below in Section 3.5 – or NAG of Zukerman, McConachy, and Korb (1998), or then DAPHNE of Grasso, Cawsey, and Jones (2000). Whereas in *cooperative dialogues*, i.e., such dialogues that none of the participants is committed to any form of deception, three levels of nesting of beliefs are sufficient, this is not enough when it comes to modelling some situations involving deception, and deeply-nested belief levels are required, as argued by Jasper Taylor (1994a, 1994b).<sup>4</sup>

<sup>&</sup>lt;sup>4</sup> Modelling *suspicion* in such a society of agents that deception may occur in it (de Rosis, Castelfranchi, & Carofiglio, 2000; Carofiglio & de Rosis, 2001a). Sergot (2005) was concerned with modelling unreliable and untrustworthy agent behaviour. Lying and deception from the viewpoint of forensic psychology (see fn. 9 in Chapter 1) are the theme of Vrij (2000 [revised 2008], 2001, 2005), of Vrij, Akehurst, Soukara, and Bull (2004), Vrij, Mann, Fisher, Leal, and Milne (2008), of Granhag and Strömwall (2004), and of de Cataldo Neuburger and Gulotta (1996); cf. Castelfranchi and Poggi (1998), whose perspective on lying is that of cognitive science. Also see Leach, Talwar, Lee, Bala, and Lindsay (2004), DePaulo, Lindsay, Malone, Muhlenbruck, and Charlton (2003), Vrij and Semin (1996), Strömwall and Granhag (2003a, 2003b, 2007), Strömwall, Hartwig, and Granhag (2006), Hartwig, Granhag, Strömwall, and Vrij (2005), Hartwig, Granhag, Strömwall, and Doering (2010), Mann, Vrij, and Bull (2004), Porter, Woodworth, Earle, Drugge, and Boaer (2003), Zuckerman and Driver (1985), Zuckerman, DePaulo, and Rosenthal (1981), and Burgoon and Buller (1994). Earlier work by Bella DePaulo – the originator of the Emotional/Motivational approaches to deception - includes, e.g., DePaulo and Kashy (1998), DePaulo and Pfeifer (1986), DePaulo, Lanier, and Davis (1983), DePaulo, Stone, and Lassiter (1984), DePaulo, Kirkendol, Tang, and O'Brien (1988), DePaulo, LeMay, and Epstein (1991).

<sup>&</sup>quot;In contrast to guilty suspects, innocent suspects approach the interview less concerned with strategic information management and instead seem to focus on providing a complete and unedited account as a way to prove their innocence" (Hartwig et al., 2010, p. 11). Hartwig et al. (2010) "mapp[ed] the reasoning of guilty and innocent mock suspects who deny a transgression. Based on previous research, we proposed that suspects will engage in two major forms of regulation: impression management, which requires the purposeful control of nonverbal and demeanor cues; and information management which involves the regulation and manipulation of speech content to provide a statement of denial. We predicted that truth tellers and liars would both be engaged in impression management, but that they would differ in the extent to which they will engage in information management. The results supported this prediction" (ibid., from the abstract).

Eve Sweetser (1987) is concerned with the definition and the semantic prototype of "lie". Also Raskin (1987, 1993) is concerned with the semantics of lying. One may be influenced into sincerely

Take two of the propositions, one encapsulating a background generalisation, from our Wigmorean analysis of the Newcastle episode (see Section 3.2.4):

Proposition 53: The judiciary may resist the hypothesis that a barrister would allow himself such misconduct as deliberately telling an outright lie.Proposition 54: A barrister is likely to be aware of such reluctance.

recollecting something untrue. McCornack et al. (1992) applied *information manipulation theory* to find out when the alteration of information is viewed as deception. A team of psychologists, Gabbert, Memon, and Wright (2006), discussed the effects of socially encountered misinformation, which may be because of memory conformity: witnesses influenced each other by discussing what they recollected (the main title of their paper was "Say it to my face").

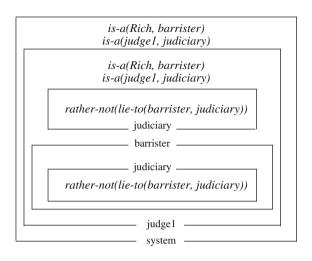
Several works by Ekman (1985, 1996, 1997a, 1997b) are psychological studies of lying; cf., e.g., Ekman and O'Sullivan (2006). Several of Ekman's papers can be downloaded from his website, at http://www.paulekman.com/downloadablearticles.html Tsiamyrtzis, Dowdall, Shastri, Pavlidis, and Frank (2005) discussed the imaging of facial physiology for the detection of deceit. Memon, Vrij, and Bull (1998, revised 2003) is a very important book about methods for ascertaining the truth and detecting lies in police investigations, and about the flaws of such methods. Also see Frank and Ekman's (2003) *Nonverbal Detection of Deception in Forensic Contexts.* Trankell (1972) is concerned with methods for analysing and assessing how reliable witness statements are. How liars attempt to convince is the subject of Colwell, et al. (2006), who researched strategies of impression management among deceivers and truth tellers. Colwell, Hiscock-Anisman, Memon, Rachel, and Colwell (2007) discussed vividness and spontaneity of statement detail characteristics as predictors of witness credibility.

One area of detecting deception, in psychology, is the assessment of *feigned cognitive impairment* (Boone, 2007), a kind of deception which is also known by the names *malingered neurocognitive dysfunction*, or *noncredible cognitive performance*. There are kinds of behaviour that are ascribed to *malingering actors* and *probable malingerers* (ibid.). In particular, *malingering* has to be assessed by forensic psychiatrists in *criminal forensic neuropsychological settings*: a criminal offender may simulate *insanity* or, at any rate, *mental incompetence* in the specific context of a given episode, in order to exonerate him- or herself from a charge. Such simulation involves *symptom fabrication*. The assessment of the mental state at the time of the offence is the task of forensic psychiatrists (Denney & Sullivan, 2008). Another area for assessment is *noncredible competence* on the part of witnesses who claim a role as forensic experts (Morgan, 2008); dubious experts may actually believe they are experts.

In France, Guy Durandin has researched lies and untruthful communication from a psychological viewpoint. His main work on the subject is the book Durandin (1972a). A slimmer volume, Durandin (1977), discusses why people find it difficult to tell lies. Yet another book, Durandin (1982), is concerned with lies in propaganda and advertisement. Advertisement he considers ideology, in Durandin (1972b). Durandin (1978) is an article on the manipulation of opinion. Durandin (1993) is a book on information and disinformation. Psychological warfare is the subject of the books by Daugherty and Janowitz (1958), Mégret (1956), and Louis (1987).

For the computer modelling of *trust and deception* in a society of agents, see, e.g., Castelfranchi and Tan (2002). Argumentation in deceptive communication is treated in Carofiglio, de Rosis, and Grassano (2001), Carofiglio and de Rosis (2001b). Floriana Grasso (2002a) discusses fairness and deception in rhetorical dialogues; Grasso (2002b) is more generally concerned with computational rhetoric. Concerning the modelling and evaluating trust in a public key infrastructure, within the area of computers and security, see Basden, Ball, and Chadwick (2001), Chadwick and Basden (2001), Ball, Chadwick, and Basden (2003), Chadwick, Basden, Evans, and Young (1998). Betrayal within a narrative context was treated computationally (in the BRUTUS storygenerating program) by Bringsjord and Ferrucci (2000). A logic representation for a character betraying another one was incorporated in the AURANGZEB model (Nissan, 2007b).

**Fig. 3.4.1.1** Nested beliefs for propositions 53 and 54 from the Newcastle episode



This is part of the reasoning we may ascribe to the judge or to anybody else, on hearing the barrister make the suspicious claim about his dog having eaten the evidence.

In Fig. 3.4.1.1, we propose the nesting of beliefs involved in the reasoning about those two propositions in the context of the Newcastle episode which we have been discussing in Section 3.2.4. The notation is as follows:

- A box with a label below stands for the set of beliefs of the agent identified by that label.
- A box with a label above stands for a belief or a set of beliefs about the object identified by that label (in particular, this may be another agent).
- An outer box with a label below (an agent's box) includes logical predicates, or then one or more other boxes, and the contents of the agent's box are what that agent believes.

This notation is taken from Ballim, Wilks, and Barnden (1990). Figure 3.4.1.1 means the following:

- The overall system believes that Rich is a barrister, and that *judge1* is a member of the judiciary.
- The overall system believes that *judge1* believes that Rich is a barrister, and that *judge1* is a member of the judiciary.
- The overall system believes that *judge1* believes that the judiciary believes that a barrister would rather not tell a lie to the judiciary.
- The overall system believes that *judge1* believes that a barrister believes that the judiciary believes that a barrister would rather not tell a lie to the judiciary.

Mutual beliefs are modelled in part of artificial intelligence's models of teamwork (e.g., Sycara, 1998). What psychologists call *attribution* and in artificial intelligence

is termed *agent beliefs* – i.e., how people (and computational cognitive models) reason about their own beliefs and the ones they ascribe to others – was applied to legal evidence in two papers that adopt different approaches: Ballim, By, Wilks, and Liske (2001), and Barnden (2001). Previously Ballim and Wilks (1991) proposed an AI formalism for nested beliefs, which in Ballim et al. (2001) they applied to legal narratives.<sup>5</sup> Barnden (2001) describes an application of agents' simulative reasoning by agents on each other, by means of the *ATT-Meta* system, which deals with agents' beliefs in respect of a formal approach to uncertain reasoning about them. The application is to reasoning about legal evidence. It is valuable, yet may be vulnerable to a Bayesio-skeptic critique: "by adopting a bold stance about how to mathematically treat uncertainty in a legal context, one is threading on the hornet's nest that the debate about forensic statistics is, among legal theorists. Some will applaud, some would not, and causing this by itself is beyond reproach" (Nissan & Martino, 2004b).

It is important to point out that it has not been necessarily the case that computer tools that envisaged guessing (mindreading) the intentions of some player, have done so by explicitly incorporating a representation of agents' nested beliefs. In particular, when just one level of ascription is involved, some other schema of representation may also be useful in practice. The following exemplifies this. BASKETBALL is an expert system that was developed in an *ad hoc* fashion (rather than according to some neat theory) by two students of mine under my direction. BASKETBALL is an expert system that gives advice to a basketball team on the opening five and the playing strategy, for a given upcoming match. It does, by analysing the present assets of the two teams, and based also on the likely course of action of the adversary team, even though the information about the present state of the adversary team is likely to be only partial; some general information about the league or the place is also relevant (Simhon, Nissan, & Zigdon, 1992). This is relevant, in our present context, because the reasoning in BASKETBALL is partly based on reading the minds of the other team, by considering how they are likely to plan how they should play, according to their assets. Yet, no further levels of nesting are involved: BASKETBALL does not consider the possibility that the other team, too, may be trying to guess how our own team is going to plan its own strategy, based on our own assets.

#### 3.4.2 Dispositional Beliefs vs. Dispositions to Believe

A philosophical (epistemological) controversy on knowledge and belief is the one between Vendler (1975a, 1975b) and Aune (1975). Our propositions 53 and 54 for the Newcastle episode are such that it is relevant to consider the difference between *dispositional beliefs* and *dispositions to believe*. Robert Audi (1994) questioned the explanatory validity of *antecedent belief*:

<sup>&</sup>lt;sup>5</sup> On agents' beliefs, also see Maida (1991). Maida (1995) is a review of Ballim and Wilks (1991).

Do you believe that this sentence has more than two words? [...] It would be natural to answer affirmatively. And surely, for most readers considering these questions, that would be answering truly. Moreover, in affirmatively answering them, we seem to express antecedent beliefs: after all, we are aware of several words in the first sentence by the time we are asked if it has more than two [...]. Antecedent belief of the propositions in question – believing them before being asked whether we do – is also the readiest explanation of why we answer the questions affirmatively without having to think about them. These considerations incline many people to attribute to us far more beliefs than, in my judgment, we have. [...] I contend that, here, what may seem to be antecedently held but as yet unarticulated dispositional beliefs are really something quite different: dispositions to believe. [...] The terms 'tacit belief' and 'implicit belief' have been used for both dispositional beliefs and dispositions to believe [...] (ibid., p. 419).

#### 3.4.3 Common Knowledge, and Consequentialism

In the nested boxes of Fig. 3.4.1.1 about propositions 53 and 54 from the Newcastle episode, we see that there is some common belief which is assumed to be shared at the very least between members of category *barrister* (thus, including Rich, the defence barrister from the trial in Newcastle whose dog ate the evidence) and members of category *judiciary* (thus, including *judge1*). The notion of common knowledge plays a significant role both in artificial intelligence models of agents' beliefs, and in game theory. Mokherjee and Sopher (1994) is a paper on real players' belief learning behaviour in economic games (ibid., pp. 62–63):

The assumption of Nash equilibrium plays a central role in modern noncooperative game theory. This theory is usually based on the notion that players have "common knowledge" regarding the payoffs and behavior modes of each other (see Aumann (1987) and Brandenburger and Dekel (1987)). It is commonly acknowledged that the assumption of common knowledge is a demanding one, and that a satisfactory theory should also describe the process by which players arrive at their beliefs (see, e.g., Binmore (1985)). Moreover, it is unlikely that most real players rely entirely on a cognitive process of thinking in order to arrive at their beliefs, rather than past experience at playing the same or related games.

In the nested beliefs related to propositions 53 and 54 from the Newcastle episode, the approach may be too "neat", too idealised, in that it appears to assume that players are *consequentialist* in how they behave. Baron (1994) investigates nonsequentialist decisions, from a psychological viewpoint, with examples about convenience and examples in ethics:

According to a simple form of consequentialism, we should base decisions on our judgements about their consequences for achieving our goals. [...] Yet some people knowingly follow decision rules that violate consequentialism. For example, they prefer harmful omissions to less harmful acts, they favor the status quo over alternatives they would otherwise judge to be better, they provide third-party compensation on the basis of the cause of an injury rather than the benefit from the compensation, [...]. I suggest than nonconsequentialist principles arise from overgeneralizing rules that are consistent with consequentialism in a limited set of cases. Commitment to such rules is detached from their original purposes (ibid., p. 1). Pietroski (1994) criticises Baron: "Because the many senses of 'should' are (somehow) related, it is easy to vacillate between different normative claims. I think Baron has done this, leaving his model without any clear function". The sense of the 'should' in a given normative claim may be instrumental, i.e. to fulfil a (possibly implicit) desire of the agent, but desires may conflict. To Pietroski, a "pragmatic" sense of 'should' is that "agents should make those decisions that, all things considered, they think will satisfy their desires on the whole. Agents typically do what they should in this sense". The attractions of Baron's "model may result from the slogan, 'Decisions should maximize the good'. However, what about moral readings?". Baron's model as a moral thesis is amenable to utilitarianism.<sup>6</sup> Pietroski claims "there is a 'should' of idealization."

An example is the ideal gas law, valid if one chooses to ignore certain facts. A reading of Baron is possible in view of this, Pietroski maintains, and proceeds to criticise it. "Finally, it is of practical importance that some decisions should be made in the idealization, but not pragmatic sense (or vice versa). But the only other sense of 'should' relevant to public policy that I can think of is *moral*. And again, we do not want Baron's consequentialism for our moral theory".

#### 3.4.4 Commitment vs. Belief: Walton's Approach

#### 3.4.4.1 The Problem of Recognising Belief, Based on Commitment

Writing for the benefit of legal scholars in the journal *International Commentary on Evidence*, Douglas Walton and Fabrizio Macagno (2005) claimed that

tools of argument analysis currently being developed in artificial intelligence can be applied to legal judgments about evidence based on common knowledge. Chains of reasoning containing generalizations and implicit premises that express common knowledge are modeled using argument diagrams and argumentation schemes.

Moreover, they argued for what they conceded is a controversial thesis (ibid.): "It is the thesis that such premises can best be seen as commitments accepted by parties to a dispute, and thus tentatively accepted, subject to default should new evidence come in that would overturn them". According to that approach, also common knowledge

<sup>&</sup>lt;sup>6</sup> Cf. in criminology: "The rational choice perspective (Clarke & Felson, 1993) states that committing a crime is a conscious process by the offender to fulfil his or her commonplace needs, such as money, sex, and excitement", in the words of Adderley and Musgrove (2003a, p. 184), who applied "data mining techniques, principally the multi-layer perceptron, radial basis function, and self-organising map, to the recognition of burglary offenses committed by a network of offenders" (ibid., p. 179). Moreover: "Routine activity theory (Cohen & Felson, 1979; Felson, 1992; Clarke & Felson, 1993) requires that there be a minimum of three elements for a crime to occur: a likely offender, a suitable target, and the absence of a suitable guardian. Offenders do not offend twentyfour hours a day committing crime. They have recognizable lives and activities, for example, go to work, support a football team, and regularly drink in a public house. They have an awareness space in which they feel comfortable, which revolves around where they live, work, socialize and the travel infrastructure that connects those places" (Adderley & Musgrove, 2003a, p. 183).

is commitment, rather than knowledge: "Common knowledge, on this view, is not knowledge, strictly speaking, but a kind of provisional acceptance of a proposition based on its not being disputed, and its being generally accepted as true, but subject to exceptions" (ibid.).

Walton (2010) saw the need to overcome a problem in artificial intelligence concerning beliefs, and proposed a model such that (ibid., p. 23):

a belief is defined as a proposition held by an agent that (1) is not easily changed (stable), (2) is a matter of degree (held more or less weakly or strongly), (3) guides the goals and actions of the agent, and (4) is habitually or tenaciously held in a manner that indicates a strong commitment to defend it. It is argued that the new model overcomes the pervasive conflict in artificial intelligence between the belief-desire-intention model of reasoning and the commitment model.

Walton's model "uses argumentation schemes for practical reasoning and abductive reasoning. A belief is characterised as a stable proposition that is derived abductively by one agent in a dialogue from the commitment set (including commitments derived from actions and goals) of another agent" (ibid.). Walton's "paper offers a definition of the notion of belief and a method for determining whether a proposition is a belief of an agent or not, based on evidence. The method is based on a formal dialogue system for argumentation that enables inferences to be drawn from commitments to beliefs using argumentation schemes" (ibid.). Walton claimed (ibid.):

The approach offers a middle ground between the two leading artificial intelligence models that have been developed for programming intelligent agents. According to the commitment model, a commitment is a proposition that an agent has gone on record as accepting (Hamblin, 1970, 1971). In the belief-desire-intention (BDI) model (Bratman, 1987), intention and desire are viewed as the pro-attitudes that drive goal-directed reasoning forward to a proposal to take action. The BDI model is based on the concept of an agent that carries out practical reasoning based on goals that represent its intentions and incoming perceptions that update its set of beliefs as it moves along (Wooldridge, 2002).

Walton explained why distinguishing between commitment and belief is important, by making the example of lying in court (ibid., p. 31):

The third reason [why do we need a notion of belief, as opposed to commitment] has to do with negative concepts like insincerity, self-deception and lying, all of which appear to require some notion of belief. For example, the speech act of telling a lie could be defined as putting forward a statement as true when one believes (or even knows) that it is false. These concepts are fundamentally important not only in ethics, but also important in law in the process of examination in trials (including cross-examination), as well as in witness testimony and the crime of perjury. It is one thing to commit yourself in a dialogue to a proposition that you are not really committed to, as judged by your prior commitments in the dialogue. There might be many reasons to explain such an inconsistency of commitments. Perhaps you just forgot, or you can somehow explain the inconsistency. Maybe you just changed your mind, as some new evidence came into the dialogue. But lying is a different thing. To lie, you have to really believe that the statement you made is false. In short, negative notions of a significant kind, like lying, self-deception, and so forth, cannot be fully understood only through applying the notion of commitment, but also require reference to belief. Lying is also closely related to notions like lying by omission, equivocation,

deception, and using ambiguity in argumentation, and these notions are in turn related to the study of informal fallacies.

Walton remarked (ibid., p. 29):

Commitments, on Hamblin's view [(Hamblin, 1970)], are public and social. If you make an assertion of a statement *A* in a way that indicates you are committed to it, and there is a public record of your speech act of asserting *A* in this manner, then that is evidence you are committed to *A*. For example, if you confess to a murder under police questioning, and the interview was videotaped, then the videotape provides evidence that you are committed to the statement that you murdered the victim. In law, the videotape itself is called evidence, and when it is shown in court, it provides evidence for the accusation that you are guilty of the crime as alleged. Thus, once you have committed yourself to a statement, say by asserting it in public so that your assertion can be recorded or be put 'on record', then that is evidence of your commitment to it. Thus, commitment is inherently a social notion that has to do with public dialogues in which two parties or more engage in public conversations. Commitment is basically public. Your commitments are inferred from what you have gone on record as saying in some context of dialogue.

Belief, although it can sometimes be public, as when we talk about commonly held beliefs, is a more private matter. If belief is an internal psychological matter of what an individual really thinks is true or false, the privacy of belief makes it more difficult to judge what an individual believes. People often lie or conceal their real beliefs. And there is good reason to think that people often do not know what their own beliefs are. If Freud was right, we also have unconscious beliefs that may be quite different from what we profess to be our beliefs. Belief is deeply internal and psychological, and public commitment to a proposition is not necessarily an indication of belief. But perhaps there is a way to infer belief from commitment.

# 3.4.4.2 Walton's Argument Schemes and Critical Questions for Argument from Commitment

In their book *Argument Schemes*, Walton, Reed, and Macagno (2008, p. 335) presented two types of an argument scheme called *argument from commitment*. The simpler type is as follows:

*Commitment evidence premise*: In this case, it was shown that *a* is committed to proposition *A*, according to the evidence of what he said or did.

*Linkage of commitments premise*: Generally when an arguer is committed to *A*, it can be inferred that he is also committed to *B*.

Conclusion: In this case, a is committed to B.

This first version of the argument-from-commitment scheme is associated with the following critical question:

 $CQ_1$ : What evidence in the case supports the claim that *a* is committed to *A*, and does it include contrary evidence, indicating that *a* might not be committed to *A*?

The second type of the argument scheme is in the context of a dialogue:

*Major premise*: If arguer *a* has committed herself to proposition *A*, at some point in a dialogue, then it may be inferred that she is also committed to proposition *B*, should the question of whether *B* is true become an issue later in the dialogue.

*Minor premise*: Arguer a has committed herself to proposition A at some point in a dialogue.

*Conclusion*: At some later point in the dialogue, where the issue of B arises, arguer a may be said to be committed to proposition B.

This second type of the argument-from-commitment scheme is associated with this other critical question:

 $CQ_2$ : Is there room for questioning whether there is an exception in this case to the general rule that commitment to *A* implies commitment to *B*?

#### 3.4.4.3 Walton's Argument Scheme and Critical Questions for Telling Out Belief Based on Commitment

Walton conceded (2010, p. 30):

The problem is how the bridge between commitment and belief can be crossed. That is, how can one draw a rational inference from a person's commitment to a statement to the conclusion that he believes that this statement is true? The inference is surely a hazardous one in many instances. A participant in a discussion will often make or incur commitment to some proposition for the sake of argument without really believing that proposition, or even being in a position to know for sure whether it is true or not. However, an argument from commitment is a defeasible argumentation scheme, and this aspect of it might be quite favourable for using it to argue from commitment to belief.

Questioning is a manner to find about about belief from commitment (ibid., p. 37):

Suppose that you believe a particular proposition A, and A is not in your commitment set, nor is there any subset of propositions within your commitment set that logically implies A. Still, it may be the case that you believe that proposition A is true. What then is the link between your commitment set and your belief that proposition A is true? The link is that I can engage in an examination dialogue with you about proposition A, and about other factual propositions related to A, and judge from the commitments I can extract from you in this dialogue whether you believe proposition A or not. I can even ask you directly whether you believe A or not. Even if you claim not to believe A, I can ask you whether other propositions you have shown yourself to be committed to in the dialogue imply belief in A. So we can say that although there is no link of deductive logical implication between belief and explicit commitment, there can be defeasible links between sets of one's commitments, both implicit and explicit.

Walton added, concerning examination dialogues (ibid., pp. 39-40):

Examination dialogue is a type of dialogue that has two goals (Walton, 2006[a]). One is to extract information to provide a body of data that can be used for argumentation in an embedded dialogue, like a persuasion dialogue for example. Examination dialogue can be classified as a species of information-seeking dialogue, and the primary goal is the extraction of information. However, there is also a secondary goal of testing the reliability of the information. Both goals are carried out by asking the respondent questions and then testing the reliability of the answers extracted from him. The formal analysis of the structure of the examination dialogue. In their model, the proponent wins if she justifies her claim that she has found an inconsistency in the previous replies of the respondent. Otherwise the respondent wins. To implement this testing function, the information initially elicited is compared with other statements or commitments of the respondent, other known facts of the case, and known

past actions of the respondent. This process of testing sometimes takes the form of attempts by the questioner to trap the respondent in an inconsistency, or even in using such a contradiction to attack the respondent's ethical character. Such a character attack used in the cross-examination of a respondent can often be used as an ad hominem argument,<sup>7</sup> where for example, the testimony of a witness is impeached by arguing that he has lied in the past, and that therefore what he says now is not reliable as evidence.

Concluding his paper, Walton (2010, p. 43) proposed this "basic defeasible argumentation scheme for an argument from commitment to belief in":

*Premise 1: a* is committed to *A* in a dialogue *D* based on an explanation of *a*'s commitments in *D* in the dialogue.

Premise 2: a's commitment to A is not easily retracted under critical questioning in D.

*Premise 3*: *a*'s commitment to *A* is used as a premise in *a*'s practical reasoning and argumentation in *D*.

Conclusion: Therefore a believes A (more strongly or weakly).

where included in *a*'s commitments are *a*'s goals, actions and professed beliefs. Walton conceded (ibid.) that:

This scheme is built on the assumption that there is some way of ordering the comparative weakness or strength of the propositions in an agent's set of beliefs, representing how firmly the agent is committed to that belief. Such firmness is indicated by how easily the proposition is given up under critical questioning by the other party in the dialogue, and by how prominently it is used as a premise in *a*'s argumentation.

Walton (ibid.) associated the scheme we have quoted above, with the following critical questions:

 $CQ_1$ : What evidence can *a* give that supports his belief that *A* is true?

CQ<sub>2</sub>: Is A consistent with a's other commitments in the dialogue?

CQ3: How easily is a's commitment to A retracted under critical questioning?

CQ<sub>4</sub>: Can *a* give evidence to support *A* when asked for it?

 $CQ_5$ : Is there some alternative explanation of *a*'s commitments?

Moreover, Walton (ibid.) also proposed this "comparative scheme for argument from commitment to belief with the conclusion that a believes A more strongly than B":

*Premise 1: a* is committed to *A* more strongly than *B* in a dialogue *D* based on *a*'s explicit or implicit commitments in *D* in the sequence of dialogue.

- *Premise 2: a*'s commitment to *A* is less easily retracted under critical questioning in *D* than *a*'s commitment to *B*.
- *Premise 3*: *a*'s commitment to *A* is used as a premise in *a*'s practical reasoning and argumentation in *D* more often and centrally than *a*'s commitment to *B*.

Conclusion: Therefore a believes A more strongly than B.

This scheme in turn was associated with the following critical questions (ibid., p. 44):

 $<sup>^{7}</sup>$  Ad hominem arguments, i.e., such arguments that attack the person claiming the truth of a proposition in order to attack that proposition, are the subject of Walton (1998b).

 $CQ_1$ : How stable is *a*'s commitment to *A* over *B* during the course of *D*?

CQ<sub>2</sub>: Is there evidence from the alternative explanations available so far in D suggesting that a does not believe A more strongly than B?

CQ<sub>3</sub>: How easily is *a*'s tenacity of commitment to *A* rather than to *B* retracted under critical questioning?

CQ4: Can a give stronger evidence to support A when asked for it, rather than to the evidence he gives to support B when asked for it?

Examinations may involve evasiveness. By pretending to cooperate, a person being interrogated may hide evasive action, something that has been researched in scholarship about argumentation (Galasinski, 1996). "A speaker resorting to covert evasion can be seen as trying to make her/his interlocutor believe that her/his utterance is cooperative and does answer the question posed. Covert evasion therefore is necessarily deceptive on a metadiscursive level. Thus it is a violation of what has been called by Grice [in Grice (1975, 1981)] a Cooperative Principle in general and its maxim of relation in particular" (Galasinski, 1996, p. 376). The design of the protocol of interrogation needs be skillful enough to reflect the examiner's taking notice of, say, covert evasiveness on the part of the person interrogated.

### 3.4.4.4 Another Approach to Critical Questions

Bex, Bench-Capon, and Atkinson's paper (2009) 'Did he jump or was he pushed? Abductive practical reasoning' adopts (ibid., p. 83) Atkinson and Bench-Capon's (2007) formal model underlying the generation of arguments and critical questions, a model itself based upon Wooldridge and van der Hoek's (2005) *Action-based Alternating Transition System (AATS)*. As explained in Bex, Bench-Capon, and Atkinson. (2009, p. 83):

Essentially, an AATS consists of a set of states and transitions between them, with the transitions labelled with *joint actions*, that is, actions comprising an action of each of the agents concerned. To represent the fact that the outcome of actions is sometimes uncertain, in the scenario we use in this paper we will add a third "gent" which will determine whether the actions had the desired or the undesired effect. The transitions will be labeled with motivations, corresponding to the values of Bench-Capon (2003b), encouraging or discouraging movement from one state to the next. [...] We use a transition system which is a simplified version of the AATS used in Atkinson and Bench-Capon (2007) to ground the practical reasoning argumentation scheme, but this will still allow us to hypothesise the reasoning concerning the events that may have taken place.

A story is a chain of arcs inside the graph (Bex et al., 2009, p. 83):

Given an AATS and a number of arguments generated from the AATS, a story (a sequence of events) is a path through the AATS. An argument explains why that path was followed, and so gives coherence and hence plausibility to the story. For example, 'John wrote a paper, John went to Florence' is a story, but it has more coherence expressed as 'John went to Florence because he had to present the paper he had written.'

The story Bex et al. (2009) used throughout their paper is as follows (ibid., p. 83):

Picture two people on a bridge. The bridge is not a safe place: the footpath is narrow, the safety barriers are low, there is a long drop into a river, and a tramline with frequent traffic

passing quite close to the footpath. One of the persons, call him Ishmael, is standing still, whereas the other, Ahab, is running. As Ahab reaches Ishmael, Ishmael falls into the river. Did he jump or was he pushed? To answer this we will need a story explaining either why Ahab chose to push Ishmael, or why Ishmael chose to jump to his doom. If Ahab is on trial, the story we believe will be crucial: if Ahab intended Ishmael's death it will be murder, if there is a less damning explanation for the push it may be manslaughter, and if Ishmael jumped, Ahab is completely innocent. We illustrate the critical questions by reference to this example scenario.

Given that here "'explanation' stands for 'the performance of joint action A in previous circumstances R'" (ibid., p. 84), by which "we mean physical explanation, how performing an action in R caused the new state of affairs S, as opposed to a mental explanation, what motivated an agent to do a particular action", *critical questions for choice of explanation* that Bex et al. (2009) enumerate are the following (ibid., p. 84):

CQ1 "Are there alternative ways of explaining the current circumstances S?", subdivided into (a) "Could the preceding state R have been different?", and (b) "Could the action B have been different?"

CQ2 "Assuming the explanation, is there something which takes away the motivation?"

CQ3 "Assuming the explanation, is there another motivation which is a deterrent for doing the action?"

CQ4 "Can the current explanation be induced by some other motivation?"

CQ5 "Assuming the previous circumstances R, was one of the participants in the joint action trying to reach a different state?"

For example, the answer they provide (ibid.) for CQ5 is as follows:

Answer: in R, even though one agent performed his part of A with motivation M, the joint action was actually A' which led to S', where  $A' \neq A$  and  $S' \neq S$ 'Ahab wanted to push Ishmael out of the way of the tram to get him out of danger, but

nature did not cooperate (and Ishmael fell off the bridge)'

Next, Bex et al. (2009) enumerated (ibid., p. 85) *critical questions for problem formulation*, for example: "Assuming the previous circumstances, would the action have any consequences?" The argument scheme and all those critical questions were then expressed formally, by adopting a notation in terms of an AATS (ibid., section 3.2). A state transition diagram was drawn (ibid., p. 90) for the scenario explaining the circumstances of the Ahab and Ishmael narrative. Then, by adopting Bench-Capon's (2003) *Value-based Argumentation Framework (VAF)*, a diagram was drawn (Bex et al., 2009, p. 92) showing arguments, objections and rebuttals. Different orderings of values result in a number of competing explanations. The most preferred value is important for providing an ordering of the motivations of Ahab and Ishmael. Alternatives for Ahab's motivation are: murder, arguable manslaughter, he did not push, or mercy killing. Alternatives for Ishmael's motivation are: suicide, sacrifice to let Ahab pass, or he did not jump (ibid., pp. 92–93). Bex et al. (2009, p. 94) acknowledged that the most relevant related work is Walton and Schafer (2006).

#### **3.5 Arguments in PERSUADER**

Negotiation involves discretionary decision making. PERSUADER has been a classical example of a computer tool supporting human negotiation. Some tools for negotiation belong in AI & Law, and have proven useful for avoiding litigation in court: this is the case of *Split Up*, a tool developed in Australia in order to help divorcing couples; it makes use of an argument-based knowledge-representation in order to meet the expectations of both spouses, so that they be spared the expenses of litigation (Zeleznikow & Stranieri, 1998).

Some of the research into computational models of argumentation has been concerned with persuasion arguments, i.e., such arguments that the parties put forth in an attempt to convince each other. Prakken (2006) provided an overview of formal systems for persuasion dialogue. Gilbert, Grasso, Groarke, Gurr, and Gerlofs (2003) described a *Persuasion Machine*. Persuasive political argument is modelled in Atkinson, Bench-Capon, and McBurney (2005c). For a treatment of AI modelling of persuasion in court, see Bench-Capon (2003a, 2003b). Also see Bench-Capon (2002) and Greenwood, Bench-Capon, and McBurney (2003).

One possibility – in the words of Bex et al. (2009, p. 92) – is to

form the arguments into a Value-based Argumentation Framework (VAF), introduced in Bench-Capon (2003b). A VAF is an extension of the argumentation frameworks (AFs) of Dung (1995). In an AF an argument is admissible with respect to a set of arguments S if all of its attackers are attacked by some argument in S, and no argument in S attacks an argument in S.

In contrast (ibid.):

In a VAF an argument succeeds in defeating an argument it attacks only if its value is ranked as high as, or higher than, the value of the argument attacked. In VAFs audiences are characterised by their ordering of the values.<sup>8</sup> Arguments in a VAF are admissible<sup>9</sup> with respect to an audience A and a set of arguments S if they are admissible with respect to S in the AF which results from removing all the attacks which do not succeed with respect to the ordering on values associated with audience A. A maximal admissible set of a VAF is known as a Preferred Extension (PE).

Katia Sycara's PERSUADER is a computer system for argumentation-based negotiation (Sycara, 1989a, 1989b, 1990, 1992; Lewis & Sycara, 1993). Its application is to labour negotiation. As being a multi-agent system, it involved three agents: a trade union negotiating on behalf of its workers, a company, and a mediator. These try to reach an agreement. There is an iterated cycle of exchanging proposals and counter-proposals. The issues of the negotiation in the PERSUADER project were various, including wages, pensions, seniority, and subcontracting.

For each agent, its beliefs were represented in PERSUADER, and these beliefs were about that agent's goals, and the interrelationships among those goals. For a

<sup>&</sup>lt;sup>8</sup> For *audiences* in *argumentation frameworks*, see Bench-Capon, Doutre, and Dunne (2007).

<sup>&</sup>lt;sup>9</sup> The acceptability of arguments is the subject of Dung (1995), the paper that introduced argumentation frameworks.

particular position, generally PERSUADER could generate more than one possible argument. The weaker type of argument was presented first, and then arguments were presented by increasing strength (Sycara, 1989b, p. 131), in the following order:

- 1. appeal to universal principle;
- 2. appeal to a theme;
- 3. appeal to authority;
- 4. appeal to "status quo",
- 5. appeal to "minor standards";
- 6. appeal to "prevailing practice";
- 7. appeal to precedents as counter-examples,
- 8. threaten.

Given goals of an agent were ranked by means of an integer value quantifying their respective strengths. For example,

Importance of wage-goal1 is 6 for union1

Starting from this statement, PERSUADER would, in order to generate arguments, search the goal-graph of the opposing agent (the company), and (according to Sycara, 1989b, p. 131) find out that:

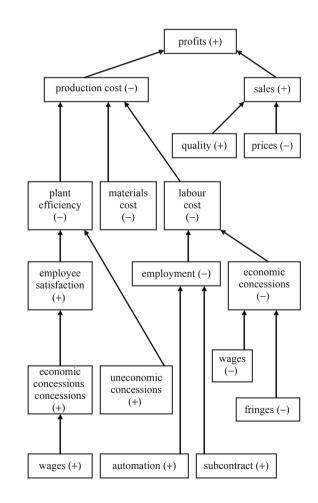
Increase in wage-goal1 by company1 will result in increase in economic-concessions, labour-cost1, production-cost1 Increase in wage-goal1 by company1 will result in decrease in profits1 To compensate, company1 can decrease fringe-benefits1, decrease employment1, increase plant-efficiency1, increase sales1

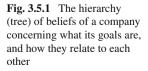
How does such a remedy on the part of the company conflict with the union's goals? PERSUADER would detect right away, based on the union's goal-graph, that:

Only decrease fringe-benefits1, decrease employment1 violate goals of union1 Importance of fringe-benefits1 is 4 for union1 Importance of employment1 is 8 for union1 Since importance of employment1 > importance of wage-goal1 One possible argument found The argument generated (Sycara, 1989b), made to the trade union after this has refused a proposed wage increase, is that:

If the company is forced to grant higher wage increases, then it will decrease employment.

In fact, the company could remedy by reducing employment, because it has the option to resort to subcontracting, or to increase automation. The graph shown in Fig. 3.5.1 represents the beliefs of a company, whose overarching goal is to maximise its profits. In order to increase profits, the company believes that it should decrease production costs or increase sales. In order to increase sales, the company should set for itself the subgoals of increasing quality or decreasing prices. In order to decrease production cost, the company should set for itself the subgoals of increasing plant efficiency, decreasing materials cost, or decreasing labour cost. In order to achieve a decrease in labour cost, the company could decrease employment





(by increasing automation or subcontracting), or then it should obtain economic concessions from their workforce, by decreasing wages or by decreasing fringe benefits. An increase in employee satisfaction would be beneficial for increasing plant efficiency. Employee satisfaction would increase if uneconomic concessions are made, or then if economic concessions are made by increasing wages.

A possible criticism that could be levelled at such workings of PERSUADER is that it makes the respective positions of the parties too rigid. Human negotiators often possess more knowledge of the specifics or of contingencies than in a general goal-hierarchy,<sup>10</sup> as well as knowledge that either parties or both may be reluctant to make explicit, except when it is convenient. This is why human negotiators may find some leeway when requesting or making concessions.

A logical representation was adopted by Kraus, Sycara, and Evenchik (1998), in order to model ideas about negotiation that were present in PERSUADER. My former colleague Sarit Kraus authored a related book (2001), *Strategic Negotiation in Multiagent Environments*.

#### 3.6 Representing Arguments in Carneades

## 3.6.1 Carneades vs. Toulmin

In Toulmin's model, as seen in Fig. 3.2.1.1, an argument consists of a single premise ("Datum" or "Data"), of the Claim (which is the conclusion), of a Qualifier which states the probative value of the inference (e.g., *necessarily*, or *presumably*), of the Warrant – which is a kind of rule which supports the inference from the premise to the conclusion of the argument – and of the Backing (an additional piece of data, which provides support for the warrant), as well as of a Rebuttal (which is an exception).

<sup>&</sup>lt;sup>10</sup> The goal-trees (goal hierarchies) of both parties in PERSUADER are somewhat reminiscent of the goal-trees in Jaime Carbonell's POLITICS. Realising the hierarchy of goals, or their relative importance, is essential, as shown by Jaime Carbonell (1978, 1979, 1981) in his POLITICS system. Carbonell related about a bug which earlier on in his project had caused the programme – when reasoning about the perception of the imminent threat of the Soviet Union invading Czechoslovakia (in 1968) requiring the American president to intervene at a time when the relations between the U.S. and the Soviet Union had recently soured (because of allegations about spying) so that the influence of the President on Brezhnev could be expected to be less effective concerning the Czechoslovak crisis – to wrongly infer that the President of the United States should congratulate Brezhnev, as this is what people are supposed to do when they need to improve their relations. The achievement of a lesser goal was being suggested, with a plan that would harm a more important goal. This problem was fixed. Other AI tools known from the research literature have been reasoning about international politics. ABDUL/ILANA was an AI programme that used to simulate the generation of adversary arguments on an international conflict (Flowers, McGuire, & Birnbaum 1982); such arguments are intended to persuade a third party, but not one's opponents.

Gordon and Walton (2006)<sup>11</sup> described a formal model, implemented in *Carneades*, using a functional programming language and Semantic Web technologies. In the model underlying this tool, instead of Toulmin's single datum there generally is a set of premises. A Rebuttal is modelled using a contrary argument. The Qualifier, which in Toulmin's approach indicates the probative weight of the argument, in *Carneades* is handled by means of a degree, out of a set of proof standards (see below). *Carneades* treats Warrant and Backing differently from Toulmin. In fact, *Carneades* does not directly allow arguments about other arguments, and the conclusion of an argument must be a statement. Therefore, with *Carneades* the equivalent of Toulmin's Warrant is to add a presumption for the warrant to the premises of an argument. "Backing, in turn, can be modelled as a premise of an argument supporting the warrant" (ibid.).

## 3.6.2 Proof Standards in Carneades

Let us consider in particular the standards of proof<sup>12</sup> as represented in *Carneades*. Gordon and Walton (2006) define four proof standards,<sup>13</sup> for *Carneades*. "If a statement satisfies a proof standard, it will also satisfy all weaker proof standards".

- 1. The weakest is SE (scintilla of evidence): "A statement meets this standard iff it is supported by at least one defensible pro argument".
- 2. The second weakest is PE (preponderance of the evidence): "A statement meets this standard iff its strongest defensible pro argument outweighs its strongest defensible con argument".
- 3. A stronger standard is DV: "A statement meets this standard iff it is supported by at least one defensible pro argument and none of its con arguments is defensible".
- 4. The strongest is BRD (beyond reasonable doubt: not necessarily in its legal meaning): "A statement meets this standard iff it is supported by at least one defensible pro argument, all of its pro arguments are defensible and none of its con arguments are defensible".

## 3.6.3 The Notation of Carneades

In Gordon and Walton's (2006) notation for argument graphs, a circle node is an argument, a box is a statement. The labels for the argument or the statement are inside the circle node or the box node. Arguments have boxes on both sides in the

<sup>&</sup>lt;sup>11</sup> The *Carneades* model is also the subject is the subject of both Gordon and Walton (2006), and Gordon, Prakken, and Walton (2007).

<sup>&</sup>lt;sup>12</sup> Cf. Bex and Walton's (2006) 'Burdens and Standards of Proof for Inference to the Best Explanation'. Also see Atkinson and Bench-Capon (2007).

<sup>&</sup>lt;sup>13</sup> Cf. Freeman (1994), and see Section 3.11.4.2 below in this book.

path: boxes and circles alternate in the path. Edges in the graph are labelled as follows.

If there is a black filled circle (which means *presumption*) at the end of an edge –• which touches an argument node, this indicates that the statement in the source node (a box) is a presumption, and as such it is a premise of that argument.

If the circle is hollow, instead, then this edge  $-\infty$  stands for an exception, and the exception statement is a premise for the argument. Had the edge an arrow head, then the statement in its source would have been an ordinary premise.

In the formulae which accompany the argument graph within the same approach, each formula is labelled with an argument identifier, and each formula has a lefthand side (the set of premises), a right-hand side (a statement identifier, this being the conclusion), and an arrow from the left-hand side to the right-hand side.

The arrow indicates this is a pro argument, but if its head is not an arrow head but rather a hollow circle, then this is a con (contrary) argument.

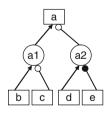
The left-hand side of the rule is a list of premises, separated by commas. The premises may be statement identifiers with no circle prefix (then this is an ordinary premise), or a statement identifier prefixated with a black circle (then this is a presumption), or a statement prefixated with a hollow circle (then this is an exception).

Examples of formulae are shown in Table 3.6.3.1.

Table 3.6.3.1   Examples of				
notation in Carneades	a1.	b, ∘c	—>	а
	a2.	d, ●e	—o	а

These are two out of five formulae which in Gordon and Walton (2006) accompany their Fig. 1, a reduced version of which (representing only the two formulae given above) appears here as Fig. 3.6.3.1.

Fig. 3.6.3.1 A tree-like representation of formulae



#### 3.7 Some Computer Tools that Handle Argumentation

Not all computer tools handle argumentation in the same perspective, or with the same theoretical foundations, or with a similar interface structure or protocol. Take *Convince Me* (Schank & Ranney, 1995), one of the argumentation visualisation tools reviewed in van den Braak, van Oostendorp, Prakken, and Vreeswijk (2006). It is

based on Thagard's Theory of Explanatory Coherence (e.g., Thagard, 1989, 2000a, 2000b, 2004), and the arguments consist of causal networks of nodes (which can display either evidence or hypotheses), and the conclusion which users draw from them. *Convince Me* predicts the user's evaluations of the hypotheses based on the arguments produced, and gives a feedback about the plausibility of the inferences which the users draw.

Some tools envisage collaboration among users. *Reason!Able*, developed by Tim van Gelder (2002),<sup>14</sup> a philosopher from the University of Melbourne, is not designed for collaboration: the intended primary usage is by one user per session. *Reason!Able* guides the user step-by-step through the process of constructing an argument tree,<sup>15</sup> containing claims, reasons, and objections, the latter two kinds being complex objects which can be unfolded to see the premises. *Reason!Able* is intended for single-user instruction and learning of argumentation techniques, for which it is well suited.

Collaborative problem identification and solving is the purpose of IBIS, an Issue-Based Information System. Problems are decomposed into issues. *QuestMap* (Carr, 2003) is based on IBIS, mediates discussions, supports collaborative argumentation, and creates information maps, in the context of legal education.

The convenience of displaying the structure of arguments visually has prompted the development of tools with that task<sup>16</sup>; e.g., Carr (2003) described the use of the already mentioned computer tool, *QuestMap* (Conklin & Begeman, 1988) for visualising arguments, for use in teaching legal argumentation; the paper was published in a volume itself devoted to software tools for visualising argumentation. Reed and Rowe (2001), at the University of Dundee in Scotland, described an argument visualisation system called *Araucaria*.<sup>17</sup> Arguments analysed using this tool can be saved in a format called *AML* (for *Argument Markup Language*), which is an XML language (concerning XML, see Section 6.1.7.2 in the present book). According to Walton et al. (2008, p. 24),

Araucaria is similar to a software tool called Reason!Able [... see above], which has been well tested and is very simple and easy to use. Where Araucaria is aimed at argument analysis, for researchers and undergraduate teaching, Reason!Able is aimed at argument construction, for more introductory teaching earlier in the curriculum. The two thus complement each other.

*Araucaria* is not only a software tool for argument analysis; it makes it possible to found the analysis on argumentation schemes. This was discussed by Walton et al. (2008, pp. 367–415), who showed "how, with an understanding of defeasibility in schemes, various techniques can be used to formally describe argumentation

<sup>&</sup>lt;sup>14</sup> Cf. van Gelder and Rizzo (2001).

<sup>&</sup>lt;sup>15</sup> A *tree* is such a graph, that any two nodes are connected by exactly one path.

<sup>&</sup>lt;sup>16</sup> In 2007, the journal *Law, Probability and Risk* published a special issue (Tillers, 2007) whose title is *Graphic and Visual Representations of Evidence and Inference in Legal Settings.* 

<sup>&</sup>lt;sup>17</sup> Araucaria is available for free at http://www.computing.dundee.ac.uk/staff/creed/araucaria

schemes" (ibid., p. 392). Prakken, Reed, and Walton (2003), a paper on using argumentation schemes for reasoning on legal evidence, is mainly an exploration of applying *Araucaria* to an analysis in the style of Wigmore Charts. That article discussed appropriate argument structures for reasoning about evidence in relation to hypothesising crime scenarios. Bart Verheij (1999, 2003) described the *ArguMed* computer tool for visualising arguments, whereas Loui et al. (1997) proposed a tool called *Room 5. ArguMed* was discussed from a comparative perspective in Walton et al. (2008, pp. 397–399). In particular, they remarked about a peculiar trait (ibid., p. 398):

In ArguMed, undercutting moves, like asking a critical question, are modelled by a concept called entanglement. The question, or other rebuttal, attacks the inferential link between the premises and conclusion of the original argument, and thereby requires the retraction of the original conclusion. On a diagram, entanglement is representated as a line that meets another line at a junction marked by an X.

In his book *Virtual Arguments*, Verheij (2005) discussed the design of software tools being "argument assistants" for lawyers and other arguers. Several tools or approaches to argument visualisation were reported about in a paper collection edited by Kirschner, Buckingham Shum, and Carr (2003).

## **3.8 Four Layers of Legal Arguments**

Lodder (2004) proposed a procedural model of legal argumentation. Prakken and Sartor (2002) usefully "propose that models of legal argument can be described in terms of four layers.

- 1. The first, *logical* layer defines what arguments are, i.e., how pieces of information can be combined to provide basic support for a claim.
- 2. The second, *dialectical* layer focuses on conflicting arguments: it introduces such notions as 'counterargument', 'attack', 'rebuttal' and 'defeat', and it defines, given a set of arguments and evaluation criteria, which arguments prevail.
- 3. The third, *procedural* layer regulates how an actual dispute can be conducted, i.e., how parties can introduce or challenge new information and state new arguments. In other words, this level defines the possible speech acts, and the discourse rules governing them. Thus the procedural layer differs from the first two in one crucial respect. While those layers assume a fixed set of premises, at the procedural layer the set of premises is constructed dynamically, during a debate.
- 4. This also holds for the final layer, the *strategic* or *heuristic* one, which provides rational ways of conducting a dispute within the procedural bounds of the third layer" (Prakken & Sartor, 2002, section 1.2).

## **3.9 A Survey of the Literature on Computational Models of Argumentation**

#### 3.9.1 Within AI & Law

Within AI & Law, models of argumentation are thriving. In the compass of this book we can cite relevant work, but the extent to which we actually delve into their content is limited. Let us start by citing the literature. We shall turn to a short discussion next. A good survey from which to start, is Prakken and Sartor (2002), which discusses the role of logic in computational models of legal argument. "Argumentation is one of the central topics of current research in Artificial Intelligence and Law. It has attracted the attention of both logically inclined and design-oriented researchers. Two common themes prevail. The first is that legal reasoning is defeasible, i.e., an argument that is acceptable in itself can be overturned by counterarguments. The second is that legal reasoning is usually performed in a context of debate and disagreement. Accordingly, such notions are studied as argument moves, attack, dialogue, and burden of proof" (ibid., p. 342).

"The main focus" of major projects in the "design" strand "is defining persuasive argument moves, moves which would be made by 'good' human lawyers. By contrast, much logic-based research on legal argument has focused on defeasible *inference*, inspired by AI research on nonmonotonic reasoning<sup>18</sup> and defeasible argumentation" (ibid., p. 343).

One should not mistakenly believe that models of argument are just either logicist, or pragmatic *ad hoc* treatments which are not probabilistic. There also is an important category, probabilistic models of argument, with which we are not concerned in this chapter. We deal with probabilistic models elsewhere, in this book.

In the literature on computational models of argumentation within AI & Law, the HYPO system, CABARET, and CATO (in chronological order) were prominent during the 1990s.<sup>19</sup> Other important research was conducted by Bench-Capon's team

<sup>&</sup>lt;sup>18</sup> "Traditional mathematical logic is *monotonic*: It begins with a set of axioms, assumed to be true, and infers their consequences. If we add new information to this system, it may cause the set of true statements to increase. Adding knowledge will never make the set of true statements decrease. This monotonic property leads to problems when we attempt to model reasoning based on beliefs and assumptions. In reasoning with uncertainty, humans draw conclusions based on their current set of beliefs and assumptions. In reasoning with uncertainty, humans draw conclusions based on their current set of beliefs; however, unlike mathematical axioms, these beliefs, along with their consequences, may change as more information becomes available. *Nonmonotonic reasoning* addresses the problem of changing belief. A nonmonotonic reasoning system handles uncertainty by making the most reasonable assumptions in light of uncertain information. It then proceeds with its reasoning as if these assumptions were true. At a later time, a belief may change, necessitating a reexamination of any conclusions derived from that belief" (Luger & Stubblefield, 1998, p. 269). See, e.g., Antoniou (1997).

<sup>&</sup>lt;sup>19</sup> See Ashley (1991) on the HYPO system (which modelled adversarial reasoning with legal precedents), which was continued in the CABARET project (Rissland & Skalak, 1991), and the CATO project (Aleven & Ashley, 1997).

in Liverpool, and by Prakken and his collaborators. Books include Prakken (1997), Ashley (1991).<sup>20</sup> There also are several paper-collections, stemming from conferences, which are devoted to computational models of argumentation, and of legal argument in particular.<sup>21</sup> The literature is vast.<sup>22</sup>

For a treatment of the generation of intentions through argumentation, see Atkinson, Bench-Capon, and McBurney (2005a); cf. Atkinson, Bench-Capon, and McBurney (2005b). Kowalski and Toni (1996) discuss a logical model of abstract argumentation, in an AI & Law forum. Bondarenko, Dung, Kowalski, and Toni (1997), also stemming from Kowalski's team at Imperial College, London, approached default reasoning by means of an abstract argumentation-theoretic framework. Toni and Kowalski (1996) apply an argumentation-theoretic approach to the transformation of logic programs. The starting point of Cayrol and Lagasquie-Schiex (2006) is bipolar argumentation frameworks, i.e., such frameworks that the interaction between arguments can be not only attack, but also, explicitly support; they go on to propose a framework "where conflicts occur between sets of arguments, characterised as coalitions of supporting arguments".

In logic-based research, "the focus was first on reasoning with rules and exceptions and with conflicting rules. After a while, some turned their attention to logical accounts of case-based reasoning [...]. Another shift in focus occurred after it was realised that legal reasoning is bound not only by the rules of logic but also by those of fair and effective procedure. Accordingly, logical models of legal argument have been augmented with a dynamic component, capturing that the information with which a case is decided is not somehow 'there' to be applied, but is constructed dynamically, in the course of a legal procedure" (Prakken & Sartor, 2002, p. 343).<sup>23</sup>

 $<sup>^{20}</sup>$  See now the book by Besnard and Hunter (2008), as well as several books by Walton (1996a, 1996b, 1998a, 2002, 2004), Walton, Reed, and Macagno (2008).

<sup>&</sup>lt;sup>21</sup> Paper collections include, e.g., Dunne and Bench-Capon (2005), Reed and Norman (2003), Prakken and Sartor (1996b), Grasso, Reed, and Carenini (2004), Carenini, Grasso, and Reed (2002).

<sup>&</sup>lt;sup>22</sup> See as well, e.g., Dix, Parsons, Prakken, and Simari (2009), Prakken (2008a, 2008b, 2005, 2004, 2000), Bex and Prakken (2004), Bex, Prakken, Reed, and Walton (2003), Bex, et al. (2007), Bex, van Koppen, and Prakken (2010), Prakken, Reed, and Walton (2004), Bench-Capon (1997), Bench-Capon, Coenen, and Leng (2000), Vreeswijk and Prakken (2000), Amgoud, Caminada, Cayrol, Doutre, and Lagasquie-Schiex et al. (2004), McBurney and Prakken (2004), Caminada, Doutre, Modgil, Prakken, and Vreeswijk (2004), Bench-Capon, Freeman, Hohmann, and Prakken (2003), as well as Allen, Bench-Capon, and Staniford (2000), Loui and Norman (1995), Sartor (1994), Prakken and Sartor (1995a, 1995b, 1996a, 1998), Freeman and Farley (1996), Rissland, Skalak, and Friedman (1996), Skalak and Rissland (1992), Zeleznikow and Stranieri (1998), Stranieri and Zeleznikow (2001b), Hunter, Tyree, and Zeleznikow (1993), Zeleznikow (2002a), Prakken (2002), Prakken and Vreeswijk (2002).

<sup>&</sup>lt;sup>23</sup> For studies of argumentation, also see Verheij (2000, 2002). In particular, refer to Alexy's (1989) A Theory of Legal Argumentation. The approach of Walton (1996a, 1996b, 1998a) eventually evolved into Gordon and Walton (2006), which describes a formal model implemented in *Carneades*. By Douglas Walton, also see e.g. his books Legal Argumentation and Evidence (Walton, 2002), and Abductive Reasoning (Walton, 2004). Bourcier (1995) adopts a semantic approach to argumentation. Van-Eemeren, Grootendorst, and Kruiger (1987) approach

Of course, legal argument is not necessarily about the evidence. Dung, Thang, and Hung (2010), a team based in Thailand, presented an application of AI & Law to the interpretation of contracts. As Grasso, Rahwan, Reed, and Simari (2010, p. 4) summarise Dung et al. (2010):

Interaction between parties needed to interpret a contract can be abstractly perceived as the exchange of arguments in support or against a given interpretation of the contract. Following this view, the main contribution of the work is an argument-based formalism that handles contract dispute resolution where the court will play the role of resolving the ongoing contract dispute by enforcing an interpretation of the contract that could be considered as representing the mutual intention of the involved parties in a fair manner. The formalism is based on modular argumentation, a recently proposed extension of assumption-based argumentation for modelling contract dispute resolution, and the appropriateness of this formalism is demonstrated by applying it to common laws. An example is developed using the system called MoDiSo (MOdular Argumentation for DIspute ReSOlution) that consists of three doctrines here modelled.

## 3.9.2 Within Other Research Communities

Computational modelling has concerned itself with arguments also outside the research community of either AI & Law, or communication in multi-agent systems or the work of scholars who contributed to those domain anyway. This is the case of a philosopher, Ghita Holmström-Hintikka (2001), who has applied to legal investigation, and in particular to *expert witnesses* giving testimony and being interrogated in court, the Interrogative Model for Truth-seeking that had been developed by Jaakko Hintikka for use in the philosophy of science; a previous paper of hers (Holmström-Hintikka, 1995), about expert witnesses, appeared in the journal *Argumentation*.<sup>24</sup> In 2010, Taylor and Francis launched their journal *Argument & Computation*.

This followed several conferences, and well as thematic issues in various journals. Journal special issues about computational models of argumentation include ones published in the journals *Artificial Intelligence* (Bench-Capon & Dunne, 2007); *IEEE Intelligent Systems* (Rahwan & McBurney, 2007); *International Journal of Intelligent Systems* (Reed & Grasso, 2007); *Argumentation*, this one on current use of Toulmin (Hitchcock & Verheij, 2005); *Journal of Autonomous Agents and Multi-Agent Systems*, on argumentation in multi-agent systems (Rahwan, 2005); *Artificial Intelligence and Law* (Bench-Capon & Dunne, 2005); *Journal of Logic* 

argumentation theory from the viewpoint of pragmatics and discourse analysis. The interface of argumentation with pragmatics is relevant also for the handbook entry Van Eemeren, and Grootendorst (1995). Also see Van Eemeren, Grootendorst, and Snoek Henkemans (1996).

<sup>&</sup>lt;sup>24</sup> Distinguish between the examination or cross-examination in court of witnesses, including expert witnesses if any, and the interrogation of suspects on the part of the police. Seidmann and Stein (2000) developed a game-theoretic analysis which appears to show that a suspect's right to silence helps the innocent.

*and Computation* (Brewka, Prakken, & Vreeswijk, 2003); *Informal Logic Journal* (Gilbert, 2002); *Computational Intelligence* (Chaib-Draa & Dignum, 2002).

In the introduction to the inaugural issue of *Argument & Computation*, Grasso et al. (2010, p. 1) remarked:

Over the past decade or so, a new interdisciplinary field has emerged in the ground between, on the one hand, computer science – and artificial intelligence in particular – and, on the other, the area of philosophy concentrating on the language and structure of argument.

There are now hundreds of researchers worldwide who would consider themselves a part of this nascent community. Various terms have been proposed for the area, including "Computational Dialectics," "Argumentation Technology" and "Argument-based Computing," but the term that has stuck is simply *Argument & Computation*. It encompasses several specific strands of research, such as:

- the use of theories of argument, and of dialectic in particular, in the design and implementation of protocols for multi-agent action and communication;
- the application of theories of argument and rhetoric in natural language processing and affective computing;
- the use of argument-based structures for autonomous reasoning in artificial intelligence, and in particular, for defeasible reasoning;
- computer supported collaborative argumentation the implementation of software tools for enabling online argument in domains such as education and e-government.

These strands come together to form the core of a research field that covers parts of artificial intelligence (AI), philosophy, linguistics and cognitive science, but, increasingly, is building an identity of its own.

Models for generating arguments automatically have been developed by computational linguists whose research is mainly concerned with tutorial dialogues (Carenini & Moore, 1999, 2001). ABDUL/ILANA was a tool from the early 1980s, also developed by computational linguists. It was an AI program that used to simulate the generation of adversary arguments on an international conflict (Flowers et al., 1982). In a disputation with adversary arguments, the players do not actually expect to convince each other, and their persuasion goals target observers. Persuasion arguments, instead, have the aim of persuading one's interlocutor, too.<sup>25</sup>

 $<sup>^{25}</sup>$  Of course, there has been much research, in computational models of argumentation (the subject of the present Chapter 3), into adversary argumentation: litigants in the courtroom try to persuade not each other, but the adjudicator. Moreover, they may *prevaricate*, in order to avoid an undesirable outcome. Dunne's (2003) 'Prevarication in Dispute Protocols' resorted to Dung's (1995) *argumentation frameworks* – in which an argument is admissible with respect to a set of arguments S if all of its attackers are attacked by some argument in S, and no argument in S attacks an argument in S – in order to "present various settings in which the use of 'legitimate delay' can be rigorously modeled, formulate some natural decision questions respecting the existence and utility of 'prevaricatory tactics', and, finally, illustrate within a greatly simplified schema, how carefully-chosen devices may greatly increase the length of an apparently 'straightforward' dispute" (Dunne, 2003, p. 12). Lengthening the dispute avoiding it reaching a conclusion is a kind of tactics in noncooperative argumentation. Dunne (2003) was concerned "one aspect of legal argument that appears to

Gilbert et al. (2003) described a *Persuasion Machine*. Persuasive political argument is modelled in Atkinson et al. (2005c). For a treatment of AI modelling of persuasion in court, see e.g. Bench-Capon (2003a, 2003b). Also see Bench-Capon (2002) and Greenwood et al. (2003).<sup>26</sup>

Arguments are also used by a rational agent on his own, when revising his beliefs: see on this Paglieri and Castelfranchi (2005), Harman (1986). Work on argumentation by computer scientists may even have been as simple as a mark-up language for structuring and tagging natural language text according to the line of argumentation it propounds: in 1999, Delannoy (1999) tentatively proposed that his own argumentation mark-up was unprecedented, but he was unaware of a previous proposal which in 1996 was published by Nissan and Shimony in a journal (Nissan & Shimony, 1996) and demonstrated by tagging an article in biology.

Parsons and McBurney (2003) have been concerned with argumentation-based communication between agents in multiagent systems.<sup>27</sup> This is also the context of Paglieri and Castelfranchi (2005), even though the latter is rather concerned with an agent revising his beliefs through contact with the environment. Kibble (2004) uses Brandom's inferential semantics and Habermas' theory of communicative action (which are oriented to social constructs rather than mentalistic notions), "in order to develop a more fine-grained conceptualisation of notions like *commitment* and *challenge* in the context of computational modelling of argumentative dialogue".<sup>28</sup> Commitments are intersubjectively observable (Singh, 1999), whereas "agent design in terms of notions such as *belief* and *intention* faces the software engineering problem that it is not generally possible to identify data structures corresponding to beliefs and intentions in heterogeneous agents [(Wooldridge, 2000)], let alone a 'theory of mind' enabling agents to reason about agents' beliefs" (Kibble, 2004).

have been largely neglected in existing work concerning agent discourse protocols – particularly so in the arenas of persuasion and dispute resolution – the use of legitimate procedural devices to defer 'undesirable' conclusions being finalised and the deployment of such techniques in seeking to have a decision over-ruled. Motivating our study is the contention that individual agents within an 'agent society' could (be programmed to) act in a 'non-cooperative' manner: thus, contesting policies/decisions accepted by other agents in the 'society' in order to improve some national 'individual' utility." (ibid.).

<sup>&</sup>lt;sup>26</sup> Atkinson and Greenwood are the same person.

<sup>&</sup>lt;sup>27</sup> Multiagent systems are the subject of Section 6.1.6 in this book.

 $<sup>^{28}</sup>$  It is not merely an argumentative dialogue, in the courtroom: lawyers are not trying to persuade the other party, or the witness they are cross-examining. Rather, they are trying to persuade the adjudicator. Also consider the notion of *ideal audience* in legal argument, which is the subject of a book by George Christie (2000).

# 3.10 Computational Models of Legal Argumentation About Evidence

## 3.10.1 Some Early and Ongoing Research

David Schum (1993, p. 175) makes the following considerations:

I have often wondered how many of the subtleties in evidence presented at trial are actually recognized by factfinders [i.e., jurors or the judge] and then incorporated in their conclusions. William Twining (1984) goes even farther in wondering how skilful are advocates themselves in recognizing evidentiary subtleties and then in explaining their significance to factfinders. One thing certain is that skilful advocates do not usually offer evidence haphazardly at trial but according to some design or strategy, the objective in such strategies being the presentation of what advocates judge to be the best possible argument on behalf of their clients. [...] That different arguments are possible from the same evidence is one reason why there is to be a trial in the first place.

David Schum is the scholar who first combined computing, evidence, and argumentation. A scholar who is prominent in applying to legal evidence computational, logic-based, theoretically neat models of argumentation is Henry Prakken, who has done so with different co-authors. Prakken has done so at a time when, as well as shortly after, a body of published research started to emerge, of AI techniques for dealing with legal evidence (mainly in connection with mostly separate organisational efforts by Nissan, Tillers, and Zeleznikow). Until Prakken's efforts,<sup>29</sup> the only ones who applied argumentation to computer modelling of legal evidence were Schum (in several publications), and Gulotta and Zappalà (2001): the latter explored two criminal cases by resorting to an extant tool for argumentation, DART, of Freeman and Farley (1996), as well as other tools.

Prakken and Renooij (2001) explored different methods for causal reasoning: section 5 in that paper is about argument-based reconstruction of a given case involving a car accident. The main purpose of Prakken (2004) "is to advocate logical approaches as a worthwhile alternative to approaches rooted in probability theory" (Prakken, 2004), discussing in particular logics for defeasible argumentation. "What about conflicting arguments? When an argument is deductive, the only possible attack is on its premises. However, a defeasible argument can be attacked even if all its premises are accepted": "One way to attack it is to *rebut* it, i.e., to state an argument with an incompatible conclusion. [...] A second way to attack the argument is to *undercut* it, i.e., to argue that in this case the premises do not support its conclusion" (Prakken, 2004, section 3.2).

<sup>&</sup>lt;sup>29</sup> Prakken's relevant papers include: Prakken (2001), Prakken and Renooij (2001), Prakken et al. (2003), Bex et al. (2003), and so forth. His publications are accessible online at www.cs.uu.nl/ people/henry/publications.html from which site they can be downloaded.

Prakken (2001) "investigates the modelling of reasoning about evidence in legal procedure. To this end, a dialogue game model of the relevant parts of Dutch civil procedure is developed with three players: two adversaries and a judge" (ibid., p. 119). "[I]n the current models the judge's role, if modelled at all, is limited to the simple activity of determining the truth of the parties' claims. Yet in actual legal procedure judges have a much more elaborate role. For instance, in Dutch civil procedure judges allocate the burden of proof, determine whether grounds sufficiently support a claim, complete the parties' arguments with legal and common knowledge, decide about admissibility of evidence, and assess the evidence" (ibid., p. 119).

Limitations of the dialogue game in Prakken (2001) listed there include the following (ibid., p. 128):

Firstly, the requirement that each move replies to a preceding move excludes some useful moves, such as lines of questioning in cross-examination of witnesses, with the goal of revealing an inconsistency in witness testimony. Typically, such lines of questioning do not want to reveal what they are aiming at. Secondly, at several points, the present ways to model legal-procedural acts have no clear one-to-one correspondence with the language of legal decisions. For instance, judges often merge their decisions on internal and dialectical strength of an argument: usually they regard the presence of a defeating counterargument as evidence that the argument is not internally valid.

Prakken et al. (2003) developed an analysis of evidence in the style of Wigmore Charts, using the Araucaria software of the University of Dundee in Scotland (Reed & Rowe, 2001, 2004), and argued for the use of argumentation schemes, which capture recurrent patterns of argumentation. Examples of recurrent patterns are to be found, that paper pointed out, in "inferences from witness or expert testimonies, causal arguments, or temporal projections". The criminal case used in Prakken et al. (2003) and Bex, Prakken, Reed, and Walton (2003) by way of an example, is Commonwealth v. Umilian (1901, Supreme Judicial Court of Massachusetts, 177 Mass. 582), and is taken from Wigmore's *Principles* (1931, pp. 62–66). It is a case that also David Schum uses on occasion for illustrating his own methods. Umilian, a farm labourer along with Jedrusik, was accused of murdering the latter, after discovering that Jedrusik was the author of a letter in which he falsely advised a priest that Umilian had a wife and children in the old country, so that Umilian's marriage to a local maid at the farm would not take place. Umilian's wedding was eventually celebrated, but he threatened to take revenge on Jedrusik, who disappeared and whose body was then found. For the period around the murder, Umilian and Jedrusik had been isolated in the area of the barn where the body was eventually found. It is an interesting case, its argumentation being displayed in Wigmore Charts.

Selmer Brigsjord with Shilliday, Taylor, Clark and Khemlani (2006) described *Slate*, a computer tool for supporting reasoning by argumentation, which produces explanations in simplified English. Part of the exemplification is about reasoning

about hypotheses in criminal investigation.<sup>30</sup> It is unclear to me whether *Slate* can be usefully applied to serious crime analysis and intelligence analysis in real-world situations, as the exemplification seen in the given paper was rather like a whodunit puzzle,<sup>31</sup> but reportedly Brigsjord has been working on real case studies in intelligence analysis for the United States' ARDA.<sup>32</sup>

## 3.10.2 Stevie

Susan van den Braak and Gerard Vreeswijk, computer scientists from the University of Utrecht, and Prakken's colleagues, have developed *Stevie* (van den Braak & Vreeswijk, 2006). *Stevie* is a knowledge representation architecture, "based on known argument ontologies and argumentation logics", "to be used as a support tool to analyse criminal cases" "by allowing case analysts to visualize evidence in order to construct coherent stories. It allows them to maintain overview over all information during an investigation, so that different scenarios can be compared. Moreover, they are able to express the reasons why certain evidence supports the scenarios". "*Stevie* is able to represent multiple cases and to support multiple users". Permanent links to external source documents can be set. Other links, to external databases, enable "to retrieve simple factual information such as quotes from witness testimonies and other original source documents".

In the *Stevie* approach, stories are "hypothetical reconstructions of what might have happened". "*Stevie* uses defeasible reasoning [...] to distill stories out of large quantities of information", where "a story is a conflict-free and self-defending collection of claims (I-nodes). A *story* is conflict-free if (and only) if it does not contain a conflicting pair of I-nodes". Moreover, "a story is self-defending if (and only if) every argument (made of of I-nodes and S-nodes) against an element of that story can be countered with an argument made up of I-nodes that belong to that story". Besides, "a third constraint on stories" is "that they must be temporally consistent".

An *I-node* is "an elementary piece of information that is used in modeling cases", and is either a quotation node, or an interpretation node. An *S-node* is a *scheme instance*, where *schemes* are "predefined patterns of reasoning. A single scheme describes an inference, the necessary prerequisties for that inference, and possible critical questions that might undercut the inference".

<sup>&</sup>lt;sup>30</sup> Criminal investigation is the subject of, e.g., Newburn, Williamson, and Wright (2007), Sanders (1977), and Ericson (1981).

<sup>&</sup>lt;sup>31</sup> What is more, when reading that paper I was worried about stereotyping of perpetrators.

<sup>&</sup>lt;sup>32</sup> A document about that particular case study can be found on the Web at http://kryten.mm.rpi. edu/SB-LOGGER\_CASESTUDY.tar.gz whereas a demo of Slate as applied to the Philadelphia bombing can be found at this other address: http://www.cogsci.rpi.edu/research/rair/slate/visitors/ PhiladelphiaBombing.wmv at the website of Rensselaer Polytechnic Institute in Troy, NY.

# 3.11 Argumentation for Dialectical Situations, vs. for Structuring Knowledge Non-dialectically, and an Integration of the Two

#### Andrew Stranieri, John Zeleznikow, and John Yearwood

# 3.11.1 Three Categories of Concepts Grouping Concepts of Argumentation

The present Section 3.11 is based on an article by the same authors, Stranieri, Zeleznikow, and Yearwood (2001). Let us begin by saying something about conceptualisations of argumentation. According to James Freeman (1991), argumentation involves a family of concepts that can be broadly grouped into three categories:

- concepts related to the process of engaging in an argument,
- procedures or rules adopted to regulate the argument process, and
- argument as a product or artefact of an argument process.

The first two categories, process and procedures, are intimately linked to a dialectical situation within a community of social agents. Freeman (1991, p. 20) defines a dialectical situation as

one that involves some opposition among participants to a discourse over some claim, that it involves interactive questioning for critically testing this claim and this process proceeds in a regimented, rule governed manner.

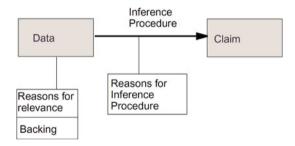
A dialectical situation need not occur between two independent human agents in that monologues can be represented dialectically. For instance, a mathematician engaged in a solo demonstration that a proposition follows from axioms does not overtly engage in a discourse. Nevertheless the reasoning can be seen as a linguistic reconstruction of an imaginary discursive exchange within a community of mathematicians. Argumentation as a product or artefact of an argument process involves viewing the linguistic reconstruction of what the argumentation process and procedure have generated. It involves laying out the premises, claims and layout of claims. For Freeman (1991), the distinction between the three views of argumentation – process, procedure and product – is largely illusory and unnecessarily confusing, particularly for his objective of identifying diagramming techniques for the clear articulation of arguments.

Argumentation concepts have been applied from the 1990s in a variety of knowledge engineering applications, typically without a clear delineation of argumentation as process, procedure or product, according to Freeman's (1991) classification. The central claim advanced in this Section 3.11 (and in Stranieri et al., 2001) is that benefits inherent in the use of argumentation frameworks for information system knowledge engineering can be substantially enhanced if key features of the distinction between argumentation as *process, procedure* and *product* are maintained.

# 3.11.2 From the Toulmin Argument Structure, to the Generic Actual Argument Model

The rise of argumentation research within artificial intelligence, as early as the 1990s, has taken various forms. A variety of logics have been developed to represent argumentation in the context of a dialectical situation such as a dialogue. In contrast to the dialectical approach, argumentation has also been used non-dialectically, in order to provide structure for knowledge. As already seen in this book, the Toulmin Argument Structure (Toulmin, 1958) – see Fig. 3.11.2.1 – has been popular among those computer scientists who have devoted some attention to argumentation: the Toulmin structure has often been adopted to structure knowledge non-dialectically Nevertheless, most studies that apply the Toulmin structure do not use the original structure, but vary one or more components. Variations to the Toulmin structure can be understood as different ways to integrate a *dialectical perspective into one which is essentially non-dialectical*.

In this Section 3.11, the label *dialectical argumentation* is used to describe the modelling of discourse. This is contrasted with non-dialectical argumentation. Drawing the dialectical/non-dialectical distinction enables the specification of a framework, called the *Generic Actual Argument Model (GAAM)*, that is expressly



**Fig. 3.11.2.1** Our version of the Toulmin Argument Structure<sup>33</sup>

<sup>&</sup>lt;sup>33</sup> Figure 3.11.2.1 represents the basic template for the knowledge representation we call a generic argument. A generic argument is an instantiation of the template that models a group of arguments. The generic argument includes: (a) a variable-value representation of the claim with a certainty slot; (b) a variable-value representation of the data items (with certainty slots) as the grounds on which such claims are made; (c) reasons for relevance of the data items; (d) inference procedures that may be used to infer a claim value from data values; (e) reasons for the appropriateness of the inference procedure.

The idea is that the generic argument sets up a template for arguments that allows the representation of the claim and the grounds for the claim. The claim of a generic argument is a predicate with an unspecified value (which can be chosen from a set when an actual argument is being made). Each data item is also a predicate with an unspecified value which can be taken from a specified set of values. The connection between the data variables and the claim variable is called an inference procedure. An inference procedure is a relation between the data space and the claim space.

non-dialectical.<sup>34</sup> The framework enables the development of knowledge-based systems that integrate a variety of inference procedures, combine information retrieval with reasoning and facilitate automated document drafting. Furthermore, the non-dialectical framework provides the foundation for simple dialectical models. Systems based on our approach have been developed in family law, refugee law, determining eligibility for government legal aid, copyright law, and eTourism.

The central theme of the present Section 3.11 is that a distinction between argument as process and procedure, called here *dialectical*, and argument as product, called *non-dialectical*, serves useful purposes for knowledge engineering in that it has motivated the development of a knowledge representation framework that clearly separates the two perspectives. A framework for knowledge engineering that supports the non-dialectical perspective expressively is described. The non-dialectical framework called the *Generic Actual Argument Model* (*GAAM*) directly facilitates the development of hybrid systems, intelligent document drafting, data mining and intelligent information retrieval. Furthermore, the non-dialectical framework provides a knowledge representation base that is the foundation for dialectical models.

The Generic Actual Argument Model (GAAM) is a variant of the layout of arguments advanced by Toulmin (1958). Arguments for non-dialectical purposes are represented at two levels of abstraction; the generic and the actual level. The generic level is sufficiently general so as to represent claims made by all members of a discursive community. All participants use the same generic arguments to construct, by instantiation, their own actual arguments. The generic arguments represent a detailed layout of arguments acceptable to all participants whereas the actual arguments capture a participant's position with respect to each argument. The actual arguments that one participant advances are more easily compared with those advanced by another, in a dialectical exercise because, in both cases, the actual arguments have been derived from a generic template that all participants share.

## 3.11.3 Dialectical vs. Non-Dialectical Argumentation

Recall that we agreed that in this Section 3.11, the label *dialectical argumentation* is used to describe the modelling of discourse. This is contrasted with *non-dialectical argumentation*. Argumentation as *dialectic* (process and procedure) is used in order to model situations that involve discourse within a community of agents. The agents need not be independent human agents engaged in group discussion but may even be a single software agent that has internal processes that involve dialectical exchange. In contrast, non-dialectical argumentation describes the use of argumentation to order, organise or structure knowledge without directly modelling a dialectical exchange.

Until recent decades, argumentation theories have been advanced for philosophical pursuits and not specifically to enhance knowledge engineering. As a

<sup>&</sup>lt;sup>34</sup> The latest treatment this topic received from us is in Yearwood and Stranieri (2006, 2009).

consequence, the distinction between dialectical and non-dialectical use of argumentation concepts is rarely prominent.

For example, Aristotle presented three types of arguments; demonstrations, dialectical deductions and contentious deductions (*Topics*, Book 1, 100a, 27–30). Although each of Aristotle's three types of argument can be seen as arising out of discursive exchanges, there is an implicit emphasis on the dialectical perspective for dialectical deductions because these arguments are made on the basis of premises that are debatable. They typically concern opinions that are adhered to with variable intensity by community members whereas demonstrations are assumed to have more of a ring of universal acceptance. Demonstrations are arguments whose claims are made from premises that are true and primary known, in more modern terminology, as analytic proofs. Contentious deductions are arguments that appear acceptable at first sight but, upon closer inspection, are not.

The analysis of argument advanced by Toulmin (1958) does not distinguish dialectical from non-dialectical argumentation. By illustrating that logic could be seen as a kind of generalised jurisprudence rather than as a science, Toulmin (1958) advanced a structure of argument that captures the layout of arguments. Jurisprudence focuses attention on procedures by which legal claims are advanced and attacked and, in a similar way, Toulmin sought to identify procedures by which any claim, in general, is advanced. He identified a layout of arguments that was constant regardless of the content of the argument.

As already seen earlier in Section 3.2 in this book, Toulmin (1958) concluded that most arguments, regardless of the domain, have a structure which consists of six basic invariants:

- claim,
- data,
- modality,
- rebuttal,
- warrant, and
- backing.

Every argument makes a claim based on some data. Let us consider an example. The argument in Fig. 3.11.3.1 is drawn from reasoning regarding refugee status according to the 1951 United Nations Convention relating to the Status of Refugees (as amended by the 1967 United Nations Protocol relating to the Status of Refugees), and relevant High Court of Australia rulings. The claim of the argument in Fig. 3.11.3.1 is the statement that Reff has a well founded fear of persecution. This claim is made on the basis of two data items, that Reff has a real chance of persecution and that relocation within Reff's country of origin is not appropriate. A mechanism is required to act as a justification for why the claim follows from data. This justification is known as the warrant which is, in Fig. 3.11.3.1, the statement that "The test for well founded fear is real chance of persecution unless relocation affords protection". The backing provides authority for the warrant and in a legal argument is typically a reference to a statute or a precedent case. The rebuttal component specifies an exception or condition that obviates the claim. Reff may well

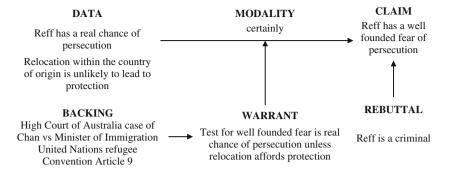


Fig. 3.11.3.1 Toulmin argument for well founded fear

have a real chance of persecution and relocation within the country of origin is unlikely to lead to protection; however the claim that his fear is well founded does not hold if Reff's persecution is due to criminal activities.

The validity of the dialectical/non-dialectical distinction for knowledge engineering is demonstrated by noting that many applications of the Toulmin structure to knowledge modelling during the 1990s have varied the structure in one way or another. However *ad hoc* the variations seem at first sight, they can be understood if seen as attempts to emphasise the dialectical as opposed to the non-dialectical perspective, to different extents.

In Section 3.11.4, diverse applications of the Toulmin argument structure are compared and contrasted in order to demonstrate that the variations are best understood as attempts to integrate dialectical argumentation with non-dialectical argumentation. In Section 3.11.5, the GAAM is presented. By specifically attempting to develop a non-dialectical model at a level that is generic to a discursive community, a variation of the Toulmin structure is derived that does not itself model dialectical exchanges. Rather, it enables dialectical exchanges to be readily modelled once communal knowledge is organised using the non-dialectical model. Applications developed with the use of the GAAM are discussed in Section 3.11.6 together with some insights regarding the dialectical model that is to be developed on the basis of the non-dialectical frame.

## 3.11.4 Variations of Toulmin's Structure

Argumentation has been used in knowledge engineering in two distinct ways; with a focus on the use of argumentation to structure knowledge (i.e. non-dialectical emphasis) or with a focus on the use of argumentation to model discourse (i.e. dialectical emphasis). Dialectical approaches typically automate the construction of an argument and counterarguments normally with the use of a nonmonotonic logic where operators are defined to implement discursive primitives such as *attack*, *rebut*, or *accept*. Carbogim, Robertson and Lee (2000) presented a comprehensive survey of defeasible argumentation.

Dialectical models have been advanced by Cohen (1985), Fox (1986), Vreeswijk (1993), Dung (1995), Prakken (1993a, 1993b), Prakken and Sartor (1996a), Gordon (1995), Fox and Parsons (1998) and many others. In general these approaches include a concept of conflict between arguments and the notion that some arguments defeat others. Most applications that follow a dialectical approach represent knowledge as first order predicate clauses, though they engage a nonmonotonic logic to allow contradictory clauses. Mechanisms are typically required to identify implausible arguments and to evaluate the better argument of two or more plausible ones. For example, Fox and Parsons (1998) analyse and extend the non standard logic LA of Krause, Ambler, Elvang-Goransson, and Fox (1995). In that formalisation, an argument is a tuple with three components:

#### (Sentence : Grounds : Sign).

The *sentence* is the Toulmin claim though this may be a simple claim or a rule. The *sign* is a number or symbol that indicates the confidence warranted in the claim. The *grounds* are the sentences involved in asserting the claim and can be seen as the reasoning steps used to ultimately reach the conclusion.

The preference for one argument over others has been modelled in a variety of ways. Prakken (1993a, 1993b) extends the framework proposed by Poole (1988) by using a concept of specificity. The claim that a penguin flies because it is a bird and all birds fly is less specific that the claim that a penguin does not fly. Preference relations between rules are elicited from experts and explicitly specified in the defeasible reasoning logic described by Antoniou (1997).

In applications of argumentation to model dialectical reasoning, argumentation is used specifically to model discourse and only indirectly used to structure knowledge. Concepts of conflict and of argument preferences map directly onto a discursive situation where participants are engaged in dispute. In contrast, many uses of argumentation for knowledge engineering application do not model discourse. This corresponds more closely to a non-dialectical perspective.

A non-dialectical representation facilitated the organisation of complex legal knowledge for information retrieval by Dick (1987, 1991). She illustrates how relevant cases for an information retrieval query can be retrieved despite sharing no surface features if the arguments used in case judgements are represented as Toulmin argument structures. Marshall (1989), Ball (1994) and Loui, et al. (1997) have built hypertext based computer implementations that draw on knowledge organised as Toulmin arguments. Hypertext links connect an argument's assertions with the warrants, backing and data of the same argument and also link the data of one argument with the assertion of other arguments. Complex reasoning can be represented succinctly enabling convenient search and retrieval of relevant information.

Clark (1991) represented the opinions of individual geologists as Toulmin argument structures so that his group decision support system could identify points of disagreement between experts. Matthijssen (1999) provides a further example of benefits that arise from the use of the original Toulmin structure. He represented user tasks as Toulmin arguments and associated a list of keywords to the structure. These keywords were used as information retrieval queries into a range of databases. Results indicate considerable advantages in precision and recall of documents as a result of this approach compared with approaches that require the user to invent queries.

Johnson, Zualkernan, and Tukey (1993) identified different types of expertise using this structure and Bench-Capon, Lowes, and McEnery (1991) used the Toulmin argument structure to explain logic programming conclusions. Branting (1994) expands the Toulmin argument structure warrants as a model of the legal concept of *ratio decidendi*, that is to say, the rationale of a decision. In the *Split* Up project, Zeleznikow and Stranieri (1995), and Stranieri, Zeleznikow, Gawler, and Lewis (1999) used the Toulmin argument structure to represent family law knowledge in a manner that facilitated rule/neural hybrid development.

Toulmin (1958) proposed his views on argumentation informally and never claimed to have advanced a theory of argumentation. He does not rigorously define key terms such as warrant and backing. He only loosely specifies how arguments relate to other arguments and provides no guidance as to how to evaluate the best argument or identify implausible ones. Nevertheless, the structure was found to be useful as a tool for organising knowledge.

According to James Freeman (1991), the Toulmin layout does not explicitly model discourse. Operators to question, attack or qualify opposition assertions are not explicit. Nor is there the facility to represent an agent's beliefs as they differ from another agent's. Not surprisingly, many knowledge engineering applications of the Toulmin framework have not modelled discursive exchanges at all, but have applied the framework to structure knowledge.

Despite the immediate appeal of the Toulmin argument structure as a convenient frame for structuring knowledge, most researchers that use the Toulmin layout vary the original structure. Each variation can be seen to be an attempt to integrate some aspects of dialectical reasoning into a structure that, for knowledge engineering purposes, is largely non-dialectical. In the following section three variations are presented. These can be understood as attempts to integrate a dialectical approach into a non-dialectical one.

#### 3.11.4.1 Johnson's Variation of the Toulmin Layout

Johnson, Zualkernan, et al. (1993) claimed that any argument's backing can be classified into one of five distinct types of backing which they label *Type 1* to *Type 5*. Each type of backing corresponds to a distinct type of expertise and also to a particular philosophical paradigm of reasoning as follows:

- *Type 1 arguments* reflect axiomatic reasoning. Data and claim for these arguments are analytic truths. The supporting evidence derives from a system of axioms such as Peano's axioms of arithmetic. Examples of what Aristotle called demonstrations would be captured as Type 1 arguments.
- *Type 2 arguments* assert a particular medical diagnosis on the basis of empirical judgements from a number of patients who have presented with similar symptoms in the past.

- *Type 3 arguments* are characterised by backings which reflect alternate representations of a problem. A medical diagnosis based on a model of the heart as a pump analyses symptoms to be consistent with that model. An alternate presentation that has the heart as a muscle provides other evidence.
- *Type 4 arguments* differ from Type 3 arguments in that the alternate representations are conflicting. In this case the argument involves supporting evidence that is conflicting. An assertion is made by creating a composite representation from conflicting ones.
- *Type 5 backings* refer to paradigms that reflect a process of inquiry.

The Type 1 and 2 backings that Johnson, Zualkernan, et al. (1993) identifies are markedly different from Types 3, 4 and 5. In the latter group, a claim is ultimately backed by recourse to alternate representations of a problem.

The resolution of conflicting representations is akin to a dialectical process. A common solution is sought from the exchange that is stimulated from conflicting representations. In Type 1 (axiomatic) or Type 2 (empirical) arguments, the backing is made from one perspective. There are no alternate representations and no common solutions. This is an example of a non-dialectical perspective.

The variation as per Johnson, Zualkernan, et al. (1993) does not introduce or eliminate components of the original Toulmin layout. However, by discerning nondialectical backings from dialectical ones, it imposes a typology of backing that can be seen as an attempt to extend the structure toward somewhat of a dialectical application. The approach is limited by the unclear nature of the Toulmin warrant.

Broadly speaking, Toulmin formulates the warrant as an inference procedure. It is a procedure for inferring a claim given data. For example, the statement that "Most Italians are a Catholic" can be used as an inference rule to infer the claim that Mario is (probably) a Catholic given data that he is a Catholic. However, the statement that "Most Italians are a Catholic" can also be interpreted as a reason for the relevance of the data item "Mario is a Catholic" in the argument.

The distinction between a warrant as an inference rule and a warrant as a reason for relevance can be seen in the refugee argument of Fig. 3.11.3.1. The warrant statement that reflects that the High Court case of Chan introduced a "real chance of persecution" as the test for well founded fear is readily seen as a reason for the relevance of the real chance data item. It is less obviously viewed as an inference rule that can be applied to infer the claim.

Below, issues related to what James Freeman (1991) calls the *problematic notion of warrant* are discussed. However, it is important to note the Johnson typology applies to backings for warrants that are inference procedures but may not apply in the same way to warrants that are statements indicating a reason for the relevance of a data item.

#### 3.11.4.2 The Freeman and Farley Variation on Toulmin Warrants

Arthur Farley and Kathleen Freeman (1995) recognised the need to extend the warrant component in order to develop a model of dialectical reasoning more formal than that proposed by Toulmin. Their main objective was to develop a system that could model the burden of proof concept in legal reasoning. The concept of burden of proof is often used to refer to the onus a discourse participant has, to supply evidence. So, as Prakken (2001) notes in modelling this form of burden of proof using a dialogue game model, a judge directs the pleadings phase of proceedings by requiring one litigant or another to supply evidence to support their claims. However, the form of burden of proof that was the focus of attention for Farley and Freeman (1995) involves the extent to which evidence is required in order to draw a conclusion. This varies with the severity of the misdemeanour. Except as otherwise provided by the law, the burden of proof requires *proof by a preponderance of the evidence*. In a criminal case, the state must prove all elements of the crime to a beyond reasonable doubt level. In cases of tax fraud, the burden of proof in a tax case is generally on the taxpayer (Black, 1990)

In an earlier paper than Farley and Freeman (1995), Kathleen Freeman (1994) described two types of warrants she called wtype1 and wtype2. The first warrant type, wtype1, classifies the relationship between assertion and data with category labels she calls *explanatory* or *sign*. Causal links are examples of explanatory warrants because they explain an assertion given data. Fire causes smoke. The consequent is explained by recourse to a cause/effect link. Other types of *explanatory warrants* include *definitional relationships* or *property/attribute relationships*. A *sign relationship* represents a *correlational link* between data and assertion.

The second warrant type, wtype2, represents the *strength* with which the assertion can be drawn from data. Examples of this type of warrant proposed by Kathleen Freeman represent the strength with which the consequent can be drawn from the antecedent. *Default type warrants* represent default relationships such as birds fly. *Evidential warrants* are less certain. *Sufficient warrants* are certain and typically stem from definitions.

Kathleen Freeman explicitly represents reasoning methods in addition to the two types of warrant. The reasoning types reside outside the Toulmin argument structure but interact with warrants in order to produce credible outcomes. Her model incorporates four reasoning mechanisms, *modus ponens, modus tollens, abduction* and *contra positive abduction*. For example, some reasoning mechanisms are stronger than others according to heuristics she devised. *Modus ponens* and *modus tollens* are assigned a strong link qualification if used with sufficient warrants, whereas the same reasoning types are assigned a "credible" qualification if used with evidential warrants.

Reasoning types interact with warrant types to control the generation of arguments according to reasoning heuristics. For example, *modus ponens/abduction* combinations are not permitted for two explanatory warrants unless both are evidential. Kathleen Freeman (1994) demonstrates a capacity her model has for dialectical reasoning. An assertion is initially argued for with the use of heuristics she defined. Then, an alternate argument is compared with the initial argument constructed and support for it is ascertained. The comparisons require the notion of *level of proof* which include *beyond reasonable doubt, scintilla of evidence* and *preponderance of evidence.* (Cf. in Section 3.6.2 in this book.) Kathleen Freeman's model is a sophisticated extension to the Toulmin argument structures that displays impressive dialectical reasoning results. She advances types of relationships between consequents and antecedents (wtpyel) and assigns the link a strength (wtype2). The discernment of two types of warrant is essential for her because her model of burden of proof relies on it. By specifying reasoning types and heuristics for their interaction with warrants, Farley and Freeman (1995) can be seen to provide a way to extend the Toulmin structure so that it can be applied to model dialogue. The ambiguity in the original Toulmin warrant is dealt with by reserving one type of warrant for the inference rule and the other to indicate the strength of the rule. This adds a representation of uncertainty to some extent, but as we shall describe below, the strength of the data items and strength of claims is not represented. Furthermore, there is no attempt to incorporate information regarding the broader context of the argument.

In contrast, the issue of context is paramount for Bench-Capon (1998), who is not intent on modelling the burden of proof in legal reasoning but on implementing a dialogue game that engages players in constructing arguments for and against assertions initially made by one party.

#### 3.11.4.3 Bench-Capon's Variation of the Toulmin Layout

Bench-Capon (1998) does not distinguish types of backing as Johnson, Zualkernan, et al. (1993) do, or types of warrant following Farley and Freeman (1995). Instead, he introduces an additional component to the *Toulmin argument structure*. The presupposition component of the Toulmin argument structure represents assumptions made that are necessary for the argument but are not the object of dispute, so they remain outside the core of the argument. A presupposition for the refugee argument illustrated in Fig. 3.11.3.1 would indicate that the country in which the argument is raised is a signatory to the United Nations Convention. As Australia is a signatory to the Convention, the data items and warrant that relate to the UN Convention are entirely appropriate. If Australia were not a signatory then those data items may not be as appropriate. This is illustrated in Fig. 3.11.4.3.1.

Making explicit presuppositions in the argument structure is important for the use Bench-Capon (1998) makes of the Toulmin argument structure. A program that plays the part of one or both players in a dialogue game is often exposed to utterances in discourse that represent presuppositions and are not central to the discussion at hand.

The presuppositions can become critical if parties to a game do not share them. Bench-Capon (1998) interprets the warrant as an inference procedure much as Toulmin originally did. The dialogue game does not directly add dialectical operators such as rebut, attack or accept into the structure but these are instead encoded into the control mechanism that represent the rules of the dialogue game. The inherent ambiguity in the Toulmin warrant is not addressed; however, the context of the argument is modelled by the addition of a presupposition component.

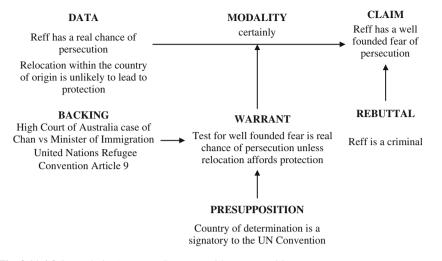


Fig. 3.11.4.3.1 Toulmin Argument Structure with presupposition component

#### 3.11.4.4 Considerations Concerning Toulmin Variations

The three variations to the Toulmin argument structure presented thus far in Section 3.11.4 can be seen to be attempts at clarifying how the structure can be used within a dialogue. This objective motivated Johnson, Zualkernan, et al. (1993) to add types of backings. Each new backing type derives from the use of arguments by a discursive community. Farley and Freeman (1995) were more direct and developed specific reasoning heuristics so that an argument and counterargument are constructed as it would be within a discursive community. Bench-Capon (1998) defined a dialogue game that regulated the dialogue between two players who each encode their utterances as Toulmin components.

In the next section, Section 3.11.5, a variation of the Toulmin argument structure is proposed that specifically aims to model the structure of arguments in a nondialectical manner. This is done in a manner that is at a sufficiently high level of abstraction so as to represent shared understanding between participants to a discourse which ultimately simplifies the specification of a dialectical model. However, even without extension into a dialectical model, the non-dialectical frame facilitates hybrid system development, document drafting and intelligent information retrieval.

# 3.11.5 A Generic Non-dialectical Model of Argumentation: The Generic Actual Argument Model (GAAM)

#### 3.11.5.1 The Argument Template

Figure 3.11.5.1.1 represents a template for knowledge representation that varies the Toulmin argument structure. The template differs from the Toulmin structure in that it includes:

Context Variable Context variable values V <sub>1</sub> V <sub>2</sub> 	Data relevance Backing drb <sub>1</sub> drb <sub>2</sub>  drb <sub>n</sub>	Data relevance Reason drr <sub>1</sub> drr <sub>2</sub>  drr <sub>n</sub>	Data Variable Data Variable	Data Values V <sub>1</sub> V <sub>2</sub>  V <sub>n</sub>	Certainty c <sub>1</sub> c <sub>2</sub>  c <sub>n</sub>	Inference       machanism variable       Values     Reason       im1     ima1       im2     ima2		Claim Variable Claim Values V1 C1	
v <sub>n</sub>			•		I	im <sub>n</sub>	ima <sub>n</sub>	v <sub>2</sub>	$c_2$
•			•						
•			•	Cla	im value re	ason (	evr	v <sub>n</sub>	c <sub>n</sub>

Fig. 3.11.5.1.1 Non-dialectical argument template

- a variable-value representation of claim and data items,
- a certainty variable associated with each variable-value rather than a modality or force associated with the entire argument,
- reasons for the relevance of the data items in place of the warrant,
- a list of inference procedures that can be used to infer a claim value from data values in place of the warrant,
- reasons for the appropriateness of each inference procedure,
- context variables,
- the absence of the rebuttal component present in the original formulation,
- the inclusion of a claim value reason component.

The argument template represents knowledge at a very high level of abstraction. There are two levels of instantiation made in applying the template to model arguments within a domain; the generic level and the actual level. A generic argument is an instantiation of the template where the following components are set:

- claim, data and context variables are specified but not assigned values,
- relevance reason statements and backing statements are specified,
- inference procedures are listed but a commitment to any one procedure is avoided,
- inference procedure reasons are specified for each procedure
- claim and data variables are not assigned certainty values

The generic argument is sufficiently general so as to capture the variety of perspectives displayed by members of a discursive community.

Figure 3.11.5.1.2 illustrates the refugee argument above, as a generic argument. The claim variable has been labelled *Well founded fear* and acceptable values specified. There are three inference procedures known to be appropriate in this example; the first is a rule set that derives from heuristics an immigration expert uses, the

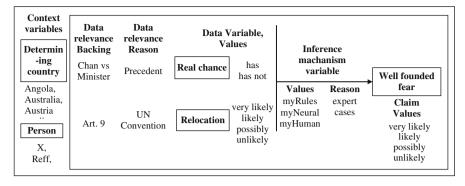


Fig. 3.11.5.1.2 Generic argument for well founded fear

second is a neural network<sup>35</sup> trained from past cases and the third is a human inference. This latter inference indicates that a human is empowered with sufficient discretion to infer a claim value from data item values in any way he or she likes.

In the *Generic Actual Argument Model (GAAM)*, the Toulmin warrant has been replaced with two components; an inference procedure and a reason for relevance. This relates to two different roles a warrant can play in an argument from a nondialectical perspective. As described above, the warrant indicates a reason for the relevance of a data item and on the other hand the warrant can be interpreted as a rule which, when applied to the data items, leads to a claim inference.

An inference procedure is an algorithm or method used to infer a claim value from data item values. Under this interpretation, an inference procedure is a relation between data variable values and claim variable values. It is any procedure that will perform a mapping from data items to claim items. A mathematical function, an algorithm, a rule set, a neural network, or procedures yet to be discovered are examples of inference procedures.

Actual arguments made are instances of a generic argument where each data slot has a value (*data item value*), an inference procedure is chosen and executed to deliver a value for the claim slot (*claim value*). Each generic argument has a claim, data items, reasons for why each data item is relevant, the names of the associated inference procedures and reasons for their appropriateness. Figure 3.11.5.1.3 shows a generic argument in detail. It consists of: a conjunction of data items or slots each with a reason for its relevance and the backing for this; a choice of inference procedures and the reasons for each one of these mechanisms and of course, the claim slot. All data slots act as input to the inference procedures. Each inference mechanism in the inference procedure slot provides a means of reaching a claim value from the input data values. Inference mechanisms may include rule sets, trained neural networks, case-based reasoners or human reasoning. The choice of a particular inference mechanism (other than human inferencing) and the reasons for that

<sup>&</sup>lt;sup>35</sup> Neural networks are the subject of Section 6.1.14 in this book.

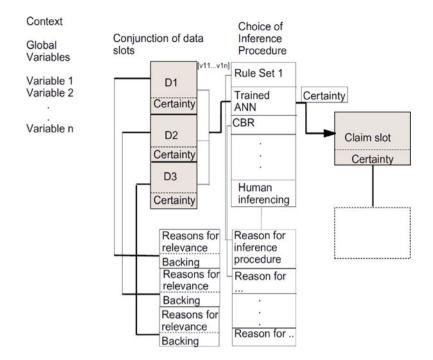


Fig. 3.11.5.1.3 Full representation of a generic argument

inference procedure provide a reason for arriving at a particular claim value. In the case of human inferencing there will still be a need to provide a justification for the claim. At the generic argument level this explanation cannot be given.

Figure 3.11.5.1.3 also includes *certainty* slots for each data item, claim and inference procedure. These recognise that there is uncertainty in the processes of developing actual arguments. The certainty values are assigned when values are assigned in the process of constructing an actual argument. A generic argument is an agreed approximation to a world but still may only be partial knowledge. We do not explicitly put a certainty or confidence value on a generic argument although we permit generic arguments to change over time. The structure of generic arguments that describe a domain will not be static. As knowledge within the domain evolves new versions of the generic argument structure will be required. New factors emerge as being relevant to some arguments and new inference procedures may be needed as new legal rules emerge or new cases become precedents. Most actual arguments in a domain are then underpinned by a particular version of the generic argument structure. Figure 3.11.5.1.3 also depicts variables that are required to capture the context of the generic argument. Context variables are conceptualised as factors that are critical for the appropriate instantiation of actual arguments from the generic template. However, context variables do not directly take part in the reasoning within an argument. For example, the reasoning used to infer claims about tours does not include the geographical region as a data item because the reasoning applies regardless of region.

#### 3.11.5.2 Discussion

Many inference procedures can be implemented in software. Thus, they can be automated in computer based systems. However, this need not be necessarily the case for a knowledge engineering framework. Claims can sometimes be inferred from data items by human agents without the explicit specification of an inference procedure. This occurs frequently in discretionary fields of law where, as Christie (1986) notes, decision makers weight and combine relevant factors in their own way without articulating precisely how claims were inferred. This situation is accommodated within the Generic Actual Argument framework with the specification of an inference type labelled, simply, human.

The original Toulmin warrant can also be seen to be a reason for relevance or an inference procedure. Past contributions to a marriage are relevant in Australian family law. Past contributions appears as a data item in a generic argument regarding property distribution following divorce because a statute dictates that contributions are relevant. The wealth level of a marriage in Australia is made relevant by past cases and not by statute. The hair colour of the wife is considered irrelevant because there is no statutory or precedent basis for its relevance. Further, domain experts can think of no reason that would make this feature *relevant*.

The concept of *relevance* is in itself difficult to define generally. See Section 4.6 in this book. van Dijk (1989) describes the concept of relevance as it applies to a class of modal logics broadly called *relevance logics* as a concept grounded firmly in the pragmatics, and not the semantics or syntax of language. Within a discursive community, the data items in a generic argument must be relevant to the claim to the satisfaction of members of the community.

A generic argument in the field of family law property division may include hair colour as a relevant data item for inferring property division if a reason for its relevance that is acceptable, even if not held, by many in the community, is advanced. Perhaps the utterance

#### Blonde women will remarry more readily.

as a reason for the relevance of hair colour as a data item may not be held by all participants to a discourse but reflects a belief that is understood as plausible by many.

The argumentation framework advanced here not only departs from the Toulmin formulation by distinguishing inference procedure from reason for relevance but it also represents context explicitly. Figure 3.11.5.1.2 illustrates two context variables; the *Determining country* and the *Person* about which the argument is being made. The respective values are a list of world nations for the *Determining Country* and Reff or the more universal X for the *Person*.

Context variables represent something of the background knowledge that impacts on the generic argument. For example, the context variable *Determining country* in Fig. 3.11.5.1.2 represents a scope constraint on the argument. This indicates that an actual argument can be made based on the generic argument however the determining country sets a context for the argument. The context variable is an articulation of the presuppositions that underpin the generic argument. The context variable can also represent the scope of variables used in the generic argument. For example, the *Person* context variable will be assigned the value X for a discourse participant intent on making the more universal argument that relates to well founded fear of anyone. The participant that restricts the argument to Reff does so be setting the context variable to Reff. In general, context is a difficult concept to define. In the framework defined here, context is defined as presupposition and variable scope. However, other definitions can also be accommodated as long as they can be captured as variable-value tuples.

There is no rebuttal component in the generic argument. The rebuttal is more clearly regarded to be a dialectical component and is therefore omitted from this essentially non-dialectical frame. For instance, discursive participants may create actual arguments as instances of the same generic argument in ways that are quite different from others. Participant A may assert a different claim value than B, yet have perfect agreement on all data item values because a different inference procedure was selected. Any discussion regarding this difference, including exchanges that make the point that the difference constitutes an attack, or exchanges that seek to defend A or B's assertion, or exchanges that seek to identify the stronger argument involve dialectical exchange and are omitted from the non-dialectical frame.

#### 3.11.5.3 Representing Actual Arguments

Figure 3.11.5.3.1 represents an *actual argument*. This is the second level instantiation of the argument template in Fig. 3.11.5.1.1. An *actual argument* corresponds to a position held by a participant in a discourse. It is an instantiation of a generic argument. The context variable *person* in the generic argument is instantiated to "Reff" indicating that the claim only applies to him and not to others.

The data item value in Fig. 3.11.5.3.1 represents the situation that "Reff is likely to have a well founded fear". The inference procedure for the actual argument is the ruleset called myRules. As a consequence of applying that ruleset, the claim value is instantiated to represent that Reff is likely to have well founded fear.

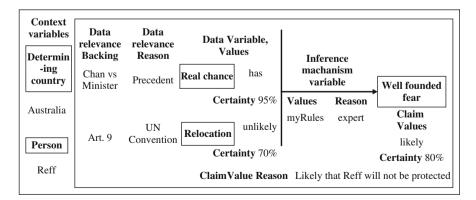


Fig. 3.11.5.3.1 Actual argument for Reff has well founded fear

The *claim value reason* for this actual argument provides a reason for the specific claim value inferred rather than other claim values. The claim value reason in Fig. 3.11.5.3.1 expresses a reason for why well founded fear is likely, given the data items and inference procedure selected. The *claim value reason* is not a reason for the inference rule. First of all the inference procedure need not be a rule. If it is a mathematical function or has mechanisms that are not visible, such as a neural network, then the articulation of a reason for the inference procedure is impossible. Conceptually, it is more correct to say it is a reason for a particular value that has arisen as a result of the application of an inference procedure.

Certainty values are assigned when a participant creates an actual argument. The certainty value represents the degree of certainty the participant has that the claim (or data) variable value selected is the true value. A certainty value may be set directly by the participant or calculated by the inference procedure, if the variable value is set by an inference procedure. The certainty value of 80% associated with the data item value, "likely", for the well founded fear variable in Fig. 3.11.5.3.1, is read as a high (80%) degree of certainty that well founded fear of persecution is likely. This is calculated by the inference procedure selected, myRules. However, if the inference procedure selected does not calculate certainty values (e.g., human inferences) then the participant must set a certainty value. The way in which the data item certainty values are combined is a feature of the mapping performed by the particular inference procedure selected so is not made explicit in the GAAM.

Linguistic variables values such as *very elderly, elderly, middle aged, young* and *very young* seem to represent certainty in themselves so as to make the specification of a certainty value redundant. However, the inclusion of a certainty value slot in the GAAM enables the specification of membership function values if fuzzy reasoning<sup>36</sup> was selected as the inference procedure, conditional probability if a Bayesian inference was selected or certainty factors if MYCIN-like rule inferences (i.e., rules of the kind made popular in expert system following the MYCIN expert system for medical diagnosis)<sup>37</sup> were used as the inference procedure.

Generic and actual argument structures correspond to a non-dialectical perspective. They do not directly model an exchange of views between discursive participants but rather describe assertions made from premises and the way in which multiple claims are organised. Claim variables are inferred using an inference procedure, which may not necessarily be automated, from data item values. The reasoning occurs within a context and the extent to which the data items correspond to true values, according to the proponent of the argument, is captured by certainty values.

The generic argument provides a level of abstraction that accommodates most points of view within a discursive community and anticipates the creation of actual arguments, by participants, as instantiations of a generic argument. However, it is conceivable that, given the open textured nature of reasoning, that a participant

 $<sup>^{36}</sup>$  Fuzzy logic is the subject of Section 6.1.15 in this book.

<sup>&</sup>lt;sup>37</sup> MYCIN is the subject of Shortliffe (1976); Shortliffe and Buchanan (1975).

will seek to advance an actual argument that is a departure from the generic argument. This is a manifestation of discretion and can be realised with the introduction of a new variable (data, claim or context) value, with the use of a new inference procedure, or with a new claim value reason.

A non-dialectical argumentation model must model discretion and open texture. The concept of open texture was introduced by Waismann (1951) to assert that empirical concepts are necessarily indeterminate. A definition for open textured terms cannot be advanced with absolute certainty unless terms are defined axiomatically, as they are, for example in mathematics. Gold may be defined as that substance which has spectral emission lines, X, and is coloured deep yellow. However, because the possibility that a substance with the same spectral emission as gold, but without the colour of gold will appear in the future, cannot be ruled out, the concept for gold is open textured.

The concept of open texture is significant in the legal domain because new uses for terms, and new situations constantly arise in legal cases. Prakken (1993a) discerns three sources of open texture; reasoning which involves defeasible rules; vague terms; or classification ambiguities. Judicial discretion is conceptualised by Christie (1986) and Bayles (1990) as the flexibility decision-makers have in weighing relevant factors when exercising discretion, although articulating an assignment of weights is typically difficult. This view of discretion does not derive from defeasible rules, vague terms or classification ambiguities, so is regarded as a fourth type of situation that contributes to the open textured nature of law.

The link between the GAAM and discretion is described in detail by Stranieri, Yearwood, and Meikl (2000). Broadly, discretion manifests itself as the flexibility for a participant to construct an actual argument from a generic argument by:

- Adding data item factors into the actual argument that are not in the generic tree.
- Removing a data item factors from the actual argument that is in the generic tree.
- Selecting a data, claim, or context variable value from those specified in the generic tree.
- Selecting a data, claim, or context variable value that has not been specified in the generic tree.
- Selecting an inference procedure from the list specified in the generic tree
- Selecting an inference procedure not specified in the generic tree.
- Leaving data items, reasons for relevance, inference procedure, and reasons for the appropriateness of inference procedures implicit.
- Introducing a claim value reason statement.
- Selecting certainty values.

This framework including the generic/actual distinction, the clear separation of inference procedure from other components and the inclusion of reasons for relevance and context introduces a non-dialectical structure that represents knowledge applicable to a discursive community, but does not include elements that are clearly needed to model dialectical exchanges. In the next Section 3.11.6, the way in which a the specification of a comprehensive non-dialectical structure facilitates hybrid reasoning, document drafting and information retrieval is described before illustrating steps toward a dialectical model based on the GAAM non-dialectical frame.

## 3.11.6 Applications of the Generic/Actual Argument Model

The use of the GAAM for facilitating hybrid reasoning is illustrated with the knowledge based system called *Split Up*, that predicts marital property distribution decisions following divorce made by judges of the Family Court of Australia. This research is reported by Stranieri, Zeleznikow, Gawler, and Lewis (1999); cf. Stranieri (1999).

## 3.11.6.1 The Split Up System for Negotiating a Divorce

The *Split Up* project (Stranieri et al., 1999) collected data from cases heard in the Family Court of Australia dealing with property distribution following divorce. The objective was to predict the percentage split of assets that a judge in the Family Court of Australia would be likely to award both parties of a failed marriage. Australian Family Law is generally regarded as highly discretionary. The statute presents a "shopping list" of factors to be taken into account in arriving at a property order. The relative importance of each factor remains unspecified and many crucial terms are not defined. The age, state of health and financial resources of the litigants are explicitly mentioned in the statute as relevant factors, yet their relative weightings are unspecified. The Act clearly allows the decision-maker a great deal of discretion in interpreting and weighing factors.

In the *Split Up* system, the relevant variables were structured as data and claim items following the generic argument outlined above into 35 interlocking arguments. The ultimate claim, representing the percentage split of assets a judge would be likely to award the husband and wife, was the root of an *argument tree*. Unlike in dialogical argumentation, using an argument tree in non-dialogical argumentation, namely, in order to structure knowledge, aims at securing the following benefit: the argument tree is a hierarchy of relevant factors, and enables to decompose one large data mining exercise into many smaller ones.

Nodes in the argument tree of *Split Up*, illustrated as Fig. 3.11.6.1.1, are claim/data items. Variable values, inference procedures, reason for relevance and context are omitted from this diagram. The arguments interlock in that the claim of one argument is a data item for another, higher up a tree such as the one depicted in Fig. 3.11.6.1.1. For example, the variable *Contributions of the husband relative to the wife* is a data item for the ultimate claim and also the claim for an argument that has four data items.

In the *Split Up* system all claim variable values were inferred using automated inference procedures from the data item values. In 15 of the 35 arguments, claim values were inferred from data items with an inference procedure that involved the use of small rule-sets that represent expert heuristics whereas neural networks,

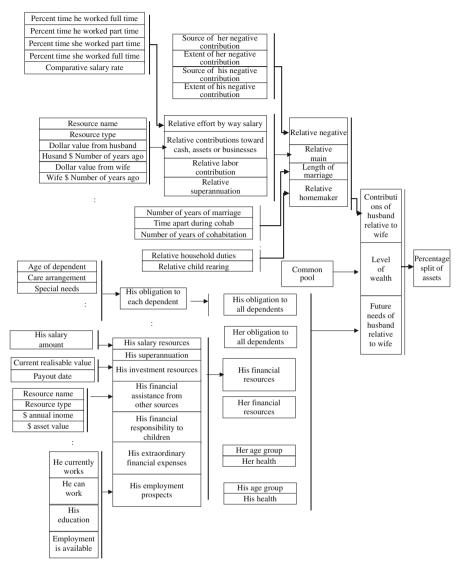


Fig. 3.11.6.1.1 The argument tree in the *Split Up* system (details are shown in Figs. 3.11.6.1.2, 3.11.6.1.3, and 3.11.6.1.4)

trained on data from past Court cases, were used to infer claim values in the remaining 20 arguments.

The *Split Up* application illustrated that the generic/actual argument model captures knowledge in way that leads to readily maintainable knowledge bases, a requirement that is particularly important in law. The tree of arguments underpinning *Split Up* was first elicited with the assistance of domain experts in 1994. Since then, property division in family law has changed in that domestic violence is now

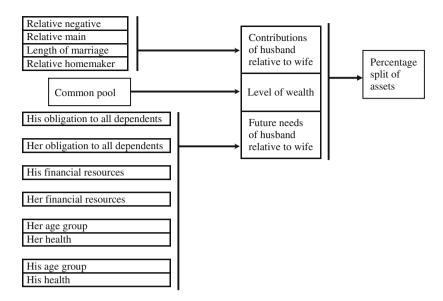
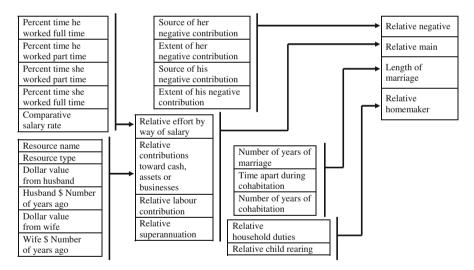
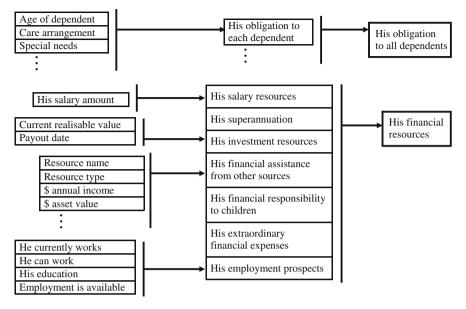


Fig. 3.11.6.1.2 The downstream part of the argument tree in the Split Up system



**Fig. 3.11.6.1.3** An enlarged detail of the argument tree in the *Split Up* system (the top left part of Fig. 3.11.6.1.1)

recognised as a relevant consideration in property proceedings following a divorce. The framework localises this change to a single argument that does not impact on any other argument. Furthermore, an examination of the process that led to the introduction of domestic violence illustrated that the generic argument framework can clarify judicial reasoning.



**Fig. 3.11.6.1.4** An enlarged detail of the argument tree in the *Split Up* system (the bottom left part of Fig. 3.11.6.1.1)

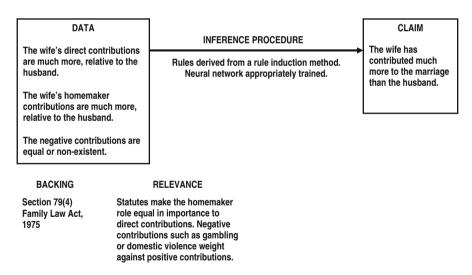


Fig. 3.11.6.1.5 Why the wife deserves more, in a given case (data to claim)

Behind the argument tree, there is an argument which in represented by means of the Toulmin argument structure, in Figs. 3.11.6.1.5, 3.11.6.1.6, and 3.11.6.1.7.

In her thesis about family law in Australia, Renata Alexander (2000) noted that during the 1990s, numerous unsuccessful attempts were made to persuade judges

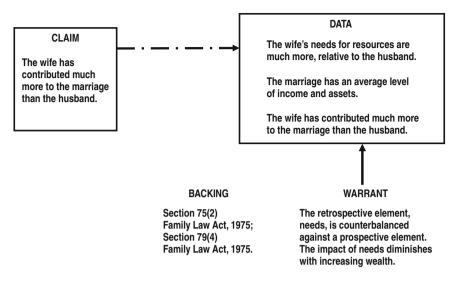


Fig. 3.11.6.1.6 Why the wife deserves more, in a given case (claim to data)

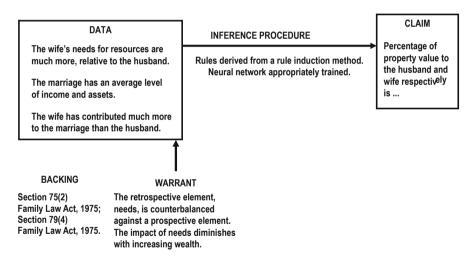


Fig. 3.11.6.1.7 Why the wife deserves more, in a given case (with another claim)

to award a more generous property settlement to victims of domestic violence. This corresponds to the situation where an argument is advanced that departs from existing generic arguments by the introduction of a new data item. In recent years, a small number of Family Court judges began to accept the domestic violence argument. Many of the early cases were appealed and precedents set by higher Courts so that domestic violence is now undeniably a relevant consideration in property division. However, as Alexander (2000) notes, there is still some ambiguity in practice

in that some judges have attributed domestic violence as a past contribution factor whereas others have recognised it as a factor that increases the victim's future needs. The ambiguity corresponds to a situation where a new factor has currently been inserted in two places in the argument tree. The discursive community, judges, lawyers and analysts of Australian family law await the resolution of this apparent conflict.

The *Split Up* application also demonstrates that the generic/actual model provides a convenient frame for task decomposition that is particularly useful for data mining. Data mining is restricted to an exercise in discovering the inference procedure within each argument. Although the total number of relevant variables is large (103 in the *Split Up* system) most arguments have a small number of data items. Mining for an inference procedure involving a small number of variables is far more readily tractable than a large set. Furthermore, a flat list of all variables requires huge numbers of cases and often includes missing values. For example, values associated with children are empty for childless marriages and appear in a flat list as null values. Null values severely hamper data-mining attempts. However, if the variables are organised into a generic tree, each argument has a small number of variables (data items). This means that relatively small numbers of cases can be used to discover inference procedures that are accurate.

Accurate inference procedures are particularly important in the *Split Up* system because users (typically, a couple) are non-experts and need the system to prompt them for all relevant facts in order to infer all claims leading up to the culminating claim. This is in contrast to the *Embrace* system, which is configured to make no automated inferences at all, yet illustrates the document drafting and information retrieval benefits of the GAAM.

#### 3.11.6.2 The Embrace System for Assessing Refugee Status

Yearwood, Stranieri, and Anjaria (1999) report the application of the generic actual model to supporting reasoning regarding the assessment of refugee status in Australia. Refugee law is highly discretionary and extremely difficult to model. The main statute, the United Nations Convention, lists factors to be taken into account in reaching a determination on the refugee status of an applicant, but does not specify the weighting factors should have.

Ensuring that the decision making is as consistent as possible in this complex and discretionary domain is critical for just outcomes. Yearwood et al. (1999) have modelled reasoning in this field using over 200 generic arguments derived from members of the body established to hear appeals from unsuccessful applicants, the Refugee Review Tribunal. Inference procedures have not been specified for any generic argument in order to ensure that the information system facilitates decision making but does not directly infer outcomes which are left entirely to Tribunal members. Nevertheless, the argument structures have proven to be useful in modelling refugee decisions and in generating XML documents that are plausible first draft determinations. Refugee Review Tribunal determinations are documents that express the reasoning steps a member of the Tribunal followed in order to infer conclusions regarding the status of an applicant. Although, it is reasonable to expect that a mapping between the reasoning steps used by judges and the structure of the judgement produced would clearly be apparent, Branting, Callaway, Mott, and Lester (1999) note that such a mapping is by no means obvious. They make some progress beyond boilerplate templates with the sophisticated use of discourse analysis using speech act and rhetorical structure theory.

Yearwood and Stranieri (1999) have identified a simple heuristic for traversing a tree of actual arguments that leads to a plausible document structure. This is achieved without the use of discourse analysis methods, largely because the generic/actual framework is a succinct, yet expressive frame for capturing reasoning.

The document generation facility has been implemented as a module of an argument shell, called *ArgumentDeveloper*. Yearwood and Stranieri (2000) describe the program that has been written to facilitate the development of knowledge based systems that use the generic actual argument model. This module traverses the actual argument tree for a user in the order specified by the algorithm and generates an XML document with an appropriate document type definition file. When this is paired with a style sheet customised for refugee law, a determination is automatically generated that expresses the flow of reasoning in a manner that is quite plausible despite using no discourse analysis techniques.

Yearwood and Stranieri (2000) developed and implemented their "Argument Developer Agent" shell which allows the building and storage of versions of the generic argument framework within a domain and an interface for the development of actual arguments. The argument shell consists of the following components:

- A generic argument editor that enables a knowledge engineer to enter a tree of generic arguments within a domain.
- An actual argument editor that enables a user to enter actual arguments made by users. This identifies the appropriate argument in the generic structure based on the text used by the user in a notepad interface. It was then replaced by a dialogue interface to interact with the TOURIST agent, in an application to tourism which we briefly discuss in Section 3.11.6.4 below.
- An inference engine that can infer a value for a claim from data item values by invoking the procedure embedded in an argument.
- A dialogue generator that models the relationships between arguments such as A supports B, A rebuts C and D, A extends G; This is important for modelling the way in which two or more parties apply arguments in a dialogue.

A knowledge engineer using the argumentation shell first maps out all the generic arguments. The claim of each generic argument except for the culminating one, is a data item for another argument so a tree of arguments is constructed.

In addition to the need to generate draft determinations rapidly, the *Embrace* project provided the vehicle for demonstrating that the generic actual model improves information retrieval. This is implemented with the development of the information retrieval module into the *ArgumentDeveloper* shell. This module automatically generates a search engine query by assembling all terms used in an argument with a list of keywords associated with the argument. Matthijssen (1999) demonstrated improved precision and recall figures using keyword lists attached to the original Toulmin argument structure. The information retrieval query takes all variable names and values in addition to a list of terms associated with each generic argument in order to generate a query.

#### 3.11.6.3 The GetAid System for Legal Aid Eligibility

The *GetAid* system operates in the field of legal aid eligibility where rapid prototyping of a web based application is more important. The generic actual framework has been applied to acquire knowledge regarding decisions made by officers of Victoria Legal Aid, a government funded provider of legal services for disadvantaged clients, in assessing whether an applicant should receive legal aid. Applicants for legal aid must pass a merits test which involves a prediction about the likely outcome of the case in Court. This assessment involves considerable discretion and is performed by grants officers who have extensive experience in the practices of Victorian Courts.

A web-based knowledge based system called *GetAid* was rapidly developed using the shell, WebShell, reported by Stranieri and Zeleznikow (2001a). Knowledge was modelled using two distinct techniques: decision trees for procedural-type tasks and generic argument trees for tasks that are more complex, ambiguous or uncertain.

The *GetAid* development demonstrated that the generic actual argument model (GAAM) is a useful representation for rapid knowledge acquisition. In order to construct a generic argument tree, the expert is initially prompted to articulate factors (data item variables) that may be relevant in determining the ultimate claim without any concern about how the factors may combine to actually infer a claim value. For every factor (data item variable) articulated, a reason for the items relevance must be able to be articulated. The possible values for each data item are then identified. The next step in the knowledge acquisition exercise involves viewing each data item as a claim and eliciting the data items that are used to infer its value.

Once the tree is developed as far back as the expert regards appropriate for the task at hand, attention can be then by focussed on identifying one or more inference procedures that may be used to infer a claim value from data item values. This proved difficult for the *GetAid* experts to articulate as rules because the way in which the factors combine is rarely made explicit but forms part of the expertise gathered over many cases. Although it is feasible to attempt to derive heuristics, the approach we used was to present a panel of experts with an exhaustive list of all combinations of data items as hypothetical cases and prompt for a likely decision. The decisions

from a panel of experts were merged to form a dataset of records that were used to train a neural network for each generic argument.

The construction of the systems, *GetAid*, *Split Up* and *Embrace* illustrate the benefits in the use of the non-dialectical framework. These include hybrid reasoning, task decomposition, information retrieval, document generation and knowledge acquisition. These benefits can be seen to derive from the effectiveness of the generic actual model to structure reasoning. In the e-Tourism application, first steps have been made toward the development of a dialectical model that is based on the non-dialectical model.

#### 3.11.6.4 An Application Outside Law: eTourism

In the *eTourism* system, developed by Avery, Yearwood, and Stranieri (2001), dialogue occurs between three types of software agents: tourists, tour advisors and tour operators. The human tourist invokes an instance of a tourist agent on commencing a consultation session. The tour advisor has no human counterpart. The dialogue between the tourist and advisor agents is aimed at realising the community goal of recommending tours the tourist will enjoy. The tour operator invokes an operator agent in order to inform the advisor of tours it operates. A key feature of the approach presented here is that all agents share the same generic argument tree but can instantiate their own actual arguments. In this way, each agent's beliefs are represented by actual arguments, but because these are instances drawn from a common generic argument tree, negotiation can be simplified.

Jennings, Parsons, Sierra, and Faratin (2000) noted that negotiation underpins any attempt at coordinating multiple agents (human or software). For instance, the architecture for the eTourism application is based on an agent-oriented approach where each software agent represents world knowledge as arguments and interacts with other agents according to dialogue rules. An agent based framework that places emphasis on *negotiation* must include three main components:

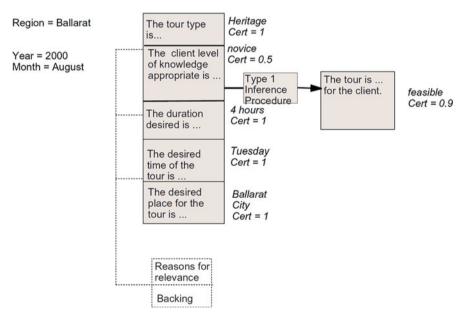
- a negotiation protocol,
- a negotiation object, and
- an agent's decision-making model.

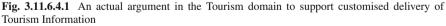
Generic arguments are used in the *eTourism* project as a means of representing the shared knowledge that an agent community has. In this approach each agent's beliefs are represented by actual arguments. Because these instances are drawn from a common generic argument tree, negotiation between agents can be simplified. The mapping between the negotiation protocol, the negotiation object and the agent's decision making model has been discussed and lays the groundwork for developing applications based on multiple agents negotiating outcomes because knowledge represented as generic/actual arguments helps to: constrain the negotiation protocol; constrain the negotiation objects; constrain the agent's decision making model.

The generic argument<sup>38</sup> constrains negotiation protocols in a convenient manner for agent-oriented architectures (this kind of software is discussed below in Section 6.1.6). The actual arguments of multiple agents can be readily compared and contrasted because each actual argument is an instantiation of the same generic argument. Operators that appear in dialectical argumentation such as *attack* and *accept* are readily implemented. An argument, A, attacks another argument, B, if A has a different claim value than B for the same claim variable. The source of the attack can be readily isolated. It may be due to different data item values, certainties, or different inference procedures. An argument, C accepts another argument, D if it has the same claim variable and value. *Identical acceptance* is operationalised as the same claim, data and inference procedures, whereas *similar acceptance* occurs if the claims are the same but data or inferences are not. Research was conducted in order to develop the dialectical model based on the generic/actual split.

Figure 3.11.6.4.1 illustrates an actual argument with data values set and a particular inference mechanism selected. It is an instantiated generic argument from

Context





<sup>&</sup>lt;sup>38</sup> In the project for assisting prospective tourists, the generic argument structure forms the basis for both the TOURIST agent and the TOUR advisor agent. The TOURIST agent currently interacts with a human tourist agent via text in a notepad interface which is parsed. This was developed into a dialogue interface. The shell permits the construction of both agents and the simple trusted negotiation mechanism is being implemented. More complex interactions were also studied.

Tourism where the claim is "The tour is *feasible* for the client", based on the data items and values given in the diagram. The inference procedure may simply be a query against a data base of information on tours. The justification can be given as one of the answers that satisfies the query and the appropriate information.

Stranieri and Zeleznikow (2001b) proposed an agent-based knowledge based approach to help regulate copyright. Five knowledge-based systems were described that are sufficiently flexible to protect authors rights without denying the public access to works for fair use purposes. The owner of a work and users who wish to copy a portion of the work are participants in the discursive community and share the same generic arguments. In order to copy the work, users construct their own actual arguments. The agent representing the owner determines whether to release the work or not by constructing its own actual argument. The generic/actual framework simplifies the negotiation protocol and assists in the deployment of an agent-oriented approach.

## 3.11.7 Envoi

Argumentation can be seen to have been applied to knowledge engineering in the 1990s and 2000s in two ways; with an emphasis on the dialectical nature of argumentation or with an emphasis on the structure of reasoning from a non-dialectical perspective. From the dialectical perspective, the way in which two or more participants in a discourse propose arguments that attack, rebut, defeat, subsume or accept others is paramount. From a non-dialectical perspective the way in which claims are laid out and inferred from premises is the object of attention. The argument structure proposed by Toulmin (1958) does not clearly delineate a dialectical perspective from a non-dialectical. Many applications of the Toulmin layout of arguments for knowledge engineering purposes vary the structure.

The variations made by and Kathleen Freeman (1994), Trevor Bench-Capon (1998), Johnson, Zualkernan, et al. (1993), and others can be understood as the result of different emphases on the dialectical or non-dialectical perspective, though in many cases the distinction is still blurred. A variation to the Toulmin structure called the Generic Actual Argument Model has been advanced in the present Section 3.11, where the distinction between dialectical and non-dialectical argumentation concepts is clearly defined. The GAAM is a non-dialectical model that facilitates hybrid reasoning, information retrieval, document drafting, knowledge acquisition and data mining. The non-dialectical GAAM has been applied for the construction of systems in refugee law, family law, eligibility for legal aid, copyright law. A dialectical model that is based on the GAAM is under investigation though early results with the automated provision of e-Tourism advice using an agent architecture indicate that a dialogue model is more readily realised simplified if built on the non-dialectical base.

# Chapter 4 Computer Assistance for, or Insights into, Organisational Aspects

# 4.1 Computer Help for Organising

# 4.1.1 Procedural-Support Systems for Organising the Evidence: CaseNote, MarshalPlan, Daedalus

*E-justice*, within *e-government*, is the use of information technology within judiciary systems. Applications of *e-justice* are a means to manage court proceedings, legal bars, as well as (e.g. in Argentina) reform at the legislative level.<sup>1</sup> For example, Politis, Donos, Christou, Giannakopoulos, and Papapanagiotou-Leza (2008) is a case study of three countries in the Balkans. Their experiences are analysed as an illustration of the experiences and problems in applying e-justice on a national scale.

The development of software for such a court of justice ranges from customized applications and in-house support for small scale computerization schemes that keep track of the judge's calendar and court records, up to large scale, cross-court internetworked pieces of software monitoring all aspects of court computerization like evidence book, decision delivery date book, summons, petitions, entries of court hearing outcomes, filling of appeals, etc. to all types of decisions issued by a lower or an appellate court.

It must be said that most often, the kind of technology resorted to in e-justice is not part of artificial intelligence. Moreover, it is only seldom that anything sophisticated used to be done concerning legal evidence within e-justice, as opposed to computer techniques used by forensic scientists in order to process the evidence in their respective forensic discipline. Nevertheless, there exist some projects that

<sup>&</sup>lt;sup>1</sup> The information technology aspects of the preparation of the *Digesto Jurídico Argentino* were supervised by Antonio Martino, a well-known scholar in AI & Law. A consortium carried out two tasks, namely, the reduction of a Legislative Technical Manual (this was coordinated by Martino, and was completed in 2001), and the revision of every normative texts emanated since the 1853 Constitution (this was directed by Atilio Alterini). At www.sp.unipi.it/dsp/didattica/Digesto/manual.html (hosted by the website of the University of Pisa in Italy) it is possible to access a virtual reading room of all the laws, as well as an exemplificative method of law writing assisted by the computer.

deserve notice, and that are within e-justice rather than on its periphery. These are *procedural-support systems* for organising the evidence.

*Substantive*, as opposed to *procedural*, pertains to the rules of right administered by a court, rather than to how to administer it. For example, the order in which the parties and their witnesses testify belongs in procedure. Such terminology turns up in references to kinds of computer tools for assisting humans in handling court cases. The starting point of Prakken and Renooij (2001) is: "When procedural-support systems are to be useful in practice, they should provide support for causal reasoning about evidence", where: "Procedural-support systems are AI & Law programs that lack domain knowledge and thus cannot solve problems, but that instead help the participants in a dispute to structure their reasoning and discussion, thereby promoting orderly and effective disputes".

An important commercial tool for lawyers to organise the evidence for a trial (in a U.S. context), is *CaseMap*. What does already exist and is available to legal practitioners, to assist them with evidence? Products of CaseSoft, an American firm<sup>2</sup> – itself a division of DecisionQuest, the U.S. leading provider of trial consulting services – include the *CaseMap* case analysis software, *TimeMap* chronology-graphing software, and the *NoteMap* outliner (the latter, upstream of a document-processor or of the generation of a slide-show presentation).

With no relation to CaseSoft, there is a competitor of *CaseMap*, namely, *MarshalPlan*, which has long been a prototype developed in U.S. academia by David Schum and Peter Tillers (respectively, of George Mason University in Arlington, Virginia, and of the Cardozo Law School in New York). *MarshalPlan* was described in Schum (2001). The early prototype was developed in *HyperCard*. Since the mid-2000s, *MarshalPlan* has been making use of *Revolution* development software (of Runtime Revolution Ltd. in Edinburgh, Scotland). By 2009, the version advertised on the Web was *MarshalPlan* 3.0.<sup>3</sup> Version 4.0 was accessible online, in 2011.<sup>4</sup>

Early reports about the project which led to *MarshalPlan* are Schum and Tillers (1989, 1990a, 1990b, 1991). The initial research that ended up generating *MarshalPlan* was funded by the U.S. National Science Foundation. David Schum was the grantee, and Peter Tillers was the principal consultant (the identification numbers of the grants being SES-8704377 and SES-9007693). The NSF support lasted for a total of seven years, and ended in the early 1990s (with no application for more NSF support). Tillers and Schum continued to study the use of software to marshal evidence. Tillers conducted those post-NSF studies largely by experimenting with the software concept which eventually came to be called *MarshalPlan*.

<sup>&</sup>lt;sup>2</sup> www.casesoft.com

<sup>&</sup>lt;sup>3</sup> http://tillerstillers.blogspot.com/2009/07/release-of-marshalplan-30.html (accessed in 2011). At another webpage, http://tillerstillers.blogspot.com/2009/09/theoretical-underpinnings-and-purposes\_22.html one can access theoretical notes on *MarshalPlan*.

<sup>&</sup>lt;sup>4</sup> http://tillers.net/MarshalPlan.4.0/Web/MarshalPlan.html "Evidence marshaling software on the web: MarshalPlan 4.0 (for the time being use Firefox 3.x; Chrome and Internet Explorer won't work for some reason)".

*MarshalPlan* is a tool for marshalling the evidence and structuring the chronologies and the arguments by means of a formalism, based on Wigmore Charts, at pre-trial and trial within the American system of legal procedure (not only for criminal cases, but in civil cases as well). The formalism is organised as an algebra. Statistical processing can be added. *MarshalPlan* is intended to provide:

- (a) An environment allowing the development of a case-specific database of evidence and evidentiary details;
- (b) Support for the development of lines of fact investigation;
- (c) Support and documentation of investigation protocols;
- (d) Organisation of evidence relevant to given proposed hypotheses or scenarios;
- (e) Visual representation of the chronological relationships between facts according to hypothesised scenarios;
- (f) Visual representation of chronologies involved in the narrative and proceedings;
- (g) Visualisation of argument structures;
- (h) Support and protocols for checking, testing, and evaluating evidence;
- (i) Temporal consistency checking;
- (j) A bridge to forensic disciplines such as forensic statistics.

*Daedalus* is a tool for the Italian *sostituto procuratore* (examining magistrate during investigation, and prosecutor at trial). In the late 1990s, it was adopted by magistrates in the offices of the judiciary throughout Italy. The Ministry of Justice had come to support it because of how magistrates had expressed their preference for it. It was developed single-handedly by Carmelo Àsaro (now a judge in Rome), and used by him in his daily routine as a *sostituto procuratore* in Lucca, Tuscany.

The great advantage of *Daedalus*, a tool whose conception is especially suited for countries whose criminal justice was shaped by the Napoleonic code (France, Italy, and the Netherlands are among them), is that it validates the procedure (the user is not allowed to take the wrong step), and provides a record of this having been the case (Asaro et al., 2001). In Section 4.1.3, we are going to provide details of *Daedalus*.

A sequel project of *Daedalus* is *Itaca* (initially called *Daedalus-Cassazione*), whose development for the Court of Cassation in Rome was contracted to Siemens, but whose original design is Asaro's. The needs to which *Itaca* responds were stated by the Criminal Sections (*Sezioni Penali*) of the Court of Cassation. These needs comprise the calculation of when preventative detention and generally preventative measures are going to expire; when prescription (i.e., bar of the statute of limitations) is going to apply to the offences concerned; and in general, data processing concerning offences. Both the data and juridical rules are coded. Of course, the jurisdiction in Italy is significantly different from that of Anglo-Saxon countries, and even within the United Kingdom, there are difference between Scottish procedural and substantive law with respect to England and Wales. It is nevertheless important to also get a feel of tools for a jurisdiction from the Continent.

Elsewhere in this book, we are going to discuss link analysis (Chapter 6) and then (Chapter 7) Richard Leary's FLINTS project, whose earlier phases had been

within the police, and then in academia (as a doctoral project), before further development within corporate business. In the late 1990s, a Detective Inspector at the West Midlands Police, with headquarters in Birmingham, Leary was playing host to well-received talks on formal approaches to evidence; e.g., in 1998 David Schum gave there, in front of about 70 police officers, a "talk on computer applications to discovery and fact investigation", and he "focused of course on *MarshalPlan*" (from a posting by Schum at an e-list), by which time he had already spent about seven years about the project together with Peter Tillers.

Nevertheless, *MarshalPlan* is not only for fact investigation. It is a tool that finds application in litigation, not only in criminal cases, but also in civil cases. Potential users of *MarshalPlan* include:

- (a) Police officers engaged in the investigation in criminal cases;
- (b) Prosecutors and defence counsel engaged in informal and pretrial fact investigation;
- (c) Litigation paralegals (legally-trained assistants to lawyers), at legal practices which specialise or engage in civil litigation, for the purposes of fact investigation in connection with civil cases;
- (d) Expert witnesses with respect to questions of fact;
- (e) Investigating (examining) magistrates, in countries where this role applies; and elsewhere (such as in the U.S.A.): judges when required to pass on the adequacy of investigations conducted either by public prosecutors or private counsel;
- (f) Where this is allowed (the U.K. and some Commonwealth countries): judges, for the purposes of summation of the evidence by the judge for the benefit of a jury;
- (g) Law teachers involved in trial practice programs and clinical education in litigation.

## 4.1.2 The Lund Procedure

Robert Goldsmith (1989), working at the University of Lund in Sweden, outlined a plan for a piece of software, to be implemented using logic programming, and "consist[ing] of three basic levels: a database level, an information management level, and a user interface level" (ibid., p. 322). The user was to be given an online tutorial about how to use the so-called *evidentiary value model*, and then the program would be used for "analyzing a specific case after the user has gained access to the evidence in its entirety" (ibid.).

The user would provide assessments about how the case was to be structured, and the program would provide some guidance. First, the user would provide "some general designation of the case together with some basic facts about it" (ibid., p. 323), and the next stage would have the user input *scenarios*: "one or more brief accounts of the events which the evidence suggests may have occurred" (ibid.).

Next, "the user decides what evidentiary themes should be considered and inputs a brief description of each", being able to refer to the scenarios (ibid.). Thus, a *struc*-*tured list of themes* would be created. Next, the user would produce an *evidentiary list*, by subdividing the body of evidence. Next, at the user's discretion, "information of various types which can be of help in evaluating the evidence" would be fed in by the user; e.g., "comments by the user; general information external to the case but of possible relevance to it; arguments by the prosecutor, the defense attorney, or the counsels to the litigants; and conclusions and arguments of a statistical nature" (ibid., p. 324).

Next, the user would access "both the evidentiary list and the structured list of themes", in order to produce a preliminary *list of evidentiary facts*, and being "a list of separate portions of the evidence which appear to possibly be related in a causal or logical implicative way with one or more of the themes, or with the negation of these (as counterevidence)" (ibid.).

The next stage concerns *evidentiary relationships*: "The user is to indicate for each theme separately, which of the evidentiary facts appear linked with it in terms of a possible evidentiary relationship. If two or more themes are viewed as belonging to a chain of evidence, they are dealt with partly as a unit" (ibid.). For each evidentiary relationship, the user was also expected at this stage to state "whether it can be seen as supporting the theme or supporting the negation of the theme" (ibid.), and "whether it appears to involve the theme being a cause of the evidence, the evidence being a cause of the theme, or the evidence logically implying the theme" (ibid., p. 325). A preliminary *list of evidentiary relationships* would have thus been produced by the user.

During the next stage, the user would have been shown that list, and required to apply to each item in it "the quality of evidence criteria (for adequacy of investigation, and for specificity and coherence" (ibid.). In case those criteria were, in the user's opinion, not met, then an evidentiary relationship would be removed (and possibly an evidentiary fact would be removed, but it may be involved in more than one relationship). Any item thus removed was to be placed on the evidentiary list, where it would be "marked as having failed to meet the respective criteria" (ibid.).

It is at the next stage, *Evidentiary Value* (Goldsmith's ninth step), that the computer would have played any role other than in structuring the editing. It is also at this stage, that Goldsmith's procedure became quite committed to quantification either in line of the Scandinavian school of legal "science", in terms of strength of evidence (Ekelöf, 1964), or of outright probabilistic models. "The user's task is to assess, either directly or with varying degrees of computational help from the computer, the combined evidentiary value of the evidentiary facts in question in supporting the theme. (If only one evidentiary fact is seen as pertaining to a given theme, the user simply assesses its evidentiary value directly.)" (ibid.).

The computer would be fed intuitive assessments from the user, and would apply to them prescriptive rules. "The user is also given the choice, whether receiving computational help or not, of conceptualizing evidentiary value in strictly probabilistic terms or in terms of strength of evidence" (ibid., p. 326). The output of this stage is the *structured list of themes and evidentiary values*.

Goldsmith's tenth step was *Subordinate Decisions*: "the user may decide here to make various subordinate decisions applying either to individual themes, or to sets of themes that are logically related. Each such decision concerns whether or not the theme or set of themes in question should be accepted, that is, seen as adequately supported by the evidence" (ibid.). The final stage was for the user "to reach an overall decision" (ibid., p. 327). Goldsmiths envisaged that the program could be used for training, or "for facilitating research on use of the model and on the evaluation of judicial evidence generally" (ibid.), or for assisting a person working on the judicial evidence of a specific case.

Goldsmith conceded that the third kind of use, i.e., for practical purposes "in a manner which could directly affect the outcome of a case" (ibid.), would have necessitated further study that would involve "careful evaluation of the program's limitations and weaknesses" (ibid.), and to include features "aimed at counteracting insofar as possible whatever tendency the user might have to place undue reliance on the program" (ibid., pp. 327–328). In fact, because of the use made of quantification, especially if a probabilistic model is adopted, stage nine was threading on controversial ground, especially if the program was intended for use while working on a case on which the court was yet to find.

Therefore, Goldsmith's (1989) project fits among procedural-support systems, and its main contribution is the procedure itself. The description was quite vague about argumentation, yet relationships clearly had to capture argument structure. Goldsmith (1989) intended the user to use the so-called evidentiary value model but he also described an alternative model, being the *theme probability model*, about which he had already written in Goldsmith (1986), and which applies to judicial decision-making "an approach to probability assessment which is a widely accepted one within the natural and social sciences, whereas the evidentiary value model represents a more unconventional approach to probability assessment, one which has been examined mainly within the judicial decision making area, where the model itself is still not particularly well known. Neither model can be said to contradict the other, however, in probability theoretical terms" (ibid., p. 321). The difference between the two models consists "in the event to which probability assessments apply, this being for the theme probability model the truth of the theme, for the evidentiary value model the existence of a causal or logical link between the evidence and the theme" (ibid.).

# 4.1.3 Daedalus, a Procedural-Support Tool for the Italian Examining Magistrate and Prosecutor

#### Carmelo Asaro, Ephraim Nissan, and Antonio A. Martino

#### 4.1.3.1 Background of the Project, and Its Users

*Daedalus* is a computer tool, developed by an Italian magistrate – Carmelo Àsaro (now a judge) – and integrated in his own daily routine as an examining magistrate

conducting inquiries, then as a prosecutor if and when the case investigated goes to court. This is a role that in Italy goes by the name *sostituto procuratore*.

Around the year 2000, *Daedalus* was adopted by magistrates in judiciary offices throughout Italy, spawning moreover other related projects. Interestingly, whereas the tool was initially used by Asaro himself in his judiciary office in the Tuscan town of Lucca, it was eventually offered to other *sostituti procuratori* to try, and their positive response provided a strong incentive for Italy's Ministry of Justice to have *Daedalus* adopted in the offices of all *sostituti procuratori*. In practice, the ministry was complying with the requests of the intended users.

Unlike in the Anglo-American system, in Italy inquiries are directed by an examining magistrate, and if the decision is eventually reached to take the suspects to court, that is, to prosecute, then the examining magistrate may well become the prosecutor (in Italian, *pubblico ministero*, or *P.M.* for short). The now Romebased Judge Asaro, who used to carry out these roles while a *Sostituto Procuratore della Repubblica* in Lucca, in the late 1990s put to good effect his computing programming skills and developed *Daedalus* single-handedly.

This resulted in the tool being especially appealing to his Italian colleagues, as the ergonomics was tailored exactly to fit their day-to-day routine, validating every step they may take. At first, the use of this computer tool became integrated in Asaro's daily routine, both while investigating cases, and while prosecuting.

Subsequently, the tool was distributed and experimented with by *sostituti procuratori* throughout Italy, and their overwhelming support of the tool encouraged steps of official endorsement of *Daedalus* being taken on the part of the Italian Ministry of Justice, which distributed it to all judiciary offices in the country. For a while, Asaro was seconded to a public body entrusted with the computerisation of public administration and the judiciary.

In this chapter, we have already mentioned *Daedalus* in Section 4.1.1. In the main, the present Section 4.1.3 is based on Asaro et al. (2001). The illustrations are based on screens of *Daedalus*, but the text appears here in English instead of in Italian, which is the language of *Daedalus*.

### 4.1.3.2 General Remarks About Italian Procedural Law

In the 1990s and around the year 2000, procedural law was being reformed in various countries in Continental Europe, including Italy (as well as various countries in Eastern Europe). The general trend was towards moving away, at least to some extent, from the *inquisitorial* system that has been traditional in those countries, towards an *adversarial* system inspired by the Anglo-American system, usually without going all the way, but by just incorporating major aspects of the adversarial system. The Italian legal system used to be of the inquisitorial type, being part of Continental Law, and based on the Napoleonic code, like French law and Dutch law.

In 1989, Italy's new *Codice di Procedura Penale* (code of criminal procedure) was introduced, which adopted the adversarial system. Until 2010, the import of this reform was rather enfeebled (bringing back elements of the old system) by

about eighty legislative interventions, introducing exceptions to the reform, and that have made the input of the evidence into a trial more complex.

Quite importantly – notwithstanding there also being lay judges (*giudici popolari*, i.e., jurors) – professional judges who preside over criminal trials in Italy are much more important for the adjudication, than in trials by a jury the United States or the United Kingdom.

In the Anglo-American system, the jury provides a verdict, but does not give a motivation for their decision. It has been said that in a sense, this aspect of the jury still retains a principle of the older trials by ordeal. The jury does not have to rationalise their conviction, in the way that trained judges on the Continent need to do while providing a written motivation for their verdict.

By contrast, in the Anglo-American system there is *evidence law*, and in particular, *exclusionary rules* about the admissibility of the evidence. In Italy (like also in France), so stern a regulation about the admissibility of the evidence is not to be found, and this absence is obviated by there being the possibility to bring the matter to a *Corte d'Assise* (Court of Assizes, but the sense is not identical with those in, say, Scotland or the United States).<sup>5</sup>

At any rate, in Italy a verdict comes with a judicial motivation. In Italy, the judge is required, while writing down the motivation, to take into account also counterevidence to the decision taken, the final speeches to the bench given by the lawyers of both parties, and what emerged from cross-examination.

Even so, with a judicial motivation, there is no way to observe or to probe into the "internal forum" (*foro interno*) of the judge, i.e., into what actually went on in the judge's cognition. In the United States in the second half of the 19th century, the prominent jurist O. W. Holmes, Jr., suggested that how an adjudicators actually makes decision may even depend on his digestion. The psychology of judicial sentencing is the subject of Fitzmaurice and Pease (1986) and of Pennington and Lloyd-Bostock (1987).

<sup>&</sup>lt;sup>5</sup> Up to 2000, Italy had the following kinds of judges and courts: *Giudice di pace* (Justice of Peace), without criminal jurisdiction; *Pretura* (Magistrate's Court), which has been abolished since, and used to be a court of first instance, with a civil and criminal jurisdiction; *Tribunale*, being a court of first instance for more serious civil and criminal cases (moreover, it used to hear appeals from the *pretura*); *Giudice di sorveglianza*, responsible for the enforcement of sentences; *Tribunale per i minorenni* (Juvenile Court); *Corte di appello* (Court of Appeal); *Corte di cassazione* (Court of Assizes, only for criminal prosecutions); the *Commissario per la liquidazione degli usi civici* (Commissioner for easements and rights of use), and the *Tribunale superiore delle acque* (High Court of Waters).

In June 1999, a reform of the system started to be implemented, intended to gradually modify the tasks and functions of the judicial offices firstly in the civil and then (from January 2000) in the criminal sector. Through the institution of a *giudice unico di primo grado* (single-judge court of first instance), aimed at making trials more rapid and procedures easier, the jurisdictions of the *preture* (magistrates' courts) and *tribunali* (courts) have been merged and the *pretore* office (i.e., the judge sitting in the *pretura*) abolished.

When it is more than one professional judge who adjudicate at a trial, and the verdict is reached by a majority, in Italy there is no possibility of the judge in the minority writing down a *minority opinion (motivazione dissenziente)*.

There is a paradox, in Italy, in that whereas judges have to provide a written motivation for their finding in a case, nevertheless in such trials that a procedural shortcut (*giudizio abbreviato*) was adopted, the judge releasing the motivation may even be different from the judge who gave the verdict. Some jurists in Italy find this surprising, as this exception severs the dependency of the judicial motivation upon the proceedings that took place in court.

Italian law does not envisage such a situation that a judgement be invalidated because the judicial motivation is insufficient. But nevertheless, mistrial can be declared because of a defect of the judicial motivation. For example, in a particular case, a handwritten motivation has been invalidated because unreadable. The Giuffrida Committee decided that this was a "general annulment" (*nullità generale*), so the case was returned to the first-degree court. Had it been "relative annulment" (*nullità relativa*) instead, the case would go to a court of appeal.

#### 4.1.3.3 The Phases of an Inquiry in Italy

In the Italian legal system, procedure for a criminal case basically consists of three phases:

- The preliminary inquiry (carried out by an examining magistrate). In the old inquisitorial system, this would be conceived of as an objectively conducted stage (just as the judge, in the trial which follows, is above the opposed parties). However, the 1989 reform has redefined the inquiry as being the activity of one of the parties, in a quasi-adversarial perspective (a very limited form of Americanisation);
- (2) The debate in court (in Italian: *il dibattimento*);
- (3) Appeal (in Italian: *il giudizio di impugnazione* or *appello*).

Subsequently to the 1989 reform, *trial* (Italian: *processo*) is a name that only competes to the second and third phase, as the accusation, put forth by the prosecutor (*pubblico ministero*), is submitted to the judgement of an impartial third party, namely, the judge.

This is a bench trial, judged by a trained judge (unlike the involvement of lay factfinders, i.e., jurors, in the Anglo-American system: the reform in Italy introduced the *giudici popolari* for some trials, but these are under the firm control of the judge, who is the actual judicial decision-maker).

Since the 1989 reform, proof is construed during the debate in court, out of the dialectic between the prosecution and defence. A consequence of this is that the inquiry of the examining magistrate, turned prosecutor, can no longer be used (or even, for that matter, known) by the judge. Said otherwise, the state is represented by the prosecutor and is represented by the judge, but these two functions are now neatly separated.

The examining magistrate conducts an inquiry not out of a preconceived notion that the accusation will be proven, but rather in order to identify sources of evidence that will eventually be submitted to the judge during the trial (by which time, the examining magistrate will have become the public prosecutor in the case at hand). This is clearly a legacy of the inquisitorial system, and it is bound to be there for the very reason that the chief investigator and the prosecutor are both magistrates, and for that matter, they usually are the very same person.

Nevertheless, the rule stated above – the one by which the preliminary inquiry as conducted by the examining magistrate cannot be used (or even known) by the judge – does not always apply. There are given categories of cases, explicitly stated in the Italian criminal procedure code, in which the activities carried out by the investigating magistrate can be both known and used as evidence by the judge. These are situations in which those activities could not be usefully "replicated" at trial by the prosecutor because of reasons which are either inherent *ab origine* (such as when the evidence pertains to a requisition or perquisition which took place during the inquiry), or *intervenient* (such as when a person who made a deposition during the inquiry, died meanwhile, and therefore cannot testify in person at trial; contrast this to how hearsay is treated in Anglo-American law).<sup>6</sup>

The stage at which the inquiry takes place is the one with which *Daedalus* is principally concerned. It starts once the examining magistrate receives the notification of the crime (called in Italian a *notizia di reato*). This act may take various forms: either the Polizia Giudiziaria (which is the usual case), or a private person communicates to the Procura (where a substitute procurator will take care of the case *qua* examining magistrate) a notification (*atto*) which may be a *denuncia* (accusation), or an *esposto* (petition), or a *querela* (suit), and in which one or more persons are indicated as being the perpetrator of one or more offences.

The examining magistrate checks the *notizia di reato*. In case he or she does not need discard it (as in the case of an anonymous denunciation), s/he takes the step of having the *persona indagata* (i.e., the person subjected to the inquiry: the suspect) inscribed in the *registro degli indagati*, with a mention of the offences ascribed to the given person.

This step is crucial. It has important effects:

• firstly, it demarcates the *subjective boundaries* permissible for the inquiry (that is to say, it is forbidden to investigate persons who are different from the ones who were so inscribed in the *registro degli indagati*);

<sup>&</sup>lt;sup>6</sup> Hearsay testimony especially in the context of the Italian jurisdiction was discussed in a book by Balsamo and Lo Piparo (2004). An interesting different subject is the status of the testimony given by somebody at a related trial or a trial for a related crime; this was discussed in a book by Bargis (1994), in the Italian context. This is also treated in Ferrua (2010, section 15). The relevant act is Italy's art. 192 c.p.p. (according to the new *Codice di Procedura Penale*), paragraphs 3 and 4. The law makes such testimony admissible, on a par with the testimony of a co-defendant at the same trial. Such testimony can be evaluated, but more caution is need than with other witnesses: it can only become proof if there is independent corroboration.

- secondly, it demarcates the *objective boundaries* of the inquiry (as only those offences which were recorded in the given entry of the *registro degli indagati* can be permissibly investigated);
- and thirdly, it sets the beginning of the *indagini preliminari* (i.e., the preliminary inquiry), whose duration is to be no longer than six months, unless some limited prorogation is obtained.

This phase, concerning the *registro degli indagati*, is of course subserved by *Daedalus*.

Once the *notizia di reato* is so recorded in the *registro degli indagati*, the examining magistrate starts the inquiry, which s/he could then either carry out in person, or delegate to the Polizia Giudiziaria. If there is such a delegation indeed, it may be concerning individual actions within the inquiry, or then of the inquiry as a whole.

If it is only individual actions within the inquiry which are being delegated to the Polizia Giudiziaria, the latter is only one authorised to carry out those specific actions as well as such actions which are their direct consequence, but such being the case, the Polizia Giudiziaria is not authorised to carry out the inquiry itself.

In contrast, if the examining magistrate delegated the inquiry as a whole to the Polizia Giudiziaria, then both the strategic choices and the responsibility remains in the hands of the Polizia Giudiziaria, except the taking of such measures which by law it's only the examining magistrate who may take.

The examining magistrate carries out the inquiry by taking actions out of a set of categories (*attraverso l'emissione di atti tipici*), whose kinds are defined by the criminal code. Such actions include: a perquisition (*la perquisizione*), a requisition (*il sequestro*), the order to show something (*l'ordine di esibizione*), inspecting somebody or something (*l'ispezione di persone o cose*), eavesdropping to (*l'intercettazione di*) communications or conversations, taking information (*l'assunzione di informazioni*), or, then, carrying out an interrogation of a person subjected to the inquiry.

If so delegated, the Polizia Giudiziaria can nevertheless only take actions falling in a few of those categories – and then only if some conditions are verified (e.g., the Polizia Giudiziaria is allowed to take the initiative of carrying out a perquisition or a requisition only if an offender is caught redhanded, i.e., *solo nella flagranza del reato*, but otherwise must seek and obtain an authorisation from the examining magistrate beforehand) – whereas in contrast the investigating magistrate is allowed to take any of those actions.

Moreover, among the actions which can be taken there are such measures that restrict the personal freedom of a person subjected to the inquiry; this is only permissible when severe offences are concerned. Such measures include various kinds: incarceration as a precaution (*la custodia cautelare in carcere*), house arrest (*gli arresti domiciliari*), the obligation to only reside in a given place (*l'obbligo di dimora*), the obligation to sign (*l'obbligo di firma*).

However, the examining magistrate (the *pubblico ministero*, or *P.M.* for short) cannot currently, according to the present code of criminal procedure in Italy, on his or her own initiative restrict the personal freedom of a person; such a measure

can only be taken by a different magistrate: the so-called "judge for the preliminary inquiry", i.e., in Italian, the *giudice per le investigazioni preliminari* (whose acronym is *G.I.P.*). This role was introduced by law in order to check and validate the lawfulness of what the *pubblico ministero* does during the inquiry. The G.I.P. examines the evidence presented by the police and decides whether it is sufficient to send the accused for trial. This is much like the Crown Prosecution Service in England and Wales.<sup>7</sup>

The G.I.P. intervenes in the following few situations:

- Whenever the personal freedom of a person is involved;
- When the inquiry is concluded, which occurs when the P.M. decides to either dismiss the case or enact the *rinvio a giudizio*, i.e., take the case to court.
  - □ If the P.M. wants to go to court indeed, then the G.I.P. checks that there is enough evidence indeed to support the accusation. In case the G.I.P. finds that this is not the case, then the G.I.P. may either give order that a new inquiry be undertaken, or decide the *archiviazione del procedimento*, that is, that the case be dismissed.
  - □ If, when the inquiry is concluded, the P.M. wants the case dismissed and requests the *archiviazione del procedimento*, then the G.I.P. may either agree or disagree; if the latter, the G.I.P., deeming that there is enough evidence for pursuing the suspect in court, gives to order to prosecute.

# 4.1.3.4 The Criteria of an Inquiry

The actions taken by the P.M. during the preliminary inquiry are each expressly categorised by law (*atti tipici*). For the purposes of their being lawful, it is necessary that all conditions required for each action be verified; namely:

- that the action concerns a person subjected to the inquiry;
- that the given person has been inscribed indeed in the registro degli indagati;
- that the given action subserves the ascertainment of an offence;
- that the given kind of action be permissible for the given kind of offence the ascertainment of which it is intended to subserve.

<sup>&</sup>lt;sup>7</sup> The kinds of prosecutions in Italy around 2000 (at a time when magistrate's courts, the *preture*, hadn't been abolished as yet) included the following. Prosecutions were carried out by: the *Procuratore della Repubblica presso la Pretura* (Public Prosecutor attached to the Magistrate's Court); the *Procuratore della Repubblica presso il Tribunale* (Public Prosecutor attached to the County or Assizes courts); the *Procuratore della Repubblica presso il Tribunale per i minorenni* (Public Prosecutor attached to the Juvenile Court); the *Procuratore generale della Repubblica presso la Corte di appello* (State Prosecutor General attached to the Court of Appeal); the *Procuratore generale della Repubblica presso la Corte di cassazione* (State Prosecutor General attached to the Court of Cassation). There also are special public prosecutors: the *Procuratore nazionale antimafia* (State Anti-Mafia Prosecutor), and the *Procuratore distrettuale antimafia* (District Anti-Mafia Prosecutor).

The latter point is especially important. *Daedalus* punctiliously applies this criterion, by setting (so to speak) "roadblocks" along the control sequence of a session, so that actions be not taken that are unlawful. For example, consider eavesdropping on telephone communications. According to the Italian law, such a measure cannot be taken in order to ascertain any kind of offence. It is only permitted for some very severe offences (such as *ricettazione*, i.e., receiving stolen goods), which are expressly indicated in the code of criminal procedure, and this because eavesdropping impinges on the constitutional right of free communication.

Therefore, if the P.M. wants that a telephone conversation be subjected to eavesdropping, the authorisation to do so must be previously obtained from the G.I.P., and such an authorisation can only be given when the crime being investigated is as severe as to warrant eavesdropping. This situation had therefore to be reflected in *Daedalus*, at the time when the software came into being.<sup>8</sup>

Now, consider how the evidence is marshalled. As the inquiry unfolds, the P.M. tries to discover and elucidate the events, by gathering new elements of evidence. These are not "proof" (*prove*), but rather "sources for proof" (items of evidence, in Italian: *fonti di prova*). These in turn can be either "personal" or "real". "Real sources" (*fonti reali*) are such things or documents from which informations can be obtained that are useful to support the accusation. "Personal sources" (*fonti personali*) are such persons who have knowledge concerning the events, as well as, to some extent, the *indagati*, that is, the suspects, those very persons who are being subjected to the inquiry.

By law, the suspect, the *indagato*, is recognised the right not to answer questions that the P.M. is making during an interrogation. That the suspect actually opts to avail him- or herself of the right to silence<sup>9</sup> is, by law, considered not as evidence (*fonte di prova*), but rather as a means of defence.

Yet, those statements that were actually made to the P.M. by the informed person (who eventually at trial may called as *teste*, i.e., witness) or by the person investigated (who eventually at trial may have become a defendant, in Italian: *imputato*), can be used at trial as evidence, if the witness or the defendant are making at trial such statements that are in contradiction with something the same person had stated during the inquiry. If such a situation eventuates indeed, then the P.M., in his or her role as prosecutor at the trial, can signal the contradiction and have the court proceedings (*gli atti del Giudice*) incorporate those statements which had been made during the inquiry.

<sup>&</sup>lt;sup>8</sup> Wiretapping has been much debated in Italy in 2010, and is likely to undergo changes: this is not because of use by law enforcement, but because of widespread use on the part of journalists, and these sometimes publish confidential documents of the judiciary. One supporter of change has claimed that six million persons (out of a population of sixty million) have been wiretapped in just one year.

<sup>&</sup>lt;sup>9</sup> The right to silence and alternative self-protective choices for a person who is a suspect *(indagato)* in an inquiry, in an Italian context, are the subject of a book by Marafioti (2000).

Let us turn now to how the inquiry is closed. When the P.M. deems that the case has been adequately investigated,<sup>10</sup> the P.M. concludes the inquiry, in either way:

- If the P.M. deems the hypothesis that the suspect is not guilty of the offence ascribed (*nell'ipotesi di* opinio delicti *negativa*), then the P.M. requests that the case be dismissed (*archiviato*).
- If the P.M. sees merit instead to the accusation based on the evidence gathered during the inquiry, then the P.M. releases one of the *atti tipici* which the code of criminal procedure envisages, namely:
  - □ the request, made to the G.I.P., to
    - ➤ either prosecute (*citazione a giudizio*), or
    - prosecute directly (*citazione diretta a giudizio*), which is appropriate for lesser offences;
  - □ the request to condemn by decree (*richiesta di decreto penale di condanna*);
  - expressing an opinion concerning whether to agree the investigated person's demand that s/he be subjected to a lesser penalty (*parere sulla domanda di oblazione formulata dall'indagato*);
  - expressing an agreement concerning the investigated person's request of a shorter judicial path (consenso alla richiesta di giudizio abbreviato formulata dall'indagato). Actually, the path can be shortened to different degrees: there may be a giudizio abbreviato, or then a giudizio direttissimo, or even a giudizio immediato.

Let us consider these options in turn, leaving the discussion of the *citazione a giudizio* to the next subsection.

**Condemnation by decree** (*il decreto penale di condanna*): the P.M. asks the G.I.P. for a *decreto penale* if the P.M. deems that the appropriate penalty consists only of a fine (and not of restricting personal freedom of the person investigated). This also applies if detention is appropriate, but it is permissible and proper that detention be converted into a fine. The *conversione* procedure applies in given kinds of situations, and allows to forego detention at the rate of one day of detention corresponding to a fine of Lit. 75,000 (which was the case in 2001).

Such a procedure is not allowed if the offence can be pursued on the initiative of the plaintiff (i.e., if the offence is *perseguibile a querela della persona offesa*).

If the G.I.P. agrees the request made by the P.M., the G.I.P. releases a decree by which the person investigated – which by now is an *imputato*, i.e., a defendant – is condemned to pay the fine of the amount required. If within a given deadline the defendant does not appeal the decree, then this *decreto penale* (or *D.P.* for short) becomes operational (the Italian adjective for this is *esecutivo*).

<sup>&</sup>lt;sup>10</sup> The case being investigated is being *istruito*: this Italian participle for 'investigated' (only applied to the case, not to a person) is derived like the noun *istruttoria* and the nominal compound *fase istruttoria*, which also refer to the *indagini* [*preliminari*], i.e., the inquiry.

If the defendant appeals the decree instead, then the D.P. is no longer valid, and the G.I.P. has the defendant prosecuted in court (*rinviato a giudizio*), so that the defendant's liability be determined with those legal guarantees which a trial ensures.

Reduced fine (*l'oblazione*): by law, the person investigated can extinguish the offence by paying a fine whose amount is (according to the situation) one third or one half of the maximal *pena pecuniaria* (i.e., "fine") which is envisaged by law.<sup>11</sup> The *oblazione* procedure is only allowed for such offences which are punished either only with a fine, or with a *pena alternativa* ("alternative penalty"), i.e., detention convertible into a fine.

If the person investigated requests an *oblazione*, then the P.M. expresses his or her opinion, which he or she does by checking the case at hand: the P.M. may deem it to be the case that the request should not be granted, if there is a repeated offence (i.e., in case of recidivism), or if there are otherwise aggravating circumstances. If the P.M. deems that the suspect's request of an *oblazione* be granted, the P.M. transmits the P.M.'s favourable opinion to the G.I.P., so that the inquiry be closed.

Plea bargaining (*il patteggiamento*): the 1989 Italian code of criminal procedure has introduced this notion, which is commonplace in Anglo-American law,<sup>12</sup> but used to be unknown to the Italian procedural tradition. This notion has two formal names in the Italian legal lexicon, one with a higher formality, *applicazione della pena su richiesta*, and the other one, *patteggiamento*, being more usual and of a lesser degree of formality.<sup>13</sup>

In the new Italian code of criminal procedure, the two parties, i.e., the P.M. (the prosecution) and the *indagato* who faces becoming a defendant (*imputato*), have the option of reaching an agreement concerning which penalty is to be applied to the concrete case at hand. In order to make such an agreement easier to reach, the code allows a reduction of the penalty to be applied, namely, a deduction of up to one third of the penalty which could be expected to be obtained in court if there was no plea bargain. If the plea bargain consists of a penalty which envisages up to three months of detention, then it can be converted into a fine.

*Daedalus* can handle plea bargaining as well, with special buttons for increasing or decreasing the penalty; when during a session such a penalty eventually results that is lesser than three months of detention, then automatically a conversion grid to a fine is displayed by *Daedalus*. If, however, during the negotiation to reach a bargain the penalty increases back to three months of detention or more, then the conversion grid disappears from the screen.

### 4.1.3.5 Once the Decision to Prosecute is Taken

As announced in the previous subsection, let us discuss now the *citazione a giudizio*, i.e., when the decision is taken to prosecute a person investigated, who then becomes

<sup>&</sup>lt;sup>11</sup> In Italian, a fine is also called *ammenda* or, informally, *multa*.

<sup>&</sup>lt;sup>12</sup> Arno Lodder and John Zeleznikow provided an overview of computer-assisted dispute resolution (as being an alternative to litigation) in a book (Lodder & Zeleznikow, 2010). Plea bargaining is the subject of section 5.9 in that book.

<sup>&</sup>lt;sup>13</sup> Already an Italian book by Gambini (1985) discussed plea bargaining.

a defendant in court. Like any other action concluding an inquiry (*atto conclusivo dell'indagine*), the step being taken to prosecute (*la citazione a giudizio*), too, requires that the accusation be written down (*la previa redazione dell'imputazione*).

How is the *imputazione* (charge) edited? At the start of the inquiry, when the P.M. had been notified of the offence and had inscribed the name(s) of the person or persons to be investigated in the *registro degli indagati*, along with the charges ascribed, the P.M. had formulated sort of an accusation. This, however, was only to be a provisional charge, a hypothesis that the inquiry was to either confirm or discard.

When concluding the inquiry, the P.M. who is preparing the prosecution case is transforming the mere mention of the name (the *nomen juris*) of the given offence(s) into a discourse which explicates the temporal, spatial, and personal identity circumstances, in which the event took place in which the offence concretely took place.

It is no longer a category of offence which is being applied to the person investigated, but, rather, a concrete instance, with a constellation of contextual details. The charge, in the case of the prosecution, must be concrete enough for the defendant(s) to be enabled to try and defend him- or her- or themselves, and if the P.M. fails to make the accusation adequately concrete, it must be nullified because of its overly general statement.

The case of the prosecution delimits both objectively and subjectively the proof whose construal is sought in court. *Daedalus* contains an environment, called *Laboratorio*, in which the items of the *imputazione* can be edited into the prosecution report.

The next stage is the *citazione a giudizio*, and the case goes to court (i.e., the *vocatio in jus* takes place). The P.M. convokes the defendant to court, to be tried by the judge and so that the defendant could defend him- or herself from the accusation. The defendant has a right to "his day in court", as the English idiom has it.

For severe offences, there is an intermediate stage (which is sort of a filter) before going to court: there is a preliminary hearing (*l'udienza preliminare*) in front of the G.I.P., whose task is to decide whether there is enough evidence to warrant starting a trial. If the G.I.P. deems that this is not the case, then the G.I.P. can dismiss the case by giving an exonerating verdict (*una sentenza di proscioglimento*, acquittal). This is quite a delicate stage. Therefore, *Daedalus* activates a battery of validation checks, so that the completeness and the sufficiency of the inquiry be verified.

### 4.1.3.6 A Sample Session: The Bindi Extortion Case

We are going to describe the workings of *Daedalus* on a particular inquiry, based on one of the sections in Asaro et al. (2001). The inquiry considered is "Procedure no. 1250/2000 against Calogero Lo Dico, with the complicity of unknown persons". The initial image (Fig. 4.1.3.6.1) provides the start menu for the *Daedalus P.M. Assistant* program. The magistrate is registering the notification of offence against Calogero Lo Dico, accused of attempted extortion and damage resulting from fire.

The facts: during the morning of 3 Feb 2000, unknown criminals set fire to the warehouse belonging to Massimo Bindi, manager of a wholesale business trading in cereals, which had lately increased its activity. During the afternoon a man called



Fig. 4.1.3.6.1 The start menu of Daedalus

Calogero Lo Dico, a decorator, comes into Massimo Bindi's office and ascribes the fire to very dangerous "brainless riffraff" which it would be much better to pacify with an adequate sum of money. He proposes the sum of Lit. 50,000,000 ("Lit." are Italian Liras). Massimo's son, Luigi, who is observing at a distance, recognises Lo Dico as an habitual poker player at the "I Nuovi Dei" bar in Florence, which he himself frequents since he is sentimentally attached to Eleonora Ricci, the publican's daughter, who is the cashier there.

The Carabinieri immediately arrive, gather information from all those present and draw up the notification of offence which the magistrate is about to register. The magistrate clicks on the "New Registration" button Then he (it was Asaro) selects the item "Known – 1" (i.e., a given suspected person) from the list of known suspects (Fig. 4.1.3.6.2).



Fig. 4.1.3.6.2 A list of known suspects

TABLE NAME

1 Crimes against the person, honour, family,

Fig. 4.1.3.6.3 The initial	Suspect:	
record of a given suspect. In	Surname	Lo Dico
Italy, 'free' stands for any of	Name	Calogero
'unmarried', 'divorced', and 'widowed', on identity cards	Marital status	free
	Sex	M
	Offences	
Fig. 4.1.3.6.4 One of the subtables in the Crime Table of <i>Daedalus</i>	Cri	

Ν 0

	S crimes regarding autosteric polititori
	6 Crimes regarding acoustic pollution
stration grid opens up into	which the fundamental elements (surname,
ences for which proceeding	s are being brought forward) are inserted. The

domicile

2 Crimes against patrimony 3 Crimes regarding water pollution 4 Crimes regarding waste materials 5 Crimes regarding atmosferic pollution

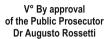
A regis name, offences for which proceedings are being brought forward) are inserted. The magistrate individuates two offences (damage resulting from fire – art. 424 Penal Code; attempted extortion – arts. 56–629 Penal Code). Refer to Fig. 4.1.3.6.3.

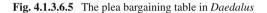
The offences have not been typed in directly, but they have been taken from the Crime Table (see Fig. 4.1.3.6.4), one of the environments upon which *Daedalus*' structure is based. The Crime Table comprises a set of tables; they each cluster together homogeneous offences. The data on the single offences, which Daedalus gathers with the user's input, are at the basis of all the following operations: calculation of the sentence in procedures by decree; calculation of plea bargaining (see Fig. 4.1.3.6.5); validation procedure; sufficiency checks; analysis of the effectiveness of rules of law, and so forth. A layout (i.e., pattern), which enables the unloading of information on offences from external databases or from the Web, is provided for.

After inserting the offences, the magistrate examines those tables which require additional information. This information is optional since, by default, Daedalus proposes as competent, the magistrate's office; as source of notification, a charge made by the Polizia Giudiziaria; as state of inquiry, the heading "to be examined". In this case, the magistrate still has to make his (or her) ideas clear. Therefore, he (or she) leaves the default options unchanged (see Fig. 4.1.3.6.6). Then he (or she) clicks on the "Continue" button, that is to say, on the >> button.

# Plea Bargaining

Components		( y m	station Jear, onth, ay )	Ammenda (Fine) in the case at hand		Deten ( yea mont day:	rs, hs,	Multa (Fine) as envisaged by the law
Basic punishment	Y	Μ	D		Y 5	M 0	D 0	L. 1.000.000
1 Aggravating	Y	Μ	D		Y	м	D	
2 Aggravating	Y	Μ	D		Y	м	D	
1 Extenuating	Y	Μ	D		Y 3	M 4	D 0	L. 670.000
2 Extenuating	Y	Μ	D		Y 2	M 2	D 20	L. 450.000
Continuation	Y	Μ	D		Y	Μ	D	
Final punishment	Y	Μ	D		Y 1	M 5	D 25	L. 300.000





### Other data:

Source of notification	Police office
Kind of notification	Charge made by Police
Notice of closed inquiry	No
State of the inquiry	to be examined
Police reference	Fin. Marco Orselli

### Acts and notes:

To close now	No
To delegate to the Police	No
Competent office	Procura presso Tribunale
Office location	Florence
Memo	No
To the secretary:	Nothing

Fig. 4.1.3.6.6 Supplementary data

*Daedalus* carries out a fairly complex activity of organisation and elaboration of the data and creates a file. This is the linking and propulsion centre of the judicial inquiry. On the one hand, it gathers and organises information; on the other hand, it bears all knowledge relative to the inquiry construction/validation routine. The file has various modules which correspond to distinct inquiry acts. These are organised in sets of information regarding the operation which must be carried out and, by means of set courses or action messages, they avoid deviation from the legal paradigm or from what was laid out by the user.

*Daedalus* doesn't confine itself to this. It also checks how many times, when and how the user makes use of its modules, as well as checking the results of the enforcement of the measures drawn up with the help of the modules themselves. This produces progress in the inquiry as the activities related to the investigation unfold, and it also brings about an increase in the knowledge of the facts regarding

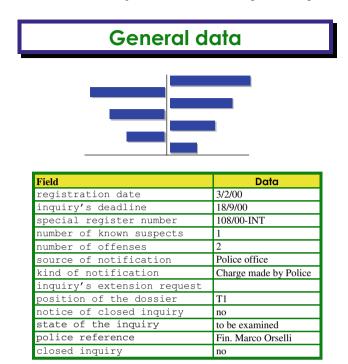


Fig. 4.1.3.6.7 General data table in *Daedalus*. "Fin." (i.e., *guardia di Finanza*) indicates that police constable Marco Orselli belongs to the branch of the police which investigates money-related offences. In the last row, "no" stands for "not closed"

the inquiry, something we may term a "metainquiry" aimed at further development and at addressing the validation procedures.

Let us get back to our sample case: the Bindi inquiry. *Daedalus* has already calculated the deadline for the preliminary inquiry (six months, which are suspended during the attorneys' holidays period, i.e., from August the 1st to September the 15th), and has organised the general data (see Fig. 4.1.3.6.7). It has, furthermore, created an individual file for the suspect (see Fig. 4.1.3.6.8). The magistrate reads the notice of offence again. There are some people whom it would be advisable to hear, namely: apart from the victim, i.e., Massimo Bindi, also his son Luigi Bindi, as well as Eleonora Pecci, the cashier at the "I Nuovi Dei" bar. The name of the victim is recorded automatically. The other two names must be inserted with the Add button (see Fig. 4.1.3.6.8).

Figure 4.1.3.6.8 shows the Subjects Window. This window applies to those involved in the procedure the same functions that the Crime Table carries out in regard to the offences. In fact, it puts the people's names in order, it classifies them according to their role, it gives information and performs operations that are important in a judicial context. For example, if Luigi Bindi is selected, then the Contact button will open the window shown in Fig. 4.1.3.6.9.

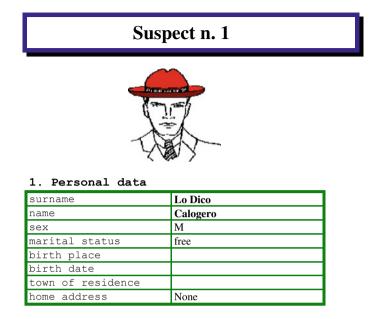


Fig. 4.1.3.6.8 The record of the suspect in the Bindi case, as being an example of a record of one of the members of the public who are involved in the inquiry

Daedalus - Implica Bindi, Luigi Bindi, Massimo Lo Dico, Calogen Pecci, Eleonora			
Role	Report	Complete	Delete
Link	Address	Edit	Close
Contact	Notes	Add	ñ

Fig. 4.1.3.6.9 A pop-up which opens when one of the persons implicated in the inquiry is selected



Fig. 4.1.3.6.10 Luigi Bindi, a witness who is the son of the victim, is given notice to appear

The window shown in Fig. 4.1.3.6.10 presupposes the knowledge that the magistrate is able to make contact with a person who is not a suspect, such as Luigi Bindi, in order to gather information, not only to charge with an offence which is the case of an interrogation of the suspect. Luigi Bindi, a witness who is the son of the victim, is given notice to appear.

On the contrary, if it is the name of Calogero Lo Dico, who is a suspect, is selected before activating the Contact, then *Daedalus* will open the window shown in Fig. 4.1.3.6.11, and which proposes interrogation as being the typical kind of contact between a suspect and the examining magistrate.

Calogero Lo Dico is accused of two offences: damage resulting from arson, and attempted extortion. These charges must be made clear. To record an individual it is sufficient to give information on his or her personal data, type of offence, and place where the fact took place. But in order to develop the inquiry and, in particular, draw up the act of accusation, something more is necessary. Alleging that Calogero Lo Dico has perpetrated an attempted extortion will not be enough. It is also necessary to enter what it consisted of, and in which manner and by which means it was carried out, in which circumstances of time and place, and whom is was perpetrated against.

The *Laboratory* helps in doing this. It is a typical *Daedalus* environment for the creation of acts of accusation or charges. It is a tool assisting with document drafting. *Daedalus* has two distinct environments which are also connected: the



Fig. 4.1.3.6.11 Contact with the suspect, Calogero Lo Dico

None

Extortion	
UC0221D	_
Basic hypothesis:	
Art. 629 Penal Code, because through obtained for <b>N</b> the wrongful profit of	
Case history:	

Fig. 4.1.3.6.12 The Workshop general pattern for extortion, within Daedalus

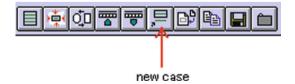
*Workshop*, structured as a charge layout editor; and the *Laboratory*, structured as an editor of charges. In the *Workshop* we can create a general pattern which is valid for any case. In the *Laboratory* instead we apply the general pattern to the particular case which is the object of the judicial inquiry.

Figure 4.1.3.6.12 shows the *Workshop* pattern for extortion. The *Basic Hypothesis* states: Art. 629 of the Penal Code, because [the perpetrator: known to the system] by violence, consisting in (enter data here), forcing [the victim: known to the system] to [something known to the system] obtained for the perpetrator the wrongful profit (enter data here), with damages for (enter data here). There also is an entry for the *Case History*.

The magistrate notices that the pattern (or layout) presents a case of extortion with violence while not that of extortion with threats. The magistrate decides to insert the latter hypothesis. In order to do this, the magistrate must implement the case history giving way to the procedure with the New Case button on the toolbar, as shown in Fig. 4.1.3.6.13. The magistrate inserts the new case, by formatting the text with the layout editor buttons: see Fig. 4.1.3.6.14.

Now the layout is ready to be used in the *Laboratory*. The magistrate closes the Crime Table and goes back to using the file. He clicks on the *Laboratory* button, that is to say, a button showing the icon of a robot. As an effect of this, *Daedalus* opens the pop-up window shown in Fig. 4.1.3.6.15.

Two function modes are provided: one in *self-composition*, when an accusation layout already exists, created by the *Workshop*; and one in *assembly*, when it is

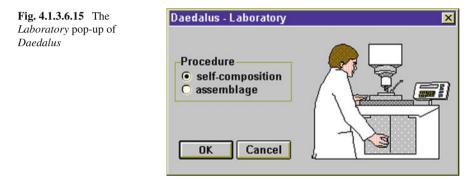


**Fig. 4.1.3.6.13** As the examining magistrate intends to insert a charge of "extortion with threats", further to the already entered charge of "extortion with violence", on the toolbar the magistrate clicks on the button for a new case



art. 629 Penal Code, because, by means of threats, consisting in **N**, forcing [] to [], the defendant obtained for **N** the wrongful profit of **N**, with damages for **N**.

**Fig. 4.1.3.6.14** The magistrate enters a charge for extortion with threats. Distinguish between the red crayon, where it is the user who has to insert data, and the empty space which we represent here as [], and which is some data (e.g., the name of the victim, and what the victim was forced to) that *Daedalus* is expected to insert automatically, because it already knows about it in the particular case at hand



necessary to create the layout from scratch. The magistrate selects *Self-composition* and then, one by one, the two offences included in the charge: see Fig. 4.1.3.6.16. A relevant article of the *Codice [di Procedura] Penale* is selected.

*Daedalus* shows the *Workshop* layouts (i.e., patterns) for elaborating charges. Let us see how a charge for extortion is processed. First of all the *Workshop* layout is shown, to which, as we have seen, the case of extortion with threats has been added: see Fig. 4.1.3.6.17.

The red crayons with which the text is interspersed have two functions: they are the place cards for the data necessary to complete the layout, but they are also a

Daedalus - Laboratory in self-con	nposition 🔀
Select the crime (art. 424 c.p.) (art. 629 c.p.) (C) (C) (C) (C) (C) (C) (C) (C	
OK Cancel	- Arter

Fig. 4.1.3.6.16 The Laboratory self-composition pop-up of Daedalus

Extortion

UC0221D

### **Basic hypothesis:**

Art. 629 Penal Code, because through violence, consisting in  $\mathbb{N}$ , forcing to [], obtained for  $\mathbb{N}$  the wrongful profit of  $\mathbb{N}$ , with damages for  $\mathbb{N}$ .

#### **Case history:**

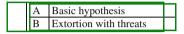


Fig. 4.1.3.6.17 The Workshop general pattern for extortion, once the charge for extortion with threats has been entered

Fig. 4.1.3.6.18 An example of advice provided by *Daedalus* about how to fill in information requested by a *red* crayon (a place-holder)



source of information on the type of data required. If the user asks *Daedalus* for help with selecting this mode for data insertion, the user will receive precise suggestions; e.g., in Fig. 4.1.3.6.18 the advice is that unlawful profit was sought by the defendant.

This capability of *Daedalus*, of providing help upon request when it comes to filling in data into a pattern, is especially useful when collaborators of the prosecutor are entrusted with preparing the bill of indictment. Asaro claimed that in such situations, *Daedalus* acts as a "cultural prosthesis" (*protesi culturale*), enabling the human collaborator of the prosecutor to be up to the task.

In processing the charge, *Daedalus* uses its juridic and linguistic knowledge and logic, it matches them to the information obtained from the user, and generates a linguistically correct document made up of descriptive proposals for the charge, which is legally suitable for being the bill of indictment (*atto d'accusa*). Once the latter is done, it is then transferred into an environment called *Storehouse*, from which it will be taken for all subsequent uses. See Fig. 4.1.3.6.19, which shows the *Storehouse* containing, in the *Management* data, the items: Origin of the last charge: Alpha; Procedure number: 1250/00; Number of charges: 1; Relapse Check: no. The *Charges* section states, under the name "Lo DICO Calogero", one entry, namely, (a), whose text states:

Offence p. and p. from art. 56-110-629 Penal Code, because, together with other people not yet identified, after having set fire to the warehouse belonging to the business whose manager is Massimo Bindi, dealer in cereals, by means of threats, consisting in implicitly pointing out that further serious damage would be incurred by his possessions and person, suitable action was taken to force Massimo Bindi to pay him and his partners the wrongful profit of Lit. 50,000,000, to Massimo Bindi's prejudice.





- \* Origin of the last charge: alpha
- \* Procedure number: 1250/00
- \* Number of charges: 1
- \* Relapse check: no

### Charges:

#### Lo Dico Calogero:

a) Offence p. and p. from art. 56-110-629 Penal Code, because, together with other people not yet identified, after having set fire to the warehouse belonging to the business whose manager is Massimo Bindi, dealer in cereals, by means of threats, consisting in <u>implicitly pointing out that further serious damage would be incurred</u> by his possessions and person, suitable action was taken to force Massimo Bindi to pay <u>him and his partners</u> the wrongful profit of Lit. <u>50,000,000</u>, to <u>Massimo Bindi</u>'s prejudice.

Verified in Florence 3 Feb. 2000

Fig. 4.1.3.6.19 The Storehouse environment in the Bindi case

The next line states: "Verified in Florence, 3 Feb. 2000".

Now that the record for the charge is ready, the magistrate seeks a contact with competent people to verify it. The magistrate activates the *Person* window, and selects Massimo Bindi. A form is given for the draft of an *Examination* record. At this point, *Daedalus* provides assistance by supplying the following three procedures: (a) check of the charge; (b) study of the case; (c) processing of the questions.

With the first of these three procedures, *Daedalus* provides the magistrate with information concerning the main points of the prosecution, in order to direct the magistrate in the examination of the competent person. See Fig. 4.1.3.6.20. With the other two procedures, *Daedalus* respectively studies the case and processes the questions to be asked (see Fig. 4.1.3.6.21).

*Daedalus* is not equipped with a repertoire of ready-made questions, but it resorts to modules which pertain to given judicial situations, and which have morphological and syntactical cues for their assembly, and logical structures for coordination. The magistrate completes the examination by asking for additional information. In this specific case important circumstantial evidence makes it advisable that Lo Dico, the person accused of having committed the offence, be taken into custody. The magistrate clicks on the file's *Acts* button. *Daedalus* invites the magistrate, by means of a dialogue window (see Fig. 4.1.3.6.22), to choose specifically whether he or she wishes to develop, or just operate, or if he or she wants to end the current investigation instead.

# Bindi Massimo's examination Check of the charge's element -a)

# $\bigvee$ Charge's text:

a) Offence p. and p. from art. 56-110-629 Penal Code, because, together with other people not yet identified, after having set fire to the warehouse belonging to the business whose manager is Massimo Bindi, dealer in cereals, by means of threats, consisting in <u>implicitly pointing out that further serious damage would be</u> <u>incurred by his possessions and person</u>, suitable action was taken to force Massimo Bindi to pay <u>him and his partners</u> the wrongful profit of Lit. <u>50,000,000</u>, to <u>Massimo Bindi</u>'s prejudice.

Verified in Florence 3 Feb. 2000.

# ✓ Accused persons: Lo Dico Calogero

# ✓ Elements to be proven: The violent action carried out: <u>in implicitly pointing out</u> <u>that further serious damage would be incurred by his</u> <u>possessions and person</u> Advantaged Person: <u>him and his partners</u> wrongful profit obtained: <u>Lit. 50.000.000</u> Disadvantaged Person: <u>Bindi Massimo</u>

Fig. 4.1.3.6.20 Check of the charge, in the presence of the victim

In this specific case, the magistrate chooses to develop. *Daedalus* invites the magistrate to select the suspect and the offence. In proceedings against more than one person this is a fundamental junction since *Daedalus* uses the dialogue window, for the act that we wish to perform, in order to:

- Check that the act is justified for the offence for which we are proceeding; e.g., imprisonment would not be permitted where a simple fine is appropriate.<sup>14</sup>
- Check that the offence, for which we are proceeding, has previously been ascribed to the suspect, to avoid that the action about to be taken, be wrongly

<sup>&</sup>lt;sup>14</sup> Incidentally, measuring how serious an offence is, is a subject that has been researched in criminology (Parton, Hansel, & Stratton, 1991; Pease, Ireson, Billingham, & Thorpe, 1977).

taken concerning suspect A, whereas the offence is intended to be ascribed to suspect B.

- Check that the data are complete and that the guarantees for the defence have been fulfilled.
- Check that the prescriptive and factual requirements for the bill of indictment have been fully complied with.

Daedalus - Question Maker
I have studied the case. Now I am able to elaborate questions. Daedalus
OK

### Question:

Mr. Bindi, this Office is proceeding for a case of extortion, a crime committed in Florence the 3/2/2000. Are you aware of facts?

### Auswor:

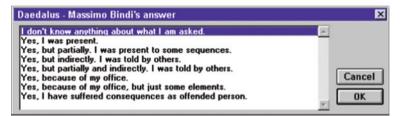
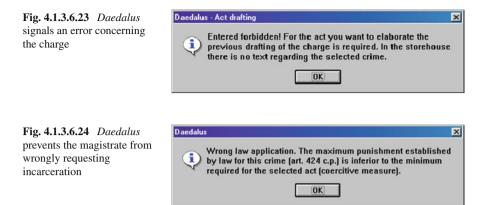


Fig. 4.1.3.6.21 The examining magistrate questions the victim

aedalus - acts Investigation strategy:	
development     routine operation     conclusion	
	Cancel OK

Fig. 4.1.3.6.22 The Acts pop-up of Daedalus: what to do with the inquiry?

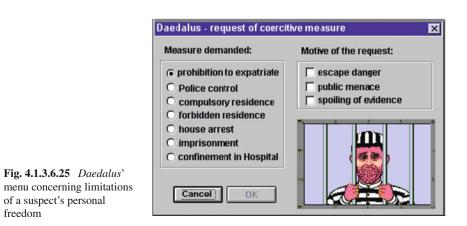


The magistrate tries to ask for custody in prison only for the damage to the warehouse. *Daedalus* checks the data and notes that the charge formulated in the *Laboratory* is for extortion and not damage resulting from fire, which is only quoted. It therefore blocks the magistrate with the reaction shown in Fig. 4.1.3.6.23.

Nevertheless, even if this charge is set up, the magistrate would not succeed in trying to ask for custody in prison for such an offence. *Daedalus* observes that such a criminal hypothesis does not consent custody in prison and blocks the magistrate by displaying a message, as shown in Fig. 4.1.3.6.24.

However, going ahead with the more serious offence of attempted extortion, *Daedalus* opens a dialogue window so that the magistrate may specify the measure requested and the precautionary requirements: see Fig. 4.1.3.6.25.

Take note that until at least one precautionary requirement is selected, the OK button remains disabled. This is a typical way in which *Daedalus* enforces compliance with important juridical precepts. This is an important function of *Daedalus*: every stem is validated.



## 4.1.3.7 Effects of the Jurisdiction: Why Is *Daedalus*' Emphasis on Step-by-Step Validation So Important in Italy? And Why Is the Statute of Limitations So Important in *Itaca*?

A sequel project of *Daedalus* is *Itaca* (initially called *Daedalus-Cassazione*), whose development for the Court of Cassation in Rome was contracted to Siemens, but whose original design is Asaro's. The needs to which *Itaca* responds were stated by the Criminal Sections (*Sezioni Penali*) of the Court of Cassation. These needs comprise the calculation of when preventative detention and generally preventative measures are going to expire; when prescription is going to apply to the offences concerned; and in general, data processing concerning offences. Both the data and juridic rules are coded.

In Italy, the statute of limitations (*prescrizione*) for offences is a major problem, as it is calculated starting when the offence was perpetrated, rather than starting when it was uncovered, and such time limitations are not stopped when a trial begins, but also apply to when the matter must be tried by, by the last court entrusted with the case, be it even the Court of Cassation. It is therefore more likely that the statute of limitations would run out before the deadline, i.e., in Italy, before the final verdict be given (this peculiarity of the statute of limitations in Italy is noted as surprising, in the 2009 Report on Italy of the Council of Europe).

Moreover, in Italy regulations make it easier for a trial to be nullified as mistrial. What may be of little consequence in jurisdictions other than Italy, in Italy may be fatal for the case of the prosecution (this shows why the emphasis on automatically validating each step of the user, in *Daedalus*, is paramount). Or then, a defect of form may invalidate a trial at which the defendant was acquitted, and this may result in a conviction later on. (This happened at the *cause célèbre* of Adriano Sofri and his co-defendants, who later had to serve a life sentence.)

It is a recognised problem that in Italy, it is more likely that offences would go unpunished because of the statute of limitations having run out, than elsewhere in Western Europe. The so called Legge ex Cirielli shortened the statute of limitations, instead of lengthening it. Besides, 12% of all hearings at criminal trials in Italy are adjourned, because people who had to appear in court did not; such delays militate towards lengthier trials, and therefore, towards the expiry of the deadlines set by the statute of limitations (Biondani, 2010).

According to the 2008 CEPEJ Report of the Council of Europe, the Italian judiciary completes more criminal trials per year than any other member state (1,150,000 in Italy, vs. 864,000 in Germany, 655,000 in France, 437,000 in Russia, and 388,000 in Spain), but in Italy 465 crime victims per day get no justice, in that the perpetrators remain unpunished, because because of the statute of limitations having run out.

An important aspect of the matter is that in Italy if at the first trial, a conviction is obtained by the prosecution, the sentence may be delayed until after the appeal, or even until the Court of Cassation has heard the case. But in Italy's prisons, over half the inmates are awaiting trial. Unfortunately, those in custody awaiting trial tend to be from the socio-economically weaker segments of society, whereas suspects from the better classes can successfully avoid detention until the verdict is given at the last trial, and this not only because they can afford to instruct lawyers whom they would pay themselves, but also because they have better access to a defence lawyer appointed by the state. While a petty criminal is likely to have one appointed, that defence lawyer may even just devote a few minutes to the case, and not appeal the conviction. (Of course, the problem of justice for the rich vs. justice for the poor is prevalent under a variety of national jurisdictions.)

# 4.1.3.8 Further Considerations About *Daedalus*, and About Select Aspects of the Human Process It Subserves

Upon close scrutiny, the design of *Daedalus* features no flamboyant, hallmark AI technique that has not become commonplace by the 1990s. It could even be said that the technology is straightforward and simple. Still, *Daedalus* is a successful tool, because of how closely this tool suits the judiciary task in its ergonomical, practical context.

*Daedalus* checks for the integrity of the procedure and data, and advises the user about how to proceed; it even "becomes upset" upon noticing that action was taken by the magistrate or the police without *Daedalus* itself being informed and kept abreast. And for good reason for that matter, especially if one is to consider the effects of the Napoleonic wars on Continental law. Tracing the impact of the French *Code d'Instruction Criminelle* on Dutch courtroom practice, Nijboer and Sennef (1999, pp. 14–15) point out that

the dossier was the central file to which "internal" control of higher authorities was applied. Law enforcement officials performed their checks using the dossier as the exclusive source of information about what happened in a case. In the dossier they could check whether all necessary, formal controls had been met and whether or not all relevant formalities had been carried out. The importance of the dossier is reflected in the Latin [maxim]: *Quod non est in actis, non est in mundo* (what cannot be found recorded in the dossier, does not exist in reality).

Especially in the Anglo-American tradition, practitioners and scholars would beg to differ from that maxim. Nevertheless, even in such jurisdictions there arguably are lessons to be learnt from *Daedalus*. In democratic societies, law enforcement agencies and the judiciary, e.g., the police when arresting somebody or when carrying out interrogations, are under pressure to show that the rights of suspects were rigorously observed. *Daedalus* is an example of how, in Italy, in the 2000s such concerns have been taken on board, by means of a tool that not only documents all steps taken by the authorities during an inquiry, but also carries out validity checks on those steps at the time they are taken.

Waegel (1981) has discussed how investigators build pools of suspects for future crime-solving. Interrogating criminal suspects in an inquiry in countries like Italy is directed by the examining magistrate; the situation is different in countries such as the United Kingdom and the United States. Marcus (2000) has discussed the process of interrogating criminal suspects in the U.S.

Interrogations involve emotional labour for the one examined, as well as for the examiner; Stenross and Kleinman (1989) discussed the emotional labour of investigative detectives in the United States. "The detectives we studied disliked their encounters with victims, but enjoyed their encounters with criminals. The detectives discounted criminals' emotional displays as inauthentic" (ibid., p. 435).

There are kinds of inconsistency that *Daedalus* may detect. One may think of probative weights, too, in relation to *Daedalus*, but such a path has been avoided. By November 1999, a version of *Daedalus* was developed which envisaged weights of evidentiary value and of credibility; this wasn't developed into an integral part of the workings of *Daedalus*, to avoid threading on contentious ground.

It is interesting to consider how, around 2000, Italy's Minister of Justice described *Daedalus*, as it pointed out what especially stands out with respect to software available until then for assisting the legal professions:

[...] The *Daedalus* project is about applied software whose ideation and coding were carried out by the aforementioned Dr. Asaro. It is intended for assisting a prosecutor during the inquiry up to the indictment of a defendant. The piece of software as implemented does not confine itself to making a form available to the magistrate for editing documents, or for selecting the charges, but rather offers an expert system for integrated assistance; the core idea of *Daedalus* is that the computer program, while providing an environment for editing the texts of measures to be taken, also records them and makes such knowledge available for validating the continuation of the inquiry. Remarkably, there is a check of lawfulness — i.e., the program responds with appropriate messages, every time the user is about to take an impermissible measure — and a sufficiency check, applied to the items of evidence that have been gathered. [...].<sup>15</sup>

An advantage of *Daedalus* is "Documentation and system transparency", to say it with the title of section 12 in Schartum's (1994) discussion of case-processing systems in the context of Norwegian administrative procedure, and of "investigations of legal contents of case-processing systems in public administration, as well as investigations in the development of such system" (ibid., p. 329). The obvious difference is that *Daedalus* pertains to criminal procedure; it is therefore capable of impinging more dramatically on some citizens' lives.

What is remarkably original, in *Daedalus*, is that every step fits in an embedded validation mechanism, for constraining the measures taken as they are adopted and unfold, as well as for future reference – to show that the examining magistrate and

<sup>&</sup>lt;sup>15</sup> "[...] Il progetto Daedalus riguarda un applicativo ideato e scritto dal suddetto dr. Asaro, concepito per l'assistenza al Pubblico Ministero nel corso delle indagini preliminari e sino alla citazione a giudizio dell'imputato. Il software realizzato non si limita a mettere a disposizione del magistrato un formulario per la redazione di atti o la selezione di capi di imputazione, ma fornisce un sistema esperto di assistenza integrata; l'idea centrale di Daedalus è che il programma informatico nello stesso momento in cui mette a disposizione un ambiente per la redazione dei provvedimenti, li registra e fornisce tale conoscenza per validare il successivo corso dell'indagine. Particolarmente interessanti sono il controllo di legalità — reazione del programma con specifici messaggi tutte le volte che si intenda adottare un provvedimento non consentito — ed il controllo di sufficienza, con specifico riferimento alle fonti di prova raccolte. [...]".

prosecutor (typically, the same person at different stages) acted in formal fairness, as far as this can be ascertained from the syntax of what they did, rather than from the recondite semantics and its pragmatic uses, which will perforce elude a computer tool.

Distinguish between computerised procedural support for prosecutors, as provided by *Daedalus*, and the use of computer tools in order to analyse how prosecutors reason and go about their business. Given aspects of strategic communication and of the argumentation structure of criminal cases from Italy have been discussed, in relation to experimentation with computer tools, by Gulotta and Zappala (2001): "Our present goal is to understand and illustrate what the public prosecutor does in order to achieve the prosecution's objective" (ibid., p. 91).

# 4.2 On Some Criminal Justice Information Systems or Other Tools

# 4.2.1 Tools for Decision Support, vs. Tools for Applying a Procedure

Giancarlo Taddei Elmi (1992, subsection 3.2) provided a discussion, in an Italian context, of the "meta-documentary" level of automation in the legal sphere; at that level, he included both tools for decision support and tools for legislation. Having identified four phases in the decision-making process – namely, (a) recognizing what the current law is, (b) interpretation, (c) logical integration, and (d) the selection of the solution among those logically correct – he indicated in phase (c), the one that "is, with no doubt, the most fertile terrain for computing" (ibid., p. 122, my translation). "Attempting to computerise juridical decision-making invariably produces the remarkable result of forcing us to rigorously reconsider the manners in which reasoning is carried out" (ibid., p. 123).

Philosopher of law Fernando Galindo, of the University of Zaragoza (Spain) – in a paper (Galindo, 1996) introducing a conference session devoted to such systems whose aim is to assist with juridical decision-making – was asking, in the very title of his article, whether such systems are possible at all.

In the second paragraph, he provided a positive answer: "Respondo afirmativamente" (ibid., p. 631). He then proceeded to list five arguments, or rather one argumentation line consisting of five propositions. The fourth of these was that such tools have been constructed, and that they work indeed. We could rephrase this by saying that the proof is in the pudding. In practice, those projects Galindo was mentioning represented a broader scope than judicial decision-making.

Immediately preceding Galindo's paper (1996) in the same volume, another article, this one by Zulueta Cebrián (1996), pointed out that in Spain, it was procurators who had come earlier to recognise the necessity of mastering new technologies for the administration of justice.

*Daedalus*, a tool originating with and intended for the Italian judiciary, does not belong to the narrowly intended category of tools that are specifically devised for the judge, who is the factfinder, the adjudicator. Especially in Italy's reformed legal system, the inquiry, though led by an examining magistrate, is identified with one of the two parties in a trial: the prosecution.

*Daedalus* assists the examining magistrate in conducting the inquiry, and next it assists in the preparation of the prosecution case for the proceedings in court. Its assistance permeates the process, organises it, validates it step by step, and documents its phases for future reference (including in order to prove that the rights of members of the public, and in particular the suspects', were properly safeguarded).

To readers used to the Anglo-American legal system, a tool such as *Daedalus* is likely to appear to be a mix of what looks like a police information system, and a tool for the legal operators at pre-trial and trial. In the United States, such tools or pro-totypes as *MarshalPlan* (a concept developed by Schum and Tillers) and *CaseMap* (the first dedicated piece of software offered on the American market) have emerged in the 2000s, for supporting the construction of the evidence upstream of as well as in court, under the Common Law system. See Section 4.1.1 above.

## 4.2.2 Risks of Too High Data Concentration

In the late 2000s, several breaches of security concerning confidential databases of the British public administration and containing data of many private persons have come to the attention of the media. Not only that. The authorities did not appear to be responsive to computer scientists' concerns lest putting in place huge databases would lend itself to confidential data being inferred by resorting to *data mining* techniques. A concern better known to the broad public is computer security, in the sense of information systems being vulnerable to unallowed or (in particular) malicious access. When it comes to police information systems, sometimes in the form of cross-border criminal databases, concerns for safeguarding privacy have arisen, something already discussed by Tupman (1995).

Around 2000, a website of the Programme in Comparative Media Law & Policy (PCMLP) of the Centre for Socio-Legal Studies, at Wolfson College of the University of Oxford was stating (PCMLP, n.d.):

Privacy International was formed in 1990 as a watchdog on surveillance by governments and corporations. With members in more than 40 countries, it has created an international movement that has helped to counter abuses of privacy by way of information technology. Privacy International has conducted campaigns in Europe, Asia and North America to raise awareness about the dangers of ID card systems, military surveillance, data matching, police information systems, and credit reporting. It is based in London, UK, and is administered by the Electronic Privacy Information Center (EPIC) in Washington, D.C. Privacy International publishes a quarterly newsletter (the International Privacy Bulletin) and organizes conferences each year on privacy and technology.

# 4.2.3 Support from User Communities, vs. Tools Bestowed from Above

How do countries cope with the adoption of computer tools devised for home affairs (in particular, the police), and the judiciary? In Italy, support for *Daedalus* among the magistrates has encouraged the state to take a more active role in promoting the tool. It also quickened the recognition, on the part of the Ministry of Justice, of recognising the need to take on board the transition from tools supported by mainframe computers, to personal computing.

Eventually, a project, *Itaca*, also ideated by Judge Asaro and porting ideas from *Daedalus* to subserving the needs of the Court of Cassation, was contracted by the state to a big multinational corporation, in striking contrast to *Daedalus*, whose ergonomics being tailored for the intended user was subserved by the software having been not only specified, but also designed and implemented single-handedly by Asaro himself, at the time a *sostituto procuratore*.

It is important to realise that *Daedalus* being adopted by the Ministry of Justice on the wave of support already obtained in the users' community is not the typical situation. Arguably, it is far more typical that large state organisations decide by themselves about which systems to develop, sometimes with consultations whose outcome is often perceived to have foregone conclusions, and at any rate the information technology policy is bestowed upon the intended users, especially if these are numerous.

Consider now the information technology strategy of the police in Scotland. Excerpts follow, from the chapter devoted to Her Majesty's Chief Inspector of Constabulary for Scotland Report for 1998/1999 (Her Majesty's... 1998/1999). The first quotation is from the section entitled 'Thematic Inspection':

1. The thematic inspection (Getting IT Right) on the specification and deployment of information technology systems in the Scottish police service was published during the year, making use of the internet as a medium of circulation, and made a number of recommendations. The report covered not only the 8 Scottish forces but also the central service establishments of the Scottish Crime Squad, SCRO and the Scottish Police College. [...]

The following is from a subsequent section, entitled "Scottish Police Information Systems/Information Technology (IS/IT) Strategy (SPIS)":

4. In recent years the forces have responded to technological change by agreeing a more unified approach to IS/IT issues. Since 1993 SPIS has been developed and agreed by all chief constables as the standard approach to the development of new IT systems in Scotland. In the last year a committee structure to manage the implementation of the strategy has been established [...]

6. The IS/IT Co-ordinating Committee continues to work towards identifying priorities. The following individual systems are being developed:

- Criminal intelligence;
- Personnel;
- Custody recording;
- Incident recording; and
- Firearms licensing.

Further down in the same document, one reads, in a section entitled "Integration of Scottish Criminal Justice Information Systems (ISCJIS)":

12. Co-operation between different agencies involved in the Scottish criminal justice system is hugely important in pursuing efficiency and effectiveness. The Scottish Executive led project, ISCJIS, applies particularly to the advantages to be gained by working towards an integrated IS/IT strategy. Pilot sites are due to begin in the latter part of 1999.

13. "Getting IT Right" recognised the importance of the Scottish police service undertaking a study to determine the common standards which need to be defined to facilitate the inter change of information between the police and other stakeholders. [...] As part of the developing ISCJIS programme, pilot work on a groundbreaking Legal Information Network for Scotland (LINETS) is underway and to go live within selected sites in early 2000. It will contain legal information from the Statute Law Database (maintained by the Statutory Publications Office) and several agencies within the Scottish criminal justice community, with each providing relevant national information to the benefit of all involved and accessible from a single source. [...]

In Hutton, Tata, and Wilson (1994), the design was described of a prototype of a Sentencing Information System for the High Court of Justiciary in Scotland, a system whose eventual adoption, it was claimed, "will arguably be the first major reform of sentencing to take place in Scotland", a country with a "strong tradition of judicial independence" (ibid., p. 255). Section 3 in that paper surveyed a number of *sentencing information systems* from jurisdictions in Canada and Australia. Doob and Park's system (Doob & Park, 1987–1988; Doob, 1990) had been in operation for several years in the 1980s in four Canadian provinces, but by 1990 only Saskatchewan had retained it, and explanations offered by the designer and reported in Hutton et al. (1994, p. 259, citing Doob, 1990), were to the effect that:

First, judges in Canada had little interest in information about current court practice. They are not accustomed to using information in this numerical form nor does their legal tradition give any weight to current sentencing practice. Second, such authority as exists in sentencing comes from the Court of Appeal. The Sentencing Information System carried no institutional authority.<sup>16</sup>

British Columbia, which until 1987 had used the Doob and Park system, from 1987 to 1992 operated a different system, described by John Hogarth (1988), but it, too, was discontinued, which was ascribed to "insufficient judicial consultation and involvement" and high costs (Hutton et al., 1994, p. 260). *Daedalus* clearly avoided the first of the latter pitfalls (as it was devised by a member of the intended user community), and a useful tool was made available for free to the Italian state by Asaro and distributed by the Italian Ministry of Justice to the judiciary offices in the country; also maintenance was relatively inexpensive, given the nature of the tool.

<sup>&</sup>lt;sup>16</sup> Social psychologist Anthony N. Doob has also researched Canadian jurors (Doob, 1978), as well as Canadian justices of the peace (Doob, Baranek, & Addario, 1991); thus his are not just *ad hoc* explanations as may be provided by an information technologist. The psychology of judicial sentencing is the subject of Fitzmaurice and Pease (1986).

As to the Scottish project, it "was based on the New South Wales model" from Australia (Hutton et al., 1994, p. 260). In turn, the computerised sentencing system for New South Wales Courts was described by Chan (1991) and Spears (1993). Several pages in Hutton et al. (ibid., pp. 269–280) are devoted to illustrating, by means of computer screens and of schemata, a session concerning a case of aggravated robbery. That kind of presentation is rather similar to our present style adopted for describing a session with *Daedalus*.

## 4.2.4 Past Cases, New Cases, and Using the Former for the Latter

The Scottish, Australian, and Canadian projects mentioned above are functionally different from *Daedalus*: unlike *Daedalus*, those systems are mainly about documenting past cases, rather than managing the minutiae of new ones. To say it with quite an important article on judicial software, Tata, Wilson, and Hutton (1996):

Formally, a Sentencing Information System is descriptive rather than prescriptive. That is, it contains no guidance as to how a sentencer might use this information to help in making the sentencing decision in a particular case. A Sentencing Information System (SIS) can display the range of sentences for the particular combination of offence and offender characteristics selected. The sentencer will have no guidance as to what extent and in what direction the appropriate sentence for the case at hand should vary from the average. This decision is a matter for the discretionary judgement of the sentencer. However, the frequency distribution indicates the highest and lowest sentences previously passed for the type of case at hand. In a well trodden area it might be assumed that a sentencer would have to have good reasons for straying outside the upper and lower limits, although there are no formal reasons why a sentencer should not choose to do so nor does the SIS restrict the sentencer's choice in any way.

### Moreover (ibid.):

A hybrid approach involving both rule based and case based systems has been developed by Bain (1989a). The programme begins with an empty case-library and a handful of heuristics for deciding sentences when no cases can be applied to a new situation. After only a few cases, however, it begins to retrieve 'remindings' of its own cases from memory and to modify the strategies associated with those cases to form new sentences.

The idea of a case based reasoning system unsupported by heuristics has also been used as a basis for modelling the sentencing process. Murbach and Nonn (1991) report progress on a project to develop a sentencing support system for fraud cases in Canada. Their system provides information about penalties but also includes information on case factors not included in the categories of offence used in the penal code but agreed by judges to be relevant to sentencing. There is thus an attempt to include information which reflects judicial perceptions of seriousness in order to make the system more sensitive and thus more useful to sentencers. Computer technology has been used to assist these reforms and to encourage greater consistency in sentencing. ASSYST (Applied Sentencing systems) has been developed by the US Federal Court system so that criminal justice personnel could easily compute, record, archive and examine the implications of the US Sentencing Commission Guidelines (Simon and Gaes, 1989; Simon, Gaes, and Rhodes, 1991).

At this point, Tata et al. (ibid.) mentioned what was to become *The Judge's Apprentice*, before turning to Bainbridge's (1991) system:

A part- simple retrieval system, part- expert system approach to sentencing support has been reported by Bainbridge (1991). The system focuses on sentencing practice in magistrate courts in England and Wales and contains components covering sentencing law and penalty statistics. The sentencing law component is intended to assist the magistrate by checking that the chosen sentence complies with relevant sentencing law. This part of the system is arguably more like an expert-system than a simple retrieval system, although it only answers the question, 'Is this sentence legally competent?' rather than, 'What is the appropriate sentence for this case?'. When a judge has selected a legally competent sentence, it is then possible to consult the penalty information section of the system. This shows the distribution of penalties for the offence in the form of probability calculations. Information is only available for two statutory offences of theft and burglary and for only 600 cases from four magistrate courts.

Uri Schild (1995) had reported about what still was work in progress, "to develop a case-based advisory system for sentencing. The domain knowledge was elicited from a senior judge, and the system uses 'hierarchical discrimination trees' in order to retrieve relevant information" (Tata et al., ibid.). Schild noted: "It is obvious that the area of sentencing is associated with an enormous amount of both common-sense and domain knowledge". However, a model which would include this knowledge was considered impracticable and it was therefore decided to use only the domain knowledge without any additional "common-sense knowledge" (Schild, 1995, p. 232). This was to become *The Judge's Apprentice*, Yaakov HaCohen-Kerner's doctoral project.<sup>17</sup>

*The Judge's Apprentice* is an expert system concerned with given categories of offences, and its aim is to assist in enhancing uniform sentencing at Israeli courts; these are akin to courts in the Anglo-American system, but there only are *bench trials* (i.e., such trials that the decision making is by professional judges), as there are no juries. In the English abstract of his thesis, Yaakov HaCohen-Kerner (1997) pointed out that of the few previously described programs "which actually assist in sentencing" and "deal each in its own way with the problem of a lack of uniformity in sentencing", none is case-based. He also noted that on the other hand, such case-based systems (other than for law)<sup>18</sup> which require common-sense knowledge to be represented and used,

<sup>&</sup>lt;sup>17</sup> Schild and Kerner (1994), HaCohen-Kerner and Schild (1999, 2000, 2001), HaCohen-Kerner, Schild, and Zeleznikow (1999), and HaCohen-Kerner (1997).

<sup>&</sup>lt;sup>18</sup> Note that in social science, Michael A. Redmond and Cynthia Blackburn (2003) described an application of *case-based reasoning* (*CBR*) and other methods for predicting repeat criminal victimisation. Theirs was an empirical analysis. Also see Janet L. Lauritsen's (2010) 'Advances and Challenges in Empirical Studies of Victimization'. Cf. Lauritsen (2005), Ybarra and Lohr (2002), and Planty and Strom (2007). Redmond and Blackburn (2003) explained: "some criminologists are interested in studying crime victims who are victims of multiple crime incidents. However, research progress has been slow, in part due to limitations in the statistical methods generally used in the field. We show that CBR provides a useful alternative, allowing better prediction than via other methods, and generating hypotheses as to what features are important predictors of repeat victimization. This paper details a systematic sequence of experiments with variations on CBR and comparisons to other related, competing methods. The research uses data from the United States' National Crime Victimization Survey. CBR, with advance filtering of variables, was the best predictor in comparison to other machine learning methods" (ibid., from the abstract).

can only be the prototype for a model whose practical application in industry is highly improbable or impossible. In contrast, our model has been applied to a system intended for use in real life. Our system deals with a limited domain and the necessary information is well defined and bounded. This information includes: a database of fifty precedent cases, the legal knowledge relevant to sentencing, and a hierarchical tree that contains over three hundred legal concepts relevant to sentencing at various levels of abstraction.

Bain's JUDGE system (Bain, 1986, 1989a, 1989b) is, among the other things, a tool whose AI mechanism is *case-based reasoning*. It adopts a hybrid approach involving both rule-based and case-based systems. JUDGE is a cognitive model of judges' decision-making when sentencing (and indeed it was based on interviews with judges); yet, it didn't have the aim of suggesting a sentence in a real judicial context; this is a major functional difference with respect to HaCohen-Kerner's *Judge's Apprentice* (HaCohen-Kerner, 1997, p. 49).

Bain's research, according to Bain (1989a, p. 93),

has been directed at modeling by computer the behavior of judges who sentence criminals. Our [i.e., Bain's] effort has been not to examine sentencing as a representative example of legal reasoning. Instead, we have viewed it as a more generic reasoning task in which people learn empirically from having to produce relative assessments of input situations with respect to several different concerns.

Bain's JUDGE used 55 represented legal precedents, mostly invented ones, the domain being violent confrontations resulting in manslaughter or murder. In contrast, *The Judge's Apprentice* is specialised in cases of sexual assault or robbery. In Bain's system, precedents are retrieved and processed based on "indexes" capturing situations; in addition, HaCohen-Kerner and Schild's tool also resorts to empirical "conceptual indexes" which resulted from interviews with judges (HaCohen-Kerner, 1997, p. 53).

Moreover, *The Judge's Apprentice* seeks to preserve uniform sentencing by reference to a "base-sentence", not just to retrieved precedents – which is how Bain's system works: JUDGE works in a black-box fashion, whereas HaCohen-Kerner's tool provides comparisons to precedents and justifications for the sentence it suggests (HaCohen-Kerner, 1997, pp. 53–54, 84–85).

Trying to achieve consistent sentencing the subject of Donald Pennington and Sally Lloyd-Bostock's edited volume (1987) *The Psychology of Sentencing: Approaches to Consistency and Disparity.* The psychology of judicial sentencing is also the subject of Fitzmaurice and Pease (1986).

A team from Portugal (Costa, Sousa, & Neves, 1999) reported about an application to legal precedents of case retrieval nets (with similarity arcs and relevance arcs), within the case-based reasoning class of methods. In Florence, Paolo Guidotti (1994) used *Reflective Prolog* to show how "the similarity between the concrete fact situation and the abstract fact situation of a norm may be translated into a similarity relation between predicates". He also proposed a meta-interpreter to enable the processing, based on analogy, of precedents constituted by previous court decisions.

Penalty statistics within a system for sentencing support has been mentioned before, in relation to Bainbridge's project (Bainbridge, 1991). Actually, for several decades now "find[ing] a relationship between certain factors and circumstances in a court case and the decision reached by a judge" (Combrink-Kuiters,

De Mulder, & van Noortwijk, 2000, p. 109) has been the aim of *jurimetrics*. Factpattern analysis in judicial decision-making was carried out in a North American context in the 1960s (e.g., Nagel, 1962; Ulmer, 1969). Jurimetrical methods are still quantitative, and include linear regression, Bayesian statistics,<sup>19</sup> and neural networks (Combrink-Kuiters et al., 2000).

Indexing for case-based reasoning for the purposes of enhancing uniform sentencing is arguably in some relation (problems of scale apart) to "the applicability of data mining techniques to legal databases" in areas where many thousands of cases are decided", and the discovery of association rules<sup>20</sup> is sought: "We would generally wish to assume that some rule is being followed so that like cases are decided in a like manner. Is there a way of deciding what the rule being followed is from an automated consideration of the data?", in the words of Bench-Capon, Coenen and Leng (2000, p. 1056). The latter article, from Liverpool, reporting about a project with such concerns, found potential in the outcome of experimentation. "If the aim is to confirm particular hypotheses about the data, the information necessary to provide this structure is available".

The Liverpool project was descriptive, and admittedly high-sky research, whereas HaCohen-Kerner and Schild's project was prescriptive and intended for use by judges. In both projects there was however a shared concern with uniformity in factfinding when cases are similar. At any rate, it must be said, concerning *The Judge's Apprentice*, that even though judges consulted were appreciative and supportive, they had not been envisaging using the system themselves in practice.

### 4.2.5 Prosecutorial Discretion and Judicial Discretion

*Discretionary* is opposed to *mandatory*. In particular, as applied to judicial decisionmaking, discretionary is what is up to the judge to decide, unfettered by mandatory rules. Likewise, when plea-bargaining is involved, or to the extent that a prosecutor is free not to prosecute, then the prosecutor is exercising his or her *discretionality*.

<sup>&</sup>lt;sup>19</sup> This kind of application of statistics has nothing to do with, and is definitely not as controversial as, probative weight and the use of probabilities to determine whether to convict in a given case, for which, see e.g. Allen and Redmayne (1997).

<sup>&</sup>lt;sup>20</sup> "Association rules represent relationships between items in very large databases. [...] An example would be 'given a marker database, it was found that 80% of customers who bought the book 'XML for beginners' and 'internet programming' also bought a book on 'Java programming'.' If X and Y are two sets of disjoint terms, then an association rule can be expressed as conditional implication  $X \Rightarrow Y$  i.e. the occurrence of the set of items X in the market basket implies that the set of items Y will occur in this market basket. Two important aspects of an association rule are confidence and support [...]. The confidence of an association rule r:  $X \Rightarrow Y$  is the conditional probability that a transaction contains Y given that it contains X, i.e. confidence( $X \Rightarrow Y$ ) = P(X, Y)/P(X). The support of an association rule is the percentage of transactions in the database that contains both X and Y, i.e., Support( $X \Rightarrow Y$ ) = P(X, Y). The problem of mining association rules can be stated simply as follows: Given predefined values for minimum support and minimum confidence." (Chan, Lee, Dillon, & Chang, 2001, p. 278, citing Agrawal & Srikant, 1994 for the definition of confidence and support).

The goal of, say, uniformity in sentencing as supported by computer tools (e.g., *The Judge's Apprentice*) should not be to the detriment of *judicial discretion*, and the latter, in turn, is distinct from *prosecutorial discretion*. Legal discretion is a subject discussed, e.g., by Hawkins (1992).

The following quotation is from a book review (Nissan, 2001e) of a paper collection in law, and this quoted text is in turn quoting from a section of four papers – a section on *plea bargaining*, which pertains to *prosecutorial discretion* indeed:

"In the past it was accepted that the question of whether a person committed a crime (and particularly a serious one), or what sentence should be imposed on the person convicted of that crime, should be answered only after the hearing of the evidence. Criminal courts were not asked to give effect to compromises at which the prosecution and accused had arrived regarding the nature of the conviction or regarding the sentence" - Harnon points out (p. 246) — but "in common law systems, the recognition that this does not reflect the reality has been growing this [i.e., the 20th] century. There has been an ever-increasing awareness, that in many criminal cases, no evidence is submitted to the court, since the accused plead guilty, following a plea-bargain" (246). In the same section, Goldstein deals with how, to cope with system overload, national legal systems are borrowing institutions and practices from each other, with a trend of "abandoning the principle of obligatory prosecution, so common in Continental Europe, and turning instead to the exercise of prosecutorial discretion" (169). "In Italy, where guilty pleas had never existed and plea bargaining was another a diversarial trial has been introduced and with it the guilty plea and the explicit grant of sentencing concessions for such pleas. Even more dramatically" (169), European countries formerly within the Soviet orbit are turning away from inquisitorial systems; yet, for American Law reform, insights are being sought in a comparative criminal justice perspective, "looking in the direction of the European continent for guidance on how to reconcile discretion and plea bargaining with principles of legality" (170). [...]

In the American system, but since the 1990s also in some European jurisdictions that previously did not allow it, plea bargaining is commonplace, and economic factors (in terms of costs/benefits whether a case goes to court) affect the prosecutor's decision whether to prosecute; potentially, this is fertile ground for decision support systems. Let us turn now to discretion in general, in a legal context.

Bodard, Hella, Poullet, and Stenne (1986), from Belgium, outlined the functions of the ADP prototype for assisting, in two manners, with "judicial decision making: the first is assistance in documentary search from elements of reasoning pertaining to a judgment and the second is assistance in assessing a judgment's coherence" (ibid., p. 187). A representation in propositional logic was adopted. Tests envisaged for *checking internal coherence* included a so-called *polarization test*, attached weights were examined, there was an *intercomposition check*, as well as a *check of external coherence* of a judgment in relation to external reference elements (ibid., p. 197).

As already seen above in Section 4.1.2 in the present book, Goldsmith (1986) – building upon Scandinavian legal thinking – presented an *evidentiary value prescriptive model*, and contrasted it to a so-called *theme probability model*, which Goldsmith challenged as far as criminal cases are concerned. Goldsmith also considered results he had obtained empirically "concerning the evaluation of evidence by Swedish judges and prosecutors, and involving a comparison of the apparent use

of the one model versus the other" (ibid., p. 229). In an appendix, Goldsmith listed rules for integrating evidence according to the model he was proposing: rules for compatible evidence, rules for conflicting evidence, and rules for chains of evidence (ibid., pp. 244–245). His treatment was probabilistic, and this is something quite contentious in the legal theory debate on formalisms for evidence. Probabilistic treatment is not as contentious if the explicit purpose is to evaluate the costs vs. the benefits of going to court vs. plea bargaining.

Discretionary decision-making by decision-support systems for judicial sentencing was discussed by Tata et al. (1996). Meikle and Yearwood (2000) are concerned with the provision of support for the exercise of discretion, and how the need to avoid the risk of adversely affecting it when using a computer tool, inspired the structural design of *EMBRACE*, a decision support system for Australia's Refugee Review Tribunal on which see Sec. 3.11.6.2 above.

Leithe (1998) has warned about the limitations of the potential of AI to fully do justice to legal knowledge for practical purposes, when it comes to modelling the actors, these being the legal decision makers. In particular, the concern is that judicial discretion be restricted, if computer tools come to be involved in the judicial decision-making process. See also Taruffo (1998).

*Daedalus* is restricted to merely supporting the inquiry and then the prosecution. It does not impinges on prosecutorial discretion, and only places a necessary obstacle whenever an impermissible step is going to be taken. Such a "lack of ambition" is arguably *Daedalus*' blessing in disguise. Moreover, *Daedalus* is in line with Leith's (1998) and Meikle and Yearwood's (2000) shift of emphasis, in computer tools, from expert systems to decision-support systems.

Meikle and Yearwood (2000, p. 101) classify legal decision-making in four quadrants, according to two operational dimensions:

One dimension is the extent to which a system should either be an 'outcome predictor' (a highly convergent aim) or should give access to diverse resources about the issues of interest (a highly divergent aim). This is the *predictive-descriptive* dimension. The other is the extent to which a system either needs to support discretion (by permitting complete autonomy, perhaps because the domain has no constraints) or needs to support weak discretion (by permitting only that allowable within prescribed constraints). This is the *strong-weak discretion* dimension.

It was proposed that *EMBRACE*, as well as Bench-Capon's PLAID (Bench-Capon & Staniford, 1995), may be placed in the quadrant characterised by strong discretion and descriptiveness (instead of predicted outcome, which when there is strong discretion lets the user override the prediction either partly or altogether).

A prosecutor's decision to offer a suspect a plea bargain, or then a prosecutor's decision not to prosecute because based on the evidence available, it is unlikely that a prosecution of a suspect would succeed in securing a conviction in court, involve a *prediction* as to the outcome. Prosecutorial discretion exploits such an evaluation. But no case is foregone, because judges or juries have their own discretion (short of blatant mistrial).

Take Italy. Following the reform of 1989 which introduced the new Italian criminal procedure code, the Italian prosecutor has been enabled to offer a plea bargain. But the prosecutor (along with the role of the examining magistrate, upstream of prosecution) is now, in Italy, one of the parties in the trial, not *above* them which is what the judge is. Investigations must be fair, and the prosecution, carried out by magistrates who like the judge, are after all in the employment of the Ministry of Justice, cannot afford "outcome prediction" *vis-à-vis* the suspects other than by way of formulating falsifiable hypotheses, then checking them.

Needless to say, the factfinders (the adjudicators) themselves (which the public prosecution is definitely not) deontically (i.e., by normative or moral obligation) cannot be *predictive* in the sense of being biased. They *ontologically* can, *deontically* cannot<sup>21</sup>: there may exist some judge or juror who is biased in a given situation, but then that is a deplored situation of an adjudicator contravening on the duties of the role. In an article entitled 'The witch hunt as a structure of argumentation', Walton stated (1996c, p. 401):

One important characteristic of a fair trial is the requirement that the judge or jury, who decides the outcome, must not have made up its mind on that outcome before all the evidence has been presented. That is, the judge or jury must be sufficiently unbiased, at the beginning stage, that they can be swung one way or the other by evidence produced during the argumentation stage of the trial. Otherwise the trial is pointless, from a normative perspective of judging the case on the balance of all the relevant evidence presented. The opposite quality is characteristic of the witch hunt.

Also as far as fair prosecution is concerned, the kind of argumentation required is that of a critical discussion, and prosecution, *qua* participant in that debate, must be ready to admit that an argument made does not hold, and ultimately to admit defeat in court, just as it must be willing to discard hypotheses out of fairness while preparing a case. "This willingness to admit defeat is an important characteristic that distinguishes the critical discussion from the quarrel, or eristic type of dialogue" – Walton states on the same page (1996c, p. 401), citing Walton (1989, p. 4) – yet partisan arguments, or advocacy, are not ruled out altogether from a critical discussion.

## 4.3 Evaluating Costs and Benefits

## 4.3.1 Evaluating Costs and Benefits While Preparing a Case

## 4.3.1.1 Ways Economics and Evidence Meet: The Rules of Evidence in Terms of Economic Rationality

Will the spread, among practitioners, of the kinds of software tools described in this book empower the citizenry, or rather further empower corporations against the individual, and institutions when the other party in litigation is a private person?

<sup>&</sup>lt;sup>21</sup> One also speaks of *normative ability*. See, e.g., Wooldridge and van der Hoek (2005).

Will such tools reduce, or deepen the divide between justice as affordable to the rich, and unaffordable or perfunctory justice for the impecunious? In my opinion, both outcomes are possible.

There are other ways of looking at the economics. One of the ways economics and evidence meet, concerns the *rules of evidence*, i.e., the regulation of which evidence is admissible. There exist, in legal scholarship, theoretical approaches that explain the way the law of evidence is, in terms of *economic rationality*: see, e.g., Posner (1999). Discussing the principles underlying evidence law in the Anglo-American legal systems, Alex Stein states (2005, p. 2):

A non-utilitiarian risk-allocating scheme may well crystallize. Under the utilitiarian approach, allocation of the risk of error is always instrumental to the trade-off that reduces the aggregate sum of error costs and error-avoidance expenses (the total sum of substantive and procedural costs). The rights-based legal systems overturn this relationship of means and ends. Under these systems, fact-finding expenditures are instrumental to the right apportionment of the risk of error, rather than vice versa. These systems rely on a non-utilitarian political morality that transforms into individual rights. These rights do not merely escape from utilitarian calculus. They actually trump utility. Consequently, rights that litigants have with respect to risk-allocation are not measured against the substantive and procedural costs that they incur. Because the prevalent political morality favours these rights, it deems the costs that these rights incur money well-spent.

#### 4.3.1.2 Alvin Goldman's Concept of Epistemic Paternalism

In an article in epistemology (the philosophy of knowledge) whose title is "Epistemic paternalism", Alvin Goldman (1991) began with the *requirement of total evidence (RTE)*, a popular principle (cf. Good, 1983 and Chapter 6 in Horwich, 1982) in epistemology and the philosophy of science. Its weak and strong versions are:

(W-RTE) A cognitive agent X should always fix his beliefs or subjective probabilities in accordance with the total evidence in his possession at the time.

(S-RTE) A cognitive agent X should collect and use all available evidence that can be collected and used (at negligible cost).

Then Goldman, whose concern is with moral and legal aspects, concedes that the strong principle is best understood in purely epistemic terms. By contrast, invasion of privacy or harmful experimentation on human subjects would be objectionable. Then Goldman remarks (1991, p. 114):

A plausible-seeming corollary, or extension, of S-RTE is a principle governing the practices of a second agent, Y, who is in a position to control the evidence made available to X. This interpersonal principle would say that Y should make available to X all evidence that is subject to his (Y's) control. Of course, like S-RTE itself, the envisaged extension or corollary of S-RTE must be restricted to epistemic contexts or concerns. Thus, we might formulate the "control" version of RTE roughly as follows:

(C-RTE) If agent X is going to make a doxastic decision<sup>22</sup> concerning question Q, and agent Y has control over the evidence that is provided to X, then, from a purely epistemic point of view, Y should make available to X all of the evidence relevant to Q which is (at negligible cost) within Y's control.

The restriction to the epistemic viewpoint is again important. In legal settings, for example, there are many nonepistemic reasons for refusing to provide relevant evidence to jurors. Available evidence may have been illegally obtained. Relevant evidence may be obtainable from the defendant, but the Fifth Amendment forbids his being compelled to testify against himself. Or the defendant may have testified elsewhere under a grant of limited immunity, providing that his testimony would not subsequently be used against him. In these cases, the judge (Y) is obliged not to provide the jurors (X) with all available evidence logically relevant to the question of guilt. These constraints, though, are not of an epistemic nature.

Goldman argues that C-RTE is unacceptable. At any rate, "existing provisions and practices, both in the law and elsewhere in society, contravene C-RTE" (ibid.). Goldman endorses such limitations on the quest for evidence: "Although I shall not defend each provision and practice in detail, many of them seem to be quite reasonable. This raises some interesting questions for a branch of epistemology that I have elsewhere called *social epistemics*" (1991, p. 114, citing Goldman, 1986, pp. 1, 5–9, 136–138; and 1987a, 1987b).

Framers of the rules of evidence, Goldman claims (1991, p. 118), "and judges themselves, often wish to *protect* jurors in their search for truth. If, in the framers' opinion, jurors are likely to be misled by a certain category of evidence, they are sometimes prepared to require or allow such evidence to be kept from the jurors. This is an example of what I shall call *epistemic paternalism*". Goldman concedes that it is primarily the parties to the litigation who are the prime objects of such protection, rather than jurors. "The indicated parties are protected, however, by getting

Daniel Mittag (2004) explains:

<sup>&</sup>lt;sup>22</sup> In philosophy and in logic, the adjective *doxastic* means "of or relating to belief". *Doxastic logic* is the branch of modal logic that studies the concept of belief. More broadly, *doxastic* may refer not only to something pertaining to belief, but alternatively also to something pertaining to states sufficiently like beliefs, namely: thoughts, judgments, opinions, desires, wishes, or fears. But usually, in a *doxastic attitude* what one holds is a belief. In epistemology (the philosophy of knowledge), *evidentialism* is generally applied to justified beliefs distinct from unjustified beliefs one may hold in a doxastic attitude. *Evidentialism* in epistemology is defined by the following thesis about epistemic justification:

<sup>(</sup>EVI) Person S is justified in believing proposition p at time t if and only if S's evidence for p at time t supports believing p.

As evidentialism is a thesis about epistemic justification, it is a thesis about what it takes for one to believe justifiably, or reasonably, in the sense thought to be necessary for knowledge. Particular versions of evidentialism can diverge in virtue of their providing different claims about what sorts of things count as evidence, what it is for one to have evidence, and what it is for one's evidence to support believing a proposition. Thus, while (EVI) is often referred to as the theory of epistemic justification known as evidentialism, it is more accurately conceived as a kind of epistemic theory. In this light, (EVI) can be seen as the central, guiding thesis of evidentialism. All evidentialist theories conform to (EVI), but various divergent theories of evidentialism can be formulated.

jurors to make accurate judgments. Protection of the jurors' epistemic ends therefore assumes derivative importance" (Goldman, 1991, p. 119).<sup>23</sup>

#### 4.3.1.3 The Litigation Risk Analysis Method

For computer tools assisting with the evidence, there is an important application that deserves mention. Prosecutors do not prosecute all cases that have merit. Economical considerations matter, and if it appears to be the case that the odds of winning the trial are not too good and the financial loss would be too great for the kind of offence involved, then the prosecutor may choose to offer a plea bargain (in such countries where plea bargaining is admitted).

A useful application is the development of such decision-support systems that would assist the prosecutor in evaluating a case at hand, so that he or she could more confidently decide whether to prosecute. Considerations in terms of cost/benefits analysis are important for the parties involved in litigation, in both criminal and civil cases. It may be important to be able to evaluate a case for settlement at an early stage of a suit or claim, both because of the cost of litigation, and the risks of the outcomes of a trial; alternative dispute resolution may be convenient to consider, and moreover, foreseeing legal costs, alternative fee arrangements with the attorneys may be entered. Arno Lodder and John Zeleznikow provided an overview of computer-assisted dispute resolution (as being an alternative to litigation) in a book (Lodder & Zeleznikow, 2010, cf. 2005).

Peter Tillers (personal communication, March 2006) kindly identified, for the present author, as Marc B. Victor (http://www.litigationrisk.com/) the developer, whom he had mentioned years before, of a decision-theoretic tool, which assumes the chances of proving this or that. Victor's Litigation Risk Analysis<sup>TM</sup>, Inc., based in Kenwood, CA, provides consulting, training, and software. Here is some information based on that firm's own promotion.

The Litigation Risk Analysis method (developed and taught by Victor from the early 1980s on) can be applied by performing the analysis by hand; alternatively it can be performed by a user who understand that method, using a decision tree software called *TreeAge Pro* (formerly known as *DATA*), produced by TreeAge

 $<sup>^{23}</sup>$  In view of this, it is somewhat ironic that in an article on computerised sentencing information for judges, Doob and Park (1987–1988) began by stating: "There are few, these days, who would not argue that those making important judgments should have access to relevant information. The difficulty usually is not only having the information, but having it reasonably accessible and produced in a usable form". In their case, they were seeking "to provide judges with some of the information that is relevant to the passing of sentences". Clearly, the context was very different of that of exclusionary rules of evidence. Rather, Anthony Doob and Norman Park had assumed that judges would be very interested in learning about current sentencing. Developing their computerised system intended to aid judges in sentencing required that those developing the computer system would figure out beforehand what kind of information would be useful: "The history of this project illustrates the difficulties in knowing *a priori* what information will be most useful and illustrates the necessity of working closely with the eventual information user" (ibid., p. 54). See Section 4.2.3 above.

Software, Inc., to be installed on Windows<sup>TM</sup>. The tool makes use of pull-down menus, and graphics. Trees are constructed by adding nodes and branches, and typing the names and probabilities.

The users targetted are ones who need evaluate litigation risk – corporations, or their lawyers – who when litigating may undervalue a case, pass up a chance to settle and then lose the trial, or vice versa, may overvalue a case, settle and pay too much. Such clients include corporate law departments, as well as the claim units at insurance companies. In the analysis, the evidence and the arguments are taken into account, yet the probabilities are assumed.

According to his website, Victor's clients are offered libraries of decision trees for various types of claims (for example, there are ready-made sets of models for personal injury & products liability claims, and for medical malpractice claims). Such availability reduces, according to the promotion, the time needed to construct correct trees. Victor's firm also offers to develop tailored models. As a consultant for the attorneys of a client, Victor elicits from them quantified input concerning the legal and factual uncertainties involved in a case, and concerning both liability issues and damage issues, he probes the relationships between the uncertainties, explores consequences from each possible combination of rulings and findings, and assesses with the attorneys the likelihood of good versus bad results.<sup>24</sup>

According to his method, the expected value of litigating is the probabilityweighted average of all possible outcomes (and how changes in various probabilities would affect the expected value is quantified by means of sensitivity analyses). This is useful when the client can afford to "play the averages", whereas in some cases, the probability of extreme consequences militates against "playing the averages" in the given case: the range and likelihood of possible outcomes is shown in a probability distribution chart.

#### 4.3.1.4 Bargaining, and Game Theory

Julia Barragán (1989) provided a short discussion of bargaining, but not pleabargaining (at any rate, not explicitly), even though the forum in which the paper appeared was in computing for law. Rather, she sketched (not very convincingly) an application to software design. At the beginning, her paper stated it "will consider the bargaining process as rational behaviour, and bargaining models as a part of a General Theory of Rational Behaviour" (ibid., p. 49). The approach she overviewed is from *game theory*. "Bargaining models are related to Game Theory, since the bargaining problems domain is concerned with decision making in a social setting, in the very particular context of uncertainty known as a game" (ibid., p. 51). In a game, "three elements enter: (1) alternation of moves, which can be either personal or random (chance) moves, (2) a possible lack of knowledge, and (3) a payoff function" (Owen, 1995, p. 2). In *graph theory* (which is itself part of *topology*), a *tree* is such a graph, that any two *nodes* (also called *vertices*) are connected by exactly one *path*,

<sup>&</sup>lt;sup>24</sup> http://www.litigationrisk.com/m-con-mbv.htm

itself made of one or two consecutive *edges*. A formal *game* can be represented as a *game tree* (also called a *topological tree*), with a distinguished node which is taken to be the starting node of the tree, i.e., the starting point of the game. A game with *n* players must have:

- 1. a *starting point* (a distinguished node in the game tree);
- 2. a *payoff function*, which associates n values with each terminal node of the tree (terminal nodes are such nodes that no path from the starting node can continue any further);
- 3. a partition of nonterminal nodes of the tree game into n+1 sets, called the *player* sets: these are the chance move,  $S_0$ , and the moves of all players, i.e.,  $S_1, \dots S_n$ .
- 4. "a randomization scheme at each chance move" (Owen, ibid.): "a probability distribution, defined at each vertex of  $S_0$ , among the immediate followers of this vertex" (ibid.);
- 5. a division "of a player's moves into 'information sets': he knows which information set he is in, but not which vertex of the information set" (ibid.): each *player set*  $S_i$  is partitioned "into subsets  $S_i^{j}$ , called *information sets*, such that two vertices in the same information set have the same number of immediate followers and no vertex can follow another vertex in the same information set" (ibid.);
- 6. an index set associated with each information set, along with a one-to-one mapping of that index set onto the set of immediate followers of each vertex of that particular information set.

Clearly, game theory is appropriate for modelling bargaining problems in general; this potentially applies to plea-bargaining, too. It is arguably not by chance, that perhaps the best known formal game of all (actually a case of *noncooperative bimatrix* game, a two-person general-sum game) is the Prisoner's Dilemma: two prisoners are in two cells, cannot communicate with each other, and are each offered a deal. If he pleads guilty and implicates the other prisoner, he himself will get a reduced sentence, and the other prisoner will get the lowest payoff, i.e., the stiffest sentence. Should neither of the two prisoners agree to the deal, neither would confess, and they would both get off with a light sentence, or would even avoid having to serve time in prison after the trial. Should both of them agree to the deal, plead guilty and implicate the other prisoner, this would be the only *equilibrium* pair, and both of them would get a very low payoff, i.e., they would both get rather stiff sentences. But if none of them would agree to the deal, they would be rather better off, and would both get a mild sentence. But the best payoff for a prisoner in this game is if he double-crosses the other. This is represented in the *payoff matrix* of Table 4.3.1.4.1, which is based on the example in Owen (1995, p. 164).

By contrast, in *two-person cooperative games*, "cooperation between the two players is allowed. This means that binding contracts can be made, that correlated mixed strategies are allowed, and that utility can be transferred from one player to the other (though not always linearly)" (Owen, 1995, p. 190). "A serious objection can be raised to Nash's bargaining scheme, and it is that it does not take threats into

Prisoner P1:	Prisoner P2:	
	Confesses:	Does not confess:
Confesses:	(1, 1)	(10, 0)
Does not confess:	(0, 10)	(5, 5)

**Table 4.3.1.4.1** The payoff matrix in the Prisoner's Dilemma. The parentheses inside each cell are the payoff vectors of the terminal nodes in the game

account" (ibid., p. 198). Theorem IX.2.2 in Owen (1995) states: "Any bimatrix game has at least one equilibrium pair of threat strategies (x, y)" (ibid., p. 200). Guillermo Owen then goes on to discuss how to formalise bargaining with threats, and next, how to deal with time-restricted bargaining (where, for example, it may be much better to accept deal now, than later on, like in an industrial dispute with a strike).

# 4.3.2 Evaluating the Effects of Obtaining or Renouncing a Piece of Evidence

Levitt and Laskey (2002) combined Bayesian inference networks with knowledge representation from AI, in order to structure and carry out an analysis of evidential argumentation about an infamous murder case. In their Section 1.5, they enumerated desiderata concerning current and future tools for supporting judicial proof: such tool should allow to represent hypotheses and supporting or denying evidence (ibid., Section 1.5.1), to compare beliefs between alternative hypotheses (ibid., Section 1.5.2), to update belief based on incrementally accrued evidence (ibid., Section 1.5.3), and to examine variations of the same hypothetical–evidential scenario (ibid., Section 1.5.4).

In their Section 1.5.4, they wrote (ibid., pp. 381–382): "A unique application of sensitivity analysis" (the sensitivity analyses reported in their article, in Section 1.4.4., being performed by Keung-Chi Ng) "has been provided for" Bayesian networks (BNs) "that provides a quantitatively powerful, scientifically meaningful, and qualitatively intuitive measure of the relevance and importance of evidence to the truth or falsity of a target hypothesis or BN query".

Gathering evidence may be costly and time-consuming. Does what is to be proven really require a given piece of evidence to be obtained?

Before evidence is observed, we can assess the impact of observing any possible state of an evidence variable, as well as the impact, if relevant, of failing to learn anything about the evidence available. We can examine the degree to which the probabilities in which we are most interested would be affected by observing the evidence. We can rank the different evidence-gathering strategies by impact on the conclusion and prioritize evidence gathering accordingly. When there are monetary or other costs to evidence gathering, these techniques provide tools for balancing the information gain of evidence gathering against the cost. [...] (Levitt & Laskey, ibid., p. 382). An important consideration we can make is that if the purpose is to assess beforehand whether to incur the costs of obtaining this or that evidence, then this is not as vulnerable to a Bayesio-skeptic critique in the controversy about Bayesianism's application to judicial decision-making, as actually trying to model the strength of the evidence for conviction in the actual trial, and proposing such statistics as evidence, would be. In fact, making use of Bayesianism for a costs/benefits analysis so that a decision is made, during fact investigation or the preparation of a trial, to either obtain or renounce some evidence, belongs in the economics of one party in the trial preparing its case. A private party turning to the courts, or called to respond, are within their rights to adopt a flawed method, or consult an astrologer, if they so wish, as well as to mismanage their case, and therefore have no case to answer if charged with methodologically unwarranted assumptions by the Bayesio-skeptics.<sup>25</sup>

When it comes to the prosecution preparing its cases, they are more vulnerable to critique, if they demonstrably grossly mismanaged a case. Nevertheless, especially in the adversarial system of procedure from Anglo-American jurisdictions (unlike, until recently, in many countries of the European Continent), in criminal cases the prosecution has the discretion whether to prosecute at all. Therefore, Bayesian methods being used in a costs/benefits analysis of whether to obtain some evidence, or then of whether to prosecute or offer a plea bargain instead, are practically immune from Bayesio-skeptic attacks.

## 4.3.3 Benefits, Costs, and Dangers of Argumentation

Negotiators hope to benefit from negotiating successfully, and more in general, people who engage in exchanging arguments also expect some benefit from such an activity. And yet, the very choice of engaging in such activities incurs costs and is fraught with dangers. If there is a category of a potential arguers who are acutely aware of this, this is people who are considering whether to turn to the courts. You

<sup>&</sup>lt;sup>25</sup> The debate about Bayesianism in judicial context is complex. In a sense, concrete misgivings, apart from mathematical niceties and whether they do model the world reliably, boil down to this: that the problems of Bayesianism cannot be solved by mere computational powers, and that all it takes, to cause the calculations go wrong, is for some supposedly expert and honest witness (e.g., some physician specialised in serving insurance companies) to say whatever suits those instructing them, and then Bayesianism could not possibly put that right. The real danger is overly relying on a formalism, when it is the adjudicator's common sense (however flawed) that should stay alert, in acute awareness that there is no safety net. Reliance on formalisms may give raise to a delusion that things are being taken care for, whereas they actually are not.

Allen and Pardo stated (2007b, p. 308): "[W]e are not uncompromising sceptics, and we even concede that the formal models may be useful in evaluating evidence and that it may not be unreasonable for parties to argue, or fact-finders to evaluate evidence, along the lines suggested by such models. To say that such models may be useful is not, however, to accept them as the sole or even a particularly reliable method of discovering the truth. Our objection is to scholarship arguing just that such models establish the correct or accurate probative value of evidence, and thus implying that any deviations from such models lead to inaccurate or irrational outcomes".

may lose, have to pay your lawyers, and also have to pay the costs of the other party. Or then, this may be an area of litigation in which even if you win, the law usually does not envisage recovery *inter partes*, and what you spent in order to have your day in court may loom too large an amount for you to derive a financial benefit from having turned to the courts. The emotional strain, too, comes at a cost.

In negotiation, arguing comes at a cost (Karunatillake & Jennings, 2004, p. 235)<sup>26</sup>:

Although argumentation-based negotiation can be effective at resolving conflicts, there are a number of overheads associated with its use. It takes time to persuade and convince an opponent to change its stance and yield to a less favourable agreement. It takes computational effort for both parties of the conflict to carry out the reasoning required to generate and select a set of convincing arguments, and to evaluate the incoming arguments and reason whether to accept or reject them. However, not all conflicts need to be resolved. Thus, for example, when faced with a conflict, an agent could find an alternative means to work around the situation; thereby evading the conflict rather than attempting to resolve it. [...] Given the overheads of argumentation, and the alternative methods available for overcoming conflicts (evade and re-plan), we believe it is important for agents to be able to weigh up the relative advantages and disadvantages of arguing, before attempting to resolve conflicts through argumentation.

A modicum of caution is also required when one is faced with the choice whether to argue, also in dialogical domains different from negotiation. In an article entitled 'Why argue? Towards a cost–benefit analysis of argumentation', Paglieri and Castelfranchi (2010) extend the discussion indeed, and consider not only the costs of arguing, but also the dangers, which they separate from the costs. Paglieri and Castelfranchi (2010) develop a neglected topic from the study of argumentation. An agent's decision whether to argue or not is governed by strategic considerations, that they set to highlight. They "propose a tripartite taxonomy and detailed description of the strategic reasons considered by arguers in their decision-making: benefits, costs, and dangers" (ibid., p. 71), and "contextualise such notions within the general framework of expected utility theory" (ibid., p. 73). They "insist that the implications of acknowledging the strategic dimension of arguing are far-reaching, including promising insights on how to develop better argumentation technologies".

People are often reluctant to argue, e.g., with one's boss, or with one's partner in a romantic relationship. The very fact of arguing may damage the relationship. Such "reluctance to argue is not a form of lamentable timidity, but rather the expression of strategic concerns: we do not engage in argument when doing so is likely to have an overall negative outcome" (ibid., p. 71).

Disagreement may escalate, so arguing could be ruinous (Paglieri, 2009; Paglieri & Castelfranchi, 2010). *The emotional well-being* of the arguers is affected (ibid., p. 82), and there are other factors militating to make escalation in disagreement an utterly undesirable outcome. And this is just one kind of danger. There also is a danger to the *reputation* of the arguer (ibid., p. 83). "A further danger of arguing concerns drawing unwanted attention from the counterpart on topics that it would

<sup>&</sup>lt;sup>26</sup> Karunatillake (2006), a doctoral dissertation, provides further details.

be in the arguer's best interest to keep hidden or out of focus" (ibid., p. 82). Yet another danger (ibid., p. 81) is that

an argument may 'backfire', to use Cohen's (2005) apt terminology, in the sense of undermining the credibility of the conclusion it aimed to prove. When an argument fails to prove its conclusions, this should not be taken to indicate that the audience is left with the same views on the matter they had before being exposed to the argument. Quite often, what happens is that a failed argument is taken as evidence to the contrary: the very fact that an argument for *p* failed is easily interpreted as an argument for [its negation,] which is clearly a highly unsatisfactory result for the arguer. Even more dramatically, once argumentative failure has occurred, the more effort the arguer put into the original argument, the more likely it is that the audience will consider this failure as good proof of the falsity of the intended claim. After all, if a determined and competent arguer, after putting so much effort into arguing for p, still failed to prove it, the most likely reason for that failure is that p is false, since there is no question as to the competence and motivation of the arguer. Like in a nightmarish subversion of all standard values, backfiring arguments may happen to retort against the arguer his very best efforts. This also implies that the dangers of arguing, in terms of negative effects on the credibility of the conclusion, increases as a function of duration, efforts, and quality of the argumentative process.

Strategic considerations about whether it is worthwhile to argue do matter not only for human arguers or prospective arguers, but also for computational tools applied to argumentation: "argument-based technologies for open systems are likely to be more effective if they are not 'doomed to argue', but rather allowed to opt for different interactive modalities in different contexts, arguing only when it is expedient doing so" (Paglieri & Castelfranchi, 2010, p. 71).

In an endnote, Paglieri and Castelfranchi suggest that the neglect, in computational models of argument, of taking into account whether it would be a benefit rather than a disbenefit to argue in the first place, is related to the relative neglect of dialogical or procedural aspects of argument: "strategic consideration of costs<sup>27</sup> and benefits still remains ahead of much of the field, since the issue becomes relevant only after acknowledging argumentation as an essentially dialogical process, involving communication between multiple agents" (ibid., p. 87, n. 1).

Another reason for the neglect of cost-benefit analysis in argumentation research, and in particular in computational models of argument, is that relatively few scholars

<sup>&</sup>lt;sup>27</sup> This is not to say that algorithmic and complexity issues relating to computational models of argument have not been researched. Quite on the contrary, there is such a flourishing direction of research (e.g., Ben-Capon & Dunne, 2007). "However, in this case, the preoccupation is with the tractability of a given argumentation framework, whereas our concerns here are on a completely different scale: even assuming that a given argumentation framework is tractable, the individual agent still has to make a strategic decision on whether arguing is rational or not, given current goals, available resources and relevant context. Obviously, the tractability of the underlying argumentation framework impacts on the strategic considerations of the agent. If the framework makes argumentation intractable or typically very costly for the agent, the likelihood of considering such practice worthwhile is either non-existent or comparatively low. But the crucial point is that, even when argumentation is tractable and its costs are in principle affordable, it does not immediately follow that arguing is the best option for the agent. It is this crucial decision problem that so far has been largely overlooked in argumentation theories, both within and outside AI: our aim now is to move some preliminary steps to explore the issue" (Paglieri & Castelfranchi, 2010, p. 73).

have considered computation to be resource-bounded. But when modelling agents, it stands to reason to bear in mind that realistically, agents are resource-bounded, and that in particular, they have bounded rationality, too. For the latter, refer to Rubinstein's book (1998) *Modelling Bounded Rationality*. Also see Gigerenzer and Selten (2001). Gabbay and Woods (2003) are aware of the importance of studying argumentation under assumptions of bounded rationality.

Paglieri and Castelfranchi (ibid., p. 87, n. 2) quote Amgoud and Maudet (2002, p. 406) as recognising that "Ideal agents compute [...] for free. But computation takes resources, and for instance spending too much time trying to determine the acceptability of an argument may be a poor strategy. What if the agent cannot conclude within the bound of the resources? [...] The role of strategy is even more crucial when taking into account the resource-bounded nature of agents". But such considerations are certainly instead on the mind of people who resort to the services of lawyers, or balk at doing so. Litigation is costly.

"[D]ialogical goals are rarely terminal, i.e. they tend not to be ends in themselves" (Paglieri & Castelfranchi, ibid., p. 74). "Dialogical goals are often instrumental to extra-dialogical goals: the car dealer wants to persuade you of the superiority of a given model in order to sell you that model, not just for the sake of discussion" (ibid.). Arguing is instrumental, and is a plan you may adopt or not adopt when pursuing extra-dialogical goals (ibid., pp. 74–75):

This implies a form of *argumentative instrumentalism*: both the overall decision to argue and more fine-grained choices of specific moves are ultimately affected by the extradialogical goals of the arguer. Argumentative instrumentalism has three facets: first, dialogical sub-goals are instrumental to some dialogical end (e.g. lauding the design of a given car is instrumental to persuade you of its superiority as a purchasing option), which in turn is instrumental to some extra-dialogical goal (e.g. selling you the car); second, the extra-dialogical goal has *priority* over the dialogical one, so if a given move is likely to foster the former but not the latter, the arguer should choose that move (e.g. observing that only few chosen people can afford to buy that model may be instrumental to selling you the car by appeasing your vanity, even if this point has no bearing on the alleged superiority of that particular model over others); third, a given move or set of moves may be instrumental to some other extra-dialogical goal of the arguer, different from the one which motivated to argue in the first place (e.g. the seller may try to impress an attractive female client with his elocution not as an effective mean to sell her the car, but rather hoping to get a date with the client).

Bear in mind that in a courtroom situation, the arguing parties, as well as the judge, are not merely concerned with persuasion in the case at hand. Bernard Jackson (2010) points out:

If we find a "a variety of different voices interlaced in the judge's discourse" ([Azuelos-Atias, 2007], p. 99), thus fulfilling his role of impartiality (p. 93), this represents the judge's personal goal of presenting himself to his colleagues according to the accepted image of good judicial behaviour. Even more so, in the case of the lawyers. Their audience is not confined to the parties to the particular case, or some notional reasonable reader; their discourse is directed to their professional peers and particularly those in whose hands lie decisions as to their professional advancement. From the very fact that some lawyers are known within the profession as mavericks, willing to fight for their clients (within the law and legal procedures) with little display of respect for institutional players such as the police, we become

aware of the fact that those who do "play the game" are in fact playing their own game as well as that of their clients. Nor should we exclude the presence here of a purely internal discourse: the communication by the lawyer of messages *to himself* (the same *acteur* playing different actantial roles, both sender and receiver), in constituting or fortifying a particular sense of personal identity.

## 4.3.4 Costs and Benefits of Digital Forensic Investigations

Richard Overill and Jantje Silomon devoted a paper (2010) to what they term *digital metaforensics*, i.e., "quantifying the investigation" into digital crime cases. Overill et al. pointed out (2009, from the abstract):

From the perspective of a digital investigation, it is the duty of digital investigators or forensic examiners to retrieve digital traces so as to prove or to refute the alleged computer acts. Given the resource constraints of most organizations and the limited time-frame available for the examination, it is not always feasible or indeed necessary for forensic examiners to retrieve all the related digital traces and to conduct a thorough digital forensic analysis.

Overill et al. (2009) and Cohen (2009) tried to develop metrics of cost-effectiveness, for the purposes of a costs/benefits analysis of forensic investigations into digital crime. Overill and Silomon (2010) provided a survey. In the summer of 2010, a software application, *Digital Forensic Advisor*, was being developed jointly at King's College London (by Overill's team), and Hong Kong University, with funds from Innovation China UK.

Overill and Silomon remarked (2010, section 2.2):

With law enforcement resources (principally manpower, money and time) already overstretched in relation to the number of digital forensic investigations requested, it becomes important to develop methods of determining whether or not any particular investigation is worthwhile undertaking. This leads naturally to the concepts of forensic triage and prioritisation. A preliminary filtering or pre-screening phase will enable evidentially hopeless investigations to be abandoned quickly, and the remainder to be ranked in probable order of evidential strength. A number of criteria have been proposed for making the initial assessment, including cost-efficiency [(Overill et al., 2009)] and return-on-investment (ROI) [(Cohen, 2009)].

Of those two measures, *cost-efficiency* "ranks the recovered evidence against the expected evidence for a known type of crime. A forensic technician is guided through the assessment by a software application" such as *Digital Forensic Advisor*, "in a pre-determined sequence which seeks out the most evidentially significant traces first, and, among traces of equal evidential weight, the lowest cost traces first" (Overill & Silomon, section 2.2). The advantage is that "an evidentially hopeless assessment can be detected early on and abandoned, while only those assessments which exceed a pre-determined evidential threshold [...] are passed on to an experienced forensic examiner for full processing" (ibid.).

By contrast, *return-on-investment* (ROI), a measure used by Cohen (2009) and inversely related to the *cost-benefit ratio* (CBR), is calculated as follows. Let *i* be a given trace, and  $w_i$  be its evidential weight, and  $c_i$  be its cost. Then:

$$ROI(i) = w_i/c_i$$
$$CBR(i) = c_i/w_i$$

Overill and Silomon (section 2.2), citing Cohen (2009), point out:

The evidential traces for a known type of crime can be ranked in order of descending ROI (or of ascending CBR) and then assessed in that order. Refinement of this scheme is possible: for example, where a particular trace *i* contributes to  $n_i > 1$  evidentiary chains then its effective weight is given by  $w'_i = n_i \times w_i$  and the effective ROI is then  $(n_i \times w_i)/c_i$ 

Nevertheless, Cohen (2009) also proposed different metrics, namely,

$$n_i + (c_i/10)$$

and

 $n_i/c_i$ 

Which metric (which ranking) to choose, for a digital forensic laboratory, "will depend on its individual priorities (for example, throughput *versus* resources) as well as on the nature of the suspected digital crime (for example, civil *versus* criminal, or large scale *versus* small scale)" (Overill & Silomon, section 2.2).

Overill et al. (2009) were concerned with digital traces  $T_i$  of a digital crime, that can be detected on a hard disk. Let there be *m* such traces. The team wanted to be able to find the relative cost ranking of those traces. They notated this as:

$$T_1 \leq T_2 \leq \cdots \leq T_{m-1} \leq T_m$$

Overill et al. claimed (2009, section 2):

As a direct consequence of this ranking, the minimum cost path for the overall investigation is immediately uniquely defined. It is worth to denote here that different organizations can adopt different relative costs to similar traces in order to meet with the organizational goals.

As an example, they drew a *path diagram* with four traces. There are different paths by which one may reach the permutation  $T_1T_2T_3T_4$ . Four arcs depart from the initial node, Ø, of the graph. Those arcs respectively reach nodes  $[T_1]$ ,  $[T_2]$ ,  $[T_3]$ , and  $[T_4]$ . The next level of nodes includes  $[T_1T_2]$  (which is reached from  $[T_1]$  and from  $[T_2]$ ),  $[T_1T_3]$  (which is reached from  $[T_1]$  and from  $[T_3]$ ),  $[T_1T_4]$ ,  $[T_2T_4]$ , and  $[T_3T_4]$ . The next level of nodes comprises  $[T_1T_2T_3]$  (reached by arcs from respectively  $[T_1T_2]$ and  $[T_1T_3]$ ),  $[T_1T_2T_4]$ ,  $[T_1T_3T_4]$ , and  $[T_2T_3T_4]$  (the latter by arcs from respectively  $[T_2T_3]$  and  $[T_2T_4]$ ). And finally, arcs reach the last node,  $[T_1T_2T_3T_4]$ , in the path graph.  $[T_1T_2T_3T_4]$  is the *minimum cost path*.

In Overill et al. (2009), the evidential weight associated with the investigation is

$$\mathbf{W} = \sum_{i=1}^{m} w_i$$

where the relative fractional importance  $w_i$  of each trace  $T_i$  is either assigned by moderated independent expert peer review, or by default is set equal to 1 = m. We note in passing that this process only needs to be undertaken once as a pre-processing step for each distinct digital crime template. The estimate **W** should be compared with unity. If **W** is sufficiently close to unity, this signifies that the *prima facie* of the case can probably be established; otherwise, it is unlikely that the available digital traces are sufficient to support the case. In other words, the differential gap between **W** and unity can formulate a "cut-off" condition that can avoid identifying all traces exhaustively in a forensics investigation.

Section 3 in Overill et al. (2009) is about missing traces, when "there is no way that an examiner can fully ascertain the trace evidence of the case." If trace  $T_j$  is not found, then all paths involving  $T_j$  must be deleted, and it must also be deleted from the minimum cost path. Then the associated weight associated with the investigation is

$$\mathbf{W} = \sum_{i \neq j}^{m} w_i$$

If the missing traces are  $T_j$  and  $T_k$ , then all paths involving either must be deleted, the minimum cost path will of course not include either trace, and the associated weight associated with the investigation is

$$\mathbf{W} = \sum_{i \neq j,k}^{m} w_i$$

Next, Overill et al. (2009, section 4) proposed a two-phase schema for performing a digital forensic examination at minimal cost. The first phase is one of preprocessing, and its task is to detect the traces:

- 1. Enumerate the set of traces that are expected to be present in the seized computer based on the type of computer crime that is suspected of having been committed.
- 2. Assign relative investigation costs to each of the expected traces.
- 3. Rank the expected traces in order of increasing relative investigation costs.
- 4. Assign relative importance weights  $w_i$  to each of the ranked traces.
- 5. Rank the expected traces within each cost band in order of decreasing relative importance weight.
- 6. Set W, the cumulative evidential weight estimate, equal to zero.
- 7. Set  $W_{\text{rem}}$ , the remaining total of available weights, to 1.
- 8. For each expected trace, taken in ranked order:
  - 8.1 Search for the expected trace.
  - 8.2 Subtract the relative importance weight  $w_i$  of the expected trace from  $W_{\text{rem}}$ .
  - 8.3 If the expected trace is present add its relative importance weight  $w_i$  to **W**.
  - 8.4 If W is sufficiently close to 1 then proceed immediately to *Phase 2*.
  - 8.5 If  $(\mathbf{W} + W_{\text{rem}})$  is insufficiently close to 1 then abandon the forensics investigation.

As to *Phase 2* in Overill et al. (2009, section 4), its task is to analyse the traces, and it resorts to a *Bayesian network*<sup>28</sup>: "Set up a full Bayesian Network model for the hypothesis of the digital crime and run and analyze the Bayesian Network model for the hypothesis of the digital crime as described previously in" Kwan, Chow, Law, and Lai (2008), which is an earlier paper from the same team.

We are going to come back to digital forensics in Section 6.2.1.5, and at the end of Section 8.3.2. The context of the latter is the debate about the role of statistics in the forensic sciences. As there was nothing specific to the technical aspects of investigating digital crime in our present discussion, we were able to treat models of such investigations' costs and benefits within the same compass as other kinds of costs/benefits analysis we have been considering in Section 4.3.

## 4.4 ADVOKATE, and Assessing Eyewitness Suitability and Reliability

## 4.4.1 The Turnbull Rules

Identification by eyewitness is far from safe. This is why in some jurisdictions with a jury, jurors receive judicial directions concerning this.<sup>29</sup> Bromby, MacMillan, and McKellar (2007) pointed out (ibid., p. 306):

Miscarriages of justice due to inaccurate eyewitness identifications are not new. In England and Wales, the inquiries into the trial of Mr Adolf Beck in 1904 and the arrest of Major R. O. Sheppard in 1925 acknowledged the erroneous identifications in those cases, but failed to recognize the inherent weakness associated with all eyewitness evidence. The Beck case led to the establishment of the Court of Appeal in England and Wales. In  $R \vee Williams$ , counsel for the defence asked the court to give a general direction that where the only evidence against an accused person was identification by one witness, the jury should be

 $<sup>^{28}</sup>$  A Bayesian network is a directed acyclic graph (i.e., a graph without loops, and with nodes and arrows rather than direction-less edges), such that the nodes represent propositions or variables, the arcs represent the existence of direct causal influences between the linked propositions, and the strengths of these influences are quantified by conditional probabilities. Whereas in an *inference network* the arrow is from a node standing for evidence to a node standing for a hypothesis, in a Bayesian network instead the arrow is from the hypothesis to the evidence. In an inference network, an arrow represents a relation of support. In a Bayesian network, an arrow represents a causal influence, and the arrow is from a cause to its effect.

<sup>&</sup>lt;sup>29</sup> Bromby et al. (2007, p. 303) discussed, in relation to eyewitness identification in Commonwealth jurisdictions, criminal jury directions, i.e., such judicial directions to the jury that are intended "to guard against wrongful convictions based upon erroneous eyewitness identification evidence. Factors known as the Turnbull Rules, derived from the English case R v. Turnbull, are of significance within many common law jurisdictions when considering the accuracy of eyewitness identifications and the practice of jury directions or mandatory warnings. The influence of these rules, together with variations in the approach taken by Commonwealth jurisdictions, illustrates that while the factors identified in Turnbull are to be found in the approaches adopted across the various jurisdictions studied, there is diversity in terms of whether or not such directions are mandatory and also as to their form and scope."

warned that it would be dangerous to convict without corroboration. The Lord Chief Justice, Lord Goddard, in quashing the conviction due to mistaken eyewitness identification, held that the Court of Criminal Appeal would lay down no hypothetical directions for a jury, as suggested by counsel. By contrast, in 1962 in the Republic of Ireland, the Supreme Court held that a general warning should be given, as juries in general might not be fully aware of the dangers involved in visual identification: [...]

Bromby et al. (2007, p. 308) also remarked about jurisprudence from England and Wales:

In 1976, following several high profile cases of mistaken identity and poorly conducted lineups in England and Wales, the Devlin Report [(Devlin, 1976)] provided a thorough analysis of identification evidence in criminal proceedings. The report had been commissioned by the Home Secretary to review all aspects of the law and procedure relating to evidence of identification in criminal cases and to make recommendations. [...] It was recommended that the trial judge should be required by statute '... to direct the jury that it is not safe to convict upon eyewitness evidence unless the circumstances of the identification are exceptional or the eyewitness evidence is supported by substantial evidence of another sort'. Such a statutory direction was never enacted. Although the committee did not wish to define the exceptional circumstances in which a conviction could be secured on the basis of eyewitness evidence, it did summarize the chief points, which in the normal course of events, a summing-up might be expected to cover: [...]

A list was based on input that the Devlin committee received from the Magistrates' Association, which does not imply that the factors listed were in common use to guide the judiciary in their summing-up (Bromby et al., 2007, p. 309):

- (i) *The witness himself.* Whether he appeared in examination and crossexamination as careful and conscientious or as obstinate or as irresponsible. Whether the experience, for example, in the case of violent crime, might have affected an identification.
- (ii) Conditions at the scene. How good the lighting levels were and whether the vantage point afforded an uninterrupted view. How much of the criminal was seen and whether there has been a single period or multiple periods of observation.
- (iii) Lapse of time. The duration between the observation and the subsequent identification.<sup>30</sup>

<sup>&</sup>lt;sup>30</sup> Delay has an effect upon the accuracy of identification by eyewitness, but also age has an impact. For example, cf. Memon, Bartlett, Rose, and Gray (2003) "The aging eyewitness: The effects of face-age and delay upon younger and older observers", whereas Memon and Gabbert (2003b) tried to find up such arrangements at lineups that would affect the identification accuracy of old witnesses. Dysart, Lindsay, MacDonald, and Wicke (2002) considered the effects of alcohol on eyewitness accuracy. Caputo and Dunning (2006) discussed post factum indicators of eyewitness accuracy, so that accurate identifications could be distinguished from erroneous ones. Horry and Wright (2008) found that viewing *other-race faces* may an impairing effect on context memory, in the sense that the eyewitness may recall having seen that face, but not be quite accurate or sure about where he or she saw that face of that person from a race other than one's own. This may be

- (iv) *Description*. What does a comparison show? The judge and jury should bear in mind that the ability to identify correctly and the ability to describe correctly are distinct.
- (v) Identification parade. Whether there are any criticisms of the line-up conditions. Did any witnesses, for example, make no identification or pick out someone other than the suspect?
- (vi) *Identified person*. Whether the suspect is easy to recognise (distinctive) or unremarkable in comparison to others (nondescript).
- (vii) *No circumstantial evidence*. Whether other statements might have been expected or identifiable objects retrieved that relate to the eyewitness's evidence.

"Following the Devlin Report, the first case to give serious consideration to eyewitness identification was  $R \vee Turnbull$ " (ibid.). Lord Chief Justice Widgery followed the Devlin Report as to jury directions, and acknowledged that occasionally eyewitness identification may be fallible. Nevertheless, as Bromby et al. point out (2007, pp. 309–310):

He made a distinction between cases with good quality identification evidence and those with evidence of a poorer quality. Differing sharply from the Devlin Report, the *Turnbull* judgment stated that prosecutions based solely upon a single eyewitness identification of 'good quality' should not fail automatically. This implies that good eyewitness identification on its own should be sufficient to secure a conviction without the requirement for further corroborative evidence. Although 'good identification evidence' and 'poor identification evidence' may be easy to define at extremes of the spectrum, cases which fall between the two cannot be classified so easily. The majority of cases where identification is disputed will present evidence either in between the two extremes or scattered along the entire spectrum of quality.

The following eight factors are known as Turnbull Rules, and as summarised here they are taken from Bromby, MacMillan, and McKellar (2003, p. 101):

- (1) the visibility and lighting conditions at the time of the offence
- (2) the distance of the eyewitness from the perpetrator
- (3) the duration of observation of the crime by the eyewitness
- (4) whether the observation of the crime was impeded
- (5) whether the perpetrator was known to the eyewitness

because of which faces one is more used to see, under the assumption that people are more used to see faces of people from one's own race. Arguably (as a research hypothesis we suggest here) experimenting with eyewitness who have been other-race adopted children and were raised in an environment where almost everybody is from the same race as their adoptive parents could show that their context memory is more accurate when having to identify individuals (and the time of viewing) such that their faces are racially akin to those of the environment in which they were raised, rather than their own. Cf. Chance and Goldstein (1995); whereas Meissner and Brigham (2001) are concerned with the *own-race bias in memory for faces*.

- (6) the duration between the sighting of the offence and the reporting of the incident
- (7) the reasons the eyewitness recalls that the perpetrator was at the scene of the crime
- (8) the differences between the description of the perpetrator and the actual appearance of a suspect.

## 4.4.2 The ADVOKATE Project

Working at the Joseph Bell Centre for Forensic Statistics and Legal Reasoning of the University of Edinburgh, Bromby et al. (2003) set for themselves the task of developing knowledge-based software for evaluating eyewitness evidence. For that purpose, they adopted a *CommonKADS* approach, based on a framework developed by Schreiber, et al. (1999).

"The CommonKADS analysis identifies gaps where more information should be obtained and how the accumulated knowledge could be represented in a useful and accessible format" (Bromby et al., 2003, p. 101). As they explained (Bromby et al., 2003, p. 100):

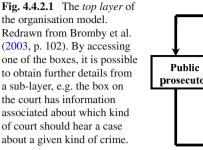
This paper discusses the modelling of a legal knowledge-based system that will alert a user on the reliability of eyewitness testimony. There is a large field of research and opinion on the performance and ability of humans to perceive, encode, store and retrieve facial images. By combining existing knowledge from different domains of expertise, such a system can draw attention to the dangers of allowing a jury to accept flawed eyewitness testimony.

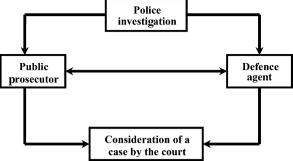
The model includes information such as the distance between the witness and the perpetrator; the duration of the observation; and the visibility or lighting conditions. These elements, along with several other event factors are commonly referred to as the 'Turnbull Rules' derived from the case R v *Turnbull*. The application of these factors has now become a requirement in England and Wales when considering the admissibility of eyewitness testimony in court. The Turnbull Rules have been applied by other common law jurisdictions, notably Ireland, Canada and Australia.

This paper presents a CommonKADS approach to designing a small-scale system to evaluate eyewitness evidence. CommonKADS is a Knowledge Acquisition Design System using computer-generated models to represent how tasks are performed, which agents are involved, their expertise and the communication involved in the process of evaluating eyewitness evidence. The knowledge modelled for the application has been drawn from sources such as: the police, the prosecution service, lawyers and psychologists.

The team analysed the current protocol for the inclusion of eyewitness evidence, and this produced "a multi-dimensional representation of knowledge, procedure and methodology. These three elements are central to any criminal investigation. Using the CommonKADS methodology, three models were constructed to identify and describe the complex process involved in analysing eyewitness evidence" (Bromby et al., 2003, pp. 101–102). The three models are the *organisation model*, the *agent model*, and the *task model*.

The organisation model represents how the investigation or case progresses through the legal system, and captures the rules of evidence. It deals with the issues

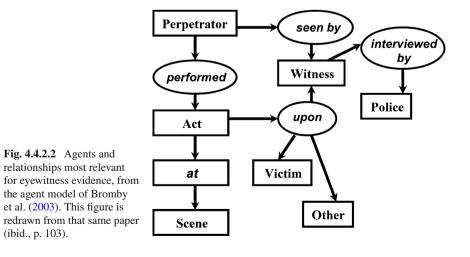




of admissibility and sufficiency of eyewitness evidence so that a case in court would be established. Figure 4.4.2.1 shows the top layer of the organisation model for a criminal case, and is redrawn from Bromby et al. (2003, p. 102). The boxes in the figure have more detailed information associated at a sub-layer.

The agent model represents relationships among individual agents (such as the police, the judge, the jury, the accused, the defence, and the prosecution, or then inanimate props). The agents are connected by actions. Figure 4.4.2.2 shows the most significant agents in the agent model, as far as eyewitnesses (possibly including the victim) are concerned. This figure is redrawn from Bromby et al. (2003, p. 103). "Other" may even be an inanimate object, such as a car. The boxes in this figure each contain either an agent or a concept. Ellipses contain relationships.

The task model in Bromby et al. (2003) identifies the main lines of inquiry so that eyewitness evidence could be gathered and evaluated. There is a sequence of three



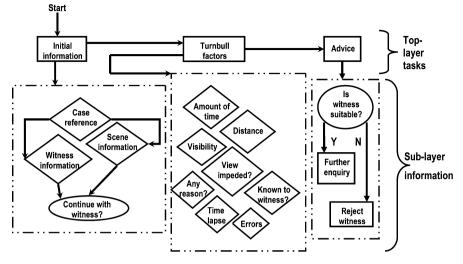


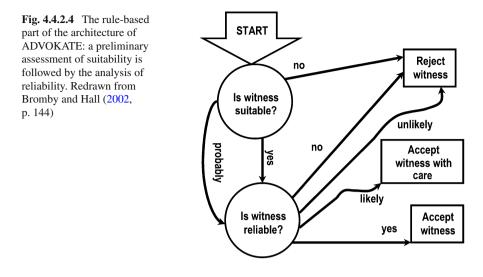
Fig. 4.4.2.3 The task model from Bromby et al. (2003). This figure is redrawn from (ibid., p. 104).

top-level tasks, and they are each exploded into a sub-layer of further information. This is shown in Fig. 4.4.2.3, which is redrawn from Bromby et al. (2003, p. 104). In this figure, each box contains a plan. A lozenge contains an enquiry. An ellipse contains a decision.

The project concerned is in the same domain as ADVOKATE,<sup>31</sup> a software tool developed by Michael Bromby in Glasgow and Maria Jean Hall at La Trobe University in Australia, was reported about in Bromby and Hall (2002) and Bromby et al. (2003). ADVOKATE is about the evaluation of the credibility of eyewitness evidence. "Directed graph techniques are used to model rule based knowledge", whereas "discretionary decisions and argumentation are modelled a technique derived from Toulmin argumentation" (Bromby & Hall, 2002, p. 143). Various factors, such as competency, compellability, and practicality, apply to witness suitability (which is applicable to all witnesses, and is primarily a legal test). Besides, there is witness reliability. A factor involved is mental capacity.<sup>32</sup>

<sup>&</sup>lt;sup>31</sup> The ADVOKATE software was made available at http://advokate.bromby.vze.com/ This browser-accessible application was developed by using an expert system shell, WebShell.

<sup>&</sup>lt;sup>32</sup> Michael Bromby first graduated in molecular and cell biology, and then earned a LLM, specialising in medical jurisprudence, intellectual property and artificial intelligence & legal reasoning. He also holds a diploma in forensic medical sciences. He co-developed ADVOKATE while a research fellow with the Joseph Bell Centre for Forensic Statistics and Legal Reasoning of the University of Edinburgh. He was for a while a technical consultant for a company specialising in police software solutions and facial composite systems, and then took up an academic position at the Law Department at Glasgow Caledonian University. According to his website at Glasgow Caledonian, "Michael's main research areas lie in facial recognition; his LLM dissertation examined the reliability and accuracy of automatic facial recognition systems as a tool for identification via CCTV



It is in the rule-based part of the architecture of ADVOKATE, that rules are represented as directed graphs. Nodes stand for concepts, whereas the possible values each concept in ADVOKATE can take as shown are arcs coming out of the node for the given concept. Figure 4.4.2.4 shows the rule-based part of the architecture of ADVOKATE, and is redrawn from Bromby and Hall (2002, p. 144). The rule-based part of the ADVOKATE model is followed by a part representing knowledge with discretionary inferencing. In fact, whether a witness is suitable and reliable is not determined by rule-based inferences. It is up to the discretionary decisions of the court.

Besides, also witness competency is assessed, based on age and mental comprehension. Does the witness understand the difference between truth and falsehood? Does the witness understand the duty to tell the truth? Is the witness able to give coherent testimony? (Bromby & Hall, 2002, p. 146). If the witness does not meet any of those three requirements, then the witness is not competent, and therefore this witness is not suitable.

"The *compellability* of a witness is determined by looking at two factors: the *connection* between the witness and the accused; and any *immunity* the witness may have" (ibid.). For example, by precedent in the law of Scotland, "communication between spouses during marriage is privileged and a spouse cannot be compelled to give such evidence" (ibid.). Figure 4.4.2.5 shows the test for witness compellability in ADVOKATE; it is redrawn from Bromby and Hall (2002, p. 146).

cameras, and his DipFMS dissertation concentrated on Expert Evidence in the UK. As a biochemist, he also carries an interest in DNA profiling, blood typing and other biological and forensic methods of identification for both civil and criminal systems." Identification via *closed-circuit TV cameras* (*CCTV*) is the subject of Bromby (2002, 2003).

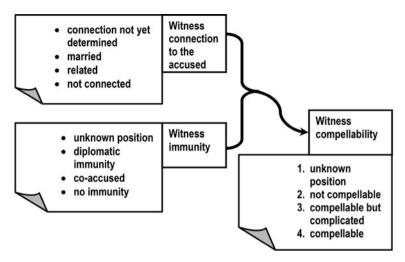


Fig. 4.4.2.5 The test for witness compellability in ADVOKATE. Redrawn from Bromby and Hall (2002, p. 146)

## 4.4.3 More on Taxonomies of Factors

It is important to realise that the taxonomy of factors in ADVOKATE is *ad hoc*, and is not necessarily uniform in eyewitness research.<sup>33</sup> For example, a basic distinction one comes across in the literature is between *estimator variables* and *system variables* affecting eyewitness testimony. In the lecture handouts of a course she has been teaching, Amina Memon pointed out:

Evidence in criminal trials is often based upon eyewitness testimonies. A large part of what we know about eyewitness identification comes from empirical research on the factors influencing eyewitness performance. Research in this area can help us understand under what conditions witness evidence may be reliable.

Estimator variables are factors over which the criminal justice system exerts little or no control. [Gary] Wells called these factors estimator variables because, although these variables may be varied in research, they cannot be controlled in the actual criminal situation and their influence on identification accuracy can at best only be estimated post hoc. We will focus on a number of estimator variables, in particular own race bias.

See Wells (2000), Wells and Olson (2003), Wells, Olson, and Charman (2003) Wells, Memon, and Penrod (2006).<sup>34</sup> By contrast, Memon pointed out:

<sup>&</sup>lt;sup>33</sup> Various categories of persons hold beliefs about factors affecting the reliability of eyewitness testimony: Magnussen, Melinder, Stridbeck, and Raja (2010) has drawn a comparison, in that respect, of judges, jurors and the general public. Brigham (1981) discussed how lawyers see the accuracy of eyewitness evidence.

<sup>&</sup>lt;sup>34</sup> Also see the website of Gary Wells: http://www.psychology.iastate.edu/~glwells/

System variables are factors that can, in principle, be directly controlled by the criminal justice system to increase the accuracy of eyewitness evidence. Knowledge about these factors can lead to changes in practice to improve the quality of evidence obtained from eyewitnesses and reduce the likelihood of error.

Clearly, it is on some system variables that ADVOKATE can intervene. A useful two-page compendium of factors that make eyewitness evidence less reliable was published by Sheriff Marcus Stone, who is both a barrister (formed in Glasgow) and a psychology graduate, in the British periodical *Criminal Law & Justice Weekly* (Stone, 2009). Even though – or rather for the very reason – that was a popularisation paper intended for lawyers, the classification of *situational factors* that can contribute to errors of observation or reporting on the part of an eyewitness as presented by Stone comes handy. This classification is separate from *forgetting* and various *corruptions of memory*.

Situational factors can be subdivided into (1) features of *the nature of the event*, (2) the *conditions of observation*, and (3) the *condition of the witness*. The latter can be subdivided into (3a) *physical hindrances to observation*, and (3b) *mental factors affecting observation*. The latter concern what was the *focus* of the observation, as a person cannot attend to every visible thing simultaneously. What gains priority is what the observer considers important or urgent. If there is an assault in the street, the witness is likely to attend to that, but by the same token, the witness may not notice something else in the environment.

"A cross-examiner should always probe what a witness was actually looking at when the incident happened. Motivation may impair observation in other ways" (ibid., p. 533). *Emotion* intervenes. "Often eyewitnesses of crimes become agitated and partial even if they are unconnected with them. They often respond to events by becoming excited, angry, frightened or sympathetic which may develop into taking sides. This creates a risk that their hostility and thirst for justice might bend their perception of the facts" (ibid.). *Expectations* are another intervening factor. "A witness's mindset, namely, his expectations, may cause him to think that he sees what he expects where facts are uncertain or ambiguous. This could apply to hidden police looking out for attempted car thefts in an unlit carpark" (ibid.).

Physical hindrances to observation may include (ibid.):

- Limitations of eyesight: "Witnesses may have permanent limitations such like poor overall sight, weakness for short or long distances, colour blindness or variable sensitivity to poor light" (ibid.).
- Whether remedial measures for poor eyesight were taken: "Whether spectacles were worn at the time may be important" (ibid.).
- Whether the witness was wounded: "Victims' injuries may impair their ability to see things properly. They may be dazed or distracted by pain or bleeding" (ibid.).
- Health conditions: "Witnesses' awareness of a situation may also be diminished by illness" (ibid.).
- The effects of pharmaceuticals or narcotics: "Either prescribed or prohibited drugs may have incalculable effects on witnesses' appreciation of what happened" (ibid.). A particular case is alcohol: "However alcohol is the most

common physical source of interference with the efficiency of observation" (ibid.). The amount of alcohol intake has an effect: "Depending on the amount which witnesses have drunk and complex physiological process their state of consciousness may range from mild euphoria to complete confusion or coma" (ibid.).

Something that Stone did not include among "Physical hindrances to observation" were environmental obstacles. One thinks of false witnesses in judicial history, claiming to have seen from where they were things they could not possibly see, such as through a keyhole, or the case decried and derided by Voltaire, when members of the public came forth to accuse Jean Calas (the Huguenot executed in France for allegedly killing his own son because he intended to convert to Catholicism): some individuals claimed to have seen things happening in another part of town, or in enclosed space, which they could not possibly have watched.

Rather, in Stone's classification, that is a kind of phenomena that pertains to Stone's category 2, namely, "The Conditions of Observation". Factors include: lighting, distance, weather, and obstructions. For example, "If a witness was too far away for a clear view he might have filled in gaps in his evidence by discussion with others, inference or imagination" (ibid., p. 533), apart from the fact that "[e]stimates of distances by different witnesses often vary" (ibid.). There are subdivisions. Weather-related factors comprise meteorological phenomena ("Snow, rain, mist or fog reduce visibility"), sunshine ("Bright sunshine may dazzle observers"), how the observer was compelled to walk or stand ("Icy pavements or high windscan distact witnesses"), or then the conditions of transparent partitions ("Wet windows, windscreens or spectacles limit vision"). Obstructions may be fixed, or temporary: "Trees, bushes, hedges, walls, railings, people or vehicles blocking one's view may limit observation of something totally or partly", and this has an undesirable effect on the quality of the testimony: "This [limit on observability] may create a risk that testimony is completed by speculation or information from other persons" (ibid.). Stone remarked (ibid.):

Criticism of these conditions [of observation] usually emerge in cross-examination. A prudent advocate should foresee this and fortify evidence against it in examination-in-chief.<sup>35</sup> This has the merit of preparing the witness for the challenge. Frequently witnesses who testified firmly in examination-in-chief will resist suggestions that they could not see what they claim.

Factors relating to the nature of event (this was Stone's category 1: I am adding labels to the subcategories) include: (1a) *duration of exposure*, (1b) *movement*, (1c) *watching several separate persons* – it may confuse witnesses, especially if those observed persons move in different directions, – (1d) *violence*, as the observer may become distraught, and focused on getting away, (1e) *ambiguous facts*, because that

<sup>&</sup>lt;sup>35</sup> *Examination-in-chief* is when a lawyer asks questions of his own witness, as opposed to *cross-examination* by the lawyer of the other party, to the lawyer asking more questions of his own party's witness following the cross-examination, and to questions being asked by the judge.

is fertile ground for mistakes or doubts arising from impression, (1f) *salient facts*: if you were focused on a weapon being aimed at you, other things may be inaccessible to memory, even if registered subliminally, (1 g) *abstract qualities* (descriptions of *intangible facts* tend to be subjective), such as: (1gA) vehicle speeds, (1gB) distances, (1gC) dates, times, or intervals, (1gD) the sequence of events, (1gE) relationships between things, (1gF) dimensions, weights, and quantities (ibid.).

One may wonder how useful can a psychologist as an expert witness prove, when commenting about eyewitness testimony. Flowe, Finklea, and Ebbesen (2009) discussed the limitations of expert psychology testimony on eyewitness identification. This was in Cutler's (2009) *Expert Testimony on the Psychology of Eyewitness Identification*.

## 4.5 Policing: Organisational Aspects of Intelligence, and the Handling of Suspects

## **4.5.1** Organisational Problems of Police Intelligence Systems

Information theory was applied to the organisation of policing in *Crime and Information Theory*, a classic by Willmer (1970). That was the age of *unit beat policing. Police* officers on the beat would observe the territory they were policing, and a lot of *information* would come to their attention. Sheptycki points out (2004, p. 310) that Willmer observed (1970, pp. 24–34) "that, as the territory being policed becomes more densely populated, or the geographical remit more widely spread, it becomes increasingly difficult to translate [the information collected] into *intelligence*" (Sheptycki, 2004, p. 310). Already Willmer referred to still experimental computer applications.

The 1990s saw *re-tooling* at governmental institutions, including the policing sector, through the adoption of new information and communication technologies. New information and communication technology within the police (e.g., Chan, Brereton, Legosz, & Doran, 2001) is an application of the "information revolution" that is sometimes referred to as *e-policing*. This required reconfiguring of the ways work used to be done within organisations, so there was considerable organisational flux, inside law enforcement agencies just as this was happening also within other governmental institutions.

Criminologist and sociologist of law James Sheptycki was formed in the United Kingdom, and is based in Toronto, Canada. Both national realities are reflected in his work. Sheptycki (2004) is concerned with organisational pathologies in *police intelligence systems*. Concomitantly with the emergence of *e-policing* in the 1990s, another phenomenon came into being: policing put emphasis (as an aspiration if not in practice) on *intelligence-led policing*, in order to better deal with serious and organised crime. Data have to be collected and analysed, so that the resulting picture of the organised crime situation could assist law enforcement authorities in their fight against organised crime.

Prevention is as important indeed as investigation of crimes already perpetrated. The task of intelligence analysts is distinct from that of detectives, even though detectives have often tended to consider intelligence analysts as being subservient to the routine and needs of detectives. By contrast to the focus on formal models of intelligence systems as found in much of the literature about intelligent-led policing against serious and organised crime, Sheptycki (2004) drew upon his own empirical research (Sheptycki, 2003), and provided a lexicon of eleven organisational pathologies, organisational problems that bedevil how police information systems are organised.

Of Willmer (1970), Sheptycki (2004, p. 310) remarks: "As he described it, the intelligence function essentially consists in the acquisition of knowledge and the processing of that knowledge into meaningful and digestible packages that lead to action". Already at the time of *unit beat policing*, which was Willmer's, there already was a back-office professional role concerned with police intelligence: "He focused on the role of the 'collator' (a precursor to today's crime analysts) in help-ing to interpret information and smooth the processes of communication internal to the police organization" (Sheptycki, 2004, p. 310).

*Link analysis* techniques (see Section 6.1.2.2 below), which in their present form utterly depend upon computing, and are one of the forms of *data mining* technology (see Chapter 6 below), had been in existence since the First World War (Gilbreth & Gilbreth, 1917), being applied at the time to how to best design the layout of a machine shop based upon distances traveled during assembly operations. Harper and Harris (1975) described how to use tables and diagrams in order to apply link analysis to the analysis of organised crime. But link analysis by means of a computer was already reported about, albeit for a different kind of application, by Haygood, Teel, and Greening (1964).

Some of the computer applications to police work that were being pioneered in several countries at the time when Willmer (1970) was writing were "to criminal records, *modus operandi* searches, personal description searches and vehicle registration searches, as well as routine administrative tasks, but [Willmer claimed] that 'Great Britain appears to be alone in considering the application of computers to intelligence information' ([Willmer] 1970: 33)" (Sheptycki, 2004, pp. 310–311). The state of the art of *intelligence-led crime control* by the 1990s was discussed in Maguire (2000) and Maguire and John (1995), and both the professional roles (e.g., undercover officers, and tasked criminal informants) and the techniques (many of them computer-based) had become remarkably sophisticated (Sheptycki, 2004, p. 311). Visual surveillance devices and closed circuit television (CCTV) were becoming widespread.

In the United Kingdom, the National Intelligence Model (NIM) was imposed, whereas other European countries adopted their own approaches. "The dominant nomenclature in the UK context has been set down within the terms of the NIM, which stipulates a cycle in five phases (Sheptycki, 2004, p. 311). The first phase is *"direction* (when the 'customer's intelligence needs' are established)" (ibid.). The second phase is *"collection* (during which information is amassed)". The third phase is *"processing* (when the information is analysed and turned into 'intelligence

packages')". The fourth phase is "*dissemination* (when 'packages' are given to customers')". The fifth and last phase of the cycle is "*formal review* (when customers and providers jointly assess what has been accomplished and decide on the direction to take in the next round)" (ibid.).

The NIM cycle also has three levels. They correspond to increasing expanses of terrain, and were defined by the National Criminal Intelligence Service (2000, p. 8, cited by Sheptycki, 2004, pp. 311–312). Level 1 is local issues: "usually the crimes, criminals and other problems affecting a basic command unit or small force area". The scope of the crimes is defined as follows: "The scope of the crimes will be wideranging from low-value thefts to great seriousness such as murder. The handling of volume crime will be a particular issue at this level" (ibid.). Level 1 is at the level of one basic command unit. Level 2 is for regional tasking and coordinating groups. Level 2 is about *cross-border issues*: "usually the actions of a criminal or other specific problems affecting more than one basic command unit". Handling this will be the task of a group of basic communal police units, neighbouring forces of group of forces, and they may resort to other resources as well: Issues will be capable of resolution by Forces, perhaps with support from the National Crime Squad, HM [i.e., Her Majesty's] Customs and Excise, the National Criminal Intelligence Service, or other national resources". Key issues for those law-enforcement players involved "will be the identification of common problems, the exchange of appropriate data and the provision of resources for the common good" (ibid.). As to Level 3, it is about *serious organised crime*, and intelligence operations contemplated would be "usually operating on a national and international scale, requiring identification by proactive means and response primarily through targeting operations by dedicated units and a preventative response on a national basis" (ibid.).

There are differences in the criminological literature in how criminal markets and organised crime are described,<sup>36</sup> but Sheptycki (2004, p. 312) remarks: "What cannot be contested is that intelligence systems models are based on hierarchies of information flow. [...] A complicating factor is that the police sector is not a unified whole, but is itself a variegated institutional field", and moreover a host of other governmental agencies, such as Inland Revenue or benefits authorities, "also contribute to and draw on information circulating in the intelligence 'system'" (ibid.).

Sheptycki (2004, p. 313) identified eleven organisational pathologies affecting the sharing of criminal intelligence in a multi-agency setting. "These are: digital divide; linkage blindness; noise; intelligence overload; non-reporting; intelligence gaps; duplication; institutional friction; intelligence-hoarding and information silos; defensive data concentration; and the differences of occupational subculture" (ibid.).

The *digital divide* concerns both the difference of *information storage systems* (often because of *legacy systems*: data were historically stored at different times and using different coding structure), and the *communications divide*: Sheptycki (2004, p. 314) exemplified it by mentioning an incident when two little boys went missing

<sup>&</sup>lt;sup>36</sup> Sheptycki (2004, p. 312) cites, concerning this, Block (1994), Gregory (1998), Hobbs (1998) – who responded to Gregor (1998), Levi (1998), and Williams and Savona (1995).

in 2001 in the Staffordshire constabulary area, and the search for them went on even as the boys had been found and taken to a police station in the neighbouring Cheshire constabulary area within an hour of being reported missing. "One implication of the digital divide is that intelligence analysis based on timely (ideally real-time) data is impossible" (ibid.).

In *crime series analysis*, Egger's book *Serial Murder* (1990) introduced the concept of *linkage blindness*. It describes the problem when, because of lack of adequate data, analysts fail to spot right away linkages in crime series. Sheptycki remarked (2004, p. 315): "When a crime series transgresses territorial boundaries, and the horizontal connections for sharing relevant intelligence are inadequate or non-existent, linkage blindness occurs. This is not the same issue as the digital divide, although it is related". To Sheptycki, the digital divide is a technical problem, whereas linkage blindness is a system problem. It typically is about personnel failing to adhere to standard practice as set down, for information sharing: "field observations indicated that, even where there is a rule-based framework for doing so, horizontal flow in information hierarchies is often poor because most effort is directed at ensuring vertical flow" (ibid.).

All information is subject to interpretation, but the flow of processed information circulating in the intelligence system is subjected to *noise*: much less useful information keeps arriving: "intelligence outputs are in fact a distorted form of the input, which itself may be of dubious value" (Sheptycki, 2004, p. 315). Sometimes, intelligence packages are described as *over-sanitised*; the processing of information into police intelligence being at a remove from origination is the reason for noise being produced (ibid., p. 316):

The volume of noise in an information system seems to be related to the distance between the reporting, recording and interpretation of data. The greater the gaps between information-reporting, intelligence analysis and dissemination, the greater the capacity for generating noise. This is because police personnel who turn information into intelligence often know little about recording decisions. Analysts who operate at a degree removed from such decisions are less able to qualify their interpretation of specific intelligence properly.

In turn, noise is the cause of *intelligence overload*, which however "is also more than that. Across the policing sector there is a pronounced lack of analytical capacity and associated administrative support" (ibid.). On the one hand, analysts as being a resource are sometimes squandered, being put in charge of data input, and also of culling information considered to be no longer useful, or to be out of date. Out-of-date information often clutters up the information environment. On the other hand, as there often is a shortage of investigative personnel, analysts are frequently given tasks that pertain to investigation rather than analysis (ibid.). Therefore, there is less analytical manpower available than supposed to be in place, and this, coupled with voluminous intelligence-reporting, results in intelligence overload, and this in turn "can very quickly paralyse an intelligence system". What is more: "Undercapacity in relation to the volume of information throughput, because capacity is taken up in data input, periodic record-screening of investigative analysis, may further contribute to the undue production of noise" (ibid.).

Sheptycki (2004, p. 316) also identified a factor, *compulsive data demand*, which exacerbates intelligence overload. As surveillance is widespread, there is a tendency for demanding more data rather than better data, or better data analysis. "Observing the volume of data coming from the financial system, one intelligence officer likened the task of intelligence analysis to 'drinking from a fire-hose'" (ibid., p. 317). It has to be said that *data mining* capabilities, which we discuss in Chapter 6 below, are important for making better use of massive volumes of data from the financial system.

Another organisational pathology which Sheptycki identified (2004, pp. 317– 318) is *non-reporting and non-recording relevant intelligence*. But recording in standardised formats is time-consuming, and it must be recognised that the requirements for resorting to *data mining* do nothing to alleviate this problem, quite to the contrary. It makes the *burden of paperwork* which afflicts the police even worse. But in terms of organisational pathologies affecting intelligence: "Intelligence-reporting rarely contributes to successful prosecution outcomes; therefore effort is put into making records associated directly with law enforcement 'case building' at the expense of intelligence-reporting" (ibid., p. 318). Lack of compatibility between databases results in the information not being integrated. Quite not by chance, Sheptycki mentions this while discussing non-reporting (ibid.). The latter is the cause of *intelligence gaps* that could have been prevented, and another outcome may be linkage blindness indeed.

Intelligence gaps, Sheptycki (ibid.) points out, may result from any of the pathologies listed earlier, and may also be "the product of the hierarchical nature of the intelligence system". The nominals of Level 1 of criminality in the NIM cycle explained earlier "are criminals whose ambit of activity is geographically narrowly circumscribed. Many of these are teenage boys and young men who are considered to be prolific offenders" (ibid.). In the pyramid of criminality, Sheptycki identified a significant intelligence gap between Levels 2 and 3, considering that Level 2 "nominals" are criminals of regional scope, and offenders with such territorial ambit include e.g. teams of burglars or armed robbers, when their "activities range across divisional and force boundaries. Level 3 'nominals' are understood to be serious criminals of national importance" (ibid.). Sheptycki quoted one police officer as saying: "The real problem is between the level twos and threes. You get what you might call a level two-and-a-half. These are criminals whose activities are beyond us. They may be drug dealers who travel to Manchester from here and we don't have the resources to take that on", whereas the National Crime Squad would consider such a suspect to be light-weight, and therefore a low priority, because that dealer is only turning over half a kilo narcotics per week (ibid., pp. 318–319).

An aspect of intelligence gaps is that as surveillance resources are scarce, it is difficult to focus them on a large population of suspects. Sheptycki also explained indeed that the nature of the targets themselves also contributes to the gap: because Level 1 nominals (i.e., local-level offenders) are perceived to be primarily opportunistic, and because surveillance of such individuals is perceived to be time-consuming, so it is crime hot spots that are preferably subjected to surveillance, whereas conventional mobile surveillance and telephone intercepts are considered by police officers to be suitable for "[n]ominals spanning the range at the 'top level' of Level 1 and into Level 2" (ibid., p. 319).

Duplication of efforts is another pathology identified by Sheptycki (ibid.). Another pathology is *institutional friction* (ibid., p. 320). It not only occurs when different agencies have to share intelligence collaboratively: "Particularly in large multi-functional organizations such as police departments, there is variability of definitions of 'the job', so that institutional friction can occur within an ostensibly unified command structure" (ibid.). Sheptycki notes that because of this kind of pathology, "intelligence products are but fricative emanations" (ibid.). "Institutional friction may result in a specific set of pathologies relating to the intelligence function: 'information-hoarding' and, what is but a structural expression of the same thing, 'information silos'" (ibid.). As taking credit for a "good pinch" is good for one's career prospects, one would try to monopolise some kinds of information. But, Sheptycki remarks, this is rather symptomatic of "the enforcement-based subcultures common in the police sector" (ibid., p. 320), whereas intelligence-led policing needs to obey a different logic, for it to work (ibid., p. 321). "Intelligence-hoarding is corrosive of the principles of intelligence-led policing. Hoarding need not be deliberate; it may be a post hoc rationalization for not communicating relevant information that stems, in the first instance, from institutional friction" (ibid.). Or then it may "be an expression of non-reporting or non-recording — such information, in effect, being 'hoarded' inside the head of the individual officer who finds the task of double-keying information too time consuming" (ibid.).

The difference with respect of *information silos* is that the latter "are the structural expression of hierarchical information systems" (ibid.). Intelligence is expected to flow upwards, in the intelligence system, but what is lost is "an emphasis on horizontal linkages between crime types. It may be more useful for linkages between intelligence relating to different 'sectors of criminality' ([such as] vehicle [theft] and drug crime) to be made at the local level, than for this information to flow to the top of their respective information silos" (ibid.), and only then either be disseminated back down the silo, or "be released out into the wider information environment from the top" (ibid.).

Yet another pathology identified by Sheptycki is *defensive data concentration*. As, owing to the very existence of the pathologies listed earlier, there is pressure to do something and achieve the goals that were set for players in the intelligence environment, "one obvious short-term solution is to take steps to gather relevant data for a given problem" (ibid.). As it is difficult to get data or to get an accurate strategic picture, extra efforts may go into the creation of a task-specific database (ibid., p. 322). This increases the demand on others (who are already over-stretched) in the police sector, for reporting for the purpose of building that task-specific database. But this reinforces the "focus on themes that are already enforcement priorities" (ibid.), so "strategic analysts may be systematically robbed of the chance to develop information about lesser-known problems that are not already systemically reported" (ibid.). More problems result from such defensive data concentration. One of those problems is that duplication is exacerbated (ibid.).

And finally, Sheptycki (2004, pp. 322–327) discusses the organisation pathology associated with *occupational subcultures*, first intra-agency, and then inter-agency. "The rivalry between detectives and uniformed patrol officers is standard fare in the policing literature (Reiner, 2000). Less is known about these sorts of rivalry in other parts of the police sector" (ibid., p. 323). Sheptycki examined how well the new job profile and type of expertise, namely, *crime [intelligence] analysis*, was "being introduced into an already established division of labour" (ibid.). One woman analyst, three years in her post, for the first two years had just been made to type memos, and it was only in the third year that she had worked with actual crime intelligence, which is what because of her training she was supposed to do in the first place (ibid.). Sheptycki then stated (ibid., pp. 323–324):

It was not uncommon for young female staff trained as analysts to report being given 'inappropriate' tasks. Long-serving personnel may have difficulties in adapting their ways of thinking to accommodate the new intelligence-based approach. Detectives involved in policing at divisional level have built their role around crime investigation and arrest leading to successful prosecution. To detectives, information equates with evidence and so, in the words of one senior analyst, intelligence can be 'subverted into detections by another name'. In certain circumstances, the long-entrenched subcultural expectations of detective work may reduce the intelligence process to evidence gathering and evaluation. In contrast to detectives, analysts are trained to loom at information more broadly. They are not merely interested in the evidence in a criminal case, although they can be involved in that too. Rather, intelligence analysts provides tools for the discovery of trends and patterns and tries to explain why these occur (Dintino and Martens, 1983). Since the detective role is more long-standing and is a relatively high-status role within the police agencies (and key performance indicators reflect this), there is an observable tendency to co-opt crime analysis for the purposes of crime investigation. Some analysts clearly identify with the detective worldview. [...]

Sheptycki found such problems at various kinds of agencies. Because of chronic shortage of personnel, training or retraining of existing staff for them to carry out intelligence work may be perfunctory, or at any rate inadequate. This, however, he expected would solve itself "as younger cohorts come of age under the intelligenceled paradigm and move into positions of responsibility" (ibid., p. 324). Another aspect of the problem is that it is often the case that intelligence analysts are civilians working with the police, and therefore their career prospects are very limited. Moreover, their analytical skills are in demand elsewhere, especially in the financial sector, and therefore, having gained experience and training, analysts leave their jobs in police organisations and sell their skills for much higher rewards (ibid.). There also a problem with whether credit is properly given: "Intelligence officers frequently report that they do not receive the same acknowledgment for their role that detectives have traditionally claimed. The 'good pinch' looms large in this occupational milieu: crimes detected are granted higher status than crimes prevented" (ibid.). According to Sheptycki (ibid., p. 324), both such intra-agency subcultures divide problems, and problems with inter-agency occupational subcultures are variants of *institutional friction*. Inter-agency differences of terminology are also contributing factors, they "indicate contrasts in subcultural style" (ibid., p. 326), and when agencies are required to collaborate, "this may result in suboptimal working practices" (ibid.).

The literature of criminal intelligence analysis in the national context of the United States is covered in such texts as Carter (2004), IACP (2002), Loyka, Faggiani, and Karchmer (2005), Peterson (2005). Also see Ratcliffe (2008). Ratcliffe (2007), in a report concerning intelligence and crime analysis in the United States, pointed out (ibid., p. 14):

Crime analysis is a term used to describe a broad range of activities and ideas. Of potentially greater value is the term problem analysis. Problem analysis stems from Herman Goldstein's concept of problem-oriented policing (1990) and has come to signify a form of crime analysis that is "conducted within the police agency [and] in which formal criminal justice theory, research methods, and comprehensive data collection and analysis procedures are used in a systematic way to conduct in-depth examination of, develop informed responses to, and evaluate crime and disorder problems" (Boba, 2003, 2). It is closely allied with the framework of problem-oriented policing, a process that not only concentrates on the identification and remedy of crime problems but also is a more comprehensive framework for the improvement of the police response to all aspects of their work (Scott, 2000). Problem solving is the thought process by which officers and analysts achieve their goals, and is often articulated through the SARA (Scanning, Analysis, Response, and Assessment)<sup>37</sup> process (Eck and Spelman, 1987). For our purposes here, we can consider crime analysis to be the overarching generic term that can collectively represent these more specific activities.

The introduction of information technology has speeded up the growth of crime analysis (Ratcliffe, 2007, pp. 14–15):

Unlike criminal intelligence, crime analysis is a relatively new discipline within law enforcement. While criminal intelligence may have remained in the "murky backwaters of policing" for over one hundred years (Christopher, 2004, 179), it does at least have name recognition both internally and externally to law enforcement. By comparison, crime analysis is a young upstart whose growth has occurred largely as a result of the digitalization of the policing world. Only since the 1980s have significant numbers of police departments discovered that they were able to use data originally recorded for statistical purposes for more than just annual summaries of crime frequencies. Even with this discovery, the lack of suitable computer hardware and software applications inevitably hampered the growth of the crime analysis field. Only in the last decade or so have we seen the creation of off-theshelf, commercial crime analysis products to replace programs that were previously created by programmers hired by police departments or on contract from universities. This growth has generated the professional field of crime analysis. Goldstein argues that "in a police agency in which individual officers may not know what has occurred outside the areas in which they work or during periods when they are not on duty, crime analysis has been the primary means for pooling information that may help solve crimes" (1990, 37).

Ratcliffe proceeded to dispel some misconceptions (2007, p. 15): "As there are misconceptions with criminal intelligence, so there are misconceptions with crime analysis." A variety of skills are required of the crime analyst: "Given the aim of exploring both crime events and broader trends in crime patterns, good crime analysts have to understand a wide range of technical and theoretical areas" (ibid.). Software is involved in the activities of the crime analyst: "an experienced crime

<sup>&</sup>lt;sup>37</sup> See http://www.popcenter.org/about-SARA.htm concerning the SARA model.

analyst might have an understanding of quantitative research skills using a variety of software packages, probably uses a geographical information system to analyse spatio-temporal crime activity,<sup>38</sup> creates analysis products and conducts officer briefings, and has a knowledge of the basics of environmental criminology" (ibid.). It is a common misconception to mistake the output to be expected of a crime analyst, for management statistics: "the perception sometimes is that crime analysts just provide management with charts and breakdowns of overtime and sick leave or simple counts of the numbers of different crime types that have happened in the last week. These tasks are not crime analysis but are simply the provision of management statistics" (ibid.). This misuse of skills is demotivating for crime analysts: "Such requests for help in areas unrelated to crime can often be a considerable drain on the enthusiasm of some analysts, and police executives should be wary of allowing their analysts to engage in work that is far removed from the central aims of crime reduction and prevention" (ibid.). The skills of a crime analysts are covered in Clarke and Eck's (2005) *Crime Analysis for Problem Solvers in 60 Small Steps*.

## 4.5.2 Handling the Suspects: Equipment, Techniques, and Crucial Problems

#### 4.5.2.1 Polygraph Tests: A Deeply Controversial Tool

In a paper from the controversy about probabilities in a judicial context, Allen and Pardo stated (2007b, p. 307)<sup>39</sup>:

The inferences drawn from legal evidence may be understood in both probabilistic and explanatory terms. Consider evidence that a criminal defendant confessed while in police custody. To evaluate the strength of this evidence in supporting the conclusion that the defendant is guilty, one could try to assess the probability that guilty and innocent persons confess while in police custody.<sup>40</sup> Or one could make the same assessment based on any

<sup>&</sup>lt;sup>38</sup> For example, Boba (2005) is concerned with crime mapping for the purposes of crime analysis. <sup>39</sup> Cf. Allen and Pardo (2007b, p. 308): "[W]e are not uncompromising sceptics, and we even concede that the formal models may be useful in evaluating evidence and that it may not be unreasonable for parties to argue, or fact-finders to evaluate evidence, along the lines suggested by such models. To say that such models may be useful is not, however, to accept them as the sole or even a particularly reliable method of discovering the truth. Our objection is to scholarship arguing just that such models establish the correct or accurate probative value of evidence, and thus implying that any deviations from such models lead to inaccurate or irrational outcomes".

<sup>&</sup>lt;sup>40</sup> False confessions are the subject of Gudjonsson (2001, 2006), Gudjonsson, Sigurdsson, Asgeirsdottir, and Sigfusdottir (2006) Gudjonsson, Sigurdsson, Asgeirsdottir, and Sigfusdottir (2007), Steingrimsdottir, Hreinsdottir, Gudjonsson, Sigurdsson, and Nielsen (2007), Sigurdsson and Gudjonsson (1996, 2001), Gudjonsson and Sigurdsson (1994), Gudjonsson and MacKeith (1982). Gisli Gudjonsson's team conducted that kind of research on, e.g., adolescents in places like Iceland or Denmark. Also see Levine, Kim, and Blair (2010), Blair (2005). Important research on false confessions was carried out in the U.S. by psychologist Saul Kassin and his team. See Kassin (2004, 2005), Kassin, Meissner, and Norwick (2005), Russano, Meissner, Narchet, and Kassin (2005), Kassin and Kiechel (1996). False confessions are also the subject of Redlich and Kassin (2005).

number of other characteristics shared by the defendant or the context of the confession. The problem of reference classes arise quite readily because each of these different classes would likely yield different results, some of which will take one closer to, and some further away from, the correct conclusion of whether this defendant in fact is guilty. Alternatively, one could evaluate how well the conclusion that the defendant is guilty explains the evidence of the confession. [fn. 1: Both approaches involve inductive inferences; the probability approach employs enumerative inferences and the explanation approach employs abductive inferences.] How well the defendant's guilt explains the evidence will depend on the strength of alternative explanations such as whether a false confession was coerced, or the defendant was trying to protect another person from conviction, or the police are lying about whether a confession was ever given, etc.

A witness may be inadvertently inaccurate. This is quite distinct from lying.<sup>41</sup> There exists a very vast literature about assessing the accuracy of eyewitness

<sup>41</sup> Memon, et al. (1998) are concerned with assessing the truthfulness of testimony, including of statements made by suspects during investigation. Also see Gisli Gudjonsson's (1992, revised 2003) *The Psychology of Interrogations, Confessions and Testimony*, as well as Aldert Vrij's (2000) *Detecting Lies and Deceit: The Psychology of Lying and Implications for Professional Practice;* cf. Vrij (1998b). Memon and Bull (1999) is a *Handbook of the Psychology of Interviewing.* Gudjonsson and Clark (1986) proposed a social psychological model of suggestibility in police interrogation. Police interrogations is the subject of Kassin (2006), Kassin et al. (2007), Kassin and Fong (1999), and Kassin and McNall (1991). Investigative interviewing is also the subject of Milne and Bull (1999) and of Gudjonsson (2007). White (1989) was concerned, from a legal viewpoint, with police trickery in inducing confessions. Police interrogations are the subject of Inbau, Reid, Buckley, and Jayne (2001). Daniel Lassiter edited the volume (2004) *Interrogations, Confessions and Entrapment.* Concerning *entrapment*, the term denotes such circumstances of obtainment of evidence that the perpetrator was deceived, by being allowed or even enabled or incited to commit an offence, with law enforcement personnel present or even participating. Osborne (1997, p. 298) remarked that in England, some cases

clearly established that, even when policemen acting in plain clothes and participating in a crime go too far and incite criminals to commit offences which would otherwise not have been committed, the law of evidence will not be used to discipline the police. There is no defence of 'entrapment' known to English law and the law of evidence could not be used to create such a defence by the device of excluding otherwise admissible evidence. Where police had gone too far, the question of their misconduct will be dealt with in police disciplinary proceedings; but insofar the accused was concerned, entrapment would only be relevant to mitigate the sentence imposed, not to the question of admissibility.

Goodman (2003). Other works on false confessions include Leo, Drizin, Neufeld, Hall, and Vatner (2006), Leo and Ofshe (1998), Ofshe and Leo (1997a, 1997b), Santtila, Alkiora, Ekholm, and Niemi (1999) and Horsenlenberg, Merckelbach, and Josephs (2003). The concern of White (1997) is primarily with law, rather than psychology, concerning false confessions. Bem (1966) was concerned with inducing belief in false confessions.

Kassin and Norwick (2004) considered the relation between being innocent, and reasons why individuals sometimes waive their statutory right to remain silent during interrogation. In *Miranda* v *Arizona* [384 U.S. 436 (1966)], the United States Supreme Court ruled (384 U.S. 436 (1966)) that prior to any custodial interrogation the accused must be warned: (1) That he has a right to remain silent; (2) That any statement he does make may be used in evidence against him; (3) That he has the right to the presence of an attorney; (4) That if he cannot afford an attorney, one will be appointed for him prior to any questioning if he so desires. According to that ruling, unless and until these warnings or a waiver of these rights are demonstrated at the trial, no evidence obtained in the interrogation may be used against the accused.

identifications.<sup>42</sup> Especially the research of Elizabeth Loftus and her collaborators has cast heavy doubts on the reliability of eyewitness identifications<sup>43</sup> and of witnesses in general.

In his critique of Bayesian probabilistic accounts of judicial proof, Ron Allen has touched upon physiological symptoms being subjectively taken to be indicators of lying or otherwise. Allen did so, while pointing out problems with subjective Bayesianism, and in particular when discussing claims made by the philosopher Alvin Goldman (Allen, 2008a, p. 325):

Alvin Goldman has tried to bring some order to all of this through an interesting theorem that demonstrates that under certain assumptions there is a positive probability of evidence increasing the probability of a truthful verdict, but in fact his theorem highlights the incompatibility of juridical proof and Bayesianism (Goldman, 1992, 245–52). Similar to the convergence to truth theorems, Goldman's proof requires objectively true likelihood ratios, but, outside of the rare occurrence of something like indisputable DNA, that condition never obtains at trial. The likelihood ratios that fact finders would create are just as subjective as their initial priors, and there is no means of adjudicating their differences. One juror might think sweating means lying and another that it is a sign of a witness striving to remember the truth, and so on.

Assumptions concerning the physiological symptoms of a person being interrogated, taken to be indicators of lying, underlie *polygraph tests*. Polygraph tests –

Bull (1979) was concerned with the effect of stereotypes on person identification, whereas Chance and Goldstein (1995) discussed, to say it with the title of their article, "The Other-Race Effect and Eyewitness Identification". Cf. Horry and Wright (2008), also on memory and *other-race faces*. Meissner and Brigham (2001) are concerned with concerned with the *own-race bias in memory for faces*.

Concerning police interrogations, also see Leo's book (2008) *Police Interrogation and American Justice*. Out-of-court witness statements are the subject of Heaton-Armstrong, Wolchover, and Maxwell-Scott (2006). The psychology of confession evidence is the subject of Williamson (2007), Kassin and Gudjonsson (2004), Kassin and Wrightsman (1985), Kassin (1997), Kassin and Neumann (1997), Kassin and McNall (1991), Gudjonsson (1992). Confirmationism, which tends to confirm expectations of guilt, is the subject of Kassin, Goldstein, and Savitsky (2003). See Home Office (2003) for the codes of practice for the police in England and Wales.

<sup>&</sup>lt;sup>42</sup> Suffice it to cite here Lindsay, Ross, Read, and Toglia (2006), Cutler and Penrod (1995), or Levine and Tapp (1982), Wells (2000), Wells, Memon, and Penrod (2006), Behrman and Davey (2001), Behrman and Richards (2005). Elsewhere in this book we have cited more specific literature from eyewitness research. By Gary Wells, see e.g. Wells (1978, 1984, 1985, 1988, 2000, 2006), Wells and Bradfield (1998, 1999), Wells and Charman (2005), Wells and Hryciw (1984), Wells and Leippe (1981), Wells and Loftus (1991), Wells and Murray (1983), Wells and Quinlivan (2009), Bradfield and Wells (2000), Bradfield, Wells, and Olson (2002), Clark and Wells (2007), Lindsay and Wells (1980), Luus and Wells (1994), Hasel and Wells (2006), Wells, Leippe, and Ostrom (1979a), and Wells, Lindsay, and Ferugson (1979b), Wells, Ferguson, and Lindsay (1981), Wells, Rydell, and Seelau (1993), Wells et al. (1998), Wells, et al. (2000), Wells, Olson, and Charman (2003), Wells, Memon, and Penrod (2006).

Various categories of persons hold beliefs about factors affecting the reliability of eyewitness testimony: Magnussen, Melinder, Stridbeck, and Raja (2010) drew a comparison, in that respect, of judges, jurors and the general public.

<sup>&</sup>lt;sup>43</sup> Loftus (1979, 1981a, 1981b, 1993b, 1998, 2003a, 2005), Loftus and Zanni (1975), Penrod, Loftus, and Winkler (1982), and Loftus and Greene (1980).

the subject of Vrij's (1998a) – albeit commonly performed in countries including the U.S., are frowned upon in European countries including the U.K. Nevertheless, AI research applied to polygraph testing has actually been carried out at Manchester Metropolitan University, in England. Clearly any results would not be applicable to law enforcement in Britain, as the British police does not use polygraph tests.

"The use of the polygraph is widespread in the USA. In the 1980s, it was believed that over one million tests were given every year" (ibid., p. 78), "includ[ing] tests as part of job selection, state security selection, and criminal investigation" (ibid., p. 78). "The number of cases since the introduction of the *Polygraph Protection Act* in 1988, which banned most tests for personnel selection purposes", resulted in a quantitatively dramatic decline in the global use of the polygraph in the United States, with the figures down to a 40,000 estimate (ibid., p. 78). "Other countries which are known to use polygraph tests to detect deception are for instance Israel, Japan, South Korea and Turkey", while "polygraph tests are not used in West European countries" (ibid., p. 78).

The two leading and probably most distinguished scientific polygraph researchers, David Raskin and David Lykken,<sup>44</sup> have engaged in prolonged controversy over the reliability and validity of various polygraph tests" (Vrij, 1998a, p. 79). "Several different polygraph tests exist. One of the first tests widely used was the relevant/irrelevant technique" (ibid., p. 79). "The control question test [CQT] is the polygraph test most widely used in the USA in criminal investigations" (ibid., p. 80). Higher arousal in the examinee in response to control questions than to relevant is considered by examiners to be an indicator of innocence. Yet, a flaw of this method is that the examinee must believe in the infallibility of the test and in the infallibility and fairness of the examiners, and often this would not be the way the examinees think. Innocent suspects may think that "if police methods are fallible enough to make them falsely suspicious, their polygraph test also may be fallible" (ibid., p. 86). They may "fear that the polygraph examiner will misjudge them" (ibid.); "may distrust the polygraph" and be aware of how controversial it is; may be generally fearful persons who "might respond more to the relevant questions than to the control questions"; and "even though innocent, ha[ve] an emotional reaction to the events involved in the crime" (Vrij, ibid.): these criticisms are based on Ekman (1985).

Moreover, there is the risk that guilty suspects would successfully resort to physical or mental countermeasures:

Physical countermeasures include physical activities such as tongue biting and foot tensing (by pressing the toes against the floor). This can for instance be done when answering the control questions, resulting in a stronger physical response concerning these questions (Vrij, ibid., p. 94),

and that would thwart expectations for the profile of physiological responses from a guilty suspect, or may be misinterpreted by the polygraph examiner as though the examinee was innocent (if the examiner could reach conclusions at all).

<sup>&</sup>lt;sup>44</sup> By Lykken, see his book (1998) A Tremor in the Blood: Uses and Abuses of the Lie Detector.

An apparently rather better method than the CQT, yet one that is overlooked in the U.S. (while being more often used in Japan and Israel than the CQT) is the *guilty knowledge test* (GKT), with questions being asked in a multiple choice format, and based on the assumption that knowledge known only by the actual perpetrator and by the police (including the examiner) would trigger higher arousal when mentioned among the optional answers; yet the GKT has limited applicability (Vrij, ibid., pp. 87–89).

Also for this technique, there is the risk that a guilty suspect would successfully resourt to countermeasures (Vrij, ibid., p. 94):

Examples of mental countermeasure techniques are counting sheep or counting backward. The result of this technique will be that the examinee does not process the questions (control question test) or the alternatives (guilty knowledge test). As a result, a similar physical response to each question or each question alternative is likely, which will lead to an inconclusive test outcome.

Whereas some researchers found countermeasures ineffective, the manner the experiment was conducted may have been flawed (ibid.), and actually "[s]everal studies showed that training in countermeasures can be very effective in defeating polygraph tests" (ibid.).<sup>45</sup> In Britain, the introduction of polygraph tests was considered, but the 1986 final report of the British Psychological Society rejected the validity of the tool. Not only is the literature divided between opponents and supporters; there also are disagreements within the polygraph community. Notwithstanding the fact that psychologists in Britain have long considered polygraph tests anathema, and in fact the fallibility of the technology makes the argument all the more weak for introducing it in such countries where it is not used, there have been developments in the United Kingdom that have been most unwelcome to psychologists in the country who have looked into the domain.

In 2008, a weaker technology than even polygraphs proper, namely, voice-based lie detectors which analyse how even minimally tremulous the voice is, of an interlocutor over the phone, were introduced by the Department of Work and Pensions for testing people who claim benefits. The matter found its way into a late evening news broadcast on BBC Radio 4, on 7 May 2008. The head of a professional association of psychologists sharply criticised this move, and pointed out that studies found voice-based lie detection to be no better than chance.

The only concession he made was that at best, the technique could be used in order to deter, rather than to detect. (Tested claimants are told.) The minister of Work and Pensions was then interviewed, and was apparently not even realising

<sup>&</sup>lt;sup>45</sup> Apart from the already mentioned Ekman (1985), other works by Ekman about the detection of deception include Ekman and O'Sullivan (1989, 1991a, 1991b, 2006), Tsiamyrtzis et al. (2005), Bugental, Shennum, Frank, and Ekman (2000), Ecoff, Ekman, Mage, and Frank (2000), Ekman, Friesen, and O'Sullivan (1988), Ekman, O'Sullivan, Friesen, and Scherer (1991), Ekman, O'Sullivan, and Frank (1999), Ekman (1981, 1988a, 1988b, 1989, 1996, 1997a, 1997b), Frank and Ekman (1997), Ekman and Frank (1993), O'Sullivan, Ekman, and Friesen (1988), and Ekman and Friesen (1969, 1974). Also see the book by Frank and Ekman (2003). In particular, Feinbert, Blascovich, Cacioppo, Davidson, and Ekman (2002) is a report about polygraph tests.

how damning the psychologist's opinion was (even though not to sound jarring, it was diplomatically somewhat understated), and in particular, what the implication is, if a technique is no better than chance. Undeterred, the minister insisted that it would help to detect fraud, and that the potential was considerable. It wouldn't be the only criterion, he conceded, for deciding whether a benefit claimant is genuine.

Even the psychologist's concession that this ineffectual technique may be useful at most as a deterrent, is up to a point humiliating for a claimant, as it may be taken to imply that a claimant would typically come from the less educated strata of society, and as he or she would gullibly believe that lie detection over the phone is genuine, he or she would be deterred from making a false claim. This does no justice to the claimant who, educated enough to believe that this is a quack technology, could only be expected to respond with a stressed voice. As pointed out by the psychologist interviewed, a person's voice may be under stress for various reasons. Insincerity is just one.

In the autumn of 2010, Britain's new coalition government – flatly though implicitly – disregarded the country's traditional aversion to lie detectors. On 20 September, Andrew Porter and Rosa Prince (2010) reported on the front page of *The Daily Telegraph*:

[Deputy prime minister] Nick Clegg has singled out the middle class for being targeted for lie detector tests as part of greater scrutiny of their tax affairs. [...] Middle-class professionals could be subjected to lie detector tests under plans for private debt collection agencies to take on responsibility from Her Majesty's Revenue and Custom. [...]

One wonders whether such plan-making paid any attention to the country's native understandings concerning lie detectors. It should have been a matter of concern as well whether privatising tax collection on a national scale – it was already in force in some places at the municipal level – would have been a safe practice anyway, in face of anecdotal indications that private tax collectors at least on occasion disregard taxpayers' entitlements because the conflict of interests is apparently resolved to the benefit of greater profits to the firm. Perhaps against such a backdrop, whether lie detectors can truly be depended upon was not the actual overriding criterion.

The news had come along with other news about private companies from over the ocean going to be permitted to offer academic degrees in Britain, thus competing with a crowded local academic market that had already taken on lowbrow features in the last two decades. But perhaps whether this further commercialisation would benefit academic quality is a moot question. Arguably what matters is that some private capital would see a return on its investments in areas that were previously off limits. This raises the question whether the "expertise" for collecting taxes privately (i.e., for *taxfarming*) was going to be imported as well, from where lie detectors *are* admitted as evidence. This in turn calls for a reflection, whether an argument *ad veritatem*, and scientific truth, have any role to play when the political will exists anyway to enact this or that policy. At any rate, it can hardly be the case that if Britain is going to adopt lie detectors indeed, this would be evidence that a scholarly consensus in their favour is forming on both sides of the ocean.

## 4.5.2.2 A Caution Against Unquestioned Assumptions: A Digression on Juridic Cultures and the Evidentiary Value of Self-Incriminating Confessions

It is important to realise that the role of confession is not fixed in the history of ideas, but is a variable parameter of the legal system of a given society and culture. It is crucial for this point to be made, in an interdisciplinary book like this one, catering to audiences in a number of disciplines, such as computer scientists; audiences who therefore, in part will not be familiar with legal history. Not only are we forced to skip across jurisdictional contexts, here discussing a tool from Italy intended for local procedure, there discussing topics especially relevant for the United States, or the context of the United Kingdom (thus, the law of England and Wales, or the law of Scotland; also note that by the 2000s, in the aftermath of devolution, in some domains Wales has begun to introduce laws autonomously).

The unavoidable risks of mix-up also affect something more basic, which is the history of human cultures. It would be an error to hold the unquestioned belief that the testimony of the defendant has always and everywhere had a role in judicial proceedings, and in particular, that confessions carry value in all jurisdictions of criminal law. And yet, the medieval and early modern practice of torture during interrogation in Continental Europe entirely depended upon the value ascribed to confession.

From a present-day perspective, wrongful convictions of factually innocent defendants are discussed, e.g., by Rattner (1988). Regardless of polygraph tests, it has been claimed that policy could modify the incentives for guilty suspects to lie. Consider the suspects' *right to remain silent* (i.e., the right not to answer questions during police interrogations: it is a privilege against self-incrimination). South African legal scholar Pamela J. Schwikkard (2008) "looks at the status and application of the right to remain silent in a number of common law jurisdictions." (Her paper was in journal from Berkeley, California.) Her paper "explores the multiple rationales said to underlie the right to remain silent and concludes that there is only one that withstands scrutiny, namely, that the right to remain silent assists in preventing the abuse of public power." She argued that the right to remain silent is therefore *instrumental* in nature. This has implications for how to assess (against that stated rationale) infringements of the right to remain silent.<sup>46</sup> She then presents an argument and a counterargument (ibid.):

<sup>&</sup>lt;sup>46</sup> Concerning differences among jurisdiction in regard to the right to remain silent, Schwikkard (2008) pointed out: "At the pre-trial stage the right to remain silent gives the accused immunity for his or her refusal to answer questions. And if he or she does make any admission or confession the prosecution must establish that such a statement was made voluntarily before it will be admitted into evidence — or phrased negatively without compulsion. These general principles are shared by most common-law countries with functioning democracies. The right to remain silent at trial grants the accused immunity from testifying. This too is a common feature of the Anglo-American jurisdictions surveyed. But nowhere is it an absolute right and depending on the circumstances there may be consequences for remaining silent. However, most of the jurisdictions surveyed do not tolerate imprisonment being imposed for the exercise of the right to silence. Although this cannot

Accordingly, if appropriate safeguards are in place minor encroachments such as the drawing of adverse inferences from silence should not create undue concern. However, given both the normative and instrumental value of the right to remain silent, it would be foolish to undermine the right in the absence of clear utilitarian gains for doing so and infringements should never be viewed as justified in the absence of appropriate safeguards against the abuse of public power.

According to a game-theoretic analysis by Seidmann and Stein (2000), this *right to silence* for suspects ultimately helps the innocent by reducing the likelihood that they would be convicted:

A guilty suspect's self-interested response to questioning can impose externalities, in the form of wrongful conviction, on innocent suspects and defendants who tell the truth but cannot corroborate their stories. Absent the right to silence, guilty suspects and defendants would make false exculpatory statements if they believed that their lies were unlikely to be exposed. Aware of these incentives, triers of fact would rationally discount the probative value<sup>47</sup> of uncorroborate their true exculpatory statements at the expense of innocent defendants who could not corroborate their true exculpatory statements. Because the right to silence is available, innocent defendants tell the truth while guilty defendants rationally exercise the right when they fear that lying is exceedingly risky. [...]

In English law, "if the police are relying on a *confession* then by virtue of s. 76 of the 1984 Act the court needs to investigate the circumstances in which the confession was obtained to see whether it is admissible, that is whether it was obtained by *oppression* or whether there is anything in all the surrounding circumstances which might render it *unreliable*" (Osborne, 1997, p. 45). Moreover, "a confession may be excluded even if it is not *unreliable* if the circumstances in which it was obtained lead to the conclusion that the admission of the evidence could have an adverse effect on the fairness of the proceedings" (ibid.). Typically, the exclusion of confessions is in connection with police misconduct or omission.

Moreover, generally speaking: "Confessions are usually used as ground truth but are not 100 per cent reliable": so Vrij (1998a, p. 89), who discusses experiments with polygraph examinations. In fact, even "people considered as guilty by virtue of

be said to be true of all common law jurisdictions it would appear that in respect of those falling under the jurisdiction of the European Court of Human Rights that imprisonment as a sanction for silence will not be tolerated." Nevertheless (ibid., fn. 7): "Ireland for example has a number of legislative provisions authorising imprisonment consequent upon the withholding of information". There also is some variation in North America; for example: "In Canada the courts have held that drawing adverse inferences from silence at both the pre-trial and trial stages is unconstitutional. Nevertheless there are also exceptions to this prohibition, for example, an adverse inference may be drawn from the pre-trial failure to disclose an alibi defence." Importantly, in the United States the right to silence is not recognised to corporations: "The United States Supreme Court has also held that the Fifth Amendment does not apply to corporate entities."

<sup>&</sup>lt;sup>47</sup> "Probative value is a relational concept that expresses the strength with which evidence supports an inference to a given conclusion. It is a crucial concept for determining admissibility (see Fed[eral] R[ules of] Evid[ence] 403, which instructs judges to exclude evidence when its probative value is substantially outweighted by its prejudicial, confusing, or duplicative effect) and for determining whether parties have satisfied their burdens of proof" (Allen & Pardo, 2007a, p. 108, fn. 2).

a confession may actually be innocent, as some innocent people do confess" (ibid.). "Criminal defense lawyers know how difficult it is to overcome a confession in a criminal trial, for juries find it hard to fathom why anyone would falsely implicate oneself" (Williams, 1996).

Bear in mind that the importance of a confession for convicting a defendant has not been a constant in legal history. Prior to the transition from the *rules of quantum and weight of proof* in Continental Europe to the *free judicial evaluation of the evidence* on the part of the fact-finder (the court), the prevalence of torture during the Middle Ages and the early modern period<sup>48</sup> depended on its being necessary to have a confession in order to convict. In Roman law, the confession of the accused was considered to be the best incriminating evidence, and it was this conception that determined the approach to confession in medieval Europe.

At the other extreme, there is rabbinic law, which deprives of evidentiary value the confession of one who is incriminating him- or herself, and this both in such criminal cases that could result in a capital sentence, and in such cases in which confession would result in oneself having to undergo divorce, or in one's alleged paramour having to divorce her husband, or in her child being considered illegitimate.<sup>49</sup>

A self-incriminating confession only has financial consequences, if any apply. Because of self-incriminating confessions having no value in capital criminal cases according to Jewish law, there was no incentive for torture as intended to obtain a confession: the law enforcers' motivation to extort a confession from a suspect perpetrator who could face the death penalty is absent ab initio. In such cases, conviction rests on two testimonies by eyewitnesses being in agreement and not having been disproven. For this rule of disallowing the court relying upon the defendant's confession, various explanations were historically offered by jurists within Jewish law:

- the testimony of a next of kin is not valid, and a person's is his own closest next of kin;
- its being unethical, indeed unlawful to commit suicide, including by self-incrimination;
- as well as (Maimonides' *Hilkhot Sanhedrin* 18:7) the risk that the confession not be truthful because of impaired mental capacity when giving it, or because a would-be suicide would falsely accuse himself in order to bring about his own death.

Criminal law in Israel is not according to rabbinic law, and in many respects (except the absence of the jury) resembles the Anglo-American system, but quite possibly there being a *right to silence* of the suspect during interrogation already by the

<sup>&</sup>lt;sup>48</sup> See Nissan (2001b), Langbein (1977), Sbriccoli (1991), Fiorelli (1953–1954).

<sup>&</sup>lt;sup>49</sup> Shereshevsky (1960/61), and cf. s.v. *hoda'at ba'al-din* in the *Encyclopaedia Talmudica*. Cf. Goldin (1952), Kirschenbaum (1970), Mendelsohn (1891, and edn. 1968).

mid-century owes no less to English law than to the influence of traditional Jewish law. (In England and Wales, the *right to silence* was gradually weakened during the 1990s. Note that in England, before 1898 a defendant in a trial was not allowed to testify at the same trial.)

Interestingly, the same confession that could not have effect in a capital criminal case under rabbinic law, *would*, under the same legal system, have effect in a civil case related to the same crime (e.g., the confessing adulteress loses the money to which, according to her nuptial contract, she would have entitled if divorced or a widow, regardless of her marriage surviving the confession in case her husband chooses not to believe her confession; and a confessing would-be adulterer who claims to be the father of the child of a woman married to somebody else becomes liable to pay for the child's maintenance, without the child's status being modified detrimentally because of the confession of his self-alleged father).

## 4.5.2.3 Computerised Identity Parades (Lineups)

In police practice, *identity parades* (also called *line-ups* or *lineups*) are means for identifying suspects. This is one of the ways in which facial identification evidence can be used by the police in order to identify suspects, by interviewing victims or eyewitnesses. The other way for using facial identification evidence during an investigation is to have victims or eyewitnesses view mugshots or, increasingly, *facial composites*: we devote Section 8.2.2 to the latter, within our chapter on the forensic sciences. Facial composites are appropriate when the police only have a verbal description of an offender. It is when the police already have some suspect that an identity parade can be resorted to.

In an identity parade, a victim or an eyewitness is required to recognise a suspect who is standing alongside others (known innocents, called *foils* or *look-alikes*). "On the other side of a screen, the victim studies them and picks out the one they think committed the crime. It is always stressed it is a one-sided mirror and the criminals [sic] cannot see the victims" (Backway, 2007). Identity parades are a domain of application for computing, and extant computerised alternatives to identity parades are relatively undemanding in terms of how sophisticated the computer techniques are.

In Britain, such a system was introduced in police practice around 2002. "The system is used across the country and [apart from the one described] there are around five other identification sites in London" (Backway, 2007). At the identification unit described, there are four police officers and three civilian staff. A video camera is used to record a video clip of the suspect, and other video clips of persons who look like the suspect are retrieved, and stored on an "ID parade disc". Hopefully there is nothing in the backdrop that would make the video clip with the suspect different from the other video clips on the disc. "There are around 25,000 images of volunteers stored on the database" (ibid.). "No images of suspects are stored on the system. The only copy is on the disc" (ibid.). "If no further action is taken, the disc and the image are destroyed" (ibid.). At the identification unit in South East London described by Helen Backway, around seven ID parade discs are created on a day.

Few forces use identity (ID) parades any more and things are a lot more sophisticated. At the territorial policing identification command, which deals with crimes in Bexley, Bromley, Lewisham and Greenwich [four boroughs in South East London], it is all done on video. In any crime where identity might be an issue, after a suspect is arrested they come into the ID suite at Lewisham police station in Lewisham High Street. They record a 15-second video clip and the image is fed into a computer, where eight similar images are chosen from the database. The suspect and their solicitor are given the option to change any of the similar images. Finally, the nine pictures are put onto a disc which is sealed and stored until the witness or witnesses come in. Rather than having to face the "criminal", the witness can be ushered into the room and watch the nine video clips as many times as they want to (Backway, 2007).

Arguably, such sequential viewing is not the same as watching a line up with physical presence, with several persons in view at a glance. Yet, there are advantages, too. "The beauty of the system being computerised is if a crime is committed away from where someone lives or if someone is housebound or in hospital, a laptop can be taken to them" (Backway, 2007). A sergeant, who pointed out that "witnesses identify the suspect in about half of all cases" (ibid.), remarked about the advantages of the video ID system: "We can get more done in a shorter period of time. This is better for witnesses and for suspects as it leads to early resolution of cases. It is also less intimidating for witnesses" (ibid.).

That same sergeant is quoted as saying: "We do not find eight people who look exactly the same. The law says we have to supply a parade which is a reasonable test of the ability of a witness to identify a person they have seen who was involved in an offence. They should resemble the person in image, height and general appearance" (ibid.). Isn't there a risk that witnesses would find it more difficult to evaluate the height of persons in the video clips? In general, it is known that witnesses tend to overestimate the stature of a person (and men, their own stature). Besides, Wells (1993) "warns against attempting to find foils that resemble the suspect as closely as possible" (Cutler & Penrod, 1995, p. 203). "The computer system is also used for more crimes than the previous ID parade process" (Backway, 2007). The inspector who heads the identification unit stated: "Years ago, we did ID parades only for serious cases. But the Crown Prosecution Service decided it should be done in any case when ID is an issue" (ibid.).

Amina Memon's eyewitness laboratory at the University of Aberdeen has carried out a project, funded by the Scottish Institute of Policing Research, to conduct experiments with VIPER, a video identity parade system adopted by Scotland police. Live parades have now been largely replaced by video parades; this has been made possible by development of the Video Identification Parade Electronic Recording (VIPER) system. "The procedure for administering VIPER is to show the entire lineup twice,<sup>50</sup> unless there is unequivocal identification and showing the witness the lineup again would cause distress to the witness" (Memon, 2008). At Memon's laboratory, Catriona Havard conducted work on child witnesses identification

<sup>&</sup>lt;sup>50</sup> Hinz and Pezdek (2001) discussed the effect of exposure to multiple lineups on face identification accuracy.

abilities using VIPER. In a field evaluation, "Amina Memon, Catriona Havard, Brian Clifford and Fiona Gabbert analysed the responses of 1718 real witnesses who viewed video parades conducted in Scotland in 2008. The major variables of interest were; characteristics of the witness, characteristics of the suspect, offence type, delay since incident and aspects of the VIPER procedure" (ibid.). Among the findings: "In terms of identification outcome, the under 16 s (as compared to over 16 s) made more suspect identifications (81% vs. 67%) and fewer foil identifications (15% vs. 24%). Overall, children (there were 32 children under the age of 9 years) and young adults (Under 16 s and the 16-25 year-olds) made more suspect identifications than adults aged 26–40; middle aged adults and adults over the age of 61." (ibid.).

There are quantitative models for assessing the diagnostic value of identity parades.<sup>51</sup> The following is quoted from Michon and Pakes (1995, pp. 521–522), who had previously discussed models for assessing evidential strength (e.g., Bayesian models and weighed average models, for which see in Chapter 2 above):

Crucial to these models, irrespective of exactly how their belief revisions are computed, is how pieces of evidence are weighed. This evaluation determines the change in beliefs under the influence of new information. Wagenaar, Van Koppen and Crombag (1993) describe this as the assessment of the diagnostic value of pieces of evidence. What a piece of evidence tells you about the guilt of a suspect can be derived from a performance table. In Wagenaar and Veefkind (1992) the diagnostic value of line-ups for person identification is assessed. [...] Diagnostic value is the ratio of hits and false alarms which in this case is 75 per cent divided by 5 per cent equals 15. This means that if a suspect has been recognised in a line-up, she or she is 15 times more likely to be guilty than innocent. This value can be used in the computations concerning guilt or innocence.

<sup>&</sup>lt;sup>51</sup> Besides, e.g. Valentine, Darling, and Memon (2007) researched whether strict rules and moving images increase the reliability of sequential identification procedures. In Darling, Valentine, and Memon (2008), those same authors discussed the selection of lineup foils in operational contexts. Valentine, Darling, and Memon (2006) were concerned with how to enhance the effectiveness of identification procedures. Memon and Gabbert (2003a) discussed the effects of a sequential lineup. Kneller, Memon, and Stevenage (2002) contrasted the decision processes of accurate and inaccurate witnesses, when viewing simultaneous vs. sequential lineups. Valentine, Pickering, and Darling (2003) tried to identify predictors of the outcome of real lineups. Garrioch and Brimacombe (2001) discussed the impact of lineup administrators' expectations on eyewitness confidence. The effects of post-identification feedback on eyewitnesses was also discussed in the literature (the risk is forced *confabulation*: witnesses will be influenced into remembering differently, by making inferences, and this may be an effect of their having been discussing their recollections). See, e.g., Wells and Bradfield (1998), Bradfield et al. (2002), Wright and Skagerberg (2007), Hafstad, Memon, and Logie (2004), and Hanba and Zaragoza (2007). Memon and Gabbert (2003b) tried to find up such arrangements at lineups that would enhance the identification accuracy of old witnesses.

Journals where papers at the interface of psychology, law and criminology are published include the Journal of Applied Psychology; the Journal of Experimental Psychology: Applied; the journal Law and Human Behaviour; the journal Applied Cognitive Psychology; the Journal of Personality and Social Psychology; the journal Legal and Criminological Psychology; the journal Memory and Cognition; as well as the Psychonomic Bulletin & Review; and the journals Psychology, Public Policy and Law; and Memory.

The empirical assessment of the diagnostic value of certain pieces of evidence does not imply that naive decision-makers will give a positive identification in a line-up the proper weight. In the cases they analysed Wagenaar, Van Koppen and Crombag (1993) claim that they found several instances in which judges under or over-valued certain pieces of evidence in spite of sound empirical findings concerning the value of that evidence.

Peter van Koppen (1995, p. 591) remarked: "Research on identification line-ups [...] has shown that the diagnostic value of a splendidly performed line-up is about 15 (Wagenaar & Veefkind, 1992), but what if not all the requirements are met to call it a very good line-up? And even then, some argue, the present tradition of laboratory research does not apply to forensic practice (Bekerian, 1993; Egeth, 1993; Wells, 1993; Yuille, 1993)". Cf. Penrod (2005).

Steven Clark and Gary Wells discussed the diagnosticity of lineups when there are more than one witness: "It is not uncommon for there to be multiple eyewitnesses to a crime, each of whom is later shown a lineup. How is the probative value, or diagnosticity, of such multiple-witness identifications to be evaluated?" (ibid., from the abstract). Their article

calculates response diagnosticity for multiple witnesses and shows how diagnostic probabilities change across various combinations of consistent and inconsistent witness responses. Multiple-witness diagnosticity is examined across variation in the conditions of observation, lineup composition, and lineup presentation. In general, the diagnostic probabilities of guilt were shown to increase with the addition of suspect identifications and decrease with the addition of nonidentifications.

As a safeguard enforced (e.g., in the United States) against erroneous conviction resulting from mistaken identification, there is the presence of counsel (a defence lawyer) at post-indictment corporeal lineups. Nevertheless, this right of criminal defendants does not extend to photoarrays or any identifications tests conducted prior to indictment (Cutler & Penrod, 1995, pp. 205–208). It is based on the assumption "that attorneys recognise suggestive identification procedures when they encounter them" (ibid., p. 206). This is the *attorney sensitivity* assumption.

There also is a *judge sensitivity* assumption: "An attorney who believes that suggestive identification procedures rendered an identification equivocal will make this argument in a motion to suppress the identification evidence. This motion would contain a description of the procedures believed by the attorney to be suggestive" (ibid.), on the assumption that also judges, not only attorneys, "can accurately discriminate between procedures that differ in level of suggestiveness" (ibid.). *Jury sensitivity* is more problematic.

In Section 2.4 above, we considered the *reference-class problem*. Allen and Pardo remarked (2007a, pp. 113–114):

The blue bus hypothetical with which we began this paper [and quoted in Sec. 2.4 above] exemplifies the general implications of reference classes, and those implications would hold for practically any attempt to quantify a priori the probative value of evidence. Consider another, and more realistic, example — that of an eyewitness identification made at a lineup. Any attempt to quantify the likelihood ratio of this evidence (the probability of picking the defendant given that he or she did it divided by the probability of picking him or her given that somebody else did it) quickly runs into the reference-class problem. Do we take the ratios of all identifications ever made? Those made (or not made, depending on the

circumstance) across racial differences? Those made by this witness? Those made by this witness under similar lighting conditions? Those made on the same day of the week, or month, or year, and so on? In each case, the reference class will likely change, and hence the quantified value will as well. But the evidence, the identification, has not changed. Thus it has no fixed, privileged, quantified value — save the event itself, which has a value of one or zero.

The demonstration above reveals several points. First, the value of evidence is not its likelihood ratio given a certain specified reference class. Evidence has countless likelihood ratios corresponding to its various reference classes. An explanation or justification for choosing any particular one must be provided, and there will invariably be reasonable alternatives. Second, for the same reason, the value of evidence is not, alternatively, its information gain in a given context, namely, the increase in probability of a hypothesis (for example, the defendant did it) from the prior probability without the evidence. This view still requires a likelihood-ratio calculation based on a chosen reference class; it just combines that likelihood with the prior probability. Third, instead of capturing the probative value of evidence, the various statistics or likelihood ratios flowing from various reference classes are just more evidence and, as such, must themselves be interpreted and explained.

There is a body of research on the effects of *lineup instruction bias*, and whereas in some experiments, subjects were aware that they were participating in an experiment, and the suggestibility effect resulted in a major increase in incorrect identifications, some other scholars reported experiments in which false identification rates did not differ significantly with biased instructions (Malpass & Devine, 1981; Cutler, Penrod, & Martens, 1987; Paley & Geiselman, 1989), and this was ascribed to the subjects being unaware that the perpetration event was not real but simulated (Maas & Köhnken, 1989), but the latter result is disputed in Cutler and Penrod (1995, p. 202).

Other kinds of bias are *foil bias* (ibid., pp. 202–203; Wells, 1993), *clothing bias* (Cutler & Penrod, 1995, pp. 203–204), and *presentation bias* (ibid., pp. 204–205), i.e., how the suspects and the *foils* (called *fillers* in the U.S.) are presented to eyewitnesses. Craig Osborne (1997, p. 307) points out a problem with the use of photographs:

If the police already have a particular suspect in mind, or indeed have arrested anyone, there is no need for the use of photographs. Photographs should be used to enable the police to get some idea as to who might be a suspect where they have no immediate candidate. If there is a suspect then the police should go straight to the stage of identification parade because obviously there is less evidential value in such a parade where a witness has already recently identified a photograph.

In a case where photographs have been used the defence are placed in a great dilemma. The defence would normally wish to cross-examine a witness searchingly about all matters relevant to his recollection and the circumstances of identification. The danger of course is that if they do this some reference to photographs will come out and the more alert members of the jury will inevitably infer that since the police had a photograph of the accused, the accused must have a criminal record.

"None of this should be confused with the situation where the police are trying to trace a *known* wanted person's whereabouts, e.g., by showing a photograph door-to-door or on television" (ibid., p. 308).

In Italy, an identity parade is called a *confronto all'americana*, i.e., literally: "a face-to-face confrontation the way they do it in America". A philologist, Stefano

Caruso, felt able to insert that name in the title of a scholarly article (Caruso, 2001), to describe a somewhat similar episode from medieval hagiography, namely, from the Greek-language *Life [and Miracles]* of St. Elias the Cave-Dweller from Reggio in Calabria, born in that city ca. 860, and who died in Melicuccà in 956.

In a Greek version (but not its Latin translation) of the tale of miraculous healing (by an apparition of the saint) of a paralysed and deaf-and-dumb youngster (who then joins a monastery), one finds: "In the morning, having brought the images of both the saint and other, they interrogated the youngster and asked him: 'Who is the one who this night appeared to you and healed you?'. He extended his arm and, fingering the image of the saint, replied: 'This one is the very same who appeared to me and healed me'" (my translation from Caruso's Italian translation from the Greek; ibid., p. 5).

Caruso (ibid., p. 3) deems it interesting, that "as a sequel of the taumaturgical event, one finds the only case of a precursor of a *confronto all'americana* one finds in Italo-Greek historical hagiography" (my trans.). Once the youngster was confronted with images, he supposedly recognised in one of them the saint whose apparition had healed him. If anything, that episode is similar to a witness (or victim) being shown several mugshots of suspects.<sup>52</sup> There is no identity parade to speak of, in the story. Moreover, Caruso does not problematise the recognisability of a given person, based on a portrait made according to the conventions of Byzantine art, thus, not realistically.

A crucial topic, for lineup or any eyewitness identification procedures, is that they should not be suggestive, so as to bias the testimony.<sup>53</sup> Psychologists Gary Wells and Deah Quinlivan (1999), writing in a U.S. perspective, dealt precisely with the problem of *suggestive eyewitness identification procedures*. Introducing the link to that paper at his website, Prof. Wells used these words: "Why the U.S. Supreme Court Needs to Revisit Manson v. Braithwaithe" (i.e., 432 U.S. 98, of 1977). Wells and Quinlivan explained (2009, p. 2):

*Manson v. Braithwaite* was argued November 29, 1976 and the U.S. Supreme Court issued its decision on June 16, 1977. Braithwaite had been convicted of the possession and sale of heroin based solely on identification evidence by undercover agent Jimmy Glover. The agent-witness did not know the person he bought the heroin from but based on a description and the location of the apartment, a fellow officer, D'Onofrio, produced a single photo of Braithwaite. Using this single photo, Agent Glover reportedly made a positive identification of Braithwaite's photo as being a photo of the man from whom he bought the heroin.

Finding in that case, the Second Circuit, and then the Supreme Court, "concluded that the identification procedure was impermissibly suggestive, but then continued to the second inquiry (following *Neil v. Biggers* 1972) as to whether, under all the circumstances, that suggestive procedure gave rise to a substantial likelihood of

<sup>&</sup>lt;sup>52</sup> Of course, psychologists have researched the effects of mugshot viewing on eyewitness accuracy (e.g., Memon, Hope, Bartlett, & Bull, 2002).

<sup>&</sup>lt;sup>53</sup> For example, Lindsay and Malpass (1999) guest-edited a special issue of the journal *Applied Cognitive Psychology* about measuring lineup fairness.

irreparable mistaken identification." (ibid., p. 3). What is referred to as the second inquiry was the reliability test. It was "borrowed directly from *Neil v Biggers*. Having found that the identification procedure was unnecessarily suggestive, the Court asked whether the identification was reliable even though the procedure was suggestive." (ibid.). In *Manson v Braithwaithe*, the procedure wasn't even a lineup (Wells & Quinlivan, 2009, p. 7): "*Show-ups* are not lineups at all, but instead are procedures in which the eyewitness is shown only one person or a photo of one person without any fillers. Recall that *Manson v Braithwaite* was a show-up procedure and the Court found that it was unnecessarily suggestive but, based on the second prong (the reliability test), did not exclude it from evidence."

In 1977, the Supreme Court had introduced what then became known as "the *Manson* test" or "the *Manson* criteria" concerning suggestive procedures, arguably hoping that this would deter the police from using them: "The Manson criteria (view, attention, certainty, time, description) were meant to clarify the idea that the ultimate issue is the reliability of the identification, not suggestiveness per se" (Wells & Quinlivan, 2009, p. 16). Wells and Quinlivan explained (ibid., p. 3):

Five criteria were articulated for the reliability test concerning (1) view, (2) attention, (3) description, (4) passage of time, and (5) certainty. The majority of the Court concluded that there was no substantial likelihood of irreparable mistaken identification and cited the witness' standing on the five factors outlined in *Biggers*:

- 1. *Opportunity to view*: Witness Glover was within two feet of the seller and the confrontation was at least "a couple of minutes." There was natural light from the window or skylight.
- 2. *Attention*: Glover was paying attention because, as a trained police officer, he realized he would have to find and arrest the dealer.
- 3. *Description*: He gave a detailed enough description that it enabled D'Onofrio to pick a single photo that was later shown to witness Glover.
- 4. *Time to identification*: Only 2 days passed between the crime and the photo identification.
- 5. *Certainty*: Glover had "no doubt" that Braithwaite was the person who had sold him heroin.

Based on their analysis, the majority on the Court concluded that there was not a very substantial likelihood of irreparable misidentification. An even longer opinion, however, was written in dissent. [...]

Wells and Quinlivan (1999) argued that the *Manson* criteria were scientifically inadequate. Wells and Quinlivan (2009) pointed out the major progress made in the intervening thirty years since a previous ruling. Wells and Quinlivan stated (2009, p.1):

Every day in the United States courts entertain arguments in pre-trial hearings that challenge eyewitness identification evidence based on suggestive eyewitness identification procedures. The arguments are familiar and the suggestive aspects common. They include using a show-up procedure (the suspect alone presented to the witness) when police could have conducted a lineup (embedding the suspect among fillers), conducting a lineup in which the suspect stood out, failing to tell the eyewitness that the culprit might not be in the lineup, showing the witness a photo of the suspect before conducting a lineup, telling a potentially non-confident eyewitness that his or her choice was correct, or conducting a second lineup procedure in which the only person in common was the suspect. The defense argument for suppressing the identification in light of even the most highly suggestive procedures almost never prevails (Loftus and Doyle, 1997). Instead, courts end up ruling that the suggestiveness of the procedure is outweighed by the "reliability test" articulated by the U.S. Supreme Court in *Manson v. Braithwaite* (1977). *Manson v. Braithwaite* is, in effect, the law of the land on eyewitness identification. Although some state courts have tweaked the reliability test in *Manson*, the core idea remains largely as it was laid out in 1977.

Interestingly, it was around the time of *Manson* that psychological scientists began to conduct programmatic experiments on eyewitness identification with a strong emphasis on suggestive identification procedures (Wells, 1978). Since that time, hundreds of eyewitness experiments have been published in peer-reviewed journals, many of which bear on issues in *Manson*. Overall, the empirical data indicate that eyewitness identification evidence is not performing very well (Penrod, 2005). In addition, since the time of *Manson*, forensic DNA testing was developed and has been used to test claims of innocence. [...]

#### Wells and Quinlivan argued (2009, p. 19):

Alternatives to *Manson* should have several characteristics that are absent in *Manson*. First, unlike *Manson*, they must provide an incentive to avoid suggestive procedures and never reward suggestive ones. This means that there has to be some real threat of suppression or some other cost to the government when unnecessarily suggestive procedures are used. Second, alternatives to *Manson* must recognize that suggestive procedures, whether unnecessary or not, confound the fact-finding process and require a much deeper analysis than the check-listing heuristic that characterizes *Manson*. Third, whatever the criteria for deciding to admit a suggestive identification, those criteria need to be independent of the suggestive procedure itself, which means that self-reports of the eyewitness are not likely to ever be good criteria unless it can be shown that they were assessed prior to the suggestive event.<sup>54</sup>

Andrew Roberts (2008) provided a critical analysis of procedural developments during the 2000s concerning *eyewitness identification evidence*. Of course, procedure concerning eyewitness identification evidence is not the same across different national jurisdictions.

<sup>&</sup>lt;sup>54</sup> One of the points made by Wells and Quinlivan (2009) is as follows (ibid., p. 20): "The current approach in *Manson* is one in which the defense must request a hearing on the identification and attempt to show that the identification was not reliable. The burden clearly rests with the defense to show that the identification was not reliable and failure to do so results in admission of the identification evidence. But, it is unclear why the burden rests with the defense to show unreliability rather than with the prosecution to show reliability. It is unlikely that a shift in burden would matter much to the prosecution, of course, as long as the prosecution was able to continue to use the current *Manson* criteria in the context of trumping suggestive procedures. Under the shift-of-burden notion, the prosecution would have to make the case that the identification was reliable regardless of whether a suggestive procedure seems to us to comport better with the Court's own reasoning on these matters that 'reliability is the linchpin in determining the admissibility of identification testimony' along with our observation that the power of suggestive procedures is not moderated by whether the suggestiveness was necessary."

# 4.6 Relevance

# 4.6.1 Definitions

In a widespread textbook on legal evidence in England and Wales, *Cross on Evidence* (Cross & Tapper, 1985, 6th edn.), section 4 is 'Relevance, Admissibility and Weight of Evidence'. To begin with, it states: "The main general rule governing the entire subject is that all evidence which is sufficiently relevant to an issue before the court is admissible and all that is irrelevant, or insufficiently relevant, should be excluded" (ibid., p. 49). There is a subsection on the definition of *relevance* (ibid., pp. 50–51), and it begins by stating: "It is difficult to improve upon Stephen's<sup>55</sup> definition of relevance when", in *Digest of the Law of Evidence* (12th edn.), art. 1, "he said that the word 'relevant' means that:"

any two facts to which it is applied are so related to each other that according to the common course of events one either taken by itself or in connection with other facts proves or renders probable the past, present, or future existence or non-existence of the other.

*Cross on Evidence* then mentions an attempt – made by Stephen in *General View of the Criminal Law* (1st edn., p. 236) – at logic formalisation of the definition of relevance (Cross & Tapper, 1985, p. 50):

Elsewhere the same writer suggested as a test for determining whether one fact should be regarded as evidence of, or relevant to another, that the matter under discussion should be cast in the form of a syllogism of which the alleged evidentiary fact constitutes the minor premise; it is then only necessary to consider whether the major premise is a proposition the truth of which is likely to be accepted by the person who has to draw the conclusion – in the case of a lawsuit, a reasonable man.

An example was provided (Cross & Tapper, 1985, p. 50):

For example, suppose that goods were found in the possession of the accused shortly after they were missed, and he was unable or unwilling to give an adequate explanation of the manner in which he came by them. These would be relevant facts on a charge of stealing because, if the matter was cast into the form of a syllogism, it could be stated in the following way: men found in possession of goods which have recently been missed are frequently guilty of stealing them if they do not give an adequate explanation of their possession of this

<sup>&</sup>lt;sup>55</sup> This is Sir James Fitzjames Stephen (1829–1894). His A General View of the Criminal Law in England was published in London by McMillan (i.e., the present-day Macmillan) in 1863 (the first edition), and then in 1890 (the second edition). The second edition was reprinted in Littleton, Colorado, by F. B. Rothman in 1985. As to Stephen's A Digest of the Law of Evidence, the 12th edition is a revision by Sir Harry Lushington Stephen and Lewis Frederick Sturge. It was published in London by McMillan and Co. Ltd. in 1948. This was a reprint, with additions, of the 1936 edition. Clearly, Stephen's Digest was long-lived. Analytical Tables of the Law of Evidence for Use with Stephen's Digest of the Law of Evidence, by George Mifflin Dallas and Henry Wolf Bikle, was published in Philadelphia by T. & J. W. Johnson in 1903 (the notes referred to Stephen's Digest's Second American Edition, itself based on the sixth English edition). The Analytical Tables were made available as an online resource accessible by licensing agreements, as a reproduction of an original copy from Harvard Law School Library, by Thomson Gale in Farmington Hills, Michigan, in 2004.

fact (major premise), the accused was found in possession of the goods in question shortly after they were missed, and he gave no adequate explanation of this fact (minor premise); therefore the accused may have been guilty of stealing the goods (conclusion). As the validity of the major premises on which the courts are invited to act can usually be taken for granted, the deductive method outlined above is seldom used in practice, but the test of the syllogism may be found useful whenever there is any doubt about the relevance of evidence.

According to the national jurisdiction, and the kind of court, there are criteria (sometimes set out explicitly as law of evidence) about whether to admit or exclude some items of information, even if they may be relevant. For example, take the U.S. law of evidence: *admissionary rules* are rules about which kinds of evidence can be admitted and heard in court. By contrast, *exclusionary rules* are rules concerning which kinds of evidence must be excluded and not heard in court.

*Rules of extrinsic policy* and *rules of auxiliary probative policy* are kinds of exclusionary rules. *Rules of extrinsic policy* are a category of rules excluding or restricting the use of admitted evidence. In interpretations of the American law of evidence, according to Wigmore's terminology,<sup>56</sup> *rules of extrinsic policy* are such exclusionary rules that give priority to other values over rectitude of decision. These are rules which are not so much directed at ascertaining the truth, but rather which serve the protection of personal rights and secrets.

*Rules of auxiliary probative policy* are a category of rules excluding or restricting the use of admitted evidence, as opposed to *rules of extrinsic policy*. In interpretations of the American law of evidence, according to Wigmore's terminology, *rules of auxiliary probative policy* are such exclusionary rules that are intended to promote rectitude of decision, avoiding unreliability or alleged prejudicial effect.

As seen, some kinds of evidence are excluded as a matter of policy. Sometimes, for reasons of policy, the law of some given jurisdiction may choose to disregard evidence that by common sense would prove adultery. By the law of England and Wales, until Parliament reformed family law in 1949, this was the case of evidence that could prove adultery because of lack of access of the husband, if a child was nevertheless born. Prior to 1949, such evidence was not admissible.

Sir Douglas Hogg, in his role as barrister in *Russell v. Russell* in 1924 (he had ceased to be Attorney-general earlier that year), had already tried to obtain admissibility for such evidence. "The question for the House of Lords was whether evidence of non-access might be given in divorce proceedings by one spouse with the result of bastardizing a child of the marriage. The answer was of great importance, not only to the parties to the suit, the sole evidence of the wife's adultery being the testimony of the husband that he did not have access to his wife at any time when the child could have been conceived, but also to all those who were interested in the proceedings in the Divorce Court, either as possible parties or as practitioners" (Heuston, 1964, p. 458).

The House of Lords deciding the case ruled such evidence inadmissible: it "held that on grounds of decency and public policy the law prohibited the introduction

<sup>&</sup>lt;sup>56</sup> By the American jurist John Henry Wigmore (1863–1943).

of such evidence." (ibid.). Hogg had admitted that the evidence would be inadmissible in a legitimacy case, but "Hogg's argument was that the rule prohibiting the introduction of such evidence had never been applied to a case in which the object of the suit was to dissolve the bond of marriage on the ground of adultery, it only applied where there was a marriage in existence and the legitimacy of a child born in wedlock was in question" (ibid.). Hogg argued that "Where the issue is adultery the birth of a child is mere accident" (quoted ibid.). "This ingenious argument was rejected by the majority of the House, Lord Finlay saying: 'To what an extraordinary state would the admission of this evidence in the present case reduce the law of England! The infant may be illegitimate for the purpose of proving adultery; but legitimate for the purpose of succeeding to property or a title!"" (ibid.).

*Social epistemics* is how philosopher Alvin Goldman (1987a, 1987b) calls social aspects of the philosophy of knowledge. Because of such social aspects, the *requirement of total evidence* is an invalid principle, and an example of contravening on it is *exclusionary laws of evidence* in court: jurors are not given all the evidence, and Goldman (1991), who approves of this, calls this *epistemic paternalism*. See Section 4.3.2.2.

*Curative admissibility* is a concept that was so-called by Wigmore, and *Cross on Evidence* remarks (Cross & Tapper, 1985, p. 57):

It is sometimes said that, if irrelevant evidence is adduced by one party, his opponent may seek to dispel its effect by calling irrelevant evidence himself. Whatever the position may be in certain American jurisdictions, this principle (which Wigmore described as one of 'curative admissibility') is not recognised by the English courts.

"The following four exceptions" to the general rule that all relevant evidence is admissible "are frequently stressed, but there are many others" (Cross & Tapper, 1985, p. 51): *hearsay* (when information is ascribed to somebody who is not called as witness); *opinion* ("Witnesses are generally not allowed to inform the court of the inferences they draw from facts perceived by them, but must confine their statements to an account of such facts", ibid.); *character* (the reputation of an accused person's), and *conduct on other occasions*. (The latter includes both *previous convictions*, and *uncharged behaviour*, as well as previous unproven charges that were actually made and possibly prosecuted but did not result in a conviction.) There is much discussion about which evidence should be admissible, and which evidence should be excluded even if relevant, as a matter of policy, and over the years, in given jurisdictions there has been a shift in such matters, usually in the direction of making more kinds of evidence admissible.

*Cross on Evidence* pointed out the risk of *manufactured evidence* (Cross & Tapper, 1985, p. 56):

The courts rightly take the view that the degree to which an item of evidence is relevant to an issue diminishes in proportion to the likelihood of its having been manufactured, but it is open to question whether people are as prone to manufacture evidence as some judgments suggest, and the bogey has led to certain exclusionary rules, the mechanical application of which may lead to the rejection of evidence of real probative value. It has certainly played a large part in the development of the rule excluding hearsay, and especially the rule excluding evidence of previous consistent statements of a witness.

#### In Section 2.6.1, we had already remarked:

For example, for the purpose of explaining why, according to economic rationality, it makes sense that hearsay be not admitted as evidence in court — incidentally, an expert system dealing with the hearsay rule is the Hearsay Rule Advisor (Blackman, 1988, MacCrimmon, 1989) — legal scholars Shapira (2002) and Callen (2002) discuss what went wrong in the reasoning of Shakespeare's character of Othello, when believing rumours about Desdemona having supposedly betrayed him. Also see Stein (2001). Incidentally: the hearsay rule (in English and American law) "requires a court to exclude any written or oral statement not made in the course of the proceedings which is offered as evidence of the correctness of the matter asserted. A statement which is relevant independently of the real intention of the speaker [e.g., a contractually binding statement] or the truth of what is stated [e.g., an allegedly libellous statement] is not adduced for a testimonial purpose and is therefore outside the scope of the rule" (Pattenden, 1993, p. 138). This is not to say that in some jurisdictions hearsay is inadmissible; e.g., McNeal (2007) discusses hearsay at the Iraqi High Tribunal, in consideration of the legacy of international tribunals for war crimes or crimes against humanity. "The IHT allowed hearsay evidence and the reading of ex parte affidavits as evidence, two of the most criticized practices of the Nuremberg Tribunal. The IHT also allowed the admission of testimony by anonymous witnesses, a legacy of the Yugoslavia Tribunal which has since been rejected by that same court" (ibid., from the abstract).

# 4.6.2 Legal Formalism, Artificial Intelligence and the Indeterminacy of Relevance

### Jonathan Yovel

### 4.6.2.1 Relevance, Within Law as Being a System for Processing Information

For lawyers, relevance is essentially a relation between information and the discursive space in which legal practices – such as litigation – take place. In an important sense, salient to the legitimacy of law as a rational practice, law (and adjudication in particular) can be seen as systems for processing information. Law's representational relation to "the outside world" – its need to relate to and reconstruct facts, events, narratives – lies at the basis of law's claims for legitimacy and rationality. Law's performance, its manipulation and use of power, require that law base itself on valid representational and reconstructive technologies. Law must credibly relate to a "real world" (rather than to fictitious ones) in the process of adjudication. In other words, its foremost challenge is epistemic, and information is thus a basic constituent of law no less than normativity. This Section 4.6.2 deals with the basic requirement for the introduction of any information into the court's practical space, that or *relevance*. It does not deal with ways in which law processes and otherwise manipulates information once it has been introduced into discourse.

The pivotal characteristic that governs any and all acts of admittance/barring of information by a court of law is that of relevance. Relevance, of course, is a criterion for sorting information in many other contexts, as well as in any conversational interaction (Grice, 1975). In law, In law, however, relevance is not only a criterion for valid treatment of information, but itself *an object of regulation*. This means that legal relevance, on top of being a second-order or meta-legal concept (as it would operate in other discourses such as science) is also first-order relation. It thus

appears not just in legal theory, as a criterion for the attractiveness of technologies of legal epistemology, but in first-order legal norms, those identified by a legal system's *rule of recognition* (Hart, 1961a) or derived from its "basic norm" (Kelsen, 1967). In this chapter, I shall use as a paradigm for first-order regulation of relevance the applicable rule of the U.S. Federal Rules of Evidence, namely Rule 401.<sup>57</sup>

There is one discursive "division of labor" that I wish not to commit to in this chapter, indeed to regard as essentially misleading: thinking of relevance as "theoretical" and of the *legal admissibility* of information as "practical". Because in law, normative considerations apply in conjunction with epistemic ones (and sometimes compete with them), relevance is called on to operate on different levels and for different functions. Thus juristic "sorters" such as the notion of admissibility of evidence lay at the heart of the law of evidence and its independent normative functions (e.g., may we introduce information that was collected illegally, or that may create unfair bias for a party, even if it may have what lawyers call "probative value" – i.e., serve an epistemic function?). The law of evidence's criterion of admissibility expresses relevance concerns but is not identical with this, nor does it exhaust the complexities of legal relevance in general. This chapter discusses several problems of legal relevance beyond the standard treatment of the law of evidence (i.e. as a more general category constitutive of legal discourse) with special relation to AI and law.

### 4.6.2.2 Relevance: Why It Is Difficult for Formal Systems

Courts use complex modes of relevance judgments in regulating the introduction of information and construction of factual narratives. However, due to a plurality of values inherent to the legal process, relevance is not a strictly well-defined relation, or operator, in legal discourse. In fact, when lawyers claim that any information is either relevant or irrelevant (or sometimes, "minimally relevant")<sup>58</sup> in relation to a given legal process, they may mean something quite distinct from the meaning of relevance in other decision-making contexts or in communication in general. The present essay (Section 4.6.2 in the book), drawing on work in logic, linguistics and AI, attempts to clarify this ambivalence by offering several conceptualizations of relevance, centering on two paradigmatic meanings and discuss certain complications in the formal treatment of each. This in turn forms the basis for a theory of legal relevance, geared *inter alia* towards a critical examination of relevance operations.

<sup>&</sup>lt;sup>57</sup> Available online at http://www.utd.uscourts.gov/forms/evid2009.pdf (May 2011).

<sup>&</sup>lt;sup>58</sup> "Minimal relevance" echoes the Bayesian treatment of Hempel's so-called "Ravens paradox" (Good, 1960). Let E stand for some information, H for a narrative hypothesis, and O for all other information. E is "minimally relevant" to H if and only if the probability of H, given E and O, is different from the probability of H, given O alone (in Hempel's original, the proposition P "All ravens are black" is ostensibly strengthened by an observation O of a white dove (since P is logically equivalent to "anything that is not black is not a raven"), although no "meaning connection" exists between the two. The Bayesian approach is to acknowledge such minimal relevance yet consider the relation as typically weak and only marginally significant to decision-making processes. See Crump (1997).

Relevance has proved difficult for formal systems because even in its most formal operation – that of a gatekeeper of information, a metaphor taken from law as much as from literature - it does more than simply signal information "in" or "out" of processes. Even in the case of Daubert v. Merrell Dow Pharmaceuticals, the leading 1993 U.S. case<sup>59</sup> on the legal admissibility of expert testimony on the grounds of relevance, the court could form no single, or even cohesive, set of parameters that would constitute a descriptive theory of relevance. Clearly, lack of relevance cannot mean *only* "waste," using information that a priori cannot influence the decision-making procedure, algorithm or heuristic process. That, I claim below, is one layer of relevance relations, which theories of information and theories of language mostly invoke. However, both communicative and normative critical insights – which legal discourse float time and again – show that relevance operates on a less well-defined level that, in law and general and in evidence law in particular, is its salient mode of operation. I shall offer to think of this in terms of "normative saturation." This constitutive characteristic means that relevance sometimes operates not as a semantic, causal or "topical" sorter of information that is "put to use" in the service of some practical (=normative) interest, but instead is infused with normativity to begin with. The challenge for AI, addressed in this essay but not resolved, is derived directly from AI's relative success in dealing with semantic or other topical relations as opposed to its difficulties in assisting, let alone simulating or replicating, decisional processes that are normatively saturated.

Normative saturation is not a common term, yet its view of the social sphere (in which law, language, and applied AI all operate) is easily recognizable from social and political theory. It is perhaps most indispensable in the work of Thomas Hobbes, still the most recognizable framework for liberal political discourse. Recall that in the pre-political stage in his *Leviathan*, persons are depicted as united by no shared normative framework (such as a social contract), and yet even in the total absence of positive normativity (let alone of law) they have the capacity to make, understand, and uphold promises: not due to an extensive metaphysics of natural law but as a direct result of being communicative agents.<sup>60</sup> The claim that for a practice, device, or operator – however one wishes to conceive of relevance – to be constituted by normativity should not then be seen as particularly objectionable. In our times, it is associated mainly with the work of Jürgen Habermas, briefly discussed below.

On the basis of normative saturation, I shall begin with exploring the incompleteness for legal relevance of three influential bodies of work: the conversational relevance of H. Paul Grice (1975), the cognitive approach of Sperber and Wilson (1986), and finally the work of Anderson and Belnap (1975) in what came to be known as *logic relevance*, extending to the critical work in pragmatics of van Dijk (1979, 1989). The main forms of incompleteness that I explore are expressed in

 $<sup>^{59}</sup>$  Daubert v. Merrell Dow Pharmaceuticals, 509 U.S. 579 (1993). See on it, e.g., Cole (2009), responding to a thematic issue on the U.S. Supreme Court's very important expert evidence decision in *Daubert* – a Symposium Issue published by the *Tulsa Law Review*, vol. 43 (2007), as its Winter Issue, p. 229 ff.

<sup>&</sup>lt;sup>60</sup> As seminally explored in Habermas (1981).

these models under different conditions. At the outset, however, it may be well to point to two major difficulties, both going to the conceptual core of relevance, as well as to enumerate the various types of *incompleteness* (or for some, *vagueness*) under these conditions.

- 1. The first is that relevance is not merely a relation between information and entailed or inferred statement, but a *disposition*: a relevance judgment pronounces the *potential* of information to effect a conclusion or a decision-making process, not its actuality or necessity. Tendencies or dispositions are notoriously difficult to work with empirically. For instance, what does it mean to say that glass has a tendency to shatter? Is this simply an ex-post statistical observation or can we maintain that the potential of glass to shatter justifies the statement independently of any evidence of glass ever actually shattering? That would require something quite distinct from statistical data something we may call "a non-inductive theory of glass" that explains its disposition to shatter without recourse to such empirical events as glass actually shattering.<sup>61</sup> To return to relevance: in order to bar (or allow) a type of information from legal processes on the grounds of irrelevance, the first approach would require an empirical, statistical methodology, while the second would be confined to ex-ante considerations.
- 2. The second vagueness is more specific to legal relevance and is derived from law's own constitutive duality: *facticity* and *normativity*. The former means law's commitment to relate as validly as possible to occurrences and events outside itself (and which took place in the past), normally requiring various mechanisms of representation based on some sort of truth by correspondence. Yet where law is distinguished, it is in its being constituted by normativity, by normative interests other than truthful reconstruction of reality (lawyers preach the difference between "scientific" or "historical truth" and "legal truth"). Relevance is constitutive of both, and the vagueness of legal discourse owes to the fact that speakers do not differentiate between the operation of relevance in producing meaning (the realm of *facticity*) and that of a commitment to a normative order. In this Section 4.6.2 I argue that this is true even for jurists for whom all normativity is no more than shorthand for social conventionalism, i.e. legal positivists.<sup>62</sup>
- 3. The third vagueness owes to a topic rarely explored although recognized in practice, which is relevance as a rhetorical or persuasive device. Two senses must be distinguished here. One is the concern for abuses of relevance, the use of

<sup>&</sup>lt;sup>61</sup> The example is taken of course from a widely-discussed problem for empiricists. See Chisholm (1965), Lewis (1973, 1997).

<sup>&</sup>lt;sup>62</sup> Even when not empirical, legal positivism grounds normativity in facticity: N is a legal norm due to a set of social and historical facts that rendered it so (order of the sovereign, recognition by courts or their mere "habit", etc.). Neo-Kantian jurisprudence differs from empiricist jurisprudence precisely on the same grounds that Neo-Kantianism differs from empiricism generally: thus in Kelsen's "pure" theory of law the logical (rather than ontological) status of the *Grundnorm*, the basic norm that necessarily anchors any given legal system, is axiomatic, a "fiction" rather than a social fact. See Kelsen (1967).

persuasive (or more generally, *perlocutionary*)<sup>63</sup> language – to a jury, a judge or other legal agent, in the context of bargaining or any other legal interaction. The point is to mask irrelevant input as relevant through rhetorical manipulation (e.g., focusing the argument on objectionable behavior of a perpetrator outside of any relevant causal link to the alleged crime, therefore creating a heuristic bias that builds on the general preference for perceived relevance).

### 4.6.2.3 Relevance and Legal Formalism

The several forms of incompleteness or vagueness explored above as to the nature of relevance put a dent, I believe, in any formalistic descriptive theory of legal relevance and thus, by extension, complicates AI treatments of it. Before attempting to justify this claim it would help to briefly clarify both what I mean by legal formalism and what I do not mean by it (Yovel, 2010).

At the basis of formalism stands what can be termed the "formalist fiction": that the process that produced the legal norms has exhausted normative and policy considerations, and thus law can be seen as a more or less "closed" normative system, and norms – typically, rules – are applicable to concrete cases without further recourse to external normative deliberation (such as principle, policy, and ethics).<sup>64</sup> Thus according to legal formalism, application is mainly a matter of logical inference and entailment. Under formalism, unless discretion or other "freedom levels" of decision-making are stipulated in the rule, legal deductions are, ideally, as unique and sustainable as the logical structures that underlie legal doctrine.<sup>65</sup> For example, in private law, such tight systems as the law of negotiable instruments<sup>66</sup> (governed

<sup>&</sup>lt;sup>63</sup> Among speech acts, *perlocution* is when a person tells another, e.g., "It's so hot, in this room", and intends the effect that the recipient should open the window. This is a hint.

<sup>&</sup>lt;sup>64</sup> A "classical" formulation frequently referred to as a model of formalist construction is Langdell (1880). See Grey (1983). My suspicion, that American pragmatism could not have wholly yielded to Langdellian formalism even during that era, is to an extent vindicated by Ernst (1998). Following Grey, Pildes (1999) identifies three characteristics of American legal formalism that to significant degrees do not overlap: 1. Formalism as *aconsequential morality in law* (i.e., a commitment to deontological ethics – of which Kantian ethics is the accepted paradigm – whereby the ethical evaluation of any rule is innate and does not stem from the consequences of its application in the world); 2. As *apurposive rule-following* (i.e., construction and application of rules that do not hinge upon their purposes – which in turn are seen as external to the rules themselves – such as literal or originalist construction); 3. As an overall efficiency-enhancing regulatory architecture (in contrast with (1) and possibly with (2)).

<sup>&</sup>lt;sup>65</sup> For helpful discussions see, *inter alia*, Merrill and Smith (2000), Schwartz and Scott (2003), and Sebok (1998) (especially pp. 83–104); and Smith (2003). A useful general work offering a functionalist approach to formalism in terms of relative independence from context is Heylighen (1999).

<sup>&</sup>lt;sup>66</sup> At http://www.referenceforbusiness.com/encyclopedia/Mor-Off/Negotiable-Instruments.html one can find, for *negotiable instruments*, the following definition from *The Encyclopedia of Business*, 2nd edition, in the entry for "Negotiable instruments" by David P. Bianco:

Negotiable instruments are written orders or unconditional promises to pay a fixed sum of money on demand or at a certain time. Promissory notes, bills of exchange, checks,

in the United States by the Uniform Commercial Code Article 3 and a set of federal statutes and regulations) is frequently described as "formalistic" because decisions rest on a relatively closed set of logically organized rules,<sup>67</sup> while contract law tends to be more "relational" than formalistic as it deals with much wider sets of relations and cases.<sup>68</sup>

As a legal approach, classical formalism was largely discredited, in twentieth century jurisprudence, by legal realist critiques.<sup>69</sup> In the 1990s and 2000s, however, the label "new formalism" has emerged to denote a dominant and growing school of thought associated with the economic approach to law.<sup>70</sup> New formalism shares some traits with plain old formalism – mainly, a preference for autonomous modes of construction and relatively strict application of rules and restrictions. Yet the new differs from the old on some important levels, predominantly on the matter of justification. While old formalism regarded itself as a correct, even scientifically correct, descriptive theory of law, and jurisprudence as a "science for the sake of science"

drafts, and certificates of deposit are all examples of negotiable instruments. Negotiable instruments may be transferred from one person to another, who is known as a holder in due course. Upon transfer, also called negotiation of the instrument, the holder in due course obtains full legal title to the instrument. Negotiable instruments may be transferred by delivery or by endorsement and delivery. One type of negotiable instrument, called a promissory note, involves only two parties, the maker of the note and the payee, or the party to whom the note is payable. [...]

<sup>&</sup>lt;sup>67</sup> This is of course a general typification lacking in nuance. For critical takes on the formalist structure of Article 3 see Yovel (2007), as well as the papers by Kurt Eggert (2002) and Grant Gilmore (1979).

 $<sup>^{68}</sup>$  I owe this insight, like many others – including the intimate relation between law and sports – to Neil Cohen. Under the relational approach, contracts are not distinct legal instruments that exist independently of relations between the parties, but the aggregate of these relations, only some of which are articulated. While relational contract theorists supplied insights into understanding long-term and complex contractual relations, they also drew away from the view of contract as such being merely a mechanism for the rational allocation of risks. Reliance and future relations are important parameters of relational contracts. See Ian Macneil's book (1980) *The New Social Contract*.

<sup>&</sup>lt;sup>69</sup> See Duncan Kennedy's (2001) encyclopedia entry on 'Legal Formalism'. Anthony Kronman (1988) offered a powerful and succinct critique. American jurisprudence has been almost obsessed with the question of formalism, especially in view of legal realist critiques. In its most offensive – for realists – manifestation, formalistic jurisprudence is a "science for the sake of science" absorbed exclusively with "the niceties of [law's] internal structure and the beauty of its logical processes", according to Roscoe Pound's (1908, p. 605) 'Mechanical Jurisprudence' (for which, see s.v. *Mechanical jurisprudence* in the Glossary of this book). But that kind of "old formalism" seems to have all but disappeared, as ("new") formalism today bases its legitimacy on functional grounds, mainly those of economic efficiency. A more lingering critique is that of Felix Cohen's (1935) 'Transcendental Nonsense and the Functional Approach', according to which formalism (or "conceptualism") supplies the philosophical basis for "objectifying" legal concepts or assuming that they stand for objects in the real world, namely normative entities, rather than artifacts or constructions, or ways of talk. For a rich reference, see Dagan (2007). See also Morton White's (1957) *Social Thought in America: The Revolt Against Formalism*.

 $<sup>^{70}</sup>$  See the papers by Hanoch Dagan (2007) and Thomas Grey (1999).

(as opposed to a substantive discourse involving various and competing normative types and concerns), new formalism justifies its approach on functionalist grounds. For instance, a formalist approach to the construction of contracts may justify a narrow, acontextual Parol (*sic*)<sup>71</sup> Evidence Rule as tending to create ex-ante incentives for efficient negotiating processes, in terms of utility and costs.<sup>72</sup> The process of shaping the rule exhausts the normative concerns (these will no longer direct the application directly, only through the interests entrenched in the rules; otherwise this would simply be a functionalist approach biased towards economic efficiency). New formalism resembles the older brand in another, ironic way: on the one hand, it is as committed – perhaps more than its predecessor – to a specific metaphysics and ideology of individualism. On the other hand, it attempts to shy away as much as possible from engaging in substantive ethical discourse, suspecting all ethical talk of relativism or at least lacking scientific rigor. The fact that a preference for economic efficiency is itself based on a substantive moral theory - utilitarianism is acknowledged, of course, but mostly in the background of discourse where it is taken as a universal dogma.

Another approach to formalism may be termed "relational": taking its cue from so-called relational contract theory, it looks to formalism as a legal architecture that is justified not by general theoretical arguments – certainly not as a valid descriptive theory of law – but as an approach that emphasizes legal form over functionalist approach in those contexts where form is deemed important to protect the relevant legal relations. Relational formalism would urge courts not to follow formal requirements blindly or dogmatically, on the one hand, yet not to give up on legal forms within a purely functionalist approach, on the other hand. An example I explored elsewhere deals with the role of form in the law of negotiable instruments, long considered a paradigm for formalist jurisprudence; I show that several junctions and tensions expressed in the actual practices and court cases dealing with the law of negotiable instruments are best explained by relational formalism, rather than by either dogmatic formalism or functionalism.

Can relevance and AI be approached in a similar way? This preliminary essay cannot offer a worked-out account of how a relational approach to relevance would look like, but it can attempt to note what should be avoided as much as what should be sought. Thus, it is far too tempting to consider causal relevance more readily formalized than normative relevance, just as semantic relations are easier to formalize than pragmatic and contextual ones. This, I think, is a mistake; possibly, AI treatment of normative judgment in this context can be better executed and justified than causal relevance. Formalizing causal relevance requires predictions about cognitive processes – what would "tend" to make any fact "more probable or less

<sup>&</sup>lt;sup>71</sup> This is no typo: *Parol Evidence Rule* is archaic spelling used by design, and it is found for example in the United States' Uniform Commercial Code, §2-202. See in the next note.

<sup>&</sup>lt;sup>72</sup> In contract law, a Parol Evidence Rule restricts recourse to extra-textual sources (such as preliminary negotiations or the parties' behaviour) when a written contract governs the parties' relations. An example is the American Uniform Commercial Code (UCC), § 2-202.

probable" (FRE 401 again).<sup>73</sup> Formalizing normative relevance, on the other hand, would require a "gatekeeper" function (to invoke *Daubert*)<sup>74</sup> that should conceivably be easier to formulate in relation to any decision-making process (or institution) since it requires no prediction of causal relations within or of the outcomes of these processes. Thus, counterintuitively, normative relevance – the aspect that specifically characterizes legal relevance – seems more amenable to AI modeling and formal treatment than its causal counterpart.

#### 4.6.2.4 Relevance, Evidence and Beyond: Three Theoretical Approaches

What does a court mean by declaring any given evidence "irrelevant" in such sentences as, e.g., "Verdict reached by a different jury (whether on the same or different evidence) in the earlier trial was irrelevant"? Surely, by "irrelevant" the court cannot mean that the information in question will necessarily prove *inconsequential*, in the sense that the decision-making process of the trial would be indifferent to it – that admitting it into the trial's discursive space is a sort of waste, since it would a priori play no part in the court's decision. On the contrary: it seems that in such cases as *Lam Chi-Ming v R*, a 1991 Hong Kong case<sup>75</sup> where information that proved correct and led to a conviction was on appeal ruled inadmissible due to its being extracted involuntarily from the defendants,<sup>76</sup> the court considered the evidence to carry considerable persuasive force: it *may* prove consequential, yet it *ought* not. Legal relevance, then, is normatively saturated from its very inception.

As I argued in a previous work (Yovel, 2003), courts and other legal agents rely on relevance to operate on two different levels: on one, it is expected to bar information that is useless for the process of legal decision-making, quite like relevance operates in other inferential frameworks, whether theoretical or practical.

 $<sup>^{73}</sup>$  Short for "Federal Rules of Evidence, Rule 401". What appears in double quotes ("more probable or less probable") is the language of the Rule 401 of the U.S. Federal Rules of Evidence, that introduces the notion of relevance to this code of evidence law.

<sup>&</sup>lt;sup>74</sup> This is the case of *Daubert v. Merrell Dow Pharmaceuticals*, the leading 1993 U.S. case on the legal admissibility of expert testimony on the grounds of relevance. *Daubert v. Merrell Dow Pharmaceuticals*, 509 U.S. 579 (1993).

<sup>&</sup>lt;sup>75</sup> Lam Chi-Ming v R (1991), [1991] 2 App. Cas. 212 (P.C. 1991) (Hong Kong).

 $<sup>^{76}</sup>$  The particulars are odd enough to merit a short description. The defendants were sentenced to death for the murder of a man who raped their sister. They used a knife that they subsequently disposed of in the sea. During the police investigation, the defendants confessed to the crime and reconstructed it on video, whereupon divers were successful in recovering the knife. At the trial, it was established that the confessions were extracted by police brutality and therefore were inadmissible. The question was how to deal with the video tapes and the knife. The trial judge found this original solution: he ruled that although all that was *said* by the defendants was inadmissible, the visual recordings of the re-enactments were not; and the video tapes were subsequently admitted *without sound*. The knife was considered material evidence, independent of its mode of discovery. The Court of Appeals was not amused, and disallowed the derivative evidence as well as the confession.

As Sperber and Wilson show, relevance conceived this way is largely an economic device applied to cognitive processes:

Human cognitive processes [...] are geared to achieving the greatest possible cognitive effect for the smallest possible processing effort [...] to communicate is to imply that the information communicated is relevant. (Sperber & Wilson, 1986, p. vii)

The qualifier "human" seems unnecessarily restrictive here, and it will perhaps be more correct to regard communication as involving *claims* of relevance, rather than implications ("imply" is too weak). While intuitively appealing, Sperber and Wilson's notion ignores that conditions of relevance are as much products of discourse, linguistic interaction and other practices as they are agents that shape them; and that, while economicity is generally advisable, it cannot be seen as an overarching goal of normative or practical processes. In other words, it is the case that legal relevance both does more than Sperber and Wilson claim (it expresses concerns other than economicity) and less (it does not always express economicity). A critically informed descriptive theory of legal discourse cannot disregard the plurality, non-reductionist and other non-parsimonious characteristics of the language used to express human experience - as well as normative ambiguities - that law requires. Any system that wishes to represent/replicate/reconstruct legal discourse would have to contend with such constitutive modes of description of the human experience; information is relevant due to its being *meaningful*, not necessarily linearly consequential. Far from being a stick in the wheels of AI and law, this only challenges legal AI to avoid collapsing into a simplistic set of syllogistic forms only to accommodate the economics of relevance.

Sperber and Wilson's second claim, that to make any contribution to discourse is to make an implied claim of its relevance is reflected in another influential work, H. Paul Grice's work on the "supermaxims of communication" (Grice, 1975). Grice discussed what he called "conversational relevance" and at one point I have taken this to be quite different from the "practical" relevance of legal discourse (the latter responds to concerns of decision-making theory, the former to those of intersubjective linguistic interaction), but the distinction now seems overstated. Grice's goal was to articulate, through a universal "ethnography" of conversational dynamics, a set of "supermaxims" that obey a standard "logic of conversation." One of those is the somewhat blunt "supermaxim of relation": "be relevant"; other maxims are effectively governed by notions of relevance, such as the "supermaxim of quantity": "make your contribution as informative as is required (for the current purpose of the exchange)", but although "questions [arise] about what different kinds and foci of relevance there may be",<sup>77</sup> the concept of relevance is treated by Grice, overall, as an inherently vague logical primitive.

Going beyond Grice's contribution entails thinking of relevance as a reasonsbased and theory-dependent device of practical reasoning. In what sense then can relevance itself be in need of justification?

<sup>&</sup>lt;sup>77</sup> Grice (1975, pp. 45–46).

It is a fact of logical discourse that relevance has not – perhaps not yet – found a canonical position in its seemingly natural habitat, modal logic (indeed relevance assisted in alienating another "logical" concept, entailment, from the calculus of possibility/impossibility). Recent studies suggest a reason for that. As Diaz (1981) convincingly argues, relevance thrives on the inability of standard modal conditionals to supply a satisfactory definition of "entailment". The emphasis here is on expectations of what the form of entailment must provide: "entailment" itself may be seen as well-defined in analytic terms, e.g. by the semantics of material implication, while neglecting the "meaning connection" that non-formal discourse ascribes to it. In formal-semantic terms, " $\rightarrow$ " is a representation of, and only of, the truth table TFTT.<sup>78</sup> It is only when we think of it as representing something else than semantic compatibility that we resent the fact that "a false proposition entails anything".

While this is not the place to elaborate on Lewis' (1973) modal treatment of entailment, a gloss is certainly required. Under the modal approach, impossible propositions "entail" - that is, are semantically compatible with - anything, and necessary propositions are "entailed" by anything. Thus "p entails q" is true if and only if it is impossible for p to be true and q false:  $(p \Rightarrow q) \equiv P(p \lor q)$  (i.e., p entails q is modally equivalent to the impossibility of p being true and q being false, where  $\Rightarrow$  stands for "strict implication" and P for Lewis' primitive modal predicate, "possible"). This formulation avoids the mislabeled "paradox of implication" where "a false proposition implies anything" (third and forth lines in the standard truth-table represented by  $p \rightarrow q$ ) and "a true proposition is implied by anything" (first and third lines). As  $\rightarrow$  is, semantically, about compatibility of combinations (e.g. the compatibility of a false antecedent and true consequent), there is no paradox but instead a pragmatic difficulty. Critics such as Nuel Belnap express the need for an additional requirement from "entailment": that a condition of valid entailment be a "meaning connection" between antecedent and consequent. In other words, the additional "relevance requirement" is that for A to entail B the former must be "relevant" in respect to the latter. One way of looking at relevance, therefore, is as an (or perhaps the) intersection between modality and meaning. Meaning is cultural and logically contingent, which at least partially explains logic's traditional difficulty in dealing with relevance; but the requirement of a "meaning connection", whatever theory of meaning is subsequently employed, should not present such grave a problem.

Since the 1960s, logical approaches to relevance have emerged from various directions, mostly along two lines: modal inquiries and what came to be loosely termed *relevant logic* (RL) – see in Section 4.6.3 below – since a symposium bearing that designation took place in 1974. The latter project relies mainly on directions suggested by work by Anderson and Belnap to identify challenges, dilemmas and modes of approaching relevance, even when positions and conclusions are critical of it. Interestingly, Both Lewis' (1973) work in modal logic and Anderson and Belnap's (1975) and Anderson's (1960) work in RL stem, at least partially, from

 $<sup>^{78}</sup>$  I.e.: true, false, true, true. The only position in which the material implication does not hold is when the antecedent is true and consequent is false.

uneasiness with classical logic's handling of material implication relations. In a nutshell, two such problems were identified: one (the semantic inadequacy) finds fault with the question of the validity of material implication as divorced from any connection to consequent B being in any sense *dependent* on its antecedent A. In other words, the problem is that relevance is not essential to logically valid argumentation. Although the term "fallacy" is sometimes invoked in this context it better be avoided; Anderson and Belnap's critique is about the desirability and fruitfulness of classical implication in explaining and regulating both discourse and decisionmaking procedures, not about its internal coherence or completeness. The problem they identify is the lack, in deductive systems, of a serious requirement that a conclusion depend on its assumptions that a proof be *from* a hypothesis as opposed to being allowed by it.

For instance, in classical logic the following is an obviously valid argument form: (1) if A, then if B, then A (which we notate as:  $A \rightarrow (B \rightarrow A)$ ). The relevance problem here is that the consequent/conclusion is not dependent, is not derived from the antecedents/assumptions A and B, respectively; there is no use for hypothesis B. Another example is that of validity on the force of contradiction, (2) if A, then if  $\sim A$ , then B (which we notate as:  $A \rightarrow (\sim A \rightarrow B)$ ). In (2) the conclusion B is not derived from its assumptions; the formula is valid on what are basically semantic considerations: syntactically, an argument with an assumption that is a contradiction cannot be invalid because it can never be the case that the assumptions are true and the conclusion false. Semantically, a material implication whose antecedent is a contradiction is itself a tautology, because the second line of its standard truth-table TFTT, i.e. the only possibility for an implication sentence to be false, can never occur. In a telling sense, it is the very hyp procedure of natural deduction that is faulted here: if hypotheses can be added at will, in what sense is the conclusion entailed by them? Likewise consider Genzen's rule of introduction of the implication connective in "natural" deduction  $I \rightarrow$ , which allows introduction of the material implication connective between elements that just happen to occur in a hypothetical sequence. B's irrelevance is thus demonstrated in line j+k+1 in (1).

The point of this exercise is to show by a very simple manipulation of the standard Genzen rules of inference, how any hypothesis can be made to seem relevant though nothing is actually entailed by it. Here, a hypothesis is introduced from which the conclusion follows, yet the hypothesis is entirely superfluous. Such shortcomings of natural deduction in expressing relevance generated Anderson and Belnup's shift to a requirement of "use" as an interpretation of entailment in Relevance Logic: B is entailed by A not merely by virtue of following from A in natural deduction, but by A being *used* to infer B.

(1)					(1	.1)	
	i.	Α					
	j.	B	hyp		i.	A	
	j+k.		A	reit i	j.	A	reit i
	j+k+1. B→A		I→ j, j+k				
	1.	Α	reit i				

These very basic formulae show: (1) A is established. B is introduced as a hypothesis. A is reiterated. Thus A follows B. However, as seen in (1.1), B is not *used* in order to entail A. The point of this exercise is to show by a very simple manipulation of the standard Genzen rules of inference, how any hypothesis can be made to seem relevant though nothing is actually entailed by it. Here, a hypothesis is introduced from which the conclusion follows, yet the hypothesis is entirely superfluous. Such shortcomings of natural deduction in expressing relevance, generated Anderson and Belnup's shift to a semantic requirement of "use" as an interpretation of entailment in Relevance Logic: A is entailed by B not merely by virtue of following from B in natural deduction, but by B being *used* to infer A.

It was on the concept of *use* that Anderson's initial attempt to form a relevance requirement for deductibility rested. In simplified form, it allowed that B be relevantly deducible from a set of statements  $\{A_1, \ldots, A_n\}$  if and only if there is a deduction from  $\{A_1, \ldots, A_n\}$  in which each of the  $A_i$  are actually used. However, at least on the surface that criterion doesn't seem to work: the  $A_i=B$  in (1) is, after a fashion, used – and its introduction definitely incurs a cost. What Anderson seems to suggest is a *sine qua non* condition: that in order to be relevant in P, each  $A_i$  must have actual significance in respect to P's outcome. This criterion means something quite different from actual use: it must mean something akin to *force*, the quality of potentially carrying an influence.<sup>79</sup> Note that B *has* an influence on (1): its introduction influences the number of stages and strategy of proving in (1). Perhaps then B is relevant in (1) if and only if it actually influences its conclusion: can that be the meaning of a conclusion being derived *from* an assumption, of an assumption *entailing* a conclusion?<sup>80</sup>

Indeed as (1.1) shows, B has no such significance in (1) because  $A \rightarrow A$  whether B or  $\sim B$ ; (B  $\vee$  B)  $\rightarrow$  A (that is to say, that B or its negation entails A) is a tautology.<sup>81</sup> The *sine qua non* interpretation of relevance is, however, too strong a requirement: it defines relevance on terms of weight, it does not allow for overruling or outweighing a relevant factor. The solution must be dynamic rather than static: in order to be considered relevant, B must be held to have a particular force in respect to (1), which is the ability (but not the necessity) to make a difference in it in terms of outcome rather than process alone.

<sup>&</sup>lt;sup>79</sup> I use "force" here mainly in deference to J. L. Austin's terminology in discussion illocutionary, locutionary and perlocutionary forces.

<sup>&</sup>lt;sup>80</sup> K. F. Hauber offered to define as a "closed system" any n statements of the form  $p \rightarrow q$  that satisfied the requirement that the antecedents exhaust all possible cases and the consequents exclude each other. The advantages of such a system for decision-making are clear: for every true assertion  $p \rightarrow q$  it is also true that  $\sim p \rightarrow \sim q$ . (By  $\sim$  the proposition is negated.) All necessary conditions are also sufficient ones and vice versa. Hauber's system marginalizes "implication paradoxes" but is not conducive toward forming a relevance requirement for entailment, as Anderson and Belnap demand.

<sup>&</sup>lt;sup>81</sup> According to the law of excluded middle. Note that in this and other parts this study I neglect to examine intuitionistic treatments of relevance that do not accept this postulate.

This approach differs from Anderson and Belnap's modification of the deductibility theorem, which distinguishes

(1) 
$$A_1 \cdot A_2 \dots \cdot A_n \rightarrow B$$

from

$$(2) A_1 \rightarrow A_2 \rightarrow \dots A_n \rightarrow B$$

on the basis of the requirement that in (2) each  $A_i$  be relevant to B, but not in (1) (Anderson & Belnap, 1975, p. 21). Diaz convincingly criticizes the distinction, which is consequently not followed here. This way or another, "used in" seems ambiguous enough to allow for the interpretation offered here. (1) Is an aggregate of conjunctives ( $A_1$  and  $A_2$  and ...  $A_n$  entail B) while (2) is a progressive sequence of entailment (if  $A_1$  then  $A_2$  then ...  $A_n$  entails B). (1) and (2) are semantically equivalent, although they differ on how the various elements are *used*.

This then is what I offer to term *causal relevance*. Establishing it does not require that the information in question actually tilt some metaphorical scales of decision making, only that it be identified by a theory of what is capable of influencing that particular process. That is why relevance is theory-dependent and theory-presupposing, and cannot be seen as a neutral, formal criterion for the attractiveness of theory. Why relevance can and must be conceptualized normatively also becomes apparent when we think of such cases as *Lam Chi-Ming* mentioned above: if a decision-making process is subject to a practical goal, relevance functions as a device for introducing and barring information that frustrate that goal, not because they (ontologically) cannot influence P's outcome (as B in (1)), but because they (permissibly) cannot, and should not.

The requirement of force substitutes for a requirement in terms of sufficient and necessary conditions. It would not do to determine relevance in terms of actual influence on a procedure P's outcome because, although it may be that element B possesses causal force in relation to P, other considerations may negate or neutralize that force. It may be that information be considered relevant (in the causal sense) in relation to P, yet eventually not allowed to influence its outcome on grounds (or *reasons*) that are external to the relation between B's causal force and P. A paradigmatic case, typical to the law of evidence, is when B, although maintaining causal relevance in relation to P, lacks *normative* relevance.

*Normative relevance* (NR) works on the grounds of subjecting legal discourse to normative considerations *always*, even when it seems that merely probative or epistemological concerns operate; this then is a product of the normative saturation of legal discourse. It becomes clearer how normative relevance acts within the set R1 pre-defined by practical causation,  $R1 = \forall x(rel x(P))$ . This, however, must not lead to an automatic conclusion that the set R2 produced by operators defined by normative relevance is necessarily a subset of R1. The reason for that, in a nutshell, is that practical causation is itself theory-dependent and that theory plays, in respect to dictating the behavior of relevance functions, a normative role. Normative relevance may be used to alter the theoretical considerations that define practical or

causal relevance. R2 is not defined as logically subject to R1 and it is not the case that only when fulfilling R1 requirements, information becomes a candidate for R2 membership.

## 4.6.2.5 Considerations About Applying Relevance Logic

Seminal work in *relevance logic*<sup>82</sup> by van Dijk seems, at first look, especially applicable to practical and normative contexts, since unlike previous work by, e.g., Anderson and Belnap (1975), its focus is on pragmatics, communication, and text-context relations. His notion that "Relevance is a relative notion [...] relevance must always be construed with respect to a certain (con-)text: relevance for a certain speaker or hearer, relevance with respect to a certain problem, question, etc." (van Dijk, 1979, p. 113) is certainly a fruitful starting point for conceptualizing legal relevance.

While van Dijk's broad identification of relevance as signaling "some *degree of importance* to some property of the discourse" (ibid.) may be misleading in the context of legal relevance since – even when discounting the problem of "minimal relevance" discussed above, that identifies information as relevant even when consequentially unimportant to the discourse<sup>83</sup> – the definition is in fact broad enough to hold both senses of legal relevance, epistemic and normative. It is precisely the point that information may be normatively *irrelevant* even when "important" in an epistemological sense (to reiterate the initial point made above, legal relevance is itself an object of first-order legal regulation.) Van Dijk would simply shift the "importance" of the information from epistemic to some other value of the relevant discourse.

His framework, then, can easily absorb the approach of this chapter. Where it is perhaps less helpful is in attempting to base one primitive relation (i.e., relevance) on another (i.e., discursive importance). As shown above, this is a pragmatic mirroring of the same problem facing Anderson and Belnap. Additionally, not unlike Grice, van Dijk's emphasize is on what may be termed *conversational relevance*, whereby proposition A is "relevant" in relation to proposition B if their connection is considered "appropriate" (van Dijk, 1989) by a speaker in a specific pragmatic context. "Appropriateness" is supposed to be different from the "meaning connection" central to Anderson and Belnap (which they see as central to semantics) and certainly different from the syntactical requirements of well-formed propositions.

Where van Dijk floats a crucial point that Anderson and Belnap – as well as Grice – sometimes fail to emphasize, is that it is a condition for a valid determination of relevance (for instance, of a data item to a line of argument) that a pragmatic *reason* for the relevance can be both formed and defended according to the parameters of the given discourse. Reading "normative" – and in some instances that

<sup>&</sup>lt;sup>82</sup> *Relevance logic* is briefly explained in Section 4.6.3 below.

<sup>&</sup>lt;sup>83</sup> See above, text to note 58.

center on courts, "institutional" – as a subset of "pragmatic" underlines a similar approach to the examination of the different contexts of operation of legal relevance explored here.

## 4.6.2.6 A Refutation of the Argument from the Distinction Between Relevance and Admissibility

Before concluding, I wish to return to a point only cursorily made at the outset of the present Section 4.6.2. A common claim aims at neutralizing the basic argument made in this paper by invoking the distinction between relevance and admissibility. This distinction, so the claim goes, allocates all normative considerations and their ambiguities to the sphere of admissibility rules, while leaving relevance relatively – or entirely – causal or "topical". On this distinction, AI procedures meet different modes of operation; even when severely challenged in dealing with admissibility, the causal or topical links of "skeletal relevance" are much more given to potent information sorters that apply semantic, pragmatic, and other heuristic procedures.

There are two reasons why this distinction does nothing to solve any of the ambiguities discussed above.

- In law as in any communicative medium, relevance permeates substantive as well as procedural or derivative discourse and procedures, not just the law of evidence. This means that forming claims in contract or criminal law, or in the law of civil procedure, requires as much relevance application as the law of evidence. In fact, it is a regretful mistake that most – not all – legal discourse of relevance is traditionally relegated to the theory of evidence. What may count as a binding contractual acceptance, for example, or what elements of happenstance may count towards a criminal defense, requires and in fact applies relevance criteria.
- 2. The argument from cultural cognition: in recent critical studies (Kahan & Braman, 2006), so-called cultural cognition studies have identified correlative links between cultural and ideological biases and perceptions of risk (e.g., a juror who is generally concerned about personal safety may be quicker to agree that a given individual suspect poses such risks than one guided by an opposite bias). My point here is not a direct application of cultural cognition to a critique of relevance, although it makes a similar basic point: that persons', and thereby institutions', relevance judgments are inter alia a product of unconscious specific (rather than merely general) epistemic biases. My point is neither to validate this point nor to refute it, but to acknowledge that as a practice (rather than a set of formal considerations), what may have a "tendency to make the existence of any fact that is of consequence to the determination of the action more probable or less probable"<sup>84</sup> is no less a matter of epistemic bias than are normative considerations. When Grice orders: "Be relevant!" he makes no claim as to what may, could, or would be considered a relevant contribution to the linguistic exchange.

<sup>&</sup>lt;sup>84</sup> Federal Rules of Evidence, Rule 401.

The argument from cultural cognition points out that a general acceptance of the relevance requirement made by any rule or maxim – even on the most technical, strictly causal or epistemic interpretation – contributes nothing towards a consensus concerning what relevance entails, nor towards a unified application of its criteria.

Invoking admissibility, then, does not solve any of the problems that the indeterminacy of legal relevance gives rise to. Relevance operates and is crucial to forming legal claims where admissibility is not a recognized standard (if it would be, it would simply be another name for relevance); and relegating relevance to a much narrower set of questions (specifically, "causal" rather than normative) does little or nothing to mitigate indeterminacy, since causal inferences are given to the same kinds of bias-pluralism that normative ones are – if not, in fact, more so.

An added consideration stems from the role of relevance in legal and quasi-legal rhetoric. A classical example is supplied by the legal ethnographers who study the language of non-represented litigants, such as in small claims court. Thus Conely and O'Barr study (1990) of divergent approaches to relevance between the standard form of legal discourse and in particular, the formation of legal claims – the ruleoriented form of rule-breach-remedy – and more relational narrations of litigants who place probative value on information that doctrine entirely bars. Consider, e.g., a litigant in the context of an automobile accident who bases her claim largely on evidence of antagonistic or aggressive behavior of her antagonist immediately following the accident, which, for the court, is entirely irrelevant in adjudicating on the responsibility of the parties for the accident that allows only evidence of antecedent behavior: the court applies NR criteria that are simply different from the NR criteria assumed by the litigant. Legal formalists or proceduralists<sup>85</sup> would dismiss this critical insight on the grounds that the phenomenon it describes is simply a mistake, or an aberration, that requires no theoretical and certainly no practical consideration the behavior and expectations need fixing, not the discursive framework. To those greatly concerned with serious gaps between the (bounded) rationality of legal practices and discourse and the (otherwise bounded) rationality of persons who approach it, such variations in understanding relevance is troubling indeed.

## 4.6.2.7 Conclusion of the Section About Relevance

The present Section 4.6.2 offers a set of critical insights rather than a central unified claim. It deals with a group of related problems that define legal theory's complex relation to the concept of relevance, with special emphasis on challenges for AI and law. Unlike some previous work, it extends beyond considerations typical of the theory of the law of evidence. Where it attempts to make a contribution, it is typifying

<sup>&</sup>lt;sup>85</sup> Generally speaking, so-called "legal proceduralists" or (in this context) "formalists" emphasize the institutional and structural aspects of decision-making processes independently of context, outcome, or "substantive" normative considerations.

tensions especially in the relations between approaches to relevance and several approaches to legal formalism, "old" syllogistic formalism, "new" functional formalism (associated mainly with the economic approach to law, Pildes (1999)) and finally a relational formalism that subjects legal forms to interests anchored in relations between parties without collapsing to functionalism (Yovel, 2010). One central argument of this analysis is that, counterintuitively, normative relevance should pose less problems for AI treatment than causal or epistemic relevance.

# 4.6.3 Relevance Logic

#### 4.6.3.1 A Gentle Introduction to the Main Concepts

Jonathan Yovel's Section 4.6.2.5, 'Considerations about Applying Relevance Logic', are in a sense preamble to the explanation of *relevance logic* (a kind of non-classical logic) in the present Section 4.6.3. *Relevance logic*<sup>86</sup> (called by some<sup>87</sup> *relevant logic*) is a family of *modal logics*. relevance logic is typified by its requiring the antecedent and consequent of implications to be *relevantly* related. We quote from a nice and undemanding explanation<sup>88</sup>:

Relevance logic aims to capture aspects of implication that are ignored by the "material implication" operator<sup>89</sup> in classical truth-functional logic, namely the notion of relevance

<sup>&</sup>lt;sup>86</sup> See, e.g., an overview in Mares and Meyer (2001), in Mares (2006), and in Dunn and Restall (2002), the latter being a rewritten version of Dunn (1986). An in-depth treatment is provided in Anderson and Belnap (1975), in Anderson and Dunn (1992), as well as, e.g., in a book by Stephen Read (1988, revised 2010).

<sup>&</sup>lt;sup>87</sup> Apparently more frequently so in Australian logicians, and also in Britain. The French name is *logique pertinente*. Practitioners of *relevant logic* have been referred to as *relevant logicians*. More often, one finds theme referred to as *Relevantists*, but usually in opposition to the Classicists, in the context of the controversy between advocates of relevance logic and advocates of classical logic.

<sup>&</sup>lt;sup>88</sup> The quotation is from http://en.wikipedia.org/wiki/Relevance\_logic Concerning the history of relevance logic (ibid.): "Relevance logic was proposed in 1928 by Soviet (Russian) philosopher Ivan E. Orlov (1886–circa 1936) in his strictly mathematical paper 'The Logic of Compatibility of Propositions' published in *Matematicheskii Sbornik*. The basic idea of relevant implication appears in medieval logic, and some pioneering work was done by [Wilhelm] Ackermann [(1956)], [Shaw-Kwei] Moh [(1950)], and [Alonzo] Church [(1951)] in the 1950s. Drawing on them, Nuel Belnap and Alan Ross Anderson (with others) wrote the *magnum opus* of the subject, *Entailment: The Logic of Relevance and Necessity* in the 1970s (the second volume being published in the nineties). They focused on both systems of entailment and systems of relevance, where implications of the former kinds are supposed to be both relevant and necessary."

The history as related by Stephen Read (1988, but in the revised edn., 2010, section 3.5, p. 44) is as follows: "In 1958, Anderson and Belnap took up ideas from Church and Ackermann, and started a research program into what in time became 'relevance (now often called, 'relevant') logic'. Their chosen name picked up an informal use before that time of the epithet 'relevant' to characterise a consequence relation, and an implication, which was not paradoxical in the way material and strict implication were [...]".

<sup>89</sup> See http://en.wikipedia.org/wiki/Material\_implication

between antecedent and conditional<sup>90</sup> of a true implication. This idea is not new: C. I. Lewis was led to invent modal logic, and specifically *strict implication*, on the grounds that classical logic grants *paradoxes of material implication*<sup>91</sup> such as the principle that *a falsehood implies any proposition*. Hence "if I'm a donkey, then two and two is four" is true when translated as a material implication, yet it seems intuitively false since a true implication must tie the antecedent and consequent together by some notion of relevance. And whether or not I'm a donkey seems in no way relevant to whether two and two is four.

Thus far, however, we haven't seen the logical criterion for relevance. The same text continues as follows<sup>92</sup>:

How does relevance logic formally capture a notion of relevance? In terms of a syntactical constraint for a *propositional calculus*, it is necessary, but not sufficient, that premises and conclusion share *atomic formulae* (formulae that do not contain any logical connectives). In a *predicate calculus*, relevance requires sharing of variables and constants between premises and conclusion. This can be ensured (along with stronger conditions) by, e.g., placing certain restrictions on the rules of a natural deduction system.<sup>93</sup> In particular, a Fitch-style *natural deduction* can be adapted to accommodate relevance by introducing tags at the end of each line of an application of an inference indicating the premises relevant to the conclusion of the inference. Gentzen-style *sequent calculi*<sup>94</sup> can be modified by removing the

<sup>91</sup> See http://en.wikipedia.org/wiki/Paradoxes\_of\_material\_implication Paradoxes of *material implication* include:

$$p \to (q \to p).$$
  

$$\neg p \to (p \to q).$$
  

$$(p \to q) \lor (q \to r).$$

where  $\neg$  is negation, (like  $\sim$  in Yovel's Sec. 4.6.2). Paradoxes of *strict implication* include:

$$(p \& \neg p) \to q.$$
  

$$p \to (q \to q).$$
  

$$p \to (q \lor \neg q).$$

<sup>92</sup> Also this quotation is from http://en.wikipedia.org/wiki/Relevance\_logic

<sup>93</sup> "In logic and proof theory, *natural deduction* is a kind of proof calculus in which logical reasoning is expressed by inference rules closely related to the 'natural' way of reasoning. This contrasts with the axiomatic systems which instead use axioms as much as possible to express the logical laws of deductive reasoning" (http://en.wikipedia.org/wiki/Natural\_deduction)

<sup>94</sup> "In proof theory, a *sequent* is a formalized statement of provability that is frequently used when specifying calculi for deduction. In the sequent calculus, the name *sequent* is used for the construct which can be regarded as a specific kind of judgment, characteristic to this deduction system" (http://en.wikipedia.org/wiki/Sequent). "In proof theory and mathematical logic, sequent calculus is a family of formal systems sharing a certain style of inference and certain formal properties. The first sequent calculi, systems LK and LJ, were introduced by Gerhard Gentzen in 1934 as

<sup>&</sup>lt;sup>90</sup> "The *material conditional*, also known as *material implication*, is a binary truth function  $\rightarrow$  such that the compound sentence  $p \rightarrow q$  (typically read 'if *p* then *q*' or '*p* implies *q*') is logically equivalent to the negative compound: not(*p* and not *q*). A material conditional compound itself is often simply called a conditional. By definition of ' $\rightarrow$ ', the compound  $p \rightarrow q$  is *false* if and only if both *p* is true and *q* is false. That is to say that  $p \rightarrow q$  is *true* if and only if either *p* is false or *q* is true (or both)" (http://en.wikipedia.org/wiki/Material\_conditional).

weakening rules that allow for the introduction of arbitrary formulae on the right or left side of the *sequents*.

A notable feature of relevance logics is that they are *paraconsistent logics*: the existence of a contradiction will not cause "*explosion*". This follows from the fact that a conditional with a contradictory antecedent that does not share any propositional or predicate letters with the consequent cannot be true (or derivable).

#### Edwin Mares (2006) explains:

Relevant logicians point out that what is wrong with some of the paradoxes (and fallacies) is that is that the antecedents and consequents (or premises and conclusions) are on completely different topics. The notion of a topic, however, would seem not to be something that a logician should be interested in — it has to do with the content, not the form, of a sentence or inference. But there is a formal principle that relevant logicians apply to force theorems and inferences to "stay on topic". This is the *variable sharing principle*. The variable sharing principle says that no formula of the form  $A \rightarrow B$  can be proven in a relevance logic if A and B do not have at least one propositional variable (sometimes called a proposition letter) in common and that no inference can be shown valid if the premises and conclusion do not share at least one propositional variable.

At this point some confusion is natural about what relevant logicians have attempted to do. The variable sharing principle is only a necessary condition that a logic must have to count as a relevance logic. It is not sufficient. Moreover, this principle does not give us a criterion that eliminates all of the paradoxes and fallacies. Some remain paradoxical or fallacious even though they satisfy variable sharing. As we shall see, however, relevant logic does provide us with a relevant notion of proof in terms of the real use of premises [...], but it does not by itself tell us what counts as a true (and relevant) implication. It is only when the formal theory is put together with a philosophical interpretation that it can do this [...].

That is to say, when one deals with semantics. Concerning the semantics of *relevance logic*<sup>95</sup>:

Relevance logic is, in syntactical terms, a substructural logic because it is obtained from classical logic by removing some of its structural rules (e.g. explicitly of some sequent calculus<sup>96</sup> or implicitly by "tagging" inferences of a natural deduction system). It is sometimes referred to as a modal logic because it can be characterized as a class of formulas valid over a class of *Kripke (relational) frames.*<sup>97</sup> In Kripke semantics for relevant logic, the implication operator is a binary modal operator, and negation is usually taken to be a unary modal operator. As such, the accessibility relation governing the operator is ternary rather than the usual binary ones that govern unary modal operators often read as "necessarily".

A Kripke frame F for a propositional relevance language is a triple  $(W,R,^*)$  where W is a set of indices (or points or worlds), R is a ternary accessibility relation between indices, and \* is a unary function taking indices to indices. A model M for the language is an ordered pair (F,V) where F is a frame and V is a valuation function mapping sets of worlds (propositions)

a tool for studying natural deduction in first-order logic (in classical and intuitionistic versions, respectively)" (http://en.wikipedia.org/wiki/Sequent\_calculus).

<sup>&</sup>lt;sup>95</sup> Also this quotation is from http://en.wikipedia.org/wiki/Relevance\_logic

<sup>&</sup>lt;sup>96</sup> See note **94**.

<sup>&</sup>lt;sup>97</sup> See http://en.wikipedia.org/wiki/Kripke\_semantics

to propositional letters. Let M be a model and a,b,c indices from  $M. \ \mbox{An implication}$  is defined

$$M, a \models \phi \rightarrow \psi \iff \forall b, c((Rabc \land M, b \models \phi) \Rightarrow M, c \models \psi)$$

Negation (i.e.,  $\neg$ ) is defined

$$M, a \models \neg \phi \iff M, a^* \not\models \phi$$

One obtains various relevance logics by placing appropriate restrictions on R and on \*.

Bear in mind that the symbol  $\vDash$  stands for *consequence*, whereas if the symbol is  $\nvDash$  (that is  $\vDash$  with a slash overprinted on it) the sense is "not a logical consequence". The symbol  $\Rightarrow$  stands for "entails". The symbol  $\Leftarrow$  stands for "is entailed by"; both are combined in the symbol  $\Leftrightarrow$  The symbol  $\rightarrow$  stands for "implies". The symbol  $\land$  stands for "and"; sometimes the symbol & is used equivalently. The symbol  $\forall$  stands for "for all". The prefix  $\neg$  (sometimes the symbol  $\sim$  is found equivalently) negates the proposition whose symbol it precedes.

Edwin Mares (2006) explains, concerning the semantics of relevance logic:

Like the semantics of modal logic, the semantics of relevance logic relativises truth of formulae to worlds. But Routley and Meyer<sup>98</sup> go modal logic one better and use a three-place relation on worlds. This allows there to be worlds at which  $q \rightarrow q$  fails and that in turn allows worlds at which  $p \rightarrow (q \rightarrow q)$  fails. Their truth condition for  $\rightarrow$  on this semantics is the following:

 $A \rightarrow B$  is true at a world *a* if and only if for all worlds *b* and *c* such that *Rabc* (*R* is the accessibility relation) either *A* is false at *b* or *B* is true at *c*.

For people new to the field it takes some time to get used to this truth condition. But with a little work it can be seen to be just a generalisation of Kripke's truth condition for strict implication (just set b = c).

[...] One interpretation of the ternary relation [...] is suggested in Jon Barwise (1993) and developed in Restall (1996). On this view, worlds are taken to be information-theoretic "sites" and "channels". A site is a context in which information is received and a channel is a conduit through which information is transferred. Thus, for example, when the BBC news appears on the television in my living room, we can consider the living room to be a site and the wires, satellites, and so on, that connect my television to the studio in London to be a channel. Using channel theory to interpret the Routley-Meyer semantics, we take Rabc to mean that a is an information-theoretic channel between sites b and c. Thus, we take  $A \rightarrow B$  to be true at a if and only if, whenever a connects a site b at which A obtains to a site c, B obtains at c.

There are other interpretations as well. Mares himself proposed two interpretations, one in Mares (1997), and the other one in Mares (2004). He explains them informally in Mares (2006).

<sup>&</sup>lt;sup>98</sup> See Routley, Meyer, Plumwood, and Brady (1983), whose second volume is Brady (2003).

#### 4.6.3.2 Any Potential for Application in Automated Tools for Law?

Applications of relevance logic have been devised within mathematics, such as a Peano arithmetic developed by Meyer (Meyer & Friedman, 1992). Relevance logic is also at the basis of some *deontic logics* (i.e., logics of obligation and permissibility) developed by Anderson (1967), Mares (1992), and Goble (1999). Wansing (2002) developed and applied an *epistemic relevant logic. Epistemic logic* is about knowledge. Besides, in theoretical computer science there exists a variation on relevance logic called *linear logics*, introduced by Jean-Yves Girard, and being a logic of *computational resources*.

It may be that eventually, *relevance* as intended in jurisprudence could be modelled by means of relevance logic, but this would require a huge effort, and would not be understood other than by logicians. It may be however that this could form the basis of some software tool. The problem would then arise of convincing the legal scholars that neither the logical model, nor the software are faulty, and that quite important nuances are not merely hidden by the mathematics as embodied in the software. This in turn would call for the automated *generation of explanations* in the form of natural-language argumentation.

Separate generation of explanations is conceivable, and not unfeasible. Arguably, this is the way to go in future relevance-logic software for legal applications. With no relation to either legal relevance, or relevance logic, something rather similar was done in Andrew Stranieri and John Zeleznikow's *Split Up* knowledge-based system for assisting in negotiations concerning marital split of assets when spouses divorce. (Split Up will be used as an example again and again in Stranieri and Zeleznikow's subsections at the end of Section 6.1 in this book.) The inference in *Split Up* resorts to neural networks, but neural networks are notoriously opaque, rather than transparent, when it comes to onlookers trying to make sense of how they reach their conclusions. Therefore, within the *Split Up* architecture, a separate module generating explanations was provided, whose inference technique is not neural (see, e.g., Stranieri, Zeleznikow, Gawler, and Lewis, 1999).

It must be said however that arguably there is no really compelling reason to use relevance logic, rather than other kinds of logic, if one is to develop logic-based software concerned with legal relevance. For practical purposes of capturing some common-sense propositions or rules, the syntactic constraint on relevance, in relevance logic, is both excessive and therefore cumbersome, and inadequate. It is excessive and cumbersome, because it prevents straightforward expression of coincidences (possibly an expression upstream of formulating a hypothesis which would attempt to conceive of causality), or of correlation or even direct causality, if correlation<sup>99</sup> or a causal relation is kept implicit because people are supposed to be aware of it.

<sup>&</sup>lt;sup>99</sup> If *A* causes *B* and *A* causes *C*, then *B* and *C* are *correlated*. By contrast, *A* and *B* are *related*, and *A* and *C* are *related*. See, e.g., Papineau's (1991) 'Correlations and Causes'.

In order to satisfy the syntactic constraint on there being shared, between the premises and the conclusion, atomic formulae if we are concerned with a propositional calculus, or variables or constants, if we are concerned with a predicate calculus, one can resort to tricks. Consider, for example, trying to express the concomitance of high tides and full moon, if we don't want to also make explicit the causal relation of the moon's force of gravity attracting the earth's vast expanses of water. One way to overcome the syntactic constraint would be to perfunctorily have observers appear in both the premises and the conclusion: if the place is such that there is some time when tides can be observed, then when one can observe (if view is unimpeded) a full moon, then one can also observe (if view is not obstacled) a higher tide with respect to the range of tide levels by which the given place is affected over time. At any rate, by syntax alone relevance logic can conceivably be fooled into accepting things that by common sense are not relevant. Moreover, as its criterion of relevance is syntactic, relevance logic may come across as too dumb for admitting as relevant some such things that we know to be relevant.<sup>100</sup>

One must say however that background information we don't want to provide in full every time, can be included among the premises, as simply a symbol for a proposition encompassing that information. Arguably future practical software systems using relevance logic, if they are to be achieved, would have to be able to access repositories of common sense, of encyclopedic knowledge, and of substantive and procedural law represented by means of some logical formalism. *Ontologies* are likely to play an important part. Sections 6.1.7.3, 6.1.7.4, and 6.1.7.5 in this book are concerned with ontologies.

<sup>&</sup>lt;sup>100</sup> Hidden relevance is sometimes the key in a joke. For example, Richard Whitely (1993) tells a joke about a visitor passing in the countryside. The visitor stops and asks a farmer for the time. Crouching down beside a cow in the pasture, the farmer lifts her udder, and tells his interlocutor that it's ten to one. Astounded, the visitor asks him: "How can you tell time by feeling a cow's udder?" The farmer explains that by lifting up the udder, one can see the church clock across the valley. Clearly, here presentation matters, as the punchline (revealing that lifting the udder is relevant indeed) comes at the end of the narration. Lifting the cow's udder is relevant in the given context, because it was an obstacle to seeing the clock. The visitor is astonished because his expectation is violated, that it cannot possibly be relevant, for telling the time, that a person would feel a cow's udder. The general rule that if you feel a cow's udder, you become able to tell the time, is a false rule, because the premise and the conclusion are not relevant to each other. It is only in the given context – namely, that the cow's udder, as being an opaque object, cannot be looked through, and that behind it, in a straight line, the clock would be visible were it not for the obstacle – that lifting the udder is quite relevant for being able to tell the time.

# Chapter 5 The Narrative Dimension

### 5.1 Legal Narratives

### 5.1.1 Overall Narrative Plausibility: Preliminaries

Adam Gearey's entry on 'Law and narrative' in a splendid encyclopedia of narrative theory (Gearey, 2005), following the entry introduction has sections entitled 'Narrative and adjudication', 'Law and literature', 'Narrative, philosophy and jurisprudence', and 'Law, narrative, and identity'. Section 'Narrative and adjudication' points out (Gearey, 2005, pp. 271–272):

The work of Bernard Jackson (1988 [our 1988a]) provides a theoretically developed account of narrative in the area of adjudication. Jackson argues that narrative is an essential part of legal decision making, picking up and developing themes within schools of both positivist and realist jurisprudence. The theoretical suppositions underlying this work return to the structuralist semiotics of A.J. Greimas, which, in turn relies on the notion of a 'semio-narrative' level in the work of Vladimir Propp [... See Propp (1928)]. Narrative is understood as a sequence that moves from the setting of goals, the performance of those goals, and the reflection on success or failure [...]. Within this sequence there will be figures who aid or obstruct the subject [...].

[...] Because analysis of the processes in a courtroom is complex, it is necessary to take an exemplary aspect: witness testimony. Testimony in court can be modelled in Greimasian terms. Imagine that the plaintiff has called a witness. The witness has a helper in the form of counsel for the plaintiff. The witness also has an opponent: counsel for the defence. [...] Jackson is drawing attention to basic positions that can be occupied by different actors as a narrative develops about the case in the courtroom [...].

"[L]awyers generally recognize the importance of stories in fact finding. Legal philosophers have argued that narrative coherence contributes to justification both of factual conclusions and choice and interpretation of legal rules" (MacCrimmon, 1989, p. 463), while she herself "focus[es] on the relationship between narrative coherence and factual conclusions. Two legal scholars who have addressed the problem and attempted to provide concrete examples are Karl Llewellyn<sup>1</sup> and Neil

<sup>&</sup>lt;sup>1</sup> Karl N. Llewellyn (1893–1962) was professor at the University of Chicago Law School. His work focused mostly on the topic of legal realism. Llewellyn (1962, repr. 2008) is a compilation of his writings from the 1930s through the 1950s.

MacCormick [(MacCormick, 1980)]" (ibid.), and for this MacCrimmon also cites Jackson (1988a). Maley and Fahey (1991) discussed the construction of reality in court by means of the manner in which the evidence is presented. There is also a different disciplinary perspective: in the journal *Poetics*, Kurzon published 'How Lawyers Tell Their Tales' (Kurzon, 1985).

"Taking their inspiration from frame analysis in sociology, Bennett and Feldman [(1981)] sought to test a hypothesis derived from their observations of jury trials, combined with discussions with participants. Their hypothesis was that the construction of truth within the courtroom was primarily a matter of the *overall* narrative plausibility of the story told. They argued that it was not the weighing of individual elements in the story, each in terms of the evidence for that element, which rendered a case persuasive or not, but rather the plausibility of the story structure taken as a whole" (Jackson, 1996, p. 19). "In the end, it is the fit of the symbolised element into the larger structure, and not the pure documentation for the element itself, that dictates final judgment" (Bennett & Feldman, 1981, p. 113). They "presented an account of narrative structure in terms of settings, concerns, central action, and resolution", again in the words of Jackson (1996, p. 19), who also explained:

The setting usually includes the time, the place, and some of the characters. The concern is an action that, given the setting, creates a climactic (eventful, ironical, suspenseful) situation. For example, if someone is rock-climbing [...] and slips and falls, slipping and falling are the concern. If the story ended at this point, the audience would be left wondering: what happened to the climber? Was he hurt or killed? A complete story will provide an answer to these questions. This stage is the resolution. The central action is the structural element that creates the central question the story must resolve. The resolution normally resolves both the predicament created by the problem and the questions the listeners might have had about the outcome

- e.g., that "the climber was taken to the hospital for treatment" (Bennett & Feldman, 1981, p. 20).

However, plausibility to the jury is not merely a matter of intelligibility of the discourse as a (well-structured) story: it is a matter also of comparison with known substantive narrative typifications of behaviour. Every society [..] has its own stock of substantive narratives, which represent typical human behaviour patterns [...] (Jackson, 1996, p. 20).

Bernard Jackson, a legal semiologist, distinguishes between the semantics of the story, and its pragmatics. "Many trial lawyers would argue that plausibility turns not only on the content of that which is told, but also on the manner of telling it" (p. 20).

# 5.1.2 Approaches to Narratives from the "New Evidence Scholarship"

In the early 1980s, there was among scholars much interest in the nature of juridical proof. Bennett and Feldman (1981) brought stories/scripts à *la* Rumelhart (1980a, 1980b) to people's attention within legal scholarship, and Pennington and Hastie (1986, 1988, 1992, 1993) produced some empiricism as to how jurors reason consistent with the Rumelhart approach. However neither had a conceptualisation of

not guilty or not liable. In addition, the dominant view was that some form of conventional probability underlay the structure.

In his scholarly output from that period, Ron Allen's answered the first question by demonstrating that it wasn't one but two stories that mattered. Secondly, he showed that the appraisal of those stories had to be ordinal, not cardinal (thus, in terms of *relative* plausibility). Implicit in this (see, e.g., the discussion of scripts, and so on) was the theory of evidence that a 1994 paper by Allen made explicit.

In the context of that debate, the *theory of anchored narratives* of Wagenaar, et al.  $(1993)^2$  made its appearance. The anchored narratives approach (sometimes informally referred to as *AN* for short) built on the prior work mentioned earlier, but it has a conceptual limit: there is no rule of decision, nothing that says when a narrative is good enough for either a civil or criminal case. It has the same conceptual limit that Pennington and Hastie's approach<sup>3</sup> has, which is there is no operationalisation of 'not guilty' or 'not liable'.<sup>4</sup> For example, Ron Allen offered that critique, amid those legal scholars who offered a critical response to the theory of anchored narratives.

The central idea of the theory of anchored narratives is that juridical proof is organised around plausible narratives where "plausibility" is determined by the relationship between the story offered at trial and the background knowledge/common sense of the decision maker. In Allen's opinion, this conflates two separate issues: the macro structure of proof, and the micro analysis of evidence, but nonetheless it is more or less accurate. These two themes – the *macro structure of proof*, and the *micro analysis of evidence –* were precisely the themes of earlier work by Allen himself.

For example, in a paper entitled 'The nature of juridical proof', Allen had claimed (Allen, 1991): "The central question is often whether a richly textured human episode occurred at trial, and if so, its nature. Answering these questions requires finding an interpretation that best explains a complex set of interrelated data" (ibid., p. 393). "Indeed, often the 'facts' are indistinguishable from the interpretation" (Allen, 1991, p. 395). Allen (1991, p. 396), throughout a section that as per its title, deals with "the Tension Between the Official Epistemology and Juror Reasoning", discussed the earlier work by Bennett and Feldman (1981) and Pennington and Hastie (See note 3). Then in Allen (1991, p. 406), section 3, 'The Equally Well Specified Cases Proposal and its Criminal Counterpart', is essentially a generalisation of the theory that what occurs at trial is the comparison of the plausibility of the plaintiff's and defendant's cases, and in criminal cases a determination that there is a plausible story of guilt and no plausible story of innocence. Plausibility, in turn, is determined, as Allen (1991, section 2) argues, by references to the background knowledge/common sense of the decision maker. This approach by Allen

 $<sup>^2</sup>$  See also Wagenaar (1996) and van Koppen (1995, pp. 593–604). The theory of anchored narratives of Wagenaar, et al. (1993) was discussed by Verheij (2000) in the context of a work on dialectical argumentation for courtroom decision-making.

<sup>&</sup>lt;sup>3</sup> Pennington and Hastie (1986, 1988, 1992, 1993).

<sup>&</sup>lt;sup>4</sup> 'Not guilty' belongs to criminal cases, whereas 'not liable' belongs to civil cases.

quite resembles (and anticipates) the anchored narratives approach, with one exception: AN has no operationalisation of 'not guilty', whereas Allen's theory does. Ron Allen's first article discussing this was Allen (1986).

Allen (1986) was an early effort to give a normative account of juridical proof that involved stories. It apparently was the paper, or one of the papers, that inspired the label "the new evidence scholarship". Allen (1991, 1994, 1997) announced a new research program in the nature of juridical proof that was exploring the limits of formal reasoning and proposed as a solution a version of a story model. This research program has stimulated a large literature especially in the United States.

The central thesis of Allen (1991) was summarised in Allen's paper 'Explanationism All the Way Down' (2008a, p. 325) as follows: "A more promising approach to understanding juridical proof is that it is a form of inference to the best explanation.<sup>5</sup> Conceiving of cases as involving the relative plausibility of the parties' claims (normally provided in story or narrative form) substantially resolves all the paradoxes and difficulties [...]". In Allen (2008b), the relationship between juridical proof and *inference to the best explanation (IBE*) was thoroughly examined.<sup>6</sup> Allen claimed (2008a, p. 325) that, if one accepts to conceive of cases as involving the *relative plausibility* of the parties' claims,

the complexity problem is purely a function of the choices made by the parties. Indeed, this points out a subtle but important clarification of the role of the parties. They are sometimes thought of as ambiguity generators, but in reality they are ambiguity discarders. Rather than litigate on an infinite number of ways in which the universe might have been, they focus on a few and ask fact finders to decide which is the most plausible.

"In criminal cases, this amounts to determining whether there is a plausible story of guilt, and if so, in addition a plausible story of innocence" (Allen, 2008a, p. 328, note 3). Allen continued (2008a, pp. 325–326):

To be sure, "plausible" may mean "more likely" but this does not mean comparative plausibility reduces to probability. Rather, what is "plausible" is a function of the explanation, its coherence, consistency, coverage, consilience, and how it fits into the background knowledge possessed by the fact finder.

This also affects the *relevance*, and therefore the admissibility of evidence in court. "Explanationism is not just the best explanation of the macro structure of proof; it is also the best explanation of such issues as relevance and weight of the evidence" (Allen, 2008a, p. 326).<sup>7</sup> In the explanationist account, relevance and the weight of evidence are conceived as follows (Allen, 2008a, p. 327):

<sup>&</sup>lt;sup>5</sup> Concerning inference to the best explanation, see Section 2.2.1.6 above.

<sup>&</sup>lt;sup>6</sup> Also see Allen (1994, 1997, 2003), and Allen and Pardo (2007a, 2007b).

<sup>&</sup>lt;sup>7</sup> In his critique of Bayesianism for legal proof, Allen claims, concerning relevance and weight of the evidence, that (2008a, pp. 326–327) "it is difficult to see how to give a sensible probabilistic interpretation to such matters. A likelihood ratio explanation of both has superficial plausibility, but immediately runs aground of the universal lack of objective relative frequencies. The explanationist account is by contrast quite straightforward."

#### 5.1 Legal Narratives

Evidence is relevant if it fits into an explanatory account, and its weight is a function of its significance for that explanatory account as compared to whatever other accounts may be under consideration. In one sense, the most critical limitation of the conventional probabilistic account of the evidentiary process is their modelling juridical proof as involving the probability of the hypothesis given the evidence. A more plausible account that is more consistent with the evidence I have discussed is that juridical proof involves the probability of the hypotheses formulated by the parties, with the best, more or less, explanatory account winning out (Allen & Pardo, 2008).

There are some philosophical worries that emerge from this account. For example, it is fair that what I have described is not exactly what the philosophers refer to as inference to the best explanation, at least not in criminal cases, where the critical issue is whether there is a plausible story of innocence rather than whether it is the best. Fair enough, but the central point is the explanation-based nature of juridical proof. What is most plausible is another worry, for which I simply recur to common sense. This will not satisfy the philosophical worries (Lipton, 2004),<sup>8</sup> but another reminder that my aim is understanding, not conceptual purity, may be in order here. A similar comment is in order with regard to what an explanation is.

Against these worries are obvious advantages of the explanatory account. It explains how cases distribute uncertainty and ambiguity over the parties, supporting the system's norms. It has the fundamental virtue of being consistent with the way people actually reason rather than imposing an odd and alien form of thinking. Indeed, this is surely why it is quite consistent with the great bulk of evidentiary regulation (which is mostly nonregulation). And it captures the role of the parties, which is to determine the range of ambiguity and uncertainty over which to dispute.

In the theory of anchored narratives of Wagenaar et al. (1993), narrative (e.g., the prosecution's claim that John murdered his wife) is related to evidence (e.g., John's fingerprints on the murder weapon) by a connection that must be satisfactory for the narrative to hold once the evidence is accepted. To say it with Bex, et al. (2007, section 2.1), anchored narratives theory

stresses that the only viable way in which crime investigation and judicial proof can proceed is by constructing alternative stories about what happened in a case, by comparing their quality as stories, and by comparing how well they are "anchored" in commonsense generalisations. A story can be anchored in two ways.1 The first is *internal anchoring*. Stories at least contain a sequence of events on a time line and stories become stronger if the connections between the events it contains are not just temporal but also causal (for example, shooting a gun causes a sound) or intentional (a man possessing a gun who is assaulted will shoot the attacker). The second type of anchoring is *external anchoring*: elements of a story can be anchored in the available evidence by sources of information, such as observation, memory or testimony. This also involves commonsense generalisations. For instance, a witness testimony supports a belief only by virtue of the common knowledge that witnesses usually tell the truth. Clearly, the general knowledge involved in anchoring stories can have exceptions and therefore anchors must be critically examined and refined when the facts indicate a possible exception. For instance, if two witnesses know each other, they may have influenced each other's testimonies: to discard this possibility a refined anchor may be needed, such as that if two witnesses agree but did not confer, they usually tell the truth.

Bex et al. (ibid.) pointed out that anchored narratives theory "does not give a detailed account of how stories can be connected to the available evidence", and proposed to do it better, by means of a logical model of argumentation (See Section 5.4). Bex,

<sup>&</sup>lt;sup>8</sup> See Section 2.2.1.6 above.

Prakken, and Verheij (2006) adopted the anchored narratives approach. In contrast, Bernard Jackson is critical of anchored narratives. At any rate, Jackson states (1996, p. 10):

[...] triers of fact [i.e., judges or, in some countries, the jury] reach their decisions on the basis of two judgments; first an assessment is made of the plausibility of the prosecution's account of what happened and why, and next it is considered whether this narrative account can be anchored by way of evidence to common-sense beliefs which are generally accepted as true most of the time.

For the story to be comprehensively anchored, each individual piece of evidence need be not merely plausible, but safely assumed to be certain, based on commonsense rules which are probably true. As Jackson<sup>9</sup> (1996 p. 25) in his critique of anchored narratives puts it:

In short, the form of argument is an 'enthymeme', a rhetorical version of the logical syllogism where the major premise is a claim that something is *probably* true of (all) members of a class (see [...] Goodrich, 1986, pp. 189–191, [...]). [...] Not being a logically *conclusive* argument, the anchor is thus always capable of being contested.

### 5.1.3 Background Generalisations

*Generalisations,* or *background generalisations,* or *background knowledge,* or *empirical generalisations,* are common sense rules of thumb, which apply to a given instance of a belief held concerning a pattern, and are resorted to when interpreting the evidence and reconstructing a legal narrative for argumentation in court. Whereas generalisations are pervasive in how humans make sense of narratives (and also in how computers are made to make sense of them, in automated story-understanders), in the courtroom generalisations may be a pitfall in the reasoning, and one should be alert to generalisations creeping into the reasoning. They should be questioned. Making assumptions is often unwarranted.

For the reason why common sense is referred to as *background generalisations*, consider the end of this quotation from a paper by Ron Allen (2008a, p. 322):

In finding facts, juridical fact finders are supposed to rely on the evidence produced at trial, but 'evidence' cannot be restricted to testimony, exhibits, and demeanor presented at trial. Exhibits and demeanor must be described by propositions to fit into deliberation, which is done by the fact finder. More deeply, the meaning of language, rules of logic, formations of likelihood ratios, or judgments of plausibility come from elsewhere than the 'evidence' presented at trial. The law reflects this in the explicit jury instructions<sup>10</sup> to rely on common sense, which means one's background, and to deliberate, which means share one's background.

<sup>&</sup>lt;sup>9</sup> Bernard Jackson has discussed legal narratives in, e.g., Jackson (1988a, 1988b).

<sup>&</sup>lt;sup>10</sup> *Jury instructions*, which jurors are given by the judge before they retire to deliberate, may have an important impact on the outcome, according to how they are formulated. For example, a team including the legal evidence scholar Craig Callen as well as Irwin Horowitz reported (Kerr, Boster, Callen, Braz, O'Brien and Horowitz 2008) about a jury simulation study. Previous research had shown "that evidence that was emotionally biasing for jurors (specifically, irrelevant information

Allen also pointed out the relation between making sense of a legal narrative and assessing plausibility, and jurors' own life experience, when they use common sense. Allen did so while referring to the instructions that juries receive from the judge (Allen, 2008a, p. 326): "Jury instructions further embed a comparative plausibility approach through instructions to rely on 'common sense'. This in essence means judge the stories you are hearing by comparison to what you have learned in your life."

Admitting that one's common sense comes from one's background is nevertheless fraught sometimes with controversy. Consider, in philosophy, Linda Martín Alcoff's defence of the U.S. Supreme Court new appointee Sonia Sotomayor (a woman of Puerto Rican background), in the aftermath of a national debate in June and July 2009 because of a speech, 'A Latina judge's voice', that Sotomayor had delivered in 2001 to the University of California Berkeley Law School (Sotomayor, 2002).

Alcoff (2010, p. 123) stated: "I would point out that the media and political controversy over Sotomayor's Berkeley speech was conducted through a repetition of just one sentence, that a 'wise Latina woman with the richness of her experiences would more often than not reach a better conclusion than a white male who hasn't lived that life."<sup>11</sup> By contrast, Alcoff continued, "The epistemological arguments she used to amplify, support, and qualify this claim – arguments that are widely held, even a kind of common sense - these arguments were not repeated or even aired at all, making her conclusion look more questionable and possibly based on a kind of identity essentialism. For these remarks, readers will no doubt recall, Sonia Sotomayor was vilified from coast to coast, [...]" (Alcoff, 2010, pp. 123–124). "She was also referred to, in the mainstream news outlets, as a schoolmarm, a broad, a hispanic chick lady, and a bully. Rush Limbaugh announced that he was going to send her a vacuum cleaner so she could clean up after the Supreme Court meetings. There was so much controversy that, in the actual confirmation hearings themselves, Sotomayor reneged on her Berkeley speech and repudiated her earlier views" (ibid., p. 124). Alcoff explained: "Sotomayor's claim that identity makes a difference to

about the character of a crime victim) exerted a stronger effect on juror judgment if those jurors had received instructions that explicitly endorsed jurors' ability to nullify rather than standard instructions – what one might call the 'amplification effect' of the nullification instructions." (Kerr et al., 2008, from the abstract). In their own study, Kerr et al. (2008) employed the same *nullification instructions* that had been used in the previous study, with one in addition: "one that explicitly cautioned mock jurors not to confuse the emotions aroused by the potential unfairness applying the law with similar emotions aroused by biasing information (the 'null plus' instructions). The null-plus instruction did not negate the amplification effect of the nullification instructions. Unexpectedly, mock jurors who received nullification or null plus instructions were more likely to convict the killer of an unsympathetic victim than of a sympathetic one, but those who received standard instructions were not sensitive to biasing victim information" (ibid., from the abstract).

<sup>&</sup>lt;sup>11</sup> Biography and background do influence, in given context, a judge's leanings and performance. This is apparent from published biographies. Consider, e.g., Jacqueline McLeod's study (2011) of the life of Judge Jane Bolin, who on being appointed to New York City's domestic relations court in 1939 for the first of four ten-year terms, became the United States' first African American woman judge.

judgment is based on the idea that identity affects baseline knowledge as well as motivations, the direction of our attentiveness, and, most strongly, our ability in some cases to understand the experiences of others" (ibid., p. 127).<sup>12</sup>

In the media, it was pointed out that the judge was not a relative of the applicant, even though their family name was the same. It must be understood however that a British judge who is himself of Near Eastern family background (on the evidence of his family name) could not have been expected to be sympathetic to a grossly outdated governmental policy based on race, and still being held by the governmental respondent at that trial in the mid 2000s, so that a woman born a Briton but whose ancestry was not from the British Isles would be excluded from the rights of a British citizen. It is quite possible that at the ministry of Defence they had noticed that the appellant and the judge had the same family name, and that the judge's ethnic background was likely to make him unsympathetic to their line of defence, but they nevertheless went along with it, without daring however to request that that judge be excused from the case on the grounds of his own racial identity, *ex legitima suspicione*. The sum the old lady eventually won, which could have been the one year's salary of a poorly paid secretary, was presumably considerably less than the government spent in order to prepare the case and defend the indefensible.

There is much more that could be said. The horrid raise in hostility, and even offences, sometimes spectacular, whether reported or not, experienced by some Jews and especially Israelis in Britain during the 2000s – as well as, repeatedly, unsavoury episodes within the institutions – would be perceived, assessed, and interpreted differently if you assume that the U.K. wartime record was spotless, and that whatever anti-Semitism was around has been taken care of in the meantime, or if you know instead that in 1941 in Baghdad, in 1945 and 1948 in Libya, in 1947 in Aden, and in 1948 during the evacuation of civilians from the university and hospital from the besieged Mt. Scopus in Jerusalem, the British military, while present, were on orders not to intervene as Jewish civilians were being massacred massively. (It is a sad phenomenon, known all too well in the decolonised world, that things that would not occur in a colonial power's metropolis are let to occur in colonial space. But they amplify attitudes incubating in the metropolis.) If you are the child of a survivor of such a massacre (I am), you are likely to know, and even to think of it often, as do the survivors themselves. (The very final version of this book is submitted exactly seventy years after the massacre relevant to the family, and the sentiments that enabled it being watched on the spot and not prevented, let alone perpetrated, are still around, even sometimes in positions of responsibility.) If you come across attitudes, perhaps concerning a former colonial space that still retains a perhaps morbid attention among some in the metropolis, that dovetail with what you know did happen in living memory, you may make inferences that the unaware would not. Unaware does not mean unaffected: a zoologist may know something about an animal that the animal observed while carrying out a given behaviour perhaps has never thought about.

<sup>&</sup>lt;sup>12</sup> One may add that sometimes, dominant identity comes with innocent unawareness of complex patterns, or even historical facts that loom quite large in how a non-dominant group may feel, and explaining which may require exceptional articulacy of a litigant, or alternatively a considerably larger financial investment in one's counsel for the counsel to convey an articulate argument which ultimately may even not be considered relevant by the court. Whereas the court's decision concerning relevance is discretionary, it is also affected by the doxa that the judges have been fed since infancy, and whose inaccuracy, even with all good will, they may not figure out unless lectured about with the support of scholarly evidence. During the 2000s, an old Jewish lady in London won a case against a respondent that actually was the U.K. government, and specifically subordinates of the Secretary of Defence. She was born into a wealthy family of Iraqi extraction and with British citizenship in Hong Kong, and as an adolescent civilian captive under the Japanese occupation, she was turned into a sex slave by the enemy. It took that trial for her to be recognised an indemnification, which by policy, other things being equal, would have been given by the British authorities to British citizenship.

Factors involved in deliberation were appropriately invoked in Alcoff's discussion (2010, p. 127): "I want to introduce some epistemic concepts from market research and from research in social psychology that are highly relevant here. The

Nevertheless, as facts such as the crimes against humanity mentioned earlier are unknown to the public in the metropolis of the former colonial power, including the judiciary, it is as though those aware (and possibly still affected by survivor or survivor's children syndrome) and the unaware (including current promoters of intolerance, or the many more who tolerate this, usually to avoid antagonising the firebrands) live in different universes. With reference to the unapologetic persistence or resurgence and spread of such levels of hostility (now clad as a virtue) in the given society, once in the early 2000s (during a major upsurge of hostility) I told a retired British judge who happens to be Jewish that having or not having lost a world war can make all the difference to what is affordable in this society. He immediately looked behind him, visibly scared, even though nobody could overhear us. Let alone that this was inside a Jewish communal building. Arguably, this is not a kind of criticism he would have dared think is even conceivable in Britain. This in turn is sad, at the societal level, as the ability to be candid implies that there is trust between the parties, whereas unfeasibility disproves full integration. By contrast, in Italy, where I was raised, I and others could say things in the spirit of what I had said, and sometimes even be listened to (and even get very positive responses from some), precisely because a world war was lost, and because therefore knowledge of unsavoury facts from the nation's past is partly known to the local educated public, and unawareness of the rest is decreasingly withheld (cf. Nissan, 2008 [2010], 2011b, 2011c).

In the U.K., even though of course most people are good people (most people want to play by the rules), being as candid is simply not feasible, for historical allegations such as what I pointed out (but see below), even though part of them are buried inside scholarly literature for specialists published in the U.K. The unfeasibility of going public with that for the purposes of a public debate also concerning present attitudes depends on such things being so alien to the doxa: saying something so unlike what people are used to hear is shocking, coming out of the blue. You can tell individuals in private, and it is painful for both parties albeit well received once it is done but there can be no public or formal acknowledgement that there is something that should be owned up to at the societal level, and that it has explanatory power for some current phenomena, some of them resulting in the law of the land being honoured in the breach.

Interestingly, this is an observation which, I found, members of the visible minorities in London find easy to relate to, because of analogues from their own respective communal experiences, which produces a *blasé*, condescendent, as well as emotionally deeply experienced attitudes towards wider local society, and especially and pointedly "formal" society. Actually such minority perspectives are potentially useful for a society bent on improving. Their being silent or silenced instead questions aspirational claims. This footnote is unlikely not to be resented, apart from its being awkward by conventions. This in turn is quite useful here, as it says something important in favour of Sotomayor's 2001 argument that because of experiences associated with her background, she but not her colleague is in some circumstances likely to spot something complex right away, of course with the duty to assess properly what suggested by intuitions that come under the rubric of background generalisations.

A bulky study by Anthony Julius (2010) on anti-Jewish prejudice in England from the Middle Ages to the present is invaluable, but too intellectual, and too focussed on textual analysis, therefore missing part of the phenomenon, the one that impinges most on people's lives. He also missed events in colonial space (an important exception being his tackling the heavily prejudiced subculture of the British administration in Palestine, which for example resulted in a British judge insulting a crowd in the courthouse, esplicitly because of their ethnoreligious identity.) All in all, Julius' book did not make an impact. In the information media, it was mentioned frivolously, in relation to the late Princess Diana (in the introduction, Julius, who had been her lawyer, related an anecdote). When (seldom) his book *was* discussed substantively, this was done superficially, and his claims were rejected out of hand (unsuprisingly, as in England the phenomenon studied tends

first concept is 'thin-slicing' – the idea of rapid judgments that short-circuit the normal time requirements of rational deliberation by filtering a small number of relevant factors from a large number of variables." Concerning snap judgement, Alcoff cited Gladwell (2005): "Malcolm Gladwell's book, *Blink*, provides numerous examples of accurate thin-slicing, from art dealers who correctly judge the authenticity or lack thereof of artworks; to marriage therapists who can judge the likely future of a marriage with 90% accuracy after simply watching a short video of the couple in conversation; to bird identification, medical diagnoses, and tastetesting" (Alcoff, 2010, p. 128). Alcoff pointed out that thin-slicing is, on the one hand, thoroughly involved in social and racial prejudices and stereotypes,<sup>13</sup> as well as, on the other hand, in judgments<sup>14</sup> that eventually turn out to have been accurate: "But we are inundated more than ever with a visual culture that confers associations between human 'types' and visible social categories. This renders the retraining of thin-slicing based on phenomenologies of appearance rather more difficult than

On the other hand, it is dubious that the perceived effect of the 18 May 2011 speech would have been so momentous, had the speech been given by an elected politician (the public tends to consider these cynically), other than somebody very revered, which in some countries is sometimes the case of a particular figurehead president with special qualities, either perceived or real. Moreover, going back to the Sotomayor controversy, it even happens sometimes that public acknowledgement is then used in order to deny that factors such as those mentioned by Sotomayor are still a reality. Some other times, a possibly little known document signed by a prime minister (such as the European Union's statement defining anti-semitism signed by Gordon Brown, though basically ornamental and only reported about in the communal rather than general information media), or released by a parliamentary committee (such as the bipartisan committee on anti-semitism at the British Parliament), can potentially be valuable as supporting evidence for an acknowledged state of affairs, in a courtroom context. This however contributes awareness of something general and possibly vague, not as situationally specific as what Sotomayor apparently meant.

<sup>13</sup> Concerning stereotypes, see e.g. the edited volume *Stereotypes and Stereotyping* (Macrae, Stangor, & Hewstone, 1996), and for stereotypes with a particular target, e.g. Ziv and Zajdman (1993), and much of the *ouevre* of Sander Gilman (e.g., Gilman, 1975, 1982a, 1982b, 1984, 1985, 1986a, 1986b, 1991, 1993a, 1993b, 1994a, 1994b, 1995, 1996a,1996b, 1996c, 1999, and 2006).

to be compartmentalised sectorially, and traditionally the chattering classes have been affected by prejudice more than other social sectors.)

It must be said that things do not remain static in a society, as well as in mutual collective perceptions, and societal change in attitudes is sometimes acknowledged in a solemn public statement on behalf of the state, whereas some other times a statement is aspirational, and aims at bringing about such change. Sometimes it is ineffectual, some other times it may be lip-service, but sometimes it is certainly sincere. Quite clearly, the Queen of England was touchingly sincere in the landmark speech she gave in Ireland on 18 May 2011. It will have given many, in both countries, a sense of closure and peace of mind. This is important for a better future. (It was a first, in being made to another nation or another ethnic group. On the previous year, an apology to the child migrants was given. On 24 February 2010, there was the prime minister Gordon Brown's apology to British child migrants to Australia, severed from families that were lied to: an apology made necessary in the U.K. because Australia was apologising to these adult, still traumatised people. At any rate, it did away with the notion that the polity never owns up.)

<sup>&</sup>lt;sup>14</sup> In research in psychology, *stereotypical biases* in social decision making and memory are the subject of Bodenhausen (1988). *Illusory correlation* and stereotypes were discussed by Hamilton and Rose (1980). Hilton and Fein (1989) were concerned with the role of *diagnosticity* in stereotype-based judgments.

ever before" (Alcoff, 2010, p. 132). Undeniably, Limbaugh's vacuum cleaner jibe at Sotomayor is a case in point.

Concluding her paper, Alcoff (2010, p. 137) remarked: "If we conceptualize identities along the lines of hermeneutic horizons, this does not introduce a uniform set of interests, or point of view, or set of assumptions. We cannot assume from any candidate's or any nominee's identity that they understand that group's experience or share their politics, since horizons are neither uniform nor universally shared. Horizons are starting places, not endpoints." Next, Alcoff claimed that Sotomayor's critics misunderstood what identities are, "and how real knowing actually occurs. It seems likely that when Rush Limbaugh looked at Sonia Sotomayor, her packaging, for him, called up an image of a hotel maid. This is not a fringe phenomenon. Ignoring the effects of sensation transference and thin-slicing on the process of our judgment will only keep locked the room in which much of our judgment takes place. If identities make an epistemic difference, then using identity as one criterion is a legitimate practice in choosing whom to vote for or how to assign a jury or a court or a committee. Of course, it is quite easy to use identities as covers for retrograde policies, for Republicans to appoint war-mongering women, or for Democrats to do so. But most people can see through that. In a snap" (Alcoff, 2010, pp. 137-138).

Anchoring by *empirical generalisations* translates, for artificial intelligence practitioners, into reliance on *common-sense beliefs*. In the literature on legal evidence, Twining (1999) is concerned with generalisations in legal narratives (see also Anderson, 1999b). Bex, et al. (2003, section 4.2) discussed such generalisations in the context of a formal computational approach to legal argumentation about a criminal case, as does Prakken (2004, section 4). The latter (ibid., section 4.2) lists four manners of attacking generalisations:

- "Attacking that they are from a valid source of generalisations",
- "Attacking the defeasible derivation from the source" (e.g., arguing that a given proposition is general knowledge indeed, but that "this particular piece of general knowledge is infected by folk belief"),
- "Attacking application of the generalisation in the given circumstances" ("This can be modelled as the application of applying more specific generalisations"), and
- "Attacking the generalisation itself".

Bear in mind that even statistics is interfaced to both argumentation, and narrative. Robert P. Abelson (well-known to cognitivists and to AI people) gave a textbook the title *Statistics as Principled Argument* (Abelson, 1995). Its publisher's blurb boldly proclaims:

Many students [think] of statistical practice as a medical regimen. [...] However, a completely formulaic approach to statistics is wrong-headed. Statements of conclusions from statistical analysis importantly involve narrative and rhetoric. To communicate results, a coherent story is required and preparation is needed for the criticism of these interpretations with convincing counterarguments. There is an analogue between the claims of a statistical analyst and those of a lawyer [...]. True, in scientific inquiry resorting to statistics (as opposed to doctored statistics geared, say, to show the economic success of the Soviet regime) the goals and principles are different from those of a lawyer, who is intent to persuade and is any-thing but objective. Yet, both a lawyer and a statistician provide an interpretation purporting to be a plausible narrative. They do so by means of rhetoric.

#### 5.1.4 The Impact of Modes of Communication

It would be too reductive to consider communication in court as though textual transcription alone would suffice. Nonverbal modes, too, affect responses. This is an aspect of legal narratives and the related court narratives to which Bernard Jackson has called attention (Jackson, 1994). He "argued elsewhere that the 'story in the trial' (e.g., the murder of which the defendant is accused) is mediated through the 'story of the trial' (that collection of narrative encounters manifest in the courtroom process itself)" (Jackson, 1998a, p. 263; citing Jackson, 1988a, pp. 8 ff, 33–36, and Jackson, 1995, p. 160 and chapter 10–12 *passim*). Jackson (2010) stated:

The narrativisation of pragmatics, as developed in the semiotic tradition, prompts us to understand the speakers in the legal discourse as motivated to do more than merely persuade the audience(s) of their discourse of its correctness [(Espar & Mora, 1992)]. Each one is a subject of (communicative) action, with his own goals (personal and professional); each one, in his/her discourse(s) may perform multiple, and distinct (communicative) actions, which require separate analysis. I have suggested a distinction between the "story in the trial" and the the "story (properly: stories) of the trial" [(Jackson, 1988a)], the latter (through which alone the former is mediated) incorporating a multiplicity of exchanges, which may be directed to different audiences for different purposes.

Mertz and Yovel's (2005) is an encyclopedia entry about 'Courtroom narrative'. They begin by remarking:

Research on courtroom narrative has shed light on the intricate relationship between social structure and power, on the one hand, and linguistic patterning and use, on the other. In addition, analysis of courtroom discourse has contributed to a deeper understanding of the complex facets of narrative, examining many discursive and sociolinguistic aspects together [...].

Before reaching the courtroom, legal narratives typically undergo transformation from the less constrained format of speakers' spontaneous trouble-telling, through conversations in lawyers' offices and mediation settings, to formulation of court filings and discussions with court personnel, and finally to accounts rendered in courtrooms – ranging from more informal settings such as small claims courts through plea bargains and motions, to full-blown trials in more formal courtrooms (Conley and O'Barr 1998). The imposition of legal frames moves litigant narratives away from more emotional and relational stories toward accounts organised around theories of cause-and-effect and responsibility that respond to the requirements of legal rules [...].

One obvious constraint on narratives in formal courtrooms in many countries is the frequent framing of accounts within question–answer sequences – with the notable exceptions of the less-constrained stories told by attorneys at the beginnings and ends of trials (Atkinson and Drew, 1979). [...]

In 1998, Kim Binsted<sup>15</sup> of Sony referred me to a robotic simulation; it was work going on at ETL: "I remember they had three talking heads, supposedly representing two lawyers and a judge, arguing a case..." (pers. comm.). ETL is the Electrotechnical Laboratory, in Tsukuba, of the Agency of Industrial Science and Technology (AIST) of Japan's Ministry of International Trade and Industry. Binsted's reference was to a paper published in 1997 by Katsumi Nitta, Osamu Hasegawa and Tomoyoshi Akiba in one of the satellite workshops of IJCAI, the leading AI conference worldwide (Nitta, Hasegawa, & Akiba, 1997). It is safe to say that three talking heads simulating a mock-trial do not ostensibly qualify as a model of the pragmatics of delivery in court, the way Jackson intended such pragmatics to be.

Forensic rhetoric is a discipline, and both verbal and other modes of communication have an impact, whether positive or adverse for a given party. It even happens that a lawyer advises his or her client beforehand to avoid exchanging stares with the judge while in the courtroom. That is prudent advice, but not because such silent communication would necessarily be harmful. You do tell a toddler not to touch a knife, but this is not because anybody using a knife would always be cutting him- or herself. It is toddlers who are more likely than the rest to cut themselves. Using facial expressions may have a beneficial or an adverse impact; if used at all, they should be used knowledgeably, and a lawyer may be more knowleadgeable at that than a client.

## 5.1.5 Pitfalls to Avoid: There Is No Shortcut for the Practically Minded, and No Alternative to Reading the Legal Literature on Evidence

Lack of familiarity with the more philosophical literature on the nature of juridical proof puts such artificial intelligence scholars who may wish to model legal evidence at risk of neglecting two of the crucial variables that motivated that literature, especially "the new evidence scholarship" (Allen, 1986 sqq., and so forth), and their problematic aspects, which were and are some of the key targets of the research program set forth in Allen (1986). Thinking of evidence at trial as either probabilistic or as involving narratives is nothing new. What was new were the limits of probabilistic reasoning, which this literature addresses (our present readers are urged to read, e.g., the papers collected in Allen & Redmayne, 1997), and the relationship between stories, juridical proof, and decision under uncertainty. The former should also be noted, but the latter is crucial.

One of the problems with both the Pennington and Hastie (1986, 1988, 1992, 1993) and the Bennett and Feldman (1981) story models is neither had a conceptualization of what 'not guilty' might mean. For that matter, neither had an explanation

<sup>&</sup>lt;sup>15</sup> After earning her PhD in Edinburgh (supervised by Graeme Ritchie) with the project of an automated generator of punning verbal jokes, Kim Binsted moved to Japan, and in 1998 was organising a symposium on artificial intelligence models of humour. She later moved to the University of Hawaii.

for 'preponderance of the evidence'. The relative plausibility model that emerged from the "new evidence scholarship" research program explicitly handled that problem. Arguably, in the present large book on techniques we could not really do justice to the relative plausibility model from the legal literature, and were we to attempt to cover it, in a sense this would be a disservice to non-legal scholars who may then naïvely come to believe that they have read here everything that there is to know about the more "philosophical" things. This is definitely not the case. There is no serious substitute to accessing at least a few articles from the debate among legal scholars about matters that may make or break the seriousness and credibility of any artificial intelligence model for legal evidence.

For example, to say that proof is just something akin to inference to the best explanation<sup>16</sup> does not say when an explanation is good enough. To make a long story short, if the "best explanation" always wins at trial, then there is no difference between civil and criminal cases. But there must be, as the standards of proof<sup>17</sup> in criminal cases are far more demanding than they are in civil cases. Suppose now that the developer of an AI model would claim that his or her implemented or envisaged design could definitely handle telling out which explanations. And suppose that that same AI practitioner's solution would be to adopt any of the quantitative models available to an AI practitioner, e.g., some Bayesian model. This would elude a serious confrontation with epistemological problems which to legal scholars are of the utmost importance.

# 5.2 An Overview of Artificial Intelligence Approaches to Narratives

#### 5.2.1 What Is in a Narrative?

Narratives<sup>18</sup> do not only belong in life events, or in literature, or, for that matter, in police investigations and then in the courtroom. Narrative is pervasive. Bear in mind that even the reasoning process unfolds in a narrative way. Peter Goodrich, in an encyclopedia entry entitled 'Narrative as Argument', has remarked: "At a formal level, narrative governs argument in that arrangement, the ordering or internal progression of a discourse, depends upon a narrative structure in which a premise is elaborated, developed, proved, or refuted. Narrative as arrangement is in this sense intrinsic to logic as well as to dialectic and rhetoric" (Goodrich, 2005, p. 348). The

<sup>&</sup>lt;sup>16</sup> See Section 2.2.1.6 above.

 $<sup>^{17}</sup>$  Cf. Bex and Walton's (2010) 'Burdens and Standards of Proof for Inference to the Best Explanation'.

<sup>&</sup>lt;sup>18</sup> Nissan (2010d) is a different version of the present Section 5.2.

following quotation is from an encyclopedia entry by Marie-Laure Ryan (2005, p. 347):

Here is [a] tentative definition of the cognitive construct that narratologists call 'story':

- 1. The mental representation of story involves the construction of the mental image of a world populated with individuated agents (characters) and objects. (Spatial dimension.)
- This world must undergo not fully predictable changes of state that are caused by non-habitual physical events: either accidents ('happenings') or deliberate actions by intelligent agents. (Temporal dimension.)
- 3. In addition to being linked to physical states by causal relations, the physical events must be associated with mental states and events (goals, plans, emotions). This network of connections gives events coherence, motivation, closure, and intelligibility and turns them into a plot. (Logical, mental and formal dimension [...])

In some kinds of narrative forms, some condition is loosened. "The lifting of condition 1 describes the 'Grand Narratives' and their relatives. These constructs are not about individuated beings but about collective entities, and they display general laws rather than a concrete world to the imagination. But they retain a temporal dimension, and they provide global explanations of history" (Ryan, 2005, p. 348).

Computer scientists, when modelling the narratives of a society of embodied agents, such as a society of robots, may choose a threshold for the attribute 'non-habitual' in Condition 2. In the case of robots, reasoning about trajectories, collisions, and so forth, needs to consider also the rote scripts of habitual physical motion, but unless these interfere in what makes a given story peculiar, we can usefully disregard what is rote, and focus on what stands out as non-habitual. In virtual environments produced by information technology, what is habitual is captured by means of statements in some behaviour specification language. This makes is simpler to then feed the environment (or the cognitive agents associated with the individual characters) some specific story. In Nissan (2008b), I have actually advocated that computer scientists should be aware of the benefits of, and resort to, the results of scholarship into narratives, when developing virtual environments or even multi-robot environments. Arguably the criteria listed by Ryan (2005) are useful also when dealing with the cognitive dimension of the social actions of embodied agents as developed by computer scientists. This is true for animated characters in a virtual environment, where a variable story is enacted by interaction with the user (an interactive narrative), yet these criteria are also valid for a set of robots sharing the same spatial environment at the same time, and reasoning about each other, and acting accordingly.

### 5.2.2 A Fable Gone Awry: An Example of Story-Generation with TALE-SPIN

The fable about the fox that tricks a crow sitting on a branch into singing, and thus into releasing the cheese (or the piece of meat) it had been holding in its beak, is

well-known.<sup>19</sup> In a Persian fable it is the bird, not the fox, that tries (unsuccessfully) to trick the fox into opening its mouth. The following is taken from a book of Persian proverbs (Haïm, 1956, pp. 384–385):

[...] Why did you choose St. George  $[Jarjīs]^{20}$  from amongst all the prophets? (i.e. Of all possibilities you have chosen the least likely).

*{From the following anecdote}* 

A fox once snatched a cock and run away, holding it firmly between its teeth. On the way the cock said, "O fox, since you have made up your mind to eat me, do so at least after mentioning the name of a prophet, or other holy person, so that it may become lawful for you to eat my flesh", intending thereby to obtain an escape in the event of the fox opening his mouth. But the cunning fox only squeezed the victim with greater force, and breathed out in a dragging manner the name "Jer-jee-s" (St. George). "Alas!" said the disappointed bird, "from amongst all the prophets you have chosen Jerjees!"

*Note.* St. George, the patron saint of England, died as a martyr in the year 303 A. D. in the reign of Diocletian, and was looked upon as a (demi-)prophet by the Mohammedans.

The following story was made up automatically by TALE-SPIN, an artificial intelligence program developed at Yale University by James Meehan in the mid-1970s (Meehan, 1976). The quotation is from Meehan (1981a, p. 197; cf. 1981b):

a program that writes simple stories. It is easily distinguished from any of the "mechanical" devices one can use for writing stories, such as filling in slots in a canned frame. The goal behind the writing of TALE-SPIN was to find out what kinds of knowledge were needed in story generation.

At one point in his presentation, Meehan states (1981a, p. 219):

Here are some more rules. If you're hungry and you see some food, you'll want to eat it. If you're trying to get some food and you fail, you get sick. If you want some object, try bargaining with the object's owner. Innocuous, right?

Then Meehan quotes this sample output made up by his automated tool for storygeneration (Meehan, 1981a, pp. 219–220; the brackets are Meehan's own):

One day Henry Crow sat in his tree, holding a piece of cheese in his mouth, when up came Bill Fox. Bill saw the cheese and was hungry. [Bill has just been given the goal of satisfying hunger.] He said, "Henry, I like your singing very much. Won't you please sing for me?" Henry, flattered by this compliment, began to sing. The cheese fell to the ground. Bill Fox saw the cheese on the ground and was very hungry. [Satisfying hunger is about to be added to Bill's goals again.] He became ill. [Because satisfying hunger was already a goal of Bill's, it can't be added again. Hence, Bill fails to satisfy his hunger, so he gets sick.]<sup>21</sup> Henry Crow saw the cheese on the ground, and he became hungry, but he knew that he owned the cheese.

<sup>&</sup>lt;sup>19</sup> Aesop, Fables, clxv; Phaedrus, Fables, i.13; Apuleius, De deo Socratis; Jean de La Fontaine, Fables, i.2.

<sup>&</sup>lt;sup>20</sup> The name  $J_{\partial r j \bar{i} \bar{s}}$  (for 'George') belongs, e.g., to the onomasticon of Iraqi Nestorians.

 $<sup>^{21}</sup>$  Instead of the hungry fox having his extant goal (the goal of seeking food) reinforced on seeing the cheese on the ground, an inadequate formulation of the set of rules (i.e., the ruleset) in TALE-SPIN caused the fox to become ill, with his goal unfulfilled, and being ill – which to TALE-SPIN was incapacitating for the ill character – knocked him out of action.

#### 5.2 An Overview of Artificial Intelligence Approaches to Narratives

He felt pretty honest<sup>22</sup> with himself, so he decided not to trick himself into giving up the cheese. He wasn't trying to deceive himself, either, nor did he feel competitive with himself, but he remembered that he was also in a position of dominance over himself, so he refused to give himself the cheese. He couldn't think of a good reason why he should give himself the cheese [if he did that, he'd lose the cheese], so he offered to bring himself a worm if he'd give himself the cheese. That sounded okay, but he didn't know where any worms were. So he said to himself, "Henry, do you know where any worms are?" But of course, he didn't so he ... [And so on.]

Meehan explains how he fixed the problem with the program, that had caused it to be embroiled in such developments for the given output story: "The program eventually ran aground for other reasons. I was surprised it got as far as it did. I fixed it by adding the rule that dropping the cheese results in loss of ownership".<sup>23</sup> Even though the variant of the fable we quoted resulted from a bug in the program, it is very interesting, because it illustrates the workings of the program itself while making up a story.

#### 5.2.3 A Few Challenges

Erik Mueller has remarked (2004, p. 308) that the several story-understanding programs that have been developed "may be characterized according to their (1) breadth of coverage, (2) depth of understanding, (3) ability to handle new stories, and (4) ability to handle real-world input such as text and speech." In particular (ibid.):

Narrow coverage systems deal with stories about a particular domain or topic area such as management successions or terrorist incidents. Broad coverage systems deal with stories that span many domains. Shallow understanding systems build a superficial understanding of a story. The understanding might consist of the important events of the story and the roles of story characters in those events. Deep understanding systems build a deep understanding. This might include the trajectories of story characters through time and space, the emotions, goals, beliefs, desires, and intentions of characters, and the themes and morals of the story. Some systems handle only the particular stories they were designed to handle, and must be modified to handle new stories. Other systems can handle an unlimited number of new, previously unseen stories. While some systems require predicate-argument structures or edited text as input, others are able to cope with naturally occurring text or speech. A general story understanding system would be one with broad coverage, deep understanding, and the ability to handle new and real stories. So far, a system like this has not been built.

Computational formalisms for the analysis and generation of narratives (e.g., see Nissan, 2008f) have implications beyond the actual use of computers. That domain of research had interesting results to show as early as the late 1970s, was put on

 $<sup>^{22}</sup>$  TALE-SPIN had applied to the same character – the crow – rules for interaction and negotiation between two characters. The crow got both roles in the interaction, hence the awkward effect on the generated story.

<sup>&</sup>lt;sup>23</sup> Meehan (1981a, p. 220). Note that TALE-SPIN, in line with the Yale School of natural-language processing, does not handle stories by means of a story-grammar, but rather has the story developed through a hierarchy of characters' goals, plans to achieve them, subservient goals for the plans to succeed, secondary plans for achieving those secondary goals, and so forth.

the back burner, so to speak, in the late 1980s and in the 1990s, and since then has been resurgent. Some projects fall squarely within the concerns of folktale studies. Besides, sporadically some project would concern itself with humorous<sup>24</sup> mock-aetiological tales<sup>25</sup> (Nissan, 2002a). During the 1970s and 1980s, when

<sup>25</sup> Bear in mind that there are narrative explanations that if two adult, competent members of advanced modern Western civilisation were to tell each other, would be taken to be humorous, because we can safely assume that both of them "know better", and that therefore the communication is non-bona-fide (the utterer or writer does not believe the content of what he or she is communicating), and yet this is not a communication with the intention of deceying the recipient. But in other or earlier different contexts, even that same explanation may be intended as bonafide communication, and both the utterer and recipient would take it very seriously and believe it. This is for example the case of the early to high modern Western theories about the origins of languages and ethnicities, and this sometimes still persists, e.g. the modern myth of the supposedly late Indo-European "invasion" of Europe (Nissan, 2010b). Or then, consider culture-bound distrust of tomatoes (the early modern *pommes d'amour*) because of supposed toxicity, not just physiological but also (as a consequence) moral (Nissan, 2011e). Moreover, there may be explanations that obey poetic conventions, and the *alethic* value (i.e., truth value) of the communication may not be necessarily relevant (Nissan, 2008k). Such explanations may occur in homiletics (when not involving dogma) – such as in an ancient tale about how the Mediterranean Sea originated, in relation to how sinful early generations were (see Nissan, 2010 [2011]) - or then in the *belles lettres*. But the logic of fiction is a complex and debated issue. There are several theories of the logic of fiction. For various approaches to the logic of fiction, see Lamarque and Olsen (1994), Crittendon (1991), Walton (1990), and Woods (1974). Pollard (1997, p. 265) explains:

Unlike real things, the entities of fiction are incomplete. While the proposition that Napoleon disliked cats is in principle decidable, the proposition that Sherlock Holmes disliked cats is not. On this latter issue, Conan Doyle's texts are silent. Furthermore, according to so-called 'classical' logic, anything whatever follows what is false. If the statements of fiction are taken as false, then what may seem perfectly acceptable inferences made by readers are rendered arbitrary: it would be as reasonable to infer from Conan Doyle's novels that the moon is made of green cheese as it would to infer that Holmes was cleverer than Inspector Lestrade.

A related issue is the emotions of readers of fiction. Consider this passage from Colin Radford's (1995, pp. 73–74) restatement of the position, he critiques, of Alex Neill (1993), who replied in Neill (1995).

However, and as Neill observes, things are not so simple. For wouldn't many of us, and certainly the less sentimental readers and theatergoers, be surprised, shocked, even outraged

<sup>&</sup>lt;sup>24</sup> There exists a discipline called *computational humour* (e.g., Hulstijn & Nijholt, 1996; Stock, Strapparava, & Nijholt, 2002; Binsted, Bergen, Coulson, Nijholt, & Stock, 2006). Various scholars in artificial intelligence and computational linguistics, especially Victor Raskin (whose linguist disciple Salvatore Attardo is also prominent in the theory of humour), Graeme Ritchie (and his disciples such as Kim Binsted), Anton Nijholt, Oliviero Stock and his collaborator Carlo Strapparava, Andrew Ortony, Akira Utsumi, and myself (I am one of the editors in the field: of two journals, and of Bejamin's book series Topics in Humor Research), are active in research into humour, trying to devise computational models capturing what it is that produces humour, or then in order to capture narrower categories, such as verbal jokes, or more in particular (which is Ritchie's case: see e.g. Ritchie, 2004), punning verbal jokes. There exist international journals in humour research, namely: *HUMOR, International Journal of Humor Research* (see http://www.degruyter.de/journals/humor/detail.cfm), and the more recently established *Israeli Journal of Humor Research: An International Journal*. Both are receptive to studies in computational humour.

multi-paragraph stories were analysed by a computer program, there would be a tacit assumption about the narration being linear, even though this was not crucial to the methods employed. From the late 1990s, projects have been emerging, that make nonlinear narratives an explicit concern. Narratives may be *linear* or *nonlinear*, in presentation or content or both; see, e.g., Szilas (1999).

At the University of Paris 8, Nicolas Szilas published about interactive drama with nonlinearities (Szilas, 1999), and later on, with Jean-Hugues Rety he developed the *IDtension* project. It studies graph-based narrative structures, considering minimal structure for stories (Szilas & Rety, 2004). At MIT, Davenport and Murtaugh (1997) reported about the *ConTour* story-generation system. The basic unit in

"Charlie wants the blind flower girl to see again" would be such an example. Let's say such a claim is a *referential* claim about a fictional character. On the other hand, some claims we make about fictional characters obviously are not referential claims. "Charlie is a fictional character" is the most trivial example of this – we cannot understand this in terms of how it would be with an actual person who is a fictional character. [...] Let me then say a claim about a fictional character is a *formal claim* if (a) it is not a referential claim, and (b) aside from limiting cases like "Charlie is a fictional character", it is to be understood along such lines as the function the character is playing in the work of art or its success. [...] the seems to me that some statements about fictional characters can be given referential as well as formal readings. [...] Consider:

D: Desdemona had to meet a (sic) unhappy end.

if we found ourselves reading a version of [Tolstoy's] *Anna Karenina* in which she lives happily ever after, a play in which the actor playing Mercutio [in Shakespeare's play *Romeo and Juliet*] refuses to die, or Nahum Tate's version of *Lear*? Does this not show that we do not *really* desire that things should be other and better for the characters, or does it not show, as I have argued [(Radford, 1975)], that we have conflicting desires?

Contrast this to Francis W. Dauer's discussion of the nature of fictional characters (Dauer, 1995). In particular, with reference to a Charlie Chaplin film and interpersonal emotions among its characters, Dauer gives a few definitions for the purposes of analysis (ibid., p. 36; the reference is to Chaplin's 1931 film *City Lights*):

If we give D a referential reading, D is to be understood in terms of some actual people having to have, or being destined to have unhappy ends. If the resulting referential claim is correct, *Othello* is in part to be understood to be about (or to be a portrayal of) people having unhappy destinies. I am reasonably certain that *Othello* is not to be understood in this way. On the other hand, D could be given a formal reading along some lines like: The integrity and coherence of the play demands that things do not turn out in the end hunky-dory for Othello and Desdemona. If we give D this sort of formal reading, which does not touch on actual world issues of fatalism or hard determinism, it seems to me that the resulting claim is correct as a referential claim, it is true or correct as a formal claim. [...] To infer the correctness of the referential claim from the correctness of the corresponding formal claim is then a *fallacy*, and we might call it the *referential fallacy*.

Dauer (1995, n. 2, p. 38) mentions "Kendall Walton's suggestion of fifteen years ago that we do not really pity Willy Loman – rather our state is one where 'make-believedly' we feel pity [(Walton, 1978)]. This account of our affective reactions to fictional characters seems 'too thin' and has spawned a number of counterproposals", such as Skulsky (1980), Novitz (1980) and Neill (1991). Incidentally, emotion in theories of justice is the subject of an article by Mary Dauglas (1993).

*ConTour* is a video fragment, labelled with a variety of keywords. Such fragments should be combined to form a narrative, or a documentary. Besides, Kevin Brooks<sup>26</sup> – at MIT, under the supervision of Glorianna Davenport – researched the construction of computational cinematographic narrative and developed a software tool, called *Agent Stories*, for assisting writers in the design and presentation of "nonlinear/metalinear narratives". Cf. Maureen Thomas's (2004) introduction to narrativity, a deliverable of NM2, a project funded by the European Union. Interactive entertainment is the subject of Handler Miller (2004). Also see, e.g., Swartjes and Theune (2006). The ACM holds a series of *International Conferences on Virtual Storytelling (ICVS)*, e.g., Cavazza and Donikian (2007).

There is a spectrum of possibilities, as to the extent to which one is to make a narrative's presentation, or even its content when generated, nonlinear. This applies to oralcy, written text, and video presentations as well, as for example flashbacks are an option for presentation even when relating a narrative in a conversation. At one end of the spectrum, one has just linear narratives. At the other end, one has random unfolding. The latter option is one that some teams are exploring for the purposes of interactive television: video presentations of narratives, whose actual unfolding, at given points, may branch differently in a way that may be called random, based on a pool of alternatives.

It is the middle of the spectrum that arguably yields the most interesting potential for formalisation and automation. Between the extremes (i.e., between linearity and random branching) there are intermediate situations in which how a narrative develops is more or less heavily constrained by norms pertaining to the medium, genre, style and poetic conventions, as well as the very nature of the universe depicted (the storyworld) in which the story is supposed to take place. The logic of the story requires consistency. Jeffrey Scott, the author of hundreds of scripts for animation, remarks on this (Scott, 2003, p. 47):

For example, if you see a character with a beard in one scene and clean shaven in the next, one could assume he shaved it off — *provided* it was logical. If he's in a car, racing down a highway with a beard, then in the next scene he pulls up in the same car clean shaven, this will be illogical. However, if he had a beard one day, and the next day had no beard while on his way to an important business meeting — this *would* be logical.

One needs as well to check in the general metadata (i.e., the abstracted data about the data) of a story or a series, for example, in both the static and evolving metadata about each of the cast of characters.

#### 5.2.4 The Task of Reconstructing the Facts

The film *Rashomon*, of 1950, was directed by Akira Kurosawa (1950) and based on a short story, *In the Forest* (1921), by Ryukonosuke Akutagawa (1892–1927).

<sup>&</sup>lt;sup>26</sup> Brooks (1996, 1999, 2002); cf. Davenport, Bradley, Agamanolis, Barry, and Brooks (2000).

In *Rashomon*, different versions are related in turn as to how a death occurred. *Rashomon* is an example of content nonlinearity, as the story branches out into several versions of how past events are reconstructed. This is a good example of how it is specifically *explanations* which determine content nonlinearity. Each such explanation is a subnarrative which is alternative to the other explanations provided. A narrative whose goal is to explain something given is called an *aetiological* narrative. As to the universe of the global narrative of *Rashomon*, it is a universe in which ghosts may intervene and give testimony in front of a court, and this contradicts the conventions of realism, which only partly apply (if at all) to *Rashomon*.

The poetic conventions also affect the generation of explanations: these are only partly realistic (magic realism may be a better descriptor), as what makes an explanation appear *adequate* (which is not the same as *true*) is mediated by a match to the poetic conventions of the given universe. Moreover, one aspect of the film *Rashomon* is that it is a *whodunit* story. Unlike in your typical whodunit story, of the four witnesses, three (of which one is a ghost) each claim to be the perpetrator. Set in a forest near Kyoto in fifteenth-century war-torn Japan, *Rashomon* revolves around the death of a samurai. A court is called to find out. A bandit states it was he who killed him. The wife of the deceased claims it was she who did. The ghost of the deceased claims it was suicide. Then a peasant gives yet another version.

In real life, law enforcement and judiciary contexts have to refer to a set of evidence in order to reconstruct the facts of a given legal narrative. Artificial intelligence for modelling the reasoning on legal evidence is an area we are dealing with in the present book. One of the seminal projects in that domain, as early as the late 1980s, is ALIBI, for which, see above in Section 2.2.2. But it is also a story-generation program; in that domain, it was perhaps the only reported system that was not developed in North America in those years. Its input is a simplified accusation, and the tool, which impersonates the accused, has to propose an exonerating or a less liable account of the events to which the accusation refers.

Whereas the latter is not concerned with literature or literary criteria, these were paramount for the COLUMBUS model (Nissan, 2002a), in which a parodistic, archaistic literary text was analysed (manually, but using artificial intelligence techniques for story-understanding), based on mock-explanations.

Other formalisms in literary studies (with implications for other fields as well, including AI & Law), namely, representations based on *epistemic formulae*, were developed by Nissan for the manipulation of personal identities in Pirandello's play *Henry IV* (Nissan, 2002b), for the play *Slave Island* by Marivaux (Nissan, 2003a), and for a passage from a Middle English romance on Alexander the Great (Nissan, 2003b). Episodic formulae were also used in order to analyse historical narratives (Nissan, 2007b, 2008j), apocryphal historical anecdotes – actually, folktales (Nissan, 2008g), or patterns from social history (Nissan, Hall, Lobina, & de la Motte, 2004; Nissan, 2008i, 2009 [2010], 2010a).

Representations in episodic formulae do not come along, for the time being, with an automated inference engine, so episodic formulae are still only for manual

analysis. There have been more mathematical approaches to narrative processing, though Honghua Gan (1994) developed a formal approach to automated story understanding, based on scripts and plans, but emphasising the role of causal relationships; Gan evisaged three cases of extension to "stepwise default theories" for story understanding: confirmation, distraction, and interference (Gan, 1994, p. 269). In fact (Nissan, 2008j, section 1.1):

In the history of narrative processing, some approaches to narratives were formulated and discussed more mathematically than others, and this is the case of the work of Honghua Gan, e.g., in [Gan (1994)]. Earlier work had "formalized the story understanding process based on scripts and plans with stepwise default theories", that however "offer final results for understanding a specific story", but "do not provide the history of changes of partial states of any objects the story may concern. Moreover, the causal models for missing events are incomplete in script-based understanding, and even not involved in plan-based understanding" [(ibid., p. 265)]. In [Gan's paper], a default rule representation was proposed for causal relationships. "Stepwise default theories [...] los[e] inference structures from which the final result is derived", i.e., they "only give results for causal prediction in understanding a story, and there [are] no intermediate results for causal explanation and causal diagnosis" [(ibid., p. 269)]. By contrast, in frame-based systems "[t]he whole default causal chain can be linked to the concerned object frame by dcc links, e.g., the default causal chain for eating in the restaurant will be associated to the object frame RESTAURANT', and such a frame is referred to as a host frame [(ibid., p. 270)]. In [the same paper by Gan], stepwise default theories were integrated with frame-based systems, in order to provide "the history of partial state changes of agents and objects in the story by generating an understanding chain" [(ibid., p. 265)]: the complete causal model of the story is a default causal chain.

## 5.2.5 Grammar-Driven vs. Goal-Driven Processing of Stories: Propp's Precedent

In the *conceptual dependency* school of automated story processing that flourished at Yale University during the 1970s and 1980s, the process is driven by goals and plans (see Sections 5.8 and 5.9 below). This is in contrast to *grammar-driven* story-processing, in which the story has to match a formal grammar, or is generated by using a formal grammar. Already Vladimir Propp, in an often cited, classic work (Propp, 1928), proposed a mathematical model for thematic patterns in folktales, a model that can be taken to be a story-generation model. He applied it to the genre of the Russian folktale. It is a work that "has had epochal significance in [almost] all areas of the study of traditional literature" (Beatie, 1976, p. 39).

Two articles, respectively by Alan Dundes (1962, repr. 1975) and S.S. Jones (1979), became the foundation of the structural narratological study of folktales. *Narratology* (Onega & Garcia Landa, 1996) is associated with *structuralism*. The study of narrative themes is *thematics*. *Thematology* is the study of the evolution of a thematic series (a story, or rather the cluster of its variants) throughout a given culture, and its methodology is related to narratology. Some concepts from the structuralist approach to folktales appear in Figs. 5.2.5.1 and 5.2.5.2 and in Table 5.2.5.1. Cf., e.g., Doležel (1972), Ben-Amos (1980), Lakoff (1972).

Fig. 5.2.5.1 The telos gives meaning to the structural constant (with a deep pattern of cognitive structures mediating). The structural constant gives meaning to the motifeme, that gives meaning to the motif (with a configuration of motifs possibly mediating) constituent units:  $\mathcal{T}^{-}$ 

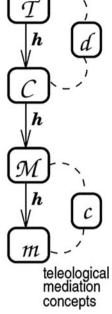
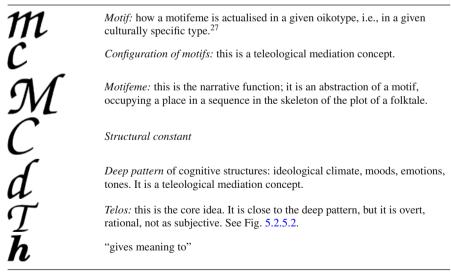
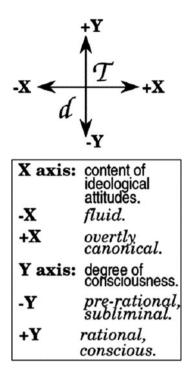


Table 5.2.5.1 Concepts involved in Fig. 5.2.5.1



<sup>&</sup>lt;sup>27</sup> In the words of Natascha Würzbach: "A motif is the concrete realisation of a fixed abstract idea, often spanning a complete narrative unit. [...] [T]he motif is a 'moveable stock device' that appears in many [historical] periods and genres. The content dimension of a motif comprises character

**Fig. 5.2.5.2** The difference between the deep pattern and the telos



A fundamental tool in the scholarship of the folktale is the classification of tale types on the part of Aarne and Thompson (1928 and sqq. edns.). Antti Amatus Aarne (1867–1925) established a system for indexing tale-plots, which was translated from the German and enlarged by Stith Thompson (Aarne & Thompson, 1928 and sqq. edns.), with a recent update by Hans-Jörg Uther (Uther, 2004). Referring to the classification of Aarne and Thompson is the standard fare of the study of folkloric narratives. Aarne died shortly before Vladimir Propp published his ground-breaking study of the Russian folktales (Propp, 1928), which paved the way also for *story grammars* in cognitive science<sup>28</sup> – David Rumelhart<sup>29</sup> rather preferred to call them *story schemata* – and automatic story processing within AI.

Propp envisaged twenty-two tale functions, and nine more in the "preparatory section" of a tale, a part that is sometimes absent. One of Propp's tale functions is

<sup>(&#</sup>x27;doppelganger', 'amazon') and action ('quest', 'marriage'), locality ('paradise, 'Gothic ruin'), and objects ('sword', 'rose'), temporal phases ('spring', 'night'), and dispositions ('madness', 'illness'). [...] The term 'motifeme' (Doležel, 1972) is frequently used to refer to the specific deepstructural narrative function of a motif" (Würzbach, 2005, p. 322). A motifeme is at a higher level of abstraction than the motif is, and is a concept introduced by Dundes (1962, repr. 1975). Concerning the concept of motif, see also Ben-Amos (1980).

<sup>&</sup>lt;sup>28</sup> Rumelhart (1975, 1980a, 1980b, cf. 1977a, 1977b); Rumelhart and Ortony (1977).

<sup>&</sup>lt;sup>29</sup> David Rumelhart is a psychologist, and has collaborated across disciplines, with Jay McClelland (psychology), Geoffrey Hinton (artificial intelligence), and Paul Smolensky (physics, artificial intelligence). Interdisciplinary collaborations are frequent in cognitive science research (Schunn, Okada, & Crowley, 1995).

*transformation*, such as when the hero lets his hair and beard grow exceedingly (and possibly makes himself unavailable, so that his previous self is not to be found), and then again when he has a hair cut, gets a shave, and otherwise enables *recognition*. Not always Propp's transformation function is intended as a disguise disabling recognition on the part of other characters. It is sometimes an enablement, such as when a character turns himself into a bird and flies.

Lakoff (1972) applied a parser approach to the Propp schema.<sup>30</sup> From the controversy concerning story grammars in cognitive science (which was influential in AI), see Black and Wilensky (1979), Rumelhart (1980b), Frisch and Perlis (1981), Wilensky (1983b), and Garnham (1983). Whereas I usually adopt goal-driven formalisms in my own work in AI, I agree that story grammars are nevertheless fairly important to how we both generate and make sense of stories. This is especially so, when a story appears to be amenable to themes and motifs from international folklore.

In his response to Black and Wilensky's (1979) critique of story grammars, Rumelhart (1980b) claimed that they had been evaluating story grammars on irrelevant grounds. He summarised their argument as follows (Rumelhart, 1980b, p. 313):

They argue that story grammars (or story schemata as I prefer to call them) are not a productive approach to the study of story understanding, and they offer three main lines of argumentation. First, they argue that story grammars are not *formally* adequate in as much as most of them are represented as a set of context free rewrite rules which are known to be inadequate even for sentence grammars. Second, they argue that story grammars are not *empirically* adequate in as much as there are stories which do not seem to follow story grammars and there are nonstories which do. Finally, they argue that story grammars could not form an adequate basis for a comprehension model since in order to apply the grammar you need to have interpreted the story. These arguments are, in my opinion, indicative of a misunderstanding of the enterprise that I and others working on these issues have been engaged in. I believe that they are all based on a misunderstanding about what grammars might be good for and about how comprehension might occur.

Rumelhart's response stressed that problem-solving and goals are central to many stories: "Most story grammars are based around the observation that many stories seem to involve a sort of problem solving motif (cf. Mandler & Johnson, 1977; Rumelhart, 1975, 1977b; Stein & Glenn, 1979; Thorndyke, 1977)" (Rumelhart, 1980b, p. 313). Many stories, Rumelhart pointed out, set a problem for a character, and this motivates a goal: "Such stories have roughly the following structure: First, something happens to a protagonist which sets up a goal that must be satisfied. Then the remainder of the story is a description of the protagonist's problem solving behavior in seeking the goal coupled with the results of that behavior" (ibid.). Story grammars in turn, Rumelhart claimed, actually formalise the structure of such problem solving episodes (ibid., p. 314):

 $<sup>^{30}</sup>$  In 2005 in Madrid, Peinado, and Gervás (2005b) combined case-based reasoning with an implementation of tale morphology à *la* Vladimir Propp.

In some stories there are several of these problem solving episodes, sometimes with different protagonists in the different episodes. Story grammars are, in essence, various schemes for formalizing this structure. The formalizations have usually (cf. Mandler & Johnson, 1977; Rumelhart, 1975; Stein & Glenn, 1979; Thorndyke, 1977), but not always (cf. Rumelhart, 1977b), involved the use of rewrite rules which conveniently, and generatively, capture the relationships among the various pieces of such stories.

According to Rumelhart (1980b, p. 314) the misunderstanding on the part of his critics (who are adept at the Yale school's *script* formalism) arose because their starting point was in formal language theory and what generative grammars mean there, and which to Rumelhart has little to do with why grammars are interesting in psychology:

Black and Wilensky appear to endorse the view that a grammar is primarily a device for generating all and only the sentences of a language. That definition of grammar presupposes the view that a language is properly defined as a set of sentences and that a grammar is merely a recursive device for enumerating them. That definition, coming out of the theory of formal languages, has very little to do with why a grammar might be *psychologically* interesting. The psychologically interesting thing about a grammar is that it proposes an analysis of the *constituent structure* of a linguistic unit. There never has been, and probably never will be, a grammar of the English language which will generate all and only the sentences of English. By the same token, there never has been and probably never will be a grammar of stories which generates all and only the population of things called stories. Nevertheless, there are grammars of English (and grammars of stories) that are interesting.

Grammars "are interesting *because* they tell us what elements 'go together' to form higher elements and how one group of elements is related to another" (ibid., p. 314), and also because grammars enable the identification of analogous elements. To Rumelhart (1980, p. 315), if anything it is the script approach that is formally clumsy (and this can be easily recognised by those who recognise that historically, practitioners of artificial intelligence can be divided in two camps: the *neaties*, who are after nice formal theories, and the *messies*, who research useful devices empirically):

Black and Wilensky appear to be so caught up in the issues of formal language theory (in which considerations of constituent structure are secondary) that they completely ignore this key issue. Instead they focus on largely technical and, from a psychological perspective, irrelevant issues. For example, they claim that most story grammars are "formally inadequate", because they lack complete self-embedding. Obviously, this cannot be an important criticism, for it is a trivial matter to add any sort of self-embedding to a system specified in a rewrite formalism. I originally employed a rewrite system *because it was so easy to express recursion* in this formalism. I created the "Old Farmer" story to illustrate the importance of recursion. In fact, one of my major objections to the other formalisms for story and event knowledge has been the clumsiness of recursion within them (e.g., recursion cannot be represented in the popular script formalism).

Moreover, Rumelhart (1977a) had stressed the interactive nature of comprehension, in the sense that comprehension identifies and exploits possibilities suggested both from top-down and from bottom-up. This is likely to find sympathetic ears in current research into story comprehension. There has recently been a resurgence of the use of story grammars on the part of some researchers, but they usually combine that device with another kind of representation as well. BRUTUS, a program making use of both frames and story grammars, generates narratives of betrayal (Bringsjord &

Ferrucci, 2000). Also the *Joseph* story-generation program (Lang, 2003) combines the goal-driven approach with story grammars. *Joseph* produces randomly generated natural language narratives conforming to a grammar, and that resemble Russian folktales.

Propp was concerned with the Russian folktale, and the Russian folktale is part of an international genre. At any rate, Propp was concerned with a particular genre. But Marie-Laure Ryan has pointed out: "It was the legacy of French structuralism, more particularly of Roland Barthes and Claude Bremond, to have emancipated narrative from literature and from fiction, and to have recognised it as a semiotic phenomenon that transcends disciplines and media" (Ryan, 2005, p. 344).

Chapter 1 in Scott Turner's thesis (1992, cf. 1994) about his MINSTREL storygenerating program describes his chance encounter with the 1968 edition of Propp's *The Morphology of the Folktale*, and its equations. "As a computer scientist, I found this fascinating". He further remarks (Turner, 1992, p. 1): "In theory, Propp's grammar could be programmed into a computer and used to recognize folktales – provided someone first translated each folktale into Propp's notation. [...] Propp's grammar could be used to 'grow' a story from seed to completion. [...] I did eventually write a computer program that tells stories. But it tooks years, not hours, and in the end, Vladmir [sic] Propp's intriguing little grammar was nowhere to be seen". Unsurprisingly, as being Michael Dyer's supervisee, Scott Turner adopted the goal-driven technique of the Yale conceptual dependency school.

# 5.2.6 Let Us Not Simplify the 1970s: A More Populated Pool of Approaches, and More Nuanced Distinctions

It would be wrong to believe that story grammars were the only *rule-based* approach to narrative understanding. In a 1980 paper in automated story-understanding, Alfred Correira (1980), from the University of Texas at Austin, discussed "computing story trees". Parsing narrative texts was, to him, "a process of collecting simple textual propositions into thematically and causally related units" (Correira, 1980, p. 135). He adopted the concept of *macrostructures* that had been previously introduced by Kintsch and van Dijk's (1978) 'Recalling and Summarizing Stories'.

Correira (1980) also applied logic rules, expressed as *extended Horn clauses* (*EHC*). The first part of the rule (what one usually refers to as the left-hand side of the rule) was, in Correira's own formalism, "the HEAD of the rule, and represents the macrostructure pattern. The second part is the PREcondition for the rule. The propositions in the precondition are the conditions which must be true, or can be made true, before Rufolo can embark on an episode of TRADINGVOYAGE" – this being from a narrative from Giovanni Boccaccio's *Decameron*, that Kintsch and van Dijk (1978) had used in their exemplification. "The third part is the EXPansion of the rule. If Rufolo goes on a TRADINGVOYAGE, then these are the (probable) actions he will take in doing so. The final part of the rule is the POSTcondition of the rule, which consists of the propositions that will become true upon the

successful completion (instantiation) of the TRADINGVOYAGE rule" (Correira, 1980, p. 138).

It would be wrong to think that in the 1970s, grammar-driven or rule-driven approaches to narrative processing were in stark opposition to the goal-driven approach of the Yale school. What Rumelhart said in defence of story grammars, in his answer to the critique of story grammars in Black and Wilensky (1979), sounds like the approach of the Yale school, from which Wilensky, his critic, had come (Rumelhart, 1980b, p. 314): "The basic theme of the research on story schemata is to look at a story and to identify the goals, subgoals, the various attempts to achieve the goals, and the various methods that have been employed." It should not come as too much of a surprise to find out that to Correira, his own rules were akin to the Yale school's scripts and plans (Correira, 1980, p. 138):

The resulting rule form is related conceptually and historically to the notion of a script as developed by Schank and Abelson (1977) (cf. Norman and Rumelhart, 1975). The precondition sets the stage for the invocation of a rule. It describes the setting and the roles of the characters involved in the rule. The expansion consists of the actions normally taken during the invocation of the rule. The postcondition is the result of these actions. When used in a script-like role, a rule is activated when its precondition has been satisfied, and its expansion can then be sequentially instantiated.

A rule can also be used as a plan. A plan is a data structure that suggests actions to be taken in pursuit of some goal. This corresponds to activating a rule according to its postcondition, i.e. employing a rule because its postcondition contains the desired effect.

#### I quote an enumeration of methods current at the time, from Correira (1980, p. 135):

Experiments with text processing led to such procedural constructs as frames (Minsky, 1975; Charniak and Wilks, 1976; Bobrow and Winograd, 1977), scripts and plans (Schank and Abelson, 1977), focus spaces (Grosz, 1977), and partitioned networks (Hendrix, 1976), among others. These efforts involved conceptual structures consisting of large, cognitively unified sets of propositions. They modelled understanding as a process of filling in or matching the slots in a particular structure with appropriate entities derived from input text.

There have also been rule-based approaches to the text processing problem, most notably the template/paraplate notion of Wilks (1975), and the story grammars of Rumelhart (1975, 1980a, 1980b). Although both approaches (procedures and rules) have their merits, it is a rule-based approach which will be presented here.

This paper describes a rule-based computational model for text comprehension, patterned after the theory of macrostructures proposed by Kintsch and van Dijk (1978). The rules are notationally and conceptually derived from the Horn clause, especially as described by Kowalski (1979). Each rule consists of sets of thematically, causally, or temporally related propositions. The rules are organized into a network with the macrostructures becoming more generalized approaching the root. The resulting structure, called the Story Tree, represents a set of textual structures.

Kintsch and van Dijk (1978) had proposed to organise a discourse as a hierarchy of macrostructures. These are essentially metapropositions. The text's sentences, clauses, or phrases are the input propositions, and this is the lowest level of discourse textual representation. "Propositions are conjoined by links of implication: if proposition A implies proposition B, then A and B are connected, and the link is marked with the strength of the connection, ranging from (barely) possible to (absolutely) necessary" (Correira, 1980, p. 136). Moreover: "The propositions and their

connections reside in a text base. A text base can be either explicit, if all the implied information necessary for coherence is made explicit, or implicit, if propositions that can be assumed to be known or implied are omitted. A text is an explicit data base by itself, and all summaries of that text are implicit data bases. A college physics text would have a much more explicit text base than after-dinner conversation" (Correira, 1980, p. 136).

As to the tree structure: "As a computational entity, a macrostructure is a node in a story tree whose immediate descendants consist of the subordinate propositions by which the node is implied, and is itself a descendant of the macrostructure it (partially) implies. Every macrostructure in this tree is the root of a derivation tree whose terminals are simple propositions" (Correira, 1980, p. 136).

At this point, *summarisation* enters the picture: "Each level of the tree shares the attribute of summarizability, i.e. a summary of the text may be extracted from any level of the tree, becoming less specific as the summary level approaches the root. The lowest level summary is the original text itself; the highest level (the root) is a title for the text" (Correira, 1980, p. 136).

# 5.2.7 Some Computational Narrative Processing Projects from the 1970s, 1980s, 1990s, and Later

Narratives are, of course, pervasive in human life. As to scholarship about narratives, there has been growth in various realms. One of these is computer science, in a subdomain of artificial intelligence which is now called *narrative intelligence*. Beginning an article, 'Models of narrative analysis: A typology', which he published in 1995 in the *Journal of Narrative and Life History*, a clinical psychologist, Elliot G. Mishler, wrote (1995, p. 87):

This is an exciting time for narrative researchers, a period of rapid growth in the number and variety of narrative studies in the human sciences. The analysis of narrative discourse, both written and spoken, has become a central topic for investigators in many countries, representing a wide spectrum of disciplines and diverse theoretical and methodological perspectives. The breadth of interest is manifested in the frequency of conferences and symposia, this journal, an annual series of edited volumes on narrative and life history [Josselson and Lieblich (1993)], and an accelerating stream of articles and books.

#### Mateas and Sengers have stated (2003, p. 1):

By telling stories we make sense of the world. We order its events and find meaning in them by assimilating them to more-or-less familiar narratives. It is this human ability to organize experience into narrative form that David Blair and Tom Meyer call "Narrative Intelligence" [Blair and Meyer (1997)] and around which AI research into narrative coalesces.

Blair and Meyer's paper (1997) that Mateas and Sengers's passage quoted above cited appeared in a volume on automated autonomous personality agents to go with computer animation's synthetic actors. Section 5.2.15 is concerned with this subject.

Early natural language understanding programs included Terry Winograd SHRDLU (Winograd, 1972), and Roger Schank's and Christopher Riesbeck's

MARGIE (Schank, Goldman, Rieger, & Riesbeck, 1973; Schank, Goldman, Rieger, & Riesbeck, 1975). At MIT, Eugene Charniak (1972) resorted to the device whose activation is spawned and is known as *demons*, in a model of children's story comprehension. He was later to work on a frame-based language comprehension program called *Ms. Malaprop* (Charniak, 1977a, 1977b), and afterwards he developed at Brown University, in the WIMP project, a theory of *marker passing* for language comprehension (Charniak, 1983, 1986). The following is quoted from Charniak (1991):

A recognition problem is one of inferring the presence of some entity from some input, typically observing the presence of other entities and the relations between them. We will make the common assumption that high-level recognition is accomplished by selecting an appropriate *schema* from a schema library. A schema is a generalized internal description of a class of entities in terms of their parts, their properties, and the relations between them. [...] In plan recognition, the generalized plans are schemas. [...] A crucial problem faced by schema selection is that of searching the schema library for the right schema; typically a single piece of local evidence is multiply ambiguous as to which schema it could indicate. For example, an act of getting a rope might fit into many schemas.

One of the few concrete proposals to solve this problem has been *marker-passing* [...] Marker-passing uses a breadth-first search<sup>31</sup> to find paths between concepts in an associative network made up of concepts and their part-subpart relations. The idea is that a path between two schemas suggests which schema(s) to consider for recognition. For example, a knob instance and a hinge instance might suggest a door (instance); since there are links between the schemas door and knob and between door and hinge in the associative network (they are part-subpart relations), there is therefore a path from knob through door to hinge. Unfortunately, most marker-passing systems have found many more bad paths, suggesting incorrect schemas, than good ones [...] We will show in this paper that the good/bad ratio can be raised quite high by exploiting probability information; we realize this benefit by (cheaply) controlling the marker-passer's search, extending it in promising directions and terminating it in unpromising ones.

At Brown University, Charniak with Robert Goldman and Glen Carroll developed *Wimp3*, with a probabilistic account of marker passing for the purposes of plan recognition (Goldman, 1990; Carroll & Charniak, 1991).<sup>32</sup> At Berkeley, Peter Norvig developed FAUSTUS, in which a theory inference for text understanding

<sup>&</sup>lt;sup>31</sup> Breadth-first search is a standard concept from artificial intelligence. I quote from Luger and Stubblefield (1998, p. 99): "In addition to specifying a search direction (data-driven or goal-driven), a search algorithm must determine the order in which states are examined in the tree or the graph." In particular, "two possibilities for the order in which the nodes of the graph are considered: *depth-first* and *breadth-first* search. [...] In depth-first search, when a state is examined, all of its children and their descendants are examined before any of its siblings. Depth-first search goes deeper into the search space whenever this is possible. Only when no further descendants of a state can be found are its siblings considered. [...] Breadth-first search, in contrast, explores the space in a level-by-level fashion. Only when there are no more states to be explored at a given level does the algorithm move on to the next level."

<sup>&</sup>lt;sup>32</sup> More recent recearch by Charniak's team has been concerned with *conversation disentanglement* (Elsner & Charniak, 2008) and with *discourse coherence* (Elsner, Austerweil, & Charniak, 2007).

was implemented, also based on marker passing (Norvig, 1987, 1989). Again at Berkeley, Dekai Wu developed a project in automatic inference for natural-language interpretation, based on a probabilistic approach to marker passing (Wu, 1992).

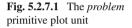
Steven Rosenberg developed at MIT a news article comprehension model based on frames (Rosenberg, 1977). Wendy Lehnert developed at Yale the OUALM question answering program, embodying her novel theory (Lehnert, 1978, cf. 1977). Richard Cullingford, also at Yale, used Lehnert's program in SAM, a script-based program for automatically understanding newspaper stories (Cullingford, 1978, 1981). At Yale, Robert Wilensky developed the PAM story-understanding program, with plans and goals (Wilensky, 1978, 1981, 1982, 1983a; cf. 1980, 1983b). In 1978, Janet Kolodner was working at Yale on CYRUS, a program with episodic memory about information about the travels of the U.S. foreign secretary Cyrus Vance (Kolodner, 1984). Also at Yale, Jaime Carbonell developed POLITICS, a program impersonating persons who, holding dovish or hawkish political views from the United States, gave answers about international affairs based on two different ideological goal trees (Carbonell, 1978, 1979, 1981). Again at Yale, Gerald DeJong developed FRUMP, a program for news story skimming (DeJong, 1979); Michael Lebowitz developed IPP, an integrated understanding system with generalisation and episodic memory; and Michael Dyer developed BORIS, a story understanding system that combined MOPs (a generalisation of scripts), TAUs (thematic abstraction units), plans, goals, and emotions: it was based on behaviour ascribed to emotional responses, from which the program took its cue for understanding characters' behaviour and the story itself (Dyer, 1983a; 1983b; 1987; Lehnert, Dyer, Johnson, Yang, & Harley, 1983). In relation to that project, Dyer's supervisor, Wendy Lehnert, developed *plot units*, a somewhat more rudimentary approach relating emotions to turns in a narrative (Lehnert, 1982).<sup>33</sup>

Based on her positing that narratives are summarised by readers according to *affect-state patterns*, Lehnert (1982) developed a suitable representation. To her, a mental model of a narrative consists of both character acts (which may be physical

<sup>&</sup>lt;sup>33</sup> It may come as a surprise to some, that the problem of an automated analysis of narratives simplistically ascribing a decidedly negative role to a collective actor being an ethnic group, has arisen as early as the early 1980s, in a research project. This was when Hayward Alker, Wendy Lehnert and Daniel Schneider developed a computational hermeneutic of Toynbee's reception of Christus Patiens according to the synoptic gospels (Lehnert, Alker, & Schneider, 1983; Alker, Lehnert, & Schneider, 1985; Alker, 1996). In Tonfoni (1985), Alker et al. (1985) follows an introductory article on plot units in automated narrative understanding (Lehnert & Loiselle, 1985). Lehnert had developed the plot units approach to the automated treatment of narratives. She left Yale for the University of Massachusetts in 1982, not before a more advanced approach came to fruition in Michael Dyer's PhD thesis about the BORIS system, a project in which Lehnert had an important role (Lehnert et al., 1983; Dyer, 1983a). In the publications about the computational project based on Toynbee's (and Gospels) narrative, it was admitted that, because of the need to simplify, the Jews had been given a negative role in the model. Those papers exhibited here and there some passages in anthropology, which did not alter the basic fact about which the authors possibly felt some discomfort.

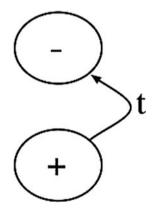
or mental), and state propositions. She maintained that such states and events are recalled according to their affect. The affects were rudimentary, actually out of just three values: positive events for the acting character (+), negative events for the acting character (-), or neutral mental states (M). Links between states and events come in different kinds, according to the way they relate to one another. One kind of link is *motivation* (m): mental states can motivate events or other mental states. Another kind of link is *actualisation* (a): mental states can be actualised by events. Yet another kind of link is *termination* (t): events can terminate mental states or other events. There also is an *equivalence* link (e) between mental states and events. According to the way states and events are linked, Lehnert (1982) defined particular patterns of mental states and events as *primitive plot units*.

The *problem* primitive plot unit is represented (Fig. 5.2.7.1) as a negative event motivating a mental state:





**Fig. 5.2.7.2** The *resolution* primitive plot unit

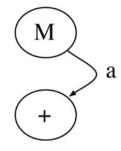


m

m

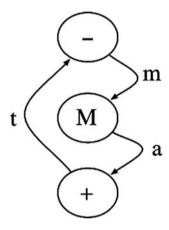
In the *success* primitive plot unit (Fig. 5.2.7.3), a mental state actualises a positive event:

**Fig. 5.2.7.3** The *success* primitive plot unit



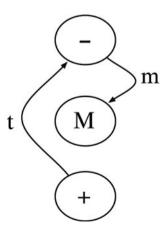
A complex plot unit for *intentional problem resolution* is as follows (Fig. 5.2.7.4):

**Fig. 5.2.7.4** A complex plot unit for *intentional problem resolution* 



By contrast, a complex plot unit for *fortuitous problem resolution* is as follows (Fig. 5.2.7.5):

**Fig. 5.2.7.5** A complex plot unit for *fortuitous problem resolution* 



In the late 1970s and early 1980s, Roger Schank and Christopher Riesback's research group at Yale University "quickly became focused on understanding narratives. In a series of programs, they developed a theory of the knowledge structures necessary to understand narratives" (Mateas & Sengers, 2003, p. 2). "[T]hese early narrative systems fell out of favor" as "[t]hey were intensely knowledge-based", and therefore were difficult to be made more general. In my view, this is an inescapable requirement, even though you may try to improve machine learning. At any rate, the field suffered when, "as funding for AI [i.e., artificial intelligence] dried up during the AI Winter, AI research became more focused on constrained problems with clear, measurable results and immediate practical utility" (ibid.), with an agenda which "rules out the ability to work on complex phenomena such as the human use of narratives" (ibid.). "Except for occasional exceptions continuing in the Yale tradition, such as Mueller's model [(1990)] of daydreaming<sup>34</sup> and Turner's model of storytelling [Turner (1994)],<sup>35</sup> sustained work on narrative disappeared from AI" (Mateas & Sengers, 2003, p. 3).

It was not the case that work on narrative in AI had completely died out, though.<sup>36</sup> For example, proceedings continued to appear. Consider in particular Mark Kantrowitz's work (at Carnegie Mellon University) on GLINDA, in the *Oz* interactive fiction project (Kantrowitz, 1990). At any rate, if there has been a winter of AI research into narratives, in other areas of computer science "narrative became an influence" (Mateas & Sengers, 2003, p. 3), such as in human-computer interface design, and in hypertext research. Moreover, as the technology of virtual reality was developing, research into narratives within computing turned to embedding a narrative dimension into interactive virtual environments, with stories unfolding by interaction with human users.<sup>37</sup>

Projects in the automated understanding of narratives included the *OpEd* project from UCLA, of 1989, in editorial comprehension, developed by Sergio Alvarado (1990). Also at UCLA, Stephanie August developed ARIEL in 1991, for automatically understanding analogies in arguments in the text of an editorial.

<sup>&</sup>lt;sup>34</sup> Erik Mueller's DAYDREAMER produced vindictive daydreams (related in the first person): the narrator dreams of vengeance for being rejected for a date by a famous movie star.

<sup>&</sup>lt;sup>35</sup> Scott Turner's thesis (1992) is posted on the Web. Our references to pages in Turner are to his thesis, as in that report. Both Mueller's DAYDREAMER project, and Turner's MINSTREL project, were supervised by Michael Dyer. In the given period, there were other teams and other projects in story generation, e.g., Smith and Witten (1991), Okada and Endo (1992), as well as Lyn Pemberton's project (1989).

<sup>&</sup>lt;sup>36</sup> At the Media Lab of the Massachusetts Institute of Technology (MIT), the Narrative Intelligence (NI) Reading Group was active during the best part of the 1990s, and continues as an e-list.

 $<sup>^{37}</sup>$  E.g., Wavish and Connah (1997), Cavazza, Charles, and Mead (2002a), Riedl and Young (2004). On interactive fiction, cf. Niesz and Holland (1984). Young (2007) "set out a basic approach to the modeling of narrative in interactive virtual worlds", and "story elements – plot and character – are defined in terms of plans that drive the dynamics of a virtual environment", whereas the communicative actions (discourse elements) "are defined in terms of discourse plans whose communicative goals include conveying the story world plan's structure", with reference to the development of the Mimesis software architecture for interactive narrative. Suspense is an aspect involved.

## 5.2.8 Primitive Acts in the Conceptual Dependency Approach

The early 1970s saw the rise of the conceptual dependency theory of goals and actions in the United States at the University of Yale, and of Maria Nowakowska's theory of goals and actions in Warsaw, Poland. The latter theory was more mathematical, and for all its merits, it did not have much of an aftermath except in her own research, even though it was published in important forums. Those two theories could still be combined together, and could potentially be usefully complementary to each other.<sup>38</sup>

Let us point out some rudiments of the approach of the Yale school of naturallanguage processing. "A basic premise of *Conceptual Dependency* (*CD*) is that meaning arises from a combination of memory search, planning, and inference. Only a small fraction of meaning is actually conveyed directly by those lexical items which explicitly appear in a given sentence" (Dyer, 1983a, p. 379). The meaning of sentences is represented by decomposing them into primitive acts. There are eleven of them in CD theory. Each primitive act has a few case-frames associated, which hold expectations for what conceptualisations should follow. Those case-frames include: actor, recipient, object (if any), direction, and instrumental case. Here is a list of the eleven primitive acts:

ATRANS. This is transfer of possession. An example of this is getting some merchandise, and paying for it:

(ATRANS		(ATRANS			
ACTOR	customer <sub>1</sub>	ACTOR	newsagent1		
OBJECT	£2.30	OBJECT	magazine1		
FROM	customer <sub>1</sub>	FROM	newsagent1		
ТО	newsagent <sub>1</sub> )	TO	$customer_1)$		

This does not necessarily involve physical transfer; for example:

(ATRANS		(ATRANS			
ACTOR	U.S.A.	ACTOR	CzaristEmpire		
OBJECT	heftyprice1	OBJECT	Alaska		
FROM	U.S.A.	FROM	CzaristEmpire		
TO	CzaristEmpire)	TO	U.S.A.)		

PROPEL. This is the application of physical force. Shoving, throwing, hitting, falling, pulling, are actions that all involve propel.

PTRANS. This is the transfer of physical location. For example, if the newswagent walks over to a customer and hands over a magazine to that customer,

<sup>&</sup>lt;sup>38</sup> The late Maria Nowakowska mentioned to me in Knoxville, Tennessee, in 1985, that the two theories are akin and were independently developed, but had a different fate. See in particular Nowakowska's 'A formal theory of actions' (1973a); *Language of Motivation and Language of Actions* (1973b); and 'Action theory: Algebra of goals and algebra of means' (1973b). See also in fn. 60 above (in the notes of Section 2.2.2.7).

who is buying it, this involves PROPEL subserving PTRANS (the newsagent moves him- or herself, and moves the magazine), itself subserving ATRANS (because of the commercial transaction).

- INGEST. This is when an organism takes something from outside and makes it internal. Examples are eating, drinking, swallowing one's saliva, and smoking.
- EXPEL. This is the opposite of INGEST. sweating and crying are among the examples of this primitive act.
- MTRANS. This is the transfer of mental information from one individual to another, or between distinct parts of the same individual's memory. When the latter, this is involved in remembering, forgetting, learning, and recalling. When MTRANS takes place between different interlocutors instead, this is involved in such actions as talking or reading.
- MBUILD. This is the primitive act of thought processes which create new conceptualisations from old ones. MBUILD is involved in realising, considering, imagining, deciding, and concluding.
- MOVE. This is the movement of a body part of some animate organism. An example of this is walking, which is represented as a PTRANS, but what accomplishes that PTRANS is an instrumental MOVE of LEGS. Other examples of actions involving MOVE include waving, throwing, dancing, and jumping.
- GRASP. This is the act of physically contacting an object. Usually this is accomplished by MOVE as applied to one's arm or one's hand. Actions such as holding, grabbing, or hugging involve GRASP. Grasping some notion instead does not involve GRASP, but MBUILD instead.
- SPEAK. This stands for any vocalisation. The act of MTRANS is often accomplished by people by means of the SPEAK primitive act.
- ATTEND. This is the act of directing a sense organ. Hearing someone or something, or listening to someone or some musical instrument, involves ATTENDing one's ears towards the sounds being made.

## 5.2.9 Scripts, Goals, Plans, MOPs, and TAUs in the Conceptual Dependency Approach

### 5.2.9.1 Goals

Conceptual Dependency theory enumerates the following kinds of goals: *satisfaction goals* (*S-goals*) as arising from the need to satisfy recurring bodily desires; *delta goals* (*D-goals*), which represent desires for a change in state, *entertainment goals* (*E-goals*); *achievement goals* (*A-goals*), which involve the long-term attainment of social status or position (e.g., A-GOOD-JOB and A-SKILL); and *preservation goals* (*P-goals*). Preservation goals are those goals which become active only when threatened; they include P-HEALTH, P-COMFORT, P-APPEARANCE, and P-FINANCES. An entertainment goal is involved, for example, when one goes to the restaurant with a friend in order to satisfy an E-COMPANY goal rather than to satisfy S-HUNGER. The change of state desired in delta goals may be mental, or physical, or of control. The latter is the case of D-CONT, i.e., the desire to gain control of something, and of D-SOCCONT, i.e., the desire to gain control of someone (e.g., in a kidnapping).

For each goal, in order to achieve it there may be a number of *plans* (each with its own preconditions which must be satisfied before the plan can be invoked). Detailed planning can be avoided, by resorting to *scripts*. These represent a large sequence of stereotypical actions, and have roles and props associated with them. For example, \$MOVIE is the script about going to a movie. Actions involved include "buying a ticket, giving the ticket to the doorman, getting a ripped ticket in return, going to the candy counter, entering the theater, sitting down, watching the movie, and leaving through the doors marked 'exit'" (Dyer, 1983a, p. 383).

#### 5.2.9.2 Scripts in Cullingford's SAM

*Scripts* are patterns that capture a sequence of events that can be expected to take place in a given situation, involving given kinds of characters. Unless it is explicitly stated, in a story being analysed, that things went differently, a story-understanding program based on scripts will assume that by default, the unfolding in the given situation was as per the defaults specified in the script. Scripts have roles in which characters in a story may fit, and also have props. For example, the props of the script for using the subway, \$SUBWAY, include (Cullingford, 1981, p. 102): a token, money paid for a token, a turnstile, a seat on the platform, the train itself, one of the cars, a seat on the car, a strap for the patron to grasp, and the gate leading from the platform at the destination station. Roles in the subway script include (Cullingford, 1981, p. 101): a group of subway riders (patrons group: *patgrp*), the cashier, the conductor, the person controlling the train, and the subway organisation. Episodes in that same script include (Cullingford, 1981, p. 108):

E1: Patron enters station (represented as M1: patgrp PTRANS to inside station), then the alternatives E2 and E3, namely: E2: Patron goes directly to turnstile (M2: patgrp PTRANS to turnstile), E3: Patron gets a token, then goes to turnstile (M3: agent ATRANS token to patgrp). After this branching into those two alternatives, the control flow joins again, into episode E4: Patron goes through turnstile, goes to platform (M4: patgrp WAIT at platform). Next, there is the *cyclic* episode E5, which loops, because this is an episode which may happen several times in succession, the minimum being one. E5: Subway arrives (M5: trainman PTRANS subway to platform). Next, we find episode E6: Patron enters subway and sits down (M6: patgrp MOVE to seat). Next, there is the cyclic episode E7: Subway goes to a new destination (M7: trainman PTRANS subway to destination). Finally, there is episode E8: Patron leaves the station (M8: patgrp PTRANS from station).

Eventually, scripts were refined into *MOPs (Memory Organization Packages)*, which differ from scripts in that a MOP also includes character's goals in relation to the sequence of plans, and therefore helps to understand the motivational dynamics of a story. Moreover, MOPs enable abstraction: for example, a MOP for service at a

restaurant can be just be a special case of a more abstract MOP, capturing the pattern of situations such that service is provided, and the customer pays later.

At the University of Yale, Richard Cullingford (1978, 1981) developed SAM (Script Applier Mechanism), a program analysing stories by identifying and applying relevant scripts, not MOPs. Even so, SAM could analyse a story such as the following, and then provide an answer to a question, and refer to the mood of the protagonist (Cullingford, 1981, p. 78):

JOHN WENT TO A RESTAURANT. HE ORDERED A HOT DOG. THE WAITER SAID THEY DIDN'T HAVE ANY. HE ASKED FOR A HAMBURGER. WHEN THE HAMBURGER CAME, IT WAS BURNT. HE LEFT THE RESTAURANT.

When asked:

WHY DIDN'T JOHN EAT THE HAMBURGER?

SAM was informed that John did not eat the hamburger indeed. SAM was able to explain why John did not eat the hamburger:

BECAUSE THE HAMBURGER WAS OVERDONE.

When asked:

DID JOHN PAY THE CHECK?

SAM provided this answer:

NO JOHN WAS ANGRY BECAUSE THE HAMBURGER WAS OVERDONE AND SO HE LEFT THE RESTAURANT.

Cullingford (1981, p. 81) could boast that:

SAM was a pioneering effort in story understanding, an attempt to directly confront the messy, but real, problems associated with reading connected texts, as opposed to isolated sentences. It was also the first system which brought enough knowledge to bear on a domain that certain interesting problems in summarization, question-answering and machine translation could be attacked.

SAM, as well its simplified version, MicroSAM or McSAM, were originally coded in the Lisp functional programming language. Leon Sterling and Ehud Shapiro (1986, pp. 233–236) showed how simple it is to recode MicroSAM in the Prolog logic programming language. In their own implementation (Sterling & Shapiro, 1986, pp. 233–234):

The top-level relation is *mcsam(Story,Script)* which expands a *Story* into its "understood" equivalent according to a relevant *Script.* The script is found by the predicate *find(Story,Script,Defaults)*. The story is searched for a non-variable argument that triggers the name of a script. In our example of John visiting Leones, the atom *leones* triggers the *restaurant* script, indicated by the fact *trigger(leones, restaurant)* [in the Prolog program]. The matching of the story to the script is done by *match(Script, Story)* which associates lines in the story with lines in the script.

Their example input was: "John went to Leones, ate a hamburger and left." By expanding the script, with defaults filled in (because they are not contradicted by the story), the output produced was:

John went to Leones. He was shown from the door to a seat. A waiter brought John a hamburger, which John ate by mouth. The waiter brought John a check, and John left Leones for another place.

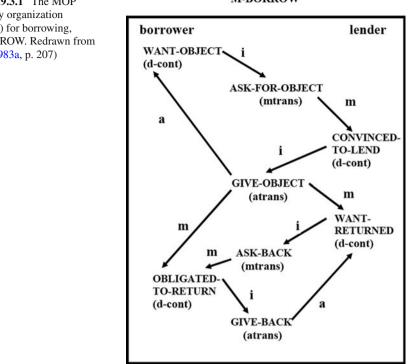
Actually, the default expectation in the restaurant script is that John paid the bill. Let us turn to how MOPs are defined for given situations. A good example is the multiparagraph understanding program BORIS, developed by Michael Dyer (1983a). Basically, not only characters' goals and motivations, but also their emotions were quite important to the workings of BORIS. It is from displays of emotion that the system could realise whether something went wrong, some plan did not succeed, or some active goal was thwarted.

### 5.2.9.3 I-Links and MOPS (Memory Organization Packages) in Dyer's BORIS

Motivations and intentions of narrative characters inside the upgraded scripts, the memory organisation packages (MOPs), in Michael Dyer's BORIS are captured by so-called I-*links*. The roles into which characters fit are written at the top of a box encompassing the MOP. Under the role, the goals of that role appear in a column. Between role-columns, a column of plans appears. The goals are connected to plans by I-links.

Various kinds of I-links exist. An event can either force, or be forced by an event. An event can motivate a goal, or thwart a goal, or achieve a goal. An event can block a goal, or be realised by a goal. A goal can be thwarted by an event, or be motivated by an event, or be achieved by an event. A goal can suspend another goal, or be suspended by another goal. A goal can intend a plan, or enable a plan. A plan can realise an event, or be blocked by an event. A plan can be intended by a goal, or be enabled by a goal. No I-link exists from a plan to a plan (Dyer, 1983a, pp. 199–200). Of these I-links, "intends" is abbreviated in diagrams as *i*, "motivates" as *m*, "achieves" as *a*, "realizes" as *r*, "blocks" as *b*, "suspends" as *s*, "forces" as *f*, "enables" as *e*, and "thwarts" as *t*.

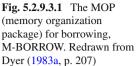
Figure 5.2.9.3.1 shows the MOP for borrowing, M-BORROW, from Dyer's BORIS. Figure 5.2.9.3.2 shows the MOP for such service that the client has to pay later. The latter MOP is quite useful in BORIS, because by customising it for the relation between customer and owner, and for the relation between customer and waiter or waitress, one can define the MOP for service at a restaurant: Figure 5.2.9.3.3 shows how. There are strands between MOPs, that link particular episodes (actually: plans) inside the MOP for a restaurant to either MOPs or scripts for kinds of service, and for a meal.



M-SERVICE (pay later)

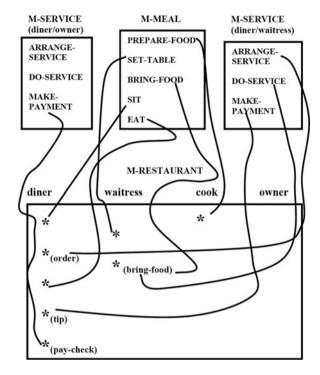
client server WANT-SERVICE ARRANGE-SERVICE m a **OBLIGATED-TO-SERVE** i DO-SERVICE m WANTm PAYMENT INFORM-BILL m **OBLIGATED** TO-PAY MAKE-PAYMENT

Fig. 5.2.9.3.2 The MOP for such service that the client has to pay later. Redrawn from Dyer (1983a, p. 221)



M-BORROW

Fig. 5.2.9.3.3 Strands between MOPs: how the MOP for a restaurant is defined by means of either MOPs or scripts for kinds of service, and for a meal. Redrawn from Dyer (1983a, p. 220)



#### 5.2.9.4 Evidence for a Divorce Case, in BORIS

The main story analysed by BORIS is DIVORCE-1, about evidence for a divorce case (Dyer, 1983a, pp. 1–5). BORIS is able to answer questions once it has analysed the first paragraph, and then again once it has analysed the second paragraph, and so forth. We omit here many of the questions and answers. The multi-paragraph story is as follows:

Richard hadn't heard from his college roommate Paul for years. Richard had borrowed money from Paul which was never paid back. But now he had no idea where to find his old friend. When a letter finally arrived from San Francisco, Richard was anxious to find out how Paul was.

Unfortunately, the news was not good. Paul's wife Sarah wanted a divorce. She also wanted the car, the house, the children, and alimony. Paul wanted the divorce, but he didn't want to see Sarah walk off with everything he had. His salary from the state school system was very small. Not knowing who to turn to, he was hoping for a favor from the only lawyer he knew. Paul gave his home phone number in case Richard felt he could help.

Richard eagerly picked up the phone and dialed. After a brief conversation, Paul agreed to have lunch with him the next day. He sounded extremely relieved and grateful.

The next day, as Richard was driving to the restaurant, he barely avoided hitting an old man on the street. He felt extremely upset by the incident, and had three drinks at the restaurant. When Paul arrived Richard was fairly drunk. After the food came, Richard spilled a cup of coffee on Paul. Paul seemed very annoyed by this so Richard offered to drive him home for a change of clothes.

When Paul walked into the bedroom and found Sarah with another man he nearly had a heart attack. Then he realized what a blessing it was. With Richard there as a witness, Sarah's divorce case was shot. Richard congratulated Paul and suggested that they celebrate at dinner. Paul was eager to comply.

After analysing the fourth paragraph, one of the questions BORIS was asked was: "Why did Richard spill the coffee?". BORIS was able to make the causal connection, so it answered: "RICHARD WAS DRUNK." The fifth paragraph states that Paul nearly had a heart attack, but it doesn't say explicitly that he was surprised. BORIS was able to understand that the effect of what the husband saw was for him to be surprised. The question "What happened to Paul at home?" was answered: "PAUL CAUGHT SARAH COMMITTING ADULTERY." Then it was asked: "How did Paul feel?", and the answer was: "PAUL WAS SURPRISED." Next, BORIS was asked: "Why did Sarah lose her divorce case?", which informs the program that she did lose the case indeed. BORIS answered: "SARAH COMMITTED ADULTERY." Then BORIS was asked: "Why did Richard congratulate Paul?", and it gave this reply: "PAUL WON THE DIVORCE CASE." That is to say, it was considered to be foregone. Actually, such a finding in court cannot be taken for granted, before the adjudication is made. Judges would be unimpressed with a party seen to consider the conclusion foregone. But Dyer (1983a, p. 22) does point out indeed that "In DIVORCE-1 the husband wins although the characters never actually get to court." Presumably Sarah is convinced to settle without litigating, and accepts her loss. By contrast (ibid.), "In DIVORCE-2 the characters all appear in court and the husband loses." That second narrative is quoted below (Dyer, 1983a, pp. 19-20):

George was having lunch with another teacher and grading homework assignments when the waitress accidentally knocked a glass of coke on him. George was very annoyed and left refusing to pay the check. He decided to drive home to get out of his wet clothes.

When he got there, he found his wife Ann and another man in bed. George became extremely upset and felt like going out and getting plastered.

At the bar he ran into an old college roommate David, who he hadn't seen in years. David offered to buy him a few drinks and soon they were both pretty drunk. When George found out that David was a lawyer, he told him all about his troubles and asked David to represent him in court. Since David owed George money he had never returned, he felt obligated to help out.

Later, David wrote to Ann, informing her that George wanted a divorce. Her lawyer called back and told David that she intended to get the house, the children and a lot of alimony. When George heard this, he was very worried. He didn't earn much at the junior high school. David told him not to worry, since the judge would award the case to George once he learned that Ann had been cheating on him.

When they got to court, David presented George's case, but without a witness they had no proof and Ann won. George almost had a fit. David could only offer George his condolences.

#### 5.2.9.5 Thematic Abstraction Units (TAUs) in Dyer's BORIS

In Dyer's BORIS, thematic abstraction units (TAUs) are abstractions of situations, such that some planning and expectation failure occurs. These are situations that oftentimes are captured by an adage. For example, the situation of an employee who

is unsatisfied with work conditions, seeks another job, and is offered one elsewhere, and then his original boss offers some improvement, but the employee has already made his or her mind, is captured by the adage "Closing the barn door after the horse", and corresponds to the pattern of TAU-POST-HOC (Dyer, 1983a, p. 29):

#### TAU-POST-HOC

- 1 x has preservation goal G active since enablement condition C unsatisfied.
- 2 x knows a plan P that will keep G from failing by satisfying C.
- 3 x does not execute P and G fails.
   x attempts to recover from the failure of G by executing P.
   P fails since P is effective for C, but not in recovering from G's failure.
- 4 In the future, x must execute P when G is active and C is not satisfied.

In the DIVORCE-1 story analysed by BORIS, the situation of Paul who hoped for a favour from the only lawyer he knew, Richard, an old friend who turns out to be willing to extending a helping hand, is captured by TAU-DIRE-STRAITS as well as by the adage "A friend in need is a friend indeed" (Dyer, 1983a, p. 36):

## TAU-DIRE-STRAITS

x has a crisis goal G.

x has experienced a planning failure

(i.e. x can't resolve the crisis by himself).

- x seeks a friend y to be his agent
  - (since y knows what plans to execute).

This TAU has the following affective expectations associated with it:

x is uncertain whether y will be able to help. If y agrees to help Then x will have a positive affect toward y Else x will have a negative affect (possibly toward y).

#### 5.2.9.6 Other Kinds of Knowledge Sources in BORIS

Dyer's BORIS knows about various kinds of affect. Moreover, there are such empathetic situations that a character expresses, either to himself or herself, or to another character, the reaction that the former feels concerning a goal situation affecting the second character. Such situations are represented as ACEs, i.e., Affect as a Consequence of Empathy (Dyer, 1983a, p. 121). When the interpersonal theme (IPT) is those two characters, x and y, being friends,

```
(IPT-FRIENDS x y)
relevant ACEs include commiserate or condole, whose representation is
x MTRANS
TO y
that [goal failure (y)
causes: x feel NEG ]
as well as felicitate or congratulate, whose representation is:
x MTRANS
TO y
that [goal success (y)
causes: x feel POS ]
```

Vice versa if the theme is (IPT-ENEMIES x y), whose relevant ACEs are gloat if the enemy experiences a goal failure, or envy or spite if the enemy experiences a goal success. Regardless of the theme, another ACE is *reassure*, whose representation is:

x MTRANS TO y that [y should feel POS in spite of active goal p-goal or goal failure ]

BORIS also includes role theme information, such as RL-TEACHER, being role theme information about teachers. When analysing some given event, BORIS searches knowledge structures associated with that role theme, when a character who is a teacher is involved (Dyer, 1983a, p. 152).

There are in BORIS knowledge structures organised like a MOP, but which are about interpersonal situations. Such is the case of IP-FAVOR. There are two roles: person-a and person-b. Here again, like in a MOP, The roles into which characters fit are written at the top of a box encompassing the MOP. Under the role, the goals of that role appear in a column. Between role-columns, a column of plans appears. The goals are connected to plans by I-links. In IP-FAVOR, person-a's goal WANT-FAVOR intends plan ASK-FOR-FAVOR (with "invoke ipt", i.e., invoke an interpersonal theme: see below).

In turn, ASK-FOR-FAVOR intends PERSUADED. At PERSUADED, there also is an incoming arrow labeled "thm" (i.e., *thematic link*), from personb's RELATIONAL-OBLIGATION (which is treated like a goal). PERSUADED motivates plan DO-FAVOR (agency), which achieves person-a's goal WANT-FAVOR, and also motivates person-a's own RELATIONAL-OBLIGATION. When person-b's goal WANT-RETURN-FAVOR is active, it intends plan ASK-FOR-RETURN-FAVOR, which motivates PERSUADED, which is linked by "thm" to person-a's RELATIONAL-OBLIGATION, and moreover intends plan DO-RETURN-FAVOR (agency), and this in turn achieves person-b's goal WANT-RETURN-FAVOR (Dyer, 1983a, p. 282).

Interpersonal themes (IPTs) are frequent in social situations. For example, in the story about Paul's anxiety while expecting a divorce, and his getting help from

his old friend, the lawyer Richard, "Richard hadn't heard from his college roommate Paul for years" triggers in BORIS a suspension of an interpersonal theme (SUSPEND-IPT). Richard having borrowed money from Paul that then he didn't return, involves IP-FAVOR. The arrival of Paul's letter and Richard being anxious to find out how Paul was involves interpersonal communication: IP-COMM, and also the MOP for a letter, M-LETTER, is triggered. "Unfortunately, the news was not good" triggers IP-EMPATHY. Paul hoping for a favour triggers again IP-FAVOR. Paul agreeing to have lunch with Richard, after the long time they hadn't been in contact, triggers RENEW-IPT. Richard offering to drive Paul home triggers IP-FAVOR (ibid., p. 294).

Paul finding his wife Sarah with another man triggers IPT-LOVE violation, which is not the same thing as the violation of the marriage contract, which is legal rather than social. Richard congratulating Paul triggers IP-EMPATHY (ibid., p. 294). This is when it is clear that as there is an eyewitness to her adultery, other than her husband, Sarah would better settle her divorce.<sup>39</sup> The suggestion that the two friends should celebrate at dinner triggers IP-SOC, an interpersonal theme that takes care of the fact that interpersonal relationship change over time (ibid., p. 291). There is a cycle – Dyer called it the *Ip-cycle* (ibid., p. 292) – that starts when INIT-IPT turns the interpersonal theme into being active. Then SUSPEND-IPT may intervene, that renders it inactive. From there, RENEW-IPT may make it active again. At any rate, when an interpersonal theme is active, is may be redefined, and REDEFINE-IPT takes care of that in BORIS (ibid., p. 292).

RELs, i.e., relations, are another kind of structure: "Marriages are complex knowledge structures in that they create many social, interpersonal, affective, legal and thematic expectations. In BORIS, the relationship of marriage is represented by R-MARRIAGE, which contains both interpersonal and social dimensions" (ibid., p. 229). Two given characters, a man and a woman, may be involved in, e.g., a marriage relationship, R-MARRIAGE, whose instance will be, e.g., R-MARRIAGE0 between ANN0 and GEORGE0 (ibid., p. 188).

"The termination of the interpersonal theme IPT-LOVERS causes emotional turmoil, such as guilt and jealousy, while the termination of the marital contract

<sup>&</sup>lt;sup>39</sup> Marital infidelity fits in another kind of legal narrative as well, namely, as motive for crime against one's spouse. Allen and Pardo (2007a, pp. 119–123) offered a critique, in terms of the *reference-class problem* (see Section 2.4 above) of how probability theory was applied to juridical proof concerning infidelity in Davis and Follette (2003, 2002). Also Friedman and Park (2003) criticised (but Allen & Pardo believe they did not go far enough) the conclusions and choice of base rates in the calculations in Davis and Follette (2002). The latter (discussing a simplified example in order to discuss a real case) purported to demonstrate quantifying the value of evidence, as illustrated on the value of a defendant's infidelity in the murder of his wife, claiming that such infidelity is not probative of whether a man murdered or will murder his wife. In the real case, the prosecution had relied heavily on motive evidence, claiming the the defendant had deliberately drowned his wife once they had fallen into the ditch. The prosecution claimed that the husband may have somehow caused the crash, and that he faked his being unconscious or unable to breathe when paramedics arrived. Davis and Follette (2003) adjusted their analysis, in reply to the criticism of Friedman and Park (2003). This however did not satisfy Allen and Pardo (2007a), who also criticised (ibid., p. 123, fn.19) Kaye and Koehler's (2003) criticism of Davis and Follette (2002).

causes legal turmoil, such as alimony and custody battles" (ibid., p. 229). *Life themes* were admittedly not dealt with in BORIS; in marriage, life-theme aspects involve courtship, engagement, the wedding, and birth and rearing of children (ibid., pp. 46, 229).

The various kinds of knowledge sources in BORIS are connected in a Knowledge Dependency Graph, as shown in Fig. 5.2.9.6.1. "Knowledge structure dependencies help in the recognition process (ibid., p. 173), as the set of links in that graph "serves as a constraint on processing effort and makes predictions concerning both processing and memory" (ibid.). There are knowledge interaction demons, but "only a portion of such demons is ever active at one time, since the number of links emanating from a given knowledge structure is rarely more than six" (ibid.). This makes the system more efficient. Two consequences of that constraint are that: "A greater amount of processing effort will be expended on those knowledge sources with the most connections in the Knowledge Dependency Graph" (ibid.), and that: "Since BORIS only checks for one fourth of all possible knowledge interactions, any story containing interactions which do not fit the ones predicted by the KS-Graph will be both a) more difficult to understand, and b) more difficult to recall" (ibid., p. 174).

"Main scenarios consist of settings in which the major events of the story occur" (ibid., p. 256). "Transition scenarios arise whenever a character moves from one main scenario to another" (ibid.). "Mental scenarios come about when

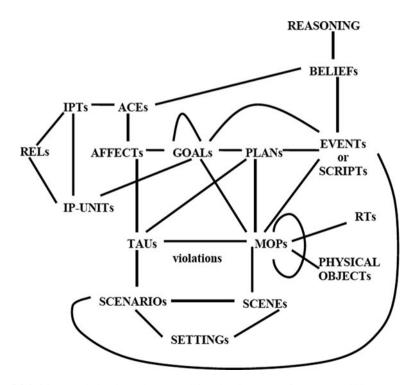


Fig. 5.2.9.6.1 Knowledge dependency graph in BORIS, redrawn from Dyer (1983a, p. 171)

Fig. 5.2.9.6.2 The MOP for a legal dispute in BORIS,

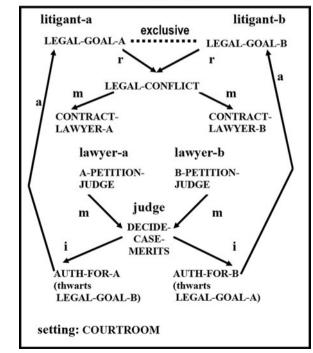
redrawn from Dyer (1983a,

p. 237)

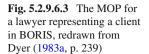
two characters communicate with one another across scenario boundaries", such as when in one of the divorce stories, Richard opened Paul's letter: "the content of Paul's letter forms a mental scenario" (ibid.).

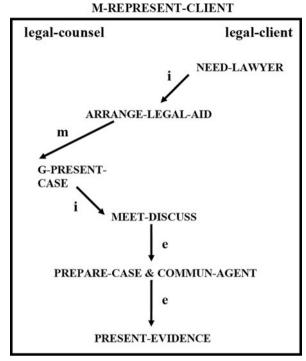
"Main scenarios organize episodes which occur within the same spatiotemporal setting. BORIS uses scene information [in] each MOP to decide when to instantiate a scenario" (ibid., p. 259). The scenes SC-OUTSIDE-COURT and SC-COURTROOM are contained in the MOP whose name is M-LEGAL-DISPUTE. When analysing one of the divorce stories, as BORIS reads "When they got to the court", the program "searches for a MOP associated with the courtroom setting. Once M-LEGAL-DISPUTE is found, BORIS instantiates a new scenario with SC-COURTROOM as one of its scenes" (ibid., p. 260). Figure 5.2.9.6.2 shows the MOP from BORIS for a legal dispute, namely, M-LEGAL-DISPUTE.

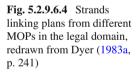
Again from BORIS, Fig. 5.2.9.6.3 shows the MOP for a lawyer representing a client; of course if the application is intended for use by a professional in the legal domain, one can be expected to take issue with the last plan, PRESENT-EVIDENCE, at the bottom of the box (it has an incoming enablement arrow). A lawyer would rather organise the evidence, which will be delivered by witnesses in court or will result from the documents (which may be pointed to from the witnesses statements), and the lawyer would eventually sum things up while eventually arguing the case. Figure 5.2.9.6.4 shows how, in BORIS, strands link the plans among three different MOPs in the legal domain.

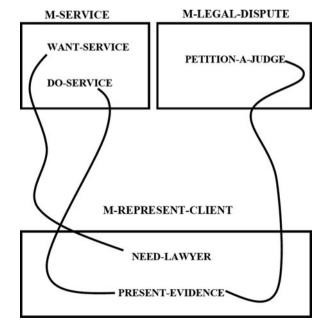


#### M-LEGAL-DISPUTE









#### 5.2.9.7 Contractual Situations and Shady Deals in STARE

The STARE system was described by Seth R. Goldman, Michael G. Dyer, and Margot Flowers (1985, 1987, 1988). The computational model was of the cognitive processes involved in remembering, recalling, and applying past experiences in new situations. Issues of recalling past cases were admittedly in the context of first-year law students learning contract law. The input is one-paragraph text, describing a contractual situation. Sometimes, the situation described concerned an unlawful deal. At any rate, it was the task of STARE to determine whether or not a contract actually exists under the principles of contract law. One case is *Merchant v. Vacationer:* "O'Hara, a police officer on vacation in Florida, promises Alfred, a store owner, that he will keep an eye on Alfred's store during Alfred's lunch hour if Alfred will pay him \$10. Alfred agrees to pay O'Hara \$10.". Goldman, Dyer, and Flowers (1987, section 1.1) explained:

Is there a contract in this situation? Answering this question requires (1) knowledge about social roles such as policemen, store owners, and public servants, (2) what effect being "on vacation" has for O'Hara, (3) what it means to "promise" to do something, (4) what it means "to keep an eye" on something, and (5) what it means to agree to something. In addition, there are many inferences we can make. One such inference is that O'Hara wants to earn some money while on vacation.

*Merchant v. Vacationer* was contrasted to *Merchant v. Copper:* "Fred, a police officer, promises Barney, a merchant who owns a store on Fred's beat, that he will keep an eye on Barney's store if Barney pays him \$50 per month. Barney agrees to pay Fred \$59 per month." In this other situation, something is very wrong. There is a conflict arising from Fred's actions. This policeman is extracting money from Barney, in order to do something he is already supposed to do. Another shady deal is *Witness v. Citizen:* "John promises to tell the truth in court if Mary will promise to pay John \$100. Mary promises to pay John \$100." This is somewhat similar to *Merchant v. Copper,* because a witness is under obligation to tell the truth, and yet this witness is extracting money from somebody, so he will say in court whatever he is going to say. In processing the input of *Witness v. Citizen,* STARE represented John's offer as follows (Goldman et al., 1987, section 1.2), based on Conceptual Dependency theory:

INPUT:	(MTRANS	ACTOR	(HUMAN	J N	AME	C	Johr	1	
				G	ENI	DER	MALE	2)	
		TO	(HUMAN	JN	AME	C	Mary	7	
				G	ENI	DER	FEMA	LE)	
		OBJ (1	MTRANS	ACT	OR	Mar	ŶУ		
				ТО		Joh	n		
				OBJ	. (	ATF	RANS	ACTOR	Mary
								ТО	John
								OBJ	\$100
								TIME	Future
	)		)		)				

```
--- result motivates -→

(MTRANS ACTOR John

TO Judge & Jury

OBJ (MENT-OBJ STATUS true)

TIME Future

)
```

When generating the output, a trace of the program run is produced. The input is processed, and a type of common sense OFFER is recognized. Then demons (i.e., agents) are spawned to determine if this is a Legal OFFER. In particular, the demons activated are CHECK-OFFEROR-RIGHTS and CHECK-OFFEREE-RIGHTS. Of these, it results from CHECK-OFFEROR-RIGHTS that John already has a DUTY to tell the truth. Thus, on that count, the input fails. The indexing of this input episode is done, by using the failure of CHECK-OFFEROR-RIGHTS. During the indexing, STARE is reminded of *Merchant v. Copper.* STARE attempts to generalise from reminding. But no common features are detected. Then expectation demons from OFFER are spawned, and these demons include EXPECT-ACCEPT and EXPECT-REJECT. Then comes the end of the conceptualisation.

In *Witness v. Citizen*, STARE's decision is as follows (Goldman et al., 1987, section 1.2):

OUTPUT:

DECISION: There is no contract between John and Mary. REASONS: John's offer was not a legal offer because John already has a DUTY to tell the truth in court. Mary's acceptance was not legal because there was no preceding legal offer. REMINDINGS: Merchant v. Copper

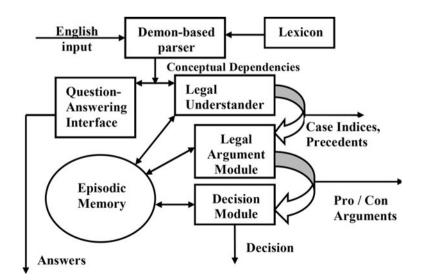


Fig. 5.2.9.7.1 The architecture of STARE (redrawn from Goldman et al., 1987)

STARE was reminded of *Merchant v. Copper* while processing *Witness v. Citizen*, because there is a conflicting duty for the offeror in both cases. The architecture of STARE is shown in Fig. 5.2.9.7.1, being redrawn from Goldman et al. (1987).

# 5.2.10 SWALE and Related Systems for Generating Explanations from Precedents

Alex Kass at Yale in the late 1980s developed SWALE, a case-based tool for understanding with explanation patterns. SWALE is a system that generates explanations for unusual death stories; its perspective within case-based reasoning is one of explaining out anomalies (Kass, 1990; Kass, Leake, & Owens, 1986). Alex Kass also developed TWEAKER and ABE, for adapting explanations in order to develop hypotheses for understanding (Kass, 1990, 1992, 1994). Ashwin Ram, at Yale in 1989, developed the AQUA project, in case-based explanation: the story understanding was driven by questions asked (Ram, 1989, 1994). Around 1990, David Leake, also at Yale, developed *Accepter*, a theory and tool for evaluating explanations (Leake, 1992, 1994). Chris Owens, also at Yale in the same period, developed *Retriever* and *Anon*, tools for indexing and retrieving planning knowledge from memory, in the perspective of case-based explanation and automated understanding (Owens, 1990, 1994).

In the book *Inside Case-Based Explanation*, edited by Schank, Kass, and Riesbeck (1994), Part I is a condensation of Schank's book (1986) *Explanation Patterns*. Part II of the book *Inside Case-Based Explanation* comprises chapters 3–9, and is an application of the theory. In particular, chapter 3 provides an overview of SWALE, because of its historical importance, as being a computer program that generates explanations by retrieving, instantiating, and adapting *explanation patterns* (*XPs* for short). Part III supplies the code, in Common Lisp, of a miniature version of SWALE. The code of the miniature is annotated.<sup>40</sup> Chapters 4–9 in Part II of *Inside Case-Based Explanation* describe in detail individual systems that relate to specific parts of SWALE (these, too, are covered in the code of the miniature in Part III). Of these chapters, Chapters 4 and 5 are about how to retrieve from memory relevant precedents, which here are previous explanations.

How to determine the appropriate abstraction level for the memory indices that enable case retrieval is the subject of chapter 4 of *Inside Case-Based Explanation*. Whereas highly abstract indices can be very powerful for retrieving relevant cases, how to accurately ascribe such abstract indices to an input case comes at a high cost. The information in an input case, the way it is found there, is not necessarily a good indicator for retrieval, and this is especially true when cases from a variety of domains are stored. Chapter 4, concerned with the *Anon* system for retrieving explanations, proposes that the appropriate level of abstraction for indices, so that explanations be generated for planning anomalies, is the level typically captured in

<sup>&</sup>lt;sup>40</sup> The code of a version of SWALE in miniature, Micro SWALE, is accessible on the Web at http:// www.cs.indiana.edu/~leake/cbr/code/

proverbial advice. There is a long tradition for using chunks of common sense at the level of adages (proverbs) for planning advice, when dealing with planning failures, in Roger Schank's *conceptual dependency* school of automated understanding of narratives, and this was especially the case of Michael Dyer's BORIS system, which used TAUs, i.e., thematic abstraction units (Dyer, 1983a, 1983b). Also note that at UCLA in 1991, John Reeves, supervised by Michael Dyer, developed THUNDER (Reeves, 1991): it was a program interpreting funny situations as plan failure (it was described as irony, but this is not precise, and was a misnomer indeed; rather, what thunder was concerned with was the workings of what makes stories from a given category funny).

Chapter 5 of the book *Inside Case-Based Explanation* is about the *Abby* system, in which stories about social situations are represented. The concern of chapter 5 is with the indexing vocabulary required for explanation retrieval. Much domain-specific knowledge is required. Chapter 6 is about the *Accepter* system, and is concerned with how, given an anomalous situation, to automatically evaluate the appropriateness of a retrieved candidate explanation. Such retrieved explanations are indexed under the same anomaly type as the current problem for which an explanation has to be generated. The proposed model of evaluation is context-sensitive, and based on what the current goals of the automated reasoner are. For anomaly detection and explanation, a recursive model is proposed in chapter 6 of *Inside Case-Based Explanation*.

Chapter 7 of that same book is about the AQUA system (Ram, 1994), embodying an approach to the generation of explanations that is based on a mechanism for question asking and answering. The questions are classified according to various kinds of knowledge goal of the understanding agent. The questions themselves are represented as memory structures, and they specify both knowledge requirement and the intended purpose of such knowledge once it is obtained. The model of explanation is recursive. In fact, answering can span further questions. Ashwin Ram (1994) "propose[d] the following taxonomy of knowledge goals for story understanding":

*Text goals*: Knowledge goals of a text analysis program, arising from text-level tasks. These are the questions that arise from basic syntactic and semantic analysis that needs to be done on the input text, such as noun group attachment or pronoun reference. An example text goal is to find the referent of a pronoun.

*Memory goals*: Knowledge goals of a dynamic memory program, arising from memorylevel tasks. A dynamic memory must be able to notice similarities, match incoming concepts to stereotypes in memory, form generalizations, and so on. An example memory goal might be to look for an event predicted by stored knowledge of a stereotyped action, such as asking what the ransom will be when one hears about a kidnapping.

*Explanation goals*: Goals of an explainer that arise from explanation-level tasks, including the detection and resolution of anomalies, and the building of motivational and causal explanations for the events in the story in order to understand why the characters acted as they did or why certain events did or did not occur. An example explanation goal might be to figure out the motivation of a suicide truck bomber mentioned in a story.

*Relevance goals*: Goals of any intelligent system in the real world, concerning the identification of aspects of the current situation that are "interesting" or relevant to its general goals. An example is looking for the name of an airline in a hijacking story if the understander were contemplating travelling by air soon.

Moreover, the *explanation patterns (XPs)*, which in AQUA have four components, in AQUA were defined by Ram (1994) as follows<sup>41</sup>:

- *PRE-XP-NODES*: Nodes that represent what is known before the XP is applied. One of these nodes, the EXPLAINS node, represents the particular action being explained.
- *XP-ASSERTED-NODES*: Nodes asserted by the XP as the explanation for the EXPLAINS node. These comprise the premises of the explanation.
- *INTERNAL-XP-NODES*: Internal nodes asserted by the XP in order to link the XP-ASSERTED-NODES to the EXPLAINS node.
- *LINKS*: Causal links asserted by the XP. These taken together with the INTERNAL-XP-NODES are also called the internals of the XP.

An explanation pattern is a directed, acyclic graph of conceptual nodes connected with causal LINKS, which in turn could invoke further XPs at the next level of detail. The PRE-XP-NODES are the sink nodes (consequences) of the graph, and the XP-ASSERTED-NODES are the source nodes (antecedents or premises). The difference between XP-ASSERTED-NODES and INTERNAL-XP-NODES is that the former are merely asserted by the XP without further explanation, whereas the latter have causal antecedents within the XP itself. An XP applies when the EXPLAINS node matches the concept being explained and the PRE-XP-NODES are in the current set of beliefs. The resulting hypothesis is confirmed when all the XP-ASSERTED-NODES are verified.

Chapter 8 of *Inside Case-Based Explanation* is about the TWEAKER system, embodying an approach to the adaptation of retrieved explanations. Such modification of explanations is done by selecting and applying retrieval strategies. These retrieval strategies are themselves stored in memory, and have to be retrieved. Chapter 8 is mainly concerned with classifying adaptation strategies (avoiding overly general strategies, which tend to be unreliable, or overly specific stategies, that tend to have just limited applicability), rather than how to select one such strategy that is appropriate.

- An adaptation strategy in TWEAKER may be to *generalise*. This is appropriate when (according to AQUA's classification of general causes of explanation failure) the system has encountered a *novel situation*.
- Another adaptation strategy in TWEAKER is to *substitute*. This is appropriate when the general cause of failure is having an *incorrect model*.
- Yet another adaptation strategy in TWEAKER is to *specialise*. This is appropriate when the general cause of failure is *misindexing* of knowledge stored in memory.

Chapter 9 of *Inside Case-Based Explanation* is about the *Brainstormer* system for plan adaptation (rather than the adaptation of explanations). Abstract planning advice at the level of proverbs is stored in memory, and *Brainstormer* has to apply

<sup>&</sup>lt;sup>41</sup> Ram (1994) provided as an example XP-RELIGIOUS-FANATIC for explaining suicide bombings, and noted the interest of a story (from newspaper news from 1985) where the prospective perpetrator was not a fanatic, but was motivated by blackmail.

such advice to some planning problem at hand. This is done by resorting to a process of *lambda abstraction*, by which the given problem is restated in terms of the abstract plan vocabulary. In order to achieve this, in memory there are rules about how to recognise instances of a given abstract concept. As by redescribing one may obtain intermediate rather than final concepts, the mechanism – here, too – is recursive. The intermediate concepts are then redescribed, again via the process of lambda abstraction. Besides, as some proverbs contradict each other, one has to resolve this ambiguity by considering in detail the specific planning situation.

## 5.2.11 Input from Earlier Research into More Recent Research in Automated Story Understanding

In 1996, Michael Cox from Georgia Tech in Atlanta reported (Cox, 1996a) about Meta-AQUA. It involved introspective multistrategy learning, and an empirical study of TALE-SPIN stories. Cox (n.d., section 5.2) remarked:

Each anomaly in a story represents a source of knowledge discrepancy for Meta-AQUA and a potential explanation target. For each anomaly up to three points are awarded: one point for identifying that a question needs to be posed, a second for providing any explanation, and a third for matching the "correct" explanation as enumerated by an oracle. With this or any like function, the evaluator should generate a real number between 1 and 0. Then to normalize the explanation criterion with performance (given a performance measure also between 1 and 0), it is sufficient to calculate performance/(2–explanation). [...]. Without the incorporation of self-explanation into the overall performance measure, many metareasoning implementations can simply optimize performance first and then sprinkle on a bit of meta-sugar after the fact.

The project of Cox was in story understanding, whereas TALE-SPIN had been a fable-like story generator (Meehan, 1976, 1981a, 1981b) from Yale University's conceptual dependency school. During the 1990s, also at Georgia Tech, the ISAAC model (and functional theory) of creative reading was developed by Kenneth Moorman (1997; cf. Moorman & Ram, 1994).

Cox's research is into metacognition in computation, self-aware cognitive agents, and learning strategies under reasoning failure.<sup>42</sup> The level of doing is the *ground level*. The level of reasoning is the *object level*. The level of metareasoning is the *meta-level*. The ground level provides the object level with *perception*. The object level provides the ground level with *action selection*. The meta-level *controls* the object level, but is *monitored* by it as well.<sup>43</sup> Cox (2007b, section 1) explained:

If the reasoning that is performed at the object level and not just its results is represented in a declarative knowledge structure that captures the mental states and decision-making

<sup>&</sup>lt;sup>42</sup> Cox (1994, 1996a, 1996b, 2005, 2007a, 2007b). Cox and Raja (2007), Cox and Ram (1999).

<sup>&</sup>lt;sup>43</sup> In the conclusions, Cox (2007b) lists some hard problems for building autonomous agents endowed with metareasoning, including the *Homunculus Problem:* "How can we effectively control metareasoning without substituting yet another computational layer above the meta-level?"

#### 5.2 An Overview of Artificial Intelligence Approaches to Narratives

sequence, then these knowledge structures can themselves be passed to the meta-level for monitoring. For example the Meta-AQUA system [Cox & Ram (1999)] keeps a trace of its story understanding decisions in structures called a Trace Meta-eXplanation Pattern (TMXP). Here the object-level story understanding task is to explain anomalous or unusual events in a ground-level story perceived by the system. Then if this explanation process fails, Meta-AQUA passes the TMXP and the current story representation to a learning subsystem. The learner performs an introspection of the trace to obtain an explanation of the explanation failure called an Introspective Meta-eXplanation Pattern (IMXP). The IMXPs are used to generate a set of learning goals that are passed back to control the object-level learning and hence improve subsequent understanding. TMXPs explain *how* reasoning occurs; IMXPs explain *why* reasoning fails.

Unfortunately these meta-explanation structures are so complicated that, although they have been shown empirically to support complex learning, they cannot be easily understood by humans. Indeed before I demonstrate the Meta-AQUA system to others, I often spend twenty minutes reviewing the TMXP and IMXP schemas, so that I can answer questions effectively. However I claim that all metareasoning systems share this characteristic. The kinds of recursive processing an agent must do to perform metareasoning (e.g., within the metacognitive loop of [Anderson & Perlis (2005)]) and the types of knowledge structures used to support metareasoning (e.g., the introspective explanations in [Raja & Goel (2007)] or [Fox & Leake (2001)]) produce a severe cognitive demand on even the most sophisticated observer. What is required is the implementation of an infrastructure to support interactive explanation of an agent's own reasoning.

Apart from Cox's Meta-AQUA, another project that resorted to concepts from much older research, is the resurrection of Lehnert's (1982) plot units in a project reported about by Appling and Riedl (2009). Their project is in *plot summarisation:* 

We are developing a system to learn from readers how to automatically reason about plot unit summarization involved in single character narratives. These stories are aggregations of temporally ordered *events*. There are however events that different readers might leave out if they were summarizing a story to another person. Taking into account this nature, and that of plot units i.e. their implicit summarization, it inherently follows that not all events of a story should necessarily be kept in a summary. That is, only the most important events would be kept to preserve the high-level principles of the original story and these should correspond to Lehnert's complex plot units. As we build a corpus of stories to train our plot units system with we used the notion of story *interpretations* as another useful abstraction that allows our system to work with different views of a single story, these result in unique subsets of events from an original story. We focus on learning and reasoning on the level of interpretations but unabridged stories are also supported.

For that purpose, Appling and Riedl (2009) resort to probabilistic machine learning techniques:

Since the primary work in this paper is the identification of representations that can be used for learning to summarize plots we are interested in the class of machine learning frameworks dealing with probabilistic graphical models. These frameworks can model sequential domains in an accessible and tractable way, important for achieving useful results in a short amount of time. Concerning plot units, they have many interesting properties: temporality, event relatedness, and interpretability. These are properties that can be easily exploited by probabilistic graphical models such as Hidden Markov Models,<sup>44</sup> Markov Random Fields,<sup>45</sup> and Conditional Random Fields [...]

For a given story, a story graph is constructed, and areas within the graph may provide alternative interpretations. This is something that already Tapiero, den Broek, and Quintana (2002) have discussed: the mental representation of narrative texts as networks, and the role of necessity and sufficiency in the detection of different types of causal relations. The purpose of that study was "to determine how the perceived strength of 4 types of causal relations (physical causality, motivation, psychological causation, and enablement) is affected by causal properties (i.e., necessity and sufficiency) and by distance in the text surface structure".

## 5.2.12 Other Systems for Automated Story Understanding

A former student of Michael Dyer, Erik Mueller (1998, 1999a), reported about *ThoughtTreasure*, involving plans, goals, emotions, grids, and simulation.<sup>46</sup> Also Mueller (1999b, 2002) dealt with story understanding. In 2003, then based at IBM Research, Mueller (2003, 2004a, 2004b, 2006, 2007) reported about a model-based story-understanding program, the model being constructed through multiple representations. Event calculus was the main representation, and satisfiability was a major concern of the project.

At the University of California at Berkeley, Srinivas Narayanan (1997) developed KARMA, a narrative-understanding model concerned with understanding metaphor and aspect, making use of *x*-schemas. Lynette Hirschman of MITRE developed *Deep Read*, a reading comprehension system (Hirschman, Light, Breck, & Burger,

<sup>&</sup>lt;sup>44</sup> "Hidden Markov Models (HMM) are probabilistic finite state automata that model the probabilities of a linear sequence of events. In a HMM, one only knows a probabilistic function of the state sequence through which the model passes. Given a training corpus in which the information is sequentially structured and which is manually annotated, efficient algorithms learn the probabilities of all transitions and emissions" (Stranieri & Zeleznikow, 2005a, Glossary).

<sup>&</sup>lt;sup>45</sup> Basically, a *Markov random field* is an undirected graph, that is to say, the edges between pairs of nodes are not arrows. Each node in a MRF can be in any of a finite number of states. The state of a node statistically depends upon each of its neighbours (i.e., those nodes to which the given node is connected by an edge), and upon no other node in the graph. A *propagation matrix*, symbolised as  $\psi$ , respresents the dependency between a node and its neighbours in the given MRF. Each case  $\psi(i, j)$  in the matrix has a value which is equal to the probability of a node *i* being in state *j* given that it has a neighbour in state *i*. If an assignment of states to the nodes in a MRF is given, then by using the propagation matrix it is possible to compute a likelihood of observing that assignment. The problem of inferring the maximum likelihood assignment of states to nodes, where the correct states for some of the nodes are possibly known beforehand, is solved by those using MRFs by resorting to heuristic techniques.

<sup>&</sup>lt;sup>46</sup> A quite useful resource, and one to which the present treatment of automated story processing owes much, is Erik Mueller's website (http://xenia.media.mit.edu/~mueller/storyund/storyres. html) on automated story understanding or generation.

1999). Machine learning<sup>47</sup> was applied to question-answering for reading comprehension tests, in a system from Singapore, *Aquareas*, reported about by Ng, Teo, and Kwan (2000). Ellen Riloff and Michael Thelen (2000), from the University of Utah, reported about a rule-based question answering system for reading comprehension tests.

The physical world in which narratives unfold was the concern of a spatiotemporal model from France, reported about by Gerard and Sansonnet (2000). It was a model for the representation of situations described in narrative texts that had to be analysed automatically. This was also a concern in Mueller (2007), an article about the modelling of space and time when understanding automatically narratives about restaurants.

At the University of Edinburgh, Harry Halpin under the supervision of Johanna Moore developed a system for plot analysis resorting to both symbolic semantic analysis and statistical analysis. The representation was the event calculus, and a method called *latent semantic analysis (LSA)* was used. The tool was a plot advice agent (Halpin, 2003; Halpin & Moore, 2010).

In 1989, the EL/Epilog/Ecologic project was developed by Lenhart Schubert and Chung Hee Hwang at the University of Alberta and the University of Rochester, in collaboration with Boeing. Episodic logic was applied to natural-language understanding (Schubert & Hwang, 1989, 2000). Kathleen Dahlgren and others at the University of Western Ontario in collaboration with IBM in 1989 developed KT, in which a logic-based knowledge representation was applied to commonsense reasoning for understanding texts automatically (Dahlgren, McDowell, & Stabler, 1989). Around 1990, TACITUS was developed by Jerry Hobbs and others at SRI in California; it resorted to a logic-based knowledge representations, and to weighted abduction, a concept related to explanation being generated as inference to the "best" explanation,<sup>48</sup> and quantified by means of weights (Hobbs, Stickel, Appelt, & Martin, 1993).

In 1993, Palmer, Passonneau, Weir, and Finin (1993) from Unisys reported about the KERNEL text understanding system, involving complex interaction between system modules. In 1995, Stuart Shapiro and William Rapaport from the State University of New York at Buffalo (Shapiro & Rapaport, 1995) reported about *SnePS/Cassie*, a "computational reader of narratives" handling beliefs and using a representation in terms of propositional semantic networks.

In 1993, Golden and Rumelhart (1993), from the University of Texas at Dallas and from Stanford, reported about a model working in situation-state space, and being a parallel distributed processing model of story comprehension and recall. Work by David Rumelhart<sup>49</sup> was historically important for cognitive and computational models of *story recognition* (Rumelhart, 1975, 1980a, 1980b), just as it was

<sup>&</sup>lt;sup>47</sup> For machine learning, see e.g. Mitchell (1997).

<sup>&</sup>lt;sup>48</sup> See Section 2.2.1.6 above.

<sup>&</sup>lt;sup>49</sup> David Rumelhart is a psychologist, and has collaborated across disciplines, with Jay McClelland (psychology), Geoffrey Hinton (artificial intelligence), and Paul Smolensky (physics, artificial intelligence).

## for *parallel distributed processing* (Rumelhart, Smolensky, McClelland, & Hinton, 1986c).

Recall from episodic memory is the task of REMIND, developed by Trent Lange and Charles Wharton at UCLA (Lange & Wharton, 1992). It involved spreading activation, inferencing, and disambiguation. Importantly, the application of connectionism (neural networks) to story-understanding emerged in those years. Charles Dolan developed at UCLA the CRAM project (Dolan, 1989), in which comprehension involved morals, and whose workings resorted to tensor manipulation networks. Also see the various articles collected in a volume, Connectionist Natural Language Processing, edited by Noel Sharkey (1992), and which I reviewed (Nissan, 1997d). Importantly, story-processing was involved, as Michael Dyer, at UCLA, had meanwhile turned to combining symbolic (old-fashioned AI) with neural processing while processing narratives; e.g., see Dyer (1991a, 1991b, 1995), Lee, Flowers, and Dyer (1992), and Dyer, Flowers, and Wang (1992). Trent Lange developed in 1989 at UCLA, under Dyer's supervision, the ROBIN project, that carried out inferencing in a connectionist networks for the purposes of narrative understanding (Lange & Dyer, 1989). Risto Miikkulainen, supervised by Dyer at UCLA, developed DISCERN, combining scripts with connectionism (Miikkulainen & Dyer, 1991; Miikkulainen, 1993). Nenov and Dyer (1993, 1994) presented a combined neural and procedural model of language learning.

In 1992, Mark St. John of Carnegie Mellon University presented the Story Gestalt model, combining scripts and connectionism for the purposes of the automated understanding of narratives (St. John, 1992). In 1995–1999, at the University of Chicago, Langston, Trabasso, and Magliano (1999) were working on a connectionist model of narrative comprehension, being a modified *construction-integration model*. Frank, Koppen, Noordman, and Vonk (2003), from Tilburg, Nijmegen, and the Max Planck Institute for Psycholinguistics, described a connectionist system carrying out knowledge-based inferences in story comprehension. The connectionist approach of this *Distributed Situation Space (DSS)* model was self-organising maps. A microworld was involved, and the representation was in a situation-state space.

## 5.2.13 Automated or Interactive Story Generation

Let us turn to making up a story interactively, with the help of a computer program. A conference session presentation in 2005 stated (Lönneker, Meister, Gervás, Peinado, & Mateas, 2005)<sup>50</sup>:

Currently, story generators enjoy a phase of revival, both as stand-alone systems or embedded components. Most of them make reference to an explicit model of narrative, but the approaches used are diverse: they range from story grammars in the generative vein to the conceptually inspired engagement-reflection cycle. Real-life applications include the generation of a set of plot plans for screen writers in a commercial entertainment environment, who could use the automatically created story pool as a source of inspiration, and the generation of new kinds of interactive dramas (video games).

<sup>&</sup>lt;sup>50</sup> By Birte Lönneker, also see Lönneker (2005) and Lönneker and Meister (2005).

Resolving a story while interacting is a problem, and influences how much freedom users are given (see, e.g., Sgouros, 1999). Cesare John Saretto (2001, p. 3) pointed out:

Let us consider an interactive detective story. The audience member is playing the role of a detective. The author intends for a crucial clue to be delivered to the player by a mobster near the end of the story. However, the mobster in question is also one of a group of mobsters who beat up the detective earlier in the drama for meddling where he didn't belong. During the beating, the player proves more skilled at defending himself than the author intended. He manages to draw his gun and mortally wound the mobster who is to later deliver the critical clue. Without the clue, the player will very possibly never be able to solve the case. If the author had intended for the resolution of his story to convey a message or moral, that resolution may never be reached, and the author's message will be lost. Indeed if the story being told was more educational in nature rather than entertaining, a loss of the message would defeat the purpose of telling the story. With no author present to fix a broken interactive narrative, the audience member become actor may quickly find himself in a boring and inconsistent universe without any hope of a meaningful resolution to the story. To avoid this situation we must answer two questions: where do we draw the line between the will of the user and the author's intended story, and how do we police such a line, once it is drawn?

The goal of providing animated life-like characters, so-called "believable embodied agents", in computer interfaces (as "embodied conversational characters") or virtual environments, has been quite conspicuously providing motivation for an increase in research into the simulation of emotion within computer science, and this in turn is important for processing narrative properly. "The time is ripe for AI to reengage narrative", Mateas and Sengers claim in an editorial capacity (Mateas & Sengers, 2003, p. 4). In fact, on occasion some paper in computational processing of narratives has appeared on the pages of the *Artificial Intelligence* journal, in the first decade of the new century (Callaway & Lester, 2002). Charles Callaway and James Lester (2001) had already reported about the *StoryBook* story-generation system.

It has been claimed that "[a]utomatic narrative generation systems can be classified as character-centric and author-centric techniques"; the former "tend to develop narratives with strong character believability but weak coherent plot lines", whereas "[a]uthor-centric systems tend to develop narratives with strong plot coherence but weak character believability" (Riedl, 2003).<sup>51</sup>

<sup>&</sup>lt;sup>51</sup> Mark Riedl, who claimed that much, tried to derive benefits from both techniques in a narrative generation system called Actor Conference. See Riedl (2003), where Riedl "informally evaluate[d] several narrative generation systems". Character-based interactive storytelling was the subject of Cavazza, Charles, and Mead (2001), Cavazza, Charles, and Mead (2002b). Riedl, Saretto, and Young (2003) were concerned with an approach for managing the interaction of human users with "computer-controlled agents in an interactive narrative-oriented virtual environment". Because of the requirement, for such systems, that "the freedom of the user to perform whatever action she desires must be balanced with the preservation of the storyline used to control the system's characters", they proposed *narrative mediation*, a technique "that exploits a plan-based model of narrative structure to manage and respond to users' actions inside a virtual world. We define two general classes of response to situations where users execute actions that interfere with story structure: accommodation and intervention. Finally, we specify an architecture that uses these definitions to monitor and automatically characterize user actions, and to compute and implement responses to unanticipated activity."

Historically, automated story-generation programs were inaugurated by TALE-SPIN, developed by James Meehan at Yale University, and involving the setting and achievement of goals and plans, and working by simulation (Meehan, 1976, 1981a, 1981b). Already Sheldon Klein's *Automated Novel Writer* (Klein, 1973) simulated the effects of generated events in the narrative universe.<sup>52</sup> That program used to generate crime stories (murder mysteries). It focused on generating proper sentences. The kind of approach to story-generation embodied in Klein's program is now called *author-centric*, but it had some *character-centric* sides to it as well. (By contrast, Meehan's TALE-SPIN focused on the characters, the goals they were given, and their rational behaviour. Meehan's characters could have one out of thirteen different emotional states, and their current emotional state affected the choices they were making.)

Author-centric features of Klein's program includes the fact it contained a set of rules about how events affect characters. Those events combine to generate a plot, and in every such plot, one out six available murder events occurs. There was little variation, because the scenarios were governed by a rigid structure. The character-centric aspect of Klein's program is that each character was assigned a numerical value for some traits. Based on past events, and on those character attributes, the program used to make choices concerning which events would occur. The following is a sample output from Klein's program:

JAMES WAS VERY RICH. CLIVE WAS IMPOVERISHED. CLIVE WANTED MONEY. THE BUTLER WAS RELATED TO JAMES. CLIVE THOUGHT THAT CLIVE INHERITED THE MONEY. CLIVE KNEW THAT JAMES DRANK A MILK. CLIVE POISONED THE MILK. JAMES DRANK THE MILK. JAMES WENT TO BED. JAMES DIED. THE OTHERS THOUGHT THAT JAMES WAS ASLEEP. THE BUTLER RETURNED THE BOTTLE. RONALD AWAKENED. RONALD GOT UP. RONALD THOUGHT THAT THE DAY WAS BEAUTIFUL.

<sup>&</sup>lt;sup>52</sup> As early as 1963, Sheldon Klein published about the computer coding of English words (Klein & Simmons, 1963a), and syntax and the computer generation of coherent discourse (Klein & Simmons, 1963b). Until he retired in 2003, Sheldon Klein was professor of both computer science and linguistics at the University of Wisconsin at Madison. He has researched analogical reasoning models (e.g., Klein, 2002), the generation of 3D virtual reality worlds using a meta-linguistic system, which can be configured to model a variety of theoretical linguistic models. It could be configured either as a machine translation system, or as a natural language interface to application command languages. Klein also researched the role of Boolean groups and analogy in complex behavioral systems, including the representation of categorial grammars.

RONALD FOUND JAMES. RONALD SAW THAT JAMES WAS DEAD. RONALD YELLED. THE OTHERS AWAKENED. THE OTHERS RAN TO RONALD. THE OTHERS SAW JAMES. EVERYONE TALKED. HEATHER CALLED THE POLICEMEN. HUME EXAMINED THE BODY. DR. BARTHOLOMEW HUME SAID THAT JAMES WAS KILLED BY POISON.

In 1983 at the University of Exeter, Masoud Yazdani reported about ROALD, an event generator in a fictional world of stories, also resorting to goals and simulation (Yazdani, 1983). Also in 1983, at Columbia University in New York, Michael Lebowitz reported about UNIVERSE, a story-generator making use of person frames, stereotypes, and memory of past events. Plots generated by UNIVERSE are for a never-ending soap-opera. In UNIVERSE, like in Sheldon Klein's program, each character was assigned a numerical value for some traits, but the approach to story-generation was author-centric. In 1984, William Chamberlain and Thomas Etter reported about the Racter project, in which syntax directives were resorted to in order to generate nonsensical sentences, such as "The policeman's beard is half constructed" (Racter, 1984).<sup>53</sup>

Erik Mueller's DAYDREAMER produced vindictive daydreams, related in the first person (Mueller & Dyer, 1985a, 1985b; Mueller, 1987, 1990). Such daydreams were "in reaction to being rejected for a date by a famous movie star. Daydreaming differs from storytelling largely in the number and types of problem constraints. One can daydream a ray gun that makes noisome children vanish; to use such a ray gun in a story would require some clever justification" (Turner, 1992, at section 13.3, p. 368). Whereas a daydream "can jump from topic to topic at the daydreamer's every whim", in contrast "a story must provide a constant and recognizable framework for the reader's understanding" (ibid., p. 369). Mueller and Dyer (1985a) explained:

DAYDREAMER is composed of:

- a scenario generator consisting of a *planner* (Fikes & Nilsson, 1971; Meehan, 1976) and *relaxation rules*,
- a **dynamic episodic memory** (Tulving, 1972; Kolodner, 1984) of experiences used by the scenario generator,
- a collection of *personal goals* (Maslow, 1943; Schank & Abelson, 1977) and control goals which guide the scenario generator,
- an **emotion component** in which daydreams initiate, and are initiated by, emotional states arising from goal outcomes, and
- domain knowledge of interpersonal relations and common everyday occurrences.

<sup>&</sup>lt;sup>53</sup> A website about Racter exists: "Racter FAQ", at http://www.robotwisdom.com/ai/racterfaq.html

Starting in 1987 up to 1990, three prototypes of ALIBI were developed under my own direction (see Section 2.2.2 above). ALIBI impersonates somebody trying to exonerate himself from a charge, by offering an exonerating explanation for the facts observed and listed in the charge. For example, robbery is blamed on an accident and on misunderstanding. I was quite interested in narrative-processing programs, but was soon convinced (by the comments of an important scholar at an international conference) that the project yielded promise in the domain of AI & Law. It is fair to say that ALIBI was a constrained kind of story-generation program: what is generated is exonerating explanations which are themselves narratives: ALIBI has oftentimes been referred to as a program making up excuses, but in fact in real life a person may give an exonerating explanation that is quite true, regardless of how believable it sounds at first).

ALIBI was first reported about in 1989. That was also the year when  $O_Z$ was launched at Carnegie-Mellon University in Pittsburgh, PA, and when at Yale University, Natalie Dehn, who already in 1981 had published about story-invention (Dehn, 1981), produced the definitive presentation of her Author system (Dehn, 1989). Author was based on reconstructive and dynamic memory. As to Oz, this is a tool for interactive drama. The intention was that stories generated would have rich characters, as this is known to be something from which traditional storytelling media draw their emotional power.  $O_z$  works with goals and emotions. Joseph Bates, Scott Reilly, and Bryan Loyall worked on that project, among others. See, e.g., Smith and Bates (1989), Bates, Loyall, and Reilly (1992), Reilly (1996), Loyall (1997), as well as Kantrowitz (1990). In Canada, at the University of Calgary, in 1992 Tony Smith and Ian Witten reported about TAILOR (Smith & Witten, 1992). TAILOR was a planner in story space (Phillips & Huntley, 1993). In 1993, Melanie Anne Phillips and Chris Huntley reported about the Dramatica project, embodying a theory of story.<sup>54</sup> In the early 1990s, at the University of California in Los Angeles, Scott Turner developed a famous story-generation program, MINSTREL. We are going to discuss it in Section 5.2.16.

Formal scenarios are the foundation of Boris Galitsky's *Scenario Synthesizer*, developed at Rutgers University (Galitsky, 1998, 1999). Like with Anthony Jameson's system, IMP, from the early 1980s (Jameson, 1983), the purpose of what Galitsky's program does is to control buyer's impression. But in Galitsky's program, it is narratives that are generated, whereas IMP only answered questions. At North Carolina State University, Charles Callaway developed the *Author/Story Book* project; his program plans sentences for narrative prose generation, and resorts to a functional systemic grammar (Callaway, 2000; Callaway & Lester, 2001, 2002). Stories about Little Red Riding Hood are generated. In their BRUTUS project, Selmer Bringsjord and David A. Ferrucci resorted to both frames and story grammars. BRUTUS generates narratives of betrayal (Bringsjord & Ferrucci, 2000).

In the late 1990s at MIT, under the supervision of Glorianna Davenport, Kevin Michael Brooks (1996, 1999, 2002) developed the *Agent Stories* project. It

<sup>&</sup>lt;sup>54</sup> See the Dramatica werbsite, at http://www.dramatica.com/

resorted to story agents in order to author story pieces, resulting in a *metalinear cinematic narrative*. Brooks has researched the construction of computational cinematographic narrative and developed a software tool, called *Agent Stories*, for assisting writers in the design and presentation of "nonlinear/metalinear narratives" (cf. Davenport et al., 2000).

Automated story-generation projects from the 2000s include MEXICA, developed by Pérez y Pérez and Sharples (2001), as well as Liu and Singh's MAKEBELIEVE (2002), and Mark Owen Riedl's FABULIST. The latter pays attention to both plot coherence and character believability (Riedl, 2004; cf. Riedl, 2003; Riedl & Young, 2004). Riedl, Rowe, and Elson (2008) presented "two intelligent support tools for the authoring and production of *machinima*. *Machinima* is a technique for producing computer-animated movies through the manipulation of computer game technologies. The first system we describe, *ReQUEST*, is an intelligent support tool for the authoring of plots. The second system, *Cambot*, produces *machinima* from a pre-authored script by manipulating virtual avatars and a virtual camera in a 3D graphical environment."

Heather Barber and Daniel Kudenko (2008) described the GADIN system (the acronym stands for *Adaptive Dilemma-based Interactive Narratives*). The method was claimed to be suitable for "any domain which makes use of clichéd story-lines". The particular application was "within the children's story domain of a dinosaur adventure". GADIN "automatically generates interactive narratives which are focused on dilemmas in order to create dramatic tension. The user interacts with the system by making decisions on relevant dilemmas and by freely choosing their own actions". Barber and Kudenko (2008)

introduce[d] the version of GADIN which is able to create a finite story. The narrative finishes – in a manner which is satisfying to the user – when a dynamically determined story goal is achieved. Satisfaction of this goal may involve the user acting in a way which changes the dispositions of other characters. If the user actions cause the goal to become impossible or unlikely then they cause the story goal to be re-selected, thus meaning that the user is able to fundamentally change the overall narrative while still experiencing a coherent narrative and clear ending.

At the University of Paris 8, Nicolas Szilas and Jean-Hugues Rety have developed the *IDtension* project. It studies graph-based narrative structures, considering minimal structure for stories (Szilas & Rety, 2004). Szilas had already published about interactive drama with nonlinearities (Szilas, 1999). Interactive drama was the subject of Brenda Laurel's dissertation of 1986 (Laurel, 1986), and of Weyhrauch's dissertation of 1997 (Weyhrauch, 1997). Several dissertations about automated story-generation have been discussed in the Netherlands in the 2000s; for example a master's thesis by Douwe Terluin (2008), supervised by Rineke Verbrugge at the University of Groningen, was concerned with how to separate paragraphs in generated stories, by using discourse structure. Michael Mateas explains (2005):

The alternative to the story graph is story management. The first story manager was proposed by Brenda Laurel in her thesis on interactive drama (Laurel), and further developed by AI research groups exploring interactive narrative. A story manager replaces the graph structure with a policy for story event selection. The author still creates the nodes of the story graph, where nodes represent story events such as scenes or individual character actions (depending on the granularity of global agency). However, rather than manually linking the nodes, that author instead creates a selection policy for story events; story events are activated as a function of the history of the story so far and the actions performed by the player. The story policy implicitly defines a story graph; theoretically, one can imagine unrolling the policy into a graph by recording the story function's response to all possible inputs (story histories + player action). The whole point of the story management approach, however, is to keep the graph implicit. By implicitly specifying graphs via a story policy, authors can create interactive stories that would be impractical to explicitly specify as graphs, and can thus create experiences with rich global agency.

The motivation for devising *story management* as an alternative to *story graphs* is in order to provide human players with *global narrative agency*. This has to be understood within the framework of the controversy concerning whether there should be a predefined narrative inside interactive computer games (Mateas, 2005):

For some designers and theorists, interactive story worlds are a holy grail of game design (e.g. Murray, Crawford), while for others narrative is antithetical to interactive experiences, destroying the high-agency, procedural potential of games (e.g. Eskelinen, Frasca). The heart of the tension between games and narrative lies in player agency. A player is said to have agency when she can form intentions with respect to the experience, take action with respect to those intentions, and interpret responses in terms of the action and intentions. Those who argue against narrative games point to the predetermined or predestined nature of narrative; strong narrative structures have complex sequences of cause and effect, complex character relationships and sequences of character interactions. Since player interaction can at any moment disrupt this narrative structure, the only way to maintain the structure is to remove or severely limit the player's ability to effect the structure. This eliminates so-called 'global' agency, forcing the player down a predetermined path. Thus ludologists argue that if narrative must inevitably mean a diminishment in player agency, it should not be used in game design.

Mateas pointed out that when he was writing that much, in 2005, extant story-based computer games appeared to be conforming with the *ludologist* position, in that "the story structure is completely fixed, or has an extremely simple branching structure. The player has local agency, that is, can move around the environment and interact with objects and non-player characters, but the narrative structure is a linear sequence of cut scenes unlocked during the gameplay" (ibid.).

Mateas (2005) contrasted two approaches to story management.<sup>55</sup> Mateas and Stern (2003) had developed *Façade*, an interactive drama whose story manager was *beat-based*, in the sense of *dramatic beats* as understood by McKee: beats are the smallest units of dramatic value change. "The desired story is modeled by one or more story value arcs (in *Façade*, the tension story value), and by declarative knowledge represented on each beat" (Mateas, 2005). By contrast, Bates (1992) and Weyhrauch (1997) had first defined the *search based drama manager* (*SBDM*). In the latter, a player's activity can cause *Player Moves* to happen. These are abstract plot points that depend upon the player's activity. The player experiences the world through a sequence of Player Moves. A Player Move is recognised

<sup>&</sup>lt;sup>55</sup> Apart from *Façade* and the SBDM approaches, yet another approach to story management was adopted in the IDA system by Magerko and Laifo (2003).

once the concrete activity accomplishes a plot point. That recognition in turn will cause the drama manager to project all possible future histories of Player Moves and System Moves. An evaluation function enables the drama manager to select its own next move: the SBDM, having recognised a Player Move, "evaluates the resulting total histories with the evaluation function, and backs these evaluations up the search tree (in a manner similar to game-tree search) to decide which system move to make next that is most likely to cause a good total story to happen" (Mateas, 2005).

In fact, the SBDM's task is to carry out *System Moves*, i.e., such actions that would encourage or obviate a Player Move. This can be displayed concretely by moving things around. But it can also consist of changing the goals of characters. "System Moves give the SBDM a way to warp the world around the player so as to make certain Player Moves more or less likely. Besides the System Moves, the author also provides the SBDM with a story-specific evaluation function that, given a complete sequence of Player and System Moves, returns a number indicating the 'goodness' of the story" (Mateas, 2005).

At the Universidad Complutense of Madrid, from 2004 a team has been active which comprises Federico Peinado, Pablo Gervás and others in the development of story-generation programs. They been dealing with creativity issues in story plot generation (Peinado & Gervás, 2005a). They applied ontologies to story-generation, when they reimplemented Scott Turner's originally Lisp-coded MINSTREL (see Section 5.2.16 below) in the formal semantics of the OWL Web ontology language (Peinado & Gervás, 2006a).<sup>56</sup> They also developed a description logic ontology<sup>57</sup> for the generation of fairvtales (Peinado, Gervás, & Díaz-Agudo, 2004). They applied case-based reasoning (CBR) to story plot generation (Gervás, Díaz-Agudo, Peinado, & Hervás, 2005; Díaz-Agudo, Gervás, & Peinado, 2004). Moreover, they resorted to CBR in an implementation, called *ProtoPropp*, of tale morphology  $\dot{a}$ la Vladimir Propp (Peinado & Gervás, 2005b). "A case-based reasoning process is defined to generate plots from a user query, with two important phases: retrieval of old stories, and adaptation to build a new one. The user query specifies an initial setting for the story, and the ontology is used to measure during the generation process the semantic distance between concepts specified by the user and those that appear in the texts" (ibid.).58

<sup>&</sup>lt;sup>56</sup> Some projects from the 2000s that are not mentioned here are surveyed in Dov Winer's (in press) 'Review of Ontology Based Storytelling Devices'.

<sup>&</sup>lt;sup>57</sup> To ontologies, a popular technology during the 2000s, we devote to it Section 6.1.7.3 below.

<sup>&</sup>lt;sup>58</sup> Peinado and Gervás explain (2005b): "The ProtoPropp application considers a plot generation problem in terms of Proppian functions, and a solution to that problem in terms of the assignment of a conceptual representation of the plot of a story. This involves transcribing existing folk tales into conceptual representations of their contents and associating them with elements of Proppian morphology. This is done by resorting to a formalized knowledge base of concepts, organised into a taxonomy, which explicitly includes the relations between them. Such a knowledge base, following current terminology in AI, is referred to as an *ontology* (Gruber [1993, 1995]). The use of explicit conceptual knowledge to guide the CBR process characterises *Knowledge Intensive* CBR (Díaz-Agudo & González-Calero, 2003)."

They have delved into narratology models for adoption in artificial intelligence (Gervás, Lönneker-Rodman, Meister, & Peinado, 2006). They have worked on automated customisation of such characters in the stories that are not themselves players, based on the temperament of the players (Gómez-Gauchía & Peinado, 2006). They have worked on role-playing games, with a plot-centric interface (Leon, Peinado, Navarro, & Cortiguera, 2008), while also developing character-based automated storytelling (Peinado, Cavazza, & Pizzi, 2008); cf. Peinado and Gervás (2004, 2007). They have dealt with the evaluation of story-generation programs (Peinado & Gervás, 2006b). They have researched remote control for storytelling environments (Peinado & Navarro, 2007). In 2007, Peinado and Gervás were claiming (2007, p. 196):

Specially during past decade, research on Interactive Digital Storytelling (IDS) has been growing relatively fast. Many papers about this topic are published each year in any of the conferences and journals that accept this kind of scientific contributions (from specific but also general fields such as Computer Entertainment and Education, Multimedia Systems, Artificial Intelligence, etc.). Some theoretical proposals have been described around the same idea: computational models for automatic control of an interactive narration.

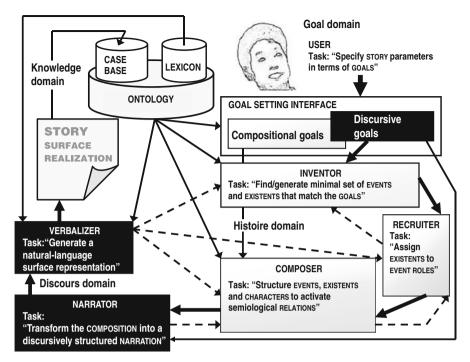
Applying to IDS concepts from *role-playing games* (*RPGs*) was proposed, e.g., by Louchart and Aylett (2003).<sup>59</sup> Peinado and Gervás (2007) proposed a preliminary formalisation of "of a well-known theory, what we called the Game Master (GM) paradigm. This theory claims that the richer and more intuitive metaphor of an automatic director for IDS applications is a human GM controlling a role-playing game. This paradigm, sometimes [...] overlooked, is a particular instance of the more general 'centralized approach' to IDS management" (ibid., p. 197). Extant computational approaches to IDS are "widely different" (ibid.). Some proposed approaches are based on emergent behavior of *non-player characters* (*NPCs*); these achieve dramatic goals. Other appraches are centralised, in that they give more responsibility to a central dramatic planning algorithm. There exist intermediate solutions that add "controllable NPCs to a centralized planner for achieving story goals or adopting a mixed approach, with a centralized director and a set of semiautonomous agents. There are also standalone dramatic planners that control the most important narrative elements, like characters or the whole fictional world" (ibid.).<sup>60</sup>

Figure 5.2.13.1 shows a schema,<sup>61</sup> redrawn from figure 1 in Lönneker and Meister (2005), of the architecture of a hypothetical ideal *Story Generator Algorithm (SGA)*. Birte Lönneker and Jan Christoph Meister, from the University

<sup>&</sup>lt;sup>59</sup> From the same team, cf. Aylett, et al. (2008): "Nowadays, the video gaming experience is shifting from merely realistic to believable", but "the behaviour of the computer driven player and non-playing characters is often poor when compared to their visual appearance." Aylett et al. (2008) "present[ed] a robotics inspired behavioural AI technique to simulate characters' personalities in an multi-award winning commercial video game."

<sup>&</sup>lt;sup>60</sup> Concerning story generation, also see Ogata (2004).

<sup>&</sup>lt;sup>61</sup> Concerning "histoire domain" vs. "discours domain", bear in mind that in narratology, the *story* is called *histoire* in French and  $\phi_{a}\delta y_{\pi a}$  (*fabula*) in Russian, whereas the *discourse* is called *récit* (or sometimes *discours*) in French and CIOKET (*syužet*) in Russian. The French or Russian terms are sometimes used in discussions in English or in other languages as well.



**Fig. 5.2.13.1** A schema, redrawn from fig. 1 in Lönneker and Meister (2005), of the architecture of a hypothetical ideal *Story Generator Algorithm (SGA)* 

of Hamburg, were focusing on the theoretically oriented tasks. Their approach is discussed in detail in a book by Meister (2003).

## 5.2.14 eChronicle Systems

There is a direction of research that goes by the name *eChronicle systems*. *E-chronicles* are sometimes found on the Web. Sometimes, some organisation just chose the name for its newsletter, but the term *e-chronicle* denotes something more specific: in an *e-chronicle repository*, a mass of thematically related events is listed. It stands to reason that suitable computer tools would process that wealth of information. In the words of the Paris-based scholar Gian Piero Zarri (2011):

An 'eChronicle' system can be defined in short as way of recording, organizing and then accessing *streams of multimedia events* captured by individuals, groups, or organizations making use of video, audio and any other possible type of sensors. The 'chronicles' gathered in this way may concern any sort of 'narratives' like meeting minutes, conference records, wedding videos, surveillance videos, football games, visitor logs, sales activities, 'lifelogs' obtained from wearable sensors, etc. The technical challenges, here, concern mainly the ways of *aggregating the events into coherent 'episodes' and of providing access to this sort of material at the required level of granularity*. A unifying indexing system employing an event-based domain model is used in general to introduce a *conceptual layer* onto the *meta-data layer* proper to each repository. Note that i) the users of the eChronicle repositories

are not concerned with the original data sources, and ii) that *exploration, and not 'nor-mal' querying*, is the predominant way of interaction with these repositories.<sup>62</sup> [...] The solution (NKRL) [proposed by Zarri]<sup>63</sup> for the 'intelligent' management of (non-fictional) narratives can be considered as a *fully-fledged eChronicle technique* [...]. In NKRL, however, a fundamental aspect of this language/environment concerns the presence of powerful '*reasoning' techniques* – an aspect that is not taken into consideration sufficiently in depth in eChronicles that are mainly interested in the accumulation of narrative materials more than in the 'intelligent' exploitation of their inner relationships.

Arguably such techniques go the extra mile to meet some of the requirements of textual data mining (see Chapter 6, this volume). In 'Multimedia electronic chronicles', a "Media Vision" column in *IEEE Multimedia* in July 2003, Ramesh Jain began by mentioning LifeLog, a new project that the Defense Advanced Research Projects Agency (DARPA) was going to start,<sup>64</sup> and that it gave rise to controversy because of privacy issues. "LifeLog is about recording everything that a person does using video, audio, and other sensors [...] The goal is to • record all this data, • organize it so that it becomes easy to analyze the activities of this person, • review the person's activities as needed, • detect patterns, and, • organize the information so that the LifeLogs of different people can interact with each other." This was supposed to "facilitate routine tasks like coordinating meetings by considering not only calendars but also individual preferences inferred by these systems and thus provide 'cognitive assistants' to people for organizing their activities" (Jain, 2003, p. 112). Jain began a section headlined "From logs to e-chronicles", by remarking (ibid.):

Many organizations keep detailed logs of events. Rumor has it that many corporations keep a log of every keystroke made by their employees. And, it's widely believed that government agencies in many countries log all events, including telephone conversations, of suspected criminals – in most cases without the subject's knowledge. These activities are hardly surprising because for decades detectives have reported the activities of enemies as well as loved ones.

So what does all this have to do with multimedia research and practice? I believe that multimedia is at the center of a newly emerging field: multimedia electronic chronicles, or e-chronicles. An e-chronicle records events using multiple sensors and provides access to this data at multiple levels of granularity and abstractions, using appropriate access mechanisms in representations and terminology familiar to application users.

The idea was that: "A well-designed e-chronicle will maintain all detailed records, while providing summaries of important events as well as access to events at the required level of granularity" (Jain, 2003, p. 111).<sup>65</sup> There were precedents: "Many variants of e-chronicles have already appeared and are being used. Data warehouses, video surveillance systems, meeting recording systems, sensor networks, and even blogs are early forms of e-chronicles." (ibid.). Jain concluded with a challenge: "I

64 http://www.darpa.mil/baa/baa03-30.htm

<sup>&</sup>lt;sup>62</sup> Publications dealing with eChronicle systems include, e.g., Güven, Podlaseck, and Pingali (2005), and Westermann and Jain (2006).

<sup>&</sup>lt;sup>63</sup> NKRL has been discussed in several papers by Zarri over the years, as early as 1996 (Zarri, 1996), but see now his book (Zarri, 2009).

<sup>&</sup>lt;sup>65</sup> Sic. Jain's column (2003) started on p. 112, but continued on p. 111.

challenge the multimedia research community to contribute their ideas and solutions to e-chronicles".

A sidebar in Westermann and Jain (2007, pp. 20–21) explains these things differently, and *life logs* have become a common noun (whereas LifeLog had been the proper name of a DARPA project):

*EChronicles* are information systems for documenting real-world events via multiple media or other suitable sensor data. EChronicles offer tools that let users interactively explore, visualize, and experience the course of events at different levels of granularity. Real-world events and their characteristics form the central units of interest in eChronicles\_and not media and their metadata as in traditional multimedia content analysis, databases, and metadata formats. Experimental eChronicles have been implemented for a diverse range of domains, including the chronicling of tennis matches, or meetings. *Life logs*, another emerging application, aim to permanently record and document people's activities with media and other sensor data, so that users can go back, review, and explore important events in their lives. Life logs can be considered a subcategory of eChronicles. As with eChronicles, the notion of events is central to life logs. Some life log applications record the daily life events of people with wearable sensors; others record all that media users produce and activities they perform on their computers and relate both media and activities to real-world events, such as that obtained from user calendars.

For example, Jain, Kim, and Li (2003) described a tool for eChronicles, as applied to meetings.<sup>66</sup> Data from user calendars are used in the life log discussed by Gemmell, Lueder, and Bell (2003). "Events appear in multimedia presentation formats, programming frameworks, and databases, as well as in next-generation multimedia applications such as eChronicles, life logs, or the Event Web. A common event model for multimedia could serve as a unifying foundation for all of these applications" (Westermann & Jain, 2007, p. 19).

According to Ramesh Jain: "The concept of 'event' can serve as the fundamental organizational principle for multimedia systems", and "you can combine events in many ways to define other (compound) events" (Jain, 2008, p. 47). When discussing the need for a common multimedia event model, Westermann and Jain (2007, p. 22) provide this example:

Media independence is necessary to establish a base model that suits many applications. Often, events might exist that aren't documented by media. A soccer eChronicle, for example, might contain high-level composite events, such as a league season, that consists of subevents, such as the individual matches in the season. Although the subevents might be extensively documented by media, the composite event might not be directly documented by media at all.<sup>67</sup>

<sup>&</sup>lt;sup>66</sup> Ramesh Jain's team has also dealt with eChornicles in Westermann and Jain (2006a, 2006b) and in Kim, Gargi, and Jain (2005).

<sup>&</sup>lt;sup>67</sup> Westermann and Jain (2007, p. 22) also claim that "real-world events can't be made properties of individual media. In the soccer eChronicle, many different media might describe a match event: the video streams from the different cameras capturing the match from different perspectives, the audio streams from the microphones capturing the stadium roar, photographs of the match highlights, the edited video finally broadcast, newspaper reviews, and so on. It isn't reasonable to tie the match event's existence to any one of those media. It also isn't reasonable to duplicate the event's description with each medium's description."

To Jain, three aspects of events should be defined explicitly. These are: information about the event, experiences related to the event, and the event's structural and causal relationships with other events (ibid., p. 48). "Because of emerging digital-media devices and technology, we're now in a position to develop the EventWeb" (ibid., p. 46). Moreover (ibid.):

Creating EventWeb will require developing technology to produce events using heterogeneous media elements, represent each event as a node, and then create explicit links between events and between events and information on the current Web. EventWeb organizes data in terms of events and experiences and allows natural access from users' perspectives. For each event, EventWeb collects and organizes audio, visual, tactile, textual, and other data to provide people with an environment for experiencing the event from their perspective. EventWeb also easily reorganizes events to satisfy different viewpoints and naturally incorporates new data types – dynamic, temporal, and live. [...] People can use an Event Markup Language to post their events and related information and experiential data in the form of photos, audio, videos, and textual data. An EML will also provide an environment for expressing and creating relationships among events. Combining this language with event capture and a media-processing tool will help users identify events of interest in the EventWeb.<sup>68</sup>

Jain's conceptions of complex events and capturing experiences is apparently independent of, yet resonates with something one comes across in philosophy. A philosopher from Purdue University, Michael Jacovides (2010a, p. 141), argues<sup>69</sup>

that experiences are complex events that befall their subjects. Each experience has a single subject and depends on the state or the event that it is of. The constituents of an experience are (or underlie) its subject, its grounding event or state, and everything that the subject is

<sup>&</sup>lt;sup>68</sup> The concept is starting to have an impact in, for example, the design of computer models for engineering. Ashit Talukder, who has been developing a tool for cyclone tracking (Panangadan, Ho, & Talukder, 2009), describes (Talukder, 2010) what is, among the other things, an application of Jain's concept to machine vision and decision support; "event-based multimedia stream data processing and representation solution is presented for large scale geographically distributed phenomena", such as cyclones or oil spills, phenomena that are to be automatically detected from raw untagged image streams (Talukder, ibid.). Satellite data on the cyclone eye are annotated (Ho & Talukder, 2009). Ontologies have been developed for representing and annotating video-events (François, Nevatia, Hobbs, & Bolles, 2005). It must be said, however, that event-based spatiotemporal data models had long been known: for example, Donna Peuquet, and Niu Duan described (1995) an application to the temporal analysis of geographical data.

<sup>&</sup>lt;sup>69</sup> Also see Jacovides (2010b), in which it is accepted, following John Dewey (1929, chapter 1), Crispin Sartwell (1995), Charles Travis (2004), and William Alston (2005), that experiences do not "represent" anything. Jacovides remarks (2010a, p. 142): "Some might be interested in this question for the same reason that historians of ideas are interested in drawing out consequences of unlikely doctrines in Plotinus or Leibniz. Others might be more sympathetic to the possibility that experiences don't represent, but want to have certain doubts resolved. For example, they might worry that a nonrepresentational account of experiences can't explain how experiences justify beliefs. For such readers, my project might serve as proof of concept. More optimistically, my account of experiences as nonrepresentational events might be so attractive that it helps justify the doctrine that experiences don't represent. I am myself convinced that experiences (ordinarily so-called) do not represent, and what follows is my best attempt to give a positive account of what they actually are."

#### 5.2 An Overview of Artificial Intelligence Approaches to Narratives

aware of during that time that's relevant to the telling of the story of how it was to participate in that event or be put in that state. The experience occurs where the person having the experience is. An experience of an event or state occurs when that event or state makes a difference to its possessor's conscious life, where this difference is either a matter of really knowing what's happening or merely a matter of being affected.

Jacovides explains as follows the difference between experiences and objects, and how they are related (Jacovides, 2010a, p. 143):

Red is a quality, but not a quality that most events can have. Explosions and flashes may be exceptions, but they are unusual events that seem to lack substrata. The fact that experiences can't be red just goes to show that experiences are ordinary events in this regard. A party can't be red, not even a party at a firehouse where all the guests wear red pants. In order to investigate the intrinsic qualities of experiences, we ought to examine qualities that ordinary events can bear. Parties can last until three in the morning. Parties can be drunken, exciting, or enjoyable. Can experiences last until three in the morning? Can they be drunken, exciting, or enjoyable? Yes, of course.

Almost all events depend on at least one enduring object. Explosions and flashes again might be counterexamples, but I'll set them aside. Most events are complex in that they depend on more than one enduring object. These involved objects are agents from which the event arises, patients that the events befall, or neither agents nor patients, but nevertheless participants in the event. The officiant is an agent in a wedding. The bride and groom are both agents and patients. The surroundings and the guests participate in one way or another.

#### Of shared experiences, Jacovides claims (2010a, p. 144):

Strictly speaking, an experience will happen to at most one subject. We do talk about shared experiences, and I take such locutions seriously. In the end, however, I think that shared experiences are, at most, higher-order complex events that overlap the more basic personal experiences. If Jack and Jill walk up a hill they share an experience. Even so, Jack's experience might be pleasant while Jill's is unpleasant. I infer that Jack's experience is, at some level, a distinct experience from Jill's.

One might object to the lesson I draw from Jack and Jill: "here's an alternative construal: their experience might be pleasant to Jack but unpleasant to Jill. This is consistent with its being one experience." I'm not inclined to go that way. It seems to me that being pleasant is an intrinsic feature of experiences, at least at the root level. Since being intrinsically pleasant is incompatible with being intrinsically painful for basic experiences, Jack and Jill can't be having the very same basic experiences, though we might try to construct collective experiences out of their individual ones.

There are degrees of commonality in experience and the proper analysis of these degrees might require appeal to particular facts about particular objects, events, or occasions. If Jack and Jill walk up a hill at the same time, they share an experience in a stronger sense than if they walk up the hill on different days or if they walk up different hills. [...]

Bearing in mind what philosophers have to say about events and experiences may enhance, with a rigorous framework, such event-based computing that caters to human experience (as opposed, e.g., to models in computer image recognition within scientific computing). In particular, this appears to be interesting for the design of eChronicles.

## 5.2.15 Virtual Embodied Agents

There exists an important body of research into automated autonomous personality agents to go with computer animation's synthetic actors. This is related to computer scientists' research into the simulation of emotions.<sup>70</sup> Anton Nijholt's team is active in researching embodied, animated conversational agents. These are also called *avatars*. Nijholt (2002) surveyed the state of the art in that domain, in affective computing, and in verbal and nonverbal interaction, "with the aim to see whether it is useful for embodied conversational agents to integrate humor capabilities in their internal model of intelligence, emotions and interaction (verbal and nonverbal) capabilities" (Nijholt, 2002, p. 101). Nijholt and his colleague Mariët Theune are also active in story generation by intelligent agents (e.g., Theune, Faas, Nijholt, & Heylen, 2003; Oinonen, Theune, Nijholt, & Heylen, 2005; Oinonen, Theune, Nijholt, & Uijlings, 2006).<sup>71</sup> Nijholt further remarked (2002, p. 105):

Embodied conversational agents (ECAs) have become a well-established research area. Embodied agents are agents that are visible in the interface as animated cartoon characters or animated objects resembling human beings. Sometimes they just consist of an animated talking face, displaying facial expressions and, when using speech synthesis, having lip synchronization. These agents are used to inform and explain or even to demonstrate products or sequences of activities in educational, e-commerce or entertainment settings.

At the Stanford University, Barbara Hayes-Roth directed the *Virtual Theater* project (Hayes-Roth & Robert van Gent, 1997). The following is quoted from an article in which I joined forces with a collaborator of hers, in order to enhance my own ALIBI model of a cognitive agent seeking exoneration<sup>72</sup>:

In a Virtual Theater application, synthetic actors are provided that can interact with each other and with users to create interactive stories in a textual or graphical environment. Each synthetic actor portrays a character defined by the designer of the application. The definition of a character includes abstract characteristics such as a personality, a repertoire of actions that he or she can perform, a set of interpersonal relationships, and an abstract script that the actor can follow. A synthetic actor is able to improvise its behavior according to the character that it portrays and the directions it receives from other actors, users, or an abstract script. Synthetic actors can be completely autonomous or avatars directed by users. So, a user can actively influence an interactive story by the directions he or she gives to his or her avatar.

<sup>&</sup>lt;sup>70</sup> See, e.g., an overview in section 6 of Cassinis, et al. (2007), and a complementary overview of other aspects in Nissan et al. (2008), Nissan (2009b, 2009c). An important step was the AbMaL model, introduced by Paul O'Rorke and Andrew Ortony (1994), and modelling the emotions in story-understanding, with a representation by means of situation calculus. Also see Marvin Minsky's *The Emotion Machine*, whose chapter 6 is concerned with story-understanding (Minsky, 2002).

<sup>&</sup>lt;sup>71</sup> At http://hmi.ewi.utwente.nl/showcases/The%20Virtual%20Storyteller one can access a publication list of The Virtual Stroyteller project from Anton Nijholt and Mariët Theune's team at the University of Twente (Enschede, The Netherlands). For example, the doctoral dissertation of Ivo Swartjes (2009) is accessible there.

Also see http://redcap.interactive-storytelling.de/authoring-tools/virtualstoryteller/

<sup>&</sup>lt;sup>72</sup> From an earlier draft (entitled 'Legal Evidence: The Dramatis Personae Approach') of Nissan and Rousseau (1997).

This is historically distinct from "synthetic actors" as known from sophisticated 3D animation – regardless of a story plot other than motion or displays of emotion – but complete with facial expressions, gait, and wrinkled cloth: such "synthetic actors" were developed by Nadia Magnenat Thalmann and Daniel Thalmann,<sup>73</sup> with characters "Marilyn" [Monroe] and "Elvis" [Presley].) Eventually, the concepts were technically merged, and have become familiar to the broad public through the online *Second Life*.

One of the applications of the *Virtual Theater* was *Cybercafe* (Rousseau, 1995). It contained<sup>74</sup>

an autonomous actor playing the role of a waiter, and an avatar portraying a customer. The user-interface contains two windows: one presenting the actions that a user can select for his or her avatar, and one textually describing how the story unfolds in the current context. A user can direct his or her avatar by selecting buttons corresponding to actions that can be performed by the customer in the current context. Actions performed by any actor are displayed by a text animator in a window containing the description of the interaction.

An important feature was that characters behaved opportunistically, improvising according to the situation at hand (ibid.):

The Cybercafe is based on local improvisation, which means that all characters decide their behavior relying on the current state of the world and the actions that they can perform. Reasoning on mental states is quite simplified in the system. Possible states of the world, that can be considered as potential goals, and transitions between those states are modeled using state machines. Actions that an actor can perform to realize the transitions correspond to its abilities. A synthetic actor knows a list of irrelevant actions for each potential state. For instance, a character who is seated cannot sit neither walk. An individual that is standing cannot stand up. Some state machines can involve more than a character in the transitions; e.g., the state machine that models the interaction between the waiter and the customer when the latter orders involve both agents. Both actors have a copy of the state machine dealing with the situation and can detect when a transition is effective, although the transition is not realized by one of their actions. It allows them to cooperate.

For all of the improvisation, characters had personality traits impinging upon their respective behaviour (ibid.):

The main focus of [...] work with the Cybercafe is the expression of personality traits through the behavior. No matter their personality, characters of the Cybercafe follow an abstract scenario defined in terms of a series of actions and cues specified at an abstract level. A cue is an action of a given type performed by another actor. For the waiter, a script could be as simple as "Perform an action till you want to stop and want to wait for a cue from the customer". Being called by a customer would be an example of cue. Transitions specified in state machines also define parts of a scenario.

<sup>&</sup>lt;sup>73</sup> For example, a very effective image of successive stages of motion appeared in 1993 on the cover of issue 4(3) of the journal edited by the Thalmanns, *The Journal of Visualization and Computer Animation*. See Magnenat Thalmann and Thalmann (1991a); also section 2 in Magnenat Thalmann and Thalmann (1991b). Refer as well to Magnenat Thalmann and Thalmann (1996, 2001).

<sup>&</sup>lt;sup>74</sup> The quotation is from an earlier draft (entitled 'Legal Evidence: The Dramatis Personae Approach') of Nissan and Rousseau (1997).

The goal of providing animated life-like characters, *believable embodied agents*, in computer interfaces (as *embodied conversational characters*) or virtual environments has been quite conspicuously providing motivation for an increase in research into the simulation of emotion within computer science. For example, a paper collection edited by Prendinger and Ishizuka (2004) is devoted to tools, affective functions, and applications in relation to life-like characters. Another paper collection on embodied conversational characters was edited by Cassell, Sullivan, Prevost, and Churchill (2000).

At the Massachusetts Institute of Technology, Bryson and Thórisson (2000) proposed<sup>75</sup> a *character architecture* called *Spark of Life (SoL)*. The following is quoted from Bryson and Thórisson (2000, p. 58):

Much research into agents for entertainment concentrates on the problem of combining the concept of a script with the notion of autonomous, reactive characters [...].<sup>76</sup> Our constructive narrative approach eliminates this problem by changing the top level creative design from a *script* to a *cast of characters*. This simplifies the task of the player by removing the need for character addition, substitution, alteration, or removal. It has the penalty of removing a substantial element of narrative structure: a sequential order of events. However, this problem has already been addressed by the creators of role-playing and adventure games. Their solution is that plot, if desired, can be advanced by knowledegeable characters, found objects, and revealed locations. Structure is produced through the use of geographic space as well as character personality. Personality traits such as loyalty, contentment or agoraphobia can be used to maintain order despite a large cast of autonomous characters, by tying particular characters to particular locations. Developing such characters requires an agent architecture powerful enough to support this complexity. It also requires sufficient modularity to allow reasonably quick construction of behaviour patterns. [...]

<sup>&</sup>lt;sup>75</sup> The forum in which Bryson and Thórisson (2000) 'Dragons, Bats and Evil Knights: A Three-Layer Design Approach to Character Based Creative Play' appeared was the journal Virtual Reality, published by Springer-Verlag. Bryson and Thórisson's Spark of Life is "an architecture for complex characters capable of multi-modal real-time dialogue with humans, and [in their paper they also presented] some of [their] experiences from using these techniques on a large-scale industrial VR [i.e., Virtual Reality] project at LEGO" (ibid., p. 69). "A constructive narrative is creative on several levels. In designing a creative experience, the goal is to provide both interesting media for expressing the content to be recombined, and tools that facilitate the recombination. If the media itself includes active creators, in our case agents that autonomously create situations and social dynamics, then the user has the opportunity to engage in truly complex constructive play. This kind of creative experience is currently only afforded to writers of drama, corporate managers, and public policy makers. However, creating an environment for such play takes considerable artistic and technical skill and planning. We have described how a creative environment with constantly changing stories and adventures can be developed using artificial intelligence and design techniques thart exploit and express the creativity of the designers. The intelligent agents in these environments [...] embody the rules and knowledge both invented and learned by their designers" (ibid.).

<sup>&</sup>lt;sup>76</sup> Citing Hayes-Roth and van Gent (1997), Lester and Stone (1997), André, Rist, and Müller (1998).

## 5.2.16 Story-Generation with MINSTREL

Scott Turner's MINSTREL story-generation program is driven by author goals. and also character's goals are important. An important aspect of MINSTREL is that it applied what in AI is known as "case-based reasoning", i.e., reasoning from precedent. MINSTREL develops stories by trying to recall pertinent elements from stories already in its repertoire.<sup>77</sup> This is one of the reasons Turner's project should be of interest to folktale studies. In order to make precedents usable, MINSTREL resorts to "creative heuristics", called Transform-Recall-Adapt Methods (TRAMs). "In addition to a process model of author-level problem-solving, MINSTREL implements four important classes of author-level goals and plans: (1) Thematic, (2) Dramatic, (3) Consistency, and (4) Presentation. MINSTREL uses these goals and plans to tell a number of short stories in the King Arthur domain".<sup>78</sup> "When MINSTREL tells a story, its primary goal is to illustrate a particular story theme. MINSTREL's story themes are stereotypical planning situations, which can often be summarized by an adage [...]".<sup>79</sup> "By limiting MINSTREL to Planning Advice Themes, we are able to address many of the issues in telling theme-based stories without the need to create a general theory of themes".<sup>80</sup>

For instantiating the main character's role, MINSTREL would choose (either at random, or by being given a hint) a hermit, or a knight, or a princess, or a king.<sup>81</sup> Turner analysed imperfections in a story resulting as output, *The Proud Knight*<sup>82</sup>:

Once upon a time, a hermit named Bebe told a knight named Grunfeld that if Grunfeld fought a dragon then something bad would happen. Grunfeld was very proud. Because he was very proud, he wanted to impress the king. Grunfeld moved to a dragon. Grunfeld fought a dragon. The dragon was destroyed, but Grunfeld was wounded. [Two errors:] *Grunfeld was wounded because he fought a knight. Grunfeld being wounded impressed the king.* 

<sup>&</sup>lt;sup>77</sup> Turner (1992, p. 377): "[I]n the MINSTREL model of episodic memory, individual episodes can be recalled only if the recall indices are unique or nearly so. If a set of recall indices matches more that a few episodes, then memory can only recall generalizations about those episodes. To recall a particular episode, the recall indices must be *elaborated* until they uniquely specify an episode. [... T]he MINSTREL model of creativity focuses a great deal of effort on efficient and directed search of episodic memory for knowledge that can be used for invention. [...] The purpose of MINSTREL's model of memory and MINSTREL's concentration on the directed, efficient search for useful knowledge is to limit the size and scope of knowledge that MINSTREL must process in order to be creative".

<sup>&</sup>lt;sup>78</sup> From Turner's (1992) thesis abstract.

<sup>&</sup>lt;sup>79</sup> Turner (1992, section 6.1., p. 155). By contrast, in Dyer's BORIS multi-paragraph story understanding program (e.g., Dyer, 1983a), an adage corresponds to a "thematic-organisation unit" (TAU) that is a pattern resorted to in order to *understand* a story. In BORIS, this is related to plan failures. Later on, Dyer tried to model also jokes, based on these.

<sup>&</sup>lt;sup>80</sup> Turner (1992, section 6.1., p. 156).

<sup>&</sup>lt;sup>81</sup> Turner (1992, pp. 412, 417).

<sup>&</sup>lt;sup>82</sup> The story is in Turner (1992), p. 412, Fig. 15.18. The analysis is ibid., on p. 412 ff.

Turner's italics identify what he consider to be erroneous, namely, Grunfeld's being wounded twice (the second time, by a knight), and the king being impressed by injuries. Turner showed how this problem occurred and was solved. "After it has been determined that Grunfeld is wounded in the fight with the dragon, MINSTREL checks to see if it knows anything further about woundings that it should add to the scene".<sup>83</sup> Using two creativity heuristics, MINSTREL recalls the episode Knight Fight: "In order to impress the king, a knight killed a dragon, thwarting the dragon's goal of staying alive". As MINSTREL did not manage "to recall a scene in which some state thwarts a knight's goal of protecting his health", MINSTREL applied a creativity heuristic that generalises a character, so the knight was generalised to another violent character, 'monster', of which a dragon is a particular case. Then, MINSTREL tried to recall something about a monster's goal of health preservation being thwarted. Yet, as it knew about a dragon having been killed, rather than just wounded, also the new specification of the problem produced no resulting recall. Then, a creativity heuristic "that modifies a thwarting state to a similar, related state" was applied to the specification, modifying the monster's (i.e., the generalised knight's) wounding to death, and MINSTREL recalled a precedent being a dragon's death from the episode Knight Fight.

This was adapted to the story being generated, "by changing the dragon's death back to wounding", and the monster (i.e., the generalised violent character) back to a knight. "Unfortunately, the modified episode has with it the remainder of the original 'Knight Fight' episode, in which the knight fights the dragon and impresses the king", and thus extraneous scenes were added to the story being generated, "resulting in the scenes in which Grunfeld fights another knight" – the knight from Knight Fight who killed the dragon onto which The Proud Knight's knight had been mapped - "and in which Grunfeld's injury impresses the king", because in Knight Fight the king was impressed by the death of the dragon onto which The Proud *Knight's* knight had been mapped.<sup>84</sup> Turner explains that the heuristic of finding a similar thwarting state performed an incorrect adaptation step: it "was able to correctly adapt the thwarting state", but "was unable to correctly adapt the extraneous scenes",<sup>85</sup> it should have removed the portion it didn't manage to adapt. Once that correction to the software was made, a correct version of The Proud Knight was generated. Another, similar story, The Proud King, was generated by recalling The *Proud Knight.* After being wounded while fighting a dragon, King Arthur wants to protect his health, so he becomes a hermit (i.e., a non-violent character).<sup>86</sup>

<sup>&</sup>lt;sup>83</sup> Turner (1992, p. 413).

<sup>&</sup>lt;sup>84</sup> Turner (1992, p. 413).

<sup>&</sup>lt;sup>85</sup> Turner (1992, p. 414).

<sup>&</sup>lt;sup>86</sup> Also within his discussion, in Turner (1992, section 15.5.2), of MINSTREL's performance, Turner related about a failed attempt to generate a story for the moral "Pride goes before a fall". What was generated, was the story *The Proud Hermit* (Turner, 1992, p. 411, figure 15.17): "Once upon a time there was a hermit. Someone warned him not to pick berries, but he went ahead and picked them anyway. Nothing happened". Turner does not envisage considering this a successful antistory. Rather, he explains why *The Proud Hermit* was a failure. MINSTREL had chosen for

## 5.2.17 Environments For Storytelling

I am going to exemplify environments for storytelling. Marina Umaschi Bers (2003) discusses various narrative tools she designed for them to be used by children. One of the tools she discusses is SAGE. She wrote (2003, p. 115):

SAGE is an authoring environment for children to create their own wise storytellers to interact with by telling and listening to stories. Children can engage with SAGE in two modes: 1) by choosing a wise storyteller from a library of already existing characters and sharing with him or her what is going on in their lives. The sage storyteller "listens" and then offers a relevant tale in response, and 2) by designing their own sages...

In SAGE, the computation module parses the user's story, expands extracted nouns and verbs through a hierarchical semantic lexical reference system, and then, based on the augmented keywords, it "perform[s] a match between the user's personal story and an inspirational story in the database", in that they deal with the same themes (Umaschi Bers, 2003). This is different from Dyer's BORIS story understanding program (Dyer, 1983a) proposing an adage to match the thematic abstraction unit (TAU) – a chunk of narrative structure – in the parsed narrative (Dyer, 1983a, cf. Dyer, 1983b, 1987; Lehnert et al., 1983). SAGE does not capture the narrative structure. "Our earliest research showed that children engaged deeply with sages that we had designed, such as a Hasidic Rabbi and a Buddhist scholar" (Umaschi Bers, 2003, p. 116, citing Umaschi, 1996).<sup>87</sup>

Incidentally, about the opening of the response from the artificial agent in SAGE; "The Gerer Rabbi": which one? i.e., which holder of the title? the current one? or the first one, Israel Meir Alter of Gur, the Hasidic author of *Chiddushei HaRim* and the founder of the dynasty of Gur

the main character the hermit role. "MINSTREL's next step is to instantiate the prideful act. [...] To do this, MINSTREL uses episodic memory to recall a typical action by the hermit, and uses this to instantiate the prideful act. In this case, MINSTREL recalls a scene in which a hermit picks berries in the woods. At this point, MINSTREL bogs down. MINSTREL cannot invent any bad consequences of picking berries. So MINSTREL is unable to fill in the 'fall' portion of 'Pride goes before a fall', and the story fizzles. [...] Being unable to continue a story because of a bad decision earlier in the storytelling is a common problem for MINSTREL plans for retracting bad solutions, or for recovery from decisions that resulted in a large number of failed goals". These limitations of MINSTREL stem from its being a doctoral project. Technology was already in existence for devising quite sophisticated planning models, and backtracking from a bad decision is commonplace in planning programs from AI.

<sup>&</sup>lt;sup>87</sup> In an "extract from a conversation log between a ten year old and the Hasidic Rabbi" (Umaschi Bers, 2003, p. 116), the child relates difficulties with studying math and other subjects. The artificial character replies by quoting a somewhat remote adage, followed by an explanation: "The Gerer Rabbi said: 'Exile contains redemption within itself, as seed contains the fruit [the unquote sign is missing here, in Umaschi's paper]. Right work and real diligence will bring out the hidden reward". The character asks the child whether he sees the point, and the child replies: "yes, so now I see that I just have to keep on trying no matter what" (ibid., p. 117). It is the user's own human intelligence that puts the meaning in the output of SAGE's pattern matching. Motivation plays a part in such success; a pilot study was conducted by using SAGE – an identity construction environment – for therapeutic purposes with chronically ill children: to young cardiac patients, using SAGE was "a way of coping with cardiac illness, hospitalizations, and invasive medical procedures" (ibid.).

Umaschi Bers (2003) also discusses *Kaleidostories*, a web-based identity construction environment which guides children in the generation of a personal online portrait with Self narratives, and in choosing or creating role models (ibid., pp. 118–121). Yet another software environment described by Umaschi Bers is *Zora*, "a 3D multi-user environment that provides the tools for young users to create a virtual city" (ibid., p. 121).

Rui Prada, Isabel Machado, and Ana Paiva (2000) reported about TEATRIX, a virtual environment for story generation. TEATRIX is a learning environment. The intended users are children, who engage in interactive story-generation collaboratively, in three phases: the story set-up (the child chooses which scenes and, next, characters to include in a story), story creation, and story writing. Stories generated and performed by the children are stored as a movie, and other children can review the movie, editing it or annotating it. In TEATRIX, acting (a child impersonates one of the characters), reading and writing were merged into a single environment. Characters have a name, a social stereotype (e.g., an old lady), and a role, and these are predefined. Only six different roles are allowed, in TEATRIX. As to scenes in TEATRIX, these are predefined spatial locations, and they have some décor, as well as exits that connect them to other scenes.

The application of models of narrative to digital interactive games has been described as "Ludology meets narratology" by Mateas and Stern (2005).<sup>88</sup> In fact, current work on interactive games, also and especially in industry, resorts both to advanced computer animation or virtual reality techniques, and increasingly to models of narrative or specifically of storytelling.

Brandon Rickman's *Dr. K*– "project is an attempt to create a fabricated narrative environment, an environment where nothing exists except that which is visible to the user" (Rickman, 2003, p. 131). "The user is presented with a screen of text", which states a place and some scenery. As a result of user interaction, in which the user selects with a mouse some element out of those presented on the screen, the screen updates, e.g. with some action on the part of some character (ibid.). "This operation is analogous to an audience continually asking questions to a storyteller while the storyteller performs" (ibid.), and he or she "can provide a direct answer, or be evasive in a number of ways" (ibid., p. 132). In a given situation, the user may click on "Some scenery", to make it more specific. "There are four structural elements in Dr. K–. There are props, scenes, actors, and actions" (ibid.). "A prop element is a piece of scenery, a self-contained object or environmental component" (ibid., p. 133). "A prop that is the focus of the user's attention tends to flux into a

<sup>(</sup>Góra Kalwaria)? Perhaps the child wouldn't bother anyway. At any rate, *Tales of the Hasidim*, the renowned popularistic collection by Martin Buber (1878–1965) of Hasidic anecdotes and aphorisms (Buber, 1947), includes – in the chapter devoted to that founder of Gur Hasidism – an anecdote appropriate for the user's predicament as related by Umaschi Bers: the anecdote from Buber recommends perseverance indeed, yet concludes disconsolately, which in the context is not the thing the child needs to hear. Information about Hasidic dynastic genealogies can be found, e.g., in the *Encyclopaedia Judaica* (published in Jerusalem by Keter, 1972), Vol. 1, pp. 160–167.

<sup>&</sup>lt;sup>88</sup> Also see Mateas (2001), a longer version of which is Mateas (2004).

more specific state. Props that have been neglected by the user tend to revert to more archetypical state. Thus it is possible that a rug, after a period of activity, may revert to \*cloth. But if the user then focuses on the \*cloth, it may transform into a curtain" (ibid.). "A scene element is a named location, a construction of place. Scenes are defined by the collection of props that they archetypically contain" (ibid., p. 134). "Scenes are never the direct focus of the user", and "are a byproduct of user interaction" (ibid.); during exploration by the user, "[u]pon reaching a certain threshold [...] the scene transforms to a more focused state" (ibid.). "Actors are much like props, but they can be mobile or autonomous" (ibid.). "There is one major pitfall to avoid when creating a fabricated world: the repeated generation of unparseable nonsense" (ibid., p. 140). To "maintain some level of comprehensibility" (ibid.) of this virtual reality project (even though it is merely based on screens of rudimentary text), it "can be presented within a theatrical setting", "the story engine is tuned so that there will be some sense of progression" (ibid., p. 141), and there "is the choice of specific subject material for the story" (ibid., p. 140). Rickman's "Dr. Kis constructed around the historic account of William Burke and William Hare in 1820s Edinburgh" (ibid., p. 140): they "made a living by killing people and selling the bodies to an anatomy school" (ibid., p. 140). "This should not be considered a backstory, however. It exists more as a background motif", and users "may recognize some of [Burke and Hare's] elements within the narrative", rather than finding their actual story (ibid., p. 140).

Michael Mateas (pers. comm., 2 May 2006) described a project of his as follows:

Regarding ABL (A Behavior Language), my reactive planning language for authoring autonomous characters, it's not so much a language within which you author story structure but a language for defining the moment-by-moment decision-making logic of real-time autonomous characters. In Facade (available for download at www.interactivestory.net) the AI architecture includes both the ABL-based autonomous characters, and a separate component, the drama manager, that is responsible for maintaining the narrative flow and dramatic arc (there's also the natural language processing subsystem, but that's not specifically relevant to story and character). On Façade, see in Section 5.2.13 above.

Let us say something specific about technologies to support children's play with narratives, i.e., the kind of tools that Umaschi Bers has been developing. At the Media Laboratory of the Massachusetts Institute of Technology, Cassel and Ryokai (2001) have been concerned with the development of tools that support children's fantasy play<sup>89</sup> and storytelling. Their *StoryMat* is "a system that supports and listens

<sup>&</sup>lt;sup>89</sup> Cassel and Ryokai stated (2001, pp. 171–172): "One common form of storytelling among young children is fantasy play. We can define this kind of spontaneous play by the fact that the children's language and actions are both the process and the product of their fantasy play. For example, a child who is holding a block tells her playmate, 'Pretend this is a train, OK?' Children demonstrate in this language a sense of possibility – the concept of 'what might be' [...]. Through their language and their action they create the world in which they are playing. Fantasy play, which can include role-playing, dressing-up, and storytelling with objects such as stuffed animals, allows children to explore different possibilities in their life without the risk of failure and frustration from unexpected events. Pretense gives children a unique opportunity to explore their own emotional arousal [...] and also an opportunity to experiment with possible interactions and relationships

to children's voices in their own storytelling play, whether they are playing collaboratively, or without a playmate. StoryMat offers a child-driven, story-listening space by recording and recalling children's narrating voices, and the movements they make with their stuffed animals on a colourful story-evoking quilt." (Cassel & Ryokai, 2001, p. 169). "Hayes-Roth's Improvisational Puppets System [...] provided an environment where children could play-act by using personality-rich characters. By manipulating the characters on the computer screen like puppets, children explored different character actions and reactions. Haves-Roth and her colleagues found that although children are able to construct stories collaboratively both with peers and parents, they engaged in more open-ended play with their peers than with adult partners." (Cassel & Ryokai, 2001, p. 172).<sup>90</sup> "Most commercial applications in the domain of tangible personal technologies for children are variants on dolls, with increasingly sophisticated repertoires of behaviours. Microsoft Actimates' 'Barney' and Mattel's 'Talk with Me Barbie'<sup>®</sup> have embedded quite sophisticated technology into familiar stuffed animals and dolls. These toys, however, deliver adult-scripted content with thin layers of personalisation, and do not engage children in their own fantasy play. In both cases the toy is the speaker and the child is firmly in the position of listener." (Cassel & Ryokai, 2001, p. 173). This is not the case with StoryMat: "Our philosophy is that good technology for children supports child-initiated and child-driven play." (ibid.). In fact (ibid., pp. 176–177):

StoryMat is a soft, quilt-like play mat with appliquéd objects such as houses and roads. It provides an under-determined play space for children to tell their own stories on, and yet it is an active participant in their play since it records and recalls their stories. [...] As far as the child is concerned, StoryMat functions entirely independently of a computer or keyboard, thus allowing pre-literate children to engage with the system. When children tell their stories with a toy of StoryMat, their narrating voices and the associated movements of the toys are recorded. The recorded story is then compared with other stories told by children who have visited the mat previously. One of the past stories, that shares a similar pattern (specifically, the length of the story, the pattern of the path the toy took, and the identity of the toy) with the present story is recalled on the mat, as a moving shadow of the toy with its narrator's voice. This, in turn, provides an opportunity for the child to continue the themes of the story she heard by telling her own new story. The child may tell her subsequent story by coming up with a creative solution to the story she just heard. Or she may continue telling her own story and incorporate some story elements from the story she just heard. In this sense, StoryMat is a kind of imaginary playmate, but who also mediates natural collaboration between a child and her peer group. [...] In addition to providing a larger-than-themselves interface, this particular kind of quilt serves as a unique interface for collaborative storytelling. Objects sewn on the mat are story-evoking: paths going in different directions, trees, houses and fields of contrasting colours. These objects serve as "story starters" for children, yet they are under-determined enough to be transformed into any objects children imagine them to be.

among humans [...]. As such, fantasy play fulfills an important purpose in children's emotional and social development."

<sup>&</sup>lt;sup>90</sup> Citing Hayes-Roth and van Gent (1997) – actually, a pre-publication technical report was cited – and Huard and Hayes-Roth (1996).

#### 5.2.18 Bias in Narrative Reporting, and Nonlinear Retelling

The challenge of representing narrative according to different perspectives, and in particular, as reported by different, ideologically biased sources, has been responded to, within artificial intelligence. The problem of how to capture capabilities of reporting a story according to partisan goals, and of understanding a story so told, has been handled by some scholars.

One of the last narrative programs from the 1980s conceptual-dependency school while it was still based at the University of Yale, namely, Eduard Hovy's PAULINE, was a milestone in modelling the generation of partisan reports on the same events.<sup>91</sup> For example, it would report about a demonstration held on campus, from the viewpoint of the university's authorities, and from the viewpoint of one of the demonstrators.

ABDUL/ILANA was a tool from the early 1980s, also developed by computational linguists. It was an AI program that used to simulate the generation of adversary arguments on an international conflict (Flowers, et al., 1982). In a disputation with adversary arguments, the players do not actually expect to convince each other, and their persuasion goals target observers.

In a different perspective on different partisan sources – the perspective of belief revision as applied to an idealised computational modelling of the making of opinions during the progressive delivery of evidence in court – Dragoni and Nissan (2004) have taken into account how the degree of credibility of the different persons who provide different items of information is dynamically affected by how some information they supplied comes to be evaluated. See Section 2.1.2 above.

A distinction is to be made between bias in conversation, and bias in presenting a narrative. In this and in the next paragraph, we exemplify those two situations. Already the early 1980s saw an AI program, IMP, give misleading information while avoiding outright lies (Jameson, 1983). That project addressed the relation between truth and manipulative presentation. IMP may try to mislead on purpose, without actually lying. A dialogue system, it impersonates a real estate agent, trying to rent moderately priced furnished rooms on the Hamburg market. Well-informed about the market, IMP assumes that the customer possesses the same general information, against which the customer assesses the qualities of the room considered. The program tries to convey a good impression about the goods, and about itself as well. It would not volunteer damaging information, unless a direct, specific relevant question is made. IMP has a goal of maintaining a neutral image of itself and an impression of completeness for its own answers; on occasion, it reportedly simulated insulted surprise if an intervening question by the customer seems to imply (by detailed questioning) that IMP is concealing information.<sup>92</sup> Also the purpose

<sup>&</sup>lt;sup>91</sup> Hovy (1987a, 1987b, 1988a, 1988b, 1988c, 1988d, 1991, 1993).

<sup>&</sup>lt;sup>92</sup> In contrast to IMP, that does not lie, but just tries to conceal information that would militate against its interests, at the present state of the art of AI there is an active field concerned with modelling such deceptive communication that agents deliberately try to deceive their interlocutors by conveying false content (rather than just withholding inconvenient information, like in IMP).

of Boris Galitsky's *Scenario Synthesizer*, developed at Rutgers University (Galitsky, 1998, 1999), is to control buyer's impression.

Narrative, and in particular, nonlinear narrative, are central to the following. Domike, Mateas and Vanouse (2003)<sup>93</sup> describe *Terminal Time*, which "is a history 'engine': a machine which combines historical events, ideological rhetoric, familiar forms of TV documentary, consumer polls and artificial intelligence algorithms to create hybrid cinematic experiences for mass audiences" (Domike et al., 2003, p. 155) that in turn respond, which is measured by a device connected to a computer, allowing the "program to create historical narratives that attempt to mirror and often exaggerate their biases and desires" (ibid.). "Although dominant in popular media today, the cookie-cutter documentary is just one form of historical documentary" (ibid., p. 156): "each program has a distinct dramatic arc, a beginning, middle and an end. The rhetorical structure [...] invariably involves a crisis situation, a climax, and a clear resolution" (ibid.), offering just one interpretation of history. "Overall the tone set is one of progress" (ibid.).

*Terminal Time* explores the early Soviet filmmaking's "Kuleshov effect", by which: "The one who controls the order[ing of visual data], controls the message" (ibid., p. 157). "Expressive AI views a system as a performance. Within a performative space, the system expresses the author's ideas" and is viewed "as a communication between author and audience" (ibid., p. 167). *Terminal Time*'s software architecture consists of the following major components: "knowledge base, ideological goal trees [...]<sup>94</sup> rule-based natural language generator, rhetorical devices, and a database of indexed audio/visual elements primarily consisting of short digital movies and sound files containing music" (Domike et al., 2003, p. 168).

# 5.2.19 Self-Exoneration with ALIBI, in the Perspective of Narrative Inventiveness

We have already discussed my own ALIBI system in Section 2.2.2 above. ALIBI receives as input an accusation, and its output explains it out, seeking to deny or at any rate minimise liability. The discussion in Section 2.2.2 was in the context of our presentation of computational approaches to reasoning about a criminal charge and to explanations. Nevertheless, it makes sense to also consider ALIBI a story-generator.<sup>95</sup> In fact, there is nothing in ALIBI that refers to the (episodic) memory

For example, at the 2000 Autonomous Agents Conference there was a Workshop on Deception, Fraud and Trust in Agent Societies. See s.v. 'Deception' in this book's subject index.

<sup>&</sup>lt;sup>93</sup> Also see Mateas, Domike, and Vanouse (1999).

<sup>&</sup>lt;sup>94</sup> Citing Jaime Carbonell's thesis about POLITICS (1979). Also see Carbonell (1978, 1981).

<sup>&</sup>lt;sup>95</sup> Already in the early stages of the ALIBI project, I entertained the long-term aim that this project would be eventually also contributing to automated story-generation of an explanatory kind. In 1986, I finished the implementation of my own PhD project, ONOMATURGE, which provided with a simple definition, generated and proposed Hebrew candidate neologisms, and ranked them according to a calculated estimate of their respective psychosemantic transparency to speakers of the language (e.g., Nissan, 1987d, 2000b). My initial plans when defining the ONOMATURGE

that the suspect (who is impersonated by ALIBI) must already have about his or her past at the time when the events ascribed to that character took place.

ALIBI takes as an input an accusation (expressed either as logical predicates, or, which is the case of ALIBI2, in simple natural language). It decomposes the actions referred to in the input, developing a hierarchy in which, e.g., 'stealing' is considered as 'taking' in given circumstances. The deontic (moral or legal) factors are separated from the action, but (in ALIBI3) track is kept, so that relative degree of liability can be computed. This is done when the planner constructs another tree, which is meant to provide an explanation for the events related, which is alternative to the accusation, and either aims at complete exoneration, or (in ALIBI3) as a second best, for diminished liability.

Processing has the program recursively decompose the actions in the input, into a tree of actions, down to elementary, atomic actions. Moreover, as mentioned, actions are stripped of their deontic connotation. It's up to the system to concoct such a plan where that act of taking fits in a way that is legitimate for the defendant. Generating the justification corresponds to a reconstitution of actions into a different tree. Then the terminal actions in the *decomposition tree* are differently reconstituted into alternative explanations (each corresponding to a *recomposition tree*) that eliminate or minimise liability.

In one of the stories, a man is accused of having shot and wounded a jeweller, while robbing him. One effect of 'wounding' is that the wounded jeweller was unable to take care of his property. This is exploited by an excuse ALIBI makes (if an excuse it is, rather the factual truth). It states that, having shot the jeweller accidentally, the defendant did take away property, but it was in order to look after it and then return it. Another effect of 'wounding' is that the wounded jeweller needed medical aid.

The defendant may supplement his excuse by claiming he *ran* away, in order to get such help for the jeweller. 'Armed threat' is an interpretation involving the effect of holding a weapon and possibly pointing it (which happens to be at somebody who then feels threatened), but ALIBI may try to admit to physically holding the object (which happens to be a weapon), while denying the intentions ascribed (of threatening an interlocutor who is therefore a victim), possibly implying an inadequacy of the defendant at realising the interlocutor's interpretation of the situation. Actually, one excuse ALIBI tries, is that the defendant was carrying the weapon for an innocent purpose, and, possibly forgetting about its presence, was innocently talking to the victim, and was unaware the latter acted by feeling threatened. *Mens rea* is denied.

project and bringing it from Italy to Israel were that I would eventually also develop a computational model of folk-etymological reasoning about words (something that, historically in the modern era, has had an impact on neologisation by loanword nativisation within language planning for various languages, including Hebrew, as eventually shown in his 2000 Oxford thesis by the linguist Ghil'ad Zuckermann [2000, cf. 2003, 2006]). Also when doing ALIBI, my long-term hopes were that by developing a mechanism for finding explanatory trajectories, this would eventually contribute to computational modelling of folk-etymological processes. With Zuckermann and Yaakov HaCohen-Kerner, at the long last I am working on the latter project, which is called GALLURA. The aim is to generate aetiological tales of a folk-etymological kind.

Whereas in general ALIBI may generate "alibis" that sound reasonable, the explanations it gives for the story mentioned here is ludicrous: the result is unintended humour.<sup>96</sup> Arguably this is because the circumstances included in the charge are damning, and the suspect (through the artificial cognitive agent impersonating that suspect) finds it very difficult to extricate himself.

ALIBI1 was implemented in the Prolog programming language during the academic year 1987–1988, under my supervision, by two by two *Expert Systems* and *Prolog* students I had been teaching at Ben-Gurion University of the Negev in Beer-Sheva, Israel, namely, Tsvi Kuflik and Gilad Puni. Kuflik is at present (2011) on faculty at the Management Information Systems Department of the University of Haifa. In ALIBI2, implemented in 1989, the semantics was reorganised in a format inspired by case-grammars. ALIBI2 could accept an input in simple English (a sequence of sentences, each with just one clause, and without the need to process personal pronouns). ALIBI2 was implemented by two students of the *Computational Linguistics* course I was teaching, Roni Salfati and Yuval Shaul, by reusing code from ALIBI1.

ALIBI3 was implemented in 1990, and involved a recoding in the Lisp programming language, but more importantly, instead of just aiming at such explanations that would seek total exoneration, failing that ALIBI3 would provide such explanations that would at any rate minimise liability. ALIBI3 was implemented as an undergraduate project by Auni Spanioli, under my supervision. Moreover, a somewhat related prototype, SKILL, was implemented in 1990 in Prolog as an undergraduate project by Fadel Fakher-Eldeen. Justifying poor behaviour was extended to areas other than in the legal domain: skill in performing at some task was judged according to common-sense knowledge (including widespread prejudices, e.g. that adult women, unlike little girls, are often expected to be able to cook well) about the task, on classes of performers, and on the environment. The discussion in Nissan and Rousseau (1997) is about how to endow ALIBI with reasoning about complicity; see in Section 2.2.2.7 in the present book.

# 5.2.20 Crime Stories, Mediation by the Media, and Crime Fiction: Any Lesson to Be Learnt in Computer Models?

#### 5.2.20.1 Criminal Investigation and Criminal Trials Within the Remit of Literary Studies

Laurance Donnelly (2003, p. 8) pointed out:

The origins of Forensic Geology can probably be traced to the publication of *Sherlock Holmes* in the late 19th century. For instance, Dr Watson observed how Holmes could recognize different soils on clothing, and from their colour and consistency could identify what part of London they came from [...] Other Victorian writers of fiction also made reference to the use of geology in solving crimes. For instance, Thorndyke [...] described red-brown

 $<sup>^{96}</sup>$  Intended humour, though discouraged in litigants, is sometimes put to use by judges in the courtroom. See Hobbs (2007).

loam containing chalk fragments and foraminifera (microfossils) on a suspect's clothing. This was identified as being characteristic of the Cretaceous Chalk at Gravesend in Kent. It was at this locality where a body was subsequently located in a dene hole (a prehistoric flint mine). Although fictitious, these demonstrated an understanding of how geology might be used to solve crimes.

It is quite interesting that Edmond Locard, a pioneer of several disciplines within forensic science, published a book in criminalistics that, as stated in its title, *La Criminalistique à l'usage des gens du monde et des auteurs de romans policiers,* was catering to the authors of detective novels (Locard, 1937).

The early modern *belles lettres*, international folklore, and even late antique homiletical literature, all know variants of a story about a perspicacious observer who manages to reconstruct past events by observing circumstances, typically including traces of passage on a route. Rosoni remarks (1995, p. 279) that Voltaire's cogent argument against probabilities as applied to circumstantial proof is in contradiction with the eminently circumstantial logic of Voltaire's *qua* novelist in *Zadig*. (Let us recall in passing that in the front material of *Zadig*, its appeal is claimed even to such readers who dislike novels. The plot of the pseudo-Oriental tale is laden with events where parties with opposite claims are pitted against each other. Moreover, Voltaire himself consigned the two parts of the novel to different publishers, cashing from both yet denying both their entitlement to the novel in full.) In Babylon, the righteous Zadig is accused of having stolen the King's horse and the Queen's pet bitch. Zadig proposes an investigation line of hypotheses by which he had recognised the footprints and other marks left by the two animals in the sand (Nissan, 2001b).

A Persian proverb states: "'Did you see a camel?' 'No'." Haïm (1956) also provides a free translation: "Say that you did not see the camel, and relieve yourself of all commitments", and proceeds to explain by means of an anecdote (ibid., pp. 275–276):

A wise man, popularly identified with the famous poet Sa'di, was crossing the desert. On seeing the footprints of a camel, he knew that a camel had been passing before him. Further on, when he came to a lucern-field, he noticed that only one side of the field had been grazed, and guessed that the camel must have been blind in one eye. In the vicinity also he saw the trace of a camel's kneeling-place, as well as the footprints of a woman, which made him think that the rider, who had been a woman, must have caused the camel to kneel in that spot for a rest.\* [Haïm, ibid.: \*The anecdote has been, and is capable of being expanded by other details dealing with traces and conjectures, which contribute nothing subservient to the purpose.] At this juncture a man came up to Sa'di, and asked him whether he had seen a camel in the neighbourhood. Sa'di furnished the interrogator with all the foregoing signs and details, whereupon the man, who seemed to be the camel's owner, began to beat the innocent poet, who he thought had stolen the beast and kept the woman. In this way Sa'di committed himself by using his perspicacity, whereas if, in reply to the man who asked him whether he had seen the camel, he had only said, 'No', he would have been relieved of such a commitment. [...] The reason that the anecdote is connected Sa'di is based on the following verse: [...] *i.e.* How long dost thou allow to be beaten by the camel-drivers, O Sa'di? Thou couldst have ignored the matter from the beginning, and said, "No", in reply to the question, "Have you seen a camel?" It would seem as if Sa'di had personally experienced the trouble described in the anecdote, but the verse in question seems altogether spurious, and must have been invented by the vulgar to justify the belief that it was  $Sa^{\prime}di$  who originated the pvb. At any rate the story is very old. (ibid., pp. 275-276).

There is a variant of the camel track story, in an Italian book of 1557: Peregrinaggio di tre figliuoli del re di Serendippo (i.e., 'The Wanderings of Three Sons of the King of Serendip', i.e. Sri Lanka), itself being based, through an Armenian author, on the Persian-language Hasht Bihisht (Eight Paradises, 1302) by a poet, Khosrau, who was himself based in India. A Dutch forensic pathologist, Pek van Andel, of the University of Groningen, mentioned the Serendippo precedent in an article (van Andel, 1994) about serendipity, a concept the word for which was coined and defined by Horace Walpole on 28 January 1758. (Van Andel is the expert whose report disproved the accepted view in the Netherlands' Ballpoint Case - a few chapters in Malsch and Nijboer (1999) discuss that case – thus leading to the overturning of the sentence. Namely, he proved that it cannot be that the victim's head was shot a ballpoint pen through her right eye into the left lobe of the brain with a small crossbow, according to a confession ascribed to the defendant, who was the victim's son. Van Andel's results were the outcome of his own shooting ballpoint pens into the eve sockets of dead human bodies, by using a small crossbow: it turned out that the pen would come apart on impact against the back of the socket.)

As far as I know, the earliest version of the camel track story is to be found in *Lamentations Rabbah*, a Jewish homiletic work about the theme of the biblical book of *Lamentations* (for this variant of the story, cf. Hasan-Rokem, 1996, p. 61). There is a parallel passage (discussed by Hasan-Rokem, ibid., pp. 69–73) in the *Babylonian Talmud*, tractate *Sanhedrin*, 104ab (i.e., on both sides of folio 104). The passage in the latter concerns two prisoners taken by a Roman slaverer on Mt. Carmel. He overhears them as they tell each other that they had been preceeded, on the same road, by a camel that was blind in one eye, was carrying on the one side a wineskin, and on the other side one containing oil instead, and so forth. (MS Munich has a longer story, in which the two are able to discover, by a kind of reasoning that is implausible to a modern mind, that their master was the illegitimate child of a professional male dancer, and he eventually discovers that this was true.) In the version from *Lamentations Rabbah*, the circumstances are somewhat different.

Thus far in the present Section 5.2.20.1, we have been considering stories about some clever character who is able to reconstruct events from traces. This is central to detective stories, yet is quite distinct from literature about crime. "Browse a bookstore, writes Mark Seltzer, and you will find a healthy shelf labeled 'Crime'. Besides it may be a smaller, seedier shelf labeled 'True Crime'. The first is popular crime fiction, the second crime fact" – in the words of the publisher's blurb for Seltzer (2006), a book that analyses cultural factors in the blurring of the distinction between fiction and real event.

Let us turn to narratives about courtroom settings in films. "[C]inematic trials make much of such situations where extremely unfortunate circumstances [are in place], in the evidence as gathered, as well as in its handling in court. Norman Rosenberg (1994) is concerned with fiction and analyses, indeed, the filmic representations of court trials. He acknowledges the practical inescapability of our adopting a positivist attitude to evidence, even when aware of its limitations. Literary studies have been impinging on the law literature, especially from North America, increasingly in recent years, to the joy of some, the dismay of others" (Geiger, Nissan, & Stollman, 2001).

Moreover, lawyers as characters in fiction do not necessarily appear with a focus on the logic of a particular trial. The biographical element may be overriding. For example, there had been lawyers in William Faulkner's family, as wells as among his friends."It is hardly surprising, therefore, that Faulkner's narratives are replete with legal characters. Watson recounts more than a scene of these, spotlighting Gavin Stevens, who plays a prominent role for three decades in works ranging from *Sanctuary* to *The Mansion*" (Labor, 1994).

*Clues: A Journal of Detection*, published by Heldref Publications (Helen Dwight Reid Educational Foundation, in Washington, DC) is the only U.S. scholarly journal on mystery and detective fiction. Whereas such fiction is in print, television, and films, the journal itself published academic essays and nonfiction book reviews. Crime investigation is a central theme, but from the viewpoint of literary and film studies. The first volume of *Clues* was published in 1980.

A prominent psychologist, Amina Memon, included this passage in her 2008 course handouts for the course in *Psychology, Law and Eyewitness Testimony* at the University of Aberdeen:

I have never recommended a "fiction" writer before but to get a good insight into the course as a whole, you might want to read a John Grisham book – *The Innocent* – it's actually based on a real case where an innocent person was wrongly convicted – based on flawed evidence, questioning techniques and unethical investigative procedures including confession evidence inappropriately obtained. Grisham also refers to DNA exoneration evidence (the innocence project, see above for website).<sup>97</sup>

Computing and computer security have made inroads in this domain, too. Consider *heist films*, i.e., such films whose plot is woven around a group of people trying to steal something (if, in particular, it is a comic film, then it is called a *caper movie*). For example, in the 1964 heist film *Topkapi* (directed by Jules Dassin, starring Melina Mercouri, Peter Ustinov, Maximilian Schell, and Robert Morley, and based on Eric Ambler's 1962 novel, *The Light of Day*), the object to be stolen was a bejewelled dagger from Istanbul's Topkapi Museum. In a memorable scene, the gang lowers one of its members, by means of a rope held by Ustinov, into a museum hall, down from the ceiling. When during the 1990s another film was made, in which there also was a scene (clearly inspired by *Topkapi*) with a gang member being lowered down from the ceiling, what was being stolen was data from a personal computer. This reflects how conspicuous, as well as glamorous, computing has become.

Semiologists Thomas Sebeok and Jean Umiker-Sebeok have developed a comparison of the inference method of Sherlock Holmes and Peirce's abductive reasoning.<sup>98</sup>

Bear in mind that the reasoning about a murder story can be quite apart from the reasoning associated with crime investigation, or even with detective stories. Take late antique and medieval traditions woven upon Scriptural narratives (possibly

<sup>&</sup>lt;sup>97</sup> She was referring to http://www.innocenceproject.org/ This is a website that documents real life cases of miscarriages of justice. Junkin (2004) discussed the case of the first death-row inmate exonerated by DNA evidence.

<sup>&</sup>lt;sup>98</sup> That work by the Sebeoks has been translated in several languages (Sebeok & Sebeok, 1979, 1980, 1981, 1982a, 1982b, 1983, 1989, 1994).

filling gaps where Scripture itself is silent). A short communication by Breeze (1992) in a journal in English studies pointed out that within a medieval Christian tradition on the *Genesis* narrative of Cain and Abel, the narrative variant that has it that Cain used a camel jawbone to kill Abel is distinctive of Irish sources, as opposed to the other variant (from texts more broadly co-territorial within the British Isles, i.e., also from Great Britain) that maintains that Cain's tool to that effect was the jawbone of a donkey.

This detail is an evident product of narrative contamination from the story of Samson, who used the jawbone of a rather freshly deceased donkey (thus not fully skeletonized and dry) to kill several of his enemies. The same topic of Cain's murder weapon in relation to Samson's use of a jawbone was dealt with by Barb (1972).

In this example, the kind of reasoning that matters is the difference between narrative variants as related to *stemmatology*, i.e., the dependency hierarchy between texts, or families of manuscripts (and early printed editions). In the given example, the geography of the manuscripts also matters. Stemmatology is due to the fact that manuscripts had to be copied, and even though copyists did not necessarily manage to be precise when copying, and for that matter did not even abide by a code of practice requiring that copies be exact, this is a far cry from creative intrusion into what they were copying. Unless a misreading is involved, it's no mere copying inexactitude when a tradition maintains that Cain used a camel jawbone instead of the jawbone of an ass.

Howe et al. (2001) described "using programs designed for biological analysis of sequence evolution to uncover the relationships between different manuscript versions of a text", i.e., for the purposes of stemmatology (van Reenen & van Mulken, 1996): diagrams of phylogenetic analysis are used, in order to represent manuscript affiliation in a *stemma* (or stemmatological tree), which shows how manuscripts are clustered with respect to a supposed original. Stemmatological trees are not what is new about the method; it is the application to stemmatology of software originally intended for biology, that was novel.

#### 5.2.20.2 When Life Imitates Art

It does happen that a detective story appears to have inspired an actual crime, and investigators may use this as supplementary circumstantial evidence, which is not necessarily for the court, but rather for their own dynamics of forming an opinion while carrying out the investigation. In a newspaper in Orlando, Florida, Michael McLeod (1991), writing in the Sunday supplement of the *Orlando Sentinel*, reported about the case, from Alturas, Polk County, of George Trepal. This man, a computer expert, was married to Diana, an orthopaedic surgeon, and both of them were active members of Mensa, the social club whose member must have a high I.Q. (supposedly a reliable indicator of high intelligence). Their neighbours were working-class Parearlyn "Pye" Carr, his second wife, Peggy, and their teenager children or stepchildren. In 1988, Pye had received a threat in the mail a few months before his wife, a son and a stepson, fell ill. This turned out to be thallium poisoning, and Peggy became comatose, was eventually disconnected from life support, and died in March 1989. Thallium, an outlawed substance, is a heavy metal once

found in rat poison. The note Pye had received said: "You and your so-called family have two weeks to move out of Florida forever or else you all die. This is no joke."

Thallium was found in cola bottles that the Carr family was drinking. As it eventually turned out during the investigation, it was George Trepal who had placed the tainted bottles on the Carrs' doorstep. As mentioned, three members of the family developed symptoms of poisoning, and for Peggy the outcome was fatal. There was a history of altercations between the two families. The Carrs played loud music, whereas George Trepall would not tolerate the noise of a television set, and his wife would watch TV at a friend's.

Diana and George Trepall used to stage annually a murder mystery at a hotel: some participants would play out a murder, while others tried to solve the whodunit. George used to research the scripts written by his wife. After the Trepals moved houses (as Diana moved to a medical practice in another town), a small brown bottle was found at their Alturas house and it tested positive for thallium. In the Trepals' new home, police discovered a homemade collection of information on poisons. And the wife's collection of murder mysteries included *The Pale Horse* by Agatha Christie, a tale of a series of murders by thallium poisoning.

In 1975, George Trepal had been convicted in Charlotte, North Carolina, for conspiracy to manufacture amphetamines for a drug ring. He was also known to have tried to poison a person: "Trepal had once smeared a homemade hallucinogen on a refrigerator handle when he suspected someone of stealing his roommates' food – hoping the culprits would absorb the drug through their skin" (McLeod, 1991, p. 138). The police hadn't mentioned in interviews with the media the threat note that Pye Carr had received. An undercover agent signed up for the Trepals' mystery weekend, and in a brochure she was handed to introduce participants to the weekend, there was this passage: "When a death threat appears on the doorstep, prudent people watch what they eat. Most items on the doorstep are just a neighbor's way of saying, 'I don't like you. Move out or else." (McLeod, 1991, p. 139). This text is similar to the text of threat note that Pye Carr received, and also dovetails with the poison found in the cola bottles left on the Carrs' doorstep.

Clearly *The Pale Horse* by Agatha Christie being found where the Trepals lived was not a prominent item in the evidence, but it reinforced the coherence of the hypothesis that George Trepals was to blame. The evidence against George Trepals was entirely circumstantial, but overwhelming. He was found guilty of Peggy Carr's murder and condemned to death by a Florida court.

#### 5.2.20.3 The JAMA Model: Modelling an Outcry for Failing to Prosecute. On the Impinging Cultural Effects of a Repertoire of Former Narratives

In the JAMA model (only partly implemented as a program),<sup>99</sup> a sample legal narrative is analysed, of a hate murder crime and the way in public perception the

<sup>&</sup>lt;sup>99</sup> See Geiger et al. (2001), Nissan (2001b), Nissan and Dragoni (2000). The JAMA project is the starting point of Geiger et al. (2001), Nissan (2001c), and a section in Nissan and Dragoni (2000); cf. Nissan and Martino (2004b, pp. 197, 199). The full-fledged JAMA architecture (only

inquiry was handled. In the JAMA project, an attempt was made – while emulating, in so doing, some of the knowledge sources that Michael Dyer had used in his BORIS story-understanding program (Dyer, 1983a) – public or media reactions to the murder by arson of a homeless Somali refugee in Rome, Ahmed Ali Giama. He was burned to death as he was sleeping on a bench in a public park. Eyewitnesses identified the suspects, who were nevertheless released without being prosecuted.<sup>100</sup>

Whereas at present there are a few Somalis who are notable in the professions in Italy (especially medicine), around 1980 Somalis in Italy were almost invariably, and at any rate always as far as the public could see, at the lowest rung of society. And yet, this was not necessarily a reflection of a lack of education: some of them had been, it seems, professionals, or teachers. In the evening of 22 May 1979, the chilling murder of Ahmed Ali Giama (Jama) had taken place in Rome, and the victim had been reported to have had both professional qualifications, namely, as a lawyer in Somalia and as a teacher in that same country, and yet he was homeless in Italy. (Apparently he had been a law student at the University of Kiev.) Giama was reported to have been an opponent of Siad Barre's dictatorship; at any rate, he had eventually become a homeless exile in Rome.

On 22 May 1979, Giama was sleeping on a bench in a park, being the churchyard (*sagrato*) of Santa Maria della Pace, near Piazza Navona. A group of persons burnt him alive. There was the testimony of a group of persons who, because of their professions, would have been expected to be quite cogent, and yet, the suspects were released without being prosecuted.<sup>101</sup> Later on there was a trial ending in their

partly implemented) is about how a cultural repertoire of narratives (from both collective historical memory, and fiction) contributes to shaping the reception by public opinion of a crime story, and how law enforcement handles or mishandles it. The discussion leads to an examination of concepts of narrative improbability, as well as to considerations about the legal "doctrine of chances" (see in the Glossary). Also relevant is how the mass media report about crime; see Schlesinger and Tumber's book (1994) *Reporting Crime: The Media Politics of Criminal Justice*.

<sup>&</sup>lt;sup>100</sup> I recall mentioning this case to an Italian examining magistrate in December 1999, and he was startled and quite uncomfortable at the mention. Public opinion in Italy (where I was raised, and lived from 1965 and 1983) disliked the release of the suspects. Magistrates, too, when not in a professional capacity are members of the public.

<sup>&</sup>lt;sup>101</sup> Nissan, analysing the outrage in the media concerning the Giama case and to the outcome of the investigation, wrote as follows (Geiger et al., 2001, in the abstract):

Apparently in the same racist crime category as the case of [Black 18-year-old student] Stephen Lawrence's murder ([by a gang of white youths, while he was waiting at a bus stop] in [Eltham in the London borough of] Greenwich on April 22, 1993), with the ensuing [and enduring] controversy in the U.K., the Jama case (some twenty years ago) stood apart because of a very unusual element: the eyewitnesses identifying the suspects were a group of football referees and linesmen eating together at a restaurant, and seeing the sleeping man as he was set ablaze in a public park nearby. Professional background as witnesses-cum-factfinders in a mass sport, and public perceptions of their required characteristics, couldn't but feature prominently in the public perception of the case, even more so as the suspects were released by the magistrate conducting the inquiry. There are sides to this case that involve different expected effects in an inquisitorial criminal procedure system from the

conviction, but later on they were acquitted on appeal. The following is quoted from Geiger et al. (2001):

One day, as he was asleep an a bench in a public park in Rome, covered with newspaper sheets, somebody (a group of perpetrators) set fire to these newspaper sheets, and Jama found his death in the flames. There was a public outcry in the country, and an inquiry was of course carried out. (There was an outcry in Somalia, too: President Barre rode a nationalistic wave, and had a state funeral organized for Jama.) There had been eyewitnesses to the crime: a party of soccer referees and linesmen who had been eating outside a restaurant nearby. They identified the suspects: a group of youngsters (one of them a woman). These happened to be from the Parioli neighbourhood. Eventually, the inquiring magistrate released them, declaring to the media: "Sono bravi ragazzi" ("They are nice young fellows"). New outcry. In a context where in the public eye, the institutions would often come under scrutiny (on occasion, the judiciary also giving rise to controversy, or even the target of violence from some quarters), that public statement made right after the release by the magistrate conducting the inquiry sounded quite ambivalent: was that the conclusion, or a premise?<sup>102</sup>

<sup>102</sup> Furthermore, Nissan had written in that same article (Geiger et al., 2001):

In lay perception, the eyewitnesses were both unusual and formidable: football referees and linesmen. More eagle-sighted or lynx-eyed that *that* sort? (Not that losing teams' fans would agree that these are infallible, on the playing grounds. But here you got a [meeting] of "focal" kinds of events: football, tearful drama, and political nasties.) There was the "glaring" element, when one is to match this to a repertoire of narration styles for a judiciary theme. (Never mind the [farces] of Dario Fo, but the football referees as dismissed witnesses sounded like they were lifted from a play by Bertolt Brecht, a still fairly popular author during those years.)

On the face of it, it's quite an extralegal perspective on the given legal narrative. Yet, realising what is involved in lay perceptions of it is all-important (not just for countries with a jury, which wasn't the case of Italy at the time, and the case had never gone to court in the first place), if we are to provide a common-sense backdrop that is credible for more technically legal models.

Again: what is special about the Jama murder is the character evidence about the witnesses – these appear to almost be too good to be true  $[\ldots]$  – and the character evidence about the suspects. These were young adults, males and one female, from fairly well-to-do families from a given residential neighbourhood [namely, the Parioli]. Such a neighbourhood background was at best ambivalent on the face of it, in what could be expected at the time to be the public perception (and indeed it [was the widespread perception in the

Continent, where an investigating magistrate leads the inquiry and prepares the prosecution case, as opposed to trial by jury under the Anglo-American adversarial system.

In the Lawrence case in London, too, nobody was ever convicted. Eventually, this led to a recognition that there was institutional racism in the police. Moreover, it is significant that about fifteen years after the murder, at the time London's chief police commissioner Ian Blair was dismissed by London's new mayor Boris Johnson, while referring to the Lawrence case Ian Blair stated that the case was treated the way such cases occurring amid the working class are treated. This claim in turn involved race and class stereotyping, because the Lawrence family was Black, but middle class. Being Black was their sectorial identity within British society, but the statement the chief of the London Metropolitan Police gave in the interview, was clear evidence of his considering Black people in London as being *en bloc* part of the working class. Therefore, to Sir Ian Blair being Black was not only a sectorial identity within society, but also a class identity. Contrast this perception to the social realities researched in Daye's (1994) *Middle-Class Blacks in Britain*.

It must be said however that the public perception was in response to exposure by the information media,<sup>103</sup> and these in turn paid due attention to the case after authoritative personalities (including the Pope) had shown the way. In the context of a discussion of Somali–Italian relations during the 1970s, the following is stated about the Giama case in Giovagnoli and Pons (2003, p. 407, my translation)<sup>104</sup>:

It was an act of extreme and ferocious racism, expressing the creeping refusal and fear on the part of a segment of Italian society, at a time when the phenomenon is incipient of immigration from Africa, mostly from Italy's former colonies and from the Maghreb. Responses at senior levels were several, and indignant. The [Communist] mayor [Giulio Carlo] Argan [an art critic on good terms with the Vatican] condemns the crime as an infamy, and asks to be permitted to pay tribute to Ali Giama's body by paying visit. But Somalia's diplomats do not accept any interference, and obtain that the body be sent to Somalia by June the 2nd. Besides, on the day following the crime, the Pope visited a parish at the centre of Rome, and this attracted attention upon the crime, thwarting the risk that the press would pass it under silence. All four perpetrators were identified, tried, and sentenced to serve a total of 61 years in prison, at the Assizes in Rome, but later on they were acquitted. Such an outcome did definitely not help to improve relations between Italy and Somalia.

In the crime narrative which inspired the JAMA project, the crime had not just any witness. While he was sleeping on a bench in a park, covered with newspapers,

Un altro drammatico episodio ostacola la ricomposizione dei rapporti italo-somali. Il 22 maggio 1979, di sera, viene barbaramente ucciso a Roma un giovane somalo, Ahmed Ali Giama, ex studente di legge presso l'Università di Kiev, dato alle fiamme da alcuni sconosciuti mentre dormiva sul sagrato della chiesa di Santa Maria della Pace, nelle vicinanze di piazza Navona. È un gesto di estremo e feroce razzismo, che esprime il rifiuto e la paura striscianti in una parte della società italiana, in un momento in cui comincia ad affacciarsi il fenomeno dell'immigrazione africana, proveniente in gran parte dalle ex colonie e dall'Africa maghrebina. Le reazioni ad alto livello sono diverse e sdegnate. Il sindaco Argan lo condanna come un infame crimine e chiede di poter salutare la salma di Ali Giama con un atto di riverenza. Ma la diplomazia somala non accetta interferenze e ottiene il rimpatrio della salma per il 2 giugno. Inoltre, nel giorno successivo all'episodio, una visita del papa a una parrocchia del centro di Roma attira l'attenzione al misfatto ed evita che esso passi sotto silenzio sulla stampa. I quattro aggressori, tutti identificati, processati e condannati a 61 anni complessivi di carcere dalla Corte d'assise di Roma, vengono poi assolti. Questa conclusione certamente non appiana gli attriti.

event]). In fact, in the given European capital where the crime and ensuing inquiry took place, the conspicuous presence of young far-right extremists from that particular neighbourhood motivated these being labelled with the name for its inhabitants [i.e., *pariolini*]. In the given period, the term was known in the nationwide political lexicon to be a descriptor with that denotation.

<sup>&</sup>lt;sup>103</sup> I personally recall that when I gave a talk at a conference in Birmingham, on 17 April 2000, and mentioned the Giama narrative and the JAMA project, a prominent AI & Law scholar in the audience remarked that such racist episodes happen all the time. Just a few days afterwards, as I was back in London, there was a (minor) news item in the broadcasted media about a Black woman suffering a racist attack in Birmingham of all places: she was doused in petrol and burnt, but at the time had survived her burns. BBC Radio 4 did not give those news much prominence.

<sup>&</sup>lt;sup>104</sup> In the following, the original text is given, from Giovagnoli and Pons (2003, p. 407; fn. 38 cites Del Boca, 2001 [1987], vol. 4, pp. 497–498):

the victim was burnt alive. The event was seen by a group of soccer referees and linesmen, who were dining at a restaurant nearby. They identified a group of young men and a woman, but these were eventually released, causing an outcry. One of the background generalisations that were in effect, is that soccer referees and linesmen are eagle-eyed, <sup>105</sup> and within the tragedy, it was fortunate that such eyewitness testimony was available. Nevertheless, the examining magistrate concluded otherwise and did not prosecute. Incidentally, in eyewitness psychology there is a pattern by which a very confident witness may be overconfident and wrong. The public reaction however was, quite justifiably, that the case should have gone to court.

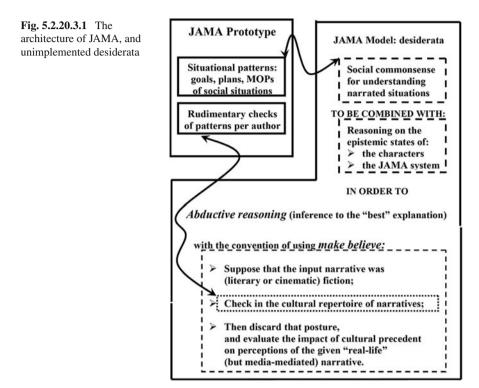
What is peculiar and awkward indeed about the eyewitnesses, is that they were football referees. But they were together, and presumably talking to each other, which presumably may have influenced how they recollected what they saw. Public expectations about the reliability of the visual acuity of such sports professionals are involved (the crime event was unrelated to either a sports event or sport-related violence, so that it was a striking coincidence that such very special eyewitnesses were available). That "even" with such testimony the case did not even go to court, lent itself to interpretations based on cultural factors and expectations. The point of selecting the particular narrative, the Jama murder and inquiry, is in that the awkward elements in it arguably help to shed light on more commonplace events. There are sides to this case that involve different expected effects in an inquisitorial criminal procedure system from the Continent, where an investigating magistrate leads the inquiry and prepares the prosecution case, as opposed to trial by jury under the Anglo-American adversarial system.

In the JAMA prototype, the attempt was made to approach the given case from the point of vantage of narrative models from AI; the difference with respect to narrative processing from the 1980s is in that not only situational social commonsense knowledge is represented, but also drawing on a more specifically cultural (literary) repertoire. The perpetrators were positively identified (but some legal psychologist may say that all too confident witnesses who were together may be wrong), by a singular kind of witnesses: a group of football referees and linesmen, who were partying together at a restaurant close by. At the stadium, these are professional witnesses-cum-factfinders. That such witnesses happened to be available when Jama was murdered, is almost "too good to be true". (The blessingin-disguise situational pattern was applied, to a story involving the availability of a witness, in a natural-language processing approach to narrative understanding, Dyer's book (1983a) on BORIS). Nevertheless, the investigating magistrate released the suspects, instead of prosecuting them.

In the *JAMA* project, what is of interest is how public perceptions of this were likely to be shaped in terms of public attitudes (trust or mistrust) to institutional justice, partly based on experience from previous cases reported about in the media, or even on a literary repertoire (e.g., Bertolt Brecht's plays: the extreme details in

<sup>&</sup>lt;sup>105</sup> Except, that is, when the football referees decides against the team of which you are a supporter yourself.

the actual Jama story, such as the professional profile of the witnesses, reminds of Brecht, as popularly perceived in the 1970s, notwithstanding Brecht being far from a humanitarian).<sup>106</sup> A software architectural schema as designed was presented in Nissan and Dragoni (2000). The schema is redrawn in Fig. 5.2.20.3.1.



<sup>&</sup>lt;sup>106</sup> Bertolt Brecht's ethics is illustrarted by the following. Brecht's The Measures Taken, a play from 1930, offered a Marxist-Leninist precept of departing from conventional moral (and even from an immediate, superficial understanding of Marx's alternative to the "bourgeois" sense of good and evil: [Marxian] good is whatever brings about the dictatorship of the proletariat, and [Marxian] evil is whatever obstacles it). In the play, revolutionaries who came to China in order to stir up a revolution kill one of their own, who out of compassion repeatedly helped the poor, for all to see. Their rationale is that his behaviour would have caused them to be detected. In The Measures Taken (which Arthur Koestler, who first was a Zionist at a socialist commune in the Galilee, then a fashionable reporter for the Western media, then a Communist in the Soviet Union, and finally an anti-Communist, called the most revealing work of communist art), three members of the underground cell kill and eat their fourth comrade, to avoid starving, then justify this to their superior. "Through his actions, the man had weakened their position by committing four crimes: pity, loyalty, dignity and righteous indignation, all violations of the true communist's code. The superior endorses the murder: 'He who fights for communism has of all the virtues only one: that he fights for communism.' The chorus in the play, speaking for Brecht, intones: 'Sink into the mud, embrace the butcher, but change the world: It needs it.' For the future freedom of mankind, they eliminated their colleague's freedom and his life as well." The wording is that of Toronto author, journalist, broadcaster, and editor Robert Fulford (2005).

#### 5.2.20.4 Episodic Similarities vs. Character Similarities

It is important to realise the difference between situational similarities between patterns of social behaviour (such as the ones captured in MOPs or the ones captured in TAUs in Dyer's BORIS program: see Section 5.2.9 above), and similarity between how events unfolded in what could be expected to be a fairly peculiar manner in a particular episode (this is something that in BORIS is represented in its *episodic memory* for each given narrative it analyses). Coincidences do happen, so that episodic similarity would result even for peculiar sequences of events. Or then, there may be correlates, yet not such strong correlates as the one that enable you to capture service at restaurants in a MOP for restaurants.

It is also important to realise the difference between

- the JAMA model seeking similarities of a narrative from the news to either collective memory in a given society, or in its pool of prominent items in its literary or theatrical or cinematic shared legacy, as being part of the cultural heritage,
- and on the other hand, the situation of seeking similarities between given individuals from real life and characters in a piece of fiction, with the latter characters possibly drawing inspiration from the former persons.

A distinction is to be made between a given person typifying some feature, and a given person as a source of inspiration of some fictional character. William Amos is the author of *The Originals: Who's Really Who in Fiction* (Amos, 1985). This peculiar dictionary of literary characters pinpoints and explains the supposed identity of the persons from real life who are assumed to have inspired a given character in a work of fiction. In the introduction, Amos remarks (ibid., pp. xiii–xv):

Tolstoy's use of relatives as models was obvious to his family, yet he noted how sorry he would be should anyone think he intended to depict any real person. In denying his use of Leigh Hunt as 'Harold Skimpole', Dickens added deviousness to duplicity, privately revelling in his portrait's accuracy, publicly disavowing all resemblance and averting his victim's wrath by publishing favourable profiles elsewhere. Maugham denied basing a character on Hugh Walpole, only to admit the identification once his model was dead. [...] If unadorned, drawn-from-life portrayal succeeds only with walking-on parts, and models for major characters are transformed into the author's own creation after the first couple of paragraphs, are originals really necessary? Listen long enough to writers and you might conclude that their models are inconsequential to the point of irrelevance. Certainly, the readers' guessing games which originals inspire are for authors a great irritant. For Proust, they were particularly vexing. His habit of combining several people's traits in a single character meant that as many as half-a-dozen different identifications could be partially correct, but none could be entirely right [...]. Balzac complained of the impertinence of more than seventy women who claimed to be his 'Foedora'. [...] In 1910 a libel action established that where there was evidence that some people might reasonably believe a plaintiff was the person referred to, it was immaterial that the writer never intended to refer to him. The minefield thus created for authors has prompted Graham Greene to recall a firm of solicitors who in the 1930s specialised in cross-checking characters' names with entries in the London telephone directory. The rarer the name, the greater the risk  $[\ldots]$ . Happily, these hazards have been reduced by the [England and Wales] Defamation Act of 1952. No longer can the innocent novelist be so easily convicted of libelling a person unknown to him; but publishers must establish either that the words were not defamatory or that no reference to the plaintiff was intended and no circumstances were known by which he or she might be thought to be referred to. They are also required to withdraw offending material [...].

Around 1990, coming out of a classroom, a professor of literary studies at Bar-Ilan University (Israel) found me waiting for him outside, and after we greeted each other, he told me: "Do you know? Amos Oz has used your name, *Ephraim Nissan*, for the protagonist of his latest novel". "I wasn't aware of that. I hope he didn't traduce me". "Oh, no! That character is sort of half-a-Messiah". "I need that like a hole in the head". "Who reads those novels anyway?"

Unfortunately, however, later on a newspaper supplement carried a *précis* of the novel, naming the protagonist and describing his awkwardness. By chance, novelist Oz was academically affiliated with the university (and campus) where I had previously earned a PhD in computer science, but I wasn't acquainted with him. There are five or six men with the same first name, 'Ephraim', and family name, 'Nissan', in the country's electoral lists. This is an example of similarities of characters confined to homonymy, but in his getting the name there may have been a causal link (namely, that the novelist came across my name in writing and he liked the sound, or that he overheard it at the cafeteria on campus).

# 5.2.21 Mathematical Logic and Crime Stories from CSI: Crime Scene Investigation<sup>TM</sup>: Löwe, Pacuit and Saraf's Representation, Building Blocks, and Algorithm

A mathematical representation of stories has been devised by logician Benedikt Löwe of the Institute for Logic, Language and Computation of the University of Amsterdam, the Department of Mathematics of the University of Hamburg, and the Institute of Mathematics of the University of Bonn, along with Eric Pacuit from the Department of Computer Science of Stanford University, and eventually also Sanchit Saraf, from the Department of Mathematics and Statistics, Indian Institute of Technology, Kanpur. Löwe made an important statement about the way his ideas about narratives developed, in an email of 24 September 2009 sent from New York to Yuri Gurevich with copies to Eric Pacuit of the Department of Philosophy of the University of Stanford, Andreas Blass at the University of Michigan, computer scientist Nachum Dershowitz at the University of Tel-Aviv, and Rohit Parikh at the City University of New York, a text that has further circulated:

there have been two completely disjoint entry points into the area of formalization of stories: One of them was my interest in dynamic logic and the ideas to represent stories as models of dynamic epistemic logic (or more general logics). This was prompted by discussions with Andres Perea at LOFT 2004, and then developed eventually (via various intermediate steps) into the paper published in the *Australasian Journal of Logic* with Eric [Pacuit. This is the paper Löwe & Pacuit (2008)]. The other one was my work on 'practice-based philosophy of mathematics' and my strong belief that the formalization of proofs in whatever proof system is not the real story about what these proofs are. I was intrigued by an idea of Robert Thomas who stressed the similarity between proofs and narratives. In the end, Thomas gave up this idea (I talked to him about this in Hatfield last July [2009] at a conference about mathematical proof), but I had this feeling that if you understand proofs as narratives \*and\* you have a formal means to characterize the structure of narratives, this might give some approximation of our notion of identity of proofs. However, we got stuck in the "a formal means to characterize the structure of narratives" part – this seems to be much more complicated than we originally thought, and decades of research in narratology do not seem to help much.

Löwe and Pacuit (2008) begin by pointing out that the process by which logic and artificial intelligence had grown apart was being reversed fin recent years: "logic overcame its traditional focus and started to study phenomena of interaction and interactive reasoning. This is best represented in the research area called *Logic and Games* in which logicians used dynamic techniques in order to study behaviour in game and communication situations and in what Parikh calls *Social Software*<sup>107</sup> [Parikh (2002)].<sup>108</sup> These new developments allowed logicians to provide theoretical insight in the general project of understanding reasoning processes in multiagent situations." (ibid., p. 163). "One particular interesting encounter between logic and game theory is the use of belief revision techniques in the sense of [Gärdenfors

<sup>&</sup>lt;sup>107</sup> This is not to be confused for computer software used for social interaction. Here is a definition from the Wikipedia entry for "Social software (social procedure)": "In philosophy and the social sciences, *social software* is an interdisciplinary research program that borrows mathematical tools and techniques from game theory and computer science in order to analyze and design social procedures. The goals of research in this field are modeling social situations, developing theories of correctness, and designing social procedures. Work under the term social software has been going on since about 1996, and conferences in Copenhagen, London, Utrecht and New York, have been partly or wholly devoted to it. Much of the work is carried out at the City University of New York under the leadership of Rohit Jivanlal Parikh, who was influential in the development of the field." Social procedures are analysed, and they are examined for fairness, appropriateness, correctness, and efficiency.

The same Wikipedia entry explains: "For example, an election procedure could be a simple majority vote, Borda count, a Single Transferable vote (STV), or Approval voting, All of these procedures can be examined for various properties like monotonicity. Monotonicity has the property that voting for a candidate should not harm that candidate. This may seem obvious, true under any system, but it is something which can happen in STV. Another question would be the ability to elect a Condorcet winner in case there is one. Other principles which are considered by researchers in social software include the concept that a procedure for fair division should be Pareto optimal, equitable and envy free. A procedure for auctions should be one which would encourage bidders to bid their actual valuation - a property which holds with the Vickrey auction. What is new in social software compared to older fields is the use of tools from computer science like program logic, analysis of algorithms and epistemic logic. Like programs, social procedures dovetail into each other. For instance an airport provides runways for planes to land, but it also provides security checks, and it must provide for ways in which buses and taxis can take arriving passengers to their local destinations. The entire mechanism can be analyzed in the way in which a complex computer program can be analyzed. The Banach-Knaster procedure for dividing a cake fairly, or the Brams and Taylor procedure for fair division have been analyzed in this way. To point to the need for epistemic logic, a building not only needs restrooms, for obvious reasons, it also needs signs indicating where they are. Thus epistemic considerations enter in addition to structural ones. For a more urgent example, in addition to medicines, physicians also need tests to indicate what a patient's problem is."

<sup>&</sup>lt;sup>108</sup> Cf. Pacuit and Parikh (2007), Pacuit (2005), Parikh (2001), Pacuit, Parikh, and Cogan (2006).

(1992)] as a means of analysis of games. The game-theoretic analysis of rationality and the study of belief revision have in common that they have a normative hue; they are concerned with questions of what constitutes rational behaviour and what would be quality measures for rationality." (ibid.). Löwe and Pacuit (2008) however take a different route (ibid., p. 163):

we develop a formal and abstract framework that allows us to reason about behaviour in games with mistaken and changing beliefs leaving aside normative questions concerning whether the agents are behaving "rationally"; we focus on what the agents *do* in a game. In this paper, we are not concerned with the reasoning process of the (ideal) economic agent; rather, our intended application is *artificial* agents, e.g., autonomous agents interacting with a human user or with each other as part of a computer game or in a virtual world. Arguably, when such agents interact, the underlying epistemic and rationality assumptions are much less important than the *actual* reasoning process used by the agents.

Löwe and Pacuit (2008) gave a story of mistaken beliefs ("in the style of a TV drama"): "The reader can imagine that this is the outline of a script. The reasoning processes referred to in the story can be made visible to the audience by monologues (Walter talking to himself in his car) or by conversations with some *confidant* or *confidante*." (ibid., p. 164). Then they proceeded to give the definitions for their formal system and how to use this setting to get a *backward induction solution*.<sup>109</sup> Next, they applied their semantics to the story of the example, and analysed it.

Löwe, Pacuit, and Saraf (2008) use "a simple algorithm for analyzing stories in terms of belief states" that had been developed in Löwe and Pacuit (2008), "to analyse actual stories from a commercial TV crime series, and identify a small number of building blocks sufficient to construct the doxastic game structure of these stories." (Löwe, et al., 2008, abstract). The TV crime series is *CSI: Crime Scene Investigation*<sup>TM</sup>. They explained (ibid., Introduction):

Whereas in [Löwe & Pacuit (2008, sec. 4)], the algorithm was used to fully analyze a fictitious story about love and deceit, in this paper, we focus on actual stories commercially produced for television broadcasting in this paper. In a descriptive-empirical approach we

<sup>&</sup>lt;sup>109</sup> Here is a definition (http://en.wikipedia.org/wiki/Backward\_induction): "Backward induction is the process of reasoning backwards in time, from the end of a problem or situation, to determine a sequence of optimal actions. It proceeds by first considering the last time a decision might be made and choosing what to do in any situation at that time. Using this information, one can then determine what to do at the second-to-last time of decision. This process continues backwards until one has determined the best action for every possible situation (i.e. for every possible information set) at every point in time. In the mathematical optimization method of dynamic programming, backward induction is one of the main methods for solving the Bellman equation. In game theory, backward induction is a method used to compute subgame perfect equilibria in sequential games. The only difference is that optimization involves just one decision maker, who chooses what do at each point of time, whereas game theory analyzes how the decisions of several players interact. That is, by anticipating what the last player will do in each situation, it is possible to determine what the second-to-last player will do, and so on. Backward induction has been used to solve games as long as the field of game theory has existed. John [von] Neumann and Oskar Morgenstern suggested solving zero-sum, two-person games by backward induction in their Theory of Games and Economic Behavior (1953), the book which established game theory as a field of study."

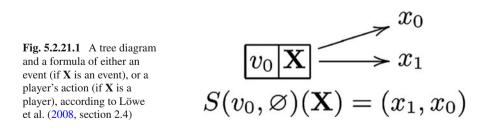
investigate their common structural properties based on a formalization in our system. The doxastic tree structures associated to the stories allow natural definitions of formal properties and complexity that can be further used to classify story types. The results of this paper show that from a large number of possible formal structures, commercial crime stories only use a very small number of doxastically simple<sup>110</sup> basic building blocks ([as shown in Löwe et al. (2008, section 2.4)]).

As opposed to Löwe and Pacuit (2008), in Löwe et al. (2008) *event nodes* were explicitly used. These are "nodes in which none of the agents makes a decision, but instead an event happens. Structurally, these nodes do not differ from the standard *action nodes*, but beliefs about events are theoretically on a lower level (of theory of mind) than beliefs about beliefs." (ibid., section 2.1).

To reconstruct the stories, the need for eight building blocks was identified (ibid., section 2.4). "The trivial building blocks are just events or actions that happen with no reasoning at all": these are called "doxastic blocks of level -1. We denote them by Ev if it is an event, and by Act(P) if it is an action by player P. Typical examples are random events or actions where agents just follow their whim without deliberation." (ibid.) But "being represented by a building block of level -1 does not mean that the *discourse* of the story shows no deliberation: in fact, even in our investigated stories we find examples of agents discussing whether they should follow their beliefs (i.e., perform a higher level action) or not, and finally decide to perform the action without taking their beliefs into account. These would still be formalized as blocks of level -1." (ibid.).

In the *tree diagrams* showing *building blocks*, a pair of adjacent squares indicates whose move in the game it is. The move could be of either a player, or an event. Refer to Fig. 5.2.21.1. If **X** is an event, i.e., if  $\mathbf{X}=\mathbf{E}$ , then this is the building block of an event,  $\mathbf{E}\mathbf{v}$ , but if **X** is a player, then the diagram represents  $\mathsf{ACt}(\mathbf{X})$ , i.e., action by player **X**.

If in a tree diagram there are more than one pair of adjacent squares, each pair of adjacent squares indicates whose move in the game it is. Sometimes the move is that of an event, rather than of a player, and then the node is an event node rather than an action node. Players symbols are indicated in boldface. Agents are assumed to be introspective, in the sense that agents are aware of their preferences and iterations thereof.



<sup>&</sup>lt;sup>110</sup> "Doxastically simple" means simple, as far as belief is concerned. The context is that of the logics of belief.

*T* is the game tree, and  $t_i$  is a terminal node of that tree;  $v_i$  is a nonterminal node of the tree. *S* is a state, and it is followed by a parenthesis containing two arguments (a node, and a list containing nil, or one player, or two players), and then another parenthesis containing a player. This is followed by an equal sign, followed by an ordering of nodes. If one of the nodes is nonterminal, is means that what precedes it is preferred over every outcome of that nonterminal, and that every outcome of that nonterminal is preferred over everything that follows the nonterminal.

There is a way to represent a situation the way it objectively is in reality:  $S(t, \emptyset)$  is the *true state of affairs* at position *t*. For state *S*, the *S*-true preference of player **P** at position *t* is the ordering that equals  $S(t, \emptyset)(\mathbf{P})$ . For example,  $S(v_0, \emptyset)(\mathbf{P}) = (t_1, t_0)$  means that the *S*-true preference of **P** at nonterminal node  $v_0$  is equal to the ordering by which terminal node  $t_1$  is preferred over terminal node  $t_0$ .

 $S(t, \mathbf{P})$  stands for player **P**'s belief at position *t*. Moreover, the following notation is used in order to express *nested beliefs*, i.e., the belief of a player about the belif of another player. If **A** and **B** are players and there is a state description  $S(t, \mathbf{B})$ , then  $S(t, \mathbf{AB})$  stands for **A**'s belief about  $S(t, \mathbf{B})$ .

"The next level of basic building blocks are those that have reasoning based on beliefs, but not require any theory of mind at all, i.e., building blocks of level 0. The two fundamental building blocks here are *expected event* ( $\mathsf{ExEv}(\mathbf{P})$ ) and *unexpected event* ( $\mathsf{UnEv}(\mathbf{P})$ )" (ibid., section 2.4). Refer to Fig. 5.2.21.2.

The same tree diagram represents either an expected event, whose formula is:

 $\begin{aligned} \mathsf{ExEv}(\mathbf{P}): \quad & S(v_0, \emptyset)(\mathbf{P}) = (t_1, t_0); \\ & S(v_0, \mathbf{P})(\mathbf{E}) = (t_1, x); \\ & S(v_1, \emptyset)(\mathbf{E}) = (t_1, x) \end{aligned}$ 

or otherwise an unexpected event, whose formula is:

UnEv(P): 
$$S(v_0, \emptyset)(\mathbf{P}) = (t_1, t_0);$$
  
 $S(v_0, \mathbf{P})(\mathbf{E}) = (t_1, x);$   
 $S(v_1, \emptyset)(\mathbf{E}) = (x, t_1)$ 

This is read as follows: "Moving beyond zeroth order theory of mind, we now proceed to building blocks that require beliefs about beliefs. There are two such building blocks used in our stories, *Unexpected Action* (UnAc(P,Q)) and *Collaboration gone wrong* (CoGW(P,Q))" (ibid.). See the tree diagram of an unexpected action in Fig. 5.2.21.3. The formula corresponding to an unexpected action is:

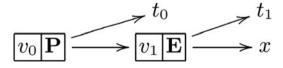


Fig. 5.2.21.2 The tree diagram of either an expected event or an unexpected event, depending on the accompanying formula (Löwe et al., 2008, section 2.4)

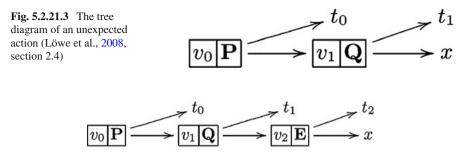


Fig. 5.2.21.4 The tree diagram of collaboration gone wrong (Löwe et al., 2008, section 2.4)

UnAc(P,Q):  $S(v_0, \emptyset)(\mathbf{P}) = (t_1, t_0);$   $S(v_0, \mathbf{P})(\mathbf{Q}) = (t_1, x);$  $S(v_1, \emptyset)(\mathbf{Q}) = (t_1, x)$ 

"There is an obvious analogue of ExEv(P) at this level that would be called *Expected Action*" (ibid.). By contrast, Fig. 5.2.21.4 shows the tree diagram of collaboration gone wrong, and its corresponding formula is:

CoGW(P,Q):  $S(v_0, \emptyset)(\mathbf{P}) = (t_1, t_0);$   $S(v_0, \mathbf{P})(\mathbf{Q}) = (t_2, t_1);$   $S(v_1, \emptyset)(\mathbf{Q}) = (t_2, t_1);$   $S(v_0, \mathbf{P})(\mathbf{E}) = (t_2, x);$   $S(v_0, \mathbf{PQ})(\mathbf{E}) = (t_2, x);$   $S(v_1, \mathbf{Q})(\mathbf{E}) = (t_2, x);$  $S(v_2, \emptyset)(\mathbf{E}) = (x, t_2)$ 

"Finally, we move to the building blocks that use second order beliefs. In our stories, there are only three such building blocks. One of them (in the story *The corrupt judge*) is slightly more complicated due to a component of incomplete information in the story" (ibid.). "The other two building blocks are *Betrayal* (Betr(P,Q)) and *Unsuccessful Collaboration with a Third* (UnCT(P,Q,R))" (ibid.). Figure 5.2.21.5 shows the tree diagram of betrayal, and its corresponding formula is:

Betr(P,Q):  $S(v_0, \emptyset)(\mathbf{P}) = (x, t_0);$   $S(v_0, \mathbf{P})(\mathbf{Q}) = (t_2, t_1);$   $S(v_1, \emptyset)(\mathbf{Q}) = (t_2, t_1);$   $S(v_0, \mathbf{PQ})(\mathbf{P}) = (t_2, x);$   $S(v_1, \mathbf{Q})(\mathbf{P}) = (t_2, x);$  $S(v_2, \emptyset)(\mathbf{P}) = (x, t_2)$ 

By contrast, Fig. 5.2.21.6 shows the diagram of unsuccessful collaboration with a third – "Again, as with UnAc(P,Q) and UnEv(P) = UnAc(P,E), we see that

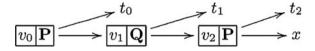
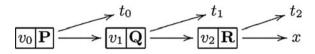


Fig. 5.2.21.5 The tree diagram of betrayal (Löwe et al., 2008, section 2.4)



**Fig. 5.2.21.6** The tree diagram of unsuccessful collaboration with a third (Löwe et al., 2008, section 2.4). Each pair of adjacent squares indicates whose move in the game it is: it's **P**'s move at nonterminal node  $v_0$  and it's **Q**'s move at nonterminal node  $v_1$  and it's **R**'s move at nonterminal node  $v_2$ 

*Collaboration gone wrong* is the special case of *Unsuccessful Collaboration with a Third* where the 'third' is an event." (ibid.) – and we can see that much indeed from the formula of unsuccessful collaboration with a third; the formula is:

```
UnCT(P,Q,R): S(v_0, \emptyset)(\mathbf{P}) = (t_2, t_0);

S(v_0, \mathbf{P})(\mathbf{Q}) = (t_2, t_1);

S(v_1, \emptyset)(\mathbf{Q}) = (t_2, t_1);

S(v_0, \mathbf{P})(\mathbf{R}) = (t_2, x);

S(v_0, \mathbf{PQ})(\mathbf{R}) = (t_2, x);

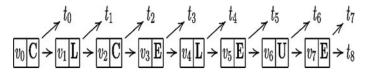
S(v_1, \mathbf{Q})(\mathbf{R}) = (t_2, x);

S(v_2, \emptyset)(\mathbf{R}) = (x, t_2)
```

"These building blocks can be stacked." (ibid.). It must be said that this kind of approach with building blocks bears a strong resemblance to structural narratology as initiated by Vladimir Propp in the Soviet Union in the late 1920s (Propp, 1928), and which become popular among scholars in English speaking countries in the late 1950s. What is novel in Löwe and Pacuit's formalism is the sound and elegant mathematics, complementing the idea of building blocks. They combined their application to games of logic, with lessons drawn from the state of the art of structuralist narratology. They actually pay much attention to the distinction between the formal structure of a story (this component is called *story* in narratology) and its presentation (in narratology, this component is called *discourse*).<sup>111</sup>

Löwe et al. (2008) analysed ten stories. "Half of our stories involves basic building blocks of at most level 1." (ibid., section 4). Figure 5.2.21.7 shows the tree diagram by whose means Löwe et al. (2008, appendix) formalised the story *Faked* 

<sup>&</sup>lt;sup>111</sup> Löwe, Pacuit and Saraf (2008) even go to the extent of pointing out that in narratology, the *story* is called *histoire* in French and  $\phi_{a}\delta y_{\pi a}$  (*fabula*) in Russian, whereas the *discourse* is called *récit* (or sometimes *discours*) in French and CIOKET (*syužet*) in Russian. This is useful, as those other terms are also used sometimes in other languages.



**Fig. 5.2.21.7** The tree diagram given in Löwe et al. (2008) for episode 3 of the story *Faked Kidnapping*, where the agents are Chip Rundle, C, Laura Garris, L, and the CSI unit, U

*Kidnapping*, which is one of the stories only involving basic building blocks of the simpler kinds. This story was formalised as

That is to say, betrayal occurs between Chip Rundle and Laura Garris, then an unexpected event affects each of them, the CSI unit intervenes, and then there is an event.

The formula of that same story as given by Löwe et al. (2008, appendix) is as follows:

$$S(v_0, \emptyset)(\mathbf{C}) = (t_3, t_2, t_0, t_1); S(v_2, \emptyset)(\mathbf{C}) = (t_3, t_2); S(v_2, \mathbf{C})(\mathbf{E}) = (t_3, v_4); S(v_0, \mathbf{C})(\mathbf{L}) = (t_2, t_1, v_3); S(v_0, \mathbf{CL})(\mathbf{C}) = (t_2, v_3); S(v_1, \mathbf{L})(\mathbf{C}) = (t_2, v_3); S(v_2, \emptyset)(\mathbf{L}) = (t_2, t_1, v_3); S(v_3, \emptyset)(\mathbf{E}) = (v_4, t_3); S(v_1, \emptyset)(\mathbf{L}) = (t_5, v_6); S(v_4, \emptyset)(\mathbf{L}) = (t_5, t_4); S(v_5, \emptyset)(\mathbf{E}) = (v_6, t_5); S(v_6, \emptyset)(\mathbf{U}) = (v_7, t_6); S(v_7, \emptyset)(\mathbf{E}) = (v_7, t_8)$$

Löwe et al. (2008, section 3.4) recognise that "the narrative sometimes does not allow us to uncontroversially choose the formalization. The dual problem to this is that the *discourse* is often much richer than the structure necessitates. In particular, there is information that may not be relevant, but could be included in the story." Moreover, they recognise (ibid., section 2.3) that "in actual stories (as opposed to stories invented for the purpose of formalization [...]), we cannot expect to have full states. Instead, we'll have some information about players' preferences and beliefs that is enough to run the algorithm described in § 2.2." Löwe et al. (2008, section 3.2) proposed to mimick imperfect or incomplete information by event games.

In order to exemplify this, they proposed this narrative: "Detective Miller thinks that Jeff is Anne's murderer while, in fact, it is Peter. Miller believes that Jeff will show up during the night in Anne's apartment to destroy evidence and thus hides behind a shower curtain to surprise Jeff. However, Peter shows up to destroy the evidence, and is arrested." They conceded that one could opt to formalise as an imperfect or incomplete information game, from game theory. They nevertheless preferred to formalise that story by resorting to an event node v2 representing "Peter turns out to be the murderer", as shown in the tree diagram of Fig. 5.2.21.8. Also refer to the accompanying key list (Table 5.2.21.1) and to the formula (Table 5.2.21.2).

**Fig. 5.2.21.8** The detective thinks the wrong person is the murderer, but then catches the right one (Löwe et al. 2008, section 3.2). A key list appears in Table 5.2.21.1

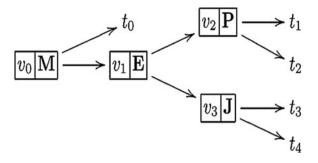


 Table 5.2.21.1
 Key list for Fig. 5.2.21.8

Μ	Detective Miller
J	Jeff
Р	Peter
$v_1$	"Peter turns out to be Anne's murderer".
$t_1$	"Jeff is the murderer, returns to the apartment and is caught".
<i>t</i> <sub>2</sub>	"Jeff is the murderer and does not return to the apartment".
<i>t</i> <sub>3</sub>	"Peter is the murderer, returns to the apartment and is caught".
$t_4$	"Peter is the murderer and does not return to the apartment".

Table 5.2.21.2 Formula for Fig. 5.2.21.8

$S(v_0, \mathbf{M})(\mathbf{E}) = (v_3, v_2)$	Miller believes that Jeff will turn out to be the murderer.
$S(v_3, \mathbf{M})(\mathbf{J}) = t_3;$ $S(v_1, \emptyset)(\mathbf{E}) = (v_2, v_3)$	Peter is the actual murderer.
$S(v_2,\emptyset)(\mathbf{P}) = (t_1, t_2)$	Peter in fact plans to return to the apartment.

Concerning the adequacy of the representation of that story, Löwe et al. claim (2008, section 3.2):

While this structure adequately describes the motivation of Miller and his surprise about catching someone who was not the suspect, it is unable to motivate why Peter chooses to go to the apartment. However, we found that for the chosen stories from the series *CSI: Crime Scene Investigation*<sup>TM</sup>, the impact on the adequacy of our formalizations was relatively minor. One of the reasons is that "strictly go by the evidence" is one of the often repeated creeds of the CSI members, prohibiting the actors from letting beliefs influence their actions.

And in a footnote: "A consequence of this is also that the investigators play only a minor rôle in our formalizations, often occurring in event nodes, and rarely making any decisions."

We rephrase discursively the algorithm from Löwe et al. (2008, section 2), and renounce here the considerably more formal setting and symbolism of their original definitions and discussion. The assumption is that the players will follow the *backward induction solution*. Then it is possible to analyse the game (which here is a story), and predict its outcome, once we are given a tuple comprising four elements:

a finite set of players, the tree (being a finite set of nodes and the edges relating them), a moving function (i.e., whose move it is, at every node of the tree), and the set of states.

In order to carry out the analysis, a set of labellings is constructed, from the tree to the set of its terminal nodes. That labelling represents the subjective belief, relative to the set of player symbols, of the outcome of the game if it has reached the node *t*. For example (here, we are modifying the original notation from the paper), let us notate labels as label<sub>state</sub>(node). If the *subjective labelling* which we notate as label<sub>state(A)</sub>(t) is equal to  $t_k$  where  $t_k$  belongs to the set of terminal nodes of the tree, then player A believes that if the game reaches t, the eventual outcome is  $t_k$ .

The labelling algorithm is as follows. If *t* is a terminal node, then assign *t* as value to  $|abel_W$  for all states *W*. "In order to calculate the label of a node *t* controlled by player **P**, we need the **P**-subjective labels of all of its successors." (ibid.). Said otherwise: if *t* is a node of the tree, and it is **P**'s move at node *t*, and we fix a state *W*, then we can define  $|abel_W|$  as follows: find the *W*-true preference of player **P**, that is, the ordering that equals  $W(t, \phi)(\mathbf{P})$ . The consider the labels  $|abel_{W(\mathbf{P})}(t')|$  for all such nodes *t'* that belong to the set of immediate successors of *t* in the tree, and pick that node which is the maximal of these, <sup>112</sup> say, *t*\*. Then assign *t*\* as value to  $|abel_W(t)$ .

This procedure has to be carried out until all *subjective labellings* are carried out, it is possible to compute the true run of the game. That is to say, the true run can be read off recursively. Remember that the subjective labellings are terminal nodes, and if the node is, say,  $t_k$  then player **A** believes that if the game reaches t, the eventual outcome is  $t_k$ . As the subjective labellings are terminal nodes, then for state *S* and for each *t* such that the moving function is  $\mu(t) = \mathbf{P}$  (that is to say: the move is of player **P**, at position *t*), there is a unique node *t'* that belongs to the set of immediate successors of *t* in the tree, such that

$$label_{S(\mathbf{P})}(t') = label_{S}(t)$$

In order to compute the true run of the game (i.e., of the story), start from the root of the tree, and then take at each step the unique successor determined by  $|abe|_{S}(t)$  until you reach a terminal node. (Of course, in a tree there is only one path between every two nodes of the tree.)

#### 5.2.22 Other Approaches

Ontologies are a technology that has received much attention during the 2000s (we devote to it Section 6.1.7.3 below). Ontologies are playing an increasing role in

<sup>&</sup>lt;sup>112</sup> For example, in the ordering  $S(v_0, \emptyset)(\mathbf{C}) = (t_3, t_2, t_0, t_1)$ , which is the first state description in the formula for the story *Faked Kidnapping* we had considered, the maximal node is  $t_3$  because it precedes all other nodes listed.

story-generation programs. We have omitted treatment of such ontology-based tools in the present overview, but some such projects from the 2000s that are not mentioned here are surveyed in Dov Winer's (in press) 'Review of Ontology Based Storytelling Devices'. At any rate, the resurgence during the 2000s of automated narrative processing, after the "AI winter" of the 1990s – when artificial intelligence shied away from open-textured problems like those which that story-processors of the late 1970s and of the 1980s had tried to tackle – has especially affected storygeneration software, rather than story-understanding tools. This is in relation to the development of computer games having conspicuously entered the computer science academic curriculum during the 2000s.

Note moreover that formalisms for communication and for representing narratives keep emerging. We are not going to delve here into the so-called "Leibnizian spatio-temporal representation" proposed by Katai, Kawakami, Shiose, and Notsu (2010), but it is worthwhile to signal it. By contrast to Newton's view that space and time are independent, Leibniz defined them as referring to each other, and this view is combined by Katai et al. (2010) with C. S. Peirce's existential graphs, as well as with *occurrence nets*, the latter being a variant of *Petri nets*, a widespread formalism for temporal organisation. This representational framework is applied to communication between characters within the plot of a particular play.

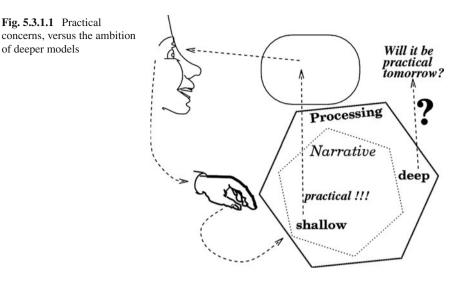
In the next section, Section 5.3, we are going to turn to *episodic formulae*, a formalism introduced by myself in the early 2000s. It is a method of capturing various facets of a narrative plot, and is partly indebted to the conceptual dependency theory from the late 1970s and 1980s.

## 5.3 Episodic Formulae

# 5.3.1 Instances of a Method of Representation for Narratives and Legal Narratives

Like oftentimes with information technology, shallower processing may yield practical tools, whereas the ambition of in-depth analysis may have for the time being confine itself to theoretical work done on paper. This applies, for example, to whether we can expect AI tools for supporting legal evidence to capture in depth a legal narrative. See Fig. 5.3.1.1.

In Section 5.2 I provided an overview of computational representation and processing of narratives. The technique presented in the present Section 5.3, instead, is for the time being intended for manual analysis, even though it will hopefully be eventually become a representation translatable into a lower-level representation that can be run on the computer. It owes a debt to the conceptual-dependency school (Schank, 1972), which we have considered in Section 5.2.8, and which between the mid-1970s and mid-1980s used to be based at the University of Yale (e.g., Schank & Riesbeck, 1981). Actually, one of the examples of the BORIS computer tool



answering questions after parsing and making sense of multi-paragraph text, was (as we have seen in Section 5.2.9) about a man who goes home with a friend, and discovers his wife in flagrant adultery; the friend who happens to be the eyewitness happens to be what according to previous plans would have had to be the lawyer representing him (Dyer, 1983a).

This section is concerned with a particular method that has been applied to several narratives, including legal narratives and identification evidence. I developed a notation in formulae for capturing various kinds of elements of a narrative. By means of such *episodic formulae*, notions which can be represented include beliefs, perceptions, communication, testimony, intentionality, purposeful action, identity, taking roles, physical possession, ownership, and other such concepts. Several of the narratives to which the method was applied were especially concerned with individual (or sometimes, kind-) identity and identification. Whereas the context mostly was the application of AI to law, with particular attention to evidence, nevertheless the sample narratives in a few of the resulting publications were from literary texts:

- the plot of the play *Henry IV* by Pirandello (Nissan, 2002b), in which identity relations are quite complex: a modern man having fallen off a horse at a historical pageant, comes to believe he is a medieval emperor (always at the age of 26, around the time he humiliated himself at Canossa), and about twenty years afterwards, having recovered his sanity, yet still posturing as the emperor, he provokes and kills his former rival in love, whom he suspects of having caused his accident;
- the play *L'Ile des esclaves (Slave Island)* by Marivaux, where a central notion is usurped identity: two couples, the former masters, the other lone their servants, are shipwrecked, and the judicial authority on the island on whose shores they landed decree that they must switch their identities, and therefore their

social status. Nissan (2003a) sets this situation into formulae, and also develops a classification of situations of false personation, including from the legal viewpoint;

• from a Middle English romance about Alexander the Great, who is recognised by Queen Candace in India notwithstanding his assumed identity. Nissan (2003b) developed for this a formalism, which includes the notions of action, enlisting support, assumed identity, counterdeception, and recognition based on visual evidence from a portrait.

For one of the narratives analysed (Nissan et al., 2004), the context was the analysis of policy-making within the *WaterTime* project, and the application was to a narrative about the privatisation of a city water system, and its eventual remunicipalisation in the wake of proven corruption on the part of a mayor. Among the other things, such concepts as *privatisation* and *graft* were set into formulae, and for comparison purposes, so was the concept *tax-farming* (a king of old who having received payment from a private individual, would grant the exploitation of resources in some region in the form of privatised tax collection or taxation, was by this very act not violating the law, unlike some modern administrator who concludes a corrupt contract).

Nissan (2001d) applied the same formal method for representing competing claims of identification in the so-called "Smemorato di Collegno" amnesia case, which divided Italian public opinion in two camps during the late 1920s. The same man was claimed by two different women, each claiming he was her husband. Nissan (2003d) develops an analysis in formulae for two cases:

- the feveroles case: of litigation in England after a firm, who had received an order for feveroles, inquired with its own supplier about what *feveroles* means, and having been told they are horsebeans, ordered and was supplied with horsebeans, only to discover it was misled, because it was supplied with feves, and horsebeans can be feves, fevettes, or feveroles, the latter being the most costly kind;
- the Cardiff Giant case: a hoax in New York State, from around 1870. The Cardiff Giant was an alleged petrified antediluvian man, whose alleged discovery was made public in October 1869. It had actually been carved on the initiative of George Hull, a cigar-maker, who sold shares of the Giant property to three Syracuse businessmen. The syndicate displayed the Giant, and Hull refused an offer to purchase or rent it, made by Phineas Taylor Barnum (1810–1891), who is currently especially known in connection with the circus that he eventually established in 1871. Barnum had a copy of the Giant made, and then exhibited it, claiming it was the original, bought from Hull's investors, and that by then these were exhibiting a copy. In December 1869, both "giants" were being exhibited in New York City. The Hull-led syndicate sued Barnum for calling his copy "genuine" and their original a "fake". Under oath, on February 2, 1870, Hull revealed his original hoax. The court ruled that Barnum could not be sued for calling the Cardiff Giant a fraud when it actually was a fraud, and the case was dismissed.

Nissan (2003c) proposes a formal representation (which I reworked into Section 5.3.3 below) for the controversy concerning the Meinertzhagen bird collection, about which some claimed (with a forensic test apparently confirming this) that at least one specimen had been restuffed and relabelled. Such a situation makes for interesting formulae. Nissan (2007b), about the MURAD subproject of the AURANGZEB project (itself part of the PLOTINUS umbrella project, a sequel to the earlier analyses), analyses a historical episode from a war of succession in northern India during the 1650s.

The eventual winner of that war, Aurangzeb, deceives Murad, who is his brother and sulking ally in their fight against the other brothers. Murad is hosted at Aurangzeb's camp, dined and wined into sleep, and then put in fetters once his bodyguard is overpowered and his own weapons are taken away from his side. The main notions are beliefs, goals, plans, and deception. Some complex situations are coded into instances of Toulmin's structure for arguments. (Also note that a model of betrayal is incorporated in BRUTUS, an automated story-generation system described by Bringsjord and Ferrucci (2000). BRUTUS has sophisticated, yet domain-specific abilities as a narrator, producing concrete narratives.)

Nissan (2008j) introduced the similar formalism for the AJIT subproject of the AURANGZEB project. The AURANGZEB project is specifically concerned with combining episodic formulae with argument structure data (in particular, Toulmin's). One can see this in the set of formulae developed for the Murad narrative, as well as in the set of formulae intended to capture the Ajit narrative. The latter is as follows.

The Raja of Marwar, Jaswant Singh (or Jasavantasingha), Maharaja of Jodhpur (b. 1625, r. 1638, d. 1678) – the Hindu ruling monarch of Marwar, from the Rathor or Rathore clan of the Rajput military community that had long been in the service of the Muslim Mughal imperial dynasty – had perished because of that hardships of the winter at his command post near the Khyber Pass in December 1678, and this had been after his only son had also perished. This was during a war they were both fighting in Afghanistan, in the service of Aurangzeb, in order to repel some invading Afghan tribes (Eraly, 2004, p. 418). Because of tributes unpaid, Aurangzeb proceeded to make Jaswant's debt good from the dead Jaswant's personal assets. Aurangzeb had the principality of Marwar put under direct imperial administration.

For a while, Aurangzeb toyed with the idea of appointing Indra Singh as successor to Jaswant, in order to divide the Rathors. Following Jaswant's death, among possible claimants for his throne the strongest was Indra Singh (a grandson of Jaswant's elder brother), but he was not acceptable to most Rathors in the elite of Marwar. Once Aurangzeb learned that two of Jaswant's wives were pregnant, he agreed to wait for the birth of the babies. Two sons were born. Ajit was born first. Aurangzeb ordered the two babies and their respective mothers seized, so that he would maintain them at his court in Delhi, and so that the children would be raised under his supervision. His preferred daughter, Zebunnisa, was in charge of educating the child who had been seized, and who, so Aurangzeb was made to believe, was Ajit, the heir to Jaswant's throne. Importantly, the two boys would be raised in Aurangzeb's own religion, and this was unacceptable to the Rathor dynasty of Marwar.

What had actually happened, was that the Rathors, under the leadership of Marwar's able politician, Durgadas (1638–1718), had exchanged the two babies and the two women. The female attendants were made to dress up and posture as though they were Jaswant's wives. The real queens were dressed like men, and fled with Jaswant's babies, together with a contingent of Rajputs. Aurangzeb's imperial officers had seized the wrong persons. When the imperial officers went to seize the queens and the princes, the Rajputs fought as if they were indeed fighting to defend their royal family, and many were killed. It is the account of Khafi Khan that the historian Eraly adopts at this point (Eraly, 2004, p. 421). Other accounts exist, of this episode and of the ruse of the Rajput in order to avoid Ajit being seized, but Khafi Khan's is the account in which all elements fall in place and make sense. This is the account that is represented in our formulae, as well as common sense about being obliged or not feeling under obligation, such as when both Jaswant and his son died in the service of Aurangzeb.

A guerrilla war ensued: the plains of Marwar had been occupied by imperial troops, with Rathor bands based on the hills or the desert, emerging and harrassing them from time to time. Eventually Aurangzeb left Rajasthan to wage war on Deccan in the south of India. Durgadas sought refuge in the Deccan, but in 1687 he returned to Marwar, and brought Ajit Singh, eight years old then, out of concealment. Thus, the Rathors of Marwar made it known that the real Ajit was under their control. Aurangzeb refused to concede that much. It was only once, in the late 1690s, Durgadas did Aurangzeb an important favour, that the Emperor became reconciled to Durgadas and to Ajit. When Ajit wed a bride from another royal family, it became clear that he was the real Ajit indeed. The marriage itself, into another royal family, removed all doubt about Ajit's identity. Instead of making Ajit the ruler of Marwar, he was given another territory to rule, and the compromise was accepted (until after Aurangzeb's demise).<sup>113</sup>

Using episodic formulae along with Toulmin's data structure for arguments proved useful, for representing the Ajit narrative, and opposite viewpoints concerning Aurangzeb's motives when dealing with Marwar found expression in the handy representation of the argumentation. Episodic formulae enabled analysing the narrative at a finer grain than it would have been possible if only a representation for arguments had been used, as applied to natural language propositions.

Episodic formulae were also developed in Nissan (2008b), analysing a perhaps apocryphal anecdote about the emperor Tamerlane. He invited three painters in turn, and commissioned from each, his own portrait. The first painter painted the king as a very handsome man, and Tamerlane had him beheaded, to punish him for his excessive flattery. The second painter represented the king realistically, if one means by that: warts and all. Tamerlane had him beheaded, as he found it intolerably offensive to see himself represented with hideous features. The third painter portrayed the king in the act of shooting an arrow, and did so "realistically", yet without revealing

<sup>&</sup>lt;sup>113</sup> Nissan (2009b) is an article in the humanities, developing a full-fledged discussion of a side story that appears in Nissan (2008j).

the physical defects, because the posture was such that these would not be apparent. How did the third painter portrait Tamerlane? In fact, in order to shoot the arrow from his bow, Tamerlane was kneeling down, so one would not notice that one leg was shorter. To aim, Tamerlane shut an eye, so one could not tell out the squint which affected his eyes (because you need to see both of them open, to tell out). This way, the life of the third painter was saved.

This story of Tamerlane and the three painters involves fairly complex epistemic structures of belief and intentionality, and these are involved in the characters' reasoning about the human body of one of them, and about the depiction of that body in a portrait (i.e., in a given kind of representation). Tamerlane shares with the three painters all of them being instances of the kind 'human being'. Nevertheless, Tamerlane doesn't possess the specific skills associated with the kind 'painter', and contracts out to painters the task of painting his portrait. Tamerlane, being an instance of the kind 'absolute ruler', of which there only is (at most) one in a given polity, possesses a very high degree of authority on all other agents within the polity, and they in turn not only do not possess authority on him (except his doctor, if he considers him authoritative and follows his advice), but also hardly can resist his orders. Therefore, it is extremely dangerous for them to provoke his susceptibility, which is both affected by emotion, and is rational at the same time. He does not need to be concerned about the same in the reverse relation (unless he does so to so many and to such a degree, that the polity would rebel as well as his own otherwise obedient army).

It is important to stress that when we represent the anecdote about Tamerlane and the three painters by means of episodic formulae, we are making no claim of automatable processing. It would have been a different story, had we been representing the narrative in terms of *event calculus*, or *situation calculus*, or extensions of these. These are representations at a lower level, yet ones that are rigorous and computable. Developing a translation of at least a subset of the language of episodic formulae into an extension of either event calculus or situation calculus is a desideratum, and it is unclear to what extent such an effort would be successful.

The article (Nissan, 2008g) about the TIMUR model (the representation in episodic formulae of the anecdote about Tamerlane) appeared in a robotics journal, and it is especially considering this, that is remarkable that it resorted to notions familiar to folklorists, from the study of folktales. The article argues for the importance of providing an explicit treatment for the narrative dimension of social interaction, even when this takes place in a society of embodied agents: not only among animated avatars in a virtual environments, but even in a society of robots. There are some approaches in narrative inquiry (such as ones from the study of folktales, including, but not only, *story grammars*) that may be useful for capturing situational patterns. These are quite useful when there is a stock repertoire of narrative functions.

Nissan (2008g), the article about the TIMUR model, which iself is about agents reasoning about their own or each other's body, appeared in the same journal issue as Nissan (2008h), a survey about embodied artificial agents (either robots, screen avatars, i.e., animated characters in computer interfaces) that reason about agents'

bodies (e.g., *metamorphic robots*, i.e., *self-reconfiguring* robots), as well as about such software that incorporates a model of the human body.

Another model, resorting to both episodic formulae and block schemata as familiar for representing feedback in *systems & control* research (from engineering or cybernetics), was described in Nissan (2008e, 2009 [2010], 2010a), in the *Journal of Sociocybernetics* as well as in a journal in the history of ideas. Nissan (2008i) is about a social pattern, whereas the papers Nissan (2009 [2010], 2010a) are about a particular episode that exemplifies it, and that was analysed by means of episodic formulae. All three articles articles are about social narratives of compulsory signs (medieval or later) of group identity disclosure, imposed by an authority interested in fostering prejudice and imposing patterns of exclusion effectively.

The analysis "is applied to the core pattern of such social dynamics of prejudice, that takes the form of forcing members of a dyspreferred group to wear a sign of recognition. Moreover, block schemata are given, that show feedback on the attitudes of society, based on the goals of a malevolent authority. The phenomenon has occurred several times throughout history: e.g., the Jewish badge in medieval Europe, or under Nazi rule, as well as for Hindus under Taliban rule in Afghanistan. We begin by situating such an episode in the history of the Mongol II-Khanid kingdom [comprising Iran and Iraq]. The earliest precedent was under the Abbasid Caliphate. In 1831, the badge was still imposed in Modena, by a ruler who provided the model for Stendhal's *La Chartreuse de Parme*" (from the abstract of Nissan, 2008e).

The specific narrative analysed in Nissan (2009 [2010], 2010a) is from the final years of the 19th century in Teheran. Nissan (2010a) develops a discussion mainly within the humanities, whereas Nissan (2009 [2010]) provides the formulae for the same narrative. What makes it especially interesting for analysis in terms of a goal hierarchy as represented by means of episodic formulae, is that the representative of a French educational philanthropic organisation (the Alliance Israélite Universelle) sought to have the red patch imposed on Jews replaced with the badge of his own organisation, thus intending to subvert the humiliating purpose with which the compulsory sign disclosing affiliation in the given faith community had been imposed in 1897.

Nissan (2007c, forthcoming a) analyses episodes from two criminal cases. At a trial in Newcastle, the defence counsel claimed that his dog had eaten a video tape that was vital evidence; he was able to obtain copy of the video evidence later on during the same hearing (see Section 3.2.4 above). This is analysed by structuring arguments about how to interpret this, using Wigmore Charts (a technique we have seen in Section 3.2.). The second case considered is the series of trials against Sofri and others for the murder, in 1972, of a police chief in Milan (the case is very controversial). In response to the defence requesting the material evidence (garments worn by the victim when he was shot, the bullet, and a car), the prosecution claimed that the material evidence was no longer available, as mice in the storehouse had destroyed it. This is analysed by using episodic formulae the kind of formalism to which the present Section 5.3 is devoted.

Figure 5.3.1.2 underscores the contrast between blue-sky research, and practical projects, within the experience of the present author.

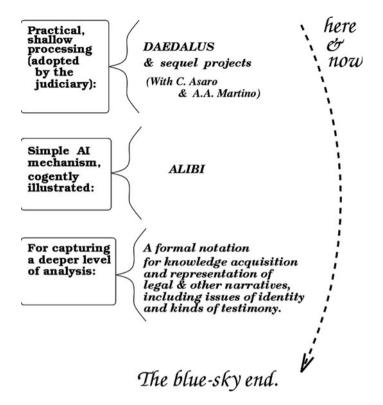


Fig. 5.3.1.2 A spectrum of goals, in projects in which the present author was involved

## 5.3.2 The Notation of Episodic Formulae

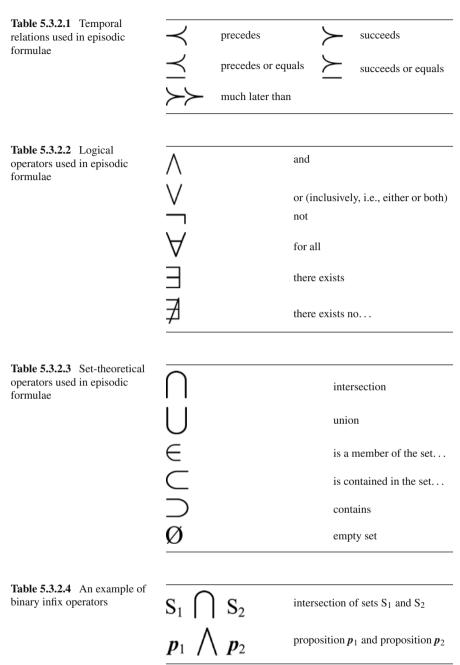
In the following, the symbols available for use in episodic formulae are defined. Readers interested in using these symbols in formulae can obtain them from myself, including (which I typically do) in order to incorporate individual symbols as an .eps file inside LaTex code (I can also provide contextual nuggets of LaTex code, or then samples). I can be contacted by email at ephraimnissan@hotmail.com for that purpose, or for any professional communication.

In episodic formulae, temporal relations include the ones shown in Table 5.3.2.1.

Standard logical operators we are going to use in Section 5.3.3 include the ones shown in Table 5.3.2.2.

Also the standard operators on sets, namely, intersection and union, are in use (for example, in order to define as agent the union of individual characters or sets of characters). See in Table 5.3.2.3.

We adopt the standard mathematical notation by which binary infix operators such as "and", "or", "intersection", and "union", that are usually placed between two arguments, such as shown in Table 5.3.2.4, can become a prefix operator, placed before a set of arguments. For example:



#### 5.3 Episodic Formulae

$$\bigwedge_{i=1}^{N} p_i \equiv p_1 \land \ldots \land p_N$$

The following is in the standard notation of *set theory*. Curly braces enclose a set. Sometimes there is a vertical line after an initial symbol with a generic subscript, as in the following example:

$$\left\{ \left. \left. \left\{ \left. \left\{ \left. \left\{ \left. \left\{ \left. \left\{ \left. \left\{ \right\}_{i} \right| is-a \ bird \right\} \right\} \right\} \right\} \right\} \right. \right\} \right\} \right\} \right\} \right\} \right\} \right\}$$

This formula means: "a set of such elements, that each element is a bird and is stuffed". The subscript identifies any of those members, whereas the specific values will be from 1 upwards, up to the cardinality (i.e., the number of elements) of the given set. As to "is" and "is-a" as being infix binary operators (that is to say, they each follow the subject and precede its predicate), these are standard in *semantic networks* from artificial intelligence.

In episodic formulae, whenever the symbol for an agent appears as a subscript to the symbol for a verb, that agent is to be taken as the subject of the action expressed by that verb. If, instead, an agent (or an inanimate concept) appears as the subscript of a noun, then the referent is to be understood as an instance of the concept named, which belongs to the concept symbolised by the subscript.

Symbols specific of our episodic formulae notation includes those shown in Table 5.3.2.5. A notation for "crumpled", i.e., discarded relations between proposition was also defined. See Table 5.3.2.6. Episodic formulae express ability, permissibility, and agency as shown in Table 5.3.2.7.

The notation shown in Table 5.3.2.8 is about belief. We don't distinguish between belief and knowledge, but see Abelson (1979) concerning the differences. Abelson listed seven differentiating features. The notation shown in Table 5.3.2.9 is about characters' goals. For a character realising something (conceiving of an idea), as well as for making a hypothesis, in episodic formulae we have the symbols shown in Table 5.3.2.10.

We have symbols for perception in episodic formulae (the character giving testimony is identified by a subscript to the symbol, whereas the time is indicated by a superscript to the same symbol). See Table 5.3.2.11. In contrast, Table 5.3.2.12 comprises symbols for kinds of giving testimony (here, too, the character giving testimony is identified by a subscript to the symbol, whereas the time is indicated by a superscript to the same symbol).

Only quite few further symbols were defined, and that was in order to express that given affective attitudes are felt by some given character (which, like for all other symbols defined above, can be indicated by means of a subscript to the symbols, and that can be not necessarily an individual character, but as well a collective character, such as society, or its ruling group).

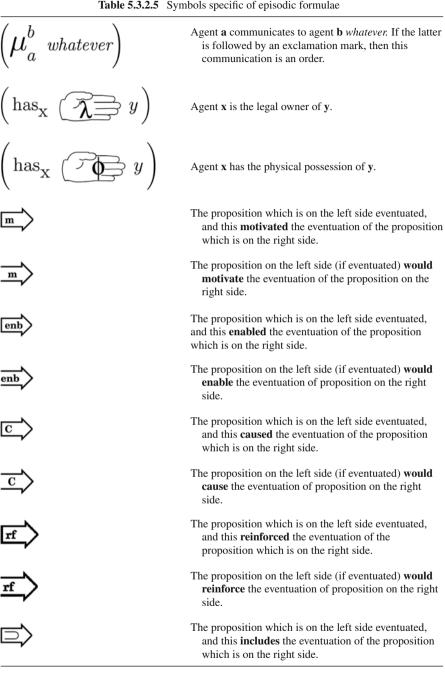
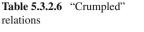
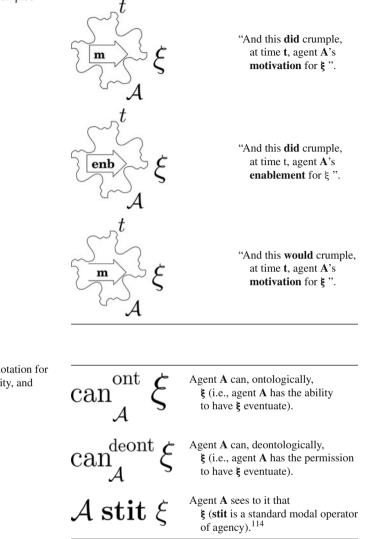


Table 5.3.2.5 Symbols specific of episodic formulae

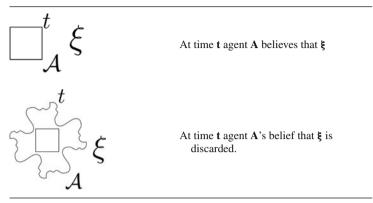




**Table 5.3.2.7** A notation forability, permissibility, andagency

<sup>&</sup>lt;sup>114</sup> On the *stit* operator, see Horty and Belnap (1995). The *stit* operator was introduced by Belnap and Perloff (1988). In an article applied to a legal narrative, Perloff (2003) shows how a modal logic of agency with a *stit* operator (*stit* stands for "sees to it that") can be concretely applied in legal analysis. Whereas it used to be the case, in logic-based accounts of agency, that analysts would focus on actions rather than on agents (i.e., the actors that carry out actions; not necessarily "police agents"), Perloff shows that "stit theory puts the agent at the center of the action".

#### Table 5.3.2.8 A notation for belief





# Table 5.3.2.9 A notation concerning characters' goals

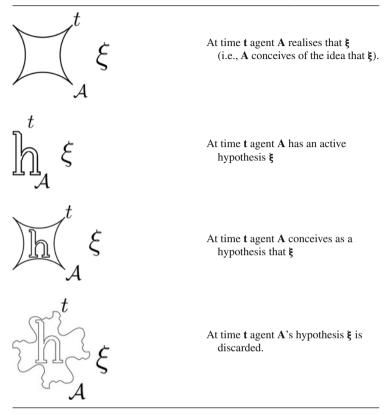
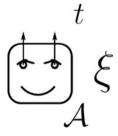


Table 5.3.2.10 A notation for realisation, or conceiving of an idea

In particular, the following notation expresses hope, despair, and the like. The following is the notation for hope:



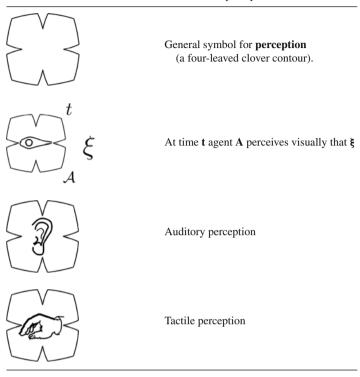
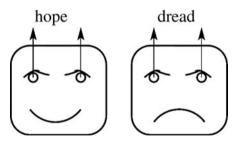


 Table 5.3.2.11
 A notation for perception

The symbol for dread is similar to the symbol for hope:



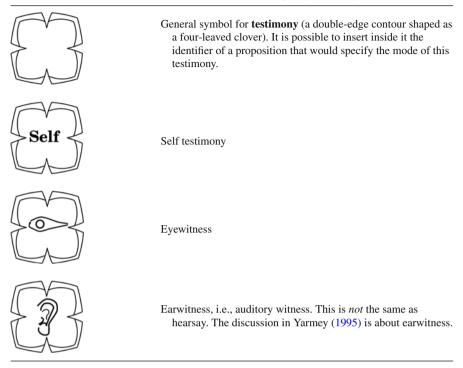
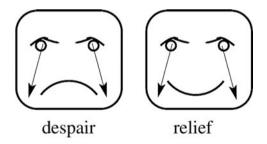


 Table 5.3.2.12
 A notation for kinds of giving testimony

Whereas hope and dread are about the future, despair and relief are post-event emotions. The symbols for these are as follows:



In episodic formulae, also symbols for prejudice are available. In order to indicate that At time  $\mathbf{t}$  agent  $\mathbf{A}$  has a positive, or very positive, or negative, or very negative prejudice towards  $\boldsymbol{\xi}$  the following four notations are available:

$$\blacksquare_{\mathcal{A}}^{t} \xi, \quad \blacksquare_{\mathcal{A}}^{t} \xi, \quad \blacksquare_{\mathcal{A}}^{t} \xi, \quad \blacksquare_{\mathcal{A}}^{t} \xi$$

Typically one would only use a subset of all these symbols. One may argue that one could go on defining new symbols, and that there would be no end to it. Nevertheless, experience with applying this notation to several narratives has shown that the technique converges. There is no risk of going on defining more and more symbols. For sure, it would be possible to replace words (names of predicates) for the graphic symbols. The advantage of the graphics (notwithstanding such preference being subjective) is that the episodic formulae tend to look compact, and one can relatively quickly make sense of what is on the page, whereas with verbal strings identifying standard predicates or modal operators, one is forced to read line by line.

# 5.3.3 An Example: From Suspects and Allegations to Forensic Testing of the Stuffed Birds of the Meinertzhagen Collection

#### 5.3.3.1 The Background, and the Narrative Represented

In Lipske's words (1999), "A British soldier, spy and noted amateur ornithologist in the early part of this century", Richard Meinertzhagen,<sup>115</sup> died at age 89, a week

<sup>&</sup>lt;sup>115</sup> Biographies in book form of Col. Richard Henry Meinertzhagen include Cocker (1990), Capstick (1998), and Lord (1971). A radio broadcast by the journalist Mark Cocker (2000) took on board the negative picture of Meinertzhagen as an ornithologist that has been recently emerging. A biography by Brian Garfield (2007) presents the man as a fraud. Garfield is, among the other things, "the author of novels that have been made into Hollywood movies (including Hopscotch and Death Wish)", and "a former president of the Mystery Writers of America". The summary of Garfield's book claims: "Tall, handsome, charming Col. Richard Meinertzhagen (1878-1967) was an acclaimed British war hero, a secret agent, and a dean of international ornithology. His exploits inspired three biographies, movies have been based on his life, and a square in Jerusalem is dedicated to his memory. Meinertzhagen was trusted by Winston Churchill, David Lloyd George, Chaim Weizmann, David Ben Gurion, T. E. Lawrence, Elspeth Huxley, and a great many others. He bamboozled them all. Meinertzhagen was a fraud. Many of the adventures recorded in his celebrated diaries were imaginary, including a meeting with Hitler while he had a loaded pistol in his pocket, an attempt to rescue the Russian royal family in 1918, and a shoot-out with Arabs in Haifa when he was seventy years old. True, he was a key player in Middle Eastern events after World War I, and during the 1930s he represented Zionism's interests in negotiations with Germany. [This was at the time when Britain allowed into Palestine a fraction of the Jews trying to leave Nazi Germany.] But he also set up Nazi front organizations in England, committed a half-century of major and costly scientific fraud, and - oddly - may have been innocent of many killings to which he confessed (e.g., the murder of his own polo groom -a crime of which he cheerfully boasted, although the evidence suggests it never occurred at all), while he may have been guilty of at least one homicide of which he professed innocence. [...]". Some of the research by Garfield in his biography of Meinertzhagen has however been questioned in Storrs Olson (2008), in an ornithology journal.

Among the claims made by Garfield (2007, p. 209), there is plagiarism. To say it with Wikipedia (at http://en.wikipedia.org/wiki/Richard\_Meinertzhagen): "As the author of numerous taxonomic and other works on birds, and possessing a vast collection of bird and bird lice specimens, Meinertzhagen was long considered one of Britain's greatest ornithologists. Yet his magnum opus, *Birds of Arabia* (1954), is believed to have been based on the unpublished manuscript of another naturalist, George Bates, who is not sufficiently credited in that book." Based on Garfield (2007, p. 68), Wikipedia also points out: "In the east African Kenya Highlands in 1905, Meinertzhagen

after the June 1967 Six Day War,<sup>116</sup> was long credited with creating one of the world's best private collections of Old World bird specimens".<sup>117</sup> In 1993, Ibis, the journal of the British Ornithologists' Union, published an article, actually an exposé by Alan Knox (1993), which "suggested, however, that labels on some of his birds were fraudulent" (Lipske, 1999). "The benefits to be gained from museum collections depend implicitly upon the accuracy of the information associated with the specimens and the correct interpretation of those data [...] Collectors and dealers have often been suspected of fabricating data for a variety of reasons, but proven cases have been documented only rarely. [...] This paper examines one such case" (Knox, 1993, p. 320). It has already been observed (in an informal forum) that the exposé, with "a case of fraud examined" in its title, must have been startling to the unsuspecting reader given the nature of papers usually published in *Ibis*; it happened to be sandwiched between more innocent material in the July 1993 issue, namely, Theo Meijer's 'Is the Starling *Sturnus vulgaris* a determinate layer?' (pp. 315–319), and a comment note by T. R. Birkhead, M. T. Stanback and R. E. Simmons, 'The phalloid organ of buffalo weavers Bubalornis' (pp. 326-331).

The following is quoted from Knox (1993, p. 320):

Richard Meinertzhagen (1878–1967) was the last of the great British bird collectors. Over his lifetime he amassed thousands of bird skins and countless other natural history specimens. In 1954 his birds were transferred to the then British Museum (Natural History), now known as the Natural History Museum (NHM). The collection was the largest — nearly 20,000 skins — acquired by the Museum in the last 75 years. It was technically superb, containing many excellently prepared skins with neat hand-written labels. The collection consisted primarily of Palearctic birds and as such was exceptionally complete. However, it was, and remains, deeply flawed.

Knox (ibid.) remarked that during his lifetime, Meinertzhagen "was regarded with suspicion by many of his contemporaries. Charles Vaurie, for example, was very unhappy about his behaviour. In a letter to F. E. Warr he wrote, 'I can cay [*sic* in Knox, but read: say] *upon my oath* that Meinertzhagen's collection contains skins *stolen* from the Leningrad Museum, the Paris Museum, and the American Museum of Natural History... He also removed labels, and replaced them by others to suit

crushed a major revolt by murdering the Nandi Orkoiyot (spiritual leader) Koitalel Arap Samoei who was leading it. He shot Koitalel, who had come to negotiate, on 19 October 1905, while shaking his hand." Posthumous claims of scientific misconduct against Meinertzhagen have also resulted in some farfetched speculations. Again Wikipedia, based on Garfield (2007, p. 172), states: "Meinertzhagen's second wife, the ornithologist Anne Constance Jackson, died in 1928 at age 40 in a remote Scottish village in an incident that was ruled a shooting accident. The official finding was that she accidentally shot herself in the head with a revolver during target practice alone with Richard. There is speculation that the shooting was not an accident and that Meinertzhagen shot her out of fear that she would expose him and his fraudulent activities."

<sup>&</sup>lt;sup>116</sup> Richard Meinertzhagen was born on 3 March 1878, the scion of a merchant-bank dynasty with an international reputation, and died on 17 June 1967.

<sup>&</sup>lt;sup>117</sup> Bird taxidermy is the subject of Farber (1977), Peter (1999), Harrison (1964, revised 1976), and Gutebier, Schmidt, and Rogers (1989), whereas Horie and Murphy (1988) is more generally on the taxidermy of vertebrates.

his ideas and theories<sup>118</sup> Knox states that while examining specimens of Redpolls (*Carduelis flammea*) from the Meinertzhagen collection, he "noted other discrepancies" (Knox, 1993, p. 320) other than such that had previously pointed out and reported by another scholar, Phillip Clancey. "In order to clarify this, I [i.e., Knox] re-examined all the Meinertzhagen redpolls at the Natural History Museum" (Knox, 1993, p. 320). Crucial damning evidence was then provided by Rasmussen and Prŷs-Jones (2003).

In addition to what Knox (1993) and Lipske (1999) state concerning Meinertzhagen – and I think it's important that I mention this because of the very fact that the prescription was so extreme – consider that a proposal was made, at the time, that Meinertzhagen's bird collection be destroyed; this understandably elicited a response of incredulity: after all, even conceding that the collection was problematic or worse, nevertheless any specimen from that given collection could be readily identified, or made identifiable, as coming from the Meinertzhagen collection, so such a measure, which would only have been appropriate had it been devised to stem the spread of an epidemic or anyway of contamination of the data, could safely be deemed to have been, if applied, punitive rather then useful, and what is more, punitive even to the detriment of usefulness for the historical record. That such a proposal had been made at all, makes it sensible that recollections arose of other instances of animosity toward Meinertzhagen – and this in a context unrelated to ornithology.

Knox however provides a reasonable explanation of how specimens from the collection were, as though, spreading contamination, because their original association with the Meinertzhagen collection was being lost owing to misplacing (this, in turn, ought to make one wonder about sloppy practices, and even about a problem with credibility that is not confined to the Meinertzhagen collection). The following is taken from Knox (1993, p. 323):

With the rumours and suspicions that surrounded Meinertzhagen during his lifetime, there was some concern at the acceptance of the collection at the NHM (Cocker, 1990). Indeed, J. D. Macdonald, the head of the Bird Room at the time, is reported to have said that the collection should have been burned (Cocker, 1990, p. 274). After the collection passed to the Museum, it was intended that it should be kept separate from the main collection [...]. For many years these were separate drawers marked "Meinertzhagen specimens", but, with the passage of time, most of the specimens have been incorporated into the main collection.

The admission made in the latter quotation identifies an important component in the questionability of the information associated with specimens.<sup>119</sup> Table 1 in Roberts,

<sup>&</sup>lt;sup>118</sup> Knox, quoting from the letter by the well-known ornithologist Charles Vaurie, points out: "(letter quoted in Cocker, 1990, p. 274)".

<sup>&</sup>lt;sup>119</sup> A dismembered collection, when information enabling reconstruction of the original constitution of the original collection or of recipient collections, let alone the loss of the track through which a given specimen went through, is also the subject of a case from archaeology, described in this note. For comparison, consider the following situation. Dore and Vellani (1994) discuss a subset of items from the inventory of archaeological findings at a museum in Bologna; those items are of local Celtic origin. Most findings were made during excavations in the 1870s. Stefania Vellani's section in Dore and Vellani (1994) focuses on two glass bracelets, several bronze buckles, and so forth. Special problems arose concerning the ascription of the bracelets to a major collection that

447

Elphick, and Reed (2009) lists "Types of errors in sightings that can occur even with 'verifiable' physical evidence". One type of error is "Interpretation errors of labels", for example because of "difference in British vs. American dating whereby 11 March 2007, could be recorded as either 11/3/07 or 3/11/07", or then because of "abbreviation of the year to the last two digits". A second kind of error is "Interpretation errors of specimens", for example "recent rediscovery of the polecat (Mustela putorius) in Scotland resulted from surreptitious translocation rather than a persisting population (Solow, Kitchener, Roberts, & Birks, 2006)". A third kind of error is "Labeling of location errors" (this includes: "spatial and temporal imprecision", "transcriptional errors", "insufficient knowledge by the end users of location names used by collector; changes in geographical names", or then "gradual loss of data and accumulated errors of the type mentioned above with increasing age of specimen as they pass through many hands", "labeling with the center where the specimens were accumulated or shipped rather than the collection locality; assumed origin of the specimen by curators", and then again, "curators substituting original labels for their own, making it impossible to verify spelling, handwriting, or original data").

In fact, after its acquisition on the part of the Bologna city council in 1860, [the Palagi collection was dismembered, and no exhaustive inventory was made. Membership in this important collection was simply entrusted to the inventory tags, which unfortunately are all too perishable. Moreover, the loss of the provenience data is a gap shared by many of the objects belonging to the Palagi collection, especially when it comes to material of documentary interest such as these bracelets. Blame for this loss is probably to be apportioned to Palagi himself, if E. Gerhard, the well-known German archaeologist who had become a consultant and buyer on Palagi's behalf, talking about the collection even before the artist's death, could state: "At various times, he augmented (...) his collection with new findings, yet he never had these eventuate in public awareness or any publications, so of most of them, by now, the place of provenience is unknown"

had been put together and then donated by an artist, Pelagio Palagi. In Haevernick's typological classification, she had stated that these pieces had belonged to the Palagi collection, and that no data were extant as to the place where they had been discovered, as Vellani points out (Dore & Vellani, 1994, pp. 43–44). Nevertheless, "[t]he very ascription [to the Palagi collection] was the first problem to face: in fact, only one of the bracelets, the one tagged IT 767, still carried the inventory tag 'Palagi', which is the only distinctive sign of certain association with that collection" (ibid., p. 44, my translation from Italian).

The museum inventory was also found to only ascribe one of the bracelets to the Palagi collection. Moreover, the handwritten inventory ascribed to Edoardo Brizio (from around 1871) was found to make no mention of glass bracelets. In contrast, in the inventory of the Palagi Milan house (turned into a museum, prior to the transfer to Bologna in 1860) – that inventory was recovered in the Bologna museum archive – both bracelets were found to be listed (Dore & Vellani, 1994, p. 44). A second problem, one which remained unsolved, was that of the determination of where did the items come from, before joining the Palagi collection (ibid.). Furthermore (ibid., my translation).

Still, Vellani hypothesised a provenience broadly located in Lombardy or Piedmont, as Palagi "was especially attentive to findings which took place in those areas where he himself stayed for a long time" (ibid., my translation). Vellani also suggests that perhaps in the future, better understanding may come into being of such artifacts in Italy, and that this could enhance the standing of her hypothesis.

Moreover, the same table lists "Specimen misidentification once in a collection": this is "known as Elvis taxa (Erwin & Droser, 1993)". There also is "Deliberate fraud through planting of specimens in the field": "most notably, Prof. J. W. Heslop Harrison in an attempt to increase evidence for his theory that the island of Rum was a refugium (Pearman & Walker, 2004)". Next in the table, there is "theft and relabeling": "most notorious example, Richard Meinertzhagen (Rasmussen & Prŷs-Jones, 2003)". And finally, there is "misrepresentation for commercial purposes". This is the case of "Victorian orchid collectors who, on occasion, gave erroneous geographic origins to protect their sources".

At any rate, during the 1990s (I recall), one would come across some defence of Meinertzhagen in ornithologists' semiformal printed forums. Nevertheless, after 1997 the controversy gained momentum. The Forest Spotted Owlet (Athene blewitti, of which *Heteroglaux blewitti* is a synonym), which had long been thought to be extinct, was rediscovered in India. In the following, I quote from an unsigned paper (Anon., 2001) that appeared in the *Deccan Herald* of Bangalore, India, on Sunday, October 14, 2001, and is posted at that newspaper's website. The paper begins as follows: "The rediscovery of a bird which is supposedly extinct is of course a dramatic occasion; and this happened in the case of the Jerdons or Double-banded Courser in Andhra Pradesh. One significant fact which emerges when a rare bird is rediscovered is that we become aware of the importance of micro-habitats for saving an endangered species. It was only because the famous naturalist T[homas] C[averhill] Jerdon (perhaps the first of the genre in India" as his work was published in the middle decades of the nineteenth century, including Jerdon (1847) and his classic, Jerdon (1862-1864), "described the bird and its habitat so accurately that the continuing attempts to rediscover it succeeded". In the final part of the paper, the case that is of interest for our present purposes is dealt with:

Another case of a bird which had disappeared for many years but was rediscovered recently is of the forest spotted owlet (Athene blewitti). The bird had not been seen for the past 113 years inspite of ornithologists searching for it in the forests on the banks of the Narbada where the species was last seen. As in the case of Jerdons Courser, the search finally succeeded, and on 25th November 1997, three Americans (one of whom was Ben King, well-known in India for his useful book: A Field Guide to the Birds of South East Asia) found the birds in the foothills of Satpura Mountains near Shahada in Maharashtra. Before this sighting the only information relating to these birds, endemic to India, was on the basis of seven specimens collected as long ago as 1880. One of the researchers from the BNHS [i.e., the Bombay Natural History Society] who is attempting to gather information about the provenance and the ecology of these birds is Parah Ishtiaq. A problem she faces is to distinguish males from females, as there is no difference in the outward appearance of males and females. Also, the birds apparently look rather similar to the common spotted owlets (Athene brama), but experienced ornithologists can tell them apart by the difference in their facial markings. Some time ago I received an excited call from a lady in Indiranagar saying that her son, a keen birder, had discovered this bird in Bangalore and had taken a photograph. I was quite sure that the photo he had taken was of the common spotted owlet and so it turned out to be. Fortunately, the calls of the two species are very different. The spotted owlets only screech, while its rarer cousin has a modicum of a "song". By tape recording the calls of these birds and broadcasting them in likely habitats, and from the response received, the research team is able to make a reasonable estimate of the number of birds that exist. But all this effort at rehabilitating an endangered species will fail if the environment

#### 5.3 Episodic Formulae

of these birds continues to be eroded; and on this front the news is alarming. Parah Ishtiaq writes, "Pamela (Rasmussen) and I went to Taloda in search of the forest owlet. Around 5000 hectares of the plains forest had recently been clear-felled to serve as a rehabilitation site for people displaced by the Sardar Sarovar Dam. About 500 families now live in this area and use the forest resources". Unfortunately then, this endangered species is still in danger.

#### The Bangalore newspaper article then turned to the Meinertzhagen controversy:

Incidentally, this bird is associated with one of the most disgraceful attempts by an ornithologist of international standing, claiming to have seen it in the wild, and producing a specimen as incontrovertible evidence, while in fact all that he did was to steal a specimen from the Museum of Natural History in Kensington London and submitting it again as a new find.

Then readers were told: "This was (to the shock of the ornithologists of the world)", the famous Meinertzhagen, "who in his lifetime was a highly respected naturalist." Next, some tribute is given to the man. The late dean of Bombay ornithologists "Salim Ali<sup>120</sup> has some interesting things to say about this dashing and courageous soldier who during the First World War, managed to deceive his enemies in many ingenious ways". But: "It was fortunate for [this soldier and scholar] and his friends that his fraudulent tendencies were discovered only many years after his death".

As can be readily seen, the newspaper is taking the hypothesis about ornithological fraud on the part of Meinertzhagen as a given, even though the formulation (in line with the style of Indian English prose) is somewhat old-fashioned in, among the other things, its moderate and deferent formulations. Also, note that whereas Lipske (1999), whose own text was published in a popularisation forum of the Smithsonian Institution, understandably emphasises the role of the latter's staff<sup>121</sup> (see below), the Bangalore-based, Mysore-owned newspaper especially conveys the experiences of local ornithologists or bird watchers.

Details of how Rasmussen and her colleagues came to develop and probe into the hypothesis that some specimens in Meinertzhagen's bird collection, and in particular the stuffed specimen of the Forest Spotted Owlet – Fig. 5.3.3.1.1(a) is an old depiction of the species; Fig. 5.3.3.1.1(b) is more accurate – is not authentic, but is rather a camouflaged older specimen that was stolen, then restuffed and relabelled, will be represented information in episodic formulae in a subsequent section.

One of the Smithsonian Institution Research Reports is an informal, popularistic account by Michael Lipske (1999) of the rediscovery in India, by ornithologist

<sup>&</sup>lt;sup>120</sup> An explanation is in order, concerning the reference to Salim Ali: "To many people, Salim Ali and Indian Ornithology were almost synonymous" (Perrins, 1988, p. 305). "The work for which he will be most widely remembered was the ten-volume work (written with S.D. Ripley *The Handbook of the Birds of India and Pakistan* (1968–74). He was in the process of re-writing this important work at the age of 90; the first five volumes have been published" from 1978 (Perrins, ibid., p. 306).

<sup>&</sup>lt;sup>121</sup> Prof. Pamela C. Rasmussen of the Michigan State University (MSU) earlier was a researcher at the Smithsonian. She was born in 1958, and earned her Ph.D. from the University of Kansas in 1990. While remaining a Research Associate at the Smithsonian Institution, in 2011 she was Assistant Professor at the MSU Department of Zoology, and Assistant Curator of Mammalogy & Ornithology at the MSU Museum.

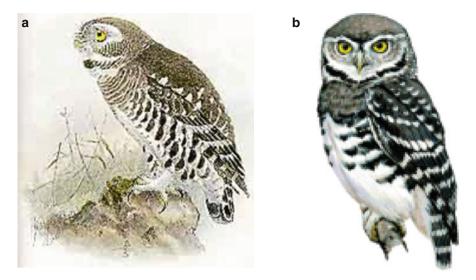


Fig. 5.3.3.1.1 (a) A painting from 1891 of the Forest Spotted Owlet (*Athene blewitti*), rediscovered by Pamela Rasmussen. The original graphics is in colour<sup>122</sup> (b) A more accurate depiction of the same species

Pamela Rasmussen of the U.S. National Museum of Natural History, of the already mentioned Forest Spotted Owlet (*Athene blewitti*), a bird that had long been thought to be extinct. Lipske wrote: "Seven stuffed skins in a handful of museums were all that seemed to remain of a species that several experts had crossed off as extinct". After living individuals of the given owlet species "had gone unseen by any scientist for 113 years", "one morning in 1997" Rasmussen "gazed, only half trusting her eyes at" an individual of that very bird species, perched on a tree in western India (more individuals were found later on): "the forest owlet that Rasmussen had sought for two weeks from one side of India to the other" (Lipske, 1999).<sup>123</sup> Lipske further stated:

<sup>&</sup>lt;sup>122</sup> An explanation given at http://en.wikipedia.org/wiki/File:Athene\_blewitti.jpg (which is where the image now appears: it was uploaded in 2008 into the Wikimedia Commons by Jim F. Bleak) states: "Until recently, the best illustration of the Forest Owlet was this one, which appeared in *The Scientific Results of the Second Yarkard Mission*, published in 1891. The illustration has several inaccuracies: the cheek patches are too dark and the breast is too barred; the belly, lower flanks, and undertail coverts should be completely white, not marked; the bands in the wing should be whiter; and the bill should be larger."

<sup>&</sup>lt;sup>123</sup> The Wikipedia entry http://en.wikipedia.org/wiki/Pamela\_C.\_Rasmussen explains: "She rediscovered the Forest Owlet *Athene blewitti*, which had not been seen since 1884, in western India [(Rasmussen & Ishtiaq, 1999; Rasmussen & King, 1998)], previous searches by S. Dillon Ripley, Salim Ali and others having failed because they relied on fake documentation from Richard Meinertzhagen [(Ripley, 1976; Rasmussen, 1998)]". Further relevant citations include Gallagher (1998), Oehler (2009), Seabrook (2006), Dalton (2005), and Weidensaul (2002).

To find out, she visited Britain's Natural History Museum in London, where most of Meinertzhagen's collection of tens of thousands of birds now resides. Working with ornithologists there, she examined the colonel's unique India specimens. "Each was either clearly fraudulent or highly suspicious", Rasmussen says.

She discovered that Meinertzhagen had done some of his most successful bird hunting not in the wild but in the museum's specimen cabinets. He was known to boast of his collection's "unique perfection", she says. "One of the reasons that it was uniquely perfect was because he was stealing the best specimens" from other collectors' museum contributions.

With Robert Prys-Jones, head of the Bird Section at Britain's Natural History Museum, Rasmussen established that hundreds of Meinertzhagen specimens were birds he filched; some he restuffed and then relabeled with false information. Of all the ornithological treasures the colonel stole, the rarest was India's forest owlet. Cracking the case required sophisticated detective work.

Rasmussen had found that, of seven known specimens of the owlet in museums, only one was said to have been collected in this century-in 1914 by Meinertzhagen. Most of the others had been collected in the 1880s by James Davidson, a British official and bird enthusiast stationed in western India.

Lipske (1999) goes on to relate how Rasmussen and her colleagues carried out examinations of the suspicious items:

Working with ornithologist Nigel Collar of BirdLife International in England, Rasmussen examined the Meinertzhagen owlet at the British Museum. Both experts could see that original stitching and stuffing had been removed from the skin and that new stuffing had been inserted and the bird resewn. Closer study of the specimen and X-ray photographs of it revealed characteristic preparation touches unique to Davidson, a self-taught worker with one-of-a-kind methods for handling bird skins.

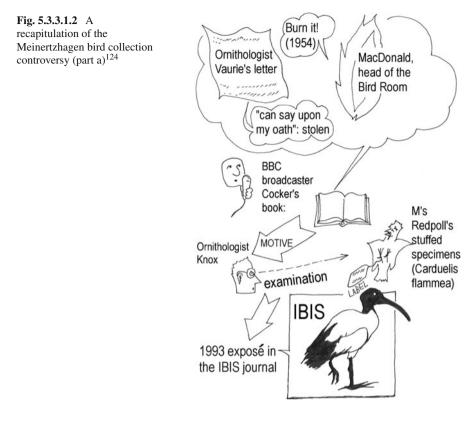
Fairly certain that Meinertzhagen's owlet actually had been collected by Davidson, the ornithologists still wanted more evidence. Even though the bird had been restuffed, Rasmussen remembers hoping "maybe, just maybe, there will be a fiber or something somewhere that will tie it to Davidson". Luckily, there was.

Inside a wing, stuffed around a joint, there remained some raw cotton that had turned yellow from fat. Checking the wing of an owl of another species Davidson collected in India, the sleuths found what looked like similar cotton. They sent both samples to the Federal Bureau of Investigation in Washington, D.C., where forensic tests indicated that the two bits of cotton were virtually identical.

"That, along with other clues, just basically put the nail in the coffin", Rasmussen says, noting the improbability that Meinertzhagen would have had access to the same kind of rough cotton Davidson used 30 years earlier. The owlet was a previously unknown, fifth Davidson specimen, presumably stolen from Britain's Natural History Museum by Meinertzhagen and decades later returned to it as part of the colonel's rich collection.

To make things clearer, we recapitulate this narrative of the Meinertzhagen bird collection controversy in Figs. 5.3.3.1.2, 5.3.3.1.3, and 5.3.3.1.4.

News of the alleged fraud were divulged indeed to the broad public in Anglo-Saxon countries, for example, in a BBC Radio 4 broadcast by Mark Cocker (2000). Willingness to believe that Meinertzhagen may have been motivated to practice deception, and may have been able to achieve it successfully, in a scholarly field (which is of course highly reprehensible) has been, no doubt, reinforced (if not inspired) by the fact that Meinertzhagen was, and is, much admired for his performance in military intelligence. That is an area in which deception is considered a virtue. Before turning to the development of a formalism, the following will give



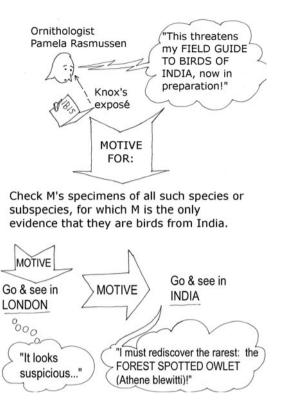
a flavour of the kind of exploits in which Meinertzhagen applied ruse in order to achieve military goals.<sup>125</sup>

<sup>&</sup>lt;sup>124</sup> Facial resemblance is not guaranteed. For one thing, Mark Cocker looks like he has all his hair intact, when seen in front.

<sup>&</sup>lt;sup>125</sup> During the first World War, Meinertzhagen took part in "the British expeditionary force attempting to conquer German East Africa. Assigned to intelligence duties, he displayed a talent for deviousness that he would later put to resounding effect" during the British invasion of the Ottoman empire from Egypt; an example of his deeds in intelligence while posted in Kenya is, he claimed, as follows: "The most effective agent working for the Germans, he soon learned, was" a Near Easterner "too elusive to capture" (Rabinovich, 1997). Meinertzhagen however "thought of another way of neutralizing him. He wrote a letter to the Arab thanking him for information about German dispositions – information which had in fact been picked up by wireless intercept". In order to frame the spy in the eyes of his German bosses, Meinertzhagen "requested more details in the letter and included 1,500 rupees. He then sent it off with one of his own men whom he had reason to believe would be bumbling enough to be caught by the Germans. Word was received shortly thereafter that the [addressee of the letter] had been tried and shot" (Rabinovich, 1997). In 1917, on the front advancing from the Sinai peninsula, Meinertzhagen "was appointed head of the intelligence section at the forward British headquarters" and "[i]t was in this capacity that he achieved his greatest renown. [...] With the war in France stalemated, British prime minister David Lloyd George had asked for Jerusalem as a morale-boosting Christmas present for the nation, and

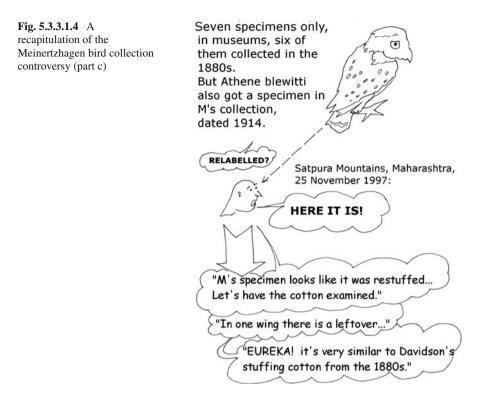


recapitulation of the Meinertzhagen bird collection controversy (part b)



<sup>[</sup>commander Gen. Edmund] Allenby was determined to give it. The plan adopted by Allenby consisted of simultaneous thrusts at Gaza and Beersheba, with the Turks to be misled about which was the main blow" (ibid.). It was then that Meinertzhagen "began to prepare his grand deception. He asked his sister, Mary, in England to supply him with a letter to an imaginary husband, supposedly a staff officer serving at Allenby's headquarters, announcing the birth of their baby. He himself began constructing this imagined persona from forged 'evidence'. This included a notebook filled with observations and vague messages, an agenda for a meeting at Allenby's headquarters, some notes about a code, a telegram announcing a reconnaissance around Beersheba and orders for an attack on Gaza" (ibid.). And then:

Stuffing all this into a haversack which he sprinkled with fresh blood, Meinertzhagen rode out on horseback on October 12 toward the Turkish lines near Beersheba. A Turkish mounted patrol duly spotted him and gave chase, but reined in after a mile. To reawaken their interest, Meinertzhagen dismounted and opened fire. The Turks resumed the chase at a gallop. At one point, Meinertzhagen lurched in his saddle as if hit and dropped the haver-sack together with his rifle, canteen and field glasses before making his getaway. The Turks and their German advisers took the bait. The faked plans showed that the British were planning a reconnaissance toward Beersheba and a main attack on Gaza. The Turks deployed their forces accordingly. Allenby massed artillery before Gaza as if in confirmation, but sent a large force on a night march toward Beersheba. Australian horsemen swept into the town before the Turks could destroy its wells. With the Turks thrown off balance by this flank attack, Allenby now began to drive against Gaza, which fell on November 16.



### 5.3.3.2 Preliminaries of the Formal Representation for the Stuffed Birds Case: Formulae About Meinertzhagen and His Bird Collection

In my notation, a superscript on the left side of the symbol of a time-point stands for a time unit whose granularity is as per the *grainsize* indicated in the superscript itself (e.g., **d** for day, **y** for year, and so forth). The symbol formed from the symbol for the time-point as augmented with the left-side superscript for *granularity*,<sup>126</sup> is a symbol for a time-interval containing the given time-point. Let us introduce these symbols for times, accounting for grainsize. See Table 5.3.3.2.1.

We are now ready for representing in a formula the years of birth and of death of Richard Meinertzhagen:

$$({}^{y}t^{\alpha}_{\mathcal{M}} = 1878) \wedge ({}^{y}t^{\omega}_{\mathcal{M}} = 1967)$$

Meinertzhagen is often credited with this so-called Haversack Ruse. It was depicted in the 1987 film *The Lighthorsemen*.

<sup>&</sup>lt;sup>126</sup> As time-granularity is important in the representation as introduced here, it is of interest to signal Bettini, Jajodia, and Wang (2000), a book on time granularities and how they are processed in representations from computer science, in particular from the viewpoints of database design, of

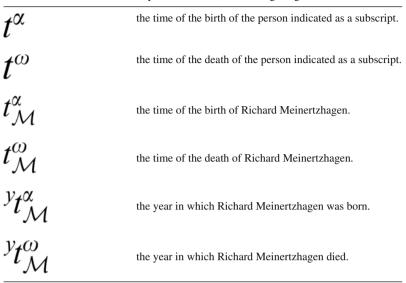


 Table 5.3.3.2.1
 Symbols for time, accounting for grainsize

We need a proposition to state that since birth, there existed Richard Meinertzhagen, and that he was a person, and a male:

At 
$$t, t \succeq t^{\alpha}_{\mathcal{M}}$$
:  $\begin{pmatrix} \exists \mathcal{M} \land \\ \land (\mathcal{M} \text{ is-a } person) \land \\ \land (\mathcal{M} \text{ is } male) \end{pmatrix}$ 

From his birth to his death, Richard Meinertzhagen was alive and was British:

At 
$$t, t^{\alpha}_{\mathcal{M}} \preceq t \preceq t^{\omega}_{\mathcal{M}} : \begin{pmatrix} (\mathcal{M} \text{ is alive}) \land \\ \land (\mathcal{M} \text{ is British}) \end{pmatrix}$$

From a given point in time, which was much later than his birth date, until his his retirement from the army, which was much earlier than his death, Richard Meinertzhagen was a colonel<sup>127</sup>:

At 
$$t, t^{\alpha}_{\mathcal{M}} \prec t^{c}_{\mathcal{M}} \preceq t \preceq t^{r}_{\mathcal{M}} \prec t^{\omega}_{\mathcal{M}}$$
: ( $\mathcal{M}$  is-a colonel)

constraint reasoning, and of automated knowledge discovery. Also see Bettini, Wang, and Jajodia (2002). We are going to discuss formal models of time in Section 8.4.2.3.

<sup>&</sup>lt;sup>127</sup> Richard Meinertzhagen retired from the army in 1925. Afterwards he was a retired colonel.

$t^{\delta}_{\mathcal{M}}$	the time when the Natural History branch of the British Museum obtained Meinertzhagen's bird collection. This is the point in the time (not the year) of the collection's physical (and accessibility) transfer to the Natural History branch. Possibly, this was a time interval, but for our present purposes, we treat this time as though it was a point along the time axis.
${}^{y}t_{\mathcal{M}}^{\delta}$	the year when the Natural History branch of the British Museum obtained Meinertzhagen's bird collection.
$\mathfrak{m}'$	the Natural History branch of the British Museum.
$\mathfrak{M}^{\prime\prime}$	the Natural History Museum.
The year wa	$_{\rm sc} {}^{y} t^{\delta}_{\mathcal{M}} = 1954$

#### Table 5.3.3.2.2 Some relevant times and institutions

There was another point in time, also much later than his birth date, when Richard Meinertzhagen became an ornithologist, and such he remained until his death:

At t, 
$$t^{\alpha}_{\mathcal{M}} \prec t t^{b}_{\mathcal{M}} \leq t \prec t^{\omega}_{\mathcal{M}}$$
: ( $\mathcal{M}$  is-a ornithologist)

In his lifetime, he published autobiographical material, which was more than once, at times in his life which occurred when he had already attained the rank of colonel:

At 
$$t^i$$
,  $t^c_{\mathcal{M}} \prec t^i \prec t^{\omega}_{\mathcal{M}}$ : (publish <sub>$\mathcal{M}$</sub>  memoirs<sup>i</sup> <sub>$\mathcal{M}$</sub> )

It was in the year 1954 that Meinertzhagen's bird collection was acquired by, and transferred to, what by then was Natural History branch of the British Museum, and was only later to become the Natural History Museum. Let us define some notation for the case at hand; see Table 5.3.3.2.2.

The next formula states that at a point in time during the lifetime of Richard Meinertzhagen (this was earlier than his death, and wasn't earlier than his becaming an ornithologist), there had been in existence an evolving bird collection associated with him, whose stage of evolution is identified by points in time, and of which he had both the legal ownership (represented by a hand containing the letter lambda), and the physical possession (represented by a hand containing the letter phi). The latest stage in the collection's evolution we are considering (as though it remained static thereafter) is the one identified by the superscript being delta:

At 
$$t, t_{\mathcal{M}}^{b} \leq t \prec t_{\mathcal{M}}^{\delta}: (\exists BirdCollection_{\mathcal{M}}^{t}) \land \land \left( has_{\mathcal{M}} \textcircled{\mathcal{T}} \Rightarrow BirdCollection_{\mathcal{M}}^{t} \right) \land \land \left( has_{\mathcal{M}} \textcircled{\mathcal{T}} \Rightarrow BirdCollection_{\mathcal{M}}^{t} \right).$$

Moreover:

At 
$$t, t \succeq t^{\delta}_{\mathcal{M}}: (\exists BirdCollection^{\delta}_{\mathcal{M}}) \land \land (\operatorname{has}_{\mathfrak{M}} \nearrow \mathfrak{m} = \mathfrak{m}')) \land \land (\exists \mathfrak{m}' \Rightarrow (\mathfrak{m} = \mathfrak{m}')) \land \land (\exists \mathfrak{m}'' \Rightarrow (\mathfrak{m} = \mathfrak{m}')).$$

This paragraph describes in words the previous formula. Up to when (at least) the physical possession of the bird collection was transferred, it was Meinertzhagen who used to have both the physical possession and the legal ownership of the collection, which had been undergoing various stages since when Meinertzhagen (by then already an ornithologist) started it. Following the transfer of the physical possession of the collection (as in the latest stage at which it was while in Meinertzhagen's possession), the collection was in (at least) the physical possession of either the Natural History branch of the British Museum, or the Natural History Museum, whichever that same evolving entity, the recipient of the collection, was.

This way, we accommodate the fact that it was what by then was the Natural History branch of the British Museum, that received the collection, and that eventually the hosting museum was to become the Natural History Museum. Starting at the transfer point in time, which was in 1954, the Meinertzhagen bird collection was to remain (let us assume it for the sake of simplicity) in its latest evolution stage, and this during what was left of his lifetime, and thereafter as well. That is to say, the way in which he had left it at his death. That much is represented in the next formula. (In particular, let us agree that we consider the bird collection merely as a set, and that every stage is characterised by the extension of the set, i.e., by which items were members in that set).

At 
$$t, t \succeq t^{\delta}_{\mathcal{M}}$$
:  $\left(BirdCollection^{t}_{\mathcal{M}} = BirdCollection^{\delta}_{\mathcal{M}}\right)$ 

A more refined version of our formal representation would continue to assign the value of *t* to the superscript of the symbol for the bird collection, in order to be able to refer to whatever physically and perceptually happened to the collection, since it

was originally stored in clearly identified drawers, until when "most specimens have been incorporated into the main collection" at the Museum (Knox, 1993, p. 323).

From 1954, which was thirteen years before Meinertzhagen's death, his bird collection was accessible to a set of persons identified by the given point in time at which the accessibility state is considered:

At 
$$t$$
,  $t \succeq t^a \succ t^{\delta}_{\mathcal{M}}$ :  $\begin{pmatrix} BirdCollection^{\delta}_{\mathcal{M}} \mathbf{is} \\ accessible-to(\mathcal{B}^t) \end{pmatrix}$ 

#### 5.3.3.3 A Notation for Biographies

The present Section 5.3.3.3 can be safely skipped, by those readers only interested in following the formalism for the controversy concerning Meinertzhagen's bird collection. The more mathematically minded, however, may find in Section 5.3.3.3 an embryo for a more refined formalisation of biographies. In order to represent a biography, in Nissan (2002b) I introduced this notation, when I developed a formalism for capturing some information from the plot of Pirandello's play *Henry IV*.<sup>128</sup>

Let *biographical context* be symbolised by a hollow M. Let Richard Meinertzhagen's biographical context at time t be represented by the symbol

$${\mathcal{M}}^t_{\mathcal{M}}$$

Let is be defined by *mutual recursion*, as follows. Let it be formulated as a doubleton, whose two members are "entourage" (or "milieu") and "history", that is to say: the subset of people of Meinertzhagen's entourage at time *t*, who (by then) are individually known to Meinertzhagen; and the history of Meinertzhagen at time *t*. It is expected that a person is, by default, aware of his or her own biographical context: at the given point in time, the given person is aware of his or her current milieu, as well as of his or her history, which in turn, among the other things, comprises the same person's past milieu states.

<sup>&</sup>lt;sup>128</sup> After a horse fall at a historical pageant, the protagonist of *Henry IV*, whose own days are those of Pirandello, believes he is the eleventh-century emperor of Germany around the time of his penance at Canossa. The people in his entourage are complacent, and he lives his delusion for about twenty years. He "maps" the persons from his life onto characters from the standard historiographical account of the emperor Henry IV. Unbeknown to his entourage, the protagonist has meanwhile recovered, and knows who he actually is. He eventually tells some visitors, then, even though he didn't premeditate to take the life of the man he considers responsible for causing his horse fall, he wounds him mortally. Onlookers are divided in their opinions: is he sane? The protagonist is now to posture as though he is not, forever.

The "entourage" member of that doubleton is symbolised as

$$Q^t_{\mathcal{M}}$$

The "history" member of that doubleton is symbolised as

$$h^t_{\mathcal{M}}$$

and is itself a doubleton, as shown in second formula in the following:

$$\begin{cases} \boldsymbol{\mathscr{M}}_{\mathcal{M}}^{t} \equiv \langle \boldsymbol{Q}_{\mathcal{M}}^{t}, \ \boldsymbol{h}_{\mathcal{M}}^{t} \rangle \\ \boldsymbol{h}_{\mathcal{M}}^{t} \equiv \langle \hat{\boldsymbol{e}}_{\mathcal{M}}^{t}, \ \boldsymbol{\mathscr{M}}_{\mathcal{M}}^{\hat{t}} \rangle \end{cases}$$

There is a double recursion, because the left-hand part of the first formula is defined by means of the left-hand part of the second formula, whereas the left-hand part of the second formula is defined by means of the left-hand part of the first formula.

In the doubleton for "history", the second member - that is

$${\cal M}_{\cal M}^{\hat t}$$

- is the latest past biographical context of the same agent, so that biographical context is defined recursively. By our convention:

$$\hat{e}^t_{\mathcal{M}} \equiv e^t_{\mathcal{M}} - e^{\hat{t}}_{\mathcal{M}}$$

just as:

$$\hat{e}^{\hat{t}}_{\mathcal{M}} \equiv e^{\hat{t}}_{\mathcal{M}} - e^{\hat{t}}_{\mathcal{M}}$$

That is to say, the e surmounted by the hat stands for a set (of events in which the given individual is knowingly involved) resulting from a difference of two sets, and having occurred in the latest interval of time since the biographical context had last changed: the e surmounted by the hat stands for an increment with respect to

the latest earlier point in time when the biographical context was different, whereas without the hat, the symbol *e* stands for a cumulated set:

$$e^t_A \equiv \hat{e}^t_A igcup_{ au}^{\hat{t}(b.d.i.)} igcup_{ au}^{ au} \hat{e}^{ au}_A \ au = t^{lpha}_A$$

where *b.d.i.* is defined as:

*b.d.i*  $\equiv$  "by discrete increments as in the definition of  $\hat{t}$  *vis-à-vis t.*" By our definition:

 $e^t_{\mathcal{M}}$  $\hat{e}^{\hat{t}}_{\mathcal{M}}$  the set of such current events (here, conventionally, from birth on) that involve the person Richard Meinertzhagen, provided that the latter was aware of them.

the increment of the events set from time double-hatted t until time single-hatted t.

As a subset of  $e_{\mathcal{M}}^{t}$  we need include Meinertzhagen's state of relations with  $Q_{\mathcal{M}}^{t}$  (his then current entourage). In  $e_{\mathcal{M}}^{t}$  other elements possibly are events of the Self alone, either physiological (such as sudden illness), or mental (some thoughts that occurred to the given individual). Likewise, for

$${\mathscr M}^ au_{\mathcal M}$$
 ,  $Q^ au_{\mathcal M}$  , and  $h^ au_{\mathcal M}$  ,

a lifelong trajectory of states (as a set of sets) can be reconstituted. Now, let us depart from the treatment given in Nissan (2003c), and specialise this notation for subsets of the biographical context, of the entourage, and of the biographical history, so that, given a person y, only such persons who are (or were) y's social superiors would be members in the subset of the entourage, and only events pertaining to y's relations with them would appear in the subset of the history. For this purpose, we introduce a variant of the hollow-M symbol, namely, a soaring (or, using a term from heraldry: essorant) hollow-M symbol to indicate the subset of the biographical context which is about y's social superiors:

$$\mathcal{M}_{\mathcal{Y}}^{\tau}$$

Here, too, we have a definition resorting to a mutual recursion:

$$\begin{aligned}
\mathbf{y}^{t} &\equiv \langle \operatorname{soc}^{+}Q_{\mathcal{Y}}^{t}, \operatorname{soc}^{+}h_{\mathcal{Y}}^{t} \rangle \\
\operatorname{soc}^{+}h_{\mathcal{Y}}^{t} &\equiv \langle \operatorname{soc}^{+}\widehat{e}_{\mathcal{Y}}^{t}, \operatorname{soc}^{+}h_{\mathcal{Y}}^{t} \rangle
\end{aligned}$$

where:

$${}^{\mathrm{soc}^{+}}\!Q_{\mathcal{Y}}^{t} \equiv \left\{ x \left| \left( x \in Q_{\mathcal{Y}}^{t} \right) \wedge \left( x \stackrel{\mathrm{soc}}{>} \mathcal{Y} \right) \right\} \right.$$

Let us go back to the formalism in Nissan (2003c). At time *t* during Meinertzhagen's life, the people in set

# $Q^{\tau}_{\mathcal{M}}$

were in Meinertzhagen's entourage, and were individually known to him at that time. At various times, Meinertzhagen's interaction with individuals, the content of that interaction, and his and theirs respective personalities motivated – that much is known and uncontroversial about Meinertzhagen's biography – feelings that were either friendly of hostile to Meinertzhagen himself. As a matter of fact, Richard Meinertzhagen is known to have stirred strong feelings toward himself: of admiration or dislike or both, but, typically, he was the kind of person that was either very much liked, or very much disliked.

Let us define two sets of persons belonging to Meinertzhagen's milieu at a given time:

$$\exists \mathcal{Q}_{+\mathcal{M}}^{t}, \quad \exists \mathcal{Q}_{-\mathcal{M}}^{t}, \quad \left(\mathcal{Q}_{+\mathcal{M}}^{t}\bigcup\mathcal{Q}_{-\mathcal{M}}^{t}\right) \subseteq \mathcal{Q}_{\mathcal{M}}^{t}$$
$$\exists t, \quad \left(\begin{array}{c} \left(q \in \mathcal{Q}_{\mathcal{M}}^{t}\right) \wedge \\ \left(\exists \tau, \tau \succeq t, \\ \operatorname{At} \tau : \\ (\operatorname{likes}_{q} \mathcal{M})\right) \end{array}\right) \Leftrightarrow \left(q \in \mathcal{Q}_{+\mathcal{M}}^{\tau}\right)$$

#### 5 The Narrative Dimension

$$\exists t, \quad \left( \begin{array}{c} \left( q \in Q_{\mathcal{M}}^{t} \right) \land \\ \left( \begin{array}{c} \exists \tau, \tau \succeq t, \\ \land \left( \begin{array}{c} \operatorname{At} \tau : \\ (\operatorname{dislikes}_{q} \mathcal{M}) \end{array} \right) \end{array} \right) \Leftrightarrow \left( q \in Q_{-\mathcal{M}}^{\tau} \right)$$

The two sets of persons thus defined,

$$Q_{+\mathcal{M}}^{ au}$$
 and  $Q_{-\mathcal{M}}^{ au}$  .

are of people who became acquainted with Meinertzhagen at some time *t* in his life and thus belonged to his entourage at least at the time of that first contact, and who since, at any rate at time  $\tau$ , had respectively harboured good feelings or bad feelings towards him. Notice that it makes sense for such sets to be defined even if  $\tau$  happens to be after Meinertzhagen's death. Those two sets of persons are not necessarily disjoint, as some people may have mixed feelings at a given moment; moreover, at different times a given person may entertain a positive view and a hostile view of another given person. Thus, it *may* happen that the intersection of those two sets is other than the empty set, at points in time that may even be the same:

$$\exists t', \quad \exists t'', \quad \left(Q_{+\mathcal{M}}^{t'} \bigcap Q_{-\mathcal{M}}^{t''}\right) \neq \emptyset$$

and perhaps so even for t' = t''

as the very same persons may belong to the opposite camps at the same time. In fact, it would just be a simplification if we were to consider those two sets as being the intersections of Meinertzhagen's entourage with, respectively, his friends and his foes. At any rate, at given times *t*, there exist two (evolving) sets:

$$\exists friends^{t}_{\mathcal{M}}, \quad \exists foes^{t}_{\mathcal{M}}$$

and whereas both sets can be expected to have a subset contained in

$$Q^{ au}_{\mathcal{M}}$$

some members of the two sets have not been known to Meinertzhagen personally. Both sets constitute instances of cumulation. Both sets persist in time beyond the time of Richard Meinertzhagen's death, and at any rate their respective membership can be considered to be fluid. For example, this or that person's being a member in his set of friends or his set of foes at a given time. Moreover, attitudes need

462

not be so crisp. They may as well be different in different domains: given individuals may have modified their appreciation of Meinertzhagen *qua* bird collector since the publication of arguments disproving his integrity in that role, but may perhaps retain their opinion of him as a spy master. Meinertzhagen is sometimes claimed to have been self-aggrandising in his memoirs. It is not unconceivable that

 $\exists \kappa, \exists \mathbf{r}, \mathbf{r} \text{ is-a person}, \\ \kappa \subset \text{content}(memoirs^{i}_{\mathcal{M}}), \\ \exists t, \quad (\text{At } t: (\text{read}_{\mathbf{r}} \kappa)) \texttt{m} > \\ \texttt{m} > [foes^{t}_{\mathcal{M}} := (foes^{t-1}_{\mathcal{M}} \cup \mathbf{r})]\texttt{m} > \\ \texttt{m} > \begin{bmatrix} \text{At } t + n: \\ \text{criticize}_{\mathbf{r}} (integrity_{\mathcal{M}} (\text{make}_{\mathcal{M}} form(memoirs^{i}_{\mathcal{M}})))) \end{bmatrix}$ 

where := is the symbol of value assignment to a variable, familiar to computer programmers. The formula means that there exists some person (symbolised as a hollow **r**), and there exists part of the content of any of Richard Meinertzhagen's autobiographical writings, and there exists a time when the person mentioned earlier read that part of Meinertzhagen's own memoirs, and that motivated that reader to join the set of Meinertzhagen's foes (that is to say, the reader had not been among those hostile to Meinertzhagen prior to that moment), and this developing a hostile attitude towards Meinertzhagen motivated that reader, at some later time, to criticise Meinertzhagen's integrity in how Meinertzhagen wrote his memoirs.<sup>129</sup>

<sup>&</sup>lt;sup>129</sup> And indeed, some have harshly criticised Meinertzhagen's diaries on formal grounds, such as suggesting that entries were rewritten or transplanted at a given data whereas they were written later on. Yet, the very motivation for the degree to which the criticism was damning perhaps was not always independent of Meinertzhagen's attitudes as displayed in the content of the diaries, visà-vis the critic's own opinions. It must be borne in mind that memoirs or even diaries that authors publish, usually are not to be held by the same standards of verifiability based on the evidence that can be expected in police inquiries, or, then, of records of laboratory tests, or, then again, of records of the handling and disposal of hazardous material (in the 1990s, there was a scandal in the U.K. concerning fake recording of the disposal process of nuclear waste). The documentary side is merely one of the things that make autobiographical texts, memoirs, or even diaries, interesting and worth of publication by a trade publisher. Tampering with the text, inserting reconstructions from memory, may be motivated on literary grounds. Unless special claims are made by an author for the text having been recorded at the time it happened, and only at that time, in order to prove something, some rewriting or supplementing would not normally affect the integrity of the text, other than in the eyes of some Draconian beholder, perhaps of one willing to assume an author's intent to deceive unless proven otherwise. Generally speaking, it happens sometimes that somebody takes exception to text in somebody else's diaries being completed from memory at a later date, or, then, makes much, by way of discredit, of editorial intervention in diaries – something that is routine in the publishing industry (charges of editing are something that, e.g., was invoked at a time by detractors of Anne Frank's diaries, which is an example of how an explicit argument may not necessarily be the main point of the argument being made).

In concepts "memoirs" and "diary", a crucial role is played by testimony about the Self, which in my notation is represented as:

$$\underbrace{ \left\{ \mathbf{A} \mathbf{t} \right\}}_{\mathcal{M}}^{t_2} \left[ \mathbf{A} \mathbf{t} t_1 \,, \, \ldots \right]$$

or, more generally, this way:

The notation introduced in the present Section 5.3.3.3 will not appear in the rest of the formalism about the Meinertzhagen narrative, which is because of what I select, out of the narrative, for representation here.

#### 5.3.3.4 Formalising the Allegations About Meinertzhagen's Stuffed Birds

For the purposes of formalising the allegations concerning some stuffed birds in the Meinertzhagen bird collection, let us stick henceforth to excerpts from a text from the Smithsonian Institution Research Reports, an informal, popularistic account by Michael Lipske (1999) of the rediscovery in India, by ornithologist Pamela Rasmussen of the U.S. National Museum of Natural History, of the Forest Spotted Owlet (*Athene blewitti*), a bird that had long been thought to be extinct.

"Seven stuffed skins in a handful of museums were all that seemed to remain of a species that several experts had crossed off as extinct". After living individuals of the given owlet species "had gone unseen by any scientist for 113 years", "one morning in 1997" Rasmussen "gazed, only half trusting her eyes at" an individual of that very bird species, perched on a tree in western India (more individuals were

Still, hypothesising intent to deceive, and success at deceiving, is not so surprising when one considers that Meinertzhagen was, and is, admired for his role in military intelligence during the First World War. The line of reasoning would go as follows: Meinertzhagen's talent for deception, which he exploited to a good effect in his capacity of managing military intelligence in a given region during that war, would enable him, and indeed even tempt him, into application in some other field. Moreover, if we are to believe Meinertzhagen's published allegation that Lawrence of Arabia, his friend notwithstanding their political views being opposite in important respects, had admitted to him that he bluffed in his own published autobiographical material, this may have one ask after all, by analogy, whether Meinertzhagen didn't likewise indulge, at least sometimes, in taking some liberties with the factual truth while offering a public image of himself. Both of them had attained mythical status, owing to self-reports of daring and highly adventurous feats; that one of these two celebrities was ascribing to the other one the admission that much of his published memoirs was bluff, was something conducive to something like that being suspected (as well) of the one making the claim.

found later on): "the forest owlet that Rasmussen had sought for two weeks from one side of India to the other".

In the narrative at hand, let us symbolise the individual human characters as follows:

- $\mathcal{M}$  The deceased bird collector and master spy.
- R Living ornithologist Pamela C. Rasmussen.
- $C_1$  First group of  $\mathcal{R}$ 's colleagues.
- $C_2$  Second group of  $\mathcal{R}$ 's colleagues.

In the following formula,

$$t_{\circ}$$
,  $d_{t_{\circ}}$ , and  $y_{t_{\circ}}$ 

respectively are the time of the given event, the day on which it took place, and the year in which this happened.

$$e_{1} \equiv \begin{bmatrix} \operatorname{At} t_{\circ}, \\ t_{\circ} \subset \operatorname{morning}(^{d}t_{\circ}) \subset {}^{y}t_{\circ} \\ {}^{y}t_{\circ} = 1997: \\ \left( \underbrace{ \bigotimes_{\mathcal{R}}^{t_{\circ}} \begin{pmatrix} \beta \land \\ \wedge (\beta \text{ is alive}) \land \\ \wedge (\beta \text{ is-a bird}) \end{pmatrix} \right) \land \\ \wedge \left( \underbrace{ \bigotimes_{\mathcal{R}}^{t_{\circ}} (\beta \in Athene\_blewitti) } \right) \end{bmatrix}$$

The previous formula states that at a given time in the morning of a day in 1997, Rasmussen visually perceived an individual bird which, as she could see, was alive, and which, at that very time, she realised belonged to the species *Athene blewitti*.

Apart from the temporal relations we have been using thus far, a shorthand using



over the line for a time interval with "precedes or equals", on both sides is used in the next formula. Let us first describe in words what the formula states: there is a given set of places (even far away from each other), all of them being in India, and during the entire temporal interval T (which corresponds to the period starting as early as two weeks earlier than the sighting of the living member of *Athene blewitti*, and as late as a given number of days later on), Rasmussen was in India with an active goal, and for all those places in the list, there was a time when Rasmussen was in that place. Rasmussen's active goal during that visit was such that for a non-empty set

of individual birds, and for two non-empty sets of time-points, (of which temporal sets the first one is a subset of the interval T) at some point in time (belonging to the first temporal set) Rasmussen would visually perceive any of the individual birds in the bird-set and see it is alive, and then at some identical or subsequent point in time she would know that the given individual bird belongs to the species *Athene blewitti*.

$$\exists Places, \ Places \subset India,$$

$$Places = \{\dots, \gamma_1, \dots, \gamma_2, \dots\},$$

$$far(\gamma_1, \gamma_2), \quad \forall t, \ t \subset T,$$

$$T \equiv \left( {}^dt_{\circ} - 2 \ weeks \stackrel{|\!\!|}{\longrightarrow} {}^dt_{\circ} + n \ days \right),$$

$$(At \ t: \ \mathcal{R} \ in \ India) \land \left( \bigotimes_{\mathcal{R}}^t G_1 \right) \land$$

$$\land \begin{bmatrix} \forall \gamma_f, \quad \gamma_f \in Places, \\ \exists \tau \ \tau \subset T, \\ (At \ \tau: \ \mathcal{R} \ in \ \gamma_f) \end{bmatrix},$$

where

$$G_{1} \equiv \begin{bmatrix} \exists \{b_{i}\}, \exists \{t_{j_{1}}\}, \exists \{t_{j_{2}}\}, \\ \{t_{j_{1}}\} \neq \emptyset, \{t_{j_{2}}\} \neq \emptyset, \\ \{b_{i}\} \neq \emptyset, (\{t_{j_{1}}\} \subset T) \land \\ \land \forall t_{j_{1}}, \forall t_{j_{2}}, t_{j_{1}} \preceq t_{j_{2}}: \\ \left( \bigotimes_{\mathcal{R}}^{t_{j_{1}}} (b_{i} \land (b_{i} \text{ is alive})) \right) \land \\ \land \left( \prod_{\mathcal{R}}^{t_{j_{2}}} (b_{i} \in Athene\_blewitti) \right) \end{bmatrix}$$

The next formula states that the bird-sighting event actually took place, and that this caused Rasmussen goal of having such bird-sightings to be achieved. It is followed by another formula, stating that up to that moment, during her visit to India, that same goal hadn't been achieved as yet.

At 
$$t_{\circ}$$
:  $e_1 \boxtimes \mathcal{P}_{\mathcal{R}}^{t_{\circ}} G_1$ 

At 
$$t, (t \subset T) \land (t \prec t_{\circ}): \neg \left( \bigotimes_{\mathcal{R}}^{t} G_{1} \right)$$

In the next formula, we first define a temporal span whose starting point and whose ending point belong to vastly different grainsizes; in fact, the interval starts one generation earlier than Rasmussen obtaining the eventful bird-sighting, and ends just before the day of that particular event. The formula also states that there existed, during the given time interval, a set whose cardinality (i.e., whose number of members) was seven, and which consisted of stuffed specimens of the species *Athene blewitti*, those specimen being at some museum.

At t, 
$$(t_o - 1 \text{ generation}) \prec t \prec {}^d t_o$$
:  

$$\exists S, \quad |S| = 7,$$

$$S \equiv \left\{ \bigwedge_i \left| \begin{matrix} (\bigwedge_i \in Athene\_blewitti) \land \\ \land \quad (\bigwedge_i \text{ is stuffed}) \land \\ \land \quad (\bigwedge_i \text{ is in } m) \land \\ \land \quad (m \text{ is-a } museum) \end{matrix} \right\}$$

In 113 years, no scientist had seen a living individual of *Athene blewitti* and published a report of that sighting:

At an advanced stage of a multi-year project, Rasmussen and her colleagues are pursuing the goal of their publishing a *Field Guide to Birds of India*, the plan enacted for that purpose being: their preparing the *Field Guide to Birds of India*. (Let us symbolise the latter as *F*.) We represent this as follows:

$$\forall t, \quad t \subset \Theta, \quad \text{most-of}(\Theta) \prec T,$$
  

$$T \equiv ({}^{y} \vartheta_{1} \stackrel{\vdash \cdots \vdash y}{=} \vartheta_{2}), \quad {}^{y} \vartheta_{1} \neq {}^{y} \vartheta_{2},$$
  

$$\left( \bigotimes_{\mathcal{R} \cup \mathcal{C}_{1}}^{t} G_{2} \right) \land \left( \text{pursue}_{\mathcal{R} \cup \mathcal{C}_{1}} G_{2} \right)$$
  

$$G_{2} \equiv \left( \text{publish}_{\mathcal{R} \cup \mathcal{C}_{1}} F \right)$$
  

$$\text{plan}_{1}(G_{2}) \equiv \left( \text{prepare}_{\mathcal{R} \cup \mathcal{C}_{1}} F \right).$$

Now, let us describe the event of the 1993 exposé in *Ibis*; remember that an event of communication is symbolised by means of the message itself being preceded by a prefix  $\mu$  whose subscript refers to the originator of the message, and whose superscript (if there is one) refers to the addressees (or recipient) of the message. The next formula states that at a given time during 1993, *Ibis*, which is a journal, published a particular article which, starting from its publication time, was conveying such information which contained this other bit of information: namely, that there exists a set of stuffed bird specimens, that set being a subset of the Meinertzhagen bird collection, and such that there exists a set of such labels which are part of the given specimen (from the given set of bird specimens), and which convey information that is false.

$$\begin{bmatrix} \text{At } t_E, \ ^y\!t_E = 1993 : (\text{publish}_{Ibis} \ E) \end{bmatrix} \land \\ \land (E \text{ is-a } article) \land (Ibis \text{ is-a } journal) \land \\ \land (\text{At } \tau, \tau \succeq t_E : \ \mu_E \varepsilon) \land (\varepsilon' \subset \varepsilon) \end{bmatrix}$$

Lipske (1999), who was first describing Rasmussen's rediscovery of the owlet species *Athene blewitti* in India, turns to some background information:

Coming nose to beak with the long-absent species required days of difficult hunting along forest paths and stream beds. But before leaving for India, Rasmussen had already picked her way down another trail that led through a jungle of scientific deception.

She had been in the final stages of preparing a field guide to birds of the Indian subcontinent (a project initiated by Smithsonian Secretary Emeritus S. Dillon Ripley), when she read an article that raised questions about the accuracy of bird records made by Col. Richard Meinertzhagen. A British soldier, spy and noted amateur ornithologist in the early part of this century, Meinerthagen (who died in 1967) was long credited with creating one of the world's best private collections of Old World bird specimens.

The 1993 article suggested, however, that labels on some of his birds were fraudulent. This was unsettling news for Rasmussen. There were more than a dozen kinds of birds for which Meinertzhagen was the only collector claiming to have found that species in India. "I had to know whether to include all these taxa" in the field guide or rule them out as Indian birds, she says.

The next formula represents the knowledge that upon reading the exposé in *Ibis*, Rasmussen realised that  $\varepsilon'$  (i.e., that there are stuffed birds in the Meinertzhagen collection whose labels convey false information) is something running counter (this is symbolised by a lightning-like arrow) her and her colleagues' goal G<sub>2</sub>, and this in turn provided motivation for her to set for herself yet another goal, G<sub>3</sub>:

$$\varepsilon' \equiv \begin{bmatrix} \exists \Sigma, \\ \Sigma \equiv \left\{ \psi_i \middle| \begin{array}{c} (\psi_i \text{ is-a } bird) \land \\ \land (\psi_i \text{ is } stuffed) \end{array} \right\}, \\ \Sigma \subset BirdCollection_{\mathcal{M}}^{\delta}, \exists L, \\ L \equiv \left\{ \begin{array}{c} (\lambda_j \text{ is-a } label) \land \\ \land (\lambda_j \subset \psi_j \in \Sigma) \land \\ \land (\mu_{\lambda_j} \text{ info}_j) \land \\ \land (info_j \text{ is } false) \end{array} \right\} \end{bmatrix}$$

At t,  $t \succeq t_E$ ,  $t \subset \text{final-stages-of}(\Theta)$ :  $(\operatorname{read}_{\mathcal{R}} E) \boxdot \left( \square_{\mathcal{R}}(\mu_E \varepsilon') \right) \boxdot$  $\boxdot \left( \square_{\mathcal{R}}(\varepsilon' \frown G_z) \right) \blacksquare \left( \square_{\mathcal{R}}(G_3) \right)$ 

Let ForEx stand for ForensicExamination.

$$G_3 \equiv \left( For Ex_{\mathcal{R} \cup \mathcal{C}_2}^{taxidermy} \Psi 
ight)$$

Lipske (1999) continues his account as follows:

To find out, she visited Britain's Natural History Museum in London, where most of Meinertzhagen's collection of tens of thousands of birds now resides. Working with ornithologists there, she examined the colonel's unique India specimens. "Each was either clearly fraudulent or highly suspicious", Rasmussen says.

She discovered that Meinertzhagen had done some of his most successful bird hunting not in the wild but in the museum's specimen cabinets. He was known to boast of his collection's "unique perfection", she says. "One of the reasons that it was uniquely perfect was because he was stealing the best specimens" from other collectors' museum contributions.

With Robert Prys-Jones, head of the Bird Section at Britain's Natural History Museum, Rasmussen established that hundreds of Meinertzhagen specimens were birds he filched; some he restuffed and then relabeled with false information. Of all the ornithological treasures the colonel stole, the rarest was India's forest owlet. Cracking the case required sophisticated detective work.

Rasmussen had found that, of seven known specimens of the owlet in museums, only one was said to have been collected in this century — in 1914 by Meinertzhagen. Most of the others had been collected in the 1880s by James Davidson, a British official and bird enthusiast stationed in western India.

Lipske goes on to relate how Rasmussen and her colleagues carried out examinations of the suspicious items:

Working with ornithologist Nigel Collar of BirdLife International in England, Rasmussen examined the Meinertzhagen owlet at the British Museum. Both experts could see that original stitching and stuffing had been removed from the skin and that new stuffing had been inserted and the bird resewn. Closer study of the specimen and X-ray photographs of it revealed characteristic preparation touches unique to Davidson, a self-taught worker with one-of-a-kind methods for handling bird skins.

Fairly certain that Meinertzhagen's owlet actually had been collected by Davidson, the ornithologists still wanted more evidence. Even though the bird had been restuffed, Rasmussen remembers hoping "maybe, just maybe, there will be a fiber or something somewhere that will tie it to Davidson". Luckily, there was.

Inside a wing, stuffed around a joint, there remained some raw cotton that had turned yellow from fat. Checking the wing of an owl of another species Davidson collected in India, the sleuths found what looked like similar cotton. They sent both samples to the Federal Bureau of Investigation in Washington, DC, where forensic tests indicated that the two bits of cotton were virtually identical.

"That, along with other clues, just basically put the nail in the coffin", Rasmussen says, noting the improbability that Meinertzhagen would have had access to the same kind of rough cotton Davidson used 30 years earlier. The owlet was a previously unknown, fifth Davidson specimen, presumably stolen from Britain's Natural History Museum by Meinertzhagen and decades later returned to it as part of the colonel's rich collection.

The following formula states that the set we call  $\Psi$  and which as stated in the previous formula, was to be subjected to taxidermic examinations, is constituted of all such stuffed bird items from the Meinertzhagen collection which according to their label originated in India, and which represent a species or subspecies (whichever taxon is minimal, i.e., if there are subspecies of the given bird species, then we are looking for representatives of those subspecies indeed, rather than merely – which is more general – of their species), provided that there is no independent evidence from other collections, deemed trustworthy, which include such an item with a label also stating that the given individual bird was collected in India. This was the narrower set of stuffed birds to be examined, for the purposes of ascertaining that the given species or subspecies could be listed in the field guide as being present in India indeed.

$$\Psi \equiv \left\{ \psi \middle| \begin{array}{c} f_1(\psi, \Omega) \wedge f_2(\Omega), \\ \forall \Omega, \ (\Omega \text{ is-a } bird) \wedge \\ \wedge \ \Omega = \min \left\{ \begin{array}{c} species(bird), \\ subspecies(bird), \end{array} \right\} \right\}$$

#### 5.3 Episodic Formulae

$$f_{1}(\psi, \Omega) \equiv \begin{bmatrix} (\psi \text{ is-a } \Omega) \land \\ \land (\psi \text{ is } stuffed) \land \\ \land (\psi \in BirdCollection_{\mathcal{M}}^{\delta}) \land \\ \land (\mu_{\lambda_{\psi}} (\psi \text{ is-from } India)) \end{bmatrix}$$

$$f_{2}(\Omega) \equiv \begin{bmatrix} \exists \xi, \ (\xi \text{ is-a } \Omega) \land \\ \land \ (\xi \text{ is } stuffed) \land \\ \land \ \exists z, \exists \lambda_{\xi}, (\xi \in BirdCollection_{z}) \land \\ \land \ (\mu_{\lambda_{\xi}}(\xi \text{ is-from } India)) \\ \land \ \left( \Box_{\mathcal{R} \cup \mathcal{C}_{2}} \begin{pmatrix} BirdCollection_{z} \\ \text{ is } trustworthy \end{pmatrix} \right) \end{bmatrix}$$

As seen earlier,

$$G_3 \equiv \left( For Ex_{\mathcal{R} \cup \mathcal{C}_2}^{taxidermy} \Psi \right)$$

We state that the very ability of, and permissibility for, Rasmussen and Prŷs-Jones, that  $G_3$  would eventuate, motivated an event:

$$\operatorname{can}_{\mathcal{R}\cup\mathcal{C}_2}^{\operatorname{ont},\operatorname{deont}}G_3$$
  $\square P_2$ 

This event was that Rasmussen and her second set of collaborators arranged for that forensic examination to be carried out:

$$e_{2} \equiv \left[ \text{make}_{\mathcal{R} \cup \mathcal{C}_{2}} \text{ For} Ex_{\mathcal{R} \cup \mathcal{C}_{2}}^{\text{taxidermy}} \Psi \right]$$
$$(e_{2} \cup \varepsilon') \blacksquare (\mu_{\mathcal{R}} \varepsilon'')$$

where

$$\varepsilon'' \equiv \begin{bmatrix} \forall \psi, \ \psi \in \Psi, \\ (\psi \text{ is "clearly fraudulent"}) \lor \\ \lor \ (\psi \text{ is "highly suspicious"}) \end{bmatrix}$$

Rasmussen and her collaborators claimed  $\epsilon'''$ 

$$\mu_{\mathcal{R}\cup\mathcal{P}} \, \varepsilon'''$$

where  $\boldsymbol{\epsilon}^{\prime\prime\prime}$  is defined as follows:

$$\varepsilon''' = \begin{bmatrix} \exists X, \ \exists Y, \ Y \subset X \subset BirdCollection^{\delta}_{\mathcal{M}}, \\ X \equiv \{x_u\}, \ Y \equiv \{y_v\}, \forall x_u, \forall y_v, \\ \begin{bmatrix} \operatorname{steal}_{\mathcal{M}} x_u; \\ \varepsilon_1'''(x_u) \land (\mathcal{M} \text{ stit } \varepsilon_2'''(y_v)) \end{bmatrix} \end{bmatrix}$$

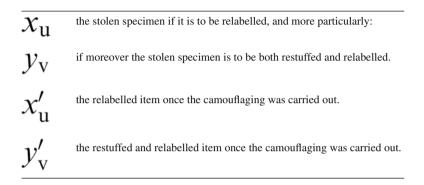
$$\varepsilon_{1}^{\prime\prime\prime}(x_{u}) \equiv \begin{bmatrix} \operatorname{remove}_{\mathcal{M}}(Old(Label(x_{u}))); \\ \operatorname{stick}_{\mathcal{M}}(Current(Label(x_{u}))) \end{bmatrix} \\ \operatorname{remove}(Old(Stitching(y_{v}))); \\ \operatorname{remove}(Old(Stuffing(y_{v}))); \\ \operatorname{insert}(New(Stuffing(y_{v}))); \\ \operatorname{sew}(New(Stitching(y_{v}))) \end{bmatrix} \end{bmatrix}$$

It's Meinertzhagen who sees to it that the removal of the old stitching and stuffing and their replacements are carried out; yet, we omit the subject subscript from the strings for the relevant verbs, as it is immaterial whether it was Meinertzhagen himself who (allegedly) carried out those operations, or (less likely) somebody else doing that discreetly on his behalf at his behest.

The supposed motivation for  $\mathcal{E}'''$  is the desire (ascribed to Meinertzhagen and more generally associated with stealing and camouflaging of stolen goods) to enact such a situation that it would not be known, other than to the culprit, that he has undue possession of the specimen he actually flaunts as being in his possession (or in the possession of whomever eventually receives from him that specimen, or the entire collection). In particular, it should not be known that of the specimen he has in his possession he is not the legal owner. Moreover, and more in particular,

it should not be known that the item is the same that unduly disappeared from the possession of the legitimate owner. To obtain the desired constellation of epistemic states in the outside world, it was necessary to give the stolen item a new identity. Should even the legitimate owner see the stolen specimen, because of the camou-flaging the owner would no longer be able to recognize it as one that disappeared from his possession.

As seen in the formula for  $\mathcal{E}^{\prime\prime\prime}$ , let us define:



We can rewrite the accusers' allegations as follows:

$$\mu_{\mathcal{R}\cup\mathcal{P}}\left(\wedge\left(\left(\bigotimes_{\mathcal{M}}^{\varepsilon'''}\wedge\pi_{0}\wedge\right)\mathbf{m}\right)\mathbf{m}\right)$$
$$\pi_{0}\equiv\left[\operatorname{has}_{\mathcal{O}}\left(\widehat{\boldsymbol{\chi}}\stackrel{}{\Longrightarrow}x_{u}\right]\right]$$
$$\pi_{0}\Rightarrow\pi_{0}'$$
$$\pi_{0}'\equiv\left[\operatorname{has}_{\mathcal{O}}\left(\widehat{\boldsymbol{\chi}}\stackrel{}{\Longrightarrow}x_{u}\right]\right]$$

In the latter, we are simplifying with respect to a situation in which the legal ownership of the set of specimens to which the stolen specimen belonged, may meanwhile have changed, and in complex ways for that matter. Also for the sake of simplicity, I am omitting some temporal references.

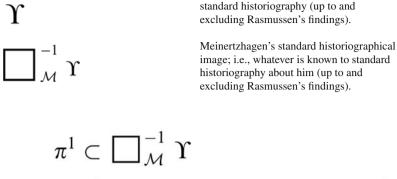
$$\pi_1 \supset \pi_2 \supset \pi_3$$

$$\pi_{2} \equiv \begin{bmatrix} \forall p, \ (p \text{ is-a } person), \ p \neq \mathcal{M}, \\ \text{if } \left( \bigotimes_{p}^{t} x_{u}^{\prime} \right) \\ \text{then } \neg \square_{p}^{t} \pi_{0}^{\prime} \end{bmatrix}$$
$$\pi_{3} \equiv \begin{bmatrix} \text{if } \left( \bigotimes_{\mathcal{O}}^{t} x_{u}^{\prime} \right) \\ \text{then } \neg \square_{\mathcal{O}}^{t} \pi_{0}^{\prime} \end{bmatrix}$$

Now, we can go ahead and represent likewise this other information: "Closer study of the specimen and X-ray photographs of it revealed characteristic preparation touches unique to Davidson" (Lipske, 1999), which I already quoted earlier. Realization of these peculiarities in the preparation of the specimen, motivated the goal of more testing: "Rasmussen remembers hoping 'maybe, just maybe, there will be a fiber or something somewhere that will tie it to Davidson'. Luckily, there was" (Lipske, 1999). The evidence found was "[i]nside a wing, stuffed around a joint", namely, "there remained some raw cotton that had turned yellow from fat. Checking the wing of an owl of another species Davidson collected in India, the sleuths found what looked like similar cotton". This in turn prompted the goal of having the cotton samples examined by a qualified laboratory. Which was at "the Federal Bureau of Investigation in Washington, DC, where forensic tests indicated that the two bits of cotton were virtually identical" (Lipske, 1999). This, to Rasmussen's own satisfaction, was proof enough: "That, along with other clues, just basically put the nail in the coffin', Rasmussen says, noting the improbability that Meinertzhagen would have had access to the same kind of rough cotton Davidson used 30 years earlier", which of course is an assumption. This is not a legal case that went to court, but rather an event that tilted the balance in a controversy about the history of science that had implications for ongoing ornithological research.

Formal representation of this would make use of my notation for motivation, goal setting, goal satisfaction (i.e., goal achievement), perception, realisation, and so forth. In the following, I rather prefer to develop a representation for another side of the narrative at hand. It is *hypothesis formation*, for which we have already seen a notation.

Let us also introduce a set of propositions symbolised by a  $\pi$  with a numerical superscript instead of a subscript (which we had used in the formulae thus far). First of all, we want to state that according to what is known to *standard historiography* (which we symbolise by a capital Greek upsilon) Meinertzhagen was a "master of deception" in a given domain, espionage, and that for that reason he won acclaim.



 $\pi^{1} \equiv \begin{bmatrix} \mathcal{M} & \text{is-a} & \text{``master of deception''} \\ & \text{in-domain} & \text{espionage}^{\text{military}} \end{bmatrix}$ 

where

 $(p_{o} \text{ is-a "master of deception"}) \Longrightarrow$  $\Longrightarrow (p_{o} \text{ is habitually}(successfully}(very(deceitful))))$ 

$$\pi^{1} \mathbf{m} \mathbf{n}^{2}$$
$$\pi^{2} \equiv [\operatorname{acclaim}_{\Upsilon} \mathcal{M} \mathbf{qua} \pi^{1}]$$

It is both permissible (i.e., deontically possible) for Meinertzhagen (in the historical perspective of his own country), and ontologically possible for him (he had the ability for that to happen), to be (or have been) a master of deception in military espionage:

$$\pi^{3} \equiv \left( \operatorname{can}_{\mathcal{M}}^{\operatorname{deont}} \pi^{1} \right)$$
$$\left[ \pi^{3} \mathbf{m} \mathbf{n}^{4} \right]$$
$$\left[ \pi^{3} \mathbf{rf} \mathbf{n}^{6} \right] \equiv \pi^{7}$$

where the arrow in the latter formula stands for "and this reinforced". The next formula is about a hypothesis being formed, and the one after that is about it being a standing hypothesis.

$$\pi^4 \equiv \left( \operatorname{h} \pi^9 
ight)$$
 $\pi^6 \equiv \left( \operatorname{h} \pi^8 
ight)$ 

Meinertzhagen's very abilities tempted him, notwithstanding the thing he was able to do being impermissible:

$$\pi^{8} \equiv \left[ \begin{array}{cc} (\operatorname{can}_{\mathcal{M}}^{\operatorname{ont}} \pi^{9}) \land \\ \land ( \text{ is-tempted}_{\mathcal{M}} \checkmark ( \neg \operatorname{can}_{\mathcal{M}}^{\operatorname{deont}} \pi^{9}) ) \end{array} \right]$$

Proposition  $\pi^8$  states that Meinertzhagen was both able to, and illegitimately tempted to, see to it that proposition  $\pi^9$  is true. Motivation of the hypothesis  $\pi^9$  arising, and  $\pi^8$  (an extant hypothesis) being reinforced, are things that may have been verified independently: either, or both of them concomitantly. Thus:

$$(\pi^5 \land \neg \pi^7) \lor (\pi^7 \land \neg \pi^5)$$
$$\pi^9 \equiv [be_{\mathcal{M}} successfully(deceitful) \mathbf{qua} D]$$

where, according to the situation (the controversy about the Meinertzhagen bird collection, or the controversy about Meinertzhagen's memoirs):

$$D \in \left\{ egin{array}{c} diarist, \\ birdcollector \end{array} 
ight\}$$

That is to say, **D** stands for *diarist* or for *birdcollector*. Literally, **D** belongs to a set which comprises *diarist* and *birdcollector*.

# 5.4 Bex's Approach to Combining Stories and Arguments in Sense-Making Software for Crime Investigation

An interesting project in AI & Law that tries to combine stories and arguments in sense-making software for crime investigation, was reported about (Bex, et al., 2007) by a team from the Dutch universities of Groningen (Floris Bex, Bart Verheij,

Henry Prakken) and Utrecht (Susan van den Braak, Herre van Oostendorp, Gerard Vreeswijk, and again Henry Prakken). Eventually, having moved to the University of Dundee in Scotland, Floris Bex has published in book form a formal hybrid theory of how to relate arguments, stories, and criminal evidence (Bex, 2011).

As stated by Bex et al. (2007, p. 145):

A formal model is proposed that combines AI formalisms for abductive inference to the best explanation and for defeasible argumentation. Stories about what might have happened in a case are represented as causal networks and possible hypotheses can be inferred by abductive reasoning. Links between stories and the available evidence are expressed with evidential generalisations that express how observations can be inferred from evidential sources with defeasible argumentation. It is argued that this approach unifies two well-known accounts of reasoning about evidence, namely, anchored narratives theory and new evidence theory. After the reasoning model is defined, a design is presented for sense-making software that allows crime investigators to visualise their thinking about a case in terms of the reasoning model.

The visualisation component of the architecture envisaged by Bex et al. (2007) is called *AVERs*, and was "implemented as a web front-end to an SQL database. A case can be represented visually through multiple views; in this paper we will focus on the two graphical views, that is, the evidence view and the story view" (section 6 ibid.). Ideally, they wanted to design a more sophisticated tool than such *investigative analysis software* for organising and visualising the evidence in the practice of crime investigation, as the British tool HOLMES 2 (short for *Home Office Large Major Enquiry System*),<sup>130</sup> and *Analyst's Notebook*,<sup>131</sup> this other tool offered by the British firm i2, as well as like the experimental tool from the Netherlands, BRAINS, reported about by van der Schoor (2004). Moreover, Bex et al. (2007) were building upon the remarkable record of some of the authors in research into argumentation within AI & Law, and they also wanted to relate their project to approaches from legal scholarship to legal narratives, and they specifically considered the *new evidence theory* (citing Anderson & Twining, 1991,<sup>132</sup> and Schum & Tillers, 1991) and the *anchored narrative theory* (citing Wagenaar et al., 1993).

There is no evidence in the paper of awareness of qualms among some scholars about Bayesianism in models of legal evidence. Nevertheless, Bex et al. (2007)

<sup>130</sup> http://www.holmes2.com/holmes2/index.php

<sup>131</sup> http://www.i2.co.uk/Products/Analysts Notebook/default.asp

<sup>&</sup>lt;sup>132</sup> An extensively revised edition – Anderson, Schum, and Twining (2005) – of Anderson and Twining's textbook on evidence and proof (1991) has appeared in 2005. Anderson et al. (2005) "is a rigorous introduction to the construction and criticism of arguments about questions of fact, and to the marshalling and evaluation of evidence at all stages of litigation. It covers the principles underlying the logic of proof; the uses and dangers of story-telling; standards for decision and the relationship between probabilities and proof; the chart method and other methods of analyzing and ordering evidence in fact-investigation, in preparing for trial, and in connection with other important decisions in legal processes and in criminal investigation and intelligence analysis" (from the publisher's blurb).

propose a model likely to be well received by both the Bayesians and the skeptics in the controversy about probability in law. This is because the model of Bex et al. (2007) is based on causal networks<sup>133</sup> and on logic, without resorting to probabilities (even though arguably these could be added, should one wish to). All in all, unsurprisingly, the model of Bex et al. (2007) is very close to the kind of modelling of argumentation as being applied to narratives, from the respective (and sometimes joint) oeuvre of Henry Prakken, Floris Bex, Bart Verheij, and Susan van den Braak.

Bex et al. (2007) concede that both *explanation* and *prediction*, both of them familiar tasks from artificial intelligence, are important in crime investigation,<sup>134</sup> but admittedly, in the given paper, they confined themselves to only model explanation, as far as stories are concerned. They envisaged also addressing prediction in future research. They considered physical causation, mental causation, and the defeasibility of reasoning with causal information.<sup>135</sup>

Their own approach was to combine reasoning from cause to effect<sup>136</sup> and reasoning from effect to cause. They combined *abductive* reasoning<sup>137</sup> and *modus*-*ponens*-style reasoning<sup>138</sup>: "while the construction of stories to explain the available evidence is modelled as abductive reasoning with networks of causal generalisations, source-based reasoning about evidence is modelled as modus-ponens-style reasoning with evidential generalisations" (section 3 in Bex et al., 2007).

<sup>&</sup>lt;sup>133</sup> Incidentally, in psychology, *causal attribution* in cognitive processes and beliefs is the subject of Hewstone (1989).

<sup>&</sup>lt;sup>134</sup> "Both forms of reasoning are, of course, of prime importance in reasoning about evidence, whether story- or argument-based. Often an attempted proof that a certain crime took place is constructed by saying that an observed fact (the evidence) holds since something else (the crime) happened which caused it. Such an explanation can then be tested by predicting what else must have been caused by the crime if it has taken place and by trying to find evidence concerning the predicted facts" (from section 2.2 in Bex et al., 2007).

<sup>&</sup>lt;sup>135</sup> "Clearly, reasoning with causal information is defeasible in several ways: causal generalisations may have exceptions (striking a match will cause fire except if the match is wet) and observed evidence may be explained by several alternatives (the grass is wet since it rained or since the sprinkler was turned on)" (from section 2.2 in Bex et al., 2007).

<sup>&</sup>lt;sup>136</sup> "A reason not to represent all causal information from effect to cause has to do with the fact that crime investigators very often draw time lines and causal-network-like structures. Since we want to build software for supporting crime investigators, we want to support this habit. This explains why for our purposes representing all causal information from effect to cause is less desirable" (from section 3 in Bex et al., 2007). By contrast, the reason given for not only representing causation from cause to effect is about witness testimony: "the relation between a witness testimony and its content must be represented as causal generalisations, in which the witness testimony is regarded as caused by something else. One possible cause of a witness testimony is, of course, the truth of the event to which the witness testifies" (ibid.). Nevertheless, the witness may have been hallucinating, or at any rate is wrongly believing that he or she saw something. Or then, the witness may have reasons to lie. Cf. Thagard (2005).

<sup>&</sup>lt;sup>137</sup> We discussed abductive reasoning in Section. 2.2.1.6 in this book.

<sup>&</sup>lt;sup>138</sup> When *modus ponens* is applied, in we must see one premise as an *antecedent*, another as a *conditional* and the conclusion is the *consequent*. This is the classical Aristotelian *syllogism*.

Bex et al. (2007, section 4) adopted a causation network graphic approach along with an example from Bex, Prakken, and Verheij (2006), in which different diagrams represent the prosecution's story and the defence's story about a case of burglary.<sup>139</sup> Arrows stand for causation or sequence inside a rectangular contour with rounded angles. From outside the contour, arrows (standing for support or for refutation, e.g. from testimony, or from an argument about the testimony) may enter the contour and point to this or that box, which in turn stands for a narrative element.<sup>140</sup> For example, based on testimony from various witnesses about what they heard, the defence claims that the witnesses did not hear a loud bang, and this provides refutation for the causal expectation that there should have been a loud bang, had the prosecution's story be true.<sup>141</sup> Bex et al. explained (2007, section 4):

The reader may find some of the causal or evidential generalisations in this example weak or far-fetched. However, this is not a problem for our approach. The very idea of our sensemaking system (which it shares with, for example, Wigmore's charting method) is that it is the user of the system who is responsible for carefully testing the quality of his stories and arguments. The software should support the user in this critical process; it should not itself automatically generate sensible stories and arguments.

The most important part of the approach developed in Bex et al. (2007) is the fomalism. "General knowledge is in our approach expressed with two sets  $G_C$  and  $G_E$  of *causal* and *evidential* generalisations. Logically, we formalise both types of generalisations in the same way, with a special conditional connective) which only satisfies the modus ponens inference rule" (Bex et al., 2007, section 5.1). Out of many formal and computational accounts of abductive reasoning that are available in artificial intelligence, Bex et al. (2007, section 5.2) proposed a simple one. They defined an *abductive framework* as a tuple  $A_C = (G_C, O, F, X)$  is the *causal theory*, and is a set of causal generalisations. O stand for the the *observations*, is a set of ground first-order literals, and does not have to be consistent. *F* is either a subset of *O*, or the entire set *O*. *F* is the set of the *explananda*, and is a consistent set of first-order literals. "They are the observations which have to be explained", whereas the observations not in *F* do not strictly have to be explained but explaining them does make an explanation better". As to *X*, it is the set of the *explanantia*; that is to say, *X* "s

<sup>&</sup>lt;sup>139</sup> Burglary is also the subject of Oatley, Zeleznikow, Leary, and Ewart (2005), in a *link analysis* perspective.

<sup>&</sup>lt;sup>140</sup> "The part of the figure within the large rounded box represents the causal network corresponding to the prosecution's story. The four small grey boxes outside the causal network are pieces of testimonial evidence. With the evidential generalisation 'a witness usually speaks the truth' they can be used to build arguments to support nodes inside the causal network" (from section 4 in Bex et al., 2007).

<sup>&</sup>lt;sup>141</sup> Andrew King is the defendant, and the Zomerdijk family house is where an attempted burglary is claimed to have taken place. Here is part of the prosecution story: "Because it is dark, King does not see the toy lying on the floor. King hits the toy, causing it to make a sound which causes the dog to give tongue. King hears the dog and runs outside, closing the door behind him. Mr. Zomerdijk hears the toy and the dog. He goes to the bedroom and sees King running away through the closed garden door."

the set of all ground literals occurring in the antecedent of some causal generalisation in  $G_C$  and instantiated with some term in" the union set of  $G_C$  and O. Let  $\vdash$ stand for logical implication according to the set of all deductive inference rules extended with modus ponens for  $\Rightarrow$ . An *explanation* in terms of  $A_C$  is a set  $H \subseteq X$ of hypotheses such that for each *explanandum*  $f \in F$  it holds that the explanation implies that *explanandum* (that is, that  $H \vdash f$ ) and that the explanation does not imply something false (that is, that  $H \nvDash \bot$ ).

Admittedly, as the approach in Bex et al. (2007) is purely qualitative, in order to compare alternative explanations resorting to probability distributions over H is not applicable (as stated in section 5.2 ibid.). Therefore, Bex et al. (2007) adopted a simple *ordering* on explanations: "if H' is better than H on the observations explained and not worse on the observations contradicted, or if H' is better on the observations contradicted and not worse on the observations explained, then H' is better than H. If they are equal on both criteria, then they are equally good overall. In all other cases they are incomparable" (from section 5.2 ibid.); they also expressed this ordering in formulae). Moreover, "combining abduction with argumentation allows a refinement of this preference relation" (ibid.). Bex et al. (2007, section 5.3) defined a *logic for defeasible argumentation*, <sup>142</sup> the application being as a "logic for reasoning with evidential generalisations. Since such generalisations allow for exceptions, this logic must be nonmonotonic."<sup>143</sup> Their choice was as follows (ibid.):

In our case the classical inference rules are those of standard first-order logic while the only defeasible inference rule is the modus ponens rule for the  $\Rightarrow$  connective. Undercutters to this defeasible version of modus ponens are formalised as arguments for the conclusion  $\neg$  valid(g) where g is the name of the generalisation to which modus ponens is applied.<sup>144</sup>

The qualitativeness of the approach, from which its avoidance of a probabilistic representation follows, would arguably make the method quite interesting for the Bayesian skeptics among legal scholars,<sup>145</sup> without however antagonising the legal Bayesians (as the latter could possibly insert a probabilistic component in the argumentation module). Another formalism that the Bayesian skeptics ought to look into, as they are likely to come to like it very much, is the model for arguments and critical questions concerning legal narratives, as proposed by Bex et al. (2009), and which we already considered in Section 3.4.4.4.

<sup>&</sup>lt;sup>142</sup> Carbogim, Robertson and Lee (2000) presented a comprehensive survey of defeasible argumentation. In this book, we have dealt with *defeasibility* in Sections 3.3 and 3.9.1. "Nonmonotonic reasoning, because conclusions must sometimes be reconsidered, is called *defeasible;* that is, new information may sometimes invalidate previous results. Representation and search procedures that keep track of the reasoning steps of a logic system are called *truth maintenance systems* or TMS. In defeasible reasoning, the TMS preserves the consistency of the knowledge base, keeping track of conclusions that might later need be questioned" (Luger & Stubblefield, 1998, p. 270). See, e.g., Antoniou (1997) and Antonious (2000), as well as, in an AI & Law context, Antoniou, Billington, and Maher (1999).

<sup>&</sup>lt;sup>143</sup> See a definition of *monotonic* vs. *nonmonotonic* reasoning in fn. 93 in Chapter 2.

 $<sup>^{144} \</sup>neg$  valid(g) means "g is not valid".

<sup>&</sup>lt;sup>145</sup> See above in Sections 2.4 and 5.1.

#### 5.5 Persuasion Stories vs. Arguments

In a poster paper at a workshop on story-processing, Bex and Bench-Capon (2010) combined the narrative dimension with multiagent persuasive argumentation.<sup>146</sup> They noted that "in a context of persuasion<sup>147</sup> people will often tell a story (i.e. a sequence of events caused or experienced by actors) rather than give an argument based on conditional rules. For example, teaching a child not to lie is easier done by telling the story of *The Boy Who Cried Wolf* than by presenting an argument that one should not tell lies in circumstances where there is no gain in telling the lie because this will demote the value of honesty and consequently people will not believe you when you do tell the truth" (ibid., p. 4). Being persuaded by a story into accepting a norm involves identification: "A story does not persuade by imparting explicit rules or values, but instead by having an agent identify with the situations or actors in a story" (ibid., p. 4).

In their brief position paper, Bex and Bench-Capon (2010) stated their "aim to explore the role of stories in persuasion, particularly in the context of value-based practical reasoning with agents" (ibid., p. 5). Questions they ask include: "What is the structure of a story?", "When is a story persuasive for a particular agent?", "Given an agent and his knowledge of different stories, how does an agent choose an action?", "What is the relation between arguments and stories in the context of practical reasoning?" (ibid., p. 5).

<sup>&</sup>lt;sup>146</sup> Section. 6.1.6 in this book is about multiagent systems. Bear in mind that it is not merely the case that argumentation could be modelled by means of multiagent systems. It is also the case that effective management of multiagent systems may require negotiation between autonomous agents, and therefore research into computational models of argumentation is beneficial for research into multiagent systems within computer science. At any rate, within AI & Law there has been research on modelling argumentation among antagonistic agents by means of multiagent systems. Artikis, Sergot, and Pitt (2003) presented a theoretical and computational framework for the executable specification of *open multiagent computational systems*. These "are composed of heterogeneous and possibly antagonistic software entities. Characteristic features are limited trust and unpredictable behaviour. Members of such systems may fail to, or even choose not to, conform to the norms governing their interactions. It has been argued that systems of this type should have a formal, declarative, verifiable, and meaningful semantics." (ibid., p. 12).

<sup>&</sup>lt;sup>147</sup> For a treatment of AI modelling of persuasion in court, see e.g. Bench-Capon (2003a, 2003b).

# Chapter 6 Accounting for Social, Spatial, and Textual Interconnections

# Link Analysis and Data Mining for Criminal Investigation

## 6.1 Methods

### 6.1.1 An Introduction

Already the second issue of the new journal *Wiley Interdisciplinary Reviews: Data Mining and Knowledge Discovery* (March/April 2011, vol. 1, no. 2) has featured 'Data Mining and Crime Analysis', an article by oatley and Ewart (2011). In fact, the pool of techniques that goes by the name *data mining* has found, among its many fields of application, also an important role in software for crime detection, crime analysis, and crime intelligence. "Data mining is the process of automated extraction of predictive information from large datasets" (Choudhary, Honbo, Kumar, Ozisikyilmaz, & Misra, 2011, p. 41). "Data mining is the analysis of (often large) observational data sets to find unsuspected relationships and to summarize the data in novel ways that are both understandable and useful to the data owner" (Hand, Mannila, & Smyth, 2001, p. 1).

Historically, there have been artificial intelligence tool prototypes (mainly expert system prototypes) originating in academia, and applied to detecting volume crimes, such as burglary (Lucas, 1986; Charles, 1998). Adderley and Musgrove (2003c, p. 26)<sup>1</sup> explain why such systems were not adopted in practice as operational systems:

<sup>&</sup>lt;sup>1</sup> Richard Adderley is affiliated with the West Midlands Police, and P. B. Musgrove, with the University of Wolverhapton, in England. Their papers (Adderley & Musgrove, 2003a, 2003c) were incorporated into Mena's (2003) good textbook, as sections 1.15 and 6.12. That paper reported about an application of self-organising maps (SOM, i.e., neural networks with unsupervised learning) to linking crimes to perpetrators. The application reported about was clustering offender description for *bogus official burglaries* (also called *distraction burglaries*), i.e., burglaries where the offender gains access to premises by deception, by posturing to somebody innocent (typically, the victim, and typically, elderly) as though they want to gain access for some legitimate purpose, in some false capacity. A commercial data mining package was resorted to (Clementine, from SPSS), using its SOM option. The output was a five-row-by-seven-column table (a map), and the input was 105 offender descriptions, measured by 46 binary variables. The clustering is in the 35 cells of the table: "This allows for a potential of 35 different offenders each committing three crimes. If there were more than 35 offenders, it would force offenders with similar descriptions to be

While usually proving effective as prototypes for the specific problem being addressed, they have not made the transfer into practical working systems. This is because they have been stand-alone systems that do not integrate easily into existing police systems, thereby leading to high running costs. They tended to use a particular expert's line of reasoning, with which the detective using the system might disagree. Also they lacked robustness and could not adapt to changing environments. All this has led to wariness within the police force regarding the efficacy of AI techniques for policing.

It took the emergence and coming of age of a combined pool of techniques, to make inroads into law enforcement applications (Mena, 2003). *Data mining* has emerged indeed as a major area of research in computing, aiming at finding patterns and connections in huge databases<sup>2</sup> (e.g., Adriaans & Zantinge, 1996). This it does by massively resorting not only to standard *database technology*, but also to *statistical modelling*, and to several branches of *artificial intelligence*, mainly *pattern-matching* and *machine-learning*.

Types of data mining include, for example (Stranieri & Zeleznikow, 2005b):

- *Predictive data mining*: its aim is to learn from sample data in order to make a prediction. Techniques include: *neural networks, rule induction, linear, multiple regression.* See Table 6.1.1.1.
- *Segmentation*: its aim is to automatically group data into groups/clusters; to discover meaningful groups in sample data. Techniques include: *k-means clustering, self-organising maps*. See Table 6.2.1.2.

<b>Table 6.2.1.1</b> An example ofpredictive data mining (by	Marriage	Length	Children	Percentage assets to wife
kind permission of Stranieri & Zeleznikow, 2005b)	1 2 3 4 5	30 years 20 years 5 years 10 years 2 years	4 2 2 1 0	50% 20% 10% 70% 90

clustered together. If there are fewer than 35 offenders the SOM algorithm could place descriptions of the same offender across a number of cells", while typically some cells remain empty (Adderley & Musgrove, 2003b, pp. 30–31). A police sergeant received the table, and analysed individual cases, i.e., individual clusters, having been "given the brief to decide if there was sufficient evidence in the witness statements and for those crimes that had been solved to say whether there was a possible link between some of the crimes in each cluster" (ibid., p. 31).

<sup>&</sup>lt;sup>2</sup> "Law-enforcement agencies across the US compile crime statistics using well-established standards such as the FBI's Uniform Crime Reporting System and its successor, the National Incident-Based Reporting System (www.fbi.gov/hq/cjisd/ucr.htm), as well as other criteria defined by jurisdictional needs and requirements" (Chen et al., 2004).

<b>Table 6.2.1.2</b> An example ofsegmentation (by kindpermission of Stranieri &Zeleznikow, 2005b)	Marriage	Length	Children	Percentage assets to wife
	1 2 3 4 5	30 years 20 years 5 years 3 years 2 years	4 2 2 1 0	50% 70% 10% 70% 90%
<b>Table 6.2.1.3</b> An example ofsummarisation (by kind	Marriage	Length	Children	Percentage assets to wife
permission of Stranieri & Zeleznikow, 2005b): if length=30 Percent=50% (66%)	1 2 3 4 5	30 years 30 years 30 years 3 years 2 years	4 2 2 1 0	50% 50% 10% 70% 90%

- *Summarisation*: its aim is to automatically present data in a way that makes interpretation easier; that is to say, the aim is to help the user visualise patterns or find associations within the sample data. Techniques include: *associations, visualisation.* See Table 6.2.1.3.
- Time series, for forecasting;
- Text mining.

Within the scholarly discipline of AI & Law, data mining has not necessarily been applied to matters relating to legal evidence. One comes across such applications that are far away from the concerns of crime detection, or police intelligence or investigation. Take *knowledge discovery from databases (KDD)*. An especially notable case of the application of *knowledge discovery from legal databases* (a subject covered by Stranieri & Zeleznikow, 2005a) is the prediction of judicial decisions in Australian family law, in order to assist couples that intend to divorce with negotiation and settling. This is a project developed by Andrew Stranieri and John Zeleznikow. This itemisation is reproduced by kind permission from Stranieri and Zeleznikow (2005a):

Field: Family Law in Australia
Task: Predict by percentage the split of assets

a judge awards husband and wife

Mining technique: Neural network
Data selection: approximately 1000 unreported cases
Data pre-processing: some contradictions removed
Data transformation: restructuring using argument tree
Data mining: 20 neural networks
Evaluation: Resampling with each neural network,

Prediction of unseen cases.

Another application of knowledge discovery to law, reported about in a brief paper by Pedro Feu Rosa (2000) and surveyed in Stranieri and Zeleznikow (2005a, pp. 12, 228), a Supreme Court Judge in Brazil initiated a program for the resolution of traffic accident disputes. It is called *Judges on Wheels*, which "involves the transportation of a judge, police officer, insurance assessor, mechanical and support staff to the scene of minor motor vehicle accidents. The team collects evidence, the mechanic assess the damage, and the judge makes a decision and drafts a judgement with the help of a program called the 'Electronic Judge' before leaving the scene of the accident. The 'Electronic Judge' software uses a KDD approach that involves data mining tools called neural networks" (Stranieri & Zeleznikow, 2005a, p. 12). Stranieri and Zeleznikow (2005a) itemised this as follows:

Field: Traffic accidents in Brasil
Authors: Feu de Rosa
Task: Predictive. Predict %outcome of traffic case. Used to help ensure consistency amongst Judges who spend more time on the road
Mining technique: Neural network
Data selection: initially synthetic commonplace cases, later actual cases
Data pre-processing: little detail
Data mining: 1 neural network
Evaluation: little detail

The application of *data mining* to police or Internal Revenue Service investigations has received an excellent treatment in depth in a book by Jesús Mena (2003), *Investigative Data Mining for Security and Criminal Detection*. In 2010, another book of his was forthcoming: *Behavioral Forensics: How to Conduct Machine Learning Investigations*. In the present Chapter 6, we clearly do not make an attempt to compete with those books. (The present chapter is likely to provide readers with motivation to read them, too.) We try here to integrate the subject of investigative data mining into the full picture that emerges from the book you are reading now.

Huge amounts of data, some of it potentially amenable to yield information relevant to crime investigation, pose a challenge that can be met by combining several categories of techniques<sup>3</sup> from computer science:

• *Link analysis* is an interactive technique, visualising graphically networks of entities and events. This may make it easier to grasp networks of irregular transactions, or of suspected offenders. See Sections 6.1.2 and 6.2, and Chapter 7 below. For example, in the United States, several government agencies use NETMAP<sup>4</sup>:

<sup>&</sup>lt;sup>3</sup> Also including, e.g., *association rules*, for which see fn 36 in Chapter 3.

<sup>&</sup>lt;sup>4</sup> NETMAP is a tool of ALTA Analytics (http://www.altaanalytics.com/). It can query databases by using the SQL query language. "The main shapes of NETMAP link charts are those of a wagonweel

"Financial crime analysts and investigators use tools like NETMAP to begin to define parts of financial transactions as they relate to individuals, organizations, and locations, including dates, amounts, institutions, sources, and ID-numbers", considering that "[j]ust in a day more than \$1 trillion is wired through New York City alone" (Mena, 2003, p. 84).

- *Database* technology (e.g., for example, techniques handling *relational databases*), for organising the data of individual databases, and to carry out and basic kinds of retrieval (which are themselves embedded in sophisticated techniques from, e.g., *machine learning*: see below).
- *Data preparation* (manually) for the various data mining techniques; but also whatever computing technology offers for *data integration* and, if the data are multimedial, *data fusion* methods, so that benefits can be derived from combining different sources of information that moreover may be of different kinds.
- *Data warehousing*, i.e., conflating various sources of information (transactional, demographics) so that a cohesive view emerges of individuals (e.g., customers) of interest to the user. See Section 6.1.7.1 below.
- *Text mining*, a kind of data mining that incorporates *free-text information retrieval* and *natural-language processing* techniques, so that a mass of textual documents notwithstanding its mainly being unstructured text<sup>5</sup> can be probed into, looking for significant information: "Unlike traditional data mining, which deals with databases that follow a rigid structure of tables containing records representing specific instances of entities based on relationships between values set in columns,<sup>6</sup> text mining deals with unstructured data" (Mena, 2003, p. 8).<sup>7</sup> In the 2000s, data mining techniques were used, e.g., on the Enron database of emails, and this is an example of the need to handle data in the form of free text. Srihari (2009) discussed text mining for counterterrorism.

format, with color conveying very important factors", but is "also supports some additional layouts, including circular, column, row, row/column, bullseye, and Cartesian charts" (Mena, 2003, p. 101).

<sup>&</sup>lt;sup>5</sup> Even though free-text may be inside a document that is itself divided into chapters and sections, and is therefore structured in that particular sense, such a body of text is nevertheless "unstructured" for the purposes of the search at hand. Structures has to emerge from the analysis.

 $<sup>^{6}</sup>$  Values set in columns is what you get in a database relation, the columns corresponsing to the attributes which are each a header of a column. It is by contract to tabular database, that we can speak of free-text databases.

<sup>&</sup>lt;sup>7</sup> Mena discusses NASA's *Perilog* text mining tool that analysed thousands of free-form narrative reports on aviation accidents (Mena, 2003, pp. 128–130), and MITRE's *TopCat* text mining tool that goes through a collection of documents, identifies different topics, and displays the key players for each topic (ibid., pp. 130–132). *TopCat* can also be used with a *summarisation filter*. Automated summarisation is an active area of research: Mani (2001) is a book on the subject; Nissan (2003h) is a long review of that book, and we adapted it into a section below.

- *Pattern-recognition* techniques,<sup>8</sup> variously applied, and oftentimes resorting to *neural networks* or then to *genetic algorithms (evolutionary computing)*.<sup>9</sup>
- *Statistical modelling* (modelling analyses include, especially, *linear regression*),<sup>10</sup> and *statistical prediction techniques*.
- *Neural networks* (see Section 6.1.13 below) are a popular kind of representation<sup>11</sup> for tasks involving *classification*, *prediction*, or *profiling*, and all three categories of application are quite important for investigative data mining; one advantage of neural networks for prediction over statistical methods such as regression, is that neural networks can manage with a relatively small training sample<sup>12</sup>; "this makes them ideal in criminal detection situations because, for example, only a tiny percentage of most transactions are fraudulent" (Mena, 2003, p. 9). According to the kind of neural networks adopted, we may have *supervised learning* or *unsupervised learning*. Supervised learning is (Callan, 1999, p. 225)<sup>13</sup>:

A type of learning that can be applied when it is known to which class a training instance belongs. With supervised learning we know what the network should produce as output

<sup>&</sup>lt;sup>8</sup> *Pattern recognition* is "The creation of categories from input data using implicit or explicit data relationships. Similarities among some data exemplars are contrasted with dissimilarities across the data ensemble, and the concept of data class emerges. Due to the imprecise nature of the process, it is no surprise that statistics has played a major role in the basic principles of pattern recognition" (Principe, Euliano, & Lefebvre, 2000, p. 643).

<sup>&</sup>lt;sup>9</sup> *Genetic algorithms* (the subject of Section 6.1.16.1 in this book) are "Global search procedures, proposed by John Holland, that search the performance surface [as optimisation techniques are conceptualised as search in a multidimensional surface indeed], concentrating on the areas that provide better solutions. They use 'generations' of search points computed from the previous search points using the operators of crossover and mutation (hence the name)" (Principe et al., 2000, p. 642).

<sup>&</sup>lt;sup>10</sup> *Linear regression* is the process of fitting a cloud of samples by a linear model. The *fitting* is done by minimising the sum of the square of the deviations.

<sup>&</sup>lt;sup>11</sup> There exists many kinds of neural networks. For example, Principe et al. (2000) is a good textbook that comes along with a compact disk of computer simulations.

<sup>&</sup>lt;sup>12</sup> Of course, neural networks are now part of the standard curriculum of computer science. But Mena explains nicely how the basic properties of neural networks are useful for investigative data mining: "A key concept about working with neural networks is that they [unless they are selforganising maps] must be trained, just as a child or a pet must, because this type of software is really about remembering observations. If provided an adequate sample of fraud or other criminal observations, it will eventually be able to spot new instances or situations of similar crimes. Training involves exposing a set of examples of the transaction patterns to a nneural-network algorithms; often thousands of sessions are recycled until the neural network learns the pattern. As a neural network is trained, it gradually becomes skilled at recognizing the patterns criminal behavior and features of offenders; this is actually done through an adjustment of mathematical formulas that are continuously changing, gradually converging into a formula of weights that can be used to detect new criminal behavior or other criminals" (Mena, 2003, p. 10). This kind of neural networks can be used for clustering individuals with similar profiles, and as mena points out, neural networks were used (recognising kerosene) in arson investigations in California, and more in general "to detect and match the chromatographic signature of chemical components" (ibid.).

<sup>&</sup>lt;sup>13</sup> Apart from Callan (1999), other textbooks specifically devoted to *artificial neural networks* include, e.g., Zurada (1992).

#### 6.1 Methods

for each training instance. If the network does not produce the correct output then the learning algorithm uses this information to adjust the network (usually by adapting the weights).

• Unsupervised learning,<sup>14</sup> which can be done by resorting to various techniques, one of which is *in self-organising maps*<sup>15</sup>: these are a kind of neural networks that do not require training at all; they are useful for detecting clusters in a mass of data.<sup>16</sup> In investigative data mining, *unsupervised learning* techniques have been

In machine learning, unsupervised learning refers to the problem of trying to find hidden structure in unlabeled data. Since the examples given to the learner are unlabeled, there is no error or reward signal to evaluate a potential solution. This distinguishes unsupervised learning from supervised learning and reinforcement learning.

Unsupervised learning is closely related to the problem of *density estimation* in statistics. However unsupervised learning also encompasses many other techniques that seek to summarize and explain key features of the data. Many methods employed in unsupervised learning are based on data mining methods used to preprocess data.

Approaches to unsupervised learning include:

- clustering (e.g., k-means, mixture models, k-nearest neighbors, hierarchical clustering),
- blind signal separation using feature extraction techniques for dimensionality reduction (e.g., Principal component analysis, Independent component analysis, Non-negative matrix factorization, Singular value decomposition).

Among neural network models, the *self-organizing map* (SOM) and *adaptive resonance theory* (ART) are commonly used unsupervised learning algorithms. The SOM is a topographic organization in which nearby locations in the map represent inputs with similar properties. The ART model allows the number of clusters to vary with problem size and lets the user control the degree of similarity between members of the same clusters by means of a user-defined constant called the vigilance parameter. ART networks are also used for many pattern recognition tasks, such as automatic target recognition and seismic signal processing.

<sup>15</sup> *Self-organising maps* were introduced by Kohonen (1990). Unlike most neural networks, Kohonen maps don't need supervised training. That is to say, they don't need to be taught what the correct output is. A tasks they are usually made to perform is *clustering* (by measuring distance), whereas other kinds of neural networks are rather suitable for *classification*. In applications to crime detection, neural networks with supervised training are "used when a sample of cases, profiles, or crimes is available for training a network to recognize the patterns of criminal behavior. For example, an auction site such as eBay.com could use this type of network to detect the probability of criminal activity because it probably has in its servers records of transactions where fraud was perpetrated" (Mena, 2003, p. 162). Solan, Horn, Ruppin, and Edelman (2005) described unsupervised learning of natural languages.

<sup>16</sup> Robert Callan pointed out (1999, p. 133): "The first decision to make when choosing a network model is the type of model, and this is dependent on whether or not the classification of training data is known. For example, training a system to recognize customers with poor credit rating is likely to involve supervised learning because a financial lender will have a record of whether a debt from a past customer has been paid. Sometimes there is no information as to the class into

<sup>&</sup>lt;sup>14</sup> See Section 6.1.13.14 below. Unsupervised learning in neural networks is the subject of a paper collection edited by Geoffrey Hinton and Terrence Sejnowski (1999). Duda, Hart, and Stork (2001b) provide a discussion of unsupervised learning and clustering. A nice concise formulation is found in the Wikipedia entry (http://en.wikipedia.org/wiki/Unsupervised\_learning):

used for clustering analysis,<sup>17</sup> such as in the U.S. CATCH project (Computer Aided Tracking and Characterization of Homicides), and Birmingham's West Midlands Police application to modelling the behaviour of sex offenders, or then, to burglaries by offenders who gain access to premises by deception.<sup>18</sup>

• *Classification trees.* "Classification and regression trees are machine-learning methods for constructing prediction models from data. The models are obtained by recursively partitioning the data space and fitting a simple prediction model within each partition. As a result, the partitioning can be represented graphically as a decision tree.<sup>19</sup> Classification trees are designed for dependent variables that take a finite number of unordered values, with prediction error measured in terms of misclassification cost. Regression trees are for dependent variables that take continuous or ordered discrete values, with prediction error typically measured by the squared difference between the observed and predicted values" (Loh, 2011, p. 14). Wei-Yin Loh's paper (2011) is an overview of the subject.<sup>20</sup>

which data fall, and sometimes the classification is fuzzy. For instance, it is often difficult to give precisely the state of health of a machine such as a helicopter. Currently much effort is being devoted to monitoring the health condition of helicopters. On-board sensors log information which is later downloaded to a database on the ground for analysis. Assuming that a helicopter operates most of its time in a good state of health, the downloaded information can be analysed to see if it varies significantly from previous flights. If there is something different in the data then it might be time to examine the aircraft more closely to see if a fault exists. Cluster analysis is often used in such situations. The Kohonen self-organizing feature map is an unsupervised neural network that has much in common with statistical clustering."

<sup>&</sup>lt;sup>17</sup> Apart from traditional clustering techniques (see e.g. Kaufman & Rousseeuw, 2005), also consider approximate clustering, which is often appropriate for data mining, and includes *fuzzy clustering* (e.g., Joshi & Krishnapuram, 1998 for Web mining; and Feng & Chen, 2004 as used in image processing), and *rough clustering* (Lingras & Peters, 2011). These are respectively based on Lotfi Zadeh's *fuzzy set theory* (Zadeh, 1965) and Zdzislaw Pawlak's *rough set theory* (Pawlak, 1991). [Fuzzy approaches are the subject of Section 6.1.15 in thid book. Algorithms for rough set theory were presented by do Carmo Nicoletti and Quinteiro Uchõa (2001). Geng and Chan (2001) presented an algorithm for automatically generating a case base from a database by using similarity based rough approximation.] "Traditional clustering partitions a group of objects into a number of nonoverlapping sets based on a similarity measure. In real world, the boundaries of these sets or clusters may not be clearly defined. Some of the objects may be almost equidistant from the center of multiple clusters. Traditional set theory mandates that these objects be assigned to a single cluster. Rough set theory can be used to represent the overlapping clusters" (Lingras & Peters, 2011, p. 64). There also exists hybrid rough-fuzzy clustering (Maji & Pal, 2007; Mitra, Banka, & Pedrycz, 2006).

 $<sup>^{18}</sup>$  The latter project has been described concisely in the very first note of Section 6.1.1 above, based on Adderley and Musgrove (2003a, 2003b).

<sup>&</sup>lt;sup>19</sup> Lior Rokach and Oded Maimon's (2008) is the first book entirely dedicated to *decision trees* in *data mining*.

<sup>&</sup>lt;sup>20</sup> Tree-based methods such as decision trees or classification trees are popular in machine learning. Cf. Kothari and Dong (2002), Chen, Wang, and Zhang (2011). "Almost all classification tree construction algorithms such as ID3 [(Quinlan, 1986)], C4.5 [(Quinlan, 1993)], and CART [(Breiman, Friedman, Olshen, & Stone, 1984)] employ a top-down heuristic search using recursive partitioning because the enumeration of all  $2^n$  possible partitions is essentially intractable. Starting from a heterogeneous set (in terms of the variation in the class label or outcome variable)

• Other *machine-learning* techniques,<sup>21</sup> detecting patterns (segmenting and classifying the data according to a desired output), and yielding (for example) behavioural profiles of suspects.<sup>22</sup> Machine learning can be used "for extracting rules and decision trees from the data for predicting crimes and profiling

Let us say something more about *bagging*. "Bagging is a method for improving the predictive power of classifier learning systems. It forms a set of classifiers that are combined by voting, by generating replicated bootstrap samples of the data. Bagging produces replicate training sets by sampling with replacement from the training instances. The multiple classifiers are then combined by voting to form a composite classifier. In bagging, each component classifier has the same vote" (Stranieri & Zeleznikow, 2005b). Cf. fn 31 below. Another method is *boosting*. By contrast to bagging (ibid.): "Boosting improves the predictive power of classifier learning systems by adjusting the weights of training instances. It manipulates the training data in order to generate different classifiers. Boosting uses all instances at each repetition, but maintains a weight for each instance in the training set that reflects its importance; adjusting the weights causes the learner to focus on different instances and so leads to different classifiers. The multiple classifiers are then combined by voting to form a composite classifier."

<sup>21</sup> For machine learning, see e.g. Mitchell (1997). It is significant that in the subtitle of their book *Data Mining*, Witten and Frank (2000) singled out machine learning: *Practical Machine Learning Tools and Techniques with Java Implementations*.

<sup>22</sup> Marketers value, and the public sometimes resents another application of data mining: *personalisation*, resulting in potential customers being targeted with personalised promotion (making the right offer at the right time), suiting the profile generated about them from data provided willingly or unwittingly.

of training samples (root node), each feature (or predictor) is evaluated using a statistic to determine how well it classifies the training samples by itself. The best feature is selected to split the training samples to descendant nodes. The whole process is recursively repeated to split the descendant nodes until some prespecified stopping criteria are met. This search algorithm is greedy because it never backtracks to reconsider its previous choices. Usually, the tree-growing step is followed by a bottom-up pruning step, which removes unessential subree3 s to avoid overfitting. [...] The critical step in tree growing is to select the best feature to split a node." (Chen et al., 2011, pp. 55-56). Segal and Xiao remark (2011, p. 80): "Since the mid-1980s, tree-structured (or recursive partitioning) classification and regression methods have enjoyed widespread popularity. This followed the publication of the Classification and Regression Trees (CART) monograph [(Breiman et al., 1984)] that established a rigorous framework for such techniques, and convincingly illustrated one of their greatest virtues: interpretability. Tree-structured methods (TSM) produce interpretable prediction rules by subdividing data into subgroups that are homogenous with respect to both predictors and response. For continuous responses, as considered here, simple (terminal) subgroup summaries (typically means) serve as predictions. The interpretability of the attendant prediction rules derives from (1) the natural, recursive fashion by which predictors are employed in eliciting subgroups, (2) the accessibility of companion tree diagram schematics, and (3) the availability of predictor importance summaries. However, by the mid/late-1990s a serious deficiency of TSM was evident: modest predictive performance, especially in comparison with emerging, flexible competitors such as support vector machines (SVM) [on which, see in Sections 6.1.9.3, 6.2.1.3 and 8.7.3.1 in this book]. In a series of papers, Breiman developed a strategy for remedying this shortcoming: create an ensemble of trees, where each tree in the ensemble is grown in accordance with the realization of a random vector and obtain predictions by aggregating (voting) over the ensemble." In fact, Segal and Xiao's paper (2011) is about multivariate random forests. "Random forests seek to effect such correlation reduction [between the quantities being averaged] by a further injection of randomness. Instead of determining the optimal subdivision of a given subgroup of a (constituent) tree by evaluating all allowable partitions on all predictors, as is done with single-tree methods [as well as in a technique called] bagging [(Breiman, 1996)], a subset of the predictors drawn at random, is employed." (Segal & Xiao, 2011, p. 80).

perpetrators" (Mena, 2003, p. 220). With respect to ordinary computer programs, machine-learning algorithms offer the advantage of being able to improve their performance by acquiring experience at carrying out the task at hand, or to learn by being shown. Machine learning is most useful in order to automate a manual process, and in particular, this often is a process of searching. By questioning the data, machine-learning algorithms discover which attributes discriminate more, and are therefore more useful for classification. They are therefore useful for seg*menting a database*, by detecting key features or intervals. "Machine-learning software can segment a database into statistically significant clusters based on a desired output, such as the identifiable characteristics of suspected criminals or terrorists" (Mena, 2003, p. 11). An additional advantage of machine learning at detection, over the use of neural networks, is that whereas the latter's inner workings are hidden from the user (a black box), machine learning algorithms are more transparent: "they can generate graphical decision trees or IF/THEN rules, which an analyst can understand and use to gain important insight into the attributes of crimes and criminals" (ibid., p. 12). The branches of the decision tree each identify a cluster. Or then, the output may be IF/THEN rules, enabling (for example) an automated monitoring system to score individuals involved in transactions, and to issue (depending on the kind of circumstances) differently calibrated alerts.

• *Multiagent* technology<sup>23</sup> which enables to manage a society of autonomous *software agents*, themselves each comprising three basic abilities: communication skills, knowledge, and performing tasks. See Section 6.1.6 below.

#### Feature extraction is described nicely by Chaoji, Hoonlor, and Szymanski (2010):

Within the data mining community, the term *feature extraction* is commonly used for techniques that identify features relevant to the application at hand. Within this context, the term feature has been loosely used for attributes of data that can range, for instance, from keywords for text documents to principle eigenvectors<sup>24</sup> for high dimensional genetic data. Feature extraction is broadly considered to be composed of two sub-tasks — *feature construction* and *feature selection* [(Guyon & Elisseeff, 2003)], each addressing one of the two main challenges of the problem. The first challenge results from the presence of a large amount of noise in the data which results in construction of ineffective features. The second challenge results from the large number of features usually generated. The features are ranked based on optimality criteria — such as information gain, kernel<sup>25</sup> and novelty detection — and only the top-ranked features are used to avoid the curse of dimensionality and enhance generalization capabilities [(Evangelista, Embrechts, & Szymanski, 2006)].

<sup>&</sup>lt;sup>23</sup> A standard textbook is Wooldridge's (2002) An Introduction to Multiagent Systems.

<sup>&</sup>lt;sup>24</sup> For *eigenvectors*, see in fn 26 below.

<sup>&</sup>lt;sup>25</sup> S.v. *kernel methods*, Stranieri and Zeleznikow (2005a, Glossary) provide this definition (from the perspective of *machine learning*): "Kernel estimates smooth out the contribution of each observed data point over a local neighbourhood of the point. Nearest neighbour and locally weighted regression are approaches for approximating target functions. Learning involves storing the presented training data and when a new query instance is encountered, a set of similar related instances is retrieved from memory and used to classify the new query instance. The kernel function is the function of distance that is used to determine the weight of each training example.

The output of investigative data mining techniques may be obtained either on the initiative of the users, or then on the initiative of monitoring software, "data mining models which can issue alerts to security, law enforcement, and other regulatory personnel" (Mena, 2003, p. 8).

Mena's *Behavioral Forensics* has refined the conceptual classification and the terminology, by distinguishing (to say it with chapter headings in the table of contents) between "Extractive Forensics: Link Analysis and Text Mining", "Inductive Forensics: Clustering Incidents and Crimes", and "Deductive Forensics: Anticipating Attacks and Pre-Crime".<sup>26</sup>

Also *profiling* is deductive. This is *offender profiling*, also known as *criminal profiling*, or *psychological profiling*, or *criminal personality profiling*. It is based on past behaviours, and is carried out by criminal profilers in the employment of the police in order to identify suspects, as well as by forensic psychologists. Profiling, too, can usefully resort to pattern recognition techniques from data mining (Mena, 2003, p. 19). Profiling, however, must only be done downstream of the forensic analysis of all the available physical evidence. It is from the physical evidence that a criminal profiler can infer offender behaviour, victim characteristics (victimology), and crime-scene characteristics. It is quite important to profile the victims, too, not only the offenders. In his *Criminal Profiling: An Introduction to Behavioral Evidence Analysis*, Brent Turvey (1999) provided this definition: "A deductive criminal profile is a set of offender characteristics that are reasoned from the convergence of physical and behavioral-evidence patterns within a crime or a series of related crimes".

Apart from physical anthropology characteristics that the criminal profiler would try to guess out (age, body features, sometimes race), socio-cultural characteristics (marital status, occupation, living arrangements, communal or national background), props (vehicle driven), psychological traits (intelligence level, psychosexual maturity, motivating factors), personal past (arrest record), the profiler would also try to deduce provocation factors that may drive the suspect out, and which interrogation techniques are likely to work best with the suspect once apprehended. The profiler would also try to suggest appropriate interrogation techniques if the suspect is already in custody, or if the suspect was already identified and is about to be apprehended. Out of basic data features, several can be obtained with the help of demographic databases or demographic data providers. Mena (2003, pp. 20–22) identifies in such reliance on database what makes profiling a good application of data mining, and he further suggests that "the ideal profiling method is a hybrid of machine learning and human reasoning, domain experience, and expertise" (ibid., p. 21).

Whereas kernel methods define the degree of smoothing in terms of a kernel function and bandwidth, nearest neighbour methods let the data determine the bandwidth by defining it in terms of the number of nearest neighbours."

 $<sup>^{26}</sup>$  Appendix A in Mena (2003, pp. 379–414) provides an amazing wealth of addresses on the Web, of interest to the subject of his book. That appendix is entitled "1,000 Online Sources for the Investigative Data Miner".

# 6.1.2 Social Networks, and Link Analysis

#### 6.1.2.1 Social Networks and Their Visualisation

*Social network analysis* is a mathematical discipline applied to the social sciences, and it has its own forums, such as the journal *Social Networks*.<sup>27</sup> Social network analysis is the branch of sociology that deals with the quantitative evaluation of an individual's role in a group or community, by analysing the network of connections between that individual and others. The techniques of social network analysis are specifically designed to explore relational data (rather than attributive ones): the relational aspects of social structures. The discipline made its appearance in the mid-20th century, its mainstream being originally developed by sociometric analysts, by researchers from Harvard who modified some techniques of graph theory, and by anthropologists from Manchester who used these developments to investigate the structure of community relations.<sup>28</sup> Central concepts of social network analysis include: *centrality, density, components, cliques,* and *distances.* Sparrow (1991, pp. 264–265) listed and examined briefly six different notions of centrality<sup>29</sup> from the network analysis literature<sup>30</sup>:

<sup>&</sup>lt;sup>27</sup> On social network analysis (SNA), see, e.g., Breiger's overview (2004), Linton Freeman's fourvolume set (2007), Aggarwal (2011), Newman (2010), Scott (1991), Burt (1980), Newman (2003), Backstrom, Huttenlocher, Kleinberg, and Lan (2006), Kempe, Kleinberg, and Tardos (2003, 2005), and Lu, Korniss, and Szymanski (2009). Exploratory visualisation of social networks is the subject of, e.g., Brandes, Raab, and Wagner (2001), but within an application to decision-making research in a real-case study: they applied some SNA techniques for the study the patterns of decision making itself. They represented the process of decision making can be represented as the network of interactions between the actors involved in the process. This involved a mix of communication, policy network studies and status visualisation techniques. In their paper, Brandes et al. (2001) studied the privatisation, in East Germany, of the shipbuilding industry and of a major steel plant, EKO Stahl AG. Their aim was to find what kind of policy making structures evolved during the decision processes and how powerful are the actors' positions in these networks. Brandes et al. (2001) identified the actors who could make an impact on decisions on the privatisation in these cases, such as the European Commission, the federal ministries of finance and economics, parties within the state parliament, the board of directors and the supervisory board of the Treuhandanstalt, the local governments with enterprise sites, the metal workers' union, competitors in West Germany among others. Status visualisation was used in order to help to analyse the two types of ties which were identified as significant for policy making in these cases, namely "obligation of report" and "consideration of interest". I drew this example from a report by Popov (2003), from a project (WaterTime) in which I was involved myself (Nissan et al., 2004).

<sup>&</sup>lt;sup>28</sup> For the history of the discipline, see e.g. Linton Freeman's (2004) *The Development of Social Network Analysis: A Study in the Sociology of Science.* 

<sup>&</sup>lt;sup>29</sup> Concerning *centrality*, also see, e.g., Pfeiffer and Neville (2011).

 $<sup>^{30}</sup>$  For Sparrow's (1991) identification of which notions of centrality is applied in practice in link analysis diagrams used by crime analysis, see the text citing fn 210 towards the end of Section 6.2.5. Also see fn 61, towards the end of Section 6.1.2.3. On notions of centrality, cf. e.g. Freeman (2008).

- 1. *Degree*: the degree of a node in a social network is the number of other nodes to which it is directly linked, but if the graph is a directed network with arrows, then the degree is the number of paths coming from a node (rather than reaching the node).
- 2. *Betweenness*: "The 'betweenness' of a node is defined as the number of geodesics (shortest paths between two other nodes) which pass through it. It is a measure of how important any one node might be to effective communication within, or operation of, the network" (Sparrow, 1991, p. 264; cf. Freeman, 1979).
- 3. *Closeness*: "The concept of 'closeness' picks as central to a network the node which minimizes the maximum of the minimal path-lengths to other nodes in the network. That is, the central node becomes the node of minimum radius, where the radius of a node is defined as the longest of its shortest connecting paths to other nodes" (Sparrow, 1991, p. 264; cf. Freeman, 1979).
- 4. *Euclidean centrality after multidimensional scaling*: such centrality is apparent in two- or three-dimensional plots of the results of multidimensional scaling (cf. Kruskal & Wish, 1978).
- Point strength: "A node's 'point strength's is defined as the increase in the number of maximal connected network subcomponents upon removal of that node. So it is a measure of how much network fragmentation would be caused by removal of that node" (Sparrow, 1991, pp. 264–265; Cf. Capobianco & Molluzzo, 1979/1980).
- Business: the business of a node "is a measure of the local information content when the network is seen as a communication network" (Sparrow, 1991, p. 265).<sup>31</sup>

Sinai (2006) applied social network analysis to combating terrorism.<sup>32</sup> Schum (1987) discusses evidence and inference for the intelligence analyst. In criminal

<sup>&</sup>lt;sup>31</sup> This notion of the business of a node in a network was defined by Stephenson and Zelen (1989). Sparrow explains (1991, p. 265): "To obtain some precise numerical scale upon which to measure 'business', one can imagine all nodes firing (transmitting) along each of their links once per unit time. Choose some retransmission ratio (between zero and one), whereby every received transmission is retransmitted one period later but with some loss of intensity, by each node. Keep the system firing repeatedly until the total information content of each node and each link reaches equilibrium. This will occur asymptotycally and monotonically both for directed and undirected networks. Then measure each node's total transmission intensity per unit time. The equilibrium transmission intensities represent useful relative, but not absolute, indicators of 'how busy' each node might be."

<sup>&</sup>lt;sup>32</sup> It is interesting to note that social networks can be extracted that are not necessarily about real-life characters. Within computational linguistics, David Elson, Nicholas Dames, and Kathleen McKeown, all of them from Columbia University in New York, reported (Elson, Dames, & McKeown, 2010) about a project which resulted in a method for extracting social networks from literary fiction. Their application was to 19th-century British novels and serials. One of the novels is a story of murder in a rural setting, namely, the third edition of Thomas Hardy's *Tess of the d'Urbevilles* (1891). They also analysed the third edition of *Oliver Twist* by Charles Dickens (1837), which is of about a criminal gang; the first edition of Bram Stoker's *Dracula* (1897); and the first edition of Robert Stevenson's *The Strange Case of Dr. Jekyll and Mr. Hyde* (1987);

investigation, intelligence analysts oftentimes apply concepts from social networks, namely (Sparrow, 1991), criminal networks among individual suspects, gangs, bank accounts, and tools such as weapons and vehicles.

Sparrow (1991) discussed the application of social network analysis to criminal intelligence. In Sparrow's article, "Section 4 examines several network analytic concepts — for instance, centrality,<sup>33</sup> equivalence, strong and weak ties — and explores their application to law enforcement" (Sparrow, 1991, p. 253). Sparrow also remarked that as "criminal intelligence databases can be huge, with many thousands of nodes" (ibid., p. 261), this mandates the use of sparse matrix techniques in computation.<sup>34</sup> He also noted (ibid., p. 262) that because of the incompleteness of data on criminal networks, this requires the use of techniques for statistical inference from incomplete graphs (e.g., Frank, 1978; Friedkin, 1981). Criminal networks are

for all three novels, they categorised the setting as being urban. "We present a method to automatically construct a network based on dialogue interactions between characters in a novel. Our approach includes components for finding instances of quoted speech, attributing each quote to a character, and identifying when certain characters are in conversation. We then construct a network where characters are vertices and edges signify an amount of bilateral conversation between those characters, with edge weights corresponding to the frequency and length of their exchanges. In contrast to previous approaches to social network construction, ours relies on a novel combination of pattern-based detection, statistical methods, and adaptation of standard natural language tools for the literary genre. We carried out this work on a corpus of 60 nineteenth-century novels and serials, including 31 authors such as Dickens, Austen and Conan Doyle. In order to evaluate the literary claims in question, we compute various characteristics of the dialogue-based social network and stratify these results by categories such as the novel's setting. For example, the density of the network provides evidence about the cohesion of a large or small community, and cliques may indicate a social fragmentation. Our results surprisingly provide evidence that the majority of novels in this time period do not fit the suggestions provided by literary scholars, and we suggest an alternative explanation for our observations of differences across novels" (Elson et al., 2010, p. 138). In the visualisation produced by their software, those characters who loom large have their name enclosed in a large ellipse, whereas marginal characters appear in tiny ellipses. A shortcoming is that in order to read the name in the tiniest ellipse, I had to zoom to 800% in their paper's .pdf file in order to read the name 'Susan' in their figure 1, which shows the automatically extracted conversation network for Jane Austen's Mansfield Park.

<sup>&</sup>lt;sup>33</sup> While discussing how crime analysts used to draw the social networks of organised crime, he mentioned that, among the other things, they were aiming at "representing 'centrality' within the organization by 'centrality' on the chart" (Sparrow, 1991, p. 256). Buth whereas he found this pictorially reasonable, he also pointed out: "But it employs a most unsophisticated concept of centrality, namely the selection of the point or points of 'maximum degree' (those with the most established connections). Moreover the context in which it is applied makes the use of maximum degree potentially misleading: the determination of centrality will depend upon *who you know most about*, rather than *who is central or pivotal in any structural sense*. The danger in this practice is that it may incline an agency to pay closest attention to those it already knows most about, individuals who may not in fact be the principal characters. The practice may therefore serve to perpetuate unfortunate and misleading biases in the initial intelligence collection" (ibid.).

<sup>&</sup>lt;sup>34</sup> Writing around 1990, Sparrow pointed out: "Some network analysis algorithms do claim to be able to handle very sizeable networks. For example the NEGOPY program (Richards and Rice, 1981) claims to handle up to 30,000 links or so. But it contains an unfortunate reliance on a one-dimensional interim stage in the analysis of groups and cliques, which will inevitably render its results suspect when applied to networks of any complexity" (Sparrow, 1991, p. 262).

dynamic, not static. And their boundaries are fuzzy<sup>35</sup> (Sparrow, 1991, pp. 262–263), and "the fuzzy boundaries render precise global network measures (such as radius, diameter, even density) almost meaningless.<sup>36</sup> With the global measures go some, but not all, measures of centrality" (ibid., p. 263).

Brandes et al. (2001, section 1) remarked about the importance of *visualisation*, when researching social networks, since the early beginning of that discipline:

From the very beginning, visualization has been an essential tool in the analysis of social networks. In his groundbreaking work, Moreno (1953)<sup>37</sup> relied extensively on graphical representations, and there is hardly any mentioning of alternatives to visual analysis of sociometric data. In fact, he attributes the breakthrough of the sociometric movement to a

<sup>37</sup> Moreno's classic book *Who Shall Survive* was originally published in 1934 and later in 1953 and 1978. It is still considered a must for serious psychodrama students. This work was in the vanguard of sociology and social psychology as it developed prior to, during and following the Second World War. Jacob Levy Moreno (1889–1974) is considered to have been the father of psychodrama, sociometry, and group psychotherapy. René Marineau authored a biography of Moreno (Marineau, 1989). Moreno was born in Bucharest (the son of Moreno Nissim Levy, a merchant from Pleven, Bulgaria, where a plaque marks J. L. Moreno's ancestral home) and moved to Vienna as a child, where he became doctor of medicine. In his autobiography, Moreno claimed that while a medical student, in 1912, he told Sigmund Freud: "You meet people in the artificial setting of your office. I meet them on the street and in their homes, in their natural surroundings. You analyze their dreams. I give them the courage to dream again." He moved to the United States in 1925, and worked in New York, at Columbia University, and also at the New School of Social Research. "In 1932, Dr. Moreno first introduced group psychotherapy to the Americal Psychiatric Association. For the next 40 years he developed and introduced his Theory of Interpersonal Relations and tools for social sciences he called 'sociodrama', 'psychodrama', 'sociometry', and 'sociatry'. In his monograph entitled, 'The Future of Man's World', he describes how he developed these sciences to counteract 'the economic materialism of Marx, the psychological materialism of Freud, and the technological materialism' of our modern industrial age" (http://en.wikipedia.org/wiki/Jacob\_ L.\_Moreno). In the centennial year of Moreno's birth, 1989, the Journal of Group Psychotherapy, Psychodrama & Sociometry published its Vol. 42. Moreno's Invitations to an Encounter, of 1914, is considered to have been influential for Martin Buber's I-Thou philosophy. "Moreno is also widely credited as one of the founders of the discipline of social network analysis, the branch of sociology

 $<sup>^{35}</sup>$  *Fuzzy* in the ordinary lay sense, not in the sense of fuzzy set theory. Fuzzy logic is the subject of Section 6.1.15 in this book.

<sup>&</sup>lt;sup>36</sup> "Meaningless" as usually understood. Beside the points raised in the debate on probabilities in law, we may tentatively glean some insight from the following concept from discrete mathematics. Fred Roberts, a mathematician from Rutgers University who has specialised in applying discrete mathematics to social and biological systems, has defined *meanigless statements* as follows; I am quoting from a seminar abstract: "A statement involving scales of measurement is called *meaningless* if its truth or falsity can depend on the particular versions of scales that are used in the statement". He went on to "develop the mathematical foundations of a theory of measurement that will allow us to make the notion of meaningless statement precise", and to "give a variety of examples of meaningless statements. For example", he showed "that the conclusion that a given solution to a problem is optimal might be meaningless and in particular we will describe such results" from graph theory or operations research "for shortest path problems, for graph coloring problems arising from frequency assignments, and for scheduling problems". Roberts also considered "limitations (through functional equations) on the possible averaging functions which allow meaningful comparisons in different applications such as choosing new technologies, comparing the abilities of different groups of students, etc."

showing of sociometric charts at the 1933 convention of the Medical Society of the State of New York (Moreno, 1953, p. xiii).

While early network analysis was largely based on plausible, yet informal, concepts and qualitative data exploration, a wealth of formal concepts has been subsequently developed to provide quantitative empirical evidence for substantive research questions. For a comprehensive overview of such methods see Wasserman and Faust (1994); Scott (2000). Sadly, visualization techniques have not kept up with this progress in measurement, leading to a divergence of analysis and graphical presentation that can be traced through the history of social network visualization (Klovdahl, 1981; Brandes, Kenis, Raab, Schneider, & Wagner [1999]; Freeman, 2000a).<sup>38</sup>

Brandes et al. (ibid.) advocated the visualisation not only of connections within a social network, but also of quantitative data:

While today visualizations are used to present network data, quantitative results of network analyses are still typically given in tabular form. However, aggregate indices in general are insufficient to fully appreciate and understand the structural information contained in network data. In network analysis, it is therefore desirable to integrate graphical presentation of the actual network and results from quantitative analyses.

Brandes et al. (ibid.) also made a remark about there only being a minority of social networks that can be mapped onto a geographical representation<sup>39</sup>

Many types of networks are traditionally visualized using point-and-line representations (Bertin, 1983). Since few networks have an underlying spatial layout, their elements need to be positioned in some other meaningful way. While the tedious work of manually positioning the elements is out of the question even for small to medium-size networks, the primary design principle implemented in currently available software for automatic layout is clarity. That is, the focus is on readability rather than visual communication of substantive content.

In addition to the inherent difficulty of laying out an abstract network in a readable way (see Di Battista et al., 1999; Kaufmann and Wagner, 2001 for overviews of algorithms for the visualization of networks in general), there is also the issue of confidence. Who is going to comfortably draw conclusions from complex aggregate data, if it is difficult to relate them to the original network data and if it is unclear how much the drawing of the network leads to wrong impressions and succeedingly to wrong interpretations?

At any rate, it does matter that there exist such situations that visualisation could exploit the spatial layout of the social network.

Brandes et al. (2001, section 2) also stated:

Commonly used network visualization tools such as Pajek (Batagelj and Mrvar, 1998), KrackPlot (Krackhardt et al., 1994), or MultiNet (Richards, 1999) are designed to produce general purpose visualizations focusing on the ease of perceiving connectedness

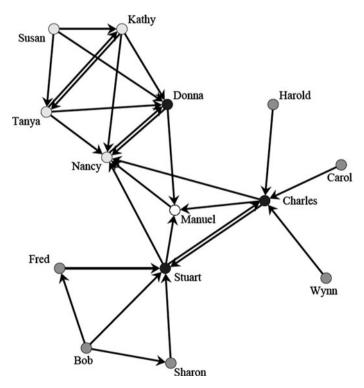
that deals with the quantitative evaluation of an individual's role in a group or community by analysis of the network of connections between them and others. His 1934 book *Who Shall Survive?* contains some of the earliest graphical depictions of social networks" (Wikipedia, ibid.).

<sup>&</sup>lt;sup>38</sup> Freeman (2000a) was published in an e-journal. Cf. Freeman (2000b, 2005, 2009).

<sup>&</sup>lt;sup>39</sup> Incidentally, Cornell University computer scientist Jon Kleinberg and his collaborators have published the paper 'Inferring Social Ties from Geographic Coincidences' (Crandall et al., 2010). Among the other things, Kleinberg has also published about *small-world* phenomena from an algorithmic perspective (Kleinberg, 2000a, 2000b, 2001, 2004, 2006).

information (i.e. the presence or absence of links between pairs of actors), or inherent symmetry. Node positions are typically determined using variants of the spring embedder (Eades, 1984), multidimensional scaling, or eigenvectors of network-related matrices such as the adjacency or Laplacian matrix. Pajek (Batagelj and Mrvar, 1998) provides the option to fix one or more dimensions of the layout space, e.g. by mapping one or more node indices to coordinates, but currently has no dedicated algorithm to produce readable visualizations given such constraints. Since the result of the status analysis cannot be taken into account with the common layout algorithms, status indices need to be represented by the size of nodes, by numerical labels, or separate from the drawing [see Fig. 6.1.2.1.1

Figure 6.1.2.1.1 shows the *Katz status index* for an example. (Among *central-ity measures*, it is called *Katz centrality*.) Let us say something about it. It was introduced, in the journal *Psychometrika*, by the Detroit-born statistician Leo Katz (1914–1976), who originally applied it to a popularity context (Katz, 1953). To determine individual status, Katz considered how many people chose the most popular individual (which was current in indexes in use at the time of his research),



**Fig. 6.1.2.1.1** A visualisation of an advice network (cf. Table 6.1.2.1.1), modified from figure 6 in Brandes et al. (2001),<sup>40</sup> where the nodes are coloured. It was obtained automatically. The type of the diagram is *stem-and-leaf*. The type of the network layout is *spring-embedder* 

<sup>&</sup>lt;sup>40</sup> The advice network in the figure is from an example made by David Krackhardt.

1.00	Nancy	(Secretary)
0.66	Donna	(Supervisor)
0.57	Manuel	(Manager)
0.19	Stuart	(Supervisor)
0.17	Charles	(Supervisor)
0.08	Kathy	(Secretary)
	Tanya	(Secretary)
0.02	Fred	(Auditor)
	Sharon	(Auditor)
0.00	Bob	(Auditor)
	Carol	(Auditor)
	Harold	(Auditor)
	Wynn	(Auditor)
	Susan	(Secretary)

Table 6.1.2.1.1Katz statusindex (based on figure 6 ofBrandes et al., 2001)

as well as (and this was novel) who is doing the choosing. Katz defined a matrix, **X**, whose column sums pertain to how many people choose the given individual. This is the *sociomatrix*, i.e., the *adjacency matrix* of the network under consideration. Katz noted that the elements of the powers of the sociomatrix, given by **X**<sup>*p*</sup>, provide the number of directed walks in the graph of length *p* from *i* to *j*. Katz (ibid., p. 40) noted that this equates to the indirect *p*-step choices (with p > 1) of a given individual by the group.<sup>41</sup> Katz assumed that longer walks inside a graph are less effective than shorter ones, and therefore he introduced an attenuation factor  $\alpha$ , where  $0 \le \alpha \le 1$ . There is a criterion of choice of this attenuation factor.<sup>42</sup> His objective was to find the column sums of the matrix, as follows:

<sup>&</sup>lt;sup>41</sup> To account for all possible walks, one raises the sociomatrix to the power of infinity.

<sup>&</sup>lt;sup>42</sup> In the jargon of *matrix* operations, one can say that the value of the attenuation factor  $\alpha$  has to be chosen such that it is smaller than the reciprocal of the absolute value of the largest *eigenvalue* of the adjacency matrix of the network under consideration. Let us explain eigenvalue. Consider a square matrix, i.e., an array with as many columns as its rows. A vector is a matrix with only one column, or only one row. The *eigenvectors* of a square matrix are those non-zero vectors that, after being multiplied by that square matrix, at most only have their *magnitude* (their numeric value, their length when drawn as an arrow) modified, but not their direction (when interpreting vectors in the sense of having a magnitude, a direction, and either sense). For each eigenvector, its eigenvalue is the factor (a scalar: just a number) by which the eigenvector changes when multiplied by the matrix. Let  $\mathbf{X}$  be the square matrix. Then a non-zero vector  $\mathbf{v}$  is an eigenvector of  $\mathbf{X}$  if there is a scalar  $\lambda$  such that  $\mathbf{X} \cdot \mathbf{v} = \lambda \cdot \mathbf{v}$  We say that the scalar  $\lambda$  is the eigenvalue of  $\mathbf{Z}$  corresponding to v. If we draw the vector  $\mathbf{v}$  in the plane of the perpendicular horizonatal axis and vertical axis (i.e., in Cartesian coordinates), we can see that matrix X acts by stretching the vector v, not changing its direction, so v is an eigenvector of X. The usual tabulation of a matrix or a vector is interpreted in n dimensions, instead of just two dimensions. A vector written as a column of n numerical values has to be imagined as drawn in a space of n dimensions, and a square matrix of n rows and ncolumns also has *n* dimensions. Here is an example from Wikipedia (http://en.wikipedia.org/wiki/ Eigenvalues\_and\_eigenvectors). Let the matrix be called *A* and let it be as follows:

#### 6.1 Methods

$$\mathbf{T} = \alpha \mathbf{C} + \alpha^2 \mathbf{C}^2 + \alpha^3 \mathbf{C}^3 + \dots + \alpha^k \mathbf{C}^k + \dots$$

In order to avoid the computation of matrix powers, Katz resorted to the *geometric series*, that is to say:

Then the vector 
$$X = \begin{bmatrix} 3 \\ -3 \end{bmatrix}$$
 is an eigenvector with eigenvalue 1. Indeed,  
$$A\mathbf{x} = \begin{bmatrix} 2 & 1 \\ 1 & 2 \end{bmatrix} \begin{bmatrix} 3 \\ -3 \end{bmatrix} = \begin{bmatrix} 2 \cdot 3 + 1 \cdot (-3) \\ 1 \cdot 3 + 2 \cdot (-3) \end{bmatrix} = \begin{bmatrix} 3 \\ -3 \end{bmatrix} = 1 \cdot \begin{bmatrix} 3 \\ -3 \end{bmatrix}.$$

Now, consider that the adjacency matrix of a graph is a square matrix. The eigenvalue of a graph is the eigenvalue of its adjacency matrix. In fact, one also speaks of *eigenvalues of a matrix*. Let I be the  $n \times n$  *identity matrix*, that is to say, a square matrix in which all values are zeroes, except a diagonal of ones. By det, one means the *determinant* of a matrix. The eigenvalues of the matrix *A* are the solutions  $\lambda$  of the equation det  $(A - \lambda I) = 0$  This equation is called the *characteristic equation* of *A*. Suppose that *A* is the following *diagonal matrix*:

$$A = \begin{bmatrix} a_{1,1} & 0 & \cdots & 0 \\ 0 & a_{2,2} & \cdots & 0 \\ \vdots & \vdots & \ddots & 0 \\ 0 & 0 & 0 & a_{n,n} \end{bmatrix}$$

then the characteristic equation reads

$$\det(A - \lambda I) = \det \begin{bmatrix} a_{1,1} & 0 & \cdots & 0 \\ 0 & a_{2,2} & \cdots & 0 \\ \vdots & \vdots & \ddots & 0 \\ 0 & 0 & 0 & a_{n,n} \end{bmatrix} - \lambda \begin{bmatrix} 1 & 0 & \cdots & 0 \\ 0 & 1 & \cdots & 0 \\ \vdots & \vdots & \ddots & 0 \\ 0 & 0 & 0 & 1 \end{bmatrix}$$
$$= \det \begin{bmatrix} a_{1,1} - \lambda & 0 & \cdots & 0 \\ 0 & a_{2,2} - \lambda & \cdots & 0 \\ \vdots & \vdots & \ddots & 0 \\ 0 & 0 & 0 & a_{n,n} - \lambda \end{bmatrix}$$
$$= (a_{1,1} - \lambda)(a_{2,2} - \lambda) \cdots (a_{n,n} - \lambda) = 0$$

The solutions to this equation are the eigenvalues  $\lambda_i = a_{i,i}$  (i = 1, ..., n). The *determinant* det(**A**) or |**A**| of a square matrix **A** is a number encoding certain properties of the matrix. A matrix is invertible if and only if its determinant is nonzero. Its *absolute value* (i.e., regardless of sign) equals the area (in **R**<sup>2</sup>, that is to say, the space in two dimensions of all real numbers) or volume (in **R**<sup>3</sup>, that is to say, the space in three dimensions of all real numbers) "of the image of the unit square (or cube), while its sign corresponds to the orientation of the corresponding linear map: the determinant is positive if and only if the orientation is preserved. The determinant of 2-by-2 matrices is given by

$$\det \begin{pmatrix} a & b \\ c & d \end{pmatrix} = ad - bc.$$

When the determinant is equal to one, then the matrix represents an equi-areal mapping. The determinant of 3-by-3 matrices involves 6 terms (*rule of Sarrus*). The more lengthy *Leibniz formula* generalises these two formulae to all dimensions." This quotation concerning determinants is from http://en.wikipedia.org/wiki/Matrix\_(mathematics) 6 Accounting for Social, Spatial, and Textual Interconnections

$$\sum_{k=1}^{\infty} r^k = \frac{r}{1-r} \,\,, \ \, r < 1$$

Katz substituted  $r = \alpha C$  and from the previous two equations, he obtained

502

$$\mathbf{T} = (\mathbf{I} - \alpha \mathbf{C})^{-1} - \mathbf{I}$$

The conventional status index in use before the Katz status index divides the column sums by (n-1), but Katz (1953, p. 42) divided the column sums of **T** by a value, *m*, reflecting the underlying technique adopted by Katz, and given by

$$m \cong (n-1)! \alpha^{(n-1)} e^{1/\alpha}$$

See the graph Fig. 6.1.2.1.2 and the corresponding choice matrix in Table 6.1.2.1.2. This was the example originally used by Katz (1953, p. 40). For the six actors A to F, one element corresponds to the original status vector

$$\mathbf{s} = [0.4 \ 0.2 \ 0.2 \ 0.6 \ 0.2 \ 0.8]$$

Nodes F, D, and A (in descending order) are the actors with high in-degree. With regards to status, they dominate. By contrast, if we use Katz's measure of the status index, and we use as multiplier  $\alpha = 0.5$ , Katz's status vector is

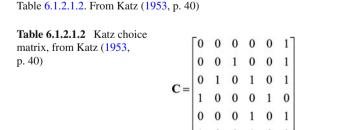
$$\mathbf{s} = [0.47 \ 0.04 \ 0.04 \ 0.41 \ 0.22 \ 0.45].$$

Fig. 6.1.2.1.2 The digraph (i.e., directed graph) associated with the Katz choice matrix of

0 0 1 0 0

С

Е



Based on this status vector, actor A scores slightly higher than F, even though the in-degree of A is relatively low. Nevertheless, A dominates, because A was chosen by F and D, both of the actors with the highest in-degree.

A team in Seoul (Phuoc, Kim, Lee, & Kim, 2009), interested in a good ranking system for World Wide Web search engines, compared the Katz status index, an old model, to *PageRank*, which ranks webpages (Brin & Page, 1998; cf. Altman & Tenneholtz, 2005). PageRank was apparently names after one of its proponents, Larry Page. The patent was assigned to Stanford University. The algorithm is used by Google. Its mathematics is explained nicely on Wikipedia.<sup>43</sup> The theory behind PageRank is based on the assumption of a *damping factor*, and in this it resembles the Katz status index. In fact<sup>44</sup>:

The PageRank theory holds that even an imaginary surfer who is randomly clicking on links will eventually stop clicking. The probability, at any step, that the person will continue is a damping factor *d*. Various studies have tested different damping factors, but it is generally assumed that the damping factor will be set around 0.85.

The damping factor is subtracted from 1 (and in some variations of the algorithm, the result is divided by the number of documents (N) in the collection) and this term is then added to the product of the damping factor and the sum of the incoming PageRank scores.

The formula for the PageRank of node A while accounting for damping can be written as follows, based on the sum of the incoming PageRanks:

$$PR(A) = \frac{1-d}{N} + d\left(\frac{PR(B)}{L(B)} + \frac{PR(C)}{L(C)} + \frac{PR(D)}{L(D)} + \cdots\right).$$

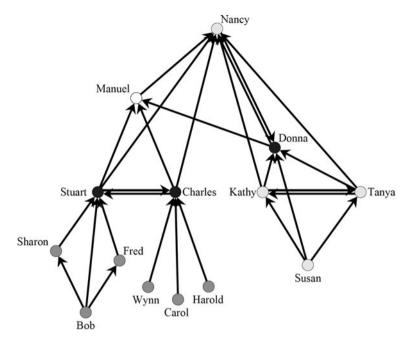
L(B) is the normalised number of outbound links of node B.

Brandes et al. (2001, section 2) went on to criticise their own figure 6, of which our Fig. 6.1.2.1.1 is a modification:

Though the network diagram is very readable, it does not convey the interesting substantive information. Moreover, its design is inherently undirected (the picture would be the same even if some or all of the edge directions were reversed), and it is next to impossible to relate the status scores to the picture. Assume, for instance, we swap the status scores of Nancy and Manuel; the visualization would not provide any indication that something was wrong. This is in stark contrast to empirical evidence suggesting that network layout not only affects the ease of reading (Purchase et al., 1997), but has an influence on the understanding and interpretation of substantive content as well (McGrath et al., 1997). Consequently, Krackhardt (1996, p. 166) arranged the actors so that most nominations point in an upward direction, thus creating an informal advice hierarchy that yields an implicit notion of status [see Fig. 6.1.2.1.3].

<sup>43</sup> http://en.wikipedia.org/wiki/PageRank

<sup>&</sup>lt;sup>44</sup> From Section "Damping Factor" in http://en.wikipedia.org/wiki/PageRank (accessed in May 2011).



**Fig. 6.1.2.1.3** A visualisation of an advice network (cf. Table 6.1.2.1.1 and Fig. 6.1.2.1.1), so arranged that most nominations are upward.<sup>45</sup> Modified from figure 7 in Brandes et al. (2001), itself an adaptation from Krackhardt (1996, p. 166). The arrangement is manual, as opposed to the automatically generated Fig. 6.1.2.1.1

#### 6.1.2.2 Link Analysis

In Section 6.1.2.1, we considered *social network analysis*. Social network analysis has been applied, among the other things, to organised crime. United States Air Force's Major Jonathan T. Hamill has discussed (2006) a Ph.D. dissertation at the Air Force Institute of Technology in Ohio, *Analysis of Layered Social Networks*, in which section 2.3 (ibid., pp. 40–60) is "The Psychology of Terrorists", application to counterterrorism being the motivation for the project. Hamill's thesis is concerned with prevention of near-term terrorist attacks:

<sup>&</sup>lt;sup>45</sup> "Though it works fine in this particular example, note that the above rule for vertical arrangement is error-prone in general, since the requirement of a maximum number of upward oriented connections may result in misleading visual explanations. A simple example of this kind is a network of actors whose connections form a directed cycle. Any one connection can be chosen as the single downward oriented one, but each choice results in a different vertical ordering of the actors" (Brandes et al., 2001). "Interpretation of relative status becomes unreliable, if not impossible, in visualizations based on a maximum number of upward pointing arcs, and only one notion of status is supported." (ibid.). Brandes et al. (2001) discussed shortcomings of various algorithmic solutions when organising a graph for visualisation, and proposed remedies for them.

To aid in this understanding, operations research,<sup>46</sup> sociological, and behavioral theory relevant to the study of social networks are applied, thereby providing theoretical foundations for new and useful methodologies to analyze non-cooperative organizations. Such organizations are defined as those trying to hide their structures or are unwilling to provide information regarding their operations; examples include criminal networks, secret societies, and, most importantly, clandestine terrorist organizations.

More generally, wherever individuals are organised, we can map their links by making their social network explicit, for example in order to better realise which advantage (i.e., which *social capital*) the individual derives from the network:

In its simplest form, a social network is a map of specified ties, such as friendship, between the nodes being studied. The nodes to which an individual is thus connected are the *social contacts* of that individual. The network can also be used to measure *social capital* — the value that an individual gets from the social network. These concepts are often displayed in a social network diagram, where nodes are the points and ties are the lines.<sup>47</sup>

In the present Section 6.1.2.2, we consider *link analysis*, a technique which has become quite important for crime intelligence and crime investigation. Whereas link analysis is not to be confused with social network analysis (the two followed, in the respective research literature, different historical trajectories), they have come together: link analysis can benefit from social network analysis, borrowing from the latter, and applying, this or that formal device. Users watching on the screen the results returned by link analysis tools will see those results, not the mathematics of the underlying concepts from social network analysis, if these are borrowed indeed.

*Link analysis* is an interactive technique, visualising – in charts or maps or diagrams – networks of *entity-to-event* associations (e.g., tying a victim to a crime), as well as *entity-to-entity* (e.g., blood relative, or spouse, or place of birth, or owner of a firm), and *event-to-event* (e.g., tying emails to each other).<sup>48</sup> "Link analysis is the process of building up networks of interconnected objects or items over time and the use of special techniques and software tools for forming, examining, modifying, analyzing, searching, and displaying these patterns of behavior, especially for the investigative data miner" (Mena, 2003, p. 80).

Harper and Harris (1975) described, in the *Human Factors* journal, a link analysis technique, using graph and matrix representations. The early beginnings of the techniques were unrelated to the processing capabilities made available by information technology. Nor were such early applications of link analysis as reported, to crime investigations; rather, they were applications in the general discipline of *human factors* (Harper & Harris, 1975, p. 158):

<sup>&</sup>lt;sup>46</sup> *Operations research* is the branch of mathematics concerned with techniques of optimisation. Also some methods from artificial intelligence are concerned with heuristic optimisation (*heuristic*, as what is found is not guaranteed to be the global optimum).

<sup>&</sup>lt;sup>47</sup> Quoted from http://en.wikipedia.org/wiki/Social\_network

<sup>&</sup>lt;sup>48</sup> "Links, as well as nodes, may have attributes specific to the domain or relevant to the method of collection. For example, link attributes might indicate the certainty or strength of a realtionship, the dollar value of a transaction, or the probability of an infection" (Mena, 2003, p. 83).

Link analysis has proven to be a useful tool in human factors research and engineering. Probably the earliest formal application of the technique was by Gilbreth and Gilbreth (1917) who evolved a system for machine shop layout based upon distances traveled during assembly operations. Fitts, Jones, and Milton (1950) employed link analysis methods to study the eye movements of aircraft pilots during instrument landing approaches. Channell and Tolcott (1954) used the method to define and rank communication links in a Navy command and control system. Haygood, Teel, and Greening (1964) used a computer-based link analysis technique to resolve conflicts in equipment placement. Harris and Chaney (1969) employed link analysis as an aid to evaluate the design of complex electronic test equipment. Chapanis (1969), McCormick (1964), and Van Cott and Kinkade (1972) all describe the use of link analysis in their human factors reference books.

When used by law enforcement agencies, link analysis makes it easier for human users to grasp the social networks of suspected offenders.<sup>49</sup> "Link analysis is the first level by which networks of people, places, organizations, vehicles, bank accounts, telephone numbers, e-mail addresses, and other tangible entities can be discovered, linked, assembled, examined, detected, and analyzed" (Mena, 2003, p. 75).

Harper and Harris remarked (1975, pp. 158–159):

In applying link analysis to the organized crime problem, the focus is on determining the presence or absence of links among individuals. The data base usually consists of information in a variety of formats and types: investigation reports, arrest records, informant reports, surveillance reports, telephone toll-call records, financial statements, newspaper articles, and public records of many kinds. From the intelligence analyst's point of view, the strength of a link between two individuals is a matter of degree, depending upon the content and completeness of available information. At least three categories of links are needed in the application of link analysis to criminal intelligence: STRONG LINKS, WEAK LINKS, AND NO LINKS. An example of a strong link would be the link between a father and son observed frequently together. A weak link is considered as a relationship that is suspected but unconfirmed, or requires some inferential judgment. An example of a weak link would be a link established on the basis of frequent telephone calls made by an individual to a motel operated by a suspected crime figure.

By 2003, Mena was able to note: "Link analysis is already used to detect fraud by specialists in the insurance and telecom industries, as well as in the area of e-commerce" (Mena, 2003, p. 76). Some link analysis tools have "the capability of incorporating multimedia and some interactive *what-if* scenarios" (ibid.).<sup>50</sup>

<sup>&</sup>lt;sup>49</sup> New ways of making or superposing diagrams, in the kid 19th century, were intended to help human experts in inferring connections: "Cholera was a forcing ground for new modes of data presentation, as in this chart correlating cholera and diarrhea deaths with meteorological variables. It was hoped that novel presentations may suggest inferences that would not have been apparent otherwise" (Hamlin, 2009, p. 157, caption of figure 9). There was no correlation, between the 1848 epidemic in England and weather conditions, and we can say that much at present even just looking at the superposed diagrams in that chart.

<sup>&</sup>lt;sup>50</sup> Mena (2003) also notes difficulties: "Link analysis is a very labor-intensive method of data mining" (ibid., p. 85). "While these visual-link networks have proven useful to investigators, their manual construction has proven difficult when it involves hundred of thousands of transactions" (ibid., p. 76). "As with all data mining projects, extracting and preparing the data for analysis is commonly a major task. Transactional databases more often than not contain incomplete or inconsistent information, or multiple instances of the same entities because they are designed and

"Knowing and working at the right level of granularity is a very important part of preparing the data for link analysis" (ibid., p. 78). Link analysis is specialised per application. For example, *call detail records* (who is calling whom, and when) are analysed (this is called *dialed-digit analysis*) in order to fight wireless fraud, an application for which link analysis is also used in different manners (ibid., pp. 78–79). Another application is for counter-drug analysts (ibid., pp. 80–82). Mena noted (ibid., p. 5):

Link-analysis technology has been used in the past to identify and track money-laundering transactions by the U.S. Department of the Treasury, Financial Crimes Enforcement Network (FinCEN). Link analysis often explores associations among large numbers of objects of different types. For example, an antiterrorist application might examine relationships among suspects, including their home addresses, hotels they stayed in, wire transfers they received and sent, truck or flight schools attended, and the telephone numbers that they called during a specified period. The ability of link analysis to represent relationships and associations among objects of different types has proven crucial in helping human investigators comprehend complex webs of evidence and draw conclusions that are not apparent from any single piece of information.

There is a problem of glut, when using link analysis as opposed to other methods of data mining: "Link analysis works best in situations where there is a limited number of observations, such as events (meetings) and entities (suspects). Its functionality begins to deteriorate once a large number of observations or transactions begins to populate a case file" (Mena, 2003, p. 86). This is because of the limited human ability to grasp what is being perceived, and link analysis, being a visualisation technique, is a help for perception, and less than helpful when it overloads it.

Link analysis is not suited for handling a mass of data based on aggregate statistical characteristics, something for which *neural networks* and *machine learning* are suited for instead. Besides, the latter two approaches construct predictive models: networks, for them, are a *model representation*, whereas for link analysis instead, networks are a *data representation* (ibid., p. 88).

It is possible however for a tool to combine link analysis with neural networks. The latter is resorted to, in order to detect trends hidden in data, by the *Trend Hunter* utility of the ATAC criminal analysis tool.<sup>51</sup> An advantage of ATAC is its wide interoperability. Mena (2003, section 3.11, pp. 88–104) enumerated and described various link analysis tools. Mena discussed at length and in detail instead the popular *Analyst's Notebook*.<sup>52</sup>

built for speed not analysis", but: "In order to map associations correctly it is necessary to first identify accurately the right individual in a database" (ibid., p. 77). *Consolidation* and *disambiguation* of transactions or individuals are necessary operations in data preparation for the purposes of link analysis (ibid., p. 78). We may add that worldwide, mistakes of identity have sometimes caused individuals to be denied credit, to be denied a job or even to lose their job (because of postings on the Web that the employer disliked), or to end up in prison – and this because of manual misidentification, apparently not involving link analysis.

<sup>&</sup>lt;sup>51</sup> See http://www.bairsoftware.com/atac.htm The acronym ATAC is short for Automated Tactical Analysis of Crime.

<sup>&</sup>lt;sup>52</sup> http://www.i2.co.uk/home.html The British firm, i2, had their software adopted by the FBI.

## 6.1.2.3 Link Analysis Tools for Criminal Investigation

A team at the University of Arizona in Tucson, whose members were Yang Xiang, Michael Chaub, Homa Atabakhsha, and Hsinchun Chen, described a project in the visualisation of criminal relationships (Xiang, Chau, Atabakhsh, & Chen, 2005). In their prototype system, called COPLINK Criminal Relationship Visualizer, they resorted to a hyperbolic tree view and a hierarchical list view. We are going to consider Coplink in some detail in Section 6.2.5. The visualisation tool from Xiang et al. (2005) is but an example from a class of tools. Xu and Chen (2004), also in Tucson, Arizona, proposed a technique for effective link analysis, resorting to "shortest-path algorithms,<sup>53</sup> priority-first-search (PFS)<sup>54</sup> and two-tree PFS, to identify the strongest association paths between entities in a criminal network" (ibid., p. 473). They remarked: "Efficiency of the two-tree PFS was better for a small, dense kidnapping network, and the PFS was better for the large, sparse narcotics network" (ibid.).

Mena (2003, section 3.11, pp. 88–104) described at some length such link analysis tools that are specifically tailored for assisting in criminal investigation. *Crime Workbench* is an intelligence management software product for criminal and fraud investigation;<sup>55</sup> there is a scaled down version, Crime Workbench Web, accessible from everywhere, and "amend at the intelligence analyst and law enforcement investigator on the move" (ibid., p. 100). *Daisy* is a link analysis too supporting a circular layout of nodes: these are connected by lines inside the circle, and are possibly surmounted by histograms outside the circle.<sup>56</sup> By contrast, the main layout of displays generated by NETMAP – a link analysis tool<sup>57</sup> used by several government agencies in the United States – are a wagonwheel format, while also supporting other layouts.

Mena noted that a unique feature of another tool, *Crime Link*,<sup>58</sup> "is its ability to generate a two-dimensional association matrix that basically shows *who knows* 

<sup>&</sup>lt;sup>53</sup> Shortest-path algorithms are a class within graph search algorithms. Shortest-path algorithms can identify the optimal paths between nodes in a graph, by examining link weights. Criminal networks in turn are represented as a graph.

<sup>&</sup>lt;sup>54</sup> The priority-first-search algorithm "works by maintaining a shortest-path tree T rooted at a source node *s*. *T* contains nodes whose shortest distances from s are already known. Each node *u* in *T* has a parent, which is represented by  $p_u$ . A set of labels,  $d_u$ , is used to record the distances from the node *u* to *s*. Initially, *T* contains only *s*. At each step, we select from the candidate set *Q* a node with the minimum distance to *s* and add this node to *T*. Once *T* includes all nodes in the graph, the shortest paths from the source node *s* to all the other nodes have been found. PFS differs from the Dijkstra algorithm because it uses an efficient priority queue for the candidate set *Q*. With modifications, PFS can be used to compute the shortest paths from a single source node to a set of specified nodes in the graph." (Xu & Chen, 2004, p. 479).

<sup>&</sup>lt;sup>55</sup> http://www.memex.com/cwbover.html

<sup>&</sup>lt;sup>56</sup> Mena (2003, pp. 100–101). See http://www.daisy.co.uk/daisy.html

<sup>&</sup>lt;sup>57</sup> http://www.altaanalytics/com/ MAPLING is discussed by Mena (2003) on pp. 101–102 and, as applied to money laundering investigations, on pp. 84–85.

<sup>58</sup> http://www.crimelink.com/

whom, who has done what, who has been where, etc." (ibid., p. 97). This is a triangular table, with one-line textual explanations (such as personal names, with their variants) shown perpendicularly to its diagonal, thus identifying the rows columns of the matrix. Those personal names are preceded by a bullet, if the row or column includes a bullet in at least one case. This enables to see who knows whom.

The *ORIONInvestigations* criminal data organiser can be integrated with the *ORIONLink* link analysis tool.<sup>59</sup> "A special feature of *ORIONLink* is its *what-if* mode, which allows objects and their connections to be hidden or restored on the fly, allowing for the viewing of their impact on the total organization, such as a terrorist cell or criminal gang" (Mena, 2003, p. 103).

Besides, Mena (ibid., p. 104) illustrates various possible applications (to money laundering investigations, to drug investigation, to insurance fraud investigations: there are further possibilities) of the *VisuaLink* link analysis software suite,<sup>60</sup> specifically devised for law enforcement users, and which comprises various data preparation components.

Harper and Harris (1975, p. 159) explained:

The link analysis procedure centers round the production of an association matrix and a link diagram. The association matrix provides an array. of the relationships among any set of individuals; the notation in any cell of the matrix indicates the nature of the link — strong, weak, or none — between two individuals. The link diagram, the end product of the analysis, presents a graphic illustration of the relationships among the set of individuals. If some of the individuals are members of identifiable organizations, these organizations can also be incorporated into the diagram. The analysis is completed by [a] six-step approach.

The association matrix is triangular, and the same names identify the rows and the columns. The six steps were:

- 1. Assemble the available information;
- 2. Abstract information relevant to individual relationships and affiliations;
- 3. Prepare an association matrix,
- 4. Develop a preliminary link diagram;
- 5. Incorporate organizations in the diagram;
- 6. Refine the link diagram.

This was what Harper and Harris (1975) propose, and by the 2000s, software tools are also providing some more sophisticated functions. Nevertheless, basically computer tools for link analysis in criminal investigation are still organised according to that old template.

When they published their article, Walter Harper and Douglas Harris were affiliated with Anacapa Sciences, Inc., in Santa Barbara, California. Malcolm Sparrow remarked (1991, p. 254):

<sup>&</sup>lt;sup>59</sup> http://www.oriosci.com/productinfo/Magic.html. These ORION tools are discussed in Mena (2003, pp. 102–103).

<sup>60</sup> http://www.visualanalytics.com/

Use of the Anacapa charting system, as developed by Anacapa Sciences Inc., Santa Barbara, California, is currently the predominant form of network analysis within law enforcement. It is used particularly frequently within major fraud investigations and by Organized Crime Squads, where understanding of large and sometimes sophisticated criminal enterprises is required.

Anacapa charts constitute a two-dimensional visual representation of link data (see Harper and Harris, 1975; Howlett, 1980; Klovdahl, 1981; Coady, 1985). They provide a method of making visual sense of a mass of data. They are also an extremely useful tool for communicating the results of analysis (and thus are used as briefing aids as well as aids for analysis). Anacapa charts generally depict individuals by small circles, and relationships by lines (solid or dotted according to whether the relationship is confirmed or unconfirmed). The charts may also show rectangles enclosing one or more individuals as a method of representing membership of corporations or institutions. They clearly show who is central, who is peripheral, and visually reveal chains of links connecting one individual to another. To a network analyst they look like typical network diagrams.<sup>61</sup>

Already in the mid-1980s, the FBI was working on the *Big Floyd* prototype (Bayse & Morris, 1987). Its application was to *template matching*, "a process which helps the analyst to determine whether or not a particular type of crime is likely to have been committed, or whether a particular pattern of criminal relationships is in existence" (Sparrow, 1991, pp. 258–259). Big Floyd used to perform (ibid., p. 259)

the regular functions of storage and retrieval of link data, encompassing links of many different specified types. It does an excellent job of facilitating the interaction between investigator and the visually displayed network, or selected subgraphs from it. It also has first class facilities to enable the investigator to re-order and interrogate the database.

Significantly "Big Floyd" also introduces a new dimension of analysis — namely the notion of template matching. Essentially, ingredients of a criminal network are superimposed on a model template for particular kinds of deduction (example "Smith is probably guilty of embezzlement"). The template is the encapsulation of an expert investigator's accumulated experience and knowledge about a particular type of offence. If the appropriate combination of linkages exist, the deduction is probably "true". The inferential system is used as a component of an Artificial Intelligence system for investigation of organized crime activities.

<sup>&</sup>lt;sup>61</sup> We have seen in Section 6.1.2.1 that Sparrow (1991) listed six different concepts of network centrality, namely: *degree; betweenness; closeness; Euclidean centrality after multidimensional scaling; point strength*; and *business*. The boundaries of a criminal web are fuzzy, and Sparrow (1991) remarked: "The third and fourth (Closeness and Euclidean Centrality) become quite arbitrary if the network has arbitrary or fuzzy boundaries. But, in fact, Euclidean Centrality is probably closest to the reality of the Anacapa chart — where centrality on the chart equates with Euclidean centrality after a manual version of two-dimensional scaling — even though the practical determination of the starting (central) node was initially by its Degree" (ibid., p. 265). Moreover: "On balance it appears that the second, fifth and sixth notions of centrality (Betweenness, Point Strength, and Business) have greater relevance to the identification of network vulnerabilities than the others (Degree, Closeness, and Euclidean Centrality)" (ibid., p. 266).

#### 6.1.2.4 Various Tools Applied to Criminal Intelligence

There exist a number of commercially available products for link analysis. Tools reported about in the research literature include the following. *Coplink* is a tool for criminal intelligence analysis which finds links in databases among such entities. Coplink performs data integration, pooling together the various information sources available (Hauck, Atabakhsh, Ongvasith, Gupta, & Chen, 2002; Chen, Zeng, Atabakhsh, Wyzga, & Schroeder, 2003; Chen et al., 2003; Xiang et al., 2005). Section 6.2.5 below is concerned with Coplink.

Drawing on experience gained with the Coplink project, Chen et al. (2004) presented a general framework for crime data mining. A project for FinCEN (Financial Crimes Enforcement Network) – the U.S. Treasury agency set up to detect money laundering – with the goal of developing a computer tool for identifying money laundering networks, by carrying out network link analysis, was reported about by Goldberg and Wong (1998). Links are created between records in databases of financial transactions, so that the networks can be detected of those individuals who made those transactions. Horn, Birdwell, and Leedy (1997) apply shortest-path algorithms to link individuals in the Link Discovery Tool. An overview was provided in a section in Zeleznikow, Oatley, and Leary (2005). Another paper on tools for crime detection from the same volume is by Atib and Zeleznikow (2005).

Leary (2004) presented FLINTS, short for Forensic Led Intelligence System. FLINTS, which was originally applied by the West Midlands Police with headquarters in Birmingham in England, is described in Chapter 7 in this book. FLINTS produces a graphical pattern of links, showing patterns of links between crimes and criminals. Data sources are both "hard" forensic data, such as DNA, fingerprints, and shoe-prints (the latter, a less weighty kind of evidence than the former two), and "soft" data, which are behavioural.

FLINTS III assists in identifying groups of offenders, by analysing offender networks, with the added feature of geographical profiling,<sup>62</sup> which enables police officers to locate crime hotspots. Comparative and seasonal analysis maps are produced. Leary, VanDenBerghe, and Zeleznikow (2003a, 2003b) described an application of the FLINTS model to financial fraud modelling. An example of a possible question to ask FLINTS is: "Show me the most prolific offender this year, and link the object to first level accomplices". An inference network helps with hypothesis generation concerning accomplices. Another system was tried by the Zurich police in Switzerland; it was developed by Olivier Ribaux.

## 6.1.2.5 Gianluigi Me's Investigation Strategy for Tackling Internet Child Pornography

Gianluigi Me, of the Third University of Rome, proposes an investigation strategy (Me, 2008) to tackle *internet child pornography*, "relying on the construction of a

<sup>&</sup>lt;sup>62</sup> In applied psychology, there has been some criticism of false confidence in computerised geographical profiling methods. See Snook, Taylor, and Bennell (2005).

victim's picture database, based on straightforward considerations on the probability of finding a link between two different children. This link can represent the most important key to linking apparently different pedo-criminal phenomena for different pedophiles,<sup>63</sup> joining the same pedo-ring at the same level" (ibid., p. 423). "[E]ven if the number of [child pornography] victims is not known a priori" (ibid., p. 421), "we are looking for the probability of two pictures depicting the same child" (ibid.). Me remarked (ibid., p. 422):

[T]he more you collect pictures with the identification data of the correspond[ing] criminal profile, the more probability you have of detecting the same child as a victim of two different criminals. This consideration creates a relationship link between two pedophiles, since the same child picture has been found in their virtual souvenir boxes: this reflects the affiliation to the same pedophile ring or the belonging to different rings where at least one person is in common.

The results of Me (2008) "can offer complementary benefit to the Situational Crime Prevention (SCP) approach to Internet CP [i.e., child pornography] and pedophilia, due to the increased risk to the pedophile when collecting the pictures and in order to improve the [law enforcement] capability to threaten the pedophiles. [...] SCP refers to a preventative approach that relies upon the reduction of the opportunities for crime, according to the emergent criminological theories focusing on the relationship between the offender and the actual environment where the crime takes place" (ibid., p. 419).

# 6.1.3 Assessing the Risk of Crimes

Part of the applications of investigative data mining are preventative, and go by the name *precrime data mining*. It is subserved by *behavioural profiling*, enabling the police to keep track of a social network of potential offenders, so that action would be taken before (further) crimes are committed.<sup>64</sup> In the words of Mena (2003, pp. 1–2):

Investigative data mining is the visualization, organization, sorting, clustering, segmenting, and predicting of criminal behavior, using such data attributes as age, previous arrests, modus operandi, type of building, household income, time of day, geo code, countries visited, housing type, auto make, length of residency, type of license, utility usage, IP address, type of bank account, number of children, place of birth, average usage of ATM card, number of credit cards, etc.; the data points<sup>65</sup> can run into the hundreds. Precrime is the

<sup>&</sup>lt;sup>63</sup> In Britain, the spelling *paedophile* is usual; the prefix *paedo-* stands for 'child', whereas the prefix *pedo-* properly stands for 'soil', as in *forensic pedology*, which is about the examination of soil traces in criminal investigation.

<sup>&</sup>lt;sup>64</sup> Napier and Baker (2005; 3rd edn. 2009) provide an overview of criminal personality profiling.

<sup>&</sup>lt;sup>65</sup> Of course, the multitude of attributes can be expected to be subdivided into clusters corresponding to entities or relations in some good database design. But it has been especially *relational database* technology that has enhanced the possibilities for analysis, unfettered by a predetermined notion of which kinds of transactions are envisaged.

#### 6.1 Methods

interactive process of predicting criminal behavior by mining this vast array or data, using several AI technologies: [...]

Even before data mining came into the picture – with the objective of assessing risk, and an output consisting of predictive models or rules – security professionals did try to estimate the probability of crimes. The data resorted to were criminal statistics, as well as documentation over a given past period in the given area. For example, one would refer to the statistics of car thefts in a given fairly narrow area: a neighbourhood, or even just a building block.

Another category of precrime risk assessment is when it is necessary to profile an offender who may hit again, such as a serial killer. Serious crime analysts would try:

- **a** *to prevent further crimes*: to identify cues that impinge upon the offender's future behaviour, apart from trying to identify the offender, and
- **b** *to solve the crime*: to devise a good way to capture the offender while minimising the risk both to the public, and to law enforcement personnel.<sup>66</sup>

This is different from *crime analysis*, as being part of policing intended to prevent future crimes by studying the statistics of the historical data. It is not a given criminal episode that is to be solved, or a given offender who is to be captured, but the goal is instead to lower the risk of future crime, of given types and in a given geographical area.

# 6.1.4 Geographic Information Systems for Mapping Crimes

Geographical information systems have various purposes, as well as different presentations. Some are accessible the World Wide Web, and these called *Web-geographical information systems* (*Web-GISs*).<sup>67</sup> The design of such a tool "strongly requires methodological and operational tools for dealing with information distributed in multiple, autonomous and heterogeneous data sources, and a uniform data publishing methodology and policy over Internet Web sites" (De Antonellis, Pozzi, Schreiber, Tanca, & Tosi, 2005, p. 33).

We have already mentioned (in Section 6.1.2.2) that such a link analysis tool as Richard Leary's FLINTS (described in Chapter 7 below) enables, among the other things, geographic profiling, so that police officers can locate crime hotspots. *Geo-mapping tools* are sometimes used in order to look for potential associations

<sup>&</sup>lt;sup>66</sup> In a police science journal, Badiru, Karasz, Karasz, and Holloway (1988) described the expert system AREST [sic]. Its application was to the profiling of suspects of armed robberies. In a technical report of the Canadian Police Research Centre, Valcour (1997) described InvestigAide B&E, an expert system whose purpose was to support the processing and investigation of breaking and entering cases, by assisting in gathering and recording case data, and providing such information as suspect characteristics.

<sup>&</sup>lt;sup>67</sup> See, e.g., Zhong Ren and Ming Hsiang (2003), Worboys and Duckham (2004), Schreiber et al. (2003), De Antonellis et al. (2005), and Pühretmair and Wöβ (2001).

and trends in crime, but sometimes the purpose is different. Crime maps are also sometimes used by the police in their public relations – "Maps of crime are highly persuasive because people tend to instantly grasp graphs, believing what they can see" (Mena, 2003, p. 344) – even though, for sure, their use for investigators and for policy-makers is much more important.

For example, a local newspaper from South East London, the *News Shopper* (Bexley edition), on of 27 August 2008, published the following unsigned item on p. 4, under the headline "Online maps to show crime hot spots":

Crime maps showing where and how often offences are committed could be seen on the internet from next month. The Met police is currently testing electronic crime mapping software and plans to launch the system in September, after a technical review. Interactive maps will sit alongside monthly crime statistics published on the Met's website. They will provide details on the number, rate and geographical location of crime types on a ward, borough and London-wide basis. According to the map, the crime rate in Bexley is below average for London, while in Bromley, Lewisham and Greenwich it is average.

A test map can be viewed online at maps.met.police.uk By clicking on a borough, visitors can see figures for burglary, robbery and vehicle crime and figures from previous years. Crime maps have been used in the US — notably in Chicago, New York and Los Angeles — where police departments show incidents at a house-to-house level.

Then Jules Cooper in the *Bexley Times* on Thursday, 11 September 2008 announced on p. 7, under the headline "Net marks crime capital":

A crime map of the capital has been launched on the internet by the Metropolitan Police Service. Burglaries, robberies and vehicle thefts are charted ward by ward on the map launched last Wednesday and each is graded by colour between high and low crime. The project is in its infancy and is expected to be expanded to show violent and sexual crimes, antisocial behaviour and the number of calls made to the police. By borough, Bromley, Bexley and Greenwich were all classed as having an 'average' rate of burglaries and robberies, whilst Westminster had the highest rate in London. No borough in London was classed as having 'low' crime. At the moment viewers can only view crime statistics of their sub-ward area of 633 houses, or of their borough. High crime sub-wards were shown to be clustered in Greenwich Peninsula and were also dotted around Woolwich, Thamesmead and Belvedere. However, areas of 'high' crime appear adjacent to 'lower than average' areas. [...]

As a matter of fact, crime maps at websites came to London several years after they did at major cities in the United States, where there also is a Web portal to the *geographic information systems (GIS)* of various police departments, at the website of CMRC: "In 1997 the National Institute of Justice established the Crime Mapping Research Center, whose goal is the promotion, researching, evaluation, development, and dissemination of GIS technology and the spatial analysis of crime" (Mena, 2003, pp. 344–345). Eventually, such maps were made accessible on the Internet, to anyone with a browser. Apart from urban crime maps, crime can also be mapped along roads (Kangas, Terrones, Keppel, & La Moria, 2003, p. 370, figure 12.10, and p. 372, figure 12.12).

The first AutoCarto conference was held in 1974 in Reston, Virginia: "this was the first in an important series of conferences that set the GIS research agenda" (Longley, Goodchild, Maguire, & Rhind, 2001, p. 12, table 1.4).<sup>68</sup> The first issue of the *International Journal of Geographic Information* Science appeared in 1987. In 1988, TIGER (Topologically Integrated Geographic Encoding and Referencing) was announced and described by the U.S. Census Bureau, as being a follow-up from DIME (Dual Independent Map Encoding – Geographic Database Files), a data structure and street-address database for the 1970 census that they developed in 1967. "Low cost TIGER data stimulate[d] rapid growth in US business GIS" after 1988 (ibid., p. 13). The *MapQuest* commercial Internet mapping service was launched in 1996, "producing over 130 million maps in 1999" (ibid.). Let us say something about geographic information systems actually are. Longley et al. state (2001, pp. 11, 13):

[...] GIS is a complex beast, with many distinct appearances. To some it is a way to automate the production of maps, while to others this application seems far too mundane compared with the complexities associated with solving geographic problems and supporting spatial decisions, and with the power of a GIS as an engine for analyzing data and revealing new insights. Others see a GIS as a tool for maintaining complex inventories, one that adds geographic perspectives to existing information systems, and allows the geographically distributed resources of a forestry or utility company to be tracked and managed. All of these perspectives are clearly too much for any one software package to handle, and GIS has grown from its initial commercial beginnings as a simple off-the-shelf package to a complex of software, hardware, people, institutions, networks, and activities that can be very confusing to the novice. A major software vendor as ESRI today sells many distinct products, designed to serve very different needs: a major GIS workhouse (ArcInfo), a simpler system designed for viewing, analyzing, and mapping data (ArcView), an engine for supporting GIS-oriented Web sites (ArcIMS), an information system with spatial extensions (ArcSDE) and several others.

"It is convenient to classify the main GIS software packages into six groups, based on their functionality and type: professional, desktop, hand-held, component, viewer, and Internet" (Longley et al., 2001, p. 171). For example, ESRI Press published *Serving Maps on the Internet* (Harder, 1998).<sup>69</sup> Table 1.3 on p. 10 in Longley et al. (2001) variously defines a GIS, according to the groups who find them useful: "a container of maps in digital form" (for the general public); "a computerized tool for solving geographic problems" (for decisions-makers, community groups, and planners); "a spatial decision support system" (for management scientists or operations researchers); "a mechanized inventory of geographically distributed features and facilities" (for utility managers, transportation officials, or resource managers); "a tool for revealing what is otherwise invisible in geographic information" (for scientists or investigators); and "a tool for performing operations on geographic data that are too tedious or expensive or inaccurate if performed by hand" (for resource managers, planners, and cartographers).

 $<sup>^{68}</sup>$  Foresman (1998) collects essays by the pioneers of geographic information systems about the history of the field.

 $<sup>^{69}</sup>$  Also Plewe (1997) is concerned with geographic information systems accessible online on the Internet.

Crime maps are the subject of Mena's (2003) chapter 12, 'Mapping Crime: Clustering Case Work' (ibid., pp. 343–378). He begins by contrasting *top-down* vs. *bottom-up* approaches to crime mapping. When a human analyst explores (by using a computer tool) the features of crimes by different dimensions, this is a top-down approach. Mena correctly points out that this is a useful complement to the bottomup approach to mapping crime, which is a machine-driven rather than human-driven analysis, and (by using data mining) clusters the data about crime automatically: "This type of map is driven by the criminal data itself and may lead to the discovery of new, previously unseen patterns and can provide very important insights that a human-driven analysis might miss" (ibid., p. 343). It must be said that sometimes maps may be deceptive: Monmonier's (1996) book is entitled *How to Lie with Maps*.

O'Looney's (2000) Beyond Maps: GIS and Decision Making in Local Government was concerned with GIS applications in local government, and a simplified classification from O'Looney appeared in Longley et al. (2001, table 2.1, pp. 34–35). There were three columns: "Inventory Applications (locating property information such as ownership and tax assessments by clicking on a map)", "Policy Analysis Applications (e.g. number of features per area, proximity to a feature or land use, correlation of demographic features with geological features)", and "Management/Policy-Making Applications (e.g. more efficient routing, modeling alternatives, forecasting future needs, work scheduling)". There was one row in the table for *law enforcement* indeed:

- 1. The cell of inventory applications to law enforcement stated: "Inventory of police stations, crimes, arrests, convicted perpetrators and victims; plotting police beats and patrol car routing; alarm and security system locations".
- The cell of policy analysis applications to law enforcement stated: "Analysis of police visibility and presence; officers in relation to density of criminal activity; victim profiles in relation to residential populations; police experience and beat duties".
- 3. The cell management or policy-making applications to law enforcement stated: "Reallocation of police resources and facilities to areas where they are likely to be most efficient and effective<sup>70</sup>; creation of random routing maps to decrease predictability of police beats".

A distinction is to be made between visualisation on a geographical map of events that have actually occurred, and *geosimulation*. "Geosimulation (Benenson & Torrens, 2004) proposes the aggregation of Multi-Agent Systems (MAS) and Geographic Information Systems (GIS) for modeling and simulating urban phenomena" (Furtado & Vasconcelos, 2007, p. 57). Geosimulation "addresses an urban phenomena simulation model with a multi-agent approach to simulate discrete, dynamic, and event-oriented systems (Benenson & Torrens, 2004). In

<sup>&</sup>lt;sup>70</sup> *Effectiveness* (less often, *efficacy*) denotes success at goal achievement. *Efficiency* denotes success at achieving goals while containing the expenditure of resources, including time.

Section 6.1.6.2, we are going to discuss the use of multiagent technology in the geosimulation of criminal dynamics in urban environments, for the purpose of training police officers.

It is important to realise that one can map crime visually, without actually displaying the data on a geographical map.<sup>71</sup> Kangas et al. (2003) is an article about CATCH (Computer Aided Tracking and Characterization of Homicides), a project of Battelle Memorial institute's Pacific Northwest Division in Richland, Washington state, and the Attorney General of Washington, Criminal Division. In CATCH, *Kohonen neural networks* (i.e., *self-organising maps*)<sup>72</sup> "learn to cluster similar cases from approximately 5,000 murders and 3,000 sexual assaults residing in the databases" (ibid., p. 365), using data from the HITS (Homicide Investigation Tracking System) database system, containing data about violent crimes primarily from the U.S. Pacific Northwest. CATCH itself, that comes in two versions – one for murders and one for sexual assaults – is a collection of tools that also include query tools and geographical maps. "The tools in CATCH are of two types. First, there are database mining tools to give the crime analyst a better understanding of the content of the database. Second, there are tools that let the analyst retrieve and

<sup>&</sup>lt;sup>71</sup> Using data from Britain, Adderley and Musgrove (2003b) used self-organising maps (i.e., Kohonen neural networks) in order to model the behaviour of offenders who commit serious sexual assaults. Clustering resulted in the formation of profiles of offenders, some of which were then confirmed independently: some of them belonged to convicted offenders, whereas other profiles resulted in further investigation. It took Adderley and Musgrove ten weeks to achieve results that using conventional methods, would have taken 2 years (as was the case of an in-house study of the police). "When a specified offense occurs within the United Kingdom the force in which the offense occurred has the remit to forward full details to the NCF [i.e., the National Crime Faculty of the National Police Staff College at Bramshill, Hampshire] for subsequent entry into the Violent Crime Linkage Analysis System (ViCLASS) system" (*sic*, ibid., p. 350), "a relational database developed in 1991 by the Royal Canadian Mounted Police comprising 53 tables, not all of which are used in the United Kingdom" (ibid.).

Adderley and Musgrove (2003b) point out that sometimes the data are ambiguous; for example, in a particular gang rape, there was the initial intention to pick up a prostitute, sop the question as to whether she was specifically targeted is yes, in that she was a prostitute, but no, in that it need not have been specifically her (ibid., p. 353). After data preparation, model building followed. "A self-organizing map was selected because it has the ability to cluster similar records into the same cell, while producing a two-dimensional topological map showing the relationship of those records to near neighbors. This can be used to form larger clusters by merging neighboring cells" (ibid., p. 355). In this sense, a map is obtained, even though it does not look as a geographical map. For example, in their figure 12.4 on p. 356, they showed the clustering of 2,370 crimes on a  $20 \times 20$  grid, and by adding straight lines manually, one can see three different areas, according to how the offender approached the victim: three manners "broadly categorized as cons, surprise, and blitz" (ibid., p. 356). As a particular case, clustering could also be on a geographical basis, but clearly Adderley and Musgrove (2003b) is about data visualisation, not about geographical crime mapping. Their article was published as part of Mena's (2003) chapter 12, "Mapping Crime", and the same is true of Kangas et al. (2003).

<sup>&</sup>lt;sup>72</sup> Self-organising maps (SOM), or Kohonen neural networks, were invented by Teuvo Kohonen (1982). The nodes of the network (i.e., artificial neurons) learn to map points in an input space to coordinate in an output space (that is to say, from the set of the input nodes to the set of the output nodes). Lebbah, Bennani, and Rogovschi (2009) proposed an approach that considers the automated learning of self-organising maps as a mixture of Markov models.

compare specific crimes" (ibid., p. 367). In particular, it is possible to have a set of crimes to be placed on a geographical map as pins (e.g., along highways). "The user can select pins to view additional information about specific crimes" (ibid., p. 369). For example, two crimes were compared in a map (ibid., p. 372, figure 12.12), and this was done (ibid., p. 373):

according to the sexual offender labels: Power Reassurance, Power Assertive, Anger Retaliatory, and Anger Excitation. The figure shows the individual weights assigned to each of the details and the four labels describing each of the two crimes. The details of the two crimes in the figure are sorted to bring the significant details to the top. The two crimes compared in the figure are both described to have "unusual ritual" and "blindfold" in common. These are two crime details that are relatively rare in the database and may suggest that the same offender committed these two crimes.

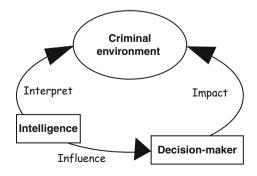
The weighting systems were developed by Robert Keppel, chief criminal investigator at the Attorney general in Washington. Keppel publishes both in specialist forensic forums (Keppel, 1995a; Keppel & Weis, 1997), and popular books about solving crimes and his experience at it (Keppel, 1995b, 1997).

## 6.1.5 Detection

#### 6.1.5.1 General Considerations

Pro-active rather than passive crime detection (it is passive when denunciations are merely received) is adapted, of course, to the specific patterns that typify the different braches of criminal activity. Generally speaking, the gathering of intelligence is required, in order to enable effective policing, both in order to solve crimes, and in order to prevent them. This is distinct from crime investigation, and for intelligence analysis to be effective, it should not be made subservient to the contingencies of the investigation of this or that crime incident. See Section 4.5.1 below.

Ratcliffe (2005, p. 439, 2003) proposed a "3i Model" of the *intelligence-led policing* process. The three "I"s stand for "Interpret, Influence, Impact". The schema is redrawn here in Fig. 6.1.5.1.1.



**Fig. 6.1.5.1.1** Ratcliffe's 3i Model of the intelligence-led process

Mena (2003, chapter 9, "Criminal Patterns: Detection Techniques", pp. 275–299) begins by discussing the *modus operandi* (*MO*) of various kinds of crimes,<sup>73</sup> along with some known indicators of such crimes, and then turns to presenting a general methodology for detecting crimes by means of data mining. In practice, he customises for crime detection the CRISP-DM data mining model methodology (the Cross-Industry Standard Process–Data Mining), a standard that is widely adopted in industry. Mena tailors every phase of the process (understanding of the objectives, understanding of the data, data preparation, modelling, evaluation, and deployment) to crime detection in general, after having discussed in previous sections the specific problems and methods associated with particular categories of crime to be detected. The very possibility of suggesting a general methodology is a challenge, and trying to address this problem deserves appreciation. "There is no single template for detecting fraud, just as there is no one methodology for data mining" (ibid., p. 276). Moreover, not only old patterns, but also novel behaviour on the part of offenders is to be expected (ibid.):

Criminal perpetrators, whether hackers or thieves, are creative and opportunistic individuals, and attempts to catch them cannot be based solely on how they have behaved in the past. An investigative data miner must look for old patterns, as well as new ones that may signal a new type or hack attack. For this reason, two typical analyses will be needed, one involving classification of known patterns and the other involving a clustering analysis in search of anomalies or outliers<sup>74</sup> in the data.

Moreover, *link analysis* is useful for the detection of offenders. Financial crimes is one area to which Mena devotes much attention. "The goal of data mining for a financial institution is the development of rules and models enabling it to reduce the number of fraudulent-transaction alerts to a volume that can be handled and investigated by, say, an audit group in a bank" (ibid., p. 276), with the proviso that one should expect offenders to take detection-avoidance action, based on what they expect the auditors' rules and procedures to be. Also "money launderers are

<sup>&</sup>lt;sup>73</sup> Keppel (2005; 3rd edn. 2009) provides an overview of linking cases by modus operandi and signature of serial offenders.

<sup>&</sup>lt;sup>74</sup> Rousseeuw and Hubert explain (2011, p.73) "In real data sets, it often happens that some observations are different from the majority. Such observations are called outliers. Outlying observations may be errors, or they could have been recorded under exceptional circumstances, or belong to another population. Consequently, they do not fit the model well. It is very important to be able to detect these outliers. In practice, one often tries to detect outliers using diagnostics starting from a classical fitting method. However, classical methods can be affected by outliers so strongly that the resulting fitted model does not allow to detect the deviating observations. This is called the masking effect. In addition, some good data points might even appear to be outliers, which is known as swamping. To avoid these effects, the goal of robust statistics is to find a fit that is close to the fit we would have found without the outliers. We can then identify the outliers by their large deviation from that robust fit." Rousseeuw and Hubert (2011) present an overview of robust statistical methods for detecting outliers, and of outlier detection tools. Cf. Su and Tsai (2011). The concept of outlier is familiar from statistics. Barnett and Lewis (1994) is a book on the subject. The definition given by Grubbs (1969) is: "An outlying observation, or outlier, is one that appears to deviate markedly from other members of the sample in which it occurs." Also see http://en.wikipedia.org/ wiki/Outlier

believed to change their MOs frequently. If one method is discovered and used to arrest and convict a ring of criminals, activity will switch to alternative methods" (ibid., p. 280). "[M]oney launderers resemble individuals who engage in ordinary fraud: They are adaptive and devise complex strategies to avoid detection. They often assume their transactions are being monitored and design their schemes so that each transaction fits a profile of legitimate activity" (ibid.).<sup>75</sup>

Detection of crime perpetrated by using computers requires awareness of techniques for evading such detection. Strategies to evade computer forensic investigations are referred to by some authors (following Harris, 2006) as *anti-forensics*: the name *digital anti-forensics* has been given to strategies to evade computer forensic investigations, as well as ways to exploit critical failures in computer forensics software or in the reliability of computer security systems.

Whereas Mena (2003) insisted correctly that data mining for fraud detection should be combined with human expertise in order to make detection techniques flexible and evolving, arguably there are two classes of techniques that could be resorted to in addition, for the formalisation of the automated processing: one class is methods from artificial intelligence for handling *agents' beliefs*, including *nested beliefs* (i.e., beliefs that agents ascribe to each others), for which see Section 3.4 above. As to game theory, see Section 4.3.2.2 above.

It is crucial to understand that data mining identifying suspect cases in a data set can only be an *indicative* tool, not an *implicative* tool: data mining points out patterns or exceptions (*outliers*) to a pattern, and just because transactions or individuals are so identified is not evidence against suspect persons. Rather, investigation should follow, and validate a charge independently.

#### 6.1.5.2 Complex Tools' Vulnerability to Manipulation by Perpetrators

Mena (2003) has an interesting treatment of methods for insurance fraud detection (ibid., sections 9.5. and 9.7), and these are summarised in a large table on pp. 286–287 in his book. In his section 9.6, Mena (2003) briefly discusses a case study, of death claims that did not add up. "A traditional auditing tool was first used as a

<sup>&</sup>lt;sup>75</sup> Mena (2003, pp. 280–281) points out that the use of techniques derived from AI research, i.e., data mining, for the purpose of monitoring wire transfer traffic (so that suspicious transfers, typically related to money laundering, may be detected) was rejected by the 1995 OTA report – a report from September 1995, prepared by the Office of Technology Assessment (OTA) and commissioned by the Permanent Subcommittee on Investigations of the U.S. Senate committee on Governmental Affairs. "The OTA report rejected the use of data mining due in part to a lack of useful profiles, high cost, and privacy issues, but, most importantly, the major challenges in constructing an effective wire transfer analysis was related to the incomplete, spotty, and poor condition of the data, not the AI technologies. 'In several cases, technologies are available that would be appropriate for wire transfer analysis, but data and (government) expertise do not exist to make those technologies effective" (Mena, 2003, p. 281). Mena claimed that however: "The post-9/11 environment is changing the priorities of years ago" (ibid.). The problem of the poor quality of the data, owing to ineffective standards, was being addressed by new legislation, with the data quality being improved enough for data mining being applied.

preprocessor to manipulate the files and sort the data", and so forth (ibid., p. 287). Then, a software product from WizSoft, WizRule, was used so that all the IF/THEN rules in the data set were searched and found. The level of unlikelihood of deviations was calculated, by that tool. Some cases that were pointed out by the tool were then investigated (ibid., p. 288).

In his section 9.5, 'Insurance Crimes', Mena (2003, pp. 281–286) considered in particular losses to Medicare in the United States, through improperly charged healthcare services.<sup>76</sup> Mena's discussion is rather detailed, and suited indeed for data mining, but in a sense, addresses a problem that in those particular forms,

In his autobiography, politician David Ben Gurion (who was born in Russia in 1886, and in 1948 proclaimed the independence of the State of Israel) claimed that his father had been a lawyer. It has been pointed out that his father had never graduated from high school, and was living in a region where he could not earn a university degree (the son instead earned a law degree in Constantinople, and for that purpose learned Turkish). Rather, the father used to write letters in good Russian for those who could not write in that language (but perhaps could write in Yiddish instead), and carried out the functions of a notary, drew up contracts, and so forth. Did Ben-Gurion try to aggrandise his family background, by claiming that his father had been a lawyer? Perhaps taking such a view would be anachronistic. In the United States in the first half of the 19th century, and in rural parts of Russia until much later, the professional profile of an *ad hoc lawyer* was commonplace. Such a lawyer used to carry out some of the functions of a lawyer, such as drawing up contracts, or settling border disputes between farmers, but they hadn't a law degree. Claiming that an ad hoc lawyer was a lawyer is false, but historically it used to be a commonplace and non-malicious statement, other than in the big cities. But Ben-Gurion himself had earned a law degree at a university, so perhaps

<sup>&</sup>lt;sup>76</sup> Consider moreover that a truthful claim may be sometimes ambiguously formulated. Partridge (1991) provides an example of a U.S. insurer misunderstanding a claim: Partridge's own son cut his knees (resulting in an injury that required several stitches), when on a trip to Gettysburg with the Boy Scouts. The father filled out an insurance form, and the insurer asked for confirmation because on the form, in the section where a short description of how the accident happened has to be supplied, the father had written: "Injury received while on the battlefield in Gettysburg, Pa." The insurer was puzzled because of the assumption that if you received an injury at a battlefield, then you were one of the combatants, and because no one still alive, let alone a minor, could have fought at the battle of Gettysburg (1-3 July 1863). This is a nice example of an ambiguous description which an artificial intelligence program with natural-language processing capabilities could be made to explain out: it is possible to receive an injury at a place where a battle had taken place in 1863, but if the person injured is a child around the year 1990, then presumably this wasn't during the famous battle. By itself, the claim may be quite truthful. Perhaps an employee at the insurer was taken aback, because of the expectation that some claims would be spurious, and perhaps this was a spurious claim making an outrageously false statement about the circumstances of the claimed injury, on the part of a claimant overconfident that anything goes.

Dan Sperber and Deirdre Wilson discussed the notion of *loose talk* (Sperber & Wilson, 1986), by means of an example they provide (Sperber & Wilson, 1990). "At a party in San Francisco, Marie meets Peter. He asks her where she lives, and she answers: 'I live in Paris'." Contrast this to a situation in which the location of the event when the occurance takes place is different: "Suppose Marie is asked where she lives, not at a party in San Francisco, but at an electoral meeting for a Paris local election". There is a difference, concerning the truth value of Marie's utterance, in terms of *relevance*. "It so happens that Marie lives in Issy-les-Moulineaux, a block away from the city limits of Paris. Her answer is literally false, but not blatantly so. If Peter presumed literalness, he will be misled". Yet, assumptions are warranted, that in terms of artificial intelligence could be represented in terms of a nesting of beliefs that agents ascribe to each other. It is not precise that Marie lives in Paris, in the sense that this is inside the city limits.

is rather peculiar of the United States, where private providers of healthcare are sometimes conniving, but more generally grossly overcharge, for European sensibilities.

It must be said that the other side of the medal, with medical insurance worldwide, is that insurers are also known to behave unethically, and medical insurance expert witnesses tend to have a poorer reputation (including within the medical profession) than expert witnesses in most other domains. Sometimes quite justified misgivings arise, that some such experts testify in a manner that suits the party that instructs them: either the insurer, or the patient.

Moreover, in the United Kingdom there is an ongoing trend, in that domain of expert testimonies, for the economically stronger party to require shortened proceedings, such that their expert witnesses would not be cross-examined. Whereas the standard situation is that in general expert witnesses can be expected to be cross-examined ferociously, with the other party trying to shatter their credibility even when they are quite competent and irreproachable, it is unfortunately precisely in such categories of trials where expert testimony is (by public feeling) more suspicious, that the party instructing them, who may be an insurer, would try to insist that in order to contain expenses, the expert witness should not be required to appear in court. Private persons are likely to find this difficult to resist.

This arguably drastically reduces the public's confidence in the possibility of obtaining justice in cases of medical insurance claims disputed by the insurer. For sure, an expert who in order to suit the insurer instructing him or her claims, say, that the claimant would in all likelihood fully recover from an accident within six months, in theory could be exposed when after many years this prediction is proven wrong, especially when counterexpertise is in place (and was in place ab initio) to point out how the insurer's expert was methodologically at fault, or even could not have been in good faith. In practice however it is very difficult to expose an expert based on past cases, if the parties wronged alike, time after time, are private persons rather than corporations or institutions.

This kind of behaviour patterns makes Mena's (otherwise praiseworthy) recommendation problematic: "It is important that carriers have the intelligence to process claims with payment, recall them, cancel them, reduce them, or seek clarification from medical staff or patient" (ibid., p. 282). This would all be good and well if the insurer's pattern of behaviour is spotless. When it is not, this may be itself a pattern belonging to corporate culture. There is a risk that a data mining tool be presented as a magical black box, and ascribed probative weight that does not compete to it, either in order to discourage claimants, or even to mesmerise the court. Even worse, the tool itself may be manipulated fraudulently, by a corporate perpetrator confident enough that nobody would be both motivated enough and smart enough to detect the fraud. I am by no means claiming that such a situation is already in place anywhere, but I am presenting a worst-case scenario for when data mining will be widespread

his claiming what he did claim about his father, yet not pointing out that his father, though for practical purposes "a lawyer", had no degree, was not entirely innocent.

enough for rogues to emerge (like in other sectors)<sup>77</sup> who would sporadically bend technology (in this case, data mining) for their own unlawful purposes.

There already exist situations when fraud in simple software may be suspected: such as at a supermarket that, in contrast to its local competitors, quite often incurs small "errors", always to the detriment of customers as they pay (errors small enough for some clients to neglect to require that they would be made good, once they uncover the error), and there is the suspicion that this is not only because cashiers and other staff find themselves forced to conform to the corporate culture of their employer, but because digital equipment at the till was dishonestly manipulated centrally, away from the control of most staff.

Needless to say, digital manipulations of the latter kind, if they occur indeed at some supermarket's tills, affect algorithms and data much simpler than data mining technologies: for the very reason that these are often most effective when ensembles of models are combined,<sup>78</sup> and for the very reason that even the average information technologists may consider such systems daunting, let alone following how they run step by step,<sup>79</sup> data mining tools may be vulnerable to dishonest manipulation on the part of private corporate perpetrators. If such a scenario is ever to materialise,

<sup>&</sup>lt;sup>77</sup> Mena (2003, p. 288) remarks that in telecommunications crime, outside criminals use either unwitting company personnel, or unscrupulous or venal employees to defraud the phone company. <sup>78</sup> Less heterogeneous than *ensembles* of data mining models, in *committees* of artificial neural networks (ANNs) – also known as *committees of machines* – it is only neural networks that are combined. Different neural networks together vote on a given example. They are typically used as *classifiers*, i.e., machines that automatically divide input data into classes. *Committees* are "Ensembles of ANNs trained with the same data, often with different topologies, whose output is interpreted as a vote for the classification. Committees are appealing because they decrease the variance of the final decision, which is considered one of the most severe problems in semiparametric classifiers" (Principe et al., 2000, p. 640).

The usefulness of committees of neural networks consists of stabilising the results, by avoiding going astray after just a single neural network, as individual neural networks are subject to finding local minima during optimisation, thus missing resolutions that are globally better. It is as though on a surface with hills and valleys, if we are looking for a maximum, because of narrow vision we were to climb on a hill to the top, and not climb a mountain in another area. Even if the topology (architecture) of the neural network is the same, if we start with the same architecture and training but using different initial random weights, it is often the case that the behaviours of networks would be vastly different. Committees are a remedy to such variation.

Using committees of machines is similar to the method of *bagging* in machine learning. The difference is that in a committee of neural networks, one obtains the necessary variety of machines in the committee by training from different random starting weights. By contrast, in bagging the variety is obtained by training on different randomly selected subsets of the training data.

<sup>&</sup>lt;sup>79</sup> In the final section in his book, a section entitled 'Alien Intelligence', Mena remarks about such software that evolves, breeds solutions, and learns on its own (2003, p. 376): "Sometime we can't follow its logic in detail, but we use these AI components because they are very accurate. This is what the renowned computer scientist and writer James Martin calls 'alien intelligence', which is a process executed on a computer that is so complex that a human can neither follow the logic stepby-step nor come to the same result by other means. We couldn't write a conventional program, for example, to spot fraud on millions of accounts in real time; we need neural networks to help us". The problem with neural networks is that they are notoriously opaque rather than transparent in how they run and reach results.

and if once it does, such an unfortunate development comes to be exposed, a major crisis in technology being trusted may ensue.

It is necessary to give this a thought already at present. A hint of how to address this could be that some mandatory procedures must apply, which themselves could not be tampered with. This kind of regulation is already in place at nuclear power plants, when validation software that carries out reactor core physics simulations must be run, after a design of how to reload fuel assemblies into the core has been produced.

At nuclear power plants, such mandatory procedures are motivated by a concern for safety. With corporate data mining, governmental regulation could enhance trust in proper use, discouraging the technology being misused fraudulently. For sure, data mining per se does not lend itself to criminal behaviour, but the risk is that because of the inner workings being beyond the understanding of non-IT or even some IT professionals, flawed or maliciously manipulated data mining tools would be misrepresented, in order to support unwarranted claims. The problem is only somewhat mitigated by the wide availability of commercial data mining kits, so that some similarity among tools is likely to occur, and this in turn enhances transparency up to a point.

# 6.1.6 Autonomous Agents

### 6.1.6.1 From Blackboard to Multiagent Systems

*Multiagent systems* constitute an independent topic at the intersection between distributed computing and artificial intelligence.<sup>80</sup> Multiagent technology<sup>81</sup> enables to manage a society of autonomous *software agents*, themselves each comprising three basic abilities:

- communication skills vis-à-vis other agents or human users;
- *knowledge*, either built-in (e.g., in a ruleset, or in a semantic network), or acquired by means of machine-learning techniques;
- *performing given tasks* (of which the ones relevant for investigative data mining are: information retrieval, filtering, monitoring, reporting),

and themselves each entrusted with tasks with may be specialising in sensing (and monitoring) vs. taking appropriate  $\arctan^{82}$  or then in retrieval functions

<sup>&</sup>lt;sup>80</sup> Textbooks on multiagent systems include Ferber (1999), Weiss (1999), Wooldridge (2002, 2nd edn.: 2009). Multiagent systems are sometimes combined with representations and techniques from, e.g. *logic* and *game theory* — this was shown in a book by Shoham and Leyton-Brown (2009) — or *algebra* (Amigoni & Continanza, 2012).

<sup>&</sup>lt;sup>81</sup> See e.g. Wooldridge (2002); Wooldridge and Jennings (1995).

<sup>&</sup>lt;sup>82</sup> A *security* application of this is the monitoring *digital signatures* provided by the use of swipe cards. If and when deviations from the norm are spotted, an alert is silently given, so that the card provider would monitor the card, just in case it was stolen.

(e.g., undertaking and carrying out given kinds of Web search), vs. in the analysis of what has been retrieved. Such software agents in turn may make use of other AI techniques, such as neural networks.<sup>83</sup> An example of *sensor agents* is such agents "that can read identity badges and detect the arrival and departure of users to a network, based on the observed user actions and the duration and frequency of use of certain applications or files" (Mena, 2003, p. 7). By contrast, *actor agents* may, e.g., create a profile, or "query a remote database to confirm access clearance" (ibid.).

An application of multiagent systems to crime investigation was reported about by Dijkstra, Bex, Prakken, and De Vey Mestdagh (2005).<sup>84</sup> It is about regulated information exchange during investigation between police forces. This is because (ibid., p. 133)

in the European Union exchange of any personal data is regulated by privacy law and in the Netherlands exchange of crime investigation data between police departments is regulated by a special act. Typically, organisations must balance the goal to exchange as much information as possible with the obligation to stay within the law.

As they explained in the abstract:

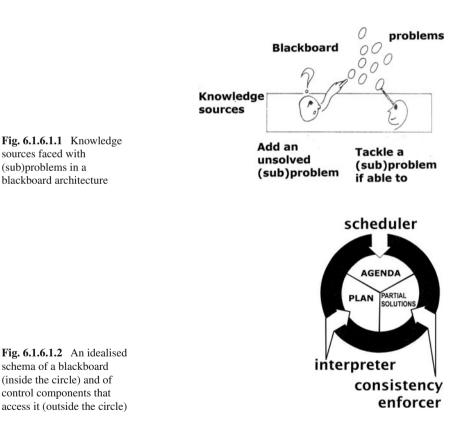
Interactions between police officers about information exchange are analysed as negotiation dialogues with embedded persuasion dialogues. An architecture is then proposed consisting of two agents, a requesting agent and a responding agent, and a communication language and protocol with which these agents can interact to promote optimal information exchange while respecting the law. Finally, dialogue policies are defined for the individual agents, specifying their behaviour within a negotiation. Essentially, when deciding to accept or reject an offer or to make a counteroffer, an agent first determines whether it is obligatory or permitted to perform the actions specified in the offer. If permitted but not obligatory, the agent next determines whether it is in his interest to accept the offer.

There is a multitude of applications of multiagent systems reported about in the scholarly literature. For example, Bivens, Gao, Hulber, and Szymanski (1999) reported about agent-based network monitoring. Szymanski and Chung (2001) reported about indexing the Web by means of agents, these being called *Web bots* (patterned after [*virtual*] *robot*). The latter application is an illustration of how multiagent technology can be combined with techniques from other domains, which in this particular case are information retrieval and text mining.

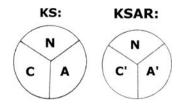
<sup>&</sup>lt;sup>83</sup> In fact, the U.S. Treasury Department's Financial Crimes Enforcement Network (FinCEN), which tries to detect financial crimes, have a tool called FAIS (i.e., FinCEN Artificial Intelligence System), which "uses an agent to weed through this large data space" – namely, "all cash transactions involving dollar amounts of above \$10,000", about ten million transactions a year – "and search for abnormalities and fraud through the use of neural network and link analysis" (Mena, 2003, p. 107).

<sup>&</sup>lt;sup>84</sup> Dijkstra et al. (2005, p. 133) explained the context of their project "This research is part of an ongoing research project ANITA (Administrative Normative Information Transaction Agents), which aims at performing the fundamental research needed to develop a multi-agent system for regulated information exchange in the police intelligence domain [(De Vey Mestdagh, 2003)]."

A precursor of multiagent systems was what in AI from the 1980s was called the *blackboard* paradigm (it is still researched by some).<sup>85</sup> A problem is posted on the agenda inside the blackboard. Different knowledge sources (which now would be autonomous agents) check the blackboard, to see whether there is any (sub)problem the given knowledge source is competent for trying to solve. If a particular knowledge source's activation record, being a summary of what it is able to do), then that knowledge source tries its hand at it, and in the process may be faced with sub-problems it cannot solve, so it posts such subproblems on the blackboard, for other knowledge sources to handle it if competent. See Figs. 6.1.6.1.1, 6.1.6.1.2, 6.1.6.1.3, 6.1.6.1.4, 6.1.6.1.5, 6.1.6.1.6, and 6.1.6.1.7. These are my own drawings, which convey notions drawn from Barbara Hayes-Roth's 1983 report on the blackboard architecture (Hayes-Roth, 1983; cf. 1985).



<sup>&</sup>lt;sup>85</sup> A blackboard-based approach has been reported in the late 2000s from the University of North Carolina at Charlotte (Liu, Yue, Wang, Raja, & Ribarsky, 2008; Yue, Raja, Liu, Wang, & Ribarsky, 2009; Yue, Raja, & Ribarsky, 2010).



**Fig. 6.1.6.1.3** Simplified schemata of (on the *left side*) a knowledge source (KS) in a blackboard architecture: N stands for the KS's name, C stands for the condition part of an *if-then* rule, and A stands for that rule's action part; and (on the *right side*) a knowledge source activation record (KSAR), which identifies a knowledge source. In the KSAR, too, N stands for the name of the KS (which is shared with the KSAR). C' stands for the triggering condition of the KSAR, whereas A' is the activity summary, i.e., a summary of proposed activities of the KS

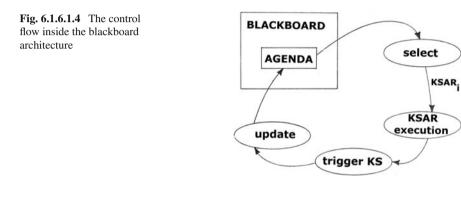
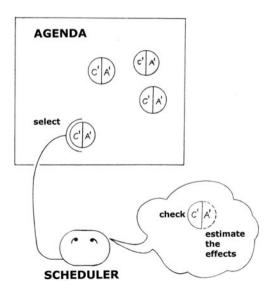
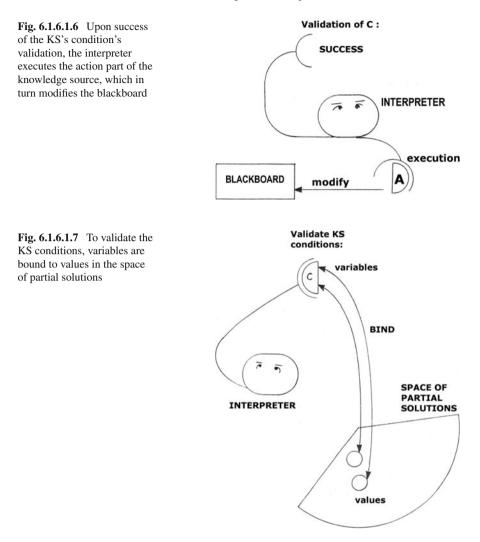


Fig. 6.1.6.1.5 The scheduler (inside the blackboard architecture) selects one of the pending actions from the agenda, where knowledge source activation records (KSARs) identify their respective knowledge sources (KSs). The scheduler identifies highest-performance tests. Once the scheduler has selected a given KSAR, the interpreter will execute the respective KS, of which a summary is provided in its KSAR





"The need for structured knowledge led to the earliest work that was recognizably multiagent systems: *blackboard systems*" (Wooldridge, 2002, p. 307).<sup>86</sup> "Blackboard systems were highly influential in the early days of

<sup>&</sup>lt;sup>86</sup> The earliest implementation of blackboard systems was in the 1970s. An edited volume on the subject was published by Engelmore and Morgan (1988), and it quoted (ibid., p. 16; cf. Wooldridge 2002, p. 307) the blackboard metaphor as originally proposed by Newell (1962): "Metaphorically we can think of a set of workers, all looking at the same blackboard: each is able to read everything that is on it, and to judge when he has something worthwhile to add to it. This conception is [...] a set of demons, each independently looking at the total situation and shrieking in proportion to what they see fits their natures".

multiagent systems, but are no longer an area of major research activity" (Wooldridge, 2002, p. 308). Eventually, agents in multiagent systems took to communicate by *message passing*.

Blackboard systems have found application in legal computing: "GBB is an expert system shell based on the blackboard paradigm. It provides the blackboard database infrastructure, knowledge source languages and control components needed by a blackboard application. It is used in the construction of the CABARET legal knowledge based system" (Stranieri & Zeleznikow, 2005a, Glossary). Ashley's (1991) HYPO system (which modelled adversarial reasoning with legal precedents) was continued in the CABARET project (Rissland & Skalak, 1991), and the CATO project (Aleven & Ashley, 1997). Besides: "The PROLEXS project at the Computer/Law Institute, Vrije Universiteit, Amsterdam, Netherlands is concerned with the construction of legal expert shells to deal with vague concepts. Its current domain is Dutch landlord-tenant law. It uses several knowledge sources and the inference engines of the independent knowledge groups interact using a blackboard architecture" (Stranieri & Zeleznikow, 2005a, Glossary). PROLEXS is the subject of Walker, Oskamp, Schrickx, Opdorp, and van den Berg (1991) and of Oskamp, Walker, Schrickx, and van den Berg (1989).

Wooldridge (2002, p. 311) relates how the subcontracting<sup>87</sup> and negotiation metaphors emerged in multiagent systems research:

In the late 1970s at Stanford University in California, a doctoral student called Reid Smith was completing his PhD on a system called the Contract Net, in which a number of agents ('problem solving nodes' in Smith's parlance) solved problems by delegating sub-problems to other agents (Smith, 1977, 1980a, b). As the name suggests, the key metaphor is that of sub-contracting in human organizations. The Contract Net remains to this day one of the most influential multiagent systems developed.<sup>88</sup> It introduced several key concepts into the multiagent systems literature, including the economics metaphor and the negotiation metaphor.

In fact, "the encounters that occur among computing elements in a multiagent system are *economic* encounters, in the sense that they are encounters between *self-interested* entities" (Wooldridge, 2002, p. 9). First of all, consider this general definition (Smith, 1980a, p. 1104):

*Distributed problem solving* is the cooperative solution of problems by a decentralized and loosely coupled collection of knowledge-sources (*KS's*) (procedures, sets of production rules, etc.), located in a number of distinct processor nodes. The *KS's cooperate* in the sense that no one of them has sufficient information to solve the entire problem; mutual sharing of information is necessary to allow the group, as a whole, to produce an answer.

<sup>&</sup>lt;sup>87</sup> See for example the treatment of the concept (from economics) of *incentive contracting* in an artificial intelligence framework, in a paper by Kraus (1996) that provides both a survey and a model.

<sup>&</sup>lt;sup>88</sup> There are limitations, and proposed improvements. Fan, Huang, and Jin stated (2008, p. 603): "The CNP is a powerful coordination mechanism in multi-agent systems. However, the performance of the CNP degrades when the number of agents increases or the announcement is of high frequency. Hence, it has a problem of applicability to large-scale multi-agent systems. In order to overcome this problem, a personal assistant that may evaluate the other agents is proposed. It can avoid an announcement sent to redundant bidders, and only the best bidder sends the bid proposal."

By *decentralized* we mean that both control and data are logically and often geographically distributed; there is neither global control nor global data storage. *Loosely coupled* means that individual *KS*'s spend most of their time in computation rather than communication.

In Reid Smith's contract net protocol (1980a), the basic messages are treated as follows. Let us start with task announcements (Smith, 1980a, p. 1106):

A node that generates a task normally initiates contract negotiation by advertising existence of that task to the other nodes with a **task announcement** message. It then acts as the manager of the task. A task announcement can be addressed to all nodes in the net (*general broadcast*), to a subset of nodes (*limited broadcast*), or to a single node (*point-to-point*). The latter two modes of addressing, which we call *focused ad-dressing*, reduce message processing overhead by allowing nonaddressed nodes to ignore task announcements after ex-amining only the **addressee** slot. The saving is small, but is useful because it allows a node's communication processor alone to decide whether the rest of the message should be ex-amined and further processed. It is also useful for reducing message traffic when the nodes of the problem solver are not interconnected with broadcast communication channels.

There are four main slots in a task announcement, in Smith's contract net protocol: *eligibility specification, task abstraction, bid specification*, and *expiration time*. They are defined as follows (ibid.):

The **eligibility specification** is a list of criteria that a node must meet to be eligible to submit a bid. This slot reduces message traffic by pruning nodes whose bids would be clearly unacceptable. In a sense, it is an extension to the addressee slot. Focused addressing can be used to restrict the possible respondents only when the manager knows the *names* of appropriate nodes. The eligibility specification slot is used to further restrict the possible respondents when the manager is not certain of the names of appropriate nodes, but can write *a description* of such nodes.

The **task abstraction** is a brief description of the task to be executed. It enables a node to rank the task relative to other announced tasks. An abstraction is used rather than a complete description in order to reduce the length of the message.

The **bid specification** is a description of the expected form of a bid. It enables the manager to specify the kind of infor-mation that it considers important about a node that wants to execute the task. This provides a common basis for comparison of bids and enables a node to include in a bid only the information about its capabilities that is relevant to the task, rather than a complete description. This both simplifies the task of the manager in evaluating bids and further reduces message traffic.

The **expiration time** is a deadline for receiving bids. We assume global synchronization among the nodes. However, time is not critical in the negotiation process. For example, bids received after the expiration time of a task announcement are not catastrophic: at worst, they may result in a suboptimum selection of contractors.

Slot information is encoded in a high-level language understandable to all nodes, and called *common internode language*. It is supplemented with a programming language for transfer of procedures between nodes.

Another aspect of Smith's contract net protocol (CNET) is *task announcement processing* (Smith, 1980a, p. 1107):

In CNET, all tasks are typed. For each type of task, a node maintains a rank-ordered list of announcements that have been received and have not yet expired. Each node checks the eli-gibility specifications of all task announcements that it re-ceives. This involves ensuring that the conditions expressed in the specification are met by the node (e.g., MUST-HAVE

SENSOR). If it is eligible to bid on a task, then the node ranks that task relative to others under consideration.

Ranking a task announcement is, in general, a task-specific operation. Many of the operations involved in processing other messages are similarly task-specific. CNET defines a *task template* for each type of task. This template enables a user to specify the procedures required to process that type of task. In Appendix E we describe the roles of the required procedures, together with the default actions taken by CNET when the user chooses to omit a procedure.

Let us turn to *bidding*, in Smith's contract net protocol (ibid.):

announcement-ranking activity proceeds concurrently with task processing in a node until the task processor [...] completes processing of its current task and be-comes available for processing another task. At this point, the contract processor is enabled to submit bids on announced tasks. It checks its list of task announcements and selects a task on which to submit a bid. If there is only one type of task, the procedure is straightforward. If, on the other hand, there are a number of task types available, the node must select one of them. The current version of CNET selects the most recently received task (older tasks are more likely to have been already awarded).

An idle node can submit a bid on the most attractive task when either of the following events occur: 1) the node receives a new task announcement or 2) the expiration time is reached for any task announcement that the node has received. At each opportunity, the node makes a (task-specific) decision whether to submit a bid or wait for further task announcements. (In the *signal* task, a potential contractor waits for further an-nouncements in an attempt to find the closest manager.)

The template of a bid contains a *node abstraction slot*. That slot briefly describes which capacities the node has, that are relevant to the announced task. That same slot may also include a list of requirements: "Statements of this form are used by a bidder to indicate that it needs additional information if it is awarded the task." (ibid.).

Smith (1980a) also described how *bid processing* is done in his contract net protocol (ibid., p. 1107):

Contracts are queued locally by the manager that generated them until they can be awarded. The manager also maintains a rank-ordered list of bids that have been received for the task. When a bid is received, the manager ranks the bid relative to others under consideration. If, as a result, any of the bids are determined to be *satisfactory*, then the contract is awarded immediately to the associated bidder. (The definition of *satisfactory* is task-specific.) Otherwise, the manager waits for further bids.

Note that "a manager is not forced to always wait until the expiration time before awarding a contract" (Smith, ibid.). It may also be that at expiration time, the contract hasn't been awarded yet (Smith, 1980a, pp. 1107–1108):

If the expiration time is reached and the contract has not yet been awarded, several actions are possible. The appropriate action is task-specific, but the possibilities include: awarding the contract to the most acceptable bidder(s); transmitting another task announcement (if no bids have been received); or waiting for a time interval before transmitting another task announcement (if no acceptable bids have been received). This is in contrast to the traditional view of task allocation where the most appropriate node available at the time would be selected.

Successful bidders are informed that they are now con-tractors for a task through an **announced award** message. The **task specification** slot contains a specification of the data

needed to begin execution of the task, together with any ad-ditional information requested by the bidder.

Once a contract is awarded, some data structures are used for communication between the contractor and the manager, and possibly also for communication with other nodes. In particular (Smith, 1980a, p. 1108):

The *information message* is used for general communication between manager and contractor during the processing of a contract. [...] The *report* is used by a contractor to inform the manager (and other report recipients, if any) that a task has been par-tially executed (an *interim report*) or completed (a *final report*). The *result description* slot contains the results of the execution. Final reports are the normal method of result communication. Interim reports, however, are useful when generator-style control is desired. A contractor can be set to work on a task and instructed to issue interim reports whenever the next result is ready. It then suspends the task until it is instructed by the manager to *continue* (with an information message) and produce another result.

The manager can also terminate contracts with a *termination* message. The contractor receiving such a message terminates execution of the contract indicated in the message and all of its outstanding subcontracts.

Amigoni and Continanza (2012) address the problem of how to recruit agents to perform tasks:

[W]e aim to contribute to the further methodological growth of multiagent systems by identifying and formally studying a general problem that is related to the selection of agents to cope with given requests. More precisely, the problem we consider is to choose, or recruit, a subset of agents from a set of available agents, to satisfy a request. We call this problem the problem of recruitment of agents. The recruitment of agents is a general problem whose particular instances pervade the whole field of multiagent systems: from the selection of agents, considered as primitive components, for forming a multiagent system (Weiss, 1999), to the assignment of goals (Durfee et al., 1987), to the allocation of tasks (Gerkey and Mataric, 2004), to the matchmaking between requested and available resources (Klusch and Sycara, 2001). The purpose of this paper, theoretical in its nature, is to introduce a novel formal approach to the problem of recruitment of agents. We characterize each agent by a set of functions it requires or it can perform. The request and the availability can be intended as two sets of agents. Broadly speaking, the problem of recruitment is thus to select a subset of the available agents in such a way the functions they can perform "cover" the functions of the requested agents. Some constraints can be imposed on the set of recruited agents, leading to the definition of different kinds of recruitment. We study the problem of recruitment of agents by adopting the algebraic formalism of lattices (Birkhoff, 1967; MacLane and Birkhoff, 1979). [...]

Amigoni and Continanza (2012) described five scenarios in which the problem of recruitment arises, either when multiagent systems are running, or even when they are being designed:

In the field of multiagent systems, the problem of recruiting (selecting) the most suitable agents to satisfy a request arises in several situations. [...] The first scenario is related to the process of design and development of multiagent systems. Despite the lack of assessed methodologies for developing multiagent systems, it is widely recognized that agents have to be considered as reusable and composable items (Weiss, 1999). This idea pervaded the field since its early stages [...] One of the basic features that a methodology for developing multiagent systems is supposed to exhibit is the support to the reusability of agents as components. In this perspective, agents can be employed many times to compose different multiagent systems that address different applications. Several approaches

#### 6.1 Methods

have been proposed for supporting the development of systems composed of reusable agents, ranging from agent platforms (Ricordel and Demazeau, 2000) to service-oriented approaches (Singh and Huhns, 2005). From the point of view of the designer of a multiagent system, it is important to have a way to determine which agents, among those available, are the most adequate for a given application. Hence, the problem is to select, to recruit, the available agents that are the most suitable to form the multiagent system. [...]

As to the scenarios when multiagent systems are running, they include, e.g., *goal assignment* (ibid.):

The second scenario is related to the well-studied problem of assigning goals in a multiagent system (Durfee et al., 1987). Generally speaking, the distribution of goals among the agents can be performed statically by the designer or dynamically during the activity of the system, according to some criteria. One of these criteria states that a goal must be assigned to the most suitable agent (see Weiss, 1999, Chapter 2). Such goal assignment problems are usually encountered in agent-based collaborative design systems (Parunak et al., 1997; Darr and Birmingham, 1996). The goal assignment problem can be considered as a recruitment problem in which the request is a set of "ideal" agents, each one exhibiting the abilities (i.e., functions or services) needed to reach a goal, whereas the availability is the set of "actual" agents (with their abilities) that are candidate to reach the goals.

Another scenario is with subplan assignment (ibid.):

The third scenario is related to the allocation of subplans to the agents (see Weiss, 1999, Chapter 3). This situation can be viewed as a special case of the previous one, in which the goal to be reached is to execute a subplan. The aim of the subplan allocation is to find an effective distribution of the subplans such that they are executed by the most adequate agents. [...]

Yet another scenario is with the assignment of agents to tasks (ibid.):

The fourth scenario generalizes the previous two and is related to the associations between agents and tasks to be performed. In this case, agents have some skills and some of these skills are required to perform tasks (see Weiss, 1999, Chapter 7). This problem is often encountered when the agents try to find collaboration partners (Gerkey & Mataric, 2004) and in role exchanging (Zhang & Hexmoor, 2002). More precisely, the problem involves a set of agents, a set of tasks to be fulfilled, and a utility function that measures the fitness of an agent for a task (which depends on the abilities of the agent and on the abilities need to perform the task). The objective is to find agents that can perform the tasks and that maximize (a function involving) utility. Once again, we can formulate this problem as an instance of the problem of recruitment by considering the request as a set of "ideal" agents that possess the abilities needed for executing the tasks and the availability as a set of "actual" agents that are present in the system.

And then there is the problem of *matchmaking* by means of *middle-agents* who moderate the requests (ibid.):

The last scenario is related to the problem of matchmaking, in which middle-agents connect service provider agents with requester agents in open environments (Klusch and Sycara, 2001; Pour Ebrahimi et al., 2004). This problem has found many solutions, including market-based approaches like contract net (Smith, 1980a) and fuzzy matching<sup>89</sup> (Ogston and Vassiliadis, 2002). Usually, these solutions associate a service provider to a requester, but do not fully address the case in which many service providers are needed to satisfy a request. Also matchmaking can be interpreted as a problem of recruitment by considering

<sup>&</sup>lt;sup>89</sup> Fuzzy approaches are the subject of Section 6.1.15 in this book.

the request and the availability as sets of agents with the required and available services, respectively.  $[\ldots]$ 

In his discussion of agents in the context of investigative data mining, Mena (2003) is especially concerned with autonomous agent technology for intelligent retrieval from the Web or other sources (in a manner that conventional search engines cannot perform), based on different information types (e.g., documents in XML), to which they adapt their queries. Mena also discusses other applications of agents, e.g., as information-filtering agents (based on the security levels of users), and notification agents, giving special alerts to wireless devices. "When used in conjunction with other data mining technologies, [...] agents can assist investigators in accessing, organizing, and using current and relevant data for security deterrence, forensic analysis, and criminal detection" (Mena, 2003, p. 112). A case study in Mena's book is about a bio-surveillance agent for monitoring bio-terrorist attacks, and planned by DARPA<sup>90</sup> (ibid., section 4.10, pp. 117–120).

# 6.1.6.2 Multiagent Systems, Simulation and Geographic Space, in Tools for Training Police Officers

In Section 6.1.4, 'Geographic Information Systems for Mapping Crimes', we pointed out the distinction between visualisation on a geographical map of events that have actually occurred, and *geosimulation*. "Geosimulation (Benenson & Torrens, 2004) proposes the aggregation of Multi-Agent Systems (MAS) and Geographic Information Systems (GIS) for modeling and simulating urban phenomena" (Furtado & Vasconcelos, 2007, p. 57). Geosimulation "addresses an urban phenomena simulation model with a multi-agent approach to simulate discrete, dynamic, and event-oriented systems (Benenson & Torrens, 2004).

In geosimulated models, simulated urban phenomena are considered a result of the collective dynamic interaction among animate and inanimate entities that compose the environment. The Geographic Information System (GIS) is responsible for providing the 'data ware' in geosimulations" (ibid., p. 59). Gimblett (2002) is an edited volume about the integration of geographic information systems and agent-based modelling techniques for simulations, the applications being social or ecological.

Vasco Furtado and Eurico Vasconcelos (2007), of the University of Fortaleza in Brazil, have described the *ExpertCop* tutorial system, "a geosimulator of criminal dynamics in urban environments that aims to train police officers in the activity of preventive policing allocation" (ibid., p. 57). "In ExpertCop, the students (police officers) configure and allocate an available police force according to a selected geographic region, and then follow the simulation process" (ibid.).

The *Pedagogical Agent*, an intelligent automated tutor, helps the students to interpret the results, "by observing how crime behaves in the presence of the allocated preventive policing. The interaction between domain agents representing social

<sup>&</sup>lt;sup>90</sup> DARPA is the United States' Defense Advanced Research Projects Agency.

entities such as criminals and police teams allocated by the students drives the simulation" (ibid.). The *Pedagogical Agent* "seeks to explain the model at the macro-level (global or emergent behavior) and micro-level (behavior of the agents individually)" (ibid.). "At the micro-level, the [Pedagogical A]gent uses the steps given in the decision-making process of each agent to explain individually each event that occurred in the simulation. At the macro-level, the [Pedagogical A]gent uses the data mining process to identify the system's patterns of behavior" (ibid., p. 78).

The architecture of *ExpertCop* comprises a user interface, a multiagent systems platform, a geographic information system, and a database. "The GIS is responsible for generating, manipulating and updating a map of the area on a small scale. The map contains geographical and statistical layers, representing the characteristics of the area such as streets, demographic density, traffic signs, slums, commercial areas, etc. The GIS agent makes it possible for the other system agents to interact with the map by creating patrol areas, identifying structures and distances, identifying the domain agent positions, plotting them and allowing them to move about the map" (ibid., p. 62).

"The criminals are the most important agents in the model" (ibid., p. 63), and "[t]heir internal architecture" consists of "three modules: perception, cognition and performance" (ibid.). "[S]pecific evaluation criteria are selected in the internal state, such as *risk, opportunity* and *reward*. [...] In the case of ExpertCop, only one type of evaluation is made, to commit a crime or not" (ibid., p. 64). "ExpertCop works only with robberies, thefts, and burglaries, which are types of crime influenced directly by preventive policing" (ibid.).

*Risk* is based on variables which include the type of crime (the risk level being "based on the type of punishment for the crime, on the level of experience and on the apparatus of the criminal" (ibid.)), the type of target –which "indicates the capacity of resistance against a crime" (ibid.), and that in *ExpertCop* is any of: "persons, vehicles, residences, gas stations, drugstores, lottery houses, banks and commercial establishments" (ibid., p. 66) – police presence, public illumination, and existence of escape routes (ibid.).

*"Benefit* is defined based on the type and amount of goods the target can offer" (ibid.). *"Personality* defines the criminal's 'courage' vis-à-vis the crime. When being created, a type of personality is randomly associated to the criminal (apprehensive, careful, fearless, and bold). A 'bold' criminal evaluates risk with fewer criteria, giving more weight to the benefit. But an 'apprehensive' criminal does the opposite, giving much more weight to risk" (ibid.).

Furtado and Vasconcelos further report (ibid.):

Another ongoing work aims at transforming ExpertCop into a decision-making support tool. In doing so, we are aware that the accuracy of the simulation model is essential. Therefore we have adopted a different approach for the crime simulation model. Instead of cognitive agents, criminals are reactive agents with behavior driven by real crime data and the statistical distribution of crime in urban areas. We model the criminal as distributed entities with the ability to demonstrate self-organization from their individual (local) activities as well as taking into consideration the influence of other criminals in the community where they live (Furtado et al., 2006). We are also designing an evolutionary approach that integrates with the simulation tool and is devised to assist police officers in the design of effective police

patrol routes. Our approach is inspired by the increasing trend of hybridizing multi-agent systems with evolutionary algorithms. Our idea is to uncover strategies for police patrolling that cope with the dynamics of the crime represented by criminals that learn 'on the fly'. To uncover good police patrol routes in this context, we are integrating into the simulation model a genetic algorithm.<sup>91</sup> Preliminary experiences have shown that such an approach is very promising (Reis et al., 2006). Our long-term challenge is then to design and integrate educational strategies into a much more accurate crime simulation model.

CACTUS features another application of simulation to the training of police officers (Hartley & Varley, 2001). CACTUS is a multiagent simulation system. By using CACTUS, police officers are trained in managing public order events, and the tool is intended for helping them to develop strategic and contingency planning skills. There is simulation, and there is debriefing. The trainees use CACTUS collaboratively, as a team. A trainer acts as a facilitator, mediating among them, while they communicate among themselves the way they would doing in a real situation.

# 6.1.7 The Challenge of Handling a Disparate Mass of Data

## 6.1.7.1 Data Warehousing

*Data warehousing* is the "assembling a cohesive view of customers from multiple internal databases coupled with external demographic data sources", or also: "the practice of compiling transactional data with lifestyle demographics for constructing composites of customers and then decomposing them via segmentation reports and data mining techniques to extract profiles or 'views' or who they are and what they are" – a now standard notion from the computer science curriculum, but that here we have quoted as two definitions formulated by Mena (2003, pp. 4, 40), who noted that by the time he was writing, they had not yet been applied to criminal detection and security deterrence, and just yielded the potential of application to those areas.

Mena recommends (2003, p. 40) to test the data, using a subset of the entire data, and crucially, with a clear objective. With proper data mining, hidden patterns of behaviour of the persons involved will hopefully emerge. Some of the databases provide demographic data, or then credit data, but there also exist sources of criminal data, such as, in the United States, the National Law Enforcement Telecommunications System (NLETS), "a nationwide network that links all states and many federal agencies together for the exchange of criminal justice information" (Mena, 2003, p. 50), as well as the FBI's National Crime Information Center (NCIC). Other sources are DNA databases, and firearm databases. Yet another source is the log files generated by Web servers,<sup>92</sup> recording every transactions between the server and browsers. Moreover, servers write cookies to a browser's

 $<sup>^{91}</sup>$  Genetic algorithms are the subject of Section 6.1.16.1 in this book.

 $<sup>^{92}</sup>$  Tsai and Chan (2007) discussed the detection of cyber security threats in weblogs by using probabilistic models.

hard disk, so that the website can recognise returning visitors – something also enabled by another data set: Web bugs, i.e., invisible bits of code. These also alert if an email has been opened, or an embedded link was clicked on (Mena, 2003, pp. 57–59).

#### 6.1.7.2 XML for Interoperability Between Data Sources

Typically, the databases you may find available, for them to be integrated into a *data warehouse* – this being (for our present concerns) in order to carry out investigative data mining – were devised for applications other than data mining. To provide interoperability among disparate systems, different kinds of data sets can be merged by using XML.<sup>93</sup> In particular, like for various other disciplines, XML standards have been developed for legal documents; this was done by non-profit organisations such as LegalXML.<sup>94</sup> Also see Leff (2001).

One resorts to XML syntax in order to mark up data, and the labels inserted come in pairs: it is like opening and closing a parenthesis. Such "parentheses" are typically nested inside each other. The nesting constitutes a hierarchy (a tree of attributes). The labels correspond to some semantics that we wish to convey to the computer about what these data are. Moreover, there are schemata that describe permissible structures of the nesting in the XML representation. This makes XML representations quite flexible.

In the 1980s, there was a school within database design research that advocated a kind of relational databases, such that the relations be not just flat tables, but would allow embedding. This was the *nested relations* school. In practice however, at the time that research community favoured shallow nesting, and developing the mathematics for handling this. By contrast, in XML and its parent-language, SGML, the depth of nesting is unlimited. SGML was originally devised for communicating structured documents.<sup>95</sup>

<sup>&</sup>lt;sup>93</sup> The popularity of XML (Extensible Markup Language) stems from its role as a standard within Web technology (it was endorsed institutionally), and is reflected in a multitude of coding languages and applications making use of it, as well as in a literature comprising textbooks or reference books (Light, 1997; Holzner, 1998; Nakhimovsky & Myers, 2002), conference proceedings (Fuhr, 2006; Bressan, 2003; XML, 2002), and dissertations (Minh, 2007), as well as in reports in the information media.

<sup>94</sup> http://www.legalxml.org

<sup>&</sup>lt;sup>95</sup> In the 1980s and later, this has also been the case of my own approach to nested relations: I advocated that the nesting should be deep and flexible, unlike in the mainstream of database design research into nested relations. This, along with the applicational thrust of what I had been developing, did not militate toward a favourable appreciation by the nested relations community of RAFFAELLO (my tool for retrieval from nested relations) and CuProS (Customization Production Systems) — itself, a ruleset- or formal grammar description of how the nesting of attributes is allowed to be within given types of nested relations). In retrospect, the applicational thrust of the RAFFAELLO project had been quite warranted: the quite similar concept of XML has at present a great appeal, for quite various applications, and the emergence of the World Wide Web has much favoured this.

Deep nested relations *could* be represented in some formal approaches from the 1980s and early 1990s, but it is the flexibility that eluded them. Nested relations emerged, in relational database

XML originated from the Standard Generalized Markup Language, SGML for short,<sup>96</sup> that was designed in the 1980s, and is defined in ISO Standard 8879. SGML enabled a formal definition of the component parts of a publishable data set, and when designed, it was primarily intended as a tool enabling publishable data (such as technical documentation) to be interchanged between, for example, authors or originators, and publishers. By the late 1980s, early digital media publishers had understood the versatility of SGML for dynamic information display. The main historical interest now of SGML is that it was simplified into XML, the Extensible Markup Language, that is at the foundation of the area of research known now as the *Semantic Web*: the use of a *semantic web* makes it possible for online textual (or multimedial) searches to find content based on meaning and context, as opposed to conventional search engines that only find documents containing specific user-defined words or phrases. Most of XML comes from SGML unchanged. Now XML is even appearing as a data type in some other languages.<sup>97</sup>

This implies that an UR interface can be implemented by using the nested UR model, thus gaining the full advantages of nested relations over flat relations" (Levene, 1992, abstract). Levene's formalisation incorporated null values into the model. Also see Levene and Loizou (1993, 1994). Incidentally, apart from relational databases, Levene has also done (with Poulovassilis) some work on a nested-graph database model for representing and manipulating complex objects (Poulovassilis & Levene, 1994).

More recent work on nested relations includes Bertino, Catania, and Wong (1999) and Garani (2004, 2008). Georgia Garani (whose 2004 Ph.D. is from Mark Levene's department at Birkbeck College in London) distinguishes nested attributes as decomposable and non-decomposable (Garani, 2008). Overcoming a once popular maxim in nested relations research ("Unnesting and then nesting on the same attribute of a nested relation does not always yield the original relation"), Garani (2008) has proven that "for all nested relations, unnesting and then renesting on the same attribute yields the original relation subject only to the elimination of duplicate data".

<sup>96</sup> The literature about SGML includes Goldfarb (1990), Bryan (1997), Smith (1992), and Spivak (1996).

design research, out of the desire to generalise flat relations, so that hierarchically structured objects could be modelled directly. Paper collections appeared (Abiteboul, Fischer, & Schek, 1989; Özsoyoğlu, 1988). Normal forms were introduced for nested relations (Özsoyoğlu & Yuan, 1987), in the tradition of normal forms from relational databases.

Mark Levene introduced important variants of nested relations (Levene, 1992; Levene & Loizou, 1990). In particular, he combined the *universal relation model* – which allows the user to view the database as though it was just one flat relation, in the space of all attributes of the database: it was the subject of my early research (Nissan, 1982, 1983, 1987c) – with nested relations, into an approach called the *nested universal relation model* (Levene, 1992). Levene's model offered the following advantages: "Functional data dependencies and the classical notion of lossless decomposition are extended to nested relations and an extended chase procedure is defined to test the satisfaction of the data dependencies. The nested UR [i.e., universal relation] model is defined, and the classical UR model is shown to be a special case of the nested model.

<sup>&</sup>lt;sup>97</sup> SGML's and XML's idea of trees of data, that can be conceived of as embedded parentheses with an unlimited depth of nesting, described in a meta-schema, was also separately attained in the 1980 in the RAFFAELLO representation language, with its CuProS meta-representation language – on which, see now Nissan (2010c) and Nissan & El-Sana (2012). They were originally described in Nissan (1986, 1987a, 1988, 1999). The original application was to lexical databases (Nissan, 1988, 1999), catering and terminal food-processing (Nissan, 1987b), and law (Nissan, 1992) – the latter application being a combined representation of Italy's regional constitutions (*Statuti Regionali*).

There is one aspect of XML that was first formalised in XML (rather than SGML), but had been first successfully implemented in a number of projects, one of these being in lexicography: the software from the University of Waterloo, Canada, New Oxford English Dictionary Project. That aspect is the notion of *well-formedness*, as opposed to *validity*. Well-formedness enables parsing without a schema. By contrast, an XML document being valid means that it contains a reference to a schema (a Document Type Definition, or DTD), and abides by that schema. The schema itself is a grammar. There are various schema languages for XML. The oldest of these is DTD, that XML inherited from SGML. But XML DTDs are simpler than SGML DTDs.

It is typical for webpages to be coded in HTML: labels of HTML are interspersed within the textual content, and the identifiers of graphic material. HTML handles presentation, not content, which is what XML is supposed to do. If one was to search an HTML Web page for content, one could only look for the occurrences of given strings. This is because the only function of the syntax of HTML is to structure the presentation, regardless of the meaning of the content. In XML, instead, the syntax is meant to describe the semantics of the content, whereas a separate module, called a stylesheet, states how the syntactic units extracted from an XML document are to be displayed. It is not the case that the entire content of the stored data has to be displayed, only their layout will be different. In fact, it may be possible to only extract some of the information, as enclosed by given tags which constitute semantic attributes; it's the data retrieved in response to a query that will be displayed as instructed by the stylesheet, and the query itself is actually specified inside the stylesheet along with the specification of how to display the results.

Furthermore, as mentioned earlier, a separate module, called DTD (for Document Type Definition) will describe admissible structures of the semantic attributes with respect to each other, the way they can appear inside the XML document. That is to say, the DTD is the schema of a database, whose instances are the respective XML documents.

There are some minor problems with terminology, when dealing with both XML and databases, because the term 'attribute' and the term 'entity' are used differently in the XML literature and in the database literature. Here is a standard XML

As to the food processing project, this was a relatively minor project, punningly named FIDEL GASTRO (after *gastronomy*), and that I had my undergraduate students implement in 1987. It was considered valuable enough for a journal in hospitality management to publish a paper on this application to large kitchens. FIDEL GASTRO finds now a parallel in a function of the so-called Microsoft Home, introduced in 2004, and reportedly first inhabited by Bill Gates and his family. Even though the Microsoft Home uses radio-frequency identification tags for inventory tracking, the basic function is like that of my 1987 project. Barron (2004), describing the Microsoft Home, wrote: "The network knows, for example, what ingredients are available in the kitchen. If the makings for chocolate chip cookies are not at hand, it will suggest a recipe for oatmeal cookies, assuming these ingredients are on the shelf" – and this is precisely what FIDEL GASTRO was doing. Incidentally, bear in mind that catering is a subject complex enough to be taught at vocational schools, and that there exist textbooks, e.g. Kinton, Ceserani, and Foskett (1992).

definition for 'attribute': "A name-value pair, separated by an equals sign, included inside a tagged element that modifies certain features of the element. All attribute values, including things like size and width, are in fact text strings and not numbers. For XML, all values must be enclosed in quotation marks".

This is very much like some HTML declarations of tables, or of the inclusion of images, and the like. What is meant by 'attribute' in database terminology, is called an 'element' in the jargon of XML, and what in database terminology is "the value of the attribute", in XML is the content of the element. If a string, this is referred to as data of the PCDATA type. If, instead, something that is nested inside the current element, then this aggregate is made of sub-elements of that element.

Consider a database relation schema, whose attributes ("attributes" as meant in database terminology, that is, "elements" in XML) are:

FORENAMES SURNAME EMPLOYMENT PLACE\_OF\_RESIDENCE MARITAL\_STATUS DEPENDENTS REFERENCES.

One straightforward way to represent in XML such a relation for the given individual, Donald Duck, would be to simply enclose the value of each relation attribute between two tags, <FORENAME> and </FORENAME>, and so forth:

### <PERSON>

<forenames></forenames>	Donald 1</th <th>FORENAMES&gt;</th>	FORENAMES>
<surname> I</surname>	Ouck <td>RNAME&gt;</td>	RNAME>
<employment></employment>	unemployed	
<place_of_residence> Duckburg </place_of_residence>		
<place_of_birth> Granny McDuck's Farm </place_of_birth>		
<marital_statu< td=""><td>S&gt; unmarried</td><td></td></marital_statu<>	S> unmarried	
<dependents></dependents>	Hewey	
<dependents></dependents>	Louie	
<dependents></dependents>	Dewey	
<references></references>	Scrooge McDuc	k
<references></references>	Daisy Duck	
<references></references>	Mickey Mouse	

Such a slavish rendering into XML of the database relation lifted from a relational database grossly underexploits the capabilities of XML. To start with, mainstream relational database technology stores the data in flat relations, that is, tables. In the 1980s and early 1990s, several database researchers tried to promote an alternative kind of relational databases, in which tables could be nested inside

each other, or, to say it otherwise, attributes may be nested as being the value of another attribute. In artificial intelligence representations, too, frames usually are hierarchies of properties: the values are the terminal nodes in a tree with, say, three generations. Conceptually, such were some of the ideas that can be detected behind the rise of XML, as being a coding in which you can actually nest any levels of attributes inside each other. For example, the same XML file could store a much richer relation than the above, still for the individual whose name is Donald Duck:

```
<PERSON>
    <NAME>
      <FORENAME> Donald </FORENAME>
      <SURNAME>
          <CURRENT> Duck
                            </CURRENT>
          <AS RECORDED AT BIRTH>
                 McDuck
  </AS RECORDED AT BIRTH>
      </SURNAME>
    </NAME>
    <EMPLOYMENT RECORD>
      <CURRENT EMPLOYMENT>
         unemployed
      </CURRENT EMPLOYMENT>
      <PREVIOUS EMPLOYMENT>
         <CATEGORY>
                     sailor
                             </CATEGORY>
         <CATEGORY>
                      farm hand </CATEGORY>
                    1936
         <FROM>
                           </FROM>
         <UNTIL>
                    1937
                           </UNTIL>
      </PREVIOUS EMPLOYMENT>
      <PREVIOUS EMPLOYMENT>
         <CATEGORY> factotum
                               </CATEGORY>
         <EMPLOYER> Scrooge McDuck </EMPLOYER>
         <WHEN>
                   often
                            </WHEN>
         <MODE> short-term informal contract </MODE>
      </PREVIOUS EMPLOYMENT>
    </EMPLOYMENT RECORD>
    <PLACE OF RESIDENCE>
         <TOWN>
                    Duckburg
                              </TOWN>
         <STATE>
                   California
                             </STATE>
    </PLACE OF RESIDENCE>
    <PLACE OF BIRTH>
         <PLACE> Granny McDuck's Farm </PLACE>
        <COUNTY>
                     Duckburg
                                </COUNTY>
         <STATE>
                   California
                               </STATE>
    </PLACE OF BIRTH>
```

```
<MARITAL STATUS> unmarried </MARITAL STATUS>
    <DEPENDENTS>
       <MINOR>
                     Hewev </NEPHEW>
          <NEPHEW>
          <NEPHEW>
                     Louie </NEPHEW>
          <NEPHEW>
                     Dewey </NEPHEW>
       </MINOR>
       <SENIOR>
                    Scrooge McDuck </UNCLE>
          <UNCLE>
       </SENIOR>
    </DEPENDENTS>
    <REFERENCES>
                      Daisy Duck
                                 </REFERENCES>
    <REFERENCES>
                      Mickey Mouse </REFERENCES>
</PERSON>
```

The syntax of XML requires that the hierarchical structure have one and just one root, which here is PERSON. Let the XML code of the example given above be stored in a file called duck1.xml It will have to be preceded by two initial XML statements, respectively specifying under which version of XML and with which alphanumeric encoding that file has to be processed; and to which stylesheet type and given stylesheet file the given XML file should be linked:

<?xml version="1.0" encoding="UTF-8"?> <?xml-stylesheet type="text/xsl" href="nicestyle3.xsl"?>

Now, let us define the DTD for the XML nested relation in which we stored information about Donald Duck. We want to state that:

- The root element is PERSON.
- The root element contains one NAME element.
- The root element contains zero or one elements of each of the following: EMPLOYMENT\_RECORD, PLACE\_OF\_RESIDENCE, PLACE\_OF\_BIRTH (it may be absent for some reason), MARITAL\_STATUS} (it also may be absent, for example if unknown, or not relevant, or even deliberately withheld), and MARITAL\_STATUS may or may not include an element SPOUSE.
- The root element contains zero or more elements of each of the following: DEPENDENTS (not anybody has other people legally depending on him or her), REFERENCES.
- Each NAME element is expected to contain either one or more strings (the symbol standing for a string in a DTD is #PCDATA), or one or more FORENAME and one or more SURNAME, and moreover, these may contain just a value, or, then, zero or more CURRENT, PREVIOUS, and AS\_RECORDED\_AT\_BIRTH. The symbol | stands for "or".
- Element EMPLOYMENT\_RECORD may include one or more strings, or then, zero or more elements for CURRENT\_EMPLOYMENT and for

PREVIOUS\_EMPLOYMENT, and these possibly contain a further level of nesting, including zero or more CATEGORY elements and zero or one FROM, UNTIL, or WHEN elements.

- Elements PLACE\_OF\_RESIDENCE and PLACE\_OF\_BIRTH include some string, or zero or one PLACE, COUNTY, STATE}, and COUNTRY.
- DEPENDENTS may include some string, or zero or more of: MINOR, SENIOR.
- SPOUSE, REFERENCES, or elements inside MINOR or SENIOR may each include just a string, or a NAME element, or a LINK\_TO\_PERSON element.
- MINOR may include one or more of: CHILD, GRANDCHILD, NEPHEW, GREATNEPHEW, COUSIN.
- SENIOR may include zero or more of: PARENT, GRANDPARENT, UNCLE, GREATUNCLE, COUSIN (a child may be grown-up and thus no longer or minor age, yet be otherwise legally a minor).

The DTD is coded as follows.

<?xml version="1.0"?> <!ELEMENT PERSON (NAME, EMPLOYMENT RECORD+. PLACE OF RESIDENCE+, PLACE OF BIRTH+, MARITAL STATUS+, DEPENDENTS\*, REFERENCES\*)> <!ELEMENT NAME (#PCDATA+ | (FORENAME\*, SURNAME\*))> <!ELEMENT FORENAME (#PCDATA+ | (CURRENT\*, PREVIOUS\*, AS RECORDED AT BIRTH\*))> <!ELEMENT SURNAME (#PCDATA+ | (CURRENT\*, PREVIOUS\*, AS RECORDED\_AT\_BIRTH\*))> <!ELEMENT CURRENT (#PCDATA\*)> <!ELEMENT PREVIOUS (#PCDATA\*)> <!ELEMENT AS RECORDED AT BIRTH (#PCDATA\*)> <!ELEMENT EMPLOYMENT RECORD (#PCDATA+ | (CURRENT EMPLOYMENT\*, PREVIOUS EMPLOYMENT\*))> <!ELEMENT CURRENT EMPLOYMENT (#PCDATA+ | (CATEGORY\*, FROM+, UNTIL+, WHEN+))> <!ELEMENT PREVIOUS EMPLOYMENT (#PCDATA+ | (CATEGORY\*, FROM+, UNTIL+, WHEN+))> <!ELEMENT PLACE\_OF\_RESIDENCE

```
(#PCDATA+ | (PLACE+, COUNTY+, STATE+, COUNTRY+))>
<!ELEMENT PLACE OF BIRTH
     (#PCDATA+ | (PLACE+, COUNTY+, STATE+, COUNTRY+))>
<!ELEMENT MARITAL STATUS (#PCDATA*, SPOUSE*)>
<!ELEMENT DEPENDENTS (#PCDATA*, MINOR*, SENIOR*)>
<!ELEMENT
          MINOR (#PCDATA*, CHILD*, GRANDCHILD*,
                  NEPHEW*, GREATNEPHEW*, COUSIN*)>
          SENIOR (#PCDATA*, PARENT*, GRANDPARENT*,
<!ELEMENT
                  UNCLE*, GREATUNCLE*, COUSIN*)>
<!ELEMENT
          SPOUSE
                   (#PCDATA*, NAME+, LINK TO PERSON)>
<!ELEMENT LINK TO PERSON (#PCDATA*)>
                   (#PCDATA*, NAME+, LINK_TO_PERSON)>
<!ELEMENT
          CHILDN
          PARENT
                   (#PCDATA*, NAME+, LINK TO PERSON)>
<!ELEMENT
<!ELEMENT
          GRANDPARENT
                   (#PCDATA*, NAME+, LINK TO PERSON)>
          UNCLE (#PCDATA*, NAME+, LINK TO PERSON)>
<!ELEMENT
          GREATUNCLE (#PCDATA*, NAME+, LINK_TO_PERSON)>
<!ELEMENT
<!ELEMENT
          NEPHEW
                    (#PCDATA*, NAME+, LINK TO PERSON)>
<!ELEMENT GREATNEPHEW (#PCDATA*, NAME+, LINK TO PERSON)>
                   (#PCDATA*, NAME+, LINK TO PERSON)>
<!ELEMENT
          COUSIN
          PLACE
                  (#PCDATA*)>
<!ELEMENT
<!ELEMENT
          COUNTY
                    (#PCDATA*)>
<!ELEMENT
          STATE
                  (#PCDATA*)>
          COUNTRY (#PCDATA*)>
<!ELEMENT
<!ELEMENT
          CATEGORY (#PCDATA*)>
<!ELEMENT
          FROM
                  (#PCDATA*)>
                  (#PCDATA*)>
<!ELEMENT
          UNTIL
<!ELEMENT WHEN
                   (#PCDATA*)>
```

The meaning of the notation can be understood by comparing this code with the explanation with which it was foreworded. Ishikawa, Yokohama, Ohta, and Katayama (2005) discussed mining XML structures based on statistics. Lee and Hwang (2005) discussed a method for retrieving similar XML documents.

## 6.1.7.3 Ontologies

Structuring conceptual relations by using *ontology* languages (and XML can be adapted into such a task) is a development of what in AI from the 1970s and 1980s used to be *semantic networks*, i.e., networks drawn as graphs whose nodes are concepts, and whose arcs (edges) are labelled with relationships between those concepts. The application of *ontologies* has mushroomed, and at present there exists a body of research into *data mining with ontologies* (Nigro, González Císaro, & Xodo, 2008). Mena's (2003) *Investigative Data Mining for Security and* 

*Criminal Detection* does not mention ontologies, but by the early 2010s the times are mature for considering ontologies as well, when devising applications for law enforcement.<sup>98</sup>

From the late 1960s to the 1980s, *semantic networks* have been a prominent kind of knowledge representation in artificial intelligence.<sup>99</sup> In 1975, Gary Hendrix introduced *partitioned semantic networks*, i.e., such semantic networks that apart from being drawn as graphs with nodes and labelled arcs, also allow arcs and nodes to be bundled together into spaces (drawn as rectangles), that are themselves joined by arcs (Hendrix, 1979).

Various kinds of semantic networks were developed during the 1970s and 1980s. During the 1990s and 2000s, semantic networks further spread, in practice becoming the conceptual centrepiece of *ontologies*. The two concepts are not identical, though, but the latter are rooted in the former. The stress in using ontologies is on uniform communication and shared understanding (Uschold & Grüninger, 2004). John Sowa was conspicuous in semantic or associative networks (Sowa, 1991, 1994, 2006), and he also turned to the discourse of ontologies, with its partly new terminology (Sowa, 1995). The term 'ontology' in computer science became popular in the 1990s, apparently following Gruber (1993, cf. 1995), but it was in use already in the 1980s within artificial intelligence. "A specification of a representational vocabulary for a shared domain of discourse — definitions of classes, relations, functions, and other objects — is called an ontology" (ibid., in the abstract).

The difference between semantic networks and ontologies as being a formalism for organising concepts is that the stress in ontologies is "shared understanding", for it to function as a unifying framework. Shared understanding is itself considered to be a requirement: for good communication; for identifying requirements for any system (e.g., software) to be developed so that it could be specified properly; and for interoperability, and possibly reuse and sharing, as well as so that formal representation would enable the automation of consistency checking, thus improving reliability.

We quote from Uschold and Grüninger (1996):

'Ontology' is the term used to refer to the shared understanding of some domain of interest which may be used as a unifying framework to solve the above problems in the above-described manner. An ontology necessarily entails or embodies some sort of world view with respect to a given domain. The world view is often conceived as a set of concepts (e.g. entities, attributes, processes), their definitions and their inter-relationships; this is referred to as a *conceptualisation*. Such a conceptualisation may be implicit, e.g. existing only in someone's head, or embodied in a piece of software. [...] However, the more standard usage and that which we will adopt is that the ontology is an explicit account or representation of [some part of] a conceptualisation.

<sup>&</sup>lt;sup>98</sup> Munn and Smith (2008) try to relate ontologies as being structured, automated representations developed within knowledge engineering (their examples are from medicine and biology), to *philosophical ontology*: in philosophy, ontology is the discipline concerned with how things in the world are divided into categories, and how these categories are related.

<sup>&</sup>lt;sup>99</sup> Sowa (2006, 1991), Findler (1979), Lehmann (1992), Maida and Shapiro (1982), Woods (1975), Steyvers and Tenenbaum (2005).

What does an ontology look like? An [explicit] ontology may take a variety of forms, but necessarily it will include a vocabulary of terms and some specification of their meaning (i.e. definitions). The degree of formality by which a vocabulary is created and meaning is specified varies considerably. [...] A formal ontology is a formal description of objects, properties of objects, and relations among objects. This provides the language that will be used to express the definitions and constraints in the axioms. This language must provide the necessary terminology to restate the informal competency questions. If we are designing a new ontology, then for every informal competency question, there must be objects, attributes, or relations in the proposed ontology or proposed extension to an ontology, which are intuitively required to answer the question. [...]

Ontologies (Uschold & Grüninger, 1996, 2004) have become widespread, in applied computing, and there is much research ongoing within computer science.<sup>100</sup> There may be *domain ontologies*, that are specialised per specific domains, and *upper ontologies*, that are general common sense that applies across a wide range of domains. An important example of the latter is the CYC project (Lenat & Guha, 1990). One also speaks of *ontology engineering*, i.e., the set of techniques for building ontologies.<sup>101</sup> This is a subfield of knowledge engineering. Arrigoni Neri and Colombetti (2009) remarked:

An ontology designed to represent the knowledge about a specific domain is usually not directly suitable for esource [i.e., electronic source] metadata. In general, an ontology engineer designs the ontology as a collection of concepts, more or less organised in taxonomies. Then he uses language constructs to further constrain ontology interpretations and finally he fills its ontology with some relevant individuals. The result is that some domain terms are used as concepts, while others are used as individuals. The level of this division largely depends on designer preference and the specific goal the ontology is designed for.

There exist various special ontology languages (*OWL* is popular), and there are description logics for ontologies,<sup>102</sup> but one could also resort to general programming languages, such as *Prolog* or *Lisp*, in order to represent ontologies, or then one may store these in data structures, to be manipulated by languages such as *C*++ or *Java*. For example, Astrova and Kalja (2008) reported about storing *OWL* ontologies in *SQL3* object-relational databases.<sup>103</sup>

An ontology (as meant in computer science) is a formal representation of a set of concepts and the relations among them, within a given domain (or in general common sense). Ontologies are important for the purpose of enabling knowledge sharing and reuse. Typically, an ontology includes individuals, classes of individuals (instances or objects), attributes of objects or classes, and relations. Relations are often drawn as arcs in a graph, whose nodes are individuals or classes. Moreover, there may also be *restrictions* (necessary conditions), and *if/then rules*, that augment

<sup>&</sup>lt;sup>100</sup> E.g., see Staab and Studer (2009), Grüninger and Lee (2002), and Uschold (2005).

<sup>&</sup>lt;sup>101</sup> E.g., see Gómez-Pérez, Fernández-López, and Corcho (2004), De Nicola, Missikoff, and Navigli (2009), Orgun and Meyer (2008), Gruber (1995), Lam (2007), and Toppano, Roberto, Giuffrida, and Buora (2008).

<sup>&</sup>lt;sup>102</sup> Description logics for ontologies are the subject of Sattler (2003) and Baader et al. (2003).

<sup>&</sup>lt;sup>103</sup> Conference series sometimes combine, in their scope, databases and ontologies (Catarci & Sycara, 2004; ODBASE, 2005).

the representation. There may be as well events, that change attributes or relations. And there may be axioms (but by these, when dealing with ontologies, one means not only a priori knowledge, but also the theory derived).

Just as methods from artificial intelligence have become mainstream and incorporated in some other areas of the practice of computing, the same has happened with ontologies. Traditionally and at present, too, ontologies are important in computational linguistics.<sup>104</sup> *WordNet* is a well-known monolingual English lexicon.<sup>105</sup> Another important area of application of ontologies is the Semantic Web.<sup>106</sup> There are applications of ontologies to information-providing dialogue-systems: in Sweden, Annika Flycht-Eriksson completed a doctoral dissertation (2004) on the design and use of ontologies in such systems.

Ontologies are also important for enterprise architectures, because of the need to communicate; e.g., they are a cost factor in enterprise integration (Goranson et al., 2002). Ontology-based integration of information is a main purpose of ontologies, and various approaches to doing this exist (e.g., Wache et al., 2001). Integrating disparate kinds of information can be quite difficult, all the more so if the data reside outside a single organisation. Access to remote data is essential for investigative data mining as desirable for law enforcement agencies. Large governmental agencies themselves have their own, different information systems. A "data-integration issue that may limit the type of information available for some investigative data mining projects" (Mena, 2003, p. 65) is the data residing in multiple, remote locations, "which may mean that these sources must be accessed via LANs, WANs, Intranet, dial-up, wireless, Internet, or proprietary closed, secured networks. This may mean that control and access is by a third party and the data is not in a centralized repository or data warehouse" (ibid.). But, we add, such disparateness is itself a possible area of application of ontologies.

<sup>&</sup>lt;sup>104</sup> See Calzolari, Monachini, Quochi, Socia, and Toral (2010), Hirst (2004), Aussenac-Gilles and Sörgel (2005), and Poesio (2005). In a special sense, the motivation for developing ontologies in computer applications has an important precedent in the work of corporate terminologists (e.g., at Airbus), as opposed to state institutions that in some countries (e.g., France and Israel) approve terminology. Unlike at such state institutions, the knowhow of corporate terminologists comes close to concepts that are current in ontology development. In artificial intelligence, the emergence of ontologies was contextually different from the emergence of semantic networks, even though without a grasp of the latter, ontologies would not have emerged. Namely, the need for ontologies was felt when developing very large knowledge bases. But no matter how simple your artificial intelligence application, you are not unlikely to be using a semantic network, and actually *Prolog* students often learn that language by first programming some rudimentary semantic network. The work of terminologists proper has benefited from the burgeoning state of the art of ontologies as being an area of computer science.

<sup>&</sup>lt;sup>105</sup> Concerning *WordNet*, see Fellbaum (1998), and see http://wordnet.princeton.edu/ Besides, Lenci et al. (2000) discussed SIMPLE, a framework for the development of multilingual lexicons.
<sup>106</sup> Berners-Lee, Hendler, and Lassila (2001) is a popularistic introduction to the Semantic Web. Also see Michael Uschold's (2003) "Where Are the Semantics in the Semantic Web?". Maedche and Staab (2001) reported about ontology learning from the Semantic Web. Fensel, van Harmelen, Horrocks, McGuinness, and Patel-Schneider (2001) discussed an ontology infrastructure for the Semantic Web. AAAI (2002) is a paper collection about ontologies and the Semantic Web.

Mena (2003, p. 65) also mentioned "the thorny issue of integrating multimedia formats, involving free-text data, as well as images, audio, e-mail, wireless data, and other binary objects". He remarked: "For counter-intelligence analyses, which need to deal with these types of information objects and formats, this is a very real data-integration and analysis issue", and ensuring a consistent framework "can be a real challenge when dealing with time-sensitive analyses and a need to implement solutions in real time" (ibid.).

Bear in mind however that even independently of explicit ontologies, but at any rate based on semantics and content, there exists a body of research into retrieval from video data; see, e.g., Shim and Shin's paper (2005) "Spatio-temporal modeling of moving objects for content- and semantic-based retrieval in video data". Within research on ontologies there is work concerned with multimedia. Ontologies have been developed for representing and annotating video-events (François, Nevatia, Hobbs, & Bolles, 2005).

Consider the graph in Fig. 6.1.7.3.1, being a detail from the screen (in Arrigoni Neri & Colombetti, 2009) of an ontology navigation based query. As can be seen, multimedial objects are described. Mario Arrigoni Neri of Nova Semantics has kindly supplied me with Fig. 6.1.7.3.2, showing in a clearer manner a subgraph of the one shown in the screenshot detail shown in Fig. 6.1.7.3.1. It is useful to realise that applications of ontologies to multimedia are extant: Kompatsiaris and Hobson (2008) published a paper collection on the theory and applications of semantic multimedia and ontologies. Song, Koo, Yoo, and Choi (2005) discussed an ontology for integrating multimedia databases. For sure, applications need not necessarily be what law enforcement agencies need. For example, there are applications to the cultural heritage: Vrochidis et al. (2008) reported about a hybrid ontology and visual-based retrieval model for cultural heritage multimedia collections. Image processing is one of the areas of application of ontologies: Anouncia and Saravanan (2007) discussed ontology-based process plan generation for image processing.<sup>107</sup>

<sup>&</sup>lt;sup>107</sup> It is important to realise that any positive integer number of variables may be associated with individual pixels, and one may have *multivariate images*, requiring *multivariate image mining* (or *MVI mining*). Herold, Loyek, and Nattkemper (2011) provide an overview. They explain (ibid., p. 2): "Because of recent advances in sensor technology and a rapid increase in storage capacities, a growing number of intensity values can be recorded and associated with pixel coordinates using new imaging technologies. This growth in dimension can be observed in different scientific areas and this new category of images is referred to as multivariate images (MVIs). In these images, an almost arbitrary number of variables is associated with each pixel that represent, for instance, signal values at different time points or for different spectral bands or for different imaging parameters or modalities. Thus, these images can no longer be interpreted as gray value images or red, green, blue color images, and new information technologies are needed." Current applications are mainly to biomedical imaging. In particular, multivariate images result from different techniques, and include *multispectral images* in microscopy, *multifluorescence imaging* (or *multicolour imaging*: it "aims at precisely visualizing the location ofmolecules in a sample"), and *multimodal imaging*.

In *multispectral imaging*, a "biological sample is imaged for multiple wavelengths so that each signal,  $s_i$  ( $i \in [1, n]$ ), represents the intensity of a pixel at a given wavelength  $\lambda_i$ . In general, a red, green, blue (RGB) image can be regarded as the most simple multispectral image stack with

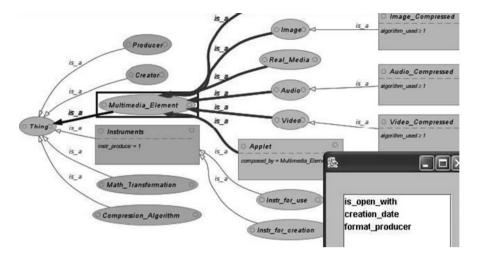


Fig. 6.1.7.3.1 A detail from a screen snapshot in Arrigoni Neri and Colombetti (2009)

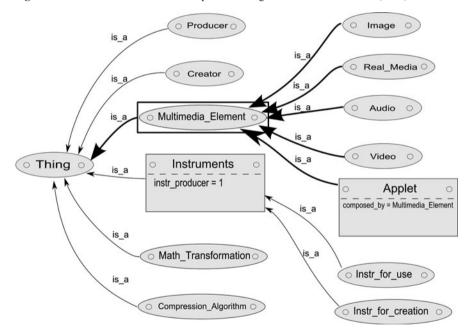


Fig. 6.1.7.3.2 A drawing kindly supplied by Mario Arrigoni Neri in September 2011

only three bands. Modern spectral imaging systems, however, allow to image signals over a wide wavelength range, with small increments" (ibid., p. 2).

*Multifluorescence images* result as "multiple molecules are selectively labeled by moleculespecific antibodies fused with a fluorophore and imaged by fluorescence microscopy. Each signal,

Importantly, ontologies have been developed within computing for law (see Section 6.1.7.4). For example, Lenzi, Biagioli, Cappelli, Sprugnoli, and Turchi (2009) reported about the LME project; their article is concerned with legislative metadata based on semantic formal models. Abrahams, Eyers, and Bacon (2009) discussed a structured storage of legal precedents using a minimal deontic ontology, for computer assisted legal document querying. A *crime emergency ontology event model* is the subject of Wang, Guo, Luo, Wang, and Xu (2005). Leary et al. (2003a, 2003b) discussed the goal of developing a *financial fraud ontology. Investigative data mining* also stands to benefit from ontologies, because data mining in combination with ontologies is a field entering maturity: all of the papers in a collection edited by Hector Oscar Nigro, Sandra González Císaro and Daniel Xodo (2008) are about data mining with ontologies. We have already mentioned that one of the applications of multiagent systems is for data mining. But ontologies can also subserve multiagent system technology: Hadzic and Chang (2008) discussed using *co-algebra* and *co-induction* to define ontology-based multiagent systems.

Ontologies have also been developed in such areas as software engineering, engineering, <sup>108</sup> electronic commerce (E-commerce), <sup>109</sup> biology and bioinformatics, <sup>110</sup>

 $s_i$  ( $i \in [1, n]$ ) thus, reflects the intensity of a pixel for one molecule  $m_i$ . In recent years, the number of available specific antibodies has continuously been increasing, allowing to selectively label a large number of molecules. However, in most applications, only few molecules are labeled at once due to the spectral limitation of fluorescence microscopy" (ibid., pp. 2–3).

<sup>&</sup>quot;Both multivariate imaging strategies mentioned so far can be summarized as intramodular imaging techniques, as the same imaging modality is used and changes in their parametrization, i.e., recorded wavelength or labeled molecule is applied to acquire the set of *n* different signals. However, MVI data can also be acquired by applying different imaging modalities" (ibid., p. 3). One speak then of *multimodal images*. "For example, bright field imaging can be combined with images obtained by dark field, phase contrast, and fluorescence imaging" (ibid.). Both in multimodal imaging and in *intramodular imaging* (namely, multispectral imaging and multifluorescence imaging), "the acquired images hold the same resolution. This eases the process of image registration, i.e., spatially aligning all channels of the MVI to each other, which is the prerequisite for a meaningful MVI analysis" (ibid.). Moreover, "also modalities that acquire images of different spatial resolution can be combined such as optical microscopy and electron microscopy. Here, directly mapping the spatial location in different images is not possible, and sophisticated mapping techniques are required" (ibid.).

<sup>&</sup>lt;sup>108</sup> Li, Yang, and Ramani (2009) described a methodology for engineering ontology acquisition and validation. Ciocoiu, Nau, and Grüninger (2001) were concerned with ontologies for integrating engineering applications. Grüninger and Delaval (2009) discussed a cutting process ontology for sheet metal parts. A paper by Paul van der Vet and Nicolaas Mars (1995) is a case study in ontologies for very large knowledge bases in materials science.

<sup>&</sup>lt;sup>109</sup> Ding, Fensel, Klein, Omelayenko, and Schulten (2004) discussed the role of ontologies in Ecommerce. A book by Gómez-Pérez et al. (2004) discussed applying ontologies to the areas of knowledge management, E-commerce, and the Semantic Web. Dieter Fensel published a book (2003) about ontologies for knowledge management and E-commerce.

<sup>&</sup>lt;sup>110</sup> Calzolari et al. (2010) discussed an ontology for biology. Stevens, Wroe, Lord, and Goble (2004) were concerned with ontologies in bioinformatics.

biomedical informatics,<sup>111</sup> library science, document management systems,<sup>112</sup> and agriculture.<sup>113</sup> Even an attempt to developed a computational ontology of mind was reported.<sup>114</sup> Moreover, a Swiss prominent team in 3D computer graphics and virtual reality,<sup>115</sup> in Geneva and Lausanne, reported about an "ontology of virtual humans: incorporating semantics into human shapes".<sup>116</sup>

Mario Arrigoni Neri and Marco Colombetti, in a paper (2009) in e-learning – which among the other things, propose a graphical syntax for the well-known ontology language OWL – noted: "Learning objects paradigm is widely adopted in e-learning environments. Learning objects management can be improved using semantic technologies from ontology engineering and the semantic web", and: "Learning objects composition is one of the main challenges in e-learning management systems and can be improved exploiting ontological reasoning. The building of a course can be carried out in two phases, in the first one we compose concept

Whereas Garcia-Rojas et al. (2008b) were concerned with reactive behaviour, with expressive animation, and with semantics, Garcia-Rojas et al. (2008a) were rather concerned with inhabited virtual environments, with ontologies, with an authoring tool, and with visual programming. To say it with the abstract: "The creation of virtual reality applications and 3D environments is a complex task that requires good programming skills and expertise in computer graphics and many other disciplines. The complexity increases when we want to include complex entities such as virtual characters and animate them. In this paper we present a system that assists in the tasks of setting up a 3D scene and configuring several parameters affecting the behavior of virtual entities like objects and autonomous virtual humans. Our application is based on a visual programming paradigm, supported by a semantic representation, an ontology for virtual environments. The ontology allows us to store and organize the components of a 3D scene, together with the knowledge associated with them. It is also used to expose functionalities in the given 3D engine. Based on a formal representation of its components, the proposed architecture provides a scalable VR system. Using this system, non-experts can set up interactive scenarios with minimum effort; no programming skills or advanced knowledge is required."

 $<sup>^{111}</sup>$  Udo Hahn and Stefan Schulz (2004) discussed building a very large ontology from medical thesauri.

<sup>&</sup>lt;sup>112</sup> Mitschick and Meissner (2008) are concerned with metadata generation and consolidation within an ontology-based document management system.

<sup>&</sup>lt;sup>113</sup> The International Journal of Metadata, Semantics and Ontologies published a special issue entitled Agricultural Metadata and Semantics (Manouselis, Salokhe, & Johannes Keizer, 2009).
<sup>114</sup> By Ferrario and Oltramari (2004).

<sup>&</sup>lt;sup>115</sup> See e.g. Magnenat Thalmann and Thalmann (1996, 2001, 2005). Cf. fn 291 below.

<sup>&</sup>lt;sup>116</sup> Gutiérrez et al. (2005, 2007). Cf. Garcia-Rojas et al. (2008a, 2008b). "The context of this work is the search for realism and believability of Virtual Humans. Our contribution to achieve this goal is to enable Virtual Humans (VH) to react to spontaneous events in virtual environments (VE). In order to reflect the individuality of each VH, these reactions have to be expressive and unique. In this paper we present firstly a model of reaction based on personality traits. The model was defined using statistical analysis of real people reacting to unexpected events. We also consider that the emotional state is involved in the modulation of reactions, thus we integrate a model of emotion update. Secondly, we present a semantic-based methodology to compose reactive animation sequences using inverse kinematics (IK) and key frame (KF) interpolation animation techniques. Finally, we present an application that demonstrates how Virtual Humans can produce different movements as reaction to unexpected stimuli, depending on their personality traits and emotional state" (from the abstract of Garcia-Rojas et al., 2008b).

level entities to obtain an outline of the course, then we fill such an outline with actual resources from the repository. Both phases can use ontology based models to capture specific domain knowledge" (ibid.).

Data organisation upstream of feeding them into a data mining tool (Pyle, 1999) can be facilitated by a special category of software: Mena (2003, section 2.16, pp. 68–72) reviewed several commercial software products specifically designed for data preparation. Arguably, it has meanwhile become realistic to also resort to ontologies. Mena (2003, section 2.17, pp. 72–74) argued for standardising crime reports. This may be quite difficult, because: "Police officers and investigators may use widely varying styles and formats in describing criminal scenes and modus operandi", and moreover, they may be spelling errors, as well as abbreviations (ibid., p. 72). Arguably, ontologies could do a lot to filter out such diversity, and extract a unified representation automatically or semi-automatically.<sup>117</sup>

- id: TGMA:0000051
- name: postfrontal suture
- def: "One of two sutures diverging from the coronal suture above the ocelli and separating the interocular space from the frons." [ISBN:0-937548-00-6]
- comment: Fig 02,04,07,08 Abbr: pfs in ISBN:0-937548-00-6.
- synonym: "frontal suture" RELATED [ISBN:0-937548-00-6]
- is\_a: TGMA:0001828 ! anatomical line
- relationship: part\_of TGMA:0000003 ! adult cranium
- id: TGMA:0000052

name: postfrontal ridge

def: "The apodeme marked externally by the postfrontal suture." [ISBN:0-937548-00-6] comment: Fig 05 Abbr: PR in ISBN:0-937548-00-6. synonym: "frontal ridge" RELATED [ISBN:0-937548-00-6] relationship: part\_of TGMA:0000003 ! adult cranium

- id: TGMA:0000053
- name: adult postgena

def: "The lateral and ventral parts of the cranium behind the compound eye." [ISBN:0-937548-00-6] comment: Fig 02,03,04,06 Abbr: PG in ISBN:0-937548-00-6. synonym: "cheek" RELATED [ISBN:0-937548-00-6] synonym: "gula" RELATED [ISBN:0-937548-00-6] synonym: "gula" RELATED [ISBN:0-937548-00-6] synonym: "gular region" RELATED [ISBN:0-937548-00-6] synonym: "Kehle" RELATED [ISBN:0-937548-00-6] synonym: "cociput" RELATED [ISBN:0-937548-00-6] synonym: "temple" RELATED [ISBN:0-937548-00-6] synonym: "temple" RELATED [ISBN:0-937548-00-6] synonym: "tempus" RELATED [ISBN:0-937548-00-6] synonym: "

id: TGMA:0000054 name: postgenal seta

<sup>&</sup>lt;sup>117</sup> To give the flavour of what ontologies may look like, the following is excerpted from *TGMA*: *The mosquito anatomy morphology* (http://anobase.vectorbase.org/anatomy/mosquito\_anatomy. obo), accessed in February 2009, and developed at IMBB in Greece for VectorBase (http://www.vectorbase.org is the homepage of the site where it is posted, with other such ontologies of ticks and malaria, at http://anobase.vectorbase.org/ontologies):

### 6.1.7.4 Legal Ontologies

## Andrew Stranieri and John Zeleznikow

The present Section 6.1.7.4 is based on a section in Stranieri and Zeleznikow (2005a).<sup>118</sup> Whilst the World Wide Web is becoming a major source of information retrieval and a repository of legal knowledge, the uses of web mining to discover legal knowledge has been limited.<sup>119</sup> Zeleznikow (2002b) noted that currently, very few legal decision support systems are available on the World Wide Web. Much current research is focused upon using text mining for Homeland Security and Intelligence and Law Enforcement.

The Australasian Legal Information Institute (AustLII)<sup>120</sup> provides free Internet access to Australian legal materials. AustLII's broad public policy agenda is to improve access to justice through better access to information. To that end, AustLII has become one of the largest sources of legal materials on the net, with over 7 gigabytes of raw text materials and over 1.5 million searchable documents (by the early 2000s). It does not have any decision support systems on its Internet site.

The British and Irish Legal Information Institute (BAILII)<sup>121</sup> provides access to the most comprehensive set of British and Irish primary legal materials that are available for free and in one place on the Internet.

In Canada, the Canadian Legal Information Institute project (CANLII) aims at gathering legislative and judicial texts, as well as legal commentaries, from federal, provincial and territorial jurisdictions bin order to make primary sources of

<sup>120</sup> www.austlii.edu.au

<sup>121</sup> www.bailii.org

def: "One of the setae occurring in a group on the postgena at the posteroventral area of

the cranium." [ISBN:0-937548-00-6]

comment: Fig 02,04 Abbr: PgS in ISBN:0-937548-00-6.

synonym: "gular bristle" RELATED [ISBN:0-937548-00-6]

synonym: "gular chaeta" RELATED [ISBN:0-937548-00-6]

synonym: "postgenal hair" RELATED [ISBN:0-937548-00-6]

relationship: part\_of TGMA:0000053 ! adult postgena

Another website worth visiting is http://www.ifomis.org/bfo/publications of Basic Formal Ontology (BFO).

<sup>&</sup>lt;sup>118</sup> [A note by E. Nissan:] Valente (2005) has discussed types and roles of legal ontologies, and his paper followed in the same book an especially stimulating article on the use and reuse of legal ontologies by Breuker, Valente, and Winkels (2005). Also Gangemi, Sagri, and Tiscornia (2005), too, discussed legal ontologies. This was inside an edited volume that had *legal ontologies* in its subtitle. The volume editors were Benajmins, Casanovas, Breuker, and Gangemi (2005), and the papers in the volume were drawn from two meetings devoted to the Semantic Web and the legal domain: The International Workshop on Legal Ontologies and Web-Based Legal Information Management held in Edinburgh, Scotland, in June 2003 (John Zeleznikow had been directing a laboratory at the University of Edinburgh at the time), and the International Seminar on Law and the Semantic Web, held in Barcelona, Spain, in November 2003.

<sup>&</sup>lt;sup>119</sup> Web mining was surveyed by Kosala and Blockeel (2000). Joshi and Krishnapuram (1998) discussed fuzzy clustering methods for web mining.

Canadian law accessible on the Internet.<sup>122</sup> The large volume of legal information in electronic form creates a need for the creation and production of powerful computational tools in order to extract relevant information in a condensed form.

The development of *legal ontologies* offers great opportunities for the development of legal decision support that draws on knowledge learnt using *knowledge discovery from* databases (*KDD*) on the World Wide Web. As explained earliest in this book, an ontology as an explicit conceptualization of a domain is defined in Gruber (1995). Breuker, Elhag, Petkov, and Winkels (2002) claim that unlike engineering, medicine or psychology, law is not ontologically founded. They claim that law is concerned with constraining and controlling social activities using documented norms. They have developed a core upper level ontology LRI-core. This ontology has over 200 concepts and has definitions for most of the anchors that connect the major categories used in law: person, role, action, process, procedure, time, space, document, information, intention, and so on. The main intended use is supporting knowledge acquisition for legal domains, but a real test of its semantics is whether it enables natural language understanding of common sense descriptions of simple events, as in the description of events in a legal case documentation. This is of the core principle of the Semantic Web initiative of WC3.

The development of legal ontologies has been examined by Bench-Capon and Visser (1997). Ontologies have benefits for:

- (a) knowledge sharing;
- (b) verification of a knowledge base;
- (c) knowledge acquisition; and
- (d) knowledge reuse.

A formal legal ontology was built by Visser (1995) by developing a formal specification language that is tailored in the appropriate legal domain. He commenced by using van Kralingen's theory of frame-based conceptual models of statute law (van Kralingen, 1995). Visser uses the terms ontology and specification language interchangeably. He claims an ontology must be:

- (a) epistemologically adequate;
- (b) operational;
- (c) expressive;
- (d) reusable; and
- (e) extensible.

Visser chose to model the Dutch Unemployed Benefits Act of 1986. He created a CommonKADS expertise model (Schreiber et al., 1999). Specifying domain knowledge is performed by:

<sup>&</sup>lt;sup>122</sup> http://www.canlii.org

- (a) Determining the universe of discourse by carving up the knowledge into ontological primitives. A domain ontology is created with which the knowledge from the legal domain can be specified.
- (b) The domain specification is created by specifying a set of domain models using the domain ontology.

A legal ontology based on a functional perspective of the legal system was developed by Valente (1995). He considered the legal system as an instrument to change or influence society in specific directions by reacting to social behaviour. The main functions can be decomposed into six primitive functions each of which corresponds to a category of primitive legal knowledge:

- (a) Normative knowledge which describes states of affairs that have a normative status (such as forbidden or obligatory);
- (b) World knowledge which describes the world that is being regulated, in terms that are used in the normative knowledge, and so can be considered as an interface between common-sense and normative knowledge;
- (c) Responsibility knowledge the knowledge which enables responsibility for the violation of norms to be ascribed to particular agents;
- (d) Reactive knowledge which describes the sanctions that can be taken against those who are responsible for the violation of norms;
- (e) Meta-legal knowledge which describes how to reason with other legal knowledge; and
- (f) Creative knowledge which states how items of legal knowledge are created and destroyed.

Valente's ontology, which he described as a Legal Information Server, allows for the storage of legal knowledge as both text and an executable analysis system interconnected through a common expression within the terms of the functional ontology. The key thrust of his conceptualisation is to act as a principle for organizing and relating knowledge, particularly with a view to conceptual retrieval.

Many organizations are now building legal ontologies to provide legal knowledge on the World Wide Web. The Dutch Tax and Customs Administration have developed the POWER (Program for an Ontology-based working environment for rules and regulations) research project (van Engers & Glasee, 2001). POWER develops a method and supporting tools for the whole chain of processes from legislation drafting to executing the law by government employees. The POWER program improves legislation quality by the use of formal methods and verification techniques.

CLIME, e-COURT and FFPOIROT are all legal ontology projects funded by the European Union. Because of the plethora of legal systems, there is a great need to develop legal ontologies that are applicable across the European Union.

In the CLIME project, a large-scale ontology was developed for the purpose of a web-based legal advice system MILE (Maratime Information and Legal Explanation). The system features both extended conceptual retrieval and normative assessment on international rules and regulations regarding ship classification (Bureau Veritas) and maritime pollution (MARPOL). The user can formulate a case using a structured natural language interface. The interface uses only the terms available in the ontology, which ensures that the user formulates a query on a topic known to the system. The ontology also provides a means for adequate knowledge management of the rules and regulations.

The KDE (Knowledge worker Desktop Environment) project reused the CLIME ontology in a knowledge and workflow-management environment. In the KDE system, the CLIME ontology functioned as a domain ontology for the work of those associated with ship classification within the Bureau Veritas organization.

The CLIME knowledge base has two separate components:

- (a) Domain A domain ontology of the design, construction, maintenance, repair, operation and construction of ships. The domain ontology incorporates a small abstract top ontology, distinguishing things like artifacts, substances, agents and functions;
- (b) Norms A knowledge base of norms: mappings from rules in legal documents to deontic constraints that allow or disallow certain types of cases. These norms are often limited and incomplete interpretations of the norms expressed in the rules. The knowledge acquisition for the CLIME ontology can be split into two phases: (i) the conceptual retrieval phase in which the concepts and their relations are identified, created and defined, and (ii) the phase in which knowledge acquisition for normative assessment takes place.

The e-COURT project (Breuker, Valente, & Winkels, 2002) is a European project that aims at developing an integrated system for the acquisition of audio/video depositions within courtrooms, the archiving of legal documents, information retrieval and synchronized audio/video/text consultation. The focus of the project is to process, archive and retrieve legal documents of criminal courtroom sessions. In principle, these documents should be accessible via the World Wide Web. The system has the following major functions:

- (a) Audio/Video/Text synchronization of data from court trials and hearings;
- (b) Advanced Information Retrieval multilingual, tolerant to vagueness. Statistical techniques are combined with ontology based indexing and search;
- (c) Database management multimedia documents support retrieval;
- (d) Workflow management defines and manages rules for sharing relevant information and events among judicial actors; and
- (e) Security management plays an important role to protect privacy information and to comply with national and international regulations about the interchange of criminal information.

The project is aimed at the semi-automated information management of documents produced during a criminal trial: in particular, the transcription of hearings. The structure of this type of document is determined by the debate/dialogue nature of the hearings, as well as by specific local court procedures. The developers identify and annotate content topics of a document. These annotations can vary from case descriptions in oral testimony to indictments in criminal law. Their first completed task was an ontology for Dutch criminal law, which served as a framework for ontologies on Italian and Polish criminal law.

FF-POIROT is a multi-million euro-dollar venture to develop European standards for the prevention, detection and successful investigation of financial fraud. The goal of the project is to build a detailed ontology of European Law, preventive practices and knowledge of the processes of financial fraud. The FF-POIROT project aims at compiling for several languages (Dutch, Italian, French and English) a computationally tractable and sharable knowledge repository (a formally described combination of concepts and their meaningful relationships) for the financial fraud domain. This knowledge source is being constructed in three ways:

- (a) Having human experts analyze and model the domain(s), in particular identifying the most abstract notions;
- (b) Using computers to automatically find relevant notions (the most specific ones) from existing documents and semi-structured corpora including the Internet (text mining);
- (c) Having humans validate the automatically generated suggestions to combine/merge already existing similar knowledge sources (semi-automatically aligning).

The resulting environment is useful to at least three different and EU-relevant types of user communities:

- (a) Investigative and monitoring bodies: benefit from the strongly enriched information retrieval made possible by linking e.g. internet or database search facilities to the FF-POIROT ontology in order to detect or investigate instances of attempted or actual financial fraud. Species of fraud (typologies) have been identified so that macro and micro-analysis can be undertaken, the results of which are then used as "templates of fraud". These templates can be stored, accessed and used to mine for new instances of fraud, conducted across linguistic and jurisdictional boundaries;
- (b) Financial professionals: Accountants, auditors, banks, insurance agencies, government departments, regulators and financial experts will benefit from an "FF-POIROT-style" ontology using it as an authoritative concept base, extensively cross-linked (to other domains, systems and languages) and available for customised applications. Exploitation in this area could be as a high-tech service extending similar services and products (in particular with respect to accounting practices related to European VAT), currently already commercialised by at least two of FF-POIROT's users;
- (c) Law enforcement: Police and other law enforcement agencies benefit by the availability of relevant parts of the FF-POIROT ontology – for example as an RDF-mapped Semantic Web resource, to support future police-oriented

query systems – in a non-technical user-friendly, attractive, and comprehensive manner. Additionally, sharing of information with investigative bodies and understanding of related documents will be substantially enhanced if such communication and documents are hyperlinked to a shared ontology. Optimising the investigation, discovery, prevention and reduction of complex frauds is being made routine and efficient.

The partners in the FF-POIROT projects include universities (in Belgium, Romania and the United Kingdom), software houses (in Belgium and Italy) and two industry partners, CONSOB and VAT Applications who wish to commercialize the consortium's results.

CONSOB is the public authority responsible for regulating the Italian securities market. It is the competent authority for ensuring: transparency and correct behaviour by securities market participants; disclosure of complete and accurate information to the investing public by listed companies; accuracy of the facts represented in the prospectuses related to offerings of transferable securities to the investing public; compliance with regulations by auditors entered in the Special Register. CONSOB conducts investigations with respect to potential infringements of insider dealing and market manipulation law. Within the FF-POIROT project, CONSOB is particularly interested in detecting and prosecuting companies that spread fraudulent information on the internet.

VAT Applications NV is a Belgian software company developing automated software to deal with issues surrounding Value Added Tax at a European level. It has packages for all countries and in eleven languages. The addition of ten new members to the European Union in 2004, has placed a further need for the development software packages to help compliance with VAT requirements across the European Union and the identification, prevention and reduction of fraud across jurisdictions.

The University of Edinburgh's Joseph Bell Centre for Forensic Statistics and Legal Reasoning has been performing the following tasks:

- (a) Prepare for the construction and testing of the financial forensics repository using macro and micro analytical techniques;
- (b) Gather information on how relevant authorities accumulate and analyse evidence of financial fraud, and analyse the tools auditors and accountants use to maintain up-to-date awareness of financial services regulations; and
- (c) Collect requirements for the retained data, its validation and the applications needed to optimise the use of the information.

User requirements were collected by conducting structured interviews and using consortium expertise to accumulate necessary information for the construction and testing of a financial fraud ontology. Advice was obtained from end-users on how law enforcement agencies and investigative and regulatory bodies accumulate and analyse criminal evidence in domains of financial fraud, and analyse resources by which financial regulatory knowledge is available for auditing and accounting professionals.<sup>123</sup>

# 6.1.7.5 An Application of Ontologies to Eliminating Sensitive Information While Declassifying Documents: The Case of Accounts of Crime Investigation

Raskin, Atallah, Hempelmann, and Mohamed (2001) reported about the use of onotologies when manipulating documents being declassified, so that information that still must not be released be eliminated, and the wording reformulated so that it would not be included. Their project was intended to respond to a real need for handling masses of documents, because of a policy instituted in the mid-1995:

Since Executive Order 12958, Classified National Security Information, signed by President Clinton on April 17, 1995, most U.S. Government agencies have faced a monumental problem of declassifying millions of pages of its documentation. Many agencies as well as other organizations and corporations are increasingly facing the need of downgrading or sanitizing information that they need or have to share with their various coalition partners, e.g., within the NATO alliance.

Raskin et al. (2001) listed different degrees of security requirements while declassifying documents. When the requirement is *weak declassification*, the problem is one of "dividing a set of documents into definitely open ones and others, with a reasonable degree of accuracy". When the requirement is *strong declassification*, the problem is one of "determining the status of each document as unclassified or classified without any margin of error". When the requirement is *downgrading/sanitizing*, the problem is more complex, as it involves "strong declassification coupled with a seamless modification of each classified document to an unclassified version". And finally, the most complex problem in this spectrum is when one has to carry out "*onthe-fly downgrading/sanitizing/surveillance:* filtering out electronic communication in real time." Some information is *top secret*, some other information is merely *secret*, and some other information is merely *confidential*.

In partially automatized textual declassification, there have been two primary approaches to the problem. The keyword- based approach is exemplified by the TapUltra-UltraStructure approach developed for the Department of Energy (see NRC, 1995; DPRC, 2000 in lieu of unavailable regular publications). The approach is based on an assumption that the classified element will appear as an anticipated word or string of words in the text. This assumption is not always correct, and the result is insufficient accuracy which is unlikely to be improvable in principle. The statistical tagging approach cleverly divides the entire corpus of documents into the training and testing subcorpora. Humans tag the training corpus in a variety of ways and divide it into classified and unclassified subsets. A sophisticated statistical procedure attempts then to relate certain tag clusters to the classified nature of a document and

<sup>&</sup>lt;sup>123</sup> Leary et al. (2003a, 2003b) discussed the goal of developing a *financial fraud ontology*. Lenzi et al. (2009) reported about the LME project; their article is concerned with legislative metadata based on semantic formal models.

to tag the testing corpus automatically as well as to divide it into the classified and unclassified subsets. If this task is achieved with a high degree of accuracy, the approach succeeds (Hochberg, 1999, 2000).

"The existing approaches share an important principle: They do not try to follow the declassification rules for human workers because, of course, humans understand the rules and these approaches do not." By contrast, the *ontologic semantic* approach in Raskin et al. (2001) "both for text and for data, is based on the computer understanding of the information, which does make it possible to follow the prescribed declassification rules in every sensitive detail as well as to dynamically modify these rules."

The ontological semantic approach (see Nirenburg and Raskin, 2004) uses three major static resources, the lexicon (see Nirenburg and Raskin, 1987, 1996; Viegas and Raskin, 1998), the ontology (see Mahesh, 1996), and the text-meaning representation (TMR) language (see Onyshkevych and Nirenburg, 1995). The lexicon contains words of a natural language, whose meanings are explained in terms of an ontological concept and/or its property. The ontology contains a tangled hierarchy of concepts, each containing a set of properties with filler specifications [...]. The TMR language composes the sentential meaning out of ontological concepts and their properties evoked by the words of the sentence with the help of a special formal syntax.

In the approach of Raskin et al. (2001), which was to only involve minimal analysis, the use of ontology is confined to crucial terms and concepts, with the "possible addition of a few domain-specific nodes and/or properties of nodes". The lexicon, too, is a resource only used for crucial terms, with the "possible but rare addition of a terminological lexical entry or sense". TMR was used primarily for crucial terms. Nevertheless, TMR, was to be ready for any paraphrase. The analyser was fully ready for any paraphrase. As to the text generator, it was to be used only for downgrading and surveillance.

Raskin et al. (2001) exemplified their method on several texts. A few of these were reports about criminal investigation. The text entitled "Dartmouth Murders" was " taken from the *Washington Post* archive section. It's about a murder that two teenagers committed at their school. They tried to escape after committing the crime, but they were caught." Raskin et al. (2001) assumed, for the sake of the example, that nothing is allowed to be mentioned that would help to identify the identity of the suspects, their age, or the nature of their crime. "For example, we have to delete the name 'Casey Purcell', simply because people knowing Purcell might know his friends and thus can figure out the identity of the suspects."

In another narrative text also downgraded in the exemplification of Raskin et al. (2001), also actually taken from the *Washington Post* archive, an employee in Massachusetts had shot dead seven colleagues in the offices of Edgewater, an Internet company. In order to hide the identity of the state inside the U.S. where the crime took place, the names of police officers and of people living there had to be suppressed. Their names were replaced with those persons' position. Moreover, in order to hide the identity of the company where the shooting took place, the name of the company where suppressed, and the identity of the suspect had also to be suppressed, and so were even his imposing physical features. The

word "e-business" was replaced with "this kind of business". Also the name of a neighbouring company was suppressed.

Raskin et al. (2001) mentioned unsolved problems, with literal as well as nonliteral language. Concerning literal language, they stated:

In sum, even with literal use of language, we have a number of yet unsolved issues:

1. Not everything can be deleted or replaced in a sentence, only elements clearly circumscribed syntactically are interchangeable.

2. Information can lie at the "core" of a text, that is, the purpose of the text has been to relate that very information and elaborate on facets of it. This "central information" is obviously hard to obscure.

3. If too much information is deleted or replaced it becomes obvious that the text has been tampered with.

4. If the text is of any poetic or rhetoric nature, any change to the wording will affect it negatively. In view of the expected clients for this application this latter effect is hopefully of minor significance.

# 6.1.7.6 A Digression – *Maurice v. Judd* (New York, 1818): Is Whale Oil a Kind of Fish Oil? When the Jury Had to Decide About Ontology

In New York during the early Republic, there was a sea captain, whaleman, and whale oil man, named *Preserved Fish*. The family name *Fish* is unsurprising, for a New Englander from a fishing community; moreover, *fish* used to be a nickname for whalers. *Preserved* was his first name (by etymological motivation, it means the same as the Arabic first name *Mahfud*, which is also originally a passive participle). Preserved Fish was called as a witness for the defence, in a trial held in New York in 1818, *Maurice v. Judd*, the plaintiff being an inspector, James Maurice who insisted on also inspecting (for a fee) whale oil, whereas the law required that fish oil be inspected. The defendant was Samuel Judd, a wealthy oil merchant, who insisted that whale oil was not intended to be inspected, by current legislation.

A scientist – the distinguished New York physician-naturalist, Samuel Laptham Mitchill, with a record of service as a senator and state representative in Washington, and the one who had given the United States the name *Fredonia*, i.e., the land of the free – testified that the whale is not a fish.<sup>124</sup> Traders in marine oils claimed that when an order for fish oil is made, liver oil is supplied, not whale oil. Moreover, it was the quality of liver oil that was uneven, whereas the quality of whale oil was usually satisfactory.

Eventually, the jury found for the plaintiff, after the plaintiff's lawyer insisted that all those who claimed that a whale is not a fish, or that whale oil is not fish oil, were easterners, i.e., New Englanders, even though they may have been living in New York. There was antipathy between New Yorkers and New Englanders. The jury found for the plaintiff. This is the subject of a book by Burnett (2007).<sup>125</sup> Captain

 $<sup>^{124}</sup>$  A book by Golan (2004) traces the history of *scientific expert testimony* in England and America.

<sup>&</sup>lt;sup>125</sup> Another version of section 6.1.7.5 appears in a book review I wrote on Burnett (2007).

Fish was from New Bedford, in New England, and "had been for twenty years in New York" (ibid., p. 175). Burnett remarks (ibid., p. 164) that "the case of *Maurice vs. Judd* represented above all a showdown between two powerful groups of politically active and wealthy figures in the city of New York in the early nineteenth century: a clique of oil merchants and chandlers on the one hand, and a consortium of tanner-financiers on the other."

This court case is quite interesting in our own present context of discussing ontologies, because here we have an example of ontology being centrestage: in practice, this was what the jurors were asked to decide about. Moreover, as we are going to see, there are lots of nuances and distinctions; this should immunise readers against too simplistic a view of taxonomies, and therefore against inadequate, too rigid, ontologies insensitive to differences of usage.

Jurors were used to consider the whale as a kind of fish, and this was also what they gathered from the English translation of the Bible they were used to. (In the Hebrew original, the relevant lexicographical situation is quite complex, more than in translation, because translators already made classification choices.) Burnett points out (2007, pp. 8–9):

Maurice v. Judd [...] presents a gloriously feisty public forum where competing parties deployed a wide range of skills, texts, and authorities in efforts to undermine (and sometimes to undergird) the edifice of contemporary taxonomy and classification. Nor are these different positions merely static: by following the citations marshaled by the diverse parties to the action I will show how knowledge of natural order and natural types "migrated" across different communities of expertise, and across geographical regions, thereby revealing how the "new philosophy" of the metropolitan (and largely French) classifying science made its way to American readers, and how such ambitious "systems" fared in confrontation with folk taxonomies, vernacular natural history, and biblical representations of creation. These trial transcripts thus dramatize just how unstable the science of natural order was in 1818, at least as viewed from lower Manhattan by readers who had access to a preponderance of the leading publications in Anglo-European natural history; indeed, it was by setting these texts against each other that opponents of the "new philosophy" could represent the science of classification as a house woefully divided, and by no means the architecture of the natural world. Having revealed the contingency of such "systems", the skeptics were positioned to defend the legitimacy of the taxonomic discriminations implicit in ordinary language and in social and political categories precipitated out of labor, law, and the market. The adversarial setting of the Mayor's Court dramatized these conflicts, and for historians of science and scholars of law generally interested in the relationship between legal systems and the production of knowledge, Maurice v. Judd is a mini-bonanza.

Traditionally in England, the whale was known as "royal fish": whales and sturgeons were so-called because they were the special possession of the throne since the 14th century (each beached whale had to go to the King), with the term "Fishes Royal" first appearing in a statute of 1325 (Burnett, 2007, p. 3). "We modern readers may need a reminder: in the late eighteenth and early nineteenth century the word 'fish' meant (as the 1817 Philadelphia edition of Samuel Johnson's *Dictionary of the English Language* stated clearly) 'an animal existing only in water'" (Burnett, 2007, p. 20). "And the author of the article in the *National Advocate* made the tacit taxonomy on which this taxonomy rested still more explicit: 'a whale *is* a fish, for the simple reason that it is not a beast or a bird'" (ibid., pp. 20–21).

The plaintiff's counsel invoked Scripture and the scriptural tradition, as well as ordinary language, as for example a peddler of "oysters, crabs, and clams" is called a "fish-monger" (Burnett, 2007, p. 21). "Moreover, by these lights, the whale was not just any fish. Rather, it was, as the Philadelphia Lady's and Gentleman's Weekly Literary Museum and Musical Magazine commented in its article on the trial, the very 'king of the scaly tribe', the primogenitus of the seas", as pointed out by Burnett (ibid., p. 21), who proceeds to show how this is supported by a "survey of juvenile literature and didactic volumes touching on natural history available in New York before 1819" (ibid., pp. 21-22). "Indeed, most Americans probably first encountered the whale in the context of nursery-rhyme natural theology: the ubiquitous New England Primer reserved the letter 'W' as an occasion to catechize Christian youths in the pervasive power of the Lord's calls, using a couplet that would have been quick to the tongue of every New Yorker in 1818, 'Whales in the sea / God's voice obey" (ibid., pp. 22, 24). People were raised into a conception of ascribing beasts to the land, birds to the air, and fish to the water, and that the biggest fish of them all was not a fish was deeply against the grain.

During the last days of the year in 1818, the galleries of Mayor's Court were apparently quite crowded, and Burnett (ibid., p. 19) explains that it was so for the sheer fact that such a "paradox" could be debated:

That same "paradox" guaranteed the coverage of the trial in a host of newspapers and periodicals in New York and beyond — eventually across much of the young Republic. The paradox in question was simply the proposition that a whale was *not* a fish. [...] Nor was this sense of surprise merely the theatrical special pleading of the plaintiff's counsel, [John Anthon,] who clearly had an interest in presenting his opponent's position as an egregious departure from habit, custom, and verity: published and unpublished responses to the trial support Anthon's assertion that the vast majority of Americans not only assumed that a whale was a fish, but were surprised to learn that the question could be debated.

"Anthon dismissed the notion of non-fish-whale oil as nothing more than a 'mere provincial usage' of New England, one that could be readily ignored" (Burnett, 2007, p. 175). New York's jurors were offered the rationale, as Burnett conveys the gist of it making it explicit, that a "secret confraternity had been giving silent shape to the case: these anomalous oath-takers, who had outrageously and vociferously vouched for mammalian cetes, were *not really New Yorkers*. They were, rather, 'easterners' — Boston men, long-boned New Englanders, [...]" (ibid., p. 174). "It was a subtle ploy, but an effective one, playing as it did on the Yankee–Knickerbocker rivalry that had stewed New York elites for a generation" (ibid., pp. 175–176). Judd's lawyers rose instantly to denounce to the jurors the use by the other party of "the contemptuous epithet of yankees" (ibid., p. 176).

When, in an earlier generation, Linnaeus had based his classification of plants on their reproductive organs, this was judged unseemly by some prudes. To New Yorkers, it seemed outlandish that in order to explain the difference between whales and fish, he would explain that fish ejaculate into the water, whereas whales have a huge male organ (even though, along with the distinction between cold and hot blood, and along with whales' lactation, this is quite an apt explanation, from the viewpoint of scientific zoology). As Burnett explains (2007, pp. 42–43): These sallies at the categories of the naturalists [such as cetes having a horizontal tail, vs. the vertical tail of fish] left only delicate matters as the rationale for keeping whales out of the fish category: breasts and reproductive organs. When called to the stand, Dr. Mitchill would make much of these points, which were at the heart of the classification he had come to defend: male fish, he could show, had "no *penis intrans*" and, unlike the cetes, propagation among the cetes involved the casting of "the fecundating fluid" over ova deposited in a "nidus". These bedroom details, raised at the level of "philosophy", and set against the commonplace distinctions of the fish-market (and the sacred groupings of scripture), clearly struck many New Yorkers as grounds for a snicker: shortly after the trial, a satirical poem — there were to be a number of them — in the *Evening Post* invoked the city's preeminent naturalist with a sly dig at his prurient engagement with taxonomy, hailing him as

### Mitchell, who sung the amours of fishes...

The two whalemen called as witnesses "disagreed emphatically on the question before the court" (Burnett, 2007, p. 95). Captain Preserved Fish took stand for the defendant, Samuel Judd. James Reeves testified for the plaintiff. Captain Fish, who "eventually became a director at the Bank of America" (ibid., fn 1), "hailed from New Bedford, the Massachusetts city that was in those very years displacing Nantucket as the gravitational center of the whaling industry in the United States" (ibid., p. 95). Like Mitchill, Fish insisted that whales were not fish because they breathed air. Reeves instead claimed he thought they might be able to breathe underwater (ibid., pp. 95, 97). During cross-examination, the plaintiff's lawyers eventually had Fish admit that a whale could breathe if its mouth was underwater but its nose above water, and Fish was dismissed.

Reeves, testifying for Maurice, "explained that it was the common habit of whalemen to call their quarry 'fish'" (ibid., p. 97). Once Reeves came under crossexamination, Judd's attorney asked him: if someone were to ask him for "fish oil", what would he give them? "Reeves had an easy answer: he would simply ask 'what kind of fish oil do you want?' since, from what he understood, the 'oil was named from the fish, as black fish, humpback, and whale oil" (ibid., p. 98). Burnett (ibid., fn 8) points out "that the term 'whale' was itself ambiguous, and not uniformly used in the period to refer to all the large cetaceans". In particular, Burnett remarks, "Reeves here distinguishes between 'humpback' oil and 'whale' oil, despite the fact that the 50-foot humpback [...] certainly counts, by our lights, as a 'whale'" (ibid., fn 8). Again during his cross-examination, Reeves claimed: "I never heard any distinction between fish oil and whale oil, as talked of here to day, but always thought that fish oil included them all" (ibid., p. 98).

If Maurice's lawyers tried to awaken in the jurors their prejudices against New Englanders (ibid., pp. 174–176), Judd's lawyers appealed to their class sympathies, and "reminded jurors that in weighing the testimony from the practical whalemen, they would do well to recall that *Captain* (whale-not-a-fish) Fish had been 'master of a vessel in the trade', whereas *Mr*: (whale-a-fish-far-as-I-know) Reeves 'was but a common whaler who had made but three voyages' before the mast'' (ibid., p. 177). The plaintiff's lawyers tried to get the judge to discount much of Fish's testimony because this former whaleman had become an oil merchant, and as such he had an interest in whale oil not having to be inspected (ibid., p. 145).

#### 6.1 Methods

Significantly, obstacles were put in the way of testimony being heard about how lawmakers had intended the law to be understood (Burnett, 2007, p. 170):

Responding to the exhortation to ascertain the intent of the legislators, Judd's lawyers went so far as to seek out and call as a witness the actual legislator who had chaired the committee responsible for the fish oil statute: Peter Sharpe, a city representative [the one of the city of New York] to Albany [...] but the court disallowed any part of Sharpe's testimony that purported to provide direct access to the assembly's will in passing the law, thereby hamstringing a potentially decisive defense witness. Sharpe was permitted, however, to dilate on what he "may happen to know as a member of the community".

Judd's lawyers referred again and again to legislative intent (ibid., p. 171). Among the other things, they noted "that if the law had really been meant to cover whale oils, then it was impossible to understand why no inspector had been assigned to Sag Harbor, the state's [i.e., New York state's] only great 'eastern' whaling depot", as indeed "the legislation called for the commissioning of three inspectors for the whole state, one for Albany, one for Troy, and one for 'the city of New-York, [sic] whose powers shall extend to, and include the village of Brooklyn'" (ibid., pp. 176–177). Burnett found (from advertisements from that period) that Sharpe sold at his shop in New York umbrella and parasol frames made of whalebone, so he "knew his whale products first hand!" (Burnett, 2007, p. 187, fn 65):

Lawmakers had been more receptive to the distinction between fish oil and whale oil, than the plaintiff, and eventually the jurors, were willing to concede. But the way the jurors found out was at odds with the conventions of the oil merchants (Burnett, 2007, p. 149):

The assertion of Maurice and the plaintiff's-side witnesses — that "fish oil" was the general term and included all the oils of the sea creatures — thus did not conform, according to [Thomas] Hazard and his fellow merchants, to the usages of the market. Fish oil was fish oil. It was the oil derived from the livers of cod and other fish (hence the synonym "liver oil"), and if someone came into the shop and requested "fish oil", giving them whale oil, or porpoise oil, or elephant oil [obtained from sea elephants, i.e., elephant seals], or, of all things, *spermaceti oil* (generally double the price of good common whale oil, which traded at about the same price as standard grade liver oil) was unthinkable.

Moreover, from the merchants' perspective, this was a distinction that had nothing to do with whether whales were fish. When queried on this matter, Hazard shrugged it off: he had been "lately told by a learned friend, that a whale was not a fish", but this was news to him, and he didn't really care, since it seemed to him that this had nothing to do with the law and its extortionate misapplication. On the subject of the cetacean's internal anatomy he had even less to offer: Did the whales too have a liver? He had no idea. He had never seen whale liver oil come to market, but that was all he could say. Similarly, the oil dealer John Russell, who had fifteen years in the trade, declared himself agnostic on the niceties of book taxonomy.

The purpose of the legislation had to do with the manufacturing process (ibid., p. 151):

These manufacturing details were essential because they went to the heart of what was understood to be the purpose of the legislation at issue: to guard against adulterated and/or unacceptably impure "fish oil" coming to market. What was the "fish oil" that had long been the target of customer complaints? "Liver oil", according to the merchants, for the simple reason that it was by its nature a sloppy substance, of uneven quality, and thus very liable to prompt dissatisfaction among purchasers. Such troubles, they asserted, were more or less unknown with expensive household illuminating oil like spermaceti, or the lubricant and lighting oils taken from porpoises and the ordinary whales. Generally tried out by fire in the process of their manufacture, these oils were comparatively uniform, consistently "dry" (without admixtures of water), and seldom occasioned any difficulty. With common "fish oil", the stuff oozed out of the livers of various groundfish, things were admittedly different. The products had different recent commercial histories as well [...]

Even the plaintiff, James Maurice the inspector, was apparently aware of this distinction. Burnett relates (ibid., p. 165):

With considerable sums of money on the line, much could hang on a stray word. Toward the end of the trial Judd's lawyers called James Maurice's former assistant, who gave testimony strongly suggesting that Maurice, the former oil man, had been obliged rapidly to shuffle his own nomenclature after taking up his new commission as the long arm of the fish oil law. Present while Maurice conducted one of his controversial early inspections on several barrels of whale oil, this witness testified that he had overheard someone ask Maurice casually whether he was inspecting "fish oil". To which the inspector, "answered no; but afterwards, looking up and correcting himself, said, yes."

Ultimate victory was Judd's, however, because the original statute was amended by the legislators in Albany, its language being revised. The bill, put forth by Sharpe, authorised the inspection of liver oil, and excepted sperm or whale oil from inspection (Burnett, 2007, p. 187). This was the initiative of Peter Sharpe, the state representative of the city of New York, who as a witness at the trial had "endeavored to inform the jury that the true intent of the legislature extended only to liver oil from bona fide fish" (ibid., p. 187). On appeal, the original verdict of the jury was upheld – the reasoning being that as the law was changed into excluding whale oil, this proved that it originally did include it – and Judd had to pay the fine and legal costs (ibid., p. 189). Judd was wealthy, and this was an acceptable price to pay for the new situation, which vindicated him and the other oil merchants and chandlers. Disgusted because of the restrictions imposed by the new legislation, Maurice turned in his commission as inspector, sold his real estate in the city of New York, and apparently moved out of town (ibid., p. 189).

# 6.1.7.7 Legal Modelling, and Financial Fraud Ontology Transnational Online Investment Fraud

## Richard Leary, Wim Vandenberghe, and John Zeleznikow

The project described here was developed in the early 2000s while the present authors were affiliated with the Joseph Bell Centre for Forensic Statistics and Legal Reasoning of the University of Edinburgh. The project<sup>126</sup> combined legal ontology and financial fraud analysis, as well as knowledge analysis and user

<sup>&</sup>lt;sup>126</sup> In 2003, it was the subject of two workshop presentations by the present three authors (Leary et al., 2003a, 2003b), and this section is based on one of these (Leary et al., 2003b). Moreover, there also have been other publications about the same subject, including a journal article with the same title as Leary et al. (2003b), but by John Kingston, Burkhard Schafer, and Wim

requirement analysis. The context was a European Commission funded project, FF POIROT (financial fraud prevention oriented information resources using ontology technology). Its partners included legal academics, computer science academics, linguists, software houses, and two user partners, CONSOB and VAT Applications (VAT@) who wished to commercialize the consortium's results.<sup>127</sup> It was named after follows in the detective star from fiction, Hercule Poirot, and it was its aim to provide *inter alia* law enforcement agencies with a novel approach to solve the financial fraud puzzle.

The task reported about, here, is the specification of the user requirements that define the functionality of the financial fraud ontology that had to be designed by the FF POIROT partners. The goal of the broader project was to build a detailed ontology of European Law, preventive practices and knowledge of the processes of financial fraud within the European Union. It aims at compiling for several languages (Dutch, Italian, French and English) a computationally tractable and sharable knowledge repository (a formally described combination of concepts and their meaningful relationships) for the financial fraud domain.

Financial fraud is growing faster than international trade. Frauds are *prima facie* more complex and involve larger sums than ever before. More than any other wrongdoing, fraud may involve both civil and criminal legal action. The focus of the FF POIROT project was quite deliberately on criminal fraud. Criminal fraud is clearly enough defined, requiring a deliberate misrepresentation or deception leading to some kind of improper pecuniary advantage. As financial fraud is a very broad field, we have to delineate it to very concrete subdomains that exist in the fraud area. Our initial focus is to examine cross-border Value Added Tax fraud within the EU and Investment fraud on the World Wide Web. This corresponds respectively to the domain expertise of VAT@ and CONSOB. The present Section 6.1.7.7 will only discuss investment fraud on the World Wide Web. The fraud may be committed or attempted in a number of ways.

In developing computer resources such as forensic ontologies, in particular as evidence support for transnational issues in Europe such as financial fraud, we need to be aware of the different legal systems in the European Union. Clearly such resources will also fulfil a strong documentary need for many *bona fide* organizations that depend on meaningful insight in Europe's complex multi-national regulations. There is an urgent need to examine the various European legal systems when trying to build forensic ontologies in Europe. A major reason is that crimes are regularly being committed in transnational domains. This is certainly the case for the two subdomains of financial fraud under FF POIROT scrutiny. Forensic evidence, by definition, can be used in criminal or civil courts. However, in the FF POIROT project, we confine ourselves to an examination of ontologies for criminal

Vandenberghe (Kingston et al., 2004). Cf. Kingston et al. (2003), Kingston and Vandenberghe (2003), Vandenberghe, Schafer, and Kingston (2003).

<sup>&</sup>lt;sup>127</sup> Commissione Nazionale per le Società e la Borsa (http://www.consob.it) and VATAT (http:// www.vatat.com). They are respectively concerned with the share market, and with the Value Added Tax (VAT).

law. A major reason for taking this decision is the different burdens of proof in civil law when compared to criminal law.

One of the resources that were to be built was a partial ontology of financial fraud evidence. To illustrate the role and importance of an evidence ontology, consider that in the process of fact investigation many things are to be discovered including hypotheses (or possible conclusions), evidence, and arguments linking hypotheses and evidence. These arguments are generated in defence of the relevance and credibility of evidence and form the basis for subsequent assessments of the probative force of evidence. During fact investigation, of each episode of which is unique in law, we have hypotheses in search of evidence at the same time we have evidence in search of hypotheses. Also to be generated or discovered were arguments linking the evidence and hypotheses. FF POIROT did not cover these aspects of legal reasoning itself.

An important aspect of FF POIROT was the mining of (formal) ontology elements from unstructured or semi-unstructured re sources such as lexicons, text databases, XML documents, RDF schemes, law texts, and of course the Internet. This involves the processing of natural language, which however in the context of FF POIROT was be assumed to be an a priori limited to the above mentioned component domains. Language understanding is a process that traditionally is recognized to be the result of various kinds of knowledge: phonological, morphological, syntactic, semantic, pragmatic and world knowledge.

For the purposes of FF POIROT, it was possible to simplify the picture and to adopt a somewhat reduced view. Firstly, we can make abstract from the discourse level. Authors of legal documents or descriptive reports on forensic issues in general merely want to convey facts, and not to invoke emotions or to initiate actions by the reader. As such, we can limit our analysis to what in the speech-act literature is known as constative inscriptions, sentences uttered in a descriptive context, however without being too narrow as is the case in the traditional formal linguistic semantics scene where sentence-meaning is viewed as being exhausted by propositional content and is truth-conditionally explicable. Since multilingual resources were one of our main objectives, we could however hardly ignore morphology.

The involvement of this project with ontology technology had its roots in artificial intelligence on knowledge representation. Basic research had concentrated on formal aspects trying to determine the underlying fundamental notions of the way we view the world and its organization, to the point of involving and formalizing central ideas of philosophy. A notable practical effort is the attempted distributed development by the IEEE of a *Standard Upper Ontology* (*SUO*).<sup>128</sup> On the other hand, a lot of attention has been focused on the construction of ontologies from a software engineering perspective. Products of this research were the first partial methodologies for the specific development of ontologies such as METHONTOLOGY and techniques for semi-automatic ontology acquisition.

<sup>128</sup> http://suo.ieee.org

CYC and Ontolingua are best known, among the applied results achieved in the field. Ontolingua is based on *knowledge interchange format* (*KIF*) and considered an important and influential formalism with Lisp-like representation of ontologies, and was proposed as an ANSI standard and is also being used in the IEEE SUO effort cited above. We did not adopt this latter formalism in FF POIROT for its suspected lack of scalability to the size of the terminology databases and corpora we were expecting to mine, or the number of concepts we will need to align to in the project. Instead, we adopted a more "layered" approach for the FF POIROT ontology and its tool set inspired by the way "classical" large database systems are typically set up.

According to the well tried ontology base, we envisaged a set of "language independent" domain specific atomic facts, which we called *lexons*, and instances of their explicit interpretations. The latter in this way form a separate layer mediating between the ontology base and the application instances committing to the ontology. It is precisely this aforementioned separation in relational database systems that allows for the high efficiency and scalability of its management tools (DBMS), the sometimes huge size of the "models", and high volume transaction processing. Also, a number of well-known techniques from the database view and schema integration were to be evaluated and tested for alignment and merging of the different parts of the ontology. Since the ontology will be built up from components for the different subdomains (evidence, law and finance) the issue of scalability for ontology modeling were to be encountered in each of these three dimensions separately as well as across different domains when these subdomains are aligned and/or merged to create the financial forensics ontology.

Let us now turn to an abstract model of online investment fraud. In order to identify signals useful to the reduction of uncertainty associated with the presence of suspect solicitation agents on WWW, it is useful to be able to analyse the fraud in the form of an abstract model. This section will assess the potential of the fraud model and explain the methodology which supports the model. The objective of our legal model was that it should be helpful in the process of designing the financial fraud ontology.

In the tradition of Wigmore and Twining, the proposed method of knowledge modeling is by using inference networks of law. These are representations for complex probabilistic reasoning tasks often based on masses of evidence. This is highly useful as online investment fraud cases are notorious for huge data files to be investigated. The model is a directed acyclic graph; it is directed because it shows the direction of reasoning, or the direction of probabilistic influence among nodes on the network. It is acyclic because, following any reasoning path, you are never led back to where you started.

Further the model is an integrated logic based model. For the purposes of reasoning about evidence in fraud cases it seems to us there are three types of logic to take account of: logic of deduction, logic of induction; and logic of abduction. Depending upon the problem faced, any one or any combination of these forms of logic can be used. It is not a binary issue of logic or no logic.

It is essential that crime investigators work within a guiding frame so that certain items become evidence and certain other items can be discarded. The better they get at the art of solid reasoning, the more efficient they will be in solving their cases. Using logic to untangle complex scams and solve the complicated puzzles of crime means the difference between dead reckoning that can steer an investigator in the right direction and random guessing that can make things hopelessly confused.

The main idea of the model is that fraud cases can be broken down into three distinct layers of information. Firstly, a proposition (hypothesis) layer, secondly a law layer and thirdly the evidence layer. Any case will therefore have a layer of information about the hypothesis or case theory, for example, (X Defrauded Y), a layer of information about specific elements of law that need to be satisfied if a case of fraud is to be proven and, thirdly, there is an evidence layer comprising all the material facts and evidence that go to make up the facts of the case. The following is an abstract model of the different layers involved in constructing or assessing a legal case. Note that the chart provides the abstract model and the Key List describes the component parts of the model. See Fig. 6.1.7.7.1 and Table 6.1.7.7.1.

The abstract model is arrived at by asking a series of questions aimed at exposing the relationships between propositions of law and propositions of evidence. Although these questions appear in the form of a hierarchy above, when being used to discover the presence of a fraud within a tangible or intangible environment, they can be asked within any sequence including "top down" and "bottom up". Logic can therefore be both ex ante or ex post. In other words, we can move from facts to conclusions and from conclusions to facts. An investigation may be a waste of time and money, however valid its legal conclusion/hypothesis, if evidence is not gathered to support that conclusion.

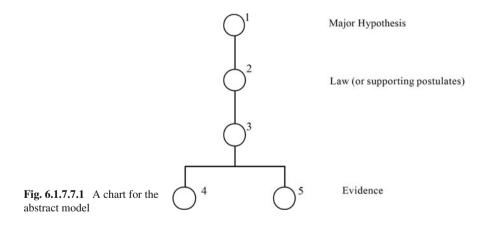


Table 6.1.7.7.1 Key list

- 1. What is the ultimate intended aim (major hypothesis or proposition)
- 2. What is the substantive law that will be breached if the ultimate intended aim is reached
- 3. What are the acts or omissions that need to be undertaken (or not undertaken) if the ultimate intended aim is to be achieved?
- 4. What acts or omissions are generally seen if the ultimate intended aim is to be achieved?
- 5. What acts or omissions are generally not seen if the ultimate intended aim is to be achieved?

However, it should be borne in mind that in terms of completeness, no matter how thorough the query and search process is, there will always be unanswered questions and, no conclusion, no matter how well formulated, can ever account for all the facts we may potentially encounter. The evidence layer can become extremely complex for a number of reasons which will be explained henceforth.

We now turn to the *complexity of the evidence layer*. We articulate this in five points. Firstly, evidence or facts are always context specific. That is, the relevance of the evidence will be determined by the circumstances in which it is under consideration. Any item of evidence can be used for more than one purpose. It is not unusual for evidence to be used by different sides in a case for different purposes. A prosecutor may seek to use evidence of previous bad character to show that a suspect has a propensity for particular types of behaviour whereas the defence may seek to use the same evidence of previous bad character to demonstrate that the suspect has not offended for a considerable amount of time and is therefore reformed. In other circumstances, the defence may choose to use the same evidence to demonstrate that the suspect could not have fully participated in the crime because he was in prison during the preparatory stages of the offence.

Secondly, evidence never arrives in the hands of the user with its credentials made out. The relevance, credibility and weight of the evidence always has to be assessed and declared.

Thirdly, the user of evidence is always biased to some degree in the interpretation of evidence. Each user should be aware of their "standpoint" in using evidence and be prepared to declare it. Different persons have different standpoints each of which may result in a different interpretation of the evidence.

Fourthly, evidence is a word of association and therefore it can only be assessed by comparing, contrasting and juxtaposing it with other evidence and hypotheses. Hence, it is not possible to have a "single item of stand alone evidence." There is always other evidence.

Fifthly, all evidence can be broken down into smaller component parts. For example, an item of documentary evidence may be made up of paper, writing, ink, type face, a post mark, glue. The document may even have a fingerprint, a DNA stain or a discarded hair stuck to it. This atomistic view of evidence results in a situation where all evidence can be infinitely broken down into smaller and smaller parts which means that it can always be seen in the light of other evidence. This ancillary evidence about evidence can provide important insights into the relevance, credibility and weight of the evidence as a whole. A question for the user is always going to be "at what level of detail and at what level of granularity should the abstract model be considered to be complete?" This question is most important in fields such as criminal law. The reason is that it bears directly on the forensic standard "beyond a reasonable doubt". Regardless of how well a particular model appears to be formulated, there is always room for doubt. Facts are based on evidence and evidence always falls short of certainty.

Let us consider now *the role of evidence in argumentation*. Arguments are made up of *hypotheses*, sometimes called *propositions* or *case theories*, *chains* of directly relevant or indirectly relevant evidence and *generalizations*. Generalizations are generated by humans from perceived signals and stimulus in the environment. Generalizations may be presented by one person to another in circumstances where they become simply "accepted facts". These interactions take place between humans in the normal course of communication.

Others are formulated by direct perception of new signals by a single person. In reality, the process of reasoning from *evidence* (*signals*) to *hypothesis* (*case theory*) inevitably involves both. A useful way to think about generalizations is that they are clusters of signals assembled into forms that resemble an explanation or a story.

Because *generalizations* are constructed by the clustering of different forms of signals and stimulus from different sources of information, in the pursuit of different objectives and by different people, they exhibit highly subjective characteristics. This means that generalizations need to be managed with care. Understanding the fundamental steps in the construction of explanations and stories from mixtures of hypotheses, evidence and generalizations provides valuable insights into human decision-making. Furthermore, assessing the reliability of the grounds upon which an explanation is constructed provides a means to grade validity. Assessments about validity of explanations are inevitably uncertain and therefore can only be used as inferences towards to away from the hypothesis under consideration. That does not mean they are of limited use. If maximizing the frequency of desired outcomes as opposed to undesired outcomes is important, systematic methods have much to offer humans engaged in processes like investigation, decision making or the assessment of risk.

*Generalizations* are formulated by first and second hand exposure to information about events in the environment. We receive and process signals generated by these events and experiences and our sensory receptors process the signals into scenarios we can store and recover from memory. Views are generated about event types and often about causality. The purpose of this process in ways that can assist us in dealing with future. We formulate views of event are supported or negated by ancillary evidence. Evidence is therefore but one component used in the construction of legal arguments.

*Inferences* flow from items of evidence, generalizations and ancillary evidence towards or away from the hypothesis or proposition. Evidence therefore tends to support or tends to negate the hypothesis under consideration. Handling evidence in cases is therefore complex by virtue of the number of different ways the hypothesis, evidence, generalizations and ancillary evidence can be brought together.

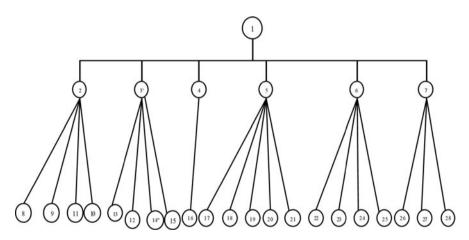
In order to consider *the anatomy of the case as a whole*, we consider now a *case study*. Let us begin with *facts*. The following model was extracted from an actual case file of unauthorized online solicitation that occurred within the jurisdiction of the Italian financial market regulated by CONSOB.<sup>129</sup> The company Smallxchange, headquartered in the British Virgin Islands, aims to become an unofficial 24-h stock exchange on which any company in the world can be listed at no charge. In return the investors are asked to tender shares in exchange for a stake in the venture. The shares

<sup>&</sup>lt;sup>129</sup> See CONSOB's weekly newsletter (October 2001).

would then be traded between partners in this unofficial stock exchange. Investors were solicited by a WWW Page advertising financial investment services (public offering of participation certificates).

In order to establish the efficacy of regulation of fraud on the Internet, it is necessary to consider whether CONSOB has appropriate jurisdiction.<sup>130</sup> CONSOB considered that its jurisdiction was asserted as Smallxchange targeted the national investment market of Italy. The soliciting agent was not licensed to trade as required under Directive 93/22/EEC (and its implementation in Italy: Legislative Decree 58) and false statements were made on the web page.

The illustration is an abstract model of the fraud. Note that the model is comprised of true claims (signals) as well as false claims. Refer to Fig. 6.1.7.7.2. Node 10 is a false statement aggravating the fact that the company, although properly constituted in law in UK, was not licensed to solicit investment services. This is a simple model but a more detailed model follows later. The chart in Fig. 6.1.7.7.2 depicts a simplified version of an investment scam online. In fact it could involve many more individuals, and so forth. There are three levels in the hierarchy. The top level, which only includes Node 1, corresponds to a *major hypothesis*. The middle level comprises a few nodes which correspond to *law* (or *supporting postulates*). The lowest level in the hierarchy, which comprises most nodes, corresponds to *evidence*. See a key list in Table 6.1.7.7.2. Next, refer to Fig. 6.1.7.7.3 and its respective



**Fig. 6.1.7.7.2** A simplified version of an investment scam online: the low level of detail of the abstract model. The *numbers* refer to the number of a proposition on a key list of the evidence being charted. At the top level we find a major hypothesis, at the middle level, law (or supporting postulates), and at the lowest level, the evidence. See a key note in Table 6.1.7.7.2

<sup>&</sup>lt;sup>130</sup> This must be considered separately from the regulator's ability to enforce its powers within such jurisdiction. For example, a securities regulator would first need to consider whether a security was being advertised or sold within its geographical jurisdiction and secondly, whether or not the person advertising the product was subject to their regulation.

Table 6.1.7.7.2 Key list

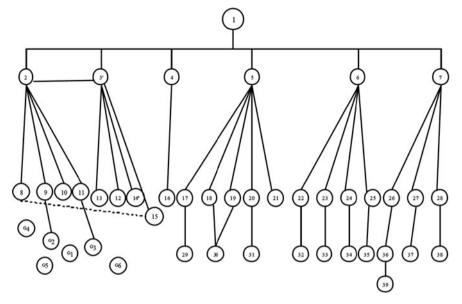
- 1. Smallxchange.Com Ltd is fraudulenty solicited investment services on the WWW
- 2. Targets the national market (i.e. the Italian public/investor market) (assertion of jurisdiction)
- 3. Smallxchange solicited securities services on WWW for investors
- Requirement to inform Consob of its existence and to comply with minimal disclosure rules on technical details
- 5. Unauthorised sollicitation of investors (contra article 94 of Decree 58)
- 6. Unauthorised alternative trading system (contra article 102 of Decree 58)
- 7. Placing of unauthorised funds
- 8. An Italian ISP hosted the site
- 9. Most of the advertising was in Italian
- 10. Company is run by Italian executives
- 11. Possibility of paying in lira/euro
- 12. Non fulfilment
- 13. Web site lists shares for sale
- Gianni Altieri was offered investment services by Smallxchange via email dated August 29, 2000.
- 15. http://www.smallXchange.com is a Web Site managed by Smallxchange Ltd.
- 16. http://www.smallXchange.com is hosted by Smallxchange Italia s.r.l.
- 17. Public offering of financial products
- 18. Shares of the companies listed on the stock exchange
- 19. Shares of the stock exchange in exchange for shares of the listed companies
- 20. Mutual fund shares
- 21'. Unauthorised public offering
- 22. Organization of a stock exchange
- 23. Quoted companies
- 24. Clearing house
- 25. Trading book
- 26. Placing of a fund
- 27. Asset management company
- 28. Fund name

key list in Table 6.1.7.7.3. Again, at the top level we find a major hypothesis, at the middle level, law, and at the lowest level, the evidence.

The abstract model lends itself to both macro and micro analysis. The model is a network of links and relationships between different items of evidence (signals). This allows finer analysis to be undertaken including the introduction of new signals. The analyzer of the case must however at some stage decide when to stop. The nature and characteristics of evidence signals means that the analyst could continue to analyze to ever smaller levels of detail.

The abstract model in Fig. 6.1.7.7.4 is a micro analysis of elements 7, 26, 27, 28, 36, 37 and 38 from the key list. Element 7 in the key list refers to a section of the law which demands that if the placing of unauthorized funds is to be proven, then an inducement to acquire securities must be shown to exist. Different sections of the abstract model can be broken down in this way to provide ever more detailed analysis.

An *evaluation of the abstract model* follows. The abstract model provides a number of benefits in the construction of fraud templates:



**Fig. 6.1.7.7.3** A simplified version of an investment scam online: the higher level of detail of the abstract model. The *numbers* refer to the number of a proposition on a key list of the evidence being charted. G stands for *generalization*. At the top level we find a major hypothesis, at the middle level, law (or supporting postulates), and at the lowest level, the evidence. See a key note in Table 6.1.7.7.3

- Table 6.1.7.7.3 Key list
- 1. Smallxchange.Com Ltd is fraudulenty solicited investment services on the WWW
- 2. Targets the national market (i.e. the Italian public/investor market) (assertion of jurisdiction)
- 3. Smallxchange solicited securities services on WWW for investors
- Requirement to inform Consob of its existence and to comply with minimal disclosure rules on technical details
- 5. Unauthorised sollicitation of investors (contra article 94 of Decree 58)
- 6. Unauthorised alternative trading system (contra article 102 of Decree 58)
- 7. Placing of unauthorised funds
- 8. An Italian ISP hosted the site
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- 11. Possibility of paying in lira/euro
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- 15. http://www.smallXchange.com is a Web Site managed by Smallxchange Ltd.
- 16. http://www.smallXchange.com is hosted by Smallxchange Italia s.r.l.
- 17. Public offering of financial products
- 18. Shares of the companies listed on the stock exchange
- 19. Shares of the stock exchange in exchange for shares of the listed companies
- 20. Mutual fund shares
- 21'. Unauthorised public offering

- 22. Organization of a stock exchange
- 23. Quoted companies
- 24. Clearing house
- 25. Trading book
- 26. Placing of a fund
- 27. Asset management company
- 28. Fund name
- 29.-36. Etc.
- 37. Tricalpa Investment Inc.
- 38. Millenium Bug International

39. Etc

G1 The presence of references to facts and circumstances concerning Italy in the site

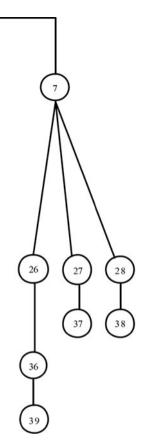
- G<sub>2</sub> The Employment of the Italian language
- G3 The indication of prices or amounts in Italian lire or Euro
- $G_4$  The operations in Italy of intermediares through which it is possible to carry out or agree to the promotion or placement executed through the Internet
- G<sub>5</sub> The spreading of information in Italy; it is included the execution of individualized or mass advertising or information campaigns in Italy, with the object similar to the site contents

G<sub>6</sub> The availability of the site through search motors specialized in Italy or Italian

- It uses rational principles for the combination of the key logical components in fraud: A proposition, the law, evidence and generalizations;
- It facilitates a method for combining key logic. Same "logic" in detection, prevention and prosecution;
- Provision of both holistic and atomistic (macro and micro) analysis of the key components in fraudulent activity. Consequently it facilitates to imagine all the sources of doubts that may lurk between the evidence;
- It ensures that the analysis of fraud cases is undertaken in a rational, repeatable way which can be conveyed to others for analysis and use (checking the coherence of your argument; convincing others of the relevance of an item of evidence);
- It provides the basic abstract model from which computational models can be constructed;
- It facilitates both "top down" and "bottom up" analysis of the key components in fraud.

We next concern ourselves with the *user requirements analysis*. What key features and requirements of the financial fraud ontology are important from the user's point of view? We set out a systematic requirements analysis by identifying and documenting the main needs of fraud investigators. We first consider the *method*, and *the breakdown of the users*.

Requirements gathering can be done using a number of different methods separately or in combination. We decided to organise the activities along three lines. First, we consulted the literature on financial fraud. To complement the literature review of the phenomenon of financial fraud to include the practice of fraud with VAT and fraud with securities, a number of structured interviews **Fig. 6.1.7.7.4** A micro analysis of elements 7, 26, 27, 28, 36, 37 and 38 from the key list



were conducted with representatives from several institutions in all three countries. Moreover, consortium expertise was used to accumulate necessary information for the construction and testing of a financial fraud ontology. Finally we had brainstorming sessions.

The ontology should at least be useful to three different and EU-relevant types of user communities:

- financial professionals: Accountants, auditors, banks, insurance agencies, government departments, regulators and financial experts
- Police and other law enforcement agencies
- Investigative and monitoring bodies

The emphasis is on defining what is required in terms of the information requirements rather than how the system should be physically implemented. Step one was to figure out what information would help investigators do their job better. Thus we start of with explaining the ontology functions. Then we will scrutinize the specific requirements for each fraud subdomain. Analogue with this is an analysis of the system attributes.

We start with general strategic requirements. The system has to be effective and efficient in deterring and preventing financial fraud. Central to achieving this is the identification of fraudulent activity from what is often a vast array of data. Eliminating legitimate activity from illegitimate activity is at the core of the problem, a fact that fraudsters know and use to hide illegal operations.

Illegitimate activity ranges from complex, organised and well thought through fraud to simple, disorganised and opportunist fraud. However, care needs to be taken not to assume that because a fraud is simple, disorganized and not particularly well planned that it will not have serious consequences. The www provides many examples of simple single frauds perpetrated for what may appear small financial gains. However, when these are added together, large amounts are often involved. This is used by fraudsters in both VAT fraud and Investment and Securities fraud. Single fraudulent transactions may involve small sums but when added together in the form of a "continuing fraudulent operation", massive sums of money can be involved and often over small timescales.

All fraud, complex or simple, involves at some stage of the process a breach of trust, confidence and fiduciary duty between a victim and a fraudster. Gaining and harnessing an understanding of this relationship and building it into the ontology, provides many opportunities for the identification of fraud. Refer to Table 6.1.7.7.4.

Let us consider, now, temporal awareness of fraudulent actions. Identifying different types of Patterns of fraudulent activity over time is a useful inquisitive technique for focusing the process of enquiry. A useful methodology is to develop a classification of events and activities that take place at different stages of fraud as the process unfolds. For example, events and activities that take place in before the fraud is committed (preparatory acts or omissions) events and activities that take place at the time the fraud is committed (actus reus) and finally, events and activities that take place after the commission of the fraud (consequential acts). See Fig. 6.1.7.7.5.

Table 6.1.7.7.4       Victims vs.         fraudsters	Victim		Fraudster
	Buyer		Seller
	User		Supplier
	Employee Investor	Employer Investment advisor Agent	
			Principal
	Beneficiary		
	Manufacturer		Vendor
	Stockholder		Executive
	Customer		Broker
	Before the fraud is committed	At the time the fraud is committed	After the fraud is committed
<b>Fig. 6.1.7.7.5</b> Time in relation to fraudulent actions		Time	

# relation to fraudulent actions

#### 6.1 Methods

A major task in fraud detection is constructing models of fraudulent behavior. This identifies key characteristics of fraud which can be used to prevent future frauds (online fraud detection) and for detection of past frauds (a posteriori fraud detection). It can also be used to identify ongoing fraud.

Fraud cases are notorious for their complexity. This complexity is usually caused by the complex nature and extent of the information involved. Said briefly, the law is often simple but the facts and evidence is often complex. Therefore, the ontology has to be able to manage and control the masses of data gathered during financial fraud investigations. This can aid the investigator to in focusing on relevant areas of law, the relevant facts in issue and the links and associations inherent in the evidence. Some associations between hypotheses, law and facts in a fraud model may be obvious, but others may be less so obvious. Simply modelling these relations is an important part of investigative methodology. Identifying what may be obvious and what may not be so obvious, lies at the heart of effective modelling and investigation. The way in which simply modelling and visualizing the relationships between the hypothesis under investigation, the law and the evidence, should not be under-estimated.

The following top-level strategic requirements were identified:

- 1. The user needs to be able to identify the species of fraud involved. This may be in terms of a legal definition but it will also be in terms of the methodology adopted to commit or even plan the fraud.
- 2. The user needs to be able to identify and express a hypothesis. The hypothesis will be in the form of some tentative explanation, a theory that requires explanation or some exposition. This exposition may or may not be able to account for the law and facts presented. In brief, the user must be able to identify associations between legal rules, facts and explanations gathered during investigations.
- 3. Pre-condition: to automate pattern searching to reveal previously unknown relationships.
- 4. The user must be able to streamline and standardize data capture, storage and analysis.
- 5. The user must be able to engage in the synthesis of probable and even possible models of fraud.
- 6. The user must have access to an information infrastructure for investigations
- 7. The user must be able to have access to information that is geographically specific.
- 8. The user must be able to have access temporal classifications and associations.
- 9. The system must provide clear audit trails.
- 10. The system must be sensitive to privacy and digital rights management.
- 11. The system has to work interoperable: the system has to take into account the different regulatory requirements, i.e. it has to work cross-jurisdictional; across the UK, Belgium and Italy. A system that will be deployed across multiple jurisdictions, faces the fact that no two law enforcement agencies store their incident data in exactly the same way. Thus it is important to have a data organization design that is flexible enough to be applied to any underlying data set.

- 12. A system should use standard and non-standard querying techniques so that it can be used to identify standard patterns of fraud and non-standard patterns of fraud.
- 13. The system has to incorporate knowledge from different domains.
- 14. The user has to be able to share information amongst regulators in the EU.
- 15. The system must be able to conduct querying on the basis of incomplete information.
- 16. The system needs to be able to be interoperable between agencies.
- 17. The system and users need to be able to use "Red Flags" and "Alerts" sensitive to fraud signals.
- 18. The system must be sensitive to both fuzzy and linear associations. Associations between facts and law are often fuzzy rather than linear.
- 19. The system has to look at multiple factors in a potential fraud case and select only those where it assumes a certain degree of likelihood of fraud for manual review.
- 20. The system has to include a kind of electronic case management system; to store and work on new cases. This includes a case chart; interests harmed; estimated losses; target; geography.
- 21. Investigators often need to be able to justify and document the manner in which they draw a conclusion. This is used in legal proceedings to justify subsequent actions. A search history should be designed to address this need.
- 22. The General User Interface (architecture) should be simple but adequate to achieve the requirements of the user.

The following points were taken into consideration:

- Confidentiality requirements;
- Privacy rights;
- Digital rights;
- Priority issues;
- Entities to be investigated;
- Periods to be covered in investigation;
- Authority to obtain information and access to premises and records;
- Identify key issues: consider: business activities; operating locations; trading record; management; audit reports; cash flow and financing;
- Decide on documentation to be seized: consider: evidential requirements;
- Range and location of documents to be seized;
- System scalability;
- Graphical User Interface (GUI) ergonomics.

Let us consider the user requirements for CONSOB type fraud. The main objective for CONSOB is a systematic and scalable "web crawler procedure". That is, closing the gap between inspection and enforcement in such a way that enables the user to detect more fraud with lower false positives. At the time we were developing the project CONSOB's procedure, which is fundamentally based on keyword-search, consisted of using different Internet search engines (such as Altavista, Googly, Yahoo, and so forth), as well as several meta-search engines. The search result is a list of web sites whose content is investigated by CONSOB's inspection officers in order to analyse and identify market abuse phenomena, abuse provisions of investment services and investment solicitation. The keywords are selected and combined to manually create complex queries on basis of the experience acquired during the ordinary supervision activity of the CONSOB's operative units. The use of the FF POIROT ontology in CONSOB's business case is related with the use of tools able to automate the query launching and to optimise the web information retrieval results. That is to say:

- Ability to examine possible fraudulent websites, and the links included on that website.
- The system has to be attached with several subject-specific thesauri, databases of term phrases with respect to the specific crime of fraudulent online investment solicitation.
- Finding suspected information on the World Wide Web: A web crawler (a proprietary search engine as opposed to general-purpose search engines) with a twofold search task: Which sites are selling securities AND which securities are being sold unlawful. Identification of traders in investment funds on the web. Identification of those traders who are not licensed. Proving that point above are engaged in trading in investment funds.
- A match program to compare the found pages with the search intention to filter out the irrelevant pages (lexicographically).
- Data manager; is responsible for the management of search results.
- A program to compare the search intention with web pages lexicographically to filter out irrelevant pages.
- Application of image processing technology in the search task.
- Facilities for organizing and managing search results should be provided.
- Semantic analysis of the selected pages shall be done to identify the pages containing crime information. First by a natural language processor and, then, by human experts.
- A central repository to store the relevant web sites after the semantic analysis. The system should keep a detailed history of the fraudulent website and changes to it to make the job easier for prosecutors (Collection of suspected information). A centralized database with a fraudster's name, method of operation, email address, URL, screen names, or other pertinent data would serve as a national repository for these crimes and criminals. As financial crimes conducted on the World Wide Web are particularly difficult to solve, but investigators linked through such a system could connect clues from various jurisdictions.
- If a page is verified as containing crime information, it will be processed automatically to abstract new concept terms that are to be added to the database for supporting further search.

The user requirements for combating VAT fraud were as follows. The main objective in fighting cross border VAT in the EU is to establish an effective system of mutual

assistance and information exchange in order to ensure the proper functioning of the VAT system. A possible use case is an automatic and preferably a spontaneous exchange of information to help in the detection and prevention of fraud in intra-Community trade.

The system needs to enable two-way co-operation. This is in terms of maintaining and respecting legal authority of a European Union (EU) Member State but at the same time cooperating with other national authority's of other EU Member States. The Ontology would provide a solid base for the monitoring and enforcement of non-compliance of VAT laws. This should include:

- data integration within the same agency;
- data integration between different (national) agencies;
- data integration between two or more EU Member State agencies.

Fuzzy logic is central to the effective investigation and identification of tenuous and non-descript facts within a suspected or potential fraud. Distinguishing between probable, potential, accepted facts and frauds will enable and support better decision making and resource management.

The average life span of a VAT carousel fraud scheme is four months. After four months, the fraud organizer will make changes to the fraud scheme (adding companies, taking companies out, etc). Using fuzzy logic allows the system to adjust the profile dynamically as data are being analyzed. The output of the fuzzy logic system is twofold. First, a degree of likelihood of fraud is assessed by the fuzzy logic system. A second output variable gives an indication why a certain invoice claim was considered to be possibly fraudulent by the fuzzy logic system.

- a. Active logic inference engine (VAT fraud à Customs & Excise have power of criminal investigation. While their counterpart in Belgium do not have this power. Only the police have the power to investigate in Belgium. You want to have the system to know this).
- b. Contextual computing (building in the ability to learn from data should enable systems to apply individual context to decision making)
- c. Recognise trends in VAT Fraud. Follow up developments in used techniques. Fraud control is played against opponents who think creatively, adapt continuously, and relish devising complex strategies. So a set of fraud controls that is perfectly satisfactory today may be of no use tomorrow, once the game has progressed a little. Maintaining effective fraud controls demands continuous assessment of emerging fraud trends and constant, rapid revision of trends.
- d. The system has to be flexible: VAT fraudsters need only a few days or weeks at the most to change tactics once they find out a particular method is thwarted. For example, new buffer companies. Because fraud control is dynamic and continuously evolving, a static set of filters has only short-term value.
- e. The investigator will analyse apparently random data such as invoices files to determine if some external agent (fraudster) is distorting the random nature of the data and leaving a noticeable pattern. Model has to make it feasible to distinct between simple irregularities and actual fraud.

- f. System needs a typology of VAT fraud.
- g. Multiple data sources (VIES, ICT listing, etc) are often used, each having different functions and user interfaces. This adds another dimension of difficulty for the end-user. One easy-to-use interface that integrates these different data sources is needed
- h. The system has to recognise all national rules.
- i. An ontology is needed to enable a correct and rapid analysis of the VAT regulations in different member states and to keep analytical activity up to date.
- j. This cross linking to the various national statutes is highly relevant for VAT officers because VAT fraud often has a cross border element. It helps the VAT officer who does not understand the different languages concepts and their meaning.
- k. Data mining: to identify deliberate falsification of data (invoices) held within external database sources (VIES, etc.).
- 1. Graphical/illustrative presentations of key issues assist users in understanding them. In the case of the UK, visualization will not only assist users. During a trial, the evidence of a fraud investigation is inevitably complex and mountainous. Presenting this information in court to a lay jury is frequently seen as one of the biggest hurdles in any case. Applying simple, clear graphics to illustrate complex commercial data or financial transactions can help a jury to understand highly intricate cases.
- m. In fraud detection and investigation it is essential to develop a fraud risk profile in order to identify those areas that are vulnerable to fraud and to establish applicable and appropriate red flags.
- n. Presenting the data in a way that it is easily understand by the judge, client, and so forth.
- o. Running of multiple profiles. Indicators: rarely can fraudulent activity be detected through the use of a single profile. Similarly, the running of multiple profiles is normally time consuming and a drain on resources. For example, other profiles in VAT transactions may include post box service, and so on. As a result, the trend is increasingly towards fully automated systems that can repeatedly run all the know profiles.
- p. Concerning VAT, a lot of the tasks are repetitive. For example, checks to ensure VAT numbers are valid. This should be automated so the investigator does not spend time running these tests.

A discussion of *meeting the requirements* follows. When the requirements are met the resulting environment will be useful to the above mentioned target audience in a way that:

1. Investigative and monitoring bodies will benefit from the strongly enriched information retrieval made possible by linking e.g. internet or database search facilities to the FF POIROT ontology in order to detect or investigate instances of attempted or actual financial fraud. Species of fraud (typologies) have been identified so that macro and micro analysis can be undertaken then used as "templates of fraud". These templates can be stored, accessed and used to mine for

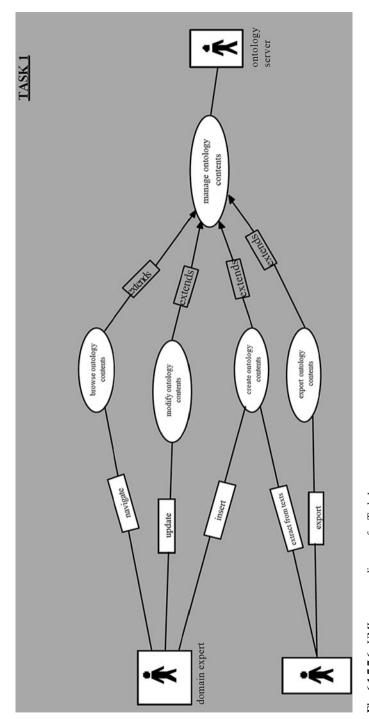
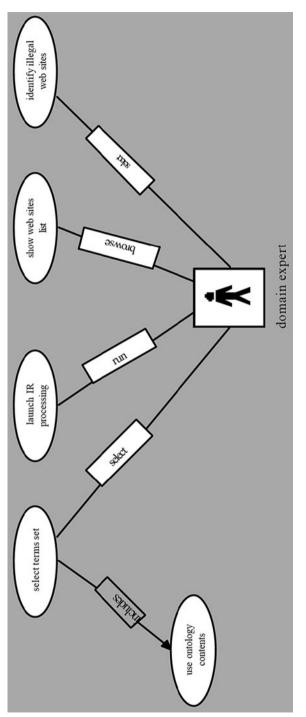


Fig. 6.1.7.7.6 UML use case diagram for Task 1





new frauds across linguistic and jurisdictional boundaries. In addition, they can use partial templates (bits of the model) to act as "attractors" or "magnets" which they can use to mine for data that might (when drawn together) amount to a fraud.

- 2. Financial professionals will benefit from an "FF POIROT style" ontology using it as an authoritative concept base, extensively cross-linked (to other domains, systems and languages) and available for customized applications. Exploitation in this area could be as a high-tech service extending similar services and products (viz. on European VAT in respect of accounting rules) currently already commercialized by at least two of FF POIROT's users.
- 3. Law enforcement: benefit by the availability of relevant parts of the FF POIROT
- 4. ontology; for example, as an RDF-mapped Semantic Web resource, to support *future*
- 5. *police-oriented query systems*, in a non-technical user-friendly, attractive, and comprehensive manner. Additionally, sharing of information with investigative bodies and understanding of related documents will be substantially enhanced if such communication and documents are hyperlinked to a shared ontology. Optimizing the investigation, discovery, prevention and reduction of complex frauds is being made routine and efficient.

Let us consider *use case decomposition*, for the CONSOB part of the project. The use case diagram in two parts, drawn in UML format,<sup>131</sup> shown in Figs. 6.1.7.7.6 and 6.1.7.7.7, represents the CONSOB showcase in terms of actors, use cases and interactions amongst them. Actors are users and external systems. In order to make these figures comprehensible, a short description of the scenario relevant to the use case identified is given hereafter.

This is mainly based on a document by Maria Vittoria Marabello of Knowledge Stones S.p.A., within the FF POIROT consortium. Task 1 consists of *accessing and editing the ontology contents*:

- *Manage the ontology contents*: This use case occurs each time the user wants to access and manage the contents of the domain specific ontology, extracted from texts by the *ontology extraction tool* (OET), integrated and made available by the project's ontology server.
- *Browse Ontology Contents*: This use case occurs when the user wants to navigate the ontology contents.
- *Create Ontology Contents*: This use case occurs when the user wants to update the ontology contents by manually creating new elements.
- *Modify Ontology Contents*: This use case occurs when the user wants to update the ontology contents by changing the available elements.
- *Export Ontology Contents*: This use case occurs when an upload of the domain specific ontology contents into the project's ontology server is required.

<sup>&</sup>lt;sup>131</sup> UML is the Unified Modeling Language. This is a widespread language for such purposes.

Task 2 consists of supporting the Web investigation:

- *Select Terms Set*: This use case occurs each time the user wants to select a terms set to feed the information retrieval process, by means of which it is possible to identify financial frauds carried out through Web Sites.
- *Use Ontology Contents*: This use case occurs when the user wants to select a terms set to feed the information retrieval process. The terms set has to be part of the project's ontology validated contents.
- *Launch IR Processing*: This use case occurs whenever the user wants to start the IR process, in order to select a group of sites potentially carrying out a financial fraud.
- *Show Web Sites List:* This use case occurs each time the user wants to look at the list of sites produced by the IR process.
- *Identify Illegal Web Sites*: This use case occurs each time the user, by looking at the sites list produced by the information retrieval process, can carry out a Web Site inspection to identify the illegal services there proposed.

In the present Section 6.1.7.7, we have explained how we approached the tasks of setting the user requirements for a project envisaging the development of an ontology prototype concerning financial fraud. Whilst the initial prototype was to be designed to fulfil the requirements expressed here, it also had to be designed for flexibility, in order to allow easy modification and iterations based on use cases, user feedback and user-testing results. As this was an *initial* analysis of user requirements, there should always be scope for discussion on new necessities of the system.

## 6.1.8 Automatic Text (and Multimedia) Summarisation

### 6.1.8.1 An Overview

Automated summarisation may or may not be associated with *text mining*, but it is relevant for both investigative and judicial or juridic context.<sup>132</sup> Sometimes researchers who are engaged in the detection of crime, are also researching text mining or then the automated summarisation of large documents, which is the case of Christopher Yang, who has published about knowledge discovery and information visualisation for terrorist social networks (Yang, 2008), but has also published about the hierarchical summarisation of large documents (Yang & Wang, 2008).

Writing a summary is a cognitively demanding task for humans, who moreover can be expected to approach it in different ways, to varying degrees of satisfaction for their clients, who in turn apply criteria relevant for given purposes. All

<sup>&</sup>lt;sup>132</sup> The present Section 6.1.8.1 on automated summarisation is an adaptation of Nissan (2003h).

the more so, good summarisation is an ambitious task for automated *NLP* (*natural-language processing*) systems. The sheer amount of information flowing in as online text makes the allocation of human time to process it prohibitive, in given contexts. Hence, the appeal of the prospect of having automated tools carrying out summarisation or, at the very least, the kind of sorting that goes under the name *story categorisation*.

For *news story categorisation systems*, already in the 1980s nice results could be shown, combining information retrieval and NLP: Hayes, Knecht, and Cellio (1988) reported about a tool that, while

["]not perform[ing] a complete semantic or syntactic analysis of the input stories" — a stream of news stories — was sophisticated enough to handle such lexicon that its superordinate semantic concepts would make for misleading predictions about the category in which the story belongs. "We were prepared for sports stories that looked like metals stories ("...*captured the gold medal at the summer Olympics*...") or like war/disorder stories ("...*the battle on center court at Wimbledon*..."). A more difficult challenge was posed by words and phrases that were good predictors of a particular topic but occurred randomly across all story types, sometimes with the same meaning, sometimes not. [...] Metaphorical language was also a problem — not use of fixed phrases (we had no trouble failing to assign the category **metals** to a story that contained the phrase *like a lead balloon*) — but rather creative metaphorical language. So, a story about a series of battles in the continuing disposable diaper war between Proctor and Gamble and its competitor was assigned to the disorders category.

Automatic summarisation is more demanding. In fact, it requires endowing the tool with enough understanding of the text, that another text be generated, conveying a sensibly identified gist of the input. When one has AI application in the legal or investigative domain in mind, it is a matter of course to point out that case summarisations are of paramount importance in the workings of the judiciary, both for a case at hand, and in the record of the past as subserving the construction of new cases that may obtain. Even more to the point, *text mining* for investigative purposes can greatly benefit from automatically generated summaries, which once they come to the attention of human analysts, would motivate them to read some given detected documents.

In the SALOMON project, Belgian criminal cases were summarised automatically and presented by a case profile. Case category, case structure and irrelevant text units are identified based on a knowledge base represented as a text grammar. Thematically important text units and key terms are selected by shallow techniques. These paragraphs are represented as weighted vectors and clustered. The system points the user effectively towards relevant texts. SOLOMON was described in Uyttendaele, Moens, and Dumortier (1998) and Moens, Uyttendaele, and Dumortier (1999). The next section, Section 6.1.8.2, is going to deal with projects specifically in text summarisation for law.

Inderjeet Mani (2001) provides a systematic introduction to automated summarisation techniques. Which strategies are applied by humans when confronted with the task of writing a summary is a subject discussed early on in the book, by way of its foundation: "the study of summarization by human abstractors provided a useful grounding for automatic summarization. It also became clear that in order to provide a constructive analysis of the field, covering a few critical issues in depth would be preferable to a broad compendium of the tremendous variety of work in summarization" (ibid., p. ix), so that as a survey Mani's book was not meant to be exhaustive.

As could be expected, Mani's own work in the field features prominently in the book, "because of the wealth of system detail I can tap for discussion of these basic issues" (ibid., p. ix). Particular approaches are illustrated in case studies, in view of adoption as a textbook (an aim subserved as well by the review sections placed at the end of chapters; they list and concisely define concepts by way of a recapitulation). The publisher's blurb notes that "the book also includes detailed assessments of evaluation methods and new topics such as multi-document and multimedia summarization", where "multimedia" concerns the input, the output, or both. In multi-document summarisation, "the summarizer identifies what's common across the documents, or different in a particular one" (ibid., p. 13).

In Mani (2001), chapter 1, "Preliminaries", introduces a variety of basic concepts, such as measures of semantic informativeness, or the relationships between indicative, informative, and evaluative or critical summaries. This distinction fits in the transformation stage, which in a general abstract architecture of a summariser, is intermediate between analysis (either generic or user-focused) and synthesis (of either fragments, or connected text).

Mani's chapter 2 is on human professional abstractors. There exists an ANSI standard of abstracting, for which Edward Cremmins was responsible. A book by Endres-Niggermeyer (1998) is a detailed empirical study of human abstractors. Chapter 2 of Mani's book describes, among the other things, how strategies of manual summarization make use of features, e.g. cue phrases (explicit statements of concern or conclusion in the input paper), and in-text summaries (which an author may introduce with "In summary". Location cues from the beginning or end of text units are considered "likely to carry theme-relevant information" (ibid., p. 32), and so is the title cue. Professional abstractors may as well revise author-supplied, computer-produced, or their own draft abstracts (ibid., p. 37). Mani's chapter 4 is on revision.

At the start of his chapter 3, "Extraction", Mani remarks: "For a computer program, extracts are obviously an easier target than abstracts, since the program does not have to create new text. Extraction is a relatively low-cost solution, compared to the additional knowledge resources required to construct sentential meanings or to generate text" (ibid., p. 45): analysis predominates, is shallow, "and rarely goes as deep as a sentiential semantics" (ibid., p. 45). Mani's chapter 5 shows that "extraction can fruitfully exploit a discourse-level analysis" (ibid., p. 45), "though the representation from the deeper analysis isn't present in the extracted result" (ibid., p. 45). Discourse-level analysis is necessary of abstraction, optional for extraction. "Since humans (professional abstractors are often given exemplars of abstracts as guides in training them [...], it makes sense to have machines do the same" (ibid., p. 45).

Unsurprisingly for a treatment of *discourse analysis*, an important part is played by *text cohesion* (Mani, ibid., chapter 5, section 2) and *text coherence* (ibid.,

section 3). It is a coherence relation of the *elaboration* kind that links "John can open Bill's safe" and "He knows the combination" As to cohesion: "The semantic relationships underlying cohesion are ubiquitous in text" (ibid., p. 93), and include "devices such as repetition, anaphora,<sup>133</sup> ellipsis, synonymy, etc." (ibid., p. 93). "Cohesive ties influence the comprehensibility and perhaps even the summarizability of texts" (ibid., p. 93). The discussion in "Cohesion graph topology" (this is the title of Mani's section 2.2) is based on Skorochod'ko's *Connectivity Criterion* ("The salience of a sentence is proportional to the number of sentences that are semantically related to it"), and *Indispensability Criterion*: "The salience of a sentence is proportional to the graph when the sentence is removed" (Mani, ibid., p. 95).

Text cohesion can be used for topic segmentation (Kozima's *Text Tiling* algorithm was devised for that), where: "A topic [...] could be thought of as a text segment that is about a single thing; this notion is somewhat different from the related notion of 'what the text is about'" (ibid., p. 102). *Lexical chains* are a related notion: "if we have one or more topical segments about a particular topic, a chain is a sequence of related words characterizing the topic" (ibid., p. 104). An algorithm for computing lexical chains was proposed by Barzilay and Elhadad (1999).

"An alternative approach to segmenting text into topical regions is to deal with relatively coarse-grained topics for discovering topical segments" (Mani, ibid., 105) – this is the beginning of Mani's section 2.3.3 – and statistical models have been used to that effect. Chapter 6 in Mani (2001), "Abstraction", discusses abstraction from templates (ibid., section 2), or by term rewriting (ibid., section 3), using event relations (ibid., section 4), using a concept hierarchy (ibid., section 5). This is followed by "Synthesis for Abstraction" (ibid., section 6), and this includes both extraction (ibid., section 6.3) and generation (ibid., section 6.4), which eventually results in surface realization (ibid., section 6.4.5). In his book, Mani noted (pp. 160–162):

Recently, there has been a great deal of interest in statistical generation [...], to address the knowledge acquistion bottleneck in developing grammars of sufficient coverage for a particular application. Of particular interest here is the use of language modeling methods discussed in [Mani's own] Chapter 3 [i.e., 'Extraction']. Banko et al. (2000) use these methods to produce very short headline-summaries. Equation 6.6. describes the general form of their method — here H and D represent the bag of words in the headline and the document respectively. The equation reflects a mixture of several models using simple linear interpolation: it uses a linear combination of the conditional probability of a term occurring in a training headline given its occurrence in the corresponding document, the most likely ordering of terms in the document (i.e., using bigrams from a corpus rather than grammatical knowledge to influence word-ordering), and the length of the resulting summary.

<sup>&</sup>lt;sup>133</sup> Resolving *anaphora* determines what determinative or possessive adjectives or pronouns (e.g. "this", "my", "yours"), or articles ("the"), or other indexicals (e.g., "yesterday"), refer to. Literally in Greek *anaphora* means "carrying back", and *anaphora* in the narrow sense means a reference backwards by a determinative, as opposed to *cataphora*, which refers forwards. In the usual, broader sense, *anaphora* encompasses both backward and foreword references.

The equation is as follows:

$$s^{\star} = \arg \max( \alpha \sum_{i=1}^{n} \log(P(w_i \in H | w_i \in D)) + \beta \sum_{i=2}^{n} \log(P(w_i | w_{i-1})) + \gamma \log(P(len(H) = n)))$$

Experience of everyday life teaches us that when summarising anything, we must pay attention to critical information, and that there are different way for information to be conveyed to a fuller or lesser extent. The loss of information may be critical, for given purposes. There is an Arabic proverb that conveys the problematic nature of summaries; the chapter on Joseph in Egypt is the longest in the Koran, and the proverb sums it up: "A man lost his son, and found him". This is an accurate summary, and it is focal in view of expectations about what does matter for human emotions. But then consider this punning summary (which I am making up) of Joseph Conrad's novel *Lord Jim*: "Wishful sinking". The protagonist of that novel is a sailor who, believing the ship is about to sink, abandons it, and by so doing is dishonoured; he eventually recovers his honour because of the death he dies. It is only once you already know the plot, that you can appreciate the summary "Wishful sinking" (the belief that the ship was about to sink was not quite "wishful thinking", but being inaccurate, it comes close).

In Mani's chapter 7, "Multi-document summarization", among the other things we find: "The difference between informational equivalence and informational subsumption is really a matter of degree" (ibid., p. 175). Examples given in Mani (2001, chapter 7) are taken from Radev, Jing, and Budzikowska (2000). In particular (Mani, ibid., p. 175):

- (7) X was found guilty of the murder.
- (8) The court found X guilty of the murder of Y last August and sentenced him to life.

#### Mani remarked (ibid.):

Sentence (8) contains additional information, about the sentencer, the victim, the time of the sentencing, and the duration of the sentence. If the additional information is deemed important, (7) could be eliminated if substituted by (8). For example, "the court" may be viewed as less important, but if (8) had instead "the 5 white jurors" or "the tribunal", that may be deemed more important. [...] In this particular case, which is quite typical, the subsuming sentence (8) is longer. There can be cases where the subsuming sentence is of the same length, e.g., (9), or even shorter, e.g., (10). Since being sentenced implies being found guilty, (9) may be viewed as conveying all the information in (7), while also being of the same length.

- (9) Last August, X was sentenced to life for Y's murder.
- (10) X got life last August, for Y's murder.

Mani also remarked (ibid.): "Another criterion is *coverage*. A sentence in one article which subsumes multiple sentences in another article might be preferred to one which just subsumes a single sentence in the other article".

A case study, of biographical summarisation, appears in Mani's section 4 of chapter 7; in particular, section 4.4 (pp. 201–202) enumerates "the top-level components that can be involved in" a multi-document biographical summariser: (1) "a tokenizer for words and sentences, which outputs strings marked up with word and sentence boundaries"; (2) "a part-of-speech tagger, which outputs a part-of-speech for each word in a sentence"; (3) "a named-entity finder, which extends the word tokenization to include named entities along with within-document coreference relations among them"; (4) "a nominal tagger, which tags names like 'priest' as a person"; (5) "an anaphora resolver, which resolves pronouns like 'he', and definite NPs [i.e., noun phrases] like 'their leader'"; (6) "a cross-document coreference module, which decides whether two names (e.g., George Bush), each from a different document, describe the same entity or not"<sup>134</sup>; (7) "a syntactic analyzer,

<sup>&</sup>lt;sup>134</sup> Let us develop here that example, which Inderjeet Mani proposed yet not develop himself in context. Disambiguating "George Bush" is usually between the father and the son, as both of them were presidents of the United States. Consider in addition that in the 1830s, in New York there was a professor of Hebrew by that name. For sure a newspaper or a news magazine you may have been browsing between 1980 and 2010 has not been referring to *that* George Bush. And of the two politicians, international news mentioning George Bush in the 1980s and early 1990s are likely to have been referring to the elder Bush, but in a Texan context the son, who was a governor, may have been referred to. Elsewhere, the text is likely to have pointed out that the son was meant, rather than the father: "Ann Richards [...] is running for reelection as Governor of Texas against George W. Bush, a Republican and the eldest son of the former President. [...] She derides him as 'all hat and no cattle'. [...] Her followers hand out bumper stickers saying: 'Don't elect the son-of-a-Bush'. They call him 'Shrub'", as reported by Ian Brodie in the London *Times* of 20 October 1994, p. 15, under the title "Lone Star governor struggles to uproot the Shrub".

Also in 1994, the 1830s George Bush was briefly discussed in a new scholary book from the United States (Ritterband & Wechsler, 1994). Columbia College (from the 1880s, Columbia University) suspended Hebrew instruction from 1799 "until 1830 when, perhaps responding to a movement to establish the rival University of the City of New York, it appointed the Rev. Samuel Turner, D.D. [...] to a professorship of Hebrew language and literature" (ibid., p. 12), but then the rival new university "soon appointed George Bush and Isaac Nordheimer to Hebrew and Arabic chairs, respectively. Nordheimer, one of America's first Jewish college professors, is oft noted for his Hebrew grammar. The work of Bush and Nordheimer allowed Turner to cease instruction at Columbia, though Nordheimer died within three years of his appointment" (ibid., p. 13). Endnote 54 on p. 243 explains: "The University of the City of New York apparently cornered the market on Hebrew instruction in New York. Turner wrote: 'When Nordheimer became known as a good Hebrew teacher, I felt it less incumbent on me to devote my time to this object. [sic] Since then I have never been required to give lessons in Hebrew, so that the professorship has become a sinecure' (quoted in Richard Gottheil, "Semitic Languages at Columbia", Columbia University Bulletin 19 [March, 1898], 94). Bush, not Nordheimer, taught Hebrew at the new institution." That much is related by Ritterband and Wechsler (1994) about that early George Bush.

In the Catalogue of the Officers, Alumni, and Students of the University of the City of New York, 1839–40, printed in New York by Hopkins and Jennings in 1840, and now accessible online (http://dspace.nitle.org/bitstream/handle/10090/1838/UnivofCityofNewYork1839\_40\_cat.PDF?sequence=1), one finds indeed: "GEORGE BUSH, Professor of Hebrew. ISAAC NORDHEIMER, P. D., Professor of the German Language and of Oriental Languages", listed among the (few) "Professors not of the Governing Faculty."

which provides syntactic analysis for a sentence or parts thereof"; (8) "a tagger for temporal expressions, which resolves dates and times like '3 pm on June 1st' and 'next Tuesday'"; (9) "an event-ordering component, which tags certain verbs with event indices along with a 'precedes' attributes [*sic*] indicating which event-indices succeed it temporally"; (10) "an appositive phrase extractor, which allows the identification of occupation and age descriptions associated with a person"; (11) "an event extractor, which finds events associated with a person"; (12) "an associated-people extractor, which computes a mutual information metric across named entities found in the collection to find people who are mentioned together significantly"; (13) "a biography aggregator, which merges biographical tuples [...]"; (14) "a text planner, which takes a table of descriptions of a person and decides what to say in each sentence" (Mani, 2001, p. 201); (15) "a realization component, which takes the input sentence representations and generates sentences" (ibid., p. 202).

Concerning what Mani calls "an associated-people extractor", I would like to refer to a related task, even though not in summarisation, that was described in by Marie-Daneille Demelas-Bohy and Monique Renaud (1995). Their paper was entitled "Instability, networks and political parties: a political history expert system prototype". It described computer-assisted attempts to ascribe party affiliation to the members of the 1880 National Convention of Bolivia; party affiliation was not stated in the parliamentary roll. Based on a few known affiliations of leading politicians, on the events stored in the database, on statements (if any record survives) by the individual members of parliament, on their known attitudes or relation toward other politicians, and so on, a computer program proposed individual party affiliations that in the main quite successfully match conclusions reached by the same authors qua historians without resorting to the computer. This amounts to a reconstruction of the Bolivian political class at the time. Mathematical research into social networks is relevant; refer to the *Social Networks* journal (1979–), and, e.g., to a book by Wasserman and Faust (1994).

Chapter 8 in Mani's book (2001) is entitled "Multimedia summarization", and shortly overviews the *summarization of dialog, of video, and of diagrams*. Section 3 (ibid.) is entitled "Summarization of video"; for example (ibid., p. 212):

Current methods for processing broadcast news exploit information from the audio or closed-captioned text (silence, speaker changes, anchor-reporter handoffs, and content

Another Web search retrieved facsimile excerpts from a book being advertised, with the following, further information. Goldman clarifies the scholarly relation of Bush to Nordheimer (2004, pp. 163–164 in chapter 8): "Nordheimer died too young to realize his full scholarly potential — at the age of thirty-three he succumbed to the tuberculosis that had weakened him since his adolescence — his life and writings had considerable influence on the leading American Protestant Hebraists of the first half of the nineteenth century: Moses Stuart of Andover Theological Seminary, George Bush of New York University, and Edward Robinson of Union Theological Seminary."

This example of human-initiated search for information drives in the importance of incorporating some reasonably effective competence in natural-language analysis, not only in automatic summarization tools, but also in such text mining tools that demands on their output are not unambitious.

analysis), as well as video (anchor and logo detection, for example) to help determine what is salient. (The closed-captioned text is generated for the benefit of TV viewers who have hearing impairments.) The Broadcast News Navigator (BNN) system [(Merlino et al., 1997)] provides a tool for searching, browsing and summarizing TV news broadcasts from a variety of news sources (including some foreign language ones). In BNN, information extracted from the audio (silence, speaker changes), video (anchor and logo detection), and closed-captioning text (anchor-reporter handoffs) is used to segment the stream into news stories. BNN uses a number of mixed-media presentation strategies, combining key frames extracted automatically from the video with summaries of the accompanied closed-captioned text. These summaries contain a single sentence (extracted by weighting occurrences of proper name terms) along with key organizations, locations, and people involved. To minimize redundancy, clusters of related stories in the BNN stream or on the Internet are formed by means of cosine similarity vocabulary comparisons; only representative video segments from a cluster are shown.

Still in chapter 8 in Mani (2001), section 4 is "Summarization of diagrams", and section 5 is "Automatic multimedia briefing generation". Mani's chapter 9, "Evaluation", discusses intrinsic methods (quality and informativeness evaluations, e.g., of the fidelity to the source: in these, the system's performance is tested for its own sake), and extrinsic methods: "to determine the effect of summarization on some other task" (ibid., p. 241). Extrinsic methods include relevance assessment, reading comprehension, presentation strategies, and assessing the impact on end-users of a system mature enough to have any.

An early automatic summariser was DeJong's FRUMP (dealt with by Mani, 2001 on pp. 130–132), based on the representation of generalised event patterns by means of *scripts*, and coming from what used to be the Yale-based *conceptual-dependency* school of automated narrative understanding (for which, see Sections 5.2.8 and 5.2.9 above). FRUMP was originally described in DeJong (1979, 1982).<sup>135</sup>

<sup>135</sup> Another computer scientist with a record of early involvement in research into summarization tools is Udo Hahn, who is also prominent in research about ontologies. In his preface, Mani (2001) actually credits Hahn (ibid., p. x) as having jointly taught conference tutorials, on which the introduction of Mani's book is based. They co-authored Hahn and Mani (2000). When preparing the original draft of what is now the section you are reading, I chanced upon a copy of an old report by Hahn and Ulrich Reimer, 'Heuristic text parsing in TOPIC: Methodological issues in a knowledge-based text condensation system' (Bericht TOPIC-5/83, 2nd ed., Universität Konstanz), that was going to appear in the North-Holland Proceedings of the 5th International Research Forum in Information Science, Heidelberg, 1983. The task of TOPIC was described as being "the generation of condensates (abstracting)" (from German texts). "Parsing heuristics referring to cohesion and coherence of texts" were in the first place intended to generate indicative summaries. Mani's book (2001) discusses TOPIC on pp. 148-150: "The system applies shallow methods of parsing noun phrases in the text, relying on a lexicon which maps to a knowledge base of domain concepts. The system increases the activation weights of frames, slots, and slot values whenever they are referred to in the text. TOPIC counts how frequently references are made to a frame itself, to a slot of a frame, or to the slot value. Thus, *concept counting* is carried out, rather than counting words, word-stems or discourse referents [...]. For example, the salience of a slot is determined by the frequency of reference to that slot compared to the frequency of reference to all slots mentioned in the text. A frame is salient if the ratio of the number of its instances to the number of its active instances (an active frame is one which is referenced at least once in the text) is less than the number of its active instances. [...] These patterns of salience are applied to individual paragraphs, and

### 6.1.8.2 Text Summarisation Projects for Law

### Andrew Stranieri and John Zeleznikow

Text summarisation<sup>136</sup> involves identifying, summarising and organising related text so that users can efficiently deal with information in large documents. Sparck Jones (1993) states that text summarisation consists of three steps:

- The text analysis step identifies the essential content of the source text resulting in a source text representation;
- In the transformation step the content of the source text is condensed either by selection or generalisation of what is important in the source. The selected and generalised information is captured in a summary representation; and
- The synthesis step involves drafting and generation of the summary text based upon the summary representation.

The SALOMON project represents seminal work in text summarisation for law, and is discussed next. The SALOMON project (Moens, 2000) automatically summarised Belgian criminal cases in order to improve access to the large number of existing and future court decisions. SALOMON extracts relevant text units from the case text to form a case summary. Such a case profile facilitated the rapid determination of the relevance of the case to be employed in text search. Techniques were developed for identifying and extracting relevant information from the cases.

A double methodology was used when developing SALOMON. First, the case category, the case structure and relevant text units were identified based on a knowledge base represented as a text grammar. Consequently, general data and legal foundations concerning the essence of the case were extracted. Secondly, SALOMON extracted informative text units of the alleged offences and of the opinion of the court based on shallow statistical techniques. The application of cluster algorithms based on the selection of representative objects has the potential for automatic theme recognition, text abstracting and text linking, even beyond the legal field.

A major part of the SALOMON research concerns automatic abstracting of text. Document abstracts generated automatically generally belong to two types (Sparck Jones, 1993). Firstly, the abstract is constructed for easy and fast determination

then topic descriptions are determined and aggregated over paragraphs, after which generalization operations are applied across the topic descriptions to create a hierarchical text graph. Using an interactive text graph navigation aid, a user is able to traverse the resulting text graph, varying the detail of the summaries [... O]ne can certainly ask how such a hypertext conceptual representation compares with a conventional text summary. [...] TOPIC could, in principle, certainly produce an extract summary, simply by weighting sentences based on the density of references to salient concepts".

<sup>&</sup>lt;sup>136</sup> Section 6.1.8.2 is based on a section on text summarisation in Stranieri and Zeleznikow (2005a).

of relevance: it indicates whether the complete text version is of interest (indicative abstract). Secondly, the abstract is a document surrogate expressing the main contents of the document: its components may be used for text search and linking (informative abstract). In this way abstracting is related to indexing. A brief summary may serve as a complex structured index description.

The automatic generation of document abstracts has early been recognised as a potential area for automation (Luhn, 1958). At that time automatic text abstracting and indexing were strongly related. Attempts have been made to extract words, phrases, or sentences that reflect the content of the text. Index terms are weighted depending upon the occurrence in titles and headings (Salton, 1989) or upon occurrence frequencies in the text and/or text corpus (Salton & Buckley, 1988). Sentence scores are based on the number of significant and non significant words in it (Luhn, 1958), on location heuristics (Baxendale, 1958), or on the occurrence of positive or negative indicator phrases (Edmundson, 1969), or are computed as the sum of term weights after eliminating stop words (Earl, 1970). Sentences, the score of which surpasses a certain threshold value, are retained for summary purposes.

Moens, Uyttendaele, and Dumortier (1997) noted that until recently, automatic abstracting had been receiving little attention, apart from the application of artificial intelligence techniques in restricted text domains. With the current information overload, automation of text summarisation receives renewed interest. An example of the automatic generation of case summaries in the legal field and their use for information retrieval is FLEXICON (Fast Legal Expert Information CONsultant), reported about by Gelbart and Smith (1993). FLEXICON extracts relevant text units based on location heuristics, occurrence frequencies of index terms, and the use of indicator phrases.

Let us turn now to other applications of summarisation in law. Grover, Hachey, Hughson, and Korycinski (2003) report on a project, *Sum*, that applies automatic summarisation techniques to the legal domain. In their methodology, sentences from text are classified according to their rhetorical role in order that particular types of sentence can be extracted to form a summary. They describe some experiments with judgements of the House of Lords. They have performed automatic linguistic annotation of a small sample set and then hand-annotated the sentences in the set in order to explore the relationship between linguistic features and argumentative roles. They use state-of-the-art natural language processing techniques to perform the linguistic annotation using XML-based tools and a combination of rule-based and statistical methods. They focus on the predictive capacity of tense and aspect features for a classifier.

Farzindar and Lapalme (2004) describe a method for the summarization of legal documents helping a legal expert determine the key ideas of a judgment. Their approach is based on the exploration of the document's architecture and its thematic structures in order to build a table style summary for improving coherency and readability of the text. They present the components of a system, called *LetSum*, built with this approach, its implementation and some preliminary evaluation results. They were exploring methods for generating flexible summaries of legal documents,

taking as their point of departure the approach to automatic summarisation of Teufel and Moens (2002). They were working with law reports for three main reasons:

- i. The existence of manual summaries means that they have available to them evaluation material for the final summarization system;
- ii. The existence of differing target audiences allows them to explore the issue of tailored summaries; and
- iii. the texts have much in common with the academic papers that Teufel and Moens worked with, while remaining challengingly different in many respects.

The goals of Farzindar and Lapalme (2004) are similar to those of the SALOMON project (Moens et al., 1997), which also deals with summarisation of legal text. However, their choice of methodology is designed to test the portability of the Teufel and Moens approach to a new domain. Farzindar and Lapalme (2004) considered the processing of previous legal decisions and their summaries because a court order generally gives a solution to a legal problem between two or more parties. The decision also contains the reasons that justify the solution and constitute a law jurisprudence precedent from which it is possible to extract legal rules that can be applied to similar cases. To find a solution to a legal problem not directly indicated in the law, lawyers look for precedents of similar cases. For a single query in a database of law reports, one often receives hundreds of documents. Hence, legal professionals require summaries.

In Quebec, the French-speaking province of Canada, REJB (Répertoire électronique de jurisprudence du Barreau) and SOQUIJ (Société québecoise d'information juridique) are two organizations that provide manual summaries for legal resources, but these services very expensive. For example the price of only one summary with its full text, provided by SOQUIJ is \$C7.50. Some legal information systems have been developed by private companies such as QuickLaw in Canada and WESTLAW and LEXIS in the United States, however no existing system completely satisfies the specific requirements of this field.

One reason for the difficulty of this work is the complexity of the domain: specific vocabularies of the legal domain and legal interpretations of expressions produce many ambiguities. For legal judgments, Farzindar and Lapalme (2004) identify discursive structures for the different parts of the decision and assign some argumentative roles to them. The processing of a legal document requires detailed attention and it is not straight-forward to adapt the techniques developed for other types of document to the legal domain.

Their corpus contained 3500 judgments of the Federal Court of Canada.<sup>137</sup> They manually analysed 50 judgments in English and 15 judgments in French as well as their summaries written by professional legal abstractors. The average size of the documents that are input to their system are judgments between 500 and 4000 words long (2–8 pages), which form 80% of all 3500 judgments; 10% of the documents

<sup>&</sup>lt;sup>137</sup> These are available in HTML at http://www.canlii.org/ca/cas/fct/

having less than 500 words (about one page) and so they do not require a summary. Only 10% of the decisions have more than 4000 words.

### 6.1.9 Text Mining

#### 6.1.9.1 General Considerations

Information overload has motivated the emergence of both *data mining* and *text mining*. Pooled techniques for extracting fairly sophisticated kinds of information from large text corpora goes by the name *text mining*.<sup>138</sup> Solka remarked (2008, p. 94):

Data mining on text has been designated at various times as statistical text processing, knowledge discovery in text, intelligent text analysis, or natural language processing, depending on the application and the methodology that is used [(Baeza-Yates & Ribeiro-Neto, 1999)]. Examples of text mining tasks include classifying documents into a set of specified topic areas (supervised learning), grouping documents such that each member of each group has similar meaning (clustering or unsupervised learning),<sup>139</sup> and finding documents that satisfy some search criteria (information retrieval).

The *text analytics* involved in text mining goes beyond conventional *information retrieval* from online text. Disciplinary areas involved include *information retrieval, computational linguistics (natural-language processing), knowledge management, data mining,* and in particular *machine learning,* as well as statistical methods. Besides, *link detection* is an approach to the analysis of text; it shares or makes use of various key elements of text mining. Moreover, the use of a *semantic web* enables text mining to find content based on meaning and context, as opposed to conventional search engines that only find documents containing specific user-defined words or phrases.

Typically, *statistical pattern learning* is resorted to, in order to discover patterns and items of interest.<sup>140</sup> The process of text mining typically involves inferring some structure, by a variety of means, such as parsing sentences and multi-sentence units by computational linguistic means. Data are modified, by both removal of some, and the insertion of some information (typically, tags which identify linguistic features), and inserted into a database. Once the data are thus structured, they are analysed, looking for patterns, or looking for items by learning patterns. Criteria or metrics of *relevance* and *interestingness* apply. Sometimes, tools are capable of analysing textual sources in multiple languages.

Tasks may include:

<sup>&</sup>lt;sup>138</sup> Text mining is the subject of Berry's book (2003) and a survey by Solka (2008).

<sup>&</sup>lt;sup>139</sup> See Section 6.1.13.14 below.

<sup>&</sup>lt;sup>140</sup> Statistical natural language processing is the subject of Manning and Schutze (1999).

#### 6.1 Methods

- *text categorisation*, i.e., determining what a given text is about (categorization can be made more efficient by resorting to concept mining: see below)<sup>141</sup>;
- *text clustering*: clustering documents by topic (having converted text to quantitative data, one can use any of the clustering methods familiar to statisticians, or then use an encoding in graphs for the same purpose)<sup>142</sup>;
- concept mining (concept/entity extraction): identifying candidate word-senses inside text, resolving ambiguity by means of any out of a number of *disambiguation* techniques as known from computational linguistics, and then determining the concepts involved (using a thesaurus or an ontology), possibly using techniques based on *semantic similarity* between concepts;
- the generation of *ontologies* (one also talks about granular taxonomies);
- automatic summarisation;
- entity relation modelling: learning relations between named entities.

In order to carry out clustering, classification, and information retrieval on text, these being tasks involved in data mining, a notion of similarity between documents is needed. Solka pointed out (2008, p. 99):

The most commonly used measure in text data mining and information retrieval is the cosine of the angle between vectors representing the documents [(Berry & Browne, 2005)]. Assume we have two document vectors  $\vec{a}$  and  $\vec{q}$ , then the cosine of the angle between them,  $\theta$ , is given by

$$\cos(\theta) = \frac{\vec{a}^T \vec{q}}{||\vec{a}||_2 ||\vec{q}||_2},$$

where  $\|\vec{a}\|_2$  is the usual L<sub>2</sub> norm of vector  $\vec{a}$ . Note that larger values of this measure indicate documents are close together, and smaller values indicate the documents are further apart. We can easily apply this measure to the bigram proximity matrices by converting each matrix to a vector — for example by just piling each column on top of the other.

Nevertheless, a similarity measure may not be as convenient for use as a measure of distance. Solka continued (2008, p. 99):

<sup>&</sup>lt;sup>141</sup> Sebastiani (2002) is a survey of machine learning in automated text categorisation. Cf., e.g., Esuli, Fagni, and Sebastiani (2008).

<sup>&</sup>lt;sup>142</sup> Solka (2008) explained as follows the graph-based method (ibid., pp. 102–103): "One can cast the term-document matrix as a bipartite graph where the documents are on the left-hand-side of this graph, and the terms are on the right-hand-side. The graph is designated a bipartite graph because there are edges only between the documents and the terms. There are no edges between the documents or between the terms. Given this encoding one can view document clustering as a graph cut problem, where one attempts to divide a graph into two groups in such a way as to minimize the number of edges that pass between them. Approximate solutions to this problem can be obtained using a spectral decomposition of the graph Laplacian. A benefit of this approach is that it allows one to obtain a simultaneous clustering of terms and documents. This makes sense in that a clustering of terms would naturally induce a clustering of documents and a clustering of documents would induce a clustering of terms."

The cosine measure is a similarity measure rather than a distance. We are usually more comfortable working with distances, but we can easily convert similarities to distances. First, assume that we have organized our similarities into a positive-definite matrix C, where the *ij*-th element of this matrix indicates the similarity of the *i*-th and *j*-th documents. Then one way to convert this value to a Euclidean distance is to use the following formula [(Duda et al., 2001a)]:

$$d_{ij} = \sqrt{c_{ii} - 2c_{ij} + c_{jj}}.$$

Note that when two documents are the same  $(c_{ii} = c_{jj})$  then the distance is zero.

An important book on text mining and link detection is Feldman and Sanger (2007), *The Text Mining Handbook: Advanced Approaches in Analyzing Unstructured Data.*<sup>143</sup> After introducing core text mining operations, and then text mining preprocessing techniques, the book proceeds with chapters on categorization, on clustering, on information extraction, on probabilistic models for information extraction, and on preprocessing applications using probabilistic and hybrid approaches. Next, a chapter about presentation-layer considerations for browsing and query refinement is followed with a chapter on visualization approaches. And finally, there are chapters on link analysis, and on text mining applications.

Some text mining tools are commercial, other tools are available on an open source basis, and still other tools are being used privately by institutions, corporations, or professionals from various categories. These include, e.g., academics, or then law enforcement or counterintelligence personnel.

Applications of text mining include:

- security (especially by monitoring textual data on the Internet);
- spam filters, which according to detected characteristics predict whether email messages are unwanted material, such as unsolicited advertisements;
- alert services, e.g. about scholarly literature (such as the biomedical literature, and social science);
- search and indexing;
- marketing;
- the media industry (through websites);
- obtaining feedback for movies distribution, by analysing the affectivity of words that appear in movie reviews, or in commercial product reviews (this is called *sentiment analysis*)<sup>144</sup>;

<sup>&</sup>lt;sup>143</sup> An older book on data mining is Han and Kamber (2001).

<sup>&</sup>lt;sup>144</sup> The application to movie reviews was described by Pang et al. (2002), whereas Valitutti et al. (2005) were concerned with the development of affective lexical resources. Esxuli and Sebastiani (2010) reviewed *sentiment-quantification* methods (as opposed to *sentiment classification*) within *opinion mining*. Sentiment classification instead is the subject of Abbasi (2010). Also see, e.g., Argamon et al. (2009). Feldman, Fresko, Goldenberg, Netzer, and Ungar (2010) apply text mining to the analysis of product comparisons (concerning car models) on Web-supported product discussion boards:

- business intelligence solutions, using a news and company information content set;
- patent information (this is the case of the Thomson Data Analyzer);
- legal practice (as being an extension of information retrieval in the legal domain).

One of the application domains covered in Feldman and Sanger (2007) is counterterrorism activities.<sup>145</sup> Another domain is business intelligence, and yet another one is genomics research. What makes text mining useful in a law enforcement or counter-intelligence context, is the possibility offered by text mining of building large dossiers of information about specific people and events. This greatly empowers intelligence analysts.

There are many text mining tools available. Mena (2003, section 5.8, pp. 141–157) surveyed several of them. For example, VisualText, a text mining toolkit from TextAI,<sup>146</sup> enables to develop custom-made text-analysers supporting various functions. "For those agencies or departments with an IT staff wishing to customize and build its own text analyzer, this kit is ideal" (Mena, ibid., p. 155). It supports both *shallow extraction* (the identification of names, locations, and dates in text), and *information extraction* of a more advanced king (extracting, correlating, and standardising content). Other supported functions include *indexing* of text (e.g., from the Internet), *filtering* (to determine whether a document is relevant), *categorisation* (what is the topic of documents?), *test grading* (for reading and matching prose), *summarisation* (to briefly describe contents), *automated coding* (e.g., for coding police reports), *natural-language querying* (so queries could be made in plain text), and *dissemination* (for routing documents to those persons who need them). Refer to the case studies in Sections 6.2.1 and 6.2.7.

There is increasing recognition that product reviews by consumers can provide important insight into how they view products, and that automated text analysis methods can be fruit-fully used to extract such information [(Popescu & Etzioni, 2005; Dave, Lawrence, & Pennock, 2003)]. For example, the rapidly growing field of sentiment analysis looks to extract how authors feel about different products [(Kim & Hovy, 2006; Turney, 2002; Hu & Liu, 2004; Pang, Lee, & Vaithyanathan, 2002)]. Such work has tended to look at single products, in spite of the fact that many of the purchase decisions, and hence much of the marketing effort, is based on product comparisons. This paper describes a methodology for automatically analyzing products and comparisons between them. Given a (possibly ungrammatical) sentence such as "Sonata has soft ride similar to Camry and Accord" we automatically extract the products (Sonata, Camry and Accord) and what attributes they are compared on ("soft ride"). Our goal is to automatically determine which products are preferred on different attributes. We term this process "comparative sentiment analysis."

<sup>&</sup>lt;sup>145</sup> Cf. Christopher C. Yang's (2008) 'Knowledge Discovery and Information Visualization for Terrorist Social Networks'.

<sup>146</sup> http://www.textanalysis.com

#### 6.1.9.2 Examples of text Mining as Applied to Law

### Andrew Stranieri and John Zeleznikow

This brief section is based on section 57 in chapter 10 of our book *Knowledge Discovery from Legal Databases* (Stranieri & Zeleznikow, 2005a). Text mining includes techniques for clustering documents, summarising and categorising documents and extracting information from text. A common application of text categorisation is the assignment of keyword lists to categorise cases. Typically legal publishers expend considerable resources to manually determine the most appropriate list of keywords for each published case. For example, judgments available online from WESTLAW the American legal publisher, are categorised manually into 40 high level categories such as bankruptcy.<sup>147</sup> Thompson (2001) described comparative trials with three different data mining techniques, one that applies clustering and two that involve classification by rule induction.

Other approaches that involve text mining involve sophisticated case matching techniques that are not simple examples of clustering or classification approaches because other processes are also involved. For example, Brüninghaus and Ashley (2003) sought to elicit case factors automatically from a summary of a case. The motivation for doing so was to enable the most time consuming phase of case based reasoning methods (Ashley, 1991), the elicitation of factors to be performed automatically. This involved sophisticated natural language parsing of sentences.

Yearwood (1997) reported a technique for the retrieval of similar cases. His work involves the automatic identification of which sections of refugee law judgments feature most prominently in the retrieval of cases that match a current one. This work was also successfully applied to more structured documents taken from hospital records (Yearwood & Wilkinson, 1997).

In the SALOMAN project (Moens et al., 1997; Moens, 2000) summary of a judgments was generated. This was done by combining text matching using information retrieval algorithms with expert knowledge about the structure of judgments. SPIRE, developed by Daniels and Rissland (1997) integrates a case based reasoner with information retrieval techniques to locate the passage within a document where a query concept is likely to be found.

Dozier, Jackson, Guo, Chaudhary, and Arumainayagam (2003) used text-mining techniques to create an on-line directory of expert witnesses from jury verdict and settlement documents. The supporting technologies that made the application possible included information extraction from text via regular expression parsing, record linkage through Bayesian based matching and automatic rule-based classification. Their research shows that text-mining techniques can be used to create useful special-purpose directories for individuals involved in legal proceedings.

<sup>&</sup>lt;sup>147</sup> www.westlaw.com Accessed on 15 March 2004.

Common application areas of text mining include:

- (a) Homeland security and intelligence:
  - (i) Analysis of terrorist networks.
  - (ii) Rapid identification of critical information about such topics as weapons of mass destruction from very large collections of text documents and
  - (iii) Surveillance of the Web, e-mails, or chat rooms.
- (b) *Law enforcement* such as the structuring of narrative reports written by federal, state, and local law enforcement agents to aid the analytical process by identifying previously unnoticed trends, links, and patterns.

The Coplink project (Hauck et al., 2002), to which Section 6.2.5 in this book is devoted, does not use entity extraction techniques because they drew the data from a structured database system. Yet many police records systems contain large collections of unstructured text and structured case reports. These textual sources often contain volumes of information that are not captured in the structured fields. A research direction that was envisaged in that project is to develop textual mining approaches that support knowledge retrieval from such sources. The development of linguistic-analysis and textual-mining techniques for performing fine-grained content analysis could help to make intelligent use of large textual collections in police databases.

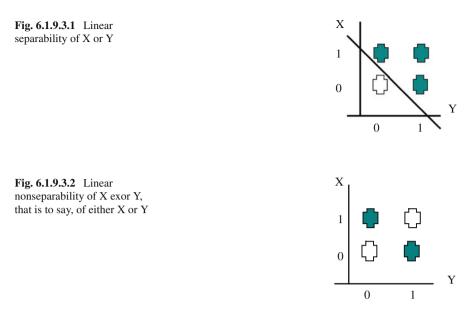
### 6.1.9.3 Support Vector Machines, and Their Use for Information Retrieval, Text Classification and Matching

#### Andrew Stranieri, John Zeleznikow, and Ephraim Nissan

This section is based on section 33 in chapter 6 and some other text in our book *Knowledge Discovery from Legal Databases* (Stranieri & Zeleznikow, 2005a). Support Vector Machines are learning machines that can perform binary classification (pattern recognition) and real valued function approximation (regression estimation) tasks. Support Vector Machines non-linearly map their *n*-dimensional input space into a high dimensional feature space. In this high dimensional feature space a linear classifier is constructed.<sup>148</sup>

As long as two classes are linearly separable, support vector machines determine the hyperplane in the *n*-dimensional feature space that maximises the margin between the examples of the classes. A new example is classified by computing to which side of the hyperplane the example belongs. The technique can be generalised to examples that are not linearly separable. Data is linearly separable if a straight line or plane can be drawn to separate examples into different types of outputs. Figure 6.1.9.3.1 illustrates the plot of points that represent X or Y. The shaded

 $<sup>^{148}</sup>$  We are going to come back to support vector machines in Sections 6.2.1.3 and 8.7.3.1.



points represent the value 1 on (X OR Y). We see clearly that a straight line can be drawn that separates those X and Y data points that have a value 1 on (X OR Y) from those that have a value 0. In contrast, in Fig. 6.1.9.3.2 we see that a similar straight line cannot be drawn: the *exclusive-Or function* (also called *exor*) is said to be non-linearly separable.

Support Vector Machines are based on the structural risk minimisation principle from computational learning theory (Vapnik, 1995). The idea of structural risk minimisation is to find a hypothesis **h** for which we can guarantee the lowest true error. The true error of **h** is the probability that **h** will make an error on an unseen and randomly selected test example. An upper bound can be used to connect the true error of a hypothesis **h** with the error of **h** on the training set and the complexity of **H**, the hypothesis space containing **h**. Support Vector Machines are a method for creating functions from a set of labeled training data. The function can be a classification function if the output is binary or the function can be a general regression function.

For classification, Support Vector Machines operate by finding a hypersurface in the space of possible inputs. This hypersurface will attempt to split the positive examples from the negative examples. The split will be chosen to have the largest distance from the hypersurface to the nearest of the positive and negative examples. Intuitively, this makes the classification correct for testing data that is near, but not identical to the training data.

There are various ways to train Support Vector Machines. One particularly simple and fast method is Sequential Minimal Optimisation. Sequential Minimal Optimisation is a fast method to train Support Vector Machines. Training a Support Vector Machine requires the solution of a very large quadratic programming optimisation problem. Sequential Minimal Optimisation breaks this large problem into a series of smallest possible problems. These small problems are solved analytically, which avoids using a time-consuming numerical optimisation.

Joachims (1998) states that support vector machines are based on the structural risk minimisation principle from computational learning theory (Vapnik, 1995)<sup>149</sup>. The idea of structural risk minimisation is to find a hypothesis **h** for which we can guarantee the lowest true error. The true error of **h** is the probability that **h** will make an error on an unseen and randomly selected test example. An upper bound can be used to connect the true error of a hypothesis **h** with the error of **h** on the training set and the complexity of **H**, the hypothesis space containing **h**. Support Vector Machines find the hypothesis **h** that approximately minimises this bound on the true error. The ability of Support Vector Machines to learn can be independent of the dimensionality of the feature space. Support Vector Machines measure the data, not the number of features. Thus generalisation can occur, in the presence of many features as long as the data is separable with a wide margin. We do this by using functions from the hypothesis space.

Joachims (1998) claimed that Support Vector Machines are excellent for classifying text because of their ability to deal with:

- (a) High dimensional input space. When learning text classifiers, we have to deal with a very large number of features. Since Support Vector Machines use *overfitting* (which does not necessarily depend on the number of features), they have the potential to handle these large feature spaces.
- (b) Few irrelevant features. One way to avoid high dimensional input spaces is to assume that most features are irrelevant. Feature selection tries to determine these irrelevant features. Text categorisation generally involves very few irrelevant features. Through a detailed example, Joachims (1998) showed that a classifier using only the worst features has a much better than random performance. Since it is unlikely that all the features are completely redundant, he conjectures that a good classifier should combine many features and that aggressive feature selection may result in a loss of information.
- (c) Document vectors are sparse. For each document, the corresponding document vector contains only a few non-zero entries. Support Vector Machines are well suited for problems with dense concepts and sparse instances.
- d) Most text categorisations are *linearly separable* and thus suitable for the use of Support Vector Machines.

Gonçalves and Quaresma (2003) have developed a methodology for the automatic *classification* of documents and applied it to a set of documents written in the

<sup>&</sup>lt;sup>149</sup> Also see more recent publications by Thorsten Joachims of Cornell University, e.g. Joachims, Hofmann, Yue, and Yu (2009).

Portuguese language. Their methodology integrates support vector machines with natural language processing techniques, such as, lemmatization and part-of-speech tagging. They applied their research to a set of Portuguese juridical documents from the Attorney General's Office. This set is composed by 7089 documents and it is being manually classified by juridical experts into a set of concepts from a legal taxonomy. Their research only used part-of-speech information to eliminate words from the bag-of-words, but they reportedly intended to use syntactical and semantic information and to propose and evaluate specific kernels. They compared their Support Vector Method classification results with other machine learning algorithms, such as the C4.5 algorithm<sup>150</sup> and Naive Bayes, and also information retrieval measures, namely precision, recall, and f-measure. The obtained results showed to be, at least, equivalent with similar approaches and they proved to be adequate for the Portuguese language and for the legal domain.

*Flexlaw*, reported about by Smith et al. (1995), used a Vector Space Model for *matching*. It automatically constructed structured representations from text. Cases and other legal documents are represented by document profiles that preserve the meaning of legal text and contain all the information necessary and sufficient to match documents with a user's query.

In addition to improving legal text indexing and query formulation, the Flexlaw knowledge representation is a documentation tool that automatically generates case *headnotes* (which they call *flexnotes*). A *flexnote* consists of case header information, a classification of the subjects of law being used and a listing of these items. Gelbart and Smith (1993) contrasted Flexlaw with other information retrieval models:

- (a) the Boolean model; and
- (b) probabilistic models.

<sup>&</sup>lt;sup>150</sup> The C4.5 algorithm (Quinlan, 1993) is an enhancement of ID3 that includes tools to (a) To deal with missing values on attributes and missing data, (b) for pruning decision trees, (c) dealing with continuous variables, (d) dealing with rule accuracy, (e) providing alternative measures for selecting attributes. The C5.0 algorithm is an enhancement of C4.5 that includes (a) *boosting* techniques (see below), (b) sophisticated ways to measure errors, (c) methods to facilitate scaling uyp an algorithm to perform on large datasets. The ID3 algorithm was developed by Quinlan (1986), and is a machine learning algorithm which induces a decision tree for classification problems. The tree is derived from examples in a training set. The ID3 algorithm uses an entropy-based measure known as *information gain*, as a heuristic for selecting the attribute that will best separate the samples into individual classes. The attribute becomes the 'test' or 'decision' attribute at the node. A handy presentation of decision tree techniques in data mining is provided by Rokach and Maimon (2008).

*Boosting* (Quinlan, 1996) improves the predictive power of classifier learning systems by adjusting the weights of training instances. It manipulates the training data in order to generate different classifiers. Boosting uses all instances at each repetition, but maintains a weight for each instance in the training set that reflects its importance; adjusting the weights causes the learner to focus on different instances and so leads to different classifiers. The multiple classifiers are then combined by voting to form a composite classifier. Boosting assigns different voting strengths to component classifiers on the basis of their accuracy.

They performed tests on 1,000 cases from British Columbia (Canada) dealing with economic loss. Their conclusions were:

- (a) Flexlaw is superior to Boolean search in terms of the knowledge structuring, the user interface, the retrieval effectiveness and the ranking of relevant documents;
- (b) Flexlaw, though based on the vector space model, is superior to the SMART implementation of the model in incorporating intelligent structuring of both documents and queries; and
- (c) Flexlaw and the inference network model intelligently incorporate structure in the document and query representations offer elegant and easy-to-use interfaces, allow the incorporation of multiple information sources such as thesauri and produce a ranked list of relevant cases.

Support vector machines have also been used for *information retrieval*. Al-Kofahi, Tyrrell, Vachher, and Jackson (2001) view the task of retrieving similar cases as complex and must be achieved with the integration of more than one method. They used a large dataset of seven million cases and performed similarity matching by invoking a support vector machine trained with over 2000 cases. The support vector machine integrated similarity predictions based on a number of measures. Similarity based on title matching, calculated using optimisation theories from mathematical programming was one measure. Another measure estimated the probability that a example case in a Court A, would have a precedent in another court. The support vector machine was trained using a linear kernel and positive instances were weighted five times more strongly than negative cases. Results demonstrate that recall rates were comparable with those for humans and while precision was not quite at that level, it was sufficiently high to warrant the development.

Hu, Liao, and Vemuri (2003, p. 173, table V) drew a comparison between variants of support vector machines (SVMs). In a *standard SVM*, also called a *soft-margin SVM*, the *objective function* to be optimised is:

$$\Phi(\mathbf{w}) = \frac{1}{2}\mathbf{w}^T\mathbf{w} + C\sum_{i=1}^{\ell}\xi_i$$

(where  $\mathbf{w}^T$  is the *transposed vector* of the *weights vector*  $\mathbf{w}$ ), under these *constraints*:

$$y_i f(\mathbf{x}_i) \ge 1 - \xi_i$$

Let us digress in order to explain the concept of a *transposed vector*. A vector is usually written as a one-column array of values. It is a general case of a matrix. The *transpose* of an *m*-by-*n* matrix **A** is the *n*-by-*m* matrix  $\mathbf{A}^T$  formed by turning rows into columns and vice versa. Therefore, the individual item found inside a matrix in the case in its *j*th row and *i*th column is the same as the element in the transposed matrix in its *i*th row and *j*th column:

6 Accounting for Social, Spatial, and Textual Interconnections

$$\left(\mathbf{A}^{T}\right)_{i,j} = \mathbf{A}_{j,i}$$

For example:

$$\begin{bmatrix} 1 & 2 & 3 \\ 0 & -6 & 7 \end{bmatrix}^T = \begin{bmatrix} 1 & 0 \\ 2 & -6 \\ 3 & 7 \end{bmatrix}$$

In a hard-margin SVM, the objective function is:

$$\Phi(\mathbf{w}) = \frac{1}{2} \mathbf{w}^T \mathbf{w}$$

under these constraints:

$$y_i f(\mathbf{x}_i) \ge 1$$

When Vapnik first introduced the idea of a SVM (see e.g. in Vapnik, 1998), it was for the *separable* case (such that positive and negative samples can be separated by a unique optimal hyperplane with the largest margin), and it is this version, for the separable case, that is called a *hard-margin SVM*. By contrast, the generalised concept of a *soft-margin SVM* (or *standard SVM*) would also work for the *non-separable* case; it was introduced by Cortes and Vapnik (1995). This generalisation to the non-separable case was done by introducing some *training errors*, being *positive slack variables*:

$$\{\xi_i\}\ i = 1, ..., \ell$$

The purpose of these is to find the best tradeoff between training error and margin. This is done by choosing an appropriate constant *C* associated with slack value. This endowed the soft-margin SVM with an error-tolerant property. The *slack term* in the objective function of the soft-margin SVM is the *sum of misclassification errors*:

$$\sum \xi_i$$

Its effect is that notwithstanding the good generalisation ability of the soft-margin SVM, a defect arises: "when trained with noisy data, the decision hyperplane might deviate from optimal position (without maximized separating margin)" (Hu et al., 2003, p. 173). "This leads to a complicated decision surface, which is known as the over-fitting problem" (ibid.). This motivated the introduction by Song, Hu, and Xie (2002) of a variant called robust SVM, originally applied to *bullet hole image classification*, something of interest to forensic science. The so-called *robust SVM* addressed the overfitting problem "by only minimizing the margin of the weight **w** instead of minimizing the margin and the sum of misclassification errors" (Hu et al., 2003, p. 173). In place of the soft-margin SVM's slack term

608

$$\{\xi_i\} \ i = 1, ..., \ell$$

in the robust SVM this other slack term was introduced:

$$\lambda D^2(\mathbf{x}_i, \mathbf{x}^*_{y_i})$$

 $\lambda$  is a non-negative pre-selected *regularisation parameter*. It measures the influence of averaged information, that is, distance to the class centre. As to

$$D^2(\mathbf{x}_i, \mathbf{x}_{u_i}^*)$$

this is the normalised distance between data point  $\mathbf{x}_i$  and the centre of the respective classes in the *feature space*. The centre of the respective classes is

$$(\mathbf{x}_{y_i}^*, y_i \in \{+1, -1\})$$

In the variant of SVM called *robust SVM* (this is the variant adopted by Hu et al., 2003), the objective function is the same as in a hard-margin SVM:

$$\Phi(\mathbf{w}) = \frac{1}{2}\mathbf{w}^T\mathbf{w}$$

but under these constraints:

$$y_i f(\mathbf{x}_i) \ge 1 - \lambda D^2(\mathbf{x}_i, \mathbf{x}_{y_i}^*)$$

The motivation for introducing the robust SVM was a defect of the standard RSV (Hu et al., 2003, p. 173):

The main idea of Support Vector Machines (SVMs) is to derive a hyperplane that maximizes the separating margin between two classes — the positive and the negative [...]. The promising property of SVM is that it is an approximate implementation of the Structure Risk Minimization principle based on statistical learning theory rather than the Empirical Risk Minimization method, in which the classification function is derived by minimizing the Mean Square Error over the training data set.

One of the main assumptions of SVM is that all samples in the training set are independently and identically distributed (i.i.d.). However, in practice, the training data are often contaminated with noise. The noisy data makes the validity of this i.i.d. assumption questionable. The standard SVM training algorithm will make the decision surface deviate from the optimal position in the *feature space*. When mapped back to the *input space*, it results in a highly nonlinear decision boundary. Therefore the standard SVM is sensitive to noise, leading to poor generalization ability.

It is typical of *operations research* (i.e., the science of *optimisation*) that there the usual, *primal problems* (in *primal space*) have *dual problems* corresponding to them respectively. It is sometimes convenient to solve the *dual problem*, in *dual space*,

609

instead of the primal problem. For the SVM variants, the dual problems are socalled *quadratic programming* (*QP*) optimisation problems. The dual space is the space of Lagrange multipliers  $\alpha_i$ , (where  $i = 1, \ldots, \ell$ ), whose values give the decision functions by computing the sign of

$$f(\mathbf{x}) = \sum_{\text{Support Vectors}} \alpha_i y_i K(\mathbf{x}_i, \mathbf{x}) + b$$

where *b* is the threshold value of the decision function (Hu et al., 2003, pp. 173–174). Hu et al. (2003, p. 174, table VI) gave the dual problems for support vector machines as follows. Let

$$\gamma_i = 1 - \lambda D^2(\mathbf{x}_i, \mathbf{x}_{y_i}^*))$$

Then in the dual problem for the soft-margin (i.e., standard) SVM, the objective function is:

$$W(\alpha) = \sum_{i=1}^{\ell} \alpha_i - \frac{1}{2} \sum_{i,j=1}^{\ell} \alpha_i \alpha_j y_i y_j k(\mathbf{x}_i, \mathbf{x}_j)$$

under these constraints:

$$\sum_{i=1}^{\ell} y_i \alpha_i = 0$$
$$0 \le \alpha_i \le C.$$

For the dual problem of the hard-margin SVM, the objective function is:

$$W(\alpha) = \sum_{i=1}^{\ell} \alpha_i - \frac{1}{2} \sum_{i,j=1}^{\ell} \alpha_i \alpha_j y_i y_j k(\mathbf{x}_i, \mathbf{x}_j)$$

under these constraints:

$$\sum_{i=1}^{\ell} y_i \alpha_i = 0$$
$$0 \le \alpha_i.$$

For the dual problem of a robust SVM, the objective function is:

$$W(\alpha) = \sum_{i=1}^{\ell} \alpha_i \gamma_i - \frac{1}{2} \sum_{i,j=1}^{\ell} \alpha_i \alpha_j y_i y_j k(\mathbf{x}_i, \mathbf{x}_j)$$

under these constraints:

$$\sum_{i=1}^{\ell} y_i \alpha_i = 0$$
$$0 < \alpha_i.$$

# 6.1.10 Stylometrics, Determining Authorship, Handwriting, and Questioned Documents Evidence

Various data mining techniques have been used in order to reduce very large feature sets down to optimal subsets (Liu & Motoda, 1998). For example, in *stylometric* analysis within text mining (e.g., in order to detect *sender deception* in email, when the actual sender disguises his or her identity), *writeprint characteristics* can be defined by a variety of features, which include *lexical features, syntactic features, structural features* (the latter relate to the overall structure of the author's writing), and *content-specific features*.

"If a researcher attempted to operationalize these categories of features by developing metrics to measure those features, the potential lists would be almost limitless. So, a first major step to comparing emails writeprints is developing a set of features that are discriminatory, measurable, and manageable." (Gray & Debreceny, 2006). "Adding more features to the analysis does not always improve discriminating power. de Vel, Anderson, Corney, & Mohay (2001) found that the performance of their analysis decreased when they increased the number of function words to 320 from 122." (ibid.).

"Li, Zheng, and Chen (2006) used the generic algorithm form of heuristic search to find the optimum subset of features. Starting with 270 features introduced in the prior paragraph, they found the optimum subset for identifying message authors includes 134 features. Their finding of 134 features is not universal; instead the results will vary depending on the textual materials being analyzed and the language used by the authors." (ibid.).

Sometimes what need be ascertained is the identity of a person, but – unlike eyewitness testimony, or fingerprints, or trying to match a description of a suspect to the police's database of mug shots (facial photographs) – it's the personal identity of an author or of the hand in which a document is written. Hypotheses of authorial identity concerning either a given text, <sup>151</sup> or a given physical copy of the

<sup>&</sup>lt;sup>151</sup> There is a separate issue of how the authorial persona comes through, in a literary or other textual work, if it comes through at all. Consider for example Martial's *Liber spectaculorum* about the cruel arena game under the Flavian dynasty in Rome: both the Emperor's name, and the authorial persona are major absences from the *Liber Spectaculorum* (see Nissan, 2011d, section 2):

In Sec. 11 [of the general introduction to her book], Coleman [(2006)] addresses two features that set the *Liber spectaculorum* apart from the rest of Martial's oeuvre. Firstly, the 'I' composing the book is absent: "we constantly hear the author's voice, but his *persona* is entirely effaced" (lxxxii). The other term of the dual absence is that the epigrams were

text (a manuscript, or a typescript) may be made from the different perspectives of textual philologists, historians, and forensic expertise on forged documents, or on documents connected with perpetrators or victims. Forensic stylistics is one of the tools available for trying to satisfy that need. Literary studies, as well as history, are also interested in the problem of determining whether two different documents were authored by the same person.

The entry for "Questioned document examination" in Wikipedia<sup>152</sup> is useful, yet somewhat U.S.-centred. Section "Common tools of the trade" lists: excellent eyesight; handlens/loupe; stereomicroscope; and Video Spectral Comparator (VSC). The same entry states:

The examination of handwriting to assess potential authorship proceeds from the *principle of identification* which can be expressed as: "Two writings are the product of one person if the similarities, when taken in combination, are sufficiently individual and there are no fundamental unexplainable differences."

There are three stages in the process of examination. In brief, they are:

- 1. The questioned and the known items are analysed and broken down to directly perceptible characteristics.
- 2. The characteristics of the questioned item are then compared against the known standard.
- 3. Evaluation of the similarities and differences of the compared properties determines which ones are valuable for a conclusion. This depends on the uniqueness and frequency of occurrence in the items.

not received by a readership through the medium of a book (lxxxi): "Perhaps what caught [Titus'] approval was, instead, a *libellus* [i.e., booklet] that one day, together with similar *libelli* [booklets] celebrating spectacles under Domitian, would form the *liber* [i.e., book] from which our surviving collection was excerpted" (lxxxiv).

And as mentioned, there is the problem of identifying which Flavian emperor was the one relevant, among Vespasian's two sons and successors, namely, Titus and Domitian:

In Sec. 6, Coleman tries to identify the emperor eulogised, but never identified in the epigrams: Titus? or Domitian? or both in turn? To Coleman, it "seems highly unlikely" that "a single emperor" was being honoured (lxxxiii). This "must remain a tantalizing puzzle" (lxiv). "[T]he atmosphere of immediacy in the second epigram is much better suited to Titus' inauguration [of the Flavian amphitheatre in Rome: the Coliseum] than to an event several years later, [...] and, given the parallels between the events of the *Liber spectaculorum* and the extant sources for Titus' inauguration, it seems perverse to postulate an entirely unattested ceremony under Domitian as the occasion celebrated in the book" (lix). Coleman dismisses another argument for ascription of the occasion to the reign of Domitian: "[T]he enmity towards Titus that is attributed to Domitian by hostile sources is a flimsy basis for supposing that he would object to the public circulation of a collection that celebrated spectacles associating both of them with" the Colosseum.

<sup>152</sup> http://en.wikipedia.org/wiki/Questioned\_document\_examination

ASTM Standard E2290-03 (Standard Guide for Examination of Handwriting) outlines the procedure followed by most reputable examiners.<sup>153</sup> Another method is provided online by the Forensic Expertise Profiling Laboratory (School of Human Biosciences, La Trobe University, Victoria, Australia). The method is divided into 11 modules which may be accessed via the FEPL website.<sup>154</sup>

Identifying an author, or, in particular, finding out whether ascribed authorship is correct, or whether two documents are by the same author<sup>155</sup> is an area of expertise which on occasion overlaps with forensic concerns. The detection of the forgery of manuscripts (fake letters and documents) is discussed by Rendell (1994). Sometimes, the longhand of the person who wrote is not available, because the text is typewritten (it is possible to trace a typescript to the individual typewriter), or then because it was written into a file and printed, or then because it already appeared in print before the introduction of information technology. Or, then, an ancient text may have been copied by hand by a chain of copyists. In that case, the determination

<sup>&</sup>lt;sup>153</sup> From an American perspective, Michael Risinger – a legal scholar who tends to be critical of expert testimony in especially criminal (Risinger, 2007a) and occasionally civil cases - surveys court cases involving the reliability of handwriting identification expertise (Risinger- 2007b; cf. Risinger, Saks, Thompson, & Rosenthal, 2002). His paper (2007b, p. 477) "seeks to collect and separately describe and analyze every explicit decision by an American court on the reliability of handwriting identification expertise since the decision in Daubert v. Merrell Dow Pharmaceuticals, Inc.", i.e., 509 U.S. 579 (1993). "the cases listed here are by no means all of the cases since 1993 in whichhandwriting identification testimony by putative experts has been proffered or accepted" (Risinger, 2007b, p. 477). Risinger explained (ibid., pp. 478-479): "Most use of such expertise likely goes unremarked upon, or occurs in cases that never generate written opinions. In the vast majority of the reported cases involving such experts, the testimony is merely noted as part of a recitation of facts. These cases include substantial numbers of civil cases, often involving challenged signatures on wills or deeds, or insurance and other contract cases, but not uncommonly involving more complex issues. The volume should not be surprising. Estimates of the number of persons who offer such testimony in court, at least on occasion, ranges up to 5,000 or more, with some hundreds who do so regularly. The range of credentials and experience exhibited by these witnesses is also startling, and it is likely that most of the testimony that occurs in American courtrooms is by persons whose training and experience would be looked down upon by the accrediting body of the Osbornian establishment, the American Board of Forensic Document Examiners (ABFDE)."

Larry Miller (1984) expressed criticism of unintended bias on the part of forensic document examiners. He began his article by claiming (ibid., p. 407): "Questioned document examination, particularly handwriting/handprinting identification, lends itself readily to unintended bias on the part of the examiner. Questioned document examination is one of the few forensic science areas that depends primarily on a subjective analysis by the examiner. Most questioned document examiners atternpt to render analyses as objectively as possible by using sophisticated measuring techniques. However, complete objectivity cannot be achieved because of (1) the situation in which the document examiner is summoned for analyses, and (2) the fact that most of the identification process involves a subjective opinion of the examiner." Larry Miller (1987) pointed out procedural bias in forensic science examinations of *human hair*. Again, this was because such evaluations are subjective.

 $<sup>^{154}</sup>$  The FEPL website is at www.latrobe.edu.au/humanbio/forensic/method\_online.htm

<sup>&</sup>lt;sup>155</sup> See Joseph Rudman's overview (1997) of authorship attribution studies at the meet with humanities computing, and also see Hanlein (1998).

of authorship is based on stylometric features alone, along with whatever the text says which may clarify its origination.

Don Foster, whose academic affiliation is in literary studies, and who in his stylometric analyses uses his computer in order to search digital corpora, has shown in several case-studies between two covers of the same volume (Foster, 2001) how essentially the same approach was repeatedly applied by himself, when elucidating authorship in a literary studies context, and when assisting the police in tracking down, according to stylistic considerations, a perpetrator – the Unabomber – who left a copious textual trail.<sup>156</sup> The Unabomber, Ted (Theodore J.) Kaczynski, a former academic whose victims were scientists or engineers, was in other respects careful not to leave cues; for example, he used to sand batteries he was using in mail bombs, in order to remove labels. even kept shoes with smaller soles attached to the base in order to confuse investigators about his body size.

Don Foster helped the prosecution prove that the Umabomber's manifesto, "Industrial Society and Its Future", was written by Ted Kaczynski, a loner living in a cabin in the Montana Rockies. He used to identify his next few targets in works of biographical references, or in academic journals, he perused at university libraries. Ted Kaczynski was arrested in April 1996. In November 1996, the defence team invited Foster to join it. Foster inspected documents he was sent, and it appeared to him altogether likely that the defendant was the author of the manifesto, so he declined to assist (Foster, 2001, pp. 102–103). In March 1997, Foster was invited to join the prosecution team, and he examined reams of documents thoroughly. Even so, he was unaware at the time of Ted Kaczynski's 1979 "Autobiography" and of his journals, nor did he learn about books related to the Unabomber found inside Kaczynski's cabin (ibid., p. 104).

The defence team was assisted by other scholars. The most categorical and also the academically most prominent among these was University of California at Berkeley's linguist Robin Lakoff (she already was the author of six books, whereas Foster was at an earlier stage of his academic career).<sup>157</sup> Lakoff for example

<sup>&</sup>lt;sup>156</sup> For a treatment of forensic stylistics in relation to authorship determination, also see McMenamin (1993), Aked (1994).

<sup>&</sup>lt;sup>157</sup> Don Foster's stylometric analysis (see Foster, 2001, chapter 3) was important for identifying the Unabomber. The defence team attacked his five-page opinion (he had been instructed to keep it short) for giving no specific examples, and suggested that he hadn't read the documents at all. In the same sweep, the defence included a second declaration by Robin Lakoff, in which she admitted she had only read an affidavit, as well as just two of the two hundred documents on which Fitzgerald's analysis was based (Foster, 2001, p. 108).

Still, she claimed, her conclusions would not have been different. Understandably, Foster is bitter and sarcastic concerning this, in his book. Foster prepared a detailed opinion of fifty pages, that was not deemed necessary by the judge, who rejected the defence motion. There is a sense in which that decision of the court better established the credentials of stylometric analysis for judicial purposes, whereas Lakoff's own opinion was not so much a stylometric analysis, as an attack on the evidentiary merits of stylometric analysis.

Also the Ted Kaczynski's sister-in-law, Linda Patrik, a professor of philosophy, came to believe (during a stay of hers in Paris) she knew he was the Unabomber because of what he wrote and the way he wrote. Eventually Ted Kaczynski was quoted in the information press as blaming his brother David for being a Judas Iscariot.

dismissed, as evidence of common authorship, *double use of content-linked lexical choices* (Foster, 2001, pp. 104–105): double, because found in texts by the Unabomber and by the defendant. Foster points out in his book that *pace* Lakoff, it wasn't just that the topical word *electrodes* was hit upon. Rather, in a 1971 essay, Kaczynski fretted over the future prospect of *electrodes* being *inserted in the brain* in order to physically control emotions (Foster, 2001, p. 105). Foster remarked (ibid., p. 106):

Discounting one by one the items of textual and linguistic evidence presented by Fitzgerald,<sup>158</sup> Professor Lakoff denied seeing the forest for the trees, dismissing each identified similarity as slight or circumstantial: Kaczynski and the Unabom [*sic*] subject, she concluded, wrote nothing that was not found in the ordinary language of law-abiding citizens. But Fitzgerald had made no claim for the uniqueness of any particular similarity between the T-docs and the U-docs.<sup>159</sup> It was the sheer magnitude and detail of the similarities between those documents that provided probable cause for a search of Kaczynski's Montana cabin.

Foster (2001, p. 106) easily rejects Lakoff's claim about discrepancies such as Kaczynski's having misspelled *chlorate* as "clorate" three times in a single document, whereas (Foster, ibid.):

In his manifesto, the Unabomber twice spells *chlorate* correctly (FC<sup>160</sup> boasts of using "a *chlorate pipe bomb to blow* up Thomas Mosser" and "a *chlorate explosive* ... *to blow up* the genetic engineer Charles Epstein and the computer specialist David Gelernter").<sup>161</sup> The defence complained that this "important distinction between Ted's language ("clorate") and FC's ("chlorate") passed unnoticed by Fitzgerald. But Ted wrote "clorate" in 1970. By 1986, he had learned to spell *chloride* and *chlorine* (in his letters); one may guess that he also learned, by 1995, how to spell *chlorate*. And while Ted may have misspelled *chlorate* in 1970, he already recognized its potential usefulness. Like the Unabomber, Ted Kaczynski had a fantasy of making people "blow up", and with the same material: all three of those 1970 instances of "clorate" appear in an original short story of Ted called "How I Blew Up Harold Snilly", <sup>162</sup> submitted to *Harper's* for publication, and rejected.

<sup>&</sup>lt;sup>158</sup> Supervisory Special Agent (SSA) James Fitzgerald of the FBI's National Center for the Analysis of Violent Crime.

<sup>&</sup>lt;sup>159</sup> The T-docs are Ted Kaczynski's documents, whereas the U-docs are the Unabomber's documents.

<sup>&</sup>lt;sup>160</sup> FC is how the Unabomber signed himself in his manifesto.

<sup>&</sup>lt;sup>161</sup> Gelernter had developed the LINDA network software. He was critically wounded, as was Epstein, in June 1993 (cf. Foster, 2001, pp. 136–137). Gelernter was nearly blinded by the explosion. It was just after Gelernter went back to the U.S. after giving a seminar at the Department of Mathematics and Computer Science at Bar-Ilan University, in the Greater Tel-Aviv area. I was in the audience, at that talk of his. In an email circulated to the department's staff at Bar-Ilan, David Gelernter and his wife thanked us for our expression of solidarity, and suggested donations to the charity Esra.

 $<sup>^{162}</sup>$  Here is an example of sheer coincidence: the name *Snilly* can be understood, in ancient Aramaic, to be a phrase of two words (*sni li*, a masculine singular passive participle followed by an inflected personal pronoun), meaning 'hateful to me'. This would be onomastically quite apt for a character being a person whom Ted Kaczynski's first-person narrator would want to blow up, and as the narrative was fiction, it is a name an author may aptly make up. But Kaczynski was utterly unlikely to know Aramaic, or that fine point from Aramaic.

Replace in all of the foregoing "hand" for "author" or "authorship", and then interest in a forensic context is at least as much obvious. The questions the expert is then asked to answer are like these ones: Was this signature forged? Is that text written by hand in a hand different than it is claimed to be? Blueschke and Lacis (1996) discussed an advanced technique for "the examination of the sequence of crossed lines, specifically, between ball point pen strokes (waterfast glycol and aqueous based inks) and faint typewritten impressions (produced by old, poor quality fabric ribbon)" (from the abstract); use was made of scanning electron microscopy (SEM) and photographic stereoscopic pairs. Huber and Headrick (1999) is a book on *handwriting identification*.

A relevant paper collection is Marinai and Fujisawa's (2008), *Machine Learning in Document Analysis and Recognition*. In the early 2000s, a team led by Sargur Srihari at the University of Buffalo<sup>163</sup> was developing a computer program with the task of determining the authorship of handwritten documents for forensic applications (Mena, 2003, pp. 363–364). "Providing a scientific basis for establishing the individuality of handwriting has become essential for admitting handwriting evidence in U.S. courts due to a number of recent rulings concerning expert testimony" (ibid., p. 363). Therefore, the automatic identification is useful, in that it can be explained based on measurable features. Cf. Zhang and Srihari (2004) and Ball, Kasiviswanathan, Srihari, and Narayanan (2010). Srihari and Leedham (2003) surveyed computer methods in forensic document examination. Srihari, Srinivasan, and Desai (2007) reported about questioned document examination using CEDAR-FOX, in the *Journal of Forensic Document Examination*.

Pu and Srihari (2010) reported about probabilistic measure for signature verification; cf. Srihari, Srinivasan, and Beal (2008) and Kalera, Srihari, and Xu (2004). Ball, Stittmeyer, and Srihari (2010) reported about an application to writer verification in historical documents. *Writer verification* is the task of determining whether two handwriting samples (a *known document* and a *questioned document*) were written by the same or by different writers. Ball and Srihari (2009) drew a comparison of statistical models for writer verification. They explained:

We present a system for performing writer verification which captures the idea of writer uniqueness. Intuitively, the system works by pairwise comparing letters of the same class between the two documents and determining their similarity to one another (by computing a similarity distance). Two conditional probability estimates are then computed based on each distance — (i) the probability of the two characters being produced by a single writer (i.e., the distance being explained by normal variation) and (ii) the chance of characters being produced by two different writers. The *log-likelihood ratio* (LLR) is computed and is used to determine the strength of confidence for the opinion.

A unique contribution of our method is our approach to generating the probability estimates. Our method captures the uniqueness of an individual writer by generating a probability distribution of distances between instances of character classes in the known

<sup>&</sup>lt;sup>163</sup> http://www.cedar.buffalo.edu/index.html CEDAR is the Center of Excellence in Document Analysis and Recognition at the University of Buffalo. Publications are listed at, and sometimes can be downloaded from, http://www.cedar.buffalo.edu/papers/publications.html

document and the general population, as represented by a set of many samples. This intuitively captures how different a writer's sample is from the general population. While it might be desirable to generate this directly by determining the distribution of features on the writer's own samples, there will in practice often be few instances of character classes. By comparing with the general population, the uniqueness can be learned even when only a small set of characters is present.

Srihari, Ball, and Ramakrishnan (2009) reported about the identification of forgeries in handwritten petitions for ballot propositions. Srinivasan and Srihari (2009) discussed signature-based retrieval of scanned documents, and that article of theirs appeared in a paper collection about computer methods for counterterrorism. Manning and Srihari (2009) discussed computer-assisted handwriting analysis in combination with legal issues in U.S. courts. Srihari, Collins, Srihari, Srinivasan, and Shetty (2008) reported about the automatic scoring of short handwritten essays in reading comprehension tests. Srihari and Ball (2008) were concerned with writer verification of handwritten Arabic. Srihari, Ball, and Srinivasan (2008) reported about searching Arabic handwriting.

This kind of domain is known by the name *questioned documents evidence* (Levinson, 2000): there exist techniques for determining authenticity, age, ink and paper sources, equipment used, forgeries, alterations, and erasures, as well as, of course, handwriting identification.<sup>164</sup>

The Wikipedia entry for "Questioned document examination"<sup>165</sup> explains which kinds of documents are examined:

Documents feature prominently in all manner of business and personal affairs. Almost any type of document may become disputed in an investigation or litigation. For example, a questioned document may be a sheet of paper bearing handwriting or mechanically-produced text such as a ransom note, a forged cheque or a business contract. Or it may be some material not normally thought of as a 'document'. Forensic document examiners define the word 'document' in a very broad sense as being any material bearing marks, signs or symbols intended to convey a message or meaning to someone. This encompasses traditional paper documents but also includes things like graffiti on a wall, stamp impressions on meat products, or covert markings hidden in a written letter, among other things. Some forensic document examiners limit their work to the examination and comparison of handwriting, but most of the forensic document examiners inspect the whole document.

Besides, consider *forensic linguistics*. *Forensic stylistics* is one facet of it. Bolelli (1993, p. 126) refers to the appointment of a linguist as an expert witness to advise the court whether a given word is an insult (in countries like Italy and the Netherlands, the court can appoint an expert witness above the parts, and such a role is called *amicus curiae* internationally, including in English-language treatments),

<sup>&</sup>lt;sup>164</sup> Handwriting identification is the subject of Morris (2000).

<sup>&</sup>lt;sup>165</sup> The literature on questioned documents includes Osborn (1929), Harrison (1958), Conway (1959), Hilton (1982), Huber and Headrick (1999), Ellen (2005), Morris (2000), Levinson (2001), Koppenhaver (2007), Köller, Nissen, Reiß, and Sadorf (2004) At www.bka.de/vorbeugung/pub/probabilistische\_schlussfolgerungen\_in\_schriftgutachten.pdf German and English versions of Köller et al. (2004) can be downloaded.

but thus is just one out of an array of contexts in which the intervention of a *forensic linguist* may be relevant.

Levi (1994) discussed the role of the *linguist* as expert witness in North American courts. Forensic linguistics as a discipline<sup>166</sup> has a specialised forum, the Routledge journal *Forensic Linguistics*, first published in 1994. An aspect of forensic linguistics that has been researched is what is the effect of language sociolect (the language variety of this or that social class) and of language style, of powerful or powerless language, on impression formation in the courtroom, and on upon judgements of victims and villains.<sup>167</sup>

Later in this book, while shortly discussing disciplines of forensic science, we are going to consider *biometrics*, which strives to identify or authenticate personal identity as based on physical traits. Yet, even though this is relatively little known even among practitioners of biometrics itself, biometrics is also concerned with the identification of a person based on personal traits of verbal and nonverbal communication; it is a challenge to express the task algorithmically (Esposito, Bratanić, Keller, & Marinaro, 2007).

# 6.1.11 Classification, Clustering, Series Analysis, and Association in Knowledge Discovery from Legal Databases

## Andrew Stranieri and John Zeleznikow

#### 6.1.11.1 Classification

The aim of *classification* techniques is to group data into predefined categories. For example, data representing important case facts from many cases may be used to classify a new case into one of the pre-defined categories, pro-plaintiff or pro-defendant, which respectively comprise such cases that were decided for the plaintiff, and such cases that were decided for the defendant.

Techniques exist for the automatic discovery of knowledge in the form of rules that take the general form

IF A and B and C THEN D.

A number of researchers have applied *knowledge discovery from databases* (*KDD*) techniques to automatically extract IF-THEN rules from data in order to make a prediction. Wilkins and Pillaipakkamnatt (1997) examined large numbers of cases in order to estimate the number of days that are likely to elapse between the

<sup>&</sup>lt;sup>166</sup> For forensic linguistics, see e.g. Coulthard (1992), Shuy (1993) – the latter, reviewed in Danet (1994) – O'Barr (1982), and Gibbons (1994).

<sup>&</sup>lt;sup>167</sup> See Erickson, Lind, Johnson, and O'Barr (1978), Bradac, Hemphill, and Tardy, (1981), Gibbons, Busch, and Bradac (1991).

arrest of an offender and the final disposition of the case. The time to disposition depends on variables such as the charge, offender's age, and the county where the arrest was made. Values on more than 30 variables from over 700,000 records from 12 U.S. states were used. Rules were automatically extracted using the rule induction algorithm ID3. Although Wilkins and Pillaipakkamnatt (1997) themselves had hoped for rulesets that predicted the time to disposition more accurately than their results indicate, this study remains an impressive demonstration of the potential for KDD techniques to contribute to the delivery of legal services.

Vossos, Zeleznikow, & Hunter (1993) and Zeleznikow, Vossos, and Hunter (1994), in conjunction with a legal firm, developed the *Credit Act Advisory System*, *CAAS*. This is a rule based legal expert system that provides advice regarding the extent to which a credit transaction complies with the Credit Act 1984 (Vic), of Victoria in Australia. Although the majority of rules derive directly from the statute, some factors remain vaguely defined in the Act. For example, the factor "credit was for a business purpose" is not defined by the statute. In this instance, a rule induction algorithm was invoked to discover new rules from a database of facts from past cases that involved credit for a business purpose. A rule induction technique discovers rules from past cases where a judge had decided whether credit was extended for a business purpose. These rules help a user determine whether a new, current situation involves credit for a business purpose or not.

In Section 6.1.1 in this book, it was already mentioned that a brief paper by Pedro Feu Rosa (2000) – surveyed in Stranieri and Zeleznikow (2005a, pp. 12, 228: also the present section is based text in that same book) – was concerned with another application of knowledge discovery to law. Namely, a Supreme Court Judge in Brazil initiated a program for the resolution of traffic accident disputes. It is called *Judges on Wheels*. A judge, police officer, insurance assessor, mechanical and support staff are transported to the scene of minor motor vehicle accidents. The team collects evidence, the mechanic assess the damage, and the judge makes a decision and drafts a judgement with the help of a program called the *Electronic Judge* before leaving the scene of the accident. The *Electronic Judge* software uses a KDD approach that involves data mining by means of neural networks.

Neural networks tools learn patterns of decision making from judges in previous traffic accidents and suggest an outcome for the current accident that is consistent with previous ones. No rules are induced. Although, the judge is not obliged to follow the suggestion offered by the *Electronic Judge*, the software was being used by judges in 68% of traffic accidents in the state of Espirito Santo. The system plays an important role in enhancing the consistency of judicial decision-making.

Hobson and Slee (1994) studied a handful of cases from the U.K. Theft Act and used neural networks<sup>168</sup> to predict the outcome of theft cases. They used a series of leading cases in British theft law to train a network to predict a courtroom outcome. The results they obtained were less than impressive, which they attributed to flaws in the use of neural networks in legal reasoning. This criticism was unduly harsh.

<sup>&</sup>lt;sup>168</sup> Cf. Hobson and Slee (1993), for the application of networks in the legal domain.

Neural networks have much to offer KDD. However, any application of KDD to data drawn from the legal domain must be carefully performed. Due attention is required, so that key assumptions made at each phase of the KDD process are clearly articulated and have some basis in jurisprudence. For example, the cases used in the Hobson and Slee study involved *leading cases*. We argue that leading cases are not well suited to a KDD exercise. See in Section 6.1.11.5 below.

Bench-Capon (1993b), drawing on hypothetical data from a social security domain, was guarded in his appraisal of the benefits of using neural networks to model reasoning in legal domains. Similar concerns regarding the use of neural networks in law have been advanced by Hunter (1994). However, as we shall demonstrate in subsequent chapters, the appropriate application of KDD involves steps that include data selection, data pre-processing, data transformation, data mining and evaluation. At each phase, assumptions that are consistent with jurisprudential theories must be made. If assumptions are clearly articulated and carefully drawn, neural networks, in addition to other KDD techniques can be adapted to provide accurate predictions.

Chen (2000a) described an automated detective that scans web pages for criminal activity. In that study, the data is text on a web page. Processes developed by Chen (2000a) seek to classify the page into one of two pre-defined categories, illegal or not illegal.

In the *Split Up* project (Stranieri, Zeleznikow, Gawler, & Lewis, 1999) – whose argument tree we considered in Section 6.11.6.1 in the present book – collected data from cases heard in the Family Court of Australia dealing with property distribution following divorce. The objective was to predict the percentage split of assets that a judge in the Family Court of Australia would be likely to award both parties of a failed marriage. Australian Family Law is generally regarded as highly discretionary. The statute presents a "shopping list" of factors to be taken into account in arriving at a property order. The relative importance of each factor remains unspecified and many crucial terms are not defined. The age, state of health and financial resources of the litigants are explicitly mentioned in the statute as relevant factors yet their relative weightings are unspecified. The Act clearly allows the decision-maker a great deal of discretion in interpreting and weighing factors.

The relative importance judges have placed on relevant factors in past cases can, to some extent be learnt with the use of KDD. This knowledge enables the user of Split Up to predict the outcomes of future cases. As we shall discuss throughout this work, important issues to be taken into account include which cases should be included in a KDD sample, how do we deal with cases in which a judge has perhaps erred, how do we evaluate the results of our systems, and how do we know which factors are important.

Oatley and Ewart (2003) described the OVER Project as a collaboration between West Midlands Police in England and the University of Sunderland that aimed to assist police with the high volume crime, burglary from dwelling houses. A software system they developed enables the trending of historical data, the testing of "short term" hunches, and the development of "medium" and "long term" strategies to burglary and crime reduction, based upon victim, offender, location and details of victimisations. The software utilises mapping and visualisation tools and is capable of a range of sophisticated predictions, tying together statistical techniques with theories from forensic psychology and criminology. The statistical methods employed (including multi-dimensional scaling, binary logistic regression) and data-mining technologies (including neural networks) are used to investigate the impact of the types of evidence available and to determine the causality in this domain. The final predictions on the likelihood of burglary are calculated by combining all of the varying sources of evidence into a Bayesian belief network. This network is embedded in the developed software system, which also performs data cleansing and data transformation for presentation to the developed algorithms.

Oatley, Ewart, and Zeleznikow (2006)<sup>169</sup> note that computer science technology that can support police activities is wide ranging, from the well known geographical information systems display ("pins in maps"), clustering and link analysis algorithms, to the more complex use of data mining technology for profiling single and series of crimes or offenders, and matching and predicting crimes. They present a discussion of data mining and decision support technologies for police, considering the range of computer science technologies that are available to assist police activities.

#### 6.1.11.2 Clustering

The aim of *clustering* techniques is to group data into clusters of similar items. Whereas the aim of *classification* techniques is to group data into predefined categories, the aim of clustering techniques is to analyse the data in order to group the data into groups of similar data. For example, a clustering technique may group cases into six main clusters that an analyst would interpret in order to learn something about the cases.

In practice, legal data about persons, cases or situations is typically stored as text based documents rather than structured databases. Discovering knowledge by the automatic analysis of free text is a field of research that is evolving from information retrieval research and is often called text mining. Hearst (1999) proposes that textmining involves discovering relationships between the contexts of multiple texts and linking this information together to create new information.

Many text-mining applications involve clustering. The application of a type of neural network known as *Self Organising Maps (SOM)* to group European Parliament cases into clusters has been described by Merkl and Schweighofer (1997), Schweighofer and Merkl (1999) and Merkl, Schweighofer, and Winiwarter (1999). Each cluster contains only cases that are similar according to the SOM. The SOM, used in this way have proven to accurately discover groupings for many thousands of cases.

In the SOM application Merkl et al. (1999) were interested in identifying clusters and the issue of selecting a cluster centre was not important. Pannu (1995) engaged

<sup>&</sup>lt;sup>169</sup> Cf. Oatley, Zeleznikow, and Ewart (2004), Oatley and Ewart (2003).

in knowledge discovery by identifying the *centre point* in a cluster. This took the form of identifying a prototypical exemplar of pro-defendant and pro-plaintiff cases within a domain, i.e., such cases that were decided for the defendant or for the plaintiff. An exemplar pro-defendant case has features that are most like those cases in which the defendant won and most unlike the cases the defendant lost. This technique can be applied to assist a lawyer to structure an argument in a current case.

As Moens (2001) notes, a major group of techniques that involves *unsuper-vised learning* (a subject for which, see Section 6.1.14.14 below) is the clustering of objects that share common features. Cluster analysis is a multivariate statistical technique that automatically generates groups into data (Kaufmann & Rousseeuw, 2005, 1st edn. 1990). *Non-hierarchical clustering methods* partition a set of objects into clusters of similar objects. Hierarchical methods construct a tree-like hierarchy of objects with the root representing a cluster containing all the objects, the leaves representing the individual objects and the nodes containing the intermediate groupings. The technique of clustering supposes:

- An abstract representation of the object to be clustered, containing the features for the classification;
- A function that computes the relative importance (weight) of the features; and
- A function that computes a numerical similarity between the representations.

Clustering is employed to group terms that regularly co-occur in documents or to group documents if they discuss the same topic terms. A form of neural network, known as *self-organising maps* (*SOM*), have been successfully applied to text clustering. We discuss SOM in Section 6.1.14.15 below.

#### 6.1.11.3 Series Analysis

The aim of *series analysis* is to discover *sequences within the data*. Sequences typically sought are *time series*. For example, past cases over a time period may be analysed in order to discover important changes in the way a core concept is interpreted by Courts. Very few studies have been performed that analyse sequences of data in law. However, the study by Rissland and Friedman (1995) provides a good indication of the potential utility in doing so. They collected data from U.S. bankruptcy cases over a ten-year period and asked whether knowledge discovery techniques could be applied to automatically discover significant shifts in judicial decision-making. Data represented variables known to be relevant for the concept of "good faith" in bankruptcy proceedings. Their aim was to discover a method for detecting a change in the way the concept of "good faith" was used by Courts. The onset of a leading decision was automatically detected from case data using a metric they devised.

#### 6.1.11.4 Detecting Association Rules

The objective of *association* techniques is to discover ways in which data elements are associated with other data elements. For example, an association between the gender of litigants and the outcome of their cases may surprise analysts and stimulate hypotheses to explain the phenomenon. *Association rules* depict an association between specific variable values. For example, an association rule that claims that if gender is female, then case is won on 10% of cases highlights a link between two variables, gender and outcome. The link is not necessarily causal and may not even be interesting. Typically, the discovery of all possible association rules from data from many cases is computationally infeasible. However, an algorithm called *a priori* advanced by Agrawal, Imielinski, and Swami (1993) makes the automatic generation of rules tractable. Stranieri, Yearwood, and Meikl (2000) have illustrated that association rule generators can highlight interesting associations in a small dataset.

In an example of KDD in law that aims to analyse a legal domain rather than making specific predictions regarding judicial outcomes, Ivkovic, Yearwood, and Stranieri (2003) have generated association rules from over 300,000 records drawn from database of applicants for government funded legal aid in Australia. In that country, applicants for legal aid must not only pass an income and assets test but must also demonstrate that their case has some merit for success. Consequently considerable data is recorded about the applicant and the case.

The purpose of the association rules study performed by Ivkovic et al. (2003) was to determine whether this data mining technique could automatically analyse the data in order to identify hypotheses that would not otherwise have been considered. For example, as a result of this study, an association between the applicant's age and categories of legal aid applied requested was discovered. It can be summarised as follows: 89% of applicants between 18 and 21 applied for legal aid for criminal offences. This result surprised experts in the field who did not expect young applicants to be so highly represented in criminal law matters. This result is not, of itself used to explain much, but is advanced to assist in the formulation of hypotheses to explain the associations observed.

The application of association rules is to suggest hypotheses from data, and such applications that are relevant to law are, for example:

- About population groups; for example, a hypothesis may be that most Western suburbs shoplifting is perpetrated by Northern suburb, young women.
- About case types; for example, a hypothesis may be that few family law cases where the husband has the children resulted in a 50:50 split.
- About Court practices or efficiencies; for example, a hypothesis may be that most cases that involved self-represented litigants who had professional jobs took longer to hear than those self-represented litigants without professional jobs.

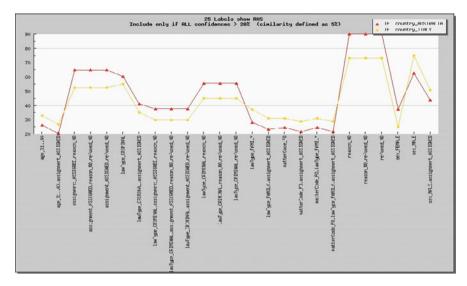


Fig. 6.1.11.4.1 Visualisation of association rules

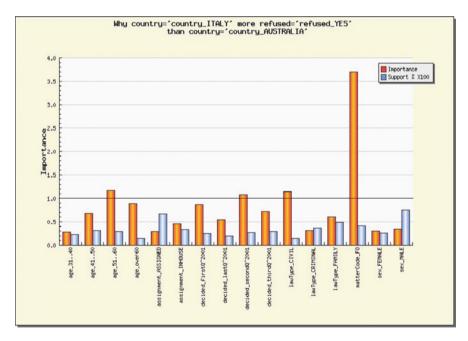


Fig. 6.1.11.4.2 Exploring hypotheses suggested by association rules

The four categories of KDD techniques – classification, clustering, series analysis and association detection – are useful categories in the practical process of applying KDD to data, because they help an analyst determine the desired outcome of a KDD exercise.

Figure 6.1.11.4.1 shows a example of visualisation of association rules. Figure 6.1.11.4.2 shows exploring hypotheses.

## 6.1.11.5 On Interestingness. Commonplace Cases, Rather Than Leading (Interesting, Landmark) Cases, Are Suitable in Training Sets for Legal Knowledge Discovery Algorithms

The vast majority of cases that come before a first instance decision maker in family law are never published, are never appealed, and establish no new principle or rule. They do not revolve around a new legal interpretation, nor do they involve circumstances that are legally interesting to experienced practitioners. They are commonplace cases.

Commonplace cases are suitable for the discovery of knowledge about how judges exercise discretion in family law, whereas landmark cases are not suitable. The distinction between commonplace and landmark cases is not one based on clear definitional categories since any case that is currently viewed as commonplace could conceivably be used in the future as a landmark case. For example, perhaps the most significant leading case in family law, Mallet vs Mallet<sup>170</sup> was not particularly extraordinary at the first instance court.

The trial judge in Mallet vs Mallet awarded 20% of the business assets from a long marriage to the wife after taking the contributions and needs of both parties into account. The Full Bench of the Family Court increased the wife's percentage split to 50% by making explicit the principle that equality should be the starting point. That Court commenced with 50% and deviated according to contributions and needs. Following this decision, the husband appealed to the High Court. The High Court overruled the Full Bench of the Family Court and reinstated the trial judge's decision. As indicated previously, this case became a landmark case in that it firmly endorsed unfettered trial Court discretion.

Although a case cannot be definitely categorised as either commonplace or landmark, the distinction between them is a useful one when applying selecting cases for inclusion in a KDD exercise. Most landmark cases are not suitable for the assembly of training sets for data mining, because these cases typically revolve around a definitional issue or they attempt to resolve a classification ambiguity so that a precedent for subsequent cases may be set.

Landmark cases heard by appeal courts typically establish a new rule or principle. In a domain where traditional *stare decisis*<sup>171</sup> is less influential than in

<sup>170 (1984) 156</sup> CLR 185

<sup>&</sup>lt;sup>171</sup> Stare decisis is a fundamental principle in common law legal systems. The principle dictates that the reasoning, loosely, *ratio decidendi*, used in new cases must follow the reasoning used by

standard Common law domains, Appeal Courts can more readily be seen to establish broad principles or resolve classification ambiguities. For example, in the Full Court decision in the Marriage of Elias<sup>172</sup> a precedent was established that deemed entrepreneurial prowess as a form of contribution to a marriage. Debts have been admitted as negative contributions in *The Marriage of Anttman*.<sup>173</sup> Both these leading cases can be seen to refine the open textured concept of a contribution to a marriage.

The objective in applying machine learning in the discretionary domain of family law, which is what we did in the Split Up system, is to model the way, in which judges weight factors which are known to be relevant. A leading case may introduce a new factor that subsequent trial decisions must accommodate. Data about the factor could not have been recorded in cases prior to the landmark case. For example, prior to Elias, no trial judge would have mentioned a contribution in the form of entrepreneurial prowess, because that issue was not known to be relevant.

Hunter (1994) illustrated that most applications of neural networks as a data mining technique, to law, use landmark cases. For example, as mentioned earlier (in Section 6.1.11.1), Hobson and Slee (1994) used a series of leading cases in British theft law to train a network to predict a courtroom outcome. Results they obtained highlighted flaws in the use of neural networks in legal reasoning. However, we agree with Hunter in noting that their results are partly due to the use of landmark cases rather than commonplace cases.

A distinction between *commonplace* and *landmark decisions* can also be seen in the *ratio decidendi*, that is to say, the rationale of a decision. The ratio decidendi in reported and appellate Court decisions can be seen to have a different purpose from the ratio in commonplace cases. The purpose of the ratio of an appellate court judge is to convince subsequent trial judges to accept a change in the interpretation of legal principles or rules. This is so even if a case sets no dramatic precedent but reinforces existing, and commonly held principles. The purpose of the ratio in unreported cases is slightly different.

First instance decision makers aim to explain to litigants (and others) that the reasoning used was in accordance with the appropriate statutes and principles and that an appeal is not warranted. The ratio in unreported cases is thus more likely to reflect the reasoning actually used in assimilating all facts to determine a conclusion. The ratio in a reported case is more likely to revolve only around those facts that are contentious. The discussion centres on which of a number of possible interpretations of principles is most appropriate as a precedent for making future decisions.

decision-makers in courts at the same or higher level in the hierarchy. Stare decisis is unknown to civil law, where judgments rendered by judges only enjoy the *authority of reason. Traditional stare decisis* is when the same decision has to be taken as a higher court judging about the same facts. *Local stare decisis* is when the same decision has to be taken as the same court judging about the same facts. *Personal stare decisis* is when the same decision has to be taken as the same judge judging about the same facts.

<sup>&</sup>lt;sup>172</sup> (1977) Fam LR, cited in [Ingleby, 1993].

<sup>173 (1980) 6</sup> Fam LR.

Commonplace cases are more appropriate than landmark cases, for inclusion in the training set of a data mining algorithm.<sup>174</sup> However, discerning a commonplace case from a landmark case is problematical given that a past commonplace case may become a future landmark case if it happens to be appealed or, perhaps even referred to, in an appealed decision. A concept of "interesting" (thus, of *interestingness*) is advanced in order to guide the discernment of a commonplace case from a landmark case. If a case is not interesting, it is a commonplace case. For a first instance decision to be interesting it must:

- (a) be appealed, or
- (b) includes a new principle, rule or factor in its ratio decidendi, or
- (c) exhibits an outcome vastly at odds with other similar cases.

It is not sufficient to admit only appealed cases to the category of interesting cases, because a litigant may choose to avoid an appeal for a variety of reasons. Thus, not all interesting cases are appealed.

The concept of *interestingness* of a case can be operationalised relatively easily by noting that senior judges of the Family Court make precisely this sort of judgement in deciding which cases are to be published by Court reporting services. These services do not publish the judgements of all cases, because the majority of cases are of little interest to readers. Thus, the more appropriate cases from which to extract data for inclusion in a training set are unreported cases. These cases are those in which a senior judge of the Family Court has ruled as uninteresting. These cases are not published, so it is difficult for a future practitioner to invoke one of these cases as backing for an argument.

Reported cases are of great importance for identifying relevant factors in the Split Up system. A reported case may set a precedent; invalidating a factor that had previously been considered relevant, or alternatively, it may introduce a new factor.

Accessing a random sample of cases is not straightforward and requires some assumptions. For example, the Family Court operates throughout Australia, yet it seems unreasonable to assume that decisions have no regional differences. A classifier trained with data from one region may perform poorly when predicting a case from another region. Another assumption we make is that decisions made by appeal Courts are not necessarily representative of decisions made by first instance judges. We also make the assumption that decisions made more than 4 years ago are not necessarily representative of decisions made more than 4 years ago are not necessarily representative of decisions made more than 4 years ago are not necessarily representative of decisions made recently, or that are likely to be made in the near future. Data for the original Split Up project was gathered from unreported Family Court cases decided between 1992 and 1994 in the Melbourne region of Australia. Each of the cases examined was decided by one of eight different judges. Judgments from these eight judges were examined in preference to limiting ourselves to those from only one judge in order to encourage the network to mimic

<sup>&</sup>lt;sup>174</sup> Such as neural networks or rule induction algorithms.

a composite of all judges and also because no one judge had decided a sufficient number of cases<sup>175</sup> during that period.

# 6.1.12 Inconsistent Data

## Andrew Stranieri and John Zeleznikow

## 6.1.12.1 Reasons for Inconsistency

We discuss *data inconsistency*, based on our treatment of the subject in Stranieri and Zeleznikow (2005a). This is an important subject, for data mining. The viewpoint we are going to offer is that of knowledge *discovery from databases* (*KDD*) in law. Legal databases are likely indeed to contain records that reflect inconsistencies. A simple and hypothetical example illustrates this. Consider a task where the decision maker concludes outcome X whenever facts A, B and C are present. This may have occurred in many cases, so be captured many times in a legal database. However, if a new case decides Y from facts A, B and C, then this is at odds with the first pattern. The reasons for this can include:

- (a) Noise. The data collection procedure was inaccurate.
- (b) Judicial error. The decision maker may have erred.
- (c) *Change*. Legislation, precedent cases (in common law countries) or judicial behaviour may have changed.

A concern with inconsistent data is important for the KDD process within law, because data-mining techniques might tend to learn incorrect or inappropriate patterns. For example, a data-mining technique will learn incorrect patterns if exposed to sufficiently many cases in which a judge had not followed personal or local stare decisis.<sup>176</sup> Similarly if elements of a case such as the length of the marriage are wrongly recorded in a database, the dataset is considered noisy. Furthermore, law is always in flux, so changes in legislation, precedents, judicial or community values will similarly impact on patterns learnt. In this Section 6.1.12, noise, error and change are discussed.

## 6.1.12.2 Noise and Outliers

*Noise* is typically assumed to consist of random discrepancies in data that are due to measurement anomalies and are not a feature of the distribution of data. For example, a faulty scanner may introduce noise into industrial data. Noise may explain outliers. Inconsistencies between the categorisation of values for the Split Up template, by the three raters in our Split Up project for assisting in negotiation in

<sup>&</sup>lt;sup>175</sup> For both completeness and to train the neural network.

<sup>&</sup>lt;sup>176</sup> See the definition of *stare decisis* in fn 106 above.

settling divorce cases<sup>177</sup> (Stranieri et al., 1999), introduce noise into the training sets. Eliot (1993) surveyed neural network research to point out that generalisation performance and training time degrade if the dataset contains noisy data. Liang and Moskowitz (1992) quantified the effect of noise on neural network performance and have introduced a method based on semi-markov models to detect noisy examples.

Data objects that are grossly different from or inconsistent with the remaining set of data are called *outliers*. Han and Kamber (2001) note that many data-mining algorithms attempt to minimise the influence of outliers or totally eliminate them. However, such action can lead to the loss of important hidden information – such as in the case of fraud detection, where outliers may indicate fraudulent activity.

The outlier mining problem can be viewed as two subproblems:

- (a) define what data can be considered as inconsistent in a given data set; and
- (b) find an efficient method to mine the outliers so defined.

The problem of defining outliers is nontrivial. If a *regression* model<sup>178</sup> is used for data modelling, than an analysis of the residuals can provide a good estimate for *extremeness*. The task is more difficult when finding outliers in *time-series data*, as they may be hidden in trend, seasonal or other cyclic changes. Data visualisation methods are weak in detecting outliers in data with many categorical attributes or in data of high dimensionality, since human eyes are good at visualising numeric data of only two to three dimensions.

Computer-based methods for outlier detection can be categorised into three approaches:

 Statistical-Based Outlier Detection. This approach assumes a distribution or probability model for the given data set (normal distribution) and then identifies outliers with respect to the model using a discordancy test. Application of the test requires knowledge of the data set parameters (such as the assumed data distribution), knowledge of distribution parameters (such as the mean and variance) and the expected number of outliers. A statistical discordancy test examines two hypotheses: a working hypothesis and an alternative hypothesis. The hypothesis is retained if there is no statistically significant test supporting its rejection. A major drawback of the statistical approach is that most tests are for single

<sup>178</sup> In *linear regression*, data is modelled using a straight line of the form

$$y = \alpha x + \beta$$

<sup>&</sup>lt;sup>177</sup> Arno Lodder and john Zeleznikow provided an overview of computer-assisted dispute resolution (as being an alternative to litigation) in a book (Lodder & Zeleznikow, 2010). *Split Up* is the subject of section 5.4 in that book. The hybrid rule–neural approach of Split Up was described in Stranieri et al. (1999). Bellucci and Zeleznikow (2005) is concerned with the *Family Winner* decision-support system that supports mediators in family law.

 $<sup>\</sup>alpha$  and  $\beta$  are determined using the method of least squares. Polynomial regression models can be transformed to a linear regression model.

attributes, yet many data mining problems require finding outliers in multidimensional space. Moreover, the statistical approach requires knowledge about parameters of the data set, such as the data distribution. However, in many cases, the data distribution may not be known. Statistical methods do not guarantee that all outliers will be found for the cases where no specific test was developed, or the observed distribution cannot be adequately modelled with any standard distribution. Wang and Gedeon (1995) described a statistical detection method and report improvements over other methods to detect and remove outliers. However, these methods are not trivial to implement and can be costly in terms of computer resources.

- 2. Distance-Based Outlier Detection. The notion of distance-based outliers was introduced to counter the main limitations imposed by statistical methods. Rather than relying on statistical tests, we can think of distance-based outliers as those objects who do not have "enough" neighbours, where neighbours are defined based on their distance from the given object. In comparison with statistical-based methods, distance-based outlier detection generalises the ideas behind discordancy testing for various standard distributions. Distance-based outlier detection avoids the excessive computation that can be associated with fitting the observed distribution into some standard distribution and in selecting discordancy tests. Several efficient algorithms for mining distance-based outliers have been developed:
  - (i) index-based algorithm;
  - (ii) nested-loop algorithm; and
  - (iii) cell-based algorithm.
- 3. *Deviation-Based Outlier Detection*. Deviation-based outlier detection does not use statistical tests or distance-based measures to identify exceptional objects. Instead, it identifies outliers by examining the main characteristics of objects in a group. Objects that deviate from this description are considered outliers.

In the next section we discuss judicial error as a source of contradictory data, particularly within a domain that affords a decision maker much discretion.

# 6.1.12.3 Judicial Error as a Source of Inconsistency

Judicial error is conceptualised differently by prevailing jurisprudential theories. Utilitarianism was first advanced by Jeremy Bentham.<sup>179</sup> Bentham argued that the purpose of a legal system is to advance the greatest degree of happiness to the greatest number of people. There is little place for natural law or natural rights in his legal philosophy. For utilitarians, an error in legal reasoning occurs if a judge determines

<sup>&</sup>lt;sup>179</sup> Bentham (1748–1832) was a leading theorist in Anglo-American philosophy of law and one of the founders of *utilitarianism*. His most important theoretical work is the *Introduction to the Principles of Morals and Legislation* (1789), in which much of his moral theory – which he said reflected "the greatest happiness principle" – is described and developed.

an outcome which cannot, ultimately, contribute to the well being of the largest number of people.

According to perspectives advanced by Dworkin (1977, 1986), a judge errs, albeit in a minor way, by failing to discover the ideal way in which to apply precedents to a current fact situation. This view led to the concept of an ideal judge; a concept that was perhaps attacked most strongly by adherents to the critical legal studies movement.

For *legal positivists* such as Hart (1994), a judge may err by failing to discern a *core case* from a *penumbra case* or by failing to apply appropriate rules to resolve a current penumbra case. For German *conceptualists*, a judge errs by failing to reason deductively from facts to a conclusion.

The concept of judicial error that can be drawn from major theories of jurisprudence, pre-supposes a failure in adherence to the doctrine of stare decisis.<sup>180</sup> However, the type of stare decisis that most neatly fits into these theoretical perspectives advanced is what we define as traditional stare decisis.

The right of appeal in common law jurisdictions provides a safeguard against judicial error. However, the grounds for appeal against a first instance decision vary so markedly across jurisdictions that a general specification of erroneous decisions is very difficult. For instance, according to Dickey (1990), the acceptable grounds for appeal a first instance decision-maker in the Family Court of Australia include:

- (a) a failure on the part of the trial judge to provide reasons for a judgement, or
- (b) the use of an inappropriate principle in reaching a decision, or
- (c) incorrect findings of fact or,
- (d) the inappropriate weighting of factors.

The requirement to give reasons has been imposed on first instance judges by a number of High Court decisions. In these cases, traditional stare decisis was operative, in that the High Court was firm in laying down constraints to ensure trial judges included reasons for their decisions. Traditional stare decisis is also clear in the *Marriage of Gronow*<sup>181</sup> in establishing a right to appeal if the trial judge acted on a wrong principle or allowed irrelevant factors to influence her.

Another ground for appeal involves the inappropriate weighting of a relevant factor. We indicated above<sup>182</sup> that the High Court has been reluctant to fetter the discretion of trial judges by laying down guidelines to control the way in which factors are weighted. The fact that experienced practitioners can predict Family Court outcomes, demonstrates that personal stare decisis and local stare decisis apply in the Family Court of Australia.

This arises because of a desire on the part of first instance decision-makers to weight relevant factors in a manner that is consistent with the decisions of other

<sup>&</sup>lt;sup>180</sup> See the definition of *stare decisis* in fn 106 above.

<sup>&</sup>lt;sup>181</sup> (1979) 5 Fam LR 719.

<sup>&</sup>lt;sup>182</sup> In the case Mallet vs Mallet (1984) 156 CLR 185.

judges. A hypothetical Family Court judge can be imagined as one who whenever she is presented with cases with identical facts, the judge would determine precisely the same percentage split of assets to both parties. That is, the exercise of discretion is perfectly consistent with other judges and, perfectly consistent with the same judge over time.

However, the ideal judge does not exist in the real world. Individual judges are not perfectly consistent with other judges, even on the same set of facts. An informal study with Family Court judges exposed to the same case facts, revealed substantial variance in percentage split outcomes. This concurs with experiences reported by family law practitioners. If it were possible to expose a large number of judges to the same set of facts, then we can imagine that a mean outcome would emerge and individual judgments would fall on both sides of the mean.

A conceptualisation of judicial error is important for the application of the knowledge discovery process to legal reasoning, because the goal of a machine learning system is to predict outcomes that judges will consider acceptable. The performance of such algorithms can be expected to degrade if exposed to large numbers of decisions in which a judge has actually erred.

If the entire set of cases used in a KDD exercise, contains a significant amount of errors, then data mining algorithms cannot be expected to accurately predict outcomes. But, how are we to determine whether an actual judicial outcome is an unacceptable exercise of discretion for the purposes of KDD? To what extent can two judges offer divergent decisions on cases with very similar findings of fact before one (or both) is considered to have erred? Furthermore, to which authority should we turn, to make this determination? We shall first discuss the issue of which authority is best placed to make a determination on acceptable bounds of discretion.

The most obvious authorities for the discernment of acceptable exercises of discretion from unacceptable exercises of discretion are appellate Courts. However, this authority is not totally suitable because decisions that fail local stare decisis may never be appealed for a variety of reasons including:

- (a) An appeal to a higher court is expensive and the possible gain may not warrant the additional expense.
- (b) Gender or other cultural factors may impact on the decision to appeal. For example, Alexander (1992) has illustrated that women tend to be more reluctant than men to continue conflict and are therefore more reluctant to pursue an appeal.

Furthermore, according to Kovacs (1992), a demonstration that a relevant factor was not given appropriate weight by a trial judge is extremely difficult to prove, because standards for the exercise of discretion in family law have not been laid down by the High Court. Experienced practitioners typically advise against an appeal unless a decision was patently unjust.

An appeal Court is not ideally situated to determine issues of local stare decisis,<sup>183</sup> because the main function of an appeal Court is to determine whether

<sup>&</sup>lt;sup>183</sup> See the definition of *stare decisis* in fn 106 above.

a lower Court has appropriately applied legal rules and principles. The issue of determining local, or personal stare decisis is only indirectly addressed.

Schild (1998) explores these issues in depth when considering the field of the sentencing of Israeli criminals. To ensure more consistent sentencing decisions, he recommended the establishment of panels of experts specifically formed to provide feedback. This approach raises many issues that warrant discussion, but this is beyond our current scope.

The task at hand is pragmatic, in that we are concerned with the impact judicial error has on the knowledge discovery from database process. If some cases from which we collect data, fail to adhere to local (or personal) stare decisis, then datamining techniques cannot be expected to learn useful patterns.

Cases in the dataset that are inconsistent with other cases need to be identified and dealt with in the pre-processing phase. If the inconsistency is due to judicial error, then we are compelled to attempt to identify them and adopt a strategy such as modifying offending records, or removing or ignoring such records. If the inconsistency is due to a change in legislation or the emergence of a precedent case, then other mechanisms may need to be invoked.

Contradictory examples are, in general, examples that have different outcomes despite identical inputs. Contradictory cases are necessarily present in discretionary domains, because judges cannot be expected to weight factors in the same way on every case throughout their career. Nor can they be expected to be perfectly consistent with the weightings used by other judges.

#### 6.1.12.4 Dealing with Contradictory Data: An Example from Split Up

There are a number of ways to deal with extreme contradictions. Most simply, the contradictions can be ignored. Wang and Gedeon (1995) note that a small proportion of contradictory examples will not dramatically effect the performance of a neural network. However, the performance of other data-mining techniques depends more heavily on the proportion of contradictory examples. The first step in dealing with contradictions, if they are not to be ignored, involves their detection. This is not trivial in a KDD exercise in law. The data in table illustrates sample contradictory data.

Marriage 1 and Marriage 2 in Table 6.1.12.4.1 have identical values on input attributes but differ dramatically on the value on the output attribute (percentage of assets awarded to the wife). A casual observer might conclude that these two records clearly contradict each other. However, Marriage 3 does not contradict Marriage 1 despite identical input values because the output percentage is 64 and not 65.

Consider transformation methods used in the Split Up project. A fundamental transformation performed on the values of variables is to map an ordinal value onto a binary string. That transformation assisted us in the deployment of neural networks for making predictions. Another benefit of the transformation adopted was that we could more easily develop a metric for determining the extent to which two examples are contradictory. We briefly describe the nature of variables and the transformation we performed in order to illustrate the metric.

Marriage number	Wife's age (years, months)	Wife's health	Age of eldest child	Suburb	Percentage of assets awarded to the wife
1	35,1	Good	4,1	Delacombe	65
2	35,1	Good	4,1	Delacombe	30
3	35,1	Good	4,1	Delacombe	64
4	35,5	Good	?	Delacombe	50
5	34,9	Good	4,2	Gold Point	40
6	34,9	Good	4,2	Sebas	40

 Table 6.1.12.4.1
 Sample contradictory data

An ordinal variable such as the contributions of the husband relative to the wife has five possible values, ["much more", "more", "same as", "less", "much less"]. This was mapped to a binary string 5 places long, where each character is either 1 or 0. The string [1,0,0,0,0] represents the value "much more" whereas the string, [0,0,1,0,0] represents between "the same as".

Two binary outcomes can be compared by noting the position of the set bit in each outcome. Thus, a binary outcome,  $[1\ 0\ 0\ 0\ 0]$ , differs from  $[0\ 0\ 0\ 0\ 1]$  by four place units. The set bit in the second number is four places away from the set bit in the former outcome. We call this a four-place contradiction. The average number of examples across all 20 datasets in the Split Up study that had identical inputs and outputs that differed by three or more bit positions totalled 9.37% of the population. However, this ranged from 0% for one dataset to 29.4% for another.

Plausible explanations for the high proportions of contradictions in the financial resources dataset are illustrative of the kinds of issues that emerge when dealing with contradictory data:

- (a) *Sampling error.* The sample drawn was not representative of the population of cases with respect to financial resources determination.
- (b) *Local stare decisis*. Local stare decisis with respect to financial resources in the Melbourne registry is quite poor.
- (c) Incomplete knowledge. Relevant factors that predict financial resources are missing. Salary, superannuation, business and resources from family or new partners may not be the only relevant items. Data collection occurred at the wrong level of granularity.

The most likely explanation for the quality of the datasets in the Split Up study is that of sampling error, because the sample size is so small it does not allow us to learn patterns. However, it is interesting to note that the factors considered relevant for determining financial resources are a matter of on-going controversy. One Family Court judge clearly indicated that resources a party receives from his or her family or new partners are irrelevant. However, domain experts are quite adamant that judges do indeed take this factor into account. One practitioner extols female clients to dress modestly for Court appearances in case judges take the view that the prospects for remarriage of a well-dressed divorcee are high and consequently the wife will have inflated financial resources prospects. This might lead to the judge concluding that a well groomed wife requires a lesser split of the common pool than a woman who is more modestly attired, because the judge believes the latter woman has greater future needs.

It is unwise to conclude that local stare decisis has failed merely because of the existence of contradictions. The number of contradictions reflects those examples with identical inputs and outputs that differed by more than 3 bit places. This is a rather crude measure of the level of contradictions. It may suffice for the datamining purposes of identifying interesting patterns in datasets, but is not sufficient as the basis of sociological inferences.

A more sophisticated measure of contradictions would be to introduce a metric of input similarity. The criteria of 3 [or more bit] places may be too severe for some training sets and too relaxed for others. However, despite these considerations, it seems most plausible to assume that the anomaly noted in the financial resources network is due to sampling error.

#### 6.1.12.5 Inconsistencies Due to New Legislation or Precedents

Broadly speaking, new legislation and new precedent cases impact on the way in which judges make decisions in the following ways:

- (a) Making a factor relevant that was previously not mentioned in the decisionmaking context, or was previously considered irrelevant. So, for example, domestic violence in family law property proceedings was not a relevant consideration prior to Kennon v Kennon.<sup>184</sup>
- (b) Making a factor that was once relevant, irrelevant. For example, the ethnic background of a child was once a factor in determining child welfare issues in Australia.<sup>185</sup> It often led to the forcible removal of many aboriginal children from their families. Ethnic background is now no longer considered relevant
- (c) Changing the way an outcome is inferred without changing relevant factors. If a new factor is introduced as a relevant consideration by a statue or precedent, then cases prior to the precedent have no data collected about that factor and the way in which the factor impacts on the other factors may be so severe that it invalidates any previous knowledge gleaned from a KDD exercise. In this case, there is little alternative but to re-expose the data to the data-mining exercise. However, this course of action is problematic, because soon after the introduction of the new factor, there are very few cases decided where the factor plays a

<sup>&</sup>lt;sup>184</sup> Kennon V. Kennon FLC 92-757 (1997).

<sup>&</sup>lt;sup>185</sup> See for example, the Royal Commission into Aboriginal Deaths in Custody's National Report, vol. 1, p. 6 Accessible on at this website: http://www.austlii.edu.au/cgi-bin/disp.pl/au/journals/ AILR/1997/disp269

prominent role. For example, even though domestic violence is clearly an issue in property proceedings since the case Kennon v Kennon, there have been such a small number of cases since that precedent that involve domestic violence, that the very little data exists.<sup>186</sup>

The constantly changing nature of law would seem, at first sight, to make KDD in law a fruitless process. However, this is not the case. The data transformation act, based on argumentation theories, and described in the next chapter, has the effect of decomposing a major problem into small units. Any change caused by the introduction of a relevant new factor, can be localised to one argument, without impacting on other arguments. It is however, the case that knowledge within the effected argument cannot be relied upon once a change occurs. However, we demonstrate in the next chapter that the impact of this change is not significant as long as argumentation is used to decompose the task into smaller units.

#### 6.1.12.6 How to Deal with Inconsistent Data

Once detected, inconsistent data may be dealt with in one of three ways:

- (a) All contradictory cases are removed from the dataset.
- (b) No contradictory cases are removed from the dataset.
- (c) Some contradictory cases are removed from the dataset, through the use of predefined criteria.

The strategy adopted in the Split Up project was to remove all contradictory cases from the dataset. Although this strategy is less than ideal, it avoids some of the drawbacks of other approaches.

Leaving contradictory examples in the dataset is not appropriate if the sample size is small. If sufficient data is collected, then we could have a greater confidence that the contradictions noted reflect the exercise of discretion in the population and are not anomalies due to the sample selected. For example, if the sample size is increased tenfold, then we would have considerably more confidence that the proportion of contradictions noted in the sample was the proportion that existed in the true population. This would mitigate toward leaving the contradictory cases in the dataset.

When presented with identical inputs, a neural network learns to produce an outcome that is between the contradictory outputs. Whilst this strategy is acceptable, it relies on the existence of substantially large datasets, which is often not feasible in law. The examples used in the Split Up system are by no means plentiful and sampling error cannot be ruled out. A concrete example may clarify this assertion.

<sup>&</sup>lt;sup>186</sup> See for example the court case of Farmer and Bramley [2000] FamCA 1615 (13 December 2000). This reference is to a case in the Family Court of Australia.

The strategy of removing all contradictory examples is preferred to one in which we attempt to determine which of the contradictory cases are unacceptable exercises of discretion. Schild (1995) highlights the need for panels of experts and judges to regularly determine boundaries for acceptable exercises of discretion. Such a panel would have the authority to rule that one or more of the contradictory cases was unacceptable and thus mandate the removal of only those cases.

However, such panels do not exist in most fields of law. The authority to determine which of the contradictory outcomes are acceptable and which are unacceptable, does not reside with any one person or group. It should not be taken by data analysts engaged in the knowledge discovery process. If contradictory cases cannot remain in the dataset and unacceptable examples cannot be discerned from acceptable ones, then the relatively conservative strategy of removing all contradictory cases is the most appropriate one. In domains that are not appreciably less discretionary than Australian family law, it could be said that if two judges arrive at different conclusions after a finding of identical facts, then the judges are using different legal principles or standards. Simply removing contradictory cases from consideration when modelling a domain, runs the very serious risk that important rules, or principles that discern one case from another, are overlooked. However, as illustrated above, two judges in family law could conceivably agree on the facts of a case and also on the appropriate legal principles, yet still reach different conclusions. This is because the principal statute affords the first instance decision maker flexibility in the weighting and combining of factors.

Family law disputes are unusual in that any extreme exercise of discretion is equally undesirable if it favours the husband or the wife.<sup>187</sup> However, in other matters, an extreme exercise of discretion in favour of the plaintiff may be worse (or better) than one in favour of the defendant.

# 6.1.13 Rule Induction

## Andrew Stranieri and John Zeleznikow

#### 6.1.13.1 Preliminaries

An important data-mining algorithm we discuss in this section is *rule induction*. *Inductive reasoning* is the process of moving from specific cases to general rules. A rule induction system is given examples of a problem where the outcome is known. When it has been given several examples, the rule induction system can create rules that are true from the example cases. The rules can then be used to assess other cases where the outcome is not known. New knowledge can be inferred with rule induction. Once rules have been generated they can be reviewed and modified by

<sup>&</sup>lt;sup>187</sup> In many legal domains, there is an onus on a specific party to prove its claims. For example, in criminal law, the prosecution must prove the defendant is guilty beyond reasonable doubt. In taxation law, the taxpayer must prove he met all the guidelines.

the domain expert, providing for more useful, comprehensive and accurate rules for the domain.

Data mining techniques derive from three different sources: artificial intelligence, inferential statistics and mathematical programming. Artificial intelligence research has contributed techniques such as neural networks, rule induction and association rules. Linear, logistic and multiple regression, in addition to algorithms such as K-means and K-medians have been developed by statisticians. Mathematical programming has contributed techniques such as the min-max method from optimisation theory.

The evaluation phase involves the evaluation and interpretation of knowledge discovered as a result of the data-mining phase. The evaluation of any legal system is fraught with theoretical and pragmatic obstacles. Assumptions regarding the nature of knowledge impact on how knowledge discovered using the process are evaluated.

#### 6.1.13.2 Pattern Interestingness

As Han and Kamber (2001) state, a data mining system has the potential to generate thousands of patterns or rules. Not all of the patterns are useful or interesting. Hence we need to define what is an interesting pattern and how can we generate all the interesting patterns and only the interesting patterns.

A pattern is *interesting* if:

- the pattern is easily understood by humans;
- the pattern is valid (with some degree of certainty) on new or test data;
- the pattern is potentially useful;
- the pattern is novel.

A pattern is also interesting if it validates a hypothesis that the user wished to validate, or resemble a user's hunch. An interesting pattern represents knowledge.

Several objective measures of *pattern interestingness* exist, based on the structure of discovered patterns and of the statistics underlying them. The concepts of *support* and *confidence* are examples of objective measures of pattern interestingness. In general, each interestingness measure is associated with a threshold, which may be controlled by the user.

Although objective measures help identify interesting patterns, they are insufficient unless combined with subjective measures that reflect the needs and interests of a particular measure. Subjective interestingness measures are based on user beliefs in the data. These measures find patterns interesting if they are unexpected (contradicting a user's belief) or offer strategic information on which the user can act.

It is often unrealistic and inefficient for data mining systems to generate all of the possible patterns. Instead, user-provided constraints and interestingness measures should be used to focus the search. *Association rule mining* is an example where the use of constraints and interestingness measures can ensure the completeness of mining.

# 6.1.13.3 Features of, and Difficulties with, Rule Induction Systems

Rule induction algorithms discover rules that are intended to be applicable as generalisations from sample data. Although there are hundreds of *rule induction algorithms*, the one initially developed by Quinlan (1986), called ID3, involves the use of information theory and has been applied to many data-sets. At the basis of a rule induction system is an algorithm which is used to induce rules from a training set. Benefits of rule induction include:

- (1) Rule induction has the ability to deduce new knowledge. A human may be able to list all the factors influencing a decision, but may not understand the impact of these factors;
- (2) Once rules have been generated they can be reviewed and modified by the domain expert, providing for more useful, comprehensive and accurate rules for the domain.

There are, however, many difficulties in implementing rule induction systems:

- (1) Some rule induction programs or training sets may generate rules that are difficult to understand;
- (2) Rule induction programs do not select the attributes. Hence, if the domain expert
  - a. chooses inappropriate attributes in the creation of the training set,
  - b. there are inconsistent examples in the training set or,
  - c. there are inadequate examples in the training set, then the rules induced are likely to be of little value;
- (3) The method is only useful for rule-based, classification type problems;
- (4) The number of attributes must be fairly small;
- (5) The training set should not include cases that are exceptions to the underlying law. In law, this requirement may not be feasible;
- (6) The training set must be sufficiently large to allow the rule induction system to make valid inferences;

We introduce some sample data in order to illustrate how ID3 works. Table 6.1.13.3.1 displays data related to the property division of six fictitious and overly simple marital splits from our *Split Up* software system for assisting in negotiations for settling a divorce (Zeleznikow & Hunter, 1994). The result attribute is for the percentage split of property obtained by the wife upon divorce.

A common technique for converting data into rules is to initially convert the training set into decision trees. Decision trees can then be converted into rules. A *decision tree* is an explicit representation of all scenarios that can result from a given decision. The root of the tree represents the initial situation, whilst each path from the root corresponds to one possible scenario. A more formal definition is that a decision tree is a problem representation in which:

Case	Is the property asset rich?	Any children?	Does the wife work?	Equal split
50	Yes	Yes	Yes	Yes
51	No	Yes	No	No
52	No	Yes	No	No
53	Yes	No	Yes	Yes
54	Yes	Yes	No	No
55	No	No	Yes	Yes
56	No	Yes	Yes	No

Table 6.1.13.3.1 Data for property split in family law

- a. Each node is connected to a set of possible answers;
- b. Each non-leaf node is connected to a test that splits its set of possible answers into subsets corresponding to different test results;
- c. Each path carries a particular test result's subset to another node.

The exercise of manually extracting rules is difficult with three boolean variables but becomes quite impossible if there are many variables of various types. Furthermore, there is no way of knowing whether all rules have been extracted, or whether the set extracted is a good, or perhaps the best set that could have been extracted. The ID3 rule induction algorithm developed by Quinlan (1986) addresses these concerns by automatically inducing rules from large and complex data sets in a way that resorts to a theoretical construct to extract the best set of rules.

ID3 works by first building a decision tree from the data. Figure 6.1.13.3.1 illustrates a decision tree for the data in Table 6.1.13.3.1. The nodes of a decision tree are variables in the data set. For example, the top most or root node represents the feature *Children*. The arcs from each node are possible values of the variable the node represents. The leaves of the tree represent a distinct category or class of output variable, in this case *Equal split* to be classified.

The extraction of rules from a decision tree is trivial once a rule is generated from every path through the tree. For example, the rules that emerge from each path in Fig. 6.1.13.3.1 are:

- IF *Children* = *no* THEN *Equal split*
- IF *Children* = yes and *rich* = *no* THEN *no Equal split*
- If *Children* = yes and *rich* = yes and wife\_works = no THEN *no Equal split*
- If *Children* = yes and *rich* = yes and wife\_works = yes THEN *Equal split*

A number of different decision trees, and therefore, rules, can be derived from the same data set. Figure 6.1.13.3.2 illustrates a different decision tree from the same marital data in Table 6.1.13.3.1. This decision tree has wife works at the root of the tree. Rules derived are quite different from those in the decision tree of Fig. 6.1.13.3.1.

Fig. 6.1.13.3.1 Decision tree for marital data

**Fig. 6.1.13.3.2** Decision tree for marital data with wife

works as root

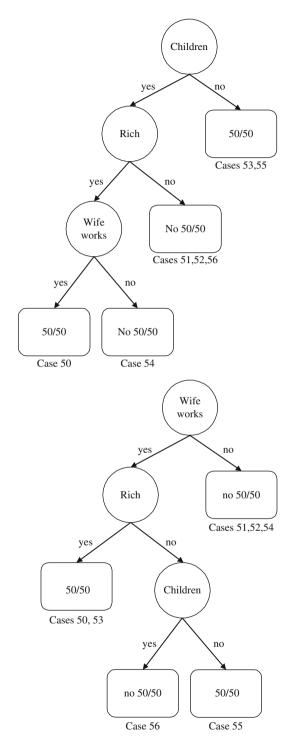
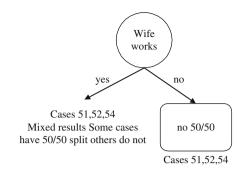


Fig. 6.1.13.3.3 Wife working as root of the tree



The ID3 algorithm builds a decision tree by following the same three steps:

- 1. Select an attribute as a node in the tree (often called selecting a feature to split on).
- 2. Split cases on that attribute's values.
- 3. Repeat 1 and 2 until leaves contain the same class.

Figure 6.1.13.3.3 illustrates the first stage of ID3 if the feature wife works is selected as the root of the tree. The cases on the no arc are all of the same class so the algorithm stops on that branch. The cases on the yes arc contain a mix of values for Equal split so the algorithm repeats using only those cases.

The key element of the ID3 algorithm is the use of *information theory* advanced by Shannon and Weaver (1949) for the selection of an attribute on which to split. ID3 also has an inductive bias favouring shorter decision trees. This follows the well known principle of *Occam's Razor*,<sup>188</sup> namely: *prefer the simplest hypothesis that fits the data*.

#### 6.1.13.4 Examples of Rule Induction in Law

Vossos et al. (1993), in conjunction with a legal firm, developed the Credit Act Advisory System, CAAS. This is a rule based legal expert system that provides advice regarding the extent to which a credit transaction complies with the Credit Act 1984 (Vic). Although, the majority of rules derive directly from the statute, some factors remain vaguely defined in the Act. For example, the factor "credit was for a business purpose" is not defined by the statute.

IKBALS III (Zeleznikow et al., 1994) is an integrated rule-based/case-based reasoner that operates in the domain of Victorian (Australia) Credit Law. Whilst the deductive reasoner covers the total domain of Credit law, the analogical component is confined to advising as to whether a transaction is for a valid business purpose. In this instance, a rule induction algorithm based on ID3 is invoked to discover new rules from a database of facts from past cases that involved credit for a

<sup>&</sup>lt;sup>188</sup> Developed by William of Occam circa 1320.

business purpose. A rule induction technique discovers rules from past cases where a judge had decided whether credit was extended for a business purpose. These rules help a user determine whether a new, current situation involves credit for a business purpose.

Large numbers of cases were examined by Wilkins and Pillaipakkamnatt (1997) in order to estimate the number of days that are likely to elapse between the arrest of an offender and the final disposition of the case. The time to disposition depends on variables such as the charge, the offender's age, and the county where the arrest was made. Values on more than 30 variables from over 700,000 records from 12 US states were used. Rules were automatically extracted using the ID3 rule induction algorithm. Although Wilkins and Pillaipakkamnatt (1997) themselves had hoped for rule sets that predicted the time to disposition more accurately than their results indicate, this study remains an impressive demonstration of the potential for KDD techniques to contribute to the effective delivery of legal services.

# 6.1.14 Using Neural Networks

#### Andrew Stranieri and John Zeleznikow

## 6.1.14.1 Historical Background

A *neural network* consists of many self-adjusting processing elements cooperating in a densely interconnected network. Each processing element generates a single output signal that is transmitted to the other processing elements. The output signal of a processing element depends on the inputs to the processing element: each input is gated by a weighting factor that determines the influence that the input will have on the output. The strength of the weighting factors is adjusted autonomously by the processing element as data is processed. Neural networks are particularly useful in law because they can deal with

- (a) classification difficulties,
- (b) vague terms,
- (c) defeasible rules, and
- (d) discretionary domains.

Whereas neural networks only became popular in computer science decades after traditional computing (*symbolic computing*) did, actually the history of neural networks can be traced back to the mid-century. In the present Section 6.1.13,<sup>189</sup> we are going to consider various kinds of neural networks, and to devote some attention to how they have been applied to law. Already before 1950, the enormous capacity for

<sup>&</sup>lt;sup>189</sup> We are using some material especially from Stranieri and Zeleznikow (2005a).

humans to learn and adapt to new situations led a number of researchers to postulate that a machine, structured in a similar way to the brain, may also learn.

Neural networks resemble the brain in two respects:

- 1. Knowledge is acquired by the network through a learning process
- 2. Inter-neuron connection strengths known as weights are used to store the knowledge

Much of the impetus for neural networks came from a recognition that the human brain, structurally, is made of cells called neurons. Neurons are connected to other cells through fibres called axons. Neurons become activated electrically and transfer the electrical impulse down their axons to other neurons. The juncture between the axon and neuron is called a dendrite. The signal travelling along an axon is restricted to a greater or lesser degree by chemicals at the site of the dendrite. The rudimentary structure is illustrated in Fig. 6.1.14.1.1.

McCulloch and Pitts (1943) explored the idea that a machine, structured similarly to the brain, may also learn. They devised a cell that performed the function of a logical AND, and another that performed the function of logical OR. They suggested that higher level reasoning and learning could occur by the combined effect of numerous specialist AND or OR cells. Rosenblatt (1958) generalised the McCulloch and Pitts neural network. He developed a neural network called a *perceptron* that could learn a variety of functions including AND and OR. He did so by suggesting dynamic modification of the weights that represent the strength of interconnections amongst neurons.

Let us consider a perceptron network *topology*. There is a pattern of connections between neurons: 2 input nodes fully connected to 2 hidden nodes, fully connected to one output node. In neural networks, such nodes that are neither input nor output are called *hidden nodes*. There is an *activation function*, f, defined as follows (we give the numerical value by way of example):

If Activation  $\geq 0.7$  then Output = 1 else Output = 0

In Fig. 6.1.14.1.2, we see the input activation of the percetron, for given weights. The data of the output activation are shown in Table 6.1.14.1.1. This is how the neurons in the perceptron combine. Let us consider a different input; then in Fig. 6.1.14.1.3, we see the input activation of the percetron. The data of the output activation are shown in Table 6.1.14.1.2.

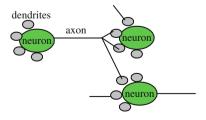
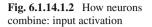


Fig. 6.1.14.1.1 Simple brain structure



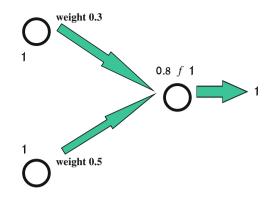
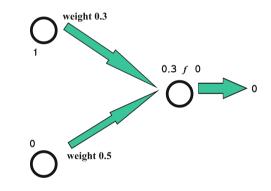


Table 6.1.14.1.1The data ofthe output activation of theperceptron given the input ofFig. 6.1.14.1.2

Inputs		Outputs	
1	1	1	
1	0	0	
0	1	0	
0	0	0	

Fig. 6.1.14.1.3 How neurons combine: input activation



**Table 6.1.14.1.2.** The dataof the output activation of theperceptron of Fig. 6.1.14.1.3

Inp	uts	Outputs	
1	1	1	
1	0	0	
0	1	0	
0	0	0	

## 6.1.14.2 Feed Forward Networks

Neurons are grouped into layers or slabs (Zahedi, 1993). An input layer consists of neurons that receive input from the external environment whilst the output layer consists of neurons that communicate the output of the system to the user or the external

environment. Designing the interactions among neurons is equivalent to programming a system to produce an input and produce the desired output. Designing a neural network consists of:

- (a) Arranging neurons in various layers;
- (b) Deciding the type of connections among neurons of different layers, as well as among the neurons within a layer;
- (c) Deciding the way a neuron receives input and produces output;
- (d) Determining the strength of connections within the network by allowing the network to learn the appropriate values of connection weights by using a training data set.

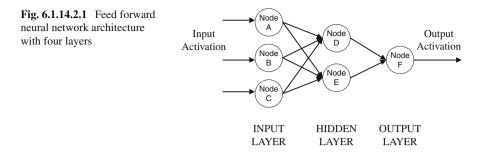
The neurons of one layer are always connected to the neurons of at least another layer. There are different types of layer-to-layer or inter-layer connections<sup>190</sup>:

- (i) *Fully connected* each neuron on the first layer is connected to every neuron on the second layer;
- (ii) *Partially connected* a neuron on the first layer is connected to one or more neurons on the second layer;
- (iii) *Feed forward* the neurons on the first layer send their output to the neurons of the second layer, but they do not receive any input back from the neurons on the second layer;
- (iv) *Bi-directional* in addition to a set of connections going from neurons of the first layer to those on the second layer, there is another set of connections carrying the outputs of the neurons of the second layer into the neurons of the first layer;
- (v) *Hierarchical* the neurons of the lower layer communicate only with the neurons on the next level;
- (vi) Resonance in the resonance type of inter-layer connection, the two layers have bi-directional connection, with the added complexity that they continue sending messages across the connections a number of times until a certain condition is achieved.

Nodes in feed forward networks are organised in layers as depicted in Fig. 6.1.14.2.1. In a feedforward network, connections all lie in the same direction from the input layer to the output layer.

The first layer of nodes receives activation input into the network and is called the INPUT LAYER. The input nodes of feed forward networks become activated and forward their activation forwar to nodes in the next layer. Neurons in each layer feed activation forward to subsequent layers. In contrast, recurrent networks, to be discussed in the next section, pass their activation back to input and other nodes to form an internal feedback loop. Of the more than 200 different kinds of neural

<sup>&</sup>lt;sup>190</sup> At http://en.wikipedia.org/wiki/Types\_of\_artificial\_neural\_networks many types of neural networks are briefly but usefully surveyed.



networks,<sup>191</sup> the feed forward networks are the most commonly used networks. The simplest feed forward network is called the *perceptron*.

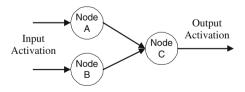
Figure 6.1.14.2.2 illustrates a simple perceptron with three neurons. A perceptron has only two layers, an INPUT and an OUTPUT layer though any number of neurons may be defined in each of those two layers. When the two neurons on the left, A and B are activated, they pass their activation on to neuron C. The link between A and C and B and C is marked with a weight that acts to inhibit (or exalt) the signal. The activation coming into C is calculated by summing the inputs multiplied by the weight. For example, if we set the activation of nodes A and B to 1.0 then the activation reaching

C 
$$(1 * 0.8) + (1 * 0.8) = 1.6$$
 units,

where 0.8 is the weight between A and C and also between B and C. The activation leaving a node is not simply the activation entering the node. Rather, the raw input activation is passed through a function known as the activation function to determine the output. Rosenblatt (1958) advanced the following activation function:

**if** input is greater than a threshold **then** the activation output is 1 **else** the activation output is 0.

Learning commences in a *perceptron* by setting weights to any random starting point. One by one, examples are presented to the network and a learning rule



#### Fig. 6.1.14.2.2 Perceptron

<sup>&</sup>lt;sup>191</sup> At http://en.wikipedia.org/wiki/Types\_of\_artificial\_neural\_networks a few of the many kinds of neural networks are surveyed.

determines whether the initial weights will produce the output required. If not, the learning rule modifies the weights. Training stops when a set of weights is found that produce the correct output for all inputs.

The perceptron learning rule is simple:

- (a) If the output is correct then do not change any weight.
- (b) If the output is too small then increase the active weight by a constant.
- (c) If the output is too large then decrease the active weight by a constant.

Rosenblatt (1958) demonstrated that starting with any set of initial weights, the *perceptron* learning rule will incrementally modify weights until a set of weights that leads to the desired output is found. The constant, d, is called the learning rate and is generally set between 0 and 1. A large learning rate will modify weights each time by a large amount and lead to faster training. However, as we discuss below, this can also lead to sub-optimal training.

Let us consider the training of the *perceptron* initialised with weights as depicted in Fig. 6.1.14.2.2. The *perceptron* is required to learn from the data in Table 6.1.14.2.1, which contains the *training data*. The training itself is tabulated in Table 6.1.14.2.2.

The *perceptron* can be configured with any number of input and output nodes and the learning rule will still find a set of weights, if one exists, that maps the input into the outputs. A great deal of excitement surrounded the introduction of Rosenblatt's (1958) *perceptron* as a result of the breadth of applications imaginable. However, the excitement waned when Minsky and Papert (1969) illustrated how the *perceptron* fails to find a set of weights if the examples are non-linearly separable. This limits the application of *perceptrons* to little more than trivial problems.

Data is linearly separable if a straight line or plane can be drawn to separate examples into different types of outputs. Please refer again to the figures of Section 6.1.9.3 above, of which the first one illustrates the plot of points that represent X or Y. The shaded points represent the value 1 on (X OR Y). We see clearly that a straight line can be drawn that separates those X and Y data points that have a value 1 on (X OR Y) from those that have a value 0. In contrast, in the second figure of Section 6.1.9.3 we see that a similar straight line cannot be drawn. The exclusive-Or function is said to be non-linearly separable. Minsky and Papert (1969) demonstrated that the Perceptron cannot learn patterns that are non-linearly separable such as the exclusive-Or function.

Example	А	В	C
1	1	1	1
2	1	0	0
3	0	1	0
4	0	0	0

Table 6.1.14.2.1	Training
data for perceptro	n example

					-	0		
Example	Input at A	Input at B	Weight A/C	Weight B/C	Raw input at C	Activation at C	Expect activation	Learning rule outcome
1	1	1	0.8	0.8	1.6	1	1	Correct. Leave weights unchanged
2	1	0	0.8	0.8	0.8	1	0	Output is too large so decrease the active weight
3	0	1	0.5	0.8	0.8	1	0	Output is too large so decrease the active
4	0	0	0.5	0.5	0.0	0	0	weight Correct output so leave weights
1	1	1	0.5	0.5	1.0	1	1	unchanged Correct output so leave weights
2	1	0	0.5	0.5	0.5	0	0	unchanged Correct output so leave weights
3	0	1	0.5	0.5	0.5	0	0	unchanged Correct output so leave weights
4	0	0	0.5	0.5	0.5	0	0	unchanged Correct output so leave weights unchanged

 Table 6.1.14.2.2
 Perceptron training

Rumelhart, Hinton, and Williams  $(1986a)^{192}$  and Werbos (1974) demonstrated that non-linearly separable problems can be learnt by a neural network provided that there were at least three layers of neurons as depicted in Fig. 6.1.14.2.1. A network that has a hidden layer cannot be trained with the *perceptron* learning rule.

<sup>&</sup>lt;sup>192</sup> Also see Rumelhart, Hinton, and Williams (1986b).

This is because the error of the nodes in the hidden (middle) layer cannot be known. The error on the output layer is known because the output desired is available in the data set and the network's output is known. However, the desired output on a hidden layer is unknown. Without knowing the error on hidden layers, the weights between input and hidden nodes cannot be adjusted.

## 6.1.14.3 Back Propagation of Errors

Rumelhart et al. (1986a) developed a new learning rule called the *Generalised Delta Learning Rule* or *back propagation of errors*. In this learning rule, the error on the hidden nodes, though not known, is estimated from the error at the output layer. The mathematics involved can be difficult but the intuition is straightforward. The error of hidden nodes is related to the error of nodes in the next layer. In fact, the error is a derivative of errors in the next layer. The hidden layer error is estimated as the derivative of the output layer error. Using the derivative of the output layer to estimate the hidden layer error turns out to work quite well.

The approach does however assume that the derivative can be calculated on all output values. In order to ensure this, Rumelhart et al. (1986a) applied an activation function that generated a continuous output. The most commonly used activation function is the *sigmoidal* or *S*-curve function.

Since its introduction, the multi-layer feedforward neural network trained with back propagation of errors has been applied in thousands of applications. Many neural network packages are available commercially and others are available as open source programs.<sup>193</sup>

## 6.1.14.4 Setting Up a Neural Network

Setting up a neural network involves determining a topology. A network topology is a specification of the number of neurons in the input layer, the output layer and in each of the hidden layers. Decisions regarding the number of nodes in the input and in the output layers depend on the way data is to be encoded for the network.

Data encoding refers to the format of data to be input to the neural network. For example, the percentage split argument in our Split Up system for automated assistance in settling divorces encodes:

• A percentage split outcome awarded to the husband, measured with 14 categories; [0–10%, 11–20%, 21–30%, 31–35%, 36–40%, 41–45%, 46–50%, 51–55%, 56–60%, 61–65%, 66–70%, 71–80%, 81–90%, 91–100%] as output.

<sup>&</sup>lt;sup>193</sup> The Usenet news group comp.ai.neural-nets maintains a monthly posting of a Frequently Asked Question (FAQ) that lists packages available. Regardless of the package used, the use of a neural network involves two main steps; defining the network and training it with data. These steps are discussed in the next two sections.

- An input variable that represents the contributions the husband has made relative to the wife with values on a five point scale: [much more, more, same, less, much less].
- An input variable that represents the level of wealth of the marriage. This is also a five point scale: [very high, high, average, low, very little].
- An input variable that represents the future needs the husband has relative to the wife with values on a five point scale: [much more, more, same, less, much less].

Figure 6.1.14.4.1 illustrates the topology with 15 input nodes, 5 hidden nodes and 14 output nodes that implements the percentage split network in the Split Up study. Five of the input nodes encode values for the contribution variable. The next five encode the "needs" variable and the remaining five encode the "wealth" variable. A marriage where the judge considers the husband has contributed *much less* than the wife, has future needs *much more* than the wife and is of *average wealth* is encoded as [0,0,0,0,1,1,0,0,0,0,0,0,0,1,0]. This is quite a sparse encoding as the same values could be encoded in a far more compact way. For example, an encoding scheme illustrated in Table 3 could be used to encode the same case using only three input nodes as [-1,1,-0.5].

Table 6.1.14.4.1 shows a sample encoding in the Split Up system. More compact encoding schemes enable for the development of neural networks with fewer input nodes and connections to be designed. However, the compactness makes training more difficult.

Once the input and output encoding is determined, the next decision involves selecting the number of hidden layers and the number of nodes at each layer.

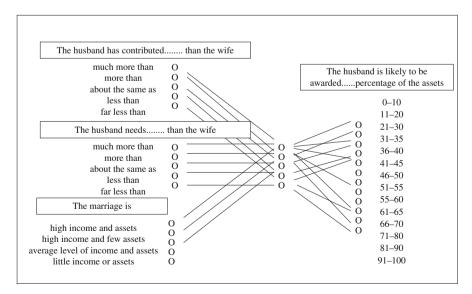


Fig. 6.1.14.4.1 Topology of percentage split network in Split Up

ole	Data value	Encoding		
	Much less	-1		
	Less	-0.5		
	Same	0		
	More	0.5		
	Much more	1		
	Very high income and assets	1		
	High income and assets	0.5		
	Average income and assets	0		
	Low income and assets	-0.5		
	Little income or assets	-1		

Table 6.1.14.4.1	Sample
encoding in Split	Up

Cybenko (1989) demonstrated that a single hidden layer is sufficient to approximate any (linear or non linear) continuous function. This means that any function between inputs and outputs can be approximated with a neural network that has only one hidden layer. This is not to say that the optimal number of hidden layers is one.

Haykin (1994) reviewed a body of research that has been devoted to the discernment of optimal network architectures. All of the approaches surveyed recognise a relationship between training set size and network size. However, a procedure that can be applied to determine the best topology for any data set has not been found. Lengers (1995) demonstrated a method based on trying many hundreds of different topologies using artificial intelligence search techniques.

Once a neural network topology is defined, training may commence. In the next section, processes are discussed to ensure training occurs effectively.

## 6.1.14.5 Training a Neural Network

Multi-layer feed-forward networks are commonly trained with the back-propagation of errors learning rule. Training involves exposing a network to a training set that is comprised of data examples, with known outputs. The learning rule adjusts the internal weights of a network in a direction that will minimise the errors made by the network on subsequent exposure to the examples. An *epoch* is completed when all training set examples are presented to the network. Typically, a network with many nodes and examples requires many hundreds, thousands or tens of thousands of epochs before the learning rule discovers a set of weights that will minimise the error made on classifying examples.

Training a neural network is as much art as science and requires the adjustment of many parameters during the training. A plot of the errors at each epoch is useful. This is depicted in Fig. 6.1.14.5.1. The error is often measured as the proportion of the training set examples that are incorrectly predicted by the network. For example, an error rate of 0.75 indicates that for 75% of examples in the training set, the output calculated by the neural network did not match the output that was observed in the training set. We see in Figure 6.1.14.5.1 that the error rate remained quite high for

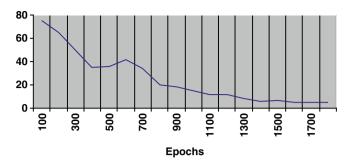


Fig. 6.1.14.5.1 Plot of error rate vs. epochs

the first 600 or so epochs. By epoch 1000 the rate was quite low. Furthermore, it did not alter terribly much between epoch 1300 and epoch 1700.

Training a neural network involves making decisions regarding the following parameters:

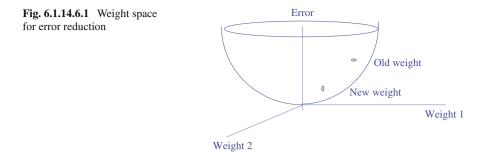
- Learning rate
- Momentum
- Bias term
- Stopping criteria

#### 6.1.14.6 Learning Rate

The learning rate specifies the speed with which learning occurs. If this is too high, the weight matrix<sup>194</sup> may be caught in a local minima and never find the set of weights that corresponds to an optimal solution. Figure 6.1.14.6.1 depicts learning as the search for the set of weights that will realise the smallest error. The initial weights, typically selected at random, lead to large errors. As the learning rule adjusts the weights, the error of the network reduces, until no further reduction seems to occur during epoch after epoch. The weights at this point may be the best set that will be discovered; i.e. they represent global minima. However, this cannot be known with certainty because the weights may represent local minima. They do not change from epoch to epoch because any change leads to an error that is worse, so the learning rule re-adjusts the weights back to the local minima.

Many variants introduce additional parameters to tune. Others, such as *quickProp* Fahlman (1989) dynamically modify many of the parameters, including the learning rate.

<sup>&</sup>lt;sup>194</sup> A *weight matrix* "is used to list the weight values (strengths) that exist in the network. The position of a weight within the matrix will define which units the weight connects. Sometimes, more than one weight matrix is used to describe the way in which the units are connected in a network. For example, if units are placed in layers then a single matrix might be used to describe the connections between two layers" (Callan, 1999, p. 226).



## 6.1.14.7 Momentum and Bias

There is no theoretical way of knowing whether the weights obtained are the best set possible or are an instance of weights stuck in local minima. The generalised delta rule includes a term known as the *momentum*, to add stability to a network and to guard against being caught in local minima. This term represents the extent to which weight values in previous epochs carry over into subsequent epochs. The user sets the momentum of the learning rule.

Momentum values are usually set between 0.3 and 1. A momentum term set too low will result in a network that may not be able to climb out of local minima regardless of the learning rate adjustments. In addition to momentum, terms known as *bias* represent constants that act as additional inputs to each node. The topology of the network, number of examples and the characteristics of the data all impact on these parameters.

A bias term is included in many implementations of neural networks and can be thought of as a fixed, constant input into each neuron. Bias terms are usually set between -1 and +1. Bias provides additional stability and restricts erratic learning behaviour. Modifying the bias term during training sometimes helps a network seemingly stuck at one error level to begin to make small gains on each epoch.

## 6.1.14.8 Training Stopping Criteria

Typically, training ceases when a fixed maximum number of epochs are reached or when the network performance has reached a threshold error level. A stopping criteria based on an error threshold is better than one based on number of epochs, but the error should be measured on examples not seen during training. The extent to which the trained network will generalise and perform correctly on cases not in the training set depends on the size and coverage of the training set, the architecture of the network and the complexity of the problem. Two extremes are to be avoided if adequate generalisation is to ensue: *undertraining* and *overtraining*.

*Undertraining* of a neural network occurs if the network is not exposed to enough examples. Learning is difficult in this situation simply because the training patterns available are not sufficiently representative of the true population of cases.

Another variation of the same extreme occurs if the network is not exposed to the training set for a sufficient number of epochs. The opposite extreme is known as *over-generalisation, overtraining* or *overfitting*. If a sufficiently large network has been exposed to an abundance of examples, far too many times, it can learn each input–output pair so well that it, in effect memorises those cases. The network classifies training set cases well but may not perform so well with cases not in the training set. The network is said to be *overtrained* or *overfitted*.<sup>195</sup>

The objective in training any neural network is to avoid either undertraining or overtraining. This can be achieved in various ways. In the Split Up project, this goal was achieved by pursuing the *cross-validation resampling method*.

However, perhaps the most important consideration in avoiding over-training or undertraining involves the discernment of a domain specific appropriate metric for measuring errors. A measure of classifier performance typically used in classifier training in non-legal domains is the number of examples correctly classified. As Weiss and Kulikowski (1992) point out, this measure of network performance may not be adequate for all domains. They suggest a metric that includes the costs of predicting a positive outcome when the actual outcome was negative (called *false positives*) and the risks associated with predicting a negative outcome when the actual outcome was positive (called *false negatives*).

For example, a network, trained to discern the presence or absence of a disease will ideally, err far more times on the side of predicting a disease when there is none present than it will err in missing a disease that is actually present. A False positive/False negative analysis of errors is not warranted in family law, because the direction of the error is not as critical as it is in medical diagnostic problems. A network that predicts the husband is to receive 60% of the property errs if the judge in the case actually awarded 55%. However, another network errs in a similar and in a no more or less damaging manner if it predicts the husband is to receive 50% of the assets. Thus, the direction of the error is not critical for our purposes.

The stopping criteria for neural networks that model legal domains are invariably subjective. It is unreasonable to expect perfect performance from neural networks in discretionary domains of law, because networks are trained on data from many judges, and thus cannot always exactly predict the outcome of any one judge on

<sup>&</sup>lt;sup>195</sup> A nice exemplification of *overtraining* is found in the Wikipedia entry for "Artificial neural network" (http://en.wikipedia.org/wiki/Artificial\_neural\_network):

A common criticism of artificial neural networks, particularly in robotics, is that they require a large diversity of training for real-world operation. Dean Pomerleau, in his research presented in the paper "Knowledge-based Training of Artificial Neural Networks for Autonomous Robot Driving", uses a neural network to train a robotic vehicle to drive on multiple types of roads (single lane, multi-lane, dirt, etc.). A large amount of his research is devoted to (1) extrapolating multiple training scenarios from a single training experience, and (2) preserving past training diversity so that the system does not become overtrained (if, for example, it is presented with a series of right turns — it should not learn to always turn right). These issues are common in neural networks that must decide from amongst a wide variety of responses.

all cases. The measurement of the performance of a neural network, by counting the number of correctly classified examples, leads to a measure of network performance that may be too fine-grained for legal applications and thus increases the risk of over training. Given that a perfect performance is unlikely, other acceptable criteria must be adopted. There seems no theoretical basis to underpin such criteria, so acceptable criteria must be selected heuristically.

A good measure of a neural network's performance in a discretionary legal domain includes an indication of the magnitude of the error. An error of 5% either way when estimating a judge's decision about the percentage of marital assets to be awarded to the wife is, in our view, tolerable. On the other hand, a network which outputs a percentage split which deviates by 20% from that given by a judge, is assumed to have erred. Although the cut off point for declaring that an error has occurred is necessarily subjective it is important that a metric be discerned which can be applied consistently to all neural networks in the Split Up system.

The metric adopted in the Split Up study makes use of the following encoding scheme. Consider a network with five binary outputs. A network output of [1,0,0,0,0] for a particular example indicates that the first bit is set. If the actual output has the fifth bit set [0,0,0,0,1], we consider the network to have made an error of magnitude four. If the actual output sets two bits such as it would in [0,1,1,0,0]we take the average of the positions of the set bits. In this case we say the actual bit set is in position 2.5. If the expected output was [0,0,1,0,0] then the error is of magnitude 0.5 (i.e., in the range between 2.5 and 3). The use of an error heuristic based on the position of the set bit has advantages in that it is simple, easy to calculate and has a direct association with the interpretation placed on the bits. Encoding the five values "much more", "more", "about the same as", "less" and "much less" as bit string could be achieved with as few as three bits. However, a five bit number enables the position of the set bit to correspond directly with one of the values.

The error heuristic we use is central to the training of the neural networks used in the Split Up project. Training is halted in Split Up networks once the proportion of errors of magnitude three or more is observed to be 3% or less. An error of magnitude three represents a significant error for most neural networks. However, the cost of totally eliminating these errors is high, in that the additional training required increases the risk of overtraining.

A number of neural networks in legal domains have been trained successfully, although the use of neural networks in law is far from widespread. In the next section we review these attempts in order to argue that many neural networks have not been appropriately trained, and further inappropriate data has been used.

## 6.1.14.9 Application to Law of Neural Networks

Hunter (1994) notes that neural networks are essentially statistical. By this he means that associations between inferred outcomes and facts are represented as statistical associations captured as inter neuron weights. As such, connectionism derives support from the same jurisprudential theories as does any statistical method.

In the 1960s, Kort (1964) and Nagel (1964) both developed statistical methods for analysing cases. Their goal was to predict decisions. Both authors advanced methods for determining how the courts weighed individual facts to reach a decision. Kort's method was based on the solving of simultaneous equations in order to ascertain the weight of factors, while Nagel used discrimminant analysis. These authors validated their statistical approach by drawing on the jurisprudence of legal realists. As stated in chapter one, we claim that connectionism can be useful for resolving situations that involve open texture, yet their effectiveness depends on the type of open textured situation studied.

The classification of situations, characterised as open textured by Prakken (1993a), provides a useful framework for a survey of neural network approaches. We argue that neural networks are best applied to situations that involve the open texture inherent in judicial discretion though some inroads can also be made toward resolving classification difficulties. To recapitulate, Prakken (1993a) identifies situations characterised as open textured as those that involve classification ambiguities, defeasible rules or vague terms. We appended the situation characterised by judicial discretion to that list. In the following, we shall survey notable applications of neural networks to each of these open textured situations.

PROLEXS (Walker et al., 1991) operates in the domain of Dutch landlordtenant law. It operates with four knowledge groups, each of which have their own knowledge representation language and dedicated inference engine:

- legislation: a rule-based system<sup>196</sup>;
- legal knowledge;
- expert knowledge; and
- case law: using case-based retrieval.<sup>197</sup>

PROLEXS resorts to neural networks in case selection, case abstraction and credit assignment. The PROLEXS perceptron dealt with apartment suitability and had as its inputs the age of the tenant, the disability of the tenant, the quality of the apartment and the presence of an elevator. Various weights were assigned, and some learning was attempted. Rather than rely on manual specification of weights, the use of a perceptron allowed for automatic weight generation, avoiding the danger of manual specification of weights. The use of hidden layers in a neural network can improve the accuracy of the predictions generated by the network.

Borges, Borges, and Bourcier (2002) use neural networks to model the legal reasoning of judges at the Court of Appeal, Versailles, France. As does Hunter (1994),

 $<sup>^{196}</sup>$  Historically within AI & Law, rule-based systems came under criticism because of too rigid interpretation of legislation, leaving no room for interpretation. Bench-Capon (1993a = 1994 [at a conference and a journal, both of them with Indira M. Carr as editor]) argued that rule-based representations of legal knowledge can nevertheless be acceptable, if the use made of the rules is sophisticated.

<sup>&</sup>lt;sup>197</sup> For retrieving legal cases, see e.g. Zeng, Wang, Zeleznikow, and Kemp's (2005) "Knowledge Representation for the Intelligent Legal Case Retrieval".

they claim that one of the main obstacles to the use of neural networks in legal domains, is the inability of such networks to justify their decision making. They develop a multilevel perceptron justification algorithm. They claim that their models can be used for improving the self-justification process of a decision-maker and for predicting or suggesting new lines of reasoning based on implicit knowledge. Borges, Borges, and Bourcier (2002) use employment contracts cases. Borges et al. (2003) study the topography of a multilayer perceptron with backpropagation algorithm to improve connectionist classification.

Hobson and Slee (1994)<sup>198</sup> study a handful of cases from the U.K. theft act and also use neural networks to predict the outcome of theft cases. They used a series of leading cases in British theft law to train a network to predict a courtroom outcome. Results they obtained were less than impressive which they attributed to flaws in the use of neural networks in legal reasoning. This criticism was too harsh. Neural networks have much to offer knowledge discovery from databases (KDD). However, any application of KDD to data drawn from the legal domain must be carefully performed. Due attention is required so that key assumptions made at each phase of the KDD process are clearly articulated and have some basis in jurisprudence. For example, the cases used in the Hobson and Slee study involved leading cases. We believe that leading cases are not well suited to a KDD exercise involving neural networks.

#### 6.1.14.10 Application to Classification

Bench-Capon (1993b) applied neural networks to a problem that involved open texture in the manifestation of classification difficulties. He identified six variables as inputs into a neural network that modeled the imaginary domain of social security entitlements in the United Kingdom. The output represented whether or not an applicant was entitled to social security benefits. The open texture in this domain manifested itself as difficulties inherent in classifying whether the applicant was entitled to social security benefits.

Presented with cases that were not used for training, the neural network was able to suggest an outcome that reflected the weightings of input variables in prior cases. However, limitations were apparent in that, in some cases the network was clearly in error. For example for every case in the training set that output a social security benefit, it had, as one of the inputs, the fact that the applicant was over a certain age. This was because the applicant's age was a limiting condition for the granting of a benefit. However, when dealing with some unseen cases, the neural network granted a benefit to some applicants under the limiting age.

A neural network cannot be guaranteed to perform correctly on cases that were not present in the training set. If trained appropriately, then we may estimate the proportion of all possible cases that will be classified correctly. However, we will not know with certainty which class of cases will be incorrectly classified. This

<sup>&</sup>lt;sup>198</sup> We already referred to that study in Sections 6.1.11.1 and 6.1.11.5 above.

is not necessarily a condemnation of neural networks. The limiting condition in the Bench-Capon's study (1993b) is more aptly represented as a rule. Furthermore, the rule seems to be one, which is applied in an all or nothing, way: without any exceptions. In law, very few rules in operate in this way. The Bench-Capon study can thus be seen to apply neural networks to a classification task that is more obviously suited to a series of simple rules.

Warner (1994) does not explicitly claim that neural networks have the potential to resolve situations in law characterised by classification difficulties. Rather, he maintains that neural networks are appropriate to use in modelling law, because they exhibit the capacity to emulate the parallel reasoning process of a lawyer. He argues that legal problem solving behaviour is often described as a serial process that progresses in a step-by step fashion, from the initial problem description, to the goal of the reasoning. Yet, legal reasoning involves a parallel process of assimilating facts to reach partial solutions and assimilating partial solutions to reach a final solution. Warner's rationale for the use of neural networks in law is open to criticism, in that the distinction between problem solving performed in series and in parallel, is by no means clear. For instance, it is not clear why a parallel process should succeed in law where a serial process will fail. Furthermore, according to Hunter (1994), there is little support from jurisprudential theorists for the notion that legal reasoning is, in any sense, parallel.

Despite the shortcoming in the rationale that Warner (1994) uses to justify the use of neural networks, the actual task to which he applies neural network, is one that attempts to deal with classification difficulties in the domain of consideration in contract law. His network attempts to classify a case according to whether the contract involved a consideration. The uses of neural networks for modelling legal reasoning by Bench-Capon and Warner are similar, in that each of these authors applies neural networks to resolve classification difficulties; difficulties that contribute to a perception of law as open textured. The application of neural networks to legal reasoning by Philipps (1991) and by Thagard (1989) differ from these approaches, in that their studies can be seen to apply connectionism in an attempt to resolve defeasible rules.

## 6.1.14.11 Application to Rule Defeasibility

Philipps (1989) demonstrates how neural networks can assist in dealing with defeasible rules by examining a hypothetical example taken from Roman Law. The will of a hypothetical citizen whose wife was pregnant read:

If a son is born to me let him be heir in respect of two thirds of my estate, let my wife be heir in respect of the remaining part; but if a daughter is born to me, let her be heir to the extent of a third; let my wife be heir to the remaining part.

This hypothetical will can be seen to involve two rules, one governing the distribution of the estate in the event of the birth of a daughter and the other governing the distribution of the estate in the event of the birth of a son. Rather than representing these rules as clauses in a logic program or rules in a rule based reasoner, Philipps trained a feed forward neural network with back-propagation of errors to deliver the correct output when exposed to scenarios that involved the birth of a boy and the birth of a girl, but not the birth of both. He then put forward a case that necessarily defeats these rules; one in which twins, a boy and a girl are born. In this case, the network that had not been exposed to this scenario during training, produced an outcome that indicated the mother receives two shares, the son receives three and the daughter receives four.

Philipps argues this outcome is reasonable, in that it represents an equilibrium based on past cases. However, Hunter (1994) points out that the notion of equilibrium with past cases is jurisprudentially flawed. There is no notion of moral correctness, nor any appeal to reason, that reflect higher principles. We agree with Hunter on this point, because we believe that, in this Roman Law example, reasoning is best modelled as deductions made from known legal rules. However, this is not the case in discretionary domains. Another instance of the application of connectionism for modelling defeasible rules in law can be seen in the work of Thagard (1989).

He proposed a theory of explanatory coherence that aims to model the way in which competing hypotheses are supported by available evidence. Some nodes in the network he developed represent propositions about each hypothesis. Other nodes represent available evidence. Links exist between evidential nodes and hypothesis nodes. Each has an associated weight that may be excitary or inhibitory. To determine which hypothesis has more support, the network is activated. Nodes feed activation (or inhibition) to other nodes which provide feedback to each other, until an equilibrium is reached. The network is then settled.

Thagard (1989) trialed his ECHO program (cf. Section 2.2.1 above in this book) on a murder case in which the competing hypotheses were X was innocent and X was guilty. Propositions associated with these hypothesis included C broke his hand punching X and C broke his hand falling on a rock. Thagard's propositions did not include rules from statutes or from legal principles, but could easily have been extended thus. Propositions that reflected statutes or principles would compete for activation with other propositions and those hypotheses that remained most active after the network settled, would be deemed to have, in Thagard's terms, more explanatory coherence.<sup>199</sup>

In this way, the Thagard approach can be interpreted as one which attempts to resolve those situations in law that are characterised as open textured, because of the presence of defeasible rules. The Thagard approach is certainly intuitively appealing, but requires much further research. Attempts by Thagard and Philipps to use neural networks to model reasoning with defeasible rules can be seen to be overly ambitious if we relate their attempts to the use of Toulmin argument structures (for which, see Sections 3.2 and 3.11 in this book).

Inputs and outputs of their neural networks correspond to datum and claim of the Toulmin Argument Structure. The force, rebuttal, warrant and backing cannot be represented using conventional connectionist systems. So, in the Roman law

<sup>&</sup>lt;sup>199</sup> Coherence in finite argument systems is the subject of Dunne and Bench-Capon (2002).

example, commentators such as Hunter are unlikely to accept the neural network conclusion, because it cannot supply a warrant or supporting evidence. This does not point to a flaw with the use of connectionism in law, but, in our view only highlights that the procedure used to infer a claim is only one component of the structure used to persuade a reader of the feasibility of the claim. This opacity of neural networks calls for an alternative provision of transparency for the advice given by a knowledge-based systems. This is why in our Split Up system, where calculations are by means of neural networks, we have a separate automated generation of explanations for the output obtained by the neural networks.

## 6.1.14.12 Vagueness

Law is replete with terms that are vague.<sup>200</sup> A concept such as "within reasonable limits", specified in a statute, is labelled a vague term by Brkic (1985). What is "a reasonable period"? This is vague. The presence of vague terms was enough to entice Brkic (1985) to condemn the use of deduction to model legal reasoning. To our knowledge, connectionism has not been applied to tasks that involve vague terms.<sup>201</sup> Vague terms present difficulties, because there are a number of senses in which a term may be considered vague. A statutory concept such as "within reasonable limits" may signify that a decision-maker has recourse to an element of discretion in much the same way that a Family Court judge has some flexibility in distributing marital property. If all relevant principles, rules and factors were made clear to a decision maker who then had to weight the factors in order to determine whether a current case fell within reasonable limits, we would be inclined to regard the resolution of vague terms in much the same way as we see the allocation of discretion.

However, the above paragraph does not describe not all vague concepts appearing in statutes. A vague concept such as within reasonable limits, may be included in a statute, with no supplementary material that would assist a decision maker in defining the term. Legislative drafters often prefer this flexibility, so that Courts will lay down principles to guide future decision makers. A connectionist system can conceivably be developed that has, as inputs, the facts of a case and outputs one of a permitted number of uses of the vague concept. This use of connectionism is not dissimilar to the use of connectionism to resolve classification difficulties.

*Transvaluationism* is an account of *vagueness* proposed by philosopher Terry Horgan. Horgan states (2010, p. 67):

The philosophical account of vagueness I call "transvaluationism" makes three fundamental claims. First, vagueness is logically incoherent in a certain way: it essentially involves

 $<sup>^{200}</sup>$  For example, see George Christie's (1964) "Vagueness and Legal Language". It is not merely the terms that are vague. Some concepts as well are confused and confusing, he argued concerning the concept "due process of law", in an article (Christie, 1984b) which aptly appeared in a book entitled *Les notions à contenu variable en droit.* 

 $<sup>^{201}</sup>$  It is not only terms that are vague. See Jonathan Yovel's discussion of vagueness in Section 4.6.2.2 above, in the context of his treatment of *relevance*.

mutually unsatisfiable requirements that govern vague language, vague thought-content, and putative vague objects and properties. Second, vagueness in language and thought (i.e., semantic vagueness) is a genuine phenomenon despite possessing this form of incoherence — and is viable, legitimate, and indeed indispensable. Third, vagueness as a feature of objects, properties, or relations (i.e., ontological vagueness) is impossible, because of the mutually unsatisfiable conditions that such putative items would have to meet.<sup>202</sup>

## 6.1.14.13 Application to Modelling Discretionary Legal Domains

The application of neural networks to the task of learning the way in which judges weight relevant factors in a *discretionary* domain<sup>203</sup> does not presume more from neural networks than they can deliver. As we have seen, the use of neural networks to resolve classification ambiguities or to mimic reasoning with defeasible rules makes questionable jurisprudential assumptions. We claim that neural networks can be appropriately applied to learn the way in which judges, have combined factors in past cases. To do this, we adopt a legal realist stance that variations displayed by individual judges on similar cases in a discretionary domain, are not the result of the application of different legal principles. However, a number of obstacles must be overcome if this paradigm is to be usefully applied. Hunter (1994) and Aikenhead (1996) identify prominent flaws in the way in which neural networks have been trained for use in past legal applications.

The concerns they raise focus on the explication deficiencies of neural networks, the assembly of appropriate data and methods used for the training of neural networks. We successively survey these concerns in order to describe the steps we have taken to ensure our neural networks are appropriately trained. The lack of explication facility inherent in the connectionist paradigm weighs heavily against their use in law. To overcome this problem we need to return to jurisprudence in order to discover how explanations fit into the scheme of legal reasoning.

The jurisprudence of the legal realism movement<sup>204</sup> is central to the application of the connectionist paradigm, in that this movement advocates a separation of

<sup>&</sup>lt;sup>202</sup> More can be found s.v. "Transvaluationism" in the Glossary at the end of this book.

<sup>&</sup>lt;sup>203</sup> *Discretionary*, as opposed to *mandatory*. In particular, as applied to judicial decision-making: what is up to the judge to decide, unfettered by mandatory rules, is discretionary. See Section 4.2.5. Meikle and Yearwood (2000) are concerned with the provision of support for the exercise of discretion, and how the need to avoid the risk of adversely affecting it when using a computer tool, inspired the structural design of EMBRACE, a decision support system for Australia's Refugee Review Tribunal. Leith (1998) has warned about the risks, with AI applications to law, that judicial discretion be restricted, if computer tools come to be involved in the judicial decision-making process.

<sup>&</sup>lt;sup>204</sup> "Legal realists are jurisprudes for whom the reliance on rules is an anathema. They argue that judges make decisions for a range of reasons which cannot be articulated or at least are not apparent on the face of the judgement given" (Stranieri & Zeleznikow, 2005a, Glossary). See, e.g., Rumble (1965), in the history of ideas. Wilfrid Rumble began his paper by stating (ibid., p. 547, his brackets):

Even now, the nature of American legal realism is the subject of widespread and often intense disagreement. Its significance has, to be sure, seldom been denied. Most jurists would agree with the evaluation of Mr. Justice Cardozo that "the most distinctive product of the last decade [the 1920's] in the field of jurisprudence is the rise of a group of scholars

the decision making process from the process of justifying that decision. Thus, reasoning to reach a conclusion and explaining that conclusion can be seen as two distinct processes. Drawing this distinction enables us to design a system that uses neural networks to infer conclusions and another system to explain the conclusions. A decision is made on the basis of facts inputted. We assume that rules and principles are not necessarily factors for arriving at a decision. However, rules, principles and the facts of a case, in addition to the decision itself, are necessary in order for a justification to be advanced.

Discretion, defined as the ability of individual judges to assign different relative weights to relevant factors is accommodated in the first phase, the reaching of a conclusion. The second phase, justification of the decision does not necessarily involve a reproduction of the reasoning steps nor does it necessarily require that all factors that were relevant, even if they are highly weighted, are reported as a justification of the decision.

A barrister who suspects that her client will condemn her performance, will be tempted to offer the client a conservative prediction. Yet, that factor cannot be included in an explanation without defeating the purpose. The justification phase necessarily requires a reference to rules or principles. Decisions explained without reference to established statutes or precedents are totally untenable in liberal democracies. Legal concepts are useful tools for justifying a decision and can be applied by an artificial reasoner to justify or explain any decision. A family law expert displays the same capacity. Given the same set of facts an expert is able to justify a property decision of 70% to the husband and yet, is also able to create a justification for an output of 50% to the husband for the same case.

## 6.1.14.14 Unsupervised Neural Networks

The neural networks we have previously discussed are *supervised neural networks*. This means that during training the network is presented with the example and the output is learnt for that example. For instance, during training of the Split Up percentage split network, input values for contributions, needs and wealth are presented to one network along with a percentage split of assets that the trial judge awarded in that case.

In supervised learning, the system developer tells the system what the correct is, and the system determines weights in such a way that once given the input it would produce the desired output. The system is repeatedly given facts about various cases, along with expected outputs. The system uses the learning method to adjust the weights in order to produce outputs similar to the expected results. The bulk of our discussion on neural networks for data-mining legal data sets involved a consideration of supervised neural networks.

styling themselves realists". Nonetheless, the contours of this "product" are still not universally agreed upon. Even the legal realists were baffled. The confession of one — "I do not know what it [legal realism] means" — has been echoed by others.

In *unsupervised learning* the neural network is not presented with inputs and outputs. Rather, the entire data set is presented to the network. The network is required to cluster examples into groups of similar examples. There are many types of unsupervised networks including Self-Organising Maps, Grossberg nets, In-star, out-star, Bi-directional Associational Maps and Hopfield networks (Hecht-Nielson, 1990). There is a variety of applications (either potential or actual) of unsupervised neural networks in data mining, including for the purposes of crime detection.Unsupervised neural networks known as *self-organising maps* or *Kohonen networks* have been applied in a text mining context by Merkl and Schweighofer (1997), Schweighofer and Merkl (1999) and Merkl et al. (1999). Self-organising maps will be discussed in the next section.

## 6.1.14.15 Text Clustering with Self-Organising Maps (Kohonen Neural Networks)

Kohonen (1982) first introduced *self-Organising maps* (*SOM*) or *Kohonen net-works*. The basic SOM architecture consists of two layers of nodes as illustrated in Fig. 6.1.14.15.1. Each input is connected to every output node. A randomly assigned weight is associated with each connection. The inputs nodes represent feature values that distinguish one example from another.

The data miner sets the size of the SOM output grid. The SOM in Fig. 6.1.14.15.1 contains 25 nodes in a 5\*5 configuration. There is no systematic way to determining the optimal size of an output grid. Trial runs with grids of varying sizes are generally performed until an appropriate configuration is adopted.

During training, feature vectors are presented to the SOM. Figure 6.1.14.15.2 illustrates the presentation of a first example that has values [5,5]. Those values represent activation that flows forward along each connection and are attenuated by the weight associated with each connection. The weights are initially set randomly. Each output node receives slightly different activation because the weights are initially different. One of the output nodes received the greatest activation and is called the *winner*. The weights between the input and the winner are increased so as to ensure the same node is the winner if the same input is presented again. Weights to nodes near the winner are also increased with the use of a *neighbourhood function* illustrated in Fig. 6.1.14.15.3. Figure 6.1.14.15.4 illustrates the presentation of the second example.

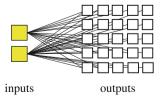


Fig. 6.1.14.15.1 Basic self organising map architecture

#### 6.1 Methods

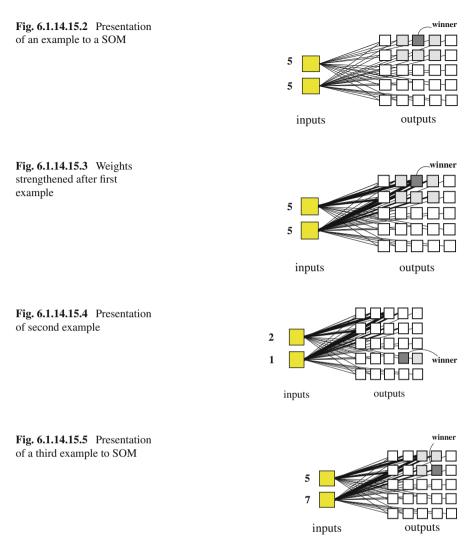


Figure 6.1.14.15.4 illustrates that a different node emerges upon presentation of quite different inputs. The weights between that winner and the inputs are strengthened. Figure 6.1.14.15.5 illustrates the presentation of an input that is more similar to the first instance than the second instance.

The winning node in Fig. 6.1.14.15.5 is closer to the winning node after presentation of the first example than the second example because the example [5,7] is more similar to [5,5] than it is to [2,1].

After repeated exposure to a sufficiently large number of cases, different areas on the output grid will reflect different clusters of examples. Manual examination is required in order to label regions on the grid to reflect the meaning of each cluster. The distance between regions on the grid represents the similarity between clusters. For example, the top left region of the output grid in the study by Merkl and Schweighofer (1997) corresponded to cases that involved chemical weapons and was labelled "arms control". The bottom centre region was labelled "Human rights" and corresponded to documents on treaties and torture.

Merkl and Schweighofer (1997) applied a hierarchical variation to the standard SOM. Miikkulainen (1993) introduced a *hierarchical self organising map* where the output grid is used as an input grid to another SOM and that output is used as input to yet another SOM. This has benefits in that the higher-level grids represent more abstract clusters. More pragmatically, training time is substantially reduced. For example, the top level grid in the study by Merkl and Schweighofer (1997) discovered four key clusters in public international law: humanitarian law, human rights, environment law and other matters.

## 6.1.15 Using Fuzzy Logic

## Andrew Stranieri and John Zeleznikow

Natural language has many terms that are used frequently but are not precisely defined. For example, the term "young man" is not precisely defined yet is useful in many contexts. Fuzzy logic models the way in which imprecise terms in rules can combine with other imprecise terms and imply conclusions which are also often not precisely defined. To appreciate fuzzy logic and its potential application in law, we must first understand its precursor, fuzzy set theory. Zadeh (1965)<sup>205</sup> introduced the idea of a fuzzy set as a more general form of classical sets. In classical set theory an element either is, or is not, a member of a set. The boundary that demarcates the set from other sets is crisp.

In fuzzy set theory, an element belongs to a set to a degree that ranges from 0, which is equivalent to not in the set, to 1, which means the element is clearly in the set. Values between 0 and 1 indicate varying degrees of membership. Table 6.1.15.1 illustrates elements that represent age in years of men. Alongside each element is a rating for the degree of membership of each element to the set "young man".

A person who is 15 years old is clearly a member of the young person set whereas the 25-year-old person is less clearly a member of the same set. Being 25 years old

Table 6.1.15.1 Degree of membership of "young person set"

Age in years	0	5	10	15	20	25	30	35	40	45	50	55	60
Degree of membership	1	1	1	1	0.9	0.7	0.6	0.4	0.3	0.2	0	0	0

<sup>205</sup> Also see, e.g., Yager and Zadeh (1994), Ross (1995).

would be very young for being a champion marathon runner, but quite old for being a champion swim sprinter.

We are not implying that there is uncertainty regarding the person's age. We may be quite certain the person is 25 yet express the view that the person is not unequivocally young.

Interpreting the degree of membership figure as an uncertainty about membership of the set is also misleading. We can be quite certain that a man aged 25 belongs to the set with a degree that can be quantified as 0.7.

Chen (2001) states that there are at least five important explanations on the role of fuzzy logic in data mining:

- 1. *Knowledge Granulation* Fuzzy sets are conceptual extensions of set theory and are primarily geared towards various aspects of knowledge representation and predetermining most of the activities of data mining, especially knowledge granulation. Fuzzy sets are linguistic information granules capturing concepts with continuous boundaries. They are one of a number of contributing technologies towards data mining.
- 2. Better Tolerance Fuzzy sets exploit uncertainty in an attempt to make system complexity manageable. Fuzzy logic can deal with incomplete, noisy and imprecise data and is helpful in developing better uncertain models of the data than is possible with traditional methods. Since fuzzy systems can tolerate uncertainty and utilise language-like vagueness to smooth data, they may offer robust, noise-tolerant models or predictions in situations where precise data is unavailable or too expensive.
- Data Classification Fuzzy logic works at a high level of abstraction and is thus useful for data mining systems performing classification (Han & Kamber, 2001).
- 4. "Indirect" Contribution to Data Mining through its relationship with Artificial Neural Networks Fuzzy set theory by itself is neither a machine learning nor a data mining technique. However, fuzzy set theory does have a close relationship with the weights used in artificial neural networks.
- Increased chance of Knowledge Discovery Due to Vagueness Fuzzy set theory can be combined with other data mining and uncertain reasoning approaches. By allowing vagueness, the chance of uncovering hidden knowledge is enhanced.

As Phillips and Sartor (1999) note, a judge must decide on legally relevant situations, which can only be described in indeterminate terms. The decisions must be determinate and can often only be expressed as a numerical quantity. But what is indeterminancy? Indeterminancy is not uncertainty. To quote the Roman maxim — *Mater semper certa est, pater semper incertus* — one can never be certain that a man was the real father of a child, even if he was the mother's husband. But the concept of a father is certainly determinate. Phillips and Sartor (1999) argue that fuzzy logic is an ideal tool for modelling indeterminancy. Legrand (1999) has developed guidelines for the use of Fuzzy Logic to model legal reasoning.

Phillips (1993) has used fuzzy reasoning in modelling traffic accident law. Borgulya (1999) also uses fuzzy logic methods to model decisions made by judges regarding traffic accidents. He provides information for courts and lawyers about the seriousness of an actual case compared to previously tried cases. Xu, Kaoru, and Yoshino (1999) constructed a case-based reasoner to provide advice about contracts under the United Nations Convention on Contracts for the International Sale of Goods (CISG). Shapira (1999) investigates the attitude of Jewish law sources from the second to fifth centuries to the imprecision of measurement. He argues that the Talmudic sources were guided by primitive insights compatible with fuzzy logic presentation of the inevitable uncertainty involved in measurement.

## 6.1.16 Using Genetic Algorithms in Data Mining

## Andrew Stranieri, John Zeleznikow, and Ephraim Nissan

## 6.1.16.1 Evolutionary Computing and Genetic Algorithms

Evolutionary computing refers to the task of a collection of algorithms based on the evolution of a population toward a solution of a certain problem. These algorithms can be used in applications requiring the optimisation of a certain multidimensional function. The population of possible solutions evolves from one generation to the next, ultimately arriving at a satisfactory solution to the problem.

The various algorithms differ in the way in which a new population is generated from the present one, and in how the members are represented within the algorithm. The two most significant evolutionary computing techniques are:

- (1) Genetic Algorithms Genetic algorithms are general-purpose search algorithms that use principles derived from genetics to solve problems. A population of evolving knowledge structures that evolve over time through competition and controlled variation is maintained. Each structure in the population represents a candidate solution to the concrete problem and has an associated fitness to determine which structures are used to form new ones in the competition. The new structures are created using genetic operators such as crossover and mutation. Genetic algorithms are very useful in search and optimisation problems, because of their ability to exploit the information accumulated about an initially unknown search space in order to bias subsequent searches into useful subspaces, namely their robustness.
- (2) Evolutionary Algorithms Evolutionary algorithms are computer-based problem solving systems that use computational models of evolutionary processes as key elements in their design and implementation. Examples include evolutionary programming, evolution strategies, classifier systems and genetic programming. Evolutionary algorithms share a common conceptual base of simulating the individual structures via processes of selection, mutation and reproduction.

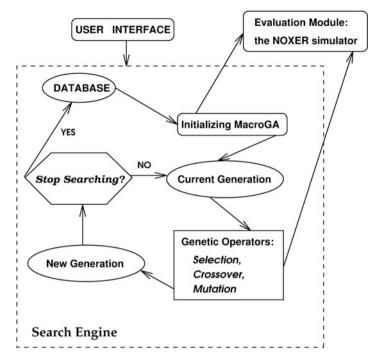


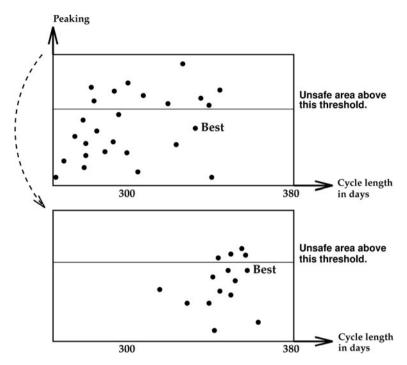
Fig. 6.1.16.1.1 The genetic algorithm in the control flow of FUELCON (Nissan et al., 2001)

For example, Fig. 6.1.16.1.1, which is from Nissan, Galperin, Soper, Knight, and Zhao (2001), shows the control flow of FUELCON, an expert system for designing how to refuel the core of a nuclear reactor. It is based on a genetic algorithm called *MacroGA*. Each individual solution is a configuration of fuel units (themselves assemblies of rods) in the grid which is the cross-section of the core of the reactor (in one-eighth symmetry). Solutions were evaluated by means of NOXER, a software tool in reactor physics. Figure 6.1.16.1.2, which is also from Nissan et al. (2001), shows how FUELCON's population of solutions (the "cloud" of solutions) eventually moves into a better region, and contains the optimal solution. The method was *macroevolution*, because the population of competitors is a population of clouds of solutions, thus a set of sets, a population of populations.

The following is quoted from Zhao, Knight, Nissan, Petridis, and Soper (1998), and explains the genetic algorithm in FUELCON (this was the doctoral project of Jun Zhao, supervised by Nissan and others):

In macroevolution, a number of species co-evolve. In the scheme of macroevolution we have adopted,

- A number of species are used, with no dominant species.
- Migration is controlled by a migration rate (or probability) determining when migration occurs, the number of migrants per migration (normally two), and a migration topology, such as the so-called ring or line topology.



**Fig. 6.1.16.1.2** FUELCON's cloud of solutions moves to a better region, and the optimal solution is found (Nissan et al., 2001). Each individual solution (which is a configuration of fuel in the core of the reactor) is shown as a *dot* 

- Migrants are the best individuals in the source species, and they will compete with all the individuals within the destination species for survival; the same number of least fit individuals will then be removed.
- Each species has a different crossover and mutation rate, which are generated from a mutation rate range and a crossover rate range.
- The ranking selection method is applied to all species.
- It is only as a particular case, that all species may happen to use the same crossover and mutation operators.

More generally, such uniformity is not necessary (ibid.). The same paper also explained:

In the macro genetic algorithm, the first step is to initialize its parameters, and a set of species. At this stage, the probability of migration is set, each species is initialized in terms of selection operator, crossover operator, mutation operator, population size, and crossover and mutation rates. After initialization, all species evolve in parallel, and migrations take place at each generation. At each generation, the best individual is recorded and checked. If the current best individual is acceptable in terms of fitness, then a termination message, "Stop", is distributed to all species, and the macroevolution process comes to an end.

## 6.1 Methods

Here is an outline of how FUELCON works (ibid.):

- 1. Initialize the MacroGa with setup parameters, such as the number of species (sub-populations), the number of generations, population size for each species, etc.
- 2. Create the current generation, and evaluate the fitness for each individual in the population.
- 3. Apply the genetic operators to create a next generation.
- 4. Check whether an acceptable loading pattern has been found. If so, go to step 6.
- 5. Replace the current generation with the next generation, then save the search information (i.e., the best reload pattern), and go to step 3.
- 6. Save the final search results to the database, and stop.

The advantages of this macroevolution (in which we have a population of populations) were explained (ibid.) as stemming from:

- (1) A set of weakly interacting species, allowing each species to concentrate on a separate area of the search space. The species can search their own regions aggressively (under high selection pressure) and hence quickly, without the risk of a premature loss of diversity.
- (2) The use of different crossover and mutation rates in the various species, avoiding the problem of having to determine effective values for these parameters. The inclusion of rather high mutation rates in some of the species adds a strong hill-climbing element to the search, without generating a random one. Hill-climbing has been shown to be an effective ingredient in genetic algorithms; macro evolution allows its introduction in a natural way while gaining the advantage of point 1.

New parameters to be determined for effective performance appear however as the migration rate between species, and the number of individuals exchanged at each migration. Values for these parameters giving good performance were easy to determine however, confirming that macrogenetic algorithms are robust, requiring little parameter tuning for a new application.

The FUELCON project however involved no data mining. Cios, Pedrycz, and Swiniarski (1998) claimed that evolutionary computing is useful to data mining because it can be used to solve optimisation problems. The optimisation processes are based on a population of potential solutions rather than relying on a population of potential solutions rather than relying on a single search point being moved according to some gradient based or probabilistic search rules.

## 6.1.16.2 Genetic and Other Methods as Applied to Transforming Pre-processed Data Upstream of the Data Mining Phase

Data that has been selected and pre-processed may not necessarily be ready for exposure to a data-mining algorithm. Some transformation of the data may dramatically enhance the benefit of the subsequent data mining phase. Transformation can be performed in five ways:

- (a) Aggregation of data values. This involves transforming values into categories or groups. Values on an age variable captured in years and months, for example, may be transformed into five pre-defined age groups. Aggregating values is also known as *binning* because it involves transforming values of a feature into a small number of categories.
- (b) Normalisation of data values. A variable with large values measured, for instance in the thousands could dominate a variable with very small values measured in the thousandths in the data mining phase. Normalising involves transforming both sets of values so that they fall within the same range. Scaling values so that they fall within a specified range is particularly important if two or more features have vastly different ranges.
- (c) *Feature reduction*. This involves the removal of features that are not relevant or make no sizeable contribution to the data mining exercise.
- (d) *Example reduction*. Example reduction involves eliminating records from the data set. Data-sets in law are typically too small to contemplate example reduction.
- (e) *Restructuring*. Restructuring involves decomposing the data-set into smaller parts for independent data mining exercises.

Restructuring a data set into smaller parts for independent mining exercises is particularly important for mining from data sets in law. This is due to the lack of availability of large data sets that reflect judicial reasoning. For example, 94 variables were identified by specialist family lawyers as relevant for determining property outcomes in Australian family law. A data mining exercise with so many variables requires data from many thousands of cases for meaningful results. However the mining exercises. Most of these smaller exercises involved less than five variables, so that mining was possible, though not ideal, with data from around one hundred cases.

*Feature reduction* involves the removal of features that are irrelevant or will not contribute to the data mining exercise. Irrelevant features may clutter the data mining phase making the discovery of meaningful patterns difficult or at worst, impossible. There are three main ways that feature reduction is performed:

(a) Expert heuristics. Legal specialists well acquainted with the jurisdiction the data-set derives from often have a clear view of the extent to which a feature may be irrelevant and warrant removal. The articulation of a reason for each feature's relevance presents as a simple and effective, yet not foolproof mechanism for the identification of irrelevant features. In law, the relevance of a feature typically derives directly from a statute, precedent case, regulation or commonly accepted practice. However, this is not always the case. Most family law specialists claim the wife's hair color is irrelevant and should not play a role in

mining aimed at predictive property split orders. In contrast, some specialists claim hair color is entirely relevant in property proceedings as judges may, correctly or not, regard that blond women have better prospects for re-marriage and therefore ought to be awarded fewer marital assets.

- (b) Statistical techniques. Statistical techniques can be applied to the data-set to identify features that do not contribute to the prediction. *Principal components analysis (PCA)* is the technique most often used to determine such features. PCA involves the analysis of variance between features and the class variable in a prediction exercise. PCA requires specialist statistical software, since the calculations are cumbersome. PCA is applicable only to features that are numeric.<sup>206</sup>
- (c) Data mining. The third approach used in feature reduction involves the application of a data mining technique in order to discover features that do not contribute to the mining. The *rule induction* algorithm is often applied in this way because features that are irrelevant do not appear in rules derived with this algorithm. Alternatively, *genetic algorithms* can be applied: see below.

Within category (c), we mention the application of genetic algorithms in a project related to our *Split Up* system for assisting in negotiations for marital splits. Skabar, Stranieri, and Zeleznikow (1997) applied the following method with excellent results. The search method they resorted to was *genetic algorithms*. These they used in order to look for the best subset of features of the Split Up data-set for neural network training. They found a subset of 17 features predicted percentage split in property proceedings as well as the original 94 featured data-set.

The use of expert heuristics is the best of the three approaches when using a data-set that derives from legal databases. The statistical and data-mining approach may yield counter-intuitive results that while correct, are not readily explained or accepted. For example, many of the features found to be unnecessary by Skabar (1997) in predicting percentage split outcomes such as the contributions made by the husband are central in statutes and common-sense reasoning in family law. Specialist lawyers, judges and other commentators explain virtually every judgement with reference to this feature. The fact that a data-mining method does not need this feature in order to make good predictions cannot be taken to mean that the feature is not taken seriously by judges in reaching decisions. It is more likely that this is an artefact that arises because the interdependence between this feature and other features results in accurate predictions when using a combination of other features.

<sup>&</sup>lt;sup>206</sup> Suppose that we have *N* tuples from *k*-dimensional space to compress. Han and Kamber (2001) say PCA searches for *c k*-dimensional orthogonal vectors that can be best used to represent the data, where  $c \le k$ . The original data is projected onto a much smaller space, resulting in data compression. PCA can be used as a form of dimensionality reduction. Unlike attribute subset selection, which reduces the attribute set size by retaining a subset of the initial set of attributes, PCA "combines" the essence of attributes by creating an alternative smaller set of variables. The initial data can then be projected onto this smaller set.

# 6.1.16.3 Nearest Neighbours Approaches and Their Integration with Genetic Algorithms

Below, we discuss evolutionary computing in order to illustrate an innovative use of genetic algorithms in law by Pannu (1995). However, before doing this we briefly overview the *k*-nearest neighbour algorithm that is required for an understanding of the approach which Pannu (1995) uses. According to Ripley (1996), the *k*-nearest neighbour (*k*-NN) algorithm is attributed to Fix and Hodges (1951). It is a relatively simple algorithm for classifying examples in a sample that uses two basic steps to classify each example:

- 1. Find the k nearest, most similar examples in the training set to the example to be classified
- 2. Assign the example the same classification as the majority of *k* nearest retrieved neighbours.

A trivial example involves classifying whether a young man is likely to be classified with an even split of marital property given the data in Table 6.1.16.3.1. Say the example to be classified is a young man represented as [1,0,1,0] and that k = 3. Assuming each feature is equally important, the three most similar examples are examples 1, 2 and 3. The majority of the k neighbours, (i.e examples 1 and 2) are classified. Even so the young man example will also be classified as receiving an even split.

Issues that need to be considered when using the k-NN algorithm include:

• *Choice of Similarity metric.* Typically a Euclidean distance metric is deployed such as

$$\Sigma (\mathbf{x}_{e} - \mathbf{x}_{t})^{2}$$

where

$$x_e - x_t$$

is the difference between the example value and the a training set value for each feature. This can be modified by weighting each feature differently

Table 6.1.16.3.1Sampledata for k-th nearest	Ex.	Age young	Age elderly	Sex male	Sex female	Split
neighbour example	1	1	0	1	0	Even
	2	1	0	1	0	Even
	3	0	1	1	0	Uneven
	4	0	1	0	1	Uneven

$$\Sigma w(x_e - x_t^2)$$

This metric, which combines the difference between points linearly, is adopted.

• *Optimal choice of k.* The decision about the size of k must be made in advance. A large value of k introduces computational complexity, whereas a small value k is less accurate. Refinements of the algorithms involve dropping examples that are not needed to correctly classify the example.

Michie, Spiegelhalter, and Taylor (1994) illustrate that the k-NN compares favourably with respect to error rates in classification tasks against neural networks, Bayesian belief networks and linear or logistic regression. The k-NN approach is embedded in the genetic algorithm of Pannu (1995) discussed next.

Pannu (1995) applied genetic algorithms to discover a prototype, 'perfect' exemplar for cases with a specified outcome. Good exemplars for cases are useful because future cases can be mapped to exemplars with different outcomes to predict likely outcomes and to identify weaknesses in a case. Two elements are required in order to generate a good exemplar; a distance metric to measure the degree of similarity between one case and another, and a search procedure that can explore an very large number of possible exemplars to find the best one.

The approach Pannu (1995) used integrated k-th nearest neighbour distance metric with a genetic algorithm described by Kelly and Davis (1991). The distance metric computes a distance between two vectors. The distance algorithm was based on the k-th nearest neighbour algorithm.

For Pannu (1995), the vector elements were a 1 or a 0 and represented whether or not a factor was present in a case. A fitness function that sought to find a exemplar case did so by minimising the distance between itself and all other cases with the same outcome and by maximising the distance between itself and exemplars for cases that had different outcomes.

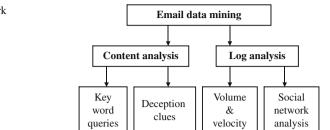
Evolutionary computing techniques have not been extensively applied in the legal domain though the work by Pannu (1995) indicates some possibilities. Quite recent data mining techniques broadly categorised as kernel machines are described in the next section, though these algorithms have not yet been applied to law.

## 6.2 Case Studies of Link Analysis and Data Mining

## 6.2.1 Digital Resources and Uncovering Perpetration: Email Mining, Computer Forensics, and Intrusion Detection

## 6.2.1.1 Email Mining

One form of *text mining* is *email mining*. In a section entitled "Email Text Mining", Gray and Debreceny (2006) remarked: "The text of the email is essentially unstructured. Minkov and Cohen (2006) notes that these characteristics of emails allow us to view a set of semistructured emails as a graph, with nodes representing



**Fig. 6.2.1.1.1** A framework for email data mining, redrawn from Gray and Debreceny (2006)

actors, temporality, subject matter and meetings. We can exploit these characteristics by employing a variety of techniques as illustrated in Figure [6.2.1.1.1]". Those techniques can be blended, and, e.g., one can analyse content (emails and their file attachments) while also analysing the log: for example, the social network of senders and recipients, possibly in relation to roles known from the structure of an organisation of which these are employees. "Within corporate email systems, it is relatively simple to match email recipients to corporate roles and responsibilities" (Gray & Debreceny, 2006).

From the *temporal mining of an email log*, volume and velocity are metrics that can be analysed. "Volume measures the number of emails a person sends and/or receives over a period of time. Velocity measures how quickly the volume changes. Gradual change would be low velocity and sudden jumps in volume would be high velocity" (Gray & Debreceny, 2006). This is potentially useful when trying to detect suspicious activities. "In terms of continuous monitoring of volume and velocity, the key issue is determining the optimum time intervals to sample the data" (ibid.). "Changes in velocity over time for no apparent reason may also indicate suspicious activities. The first task is to create a *baseline normal* profile and then changes in volume and velocity compared to the profile for no apparent reason may indicate suspicious activities" (ibid.).

*Rolling histogram* is a concept that has arisen in the literature concerning this. "Recognizing that the baseline profile can evolve over time, Stolfo, Creamer, and Hershkop (2006) use the term 'rolling histogram' to reflect the dynamic aspects of an employee's profile changing over time. The concept of the rolling histogram is like other moving averages where the profile is updated based on a moving window of a time interval (e.g., a twelve-week moving average)" (Gray & Debreceny, 2006). Stolfo et al. (2006) used software called Email Mining Toolkit (EMT). It is freely available.<sup>207</sup> It was developed at Columbia University, includes approximately 132,000 lines of Java code, and interfaces with relational databases.

*Link and network monitoring* is another kind of analysis of the log, in relation to the social network of the senders and the recipients within an organisation.<sup>208</sup> Gray and Debreceny (2006) remarked:

<sup>&</sup>lt;sup>207</sup> http://www1.cs.columbia.edu/ids/emt/

<sup>&</sup>lt;sup>208</sup> Email surveillance is the subject of, e.g., Browne and Berry (2005).

Once the networks and cliques are identified, continuous monitoring techniques could be used flag emails that fall outside the established patterns. For example, an email from a high-level executive to a warehouse worker, where no similar emails existed before, could be suspicious. Emails from employees to customer domains where the employee does not hold a position that normally communicates with customers would be suspicious. Unlike the monitoring of volume and velocity, link and network monitoring could be performed on a near real-time basis.

Another direction of research in *email mining* is *deception research*. Deception can be of the sender trying to deceive the addressee, of then of both of them in collusion trying to deceive their employer. Moreover, distinguish *sender deception* (lying about the sender's identity) from *content deception*.

## 6.2.1.2 The Enron Email Database as an Opportunity for Research

The Enron scandal spawned text mining research into the email database of Enron. In the words of Gray and Debreceny (2006):

A large corpus of emails from Enron was put into the public domain by the Federal Energy Regulatory Commission following its investigation of the corporation in relation to alleged manipulation of "electricity and natural gas markets in California and other Western states in 2000 and 2001." The original corpus contained 0.6m emails from 158 users (Klimt and Yang [2004a, 2004b]). These users included key participants in the events that brought down the corporation in 2001 [...] Elimination of [email] duplicates reduced the corpus to 0.2m messages; an average of 757 messages per user. They also worked to remove quotations of previous emails in subsequent emails in that thread. [...] The Enron email corpus has subsequently been transformed into a relational database format and published in MySQL format (Shetty and Adibi, 2004). [...] Exploring the emails may be undertaken by targeted analysis based upon known patterns, or by automated techniques. [...] Emails also provide a flavor of the relationship between the external auditors and Enron. A total of 466 emails in the corpus were sent from Enron email addresses to Andersen email addresses. A surprising proportion of these emails were comprised of jokes often in poor taste, event announcements and personal mail. There were 33 emails from Andersen email addresses to Enron email addresses. Again, many of these emails were related to matters other than the audit.

Research into the Enron email database has adopted various techniques, with different purposes. Gray and Debreceny (2006), whose viewpoint is that of auditors, mentioned that even such a rudimentary technique as looking for key words yielded results: "Emails could be searched for key words such as finder's fee, bribe, kickback, and similar words that could indicate questionable actions or overrides of controls. This would be cherry-picking the naive fraudsters. It is hard to believe that a fraudster would use such words in the company email, but they do as found by researchers who have explored the Enron email corpus" (ibid.). "Probably the most discussed continuous email monitoring is the *Carnivore* system developed by the FBI to scan emails in the United States. The CIA and NSA are assumed to have similar systems to monitor email traffic outside of the U.S. The difference being that the FBI needs a court order before it can monitor a specific person's email traffic in the U.S. By the way, companies do not need a court order to monitor employee emails." (ibid.). One strand of research was intended to discover structures within the organisation. This is part of the discipline analysing social networks, in order to identify communities and model their evolution. The Enron email dataset was made available to the public,<sup>209</sup> and this has enabled research to flourish.<sup>210</sup> Gray and Debreceny (2006) pointed out:

Research on automated understanding of the emails within the Enron corpus is still at a relatively early stage. A considerable amount of research has gone into understanding social network relationships within email data sets. Whilst this is an important first step in identifying key relationships that can be used for assurance purposes, social network analysis does not on its own allow identification of emails that may be critical to an assurance issue. As discussed above, there are also a variety of techniques to analyze the text within a corpus including natural language processing and machine learning. The next step is to match content analysis and social networks.

For those who "want to recognize a group of authors communicating in a specific role<sup>211</sup> within an Internet community, the challenge is recognize possibly different roles of an author within different communication communities. Moreover, each individual exchange in electronic communications is typically short, making the standard text mining approaches less efficient than in other applications" (Chaoji et al., 2010).<sup>212</sup> The textual corpus of Enron emails corpus is a suitable domain of application: "An example of such a problem is recognizing roles in a collection of emails from an organization in which middle level managers communicate both with superiors and subordinates. To validate our approach we use the Enron dataset which is such a collection" (Chaoji et al., 2010).

Wilson and Banzhaf (2009) applied a genetic algorithm to the discovery of social networks within the Enron email database. "Heer [jheer.org] has built a variety of tools that allow visual representations of several types of social networks including Friendster relationships (Vizter) and relationships expressed in Enron emails (Enronic). These tools are based on natural language processing techniques", and one of the tools, Enron Corpus Viewer, plots a graph being "a visual representation of the social networks embedded in the Enron corpus" (Gray & Debreceny, 2006).

Chapanond, Krishnamoorthy, and Yener (2005) developed such an analysis of the Enron email data. They constructed an email graph, and studies its properties by using *graph theoretical* and *spectral analysis* techniques. "The graph theoretical analysis includes the computation of several graph metrics such as degree distribution, average distance ratio, clustering coefficient and compactness over the email graph. The spectral analysis shows that the email adjacency matrix has a rank-2

<sup>&</sup>lt;sup>209</sup> Enron Email Dataset, http://www-2.cs.cmu.edu/enron/ and later on at http://www.cs.cmu.edu/~ enron/ (maintained by W. W. Cohen). Moreover, the following is also available: Enron Employee Status Record, at http://isi.edu/~adibi/Enron/Enron Employee Status.xls

 $<sup>^{210}</sup>$  E.g., Klimt and Yang (2004a, 2004b). Keila and Skillicorn (2005), Diesner and Carley (2005), McCallum et al. (2005), and Priebe et al. (2005).

<sup>&</sup>lt;sup>211</sup> Role identification in a corpus of emails is a special case of automated text categorization.

<sup>&</sup>lt;sup>212</sup> Chaoji et al. (2008a, 2008b, 2010) and Goldberg et al. (2008) stem from the same team, led by Boleslaw K. Szymanski at the Rensselaer Polytechnic Institute, in Troy, New York state.

approximation. It is shown that preprocessing of data has significant impact on the results, thus a standard form is needed for establishing a benchmark data".

Goldberg et al. (2008) are concerned with "Social networks that arise spontaneously and evolve over time": "Their loose membership and dynamics make them difficult to observe and monitor". Goldberg et al. (2008) presented "a set of tools for discovery, analysis and monitoring evolution of hidden social groups on the internet and in cyberspace. Two complementary kinds of tools form a core of our approach. One [SIGHTS] is based on statistical analysis of communication network without considering communication content. The other [Recursive Data Mining] focuses on communication content and analyzes recursive patterns arising in it" (ibid.).

## 6.2.1.3 Discovering Social Coalitions with the SIGHTS Text Mining System

One of the tools presented by Goldberg et al. (2008) is SIGHTS (Statistical Identification of Groups Hidden in Time and Space). SIGHTS was "designed for the discovery, analysis, and knowledge visualization of social coalition in communication networks by analyzing communication patterns". The algorithms of SIGTHS "extract groups and track their evolution in Enron-email dataset and in Blog data. The goal of SIGHTS is to assist an analyst in identifying relevant information" (Goldberg et al., 2008).

SIGHTS has three main modules: Data Collection/Storage, Data Learning and Analysis, and Knowledge Extraction/Visualisation. The data sources are email data, or blogs, and it was envisaged to also include a link to chatrooms at a later stage. From the data sources, data are collected, and a semantic graph and metadata are stored in a database. "The Data Collection Modules operate on semantic graphs. The graphs are constructed by adding a node for each social network actor and a directed edge from sender's node to a recipient's node. The edges are marked with the time of the communication and, possibly, other labels. Some edge labels are only appropriate for specified types of graphs" (from section 2 of Goldberg et al., 2008).<sup>213</sup> Blog Collector is a module accessing blogs, one of the data sources.<sup>214</sup>

<sup>&</sup>lt;sup>213</sup> "The user may have communication data existing in a variety of formats. SIGHTS handles the stand-alone input of a reasonable range of these formats in order to facilitate the introduction of new data into the program. Among these is a plain-text XML format which is well-documented. SIGHTS is also able to read from a database that is constructed according to specified guide-lines. Blogs data is collected from LiveJournal.com blogs service provider. The semantic graph is constructed by creating a node for each blogger and the edge between any pair of bloggers who participated in the discussion in the comments of a post." (from section 2 of Goldberg et al., 2008).

<sup>&</sup>lt;sup>214</sup> "Blogs collector monitors LiveJournal.com update feed and records the permanent address of the post. Two weeks after the date of the initial post, the blogs collector visits the page of the post and collects the thread of comments using the screen-scraping techniques. Blogs collector allows the establishment of 'interest filters' that can narrow the data collection to posts on a certain topic. Blogs collector provides the interface for the analyst to tag posts as interesting and not interesting that will create the training set for the interest learning program. This information is also stored in the database and is accessible to other modules of the application" (from section 2 of Goldberg et al., 2008).

The algorithm modules of SIGHTS interact with the database, retieving from it the semantic graph and metadata, and storing in it derived data. The algorithm modules include:

- Real Time Clustering,
- Leader Identification,
- Topic Identification,
- Cycle Group Analysis,
- Stream Group Analysis.

Interactive visualisation, through which users access the output of the algorithm, accounts for:

- Size vs Density plot,
- Graph of Clusters plot,
- Group Persistence view,
- Leaders and Group Evolution view,
- interactive Graph of Overlapping Clusters.

Goldberg et al. (2008, section 2) explained:

Temporal group algorithms identify hidden groups in the stream of communications for the user specified time scales [(Baumes et al., 2006; Camptepe et al., 2005).] Noteworthy among them are the cycle model algorithms that identify all groups of users who persistently communicate over a time interval and the stream model algorithm that finds groups based on frequently communicating triples followed by merging correlated triples. Such groups usually communicate over multiple time intervals during the period of interest in a streaming fashion. Our algorithms also give the group structure hierarchy and can be modified to track evolution. An example of the evolution of a group found in the ENRON email data set is shown in

a figure comprising three graphs, which show the evolution of a part of the Enron organisational structure in the periods 2000–2002 (respectively, the graphs showed relations at Enron during September 2000–September 2001, March 2000–March 2001, and September 2001–September 2002). All three graphs represented frequent structures; and the nodes in the graph represent actors of the Enron community. Some of those nodes (*B*, *C*, *D*, *F*) were present in all three time-intervals.

In SIGHTS, there is an Opposition Identification Module. Its task is to identify "the positive and negative sentiments between pairs of bloggers based on the length and average size of the messages in the conversations that took place among them" (from section 2 of Goldberg et al., 2008). From LiveJournal.com, SIGHTS splits threads of comments into conversations between pairs of bloggers. "The module employs the Support Vector Machine classifier<sup>215</sup> that was trained using a data set that was manually created to determine the oppositions between bloggers using the

<sup>&</sup>lt;sup>215</sup> Support vector machines are the subject of Section 6.1.9.3 in this book.

length of the conversation and the average length of the message in the conversation to determine whether bloggers opposed each other in a given conversation" (ibid.).

Bennett and Campbell (2000) provided a good introduction to *support vector machines* (*SVMs*). Ingo Steinwart and Andreas Christmann published a book (2008) on support vector machines. So did Campbell and Ying (2011), whose abstract states, among the other things:

Support Vectors Machines have become a well established tool within machine learning. They work well in practice and have now been used across a wide range of applications from recognizing hand-written digits, to face identification, text categorisation, bioinformatics, and database marketing. In this book we give an introductory overview of this subject. We start with a simple Support Vector Machine for performing binary classification before considering multi-class classification and learning in the presence of noise.

An early definition of the concept was as follows: "The *support-vector network* is a new learning machine for two-group classification problems. The machine conceptually implements the following idea: input vectors are non-linearly mapped to a very high-dimension feature space. In this feature space a linear decision surface is constructed. Special properties of the decision surface ensures [*sic*] high generalization ability of the learning machine. [...] High generalization ability of support-vector networks utilizing polynomial input transformations is demonstrated" (Cortes & Vapnik, 1995, p. 173).

The Wikipedia entry<sup>216</sup> is usefully detailed. Here is its introduction:

Support vector machines (SVMs) are a set of related supervised learning methods that analyze data and recognize patterns, used for classification and regression analysis. The original SVM algorithm was invented by Vladimir Vapnik and the current standard incarnation (soft margin) was proposed by Corinna Cortes and Vladimir Vapnik. The standard SVM takes a set of input data and predicts, for each given input, which of two possible classes the input is a member of, which makes the SVM a non-probabilistic binary linear classifier. Since an SVM is a classifier, then given a set of training examples, each marked as belonging to one of two categories, an SVM training algorithm builds a model that assigns new examples into one category or the other. Intuitively, an SVM model is a representation of the examples as points in space, mapped so that the examples of the separate categories are divided by a clear gap that is as wide as possible. New examples are then mapped into that same space and predicted to belong to a category based on which side of the gap they fall on.

More formally, a support vector machine constructs a hyperplane or set of hyperplanes in a high or infinite dimensional space, which can be used for classification, regression, or other tasks. Intuitively, a good separation is achieved by the hyperplane that has the largest distance to the nearest training data points of any class (so-called functional margin), since in general the larger the margin the lower the generalization error of the classifier.

Whereas the original problem may be stated in a finite dimensional space, it often happens that in that space the sets to be discriminated are not linearly separable. For this reason it was proposed that the original finite dimensional space be mapped into a much higher dimensional space, presumably making the separation easier in that space. SVM schemes use a mapping into a larger space so that cross products may be computed easily in terms of the variables in the original space, making the computational load reasonable. The cross products in the larger space are defined in terms of a kernel function K(x,y) selected to suit the problem. The hyperplanes in the large space are defined as the set of points whose inner

<sup>&</sup>lt;sup>216</sup> http://en.wikipedia.org/wiki/Support\_vector\_machine (accessed in April 2011).

product with a vector in that space is constant. The vectors defining the hyperplanes can be chosen to be linear combinations with parameters  $\alpha_i$  of images of feature vectors that occur in the data base.

## 6.2.1.4 Recursive Data Mining

Recursive Data Mining, is "a text mining approach that discovers patterns at varying degrees of abstraction in a hierarchical fashion. The approach allows for certain degree of approximation in matching patterns, which is necessary to capture nontrivial features in realistic datasets. Due to its nature, we call this approach Recursive Data Mining (RDM)" (Chaoji et al., 2010). Goldberg et al. (2008) also described a complementary set of tools, using *Recursive Data Mining (RDM)*. Those tools's task is "to identify frequent patterns in communication content such as email, blog or chat-room sessions". The approach of Goldberg et al. (2008) "enables discovery of patterns at varying degrees of abstraction, in a hierarchical fashion, and in language independent way". They "use RDM to distinguish among different roles played by communicators in social networks (e.g., distinguishing between leaders and members). Experiments on the Enron dataset, which categorize members into organizational roles demonstrate that use of the RDM dominant patterns improves role detection" (ibid., from the abstract). Szymanski and Zhang (2004) and Coull and Szymanski (2008) resorted to Recursive Data Mining for masquerade detection (within *intrusion detection* affecting computer resources)<sup>217</sup> and *author identifica*tion. These are subjects investigated using various techniques by other authors (e.g., de Vel et al., 2001; Elsayed & Oard, 2006).

Goldberg et al. (2008) "used *Recursive Data Mining* (RDM) for distinguishing the roles of the communicators in a social group. In general, RDM discovers, in a recursive manner, statistically significant patterns in a stream of data. The key properties of the pattern discovery in RDM include: (i) no restriction of the size of gaps between patterns, (ii) recursive mining in which discovered patterns are replaced by the new token and the mining is repeated on the newly created string, (iii) tolerance to imperfect matching" (from section 1 of Goldberg et al., 2008).

In Recursive Data Mining, "In the first iteration, the algorithm captures statistically significant patterns from the initial sequences. The patterns obtained

<sup>&</sup>lt;sup>217</sup> Greg Stocksdale of the National Security Agency Information Systems Security Organization defined *spoofing* as "Pretending to be someone else. The deliberate inducement of a user or a resource to take an incorrect action. Attempt to gain access to an AIS [i.e., Automated Information System] by pretending to be an authorized user. Impersonating, masquerading, and mimicking are forms of spoofing" (Mena, 2003, p. 429). More precisely, Stocksdale defined *mimicking* as "Synonymous with impersonation, masquerading, or spoofing" (in Mena, 2003, p. 424). Moreover, Stocksdale gloassary also includes an entry for *mockingbird*, defined as "A computer program or process that mimics the legitimate behavior of a normal system feature (or other apparently useful function) but performs malicious activities once invoked by the user" (ibid.). *Spoofing* instead of *masquerading* sometimes occurs indeed in the terminology of the research literature. For example, Gosh et al. (2005) discussed *InFilter*, a tool whose teask is "predictive ingress filtering" for the purpose of detecting *spoofed Internet Protocol (IP) traffic*.

are assigned new tokens. The initial sequences are re-written by collapsing each sequence pattern to its newly assigned token, while retaining the rest of the tokens. Next, the algorithm operates on the re-written sequences and continues to iterate through the pattern generation and sequence re-writing steps until either the sequences cannot be re-written further or a predefined number of iterations is reached." (Chaoji et al., 2010, section 4).

Goldberg et al. (2008, section 4) introduced the algorithm shown in Fig. 6.2.1.4.1, using not just one classifier for the entire process, but a different classifier for each level of RDM abstraction. "The process starts with a sliding window of predefined length passing over the input sequence one token at a time. At each stop, patterns with all possible combinations of tokens and gaps are recorded. When pass is completed, the recorded patterns are checked for frequency of their occurrence". In fact, not all patterns are of equal importance. "Some patterns could be either too specific to a certain text or insignificant because they contain very commonly occurring words. In either case, they are ineffective in classifying the mined text while adding to the computational cost of the algorithm. The 'usefulness' of a pattern is computed via a statistical significance test. A pattern is deemed significant if its frequency of occurrence in a random string. Patterns that are deemed insignificant are eliminated from further consideration." (ibid.).

"At each position in the sequence, the tokens in the significant patterns are matched against the tokens in the sequence" (ibid.). A *dominant pattern* at position *j* in the input sequence is that pattern whose matching score is the highest, starting at location *j* in the sequence. The matching score is calculated using this formula:

score 
$$(\mathcal{P}i, S_v j) = \begin{cases} 1 & \text{if } \mathcal{P}i = S_v j \\ \epsilon & \text{if } \mathcal{P}i = GAP, \epsilon < 1 \\ 0 & \mathcal{P}i \neq S_v j \end{cases}$$

**Require:** Set of sequences SEnsure: Sets of patterns (features) L, one for each level 1:  $\mathcal{L} = \{\}$ 2: i = 03: S = S {Level-0} 4: repeat 5:  $\mathcal{P}_{ALL} = pattern\_generation(S)$  $\mathcal{P}_{SIG} = sig_patterns(S, \mathcal{P}_{ALL})$ 6: 7:  $\mathcal{D} = get\_domi\_patterns(S, \mathcal{P}_{SIG})$ 8:  $\mathcal{L}_i = \mathcal{D}$ i++ 9: 10:  $S = make_next_level(S, D)$  {Level-i} 11: until  $\mathcal{M} == \emptyset \lor i == max\_level$ 12: return L

**Fig. 6.2.1.4.1** Recursive Data Mining Algorithm 1 from Goldberg et al. (2008)

" $\mathcal{P}_i$  is the *i*th token of the pattern and *j* is an index over sequence *S*.  $\varepsilon$  is intended to capture the notion that a match with a gap is not as good as an exact match but much better than a mismatch." Goldberg et al. (2008) explain:

During the second pass of the sequence at level v, the sequence for level v+1 is formed. The sequence corresponding to a dominant pattern is replaced by the new token for this dominant pattern. Unmatched tokens are copied from sequence  $S_v$  to the new sequence  $S_{v+1}$ .

"Like most supervised learning tools, RDM has two stages of processing — training and testing. The *training phase* starts with *pattern generation*, and follows by pattern selection through the *pattern significance assessment* step." (Chaoji et al., 2010, section 4). Goldberg et al. (2008, section 4) explain the training phase as follows:

The training phase uses the dominant patterns generated at each level to construct an ensemble of classifiers, one for each level. The classifiers can be created from any machine learning method, such as Naïve Bayes or Support Vector Machine.<sup>218</sup> Given a set of input sequences, along with the class labels, dominant patterns are generated for each label starting at level 0 to level *max\_level*. The union of all dominant patterns at a level *v* across all input sequences forms the set of feature for classifier at level *v*. For the ensemble of classifiers, the final posterior class probability is the weighted sum of the class probabilities of individual classifiers. Each classifier is assigned a weight that reflects the confidence of the classifier in the ensemble trains its model based on the new training set. The confidence value of classifier at level *v*, conf ( $C_v$ ), is defined as the relative accuracy on the tuning set. The testing phase follows the training phase in terms of the level by level operating strategy. [...]

Advantages of recursive data mining include there being no length restriction on the patterns formed: "This allows arbitrary size patterns to be discovered. Most of the other published techniques work on a fixed size window" (Chaoji et al., 2010, section 1); the ability of the method to also discover approximate, (i.e., similar) patterns; and that this method is *hierarchical*, the hierarchy resulting from the *recursive* processing: "This enables us to capture patterns at various levels of abstractions. Moreover, the hierarchical nature allows us to remove noisy symbols from the stream as we move from a lower level to a higher level in the hierarchy. This ultimately leads to discovery of *long range patterns* that are separated by long noisy intermediate segments." (ibid.).

In the Recursive Data Mining method, as explained in Chaoji et al. (2010), the total score for a pattern, starting at index j in S, is given by

$$\operatorname{score}\left(\mathcal{P}, S_{v}[j]\right) = \sum_{i=1}^{|\mathcal{P}|} \operatorname{score}\left(\mathcal{P}[i], S_{v}[j+i]\right)$$

After the training phase, there is the testing phase. This is done level by level. Of the dominant patterns at level 0, the frequency is counted over the level 0 test sequence. This results in a vector of frequencies. It is the feature vector at level 0. Then the

 $<sup>^{218}</sup>$  We have said something about support vector machines at the end of Section 6.1.2.3.

same is done at the next level. Let the level that has just been done be v. Then the next level sequence is generated, by applying the rewriting rules for dominant patterns. "This process continues till all levels of dominant patterns are exhausted. Each classifier in the ensemble classifies the test data and the final probability of class *C* given a sequence *x* is assigned based on the following weighing scheme

$$\mathbf{P}(C \mid x) = \sum_{i=1}^{\max\_levels} \operatorname{Conf} (\mathcal{C}_i) \times \mathbf{P}_{\mathcal{C}_i}(C \mid x)$$

where x is a test sequence and

$$\mathbf{P}_{\mathcal{C}_i}(C \mid x)$$

is the posterior probability assigned by classifier  $C_i$ " (Goldberg et al., 2008, section 4).

#### 6.2.1.5 The Disciplinary Context: A Brief Introduction to Computer Forensics

The foregoing in the present Section 6.2.1 is concerned with *email mining*, which is a technique within *text mining*, as well as within *computer forensics*. It is not necessarily the case that AI methods are used in the analysis of computer forensic evidence. The most obvious connection would be the discovery process and the data mining techniques used for example on the Enron database of emails indeed.

Dealing with *computer crime* requires expertise in computing, of course; e.g., in *computer security*. Nevertheless, when it comes to forensic investigation once a transgression was committed or is suspected, *computer forensics* (also known as *evidential computing*, or *forensic computing*) is not confined to computer crime alone. For example, evidence from a firm's computers may be seized so that forensic accountants examine the data.

Computer forensics<sup>219</sup> is the use of techniques that are specialised for the collection, identification, description, provision with security, retrieval, authentication, analysis, interpretation and explanation of digital information, when a case being investigated involves the use of computing or of a data carrier.<sup>220</sup> Digital evidence<sup>221</sup> is any digital information that could be used as evidence in a legal case. One also speaks of *digital crime*, and *digital forensics*.

 $<sup>^{219}</sup>$  Computer forensics = French investigation informatique. Throughout this book, I haven't tried to provide equivalent terminology across languages, but let us exemplify here how terminology differs, in the case of French: unless you are told or were already aware, you could not just guess the French term correctly, based on the English term.

<sup>&</sup>lt;sup>220</sup> Data carrier = French support d'information.

<sup>&</sup>lt;sup>221</sup> *Digital evidence* = French *preuve numérique*.

We have already referred previously to digital forensics. This was when we discussed, in Section 4.3.4, the costs/benefits analysis of digital forensic investigations into digital crime.

The *hash value*<sup>222</sup> of some given digital information is generated by an algorithm applied to a file or to some logical or physical memory unit. The algorithm is such that it is impossible to modify the digital information without the hash value also being modified. If the hash value was not modified, then it is assumed that the digital information was not modified. To be on the safe side, the hash value is calculated in two different manners, especially when it comes to hard disks.

*Chain of evidence*<sup>223</sup> in computer forensics is the recording of the stages of the inquiry (investigation), in order to guarantee that some given digital evidence is indisputably derived from some given digital information. The record describes how that digital information was preserved, gives its hash value, describes software and hardware used for preventing tampering (by rewriting), describes the operations carried out and the software employed, informs about incidents and especially about any modification of the digital information being analysed, lists the items of evidence collected, and provides the series numbers of the data carriers used for recording such evidence. For such a record to be a judicial document (which includes the inquiry documents of an examining magistrate), e.g., in France, it is necessary that the chain of evidence be requested by some judicial authoritiy, and that it be accompanied by a chain of custody.

The *chain of custody*<sup>224</sup> is a report or notes of the proceedings of the seizure or reception of some give digital information and of its support. It contains information about who had detained it previously (an owner, or user, or custodian), about the place and circumstances of this digital information being obtained, retrieved or transmitted, about the data carrier (including a physical description with a photograph, as well as the series number), and possibly a description consisting of metadata, the data structure, and the hash value. The chain of custody also specifies whether the data are accessible or otherwise, and whether there is a seal (with its identification). Also included are information about accompanying documents, the dates when the data carrier was opened and closed, mentions of any modification that has occurred (such as the suppression of a password), a description of how (if such is the case) the data carrier was returned (in terms of accessibility to data, to whether a label was applied, or to any seal). Also a photograph is included.

A *forensic copy*<sup>225</sup> is a whole copy, bit by bit, of digital information present on a data carrier, including blank spaces, precluded areas, and queues. The software used in order to obtain the forensic copy is specified. The forensic copy must have the some hash value as the original of which it is the copy; otherwise, the chain of evidence must specify the reasons for difformity.

<sup>&</sup>lt;sup>222</sup> Hash value = French empreinte numerique, or valeur de hachage.

<sup>&</sup>lt;sup>223</sup> Chain of evidence = French rapport d'investigation.

<sup>&</sup>lt;sup>224</sup> Chain of custody = French rapport de garde.

<sup>&</sup>lt;sup>225</sup> Forensic copy = French copie-image.

*Forensic computing*<sup>226</sup> is the subject of a book by Sammes and Jenkinson (2000) which deals with data security, but especially shows how information held in computer systems (that possibly was deliberately hidden, or then, subverted, for criminal purposes) can be recovered in such a way that its integrity cannot be challenged, legal issues associated with computer-generated evidence, and practices required to ensure its admissibility. A more recent book is Carrier's (2005) *File System Forensic Analysis*.<sup>227</sup> London-based Overill (2009) discussed the development of Master's modules in computer forensics and cybercrime for computer science forensic science students.<sup>228</sup>

A distinction has been made, in the literature, between *computer* and *digital forensics*. The name *digital anti-forensics* has been given at least as early as Shirani (2002) – and apparently made popular following an article by Harris (2006) of Purdue University<sup>229</sup> (cf. Rogers, 2005, also from Purdue) – to strategies to evade computer forensic investigations, as well as ways to exploit critical failures in computer forensics software or in the reliability of computer security systems. Harris wrote (2006, pp. S44–S45):

Currently there is no unified definition for anti-forensics. This is not surprising however, since it is a relatively unexplored field. Several definitions are available and each has its own relative merits. Some of those definitions look only at specific segments of anti-forensics. Some have seen anti-forensics as simply breaking tools or avoiding detection (Foster and Liu, 2005) while others have only related anti-forensics to system intrusions (Shirani, 2002). [...]"Peron and Legary pinpoint anti-forensics as the attempt to "limit the identification, collection, collation and validation of electronic data" so that the crime investigation is hindered (Peron and Legary, 2005). This definition is not complete however, since it disregards the analysis of the evidence. Evidence analysis is essential to the forensic process; therefore, we must include it if we list each phase in our definition. Another definition by Grugq identifies antiforensics as "attempting to limit the quantity and quality of forensic evidence" (Grugg, 2005). This definition is useful as well, but it only considers the evidence and completely ignores the forensic process. If we combine Grugq's ideas with those of Peron and Legary, we can arrive at a concise vet precise definition of anti-forensics. In this paper, we will consider anti-forensics to be any attempts to compromise the availability or usefulness of evidence to the forensics process. Compromising evidence availability includes any attempts to prevent evidence from existing, hiding existing evidence or otherwise manipulating evidence to ensure that it is no longer within reach of the investigator. Usefulness maybe compromised by obliterating the evidence itself or by destroying its integrity.

<sup>&</sup>lt;sup>226</sup> Kruse and Heiser (2002) is a book on computer forensics. As we couldn't delve, here, in computer forensics any further, we confined ourselves to just providing a few definitions, that were loosely adapted from Lerti (2006). Handling digital evidence in relation to computer crime is the topic of Casey (2000 [new edn., 2004], 2001) and Kanellis et al. (2006). McHugh (2001) provides a historical and methodological overview of intrusion detection in computer security.

<sup>&</sup>lt;sup>227</sup> Cf. Carrier & Spafford's article (2004) "Event recostruction of digital crime scenes".

<sup>&</sup>lt;sup>228</sup> Of course, the literature about *digital forensics* is vast. For example, Goel et al. (2005) discussed *Forensix*, a reconstruction system. Tang and Daniels (2005) discussed a framework for *distributed forensics*.

<sup>&</sup>lt;sup>229</sup> I owe Dr. Jeimy Cano the information that the name *digital anti-forensics* has been in use (at least) since 2006, following an article at a conference by Harris (2006). Actually, the conference was at West Lafayette, Indiana, where Ryan Harris was based, pursuing a MS in information security from Purdue University.

Harris (2006, p. S45) enumerated four kinds of anti-forensic activities, namely, *evidence destruction, evidence source elimination, evidence hiding*, and *evidence counterfeiting*. Harris (ibid., table 1) classified common antiforensic methods as follows. *MACE alterations* involve destroying ("Erasing MACE information or overwriting with useless data"),<sup>230</sup> or counterfeting ("Overwriting with data which provides misleading information to investigators"). *Removing/wiping files* involves destroying ("Overwriting contents with useless data"), or hiding: "Deleting file (overwriting pointer to content)". *Data encapsulation* involves hiding: "Hiding by placing files inside other files". *Account hijacking* involves counterfeiting: "Evidence is created to make it appear as if another person did the 'bad act'". *Archive/image bombs* involve counterfeting: "Evidence is created to attempt to compromise the analysis of an image". In *disabling logs*, what is involved is source elimination: "Information about activities is never recorded".

While trying to suggest countermeasures, Harris recognised that the *human element* is likely to be the most difficult to handle. Harris (2006, p. S47, table 2) listed the following exploits of the various anti-forensic actions. For *MACE alteration*, the human element is: "Investigator may assume accuracy of dates and times". For *removing/wiping files*, the human elemewnt is: "Investigator may fail to examine deleted files". For *account hijacking*, the human element is: "Investigator may fail to consider whether the owner of the account was actually the person at the keyboard". Harris listed no human element for *archive/image bombs*. For *disabling logs*, he gave this human element: "Investigator may not notice mising log records".

In the next column in the table, Harris listed the forms that the *tool dependence element* takes in the various anti-forensic activities. For *MACE alteration*, the tool dependence element is: "Tools may not function with invalid or missing dates or times". For *removing/wiping files*, the tool dependence element is: "Methods of restoring deleted files are specific to the tool — so effectiveness may vary". For *account hijacking*, the tool dependence element is: "Tool may not be capable of extracting information that would aid investigator in determining who was in control of the account". For *archive/image bombs*, the tool dependence element is: "Improperly designed software may crash". For *disabling logs*, he gave this tool dependence element: "Software may not flag events that indicate logging was disabled".

In the third and last column in the table, Harris listed the forms that the *physical/logical limitations element* takes in the various anti-forensic activities. For *MACE alteration*, the element of physicial or logical limitations is: "Invalid dates and times make collating information from multiple evidentiary sources difficult or

 $<sup>^{230}</sup>$  The New Technology File System (NTFS) is a file system developed and introduced by Microsoft in 1995 with Windows NT. As a replacement for the FAT file system, it quickly became the standard for Windows 2000, Windows XP and Windows Server 2003. NTFS keeps track of lots of *time stamps*. Each file has a time stamp for "Create", "Modify", "Access", and "Entry Modified". The latter refers to the time when the MFT entry itself was modified. These four values are commonly abbreviated as the *MACE values*. Other attributes in each NFT record may also contain timestamps that are of forensic value.

impossible". For *removing/wiping files*, the element of physical or logical limitations is: "Time required to restore wiped file contents may outweigh the evidentiary value of the data it contained". For *account hijacking*, the element of physical or logical limitations is: "Zombied computer accounts may produce so much indirection that it is almost impossible to actually find the origin of an attack. Lack of detailed information may keep investigator from determining actual account user". For *archive/image bombs*, the element of physical or logical limitations is: "Useful information might be located in the bomb itself, but outside the logical limitations of the investigator's system". For *disabling logs*, he gave this element of physical or logical limitations: "Missing data may be impossible to reconstruct".

Insecurity governance or insecurity management is a branch of information technology concerned with how to respond, on an organisational level, to threats to computer security. *Multimedia forensics* is specifically concerned with uncovering perpetrators of piracy targeting protected digital content or encrypted applications. Typically, perpetration consists of unauthorised music and movie copying, either for private use of for selling pirated copies, thus eating a big bite of the profit of the record industry and the movie studios. Chang-Tsun Li (of the University of Warwick, England), has published a book (Li, 2008) on state-of-the-art *pirate tracking software.* A particular technique, *traitor tracing*, can be applied to multimedia forensics, but the term has previously been used also in the literature about cryptography.

#### 6.2.1.6 Digital Steganography

In Section 8.2.5, we are going to concern ourselves with *digital image forensics*, which consists of computational methods of detection of image tampering. It is worthwhile to also mention another discipline: *digital steganalysis* is a forensic activity within *digital steganography*, which itself also comprises the deeds of perpetrators, not only the attempts by investigators to uncover those deeds. *"Steganography* is the art and science of writing hidden messages in such a way that no one, apart from the sender and intended recipient, suspects the existence of the message".<sup>231</sup> *Steganography* also denotes a particular system of ascribing or claiming to decipher hidden messages.

The history of secret writings is the subject of Kahn (1967, 2nd edn., 1996). Steganographies were associated with mysticism and occult studies in the early modern period, and particularly, with claims in the writings of the German abbot

<sup>&</sup>lt;sup>231</sup> http://en.wikipedia.org/wiki/Steganography "Generally, messages will appear to be something else: images, articles, shopping lists, or some other *covertext* and, classically, the hidden message may be in invisible ink between the visible lines of a private letter. The advantage of steganography, over cryptography alone, is that messages do not attract attention to themselves. Plainly visible encrypted messages — no matter how unbreakable — will arouse suspicion, and may in themselves be incriminating in countries where encryption is illegal. Therefore, whereas cryptography protects the contents of a message, steganography can be said to protect both messages and communicating parties." (ibid.).

Johannes Trithemius (1462–1516),<sup>232</sup> discussed by Noel Brann (1981, 1999, 2006), Arnold (1971, 2nd edn. in 1991), David Kahn (1967, 2nd edn. 1996), Umberto Eco (1995, in one of the sections of his chapter 6), and Walker (1958, pp. 86–90). Later early modern steganographers included Giovambattista della Porta (in his *De furtivis litterarum notis*, of 1563), Blaise de Vigenère (in his *Traité des chiffres*, of 1587), and Gustavus Selenus (in his *Cryptometrices et cryptographjiae libri IX*, of 1624).<sup>233</sup>

Regardless of that cultural context, generally speaking:

Steganography has been used throughout history for secret communications. Criminals have always sought ways to conceal their activity in real, or physical space. The same is true in virtual, or cyber space. Digital steganography represents a particularly significant threat today because of the large number of digital steganography applications freely available on the Internet that can be used to hide any digital file inside of another digital file. Use of these applications, which are both easy to obtain and simple to use, allows criminals to conceal their activities in cyber space. In fact, the NIJ Guide for Electronic Crime Scene Investigation for First Responders<sup>234</sup> states that potential digital evidence in child abuse, child exploitation, and terrorism investigations includes information regarding steganography. Thus, steganography presents a significant challenge to those who investigate it because detecting hidden information and then extracting that information is very difficult and may be impossible in some cases.<sup>235</sup>

<sup>&</sup>lt;sup>232</sup> "Until 1499 Trithemius' reputation rested primarily on his monastic, mystical and humanist writings. Then, in that year, his magical notoriety burst onto the historical stage like a lightning bolt, signaled by a 1499 letter to a Carmelite friend, Arnold Bostius (1445–1499), announcing the birth of the art of steganography, a form of cryptography ostensibly invoking angels for the conveyance of secret messages. Far from having himself invented the art therein described, Trithemius assured Bostius, he had been instructed in its principles through a divine revelation. Inasmuch as the intended recipient had deceased prior to the letter's arrival, the prior of his cloister gained access to its contents and, aghast at what he therein encountered, insti instigated the abbot's necromantic legend. If the unforeseen disclosure of the Bostius epistle can be said to have delivered the first serious blow to Trithemius's reputation, a second severe blow was inflicted in the following decade by the French scholar Carolus Bovillus (c. 1479–1553), who, following a 1503 Sponheim visit in which he was given access to the partially completed *Steganographia*, condemned its author in a widely circulated letter as a diabolically inspired sorcerer' (Brann, 2006, p. 1136).

<sup>&</sup>lt;sup>233</sup> Of Trithemius' Latin treatise *Steganographia, hoc est, ars per occultam scripturam animi sui voluntatem absentibus aperiendi certa*, published in Frankfurt on the Main "ex officina typographica Matthiae Beckeri, sumptibus Joannis Berneri", in 1605, 1608, and 1621, there exists a partial English edition: *The Steganographia of Johannes Trithemius*, edited by Adam McLean, and translated by Fiona Tait, Christopher Upton and J. W. H. Walden. It was published in 1982 in Edinburgh, Scotland, in the Magnum Opus Hermetic Sourceworks.

<sup>&</sup>lt;sup>234</sup> Generally speaking, concerning *first responding officers*, also called *first responders* (which strictly speaking is a broader category, as sometimes the earliest responders are members of the public), Miller (2003) writes: "The first responders at a crime scene are usually police officers, fire department personnel or emergency medical personnel. They are the only people who view the crime scene in its original condition. Their actions at the crime scene provide the basis for the successful or unsuccessful resolution of the investigation. They must perform their duties and remember that they begin the process that links victims to suspects to crime scenes and must never destroy the links" (ibid., p. 118).

<sup>&</sup>lt;sup>235</sup> From http://www.sarc-wv.com/ This is the address of the site of the Steganography Analysis and Research Center within Backbone Security.

#### In fact:

Steganography includes the concealment of information within computer files. In digital steganography, electronic communications may include steganographic coding inside of a transport layer, such as a document file, image file, program or protocol. Media files are ideal for steganographic transmission because of their large size. As a simple example, a sender might start with an innocuous image file and adjust the color of every 100th pixel to correspond to a letter in the alphabet, a change so subtle that someone not specifically looking for it is unlikely to notice it.<sup>236</sup>

# Applications of digital steganography include the following<sup>237</sup>:

- Concealing messages within the lowest bits of noisy images or sound files.
- Concealing data within encrypted data or within random data. The data to be concealed is first encrypted before being used to overwrite part of a much larger block of encrypted data or a block of random data (an unbreakable cipher like the one-time pad generates ciphertexts that look perfectly random if you don't have the private key).
- Chaffing and winnowing.<sup>238</sup>

<sup>236</sup> http://en.wikipedia.org/wiki/Steganography

<sup>&</sup>lt;sup>237</sup> From http://www.sarc-wv.com/ This is the address of the site of the Steganography Analysis and Research Center within Backbone Security.

<sup>&</sup>lt;sup>238</sup> See http://en.wikipedia.org/wiki/Chaffing\_and\_winnowing "Chaffing and winnowing is a cryptographic technique to achieve confidentiality without using encryption when sending data over an insecure channel. The name is derived from agriculture: after grain has been harvested and threshed, it remains mixed together with inedible fibrous chaff. The chaff and grain are then separated by winnowing, and the chaff is discarded. The technique was conceived by Ron Rivest. Although it bears similarities to both traditional encryption and steganography, it cannot be classified under either category. This technique is remarkable compared to ordinary encryption methods because it allows the sender to deny responsibility for encrypting their message. When using chaffing and winnowing, the sender transmits the message unencrypted, in clear text. Although the sender and the receiver share a secret key, they use it only for authentication. However, a third party can make their communication confidential by simultaneously sending specially crafted messages through the same channel." An explanation of the workings (on which, variations exist) follows hereby (ibid.): "The sender (Alice) wants to send a message to the receiver (Bob). In the simplest setup, Alice enumerates the bits in her message and sends out each bit in a separate packet. Each packet contains the bit's serial number in the message, the bit itself (both unencrypted), and a message authentication code (MAC) whose secret key Alice shares with Bob. Charles, who transmits Alice's packets to Bob, interleaves the packets with corresponding bogus packets (called 'chaff') with corresponding serial numbers, the bits inverted, and a random number in place of the MAC. Charles does not need to know the key to do that. Bob uses the MAC to find the authentic messages and drops the 'chaff' messages. This process is called 'winnowing'. Eve, an eavesdropper located between Alice and Charles, can easily read Alice's message. But an eavesdropper between Charles and Bob would have to tell which packets are bogus and which are real (i.e., to winnow, or 'separate the wheat from the chaff'). That is infeasible if the MAC used is secure and Charles does not leak any information on packet authenticity (e.g., via timing). When an adversary requires Alice to disclose her secret key, she can defend with the argument that she used the key merely for authentication and did not intend to make the message confidential. If the adversary cannot force Alice to disclose an authentication key (which knowledge would enable the adversary to forge messages from Alice), then her messages will remain confidential. On the other hand, Charles does not even possess any secret keys that he could be ordered to disclose."

- Mimic functions convert one file to have the statistical profile of another. This can thwart statistical methods that help brute-force attacks identify the right solution in a ciphertext-only attack.
- Concealed messages in tampered executable files, exploiting redundancy in the i386 instruction set.
- Pictures embedded in video material (optionally played at slower or faster speed).
- Injecting imperceptible delays to packets sent over the network from the keyboard. Delays in keypresses in some applications (telnet or remote desktop software) can mean a delay in packets, and the delays in the packets can be used to encode data.
- Content-Aware Steganography hides information in the semantics a human user assigns to a datagram. These systems offer security against a non-human adversary/warden.
- Blog-Steganography. Messages are fractionalized and the (encrypted) pieces are added as comments of orphaned web-logs (or pin boards on social network platforms). In this case the selection of blogs is the symmetric key that sender and recipient are using; the carrier of the hidden message is the whole blogosphere.

Moreover, one also speaks of *network steganography* ("All information hiding techniques that may be used to exchange steganograms in telecommunication networks can be classified under the general term of network steganography"),<sup>239</sup> and of *printed steganography* (as the output of digital steganography may be in the form of printed documents): when using printed steganography, "A message, the *plaintext*, may be first encrypted by traditional means, producing a *ciphertext*. Then, an innocuous *covertext* is modified in some way so as to contain the ciphertext, resulting in the *stegotext*."<sup>240</sup>

The ciphertext produced by most digital steganography methods, however, is not printable. Traditional digital methods rely on perturbing noise in the channel file to hide the message, as such, the channel file must be transmitted to the recipient with no additional noise from the transmission. Printing introduces much noise in the ciphertext, generally rendering the message unrecoverable. There are techniques that address this limitation, one notable example is ASCII Art Steganography.<sup>241</sup>

One sometimes talks about *fingerprints*, and a *fingerprint vault scheme*, in digital steganography: see Li, Niu, Wang, Jiao, and Sun (2005).

# 6.2.1.7 Digital Forensics and Bayesian Networks

Bayesian networks have been applied to the evaluation of evidence in digital forensic investigations (Kwan, Chow, Law, & Lai, 2008).<sup>242</sup> Moreover, Overill et al.

<sup>&</sup>lt;sup>239</sup> http://en.wikipedia.org/wiki/Steganography "Contrary to the typical steganographic methods which utilize digital media (images, audio and video files) as a cover for hidden data, network steganography utilizes communication protocols' control elements and their basic intrinsic functionality. As a result, such methods are harder to detect and eliminate" (ibid.).

<sup>&</sup>lt;sup>240</sup> http://en.wikipedia.org/wiki/Steganography

<sup>&</sup>lt;sup>241</sup> http://en.wikipedia.org/wiki/Steganography

<sup>&</sup>lt;sup>242</sup> Halliwell et al. (2003) built upon the application of Bayesian networks (BNs) to inferring the probability of defence and prosecution statements based on forensic evidence. Halliwell et al.

(2010b) have developed a *sensitivity analysis* for such an application. "A Bayesian network representing an actual prosecuted case of illegal file sharing over a peer-topeer network has been subjected to a systematic and rigorous sensitivity analysis. Our results demonstrate that such networks are usefully insensitive both to the occurrence of missing evidential traces and to the choice of conditional evidential probabilities" (ibid., from the abstract). The study concerns a court case tried in Hong Kong, "involving the use of a BitTorrent (BT) peer-to-peer (P2P) network to act as the initial 'seeder' for illegally uploading a copyright protected audio-visual file for subsequent distribution was constructed and examined. In Hong Kong only the uploading of copyright protected material is prohibited whereas in the UK any activity infringing copyright is forbidden" (ibid., section 1). In order to carry out the sensitivity analysis, Overill et al. (2010b) proceeded as follows:

We have systematically replaced the aggregated likelihoods from the original survey [(Kwan et al., 2008)] by the minimum and maximum values of the responses provided by the sample of 31 expert digital forensic investigators. We have removed 'outlier' values from this sample by discounting any single response lying at either extreme of the range. [...] In addition, we have simultaneously set all the likelihoods to their respective minimum and maximum values in turn.

It was claimed that the Bayesian network in the study for which the sensitivity analysis was carried out "is insensitive to the occurrence of missing evidence and also to the choice of evidential likelihoods to an unexpected degree." Overill, Silomon, and Chow (2010a) conceded than in extreme cases of missing evidential traces, much lower probabilities for the investigative hypothesis were found.

It must be said however that even with the sensitivity analysis, the Bayesioskeptic general critique of Bayesian methods in a judicial contexts is not assuaged at all. The sensitivity analysis is to the satisfaction of statisticians, but this by itself does not prove that Bayesianism is safe for evaluating evidence in criminal cases, other than in the relatively harmless application to having the prosecutor assess whether to prosecute.

Potentially, and if taken per se, more interesting also for the Bayesian skeptics is another method from that same team, which tries to calculate *operational complexity* (Overill, Silomon, & Chow, 2010a). The very idea is tantalising, and a proper definition may satisfy perhaps also the Bayesian skeptics.

Nevertheless, the way Overill, Silomon, and Chow (2010a) defined and employed it, operational complexity is applied to the quantification of forensic evidential probabilities: "From the complexity of formation of a set of traces via a

<sup>(2003)</sup> noted: "This is an important development as it helps to quantify the meaning of forensic expert testimony during court proceedings, for example, that there is 'strong support' for the defence or prosecution position. Due to the lack of experimental data, inferred probabilities often rely on subjective probabilities provided by experts. Because these are based on informed guesses, it is very difficult to express them accurately with precise numbers. Yet, conventional BNs can only employ probabilities expressed as real numbers." (ibid., p. 42). This is oblivious to the critique of Bayesianism in law (see Sections 2.4 and 5.1 in this book). Halliwell et al. (2003) introduced an extension of probability theory, allowing to express *subjective probabilities as fuzzy* numbers.

specified route a measure of the probability of that route can be determined. By determining the complexities of alternative routes leading to the formation of the same set of traces, the odds indicating the relative plausibility of the alternative routes can be found" (ibid., from the abstract). Overill, Silomon, and Chow (2010a) exemplified this method of their by applying in the context of a digital forensic examination. The court case taken as a real case study is still the same that was tried in Hong Kong, about BitTorrent and the illegal upload of a copyright protected audio-visual file.

The operational complexity model (OCM) is described as follows:

The various *feasible routes* by which the recovered set of digital evidential traces could have been formed are first enumerated. For each feasible route *k* by which the set of digital evidential traces  $\{E_i\}$  could have been formed the operational complexity of that route is given by:

$$C_k = KLM_k + CC_k$$

 $C_k$  is the operational complexity of each feasible route *k*. It is a measure which "comprises a cognitive complexity component specified by the GOMS-KLM model<sup>243</sup> [(Kieras, 2001)] and a suitably defined computational complexity (CC) [(Papadimitriou, 1994)] component."  $C_k$  is inversely related to  $p_k$ , i.e., its probability of occurrence:

The constant of proportionality is determined uniquely by the normalization condition on the sum of the probabilities over all feasible routes k:

$$p_k \propto C_k^{-1}$$

The constant of proportionality  $\alpha$  reflects the units in which the complexity of each of the feasible routes *k* is measured, and is given by:

$$\sum p_k = 1$$

It should be noted here that while the OCM model makes use of a complexity metric it is not based on Shannon information theory [(Shannon & Weaver, 1949)], which would lead to an inverse exponential relation:

$$\alpha = (\sum C_k^{-1})^{-1}$$

Let  $\{E_i\}$  be a recovered set of digital evidential traces. Let  $H_k$  be the hypothesis that feasible route k was taken. Overill, Silomon, and Chow (2010a) combined their definitons as given above, with probabilistic calculations. The *posterior probability* of a feasible route k leading to the formation of  $\{E_i\}$  is given by

<sup>&</sup>lt;sup>243</sup> The GOMS (Goals, Operators, Methods, Selections) family of models of *cognitive complexity* includes the GOMS Keyboard-Level Model (KLM), developed by Kieras (2001), and which provides a tractable means of measuring human involvement in the operational process.

$$\Pr(H_k|\{E_i\})$$

The *posterior odds* for two alternative routes k and k' leading to the formation of the same recovered set of digital evidential traces {*Ei*} is then given by:

$$O(k:k') = \Pr(H_k | \{E_i\}) / \Pr(H_{k'} | \{E_i\})$$

Note that the odds are independent of the constant of proportionality since  $\alpha$  appears linearly in both the numerator and the denominator.

In a digital forensics context, if  $H_k$  represents the prosecution's contention regarding the formation of  $\{E_i\}$  and  $H_{k'}$  is the defence's alternative contention, then the odds O(k:k')provide a measure of the relative plausibility of the two competing hypotheses. More generally, if a total of *n* feasible routes are identified which are each capable of leading to the formation of the set of recovered traces, then the odds that feasible route k was taken are given by:

$$O(k) = \Pr(H_k | \{E_i\}) / \Pr(H_k^c | \{E_i\})$$

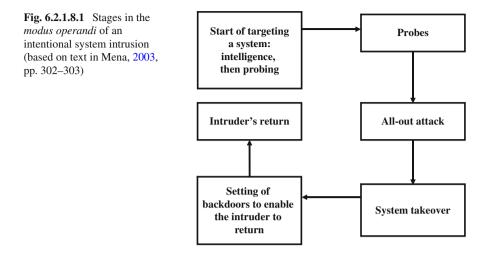
where  $H_k^c$  is the hypothesis that feasible route k was not taken, and involves summing the individual probabilities of the remaining n-1 feasible routes.

# 6.2.1.8 Intrusion Detection in Computer Resources A Glimpse of an Intruder's Modus Operandi

One of the areas of *computer forensics* is *intrusion detection*.<sup>244</sup> "An intrusion is when a hacker attempts top break into or misuse a computer system, Web site, or network. Yet another way to define an intrusion is any set of actions that attempt to compromise the integrity, confidentiality, or availability of a computer resource" (Mena, 2003, p. 301). "There are two types of potential intruders, the outside hacker and the inside one. Remarkably, FBI studies have revealed that 80% of intrusions and attacks come from within organizations" (Mena, 2003, p. 302). In the rest of Section 6.2.1, we are only going to discuss the subject selectively.

Mena (2003, section 10.2, pp. 302–309) provides an articulate, detailed description of the likely *modus operandi* of a hacker intent on intruding into a target system. See Fig. 6.2.1.8.1. Mena's description of the *intelligence* stage an intruder would carry out, enumerates such Web resources that the hacker may use in order to learn about the structure of a firm or organisation, and in order to detect possible openings for an intrusion. For example, security at the networks and webpages of the new acquisitions of a company are likely to lag behind the security at parent company. A distributed database, the *Domain Name Service (DNS)*, mapping addresses and hostnames to each other, may be configured insecurely, and then an attacker may

<sup>&</sup>lt;sup>244</sup> John McHugh (2001) provides a historical and methodological overview of intrusion detection in computer security.



learn addresses, and then the map of the internal network of the firm or organisation that the attacker is targetting.

It is at the next stage, *scanning*, that the intruder may use automated discovery tools in order to carry out *ping sweeps* (sending *ping* requests, i.e., checks whether a system is alive, massively in parallel), and *port scans* (which may be done, e.g., by using a tool called *Nmap*, which determines which type of operating system a target computer is using).

At the next stage, *probing*, "an attacker will attempt to identify user accounts, network resopurces, users and groups, file-sharing lists, and applications" (Mena, 2003, p. 306). Mena explains which utilities an intruder may use for probing, on different operating systems. The next stage is attack, and Mena (ibid., p. 307) explains which utilities on different operating systems an intruder may use in order in order to eavesdrop for passwords, and would then break in.

At the next stage, the intruder would try to take *control* of the system. Mena (ibid., p. 307) explains which utilities an intruder would use in order to gain *administrator privileges*. And finally, the intruder would set *trapdoors*, "to secure privileged access, and enabling return", Mena explains (ibid., p. 308), proceeding to enumerate which tools a cybercriminal would be use at this last stage. For example, *netcat*, a tool for network debugging and exploration, "reads and writes data across network connections", is used "for planting remote-control, services", and "can create almost any kind of connection a perpetrator needs" (ibid.).<sup>245</sup>

<sup>&</sup>lt;sup>245</sup> The research literature about *intrusion detection* is vast. See, e.g., e volume edited by Kreibich and Jahnke (2010).

## 6.2.1.9 A Classification of Intrusion Detection Systems

*Intrusion detection systems (IDS)* try to automatically detect break-ins, but also "a legitimate user misusing system resources" (Mena, 2003, p. 311). Coull, Branch, Szymanski, and Breimer pointed out (2003, p. 24):

Standard security deployments such as firewalls, patched operating systems and password protection are limited in their effectiveness because of the evolving sophistication of intrusion methods and their increasing ability to break through entry points of a guarded infrastructure [...]. An intrusion detection system (IDS) addresses the layer of security following the failure of the prior devices. This layer usually monitors any number of data sources (i.e., audit logs, keystrokes, network traffic) for signs of inappropriate or anomalous behavior. Since attacks occurring at this level are sophisticated enough to bypass entry point protection, advanced algorithms and frameworks for detection are required to prevent total subversion of critical resources. While no computer or network is entirely secure, intrusion detection is essential for any computer-based infrastructure, in which the value of its assets draws the attention of potential attackers.

Patterns of detection include *misuse intrusions*, vs. *anomaly intrusions*. (One also classifies the respective tasks into *penetration identification* vs. *anomaly detection*.) *Anomaly intrusions* can be detected based on a profile of the system being monitored. As an example,<sup>246</sup> consider Zhang, Zhu, Jeffay, Marron, and Smith (2008, p. 1):

In the context of Internet traffic anomaly detection, we will show that some outliers in a time series can be difficult to detect at one scale while they are easy to find at another scale. In this paper, we develop an outlier detection method for a time series with long range dependence, and conclude that testing outliers at multiple time scales helps to reveal them. We present a multi-resolution anomaly detection (MRAD) procedure for detecting network anomalies.

As to *misuse intrusions*, being "well-defined attacks on known weak points of a system" (Mena, 2003, p. 309), they can be detected by data mining audit-trail information, using pattern matching (ibid.). Mena (2003, p. 311) suggests to use a hybrid program, combining both approaches, that "would always be monitoring the system for potential intrusions, but would be able to ignore spurious false alarms if they resulted from legitimate user actions" (ibid.). But false negatives, i.e., ignoring intrusive activities that are not anomalous, "is far more serious than the problem of false positives", i.e., false alarms (ibid., p. 310).<sup>247</sup> *Misuse detection schemes* look for attacks "in the form of a pattern or signature<sup>248</sup> so that even variations of

<sup>&</sup>lt;sup>246</sup> Also see, e.g., Perdisci et al. (2009). They described the McPAD system.

<sup>&</sup>lt;sup>247</sup> "It is not uncommon for the number of real attacks to be far below the false-alarm rate. Real attacks are often so far below the false-alarm rate that they are often missed and ignored" (http://en.wikipedia.org/wiki/Intrusion\_detection\_system).

<sup>&</sup>lt;sup>248</sup> A *signature* is string of information that an intrusion detection sensor looks for in a packet sent through the network, and if the string matches the signature, then it is detected as an event in an intrusion detection context. Packets are small manageable pieces into which the data is broken up, so it could be sent through a network. A *signature-based intrusion-detection system (IDS)* "monitors packets in the Network and compares with preconfigured and predetermined attack patterns known as signatures. The issue is that there will be lag between the new threat discovered and Signature being applied in IDS for detecting the threat.During this lag time your IDS will

the same attack can be detected", but, "not unlike virus detection systems — they can detect many or all known attack patterns, but are of little use for as yet unknown attack methods" (ibid.). *Anomaly detection* tends to rely on techniques from artificial intelligence<sup>249</sup>:

An Anomaly-Based Intrusion Detection System is a system for detecting computer intrusions and misuse by monitoring system activity and classifying it as either normal or anomalous. The classification is based on heuristics or rules, rather than patterns or signatures, and will detect any type of misuse that falls out of normal system operation. This is as opposed to signature based systems which can only detect attacks for which a signature has previously been created.

In order to determine what is attack traffic, the system must be taught to recognize normal system activity. This can be accomplished in several ways, most often with *artificial intelligence* type techniques. Systems using *neural networks* have been used to great effect. Another method is to define what normal usage of the system comprises using a strict mathematical model, and flag any deviation from this as an attack. This is known as strict anomaly detection.

Anomaly-based Intrusion Detection does have some short-comings, namely a high false positive rate and the ability to be fooled by a correctly delivered attack. Attempts have been made to address these issues through techniques used by PAYL and MCPAD.

Apart from *misuse IDSs*<sup>250</sup> and *anomaly IDSs*,<sup>251</sup> there also exist a different criterion of classification: *host-based IDS*,<sup>252</sup> also known as *event log viewer*, carrying out monitoring for suspicious activity by checking event logs from multiple

be unable to identify the threat" (http://en.wikipedia.org/wiki/Intrusion\_detection\_system). "Many attacks are geared for specific versions of software that are usually outdated. A constantly changing library of signatures is needed to mitigate threats. Outdated signature databases can leave the IDS vulnerable to new strategies" (ibid.).

<sup>249</sup> http://en.wikipedia.org/wiki/Anomaly-based\_intrusion\_detection\_system

<sup>&</sup>lt;sup>250</sup> *Misuse detection* is the subject of, e.g., Kinder et al. (2005) and Meier et al. (2005).

<sup>&</sup>lt;sup>251</sup> Anomaly detection within intrusion detection is the subject of, e.g., Valeur et al. (2005); Latendresse (2005); Agbaria and Friedman (2005). The research literature about this subject is vast. Bear in mind however that anomaly detection is a broader subject, as the more general topic looms large in data mining research. "Anomaly detection, also referred to as outlier detection, refers to detecting patterns in a given data set that do not conform to an established normal behavior. The patterns thus detected are called anomalies and often translate to critical and actionable information in several application domains. Anomalies are also referred to as *outliers*, surprise, aberrant, deviation, peculiarity, etc. Three broad categories of anomaly detection techniques exist. Supervised anomaly detection techniques learn a classifier using labeled instances belonging to normal and anomaly class, and then assign a normal or anomalous label to a test instance. Semisupervised anomaly detection techniques construct a model representing normal behavior from a given normal training data set, and then test the likelihood of a test instance to be generated by the learnt model. Unsupervised anomaly detection techniques detect anomalies in an unlabeled test data set under the assumption that majority of the instances in the data set are normal" (http:// en.wikipedia.org/wiki/Anomaly\_detection). As to computer security: "Anomaly detection for IDS is normally accomplished with thresholds and statistics, but can also be done with soft computing [i.e., neural, genetic, or fuzzy techniques], and inductive learning. Types of statistics proposed by 1999 included profiles of users, workstations, networks, remote hosts, groups of users, and programs based on frequencies, means, variances, covariances, and standard deviations" (ibid.). It was Dorothy Denning (1986) who introduced anomaly detection for intrusion detection systems.

<sup>&</sup>lt;sup>252</sup> Host-based intrusion detection is the subject of, e.g., Dreger et al. (2005).

sources (Mena, 2003, p. 321). They operate in nearly real time, so "system faults are often detected quickly" (ibid.). "These host-based IDSs are ideal for detecting computer misuse from inside users or outsiders who have already infiltrated a network" (ibid.). Coull et al. explain (2003, p. 25):

Traditionally, there have been two main classes of IDSs: hostbased and network-based systems. A host-based IDS monitors the detailed activity of a particular host. Depending on the specific IDS implementation, any number of data sources can be used to search for malicious activity. Solaris Basic Security Module (BSM) provides system call traces which are typically used as datasets for host-based IDSs [<sup>253</sup>]. For instance, when an analysis of the BSM data shows signs of an intrusion, the IDS alerts the system administrator of an attack. In other implementations, hostbased systems also use such identifying information as a user's keystrokes and command execution patterns.

By contrast, there exist *network-based IDSs*, and these monitor all network traffic. They monitor networks of computers as well as other devices, these being routers and gateways, that intruders tend to attack: "rather than using machine and processoriented data, such as that from BSM, network-based IDSs primarily use data from network traffic in detecting intrusions." (Coull et al., 2003, p. 25). "A network-based IDSs view is restricted to what passes over a given line" (Mena, 2003, p. 321). In particular, *tcpdump* is a popular program for capturing network traffic. It can display or store every field belonging to a TCP packet.<sup>254</sup> Some IDSs are hybrids, that combine network-based and host-based intrusion-detection in the same package (Mena, 2003, p. 321).

Let us say something about the difference between intrusion detection systems (*IDS*) and *firewalls*. A firewall is a fence, without much discernment. A firewall is placed at the perimeter of a computer system.<sup>255</sup> An IDS can be placed outside the firewall, in order to gather information about an attack, as well as inside a firewall, in order to check information that goes out. A firewall, once it is turned on, shuts off all communication from outside (while not blocking outgoing connections from inside the system), and then turns back on some few well-chosen items. A firewall restricts access to designated points, but cannot detect whether by other criteria

<sup>&</sup>lt;sup>253</sup> A document describing BSM is S.M. Inc.'s Sunshield *Basic Security Module Guide, Solaris7* (Sun Part No. 8052635-10, October 1998).

<sup>&</sup>lt;sup>254</sup> Available via anonymous FTP from ftp.ee.lbl.gov (by V. Jacobson, C. Leres, and S. McCanne, June 1989). ICP is the Transmission Control Protocol. The Internet is based (among the other things) on this protocol.

<sup>&</sup>lt;sup>255</sup> A firewall is defined by Greg Stocksdale of the U.S. National Security Agency Information Systems security Organization as "A system or combination of systems that enforces a boundary between two or more networks. Gateway that limits access between networks in accordance with local security policy" (Mena, 2003, pp. 422–422). Stocksdale provided an example based on the UNIX operating systems: "The typical firewall is an inexpensive micro-based UNIX box kept clean of critical data, with many modems and public network ports on it, but just one carefully watched connection back to the rest of the cluster" (Mena 2003, p. 423). An *application level gateway* is defined by Stocksdale as "A firewall system in which service is provided by processes that maintain complete TCP [i.e., the Internet's Transmission Control Protocol] connection state and sequencing. Application level firewalls often re-address traffic so that outgoing traffic appears to have originated from the firewall, rather than the internal host" (Mena 2003, p. 419).

a communication from outside going through the designated points is legitimate. More generally, a firewall cannot by itself recognise attempts to break it. A fence around premises blocks intruders from walking it, but not from climbing on the fence, or digging under the fence. It is an IDS that has the task to recognise attacks. Moreover, a firewall is at the boundary, whereas an IDS may also recognise attacks inside the system.<sup>256</sup>

*Malicious traffic analysis* is necessary not only in traditional computer networks, but also in *wireless mobile ad hoc networks (MANET)*. These have a highly dynamic topology, without infrastructure. There may be *malicious intermediate nodes* in a MANET, and these constitute a threat both to security and to anonymity. Mizanur Rahman et al. (2008) proposed RINOMO, an anonymous on-demand routing protocol for MANETs. It is purported to be robust, and to both protect anonymity, and achieve security in MANETs. In order to obtain secure communication, legitimate nodes in the network need be authenticated.<sup>257</sup> Once they are authenticated, they

<sup>&</sup>lt;sup>256</sup> "Though they both relate to network security, an intrusion detection system (IDS) differs from a firewall in that a firewall looks outwardly for intrusions in order to stop them from happening. Firewalls limit access between networks to prevent intrusion and do not signal an attack from inside the network. An IDS evaluates a suspected intrusion once it has taken place and signals an alarm. An IDS also watches for attacks that originate from within a system. This is traditionally achieved by examining network communications, identifying heuristics and patterns (often known as signatures) of common computer attacks, and taking action to alert operators. A system that terminates connections is called an *intrusion prevention system*, and is another form of an *application layer firewall*" (http://en.wikipedia.org/wiki/Intrusion\_detection\_system).

<sup>&</sup>lt;sup>257</sup> Yu et al. (2008) discussed *biometric*-based user authentication in mobile ad hoc networks. "In high security MANETs, continuous authentication is desirable so that a system can be monitored for the duration of the session to reduce the vulnerability. Biometrics provides some possible solutions to the authentication problem in MANETs, since it has direct connection with user identity" (ibid., p. 5). They proposed to use not just one biometric technology, but *multimodal biometrics*, in order "to exploit the benefits of one biometric while mitigating the inaccuracies of another. We propose an optimal multimodal biometric-based continuous authentication scheme in MANETs" (ibid.).

<sup>&</sup>quot;Biometrics, which refers to identifying an individual based on his or her physiological or behavioral characteristics, has the capability to reliably distinguish between an authorized person and an imposter. A biometric system can be operated in two modes: (1) verification mode and (2) identification mode (Jain et al., 2000). The former is called *person verification*, or *person authentication*. A biometric system operating in the verification mode either accepts or rejects a user's claimed identity, while a biometric system operating in the identification mode establishes the identity of the user without any claimed identity information" (Khuwaja, 2006, pp. 23–24). Jain et al. (1999) is a book on the subject. Bromby (2010) discussed how biometrics can aid certification of digital signatures. The most mature technique for person verification, or one of the most mature, is fingerprint-based identification. Other approaches are based on "face, hand geometry, iris, retina, signature, voice print, facial thermogram hand vein, gait, ear, odor, keystroke dynamics, etc." (Khuwaja, 2006, p. 24). For example, *iris recognition* is the subject of Li et al. (2002), Yunhong et al. (2003). *Retina recognition* is discussed by Yoichi Seto (2009).

*Biometric fusion* (or *information fusion in biometrics*: Ross & Jain, 2003) is "[t]he general method of improving performance via collection of multiple samples" (Rattani, Mehrotra, & Gupta, 2008, p. 485). *Multi-biometrics* is "[t]he ability to utilize multiple biometrics modalities (multimodal), instances within a modality (multi-instance), and/or algorithms (multi-algorithmic) prior to making a sepecific verification / identification or enrollment decision" (ibid.), where *enrollment* is "[t]he initial process of collecting biometric data from a user and then storing it in a template for later use" (ibid., p. 484).

can communicate by using *pseudo IDs*. The generation of pseudo IDs resorts to pairing-based cryptography. Mizanur Rahman et al. claimed (2009, p. 179):

Nodes can generate their pseudo IDs independently and dynamically without consulting with system administrator. As a result, RINOMO reduces pseudo IDs maintenance costs. Only trust-worthy nodes are allowed to take part in routing to discover a route. To ensure trustiness each node has to make authentication to its neighbors through the designed anonymous authentication process. Thus, RINOMO safely communicates between nodes without disclosing node identities. It also provides different desirable anonymous properties such as identity privacy, location privacy, route anonymity, and robustness against several attacks.

## 6.2.1.10 Intrusion Detection by Means of Various Learning Techniques

Some IDSs resort to neural networks, for profiling (rather than for classification), whereas some other IDSs resort to machine learning algorithms (Mena, 2003, p. 322). Mena (ibid., section 10.7, pp. 313–318) presents a case study from the MITRE corporation, of the use of data mining for intrusion detection (their Data Mining in ID project). Data mining is called for, because of data overload. "Metalearning IDSs have been developed at Columbia University. Metalearning integrates a number of different classifiers. This type of IDS benefits from a multilayered approach in which machine learning and decision procedures detect intrusions locally" (Mena, ibid., p. 323).

Various approaches within machine learning have been applied to intrusion detection.<sup>258</sup> Zonghua Zhang and Hong Shen (2004) reported about the online training of *support vector machines*<sup>259</sup> for real-time intrusion detection. So did Kim and Park (2003). Hu et al. (2003) applied a variant, called *robust support vector machines*, to anomaly detection in computer security.<sup>260</sup> Another method in machine learning is *boosting*.<sup>261</sup> Webb (2000) introduced *multi-boosting*. The

<sup>&</sup>lt;sup>258</sup> In Canada, the joint editor of the *Computational Intelligence* journal, Ali Ghorbani, and his collaborators (Ren, Stakhanova, & Ghorbani, 2010) have described an online *adaptive* approach to *alert correlation*. Bear in mind that apart from *machine learning* (which is part of *artificial intelligence*), there also exist adaptive control (which is part of *systems & control*, historically a different discipline within the mathematics of engineering, concerned with the modelling of *dynamic systems*).

<sup>&</sup>lt;sup>259</sup> Support vector machines (SVMs) are the subject of Section 6.1.9.3 in this book.

<sup>&</sup>lt;sup>260</sup> Hu et al. (2003) presented an application *robust support vector machines (RSVMs)*, to anomaly detection over noisy data. They described as follows the advantage of RSVMs for the purposes of intrusion detection: "RSVMs effectively address the over-fitting problem introduced by the noise in the training data set. With RSVMs, the incorporation of an averaging technique in the standard support vector machines makes the decision surface smoother and controls the amount of regularization automatically [...]. Moreover, the number of support vectors of RSVMs is significantly less compared to those of standard SVMs. Therefore, RSVMs have a faster testing time" (ibid., p. 168). RSVMs were introduced by Song et al. (2002), who applied them to *bullet hole image classification*.

<sup>&</sup>lt;sup>261</sup> "Boosting improves the predictive power of classifier learning systems by adjusting the weights of training instances. It manipulates the training data in order to generate different classifiers. Boosting uses all instances at each repetition, but maintains a weight for each instance in the

algorithm appeared ibid., in table 4 on p. 169. "MultiBoosting can be viewed as combining AdaBoost<sup>262</sup> with wagging.<sup>263</sup> It is able to harness both AdaBoost's high bias and variance reduction with wagging's superior variance reduction" (ibid., p. 159). Bie, Jin, Chen, Xu, and Huang (2007) applied that approach to intrusion detection:

[T]raditional data mining based intrusion detection systems use single classifier in their detection engines. In this paper, we propose a meta learning based method for intrusion detection by MultiBoosting multi classifiers. MultiBoosting can form decision committees by combining AdaBoost with wagging. It is able to harness both AdaBoost's high bias and variance reduction with wagging's superior variance reduction.

Bie et al. explained (ibid., p. 811):

MultiBoosting [(Webb, 2000)]<sup>264</sup> can be considered as wagging (which is in turn a variant of bagging) committees formed by AdaBoost. A decision is made as to the size of sub-committees, and how many sub-committees should be formed for a single run. In the absence of an a-priori reason for selecting any specific values for those factors, MultiBoost takes a single committee size T and sets the number of subcommittees and the size of those sub-committees to square of T. Note that both these values must be whole numbers, it is necessary to round off the result. Deriving the values is achieved by setting a target final

training set that reflects its importance; adjusting the weights causes the learner to focus on different instances and so leads to different classifiers. The multiple classifiers are then combined by voting to form a composite classifier" (Stranieri & Zeleznikow, 2005b).

<sup>&</sup>lt;sup>262</sup> "AdaBoost, short for Adaptive Boosting, is a machine learning algorithm, formulated by Yoav Freund and Robert Schapire [(1997)]. It is a meta-algorithm, and can be used in conjunction with many other learning algorithms to improve their performance. AdaBoost is adaptive in the sense that subsequent classifiers built are tweaked in favor of those instances misclassified by previous classifiers. AdaBoost is sensitive to noisy data and outliers. However in some problems it can be less susceptible to the overfitting problem than most learning algorithms. AdaBoost calls a weak classifier repeatedly in a series of rounds t = 1, ..., T from a total T classifiers. For each call a distribution of weights  $D_t$  is updated that indicates the importance of examples in the data set for the classification. On each round, the weights of each incorrectly classified example are increased (or alternatively, the weights of each correctly classified example are decreased), so that the new classifier focuses more on those examples" (http://en.wikipedia.org/wiki/AdaBoost).

<sup>&</sup>lt;sup>263</sup> *Wagging* is the subject of section 7.4.2.2. in Rokach and Maimon (2008). "Wagging is a variant of Bagging [Bauer and Kohavi (1999)] in which each classifier is trained on the entire training set, but each instance is stochastically assigned a weight" (ibid., Rokach & Maimon's brackets). Webb (2000, p. 161) explained *wagging*: "Wagging (Bauer & Kohavi, in press [1999]) is variant of bagging, that requires a base learning algorithm that can utilize training cases with differing weights. Rather than using random bootstrap samples to form the successive training sets, wagging assigns random weights to the cases in each training set. Bauer and Kohavi's (in press [1999]) original formulation of wagging used Gaussian noise to vary the instance weights. However, this can lead to some instance weights being reduced to zero, effectively removing them from the training set. Instead, following a suggestion from J. R. Quinlan (personal communication, May 1998) the new technique uses the continuous Poisson distribution to assign random instance weights. As the assignment of instance weights by bagging can be modeled by the discrete Poisson distribution, use of the continuous Poisson distribution can be viewed as assigning instance weights using an equivalent distribution to bagging, but over a continuous rather than discrete space."

<sup>&</sup>lt;sup>264</sup> Contrast this to the theory of *multiclass boosting* of Indraneel Mukherjee and Robert Schapire (2011).

sub-committee member index, where each member of the final committee is given an index by starting from one. Due to too great or too low error, that allows the premature termination of boosting one sub-committee to lead to an increase in the size of the next sub-committee. An additional sub-committee is added with a target of completing the full complement of committee members if the last sub-committee is prematurely terminated. When this additional sub-committee also fails to reach this target, this process is repeated, adding further sub-committees until the target total committee size is achieved.

There exist applications of machine learning also to intrusion detection in *wireless* sensor networks (WSNs). Misra, Abraham, Obaidat, and Krishna (2009) described the LAID scheme. They applied *learning automata* for that purpose. The feedback is an *S*-shaped function: the feedback from the environment to the automaton is not crisp (completely favourable or completely unfavourable), but also any continuous value within those extremes.

#### 6.2.1.11 Masquerading and Its Detection

Anomaly detection systems can detect previously unknown attacks, and therefore "anomaly-based systems are strongly applicable to masquerade detection" (Coull et al., 2003, p. 25). *Masquerading* is a security attack – one of the most damaging kinds of attacks indeed – "in which an intruder assumes the identity of a legitimate user. Many approaches based on Hidden Markov Models and various forms of Finite State Automata were proposed to solve this problem" (ibid., p. 24). Coull et al. explain (ibid.):

Masquerade attacks typically occur when an intruder obtains a legitimate user's password or when a user leaves their workstation unattended without any sort of locking mechanism in place. It is difficult to detect this type of security breach at its initiation because the attacker appears to be a normal user with valid authority and privileges. This difficulty underlines the importance of equipping computer systems with the ability to distinguish masquerading attacker actions from legitimate user activities.

The detection of a masquerader relies on a user signature, a sequence of commands collected from a legitimate user. This signature is compared to the current user's session. The underlying assumption is that the user signature captures detectable patterns in a user's sequence of commands. A sequence of commands produced by the legitimate user should match well with patterns in the user's signature, whereas a sequence of commands entered by a masquerader should match poorly with the user's signature. Designing algorithms to distinguish legitimate users and masqueraders based on user signatures has been extensively studied [(Maxion & Townsend, 2002; Schonlau et al., 2001)].

## In particular (Coull et al., 2003, p. 25):

A seminal work by Schonlau et al. [(2001)] analyzes the performance of various masquerade detection methods. Results showed that the method yielding the lowest number of false alarms was *uniqueness*, which had a false positive rate of 1.4%. However, it had a falsenegative rate of 60.0%. Another good performer was the *Bayes one-step Markov* with a false positive rate of 6.7% and a false negative rate of 30.7%. In another paper [(Maxion & Townsend, 2002)], Maxion and Townsend analyzed the sources of error made by the detection mechanisms covered by Schonlau et al. and proposed several improved methods, among which the *Naive Bayes with updates* yielded excellent 1.3% of false positive rate with a respectable 38.5% of false negative rate. Coull et al. (2003) - an article from Boleslaw Szymanski's team at Rensselaer Polytechnic Institute in Troy, NY – approaches masquerading detection by applying to that task "a new algorithm that uses pair-wise sequence alignment to characterize similarity between sequences of commands" (ibid., p. 24). "Sequence alignment has been extensively applied in the field of bioinformatics as a tool for comparing genetic material [(Gelfand, Mironov, & Pevzner, 1996; Goad & Kanehisa, 1982)]. Our algorithm, which is a unique variation of the classic Smith-Waterman algorithm [(Smith & Waterman, 1981)], uses a novel scoring scheme to construct a semi-global alignment. The algorithm produces an effective metric for distinguishing a legitimate user from a masquerader" (Coull et al., ibid.). "The novelty of our approach results from application of techniques used in bioinformatics for a pair-wise sequence alignment to compare the monitored session with the past user behavior. Our algorithm uses a semi-global alignment and a unique scoring system to measure similarity between a sequence of commands produced by a potential intruder and the user signature, which is a sequence of commands collected from a legitimate user." (ibid.). After testing, the team found that "that the described algorithm yields a promising combination of intrusion detection rate and false positive rate, when compared to the published intrusion detection algorithms" (ibid.).

Coull et al. (2003, p. 27) explained why they chose to depart from the Smith-Waterman algorithm:

The problem with using a purely local alignment to characterize similarity between command sequences is that both a prefix and suffix can be ignored in both sequences. For intrusion detection, it is critical that we align the majority of the tested block of commands to the user's signature. If we were to allow a large prefix and large suffix of the tested block of commands to be ignored then the intrusion itself might be ignored.

Also using a purely global alignment algorithm would have been unsuitable (Coull et al., ibid.):

The problem with using a purely global alignment is that there may be large portions of the signature that do not necessarily align with a segment of the user's commands. Thus, we want to design a scoring system that rewards the alignment of commands in the user segment but does not necessarily penalize the misalignment of large portions of the signature.

Let *UserSign* stand for the *signature sequence*. It represents the user's typical command behaviour. Let *IntrBlck* stand for the tested block, i.e., the block being tested for intrusion. This is the monitored command sequence, which may contain a possible subsequence of masquerader commands. "Since the *UserSig* is significantly longer than the *IntrBlck*, it is expected that most of the commands in the *UserSig* will not participate in the alignment" (Coull et al., 2003, p. 27). Coull et al. (ibid., p. 28, figure 4) modified the Smith-Waterman *local alignment alogirithm*, and proposed the following *semi-global alignment algorithm*:

```
Input: string UserSig of length m,
        string IntrBlck of length n
1. Initialize a matrix, D,
        of type integer
```

```
2. for i=0 to m
3. for j=0 to n
4. if(j=0 or i=0)
5. D[i][j]=0;
6. else
7. if(j=n or i=m)
8. top=D[i][j-1];
9. left=D[i-1][j];
10. else
11. top=D[i][j-1] - gUserSig;
12. left=D[i-1][j] - gIntrBlck;
13. if(top<0) top=D[i][j-1];
14. if(left<0) left=D[i-1][j];
15. diagonal=D[i-1][j-1] +
             matchScore(UserSigi-1,
                        IntrBlckj-1);
16. D[i][j]=maximum(top,left,diagonal);
17. return D[m][n];
```

Coull et al. (2003, p. 27) explained that in the beginning, this algorithm initialises a matrix of float. This matrix is used to store the score throughout the alignment process.

Each position (i, j) in the matrix corresponds to the optimal score of an alignment ending at  $UserSig_i$  and  $IntrBlck_j$ . This optimal score is computed by starting at the upper left corner of the matrix (i.e., at the point (0,0)) and then recursively making a step yielding the maximum from the three following options:

- Option 1 (diagonal step): The alignment score ending at position (*i*-1,*j*-1) plus *matchScore*(UserSig<sub>i</sub>,IntrBlck<sub>j</sub>), which is a penalty or reward for aligning the UserSig's *i*th command with the IntrBlck's *j*th command.
- Option 2 (top-down step): The alignment score ending at position (i, j-1) plus gUserSig, which is the penalty for introducing a gap into the UserSig, or
- Option 3 (left-right step): The optimal score ending at position (i-1, j) plus *gIntrBlck*, which is the penalty for introducing a gap into the *IntrBlck*.

If Option 1 yields the largest value, then the optimal alignment matches  $UserSig_i$  with  $IntrBlck_j$ . If Option 2 or Option 3 yields the largest score, then the optimal alignment associates either  $UserSig_i$  or  $IntrBlck_j$  with a gap.

There are three essential parameters used in the scoring system. The *matchScore*(*UserSig*<sub>i</sub>,*IntrBlck*<sub>j</sub>) function returns a negative value if the two commands do not match well and a positive value if they do. The *gUserSig* and *gIntrBlck* are negative gap penalties associated with inserting gaps into the *UserSig* and *IntrBlck*, respectively.

This approach heavily penalises "any gaps that may be inserted into the user signature, as we do not want commands in the tested block to be aligned with gaps in the user's signature" (Coull et al., 2003, p. 29). Eventually, a paper by Coull and Szymanski (2008) in the journal *Computational Statistics and Data* 

*Analysis* described further progress concerning sequence alignment for masquerade detection. Their method included the algorithm for alignment, enriched with "several scoring systems, methods for accommodating variations in user behavior, and heuristics for decreasing the computational requirements of the algorithm" (ibid., p. 4116). Another paper from Szymanski's team (Bivens, Palagiri, Smith, Szymanski, & Embrechts, 2002) applied *neural networks* to network-based intrusion detection. Another approach to intrusion detection was described by Branch, Bivens, Chan, Lee, and Szymanski (2002), from the same team: it resorted to *time dependent deterministic finite automata*.

## 6.2.1.12 Honeypots for Trapping Intruders

The goal of Honeynet Project<sup>265</sup> – reported about by Spitzner (2003a) – is trapping hackers, by providing them with so-called *honeypots*. Information on hackers is gathered "by deploying networks (called honeynets) around the world to be compromised" (ibid.). Honeynet is just one out of several projects resorting to networks of honeypots. The Honeynet Research Alliance coordinates honeynet research around the world. The seminal paper on honeypots was by Cheswick (1992),<sup>266</sup> of AT&T Bell Laboratories.<sup>267</sup> Cheswick's paper began as follows:

On 7 January 1991 a cracker, believing he had discovered the famous sendmail DEBUG hole in our Internet gateway machine, attempted to obtain a copy of our password file. I sent him one. For several months we led this cracker on a merry chase in order to trace his location and learn his techniques. This paper is a chronicle of the cracker's "successes" and disappointments, the bait and traps used to lure and detect him, and the chroot [sic] "Jail" we built to watch his activities.

Basically, *honeypots* could be any out of various computer resources, such as a computer on a network, or a password file, or an entry in a database, or an Excel spreadsheet. Typically, research into honeypots has been concerned computers in a network which are used as an information system resource, the value of that resource lying in its unauthorised or illicit use. It is a computer unused by the legitimate users of the network: they don't know about it, so it is not involved in legitimate network traffic. The assumption is that any traffic it gets is malicious by definition, i.e., attacks. An attacker would think this is a normal computer. A log is maintained on a remote machine, of any interactions the honeypot gets. There are *low-interaction honeypots*, and *high-interaction honeypots*.<sup>268</sup>

<sup>&</sup>lt;sup>265</sup> Papers about the project are posted at the website of the Honeynet Project, under the rubric "Know Your Enemy" Whitepapers (http://www.honeynet.org/papers/).

<sup>&</sup>lt;sup>266</sup> Honeypots are the subject of, e.g., Provos and Holz (2007), Göbel et al. (2006), Spitzner, 2002, (2003b, 2004); Oudot (2003); Oudot and Holz (2004); Dulaunoy (2010), Crandall, Wu, and Chong (2005); Pouget and Holz (2005).

<sup>&</sup>lt;sup>267</sup> By the late 2000s, Bill Cheswick was affiliated with the Department of Computer Science of Columbia University, in New York City.

 $<sup>^{268}</sup>$  The presentation in the present Section 6.2.1.12 is partly based on a nicely organised slideshow by Claire O'Shea (2005), available on the Web.

*Low-interaction honeypots* are simple, low-cost, and low-risk (because an attacker never enters a real system). The information obtained by this kind of honeypots is limited however, there are new types of attacks such honeypots may miss, and moreover attackers may easily detect that this is a honeypot. In a low-interaction honeypot, what an attacker interacts with is a simulated computer, and one real machine may simulate various things, such as an entire network of *virtual honeypots*.

*High-interaction honyepots* are real systems running real services, and these services will be compromised. Interactions will be monitored and logged in detail, so detailed information would be obtained about what an attacker did. Moreover<sup>269</sup>:

Honeypots can be classified based on their deployment and based on their level of involvement. Based on the deployment, honeypots may be classified as

- 1. Production Honeypots
- 2. Research Honeypots<sup>270</sup>

What is used is the *fishbowl* analogy. In real life, a fish swims inside a fishbowl at home, and never gets out of a fishbowl, inside which it finds various props, such as rocks and plants. In a honeypot organised like a fishbowl, a framework has been set up, that provides data logging and also security for the host, because the attacker

<sup>&</sup>lt;sup>269</sup> http://en.wikipedia.org/wiki/Honeypot\_(computing) At that webpage, a few types of honeypots are briefly described. For example, some honeypots are specilised as *anti-spam tools*. Moreover: "An e-mail address that is not used for any other purpose than to receive spam can also be considered a spam honeypot. Compared with the term *spamtrap*, the term 'honeypot' might better be reserved for systems and techniques used to detect or counter attacks and probes. Spam arrives at its destination 'legitimately' — exactly as non-spam e-mail would arrive'' (ibid.). The Honeypot Project, which is open-source, "uses honeypot pages installed on websites around the world. These honeypot pages hand out uniquely tagged spamtrap e-mail addresses. *E-mail address harvesting* and *spammers* can then be tracked as they gather and subsequently send to these spamtrap e-mail addresses'' (ibid.). Moreover, there also exist *database honeypots*: "Databases often get attacked by intruders using *SQL Injection*. Because such activities are not recognized by basic firewalls, companies often use database firewalls. Some of the available SQL database firewalls provide/support honeypot architectures to let the intruder run against a trap database while the web application still runs as usual'' (ibid.).

<sup>&</sup>lt;sup>270</sup> "Production honeypots are easy to use, capture only limited information, and are used primarily by companies or corporations; Production honeypots are placed inside the production network with other production servers by an organization to improve their overall state of security. Normally, production honeypots are low-interaction honeypots, which are easier to deploy. They give less information about the attacks or attackers than research honeypots do. The purpose of a production honeypot is to help mitigate risk in an organization. The honeypot adds value to the security measures of an organization. *Research honeypots* are run by a volunteer, non-profit research organization or an educational institution to gather information about the motives and tactics of the *Blackhat* community [see http://en.wikipedia.org/wiki/Black\_hat] targeting different networks. These honeypots do not add direct value to a specific organization. Instead they are used to research the threats organizations face, and to learn how to better protect against those threats. This information is then used to protect against those threats. Research honeypots are complex to deploy and maintain, capture extensive information, and are used primarily by research, military, or government organizations" (ibid.).

could not get out of the fishbowl into other parts of the host system. Appropriate *data control*, invisible to the attacker, should be in place to prevent harm done from inside the fishbowl to machines outside it. There is still a risk that such data control would not be successful, and that other machines in the host network would be at risk. This is a disadvantage. Inside the fishbowls, there are machines that we want the attacker to attack (setting this up effectively is difficult), so the attacker's interaction with them could be watched. This is done by *data capture*, also invisible to the attacker, and recording all of the attacker's activities while in the fishbowl. (Anything that implements data control and data capture is called a *honeynet*.) Such monitoring is time-intensive, which is a disadvantage, but a detailed profile of attack can be captured, and new types of attack can also be captured, and these are advantages. Another problem with honeypots, is that the attacker may use the honeypot for carrying out criminal activities, and the host would be blamed.

Usually, high-interaction honeypots are used for research purposes, and not for intrusion detection in operational systems, because setting up and maintaining high-interaction honeypots inside operational systems would be too expensive. Symantec's Decoy Server, as well as Honeynets, are examples of high-interaction honeypots. Most *honeypot research* is on the several ways to use a honeypot as part of a security system for the purposes of *intrusion detection and prevention*. Another use of honeypots is for *attack analysis*: by observing how attackers behave, hopefully better tools to guard against them could be developed.

Moreover, honeypots can be used as *decoys*. The host populates all unused addresses on one's network with honeypots, so the attacker would have to waste time to attack such honeypots. Automated ttacks by *malware* (malicious software, especially *worms*)<sup>271</sup> is slowed down by decoys. As to human attackers, they are both slowed down, and annoyed, and therefore hopefully discouraged.

Another use of honeypots is as *tarpits*, also intended to slow down an attacker. A tarpit allows an attacker to open a connection, but then reduced the window size to zero. The attacker cannot get any data through, and cannot close the connection, and this uses up resources on the attacker's system. For example, a tarpit may consist of an *open email relay*, that would entice spammers because they would expect to be able to send out spam through that anonymous mail relay. The tarpit however would respond very slowly, wasting the time of spammers. Moreover, such a honeypot may pretend it forwards the mail, but actually drop it, and human spammers would be duped into thinking they had been successful, whereas automated spammers would assume success and move on.

<sup>&</sup>lt;sup>271</sup> A *worm* is defined by Greg Stocksdale of the U.S. National Security Agency Information Systems security Organization as an "Independent program that replicates from machine to machine across network connections often clogging networks and information systems as it spreadsds" (Mena, 2003, p. 430). In contrast, a virus is "a program that can infect other programs by modifying them to include a possibly evolved copy of itself" (Stocksdale, in Mena, ibid.).

A major use of honeypots is as *burglar alarms*, because once the honyepots are compromised, system administrators know that an attack is going on. There has been speculation with some evidence, that based on abnormal activity on the honeypots, attacks can be detected a few days in advance.

Yet another use of honeypots is as a so-called *honeycomb*, in *automatic signature generation*. It detects patterns, and created *intrusion detection signatures* faster than with *manual signature generation*. *Honeyd* is a low-interaction honeypots, and uses the honeycomb as a plug-in.<sup>272</sup> A single machine simulates the network stack of each machine in a group of virtual machines, and also simulates the physical network between them.

The Honeyd machine<sup>273</sup> has been used as a network decoy, for detecting worms, for capturing spam, and for providing a front end that selectively forwards packets<sup>274</sup> to high-interaction honeypots. What Honeyd tries to do, is to fool so-called *fingeprinting tools* (such as *Xprobe* and *Nmap*). What is meant by *fingerprinting* in intrusion detection, is testing a network behaviour.<sup>275</sup> Tools like Nmap generate a *fingerprint*, which looks like abstruse code, but typifies the behaviour of the network being tested.

<sup>&</sup>lt;sup>272</sup> The concept of a *honeycomb* was introduced by Christian Kreibich and Jon Crowcroft (2004). Kreibich has also been working on *botnets* (Caballero, Poosankam, Kreibich, & Song, 2009). Juan, Kreibich, Lin, and Paxson (2008), whose team also included Kreibich, discussed a tool for offline and live testing of *evasion resilience* in network intrusion detection systems. Cf. Dreger, Kreibich, Paxson, and Sommer (2005), on *host-based intrusion detection*.

<sup>&</sup>lt;sup>273</sup> Honeyd is available as an open source, at http://www.honeyd.org

 $<sup>^{274}</sup>$  When data is sent through a network, the data is broken up in to small manageable pieces called *packets*.

<sup>&</sup>lt;sup>275</sup> Moreover (http://en.wikipedia.org/wiki/Application\_protocol-based\_intrusion\_detection\_ system): "An application protocol-based intrusion detection system (APIDS) is an intrusion detection system that focuses its monitoring and analysis on a specific application protocol or protocols in use by the computing system. [...] An APIDS will monitor the dynamic behavior and state of the protocol and will typically consist of a system or agent that would typically sit between a process, or group of servers, monitoring and analyzing the application protocol between two connected devices. A typical place for an APIDS would be between a web server and the database management system, monitoring the SQL protocol specific to the middleware/business logic as it interacts with the database." Monitoring dynamic behaviour on the part of an APIDS involves the following. "At a basic level an APIDS would look for, and enforce, the correct (legal) use of the protocol. However at a more advanced level the APIDS can learn, be taught or even reduce what is often an infinite protocol set, to an acceptable understanding of the subset of that application protocol that is used by the application being monitored/protected. Thus, an APIDS, correctly configured, will allow an application to be 'fingerprinted', thus should that application be subverted or changed, so will the fingerprint change" (ibid.). In general, regardless of their being protocol-based or otherwise, there is a class of intrusion detection systems that are known as middleware-level IDSs. For example, Naess, Frincke, McKinnon, and Bakken (2005) discussed configurable middleware-level intrusion detection for embedded systems.

Honeypots and honeynets<sup>276</sup> can be used in combination with *automated monitoring tools*. These can look for suspicious activity and send out alerts. One such tool is *Swart*. It monitors log files for predefined patterns. It is at such tasks that *data mining* has a role to play. The honeypots gather data about network attacks, and any interaction with them is assumed to be an attack. It is in order to detect this or that attack, that *pattern matching* is resorted to. Still, the more sophisticated attacks are, the harder it is to catch them with honeypots. It has also been argued that making it possible to detect the presence of honeypots may prove to be a deterrent:

Just as honeypots are weapons against spammers, honeypot detection systems are spammeremployed counter-weapons. As detection systems would likely use unique characteristics of specific honeypots to identify them, a great deal of honeypots in use makes the set of unique characteristics larger and more daunting to those seeking to detect and thereby identify them. This is an unusual circumstance in software: a situation in which "*versionitis*" (a large number of versions of the same software, all differing slightly from each other) can be beneficial. There's also an advantage in having some easy-to-detect honeypots deployed. Fred Cohen, the inventor of the *Deception Toolkit*, even argues that every system running his honeypot should have a deception port that adversaries can use to detect the honeypot. Cohen believes that this might deter adversaries.<sup>277</sup>

Some honeypot systems only target automated attacks by propagating malware, rather than attacks by human attackers. This is the case of the *Nepenthes* system.<sup>278</sup> Göbel, Hektor, and Holz (2006) discussed the collection of malware that spread automatically (such as network *worms* or *bots*) by using the Nepenthes low-interaction honeypot. The purpose is obtaining the malware itself, its binary code is downloaded and stored for further in-depth analysis. Nepenthes only simulates the vulnerable parts of a service, not the full service for an attacker to interact with. Human attackers would easily detect Nepenthes, whereas this tool is useful for interacting with propagating malware instead. The modules of Nepenthes include:

- *vulnerability modules* (which simulate the vulnerable parts of network services);
- *shellcode parsing modules* (these analyse the code received by a vulnerability module, which is in a low-level, machine-executable, assembly language, and extract information about the malware)<sup>279</sup>;

<sup>&</sup>lt;sup>276</sup> "Two or more honeypots on a network form a *honeynet*. Typically, a honeynet is used for monitoring a larger and/or more diverse network in which one honeypot may not be sufficient. Honeynets and honeypots are usually implemented as parts of larger *network intrusion detection systems*. A *honeyfarm* is a centralized collection of honeypots and analysis tools." Quoted from http://en.wikipedia.org/wiki/Honeypot\_(computing)

<sup>&</sup>lt;sup>277</sup> http://en.wikipedia.org/wiki/Honeypot\_(computing) citing Fred Cohen's *Deception Toolkit* (in turn, accessed in 2006 at http://all.net/dtk/index.html).

<sup>&</sup>lt;sup>278</sup> The source code of the nepenthes system is available from http://nepenthes.mwcollect.org

<sup>&</sup>lt;sup>279</sup> "Shellcode parsing modules analyze the received payload and automatically extract relevant information about the exploitation attempt. Currently, only one shellcode parsing module is capable of analyzing all shellcodes received in the wild. The module works in the following way: First, it tries to decode the shellcode. Most shellcode is obfuscated with an XOR encoder. An XOR decoder is a common way to 'encrypt' the native shellcode in order to evade intrusion detection systems

- *fetch modules* (the information which is the output of the shellcode parsing modules is used by the fetch modules in order to download the malware from some remote location);
- *submission modules* (these handle the malware once it has been downloaded: they save its code to hard disk, or store it in a database, or send it to developers of antivirus software); and
- logging modules (information about the simulation is logged by these, so that patterns in the collected data could be detected and an overview provided).

There also is an *event-driven notification mechanism* in Nepenthes, so that the events triggered by each step of an attack be registered and reacted to.

Traditional honeypots are servers (or devices that expose server services) that wait passively to be attacked. *Client Honeypots* are active security devices in search of malicious servers that attack clients. The client honeypot poses as a client and interacts with the server to examine whether an attack has occurred. Often the focus of client honeypots is on web browsers, but any client that interacts with servers can be part of a client honeypot (for example ftp, ssh, email, etc.).<sup>280</sup>

In particular, there again is the distinction between *high-interaction client honeypots* and *low-interaction client honeypots*, just as there is such a distinction concerning just traditional honeypots:

High interaction client honeypots are fully functional systems comparable to real systems with real clients. As such, no functional limitations (besides the containment strategy) exist on high interaction client honeypots. Attacks on high interaction client honeypots are detected via inspection of the state of the system after a server has been interacted with. The detection of changes to the client honeypot may indicate the occurrence of an attack against that has exploited a vulnerability of the client. An example of such a change is the presence of a new or altered file.

High interaction client honeypots are very effective at detecting unknown attacks on clients. However, the tradeoff for this accuracy is a performance hit from the amount of system state that has to be monitored to make an attack assessment. Also, this detection mechanism is prone to various forms of evasion by the exploit. For example, an attack could delay the exploit from immediately triggering (time bombs) or could trigger upon a particular set of conditions or actions (logic bombs). Since no immediate, detectable state change occurred, the client honeypot is likely to incorrectly classify the server as safe even though it did successfully perform its attack on the client. Finally, if the client honeypots are running in virtual machines, then an exploit may try to detect the presence of the virtual environment and cease from triggering or behave differently.<sup>281</sup>

and string-processing functions. After decoding the code itself according to the computed key, this module then extracts more information from the shellcode (e.g., credentials). If enough information can be reconstructed to download the malware from a remote location, this information is passed to the next type of module" (Göbel et al., 2006, p. 20).

<sup>&</sup>lt;sup>280</sup> http://en.wikipedia.org/wiki/Client\_honeypot

<sup>&</sup>lt;sup>281</sup> Ibid. Several such systems are briefly described at that webpage. So are several *low-interaction client honeypots*. "Low interaction client honeypots differ from high interaction client honeypots in that they do not utilize an entire real system, but rather use lightweight or simulated clients to interact with the server. (in the browser world, they are similar to web crawlers). Responses from servers are examined directly to assess whether an attack has taken place. This could be done, for

# 6.2.2 The United States' Anti-Drug Network (ADNET)

Law enforcement agencies in the United States resort to ADNET (Anti-Drug Network), with data-mining assistance from the MITRE Corporation. This is briefly described by Mena (2003, section 7.5, pp. 210–212). The bodies that share data within ADNET include the U.S. Department of Defence, the U.S. Coast Guard, the Department of Justice, the Department of State, the Department of Treasury, the Federal Communications Commission, and the U.S. intelligence community.

A U.S. governmental source explains<sup>282</sup>:

The ADNET program's mission is the implementation of information systems, technologies, and services at the secret and sensitive-but-unclassified level for Department of Defense, federal, state, local, and tribal law enforcement and partnering nations.

ADNET supports the Deputy Assistant Secretary of Defense for counternarcotics and its mission of counter-narcoterrorism, including:

- Statutory detection and monitoring
- Demand reduction activities
- Support to domestic and host nation law enforcement
- Other missions that support the war on terrorism, readiness, national security, and security cooperation goals
- ADNET provides application and customer enclave services to the counternarcoterrorism communities of interest.

Another source, being a resource for the press, provides further detail:

ADNET is a community of interest that provides command, control, communication, computer, and intelligence (C4I) capabilities to help the Department of Defense (DoD) and other federal, state, and local governments detect, monitor, and interdict activities related to narcotics trafficking and narco-terrorism (CNT). These efforts are directed by the Office of the Deputy Assistant Secretary of Defense for Counternarcotics and Global Threats.<sup>283</sup>

The same press resource from the U.S. government explains the capabilities and serivces of ADNET as follows:

ADNET is the primary secure link among DoD, the Office of National Drug Control Policy, Federal Communications Commission, Homeland Security, National Guard (high intensity drug trafficking areas), intelligence community, Justice, and Treasury. Interagency groups leverage ADNET's secure and accredited operational infrastructures at the Secret and Sensitive But Unclassified (SBU) levels to complete CNT tactical and strategic missions. ADNET develops and operates critical information systems such as the Counterdrug Consolidated Database (CCDB), Webshare collaboration system, FORUM (request for

<sup>282</sup> See http://www.disa.mil/services/adnet.html

example, by examining the response for the presence of malicious strings. Low interaction client honeypots are easier to deploy and operate than high interaction client honeypots and also perform better. However, they are likely to have a lower detection rate since attacks have to be known to the client honeypot in order for it to detect them; new attacks are likely to go unnoticed. They also suffer from the problem of evasion by exploits, which may be exacerbated due to their simplicity, thus making it easier for an exploit to detect the presence of the client honeypot" (ibid.).

<sup>&</sup>lt;sup>283</sup> See http://www.disa.mil/news/pressresources/factsheets/adnet.html

information), counter drug (CD) common operational picture (COP), and electronic mail to support these interagency groups.

These systems utilize ADNET's enterprise products and services which includes

- maintenance of six (6) separate architectures (development, test, user acceptance, continuity of operations (COOP), ADNET-Secret, and ADNET-SBU) for full life-cycle development;
- extensive security engineering to include design and implementation of security configurations and firewall and intrusion detection system monitoring and maintenance;
- certification and accreditation documentation to ensure compliance with DoD and customer policies for operating on Secret and SBU;
- full service network operations center and service desk to provide customer and technical support from the network to the customer's edge device;
- engineering and fielding of complete information systems to include telecommunications, hardware, software development, installation, security engineering, accreditation, training, network operations, and service desk.

ADNET manages a number of devices at customer locations consisting of workstations, routers, switches, firewalls, storage area networks, and servers in the Secret and Unclassified environments.

ADNET operates an unclassified information sharing portal technology system supporting the combatant commanders, federal, state, local, and foreign governments doing intelligence preparation of the battlefield, joint operations, operational evaluations, and interdiction. The El Paso Intelligence Center leverages the ADNET Unclassified portal to allow vetted users to access the National Seizure System.

Additionally, DoD's general counsel has authorized the ADNET program to host U.S. person data on their systems.

MITRE, Mena (2003) reported, was "working on a now-fielded prototype targeting system that analyzes passenger vehicle crossing data and develops data mining rules and tools that help operators perform real-time analysis to identify potential counternarcotics targets" (ibid., p. 211). In particular, MITRE was applying techniques from *machine learning*. "The objective is to provide end users with a system that will quickly indicate if an individual coming into the United States is worthy of further inspection" (ibid.). For an incoming car at the border, this is done via the licence plate. Based on this input, ADNET informs the customs system operator about the travel patterns of that car, and whether this trip is different – and suspicious (ibid., p. 210).

The following is quoted from MITRE  $(2001)^{284}$ :

Anti Drug Network (ADNET): A middle-aged man in a light blue Mustang is on the way to enter the United States from Mexico through one of the numerous customs checkpoints along the southwest border. He is confident no one will suspect that he is transporting more than 10 pounds of heroin in secret compartments inside his vehicle; he has done it before and he plans to do it again and again.

<sup>&</sup>lt;sup>284</sup> This text from MITRE (2001) was quoted by both Jesus Mena (2003), and Hakikur Rahman (2009, pp. 176–177).

But, a customs system operator at a site near El Paso, Texas, uses the Anti-Drug Network (ADNET) system to access data on the driver and his car via his license plate. It's just routine check and takes a few moments.

The agent quickly learns through a system that accesses a large data warehouse of information on crossings, seizures, and motor vehicles that the driver makes this trip on a regular basis, at a regular time, but this trip is different. She decides it is worth her time and trouble to continue the inspection. Ten minutes later, she finds more than a dozen small packages of white powder inside the vehicle. The drugs were seized and the driver was arrested.

Situations like this occur almost daily across the many ports of entry along the Mexican/U.S. border and other entry points into the United States. It may happen to many other countries and continents. Sophisticated data-sharing systems developed by the ADNET community (i.e., Department of Defense, U.S. Coast Guard, Department of Justice, Department of State, Department of Treasury, Federal Communications Commission, and the intelligence community) give U.S. drug and law enforcement officials a cache of information needed to track the flow of illegal narcotics and other dangerous substances into the country.

# 6.2.3 Investigating Internet Auction Fraud

## 6.2.3.1 What the Problem Is

Wikipedia has an informative entry for "Internet fraud",<sup>285</sup> with a usefully detailed classification.<sup>286</sup> Choo (2008) proposed a typology of organised crime groups on the Internet. Dawn Gregg and Judy Scott (2008) described a typology of complaints about eBay sellers: eBay is the world largest online auction website.<sup>287</sup> "In an *online* 

By contrast, at a reverse auction "the seller puts up an item for sale at a high price. The price of this item is progressively reduced until a potential buyer accepts the bid and the items are then deemed to have been sold to the buyer" (ibid., p. 385). "An example of a decreasing bid auction

<sup>&</sup>lt;sup>285</sup> Fraud, regalrdless of the Internet, has been approached within AI & Law in respect of *ontologies*: Vandenberghe, Leary, and Zeleznikow (2003) discussed the goal of developing a *financial fraud ontology*.

<sup>&</sup>lt;sup>286</sup> http://en.wikipedia.org/wiki/Internet\_fraud

<sup>&</sup>lt;sup>287</sup> http://www.ebay.com This is a generalised auction site, in the sense that customers are allowed to put up many different kinds of items for sale on the auction site. But in respect of the mode of bidding, eBay has a forward auction facility. What distinguishes an auction from other forms of selling is that the seller puts up the items for sale, without giving a fixed price. Moreover, an auctioneer manages the process. "There are several different types of auctions, the most common ones being an increasing bid auction (English auction), a decreasing bid auction (Dutch auction), and a price quantity pair auction. Auctions found their way onto the internet as early as 1995" (Chan et al., 2001b, p. 384). On the Internet, increasing bid auctions are known as forward auctions, whereas decreasing bid auctions are known as reverse auctions. In a forward auction, "the seller puts up an item for sale and specifies an acceptable minimu price or reserve price that he is willing to accept. The item is then posted on the auction site together with the minimum price and the bidding is kept open for a specified period. During this period, potential buyers bid for the item and the latest high bid is displayed (but not the identity of the bidder). When the specified period lapses, the highest bidder is required to purchase the item at the bid price. There are clearly defined rules for the auction site that the bidder and the seller of the item are required to adhere to" (ibid., pp. 384-385).

*auction scheme*, a fraudster starts an auction on a site such as eBay or TradeMe with very low prices and no reserve price, especially for typically high priced items like watches, computers, or high value collectibles. The fraudster accepts payment from the auction winner, but either never delivers the promised goods, or delivers an item that is less valuable than the one offered – for example, a counterfeit, refurbished, or used item.<sup>288</sup>

Gregg and Scott's (2008) categories include the sellers delivering goods not as requested by the buyer, or delivering goods of low quality, or goods without ancillary item or parts, or then goods being defective or damaged; moreover the goods supplied may be or black market items. In a so-called *accumulation* fraud, a seller builds up his or her reputation by making the initial investment of selling much low-value merchandise over a long period of time. Next, the seller presents an offer of expensive goods, but once buyers make their payment, they never get the expensive

site is Klik klok, which auctions gold and jewellery" (ibid., p. 386). The third kind of auction is a price quantity pair auction: it "has potential buyers making a bid for a certain quantity of an item at a certain price and sellers offering to sell a given quantity at a specified price. The buyer's bids are progressively increased and seller's 'asking' price progressively decresed until matching bids are obtained and the requisite quantity is then deemed to have been sold to the buyer at the right bid price" (ibid., p. 385). Sites like eBay are C2C auction sites, i.e., customer-to-customer sites, as opposed to B2B auctions, i.e., broker-to-broker auctions. One of the models of B2B auctions is "Use of a liquidation broker to sell excess items. In this case, the liquidation broker is essentially a third party auction site that does the auctioning for you" (ibid., p. 386). Otherwise, one may auction items at one's own website, or one may resort to "the auction facility on a virtual market site that one is a participant in to auction excess inventory" (ibid.). These, too, are B2B models, according to Chan et al. (2001b). As to C2C auction sites, they are any of three types: generalised auction sites (such as eBay), specialised auction sites, or agent-based auction supporting sites, i.e. "agent based services or search engines that will allow a buyer to specify an item, and the mobile agent or search engine would then visit relevant new sites returning information on where the item can be found. An example of this is www.usaweb.com" (ibid., p. 386).

<sup>&</sup>lt;sup>288</sup> From section "Online auction and retail schemes" at http://en.wikipedia.org/wiki/Internet\_ fraud Online auction fraud is akin to online retail fraud. "Online retail schemes involve complete online stores that appear to be legitimate. As with the auction scheme, when a victim places an order through such a site, their funds are taken but no goods are sent, or inferior goods are sent. In some cases, the stores or auctioneers were once legitimate, but eventually stopped shipping goods after accepting customer payments. Sometimes fraudsters will use phishing techniques to hijack a legitimate member accounts on an online auction site — typically an account with a strongly positive online reputation — and use it to set up a phony online store. In this case, the fraudster collects the money, while ruining the reputation of the conned eBay member. When victims complain that they have not received their goods, the legitimate account holder receives the blame. A more subtle variation of online auction fraud occurs when a seller ships an item to an incorrect address that is within the buyer's ZIP code using the United States Postal Service's Delivery Confirmation service. This service does not require the recipient to sign for the package, but offers confirmation that the Postal Service delivered the package within the specified ZIP code. The item shipped is usually an empty envelope with no return address and no recipient name, just a street address different from that of the victim. The delivery of the envelope with the Delivery Confirmation barcode attached suffices for the Postal Service to record the delivery as confirmed. The fraudster can then claim the package has been delivered, and offer the Delivery Confirmation receipt as proof to support the claim." (ibid.).

goods they purchased. In his own discussion of frauds at eBay auctions, Wahab (2004) stated:

With respect to forms of online auction fraud, there are several activities which constitute fraudulent behaviour including:

*Non-delivery*: involves the seller placing an item up for bid when, in fact, there is either no item at all or the seller has no intention to sell. As a result, the item is never delivered to the buyer after he/she purchases the item.

*Misrepresentation*: Occurs when the seller's purpose is to deceive the buyer as to the true value of an item by listing false information or using fake pictures of the item.

*Non-payment*: Involves a buyer placing the highest bid and winning the auction, and as the merchandise is delivered no money is paid. The victim in this case is actually the seller.

*Triangulation*: Involves three parties: the perpetrator, a consumer, and an online merchant. The perpetrator buys merchandise from an online merchant using stolen identities and credit card numbers. Then, the perpetrator sells the merchandise at online auction sites to unsuspecting buyers. Later, the police seize the stolen merchandise to keep for evidence, and the buyer and merchant end up the victims.

*Fee stacking*: Involves adding hidden charges to the item after the auction is over to obtain more money. Instead of a flat rate for postage and handling, the seller adds separate charges for postage, handling, and shipping. As a result, the buyer has to pay more than anticipated.

*Black-market goods*: These goods include copied software, music CD's, videos, etc. The goods are delivered without a box, warranty, or instructions. Auction sites such as eBay try to stamp out selling such items by prohibiting the selling of unauthorised copies of software, games, music, or video. Multiple violations of eBay's unauthorised copy policy could result in the suspension of your account.

#### Wahab (2004) also listed fraudulent kinds of bidding at online auctions:

*Multiple bidding*: This occurs when a buyer places multiple bids (some high and some low) using different aliases. The multiple high bids cause the price to escalate, and scares off other potential buyers from bidding. Then, in the last few minutes of the auction the same buyer withdraws their high bids, only to purchase the item with their lowest bid. On eBay, it is not permitted to use secondary User IDs or other eBay members to artificially raise the level of bidding and/or price of an item. Equally, retracting bids is not allowed as a rule on eBay, as all bids are binding, except: sales of real estate or businesses, sales of items that are prohibited by law or by eBay's User Agreement, and other exceptional circumstances (typographical errors, significant change in the description of the item, inability to reach the seller, and unauthorised use of the buyers ID and password)

*Shill bidding*: is the intentional sham bidding by the seller to drive up the price of his/her own item that is up for bid. This is accomplished by the sellers themselves and/or someone that is associated with the seller making bids to purposely drive up the price of the seller's item.

*Shield bidding*: occurs when the buyer uses another email address or a friend (the shield) to drive up prices and discourage bids on an item she wants. At the last minute, the shield withdraws the high bid, allowing the buyer to win the item at a lower price. Most auction sites forbid retracting a bid once it's made, and on eBay shill and shield bidding is clearly prohibited.

Summing up the foregoing kinds of fraudulent behaviour, Wahab (2004) remarked: "Although one or more forms may be prevented under the auction site policies, the main concerns for online auction fraud lies in the non-delivery, delivery of defective goods or late delivery, failure to disclose all relevant information, and non-payment". Wahab (2004) listed the following factors in buyers' behaviour that make them vulnerable to fraud at online auctions:

- (a) *Lack of knowledge*: where the buyer is not fully aware of the site policies or safe harbour principles. Many buyers act on the assumption that standard policies exist in all auction sites.
- (b) Payment Methods: money orders or personal cheques were listed as methods of payment by 80% of the victims that reported Internet auction fraud. The National Consumers League found that most of the consumers who lost money in Internet auctions paid with a money order (48%), personal cheques (32%), or cashier's cheques (7%).
- (c) Negligence: engaging in online auction activities has its stakes as well as its advantages. Thus, the lack of cautious conduct may very well result in becoming a victim of fraud. Buyers and sellers who do not act carefully by checking retail prices and information about each other, reading their feedback ratings, or using common sense in assessing the price of the item up for a bid, could become the perfect victims of fraud.

FADE (Fraud and Abuse Detection Engine) is a data mining system developed by the online auction site eBay in order to detect fraud perpetrator at its site (Mena, 2003, p. 254). Some unscrupulous sellers never supply the merchandise they sold, or then they misstate its features. Internet auction fraud has been ranked the highest amongst the reported fraud cases in electronic commerce (Ochaeta, 2008). Often fraudsters try to build up a reputation for themselves, by initially selling to or buying from traders with a good reputation, for a while, a lot of low priced or cheap products; or then they may sell to or buy from accomplices moderate value or expensive items. Morzy (2008) proposed algorithms for mining the reputation of participants of online auctions. Morzy identified further fraudulent practices, beside the ones described by Gregg and Scott (2008). Those practices considered by Morzy include bid shilling, that is to say, as seen earlier, the use of a false bidder identity to drive up the price of an item on behalf of the seller; and *bid shielding*: the perpetrators comprise a rolecalled the *shielder*, and a role of the one who is going to fraudulently win the auction. The shielder offers an artificially high bid for an item, so that other bidders be discouraged from competing for an item; then, at the last moment, the shielder withdraws the bid, and his or her accomplice, who is the second highest bidder, wins the auction. Chua and Wareham (2002, cf. 2004), concerned with selfregulation for online auctions, proposed a taxonomy, quoted by Kwan et al. (2010) and presented in two tables (Tables 6.2.3.1.1 and 6.2.3.1.2).

Kobayashi and Ito (2008) proposed a transactional relationship visualisation system in Internet auctions. Credit card phantom transactions in online auctions was discussed, from a fraud detection perspective, in Chae, Shim, Cho, and Lee (2007). Anonymacy and information asymmetry were identified by Sakurai and Yokoo (2003) and Chae et al. (2007) as being important factors in online auction fraud. A seller or a buyer might submit a false-name bid by pretending to be a potential buyer or seller, thus enabling the perpetrator to manipulate the supply-and-demand chain. Ku, Chen, and Chiu (2007a) proposed a data mining approach for internet auction fraud detection – "a simple method which is detected potential fraudster by social network analysis (SNA) and decision tree to provide a feasible mechanism of playing capable guardians in buyers' auction activities" – whereas Ku, Chen, Wu, and Chiu (2007b) were concerned with online gaming crime.

Seller as fraudster			
Bid shilling	Seller bids on own auctions to drive up the price		
Misrepresentation	Seller intentionally misdescribes the item		
Fee stacking	Seller adds hidden costs such as handling charges to the item after the auction ends		
Failure to ship	Seller never sends the goods		
Reproductions and counterfeits	Seller advertises counterfeit goods as the real thing		
Triangulation fencing	Stolen goods are sold		
Shell auction	Seller sets up an auction solely to obtain names and credit cards		

 Table 6.2.3.1.1
 Kinds of fraud perpetrated by sellers at online auctions

Buyer as fraudster		
Bid shielding	Two buyers collude on an auction. One bidder makes a low bid, while the second makes an inflated bid. Before the auction ends, the higher bidder withdraws	
Failure to pay	Buyer never sends the money	
Buy and switch	Buyer receives merchandise and refuses it. However, buyer switches original merchandise with inferior merchandise	
Loss or damage claims	Buyer claims item was damaged and buyer disposed of it. Buyer wants money back	

Table 6.2.3.1.2 Kinds of fraud perpetrated by buyers at online auctions<sup>289</sup>

Jun Gu from the University of Edinburgh presented a case study of eBay, the online auction site (Gu, 2007), and included a table comparing eBay to Sotheby's, a traditional auction company. See Table 6.2.3.1.3. "The potential shopping risks for a consumer who purchases at Sotheby's and EBay could be inferred from [...] major differences as revealed in the [...] table" (Gu, 2007, p. 3).

Internet auction fraud is also a domain researched, e.g., by Kwan et al. (2010). That study, carried out by computer scientists at King's College London and the University of Hong Kong, is concerned with Internet auction fraud involving the

<sup>&</sup>lt;sup>289</sup> Also consider *PayPal fraud* perpetrated by purchasers at eBay auctions. The following quotation is from section "PayPal fraud" at http://en.wikipedia.org/wiki/Internet\_fraud "In a *collection in person PayPal scheme*, the scammer targets eBay auctions that allow the purchaser to personally collect the item from the seller, rather than having the item shipped, and where the seller accepts PayPal as a means of payment. The fraudster uses a fake address with a post office box when making their bids, as PayPal will allow such an unconfirmed address. Such transactions are not covered by PayPal's seller protection policy. The fraudster buys the item, pays for it via PayPal, and then collects the item from the victim. The fraudster then challenges the sale, claiming a refund from PayPal and stating that they did not receive the item. PayPal's policy is that it will reverse a purchase transaction unless the seller can provide a shipment tracking number as proof of delivery; PayPal will not accept video evidence, a signed document, or any form of proof other than a tracking number as valid proof of delivery. This form of fraud can be avoided by only accepting cash from buyers who wish to collect goods in person."

	Sotheby's	eBay
Registration procedure for the buyer	Proof of identity (passport, driving license, etc.)	Providing a valid email address.
Registration procedure for the seller	<ol> <li>Evaluating the item for a decision of acceptance.</li> <li>Contracting with the seller if</li> </ol>	<ol> <li>Verifying the identity of Seller by phone or credit card.</li> </ol>
	that item has been accepted.	<ol> <li>Offering PayPal or a merchant account credit card as a payment method.</li> </ol>
Liability distribution	The Sotheby's, the seller, and the buyer.	The seller and the buyer
Criteria for a decision of purchase	Descriptions and examinations of the specific item.	Descriptions only.

Table 6.2.3.1.3 Sotheby's vs. eBay (based on Gu, 2007)

selling of faked goods in Hong Kong, and goods bearing false trade descriptions or forged trademarks.

Kwan et al. (2010) quoted from Ochaeta (2008) six steps in a safe Internet auction: (a) Initial buyers and sellers registration; (b) Setting up a particular auction event; (c) Scheduling and advertising; (d) Bidding (which handles the collection of bids from buyers); (e) Evaluation of bids and closing the auction; (f) Trade settlement. This last step involves payment, and the transfer of goods. At sites such as eBay, typically the seller is not the auctioneer, so the trade settlement step this final step involves the payment of fees to the auctioneer and other agents.

At the initial step, namely, the registration of the initial buyers and sellers, the authentication takes place of the trading parties. They exchange cryptography keys, and a profile is created for each trader. The profile states in which kinds of products the trader is interested, and possibly his or her authorized spending limits.

The second step, which is the setting up a particular auction event, consists of setting up of the protocol and rules of the auction. "Such rules include the descriptions of the items being sold or acquired, the type of auction being conducted (e.g. open cry, sealed bid, or Dutch), parameters negotiated (e.g. price, delivery dates, terms of payment), starting date and time of the auction, and the auction closing rules, etc." (Kwan et al., 2010).

At step (c), i.e., scheduling and advertising, typically involves items of the same category (such as art, or jewelry) being auctioned together on a regular schedule. This is done in order to draw the attention of potential buyers. "Popular auctions are sometimes mixed with less popular auctions. Items to be auctioned in upcoming auctions are also advertised. Potential buyers are notified of these upcoming events" (Kwan et al., 2010).

During the bidding step (i.e., step c), bids made by potential buyers are collected, the bid control rules of the auction are applied (involving minimum bid, bid increment, and deposits required with bids), and participants are notified when new higher bids are submitted. Next, step (d) consists of the evaluation of bids and the closing of the auction. Closing rules are implemented, and a notification is given to the winners and losers of the auction.

Whereas law enforcement agencies, the auction sites themselves, as well as newspaper articles advise users to be careful, to "be cautious at their end and perform background checks of sellers that they wish to transact with. Such suggestions however, require users to maintain constant vigilance and spend a considerable amount of time and effort in investigating potential dealers before carrying out a transaction" (Pandit, Chau, Wang, & Faloutsos, 2007, p. 202), this is not really helpful, and merely shifts the burden of responsibility to the users: "Such suggestions however, require users to maintain constant vigilance and spend a considerable amount of time and effort in investigating potential dealers before carrying out a transaction. To overcome this difficulty, self-organized vigilante organizations are formed, usually by auction fraud victims themselves, to expose fraudsters and report them to law enforcement agencies" (ibid.), but such grassroots efforts are not sufficient. Hence the usefulness of the advice a data mining tool, *NetProbe* (see in Sections 6.2.3.2 and 6.2.3.3), can give users by actually checking the stream of transactions of all users in order to identify likely fraudsters. "Specifically, NetProbe [...] is able to spot sellers that are prone to commit the 'non-delivery' type of fraud. idea is that such sellers usually have 'accomplices', that is, nodes with good reputation, who have never committed any fraud, but are willing to give good feedback scores to the fraudsters-to-be."290

There exist *reputation systems* (Resnick, Zeckhauser, Friedman, & Kuwabara, 2000; Resnick, Zeckhauser, Swanson, & Lockwood, 2003; Melnik & Alm, 2002), and these are used by the online auction sites. "But they are usually very simple and can be easily foiled" (Pandit et al., 2007, p. 202). Neverthelsss, reputation systems are applied extensively, and they do have an impact on patterns of behaviour: "In an overview, Resnick et al. [(2000)] summarized that modern reputation systems face many challenges which include the difficulty to elicit honest feedback and to show faithful representations of users' reputation. Despite their limitations, reputation systems have had a significant effect on how people buy and sell" (Pandit et al., 2007, p. 202). The following is quoted from a Wikipedia entry<sup>291</sup>:

A *reputation system* computes and publishes reputation scores for a set of objects (e.g. service providers, services, goods or entities) within a community or domain, based on a collection of opinions that other entities hold about the objects. The opinions are typically passed as ratings to a reputation center which uses a specific reputation algorithm to dynamically compute the reputation scores based on the received ratings.

Entities in a community use reputation scores for decision making, e.g. whether or not to buy a specific service or good. An object with a high reputation score will normally attract more business that an object with a low reputation score. It is therefore in the interest of objects to have a high reputation score.

Since the collective opinion in a community determines an object's reputation score, reputation systems represent a form of collaborative sanctioning and praising. A low score represents a collaborative sanctioning of an object that the community perceives as having

<sup>&</sup>lt;sup>290</sup> From a project report by C. Faloutsos, at http://www.cs.cmu.edu/~christos

<sup>&</sup>lt;sup>291</sup> http://en.wikipedia.org/wiki/Reputation\_system

or providing low quality. Similarly, a high score represents a collaborative praising of an object that the community perceives as having or providing high quality. Reputation scores change dynamically as a function of incoming ratings. A high score can quickly be lost if rating entities start providing negative ratings. Similarly, it is possible for an object with a low score to recover and regain a high score.

Reputation systems are related to *recommender systems*<sup>292</sup> and *collaborative filtering*,<sup>293</sup> but with the difference that reputation systems produce scores based on explicit ratings from the community, whereas recommender systems use some external set of entities and events (such as the purchase of books, movies, or music) to generate marketing recommendations to users. The role of reputation systems is to facilitate trust (Resnick et al., 2000) (Jøsang, Ismail, & Boyd, 2007), and often functions by making the reputation more visible.

Reputation systems are often useful in large online communities in which users may frequently have the opportunity to interact with users with whom they have no prior experience or in communities where user generated content is posted like YouTube or Flickr. In such a situation, it is often helpful to base the decision whether or not to interact with that user on the prior experiences of other users.

Reputation systems may also be coupled with an incentive system to reward good behavior and punish bad behavior. For instance, users with high reputation may be granted special privileges, whereas users with low or unestablished reputation may have limited privileges.

Concerning types of reputation systems, the same entry explains concisely:

A simple reputation system, employed by eBay, is to record a rating (either positive, negative, or neutral) after each pair of users conducts a transaction. A user's reputation comprises the count of positive and negative transactions in that user's history.

More sophisticated algorithms scale an individual entity's contribution to other node's reputation by that entity's own reputation. PageRank is such a system, used for ranking web pages based on the link structure of the web. In PageRank, each web page's contribution to another page is proportional to its own pagerank, and inversely proportional to its number of outlinks.<sup>294</sup>

Reputation systems are also emerging which provide a unified, and in many cases objective, appraisal of the impact to reputation of a particular news item, story, blog or online posting. The systems also utilize complex algorithms to firstly capture the data in question but then rank and score the item as to whether it improves or degrades the reputation of the individual, company or brand in question.

### 6.2.3.2 Data Mining and Online Auction Fraud: Techniques in the Background of NetProbe

Jung, Han, and Suh (1999) applied case-based reasoning to the categorisation of the risk involved in electronic commerce transactions. A team from Carnegie Mellon

<sup>&</sup>lt;sup>292</sup> See at http://en.wikipedia.org/wiki/Recommendation\_system concerning *recommender systems*, also called *recommendation systems*. Cf. Leskovec, Singh, and Kleinberg (2006), "Patterns of Influence in a Recommendation Network".

<sup>&</sup>lt;sup>293</sup> For collaborative filtering, see at http://en.wikipedia.org/wiki/Collaborative\_filtering

 $<sup>^{294}</sup>$  The algorithm of PageRank (Brin & Page, 1998) was already outlined, it was eventually realised, in the notion of Katz centrality in a social network (Katz, 1953). See Section 6.1.2.1 in this book. a team in Seoul (Phuoc et al., 2009), interested in a good ranking system for World Wide Web search engines, compared the Katz status index, an old model, to *PageRank*.

University - comprising Shashank Pandit, Duen Horng Chau, Samuel Wang, and Christos Faloutsos - described NetProbe, a fast and scalable data mining system which they designed and implemented, for fraud detection in online auction networks (Pandit et al., 2007).<sup>295</sup> Experiments with NetProbe as reported in Pandit et al. (2007) were conducted on a synthetic dataset of very large graphs with as many as 7,000 nodes and 30,000 edges. Experiments were also conducted on a real dataset crawled from the eBay online auction website. This real dataset was "with nearly 700,000 transactions between more than 66,000 users, where NetProbe was highly effective at unearthing hidden networks of fraudsters, within a realistic response time of about 6 minutes" (Pandit et al., 2007, p. 201). It is a recognised fact among scholars that the social networks, let alone the networks of transactions, of criminal organisations are dynamic. Pandit et al. (ibid.) came up with a solution: "For scenarios where the underlying data is dynamic in nature, we propose *Incremental NetProbe*, which is an approximate, but fast, variant of NetProbe. Our experiments prove that Incremental NetProbe executes nearly doubly fast as compared to NetProbe, while retaining over 99% of its accuracy".

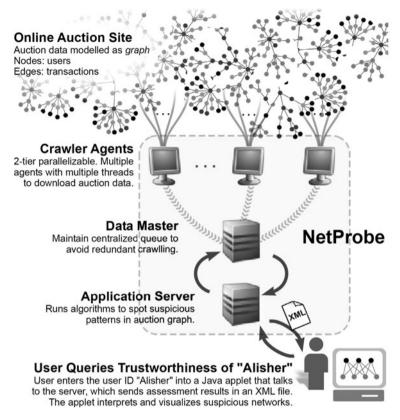
Figure 6.2.3.2.1 shows an overview of the NetProbe system. NetProbe systematically analyses the transactions of users of online auction sites, and offers users the advantage that they can query the trustworthiness of any other user, and the query results are visually explained to the user through an interface. The general problem is that fraudsters build for themselves a reputation at the online auction site, by behaving correctly for a while. Once they hit, they are burnt out, but they can still trade through accomplices who still have a good reputation at the same auction site.

In NetProbe, users and transactions were modelled as a *Markov random field* (*MRF*) which is tuned for the detection of suspicious patterns generated by fraudsters. MRFs are suitable for such problem-solving about inference, that there is uncertainty in observed data.<sup>296</sup> A *Markov random field* (*MRF*) is a probabilistic

<sup>&</sup>lt;sup>295</sup> A different team, Yungchang Ku, Yuchi Chen and Chaochang Chiu, also proposed a data mining approach for detecting potential fraudsters at online auction sites (Ku et al., 2007a). Their approach is based on social network analysis and on a decision tree. The intended users are prospective buyers.

<sup>&</sup>lt;sup>296</sup> A now old book about Markov random fields is the one by Ross Kindermann and J. Laurie Snell (1980). MRFs have been discussed in the artificial intelligence literature about *belief propagation* (e.g., Yedidia, Freeman, & Weiss, 2003). Moreover, MRFs can be used for a wide variety of machine vision or image processing problems, e.g. Mitchell (2010), Li (2009), Jin, Fieguth, and Winger (2005, cf. 2006), Kato and Pong (2001), Feng and Chen (2004). Yuri Boykov, Olga Veksler and Ramin Zabih (1998) combined MRFs with *graph cuts*: they reduced stereo vision to a *multi-way cut problem* on a certain graph. Boykov et al. (1998) "focus on MRFs with two-valued clique potentials, which form a generalized Potts model. We show that the maximum a posteriori estimate of such an MRF can be obtained by solving a multiway minimum cut problem on a graph. We develop efficient algorithms for computing good approximations to the minimum multiway, cut. The visual correspondence problem can be formulated as an MRF in our framework" (ibid., from the abstract). They also applied their "techniques to MRFs with linear clique potentials" (ibid.).

Also see Wu and Chung (2005a, 2005b): they "introduce[d] a novel energy minimization method, namely iterated cross entropy with partition strategy (ICEPS), into the Markov random field theory. The solver, which is based on the theory of cross entropy, is general and stochastic. Unlike some popular optimization methods such as belief propagation (BP) and graph cuts (GC),



**Fig. 6.2.3.2.1** An overview of the NetProbe system. By kind permission of "Polo" Chau of Carnegie Mellon University, and by kind permission of the Secretariat of IW3C2 for the WWW conferences. From Pandit et al. (2007)

ICEPS makes no assumption on the form of objective functions and thus can be applied to any type of Markov random field (MRF) models. Furthermore, compared with deterministic MRF solvers, it achieves higher performance of finding lower energies because of its stochastic property. We speed up the original cross entropy algorithm by partitioning the MRF site set and assure the effectiveness by iterating the algorithm. In the experiments, we apply ICEPS to two MRF models for medical image segmentation and show the aforementioned advantages of ICEPS over other popular solvers [...]" (Wu & Chung, 2005a, from the abstract).

Hiroshi Ishikawa (2003) proposed a method to solve exactly a first order Markov random field optimization problem, more generally than available before. "The MRF shall have a prior term that is convex in terms of a linearly ordered label set. The method maps the problem into a minimumcut problem for a directed graph, for which a globally optimal solution can be found in polynomial time. The convexity of the prior function in the energy is shown to be necessary and sufficient for the applicability of the method" (ibid., from the abstract).

Du, Li, Chen, Zhang, and Yao (2006) combined MRFs with the well-known *simulated annealing* optimisation technique (itself inspired by annealing in metallurgy, which involves heating and

model defined by local conditional probabilities. The concept is useful for devising contextual models with prior information: Markov random field theory is typically resorted to in order modeling context dependent entities (such as, in image processing within computer science, image pixels). Basically, an MRF is an undirected graph, that is to say, the edges between pairs of nodes are not arrows. Each node in a MRF can be in any of a finite number of states. The state of a node statistically depends upon each of its neighbours (i.e., those nodes to which the given node is connected by an edge), and upon no other node in the graph. A propagation matrix, symbolised as  $\psi$ , represents the dependency between a node and its neighbours in the given MRF. Each case  $\psi(i, j)$  in the matrix has a value which is equal to the probability of a node *i* being in state *j* given that it has a neighbour in state *i*. If an assignment of states to the nodes in a MRF is given, then by using the propagation matrix it is possible to compute a likelihood of observing that assignment. The problem of inferring the maximum likelihood assignment of states to nodes, where the correct states for some of the nodes are possibly known before hand, is solved by those using MRFs by resorting to heuristic techniques,<sup>297</sup> and

controlled cooling) as well as with optimisation by means of a genetic algorithm, for the purposes of image segmentation. In annealing from metallurgy, the heat causes the atoms to become unstuck from their initial positions and wander randomly through states of higher energy. Their being cooled slowly gives them more chances of finding configurations with lower internal energy than the initial one. In simulated annealing, each step of the algorithm replaces the current solution by a nearby solution, chosen randomly with a probability that depends both on the difference between the corresponding function values and also on a global parameter called the *temperature*. The temperature is gradually decreased during the process. The dependency is such that the current solution changes almost randomly when the temperature is large, but increasingly downhill as the temperature goes to zero. Allowing uphill moves potentially saves the method from becoming stuck at local optima. (For convenience, this explanation is partly reworded from http://en.wikipedia.org/ wiki/Simulated\_annealing) Uphill and downhill belong to the standard terminology of operations research (i.e., optimisation techniques), as moving towards a minimum or a maximum is metaphorised as moving through rough terrain. The *Boltzmann machine* is a neural network that uses the idea of simulated annealing for updating the network's state (Ackley, Hinton, & Sejnowski, 1985). <sup>297</sup> This is so because enumerating all states would be exponential in time, and because of the lack of any known theoretic method that would solve this problem for a general MRF. Wu & Chung explained (2005a, p. 230), concerning various methods (including belief propagation, or alternatively simulated annealing, or iterated conditional modes, or graph cuts, or mean field approximation, or relaxation labelling, or graduated nonconvexity), as well as their own application of cross entropy:

One of the earliest efforts to optimize MRF objective functions was made by Kirkpatrick, Gellatt, and Vecchi [(1983)] who proposed the solver, simulated annealing (SA). SA can guarantee to converge to a global minimum as long as the temperature is decreasing slowly enough which makes SA too slow for practical use especially for clinical data. Another pioneering work was done by Besag [(Besag, 1986)], where the iterated conditional modes (ICM) was presented. This is a fast solver at the cost that it finds local optima in a neighborhood where only one site label is allowed to change. After those two methods, quite a few solvers were introduced [(Li, 2009, 3rd edn., this citation is to the previous edn. 2001)], such as mean field approximation (MFa), relaxation labeling (RL), graduated non-convexity (GNC), etc. Recently two efficient and fairly accurate solvers, belief propagation (BP) [(Yedidia et al., 2003)] and graph cuts (GC) [(Boykov, Veksler, & Zabin, 2001)], were

an especially powerful heuristic method to do that is the *iterative message passing scheme* of the *belief propagation* algorithm.

In order to detect likely fraudsters, a *belief propagation* mechanism was resorted to in NetProbe, that algorithm being generally used in order to infer the maximum likelihood state probabilities of nodes in the MRF, given a propagation matrix and possibly a prior state assignment for some of the nodes. The standard notions about belief propagation are as follows:

- Let vectors be indicated in a bold font, as opposed to scalars. The *k*th element in a vector **v** is indicated as **v**(*k*).
- Let *S* be the set of possible states in which a node can be.
- Let  $\mathbf{b}_n(\sigma)$  stand for the probability that node *n* is in state  $\sigma$ . That probability is called the *belief* that *n* is in state  $\sigma$ .
- Nodes pass *messages* to each other. Iterative message passing is how belief propagation works. "Let  $\mathbf{m}_{ij}$  denote the message that node *i* passes to node *j*.  $\mathbf{m}_{ij}$  represents *i*'s opinion about the belief of *j*. At every iteration, each node i computes its belief based on messages received from its neighbors, and uses the propagation matrix to transform its belief into messages for its neighbors" (Pandit et al., 2007, p. 203).  $\mathbf{m}_{ij}$  is a message vector.  $\mathbf{m}_{ij}$  ( $\sigma$ ) is the  $\sigma$ th element of that vector.
- Let *N*(*i*) be the set of nodes that are the neighbours of node *i*.
- Let *k* be a normalisation constant.

proposed. These two solvers are now often used for MRF models because they give good accuracy in an efficient way, which means they can find "global" optima within a rather large neighborhood while maintaining acceptable time complexity. [...] BP and GC are not applicable to all types of objective functions. They obtain their accuracy at the cost of function form restrictions. For example, standard BP is only proper for pairwise MRFs and generalized BP is either not for all functions [(Yedidia et al., 2003)]. So we cannot solve by BP such MRF models as FRAME [(Zhu, Wu, & Mumford, 1996, cf. 1998)] or multi-level logistic (MLL) with more than two sites in a clique [(Li, 2001)]. The same situation occurs for graph cuts because GC will work only when the energy function is regular [(Kolmogorov & Zabih, 2004)]. These may considerably limit the usage of the two popular solvers. In this paper, we proposed a new simple stochastic solver for MRF modeling, called cross entropy (CE). This idea is originated from the field of operations research to simulate rare events [(Rubinstein, 1997)]. This paper combines the idea of CE with MRF theory for the first time and applies the whole model to medical image segmentation. The CE solver is a general and stochastic optimization method that can be applied to any kind of MRF formulation. Unlike BP and GC, CE makes no assumption on the form of the objective function so it is able to solve more complicated MRF models. The efficient CE solver is completely insensitive to initialization and more importantly, as a stochastic method, CE tends to find more global optimum than deterministic solvers like BP.

Then this pair of value assignment formulae holds, in belief propagation:

$$\begin{array}{lcl} \mathbf{m}_{ij}(\sigma) & \leftarrow & \displaystyle \sum_{\sigma'} \psi(\sigma',\sigma) \prod_{n \in N(i) \setminus j} \mathbf{m}_{ni}(\sigma') \\ \mathbf{b}_i(\sigma) & \leftarrow & \displaystyle k \prod_{j \in N(i)} \mathbf{m}_{ji}(\sigma) \end{array}$$

The first formula states that the messages that node *i* passes to node *j* (that is to say, *i*'s opinion about the belief of *j* in state  $\sigma$ ) is assigned the value obtained by multiplying the sums of all the propagation matrix cells which are the likelihoods that a node is in state  $\sigma$  given that is has a neighbour in state  $\sigma'$ , for the products (done for all such nodes *n* other than *j* that are *i*'s neighbours) of node *n*'s opinion about the belief of *i* in state  $\sigma'$ .

The second formula states that the belief of *i* in state  $\sigma$  (that is to say, the probability that node *i* is in state  $\sigma$ ) is assigned as value a normalisation constant multiplied for the products of the messages that node *j* passes to node *i* (that is to say, *j*'s opinion about the belief of *i* in state  $\sigma$ ), for all such *j* that *j* is a neighbour of node *i*.

The standard algorithm is as follows: "Starting with a suitable prior on the beliefs of the nodes, belief propagation proceeds by iteratively passing messages between nodes based on previous beliefs, and updating beliefs based on the passed messages. The iteration is stopped when the beliefs converge (within some threshold), or a maximum limit for the number of iterations is exceeded" (Pandit et al., 2007, p. 203). "In case there is no prior knowledge available, each node is initialized to an unbiased state (i.e., it is equally likely to be in any of the possible states), and the initial messages are computed by multiplying the propagation matrix with these initial, unbiased beliefs" (ibid., fn 4).

*Fraud detection* as a domain of application of link analysis is related to two other application domains: *trust propagation*, and *authority propagation*. The latter's goal is to rank webpages by importance: a webpage is considered to be important, if webpages that are themselves considered important point to it. This kind of computation is carried out by *PageRank* (Brin & Page, 1998)<sup>298</sup> and by *HITS* (Kleinberg,

<sup>&</sup>lt;sup>298</sup> Brin and Page were affiliated with Stanford University when they published that paper, in which they explained how Google crawls and indexes the Web. They explained: "Google is designed to crawl and index the Web efficiently and produce much more satisfying search results than existing systems. The prototype with a full text and hyperlink database of at least 24 million pages is available at http://google.stanford.edu/ To engineer a search engine is a challenging task. Search engines index tens to hundreds of millions of web pages involving a comparable number of distinct terms. They answer tens of millions of queries every day. Despite the importance of large-scale search engines on the web, very little academic research has been done on them. Furthermore, due to rapid advance in technology and web proliferation, creating a web search engine today is very different from three years ago. This paper provides an in-depth description of our large-scale web search engine — the first such detailed public description we know of to date. Apart from the problems of scaling traditional search techniques to data of this magnitude, there are new technical challenges involved with using the additional information present in hypertext to produce better search results" (from the abstract of Brin & Page, 1998).

1998).<sup>299</sup> By contrast, the goal of trust propagation is to distinguish good from bad websites, bad ones being those of scams (phishing), or ones with pornography. An example of a trust propagation system is *TrustRank* (Gyongyi, Molina, & Pedersen, 2004).<sup>300</sup> Pandit et al. (2007, p. 203) also stated affinity between their own project and that of Neville and Jensen (2003), Neville, Jensen, and Friedland (2003), and Neville et al. (2005), who respectively carried out automated classification of movies<sup>301</sup> and stock databases by aggregating features across

<sup>&</sup>lt;sup>299</sup> In the conclusions section, Kleinberg (1998) stated, among the other things: "We began with the goal of discovering *authoritative pages*, but our approach in fact identifies a more complex pattern of social organization on the WWW [i.e., the World Wide Web], in which hub pages link densely to a set of thematically related authorities. This equilibrium between hubs and authorities is a phenomenon that recurs in the context of a wide variety of topics on the WWW. Measures of impact and influence in bibliometrics have typically lacked, and arguably not required, an analogous formulation of the role that hubs play; the www is very different from the scientific literature, and our framework seems appropriate as a model of the way in which authority is conferred in an environment such as the Web."

<sup>&</sup>lt;sup>300</sup> Zoltan Gyongyi, Hector Garcia-Molina, and Jan Pedersen has published that article while at Stanford University. They explained: "Web spam pages use various techniques to achieve higher-than-deserved rankings in a search engine's results. While human experts can identify spam, it is too expensive to manually evaluate a large number of pages" (from the abstract of Gyongyi et al., 2004). As an alternative, the paper "propose[d] techniques to semi-automatically separate reputable, good pages from spam. We first select a small set of seed pages to be evaluated by an expert. Once we manually identify the reputable seed pages, we use the link structure of the web to discover other pages that are likely to be good. In this paper we discuss possible ways to implement the seed selection and the discovery of good pages" (ibid.). Experiments whose results were presented in the paper had been "run on the World Wide Web indexed by AltaVista and evaluate the performance of our techniques. Our results show that we can effectively filter out spam from a significant fraction of the web, based on a good seed set of less than 200 sites" (ibid.).

<sup>&</sup>lt;sup>301</sup> Neville and Jensen (2003, p. 78): "In this paper, we introduce relational dependency networks (RDNs), an undirected graphical model for relational data. We show how RDNs can be learned and how RDNs and Gibbs sampling can be used for collective classification. Because they are undirected graphical models, RDNs can represent the cyclic dependencies required to express autocorrelation, and they can express a joint probability distribution, rather than only a single conditional distribution. In addition, they are relatively simple to learn and easy to understand. We show preliminary results indicating that collective inference with RDNs offers improved performance over non-collective inference that we term 'individual inference'. We also show that RDNs applied collectively can perform near the theoretical ceiling achieved if all labels of neighbors are known with perfect accuracy. These results are very promising, indicating the potential utility of additional exploration of collective inference with RDNs." In the example dataset from the movie domain, there are three types of objects: movies, studios, and actors (ibid., p. 83).

nodes in a graph.<sup>302</sup> Neville et al.  $(2005)^{303}$  explained (ibid., from the abstract):

We describe an application of relational knowledge discovery to a key regulatory mission of the National Association of Securities Dealers (NASD). NASD is the world's largest private-sector securities regulator,<sup>304</sup> with responsibility for preventing and discovering misconduct among securities brokers. Our goal was to help focus NASD's limited regulatory resources on the brokers who are most likely to engage in securities violations. Using statistical relational learning algorithms, we developed models that rank brokers with respect to the probability that they would commit a serious violation of securities regulations in the near future. Our models incorporate organizational relationships among brokers (e.g., past coworker), which domain experts consider important but have not been easily used before now.

<sup>303</sup> Neville et al. (2005) was jointly authored by a computer scientists team from the University of Massachusetts at Amherst (Jennifer Neville, Özgür Şimşek, and David Jensen), and a team from NASD, the National Association of Securities Dealers (John Komoroske, Kelly Palmer, and Henry Goldberg). In 2011, Jennifer Neville was affialiated with Purdue University in West Lafayette, Indiana.

<sup>304</sup> NASD is in Washington, D.C. It was established in 1939. "NASD has a nationwide staff of more than 2,000, and its regulatory responsibility now includes 5,200 securities firms that operate more than 100,000 branch offices and employ 660,000 individual securities brokers" (Neville et al., 2005, section 2.1).

<sup>&</sup>lt;sup>302</sup> Besides, Pandit et al. (2007, p. 203) considered *graph mining* to be more remotely related to their own research on NetProbe. In particular, whereas NetProbe carries out systematic, large-scale checks on auction site user transactions, in graph mining either topologies are uncovered on the Web, or then fast algorithms are devised with the task of searching and mining for specific, or frequent graph patterns. Examples of such graph mining algorithms are embodied in tools such as *gSpan* (Yan & Han, 2002) for mining frequent subgraph patterns (cf. Yan, Zhu, Yu, & Jan, 2006) – a task which falls within *frequent pattern mining* (of which Han et al., 2007 is a survey) – and the *GraphMiner* system (Wang et al., 2005). Related algorithms were described in Pei, Jiang, and Zhang (2005), Yan, Zhou, and Han (2005), and Zeng, Wang, Zhou, and Karypis (2006). The latter proiposed a graph mining algorithm called *Cocain*.

Temporal data mining was surveyed by Laxman and Sastry (2006). Discovering frequent patterns in an event sequence fits in that area, whereas episode mining fits in both that area, and graph mining. "Discovering patterns in a sequence is an important aspect of data mining. One popular choice of such patterns are episodes, patterns in sequential data describing events that often occur in the vicinity of each other. Episodes also enforce in which order events are allowed to occur" (Tatti & Cule, 2010, from the abstract). "A pattern in a sequence is usually considered to be a set of events that reoccurs in the sequence within a window of a specified length. Gaps are allowed between the events and the order in which the events occur is often also considered important. Frequency, the number of sliding windows in which the episode occurs, is monotonically decreasing" (ibid., section 1). "The order restrictions of an episode are described by a directed acyclic graph (DAG): the set of events in a sequence covers the episode if and only if each event occurs only after all its parent events (with respect to the DAG) have occurred [...] Usually, only two extreme cases are considered. A parallel episode poses no restrictions on the order of events, and a window covers the episode if the events occur in the window, in any order. In such a case, the DAG associated with the episode contains no edges. The other extreme case is a serial episode. Such an episode requires that the events occur in one, and only one, specific order in the sequence. Clearly, serial episodes are more restrictive than parallel episodes. If a serial episode is frequent, then its parallel version is also frequent." (ibid.). Also see Tatti (2009), Zhou et al. (2010), Gwadera et al. (2005a, 2005b), Casas-Garriga (2003), and Mannila, Toivonen, and Verkamo (1997).

There may be an ethical and perhaps even legal problem with this, because a person may find him- or herself considered guilty by association. But what is being evaluated is not guilt, but reputation. Association with disreputable players tarnishes one's own reputation as well. NASD already had a database of brokers, called *CRD* (*Central Registration Depository*), in operation since 1981.<sup>305</sup>

Neville et al. (2005, p. 449) indicated the limitations of handcrafted rules in use at NASD before machine learning was applied:

NASD currently identifies higher-risk brokers using a set of handcrafted rules. These rules are based on information intrinsic to the brokers such as the number and type of past violations. They do not exploit social, professional, and organizational relationships among brokers even though NASD experts believe this information is central to the task. Indeed, fraud and malfeasance are usually social phenomena, communicated and encouraged by the presence of other individuals who also wish to commit fraud [(Cortes et al., 2001)]. It is, however, difficult to accurately specify these patterns manually. As such, relational learning methods have the potential to improve current techniques.

Neville et al. (2005, p. 457) claimed that the findings of their own project supported the general beliefs at NASD, while reaching predictions differently:

NASD staff began this project contending that information about the professional and organizational networks that connect brokers would provide useful information for determining their risk for serious violations of securities regulations. The results of this research have borne out those beliefs. Our relational models provide predictions that are competitive with, but significantly different from, the predictions provided by NASD's hand-tuned rules, which only examined brokers and their disclosures, ignoring additional relational information such as coworkers at present and past firms. These models show important potential for NASD's screening process. They identified higher-risk brokers not previously identified by the NASD rules, and thus provided additional targets for NASD examinations. Furthermore, being identified as higher-risk by both our models and the HRB model<sup>306</sup> model was found

<sup>&</sup>lt;sup>305</sup> As stated by Neville et al. (2005, section 2.2): "CRD was established to aid in the licensing and registration of its broker-dealers and the brokers who work for them. CRD maintains information on all federally registered broker-dealers and brokers for the SEC [i.e., the U.S. Securities and Exchange Commission], NASD, the states, and other federally authorized private sector regulators, such as the New York Stock Exchange. Originally implemented in June 1981, CRD has grown to include data on approximately 3.4 million brokers, 360,000 branches, and 25,000 firms. For firms, CRD information includes data such as ownership and business locations. For individual brokers, CRD includes qualification and employment information. Information in CRD is self-reported by the registered firms and brokers, although incorrect or missing reports can trigger regulatory action by NASD."

<sup>&</sup>lt;sup>306</sup> The HRB model is NASD's identification of *high-risk brokers* by handcrafted rules. Neville et al. explained (2005, section 3): "Currently, NASD generates a list of higher-risk brokers (HRB) using a set of handcrafted rules they have formed using their domain knowledge and experience. This approach has two weaknesses we aim to address. First, the handcrafted rules simply categorize the brokers as 'higher-risk' and 'lower-risk' rather than providing a risk-ordered ranking. A ranking would be more useful to examiners as it would allow them to focus their attention on brokers considered to have the highest risk. Second, NASD's handcrafted rules use only information intrinsic to the brokers. In other words, they do not utilize relational context information such as the conduct of past and current coworkers. NASD experts believe that organizational relationships can play an important role in predicting serious violations. For example, brokers that have had serious violations in the past may influence their coworkers to participate in future schemes. Furthermore,

to be more predictive of future problems than being identified by either model alone, thus permitting NASD to focus examinations on those most likely to have a serous violation in the near future. And finally, the probability estimates assigned to brokers by our models in general agreed with the subjective ratings of NASD examiners, thus the ranking provided by our models can be used to prioritize examiners' attention.<sup>307</sup>

We now go back to NetProbe. In NetProbe, the "key idea is to infer properties for a user based on properties of other related users. In particular, given a graph representing interactions between auction users, the likelihood of a user being a fraudster is inferred by looking at the behaviour of its immediate neighbors" (Pandit et al., 2007, p. 203). This is why trust propagation and authority propagation research are akin to the method of NetProbe. Some "non-trivial design and implementation decisions" were made by the Carnegie Mellon team "while developing NetProbe. In particular, we discuss the following contributions: (a) a parallelizable crawler that can efficiently crawl data from auction sites, (b) a centralized queuing mechanism that avoids redundant crawling, (c) fast, efficient data structures to speed up our fraud detection algorithm, and (d) a user interface that visually demonstrates the suspicious behavior of potential fraudsters to the end user" (Pandit et al., 2007, p. 202).

#### 6.2.3.3 How NetProbe Works

In NetProbe, it was the transactions between users that were modelled as a graph, a *Markov random field (MRF)* indeed (we provided a definition for this in the previous subsection; see Section 6.2.3.2). Each node stands for a user. Each edge stands for one or more transactions between pairs of users. If there is an edge between two

some firms tend to be associated with continuous misconduct (i.e., they do not regulate their own employees and may even encourage violations). Lastly, higher-risk brokers sometimes move from one firm to another collectively, operating in clusters, which heightens the chance of regulatory problems. A model that is able to use relational context information has the potential to capture these types of behavior and provide more accurate predictions."

<sup>&</sup>lt;sup>307</sup> Neville et al. (2005, p. 457) also indicated some limitations: "That said, the available data provide only relatively weak abilities to exploit the relational aspects of the domain. In CRD, individual brokers are directly related only through firms. Even branch relationships have to be inferred from address information, although this limitation will be obviated beginning this October [2005] when each broker will be systematically linked to a branch. More importantly, we do not know which individual brokers work together directly, nor what other social or organizational relationships they may share. To enhance their knowledge of potential links among individuals, NASD is investigating other recent technologies, most notably the NORA (Non-Obvious Relationship Awareness) system produced by Systems Research and Development, a Nevada-based company recently acquired by IBM. Such relationships could add substantially to the data analyzed in the work reported here, which could only use branch and firm relations present in CRD. The work reported here also exemplifies a framework that may be useful to projects that seek to develop screening tools to aid field examiners working in other domains such as health care, insurance, banking, and environmental health and safety. In such cases, development of a labeled training set may be impractical in the initial stages of a project. While the most accurate class labels would be the judgments of examiners, examiners' time is typically limited and organizations may be understandably skeptical about devoting large amount of examiners' time to labelling data sets."

nodes, this indicates that the two users for whom the two nodes stand, have transacted at least once. Each node can be in one out of three states, namely, fraud, accomplice, or honest, or then its state may be undetermined, in the sense that NetProbe does not assign a state to that node. Pandit et al. (2007, p. 204) pointed out the similarity to authority propagation as used in order to rank the importance of webpages (see in the Section 6.2.3.2):

As is the case with hyper-links on the Web (where PageRank [(Brin & Page, 1998)] posits that a hyper-link confers authority from the source page to the target page), an edge between two nodes in an auction network can be assigned a definite semantics, and can be used to propagate properties from one node to its neighbors. For instance, an edge can be interpreted as an indication of similarity in behavior — honest users will interact more often with other honest users, while fraudsters will interact in small cliques of their own (to mutually boost their credibility). This semantics is very similar in spirit to that used by TrustRank [(Gyongyi et al., 2004)], a variant of PageRank used to combat Web spam. Under this semantics, honesty/fraudulence can be propagated across edges and consequently, fraudsters can be detected by identifying relatively small and densely connected subgraphs (near cliques). However, our previous work [(Chau et al., 2006)] suggests that fraudsters do not form such cliques. [...] Instead, we uncovered a different modus operandi for fraudsters in auction networks, which leads to the formation of *near bipartite cores*.<sup>308</sup> Fraudsters create two types of identities and arbitrarily split them into two categories — fraud and accomplice. The fraud identities are the ones used eventually to carry out the actual fraud, while the accomplices exist only to help the fraudsters carry out their job by boosting their feedback rating. Accomplices themselves behave like perfectly legitimate users and interact with other honest users to achieve high feedback ratings. On the other hand, they also interact with the fraud identities to form near bipartite cores, which helps the fraud identities gain a high feedback rating. Once the fraud is carried out, the fraud identities get voided by the auction site, but the accomplice identities linger around and can be reused to facilitate the next fraud.

NetProbe uses the propagation matrix in order to detect *bipartite* cores in the graph. In NetProbe, a particular propagation matrix was devised, so that the belief propagation mechanism would suite the behaviour of fraudsters and their accomplices. The intuition (Pandit et al., 2007, pp. 204–205) was that a fraudster would avoid linking to another fraudster. Rather, a fraudster would link heavily to accomplices.

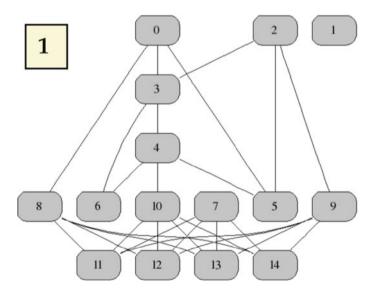
<sup>&</sup>lt;sup>308</sup> What is meant is that inside the graph which represents the online auction site, one expects to find such subsets of the nodes (i.e., such subsets of the users), that the given subset is a *complete bipartite graph*. That is to say, the given subset could be divided into two subsubsets, and each node in either subsubset has edges linking it to all nodes in the other subsubset. If we replace "all" with "one or more of the", then we would have a *bipartite graph* that is not a *complete bipartite graph*. This is also a possibility that is relevant for detecting fraudsters and their accomplices at sites like eBay. In the application at hand, which is to fraudsters at an online auction site, a fraudster is linked to all of his or her accomplices, but two or more fraudsters may share accomplices. If a particular fraudster is the only fraudster using his or her accomplices, that is to say, if the fraudster has exclusive use of his or her accomplices, then one of the two subsubsets in the (complete) bipartite core is a singleton set, i.e., such a set that it only contains one element. It may also be that if the subsubset comprising the fraudsters comprises more than one fraudster, then the bipartite core is *not* a complete bipartite graph, because it may be that one of the fraudsters in the fraudsters' subsubset is only using some of the accomplices of another fraudster in that subsubset, and the former fraudster may be using as well some accomplices that the latter fraudster is not using.

<b>Table 6.2.3.3.1</b> NetProbe'spropagation matrix		Node state		
	Neighbour state	Fraud	Accomplice	Honest
	Fraud Accomplice Honest	ε 0.5	1 - 2 2 $\epsilon$ $(1 - \epsilon)/2$	$\epsilon$ $0.5 - 2\epsilon$ $(1 - \epsilon)/2$

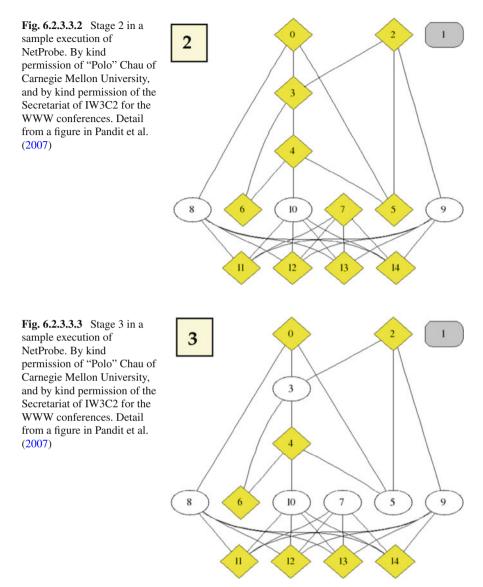
An accomplice, instead, would link to both honest nodes, and fraudsters, but the accomplice has a higher affinity for fraudsters. As to honest nodes (i.e., innocent users), they link to honest nodes as well as to accomplices, because the honest user believes that the accomplice to be honest.

Pandit et al. (2007, p. 205) gave the table shown here as Table 6.2.3.3.1, and in particular, in their experiments they found it useful to set the value of  $\varepsilon$  to 0.05. Each case in the table denotes the probability that the given node is in the state identified by the column, given that this node itself has a neighbour in the state identified by the row.

In the running example shown in Figs. 6.2.3.3.1, 6.2.3.3.2, 6.2.3.3.3, 6.2.3.3.4, 6.2.3.3.5, and 6.2.3.3.6, the graph consists of users numbered from 0 to 14, and of these, nodes 7–14 are a bipartite core. All nodes are initially given the value "unbiased", in the sense that they are equally likely to be honest, or a fraudster, or

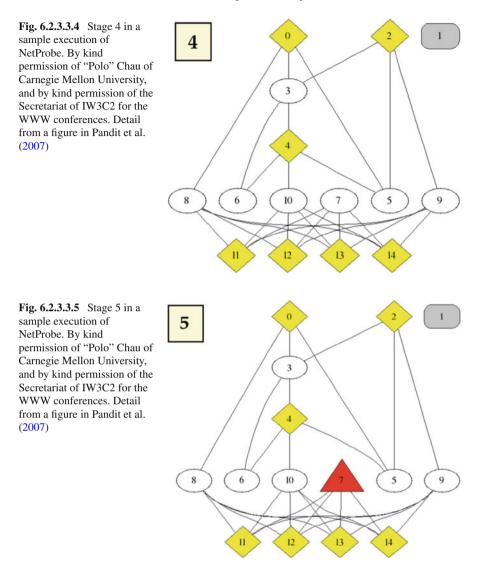


**Fig. 6.2.3.3.1** Stage 1 in a sample execution of NetProbe. By kind permission of "Polo" Chau of Carnegie Mellon University, and by kind permission of the Secretariat of IW3C2 for the WWW conferences. Detail from a figure in Pandit et al. (2007). *Red triangles* represent fraudsters, *yellow diamonds* represent accomplices, *white ellipses* represent honest nodes, while *gray rounded rectangles* represent unbiased nodes



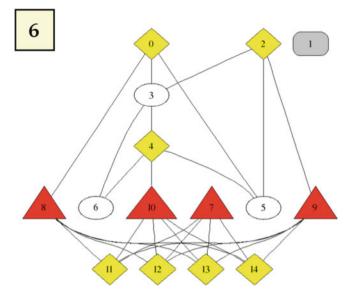
an accomplice. Pandit et al. (2007, p. 204, figure 2) resorted to the convention of depicting as red triangles the fraudsters, as yellow diamonds the accomplices, as white ellipses the honest nodes, and as gray rounded rectangles the unbiased nodes. By iteratively passing messages, the nodes affect each other's beliefs. Pandit et al. (2007, p. 205) explained:

Notice that the particular form of the propagation matrix we use assigns a higher chance of being an accomplice to every node in the graph at the end of the first iteration. These



accomplices then force their neighbors to be fraudsters or honest depending on the structure of the graph. In case of bipartite cores, one half of the core is pushed towards the fraud state, leading to a stable equilibrium. In the remaining graph, a more favorable equilibrium is achieved by labelling some of the nodes as honest. At the end of execution, the nodes in the bipartite core are neatly labeled as fraudsters and accomplices. The key idea is the manner in which accomplices force their partners to be fraudsters in bipartite cores, thus providing a good mechanism for their detection.

Goldberg et al. (2008), who were concerned with evolving social networks, remarked: "Their loose membership and dynamics make them difficult to observe



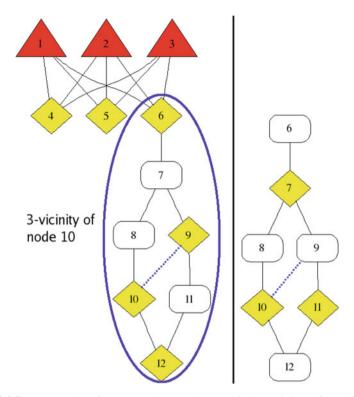
**Fig. 6.2.3.3.6** Stage 6 in a sample execution of NetProbe. By kind permission of "Polo" Chau of Carnegie Mellon University, and by kind permission of the Secretariat of IW3C2 for the WWW conferences. Detail from a figure in Pandit et al. (2007)

and monitor". Sparrow (1991) among others recognised that criminal networks are dynamic, not static. All the more so, online auction sites burst with activity.<sup>309</sup> Pandit et al. (2007, p. 205) remark that in practice, given the very large size of the graph, it would be too strong a requirement if NetProbe had to propagate beliefs over the entire graph each and every time that a node (i.e., a user) or an edge (i.e., a transaction) is added to the network. In order for the users to get answers to their queries in real time when using NetProbe, the Carnegie Mellon team which developed NetProbe, also developed Incremental NetProbe, a version which allows approximation. This avoids wasteful recomputation from scratch of node beliefs. Incremental NetProbe incrementally<sup>310</sup> updates node beliefs as small changes occur in the graph. Figure 6.2.3.3.7 shows an example of Incremental NetProbe. The assumption, when using Incremental NetProbe, is that the addition of a new edge would only have a local effect. Incremental NetProbe works as follows (ibid.):

Whenever a new edge gets added to the graph, the algorithm proceeds by performing a breadth-first search of the graph from one of the end points (call it n) of the new edge, up to a fixed number of hops h, so as to retrieve a small subgraph, which we refer to as the

<sup>&</sup>lt;sup>309</sup> In fact, Prof. Christos Faloutsos (http://www.cs.cmu.edu/~christos), who supervised the development of NetProbe at Carnegie Mellon University, is also quite active in *graph mining*, and, in particular, in researching evolving graphs. See Section 6.2.4 below.

<sup>&</sup>lt;sup>310</sup> In computer science, an *incremental* system is such that additions do not intrude into what was already there. This prevents having to do extensive changes to what one already had, once a new version is installed.



**Fig. 6.2.3.3.7** An example of Incremental NetProbe. By kind permission of "Polo" Chau of Carnegie Mellon University, and by kind permission of the Secretariat of IW3C2 for the WWW conferences. From Pandit et al. (2007). *Red triangles* represent fraudsters, *yellow diamonds* represent accomplices, *white ellipses* represent honest nodes, while *gray rounded rectangles* represent unbiased nodes. An edge (shown as a *dotted blue line*) is added between nodes 9 and 10 of the graph on the left hand side. Normal propagation of beliefs in the 3-vicinity of node 10 (shown on the right hand side) leads to incorrect inference, and so nodes on the boundary of the 3-vicinity (i.e. node 6) should retain their beliefs

*h-vicinity* of *n*. It is assumed that only the beliefs of nodes within the *h*-vicinity are affected by addition of the new edge. Then, "normal" belief propagation is performed only over the *h*-vicinity, with one key difference. While passing messages between nodes, beliefs of the nodes on the boundary of the *h*-vicinity are kept fixed to their original values. This ensures that the belief propagation takes into account the *global* properties of the graph, in addition to the local properties of the *h*-vicinity.

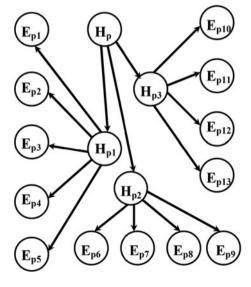
## 6.2.3.4 A Non-Mining Model for Reasoning on the Evidence of Online Auction Fraud

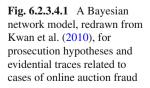
At the end of Section 6.2.3.1, we mentioned a study about online auction fraud by Kwan et al. (2010). That study, carried out by computer scientists at King's College London an the University of Hong Kong, is concerned with Internet auction fraud

involving the selling of faked goods in Hong Kong, and goods bearing false trade descriptions or forged trademarks. Let us elaborate about the original proposal in Kwan et al. (2010). Its approach is not from data mining. It is in probabilistic analysis, and strictly speaking, could be performed in theory on paper, maybe with a good calculator as help. We nevertheless dwell on this here, for the sake of representiativeness, because it is often the case that AI systems for legal evidence include probabilistic analysis (notwithstanding the controversial status of Bayesianism for judicial purposes).

Kwan et al. (2010) proposed (basing themselves on several prosecuted cases) an investigation model for online auction fraud in selling of counterfeit goods using a Bayesian network approach. They made three ancillary hypotheses, substantiating the overall prosecution hypothesis that an online auction fraud crime has been committed. Namely, they hypothesised that perpetrators uploaded auction-related material, such as images or descriptions of the items. They hypothesised that manipulation (editing) of the corresponding auction item had taken place, such as adjusting the price. And they hypothesised that communication (e.g., by email or by instant messaging) had occurred between the seller and the buyer, concerning the auctioned fake item.

Those three sub-hypotheses are supported by 13 distinct evidential traces, again obtained from the responsible digital forensic examiners. Kwan et al. (2010) represented this in a Bayesian network model for the prosecution's main hypothesis and three ancillary hypotheses, with the related evidential traces; it is redrawn in Fig. 6.2.3.4.1. "This does not of itself substantiate the whole prosecution case. The auctioned item also has to be procured physically by the investigator and to be examined by the trademark owner in order to ascertain whether or not the item is counterfeit in nature" (ibid.).





6 Accounting for Social, Spatial, and Textual Interconnections

Note however that the approach in Kwan et al. (2010) is *not* from data mining. They intended it to be applied once suspects had already been identified, and were being prosecuted. In practice, they provided an interpretation of a typical case, being an abstraction of twenty cases that had actually been prosecuted in Hong Kong.

In Fig. 6.2.3.4.1, the prosecution hypotheses are as shown in Table 6.2.3.4.1. The evidential traces in Fig. 6.2.3.4.1 are as shown in Table 6.2.3.4.2.

Kwan et al. (2010) also developed a Bayesian network model for evaluating the relevance of the digital evidential trace, refresenting the defence's scenarios; it is redrawn in Fig. 6.2.3.4.2.

In Fig. 6.2.3.4.2, the prosecution hypotheses are as shown in Table 6.2.3.4.3. The evidential traces in Fig. 6.2.3.4.2 are the same as in Fig. 6.2.3.4.2:

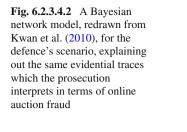
 $E_{d1}$  has the same definition as  $E_{p1}$ ,  $E_{d2}$  has the same definition as  $E_{p2}$ , and so forth.

 Table 6.2.3.4.1
 The prosecution hypotheses in Fig. 6.2.3.4.1

Hp	The seized computer has been used as transaction tool for the fake item.
H <sub>p1</sub>	Uploading of auction material related to the fake item has been performed.
H <sub>p2</sub>	Manipulation of the corresponding auction item has been performed.
H <sub>p3</sub>	Communication between the seller and the buyer on the fake auction item has occurred.

Table 6.2.3.4.2 The evidential traces in Fig. 6.2.3.4.1

E <sub>p1</sub>	Material of the auctioned fake item (e.g., image file, text files, etc.) was found on the seized computer.
E <sub>p2</sub>	Seller's account login record was retrieved from the auction site.
E <sub>p3</sub>	Meta-data of a file found on the seized computer matched with that found on the auction site.
E <sub>p4</sub>	IP address assigned to the seized computer matched with that which performed the data transfer.
E <sub>p5</sub>	Internet history / cached contents for transferring the auctioned fake item material was found on the seized computer.
E <sub>p6</sub>	Seller's account login record was retrieved from the auction site.
E <sub>p7</sub>	IP address assigned to the seized computer matched with that logged into the auction site.
E <sub>p8</sub>	Editing of an auction item has occurred (e.g., price adjustment) on the auction site.
E <sub>p</sub> 9	Enhanced material of an auction item (e.g., image file, text file, etc.) was found on the seized computer.
Ep10	Messages from auction site related to an auction item were found on the seized computer.
E <sub>p11</sub>	Messages to/from the buyer related to an auction item were found on the seized computer.
E <sub>p12</sub>	Address book containing covert investigator's email account was found on the seized computer.
E <sub>p13</sub>	IP address assigned to the seized computer matched with that which performed the email communication.



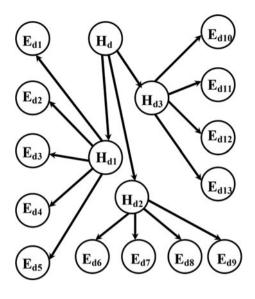


 Table 6.2.3.4.3
 The prosecution hypotheses are as shown in Table 6.2.3.4.3

- $H_d$  The seized computer has been used as transaction tool for the fake item.
- $H_{d1}$  Auction material related to the fake item was downloaded from the auction site.
- $H_{d2}$  Manipulation of a non-fake item has taken place.
- $H_{d3}$  Communication between the seller and the buyer on a non-fake auction item has occurred.

Kwan et al. (2010) – who did not acknowledge the misgivings that several important law scholars have concerning the application of Bayesianism to criminal cases – used a *likelihood rate (LR* for short), in the version devised by Evett (1993) in order to represent the situation where it is uncertain whether or not the evidence is a result of the suspect's activity:

$$LR = \frac{\Pr(E|H_p)}{\Pr(E|H_d)}$$

where *E* is the total digital evidence related to the crime. Kwan et al. (2010) claimed:

In our simple Bayesian network models, the existence of each individual trace of digital evidence does not imply the existence of any other such traces. Since the evidential traces are mutually independent, their individual probabilities can be multiplied together to determine the probability of E given a root hypothesis. The prior probability values of the individual evidential traces for the online auction fraud models (both prosecution and defense) were obtained from a survey of the digital forensic examiners of the Hong Kong Customs & Excise Department, and are generally accepted values within this community of experts.

As calculated by Kwan et al. (2010), the LR of evidence for hypothesis  $H_{p1}$  against the evidence for hypothesis  $H_{d1}$  is:

$$\frac{\Pr(E|H_{p1})}{\Pr(E|H_{d1})} = \pi_{p1}/\pi_{d1} \text{ where}$$
  

$$\pi_{p1} = \Pr\left(E_{p1} \mid H_{p1}\right) \times \Pr\left(E_{p2} \mid H_{p1}\right) \times \Pr\left(E_{p3} \mid H_{p1}\right) \times$$
  

$$\times \Pr\left(E_{p4} \mid H_{p1}\right) \times \Pr\left(E_{p5} \mid H_{p1}\right)$$
  

$$\pi_{d1} = \Pr\left(E_{d1} \mid H_{d1}\right) \times \Pr\left(E_{d2} \mid H_{d1}\right) \times \Pr\left(E_{d3} \mid H_{d1}\right) \times$$
  

$$\times \Pr\left(E_{d4} \mid H_{d1}\right) \times \Pr\left(E_{d5} \mid H_{d1}\right)$$

which they calculated as:

$$\approx \frac{0.9 \times 0.75 \times 0.6 \times 0.75 \times 0.85}{0.9 \times 0.05 \times 0.6 \times 0.01 \times 0.01} \approx \frac{0.258}{0.0000027} \approx 95,600$$

Similarly, Kwan et al. (2010) calculated the LR values for  $H_{p2}$  against  $H_{d2}$  and  $H_{p3}$  against  $H_{d3}$ . It was especially for the prosecution's first sub-hypothesis that they found strong support. It cannot be however overemphasised that the concerns of scholars who are skeptic about Bayesianism in a judiciary context are important, and must be addressed. In Kwan et al. (2010) there is no mention of how controversial this topic is. There is one context however in which applying this kind of model would be unproblematic, and this is if the prosecution carries out such calculations when evaluating whether it has evidence strong enough for prosecuting. That is to say, this would just fit in a costs/benefits model.

## 6.2.4 Graph Mining for Malware Detection, Using Polonium

#### 6.2.4.1 Preliminaries About Graph Mining

The leader of the team from Carnegie Mellon University that developed NetProbe, the tool for detecting fraudsters and their accomplices at online auction sites which we described in Sections 6.2.3.2 and 6.2.3.3 above, Prof. Christos Faloutsos,<sup>311</sup> is also quite active in *graph mining*. This is the area within data mining that is concerned with very large graphs.<sup>312</sup> Finding the mastermind of some activity within a graph is just one of the problems for which graph mining can be put to use. Another such use is modelling virus propagation, or how news propagates through blogs on the Web (this allows to understand the impact of blogs): the Blogosphere consists of blogs and posts (postings on a blog); there is a blog network, linking blogs, and (at a more detailed level) a post network, linking posts. Posts may be popular, but they tend to decay: post popularity drops off as days elapse since when the posting took place. Another rask is finding patterns: rules, and outliers. Another problem is to understand how do real graphs look like, in social contexts involving very large

740

<sup>&</sup>lt;sup>311</sup> See http://www.cs.cmu.edu/~christos

<sup>&</sup>lt;sup>312</sup> See a long slide presentation, graphMining.ptt, at the same website.

graphs (such as the Internet map, or friendship networks, or protein interactions, of the food web in ecological systems, such as the smallmouth bass, which is a cannibalistic fish, along with leeches, phytoplankton, and zooplankton in Little Rock Lake).

A major side to Faloutsos' research on graph mining is the study of the temporal evolution of graphs. One application is tracking communities over time. In social network analysis, a static task is finding community structures. a dynamic task is monitoring community structure evolution, spotting abnormal individuals, or abnormal time-stamps. *Network forensics* is yet another application, the task being the identification of abnormal traffic pattern and finding out the cause.

One aspect of the temporal evolution of graphs is the study of *densification*, such as in affiliation networks (authors linked to their publications), or in patents being cited, or in physics papers citations. Another problem is, given a growing graph with such and such count of nodes, generate a realistic sequence of graphs that will obey all the static and dynamic patterns, such as power laws, or patterns about the diameter (a small diameter is a static pattern, whereas diameters shrinking or stabilising is a dynamic pattern). Faloutsos has been developing a generator in which such properties can be proven. For time evolving graphs, Faloutsos has applied tensors; these are multi-dimensional extensions of arrays, and there exist various decomposition methods for them, just as there exist decomposition methods for arrays.<sup>313</sup> Faloutsos and colleagues used tensor-based methods in order to spot patterns and anomalies on time evolving graphs, as well as for monitoring purposes, by application to streams.<sup>314</sup> PeGaSus is an open source Peta Graph Mining library, developed by Faloutsos and others, which performs typical graph mining tasks such as computing the diameter of the graph, computing the radius of each node, finding the connected components, and computing the importance score of nodes.

<sup>&</sup>lt;sup>313</sup> In an overview of the application of tensor factorisations and decompositions in data mining, Morten Mørup explains (2011, p. 24): "Tensors, or multiway arrays, are generalizations of vectors (first-order tensors) and matrices (second-order tensors) to arrays of higher orders (N > 2). Hence, a third-order tensor is an array with elements  $x_{i,j,k}$ . Tensor decompositions are in frequent use today in a variety of fields ranging from psychology, chemometrics, signal processing, bioinformatics, neuroscience, web mining, and computer vision to mention but a few. Factorizing tensors have several advantages over two-way matrix factorization such as uniqueness of the optimal solution (without imposing constraints such as orthogonality and independence) and component identification even when only a relatively small fraction of all the data is observed (i.e., due to missing values). Furthermore, multiway decomposition techniques can explicitly take into account the multiway structure of the data that would otherwise be lost when analyzing the data by matrix factorization approaches by collapsing some of the modes. Tensor decompositions are in frequent use in psychometrics in order to address questions such as '*which group of subjects behave differently on which variables under which conditions?*" Arguably, this may also be useful for data mining for investigative purposes or for criminal intelligence purposes.

<sup>&</sup>lt;sup>314</sup> The projects of Faloutsos' team mentioned in Section 6.2.4.1 were described in See Tong, Faloutsos, and Jia-Yu Pan (2006); Tong and Faloutsos (2006); Leskovec, Kleinberg, and Faloutsos (2005); Leskovec, Chakrabarti, Kleinberg, and Faloutsos (2005); Leskovec and Faloutsos (2007); Sun, Tao, and Faloutsos (2006); Sun, Xie, Zhang, and Faloutsos, 2007).

#### 6.2.4.2 The Polonium System

Esmaili, Safavi-Naini, Balachandran, and Pieprzyk (1996) applied case-based reasoning to the differentiation between hostile intrusions of computer systems and other anomalous transactions.<sup>315</sup> Duen Horng "Polo" Chau, of the Carnegie Mellon University team that developed NetProbe, also developed (in collaboration with Symantec, the world's leading security software provider) Polonium,<sup>316</sup> a tool for detecting malware.<sup>317</sup> A malware instance is defined as a program that has malicious intent. Computer viruses are just one kind of malware. Other kinds include worms, Trojan horses, rootkits, spyware, adware, and so forth.<sup>318</sup> Infected files are also considered malware. Chau, Nachenberg, Wilhelm, Wright, and Faloutsos (2010) claimed: "We evaluated it with the largest anonymized file submissions dataset ever published, which spans over 60 terabytes of disk space",<sup>319</sup> with over 900 million files described in the raw data, from a total of 47,840,574 machines. Polonium resorts to graph mining. Like NetProbe, it also resorts to the belief propagation algorithm. "We adapted the algorithm for our problem. This adaptation was non-trivial, as various components used in the algorithm had to be fine tuned; more importantly, [...] modification to the algorithm was needed to induce iterative improvement in file classification." (Chau et al., 2010). A reputation-based approach was adopted. In a nutshell, "the key idea of the Polonium algorithm is that it infers a file's goodness by looking at its associated machines' reputations iteratively. It uses all files' current goodness to adjust the reputation of machines associated with those files; this adjusted machine reputation, in turn, is used for re-inferring the files' goodness." (ibid.).

The reputation-based approach adopted is a Symantec protection model that, for ever application that users may encounter computes a *reputation* score, and protects them from files whose score is poor. Various attributes contribute to reputation: whether an application comes from known publishers, whether it already has many users, and so forth. "Symantec has computed a reputation score for each machine based on a proprietary formula that takes into account multiple anonymous aspects of the machine's usage and behavior. The score is a value between 0 and 1" (Chau et al., 2010). Intuitions include: "Good files typically appear on many machines and bad files appear on few machines." (ibid.). Another intuition is what was called *homophilic machine–file relationships*: "We expect that good files are more likely to appear on machines with good reputation and bad files more likely to appear on

<sup>&</sup>lt;sup>315</sup> Data mining has been applied to malware detection also by Muazzam Ahmed Siddiqui in his doctoral thesis discussed in Orlando, Florida (Siddiqui, 2008).

 $<sup>^{316}</sup>$  The tool was probably named *Polonium* because of its association with the doctoral student "Polo" Chau, or at any rate the coincidence is apt, but the official explanation is that *Polonium* is an acronym for *Propagation Of Leverage Of Network Influence Unearths Malware*.

<sup>&</sup>lt;sup>317</sup> See Chau et al. (2010), and an informal discussion in Chau (2011).

<sup>&</sup>lt;sup>318</sup> At www.symantec.com/norton/security\_response/malware.jsp Symantec provides definitions for kinds of malware.

<sup>&</sup>lt;sup>319</sup> Emphasis in the original.

machines with low reputation. In other words, the machine-file relationships can be assumed to follow homophily." (ibid.).<sup>320</sup>

Computing *reputation* credibly was made possibly by the worldwide Norton Community Watch program, with millions of users contributing data anonymously. This is a huge file submissions dataset. The raw data undergo processing at Symantec, and then are fed into Polonium, which mines the data statistically, and machine learning is applied. "Each contributing machine is identified by an anonymized machine ID, and each file by a file ID which is generated based on a cryptographically-secure hashing function" (Chau et al., 2010). An undirected, unweighted bipartite graph of files and machines was generated "from the raw data, with almost 1 billion nodes and 37 billion edges (37,378,365,220). 48 million of the nodes are machine nodes, and 903 million are file nodes. An (undirected) edge connects a file to a machine. The graph is stored on disk as a binary file using the *adjacency list* format" (ibid.); "we want to label a file node as good or bad, along with a measure of the confidence in that disposition" (ibid.).

Polonium computes the reputation for a given application, and is used in concert with other Symantec malware detection technologies. In the belief propagation algorithm as used in Polonium, belief corresponds to reputation. The Polonium team treated each file as a random variable *X*, whose value is

- either  $x_g$  (this being the "good" label)
- or *x<sub>b</sub>* (this being the "bad" label).
- The probability  $P(x_g)$  is the file goodness,
- whereas  $P(x_b)$  is the file badness,

and the sum of the two probabilities is 1. Therefore, by knowing the value of one also knows the other. For each file *i*, the goal is to find the marginal probability

$$P\left(X_i=x_g\right),\,$$

that is the goodness of that file. Domain knowledge helps infer label assignments.

<sup>&</sup>lt;sup>320</sup> Social influence is the subject of the papers in Forgas and Williams (2001). LaFond and Neville (2010) carried out *randomisation tests* for distinguishing *social influence* and *homophily effects*. A clear case where social influence is posited, is in the NASD beliefs that for determining the reputation of sock brokers, association with disreputable brokers is tarnishing, because one may be influenced into behaving irregularly like them (Neville et al., 2005). See fn 189 sqq. above. In artificial intelligence, Charlotte Gerritsen, Michel Klein and Tibor Bosse applied *agent-based simulation* to criminology: "A large group of offenders only shows criminal behaviour during adolescence. This kind of behaviour is largely influenced by the interaction with others, through social learning" (ibid., from the abstract). Their own study set to "to simulate social learning of adolescence-limited criminal behaviour, illustrated for a small school class. The model is designed in such a way that it can be compared with data resulting from a large scale empirical study" (ibid., from the abstract).

6 Accounting for Social, Spatial, and Textual Interconnections

Terminology with the respective definitions include: *file ground truth* for "file label, good or bad, assigned by human security experts" (here, by file an executable file is meant); *known-good file* for "file with good ground truth"; *known-bad file* for "file with bad ground truth"; and *unknown file* for "file with unknown ground truth".

"Symantec maintains a *ground truth database* that contains large number of *known-good* and *known-bad* files, some of which exist in our graph. We can leverage the labels of these files to infer those of the unknowns. The ground truth files influence their associated machines which indirectly transfer that influence to the unknown files" (Chau et al., 2010).

Moreover, the possibility of errors is recognised: in the case of Polonium, *True Positive* (*TP*) stands for "malware instance correctly identified as bad", as opposed to *False Positive* (*FP*) for "a good file incorrectly identified as bad". False positives are a price to pay that comes with some successful malware detection tools: Tesauro, Kephart, and Sorkin (1996), who applied neural networks, were able to detect "boot sector viruses" with over 90% true positive rate in identifying those viruses, but on the other hand this came at a 15–20% false positive rate. In Polonium, there is a tradeoff concerning false positives, that is expressed in how the belief propagation algorithm is made to stop.<sup>321</sup>

*Virus signatures* are virus profiles, or virus definitions. Malware detection comes in two major categories: *anomaly-based detection*, based on some presumed "normal" behaviour from which malware deviates; and *signature-based detection*, in which malware instances are detected because they fit some profiles (Idika & Mathur, 2007; Chau et al., 2010). It was Kephart and Arnold (1994) who first used data mining techniques to automatically extract virus signatures. Schultz, Eskin, Zadok, and Stolfo (2001) were among those who pioneered the application of machine learning algorithms (in their case, Naive Bayes and Multi-Naive Bayes) to classify malware.

In Naive Bayes, for a given sample we search for a class  $c_i$  that maximises the posterior probability

$$P(c_i \mid x; \theta')$$

by applying Bayes rule. Then x can be classified by computing

$$c_{l} = \underset{\max}{\operatorname{arg}} \quad P(c_{i} | \theta') P(x | c_{i}; \theta')$$
$$c_{i} \in C$$

Concerning how belief propagation was applied in Polonium, Chau et al. (2010) explain:

At a high level, the algorithm infers the label of a node from some prior knowledge about the node, and from the node's neighbors. This is done through iterative message passing between all pairs of nodes  $v_i$  and  $v_j$ . Let  $m_{ij}(x_j)$  denote the message sent from *i* to *j*. Intuitively, this message represents *i*'s opinion about *j*'s likelihood of being in class  $x_j$ . The prior knowledge about a node *i*, or the prior probabilities of the node being in each possible class are expressed through the *node potential function*  $\phi(x_i)$ 

<sup>&</sup>lt;sup>321</sup> See an explanation in fn 207 below.

This prior probability is called a *prior*. Once the procedure execution is completed, the goodness of each file is determined: "This goodness is an estimated marginal probability, and is also called *belief*, or formally  $b_i(x_i) (\approx P(x_i))$ , which we can threshold into one of the binary classes. For example, using a threshold of 0:5, if the file belief falls below 0:5, the file is considered bad" (ibid.). The messages are obtained as follows (ibid.):

Each edge  $e_{ij}$  is associated with messages  $m_{ij}(x_j)$  and  $m_{ji}(x_i)$  for each possible class. Provided that all messages are passed in every iteration, the order of passing can be arbitrary. Each message vector  $m_{ij}$  is normalized over j (node j is the message's recipient), so that it sums to one. Normalization also prevents numerical underflow (or zeroing-out values). Each outgoing message from a node i to a neighbor j is generated based on the incoming messages from the node's other neighbors.

Let N(i) be the set of nodes that are the neighbours of node *i*. Let *k* be a normalizing constant. Let the *edge potential* be notated as  $\psi_{ij}(x_i, x_j)$ ; "intuitively, it is a function that transforms a node's incoming messages collected into the node's outgoing ones. Formally,  $\psi_{ij}(x_i, x_j)$  equals the probability of a node *i* being in class  $x_i$  given that its neighbor *j* is in class  $x_i$ ." (ibid.). The message-update equation is:

$$m_{ij}(x_j) \leftarrow \sum_{x_i \in X} \phi(x_i) \psi_{ij}(x_i, x_j) \prod_{k \in N(i) \setminus j} m_{ki}(x_i)$$

When the execution of the belief propagation algorithm ends,<sup>322</sup> the node beliefs are determined according to this formula:

$$b_{i}(x_{i}) = k\phi(x_{i}) \prod_{x_{j} \in N(i)} m_{ji}(x_{i})$$

In Polonium, the intuition that good files are (slightly) more likely to appear on machines with good reputation and bad files (slightly) more likely to appear on machines with low reputation (that is to say, the *homophilic machine-file* 

<sup>&</sup>lt;sup>322</sup> "The algorithm stops when the beliefs converge (within some threshold.  $10^{-5}$  is commonly used), or a maximum number of iterations has finished. Although convergence is not guaranteed theoretically for generally graphs, except for those that are trees, the algorithm often converges in practice, where convergence is quick and the beliefs are reasonably accurate." (Chau et al., 2010). In particular, in Polonium, there is a departure from how usually a belief propagation is made to terminate, and this involves how *true positive rates (TPR)* rather than *false positive rates (FPR)* are treated: "the Polonium algorithm's termination criterion is goal-oriented, meaning the algorithm stops when the TPR does not increase any more (at the preset 1% FPR). This is in contrast to Belief Propagation's convergence-oriented termination criterion. In our premise of detecting malware, the goal-oriented approach is more desirable, because our goal is to classify software into good or bad, at as high of a TPR as possible while maintaining low FPR — the convergence-oriented approach does not promise this; in fact, node beliefs can converge, but to undesirable values that incur poor classification accuracy. We note that in each iteration, we are trading FPR for TPR. That is, boosting TPR comes with a cost of slightly increasing FPR. When the FPR is higher than desirable, the algorithm stops" (ibid.).

Table 6.2.4.2.1Edgepotentials in polonium	$\psi_{ij}\left(x_{i}, x_{j}\right)$	$x_i = \text{good}$	$x_i = bad$
	$x_j = \text{good}$	$0.5 + \varepsilon$	$0.5 - \epsilon$
	$x_j = bad$	$0.5 - \epsilon$	0.5 + ε

*relationships* assumption) was converted into an edge potential defined according to Table 6.2.4.2.1, where the value of  $\varepsilon$  was set to 0.001.

Moreover, for machine nodes, the *node potential function* maps the reputation score computed by Symantec, into the machine's prior. That exponential mapping obeys the following formula (where k is a constant whose value is based on domain knowledge):

#### machine prior = $e^{-k \times reputation}$

This translates the intuition about what machine reputation contributes to the file reputation, into the machine prior. "Similarly, we use another *node potential func-tion* to set the file prior by mapping the intuition that files that appear on many machines are typically good" (ibid.). This maps file prevalence into file prior. That is to say, the intuition about file goodness is translated into an unknown-file prior. And finally, the intuition about file ground truth is mapped into known-file prior: "For known-good files, we set their priors to 0.99. For known-bad, we use 0.01" (ibid.). "Note that no probability is ever 0, because it can 'zero-out' other values multiplied with them. A lower bound of 0.01 has been imposed on all probabilities. Upper bound is, therefore, 0.99, since probabilities of the two classes add up to 1" (ibid.).

When developing Polonium, the team modified the file-to-machine propagation between nodes of the graph: the edge potential based on the homophilic intuition is used in order "to propagate machine reputations to a file from its associated machines. Theoretically, we could also use the same edge potential function for propagating file reputation to machines. However, as we tried through numerous experiments — varying the  $\varepsilon$  parameter, or even 'breaking' the homophily assumption - we found that machines' intermediate beliefs were often forced to changed too significantly" (ibid.): what was happening, was that such change "led to an undesirable chain reaction that changes the file beliefs dramatically as well, when these machine beliefs were propagated back to the files. We hypothesized that this happens because for a machine's reputation (used in computing the machine node's prior) is a reliable indicator of machine's beliefs, while the reputations of the files that the machine is associated with are weaker indicators". Based on this hypothesis, the team found this solution: "instead of propagating file reputation directly to a machine", the had Polonium "pass it to the proprietary formula that Symantec uses to generate machine reputation, which re-compute a new reputation score for the machine". Experiments showed "that this modification leads to iterative improvement of file classification accuracy" (ibid.). Figure 6.2.4.2.1 shows an overview of the Polonium technology. Figure 6.2.4.2.2 shows the scalability of Polonium: the run time per iteration is linear to the number of edges.

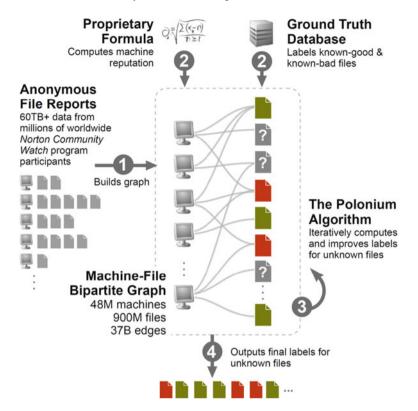
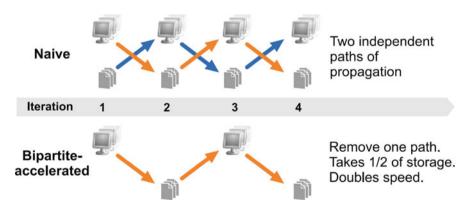


Fig. 6.2.4.2.1 An overview of the Polonium technology. By kind permission of "Polo" Chau from Carnegie Mellon University



**Fig. 6.2.4.2.2** The scalability of Polonium: the run time per iteration is linear to the number of edges. By kind permission of "Polo" Chau from Carnegie Mellon University

## 6.2.5 Link Analysis with Coplink

We have referred to the Coplink project in Section 6.1.2.4. *Coplink* is a tool for criminal intelligence analysis which finds links in databases among such entities. Coplink, developed by a team at the University of Arizona in collaboration with the Tucson police, performs data integration, pooling together the various information sources available (Hauck et al., 2002; Chen, Zheng, et al., 2003; Chen et al., 2003). It "evolved into a real-time system being used in everyday police work" (Hauck et al., 2002, p. 30). Drawing on experience gained with the Coplink project,<sup>323</sup> Chen et al. (2004) presented a general framework for crime data mining. Next, Xiang et al. (2005) described a prototype system called the COPLINK Criminal Relationship Visualizer.<sup>324</sup>

At the Tucson Police Department (TPD), records at the time consisted of about 1.5 million criminal case reports, containing details from criminal events spanning the period from 1986 to 1999 (Hauck et al., 2002, p. 31). Notwithstanding investigators being able, before Coplink became available, to access the Records management System (RMS) to tie together information, when it came to finding relationships inside the records they had to manually search the RMS data (ibid.).

In Coplink, a concept space is applied (ibid.):

Coplink's underlying structure is the *concept space*, or automatic thesaurus, a statisticsbased, algorithmic technique used to identify relationships between objects of interest. A concept space consists of a network of terms and weighted associations that assist in concept-based information retrieval within an underlying information space.

In addition, co-occurrence analysis<sup>325</sup> uses similarity and clustering functions to weight relationships between all possible concept pairs. The resulting network-like concept space

<sup>&</sup>lt;sup>323</sup> Coplink is accessible at http://ai.bpa.arizona.edu/coplink

<sup>&</sup>lt;sup>324</sup> Also see Schroeder, Xu, Chen, and Chau (2007).

<sup>&</sup>lt;sup>325</sup> Consider, within data mining, the task of *frequent pattern mining*, of which Han, Cheng, Xin, and Yan (2007) is a survey. They explained (ibid., p. 56): "Frequent patterns are itemsets, subsequences, or substructures that appear in a data set with frequency no less than a user-specified threshold. For example, a set of items, such as milk and bread, that appear frequently together in a transaction data set, is a frequent itemset. A subsequence, such as buying first a PC, then a digital camera, and then a memory card, if it occurs frequently in a shopping history database, is a (frequent) sequential pattern. A substructure can refer to different structural forms, such as subgraphs, subtrees, or sublattices, which may be combined with itemsets or subsequences. If a substructure occurs frequently in a graph database, it is called a (frequent) structural pattern. Finding frequent patterns plays an essential role inmining associations, correlations, and many other interesting relationships among data. Moreover, it helps in data indexing, classification, clustering, and other data mining tasks as well. Thus, frequent pattern mining has become an important data mining task and a focused theme in data mining research. Frequent pattern mining was first proposed by Agrawal et al. (1993) for market basket analysis in the form of association rule mining. It analyses customer buying habits by finding associations between the different items that customers place in their 'shopping baskets'. For instance, if customers are buying milk, how likely are they going to also buy cereal (and what kind of cereal) on the same trip to the supermarket? Such information can lead to increased sales by helping retailers do selective marketing and arrange their shelf space. Since the first proposal of this new data mining task and its associated efficient mining algorithms, there have been hundreds of follow-up research publications, on various kinds of extensions and

holds all possible associations between objects, which means that the system retains and ranks every existing link between every pair of concepts. Analysts frequently use this technique to develop domain-specific knowledge structures for digital-library applications.

In Coplink, detailed case reports serve as the underlying space, while concept derive from the meaningful terms that occur in each case. Concept space analysis easily identifies relevant terms and their degree of relationship to the seach term. The system output includes relevant terms ranked in the order of their degree of association, thereby distinguishing the most relevant terms from inconsequential terms. From a crime investigation standpoint, concept space anlysis can help investigators link known objects to other related objects that might contain useful information for further investigation — such as people and vehicles related to a given suspect.

Hauck et al. (2002, p. 31) listed three main steps involved in building a domainspecific concept space (CS). The first step consists of identifying document collections in the specific subject domain, and for the Tucson police, the collection was the case reports in the existing database. Each piece of information in the case reports database was categorised and stored in well-organised structures. At the second step, the terms were filtered and indexed (ibid., pp. 31–32):

A co-occurrence analysis captures the relationships among indexed terms. Developers then insert the resulting concept space into a database for easy manipulation with an appropriate algorithm. These last two steps were customized for the Coplink CS. After optimizing the code and tuning the database, building a Coplink CS takes approximately five hours, an acceptable period considering the TPD's requirements. [...] Term types in the CS concept space were divided into five main categories: Person, Organization, Location, Crime, and Vehicle. For the first four categories, only one piece of information such as a person's full name, street address, or crime type can function as a search term. For a vehicle, on the other hand, a single piece of information — such as color, make, or type — results in so many matches that using it as a search term would generate a flood of relevant terms. To avoid this problem, the Coplink CS combines two or more nonspecific vehicle terms into one composite term.

Hauck et al. (2002, p. 32) described how they applied co-occurrence analysis, by first identifying terms, and then computing the term frequency and document frequency for each term in a document, using a method proposed by Chen and Lynch (1992) for the automatic construction of networks of concepts characterising document databases.

The number of occurrences of term *j* in document *i* is the term frequency,  $tf_{ij}$ By contrast, the document frequency  $df_j$  is the number of socuments in a collection of *N* documents in which term *j* occurs. *N* is the total number of documents in a collection, whereas  $w_j$  is the weight of words in descriptor *j*. By  $d_{ij}$  one represents the combined weight of term *j* in document *i*. This is calculated as follows:

$$d_{ij} = tf_{ij} \cdot \log \left(N \cdot w_j/df_j\right)$$

applications, ranging from scalable data mining methodologies, to handling a wide diversity of data types, various extended mining tasks, and a variety of new applications."

Higher weights are assigned to such term types that are more descriptive and more important than others. Such higher weights are intended to ensure that relationships associated with these term types be always ranked reasonably. In particular, in the concept space of Coplink it was crime types that were assigned higher weights.

Term co-occurrence analysis was performed, according to Hauck et al. (2002, p. 32), based on the asymmetric cluster function, where  $W_{jk}$  are the similarity weights from term *j* to term *k*, whereas  $W_{kj}$  are the similarity weights from term *k* to term *j*, and where  $d_{ij}$  and  $d_{ik}$  are the combined weight of both descriptors *j* and *k* in document *i*:

$$W_{jk} = WeightingFactor(k) \cdot \left(\sum_{i=1}^{n} d_{ijk}\right) / \left(\sum_{i=1}^{n} d_{ij}\right)$$
$$W_{kj} = WeightingFactor(j) \cdot \left(\sum_{i=1}^{n} d_{ikj}\right) / \left(\sum_{i=1}^{n} d_{ik}\right)$$

Where *WeightingFactor* is used in order to penalise general terms, so that general terms be pushed down in the co-occurrence table, and is calculated according to the formulae:

WeightingFactor(k) = 
$$\log (N/df_k) / \log N$$
  
WeightingFactor(j) =  $\log (N/df_j) / \log N$ 

The combined weights of descriptors were calculated according to the formulae:

$$d_{ijk} = tf_{ijk} \cdot \log \left( N \cdot w_j / df_{jk} \right)$$
$$d_{ikj} = tf_{ijk} \cdot \log \left( N \cdot w_k / df_{jk} \right)$$

"where  $tf_{ijk}$  represents the number of occurrences of both term *j* and term *k* in document *i* — we chose the smaller number of occurrences between the terms;  $df_{jk}$ represents the number of documents in a collection of *N* documents in which terms *j* and *k* occur together" (Hauck et al., 2002, p. 32).

Chen et al. (2004) described how three kinds of data mining are done in the Coplink project: *named-entity extraction, deceptive-identity detection*, and *criminal-network analysis*. Let us consider the first one first: "Our first data mining task involved extracting named entities from police narrative reports, which are difficult to analyze using automated techniques" (ibid., p. 53). The team deliberately chose challenging data: "We randomly selected 36 narcotics-related reports from the Phoenix Police Department that were relatively *noisy* — all were written in uppercase letters and contained many typos, spelling errors, and grammatical mistakes" (ibid.).

In order to carry out named-entity extraction, Hsinchun Chen's team used a modified version of the AI Entity Extractor system. In order to identify the names of persons, locations, and organisations in a document, that tool performs a three-step process. The first step consists of identifying noun phrases according to linguistic rules. At the second step, "the system calculates a set of feature scores for each phrase based on pattern matching and lexical lookup. Third, it uses a feedforward/backpropagation neural network to predict the most likely entity type for each phrase" (ibid.).

The second data mining task for Coplink reported about in Chen et al. (2004) "involved automatically detecting deceptive criminal identities from the Tucson Police Department's database, which contains information such as name, gender, address, ID number, and physical description. Our detective consultant manually identified 120 deceptive criminal records involving 44 suspects from the database" (ibid.). In a case study, the team had developed a taxonomy for criminal identity deception. Based on that taxonomy, the team (ibid., pp. 53–54)

selected name, birth date, address, and Social Security number to represent a criminal's identity and ignored other less reliable fields. Our method employed string comparators to compare values in the corresponding fields of each record pair. Comparators measure the similarity between two strings. We normalized the similarity values between 0 and 1, and calculated an overall similarity measure between two records as a Euclidean vector norm over the four chosen fields. A Euclidean vector norm is the square root of the sum of squared similarity measures and is also normalized between 0 and 1.

We employed a holdout a holdout validation method using two-thirds of the data for training and the rest for testing. In the training stage, we tried threshold values ranging from 0.00 to 1.00 that differentiated between deceptive and non-deceptive records. We first determined the optimal threshold to be reached when the association decisions best matched our expert judgments, 0.48, then used this value to assess our algorithm's predicted association accuracy in the testing stage. [...] With this technique, law-enforcement officers can retrieve existing identity records relating to a suspect in their databases that traditional exact-match techniques often fail to locate.

As to the criminal-network analysis, Chen et al. (2004) used a concept-space approach of the kind described earlier in this section. With that technique, they extracted criminal relations from the incident summaries. The goal was to create a likely network of suspects. "Our data came from 272 Tucson Police Department incident summaries involving 164 crimes committed from 1985 through May 2002" (ibid., p. 54). In particular (ibid., pp. 54–55):

Co-occurrence weight measured the relational strength between two criminals by computing how frequently they were identified in the same incident. We used hierachical clustering to partition the network between these subgroups. We also calculated centrality measures — degree, betweenness, and closeness<sup>326</sup> — to detect key members in each group, such as leaders and gatekeepers. [... D]ata mining uncovered 16 target gang members from the resulting network. In [a visualisation], the circles represent subgroups the system found, and they bear the labels of their leaders' names. A circle's size is proportional to the number of members in that subgroup. The thinckness of straight lines connecting circles indicates the strength of relationships between subgroups.

We conduicted a two-hour field study with three Tucson Police Department domain experts who evaluated the analysis's validity by comparing the results against their knowledge of gang organization. They confirmed that the system-found subgroups correctly

<sup>&</sup>lt;sup>326</sup> For these concepts, see in Section 6.1.2.1 above; cf. in fn 14.

represented the real groups' organization. [...] Studying criminal networks requires additional data mining capabilities: entity extraction and co-occurrence analysis to identify criminal entities and associations, clustering and block modelling for discovering subgroups and interaction patterns, and visualization for presenting analysis results. One drawback of our current approach is that is generates mostly static networks. Given that criminal networks are dynamic, future research will focus on the evolution and precition of criminal networks.

The point that criminal networks are dynamic, and that techniques need be capable of dealing with that, was already made by Sparrow (1991). Efficient algorithms for searching graphs, and using Coplink's concept space, were discussed by Xu and Chen (2004), based in Tucson, Arizona, who used as a data set one year's worth of crime reports from the Phoenix Police Department. Their algorithms compute the shortest paths between two nodes in a graph, based on weighted links. They found that the efficiency of their algorithms differed, and whereas one algorithm was suitable for small and dense networks (such as kidnappers), another algorithm was efficient when the network is large and sparse, which is the case of narcotics networks.

At the University of Arizona in Tucson, Yang Xiang, Michael Chau, Homa Atabakhsha, and Hsinchun Chen described (Xiang et al., 2005) a project in the visualisation of criminal relationships: the Coplink Criminal Relationship Visualizer. They contrasted the use of two views, namely, a *hyperbolic tree* view, and a *hierarchical list* view. They explained (ibid., p. 76):

The COPLINK Visualizer includes a hyperbolic tree view and a hierarchical list view implemented in Java. The hyperbolic tree was developed based on a freely available program written in Java (http://www.soi.city.ac.uk/~livantes/Research.html). Users can submit search terms to the system and the search terms have to be one of the five chosen entities, namely person, vehicle, organization, location, and incident/crime type.

They found the hyperbolic tree view to be more efficent for an "associate" task. Nevertheless, participants in the experiment generally found the hierarchical list view easier to use, apparently because they were more familiar with it. Opinions among the participants were divided as to which of the two views is more useful. The team proposed that both views are helpful, even though at some tasks the hyperbolic tree performs better. A hyperbolic tree view shows a hierarchy fanning out around the node which is the root of the tree. Viewers have the option to focus on one part of the tree, which is enlarged, whereas the rest of the tree is shown smaller and further away from the centre.

# 6.2.6 The EDS Project for the U.S. Federal Defense Financial Accounting Service

Mena (2003, section 7.7, pp. 213–219) describes a data mining project previously reported about in Vafaie, Abbott, Hutchins, and Matkovskly (2000), developed for the United States' Federal Defense Financial Accounting Service by prime contractor EDS Corporation and various subcontractors. An important aspect of that project

was the application of machine learning techniques. The task was to develop a tool for detecting suspicious government financial transactions, because of the known occurrence of frauf in the vendor payment system. There was the problem of what to learn from, as the number of known cases from which to learn was not large, and moreover, data about these were incomplete. "Then, there is the problem that fraud is often hidden in large sets of legitimate translactions" (Mena, 2003, p. 213).

In establishing investigation goals, there was a concern with containing the costs. Whereas identifying suspicious payments was the primary goal, there was the constaint of maintaining a low false-alarm rate. "This cost concern is due to e limited number of examiners to investigate suspicious payments" (ibid.). Whereas the detection of suspicious financial transactions was the primary goal, other goals were also set, namely, that the data mining proicess to be developed could be generalised for use in other applications within the agency, and that knowledge transfer would be in place, so that the agency's existing staff could carry out the data mining process.

Having set the goals, the developers of the project took a step of knowledge discovery, i.e., they tried to understand the business methods involved, as well as the data, and the data were prepared. Initial exploratory analyses were performed, to enhance data preparation.

Next, the step was taken of assessing the modelling challenges (Mena, 2003, p. 214). Challenges included: "the data set is a very large payment database with incomplete information in the vendor payment data file" (ibid.); "payments are unlabeled and cannot be verified" (ibid.); and besides "there is a very small number of known fraud payments with instances of multiple payments from the same case" (ibid.). It was decided to use a cross-validation methodology, with several models (actually several modellers developed hundreds of models) using different data mining strategies. Then, a set of the best eleven models would be retained.

"The main strategy was to create multiple structured and random samples for training and testing of fraud detection models" (ibid.) Of the structured samples (called *splits*), eleven were for known fraud data. Each split had "taning, testing, and validation data subsets of 33 overlapping samples of fraud cases. In addition, 11 corresponding random splits were used with training, testing, and validation data subsets for non-fraud data of 33 non-overlapping samples of non-fraud" (Mena, 2003, p. 215). *Data balancing* required that the non-fraud set of samples be small enough, so that *false positives* be avoided (i.e., non-fraud transactions being taken to be fraud). "In addition to being split, the data was also rotated to ensure the validity of the models" (ibid.).

Classification algorithms generally differ, by their error rate, according to the data sets used, and how the data are structures has an impact on those error rates. In particular, in the project at hand, that much resulted from the step of evaluating the investigation algorithms. There was no clear winner, out of five algorithms (neural networks, logistic regression, linear vector, projection pursuit, and decision tree) on six datasets, because, for example, all five algorithms turned out to be first or second at least once, and of these, three algorithms were winners at least once, but four algorithms were worst at least once (ibid., pp. 215–216).

The next step was to select the investigation ensembles of models, because using just one model has shortcomings, depending on the non-exhaustive search by different algorithms for the best model, and because "iterative algorithms converge to local minima, such as neural networks" (ibid., p. 216). "Model ensembels make decisions by committee of algorithms" (ibid.).

Next, data were prepared for data mining: "some input and output data specifications are controlled via automated scripting" (ibid., p. 217). Next, the models were created and tested. The criteria for both their generation and their testing were multiple. The more fraud sensitive a model is, the better, but if the model is prone to false positives, this is a shortcoming. To make predictions more robust, the best models were combined.

The final step of the project as reported was to test the model on validation data. Which transactions were used for training, testing, and validation did much matter for the results obtained. But all in all, the ensemble tended to be a better classifier than any of its individual components (but not always) – it was found that "model ensembles mitigate risk compared to single-model solutions and that the ensemble, although not necessarily the best model, was always among the best, and rarely among the worst" (ibid., p. 219) – and "97% of known fraud cases were accurately detected in the validation data set sample" (ibid., p. 218). The models selected 1,217 suspicious transactions, so that the agency would carry out investigations to find out whether these were fraudulent payments.

# 6.2.7 Information Extraction Tools for Integration with a Link Analysis Tool, Developed in the Late 1990s by Sterling Software

Already by the late 1990s, text mining had results to show. During the 1990s, in the United States, several Message Understanding Conferences (MUC),<sup>327</sup> sponsored by DARPA,<sup>328</sup> were held. It built upon research in natural language automated understanding, an active and successful field in the 1970s and 1980s (See Section 5.2 above). The challenge was how to handle effectively masses of data. Traditionally, computer tools for understanding natural-language multi-sentence text had been successful, based on knowledge stored in long-term memory about narrow domains.

Douglas Lenat embarked upon the implementation of an enormous knowledgebase, CYC, of computational representations of items of common sense (Lenat & Guha, 1990), but that enterprise had its critics within the artificial intelligence scholarly community, at a time when the 1990s "AI Winter" was setting in, as leading AI scholars, and a multitude of teams worldwide, had become disenchanted with AI's near-term perspectives of taking on open-textured problems. Whereas the CYC

<sup>&</sup>lt;sup>327</sup> By *messages*, what is intended is incoming documents whose text is *unformatted*; that is to say, they are *free-text*. The arrival of such textual records is referred to as *unformatted message traffick*. <sup>328</sup> DARPA is the United States' Defense Advanced Research Projects Agency.

database is available online, had been historically important, and still has potential, arguable in practice the real breakthrough came with the proliferation of projects developing *ontologies*, for a multitude of application domains. One application is *financial fraud ontology* (Kingston, Schafer, & Vandenberghe, 2004). See Section 6.1.7.7 in this book.

Richard Lee of Sterling Software in McLean, Virginia, reported (Lee, 1998) about several tools for *information extraction (IE)* being developed by his firm. He claimed he had "demonstrated that the state of the art in Artificial Intelligence specifically, Natural Language Understanding - is advanced enough that we can implement a practical Information Extraction tool which populates relational data bases with detailed information from free-text messages" (ibid., p. 67). Sterling Software's first system with an IE capability was the Counter-Drug Intelligence System (CDIS), "which was developed to support analysts tracking the entire spectrum of narcotics-related activities from crop cultivation and precursor chemical production to delivery of the drugs into the United States" (ibid., p. 66). At the core, there was a Sybase relational database. All the entity types involved were stored in that database, along with "a dozen narcotics-related event types" as well as "the full assortment of relations and roles" (ibid.). A second tool with an IE capability was specifically developed by Sterling Software for DARPA's MUC-6 (within the conference series mentioned earlier). "It extracted and templated information on Individuals, Organizations, Locations, Money, Dates, and Times, from Wall Street Journal articles" (ibid.). That tool was reported about in Lee (1995).

Sterling Software then developed a third tool with an IE capability, the *Migration Defense Intelligence Threat Data System (MDITDS)*. At its core, there was a Memex database: "not, strictly speaking, a relational data base engine, but the design has separate tables for the primary entity types, a table for events, and the crucial Association table" (Lee, 1998, p. 66). MDITDS was to be combined with a link analysis tool, which was being developed by Orion Scientific (ibid.). A continuation tool was also been developed, around an Oracle relational database (ibid.), and with additional event types. A knowledge base was being developed for intelligence messages (ibid., p. 67).

Lee admitted (ibid., p. 66) that cross-sentence reasoning was still beyond the capability of his extraction tool: the tool had no problem, when handling a message about the arrival of an airplane carrying drugs, with realising that the drugs were seized, but the tool could not realise that the Movement event reported about was a transhipment involving both the aircraft and the drugs.

The handling of *coreference* (different instances within the text of referring to the same object or person) was to be improved (ibid., p. 67). "One limitation of the IE tool is that it makes no effort to decide whether an item it has found in a message is the 'same' as another item already in the data base; it errs on the side of assuming it is not" (ibid.). Nevertheless, Lee claimed that the generation of excess records could be handled once the IE tool was integrated with a link analysis tool: "It is up to the analyst to use various tools — including link analysis — to decide that the two records refer to the same item. This leads to a useful synergy between the two tools and the analyst" (ibid.).

6 Accounting for Social, Spatial, and Textual Interconnections

Sterling Software was also developing the *Information Extraction Component* (*IEC*), with all the types of entities involved in the previous projects developed by the firm and mentioned here. In particular IEC, was endowed with "the various event types relevant to Counter-Terrorism analysts",<sup>329</sup> and it was to be delivered "with the knowledge bases needed for extracting from newswire articles" (ibid., p. 66).

All Sterling Software's tools with an IE capability except the project for MUC-6 were developed on contracts of the United States Department of Defense. All versions of Sterling Software's IE tool were reportedly developed using a natural-language processing tool, the *NLToolset*, produced by Lockheed-Martin (ibid., p. 67). Lee explained (ibid., p. 64):

The IE operates by first looking for phrases containing all the references to the entities of interest, plus any date and time references. It then analyzes the phrases and clauses containing those references to find all the entity-to-entity associations (relations). It then analyzes the clauses for events of interest, assigning each entity reference, date and time in the clause to the appropriate role in the event. For each item found, it constructs a *frame* — a representationwhich categorizes each piece of pertinent information by putting it into the appropriate *slot*.

Once frames had been generated, to the extent that the extraction tool was able to identify coreference it merged those frames that refer to the same item. Next, those frames were converted into database records. "Typically, each frame is mapped to a single data base record, with each slot mapped to a data base field, but it is often more complicated" (ibid., p. 64).

Lee (1998, p. 65) provided an example whose input was this message:

pilot pablo garcia, colombian, PPT 2324224, arrived at miami international airport on 27 Jun 97. He was arrested by U.S. custom agents when 300 kgs of cocaine was found in the spare fuel tank of his cessna firebat.

For Counter-Drug analysts, the events include:

- · Processing, purchasing, transporting, etc of drugs
- Planning, meeting, or communicating about any of the above
- Arrest of traffickers or sezure of drugs, money, weapons, etc.

For Counter-Terrorism analysts, on the other hand, the events include:

- · Killing, kidnapping, hostage-taking, etc of people
- · Bombing, hijacking, etc of buildings and vehicles
- · Buying, stealing, etc of weapons and money
- Training in weapons and tactics
- Arrest, conviction, punishment etc of terrorists

<sup>&</sup>lt;sup>329</sup> Lee (1998, p. 63) pointed out that event types had to be more specific per area of application, than the entities to be stored in the relational database. Entities of interest as listed, included: Individuals, Organisations (government, commercial, military, extralegal, and so forth), Places (of various grainsizes, ranging from street addresses to entire continents), Facilities (such as factories, airports, hotels, or warehouses), Documents (such as passports, driver's licenses, or bank book), Money, Vehicles (air, land, or sea), Drugs, and Weapons. By contrast (ibid.):

Lee claimed that "the frames would look something like this" (ibid.):

INDIVIDUAL: NAME: PABLO GARCIA OCCUPATION: PILOT CITIZENSHIP: COLOMBIA DOCUMENT: TYPE: PASSPORT NUMBER: 2324224 PLACE: CITY: MIAMI COUNTRY: US FACILITY: TYPE: AIRPORT NAME: MIAMI INTERNATIONAL AIRPORT DATE: YEAR: 1997 MONTH: 06 DATE: 27 ORGANIZATION: NAME: CUSTOMS TYPE: LEA COUNTRY: US DRUGS: **TYPE: COCAINE QUANTITY: 300** UNIT: KG VEHICLE: TYPE: AIR MANUFACTURER: CESSNA MODELNAME: FIREBAT MODELNUMBER: XJ3 **RELATION: TYPOE: HASDOC** ENT1: <DOCUMENT> **RELATION:** TYPE: LOCATED ENT1: <FACILITY> ENT2: <PLACE>

**RELATION:** TYPE: OWNS ENT1: <INDIVIDUAL> ENT2: <VEHICLE> EVENT: **TYPE: MOVEMENT** AGENT: <INDIVIDUAL> DESTINATION: <PLACE> DESTFAC: <FACILITY> ENDDATE: <DATE> EVENT: **TYPE: ARREST** ARRESTEE: <INDIVIDUAL> ARRESTER: <ORGANIZATION> PLACE: <PLACE> FACILITY: <FACILITY> BEGINDATE: <DATE> ENDDATE: <DATE> EVENT: TYPE: SEIZURE SEIZEE: <DRUGS> SEIZER: <ORGANIZATION> PLACE: <PLACE> FACILITY: <FACILITY> BEGINDATE: <DATE>

ENDDATE: <DATE>

This reflects an application of data structures (namely, frames with slots) which were already used in artificial intelligence in the 1970s and 1980s. What was not very developed as yet, was ontologies technology. Still, there is a continuity: we find in Lee's example both types (in event frames and relation frames), and instances of types (in the frames for individual, document, place, facility, date, organisation, drugs, and vehicle).

# 6.2.8 The Poznan Ontology Model for the Link Analysis of Fuel Fraud

A team at the Poznan University of Technology, in Poland, comprising Czesław Jędrzejek, Maciej Falkowski, and Maciej Smolenski, reported (Jedrzejek, Falkowski, & Smolenski, 2009) about an application of ontologies technology to link analysis for investigating scams involving chains of transactions made by a

multitude of straw companies, and whose goal is fuel fraud.<sup>330</sup> In particular, what is involved is a kind of crime known as a fuel laundering scam. "This crime mechanism is to buy rebated oil (in Poland heating oil) from a licensed distributor and then mix it (i.e. add components) and sell to the retail market as duty paid diesel" (ibid., p. 83).

In order to avoid the considerably higher excise tax or duty on Diesel fuel, fraudsters process heating oil or agricultural oil by *fuel laundering* – i.e., by removing the dye identifying these, and adding components – into Diesel fuel that is suitable for engines. The lower-quality fuel thus obtained is then illicitly sold to drivers as Diesel fuel at a pump at gas stations. The cost of transforming the fuel is negligible, and as tax is avoided, the operators pocket the difference. This is a big sector on the black market, both in Poland and, e.g., in the United Kingdom.

The crime mechanism involves a flow of fuel, fuel components, and money, and this is masked by issuing fictitious invoices, either with or without payment. Whereas "the methods to hide the proceeds (i.e. executing the crime scheme) are very similar" (Jedrzejek et al., 2009, p. 81) – notwithstanding its also being true that "fraudsters may use many types of schemes, techniques and transactions to achieve their goals" so that "we need a conceptual model of fuel laundering crime of significant generality" (ibid.) – in the three major cases from Poland that the team studied "prosecutors had an enormous problem to uncover money flows from the source of money (profit centre) to sinks (where the money leaves companies and goes as cash to organizers of the scheme) and in retrospect, some of them did not even attempt to do this" (ibid.).

The purpose of the Poznan team's project was to develop adequate analytic tools to help with investigations and prosecutions. The tool developed is *FuelFlowVis*. The unwieldy difficulties with which the prosecutors were faced are explained in the paper: "This occurs because the use of traditional analysis tools (spreadsheets or non-semantic visualization tools) cannot provide information about chains of transactions — a separate binary relations' view does not give complete insight into the crime mechanism. The consequence of this fact is incomplete understanding of a crime mechanism" (ibid.).

The team was faced with the general problem of its being very difficult to model economic crime (cf. e.g. Chau, Schroeder, Xu, & Chen, 2007) for the purpose of developing a knowledge-based system. The team was also provides with an opportunity, as whereas data mining tools for investigating money laundering have become available, fuel laundering was still virgin territory for AI & Law as catering to the needs of national financial intelligence units.

The team mainly studied three large fuel laundering cases from the 2001–2003 period, that went to court in Poland in 2008. Data sources were incomplete, especially when it came to electronic data (these are often lost in the time lapsed since the crime being perpetrated, and the case going to court). Only for one of the three cases, a rather complete set of money transfers was available, along with the most

<sup>&</sup>lt;sup>330</sup> Incidentally, e.g. Anne Alvesalo (2003) discusses the investigation of economic crime.

important invoice information. The lack of data for the other two cases — "we did not have the original wire transfer data; only the aggregated ones" (Jedrzejek et al., 2009, p. 81) — made it impossible to apply to them a particular data mining technique, namely: triggering rule-based red flags. Most defendants were changed with money laundering, or signing false documents, or fraudulently reclaiming VAT from the tax office, as well as with conspiracy, of tax evasion in the form of simple nondeclaration of income, of false data in a tax statement, or of directing illegal activity performed by another person (ibid.).

The Poznan team developed a formal model of fuel laundering and money laundering, the model being based on a *minimal ontology* (coded in OWL). It is minimal, in the sense that the team deliberately only included there necessary concepts that follow in the logical order of uncovering facts about a crime (ibid., p. 82). That minimal ontology – which is itself structured as eight layers in fact-uncovering order (only five layers were shown in a table ibid.) — constitutes an application layer, which in turn is "embedded in an upper level ontology of criminal processes and investigation procedures" (ibid.).

Modules in the ontology include one (Person.owl) "describing persons as social entities and groups of persons" (ibid.); another module (Document.owl) "specifying legal meaning of documents and their content" (ibid.); a module LegalProvision.owl about legal acts and sanctions; the module intent.own about a person's intentions; the module Action.owl about activities; the module Object.owl describing goods, and in particular, fuels and the added components involved in fuel laundering; and moreover general concepts and relations were defined in the module MinimalModel.owl.

The taxonomy of concepts of the module Object.owl states that both DieselComponent and GasComponent are kinds of FuelComponent; that Diesel, Gas; and IllegalDiesel are kinds of Fuel; and that Fuel, FuelComponent, and HeatingOil are kinds of goods (ibid., p. 83).

The taxonomy of concepts of the module Person.owl states (ibid.):

- that MajorOwner, MinorOwner, and StrawOwner are kinds of Owner;
- that ManagementBoard is a kind of GroupOfPersonsCinnectedToCompany;
- that GroupOfPersonsCinnectedToCompany is a kind of GroupOfPersons;
- that GroupOfPersons, Fraudster, and PersonWhoFalsifiedDocument are a kind of PhysicialSubject;
- that IndirectManager is a kind of PersonNotConnectedToCompany;
- that Owner, DecisivePerson [sic], MiddleLevfelDecisivePerson, and OtherPersonRealatedToCompany are a kind of PersonConnectedToCompany;
- that Physical Subject, PersonConnectedToCompany, and PersonNotConnectedToCompany are a kind of Person;
- that HeadOfSingleUnit, HeadOfMultipleUnits, ChiefAdministrativePerson, ChiefAccountant, and DeputyHeadOfMultipleUnits are a kind of MiddleLevelDecisivePerson;

- thaty ChairmanOfTheBoard, MemberOfTheBoard, and DeputyPerson are a kind of DecisivePerson;
- and that Procurtent [sic] and OtherDeputy are a kind of DeputyPerson.

As can be seen, the concepts defined were such that were found to be useful on an ad hoc basis. For convenience in the exposition, Jedrzejek et al. (2009, p. 82) stated in *database relational notation* the most important concepts that at the time of their writing were functional in their FuelFlowVis tool.<sup>331</sup> This notation consists of the name of a relation, followed by a parenthesis containing a list of attributes. In turn, an attribute (such as Money-Transfer) may itself be a relation. That is to say, Jedrzejek et al. (ibid.) implicitly conceptualised their relational schema by allowing what in database research is known as *nested relations*<sup>332</sup>:

Flow (Money\_Transfer, Invoice, Goods/Service) Money\_Transfer (From\_Entity, To\_Entity, Method\_of\_Transfer, Data, Value, Title-of-Transfer) Method\_of\_Tranfer (Electronic\_Transfer, Cash) Fuel (Component\_of\_Gas, Gas, Component\_of\_Gas, Diesel)

Title\_of\_Transfer states what is the money transferred for, which is in order to obtain some given kind of goods in exchange. In link analysis as performed while investigating fuel laundering, that attribute is both important and problematic. "The crucial step is the unification of money transfer and invoice data, because perpetrators usually enter meaningless information in a 'title of payment field'" (ibid., p. 85).

The Poznan team's project resulted in a tool called *FuelFlowVis*. It is a "visual intelligent analytic tool" (ibid., p. 83). Its purpose is to support prosecutors in the management and building of evidence when handling a fuel laundering scam. "The tool serves to give an investigator an insight into size, timing and topology of transactions. This is controlled by various filters" (ibid., p. 84). Moreover, users are enabled to "inspect invoices or money transfers separately, or in a combined view,

<sup>&</sup>lt;sup>331</sup> They actually store the data in a relational database, and queries are in SQL (ibid., p. 85).

<sup>&</sup>lt;sup>332</sup> Concerning nested relations, see in fn 47 above, and in the text citing that footnote.

at various cales. Usually, one manipulates [the] left local panel and has a small size shaded overview in the right panel" one the screen, when in main application view (ibid.).

Link analysis is visualised in graphs, which are shown either in detail, or in a simplified view with just selected objects, or by showing aggregated relations (ibid.). In the link analysis diagrams, some graphs are *transfer diagrams*, and whereas the nodes represent persons, companies, or other entities, the connections between nodes are of the following types: fuel component invoices (shown in green), gas invoices (shown in blue), Diesel oil invoices (shown in red), or money transfers (shown in black).

Some other graphs are *roles of person's diagrams*, and the connections between nodes in these graphs are of the following types (ibid.): "Approve of electronic money transfer" (shown as a solid red line); "Cash transfer (Drawing cash on authorization or passing cash)" (shown as a dashed red line); "Real or informal ownership of a company (directing activities of a straw company owner)" (shown as a solid black line); "Informal management of a company" (shown as a dashed black line); and "Other activities" (shown as a blue line).

For a given node, *input neighbors* are such companies that transferred money or goods to the company represented by that given node, whereas by contrast *output neighbors* are such companies to which money or goods were transferred from the node considered (ibid., p. 85). The data mining capabilities of FuelFlowVis include also the search of paths, by means of a path algorithm (ibid.). The criminal organisation "consists of many straw companies, whose only rationale is to obscure patterns of transactions and move suspicion away of a mixing shop" (ibid., p. 86), where rebated fuel is fraudulently upgraded. In fact (ibid.):

It has to be understood that although flow of money is real, operations are mostly fictitious — no change of material goods takes place. Similarly, for most operations, invoices were properly drawn pretending a legal operation, but actually the[y] were false. Phony companies have no real inbfrastructure, and most of the time invoices are produced by a scheme mastermind.

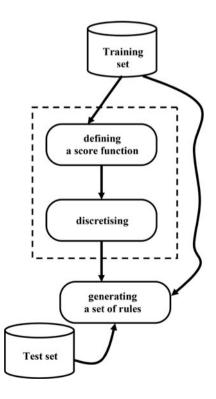
#### 6.2.9 Fiscal Fraud Detection with the Pisa SNIPER Project

A team based in Pisa, Italy, and whose members are Stefano Basta, Fosca Giannotti, Giuseppe Manco, Dino Pedreschi and Laura Spisanti reported about the SNIPER project (Basta, Giannotti, Manco, Pedreschi, & Spisanti, 2009). SNIPER is an auditing methodology, applied to an area in fiscal fraud detection,<sup>333</sup> namely, the

<sup>&</sup>lt;sup>333</sup> A comprehensive survey of research into the application of data mining to fraud detection was provided by Phua, Lee, Smith-Miles, and Gayler (2005). Cf. Kou, Lu, Sirwongwattana, and Huang (2004), Weatherford (2002).

detection of Value Added Tax (VAT) fraud. Such fraud can take various forms, such as underdeclaring sales, or overdeclaring purchases. Moreover, fraudulent claims are possible for credits and refunds, because "tax charged by a seller is available to the buyer as a credit against his liability on his own sales and, if in excess of the output tax due, refunded to him" (ibid., p. 27).

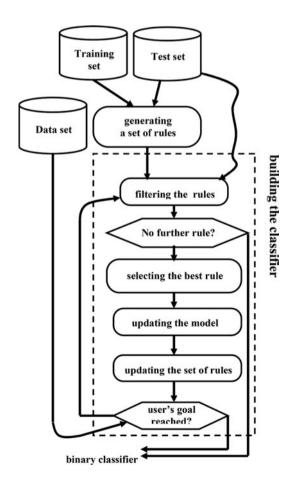
The team developing SNIPER aims at having a rule-based computer tool that by means of data mining, would "identify the taxpayers with the highest probability of being VAT defrauders, in order to support the activity of planning and performing effective fiscal audits" (ibid.). A major constraint is the limited auditing capability of the competent revenue agency: "In Italy for example, audits are performed on only 0.4% of the overall population of taxpayers who file a VAT refund request" (ibid.). The resulting *sample selection bias*, by which auditors focus on suspicious subjects, has the consequence that "the proportion of positive subjects (individuals who are actually defrauders in the training set is vast compared with that in the overall population" (ibid.). The same constraint on auditing capability also "poses severe constraints in the design of the scoring system" (ibid.), and "the scoring system should concentrate on a user-defined fixed number of individuals (representing the auditing capability of the agency), with high fraudulent likelihood and with a minimum false positive rate" (ibid.).



**Fig. 6.2.9.1** The initial, preprocessing part of SNIPER's flowchart

The fraud detection scenario has several objective functions (i.e., criteria) to be optimised, "and a traditional classification system may fail in accomplishing such a multi-purpose task" (ibid.). These typical criteria were enumerated (ibid.):

- *Proficiency*: scoring and detection should not rely only on a binary decision boundary separating defrauders from non-defrauders. Rather, higher fraud amounts make defrauders more significant. For example, it is better to detect a defrauder whose fraud amounts to \$1000 than one whose fraud amounts to \$100.
- *Equity*: a weighting mechanism should highlight those cases where the fraud represents a significant proportion of the business volume. For example, an individual whose fraud amounts to \$1000 and whose business volume is \$100,000 is less interesting than an individual whose fraud amounts to \$1000 but whose business volume is only \$10,000.



**Fig. 6.2.9.2** The classifier-building part of SNIPER's flowchart

• *Efficiency*: since the focus is on refunds, scoring and detection should be sensitive to total/partial frauds. For example, a subject claiming a VAT refund equal to \$2000 and entitled to \$1800 is less significant than a different subject claiming \$200 who is entitled to nothing.

#### Basta et al. (2009, p. 29) pointed out that

In general, supervised techniques (using a training set of known fraudulent cases) based on hybrid or cost-sensitive classification suffer from low interpretability, which makes them inadequate for the problem at hand. In addition, the aforementioned problem of sample selection bias makes it difficult to devise a proper training set. Recently, semisupervised and unsupervised methods have been proposed to partially overcome these drawbacks. Unfortunately, these techniques fail to provide interpretable explanations for the 'outlierness' of a fraudster.

Rather, the team opted for adopting a rule-based classification approach. This is because intelligible explanations made available to the auditors are more important than the scores themselves. By receiving explanations, auditors can get an idea of which behavioural mechanism behind the fraud to investigate. A drawback of rulebased classification techniques is that as, in the problem at hand, the underlying data distribution is such that occurrences of positive cases of fraud are rarely observed, the classifier would be poor at predicting accurately. In SNIPER, the approach is flexible, being "an ensemble method that combines the best of several rule-based baseline classification tools" (ibid.), each handling specific subproblems. The system should gradually learn a set of rules, and devise a scoring function. "Tuning the function allows different aspects of VAT fraud to be emphasized, from which baseline classification tools can then be trained in order to associate class labels to individuals according to their relevance to the aspect of interests" (ibid.). Bad rules, i.e., such rules that would degrade overall accuracy, are to be filtered out iteratively, until a final binary classifier is obtained, which advises whom to audit or not audit. Experiments were claimed to have shown SNIPER to be effective, outperforming traditional techniques (ibid.). In Figs. 6.2.9.1 and 6.2.9.2, I redrew the flowchart from Basta et al. (2009, p. 27, figure 1).

# Chapter 7 FLINTS, a Tool for Police Investigation and Intelligence Analysis: A project by Richard Leary explained by its author

### 7.1 Introduction: Motivations and History of the Project

This chapter is the result of research conducted by myself into the benefits that can be gained by the application of a general theory and methodology for the process of obtaining, managing and using evidence in police investigation and intelligence analysis. Central to this thesis are methods and processes that help investigators and intelligence analysts to ask better questions. This introductory section presents a brief chronology of the development of those ideas and research. My standpoint was informed by having been a Detective Police Officer for a number of years in the United Kingdom.

My original ideas about improving police investigation and intelligence analysis came from ideas that involved the combination of different types of evidence. Furthermore, I had experimented with ideas about how we could improve police investigation and intelligence analysis by developing a better understanding about techniques for the reduction of "uncertainty" as presented in a paper at the First World Conference on Criminal Investigation and Evidence at the Hague in 1995. Uncertainty reduction (*entropy*) for me is at the heart of all good science and is the bedrock of rational systems of discovery. Something I remain convinced upon to this day.

In 1996, two additional papers were published in the Police Research Group's publication, *Focus*. The first was entitled *A Revolution in Criminal Investigation*, and concerned extending the application of forensic principles and genetic evidence within policing. The second was entitled *DNA: The Promise*; it challenged the traditional use of evidence, and proposed new ways for the systematic management and use of evidence in the investigation of multiple cases rather than solely of single cases. These three papers provided the ideas behind the systematic use of large collections of evidence, and helped I to formulate the original ideas underpinning a prototype system of software (called the "Forensic-Led Intelligence System", FLINTS) that became adopted by West Midlands Police. Prior to this, forensic

evidence was almost exclusively used in the investigation of single, isolated events such as a burglary, a murder, or a rape, rather than in the routine investigation of linked series of crimes.

In 1996, I developed an interest in the methods of analysis and synthesis of evidence developed by John Henry Wigmore.<sup>1</sup> Although this approach was exclusively concerned with single, isolated cases, and was intended primarily for use by advocates preparing for court, it provided a foundational methodology for the charting of logical relations between evidence as an aid to developing powerful arguments. I also developed an interest in the science of complexity, which provided valuable ideas about how complex systems function and the way in which information in such systems behaves and can be used. That same year, I won the Forensic Science Society Scholarship and used that funding to continue this research into new ways of using and managing forensic evidence. Systemizing the combination of different evidence types and developing intelligence from forensic evidence were the focus of this work.

At this time, I was seeking to operationalise my research findings in the form of a system so as to accomplish two goals: to overcome five weaknesses identified in police investigation and practice, and to draw on the lessons learned from Wigmore, molecular biology, and complexity theory.

In 1998, I was appointed Scientific Officer to West Midlands Police and tasked to implement new methods of managing and using forensic evidence. In 1999, for the first time in the world. I and scientists from the Forensic Science service experimented with the use of highly sensitive technology for recovering DNA from surfaces that had merely been touched by humans. Although it was usual to recover DNA from visible samples, the experiment focused on material that was invisible to the human eye. The intelligence gained from this evidence was used to identify groups of criminals operating in networks. At this time, there was a national crime problem involving the defrauding of elderly citizens. Confidence tricksters were gaining access to the homes of elderly people on the pretext of being public officials, and using the opportunity to steal cheque books and other valuables. Using "supersensitive" recovery techniques, DNA was successfully recovered from door knockers, handles and other objects that had merely been touched by offenders. Applying new policy, procedures and techniques in accordance with the general theory and methodology described in this thesis, evidence was recovered that resulted in the detection of networks of criminals and crimes. This was later responsible for the prosecution of key people involved in organizing and committing these offences. The technique subsequently became a forensic service offered to investigators.

As a result of this work over a number of years I decided to implement some the main themes of the work into a software system. The resulting software was FLINTS. Mark Compton programmed the computer code under my guidance; I provided domain expertise that shaped how the programmer embodied the conceptual foundations behind my new approach to evidence management and implement it into the software.

<sup>&</sup>lt;sup>1</sup> See Section 3.2 in this book.

In 1999, Nick Tofiluk, Chief Superintendent (later, Assistant Chief Constable) of the West Midlands Police, developed an interest in FLINTS and offered strategic assistance in overcoming organisational barriers to implementation of the system in the West Midlands Region. This resistance was an interesting reaction which I learnt greatly from. In essence, the resistance emanated from protectionist attitudes amongst some Detectives, Managers and the IT Department because adopting FLINTS meant (A) admitting that we could do things faster, cheaper and more effectively and (B) it involved the use of modern computing power and threatened job security. Whilst the former was true the latter was not. FLINTS merely ensured that humans could achieve more and be employed in the things they do best; reasoning, deciding, evaluating and decision making whilst the computer could access, count, sift, sort and process information at breath-taking speed. I and Nick agreed to work together and I was given great assistance in overcoming these organizational barriers. Responsibility for the development of the methodology and conceptual underpinnings continued to remain my own.

In 2002, I began work on a case study intended to develop a new approach to managing the problem of shifting contexts and standpoints in evidence management. In 2003, the first iteration of a new case study was programmed and used to simultaneously manage and analyse evidence in hundreds of cases of fraud. Lawyers involved in the original litigation had been unable to manage these cases without the application of the approach because the body of evidence was too vast for manual methods to succeed. Although the system, called MAVERICK, is outside the scope of this chapter, it uses a unique methodology to manage the way in which evidence is perceived and managed.

In 2004, using MAVERICK, I responded to requests in the provision of two important areas of assistance to law enforcement and financial organizations: First, I provided assistance in meeting the compliance obligations laid down by the Proceeds of Crime Act and Terrorism Act of 2000. This assistance was in terms of "disclosures" of material to the National Criminal Intelligence Service about suspected terrorist funding and financial crimes committed during organised crime involving fraud and deception. These disclosures were made on behalf of U.K. lawyers representing large corporate organisations who had been targeted with fraud. Second, I provided assistance in the management of a mixed mass of evidence concerning 2 million financial transactions suspected to contain material subject to the above legislation. My methodology and the MAVERICK software were used throughout.

### 7.2 Early Beginnings

The traditional approach to the management of evidence in policing has involved narrow conceptions of the way evidence is managed, analysed and used. My experience demonstrated that practitioners<sup>2</sup> adopted narrow views as well as uninspired

<sup>&</sup>lt;sup>2</sup> This includes police officers, Crime Scene Investigators and lawyers.

approaches<sup>3</sup> towards the study and use of evidence as a science. This included the way that evidence should be collected and the many uses to which it could be put. A common experience was that whilst cases may appear to be overwhelming proven "on paper", by simply adopting another standpoint or considering an alternative explanation about some aspect of the case, an alternative view could be deemed not only plausible, but often persuasive. Often, this was the result of investigators treating and interpreting evidence only in the light of the hypothesis they were pursuing. Evidence is too often seen in light of the support it can give to a narrow or single hypothesis. Alternatives are not considered, or, if they are, they are dismissed too readily. Narrow or single hypotheses often appear in the form of a case theory. For example, the theory may propose that a particular act had been perpetrated by a particular individual, or that an event took place "in the following way", thereby favouring a particular explanation. This narrow view has implications not only for single cases, such as the investigation of historical events or crimes, but also for intelligence analysis and predictive enquiry. In terms of single cases, it creates barriers to the consideration of alternative explanations.

Evidence that may support an alternative theory may be ignored, resulting in the wrong conclusion being drawn. In terms of intelligence analysis, the narrow focus can prevent users of evidence from considering fruitful lines of enquiry that would potentially prevent a threat from becoming a reality. Simple explanations or those that appear obvious are considered at the expense of those more difficult to uncover. Collections of evidence often contain many layers of information in which indirect links and associations may not be immediately obvious. Accessing and testing these areas of our collections of evidence present many opportunities for the discovery of new knowledge.

This insight provided valuable lessons about the way evidence is sought, collected and used, and seemed crucial to developing a better approach. What seemed

<sup>&</sup>lt;sup>3</sup> Following my appointment as a Detective in 1981 in the inner City of Birmingham, England, I found the lack of determination that some investigators adopted in the search for evidence in their investigations was surprising. In particular, the search for evidence in pursuit of one side of the story struck me. I cannot claim that this bias was borne of some high-grounded moral attitude, but rather, quite simply, of the futility of learning all sides of the story. It became apparent fairly early on that evidence is always available, in some form, somewhere, and it is only our determination and ingenuity in finding it that is in question. Furthermore, any collection of evidence eventually has to be tested by others. These may be Crown Lawyers, Defence Lawyers, a Jury or a Judge, and any suspect; therefore, I had a responsibility not only to satisfy my own view of the evidence, but also to demonstrate that I had tested arguments in favour of my hypothesis as well as those counter to it. This paid off many times, particularly in generating new sources of covert information from within the criminal fraternity. Balance and fairness demonstrates reliability, which was something that informants sought from an investigator when seeking to impart information, especially in cases involving violent or serious crime. Anticipating the opposing view, seeing evidence from different perspectives and demonstrating that evidence had been collected in support as well as negation of a hypothesis was crucial. Whilst it is never possible to overturn every possible stone, it is possible to demonstrate that one has overturned every reasonable stone, bearing in mind the available evidence and the issues under investigation.

to be missing was the development of a truly systematic forensic<sup>4</sup> attitude towards the management and use of evidence.

### 7.3 FLINTS 1

FLINTS is a modernised neo-Wigmorean approach to the management, analysis and use of evidence in pre-trial criminal fact investigations. It was designed on the basis of the methodology in this thesis to model the relationships between people, crime, locations, times and evidence in ways useful to analysts, investigators and policy makers. This kind of Wigmorean evidence modelling serves a number of purposes in the generation and discovery of knowledge. However, there are two principal purposes it is concerned with: first, the provision of understanding of the attributes of evidence we already possess about events that have already take place, and second, the provision of insights into evidence we do not yet possess, but need, and into events that may yet take place. At the end of this chapter, a case study in "linked burglary crime" is described, and the methodology and use of FLINTS are demonstrated.

Policing has suffered<sup>5</sup> from a lack of knowledge about the structural and intellectual questions surrounding the collection and use of evidence as a discipline and has therefore been unable to construct a conceptual framework and a set of operating principles that would allow police organisations to gain maximum knowledge from their collection of evidence.

The mechanisms I put forward in my doctoral dissertation to aid the modelling of relationships within networks of evidence are achieved by organising the systems and structures under which evidence is discovered, collected, considered and stored so that links and connections inherent in the evidence can be speedily established. This in turn aids the formation of new hypotheses and the elimination of old hypotheses. Questions can be asked of the system to draw on the complex combinations of evidence that already exist, but that are perhaps not readily known, as well as those combinations and connections not known to exist but that are strongly suspected to exist.

This demonstrates that although we may be in possession of information, we are often unaware of the evidence's existence, or, if we are aware of its existence, we are sometimes oblivious to its meaning and the links that exist within the information. The contribution that approaches like this can make to developing our understanding of the environment in which we operate is underestimated. What we "possess" and what we "know" are often very different. Establishing the difference between what

<sup>&</sup>lt;sup>4</sup> To this end, *forensic* is meant to portray an interrogative, questioning approach. The *Shorter Oxford English Dictionary* defines the term as "pertaining to, connected with, or used in courts of law; suitable or analogous to pleadings in court, or a speech or written thesis maintaining one side or the other of a given question."

<sup>&</sup>lt;sup>5</sup> I argued that much in chapter 1 of my doctoral dissertation.

we possess and what we know provides the ability to establish what we "do not possess" and "do not know". Optimising systems to undertake this function is crucial in getting the most benefit from the evidence collections we have. Applications for use of this approach are many.

Identifying links and connections between crimes and events that we know<sup>6</sup> have taken place and people that we believe are connected to these occurrences helps us to identify links and connections with other crimes, events and people that *may* be linked, but for which evidence is currently not available to justify, negate or sustain that belief.<sup>7</sup> Investigators can set out to establish whether sufficient evidence, even if not presently available, does exist in some form, somewhere, to justify or negate the hypothesis. This helps us to investigate crime not only on the basis of single events in time, but also on the basis of chains of events in time and space, and thus represents a whole new way of thinking about crime investigation and intelligence analysis. Let us imagine a series of ten crimes of burglary linked on the basis of DNA evidence.

Let us consider an example: a series of 10 crimes linked by a single DNA profile. Figure 7.3.1 illustrates that at each of the 10 crimes, DNA evidence in the form of a crime stain<sup>8</sup> was recovered. The hypothesis is formulated that these 10 events are linked because DNA recovered at each crime scene has produced the same genetic profile, namely that of suspect "A".

We can formulate a hypothesis that the donor of the DNA at each of the scenes of crime is the same person, even though we do not yet know their name.<sup>9</sup> In an effort

<sup>&</sup>lt;sup>6</sup> Here, the term "know" does not mean a fact that has been established beyond challenge. It means instead "that which we are prepared to accept on the basis of reliable evidence currently in our possession".

<sup>&</sup>lt;sup>7</sup> Challenge may come in the form of counter-arguments put forward by our adversaries or, just as importantly, counter-arguments we construct ourselves to test some argument that we are naturally persuaded by. The former is simple; adversaries or colleagues may favour another argument or explanation that they put to us in the form of a challenge, and we can deal with it on that basis. The latter is sometimes difficult because it involves constructing counter-assertions ourselves, often in the knowledge that we are already satisfied with the current explanation. The approach may go something like this: "Is this explanation or argument sustainable if new evidence were to be made available?" Alternatively, it may go like this: "Is my explanation or argument sustainable in the light of the following alternative hypothesis?" This thought process may involve considering a range of possible explanations or arguments ranging from that which is highly probable. It may also involve considering that which is impossible. The reason for this is simple: that which is impossible on the basis of evidence currently available may become possible in the light of new evidence or some other explanation. The process may instead be as simple as viewing the evidence we currently have in a different light or from a different standpoint.

<sup>&</sup>lt;sup>8</sup> *Crime stain* means DNA recovered in some form from a crime scene and that awaits matching against reference samples stored in a database. A match with one of these samples would enable the investigator or analyst to formulate a hypothesis that the individual may have had the "opportunity" to commit the crime. It does not necessarily mean that they *did* commit the crime.

<sup>&</sup>lt;sup>9</sup> In addition to the problem of false positives and adventitious matches, investigators and analysts should also keep in mind that identical twins share the same DNA code. Identical twins (monozygotes) originate from a single embryonic cell and therefore share the same genomic DNA. Therefore, wherever monozygotic twins are suspected of involvement in a crime, both must be

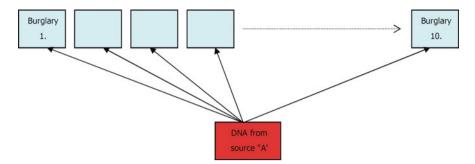


Fig. 7.3.1 A hypothetical series of 10 crimes linked by a single DNA profile

to identify the donor of the DNA, we might search for any matching DNA profiles from former suspects and convicted persons stored in the National DNA Database. However, it is possible that after the search, despite our establishing that the crimes appear to be linked, no profiles from suspects and convicted persons matched Profile A. We would then be left with the task of identifying the offender by other means.

#### 7.4 Identifying "Unknown" Offenders

How can we set about identifying "unknown" offenders? We could sit around and hope that we "get lucky" or we could appeal for witnesses to the events in the hope that someone, somewhere, might have the evidence we need. One effective approach is to explore methods that reduce the level of uncertainty associated with the number of people in the database that could account for the DNA profile.<sup>10</sup>

We can create a "virtual offender" to account for the presence of DNA Profile A at the scene of each of the crimes and await other evidence that might indicate a legal identity. This can be done by systematically exploring the information we already possess to ascertain whether there are any indications anywhere in our systems as to the possible identity of the individual who possesses DNA Profile A. Not only might this produce a suggestion of their identity, it might also lead us to search for additional information in areas where we are likely to find useful indicators of the offender's true identity.

So far we have only considered DNA evidence recovered from each of the 10 crimes. There may be other evidence available that we have not considered. Fingerprints, footwear, tool marks, handwriting, hairs, fibres, witness evidence and

considered "suspects" and therefore both must be treated for the purposes of an investigation as requiring us to eliminate them from suspicion. The hypothesis that the virtual suspect or offender may be one of two identical twins must always be considered.

<sup>&</sup>lt;sup>10</sup> The ideal position is to be able to eliminate all persons except one. Once we have reduced the uncertainty to a single individual, we can then use other evidential tests to challenge the reliability of the analysis and conclusion.

other clues may provide a suggestion about the likely identity of the suspect if we consider this evidence alongside the DNA.

Imagine that a fingerprint found at burglary 4 is identified as the index finger on the right hand of a known former burglar called Mr. George Smith. The question then arises: "Does George Smith have DNA profile A?" If he does, fingerprint evidence has suggested a method to establish the identity of the original donor of DNA profile A – possibly Mr. George Smith. If the answer affirms this, then Mr. George Smith may be asked to provide a DNA sample for comparison and, if matched to DNA recovered from one or more burglary scenes, asked to account for the presence of his DNA at each of the 10 scenes. Other evidence types can also be used in this way.

Many types of evidence can help us to identify people that we know exist in the population but for whom we have no means of distinguishing them as individuals. Used in combination, these sources of evidence present us with a range of possibilities to identify individuals uniquely. Some involve direct and some involve indirect chains of reasoning.

### 7.5 Systemising the Identification of Unknown Offenders

Policing and intelligence work has for too long approached the identification and elimination of suspects in a conceptually narrow way. The focus of attention has been on the use of names rather than a wider concept involving the use of *indicators of identity*.<sup>11</sup> Intelligence systems employed in law enforcement use names as the key identifier. The same is true of evidence systems used in fingerprint and other forensic databases.

The ability to systematically (and routinely) identify *persistent offenders* has great potential for decision-making and for optimising investigative effectiveness. Identifying those persons who commit most of the crimes in our systems offers greater returns on the investments we make in the deployment of staff and financial resources.

The use of a wide range of indicators of identity can be used rather than narrow, single indicators (typically only a name) to provide a more inquisitive methodology for identification. Rather than simply referring to offenders by either their name or as simply "unknown", they can be referred to as "virtual unknowns". They can be classified and catalogued in a database alongside indicators of the characteristics we do know. As the investigation of crime continues over time, we can explore different combinations and different inferential chains of links by using these indicators in combination to help us set about filling in the gaps in our knowledge. Researching

<sup>&</sup>lt;sup>11</sup> This concentration on the use of a name as a means to identify people is surprising bearing in mind the large proportion of the population that share the same name. Some with the same name even share the same date of birth.

direct and indirect chains of links may eventually produce or suggest a possible indicator as a means of identification.

Let us consider this approach in detail. If we are satisfied from the available evidence that a crime has been committed, we can infer that someone who may (as yet) be unknown committed the crime. Unknown persons can be classified as "virtual suspects" simply by giving them a unique number to act as an identifier until their true identity is discovered. Once we have allocated a unique number to the "unknown", we can then think about them as a "virtual unknown" person. This provides us with a whole new way of thinking about the problem of identification. We can use a range of indicators about their characteristics, their identity or their personal circumstances to do so. Taken together, these indicators can provide the means to link different aspects of identity until one or more of those indicators provide a suggestion of a name.<sup>12</sup>

It is the ability to develop and navigate direct and indirect chains of inference between indicators that presents the opportunity to identity individuals. This is an example of a broader use of the concept of evidence and the wider uses to which it can be put to.

Table 7.5.1 is a *multidimensional identification index* designed to present a systematic approach to the use of a range of indicators to identify people.

Referring to Table 7.5.1, let us imagine that Event 2 was a burglary in which the offender shed hair. Subsequent DNA analysis of the hair produced a DNA profile. However, no reference sample of the offender existed in the National DNA Database, therefore the offender cannot be immediately identified by name. Genetic information gained from DNA profiling of the hair provided further information about the person's physical characteristics: their hair colour, eye colour, ethnic ancestry and height. These additional indicators are used to begin to fill gaps in the *virtual persons record* that may become useful to us.

The same DNA profile is found at Event 4, the theft of a motor vehicle. A witness to Event 4 states that the offender was seen to have a distinctive tattoo on his right forearm: an eagle and sword. He was aged between thirty and forty years, was a white European and had brown to red hair.

Because Event 4 revealed the same DNA profile as Event 2, we can begin to cross-reference specific details of *indicators* from Event 4 to Event 2.<sup>13</sup> The index demonstrates how we can use a method of cross-referencing evidence from one event to another so as to provide us with a system to navigate inferential links, gaining clues to the identification of individuals and even groups of individuals as we progress. In this example, it can be seen that the DNA recovered in Events 2 and

<sup>&</sup>lt;sup>12</sup> A *virtual suspect or offender* is a person who is known to exist because evidence of their presence at a scene of crime has been discovered, but whose identity is yet to be established.

<sup>&</sup>lt;sup>13</sup> For example, the original Indicators (DNA, tattoo, age and hair colour) that we discovered from Event 4 are marked with a red **#** sign. Because the same DNA profile was found at Events 2 and 4, we can infer that all details for Event 4 should also apply to Event 2. These inferred indicators are marked with a blue **#** sign.

	Events, Crimes and People; 1-n				
Evidential indicators of	1	2	3	4	5
identity					
1. Sex					
2. Birth date or age		#		#	
3. Address zip code					
4. E-mail address,					
number					
5. Father's reference					
number					
6. Mother's reference					
number					
7. Male siblings					
8. Female siblings					
9. Height					
10. Eye colour					
-		щ			
11. Hair colour		#		#	
12. Ethnic origin		#		#	
13. Shoe size				-	
14. Biometric					
identifiers:					
(a) Eyes					
(b) Facial					
(c) Fingerprints (10)					
15. DNA profile		#		#	
16. Genetic		#		#	
characteristics:					
(a) Hair colour		#		#	
(b) Eye colour		#		#	
(c) Gender		#		#	
(d) Ethnic ancestry		#		#	
(e) Height		#		#	
17. Body marks;		#		#	
tattoos/scars					
18. Vehicle number					
19. Electoral roll					
number					
20. Nationality					
21. Passport number					
22. National Insurance					
Number					
23. Driving licence					
number					
24. Credit card number					
25. Taxation number					
26. Telephone number			1		
27. Cell phone number		1	+	+	
27. Cell phone number 28. National		-	+	+	
Identification					
Number			+	+	
29. Associates with		-			
30. Employed by					
31. Educated at				_	
32. Related to					
33. Criminal convictions					
34. Occupation					
35. Name					
(legal/accepted)					

 Table 7.5.1
 A multidimensional identification index

4 provided us with genetic information about the offender's physical characteristics and ancestral ethnicity, and these become a part of the index.

A search of the tattoo file in the multidimensional index reveals that two people are known to have a tattoo of this description: a male aged sixty-five years, of West Indian appearance and with a recorded name of Charles, and a thirty-two-year-old male of White European appearance called Finney. Neither had previously provided DNA profiles. The system could be automated to check for those persons within the population with indicators that match a tattoo as well as any other indicators available. This narrows down those in the system that could potentially match with the available information.

Computers can be used to manage and track the chains of connections produced by this kind of cross-referencing. Although the methodology is simple, the potential links involved soon become complex and require an efficient means of tracking and cross-referencing. This process helps us to eventually establish an identity using the conventional method of a legal name, ultimately reducing the uncertainty about the legal identity of the person of interest to us. Another useful attribute of this method is that the indicators of identity can be searched in predetermined ways involving one indicator or a combination of indicators to "cleave out" of the system configurations of information of interest to us. We may need to identify a white male, aged fifty to fifty-five years, with brown hair and blue eyes, and who drives a white BMW car. This may produce a range of potential suspects, some with known legal names and others still classified as "virtual unknowns". Again, the process of cross-referencing indicators, combining indicators and exploring inferential routes between records may produce an indicator of interest in determining a true identity.

Let us consider another aspect to this process. The evidence we have does not mean that the *virtual suspect or offender* was alone when the crimes were committed; they may have committed any one or any combination of these crimes with any number of other individuals. The index may provide evidence of links between individuals and hence their potential identity. Even the notion of virtual criminal networks can be used in this way. For example, we may have evidence in our system to suggest that a number of crimes have been committed, and by means of a range of indirectly linked indicators, a complex network of links between a group of people may be suggested. These groups can be used as sources of suggested names for elimination purposes. As with the fingerprint evidence at burglary 4 in Table 7.5.1, if we can establish an accomplice of our "virtual offender" acting in concert at (say) burglary 6, that evidence (whatever it may be)<sup>14</sup> may suggest a potential name for the donor of the DNA found at each of the 10 crimes.

<sup>&</sup>lt;sup>14</sup> Evidence should always be subjected to questions about its reliability, relevance and probative force.

# 7.6 Link Detection

Modelling networks of offenders can assist in the identification of suspects and groups of suspects for crimes that may already have occurred and for crimes that are yet to occur if action is not taken. Let us consider how this can be done and how FLINTS can assist in this. Searching each of the 10 crimes for additional evidence types such as a fingerprint or tool mark or footwear impressions may give rise to suspicion about a group of suspects or even an additional single suspect who may also have been involved.

Figure 7.6.1 demonstrates how a multidimensional approach to evidence management and analysis can aid in the detection of links between series of crime evidence and people. The same approach can be used to detect links between groups of people, geographic locations and chronologies using different *mixtures* of evidence. Figure 7.6.1 is an illustration of a database of crimes that can be examined for linkages on the basis of different evidence types. Each square in the illustration represents one crime. Each blue square is a crime scene from which DNA of type A has been recovered. As already stated, these 10 crimes are potentially linked.

A useful question might concern which of the remaining crimes in the database are linked based on an analysis of a variety of evidence types and, importantly, which are linked on the basis of combined evidence types. If any other evidence type (for example, those listed in the illustration) can provide a suggestion of a linked suspect, then we can set out to implicate or eliminate that suspect based on the DNA evidence.

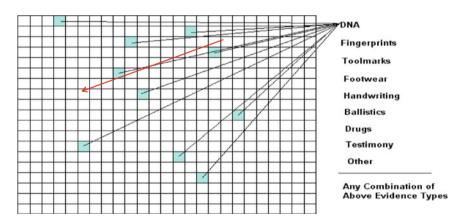


Fig. 7.6.1 A multidimensional approach to evidence management and analysis<sup>15</sup>

<sup>&</sup>lt;sup>15</sup> A finger mark at linked crime 6 suggests the name "George Smith" as a suspect. Smith may possess DNA profile type A. If so, we can connect him with the series of 10 linked crimes. If he does not, one of his associates may. Other evidence types may indicate additional links between other crimes and Smith as well as other series of crimes and other suspects. Some of the new suspects may be connected to Smith as associates.

Inferential links may be discovered on the basis of high frequencies of offending in particular geographic areas or where a crime bears a particular *modus operandi*. These observations may reveal interesting patterns to consider as hypothetical links within the original linked series. This may reveal evidence that suggests suspects for consideration in the original series linked by means of DNA.<sup>16</sup> Using this idea, a search of the FLINTS system may reveal potential suspects on the basis of the frequency of crimes bearing striking similarities to the series of 10 that are believed to be linked.

Investigators and analysts can begin to discover and understand complex networks and connections between people, events, locations, times and evidence in ways not previously possible. FLINTS not only allows this to be done – it allows it to be done speedily, efficiently and with reliable and actionable results. In *Foucault's Pendulum*, Umberto Eco (1988, p. 225) describes an innate characteristic that exists in databases of information. This description by Eco could well have been a description of FLINTS:

No piece of information is superior to any other. Power lies in having them all on file and then finding connections. There are always connections you have only to want to find them.

FLINTS is designed to act as an evidence integrator that brings together collections of evidence and arranges them in such a way that users can formulate questions. The principal objectives are to enable the marshalling of substance-blind sources of evidence that enable links between people, events, locations, times and evidence to be discovered by the process of analysis and questioning.

Figure 7.6.1 demonstrates the fundamental principle of integration, management and analysis of evidence around the key attractors of people, events, locations, times and evidence. If we begin from the left-hand side and work through the chart, we see that evidence is put into the system from various sources. These may be sources such as fingerprints and DNA, but in fact can be any class of information that we determine as reliable. *Accepted fact*, a concept well understood in law, has great potential in intelligence analysis. There are many facts about the way we live, work, behave and communicate that are generally available. These characteristics can be used as evidence in the form of *accepted fact* and treated in much the same way as DNA, fingerprints and other forensic evidence types.

Evidence of many kinds is integrated in the FLINTS database around the key attractors of people, events, locations, times and evidence so that links, associations and connectivity within the data can be detected. The system allows questions to be formulated in a structured way by investigators and analysts using a conventional computer that runs Microsoft Windows. Figure 7.6.2 is an illustration of the flow of evidence through FLINTS.

<sup>&</sup>lt;sup>16</sup> One of those crimes may have been detected or there may be an item of evidence at any one of the crime scenes that may provide an insight into the identity of the "virtual suspect or offender".

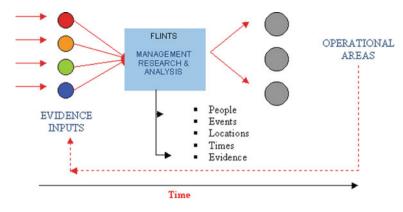


Fig. 7.6.2 The flow of evidence through FLINTS

# 7.7 The First Generation of FLINTS

The prototype FLINTS system began managing forensic evidence matches in the West Midlands Police department in April 1999 following a request from the force to use the system.<sup>17</sup> The system had been designed to demonstrate the benefits of its underlying concept<sup>18</sup> and used fingerprint and DNA evidence to do so. Evidence based on footwear, handwriting, tool marks and drugs were soon to follow. The system provided for the integration, management, analysis and performance measurement assessments as well as for the systematic allocation and management of enquiry work.<sup>19</sup> Protocols designed for key managers and key analytical tasks became part of the West Midlands Police strategic policy.

Forensic matches reported by departments for specific evidence types are input into FLINTS by means of a standard formula. For example, DNA matches reported by the National DNA Database, fingerprint matches reported by the West Midlands Fingerprint Bureau<sup>20</sup> and physical evidence matches such as footwear and tool marks reported by forensic laboratories are brought together in the FLINTS Bureau for entry into the underlying databases.

<sup>&</sup>lt;sup>17</sup> This system was the prototype version of FLINTS.

<sup>&</sup>lt;sup>18</sup> FLINTS was designed on the basis of *Intellogic* as an executable computer programme for use in forensic investigation. Other applications were not pursued as computer programmes at this stage.

<sup>&</sup>lt;sup>19</sup> The enquiry work referred to is often called an *action package*. This package is a file of evidence produced by FLINTS that contains all the necessary evidence, photographs, plans and ancillary intelligence necessary to carry out an enquiry and usually leads to the arrest of a suspect. The suspect is normally the target in the action package.

<sup>&</sup>lt;sup>20</sup> Fingerprint matches are input automatically, but their quality must be checked by the intelligence system's manager.

Strategic and analytical management tasks can be undertaken for a wide variety of purposes. Some of the tasks undertaken: maintaining a "tracking system" for the enquiry work allocated, assessing the performance of operational police areas by individual evidence types as well as by individual scene examiners, comparing evidence yields by operational areas and individuals, managing information about suspects identified, and comparing operational areas for trends.

#### 7.8 Integration, Linking and Analysis Tools

From the initial implementation, it became apparent that FLINTS gives the user access to ranges and classifications of intelligence data about people, events, locations, times and evidence. The system enables the user to "visualise" the evidence in a number of ways that provides a range of perspectives on the data. Geographical visualisation, network visualisation and spreadsheets of varying kinds can be requested and presented in user-friendly ways. Wigmore recognised the power of visualising evidence for temporal analysis and the synthesis of arguments. FLINTS thus uses a Wigmorean approach in the development of scenarios of interest to the analyst and investigator.

Arthur Conan Doyle gave Sherlock Holmes a number of attributes important to his task that are rarely *all* seen at once in analysts and investigators in real life: keen curiosity, high native intelligence, a fertile imagination, powers of perception, a superb stock of knowledge and extreme ingenuity. In Arthur Conan Doyle's 1887 novel *A Study in Scarlet*, the first story to feature the character of Sherlock Holmes,<sup>21</sup> Holmes explains to Watson the difference between some of these attributes:

I have already explained to you that what is out of the common is usually a guide rather than a hindrance. In solving a problem of this sort, the grand thing is to be able to reason backwards. That is a very useful accomplishment, and a very easy one, but people do not practice it much. In the every-day affairs of life it is more useful to reason forwards, and so the other becomes to be neglected. There are fifty who can reason synthetically for one who can reason analytically.

In *The Five Orange Pips*, Arthur Conan Doyle has Holmes explain to Dr. Watson the importance of understanding how chains of events can be studied and reasoned about. He says:

<sup>&</sup>lt;sup>21</sup> "Although Conan Doyle wrote 56 short stories featuring Holmes, *A Study in Scarlet* is one of only four full-length novels in the original canon. The novel was followed by *The Sign of Four*, published in 1890. *A Study in Scarlet* was the first work of fiction to incorporate the magnifying glass as an investigative tool" (http://en.wikipedia.org/wiki/A\_Study\_in\_Scarlet). The novel's quite negative portrayal of Mormons was heavily prejudiced and even libellous, as Conan Doyle allegedly eventually came to acknowledge (ibid.).

The ideal reasoner would, when he has once been shown a single fact in all its bearings, deduce from it not only all the chain of events which led up to it, but also all the results which would follow from it.

There are no formal rules in existence for *reasoning* and, if they did exist, they would represent a *logic of discovery*. Schum (1994, p. 479) believes that this illustrates what he calls *bottom up* and *top down* reasoning.<sup>22</sup> These are useful metaphors because they can aid investigators and analysts in understanding the frame of thinking in which they are operating.

FLINTS goes some of the way towards helping analysts and investigators develop their curiosity; because they are provided with high-quality data, and the system operates on the basis of questions, the user's imagination and perception of events, people, locations and times are important. This mass of knowledge and data is stocked, awaiting enquiry by users. Although FLINTS can never replace human powers of reasoning, it does provide a foundation and system from which users can access evidence, analyse it, synthesise questions and hypotheses, and visualise results in ways that are easily understood. In addition, the system then allows the results of those queries to be entered into the system as new inputs in the form of new questions in a circular and almost endless quest for new knowledge. The analyst and investigator can access substance-blind evidence about series of crimes, series and networks of active criminals, crime patterns, and areas where the frequency of crime is high. It can also identify travelling criminals. The system concentrates the mind of the user on using the weight of the evidence to link nodes rather than on the type of evidence involved.

Although by 2001 the Home Office was considering the potential of FLINTS and the approach underpinning the software to enhance the use and management of forensic evidence and intelligence nationally), a report from that year acknowledged that much more could be done to train users to get the best from the system.<sup>23</sup>

The FLINTS system has the potential to support substantial improvements in police efficiency and effectiveness in West Midlands. However, the force is far from using the system to its full capability. This includes the as yet untapped potential for FLINTS [to be used] as a senior strategic management information tool. West Midlands should therefore refine its

<sup>&</sup>lt;sup>22</sup> Schum (1994) provides a diagram illustrating these processes. Their uses are in the generation and testing of hypotheses.

<sup>&</sup>lt;sup>23</sup> FLINTS was adopted by the West Midlands Police, the Warwickshire Constabulary, the West Mercia Constabulary, the Staffordshire Police and the Hampshire Constabulary. The Tayside Police in Scotland and the Dorset Police are also considering adopting the system. The national body responsible for police technology – the Police Information Technology Organisation (PITO, a part of the Home Office) – are considering adopting the forensic module of FLINTS as a national system accessible to every police officer in England, Wales and Scotland. The system was recommended as a "best practice" by two of Her Majesty's Inspectors of Constabulary. The first, Keith Povey, afterward became Her Majesty's Chief Inspector of Constabulary; the second is Sir David Blakey. See also Management Summary, Home Office Policing and Reducing Crime Unit (2001) Evaluation of the Impact of the FLINTS Software System in West Midlands and Elsewhere (Home Office, United Kingdom).

FLINTS Project Plan so as to maximise its beneficial impact [...] This national potential includes the opportunity for forces to improve detection of crimes<sup>24</sup> committed by offenders across policing boundaries.<sup>25</sup>

### 7.9 Expanding FLINTS to Other Police Areas

In April 2001, following a recommendation from the Regional Forensic Science Group,<sup>26</sup> FLINTS began to manage forensic matches for West Mercia, Warwickshire and Staffordshire by means of a wide-area computer network linking the forces together. FLINTS gave the forces access to all West Midlands databases dealing with crime, incident handling<sup>27</sup> and custody data via FLINTS computer terminals of the type described towards the end of this chapter. In the future, it is predicted that each of these forces will also integrate all their current non-forensic databases of police information into FLINTS so as to realise the benefits that the West Midlands region is seeing. At present, the Midland Region communicates using high-bandwidth networking technology and shares all forensic intelligence data. It is the first Region to have adopted this approach. In Fig. 7.9.1, the current FLINTS communication channels are indicated by red lines; these represent the flow of data as in the original installation of FLINTS, at the West Midlands Police. However, note that these lines do not yet make for a complex system whereby each force can communicate with any other force or combination of forces as needs

<sup>&</sup>lt;sup>24</sup> It should be noted that the reference is plural. This is an important feature of the rationale and design behind the FLINTS approach. FLINTS manages evidence and information about *volumes of crime* as well as single crimes. The traditional approach is based on managing evidence and information as single cases.

<sup>&</sup>lt;sup>25</sup> There are 43 police forces in England and Wales. These are distributed and resourced on the basis of political boundaries, with separate Chief Officers and Police Authorities. Each force decides its own policy for crime investigation, detection and reduction as well as the structural arrangements for the delivery of the policing service to the community. There is a natural tendency to concentrate on crime committed within the force's boundaries, and crimes committed elsewhere attract less attention. This provides the strategic opportunity for criminals who are prepared to travel to commit crime with very little likelihood of being detected based on repetition of their offences. Criminals who reside in one police area and who travel to commit crime in other police areas are difficult to track and detect, and pose a serious threat to the community at large. Amongst other things, the National Criminal Intelligence Service (NCIS) was set up in 1996 to provide support to forces nationally in dealing with travelling criminals, yet no national system or ability to both monitor nominals (suspected persons), crimes they have links to, their associate networks and forensic evidence matches is capable of linking them with crimes and other persons. FLINTS could fill that gap.

<sup>&</sup>lt;sup>26</sup> Forensic science and best practice is monitored jointly by a number of police and Forensic Science Service Regional User Boards. These operate across regional areas and serve a number of police forces. The Midland Region is served by boards for West Midlands, West Mercia, Staffordshire, and Warwickshire. It was chaired at the time by Mr. Peter Hampson, Chief constable of the West Mercia Police.

<sup>&</sup>lt;sup>27</sup> The system is called *Command and Control Data*. This includes access to the emergency (999) system.

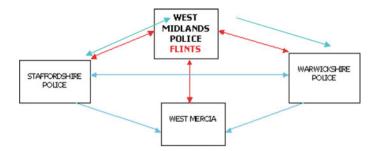


Fig. 7.9.1 Original (red) and envisaged (blue) communication channels

arise.<sup>28</sup> The next stage was to envisage an expanded capacity whereby each force would effectively input its data into one system, communicate in complex ways and make thorough use of feedback looping (the blue lines in Fig. 7.9.1).

In addition to these police services, a number of others expressed an interest in inputting their forensic match data into the system so that it can be shared in exchange for the improved analytical capability they would obtain.<sup>29</sup> This will enlarge the network and database, and will extend the system's analytical capability. The benefits of extending the system to other police forces will be the wide-scale integration of evidence managed in those force areas. As of April 2002, with the exception of the Midland Region and Hampshire, each evidence type was managed within isolated systems. The benefits of a substance-blind integration and treatment of evidence has yet to be realised in those areas. For example, police forces outside the Midland Region cannot manage matches from their diverse evidence types within one system, they cannot access management information about matches with other evidence collections and they have yet to automate the preparation of Evidence and Intelligence "action packages". In short, Wigmorean approaches have yet to be adopted, but the tide is beginning to turn and FLINTS, with its ancestral foundations in Wigmorean analysis, is proving to be the catalyst for this change.

Access to accurate intelligence is central to being able to exercise good decisionmaking in policing. FLINTS provides this access through the integrated management of evidence as well as through a structured approach to the asking of questions of and about the evidence itself. Wigmore knew even in 1913, when he published his first edition of the *Principles of Judicial Proof* (Wigmore, 1913, 3rd edn. 1937) that

 $<sup>^{28}</sup>$  Feedback loops involving an iterative process of hypothesis generation, testing and regeneration are limited. This type of process is important in the search for new knowledge in systems.

<sup>&</sup>lt;sup>29</sup> Hampshire began using FLINTS in 2002, and as of April 2002, negotiations were underway to include Kent, Metropolitan Police, Tayside, South Wales, Dyfed Powys and Strathclyde. Two national Home Office projects, CRISP and VALLIANT, are studying the potential to link the databases of every police force. On 10 April 2002, the CRISP Project Team met with the West Midlands Police FLINTS Project Team, and subsequently reported that CRISP was considering using FLINTS as the central analytical tool for managing and interpreting the information.

the visualisation of evidence is crucial to gaining an understanding of the complex relationships and dependencies that exist in evidence. The ability to visualise links and networks is central to the ability to generate new knowledge about the evidence we possess and the hypotheses we are constructing by asking questions.

# 7.10 Volume Crimes and Volume Suspects: Not *Single* Events and *Single* Suspects

Police forces in the United Kingdom are based on geographical and political boundaries. Though there are benefits to the geographic organisation of the 43 police services in England and Wales, one drawback is the fragmentation of intelligence. Criminals can travel from one force area to another to commit crime, often frustrating intelligence strategies thereby. By identifying series of crimes linked on the basis of their rationale, the gathering and linking of provable evidence across wide geographical areas by means of intelligence networks enables the police service to operate in a target-rich environment and circumvent the problems brought on by geographical boundaries. Instead of second-guessing where crime is emerging, FLINTS can give up-to-date and reliable indications of areas where activity is likely to be most prolific and of those persons who are likely to be most active. FLINTS can also give its users specific as well as linked cases in which evidence exists to arrest offenders and often charge them with crimes. It can also be used to analyse, disrupt, fragment and control organised networks of criminals. FLINTS is proving to be a useful tool not only for crime detection in the Midlands but also nationally, serving as a targeting tool for the identification and disruption of criminal networks. Her Majesty's Inspector of Constabulary reported in 2000 that nationally:

FLINTS has the capacity to link suspects with crimes that would not otherwise have been linked, for example, linking chequebook evidence from frauds with that from stolen vehicle crime [...] there is real potential for this system to be developed nationwide in the future... As FLINTS is developed it should be possible to utilise it to help identify series of offences which can then help to inform the tasking process. Potentially this database provides an exciting tool for crime investigation [...]

## 7.11 Performance Monitoring and System Identification

Identifying the outcomes of those processes by which evidence is managed and generated provides insights into new methods of generating and using evidence. As well as identifying outcomes of evidence generation processes such as fingerprint collection and DNA swabbing at scenes and classifying these outcomes by evidence type, FLINTS enables more complex configurations to be identified.

In 1999, as part of developing the treatment of evidence as a complex substanceblind commodity,<sup>30</sup> it became apparent that if DNA could be extracted from objects

<sup>&</sup>lt;sup>30</sup> The term *substance-blind evidence* is borrowed from Schum (1994).

merely touched by humans,<sup>31</sup> it could also be extracted from objects merely touched by persons committing crimes. This minute trace evidence had traditionally been thought to be beyond the ability of forensic science, but possible application areas now include crimes such as thefts of motor vehicles, deception, and fraud against elderly victims, in which offenders produce false identification papers and pose as government or public utility officials to gain access to the victim's home<sup>32</sup> to steal.

If DNA could be extracted from minute sources,<sup>33</sup> in this case faint and smudged fingerprints, it was proposed to the Forensic Science Service that in partnership with the West Midlands Police, an experiment should be run to recover minute traces by swabbing objects at crime scenes for DNA. These swabs would include DNA from objects merely touched by humans. For example, vehicle crimes would provide sources such as gear levers and steering wheels touched by the thieves. Thirty cases of burglary were targeted for the use of the Low Copy Number DNA technique and each involved elements of distraction tactics exercised against elderly victims.<sup>34</sup> National covert intelligence sources indicated<sup>35</sup> that a number of active individuals

<sup>&</sup>lt;sup>31</sup> DNA profiling has developed rapidly in recent years to become more and more sensitive and discriminating. The Forensic Science Service (FSS) can now offer a specialist service that has major implications for police investigating not just the most serious current crimes, but also those that happened decades ago. DNA Low Copy Number (DNA LCN) is an extension of the routine FSS SGM Plus<sup>TM</sup> profiling technique that enables scientists to produce DNA profiles from samples that contain very few cells, such as a single flake of dandruff or the residue left in a fingerprint. These profiles are fully compatible with those in the National DNA Database. DNA LCN profiles have been successfully generated from items such as discarded tools, matchsticks, nose and ear prints, weapon handles and ammunition casings in support of the FSS Major Crime Service. Given its high sensitivity, DNA LCN can be a particularly useful tool for investigating serious crimes when other profiling techniques have been exhausted or when options for forensic evidence appear to be limited. It can provide extremely valuable intelligence for Investigating Officers, but its context and interpretation need to be considered carefully. The relevance of a profile obtained through DNA LCN needs to be carefully considered, as it can offer valuable intelligence to police but only within the framework of each individual case. DNA evidence, whether obtained through DNA LCN or another DNA SGN Plus<sup>TM</sup> technique, is always corroborative and its significance will always depend on what else is known about the suspect.

<sup>&</sup>lt;sup>32</sup> Elderly people are chosen as victims on the premise that they may experience difficulties in the recollection of identity. More disturbing is the premise that they will not be able to survive cross-examination. In one extreme case, a criminal admitted to me that elderly witnesses, especially the very elderly, may not survive long enough to give evidence in court.

<sup>&</sup>lt;sup>33</sup> This method is known as *Low Copy Number DNA* because it recovers small traces and then amplifies the trace material into sufficiently large samples for profiling. Another term for the procedure is *supersensitive DNA*.

<sup>&</sup>lt;sup>34</sup> A typical technique is to visit the victim with false identification and claim to be a member of one of the public utilities. Once inside the premises, the offender has expertise in locating the victim's cash savings. Many elderly victims do not use bank accounts. It is not unusual for several thousands of pounds to be stolen in cases of this sort. Many victims later die, but "proximity" in terms of causation of death is almost impossible to prove.

<sup>&</sup>lt;sup>35</sup> Classified source.

were involved. As a result of using the Low Copy Number technique, DNA profiles were recovered from objects merely touched by the offenders that had committed the crimes. These were places such as door handles, door knockers, bells and so forth. As a result, 80% of the identified suspects were matched against DNA traces and later convicted and given prison sentences.<sup>36</sup>

#### 7.12 Using FLINTS: A Tour of the System as the User Sees It

Here are three simple examples of the questions we might ask the system to deal with at the start of an exploration of the evidence. The precise nature of the question is a matter for the user to define, and will be determined by the type of problem and enquiry they face. This problem or enquiry might be very focussed and might search for particular items of information about specific people, events or locations. However, it might also be quite broad and search for strategic masses of data that could be used to formulate more focussed questions:

- 1. "Show me any links between suspect Mark Smith and any crimes."
- 2. "Show me robbery events over three months in Wolverhampton along with any links between those events and people."
- 3. "Show me a list of prolific offenders<sup>37</sup> and list them alphabetically."

The first two questions allow us to simply link people with crimes on the basis of evidence that we can prove to high standards of reliability, and the latter question enables the identification of those persons who repeatedly offend. Faced with answers to questions like these, we can set about deciding the most appropriate response to take in a rational and reliable way. The options may be to arrest the suspect, use covert surveillance, investigate the crimes or the people involved in detail, or engage in ampliative discovery by asking further questions to expand our field of knowledge around the people, events, locations, times and evidence itself. Let us look at the results of the questions we have posed above by accessing the FLINTS system. The illustrations below (Figs. 7.12.1 and 7.12.2) are taken from real questions asked of the database.

<sup>&</sup>lt;sup>36</sup> The idea to use Low Copy Number DNA to find small traces of DNA left at scenes was raised at a meeting of Crime Scene Examiners in 1999 in the West Midlands Region. The hypothesis was that use could be made of the technique providing that a location could be identified where the offender was known to have touched some part of the scene. This would greatly assist the swabbing process and enhance the likelihood of recovery of trace material for DNA profiling. A national operation called "Operation Liberal" employs similar forensic techniques to target and identify burglary offenders where elderly victims are involved.

<sup>&</sup>lt;sup>37</sup> That is, a list of people who have been linked by evidence to crimes on more than one occasion.

#### **QUESTION 1**

"Show me any links between suspect Mark Smith and any crimes."

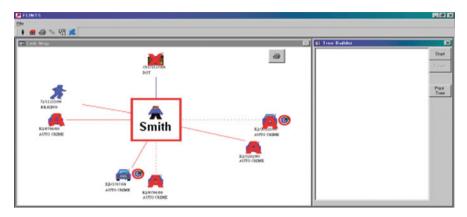


Fig. 7.12.1 An example of framing a question in FLINTS

#### **QUESTION 2**

"Show me all the robbery events in the last three months in Wolverhampton, along with any links between those events and people."

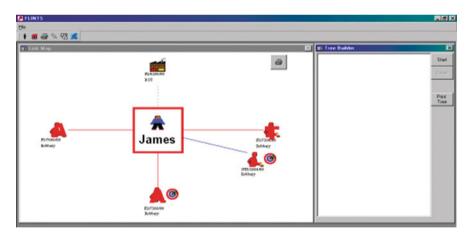


Fig. 7.12.2 A second example of framing a question in FLINTS

FLINTS has answered the question by presenting us with a modified Wigmorean chart illustrating the inferential dependencies by means of simple nodes and lines (arcs). We can see a node ("Smith") in the centre of the chart surrounded by seven other nodes around the outside of the chart that depict links to events (crimes) and other people (suspects). The arcs depict the inferential evidence – in this case, fingerprints and DNA. The dotted line depicts a partial fingerprint match.

Two charts result from this question. In the first (Fig. 7.12.2) we see that an individual called "James" has been selected by the database as the centre of an interesting network of four robbery offences and one burglary at a factory. Furthermore, one of the links is between the node for James, currently the centre of the network, and another individual node with a target sign adjacent to it. This indicates that there is a second network of links to be investigated in addition to those in the first chart. By asking the database for further information, we see in the second chart (Fig. 7.12.3) a set of links between the James node and another node bearing the name Massey. This tells us that James and Massey are implicated in yet another robbery.

The detection of volume offending is greater than expected. In another chart (Fig. 7.12.4), we can see that the node "Ford" has been identified by the system as a volume offender on the basis of forensic fingerprint evidence and DNA. He has been linked to twelve burglary offences at houses based on fingerprint evidence, to one offence of theft of a car based on fingerprint evidence, to three offences of burglary at houses based on DNA evidence, and to one offence of burglary at a dwelling house based on fingerprint and DNA evidence. If other evidence types such as footwear, tool marks, drugs, handwriting and so forth were added to the list, the volume and frequency might be even higher. Without FLINTS, it would not be possible to detect such complex linkages over time and geography by different evidence types.

The information contained in the charts presented thus far has been detailed at a micro level, with illustrations of links between certain sets of nodes. However, it is useful to be able to switch between a macro and micro view in the same way

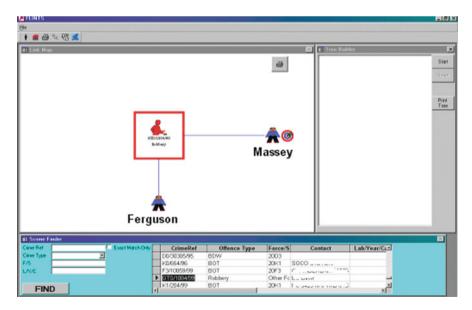


Fig. 7.12.3 Links being formed in FLINTS

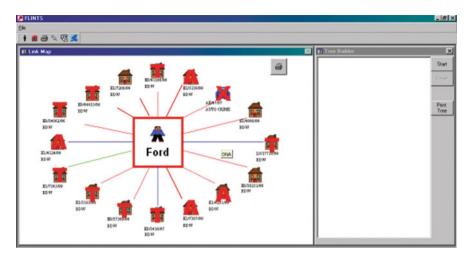


Fig. 7.12.4 The network of links around Ford

that we read a text – sometimes quickly, by scanning the text looking for key areas of interest, then slowly, reading the same text carefully, noting detailed meanings, relationships, connotations and implications. In the chart below (Fig. 7.12.5), we see a depiction of a "syllogistic tree" of *all* links in the database involving the node "Smith". This chart can help the analyst and investigator to understand networks of links that we should know already exist and networks of links that may exist but that have not yet been discovered. It can act as a prompt for asking further and better questions. For example, we can now ask ourselves a question such as:

Faced with the following tree of links, and based on my knowledge of the prevalence and geography of crime elsewhere in the system [Fig. 7.12.6], what other links may exist between these nodes for which we do not yet have evidence?

Searching our database may begin with a simple question such as the one depicted for the node "Smith". The scenarios around Smith and other nodes of interest may begin to develop as we begin to ask further questions and receive answers to them that we can in turn use to formulate further questions. From this process, we begin to see emerging items and combinations of evidence.

The locations of events and crimes, as well as the locations that suspects and victims habitually go to or reside at (Fig. 7.12.6) should be regarded as prime material for intelligence generation. In this chart, the yellow dots refer to scenes of crimes and the red dot refers to the location or last known residence of the suspect for those crimes. Adding the dimensions of space and time to the range of tools provided by FLINTS has enabled analysts to examine crimes from the standpoint of the geographer. Clustering events by their locations begins to give us insights into the movements and activities of suspects and thus lets us synthesise potential as well as real links, raise propositions about events that suspects may have been involved in

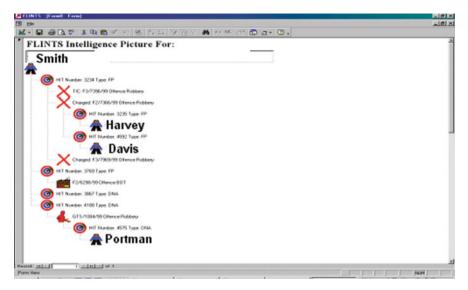


Fig. 7.12.5 Confirmed and rejected links in FLINTS

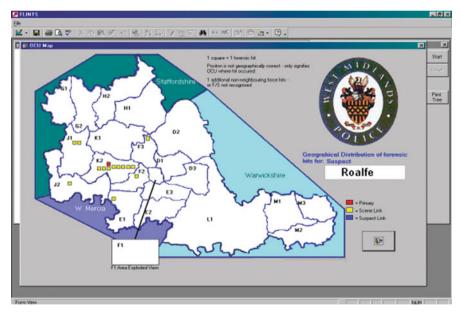


Fig. 7.12.6 A regional pattern of incidents and potential links

as well as events that are still emerging, look for crimes where there are elements of outstanding forensic evidence which we may use to either implicate or eliminate our sets of currently interesting suspects, and even identify vulnerable areas where victims are at greater risk. The chart containing the map (Fig. 7.12.6) illustrates these points.

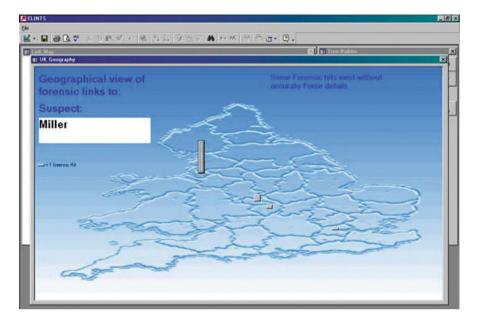


Fig. 7.12.7 A georeferenced view of forensic links to a suspect

In the illustrations in Figs. 7.12.6 and 7.12.7, and 7.12.8, we can see how we can adopt macro and micro views of geography to help us gain a better understanding of the characteristics and prevalence of the events and suspects we are currently interested in, or perhaps that we *should be* interested in given the emergence of new and interesting networks. Here, in our quest to gain insights into the activities of a node called "Miller", we learn that the suspect's links to crime span almost the length of the United Kingdom, notwithstanding the fact that his residence is in Liverpool. In this case, the events are burglary offences at factory premises from this we may infer that the suspect has been using either the motorway network or the rail system to travel between events and crimes. Interestingly, one of the events in the series involves the theft of a car, so we may also infer that Miller has been stealing vehicles to undertake the journeys. Our next enquiry may be about vehicles stolen at or near the crimes in and around Liverpool, the Midlands and London.

One specific function the system undertakes is performance management by using various measures and indicators. In the following illustration (Fig. 7.12.8) we can see the way in which a variety of categories of data can be drawn together to allow managers to assess the relative performance of police departments. On the left-hand side can be seen a series of preformatted questions from "Unresolved

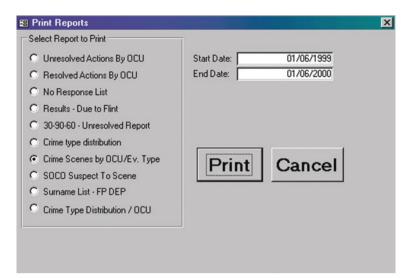


Fig. 7.12.8 Sample performance reports that can be generated by FLINTS

Actions by OCU"<sup>38</sup> to "Crime Type Distribution by OCU". The dates between the times of interest can be selected for the analysis and the resulting chart will reflect these dates.

The chart shown in Fig. 7.12.9 is the result of asking the system to measure and present the number of crime scenes, by operational area, in which matches<sup>39</sup> have been successfully achieved. Differences between areas can be evaluated, the way that scenes of crime examiners are used between different areas can be assessed, and the relative efficiency of staff in recovering evidence between different areas can also be assessed. If one area is achieving a high success rate, the others can examine the practices being adopted and try to emulate those achievements.

Other questions can be formulated to identify repeat offenders, and these questions can be used for strategic analysis and offender targeting. Offender targeting can be the concentration of both overt and covert means of monitoring the activities of key suspects within a population strongly suspected of involvement in series crime. One of the benefits of this function in FLINTS is the auditing and tracking capability that results from the analysis. This can help to justify decisions to third parties in later debates. In Table 7.12.1 we can see the answer to a question (where 'hits' means 'matches'):

Show me the evidential hits in FLINTS for 1.6.1999 for suspects with more than one hit.

<sup>&</sup>lt;sup>38</sup> OCU is a police area called an *Operational Command Unit*.

<sup>&</sup>lt;sup>39</sup> Police Forces use the term *hit* instead of *match*.

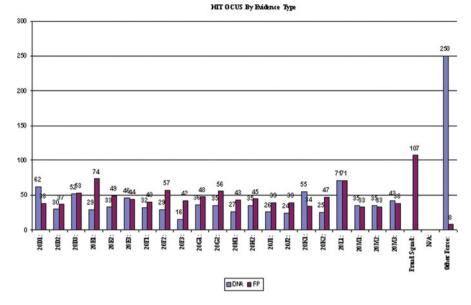


Fig. 7.12.9 A histogram of hit OCUs, by evidence type

Surname	Forename	Birth date	Crime	Crime no.	Evidence
Adams	Paul	12.3.77	Burglary	101010	DNA
Adams	Paul	12.3.77	Rape	1111010	DNA
Adams	Paul	12.3.77	Auto Theft	1011010	Fingerprint
Jones	David	17.11.52	Deception	11010001	Handwriting
Jones	David	17.11.52	Theft	1001111	Fingerprint
Jones	David	17.11.52	Theft	10010110	Tool mark
Jones	David	17.11.52	Theft	1001111	Footwear
Jones	David	17.11.52	Possess A	10010101	Drugs
Kelly	Bart	18.4.58	Burglary	11110001	DNĂ
Kelly	Bart	18.4.58	Burglary	11010001	Fingerprint
Kelly	Bart	18.4.58	Burglary	10110001	Footwear
Kelly	Bart	18.4.58	Burglary	11000001	DNA

 Table 7.12.1
 Answers to a question concerning evidential hits in FLINTS

In reality, the list in Table 7.12.1 would run to many pages. Lists can be prepared for different police areas and over different time spans, thereby giving different perspectives on the evidence. Note the squares filled in blue: for these squares, the crime reference numbers are the same, therefore Kelly and Jones may have committed this crime as accomplices. Fig. 7.12.10 illustrates how this correlation can be identified and brought to the attention of investigators.

In Table 7.12.2, we can see the result of asking the system to prepare a list of those scenes of crime that have been matched against suspects and list them by

Action:	Sent To:	ID:	7766
ctionee:	Crime Manager	OCU:	
elect iter	ns to be printed:		
	Hit Package		
Notes:	The offenders identified in this a accomplices.	nalysis appear to have beer	acting as
	Graphical View of Links To S	uspects / Primary Scene	
	Graphical View of Links To S	uspects / Primary Scene	

Fig. 7.12.10 A conclusion generated by FLINTS that calls a key finding (correlation) to the investigator's attention

operational area. In this case, we can see a list of persons identified as being suspects for single crimes as well series-linked crimes, along with the evidence type involved for the Sutton Coldfield area. The list has been abbreviated for illustration purposes.

Analysts, investigators and scene examiners can access their own reports as well as those of other areas to help formulate hypotheses about active offenders, crime types and the prevalence of particular suspects by area, crime type and density of offending.

The integrated approach to the management, analysis and synthesis of evidence now seen in the FLINTS system is enabling the police service to take a more sophisticated yet still pragmatic approach to the management and use of the evidence contained in police data systems. This approach permits analysts to solve problems that were known to exist yet that were too complex to tackle in the past.

A good example is the relationship between the incidence of crime and the illegal use of drugs, which has until now been *assumed rather than proven*. No reliable evidence has been produced to date to demonstrate this relationship, although intuitively many governments and police sources have claimed it to exist. Whilst there is evidence that many persons arriving in police custody are under the influence of drugs, the evidence to explain the networks of people and crimes involved has been too complex to even bring together let alone to analyse. FLINTS treats evidence and crimes in a substance-blind way. It is thus as applicable to the investigation of drug offences as it is to the investigation of burglary, rape, theft or homicide. Likewise, the evidence types it draws on are treated as "fuzzy" categories rather than "strictly deterministic" categories, and are equally applicable to DNA, fingerprints, footwear and a whole range of other forensic evidence types. Persuading the

	cts with more than o		1000 5		
Surname	Fore Name(s)	DOB	Crime Number	Offence	Ev. Type
BOW	SHERMAN		G2/1151/99	BDVV	DNA
BOW	SHERMAN		G1/13283/98	BDW	DNA
BRAD	ANTHONY		K1/1960/98	вот	DNA
BRAD	ANTHONY		K1/4808/98	вот	DNA
BRAD	ANTHONY		K1/1286/98	вот	DNA
CARR	EDWARD		CH/874/98	Deception	FP
CARR	EDWARD		CH/1041/98	Deception	FP
ELM	JAMES		D 2/7798/98	BDVV	DNA
ELM	JAMES		D 2/8499/98	BDW	DNA
FIN	MICHAEL		51/9426/97	вот	DNA
FIN	MICHAEL		S1/4283/97	вот	DNA
FRA	DONALD		E3/5019/99	вот	DNA
FRA	DONALD		F1/6926D/97	Criminal Damage	DNA
FRA	DONALD		F1/6926D/97	Criminal Damage	DNA
HAY	MARK		D 3/375/99	Theft	FP
HAY	MARK		D0/19413/95	BDW	DNA

Table 7.12.2 A listing of suspects with more than one hit

police service to treat evidence generically, in a substance-blind way, would pave the way to accessing a rich matrix of linked networks of people, events, times, locations and evidence.

A joint Government and Police Committee<sup>40</sup> chaired by a Minister asked early in 2001 that FLINTS be used to assist in identifying markets for the distribution of illegal drugs in the United Kingdom. Identifying those who travel across boundaries to commit a crime and who deal in drugs will aid the identification of travelling networks of criminals involved in drug trafficking or related offences. For example, at present there is no evidence available about those persons who engage in the illegal trafficking of drugs between the coastal towns of Sussex and the middle counties of England and Wales, yet there are data available that drug importation does take place

01/04/1000 to 10/04/1000

<sup>&</sup>lt;sup>40</sup> The approach was made by Mr. Peter Hampson, QPM, Chief Constable, West Mercia Police, in February 2001.

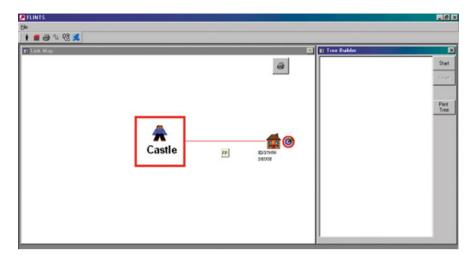


Fig. 7.12.11 Link between one suspect and evidence

on the southern coast and that the drugs arrive in the Midlands Region in smaller consignments. One way to tackle the problem of gaining a better understanding and real knowledge about this would be to apply the methods embodied in FLINTS.<sup>41</sup>

We can see how FLINTS, using a substance-blind approach to evidence, enables the system to be used for the analysis of drug networks. In this example (Fig. 7.12.11) we can see that the node "Castle" is linked to one offence of illegal possession of drugs on the basis of *fingerprint* evidence rather than a chemical drug analysis. Using fingerprint evidence in this way is an example of the substance-blind approach, and serves to illustrate how the use of one evidence type can inform the use of another. The fingerprint evidence involved came from the examination of paper wraps used to store the individual packs of drugs. The imaginative decision to use fingerprint analysis in this way was central to the ability to create a link to the networks.

However, we should also note from the chart that another network is operating behind the one visualised here. It is depicted by the "target" appearing against the crime node on the right of the screen. The system is telling us to look further because there are additional interesting links. In Fig. 7.12.12, the result of asking the system to present us with those additional links is illustrated. What we then see is that the node "Castle" is also linked to a node called "Kosko" and another node called "Castle". This latter node is in fact a brother of the first Castle. Probably the most interesting aspect of this analysis is not that we have fingerprint evidence presenting us with a scenario linking three formerly unknown associates but rather proving that none of the people involved in the network reside in the West Midlands Police area, where the drugs offence was committed.

<sup>&</sup>lt;sup>41</sup> A substantial data set was being compiled to enter into FLINTS to establish the extent and weight of illegal drugs that reach markets and the magnitude of their people networks. A presentation of the findings to the Government was planned for Autumn 2001.

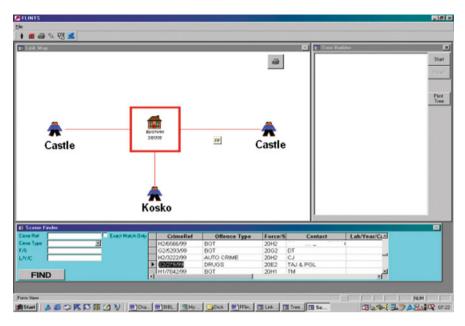


Fig. 7.12.12 Additional links suggested by FLINTS

An overview of the links between these nodes quickly demonstrates the extent of the network based solely on fingerprint evidence. Chemical analysis of the drug may reveal evidence of its source and original consignment. The use of evidence about telephone traffic among Castle, Kosko and Castle may reveal evidence of linked communications before, during and immediately after the events involving the handling of illegal drugs.

Figure 7.12.13 demonstrates how complex links between different people and different crimes can be identified using different but integrated evidence types and by using FLINTS in this way. These links would take very long periods of time to identify using conventional investigations. In this illustration, Williams has been linked to two offences of burglary at factory premises, three burglary crimes at domestic dwellings, one robbery and one theft of a car. It can also be seen that Kennedy and Tennison have been linked to the node marked with a large "X". This is, in fact, the same crime as the node marked with a "Y". This visual approach is thus a method to indicate quickly that Williams, Kennedy and Tennison may have committed at least one crime together whilst Williams has been implicated in another six crimes. The hypothesis suggests to the analyst that all three may have been operating together. Further links can then be explored by pressing the target icons depicted next to certain nodes. These indicate further lines of immediate enquiry available to the analyst. In this way, FLINTS allows the user to "surf" the connections and links inherent in the evidence. Figure 7.12.14 shows the police intelligence picture generated by FLINTS.

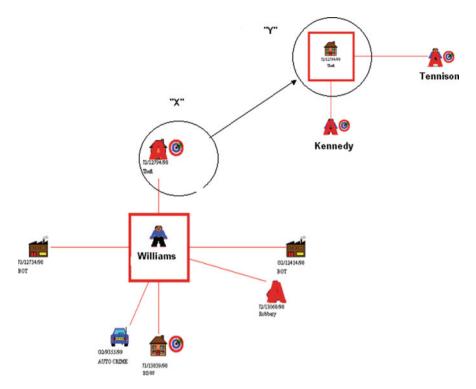


Fig. 7.12.13 Identification of complex links by FLINTS

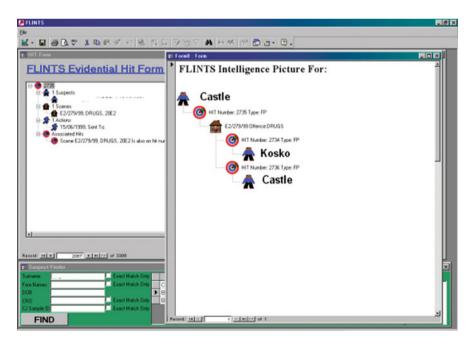


Fig. 7.12.14 The intelligence picture generated by FLINTS

# 7.13 The Intellectual Foundations of FLINTS

Large corporate bodies such as police forces have become far better at generating, transmitting, storing, and retrieving information than they have at making use of it to expose useful configurations and scenarios that can withstand repeated challenges and tests about the data's credibility and legality. Storing masses of data is in itself an unproductive pursuit because this does not automatically translate into masses of knowledge. Strategies and tools are needed to help the investigator and analyst make use of the evidence known to exist in order to discover evidence that may exist but that has not yet been discovered. One useful tool that will be described in detail later in this chapter is the ability to formulate useful questions. Good questions aid in the discovery of interesting configurations of evidence and chains of inferential reasoning from which useful conclusions can be drawn. Another useful tool that I will deal with later in this chapter is the formulation of stories to act as a mechanism for providing a structure in which configurations of evidence can be presented in a useful way. No matter how far-ranging and how thorough our search for evidence is, there will always be gaps and there will always be a degree of doubt. That doubt may be small and unpersuasive, but it will always be there to some degree.

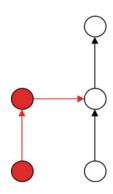
In addition, strategies and tools are needed to aid us in the identification of known or suspected gaps in our knowledge as well as areas of weakness in our chains of reasoning. Circumstances often exist in which it is useful to be able to corroborate or negate an inference that we have drawn or are preparing to draw based upon evidence we currently possess. In this regard, we may see the following simple chains of reasoning (Figs. 7.13.1 and 7.13.2) depicted with black nodes and arcs that need to be tested by the search for evidence that will either corroborate or negate the node or arc. Corroborative evidence is depicted by red nodes and arcs, an approach borrowed from Schum (1994).

A number of the problems that policing faces in terms of the analysis and synthesis of evidence involve the manner in which evidence is managed and organised. Twining, Anderson and Schum are committed to the view that how well an organisation manages its existing thoughts and evidence will ultimately influence how well the organisation is placed to generate or discover new thoughts and new



Fig. 7.13.1 Simple chain of evidence generated by FLINTS

Fig. 7.13.2 Corroborated chain of evidence generated by FLINTS



evidence that will prove useful to the problems they face. The strategies an organisation adopts in evidence management play a key role in its ability to discover new evidence, new scenarios and new explanations. In addition, drawing defensible conclusions from databases will depend upon the quality of the information, its inherent credibility and the probative force it delivers. Dealing with evidence in systems for multiple-case analysis, as depicted so far, is subject to the same tests as dealing with evidence handled in single cases in a traditional way. Successful investigation and discovery depends not only upon strategies and methods designed to marshal our information in ways useful and meaningful to solving our problems (as stated here), but also upon the ability of the user of the evidence to keep in mind and continually test for the evidence's credibility, relevance and reliability. Inference chains are only as strong as their weakest link.

FLINTS symbolises a novel approach for marshalling evidence in pre-trial criminal investigations. The opportunity to exploit complex relationships and networks of links between people suspected of involvement in criminal activity allows the investigator at a tactical level and the police manager at a strategic level to identify threats and marshal finite resources more effectively and in direct response to identified problems. Identifying the problems we face is the first step in solving them. The deployment of resources and time is evidence-led and directed to specific needs. Events can be connected or associated by virtue of their characteristics and typology, which allow investigators to link events into chronological series. This is not simply a matter of macro-level linking of high volumes of events over extended time periods – it also enables investigators to undertake the micro-level analysis of single events in the search for evidence. An item of evidence in one case may fill a gap or even a series of gaps or part of a chronology in another case.

## 7.14 What Is It About FLINTS That Makes It Different?

FLINTS uses a modified form of Wigmore's method for the analysis and synthesis of evidence in pre-trial investigations. The aim of the FLINTS approach and software is to introduce and develop a systematic method for the management of facts

founded upon the rational traditions of Francis Bacon, John Locke, John Stuart Mill and Stanley Jevons.

A frequent observation by practitioners using FLINTS for the first time is that it makes great use of "hard" evidence as opposed to the traditional approach in intelligence work, which relies more on the use of "soft" evidence. Though this description is useful, it can be misleading and problematic. The FLINTS approach and software was designed to make a distinction between tangible evidence such as fingerprints, blood samples, DNA profiles, footprints, drugs, firearms, and so on, and testimonial evidence from human witnesses. Examples here would be witnesses observing events and intelligence reports from informant agents.

This distinction is an important feature of the FLINTS approach. It draws on the differences between the attributes of the credibility of tangible evidence that differ from the attributes of the credibility of testimonial evidence in a number of ways important to this thesis. In the case of tangible evidence, we can draw on its authenticity and chain of custody as well as on the accuracy and reliability of the collection and sensing devices we use. Examples here might be DNA swabbing kits, electronic sensors, cameras, electrostatic lifting devices and sound recordings. In addition, we have the competence of those persons who operate and interpret these devices to draw upon. For testimonial assertions, we have to keep in mind the difficulties that surround the veracity, objectivity and observational sensitivity of human sources of evidence. Although this distinction is important, it does not mean that one form of evidence is naturally superior to another.

In its present form, FLINTS overcomes many of the investigative difficulties associated with attempts to link together different criminal activities, different people and different sources of evidence. One way of describing the utility of FLINTS is to say that it provides an elegant means for forming audit trails of related criminal activities.

## 7.15 A Case Study in Linked Burglary

One cannot overstress the importance of developing the *capacity* to ask good questions and how this differs from a *protocol* for asking good questions. Checklists for questions in the form of a protocol provide a good method of checking that certain things have been done, but investigators and analysts cannot operate effectively without basic training in good thinking. Evidence arrives in our hands from diverse sources, in diverse conditions and with varying levels of reliability. A modernised neo-Wigmorean approach has been incorporated in the form of computer software called FLINTS. Now let us explore a real-world scenario and the investigation of a series of burglary crimes using the methodology and software developed in this thesis.

This example is a real case of burglary, but with some fictional and additional hypotheses and evidential scenarios used to illustrate the potential of the methodology and of the use of FLINTS. The burglary scene depicted in the photograph (Fig. 7.15.1) presents many opportunities to recover physical, forensic and trace

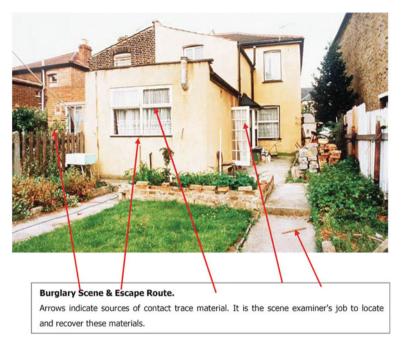


Fig. 7.15.1 Annotated photograph of a burglary scene

evidence. The scene examination reveals that the door is open, having previously been left locked and secured by the victim earlier that day. There is also clear physical evidence of damage on the inside of the door, where some kind of tool appears to have been used. The lock has been forced open, which would allow an intruder to exit the premises. This evidence raises a hypothesis that the door could have been used as a point of exit and is therefore an ideal location for seeking contact trace material, but the question arises early on as to where the alleged offender entered the premises.

This question is central to our ability to detect the crime, because when people enter and leave premises, especially by the use of force, they may leave contact trace material behind as a result of their physical contact and proximity with objects that make up the fabric of the building. Windows, doors, furniture and objects that the intruder has touched provide excellent opportunities to recover evidence. Opportunities are presented to target searches for contact trace material that could provide evidence of the identity of the intruder, the clothes they were wearing and the kind of contact they had with the premises.

In the real case (the subject of the photograph), a search of the premises and grounds was made and the lower ground-floor casement window in the foreground of the photograph was found open and damaged. This raised a hypothesis that entry was gained by means of the open casement window. The hypothesis was supported by evidence that the owner of the property had left the premises locked and secured

when she left for work earlier that day. There was no damage to the window locks when she had left home earlier that day and her jewellery and cash was now missing from a bedroom. Damage had been caused to furniture inside and a message in lipstick had been left on the dresser mirror that read "It is not over yet – we'll be back." Footwear marks were apparent in the soil below the window. On the kitchen work surface near the window that was believed to be the point of entry, there was a small smudge of red fluid that appeared to be blood. The fluid was located on the glass close to the forced lock. Another red fluid that may be blood was apparent on the kitchen work surface. A red fibre was snagged on the window ledge alongside some scuff marks, and was thought by the Scene of Crime Examiner to have been made by gravel embedded in the sole of a shoe when the intruder(s) entered.

Initially, the geography and extent of the scene of crime were thought to be the boundary of the premises. However, there was circumstantial evidence that the intruder(s) must have left the garden area by some means. On the pathway in the garden, a metal pole was found that the victim said was foreign to the scene. A hypothesis was raised that this might have been delivered into the scene by the intruder(s) as a tool to assist their entry into the building; as a result, the pole was recovered for examination at a laboratory.

The intruder(s) were not within the boundary of the property at the time the search was undertaken, and the gate remained locked and secure. It was hypothesised that they left by climbing the fence. A damaged shrub pointed out by the victim revealed a damaged fence panel. Directly above the panel, a fibre was found snagged on the top of the fence, but this time it was blue in colour. This gave rise to a series of new hypotheses: were there one, two or more offenders? If a single offender, were they wearing a red and a blue garment? Where did they go after climbing the fence?

Our observations of the scene should not be restricted to the house and garden. We can infer from the evidence available that the intruders probably left by climbing the fence. The scene now needs to be extended to encompass further pathways outside the perimeter of the garden. A "scene" can incorporate any place, any person or any "thing" that has been party to the events *prior to, at the time of* and even *after* the event under investigation.<sup>42</sup> The combination of events and times serves a number of purposes. One of them is the construction of stories to help us glue together the events we know about in a meaningful way that helps us to explain the events we do not know about but need to understand. The construction of stories such as

<sup>&</sup>lt;sup>42</sup> Wigmore (1913, p. 149) dealt with "time and place" as a means of proof. "Proximity, on the part of the accused, as thus presented for consideration, may be, in itself, of various degrees, from mere vicinity, up to actual juxtaposition or contact. It may also be of various kinds, such as proximity to the person of the deceased, or to the scene of the crime, or both; and it may exist at different stages; as before the commission of the crime, or afterwards, or both before and after. The strongest form in which this circumstance can be presented, and the one which requires the least reasoning to give it effect, is undoubtedly that of the juxtaposition of the persons of the accused and deceased, proved, by actual observation to have existed both immediately before and immediately after the crime is perpetrated. These show presence at the moment of actual perpetration, with the greatest effect possible, short of direct evidence."

Fig. 7.15.2 A chronological sequence of events



these helps us to search for evidence to either confirm or negate the evidence we will produce to fill in our knowledge gaps. In addition to helping us tell stories and discover new evidence, the stories provide an ideal form of classifying our search for and interpretation of evidence. Figure 7.15.2 shows a Chronological sequence of events.

A whole series of events can go into making up a "scene". People suspected of involvement in the crime can and should be treated as potential crime scenes in themselves, especially if they're a suspect or a victim, because they may have played star roles as "actors" in the theatre of the crime. Victims in particular can provide good evidence from their direct knowledge for two reasons: First, they have knowledge of events either before the crime was committed, at the time the crime was committed, or some time after the crime was committed. Second, they often have domain knowledge of the place, the time, the prevailing circumstances and even the people who may have been involved and those who may not have been involved. Victims often have a stock of ancillary knowledge useful to the provision of contextual evidence about the commission of the crime. Sometimes this knowledge will be small, but often it will be more extensive than one might expect.

In the case we are investigating in the present example, the victim provided important evidence about the condition of the premises before the crime was committed, and about how an intrusion and entry had changed the physical condition of the building. She had also pointed out that the metal pole was foreign to the premises and thought to have possibly been used as a tool to effect entry and discarded when the intruders left. It is crucial that investigators and Scene of Crime Examiners fully understand that the relevance, credibility and weight of any physical, forensic and contact trace material will be directly conditioned by this type of evidence from a victim or a witness. If a suspect is arrested as a result of fingerprints being identified on the tool, that suspect might find it difficult to persuade us that the tool did not belong to them but rather belonged to the owner of the premises or the victim.

It was decided that residents in houses opposite the "scene" may have witnessed activity before, during or after the crime was committed. Perhaps they saw strangers to the area loitering or climbing the fence, or heard the sounds of the window and door being forced. We formed a hypothesis that the offender(s) had at some point climbed the fence, and that asking questions of residents near the scene could provide additional evidence. Who could have seen the offender(s) leaving or even entering the premises?

As a result of asking residents opposite the scene about the events of that day, we discovered an elderly lady who claimed to have seen two men climbing the fence and leaving the garden during the afternoon. She had been suspicious, so had watched them run, walk, then run again along the street towards a car parked nearby. One of them was carrying a black bag and she saw one of the men drop something. When he returned to pick it up, the other man forced him to carry on and leave the object. He threw it over the fence into the garden he had climbed out of, and that object appeared to be the pole found in the garden. The witness pointed out in the garden the direction in which the "pole" had been thrown and identified the metal tool in the garden on the pathway as being similar to the object she had seen thrown.

The object was recovered for forensic analysis, with emphasis placed on DNA and fingerprints in an attempt to identify the persons in possession of it earlier that day. Evidence was sought about the credibility of the witness. She said she had never experienced serious difficulties with her sight other than short-sightedness, but felt she could be sure of what she had seen. She did wear glasses for short-sightedness and had been wearing them at the time of the incident. The investigator might have chosen to question and confirm the credibility of the witness's evidence by asking her to repeat a car registration plate or some other unique object in the street under similar conditions to those under which the events were seen to unfold.

Control and elimination samples of DNA and of fingerprints were taken from the elderly witness and the victim to distinguish them from any foreign DNA and finger marks found on any of the exhibits recovered from the scene. During this exercise, the witness said that she had subsequently thought about the incident and now thought that she recognised the car the men had got into as one very similar to the car owned by the previous owner of the house. Also, one of the men appeared familiar in appearance, as if she had seen him before in the area. On being asked why she had not said so earlier, she replied that she had been concerned that she might have been wrong. This provides us with a good example of Schum's equivocation testimony.<sup>43</sup>

<sup>&</sup>lt;sup>43</sup> Schum (1994, p. 107) provides a detailed methodology for assessing the relative strengths and weaknesses inherent in testimonial evidence provided by an eyewitness. The methodology serves to illustrate how important it is for investigators to bear in mind the attributes of evidence and the way in which reliability has to be *assessed* and not merely accepted. Schum's method is based on a non-statistical approach and involves asking a variety of questions about the behaviour of the witness relevant to assessing their credibility-related questions fall into three main classifications or, as he calls them, "major attributes": veracity, objectivity and observational sensitivity. Let us assume that a witness "W" provides us with evidence that event "E" occurred. Let us further assume that the event did in fact take place and that "W" obtained evidence from his own senses causing "W" to *believe* that the event occurred – therefore, "W" *knows* that "E" occurred. We did not observe the event "E", so how are we to verify the account given by "W"? Because "W"

This gives rise to another hypothesis: that one of the offenders may have been the previous owner returning to the house to commit the crime. An enquiry with the victim reveals that she was involved in a dispute with the former owner about an outstanding sale of some of the contents that she had refused to pay for because they were substandard and faulty. She said that the dispute had become acrimonious, but did not believe that the former owner would burgle her home, even though she had been threatened on a previous occasion when she refused to withdraw her legal action. Instead, she had put this down to frustration about the legal action. However, as a precaution, she had reported it to her lawyer and he had written a letter to the former owner warning him about the consequences of any further actions involving threats and intimidation. This might provide important evidence about "motive".

Enquiries revealed that the former owner of the premises had a number of convictions for burglary of dwelling houses, two of which were offences similar in nature to the present crime – lower ground-floor windows had been forced open, escape was by means of a door to the rear, and there had been episodes of climbing on both occasions. He also had other convictions for violence and damage to property.

claims to have witnessed the event with his own senses, are we also to say we know that event "E" occurred? What we have really discovered is that "W" claims to know that event "E" occurred, not that event "E" actually did occur. In considering the testimony of "W" we are faced with a chain of inferences about what "W" believes, what "W" sensed and whether event "E" did occur. Schum demonstrates the decomposition of evidence when he tells us that we can also consider our own credibility in receiving the evidence from "W" because we are not passive in the receipt of evidence. If we question our own credibility, all we can really say is that we believe witness "W" told us that event "E" occurred. Let us examine this in detail to see what he means. In a diagram, one can see that "W" believes that "E" occurred based on the evidence of his senses, and this is depicted in the form of a chain of inferences. Each node in the chain indicates a point of uncertainty about what "W" tells us. If we include an assessment of our own ability to receive and convey the evidence of "W", then the inferential chain becomes much longer. Not only must we consider veracity, objectivity and observational sensitivity in respect of witness "W", we must also consider our own major attributes in the receipt and management of that evidence. This becomes increasingly important when dealing with evidence from questionable sources or when there are competing accounts of events from witnesses. Take, for example, intelligence sources where information is offered in return for favour or reward. The recruitment of intelligence sources from the criminal fraternity or from foreign countries for the receipt of intelligence should not be based simply on the ability of the source to provide information. A well-placed source in a criminal network of offenders or a foreign diplomat working as a defence attaché in a host country may well be in a position to provide timely, high-quality information. However, they may also be in a position to provide false or misleading information to undermine operations they have been recruited to oppose. Take, for example, a drug dealer providing the police with information. Though he may indeed have valuable information, he may also have a motive for "informing" on competing drug dealers who pose a threat to his own trade in illegal drugs. He may also provide the information to arrest many smaller drug dealers as a means of providing himself with a more open and exploitable market. In intelligence scenarios, a foreign source may provide valuable information about international negotiations concerning a new military capability. However, what is really being practised is a deception designed to distract attention away from new technology being developed in another area and that is of greater importance to that power. Schum (1994, p. 115) also provides a schematic diagram for depicting his classification of recurrent forms of evidence. He provides fifteen classifications.

The items of physical, forensic and contact trace material recovered included photographs of the suspected point of entry (the lower ground-floor window), the work surfaces in the kitchen (with suspected blood stains present), the footwear scuff mark to the window sill, damage inside the premises and the writing on the dresser mirror, the damage to the door suspected to be the point of exit, the garden area (including the metal pole on the pathway) and the fence suspected to have been climbed as an escape route. A photograph was also taken of the place at which the elderly witness said she saw the people climbing out of the garden. This provided evidence that she could indeed have seen what she claimed to have seen. Other items recovered included the suspected blood stains, the debris from the scuff marks, the metal tool, the fibre snagged on the window and the fibre snagged on top of the fence. A single footmark was found in the soil outside the casement window, and this was identified by the victim as a foreign mark. It was photographed and cast to reveal the size and weight of the shoe that created it to serve as evidence for comparison with any shoes later recovered from suspects. All the victim's shoes were examined for the presence of similar patterns to those in the flower bed in an attempt to eliminate extraneous evidence and reduce the potential number of sources of the mark.

Control samples were taken from all surfaces from which items had been recovered. For example, a control sample of soil from near the footmark, a sample of debris from the path, a control sample swab from the kitchen surface and glass (where the suspected blood was recovered) and a sample of wood from the window and fence for comparison with any clothing taken from suspects.

### 7.16 Forensic Decision-Making

The objective of the investigation was to discover the identity of the person(s) who committed the crime as well as the identity of the people seen climbing out of the garden. This was done to try to reduce the suspect population to as small a number as possible. From the available items of evidence the following hypotheses were constructed:

- 1. The premises had been entered by force, possibly via the casement window and by use of the metal tool recovered on the garden path.
- 2. One or both of the intruders had cut themselves in forcing the casement window, had bled onto the work surface inside the premises, and had scuffed the window sill with a shoe and grit from outside.
- 3. The premises had been searched and the mirror had been written on by the intruders with a message bearing relevance to an ongoing dispute.
- 4. The intruders had left by the open but now damaged door and climbed the fence to escape.
- 5. One of the intruders had thrown the metal tool away; it landed in the garden on the path.

Of prime interest was the identity of the former owner of the premises and whether he had both a motive<sup>44</sup> and the opportunity to commit the crime. In addition, it was important to determine whether there was any physical, forensic or contact trace material available to connect him to the enquiry or eliminate him. He was identified by the victim and her lawyer, and from this information his convictions were found, including the fact that he was already registered in the National DNA Database following a conviction three years previously for violence. This meant that simply submitting the suspected blood from the scene to the National DNA Database for profiling and comparison would provide valuable evidence about whether he had had an opportunity to commit the crime. Also, the elimination sample of the victim, who lived alone, would also have to be submitted to ensure that the suspected blood did not originate from her, however unlikely that might seem. Also of concern was the fact that a false positive might result in linking the former owner of the premises to the crime solely because he had lived there previously.

The DNA profiling process is very sensitive, and it could potentially pick up old genetic material from when the suspect was resident there. In an attempt to clear up this point, the victim reported that she had cleaned the surfaces almost daily with a surface cleaner and that the previous owner had not been present for eighteen months.

Whilst DNA profiling was being undertaken, including a comparison of the scene stains and the control samples from the witness and victim, enquiries were conducted into the background of the former owner of the burgled premises. Intelligence was received and later confirmed that at the time when the crime had been committed, the previous owner of the premises had been in police custody and then remanded to prison to await trial for a theft that was not connected with the burglary. This effectively provided an alibi for him and challenged the basis of the enquiry. There was no reason to question the honesty and credibility of the victim and the elderly witness, so the police were left with the task of identifying (from the population) who else might have committed the crime.

It was decided not to interview the former owner in prison on the following grounds. A hypothesis was considered that although he could not have committed the crime personally, he might know who had and might have been involved as a conspirator in arranging the crime. If questioned, then, he might forewarn the intruders so they could dispose of valuable forensic and trace evidence. No evidence was available to indicate who might have committed the crime, but blood recovered from the scene might link to someone already in the DNA database.

Five days after the submission of the suspected blood to the National DNA Database, the initial results were received by the police. The suspected blood from the kitchen work surface was confirmed to be blood, and wholly different from the victim's and witness's control samples, but it did not match with any person in the

<sup>&</sup>lt;sup>44</sup> Evidence of *motive* is distinctly different from evidence of *opportunity*. One may have a motive to commit a crime, but that does not mean that the opportunity will present itself. Detectives sometimes mistake the two because motive and opportunity may on occasions converge, providing some additional probative force.

Database, including the former owner of the premises (the prime suspect). However, the FLINTS Co-Coordinator contacted the officer and informed him that one of the blood stains, although not matched to any person in the National DNA Database, did match with seven other DNA samples submitted from seven other crimes of burglary in the last two years as well as with samples from an offence of car crime.

Whilst no person had been matched, FLINTS now gave grounds for believing that the offender was a serial burglar responsible not only for this crime but for seven others. The problem now was to identify the offender. The National DNA Database was contacted and asked to confirm the gender<sup>45</sup> of the donor of the scene's blood samples and whether the two stains emanated from different donors. The Database confirmed that the donors were both male and were different people.

FLINTS was consulted in an effort to assist in identifying potential suspects for the series of nine crimes (eight burglary crimes and a car crime). In the mind of the investigator, the previous owner still had reason to be involved in the main burglary, so it was decided to begin the enquiry by identifying his network of associates. The investigator asked the system to follow five lines of enquiry and constructed the following questions:

- 1. Show me the links between the former suspect and any other known criminals in the system: what is the extent of his criminal network and who is in it?
- 2. Show me the geography of the nine crimes: where were they committed?
- 3. Show me a time line of the crimes: what is their chronology?
- 4. Show me all the burglary crimes committed in the area of the main crime: is any physical, forensic and contact trace evidence available in any of them?
- 5. Show me the current keeper of the car formerly owned by the former suspect: who has it now?
- 6. Show me the most prolific offender for burglary [in cases bearing the following features] in the area of... and over the time period of...

The answers to the questions provided the investigator with new evidence and emergent lines of enquiry. In answer to Question 1, it was revealed that the former suspect had a primary network of ten links to other criminals, all of whom he had been arrested with on previous occasions. In answer to Question 2, FLINTS told the investigator that the nine crimes fell within a radius of a spate of burglary crimes extending to 35 offences, all of which bore distinctive signatures in terms of the *modus operandi*. The answer to Question 3 was that all 35 offences had a regular pattern in that each was committed between 3.15 and 5 pm on a Tuesday or Thursday afternoon. The answer to Question 4 was that eleven of the crimes had various items of outstanding physical, forensic and trace evidence that could be submitted for

<sup>&</sup>lt;sup>45</sup> The presence of X and Y chromosomes reveals that the genomic material comes from a man; the absence of a Y chromosome reveals that the donor was a woman. DNA markers used for criminal investigation routinely test for sex, but in my experience this eliminative test is not widely used despite its enormous value. For example, if a DNA profile is gained from material left at the scene of the crime, the gender test eliminates 50% of the suspect population from suspicion.

analysis and comparison with reference databases of people. Blood and finger marks were also available.

The answer to Question 5 gave the hoped-for breakthrough: the car was now registered to one of the associates in the primary network of the former suspect. He had incurred a Fixed Penalty Ticket for a parking violation on the day the main crime had been committed, and only three streets away near a shopping precinct. The payment of the Fixed Penalty Ticket had been made in the name of the current keeper of the car and via a bank account in the shopping precinct three streets away from the scene of the burglary. His DNA profile was not present in the National DNA Database. Two days before the burglary crime being investigated, he had visited the former suspect in prison.

Tangible grounds now existed to formulate a hypothesis that the current keeper of the car had committed the crime. This conclusion was reached on the basis of his former convictions for burglary in houses, his presence in the vicinity at the time the crime had been committed, the fact that he was the keeper of the vehicle seen by the witness in the same street the crime had been committed, and that he had no legitimate reasons for being inside the premises. The vehicle was now parked regularly outside his home address and used by him in the area. The decision was made to arrest the suspect (the current keeper of the car) in an attempt to recover evidence that would either eliminate or incriminate him. On arrest, his wardrobe was searched and a pair of blue denim trousers was found. These were bloodstained (Fig. 7.16.1); moreover, he had a cut to his right hand, and a red jumper was found along with a pair of shoes similar in pattern to that in the foot mark found in the soil outside the window.

At interview, he denied being involved in any burglary crimes at any time other than those of the crimes for which he had been convicted. He agreed to supply a DNA sample in the form of a mouth swab to eliminate him from the enquiry. The



Fig. 7.16.1 Bloodstained denim trousers. Are these consistent with having bled after climbing through a casement window?

DNA process would take five days, so it was important whilst he was in custody to use other evidence available to either eliminate him or implicate him.

The blue denim jeans were sent to the laboratory, and under microscopic analysis the fibres appeared similar to the fibre recovered from the fence, but because denim is a common fabric in clothing, a definitive conclusion of identity would be unlikely. The red fibre also resembled that recovered from the scene, but was a rare fibre and thus more discriminating than the denim. However, one pair of shoes was examined by a forensic scientist and compared with the shoe mark recovered from the soil bed (Fig. 7.16.2). The scientist reported that it was very similar (a close match), that there appeared to be blood on the shoes and that there were traces of debris in the sole. The scientist made a detailed examination and produced a statement identifying points of similarity in the pattern and distinguishing damaged sections that she said made the shoes unique.

Figure 7.16.2 shows footwear mark in blood, suitable for DNA swabbing and profiling. This may reveal the identity of a victim or the attacker who bled during the crime. The question arises whether the shoe was placed into the blood already present or blood was delivered to the floor from traces already on the shoe. Figure 7.16.3 shows the footwear used as evidence.

Those same damage marks on the sole were present in the soil cast taken at the scene. The suspect was later charged with the burglary on the basis of his presence in the area at the time the crime was committed as well as the fact that his shoes matched the foot mark outside the casement window at the point of entry.

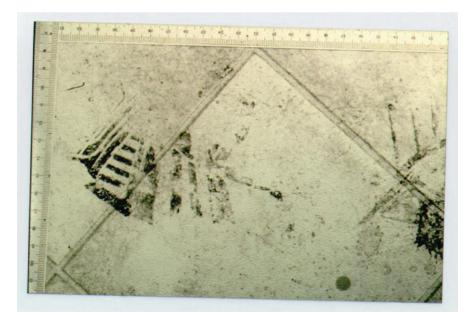


Fig. 7.16.2 Footwear mark in blood suitable for DNA swabbing and profiling

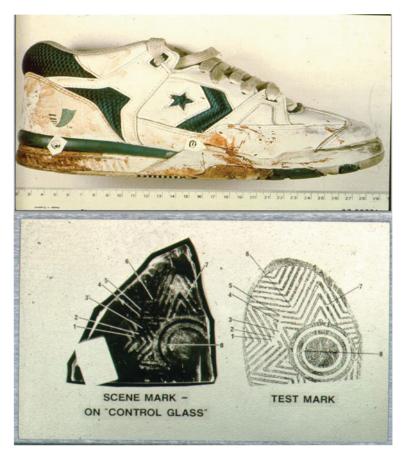


Fig. 7.16.3 Footwear used as evidence

He continued to deny involvement, although he admitted that he had knowledge of the dispute between his associate (as former owner of the property) and the victim. Faced with this evidence, he still declined to state who he had been with the day the crime had been committed and had no alibi evidence to offer.

His car was examined by a Scene of Crime Examiner, who revealed a number of finger marks in the front passenger area. These were sent for fingerprint examination with a suggestion that they be searched against the marks of the ten associates identified by FLINTS. One set of marks was identified as those of a third male. These in turn matched some outstanding finger marks at one of the linked burglary crimes. The third man was also arrested, and admitted his involvement in the original crime, saying that he had been recruited to settle a dispute between the former owner and the current owner of the premises.

Five days later, the National DNA Database reported that the DNA taken from the first man arrested and in custody matched that in all nine linked burglary crimes, including (based on the blood found on the kitchen work surface) the main crime and an additional theft of a motor vehicle. Furthermore, FLINTS now reported an additional link by means of fingerprint and handwriting evidence to a deception practised in a department store, where a cheque from a stolen book of 25 cheques had been used and presented fraudulently. The cheque book had been stolen during a car theft. The damage to the door in the main crime that was believed to have been the point of exit matched the edge of the metal pipe recovered from the garden path (Fig. 7.16.4).

The chart shown in Fig. 7.16.5 illustrates the crimes linked by forensic evidence to the suspect. The burglary and theft of the motor vehicle are linked by DNA evidence and the deception is linked by handwriting and fingerprint evidence. This chart demonstrates the links to those crimes that were the subject of a forensic link as well as links to an additional 35 potential offences of burglary that may have been linked to the suspect, depending upon the available evidence. Each of these crimes may have outstanding forensic material available for comparison with reference evidence against the main suspect as well as his associates. These could be

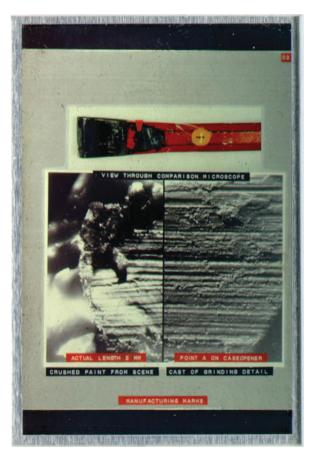


Fig. 7.16.4 Tool mark from the point of entry at the burglary scene. Microscopic comparison used to compare the tool mark in the paint with the tool recovered from the garden at the scene

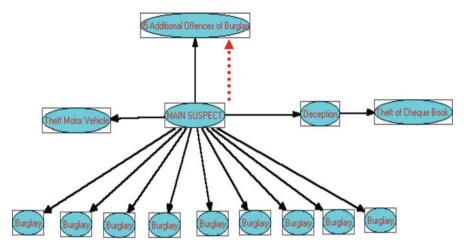


Fig. 7.16.5 Chart of links for the linked crimes and offender. This graph shows the topology of what can be interpreted as a Bayesian belief network

DNA, fingerprints, footwear, tool marks, firearms, handwriting, drugs, or, indeed, any forensic or physical contact trace material.

Analysis of the damage to the casement window and the door used to escape the premises revealed that the damage matched with the tip of the metal tool recovered from the path. A similar length of pipe was found in the boot of the car belonging to the suspect, and a comparison of the cut end sections of the two pieces revealed that they had once been a single pipe.

## 7.17 Second-Generation FLINTS

The discussion so far has centred on the conceptual ideas underpinning FLINTS and the prototype version built to prove those concepts in practice. The remainder of the chapter will be devoted to developments since testing of the prototype and a description of the newer version, now called FLINTS 2.

FLINTS 2 utilised the conceptual foundations of FLINTS 1, namely the systematic integration, analysis and use of information to inform the investigation and intelligence process. FLINTS 2 is an enhanced version of FLINTS 1 that allows access to information from a wider range of sources and allows this information to be manipulated in different ways. For example, new data sources include tables of information about arrested persons, about persons stopped and searched, and about vehicles. The new version also allows access to Command and Control<sup>46</sup> logs, and

<sup>&</sup>lt;sup>46</sup> The Command and Control System is simply the computer that manages information about incidents and crimes reported to or attended by police. It contains details of each incident and the officers attending, as well as brief report details and times.

this enables information about incidents and crimes to be directly viewed and read on the screen.

FLINTS 2 was also built to incorporate advanced mapping software so that geographical analysis could be undertaken at a more atomistic level. Geographical analysis provides useful insights into the way in which information about events, people and time can be marshalled.

Two specific features of FLINTS 1 were enhanced because they have great potential for the future. The first, a "prolific (volume) offender search", offers the ability to analyse the activity of persistent offenders. The second, a crime "hot spot search", allows us to monitor the frequency with which crime occurs in different geographic areas. These functions allow the investigator or analyst to generate hypotheses about who in the known criminal population may be offending repeatedly and about the locations where crime seems to happen most. By combining these functions, the investigator or analyst can contemplate both detection and prevention strategies. Interventions can then be targeted more acutely and the results measured over time.

Two new search and analysis functions were added. The first allows a search to be made for addresses of interest, and the second allows searches to be conducted for vehicle license numbers and partial numbers. These searches can be used to answer obvious questions about people, addresses and vehicles, but they can also be used to answer less-obvious questions. For example, if we want to know the name of a man but all we have is a partial registration number of what is believed to be his brother's car, we can set about identifying the car, then the owner, then the owner's family members. We could use the address search to provide lines of enquiry to establish which family members live where and whether any of those addresses are of interest to us. Using these search functions together or in chains of questions, we are able to navigate around the data warehouse in search of information to substantiate or negate hypotheses or to open up and test new hypotheses. It is the interplay of good questions and thoughtful analysis that allows the system to be used to best effect.

Figure 7.17.1 is an illustration of the main functions of FLINTS 2. The key list in Table 7.17.1 identifies the functions which in Fig. 7.17.1 correspond to numbers. Another new feature is the ability to use electronic mail (e-mail) to communicate intelligence findings to other personnel. Actioning forensic matches between people and crimes can be done instantaneously, thereby informing staff of a developing hot spot or the identify of a prolific offender in real time. Just as importantly, the results of this communication can be received in real time.

FLINTS 2 is a "tailor made" system designed to support the West Midlands Police in undertaking their investigations and intelligence work. It is built on the

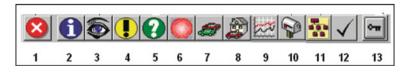


Fig. 7.17.1 The main functions offered by the FLINTS 2 toolbar

Table 7.17.1	Key list for
Fig. 7.17.1	

1	= Exit system.
2	= Management information.
3	= View graphical links.
4	= Prolific offender search.
5	= Names search.
6	= Hot spot search.
7	= Vehicle search.
8	= Address search.
9	= View management information.
10	= Mail system.
11	= View history.
12	= Enter hit results.

13 = Setup options.

same conceptual foundations as FLINTS 1, but uses wider sources of information. Links between people, crimes, locations and times are primarily based on forensic evidence, but incorporated into FLINTS 2 is the ability to use "accepted fact". Here, the term "accepted fact" refers to information that is collected in the course of routine work and that would not normally be challenged. For example, the following are examples of accepted facts: that Frederick James owns a Ford Fiesta with license number X123 GHF, and that Hugh Flannery was arrested with Frederick Prosser on 15 November 1999. Another accepted fact might be the details about a "stop and search" conducted by a police officer under the Police and Criminal Evidence Act. The fact that these events happened at a particular place, at a particular time, and involved particular people is not normally challenged. These sorts of facts therefore provide important links in chains of reasoning and seemed ideal for inclusion in the system. Introducing the term "accepted fact", which has been borrowed from the terminology of law, into intelligence work is an important step forward for law enforcement. It allows us to explain to intelligence personnel that the collection, analysis and use of everyday information can be extremely effective if the information is systemised and managed carefully; this is especially true where there is a mixed mass of information. However, the terminology also allows us to but remind personnel that information of any kind is always subject to tests of credibility, relevancy and probative force.

### 7.18 Access to the System: Searching or Surfing?

The traditional approach taken by intelligence organisations in Europe and North America has been based on a policy of a "need to know". This means that only those persons who "need to know" are allowed access to intelligence information. This has been an openly accepted policy, but one might ask "how do you know if you need to know before you have access to the information?" Evidence is only as good as the uses found for it, so giving wider and more open information access to staff offers a greater potential for the evidence contained in a database to be put to good use. That is, staff accessing the system will potentially discover new scenarios and combinations of evidence that in turn can be fed back into the system as new inputs. Wide-ranging and open access offers high-quality feedback benefits, but has to be balanced against the risks of misuse.

FLINTS may thus create a measure of tension because the very opportunity and ability to access the complexity inherent in combinations of evidence will nearly always justify the user in claiming that they have a "need to know". The nature of the policy currently operating in the West Midlands Region is currently classified as "sensitive", so it is not possible to publish it in this thesis. However, what can be said is that success was gained by applying for a policy of very wide-ranging access for users in order to ensure sufficient access to the complexity of linkages in the system. FLINTS now presents so many opportunities for linking that it is feasible to literally "surf" the system to discover links between crimes and suspects based on evidence that can be immediately acted upon. This is compatible with what Peirce ([1901] 1955, pp. 150–155) termed *abductive reasoning* and equates to acting on the basis of hypotheses that are mere hunches or insights, then recognising evidential opportunities presented as tests of their justification. The ability to formulate and ask questions speedily, then bring together the answers equally speedily while bearing in mind both what we have learnt and what we may want to learn if the opportunity presents itself is an example of Peirce's reasoning. The process is similar to the asking of questions followed by seeking evidence to either refute or confirm the hypothesis embedded in the questions.

Sir Edward Crew, the Chief Constable of the West Midlands region, commented about FLINTS that "the system is beginning to produce so many cases that a whole-sale re-evaluation needs to be taken about deployment of staff across the West Midlands. In some areas so many evidence leads and cases are being produced that there are insufficient staff in current structures to manage the arrests."<sup>47</sup>

Inappropriate access could present opportunities for corrupt practices and illegitimate use of the evidence. This problem has to be balanced against the need for wide-ranging and (as far as possible) open access to the system by investigators and analysts. The philosophy of this thesis and the design of the access system is therefore intended to support broad access but with security levels and passwords incorporated to prevent misuse.

Access to the FLINTS system cannot be gained until the user completes a log-in procedure, as shown in Fig. 7.18.1. Having negotiated the log-in procedure, users enter the system and gain access by negotiating a unique (individualised) password screen (Fig. 7.18.2). Passwords can be changed at regular intervals by the user or by system administrators to protect against security breaches. All changes are logged and tracked by means of audit trails. The toolbar at the top left corner of Fig. 7.18.2 is used to navigate through the system and to select the relevant options.

<sup>&</sup>lt;sup>47</sup> Sir Edward Crew, addressing a meeting of the Jill Dando Institute of Crime Science and the West Midlands senior management team.

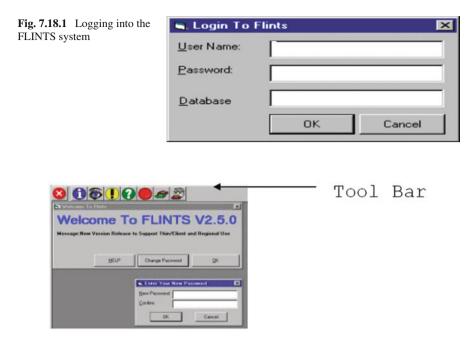


Fig. 7.18.2 The Toolbar in FLINTS 2

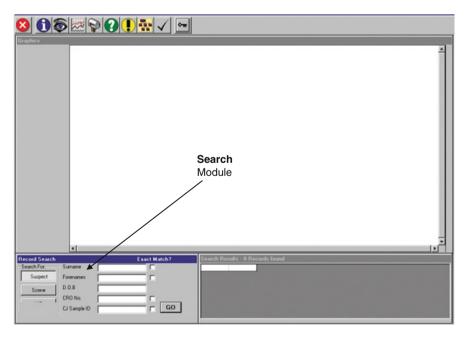


Fig. 7.18.3 The FLINTS 2 desktop environment

Once the user has negotiated the password and security system, they see the basic operating desktop (Fig. 7.18.3). This desktop gives the user the tools to undertake searches, analyse results and navigate the system.

## 7.19 Asking Questions About People and Suspects

Figure 7.19.1 illustrates the results of entering a suspect's name (here, "Tyler") into the system. Tyler may be of interest as part of an enquiry or in response to a request for intelligence information as part of someone else's enquiry.

In terms of suspects, any single field or combination of fields can be used to construct a search. Searches can be made by reference to surname, forenames, date of birth, criminal record number and DNA sample reference number. Names or identifying features (in any of the fields) can be selected and analysed further as the user's interest is raised.

Record Search			Exact Match?	Search Result	s - 3 Records found			
Search For	Sumame	Tyler	_ <u> </u>	SURNAME	FORENAME	DATE_OF_BIRTH	CRO_NUMBER	ALIAS
Suspect	Forenames			Tyler	XXXXXX	XXXXXX	10101010	XXXXXXX
Scene	D.O.8		_				-	
	CRO No.	-						
	CJ Sample ID		- G0					

Fig. 7.19.1 The results of searching on a suspect name

## 7.20 Asking Questions About Crimes and Events

Crime types are coded into the system for ease of retrieval. Figure 7.20.1 illustrates the result of a search for *burglary dwelling crimes*. (These are coded as crime type BDW.) Once found, crimes on the list can be selected, viewed, cross-referenced and searched again to provide more details about each crime as progress is made. This search could result from trying to locate a crime of particular interest based on its *modus operandi* or other discriminating features.

Searches can also be done by geographic police area, such as a town, village, city or the whole of a police area. Geographic criteria entered into a search can change

<b>Record Search</b>	10		Exact Match?	Search Results - 1909 Recor	ds found.			
Search For:	Crime No.			CRIME_REFENCE_NUMBER	OFFENCE_TYPE	FORCE_STATION		Ŀ
Suspect	Crime Type	BDW		J2/2447/99	BDW		20J2	1
	2000	IBDW		J2/2649/00	8DW		20J2	2
Scene	Force/Station			J2/2695/00,KPD/6158/00/1	8DW		20J2	2
1 ocens	LAYIC	<u> </u>		J2/2837/99	8DW		20,12	2
HIT	L'Inc	1		J2/3025/99	8DW		20,12	1
			GO	J2/3359/99	8DW		20J2	2
				LI2/3701/00 KPD/6914/00/1	RD/w/		20.12	12

Fig. 7.20.1 The results for searching by code (here, for Burglary Dwelling Crimes)

	Search Results - 238 Records found.					
	CRIME_REFENCE_NUMBER	OFFENCE_TYPE	FORCE_STATION	-		
	AJ/989/98	DRUGS		20,12		
lane and the second sec	CH/991/98	DECEPTION		20,12		
20/2	F/121/96	BOT		20J2		
	F79/96	BOT		20,12		
	J/104/96F	ROBBERY		20,12		
GO	J/173/98	CRIMINAL DAMAGE		20,12		
	.10/10442/96	RDW		2012		
		CRIME REFERCE NUMBER A/399/38 CU-391/38 F/121/35 F/73/36 J/104/36F J/173/38	CRIME REFENCE NUMBER OFFENCE TYPE AV:893/98 CRI-991/98 CRI-991/9	CRIME         REFERCE         NUMBER         OFFENCE         TYPE         FORCE_STATION           AU/393/39         DECEPTION         DRUGS         DRUGS<		

Fig. 7.20.2 The results of searching based on a police area

the results enormously. Figure 7.20.2 illustrates a search of a police area called  $20L2.^{48}$  Again, crimes can be selected and analysed further as the user's interest is raised.

In terms of crimes, any single field or combination of fields can be used to construct a search. Searches can be made by reference to crime reference numbers, crime types, geographic locations and even laboratory references for forensic samples.

# 7.21 Displaying Modified Wigmorean Charts: Graphical Results in FLINTS

One of the most powerful intellectual tools that FLINTS 1 possessed was the ability to visually display links within the evidence stored in the system. This feature has been retained and enhanced in FLINTS 2. Having obtained a list of search results, the user can select the required entry, and the links within the evidence in the system will be illustrated. Figure 7.21.1 demonstrates this feature.

Prior to FLINTS, the task of bringing together the evidence to construct such a chart would have been very time-consuming. It would involve accessing many systems, as well as the arduous task of drawing a chart encompassing all the nodes and all the arcs. Apart from being time-consuming, the many actions required of the user to obtain the information and then construct the chart would involve the risk of error. The automated system in FLINTS 1 and 2 speeds this process up and reduces the risk of error. In addition, the process can be repeated time and time again as new and interesting scenarios or links are discovered. This means that immense amounts of information can be marshalled and tested in different ways as the process of discovery unfolds. Users can combine different strategies and different functions<sup>49</sup> to analyse, synthesise and hypothesise about relationships, links and networks of people and crimes of interest to the investigator's particular tasks. This process is unique to FLINTS 1 and 2.

Figure 7.21.1 provides an example of a search of the system and a graphical display of the result. Let us imagine that we have decided that a suspect called "Tyler" is of interest to us. In the top portion of the chart, we can see links between Tyler

<sup>&</sup>lt;sup>48</sup> This area is a suburb of the West Midlands.

<sup>&</sup>lt;sup>49</sup> Here, *function* simply means *questions*.

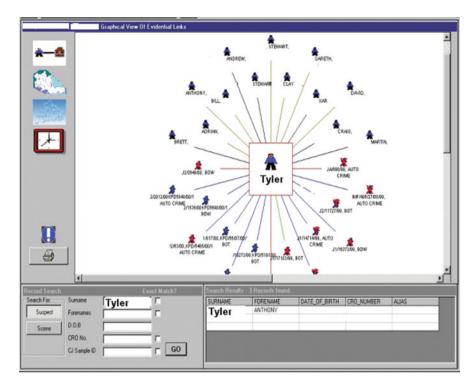


Fig. 7.21.1 Graphical display of the results of a search

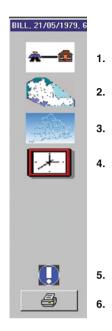
and his former associates. These are people he has previously been arrested with or prosecuted with as a co-accused person. In the lower portion of the screen, we can see links to crimes based on inferences from forensic evidence. These present us with hypotheses about opportunity and will need to be tested alongside additional evidence. The different coloured lines refer to different evidence types or links.

I would like to stress my claim that the ability to manage, juxtapose and ask questions of evidence in a variety of ways provides valuable insights into interesting scenarios and possibilities. In Fig. 7.21.1, each forensic link is colour-coded and can be identified by placing the cursor on top of a line linking two objects or nodes together. Further information about each crime scene or person may be obtained by placing the cursor on top of the relevant icon. Additional information will appear that can then be presented in another graphical view.

On the left side of Fig. 7.21.1, the user can make use of a series of functions on a toolbar. This has been designed to display the evidence in a number of ways and to reveal interesting combinations of the evidence. Figure 7.21.2 is an expanded illustration of the toolbar itself. A key list is provided in Table 7.21.1.

The presence of evidence is not always the same as evidence of the validity of the inference one can draw from it. Checking evidence for authenticity is as important in FLINTS as it is in the management of evidence in single cases. Figure 7.21.3 is

**Fig. 7.21.2** Enlarged view of the results toolbar of FLINTS 2



**Table 7.21.1** A key list for Fig. 7.36

- 1. Graphical chart function people and events.
- 2. Graphical chart function geography of crime.
- 3. National geography chart.
- 4. Temporal analysis of events.
- 5. Warning system
- 6. Print the graphic

**Fig. 7.21.3** A sample warning to confirm the validity of links



an illustration of the warning system that instructs the user to check the validity of the evidence before acting upon it.

This approach helps to eliminate errors in recording and in evidence interpretation, as well as false positives. Imagine the presence of a DNA match demonstrated visually to an investigator on a chart. Before the investigator decides to take action, they are prompted to check on the validity of the match by checking secondary

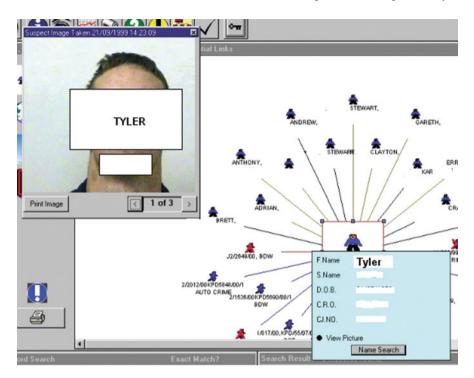


Fig. 7.21.4 FLINTS provides immediate access to photographs of suspects in its database

systems such as the National DNA Database or the Custody Records System in an attempt to uncover corroborative evidence.

As in Fig. 7.21.4, any available photographs of a suspect who appears in the chart can be viewed instantaneously. If there are a number of photographs available, they can be viewed chronologically. This has many uses, but one important one is the identification of unknown suspects.

#### 7.22 Geographical Analysis

Figure 7.22.1 provides an enlarged view of the toolbar icons in Fig. 7.21.2, plus explanations of the features. Figure 7.22.2 provides an example of the map that can be generated by clicking the second map icon in Fig. 7.22.1.

Figure 7.22.2 is a map of the West Midlands Region and surrounding county police forces of Staffordshire, West Mercia and Warwickshire. Crimes committed by a network of linked offenders are plotted on the map to give an impression of the distribution of the crimes. This display can give analysts insights into the places where suspects and their associates habitually offend, and compare these locations with each person's place of residence. This chart could then be compared with and indeed overlaid by another chart dealing with undetected crimes. There may be some



(1) This icon can be selected to view a network of suspects geographically. In addition, links between suspects and crimes across England and Wales can be identified. The links are then presented in the graphics screen.

(2) This icon can be selected to view the West Midlands



(3) This icon can be selected to view the graphics screen.

**Fig. 7.22.1** Icons for geographic analysis. (1) Icon for selecting geographic overview. (2) Icon for selecting a subset Area. (3) Icon for displaying the results for a selected view

Region and surrounding areas.

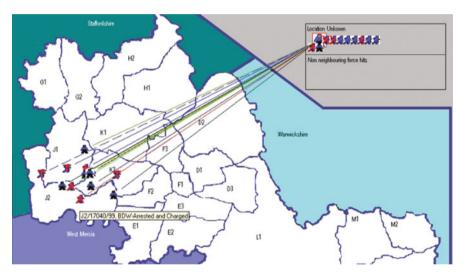
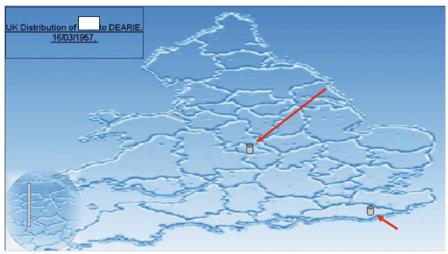


Fig. 7.22.2 Map of locations within the West Midlands region

correlation between those crimes known to have been committed by the identified network of persons and those crimes as yet undetected.

Figure 7.22.3 illustrates crimes that have been recorded across two police areas. This map display presents an opportunity to identify travelling criminals. Cylinders of various heights are used to give an impression of the number of crimes in each area. In this illustration, we have a hypothesis that a known offender, identified by means of DNA evidence, has been linked by forensic evidence to one crime in the West Midlands Region and another crime on the southern coast of England. Without FLINTS technology, these links could not be speedily identified during routine analytical work.



It illustrates crimes that have been recorded across two police areas.

Fig. 7.22.3 Map of the West Midlands region and of crimes within the region

# 7.23 Temporal Analysis

FLINTS results can also be subjected to temporal analysis using the toolbar icon in Fig. 7.23.1.

The use of temporal analysis in intelligence work can provide useful evidence to infer "opportunity" and assess how groups of crimes may be connected with each other. This assists in the provision of hypotheses and ranges of questions that can be explored elsewhere in the system.

Linking these types of hypotheses with those connected with "virtual offenders and suspects" provides additional insights into the identification of those in the population who ought to be considered as more likely offenders and those who perhaps should not be so considered. Reducing the certainty attached to some suspects in



This icon can be selected to display a chronology of events, which can then be presented on the graphics screen.

Fig. 7.23.1 Icon used to select a chronological display

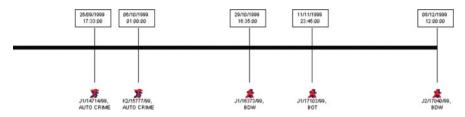


Fig. 7.23.2 Example of a typical chronology of crime for a suspect

the database is a useful method of indicating those who should be considered for further inductive eliminative exercises.

Figure 7.23.2 illustrates a chronology of crime for the suspect Tyler identified earlier in this chapter.

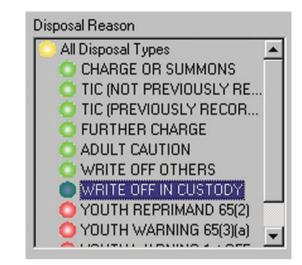
### 7.24 Prolific (Volume) Offenders Search

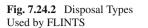
The prolific offender search function (Fig. 7.24.1) allows the user to ask the system questions designed to elicit information about persons who repeatedly commit crimes – that is, persons identified by evidence as doing so. The police, acting under Home Office instructions, classify these as "detections" and refer to them in a number of ways. Figure 7.24.2 illustrates the various ways in which these classifications are listed. These ways are called *disposal types*.

Prolific offenders can be identified by crime type, geography, and disposal type, as well as by reference to time. The results of searching under these criteria can be presented graphically in the form of a chart. This view has many uses in the construction and testing of hypotheses about crime and offenders.



Fig. 7.24.1 Searching for prolific (volume) offenders





## 7.25 Using Geography to Identify Prolific Offenders

In the West Midlands Region, operational areas are known as Operational Command Units (OCUs). These OCUs are listed in groups or clusters called Divisions, and coded from A to M. Any one or a number of these areas can be selected to provide the basis for a geographic query. Figure 7.25.1 illustrates this.

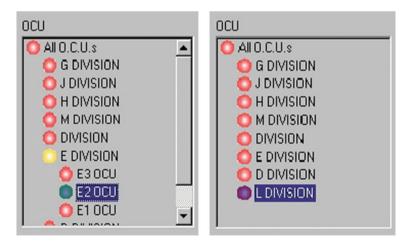


Fig. 7.25.1 List of available Operational Command Units (OCUs)

Offence Types	
All Offence Types	
ABANDON CHILD UNDER TWO YEARS (012)	
O ABDUCTION (025)	
ABSCONDING FROM LAWFUL CUSTODY (080)	
ABSTRACTING ELECTRICITY (043)	
ACCIDENT OFFENCES (805)	
O ADULTERATION OF FOOD (089)	
ADULTERATION OF FOOD, DRUGS ETC (101)	
AGGRAVATED BURGLARY IN DWELLING (029)	
AGGRAVATED BURGLARY OTHER BUILDING (031)	<b>_</b>

Fig. 7.25.2 List of available offence types

In addition, a single description or group of descriptions of crime can be selected to provide the offence type, as shown in Fig. 7.25.2.

For example, looking at Figs. 7.25.1 and 7.25.2 shows that we can select the E Division, the E2 OCU, and burglary crime during the last ninety days, by reference to where the crime was committed. This query (Fig. 7.25.3) would give us information about burglary crimes committed in E Division's E2 OCU during the last ninety days and let us view the information graphically. We could also select any one of the crimes to view the original report on screen directly to access additional information.

Figure 7.25.3 demonstrates the way in which the user is presented with a textual version of the question. This approach reminds the analyst at regular intervals about the question they are asking.

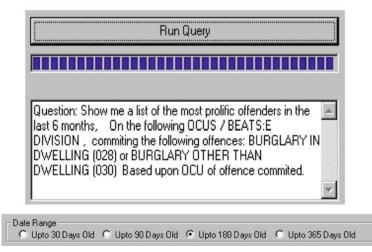


Fig. 7.25.3 The query definition dialog box

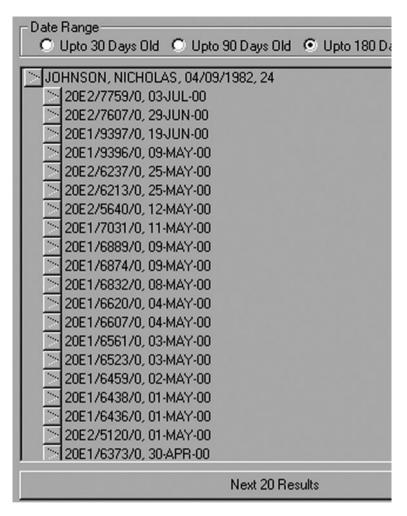


Fig. 7.25.4 The results of specifying a date range in a query

Figure 7.25.4 shows the results of a search. This screen allows the user to select items of interest from the results of the search for further searching or viewing in the graphical viewer.

Figure 7.25.5 is an example of the type of report that can be accessed using FLINTS 2 technology. The first illustration is a report concerning a crime included in the Crimes System and the second is a report concerning a Command and Control entry.

	5						/		
			F	ints - Cr	imes Re	esults			
	2001/16138/00	Report Method PATROL	OCU 0113	2	Created 06/11/00				
c	From Date 4/11/00 18:00	To Date 06/11/00 03:53	Last Updat 15/11/00 13::	ed 3:47	Cleared Or 15/11/00	/			
nce	Burglary Other Build	ng set Erdington Birmingham 82:	1.400		/				
eat Vi	ctim No								
ple	Victim Address	Mohan Ram Bn: 12/01/55	i al, Wolverhampton, WV6 BN	2					
	Reported To	9777 Christopher Bradsh	an, worvernampton, wyb ere are						
	OSC Other	6494 Guy Roberts 50500 Marie Lynch							
	Other	9890 James Weir							
	Defendant Address	Martin Richardson Bri: 10 130, Gravelly Hill North,							
		ined Access Into Premises 8 rs Caught 1 × Outstanding.		ow. Offenders Ther	n Disturbed And P	tade			
ect	Escape . 2x Offende	rs Caught 1 × Outstanding.	Property Stolen Recorded O	verleaf And Later Re	ecovered				
riptic									
erty	Damaged Stolen	Building Material Window Other Spanito Micro Sc				£300.00 £500.00			
URN	236 06/11/00								
			Terds Class - Ulac: p82122 (D		24	_			
			Inda Claud - User pIZR2 (1)		2	_			Auto Logoff in 16
			URN	Dete à Time		ecure Record	Owner	Flints - C&C	Result:
			URN 236	Dete & Time 03:55 hrs 06/	<b>≤</b> 11/2000 №	0	DAFO	Operator 53079	Result
			URN 236 Initial Class	Dote à Time 03:55 hrs 06/ Response	/11/2000 M	io Irlime No.	DAFO Arrests	Operator 53079 Date Closed	Result Dill Pert
			URN 236	Dete & Time 03:55 hrs 06/	/11/2000 M	0	DAFO	Operator 53079	Results
			URN 235 Initial Class ALASM Mothed Received Caller	Oate & Time 03:55 hrs 06/ Response IMMEDIATE	/11/2000 M	io Irlime No.	DAFO Arrests	Operator 53079 Date Closed	Result Dill Pert
			URN 236 Initial Class ALASM Mothed Rocalved Caller Caller Adress	Date & Time 03:55 hrs 06/ Response IMMEDIATE Central Alam	/11/2000 M	io Irlime No.	DAFO Arrests	Operator 53079 Date Closed	Result Dill Pert
			URN 236 Initial Class ALARM Methed Rocaived Galler Address Galler Phone	Oote & Time 03:55 hrs 06/ Response IMMEDIATE Central Alar Custodian	/11/2000 h C	o Inime No. ) 2001/16138/00	DAFO Arrests 0	Operator 53079 Dete Closed 00/11/2000	Result Dill Pert
			URN 236 Initial Class ALASM Mothed Roceived Caller Address Caller Address Caller Address Caller Cocation 060R	Dote & Time 03:55 hrs 06/ Response IMMEDIATE Central Alam Custodian Stock House 4110782918	*11/2000 h c m e-114/118 High	o rime No. ) 2001/1613860 Street Erdington-I	DAFO Arrests 0	Operator 53079 Dete Closed 08/11/2000	Result 0113 Port VM20
			URN 236 Initial Class ALARM Method Received Caller Adress Caller Phone Incident Location 060R Incident Detail	Dote & Time 03:55 hrs 004 Response IMMEDIATE Custodian Stock House 4110782918 Alarm # D10	*11/2000 M C m e-114/118 High 00916 Respons	o rime No. ) 2001/1613860 Street Erdington-I	DAFO Arrests 0	Operator 53079 Dete Closed 00/11/2000	Result 0113 Port VM20
			URN 236 Initial Class ALASM Mothed Roceived Caller Address Caller Address Caller Address Caller Cocation 060R	Dote & Time 03:55 hrs 06/ Response IMMEDIATE Central Alam Custodian Stock House 4110782918	*11/2000 M C m e-114/118 High 00916 Respons	o rime No. ) 2001/1613860 Street Erdington-I	DAFO Arrests D irmingham-West Mi	Operator 53079 Dete Closed 08/11/2000	Result 0113 Port VM20
			UIN 275 276 276 276 276 276 276 276 276 276 276	Octe à Time Osts hrs 0d/ Response IMMEDIATE Contral Alan Custodian Stock House 4110782918 Alam # DIO REPORT - CI	*11/2000 h c m =-114/118 High K0 00916 Response RIME CONTACTINE	o rime No. ) 2001/1613850 Street Erdington-I e Immediate Model Update & KEYS	DAFO Arrests D irmingham-West Mi	Operator 53079 Dete Closed 08/11/2000	Result 0113 Port VM20
			LINN 236 Initial Class ALASM Method Received Callier Address Caller Phono Incident: Coation OGGR Incident: Rosult Story 0.365.27 2075 02.365.27	Dete & Time O3:55 hrs 06/ Response IMMEDIATE Central Alar Custodian Stock House Alarm & D1078218 Alarm & D1078218 Alarm & D1078218 Alarm & D1078218	*:1/2000 N 6 m =-114/118 High K0 00916 Response RIME CONTACTINE Routed To R	o rime No. 9 2001/1613850 Street Erdington e Immediate Model Update 3 KEYS 3 kEYS	DAFO Arrests 0 limingham-West Mi Digital Com Delay 10	Operator 53079 Dete Closed 08/11/2000	Result 0113 Port VM20
			UIRN 236 Initial Class ALASM Mathad Racalved Caller Address Caller Address Caller Address Caller Cherol Incident Rosalt Softy 0.56-37 2000 0.55-37 2000 0.55-37	Date & Time 03:55 hrs 6/ Respense IMMEDIATE Central Alam Custodian Stock House Alam # 010 REPORT - C1 VM200 D181		o vime No. vime No. street Endington-1 e Immediate Model Update a KEYS adio Operator(s) nsfer Accepted by inde	DAFO Arrests 0 limingham-West Mi Digital Com Delay 10	Operator 53079 Dete Closed 08/11/2000	Result 0113 Port VM20
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Fig. 7.25.5 The results of a query

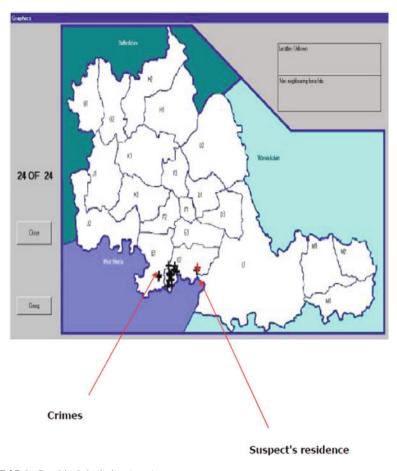


Fig. 7.25.6 Graphical depiction (map)

A map can be presented to display the relationships between crimes committed and events (indicated by black crosses) and the offender's address (indicated as a red cross). See Fig. 7.25.6 for an example.

By integrating searches between functions, detailed information about individuals and crimes can be accessed speedily. This feature can again include photographic details, as shown in Fig. 7.25.7.

All the links to this individual can displayed using the graphical viewer along with information on their geography, chronology and associates.

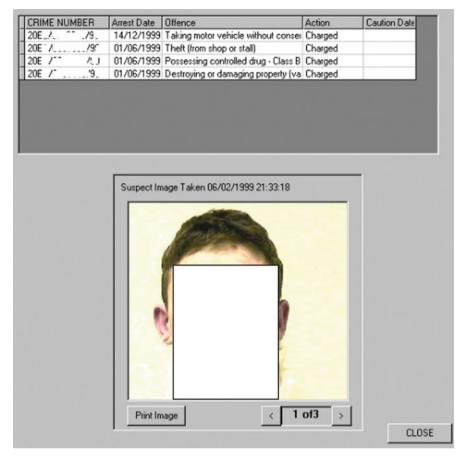


Fig. 7.25.7 Summary of crime results plus photograph of suspect

#### 7.26 Hot Spot Searches

As illustrated in Fig. 7.26.1, the hot spot search function allows users to identify geographic areas where the frequency of crime is high. This can be done by reference to times, locations, and crime types, and can be compared with address details for prolific offenders. This provides a powerful analytical tool for strategic analysis of crime frequencies as well as a briefing tool for patrolling officers and investigators.

Figure 7.26.2 illustrates an example of using the hot spot feature to search for incidents rather than crimes. The address, the day, the date, the time, the reference number of the incident, the type of incident and any notes made by the reporting office can be accessed remotely by the analyst.

F Flints Client - User: p1908 (Browse Only)			
	8		
FLINTS Hot	t Spot Sea	reh	
LINIS NU	аригаса		
0CU/Sector	Event Types	Address Type	
0 D1 OCU 0 D2 OCU	C Command and Control Incidents	G Hot streets	
O D3 OCU O E1 OCU	C Crimes Records	C Hot Grid References	
6 E2 OCU	Both		
17	Bun Query		
List	Report	Geographical	
Recorded Crime Command And Control			

Fig. 7.26.1 The FLINTS search function for identifying hot spots

\ddress	Day	Date	Time	Crime / Inci. Ref.	Туре	Notes
	<sup>DI</sup> TUE	03/10/2000	09:42:00	538	MISCELLANEOUS SUSP INC/CIRCS/PERSON/VEF SCR	CALLER REPORTS HE THINKS THERE MAY HAVE BEEN A BURGLARY-GARAGE DOOR HAS BEEN OPEN ALL NIGHT AND WINDOWS STEAMED UP-UPSTAIRS COMPLETED TASK/PLAN/ENQUIRY
	S DI MON	21/08/2000	21:52:00	2743	MISCELLANEOUS	LADS ON THE SCAFFOLDING AROUND MARGARET HOUSE. DON'T KNOW IF THEY ARE BEREAKING IN. PITCH BLACK. 2 OR 3 OF THEM. ON THE SIDE BTN 2 BLOCKS MATCHED WITH 2710 (21/08/00)
	<sup>DI</sup> MON	21/08/2000	21:45:00	2717	MISCELLANEOUS	THERE IS A GANG OF TEENAGERS ON THE SCAFFOLDING ON THE FLATS IN BERRYFIELDS-THEY MAY BE LOOKING FOR OPEN WINDOWS TO BURGLE PLACES MATCHED WITH 2710 (21/08/00)
	01 TUE	26/09/2000	07:27:00	332	CRIME MOTOR VEHICLE CRIME TMV	REPORTING MY CAR STOLEN- HAPPENBED OVERMIGHT- NOTHING SEEN ITS A ROVER 214- RED- WOU REPORT - CRIME
						CALLER REPORTING HER EX-BOYFRIEND (WHO

Fig. 7.26.2 Results of a hot spot search based on incidents rather than crimes

## 7.27 Vehicle Searching

FLINTS also offers a powerful tool for searching for vehicles (Fig. 7.27.1). The tool offers a range of options (Fig. 7.27.2). The results of vehicle searches appear in the form of lists from which the analyst can select those vehicles that appear to be of interest (Fig. 7.27.3).

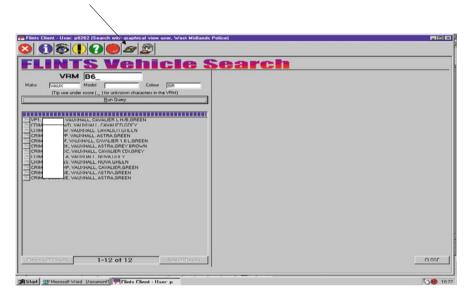


Fig. 7.27.1 The FLINTS vehicle search dialog box



Fig. 7.27.2 Options available in the FLINTS vehicle search

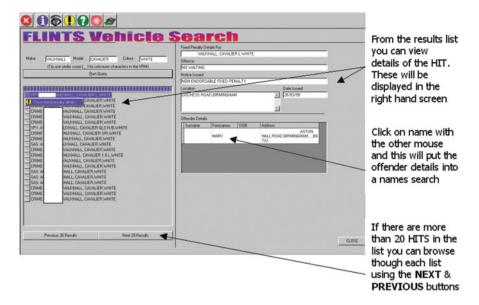


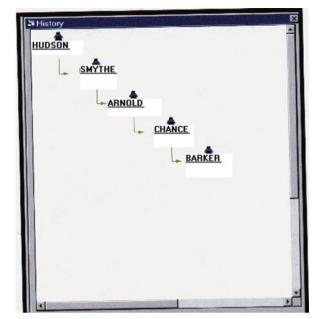
Fig. 7.27.3 The results of a vehicle search

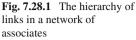
## 7.28 Analytical Audit Trails

Using FLINTS 1 and 2 can involve navigating many inferential links between people, crimes, events, places and times. For example, a user may begin by searching for a suspect for a series of crimes but soon find themselves navigating links that change their priorities or produce unexpected opportunities to discover new issues of interest. The speed with which the system searches, retrieves information and then presents graphical charts can result in users "losing their way". Users can navigate so many links and find so many opportunities within charts that it can be difficult to know where the evidence trail started and how they arrived at a particular conclusion.

An audit trail has been built into the system to help users manage this potential confusion. This function can be activated by the user and will record as well as present audit trails. Figure 7.28.1 is an illustration of a *simple* audit trail. Audit trails can become long lists of links, depending on the analysis.

The function serves two purposes: First, it helps the analyst to maintain a log of analytical activity that allows the user to "backtrack" through the analysis. The analysis can also be repeated by following the audit trail if the occasion arises. Second, the function can help others to check how a particular conclusion was arrived at. For ease of interpretation, the example presented here is a simple one – but is nonetheless a real audit trail from FLINTS. In Fig. 7.28.2 we can see an example of a complex network of links between 37 suspects. The suspect at the





centre of the chart is called "Barker". The chart represents a series of links beginning with Hudson, then Smythe, Arnold, Chance and finally Barker. The original search began with Hudson, but by navigating only three more steps the analysis ended with an extensive network of linked criminals and crimes.

A valid question at this point might be: "What benefit has been gained by this approach?" The answer is that at each level of search, a different chart was viewed (similar to the one in Fig. 7.28.2). This approach can give many different perspectives and insights into many networks involving suspects, crimes, locations and chronologies. Each of the five suspects from Hudson to Barker was viewed as a separate step in an analytical chain of reasoning. Each suspect, from Hudson through to Barker, became a central node at each stage in the process. That is, they became a central focus of the analysis, and all links known to exist between crimes and suspects were displayed in a chart.

Those charts also appear similar to the one illustrated in Fig. 7.28.2. At each stage, therefore, the analyst can decide where the analysis will journey next, and by which route. Different routes will provide different results and different links. Many unknown features and characteristics of networks between suspects and crimes could be discovered in this manner.

Another answer to the question would be that Fig. 7.28.2 has four links between suspects and burglary crimes (indicated by arrows). The suspects linked to these crimes have been linked by means of forensic evidence and are thus liable to be arrested on suspicion of committing those crimes. The hypothesis is that they had the "opportunity" to commit those crimes. However, there are indirect links between

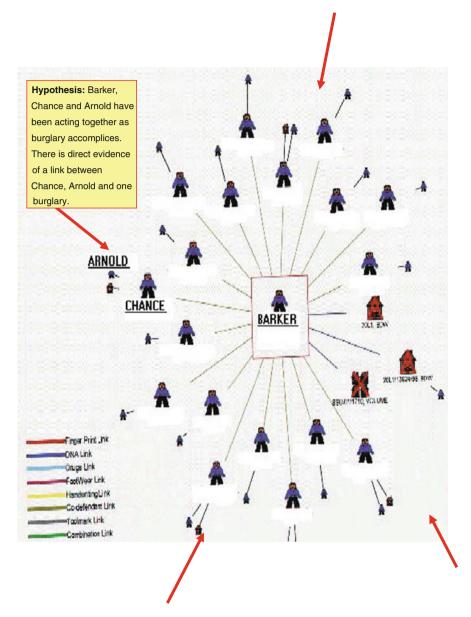


Fig. 7.28.2 List of links and hypothesis summary

other suspects and these crimes that may indicate different hypotheses. We could, for example, draw inferences about which suspects might be acting together in crime and which are not. These hypotheses can then be tested by performing other analytical work. This is an example of the way in which the system acts as a generator and tester of hypotheses. Some may be substantiated and some may not, but the

important thing is the ability to ask the question. In this example (Fig. 7.28.2), we could formulate a hypothesis that Barker, Chance and Arnold have been acting together as burglars. There is direct evidence of a link between Chance and Arnold and one burglary. Other hypotheses of equal validity could also be formulated, but from even this brief analysis, Barker has already become a suspect of great interest to us.

There are seven links to crimes of burglary in this chart, of which three are linked directly to Barker and four are linked indirectly via another suspect. The chart presents many hypotheses for testing the possible involvement of Barker and others in crime as well as many opportunities for intelligence generation. Recording the way in which the chart was navigated might prove important to those we seek to persuade subsequently of the validity of our logic.

The potential to develop evidence marshalling can be appreciated if Fig. 7.28.2 is considered in the light of potential developments. In FLINTS 1 it was already possible to have a snapshot of all the links in FLINTS 1 at a given point in time using a set of predetermined *attractors*. For example, it was already possible to ask FLINTS 1 a complex question using several objects as attractors in a truncated chain.

The ability to navigate very complex layers of information and follow direct and indirect links like these using the powerful visualisation techniques demonstrated by FLINTS 1 and 2 provides great potential for the development of future systems.

## **Chapter 8 The Forensic Disciplines: Some Areas of Actual or Potential Application**

## 8.1 Crime Scenario Modelling: The Dead Bodies Project, and a Scenario Space Generated Using an ATMS

### 8.1.1 Generating Crime Scenarios Automatically

Jamieson (2004) discussed the methodology of crime scene investigation (CSI), involving human scenarios.<sup>1</sup> Ross Gardner and Tom Bevel's (2009) Practical Crime Scene Analysis and Reconstruction addresses<sup>2</sup> every aspect of the analysis and reconstruction of the events surrounding a crime, and comprises an introduction and history of *crime scene analysis*, followed by theoretical and practical considerations, and then event analysis, this being a practical methodology for crime scene reconstruction (CSR). Event analysis in the form introduced and presented by Gardner and Bevel uses specially designed worksheets that cover internal, external, and terminal ballistics as they apply to understanding trajectories. Next, significant investigative questions of CSR are discussed in Gardner and Bevel (2009), before turning to crime scene protocols and their effect on reconstruction. This is followed by a chapter on *bloodstain pattern analysis*,<sup>3</sup> and then by a chapter by Matthew Noedel about shooting scene processing and reconstruction, a chapter by Scott Wagner on forensic pathology about dead bodies, in relation to CSR, and finally by chapters by Gardner and Bevel about writing crime scene reconstruction reports, about arguments and ethics, and about developing and using demonstrative exhibits in support of the crime scene analysis. The latter is about crime scene analysts testifying in court cases.

841

<sup>&</sup>lt;sup>1</sup> Concerning fact investigation in general, see Binder and Bergman's book (1984), as well as, e.g., Zander (1979). In a British context, Cook and Tattersall (2008) is a pocket-sized handbook about the processes and actions involved in the role of Senior Investigating Officer. The issues covered comprise, among the other things, crime scene examination and investigative strategies.

 $<sup>^2</sup>$  In the shorter compass of a book chapter, crime scene investigation is the subject of an introductory article by Marilyn Miller (2003, 3rd edn. 2009).

<sup>&</sup>lt;sup>3</sup> For which, Section 8.8 below; it is also the subject of a book by those same authors (Bevel & Gardner, 2008, 3rd edn.).

Studies of crime scene investigation conducted in a cognitivist vein include Schraagen and Leijenhorst (2001) and Ormerod, Barrett, and Taylor, (2008). In an article entitled "Distributed Cognition at the Crime Scene", Chris Baber (2010) from the University of Birmingham discussed in the journal *AI & Society* a conceptualisation of *crime scene examination*, in terms of *distributed cognition*.<sup>4</sup> "In this paper, Distribution is defined by the number of agents involved in the criminal justice process, and in terms of the relationship between a Crime Scene Examiner and the environment being searched" (ibid., from the abstract). Baber's approach combines cognition and ergonomics. Baber pointed out (2010, p. 423):

Crime Scene Examination presents an interesting and challenging domain in which to consider the notion of Distributed Cognition for the simple reason that it is not always apparent where the act of 'cognition' is situated. The ultimate aim of the criminal justice process, of course, is to acquire evidence which can be combined with information from other sources in order to produce a case that can be tried in Court. Contrary to its representation in popular fiction, the examination of a crime scene is unlikely to yield evidence that immediately links a suspect to a crime. Rather, the collection of evidence is part of a complex web of investigation that involves many individuals, each considering different forms of information in different ways.

Baber situates the role of *crime scene* examiner (*CSE*) within the criminal justice process (ibid.):

The CSE is part of a much larger investigative system, each member of which has their own skills and roles (Smith et al., 2008). In a sense, Crime Scene Investigation involves sets of ad-hoc teams pursuing independent goals with quite limited overlap (Smith et al., 2008). Thus, there is typically a demarcation between roles. Having said this, the nature of this demarcation has been subject to significant shifting over the years, with the ongoing digitisation of Crime Scene Examination leading to further changes. For example, there used to be a specific role of Crime Scene Photographer whose function was to capture and process images of the crime scene (either prior to evidence recovery or at stages during the recovery process, depending on the nature of the crime). However, with the growing use of digital cameras by CSEs, this role has (in some Police Forces) changed. This has the interesting implication that the function of a photograph taken by the Crime Scene Photographer was to capture the scene as clearly as possible in order to aid discussion of the scene in Court (or during subsequent investigation), but the function of a photograph taken by the CSE could be to illustrate the evidence recovery process; [...]

<sup>&</sup>lt;sup>4</sup> For this concept, see Dror and Hamard (2009). Baber remarks (2010, p. 424): "While I suggest that Crime Scene Examination necessarily involves several agents performing cognitive activity, this is not to argue that this results in an 'extended mind' across these agents; as Dror and Hamard (2009) point out, to argue for an extended mind is analogous to arguing for extended migraine – just because an event occurs in one brain does not inevitably mean that other brains will share this event. Dror and Hamard's (2009) argument is that one should not separate cognitive states from mental states. This criticism raises a core problem for the notion of 'Distributed Cognition', because it implies that cognition cannot be 'distributed' across agents because one cannot share mental states. A primary assumption of 'Distributed Cognition' is that it is not 'cognition' which is distributed so much as objects-in-the-world, which plays a role in supporting, structuring and aiding the activities of cognition."

#### Baber explains (2010, p. 426):

What is happening in Crime Scene Examination is the mediation of cognition through the collection, manipulation and dissemination of a variety of artifacts; each artifact is interpreted in particular ways by the agents who come into contact with it. My argument will be that, for the various agents involved in this evidence chain, each artifact can 'afford' a particular set of responses, that is, the artifacts are resources for action, and the actions will be recognised by different agents according to their training and experience. I am using the notion of 'afford' in the sense introduced by Gibson (1977, 1979), as a form of perception–action coupling in which the physical appearance of an object in the world supports particular physical responses (e.g., a pebble 'affords' grasping in the hand).

#### Once recovered, evidence is shared (Baber, 2010, p. 429):

The preceding discussion implies that the search of a scene is guided by experience, expectation and the ability to recognise items of evidential value. In this respect, the notion of Distributed Cognition can be interpreted in terms of the use of objects in the world as resources-for-action. The Crime Scene Examiner recognises objects as resources-for-action which may well differ from untrained observers. For example, while the untrained observer might assume that a pane of glass in a window could yield fingermarks, they might be less inclined to immediately assume that it could also yield footwear marks, and still less inclined to recognise its potential for yielding DNA (the latter two could arise from someone climbing in through the window, or from pressing their forehead against the window to see if anyone is at home).

So far, this description looks very much like a process that involves the mental states of an individual; the CSE interprets the scene, recognising objects as resources-for-action, and then recovers the evidence. However, what makes the Crime Scene Examination process different from a Sherlock Holmes story is that the CSE submits the evidence for interpretation by other people. Indeed, it is unlikely for the CSE's notes and reports from the scene to include any deduction. Rather the report will be as descriptive as possible.<sup>5</sup> This representation, of the scene and its evidence, is passed along the recovery train. So we have a set of processes that could ostensibly represent the stimulus (or input) to a cognitive processing system. This processing is (formally) undertaken by people other than the CSE.

Prakken et al. (2003) discussed appropriate argument structures for reasoning about evidence in relation to hypothesising crime scenarios. It was a paper on using argumentation schemes for reasoning on legal evidence, mainly by way of an exploration of applying *Araucaria*, the argument visualisation system from the University of Dundee in Scotland,<sup>6</sup> to an analysis in the style of Wigmore Charts. Case-based

<sup>&</sup>lt;sup>5</sup> Baber (2010, p. 430) concedes that there may be problems with striving to be objective by only providing descriptions, in that some useful information may be missed: "One could make a strong argument that this lack of information helps an analysis to be as objective as possible, by focussing only on the item at hand (and avoiding the potential for bias that Dror et al. (2005) demonstrated). On the other hand, it might be useful to have some knowledge of the item in situ, so as to decide how best to conduct analysis. If the Forensic Scientist had recovered the item herself then such information would be recalled by her, but when it is delivered in a batch of bags then such information is not obviously available. As an example of why this could be problematic, consider a finger-mark left on a window. This mark might not be detailed enough to form a print, but could indicate whether the window has been forced up or whether someone climbed down the window, knowing the orientation of the mark on the window can help decide how best to analyse it, but this might not have been provided in the evidence log."

<sup>&</sup>lt;sup>6</sup> Araucaria is available for free at http://www.computing.dundee.ac.uk/staff/creed/araucaria

reasoning was applied by Toland and Rees (2005) to the task of recalling similar instances of volume crime, when confronted with a crime being investigated: the task was the identification of crimes with similar *modus operandi*, and the reasoning involved potential repeat offenders. Ribaux and Margot (1999) applied case-based reasoning to the categorisation of cases of burglary, with the retrieval of cases with similar profiles. The work reported about in Oatley et al. (2004) is concerned with assisting the police in detecting the perpetrators of burglary from homes, which is a high-volume crime with low detection rates; that project made use of a variety of data mining techniques, including: classification and association rules,<sup>7</sup> neural network clustering, survival analysis and Bayesian belief nets, case-based reasoning, as well as ontologies and logic programming.

A team that was initially led in Edinburgh by John Zeleznikow, in the early 2000s, worked on projects whose aim was to produce software tools assisting in the assessment of evidence in given limited, specialist domains. Jeroen Keppens and Burkhard Schafer were members of that team. Eventually, as various persons moved around to other affiliations, sequel projects emerged at different locations. The present section is concerned with one of those lines of research.

Keppens and Zeleznikow (2002, 2003) and Keppens and Schafer (2003a, 2003b, 2004) have reported about a project whose application is in post-mortem inquests, with the goal of determining whether death occurred through natural causes, homicide or suicide. In their Dead Bodies Project,<sup>8</sup> a so-called "truth maintenance system", or ATMS (a well-known AI approach to consistency)<sup>9</sup> is resorted to, in order to maintain a space of "possible worlds" which correspond to hypothetical scenarios. The architecture is shown in Fig. 8.1.1.1.

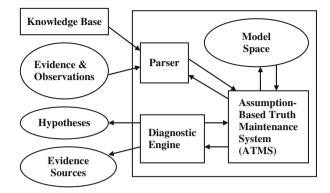
The project resorts to neither conventional expert systems, nor case-based reasoning. Any case is potentially unique. Crime investigation is very difficult to proceduralise. The design solution adopted for this project was to develop a modelbased reasoning system, i.e., such a system that given a problem instance, a model of the problem is constructed, and a problem-independent technique is applied. In the same project, dynamic preference orderings are assigned to uncertain events. Default orderings may be overruled by inferred orderings.

An article by Keppens and Schafer (2005) "characterises an important class of scenarios, containing 'alternative suspects' or 'hidden objects', which cannot be

<sup>&</sup>lt;sup>7</sup> A definition of *association rules* as a form of data mining is found in fn. 36 in Chapter 3.

<sup>&</sup>lt;sup>8</sup> Ronald Wright (2005, 2nd edn.; 2009, 3rd death) provides an overview of the *investigation of traumatic deaths*.

<sup>&</sup>lt;sup>9</sup> In Section 2.1.2 above (see in particular some historical information in fn. 1 in Chapter 1) we have already come across the approach known in artificial intelligence as *Assumption-based Truth Maintenance System (ATMS)*. An ATMS is a mechanism that enables a problem solver to make inferences under different hypothetical conditions, by maintaining the assumptions on which each piece of information and each inference depends (de Kleer, 1986, 1988). The goal of computation with an ATMS is to find minimal sets of premises sufficient for the support of each node. One has to find all minimally inconsistent subsets (NOGOODSs), and to find all maximally consistent subsets (GOODSs).



**Fig. 8.1.1.1** The early architecture of the Dead Bodies Project of Keppens and Zeleznikow (2002, 2003)

synthesised robustly using conventional abductive inference mechanisms. The work is then extended further by proposing a novel inference mechanism that enables the generation of such scenarios."

Keppens and Schafer (2006) reported about a more advanced state of the same project applying artificial intelligence to crime scenario modelling. The prototype of a decision-support system was presented, for crime scenario construction. It is component events, rather than entire scenarios, that are stored. (By *scenario*, a description of a combination of events and situations is meant.) The component events are composed into useful scenarios by an algorithm. The input is a description of the available evidence. A network of plausible scenarios is then generated. Those scenarios in turn can be analysed, with the goal of devising effective evidence collection strategies. The algorithm was allegedly highly adaptable to unanticipated cases, by allowing a major crime being investigated to be matched by component events in several different ways. One advantage hoped for was the avoidance of such pitfalls of human reasoning as *premature case theories*, or rather *premature convergence*, such that police investigators tend to focus on the more likely suspects they had identified early on.<sup>10</sup>

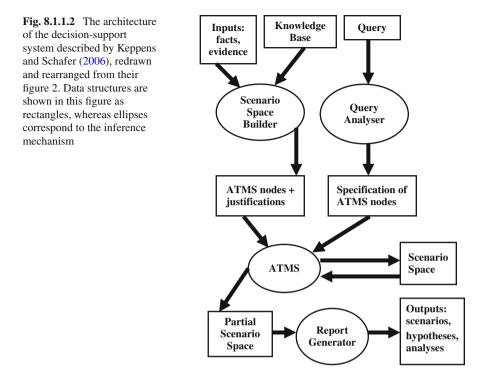
<sup>&</sup>lt;sup>10</sup> Keppens and Schafer (2006, section 2.1), citing McConville, Saunders, and Leng (1991) and Greer (1994). Once investigators think they already have the culprits, they tend to apply *confirmationism*, also known as *cognitive dissonance*, by which they privilege such information that confirm their preconceptions, and tend to disregard contrary evidence. "While the police service might pay lip service to a falsificationist model of rationality ('asking witnesses to come forward to eliminate them from the inquiry') existing reward structures make it difficult to implement this in practice. Our proposed system accounts for this by combining a 'backchaining' abductivist model of reasoning with a 'forward chaining' model that is based on the idea of indirect proof, sidestepping the issue of falsification and induction in a universe with only finitely many alternatives" (Keppens & Schafer, 2006, section 2.2). *Forward chaining* and its opposite, *backchaining*, are standard concepts from rule-based knowledge-based systems in artificial intelligence.

Therefore, that project belongs to a category of software tools known as *compo-sitional modellers*, and introduced by Falkenhainer and Forbus (1991) in their paper 'Compositional modeling: finding the right model for the job'. Compositional modelling was also discussed by Keppens and Shen (2001). In compositional modellers, small, generic and reusable rules called *model fragments* capture a domain's first principles. These are "fundamental theories describing the behaviours and mechanisms that occur in the domain of interest [...]. The compositional modelling paradigm is adapted to the crime investigation domain by employing causal rules describing how combinations of assumed states and events lead to new states and events in plausible crime scenarios" (Keppens & Schafer, 2006).

Another category in which the system described by Keppens and Schafer (2006) is *abductive diagnosers*. In abductive diagnosis (Console & Torasso, 1991), what the conditions are of a physical system under investigation are determined by comparing observations as predicted by models, to such observations that are extracted from the real world. The generation of models, in an abductive diagnoser, is done by resorting to a knowledge base of *first principles* about the given domain. First principles are general rules, independent from the decision procedure, and in this they differ from the *heuristic rules* (i.e., *rules of thumb*) found in rule-based expert systems. In the project of Keppens and Schafer (2006),

the first principles are expressed by means of causal rules describing how some states and events are triggered by other known or assumed states and events. The possible causes of a given set of available evidence are inferred by means of an abductive inference procedure. These causes form the hypothetical scenarios describing plausible crimes. Potential additional evidence that may confirm or contradict these scenarios is then deduced using the same causal rules. This abductive, first-principles based approach recognises that while the individual scenarios encountered in a major crime investigation may be virtually unique and vary widely, the underlying domain knowledge on evidence and the types of events that create it are not. It also encourages a principled hypothetico-deductive investigative methodology because it hypotheses all (known) possible causes of the available evidence, composes these causes into plausible scenarios and deduces additional evidence from the plausible scenario. This promotes consideration of many scenarios, instead of individual ones, in deciding on future investigative actions. Finally, the approach also allows making expert domain knowledge available to less experienced investigators.

The architecture of the decision-support system described by Keppens and Schafer (2006) is shown in Fig. 8.1.1.2. An *assumption-based truth maintenance system* (*ATMS*) is the central inference mechanism in this architecture. A *scenario space* is maintained by means of the ATMS. "All" possible scenarios that explain the available evidence are stored in the scenario space. The scenarios are represented as logic predicates; these predicates denote events and states, or causal relations between events and states. Causal relations between assumptions, states, and events are represented as *scenario fragments*, each of these being a tuple comprising a set of variables, a set of relations called *preconditions*. There also is a representation of inconsistencies, e.g., "a person can not kill himself both with such an intention (i.e. in a suicide) and without this intention (i.e. in an accidental self-killing)"



(Keppens & Schafer, 2006, section 4.4). The knowledge base comprises property definitions, a set of scenario fragments, and a set of inconsistencies. "*Property definitions* describe which types of predicate correspond to a symptom, fact, hypothesis or investigative action" (ibid., section 4.5). An example of scenario fragment is this one (Keppens & Schafer, 2006, section 4.3):

if a person P suffers from ailment or injury C, C is the cause of death of P, and there is a medical examiner E, and assuming that E determines the cause of death of P and makes the correct diagnosis, then there will be a piece of evidence in the form of a cause of death report indicating that according to E, the cause of death of P is C.

Keppens and Schafer explained (2006, section 3.2):

Once constructed, the scenario space is analysed through a series of *queries*. Queries are questions about the scenario space. Their answers are computed by extracting relevant parts from the scenario space and reported back in an understandable format. To interface between the human and scenario space, a *query analyser* translates standard types of user queries into a specification of ATMS nodes of interest, and a *report generator* provides the means to represent a partial scenario space back to the user.

What the scenario space is made to initially contain, is based on the initial set of given *facts* and *evidence*, and is constructed by means of a *knowledge base*.

For example, these five pieces of evidence appear in an example from Keppens and Schafer (2006):  $n_1$ : "A hanging corpse of a person identified as johndoe has

been found";  $n_{11}$ : "A report by a psychologist identified as frasier ( $n_{15}$ ) stating that johndoe may have been suicidal prior to his death";  $n_{14}$ : "The observation of suicide trial marks on the body of johndoe";  $n_{16}$ : "The body of johndoe exhibits signs of petechiae" (i.e., small red to purple spots on the eyes or skin, caused by either disease or asphyxiation);  $n_{20}$ : "A report by a medical examiner identified as quincy ( $n_7$ ) stating that the cause of death of johndoe was asphyxiation".

One possible scenario based on this evidence is suicide by hanging. For example, "The hanging corpse  $(n_1)$  and the summed cause of death  $(n_{20})$  are the consequents of johndoe's hanging  $(n_5)$ , which he was unable (unwilling) to end  $(n_4)$ . The petechiae is caused by asphysiation  $(n_{15})$  resulting from the hanging. johndoe's suicide by hanging requires that johndoe is suicidal  $(n_7)$  and the last two pieces of evidence are a consequence of his suicidal state" (Keppens & Schafer, 2006, section 4.1).

Each scenario was represented as a *causal hypergraph*. A hypergraph is a generalisation of a graph, such that an edge may appear not just between two nodes, but between a set of nodes including two or more nodes. But scenarios were represented as directed acyclic hypergraph, whose nodes are events or states, whereas the edges are directed hyperarcs, each one from a set of at least one event or state, towards one and only one event or state. The scenario of suicide by hanging was shown in Keppens and Schafer (2006, figure 3), but we find it more convenient to translate here that hypergraph into a ruleset and a list of propositions. The ruleset is shown here in Table 8.1.1.1 (where  $\land$  stands for *and*); each rule corresponds to one of the hyperarcs of the causal hypergraph of the scenario of suicide by hanging. The correspondence between node identifiers and particular propositions is listed in Table 8.1.1.2. In Table 8.1.1.1, each row stands for a directed hyperarc of the causal hypergraph, and here in the order we chose to reflect the arrangement in Keppens and Schafer's (2006) original diagram of their figure 3, from top to bottom. The meaning of the nodes is defined in Table 8.1.1.2.

Keppens and Schafer (2006, section 4.2) classify information by distinguishing *facts* ("pieces of inexplicable, certain information") from *evidence* ("information that is certain and explicable"), by distinguishing three kinds of "uncertain and

n <sub>1</sub>	$\leftarrow$	$n_4 \wedge n_5$
n <sub>16</sub>	$\leftarrow$	n <sub>15</sub>
n <sub>20</sub>	$\leftarrow$	$n_{15} \wedge n_{17} \wedge n_3 \wedge n_{18} \wedge n_{19}$
n <sub>15</sub>	$\leftarrow$	n <sub>5</sub>
n <sub>17</sub>	$\leftarrow$	$n_4 \wedge n_5$
n <sub>4</sub>	$\leftarrow$	n <sub>6</sub>
n <sub>5</sub>	$\leftarrow$	n <sub>6</sub>
n <sub>21</sub>	$\leftarrow$	n <sub>6</sub>
n <sub>15</sub>	$\leftarrow$	$n_2 \wedge n_{10} \wedge n_9 \wedge n_7$
n <sub>6</sub>	$\leftarrow$	$n_7 \wedge n_8$
n <sub>14</sub>	$\leftarrow$	$n_7 \wedge n_3 \wedge n_{13} \wedge n_{12}$

Table 8.1.1.1The hyperarcs
of the scenario of suicide by
hanging (from figure 3 in
Keppens & Schafer, 2006)

Table 8.1.1.2         Which event or state the nodes stand f	or
--	----

$n_1$ :	observe(hanging-dead-body(johndoe))
$n_2$ :	psychologist(frasier)
<i>n</i> <sub>3</sub> :	medical-examiner(quincy)
$n_4$ :	<pre>impossible(end(hanging(johndoe)))</pre>
$n_5$ :	hanging(johndoe)
<i>n</i> <sub>6</sub> :	suicide(johndoe, hanging)
n7:	suicidal(johndoe)
n <sub>8</sub> :	suicide-action(hanging, johndoe)
<i>n</i> 9:	<pre>psychological-examination(frasier, state-of-mind(johndoe))</pre>
$n_{10}$ :	correct-diagnosis(frasier, state-of-mind(johndoe))
$n_{11}$ :	psychological-evaluation(frasier,state-of-mind(johndoe),suicidal)
$n_{12}$ :	<pre>medical-examination(quincy, body(johndoe))</pre>
$n_{13}$ :	correct-diagnosis(quincy, body(johndoe))
$n_{14}$ :	<pre>medical-report(quincy, body(johndoe), suicide-trial-marks)</pre>
$n_{15}$ :	suffers(johndoe, asphyxiation)
$n_{16}$ :	observe(eyes(johndoe), petechiae)
$n_{17}$ :	cause-of-death(johndoe, asphyxiation)
$n_{18}$ :	correct-diagnosis(quincy, cause-of-death(johndoe))
$n_{19}:$	<pre>medical-examination(quincy, cause-of-death(johndoe))</pre>
$n_{20}$ :	<pre>medical-report(quincy, cause-of-death(johndoe),asphyxiation)</pre>
$n_{21}$ :	suicidal-death(johndoe)

explicable" information (*uncertain states*,<sup>11</sup> *uncertain events*,<sup>12</sup> and *hypotheses*<sup>13</sup>), and by distinguishing three types of *assumptions*, i.e., of "uncertain and inexplicable information":

- *Default assumptions* describe information that is normally presumed to be true. In theory, the number of plausible scenarios that explain a set of available evidence is virtually infinite, but many of these scenarios are based on very unlikely presumptions. Default assumptions aid in the differentiation between such scenarios by expressing the most likely features of events and states in a scenario. A typical example of a default assumption is the presumption that a doctor's diagnosis of the cause of death of person is correct (e.g. *n*<sub>18</sub>).
- *Conjectures* are the unknown causes of certain feasible scenarios (e.g. *n*<sub>7</sub>). Unlike default assumptions, conjectures are not employed to differentiate between the relative likelihood of scenarios.
- Uncommitted *investigative actions*, i.e. possible but not yet performed activities aimed at collecting additional evidence, are also treated as assumptions. At any given stage in the investigation, it is *uncertain* which of the remaining uncommitted investigative actions will be performed. The reasoning required to perform such an action involves looking at its consequences instead of its causes, and therefore they are *not* (causally) *explicable*. As such, investigative actions assume a similar role as default assumptions and conjectures: i.e. they are employed to speculate about the plausible (observable) consequences of a hypothetical scenario.

<sup>&</sup>lt;sup>11</sup> An example of *uncertain state* is node  $n_4$ , "johndoe was unable to end his hanging".

<sup>&</sup>lt;sup>12</sup> An example of *uncertain event* is node  $n_{15}$ , "johndoe asphyxiated".

<sup>&</sup>lt;sup>13</sup> An example of *hypothesis* is node  $n_{21}$ , "johndoe's death was suicidal".

## 8.1.2 The Structure of ATMS Inference in the Scenario Space Builder

The scenario-space builder instantiates scenario fragments as well as inconsistencies, into an ATMS. In the *initialisation phase*, an ATMS is generated that contains one node per piece of available evidence. Next, a *backward chaining phase* is executed. All plausible *causes* of the available evidence are added to the ATMS. A process is repeated, until exhausting all possible unifications<sup>14</sup> of individual consequents of a scenario fragment with a node already in the ATMS. That process does the following for each possible unification: it instantiates the antecedents and assumptions of that scenario fragment; the process adds a node to the ATMS for antecedent instance that does not already have a node; it adds an assumption node to the ATMS for each assumption instance that does not already have a node; and the process adds to the ATMS a *justification* (i.e. a rule like the rows in Table 8.1.1.1, but also added nodes such as assumption nodes can be included) "from the nodes corresponding to the antecedent and the assumption nodes corresponding to the assumptions, to the node corresponding to the consequent" (Keppens & Shafer, 2006, section 5.2.1).

Once the backward chaining phase is exhausted because action as described was taken for each possible unifications, execution enters the *forward chaining phase*.

 $\begin{array}{l} \forall X(man(X) \Rightarrow mortal\,(X)).\\ man(socrates).\\ man(socrates) \Rightarrow mortal(socrates). \end{array}$ 

respectively stand for "All men are mortal", "Socrates is a man", and "Socrates is a man, therefore Socrates is mortal". Unification is an algorithm that an automated problem solver can use in order to determine that socrates may be substituted for X. For it to apply inference rules, "an inference system must be able to determine when two expressions are the same or *match*. In propositional calculus, this is trivial: two expressions match if an only if they are syntactically identical. In predicate calculus, the process of matching two sentences is complicated by the existence of variables in the expressions. Universal instantiation allows universally quantified variables [that is: for all X] to be replaced by terms from the domain. This requires a decision process for determining the variable substitutions under which two or more expressions can be made identical (usually for the purpose of applying inference rules). Unification is an algorithm for determining the substitutions needed to make two predicate calculus expressions match" (Luger & Stubblefield, 1998, section 2.3.2., p. 68). "Generally, a problem-solving process will require multiple inferences and, consequently, multiple successive unifications. Logic problem solvers must maintain consistency of variable substitutions. It is important that any unifying substitution be made consistently across all occurrences of the variable in both expressions being matched" (ibid., p. 69). "Once a variable has been bound, future unifications and inferences must take the value of this binding into account. If a variable is bound to a constant, that variable may not be given a new binding in a future unification. If a variable  $X_1$  is substituted for another variable  $X_2$  and at a later time  $X_1$  is replaced with a constant, then X<sub>2</sub> must also reflect this binding" (ibid.). Unification substitutions are combined and returned thanks to the composition of unification substitutions.

<sup>&</sup>lt;sup>14</sup> Take for example the syllogism "All men are mortal, and Socrates is a man; therefore Socrates is mortal". In predicate calculus, the three expressions

What this phase does, is adding to the ATMS all possible *consequences* of the plausible scenarios. Whereas the *backward chaining* phase repeated its process until exhausting all possible unifications of individual *consequents* of a scenario fragment with a node already in the ATMS, by contrast the *forward chaining* phase carries out the following process for each possible unification of the set of *antecedents* of a scenario fragment with a set of nodes already in the ATMS. That process instantiates the assumptions and consequents of that scenario fragment; the process adds an assumption node to the ATMS for each assumption instance that does not already have a node; the process adds to the ATMS a node for each consequent instance that does not already have a node; and the process adds to the ATMS a justification for each consequent instance, "from the nodes corresponding to the antecedent and the assumption nodes corresponding to the assumptions, to the node corresponding to the consequent instance" (Keppens & Shafer, 2006, section 5.2.1).<sup>15</sup>

The forward chaining process is repeated until exhausting all unifications of scenario fragment antecedents with sets of nodes in the ATMS. And finally, the *consistency phase* is carried out: "inconsistent combination of states and events are denoted as nogoods. This involves instantiating the inconsistencies from the knowledge base based on information in the ATMS and marking them as justifications for the nogood node." (ibid.). In the terminology of ATMS, a *nogood* is such a justification that has lead to an inconsistency, that is to say, from its node there is an arc  $\rightarrow \perp$  and this implies that one of the propositions conjoined by *and* in the nogood must be false. With an ATMS, one has to find all minimally inconsistent subsets (NOGOODSs), and to find all maximally consistent subsets (GOODSs).

Keppens and Schafer (2004, section 3) pointed out similarities between what the ATMS does in their Dead Bodies project, and what a defence solicitor would do:

In developing alternative scenarios consistent with the evidence, the ATMS performs some of the scrutiny a good defence solicitor would subject the prosecution case to. A defence solicitor has broadly speaking two strategies available to him. First, he can question the factual correctness or the legal admissibility of evidence presented by the prosecution. Second, he can accept the evidence at face value and argue that alternative explanations for their presence are possible that do not incriminate his client. We are concerned here primarily with this second strategy. However, it is here that we encounter a certain ambiguity, an ambiguity explicitly recognised by the Scots law of evidence. The defence has in fact again two strategies available to it. The first can be dubbed the "Perry Mason Stratagem". Like the fictitious advocate, the defence can pursue its own investigation and "point to the real culprit". In Scots law, this is known as the special defence of incrimination [Field & Raitt, 1996], recently used (unsuccessfully) in the Lockerbie trial

for an atrocity ascribed to an act of terror: an PanAm passenger aircraft exploded while flying over Scotland in 1988 because of a bomb on board.

<sup>&</sup>lt;sup>15</sup> In the section 5.2.2 in their article, Keppens and Shafer (2006) supplied the formal algorithm for generating the scenario space.

This strategy has a number of psychological and legal advantages. The same reason that makes it the solution of choice for crime writers also works well with juries: no loose ends are left and the crime is avenged. Procedurally, it allows the defence to submit also other pieces of evidence. This corresponds to the "forward chaining" aspect of our ATMS: The party named by the defence will have interacted causally with the crime scene. This will have created evidence which can strengthen the defence case. This allows introduction of additional "suspect specific" evidence (such as alibi) evidence about other people, which otherwise might be ruled out as irrelevant. The defence of course need not prove the guilt of the other party; it only needs to establish it as a plausible alternative. [...]

## 8.1.3 An Extension with Bayesian Networks, Entropy, and Returned Evidence Collection Strategies

Keppens, Shen, and Lee (2005a) described an extension of the scenario space generation, resorting to Bayesian modelling: "this paper shows a compositional modelling approach to synthesise and efficiently store a space of plausible scenarios within a Bayesian Network (BN) [...]. Furthermore, it presents an application of the maximum entropy reduction technique to determine which investigative actions are most likely to reduce doubt" (ibid., section 1). In this extension of the work already described earlier in the present Section 8.1, scenario fragments also incorporate a set of probability distributions, one for each combination of the antecedent and assumption variables.

Thus, the following scenario states that if a victim V has petechiae on his eyes and the investigators examine V's eyes, then evidence of petechiae is discovered with a certain probability:

```
if {petechiae(eyes(V))}
assuming {examination(eyes(V))}
then {evidence(petechiae(V))}
distribution evidence(petechiae(V)) {
true, true -> true:0.99, false:0.01}
```

Keppens et al. (2005a, section 2.1) explained that, by adopting the notation shown in Table 8.1.3.1, the general representation for a scenario fragment, incorporating probability distributions, is as follows:

$\{p_1,, p_k\}$	the set of antecedent predicates
$\{p_1, \ldots, p_m\}$	the set of assumption predicates
$p_{n}$	the consequent predicate
$v_{i}$	any of the values that variable $\mathtt{p}_{\mathtt{i}}  \mathtt{can}  \mathtt{take}$
$q_{j}$	a real value in the range [0,1]

 Table 8.1.3.1
 A notation for the predicates and values involved

```
\begin{array}{c} \text{if } \{p_1, \dots, p_k\} \\ \text{assuming } \{p_l, \dots, p_m\} \\ \text{then } \{p_n\} \\ \text{distribution } p_n \ \{ \\ & \vdots \\ v_1, \dots, v_k, v_l, \dots, v_m \text{->} v_{n1} : q_1, \dots, v_{nj_n} : q_{j_n} \\ & \vdots \\ & & \vdots \\ \end{array}
```

By contrast, the general representation of an inconsistency is as a special kind of scenario fragment, as follows:

if 
$$\{p_1,\ldots,p_k\}$$
  
then  $\{nogood\}$   
distribution nogood  $\{v_1,\ldots,v_k ext{->}\top:1,\ldots,\bot:0\}$ 

where T stands for the value *true*, and the reversed T stands for the value *false*. Moreover, in the knowledge base there also are prior distributions for assumed states and events. In order to enable the compositional modelling of Bayesian networks, presumptions concerning the scenario fragments include the presumption that the causal hypergraph is acyclic ("There are no cycles in the knowledge base": Bayesian networks are inherently acyclic), and the presumption that "*Any two probability distributions taken from two scenario fragments involving the same consequent variable are independent*. Intuitively, this assumption indicates that the outcome of an influence implied by one scenario fragment is not affected by that of another" (ibid.).

*Entropy* was adopted as a measurement of doubt, this being a concept from information theory. It is also adopted in machine learning (Mitchell, 1997) and in model-based diagnosis (Hamscher, Console, & de Kleer, 1992). Keppens et al. (2005a, section 3.2) explained that the entropy over an exhaustive set of mutually exclusive hypotheses

$$H = \{h_1, ..., h_m\}$$

is given by:

$$\epsilon(H) = -\sum_{h \in H} P(h) \log P(h)$$

By resorting to conventional techniques from Bayesian networks, it is possible to compute the values P(h). As in crime investigation, additional information is

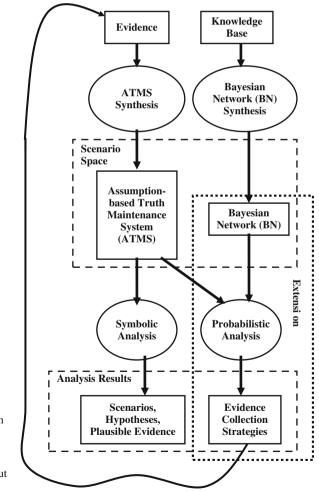
generated through evidence collection, Keppens et al. (ibid.) proposed that given e set of pieces of evidence

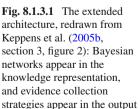
$$E = \{e_1 : v_1, \ldots, e_n : v_n\},\$$

"the entropy metric of interest for the purpose of generating evidence collection strategies is the entropy over a set of hypotheses H", as per the formula:

$$\epsilon(H \mid E) = -\sum_{h \in H} P(h \mid E) \log P(h \mid E)$$

Conventional Bayesian network techniques allows computing the conditional probability values P(h | E). Keppens et al. (ibid.) also proposed that selecting investigative





actions from a given set *A* according to the following criterion is a useful evidence collection strategy:

$$\min_{a \in A} E(\epsilon(H \mid E), a)$$

They discussed minimal entropy-based evidence (EPE) collection in their section 3.3. They conceded however (Keppens et al., 2005a, in their section 3.4) that whereas that "technique guarantees to return an effective investigative action, it does not ensure globally optimal evidence collection". They proposed a remedy, in order to reduce the "likelihood of obtaining poor quality locally optimal evidence collection strategies". This is done by only "considering the EPEs after performing a sequence of actions", although this incurs computation overheads. They then proposed a simplified equation for that remedy. Next, they turned to discussing how to allow multiple evidence sets, or multiple hypothesis sets instead of just one.

In Fig. 8.1.3.1, we redraw from Keppens, Shen, and Schafer (2005b, section 3, figure 2) the architecture of their system, as extended with Bayesian networks in the knowledge representation, and with evidence collection strategies in the output.

#### 8.1.4 Further Research

#### Jeroen Keppens

As argued by Schum (1994), a key aspect of evidential reasoning concerns the development of hypotheses. Indeed, as demonstrated by Aitken and Taroni (2004), probabilistic approaches to evidential reasoning tend to favour the statistics paradigm of hypothesis testing. This idea is not only useful when assessing evidence in court, it has been embraced by a part of the forensic science community, such as Cook, Evett, Jackson, Jones, and Lambert (1998), as a means to assess the probative force of evidence during the investigation of a (alleged) crime. But while hypotheses are readily available for testing once a case reaches court, the formulation of hypotheses during the investigative stage is not straightforward.

As argued by Keppens and Zeleznikow (2003), this requires what Peirce (1903) termed abduction or abductive reasoning. Keppens and Schafer (2006) have developed an abductive reasoning approach to produce the hypotheses required for evidential reasoning during a crime investigation. Being a knowledge based approach, it employs a knowledge base and a corresponding inference mechanism. The knowledge base consists primarily of generalised and reusable fragments of plausible scenario, such as one predicting the medical symptoms generated by a blow to the head and another indicating those resulting hitting one's head against the ground in a fall. Generally speaking, these scenario fragments express cause-effect relationships. The inference mechanism instantiates these scenario fragments to specific circumstances and combines them to compose plausible scenarios, which can then be analysed further.

The overall approach is inspired by earlier work on compositional modelling by Keppens and Shen (2004), an family of methods designed to generate formal models of real-world or hypothetical scenarios. Compositional modelling works on the idea that while the specific combination of circumstances contained within an individual scenario are relatively rare, and therefore difficult to generalise, the constituent elements appear rather more frequently. For example, while the circumstances of the murder of one of the victims of the serial killer Dr Harold Shipman might be relatively rare, the component elements such as injection with an overdose of diamorphine and the resulting evidence reoccur more frequently. Therefore, the use of compositional modelling helps to tackle, to some extent, significant knowledge acquisition problem involved with a system of this kind.

More recent developments in this strand of research have sought to further address the knowledge acquisition bottleneck and to allow more useful modes of inquire with the resulting scenario models. One extension concerns the modelling problem that arises when there are an unknown number of plausible instantiations. For example, an unknown number of unknown persons can be involved in a plausible crime scenario, such as the person a fingerprint belongs, the person who has been seen fleeing the scene of the alleged crime and the suspicious person observed in CCTV footage near the scene prior to the alleged crime. During the investigation it is not known whether this concerns three distinct individuals, two individuals (with two pieces of evidence referring to the same person) or just a single individual (to whom all evidence relates). Keppens and Shafer (2004, 2005) have proposed a *peg-unification* technique that involves representing all unknown instantiations as so-called pegs and employs an algorithm to explore all possible assumptions of equivalences between pegs simultaneously.<sup>16</sup>

As to pegs (Keppens & Schafer, 2003b, section 4.1):

The objective of this work is to identify possible references to the same unknown or partially specified entities in the scenario space. In order to correctly distinguish such entities, the notion of *pegs* is adopted from the literature on coreference resolution [(Karttunen,

<sup>&</sup>lt;sup>16</sup> *Peg unification* is useful for *coreference resolution*. Keppens and Schafer explained (2003b, section 4):

The task of identifying different references to the same entity is known as *coreference resolution* in computational linguistics. In the analysis of a discourse, it is important that references to the same entity are correctly associated with one another because each of the expressions that contains one of these references may add some information about the entity in question. For example, in the sentence "Every farmer who owns *a donkey*, beats *it*." "a donkey" and "it" refer to the same entity. The first half of the sentence conveys that the entities of interest are all donkeys owned by farmers. The second half of the sentence communicates that the entities of interest are beaten. Thus, the sentence as a whole imparts the knowledge that all donkeys owned by farmers are beaten.

A wide range of techniques has been devised to perform coreference resolution tasks, such as the one illustrated in the example. The vast majority of these techniques specialise in examining texts for discourse analysis or information extraction. An important property of the existing approaches is that they tend to consider only a single possible solution at any one time, while the present problem domain requires a method that can represent and reason with multiple possible worlds simultaneously.

Another extension of the work has augmented the original purely symbolic representation of scenarios with probabilities. More specifically, Keppens, Shen, and Price (2010) have devised a method to compose conventional conditional probability distributions from partial specifications thereof and incorporated the partial ones into the scenario fragments. This allows the original abductive reasoning approach

if {scene(S)} assuming {person (P), took (P, G)}
then {¬evidence (recover (G, S))}

given the piece of evidence:  $\neg$ evidence(recover(handgun, home(victim))}. The required substitution {*G*/handgun, *S*/home(victim)} does not provide an instance for *P*. Here, *P* refers to an unknown entity and it is therefore substituted by a peg, say, \_0. Therefore, the assumptions person(\_0) and took(\_0, handgun) are added to the scenario space. Similarly, pegs may also be introduced during the modus ponens phase of the scenario generation algorithm (i.e. step 3). In this case pegs are introduced when a rule whose consequent predicates contain variables that do not occur in the antecedent or assumption sentences, is applied.

Keppens and Schafer (2003b, section 4.2) explained peg unification as follows:

Because a peg refers to an unknown entity, it can be treated as a constant that uniquely identifies that entity, or it can be unified with a ground term, including another peg or terms containing other pegs. In the latter case, the unification is possible if it is hypothesised that the entity represented by the peg and the entity represented by the term unified to the peg are the same one. This hypothesis must therefore be made explicit by means of an assumption whenever an inference is made that depends on the unification of a peg and a ground term. In the remainder of this paper, such assumptions are referred to as *peg unification assumptions*.

In this paper, each peg unification assumption takes the form  $bind(\_n, t)$ , where  $\_n\psi$  is a peg and t is a ground term (which may include a peg). A peg unification assumption  $bind(\_n, \psi t)$  is added to the scenario space for each pair of predicates that can be matched using a substitution that contains a mapping of the form  $\_n/t$ .

The binding relation implied by these assumptions is transitive. Therefore, peg unification can not only be assumed, but also be entailed by other peg unification assumptions. This knowledge is represented explicitly in the scenario space: for each pair of peg unification assumptions

bind  $(\_i, t_1 (..., \_j, ...))$  and bind  $(\_j, t_2 (..., \_k, ...))$ ,

the following new justification is added to the emerging scenario space:

bind 
$$(\_i, t1 (\ldots, \_j, \ldots)) \land bind (\_j, t2 (\ldots, \_k, \ldots))$$
  
 $\rightarrow bind (\_i, t_1 (\ldots, t_2 (\ldots, \_k, \ldots), \ldots))$ 

<sup>1976;</sup> Landman, 1986)]. Pegs refer to a specific entity whose exact identity remains unknown (or partially specified). In this paper, each peg is identified by an expression of the form \_n, where n is a non-negative natural number. At the start of the scenario space generation algorithm n = 0, and n is incremented by 1 after each generation of a new peg. As such, each new peg is identified uniquely.

New pegs may be introduced into the scenario space during the instantiation of causal rules of the form if  $\{A_n\}$  assuming  $\{A_s\}$  then  $\{c\}$ , where An is a set of antecedent predicates,  $A_s$  is a set of assumption predicates and c is a consequent predicate. Whenever a rule, whose antecedent or assumption predicates contain variables that do not occur in the consequent sentence, is applied during the inverse modus ponens phase of the scenario space generation algorithm (i.e. step 2), then those variables are instantiated by pegs. Consider, for instance, applying inverse modus ponens on rule

to be used to produce Bayesian networks describing sets of plausible scenarios. Such a Bayesian network can, in turn, be employed to assess the usefulness of investigative actions based on the informativeness of the evidence they might produce. This extension also enables the knowledge engineer to express his/her lack of certainty regarding cause-effect relationships expressed by the scenario fragments.

However, the integration of probabilities with the approach potentially introduces a further knowledge acquisition challenge: the elicitation of suitable probabilities. Keppens (2007, 2009) has sought address this concern by employing qualitative and semi-quantitative abstractions of conditional probability tables. Fu, Boongoen, and Shen (2010) have independently developed another approach based on a similar idea, exploiting fuzzy sets<sup>17</sup> as a means of qualitative abstraction instead.

## 8.2 Processing Human Faces: A Panoply of Contexts

## 8.2.1 Computer Tools for Face Processing: Preliminary Considerations

Mike Redmayne of the London School of Economics in London, writing (Redmayne, 2002) in *The Modern Law Review*, describes a problematic case of face recognition on the part of a forensic expert: "Stephen Hookway was convicted of the robbery of a bank in Salford." (Salford is in the Greater Manchester area.) The following is quoted from Redmayne (ibid., pp. 23–24):

The only evidence against him was the testimony of a "facial mapping" expert. The expert carried out a detailed examination of photographs of Hookway, and compared them to photographs of the robbery. He found a number of similarities between them. His findings were, he said, "very powerful support for the assertion that the offender was the appellant". He could not, however, say for sure that Hookway was the robber. "He conceded that, if a trawl were made through Manchester, it may be possible to find one or two people of similar appearance". The Court of Appeal acknowledged that, in the absence of a database, "it is impossible to know how many others may look the same as a particular accused". As in *Smith* [a case in which recognition depended on DNA evidence], relatives complicated the case: the defendant's brother was produced in court, at which the expert admitted that "he could not exclude the possibility that there was somebody else who closely resembled the

Scenario space generation first *unifies* the relevant sentences (i.e. the consequent of the causal rule during inverse modus ponens, the antecedents of the causal rule during modus ponens, or the inconsistent sentences of the constraint) with nodes in the emerging scenario space, and return the substitution  $\sigma$  required to achieve the unification. Next, scenario space generation *records* each binding that unifies a peg with a term in the scenario space and a newly created set  $A_p$ . Then, the process *instantiates* the remaining sentences (i.e. the antecedents and assumptions during inverse modus ponens or the assumptions and consequent during modus ponens) by applying the substitution  $\sigma$  and the process adds those that do not already exist in the scenario space as new nodes. And finally, scenario space generation *generates* a justification if applying a causal rule, or a nogood if applying a constraint.

<sup>&</sup>lt;sup>17</sup> Fuzzy approaches are the subject of Section 6.1.15 in this book.

defendant". A similar point about the parity of evidence against Hookway and his brother can be made. Despite all this, the Court of Appeal refused to quash the conviction.

# Victor S. Johnston and Craig Caldwell, of the Department of Psychology of New Mexico State University, Las Cruces, pointed out (Johnston & Caldwell, 1997):

Humans are experts in facial recognition. They can recognize and discriminate between a very large number of faces seen over a lifetime, often following a single short exposure.<sup>18</sup> In contrast, humans have poor recall ability; they may not be able to recall the features of a close associate, or even a family member, in sufficient detail to construct a facial composite (Ellis, Davies, and Shepherd, 1986; Goldstein and Chance, 1981; Rakover and Cahlon, 1989). As a consequence, current facial composite procedures, which depend heavily on recall rather than recognition, may not be using the best approach for generating an accurate composite of a target face.

"Face processing touches upon a variety of contexts, and is investigated in different disciplines (Young & Ellis, 1989). Rakover and Cahlon (2001) is on face recognition in cognition and computation, and, while offering an overview of theories and models, it proceeds to present an original approach (the Schema Theory and the Catch Model) with criminological applications. It proposes a cognitive law of Face Recognition by Similarity (FRBS). Davies, Ellis, and Shepherd (1981), *Perceiving and Remembering Faces*, introduces issues in face recognition and its associated mental processes. Raymond Bruyer's edited volume (1986) provided an overview of the neuropsychology of face perception.

A forensic context is only one of the many facets of face recognition. The neuropsychology of face perception and face recognition is treated in Ellis et al. (1986). To psychologists, face recognition is a major challenge for human cognition. Apart from varying facial expressions, let alone disguises, even the views of a face when a head is rotated by different angles do not lend themselves to straightforward recognition on the part of humans exposed to such sights from real life, or by watching a video clip, or at a glance from photographs shot on the fly.

To human cognition, the challenge of recognising a given person in a photograph is not the same as recognising the face of a person who is standing in front of the cognitive agent. Face processing belongs in cognitive science as well as, in a different perspective, in computer science. Techniques from automated image recognition are involved in automated recognition or identity validation systems for security or other identification purposes (Nissan, 2003b, pp. 360–361).

### 8.2.2 Face Recognition Tools for Identification

#### 8.2.2.1 Facial Recognition Classification, from a Database of Mug Shots

Face recognition is a major area within image processing, in computer science. To say it with Mena (2003, p. 167):

<sup>&</sup>lt;sup>18</sup> There are studies in the psychology of eyewitness testimony that researched the effects of exposure duration on eyewitness accuracy and confidence (e.g., Memon, Hope, & Bull, 2003).

Facial recognition software works by measuring a face according to its peaks and valleys – such as the tip of the nose, the depth of the eye sockets – which are known as *nodal points*. A human face has 80 nodal points; however, facial recognition software may require only 14 to 22 to make a match, concentrating on the inner region of the face, which runs from temple to temple and just over the lip, called the "golden triangle". This is the most stable area because if an individual grows a beard, puts on glasses, gains weight or ages, this region tenjds not to be affected. The relative positions of these points are converted into a long string of numbers, known as a face print.

Databases of photographic images of suspects or convicted perpetrators are available to the police. Such photographs are usually *mug shots:* the face of the person is shown frontally. Suppose the police have a facial photograph of a suspect they are searching for. They want to identify that suspect, among the individuals whose mug shots are in the database.

For such a task of classification, the facial recognition tool of Attrasoft is useful (Mena, 2003, section 6.7, pp. 165–167). The firm, Attrasoft,<sup>19</sup> applies neural networks to tasks in facial recognition and, more generally, image processing. "Its facial recognition product is highly accurate, versatile, and capable of searching millions of images, easily handling over a terabyte of data" (ibid., p. 196).

The technique resorts to neural networks with supervised learning (i.e., the network is trained to recognised a predefined correct output). The tool is first *trained* to recognise the face of the suspect whose photograph is the input. This step is carried out by unsing the ImageFinder interface. The window of ImageFinder shows the Image, a toolbar (whose keys include: Train, Search, Classify, Batch, Example, Biometrics, and help), and an array of keys for various functions (for image processing, or for training or retraining, or for saving, sorting, classifying, undoing, and so forth).

In an example given by Mena (ibid., section 6.7), the given photograph is matched to a photograph of (apparently) the same man, smiling and wearing a hat. It also retrieved a photograph of the same man with a beard. What the user did, was to click on the *Train* button and wait a little bit until the message "Training End!" appears. Mena explains (ibid., p. 166):

The user can modify the setting parameters, like blurring, sensitivity, external weight cut, image type, segment size, etc. Once training is complete, the system can be directed to go out and look for images that match the training sample, with the output having an integer, representing a similarity value. The higher the score between the training image(s) and the retrieved images, the better the match.

Another kind of situation is when the person is physically present, and a decision needs to be taken as to whether to let that individual in. In the United States, facial recognition systems are used by casinos, but it is potentially valuable for other kinds of situations when prescreening is necessary or advisable.

Similarity search for images can be specialised for human faces, which is the case of face recognition software. Bear in mind however that there is thriving research

<sup>&</sup>lt;sup>19</sup> http://attrasoft.com

into general image similarity search. For example (*ERCIM News*, October 2010, p. 11), Andrea Esuli from ISTI-CNR in Pisa has been researching

highly efficient similarity search, for which he has developed a novel algorithms based on prefix-permutation indexing. [... He] has turned this algorithm into a working search engine for images (http://mipai.esuli.it) that currently allows image similarity search on CoPhIR, the largest image dataset availbale for research purposes. Esuli's algorithm allows similarity searches to be conducted on CoPhIR in sub-second response times, a feat currently neither attained nor approached by competing systems.

In fact, MiPai is based on the PP-Index data structure for approximated similarity search (Esuli, 2009a, 2009b, 2010; Bolettieri et al., 2009). In the demo provided at Esuli's website, one can perform similarity search on the about 106 million images currently available in the CoPhIR collection.<sup>20</sup> Esuli explains<sup>21</sup>:

The similarity measure used in this demo is based on a linear combination of the five MPEG-7 visual descriptors provided by the CoPhIR collection. The resulting concept of similarity is rather general, which is in line with the generalized nature of the images in the collection.

This means that this may be considered a "general purpose" search system, where one may retrieve images globally similar to the one given as the query, for many aspects: color palette, distribution of colors in the image, presence of similar edges or textures.

This does not means that this is an "all purpose" search system, i.e. you can't change the general similarity criterium with a more specific/specialized one. For example, you can't find shots of your cat climbing a wall given a shot of him sleeping on the sofa. You'll likely find shots of cats/dogs/teddy bears similar to your cat placed on a sofa similar to your sofa.

Efficiency comes at a cost, and a trade-off is made with accuracy<sup>22</sup>:

One thing to be noted is that MiPai is an approximated method, thus the efficiency is paid with accuracy, i.e., the 100 selected images may not identify the exact (with respect to the MPEG–7 similarity measures) 100 most similar images. The MiPai algorithm offers multiple possibilities, both at index and search time, to trade efficiency for accuracy of results.

## 8.2.2.2 Reconstructing a Face from Verbal Descriptions: Mug Shots, vs. Sketches and Composites

Let us consider to faces in forensics in particular. Facial portraits, or *mugs*, may just be a photograph (a *mug* shot) of a suspect or convict; otherwise, if the portrait was made based on the verbal description of a victim or eyewitness, it used to be drawn by a sketch artist manually (such a portrait is sometimes called an *Identi-kit*). See Laughery and Fowler (1980) on the sketch artist and Identi-kit procedures for recalling faces, in a psychological perspective. An early example of a sketch produced manually in order to identify a perpetrator is from the Renaissance: a man and his child (who was to become a famous painter) were robbed, and on reaching

<sup>&</sup>lt;sup>20</sup> http://cophir.isti.cnr.it/

<sup>&</sup>lt;sup>21</sup> http://mipai.esuli.it

<sup>&</sup>lt;sup>22</sup> http://mipai.esuli.it

the town of Bologna, the boy skilfully drew a sketch, based on which the authorities promptly identified the robbers.

An alternative to the sketch of a sketch artist is a *composite*, by which initially a photographic *photofit* was intended. The term *photofit* is still in use in the U.S., whereas in the U.K. the more general term *composite* is preferred. Research was conducted on the photofit method during the 1970s (Penry, 1974; Ellis, Shepherd, & Davies, 1975; Davies, Ellis, & Shepherd, 1978). Its shortcoming is that a face is composed of different photographic segments, for the eyes and for the mouth, and the separation lines are visible and interfere with recognisability. See Wogalter and Marwitz (1991), on the construction of face composites.

Photofit evidence is not without problems. It is "a method to obtain details of the appearance of a suspect, which when first introduced was expected to be more useful than it has proved" (Osborne, 1997, p. 308). "It was widely assumed that such photofit pictures were merely for incidental use in establishing a suspect that could then be put on an identification parade. A very strange result however occurred in the [English] case of  $R \vee Cook$  [1987] QB 417" (ibid.), and Osborne describes it as follows:

In *Cook* the accused was convicted on the basis of a photofit prepared by the victim. After the photofit had been prepared the police arrested the suspect and put him in an identification parade. The victim identified him. In the course of the trial the photofit was put in evidence, the judge ruled it admissible as 'part of the circumstances of the identification'. This was upheld on appeal. It was considered that neither the hearsay rule [for excluding evidence] nor the rule against admission of a previous consistent statement applied to this situation because in preparing the photofit the officer was merely doing what a camera would have done. This result has been much criticised and it is suggested that it is wrong. A photofit is nothing like a camera because there is the interposition of human intelligence. It is suggested that a photofit is hearsay, just as a verbal description of the accused would have been and should have been ruled inadmissible. The decision however, has been upheld in another case, *R* v *Constantinou* (1989) 91 Cr App R 74, on somewhat similar facts.

In France, face composites (in French: *portrait robot*) were developed by a police chief in Lyons during the 1950s, and only consisted of three sliding parts (*bandes coulissantes*), respectively for the hair and forefront, the eyes and eyebrows, and the mouth and chin. A sketch artist used to complete the composites with scars or moles. Eventually the police in Paris adopted the American *identity kit*. From 1993, the French police resorts to computerised face composites, which in French are called *portrait robot informatisé* (Tribondeau, accessed 2006, s.v. *portrait robot*).

Internationally, there exist various computerised systems, including E-FIT, PROfit (CD-FIT), and Mac-A-Mug Pro.<sup>23</sup> These old computerised systems appear to be less satisfactory than the manual method, with faces drawn by a sketch artist. Apparently E-FIT is good at recognising the faces of famous persons, whereas PROfit is good for recognising faces of persons with low distinctiveness. In the CRIME-VUs project (see below), an attempt has been made to improve on those

<sup>&</sup>lt;sup>23</sup> The E-FIT website is interesting; Amina Memon recommends it in her course handouts: http:// www.visionmetric.com/index.php?option=com\_content&task=view&id=17&Itemid=25

older systems. Bear in mind that composites are an *indicative tool* rather than an *implicative tool* (DNA evidence is an implicative tool, instead); nevertheless, composites are used in courtroom situations as evidence, even though it is not a weighty one.<sup>24</sup>

Johnston and Caldwell claimed (1997):

One of the most widely used systems for generating composite faces was developed by Penry (1974), in Britain, between 1968 and 1974. Termed "Photofit", this technique uses over 600 interchangeable photographs, picturing five basic features: forehead and hair, eyes and eyebrows, mouth and lips, nose, and chin and cheeks. With additional accessories, such as beards and eyeglasses, combinations can produce approximately fifteen billion different faces. Alternatives to Photofit include the Multiple Image-Maker and Identification Compositor (MIMIC), which uses film strip projections, Identikit, which uses plastic overlays of drawn features, and several computerized versions of the Photofit process, such as Mac-A-Mug Pro and Compusketch. Using Compusketch, a trained operator with no artistic ability can assemble a composite in less than an hour. Because of such advantages, computer aided sketching is becoming the method of choice for law enforcement agencies.

#### Nevertheless, there is a shortcoming (Johnston & Caldwell, 1997):

Systems such as Photofit and Compusketch depend on the ability of a witness to accurately recall the features of a suspect and to be aware of which features and feature positions of the generated composite require modification. Such systems may actually inhibit identification by forcing a witness to employ a specific cognitive strategy; namely, the recall of isolated features. Davies and Christie (1982) have shown that this single feature approach is a serious source of distortion, and Baddeley [(1979)] has concluded that any exclusively feature-based approach is misconceived.

Frowd et al. (2010a) explain:

Face recognition essentially emerges from the parallel processing of individual facial features and their spatial relations on the face (see Bruce & Young, 1986, for a review). In contrast, face production is traditionally based more on the recall of information: the description and selection of individual features. While we are excellent at recognising a familiar face, and quite good at recognising an unfamiliar one, we are generally poor at describing individual features and selecting facial parts (for arecent review, see Frowd, Bruce, & Hancock, [2008]).

<sup>&</sup>lt;sup>24</sup> Frowd et al. (2005) presented what they referred to as being a forensically valid comparison of facial composite systems. Brace [sic], Pike, Kemp, Tyrner, and Bennet (2006) discussed whether the presentation of multiple facial composites improves suspect identification. Bruce [sic], Hancock, Newman, and Rarity (2002) had claimed that combining face composites yields improvements in face likeness. McQuiston-Surret, Topp, and Malpass (2006) discussed the use of facila composite systems in the United States. Frowd, McQuiston-Surret, Anandaciva, Ireland, and Hancock (2007) provided an evaluations of some systems for making facial composites, from the United States. Frowd, McQuiston-Surret, et al. (2007) tried to apply caricature in the attempt to improve the recognition of facial composites. Hasel and Wells (2006) claimed that applying morphing to facial composites helps with identifications, but Wells and Charman (2005) had claimed that building composites can harm lineup identification performance.

#### 8.2.2.3 FacePrints for Generating Facial Composites

Caldwell and Johnston (1991) describe how a tool, FacePrints, based on an interactive genetic algorithm (GA) has been useful in assisting a witness to build a facial composite of a criminal suspect. That genetic algorithm<sup>25</sup> "can rapidly search a 'face-space' containing over 34 billion possible facial composites'' (ibid., p. 416). An important feature of *FacePrints* is that it "relies on recognition rather than recall" (Johnston & Caldwell, 1997). FacePrints "begins by generating a set of thirty random binary number strings (genotypes) and developing these into composite faces (phenotypes)" (ibid.), where the binary string expresses a sequential set of coordinates in six position axes, corresponding to the shape and position of facial features. The witness views, one at a time, the thirty composites of the "first generation" of the algorithm, "and rates each face on a ten point scale according to its resemblance to the culprit" (ibid.); "the witness may not be aware of why any perceived resemblance exists" (ibid.). Then "the genotype of the fittest face and a second genotype, chosen in proportion to fitness from the remaining twenty-nine faces, are paired for breeding" (ibid.). In personal communication with the present author (13 December 1996), Victor S. Johnston remarked about the advantages of his approach: "The advantages of the GA are: 1. based on recognition rather than recall, 2. no interview required that could bias witness, 3. no exposure to mug shots. It is difficult to see how any bias could be introduced into a procedure that is driven only by the witness' recognition ability".<sup>26</sup>

#### 8.2.2.4 The CRIME-VUs and EvoFIT Projects

Innovative tools for suspect recognition from facial composites include EvoFit (Frowd, Hancock, & Carson, 2004, 2010a)<sup>27</sup> and EFIT-V (Gibson, Solomon, Maylin, & Clark, 2009). In the United States, the leading tool is FACES. In South Africa, the ID software was developed (Tredoux, Nunez, Oxtoby, & Prag, 2006). "The basic operation of these 'recognition-based' systems is similar. They present users with a range of complete faces to select. The selected faces are then 'bred' together, to combine characteristics, and produce more faces for selection. When repeated a few times, the systems converge on a specific identity and a composite is 'evolved' using a procedure that is fairly easy to do: the selection of complete faces" (Frowd et al., 2010a). But (ibid.):

One problem with the evolutionary systems is the complexity of the search space. They contain a set of face models, each capable of generating plausible but different looking faces. The models, which are described in detail in Frowd et al. (2004), capture two aspects of

<sup>&</sup>lt;sup>25</sup> Genetic algorithms are the subject of Section 6.1.16.1 in this book.

 $<sup>^{26}</sup>$  For the application of genetic algorithms to evolving facial images, also see Hancock (2000), Hancock and Frowd (2001).

<sup>&</sup>lt;sup>27</sup> The EvoFIT website is at http://www.evofit.co.uk/ Charlie Frowd's website is at this other address: http://www.uclan.ac.uk/psychology/research/people/Frowd.html

human faces: *shape* information, the outline of features and head shape, and pixel intensity or *texture*, the greyscale colouring of the individual features and overall skin tone. The number of faces that can be generated from these models is huge, as is the search space. The goal then is to converge on an appropriate region of space before a user is fatigued by being presented with too many faces.

At the Face Perception Group (Faces Lab) at the Department of Psychology of the University of Stirling, in Scotland, the combination of facial composites, as well as sketches, and the effects of morphing between facial composites of the same depicted person, are studied in relation to effectiveness for recognition, in the framework of the CRIME-VUs project (Combined Recall Images from Multiple Experts and Viewpoints). The project, which was a predecessor of the EvoFIT project and produced an early version of the tool EvoFIT, had the aim of "examin[ining] the effectiveness of developing methods to construct and view composite images in 3D, and explor[ing] whether combining judgements from different witnesses could result in better composites" (Bruce & Hancock, 2002).

In CRIME-VUs, multiple techniques were resorted to, in forensically friendly format, and combining information from witnesses in different ways. One image processing technique used is morphing, for blending images into each other or to various degrees. Apparently the morph (of four composites) performs better than the best (and the worst) composite.

Hancock, Bruce, and Burton (1998) compared computer systems for face recognition with human perceptions of faces. Different image formats are compared, as to their impact on human and automatic face recognition, in Burton, Miller, Bruce, Hancock, and Henderson (2001). Bruce et al. (1999) were concerned with recognising persons from images captured on video. Importantly, in face recognition by humans, the recognition of unfamiliar faces (Hancock, Bruce, & Burton, 2000) is distinct from familiar face recognition (Burton, Bruce, & Hancock, 1999).

At the University of Central Lancashire (in Preston, northwest England) and the University of Stirling (in Scotland), Charlie Frowd and collaborators (Vicki Bruce, Peter Hancock, and Leslie Bowie, and others) has developed a novel "facial composite system", called *EvoFIT*. "Face construction by selecting individual facial features rarely produces recognisable images", whereas EvoFIT works by the repeated selection and breeding of complete faces" (Frowd et al., 2010a). EvoFIT is based on a holistic face coding scheme and an evolutionary interface<sup>28</sup>:

Using this system, witness choose from a selection of faces that bear a resemblance to an assailant (a composite is 'evolved' over time by breading together the selected faces). In recent experiments, EvoFIT has outperformed other current composite systems (in the most recent realistic study, EvoFIT reached a level of naming roughly twice that of another UK composite system [...]). [...] EvoFIT has also been used in a criminal investigation, Operation Mallard (Northants). [...] (note that this system has the additional advantage that a verbal description is NOT required).

<sup>&</sup>lt;sup>28</sup> The quotation is from http://www.psychology.stir.ac.uk/staff/cfrowd/index.php ABM is the industrial partner for EvoFIT; they also produce PRO-fit, one of the two facial composite systems used in the UK (the other one is E-FIT).

EvoFIT is now available for police and research use. It also has a construction 'wizard', rather like a wizard use to install software on a computer, and allows a composite to be constructed by a novice user. Please see www.evofit.co.uk

When a witness (or in general, a user) has to use EvoFIT, EvoFIT "presents users with screens of 18 such faces. Users select from screens of face shape, facial textures and then combinations thereof before the selected faces are bred together using a Genetic Algorithm,<sup>29</sup> to produce more faces for selection. This process is normally repeated twice more to allow a composite to be 'evolved'" (Frowd et al., 2010a).

Concerning a field trial of EvoFIT in 2007 with the Lancashire constabulary, developers claim<sup>30</sup>:

Given that it is not essential for a witness or victim to describe a face in detail to use EvoFIT, which was a limitation with previous composite systems, the number of potential crimes that can benefit from this technology is very large. To date, about 20 police personnel have been trained, and there has been great success in a range of crimes in Lancashire from theft to burglary to indecent assault [...]. Lancashire police are delighted with the effectiveness of the system. They are also using the new caricature animation format to present their EvoFITs of wanted persons to the public, a procedure that has been shown to substantially improve recognition rates.

Frowd et al. (2010a) "explored two techniques. The first blurred the external parts of the face, to help users focus on the important central facial region. The second, manipulated an evolved face using psychologically-useful 'holistic' scales: age, masculinity, honesty, etc. [...] Performance was best using both techniques". Frowd et al. (2010a) shows that the latest techniques, *external feature blurring* and *holistic tools*, enable a composite to be created from a two day-old memory of a face with fairly-good correct naming rates, 25%. This is compared to 5% from a traditional feature system under the same conditions. Charlie Frowd kindly provided for publication in this book, in August 2010, a screenshot of the first generation of faces from which the genetic algorithm of EvoFIT starts, as well as a screenshot showing the blur. Refer to Figs. 8.2.2.4.1 and 8.2.2.4.2.

Also, by the summer of 2010, Frowd's team had just finished developing a new interview for EvoFIT. It is called the *Holistic-CI*, and promotes an even better quality composite – a correct naming rate of 40%, which is clearly quite remarkable. The experiment for this is described in Frowd et al. (2010b). Frowd et al. (2010b) explain:

Facial composites are normally recovered from a witness's memory after a cognitive interview (CI). Here, we investigated the effect of different types of interview on composites produced from a newer evolving system, EvoFIT, which is based on the selection and breeding from arrays of complete faces. The holistic-cognitive interview (H-CI) promoted better likenesses and much more identifiable images than composites produced after the CI. Composites from both the hair-recall interview (HairI) and the holistic interview (HI) were identified similarly, and worse than composites from the CI.

<sup>&</sup>lt;sup>29</sup> Genetic algorithms are the subject of Section 6.1.16.1 in this book.

<sup>&</sup>lt;sup>30</sup> At http://www.evofit.co.uk/ (accessed in 2010).

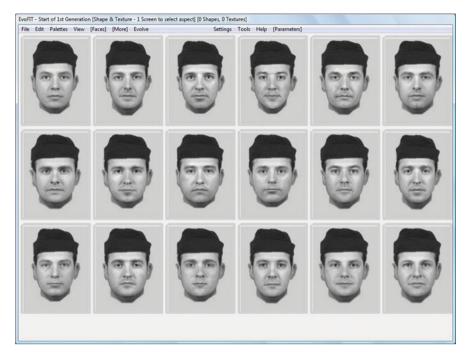


Fig. 8.2.2.4.1 A screenshot from EvoFIT. Courtesy of Charlie Frowd

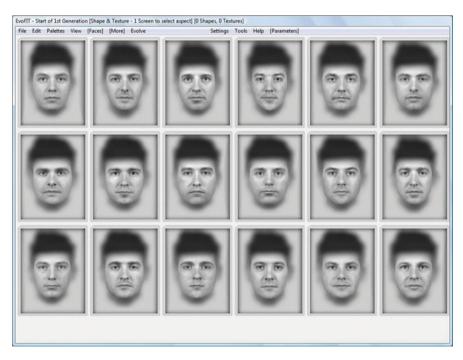


Fig. 8.2.2.4.2 A screenshot from EvoFIT, showing the blur. Courtesy of Charlie Frowd

Frowd explained (pers. comm., 19 August 2010) the relation between the CRIME-VUs and EvoFIT projects: "The CRIME-VUs project developed EvoFIT to a level where people could name the images at about 12% under the long delay. This gave us the evidence to take to the EPSRC government funding body to develop the blurring and the holistic tools, to essentially make it work as well as it does today".

# 8.2.3 Age-Progression Software and Post-Surgery Face Recognition

There is a different kind of application of computer graphics for face processing, that is in use in various contexts as explained below. It is *age-progression software*. Based on a facial image, this kind of software predicts how the particular person would age, or would have aged, for some parameter of assumed wear. To the police, age-progression software is potentially useful for the purposes of getting a better idea of how a given person would look, when trying to locate missing persons.

Aprilage Development Inc.<sup>31</sup> in Toronto produces the APRIL Age Progression Software is the only statistically based age progression software. This software generates a stream of aged images of faces from a standard digital photograph. The wrinkling/aging algorithms are based upon two sources: (a) published data regarding facial changes associated with aging; (b) research of several thousand people of all ages, ethnicities and lifestyle habits, even though the widening of the range of racial backgrounds was gradual, by segmenting additional populations: Version 2.4 (released in 2007) also included South Asian facial aging, and a Hispanic/Latino component was scheduled to be released soon afterwards. That same version also includes a 3D Component, which allows the user to work with an image of a face in various positions, in three dimensions. Version 2.4 reportedly enabled more flexibility with starting age: that version can age a child as young as 6, or an adult as old as seventy-two years of age. The same version also included a new flipbook feature, intended to improve the workflow for repetitive tasks.

Moreover, adjustment of the output images is possible, in order to take into account whether a person will age as a smoker versus a non-smoker (Smoking Simulation Software), if he or she adds excessive weight or experiences a high degree of unprotected sun exposure. APRIL ages an individual's face from adolescent to adulthood both as a non-smoker and as a pack-a-day consumer. It graphically predicts the premature wrinkling and unhealthy skin tone caused by cigarettes. The APRIL software was originally developed for use in science exhibits at Science Museums. Another context of use is as a health education tool, warning against smoking, obesity, and sun exposure (the latter possibly resulting in skin cancer: the

<sup>&</sup>lt;sup>31</sup> http://www.aprilage.com "Founded in 1998, Aprilage Development Inc. has developed APRIL<sup>®</sup> Age Progression Software in association with the Ontario Science Centre and with the support of the National Research Council of Canada. The software is used in more than a dozen countries for health and science education, entertainment and product marketing."

software graphically predicts the premature wrinkling in the face by the effects of UV exposure). And indeed, the Roswell Park Cancer Institute in Buffalo, NY, was instrumental in helping develop the first version of APRIL.

Additional applications were envisaged, to assist in finding lost and missing children, and to help to identify criminals. In fact, APRIL can be used to help predict what an individual would look like after many years. For example, the tool could show how a pre-teen child who went missing may look as a teenager. APRIL was reportedly being used alongside a facial recognition software, for such applications to law enforcement and security. An application in a medical setting is that the software can be used in hospitals or in doctors' offices to illustrate how aging affects various medical, cosmetic, or surgical procedures. Reportedly, the tool was also being used at academic courses in gerontology.

Figures 8.2.3.1, 8.2.3.2, 8.2.3.3 and 8.2.3.4 were kindly supplied by Deirdre Hogan, Director of Sales at Aprilage, with permission to reproduce them here. These are pairs of images, the one on the left side in each pair being the photograph of a child or young adult, and the one on the right side in the same pair being a prediction of how that same individual would look as an adult or in old age. Respectively,

- 1. Figure 8.2.3.1 is file "gray\_hair\_example\_Aprilage.jpg" from Aprilage, and shows normal aging of a white male young adult, the image on the right side showing him with grey hair, at age 72. The grey hair was obtained by applying the grey hair function.
- 2. Figure 8.2.3.2 is Aprilage's file "smoker-1-hi-res 45.JPG" and shows a girl, and how she would look aged 45, by assuming she smokes. The smoking factor was applied.



**Fig. 8.2.3.1** Normal aging of a white male young adult (*left*), to age 72 (*right*). The grey hair was obtained by applying the grey hair function. Compliments of Aprilage Progression software (www. aprilage.com/www.age-me.com)



**Fig. 8.2.3.2** A girl (*left*), and how she would look aged 45, by assuming she smokes. The smoking factor was applied. Compliments of Aprilage Progression software (www.aprilage.com/www.age-me.com)



**Fig. 8.2.3.3** A boy (*left*) of South Asian background, with a projection reflecting normal aging of the same person (*right*), the way he would look aged 60. The image of this person as an old man did not have the grey hair function applied. Compliments of Aprilage Progression software (www. aprilage.com/www.age-me.com)

- 3. Figure 8.2.3.3 is Aprilage's file "male SA org 2.5\_3.jpg" and shows a boy of South Asian background, with a projection reflecting normal aging of the same person, the way he would look aged 60. The image of this person as an old man did not have the grey hair function applied.
- 4. Figure 8.2.3.4 is Aprilage's file "male Lat org 2.5.\_2.jpg" and shows a young male of Latino background, and how he would look with normal aging at age 70. The image as an old man did not have the grey hair function applied.



**Fig. 8.2.3.4** A young male (*left*), and how he would look with normal aging at age 70 (*right*). The image as an old man did not have the grey hair function applied. Compliments of Aprilage Progression software (www.aprilage.com/www.age-me.com)

# 8.2.4 Facial Expression Recognition

Lisetti and Schiano (2000) reported about an automated facial expression recognizer they were developing. Moreover, they

present some of the relevant findings on facial expressions from cognitive science and psychology that can be understood by and be useful to researchers in Human-Computer Interaction and Artificial Intelligence. We then give an overview of HCI applications involving automated facial expression recognition, we survey some of the latest progresses in this area reached by various approaches in computer vision (ibid., from the abstract).

They went on to "propose an architecture for a multimodal intelligent interface capable of recognizing and adapting to computer users' affective states" (ibid.). Their article is part of a multidisciplinary special issue of *Pragmatics & Cognition* on facial information processing in human cognition (Dror & Stevenage, 2000); see there, e.g., Anna Wierzbicka's (2000) "The semantics of human facial expressions".

# 8.2.5 Digital Image Forensics

*Digital image forensics* consists of computational methods of detection of image tampering. Such tampering is also done by computer (*digital forgeries*). Images typically portray people, and tools from image forensics work on models in three dimensions of the bodies that appear in the picture. Distinguish between computer models of the reasoning of and about deception, and computer techniques intended to enable the detection of forgeries, within forensic science. This is the case of a

technique that maps inconsistencies in lighting in doctored, composite photographs, by associating a sphere with its own index of lighting with different regions of the photograph (Johnson & Farid, 2007a).<sup>32</sup>

The need for such technology was made acute by the spread and level of sophistication of digital imaging technology that can be used for manipulating digital images, including the production of photo hoaxes<sup>33</sup> or maliciously doctored photographs. Johnson & Farid remarked (2007a, p. 250):

The field of digital forensics has emerged over the past few years to combat this growing problem. Several techniques have been developed to detect various forms of digital tampering. Statistical techniques have been developed for detecting cloning [(Fridrich et al., 2003; Popescu & Farid, 2004)]; splicing [(Ng & Chang, 2004)]; re-sampling artifacts [(Popescu & Farid, 2005a; Avcıbaş et al., 2004)]; color filter array aberration [(Popescu & Farid, 2005a)]; and disturbances of a camera's sensor noise pattern [(Lukáš et al., 2006)]. Optical techniques have been developed to detect chromatic aberrations [(Johnson & Farid, 2006a)], and geometric techniques for rectifying perspectively distorted planar surfaces [(Johnson & Farid, 2006b)]. More recently two related approaches have been developed for detecting inconsistencies in lighting [(Johnson & Farid, 2005, 2007b)]. Building specifically on this work, and more broadly on all of these forensic tools, we describe a new lighting-based digital forensic technique.

Johnson's dissertation (2007, p. 54) explains:

Lighting environments can be captured by a variety of methods, such as photographing a mirror sphere [(Debevec, 1998)], or through panoramic photography techniques. These methods produce high dynamic range images, known as light probe images, that represent the lighting environment function L(V). The spherical harmonic coefficients are computed by integrating the lighting environment function L(V) against the corresponding spherical harmonic basis function [(Ramamoorthi & Hanrahan, 2001)]:

$$l_{n,m} = \int_{\Omega} L(\vec{V}) Y_{n,m}(\vec{V}) d\Omega$$

 $<sup>^{32}</sup>$  A popularistic introduction to this branch of image processing was provided by Hany Farid (2008), whereas Popescu and Farid (2005b) is a technical journal article, and Micah Kimo Johnson's dissertation (2007) is available online. Farid's team is at Dartmouth College.

<sup>&</sup>lt;sup>33</sup> Johnson and Farid (2007a, figure 1) gave a poignant example, by showing a fake cover of a celebrity magazine. The original *Star* magazine cover showed actress Katie Holmes on the right side, with her left hand on the left shoulder of actor Tom Cruise. The cover headline claimed: "TOM & KATIE Are They Faking It?". The fake cover, instead, showed the paper's first author, Kimo Johnson, in place of Tom Cruise, and the pre-headline read "KIMO & KATIE". One could tell it was fake, however, because there was a shadow on the right side of Kimo's face, whereas there was mcuh light in the environment (as could be seen from Holmes' own face, and also from Cruise's face in the original). In Johnson (2007, p. 26), figure 3.1 shows a "photograph of the *American Idol* host and judges" which "is a digital composite of multiple photographs. The inconsistencies in the shape and location of the specular highlight on the eyes suggest that these people were originally photographed under different lighting conditions." Enlarged details show the eyes of the various persons in that photograph.

Johnson's dissertation (2007, pp. 54–55) shows several light probe images.<sup>34</sup> each on a sphere, and captured at places like inside Grace Cathedral in San Francisco, Galileo's Tomb and the Uffizi Gallery in Florence, and so forth. From each such light probe image, lighting environment coefficients were computed. Next, these lighting environment coefficients were each used to render a Lambertian sphere, characterising the respective lighting environment. Being Lambertian means that is reflects light isotropically (ibid., p. 7).<sup>35</sup> Johnson (ibid., p. 47, figure 4.4) showed how lighting environments could be rendered on spheres, by displaying the first three orders of spherical harmonics as functions on the sphere: from top to bottom, that figure showed the order zero spherical harmonic,  $Y_{0,0}(\cdot)$ ; the three order one spherical harmonics,  $Y_{1,m}(\cdot)$ ; and the five order two spherical harmonics, Y<sub>2,m</sub>(·). "Irradiance describes the total amount of light reaching a point on a surface. For a Lambertian surface, the reflected light, or radiosity, is proportional to the irradiance by a reflectance term  $\rho$ . In addition, Lambertian surfaces emit light uniformly in all directions, so the amount of light received by a viewer (i.e., camera) is independent of the view direction. A camera maps its received light to intensity through a camera response function" (ibid., p. 48). Moreover, "the change in the intensity profile due to an increased exposure time  $t_2$  can be modeled by a linear change to the profile of exposure time  $t_1$ " (ibid., p. 49). The relationship between image irradiance and intensity is expressed by a formula that can itself be rewritten in terms of spherical harmonics. Lighting environments can be estimated (ibid., section 4.1.3) and compared (ibid., section 4.1.4).

By introducing results, Johnson explained (2007, p. 54, section 4.2):

We tested our technique for estimating lighting environment coefficients on synthetically generated images and real images of natural lighting environments. The synthetic images were rendered using the pbrt environment [(Pharr & Humphreys, 2004)] with data from a gallery of light probe images maintained by Paul Debevec [(1998)]. The natural images were obtained in two different ways. For the first set, we photographed a known target in a variety of lighting conditions. For the second set, we downloaded twenty images from Flickr, a popular image sharing website [<sup>36</sup>]. Results from four visually plausible forgeries are also presented. For all images, the lighting environment coefficients were estimated from the green channel of the image. Although all three color channels could be analyzed, we find that this is often unnecessary since the estimation is invariant to both multiplicative and additive terms.

<sup>&</sup>lt;sup>34</sup> Light probe images by Paul Debevec, available at http://www.debevec.org/Probes.

<sup>&</sup>lt;sup>35</sup> "The standard approaches for estimating light direction begin by making some simplifying assumptions about the surface of interest: (1) it is Lambertian (i.e., it reflects light isotropically); (2) it has a constant reflectance value; (3) it is illuminated by a point light source infinitely far away; and (4) the angle between the surface normal and the light direction is in the range  $0^{\circ}$ -90°" (Johnson, 2007, p. 7).

<sup>&</sup>lt;sup>36</sup> Flickr home page, at http://www.flickr.com.

In the discussion section in Johnson and Farid (2007a, section IV),<sup>37</sup> they pointed out the following, which is relevant to doctored images that show side by side persons who were originally not photographed together:

When creating a composite of two of more people, it is often difficult to exactly match the lighting, even if the lighting seems perceptually consistent. The reason for this is that complex lighting environments (multiple light sources, diffuse lighting, directional lighting) give rise to complex and subtle lighting gradients and shading effects in the image. Under certain simplifying assumptions (distant light sources and diffuse surfaces), arbitrary lighting environments can be modeled with a 9-dimensional model. The model approximates the lighting with a linear combination of spherical harmonics. We have shown how to apporximate a simplified 5-dimensional version of this model from a single image, and how to stabilize the model estimation in the presence of noise. Inconsistencies in the lighting model across an image are then used as evidence of tampering.

We showed the efficacy of this approach on a broad range of simulated images, photographic images, and visually plausible forgeries. In each case, the model parameters can be well approximated, from which differences in lighting can typically be detected. There are, however, instances when different lighting environments give rise to similar model coefficient – in these cases the lighting differences are indistinguishable.

In conclusion: "While any forensic tool is vulnerable to counter-measures, the precise matching of lighting in an image can be difficult, although certainly not impossible" (ibid.). The analysis of three forgeries (ibid., figure 12) associate differnetly shaded spheres characterising different lighting environments to different elements in the composite. For example, in one doctored photograph, ducks standing on the ground were added very close to players at a match. The shading effect on the spheres associated with two of the ducks are identical, but different from the shading effect on the spheres associated with two of the players. In another photograph, three men are standing side by side. The first one to the left is a football coach wearing sunglasses, a red shirt and white trousers. The other two men are soldiers holding rifles and wearing camouflage. The two spheres associated with the two soldiers have an identical shading effect, but the latter is different from that of the sphere associated with the football coach. Another photograph (ibid., figure 12) "is a forgery where the head of rapper Snoop Dogg has been placed on the body of an orchestra conductor" (with crossed arms, besuited, and with a white papillon; but the skin of a hand is that of a black person, like the face). Spheres rendered from the estimated lighting coefficients are associated with the head and the trunk, and the shading effect on the two spheres is different.

### 8.2.6 Facial Reconstruction from Skeletal Remains

Forensic *facial reconstruction* is the reproduction of an individual human's face from skeletal remains. To say it with Aulsebrook, Iscan, Slabbert, and Becker (1995): "Forensic facial reconstruction is the reproduction of the lost or unknown

<sup>&</sup>lt;sup>37</sup> Understandably, Johnson and Farid's article (2007a) shares very much with the doctoral dissertation (Johnson, 2007).

facial features of an individual, for the purposes of recognition and identification. It is generally accepted that facial reconstruction can be divided into four categories: (1) replacing and repositioning damaged or distorted soft tissues onto a skull; (2) the use of photographic transparencies and drawings in an identikit-type system; (3) the technique of graphic, photographic or video superimposition; (4) plastic or three-dimensional reconstruction of a face over a skull, using modelling display".

Whereas Aulsebrook et al. (1995) is a review of "work done on both superimposition and plastic reconstruction", nevertheless "the authors believe that only the latter category can correctly be termed facial reconstruction". Computer-graphic techniques fit in categories (2), (3), and (4).

Caroline Wilkinson (2004) presents the Manchester method of forensic facial reconstruction. She also discusses how to reconstruct the faces of children. Her book collates all published facial tissue data, and describes tissue variations with reference to age, sex, stature and ethnic origin, for use by practitioners. Wilkinson also evaluates the accuracy of current methods.

There are factors which militate in favour of one candidate reconstruction rather than another one. In one case from England, in which a man's body was found at a stage of decomposition in which it looked like a lump of fat, two facial reconstructions were developed, one with a European likeness, and the other one with a Near Eastern likeness, whose appropriateness was suggested by the fact that on the teeth of the skull there were traces of *kat*, a recreational drug in common use in Yemen (and by some in Saudi Arabia). Eventually it was discovered that the man was a Yemeni-born grandfather who had been murdered by his own son.

In another case, a large set had been developed of possible face reconstructions for the body of a young woman, and when she was eventually identified, and it was possible to verify the accuracy of the reconstructions from photographs, it turned out that none of those reconstructions looked anywhere close to how she actually looked like when alive.

Not always facial reconstruction is for forensic purposes. A professor in Sheffield who reconstructed the face of ancient Egypt's Queen Nefertiti, related, at a workshop in Edinburgh in the summer of 2004, how after a television broadcast on that project of his, a lady phoned to inform him that he got it wrong. He conceded to her that there may be errors, but then she claimed: "I am Nefertiti". She promised she would send him evidence in support. John Prag and Richard Neave (1997) are concerned with reconstructing the facial appearance of ancient people; one of these is the famous King Midas, and another one is Philip II, the powerful father of Alexander the Great. The portrait of Philip II from coins provided cues for reconstruction. Another category also treated in the same book is ancient human remains retrieved from bogs. Prag and Neave's book caters to a broad audience, yet includes moderately technical detail. An early example is a sculpture of the head of Tamerlane (see Fig. 8.2.6.1): a "[p]ortrait head of Timur [was] made by the Soviet scholar M. M. Gerasimov. This sculpture is very accurate as it is based upon the skull found in Timur's grave. By closely studying such skulls and then working out the exact position of muscles, eyes, skin, hair and so on, Gerasimov pioneered the



**Fig. 8.2.6.1** The portrait head of Timur (i.e., Tamerlane), as reconstructed by Mikhail Gerasimov

reconstruction of the portrait heads of long dead people" (Nicolle, 1990, p. 144, in a caption to a photograph).

Archaeologist and anthropologist Mikhail Mikhaylovich Gerasimov (1907– 1970) "developed the first technique of forensic sculpture based on findings of anthropology, archaeology, paleontology, and forensic science. He studied the skulls and meticulously reconstructed the faces of more than 200 people, including Yaroslav the Wise, Ivan the Terrible, Friedrich Schiller and, most famously, Tamerlane" ([Gerasimov] 2007). Gerasimov's early work, from 1927 on, was on skulls of prehistoric or exotic humans. "It took a decade of studies and experiments to come close to individual portrait resolution quality of historical persons", yet "his first public work of this type is dated 1930", this being the "face of Maria Dostoyevskaya, mother of Fyodor Dostoyevsky" (ibid.). He worked on the skulls of Yaroslav the Wise in 1938, and of Tamerlane in 1941. "In 1953 the Soviet Ministry of culture decided to open the tomb of Ivan the Terrible and Gerasimov reconstructed his face" (ibid.). See Eve Conant's article (2003), and Mikhail Gerasimov's own *The Face Finder* (Gerasimov, 1971), originally of 1968. The earliest version of his memoirs appeared in Russian in 1949.

Facial reconstruction, as mainly developed for forensic purposes, when applied in an archaeological context has enabled even glaring departure with respect to ancient portraits (conditioned by cultural conventions) to be ascertained. Olga Wojtas (1996) reported that "[f]orensic techniques used by the police to establish the identity of unknown bodies have revealed what sixteenth-century Scottish humanist, classicist, historian and poet George Buchanan looked like. [...] Most of the portraits of the time pay tribute to his brain power by depicting a man with an enormous forehead, a literal "highbrow". But Buchanan's skull [...] is relatively small, with an average-sized forehead". Anatomist Matthew Kaufman "decided to find out whether any of the portraits were accurate", and then, having had the face reconstructed from a plaster cast, "was staggered" as "it turned out to be almost identical to a portrait of Buchanan now hanging in the Royal Society in London" and which, significantly, "avoids the convention of linking exceptional intellect to a large forehead". The newspaper report concludes with the interviewee remarking that head size as an indicator of intellect is a widespread belief. Nevertheless, a distinction is to be made between beliefs and pictorial or other culture-bound representational conventions.

It must be noted that whereas, when discussing forensic archaeology, we mentioned that there is a perception that this discipline is ahead in the application of scientific techniques to forensics for some applications, this is not the case of face reconstruction. An expert in forensic face reconstruction was skeptical, during her lecture at a workwhop in Edinburgh, of forensic archaeology precisely inasmuch face reconstruction is involved. In fact, in forensic face reconstruction, once human remains are identified and photographs of the dead person are obtained, it happens sometimes that face reconstructions that had been developed are found to be wide of the mark, and in some real case it can be seen that alternative reconstructions that had been proposed, could be seen to be quite different even before the identification was made. (It basically depends on the methods, and on assumptions.)

By contrast, no such validation is possible, when the face of a person from antiquity is reconstructed. In turn, this is different from peat bodies, which may be well conserved even after a millennium, and what one sees is a blackened face that is not a reconstruction; such is the case of the body of a garrotted man who was found in Denmark. His face, short facial hair, and hat are well preserved, but the mangling of his neck is an effect of his execution, before his body was thrown into the bog.

# 8.2.7 Considerations about Socio-Cultural Factors in Portraiture That Have Been Analysed with Episodic Formulae

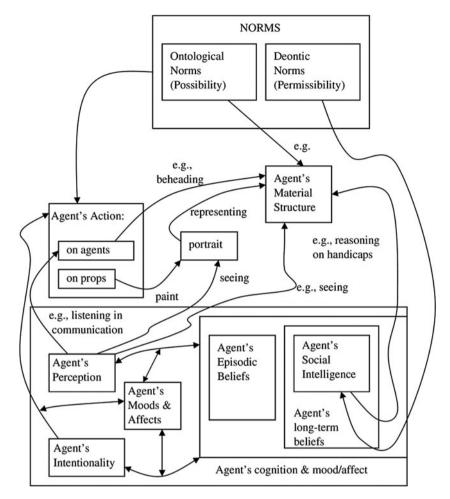
In Section 5.3, we have been concerned with the representation of narratives by means of *episodic formulae*. One of the models that adopt that approach it TIMUR

(Nissan, 2008b). In Section 5.3.1, among the other things I explained that the analysis in TIMUR is of

a perhaps apocryphal anecdote about the emperor Tamerlane. He invited three painters in turn, and commissioned from each, his own portrait. The first painter painted the king as a very handsome man, and Tamerlane had him beheaded, to punish him for his excessive flattery. The second painter represented the king realistically, if one means by that: warts and all. Tamerlane had him beheaded, as he found it intolerably offensive to see himself represented with hideous features. The third painter portrayed the king in the act of shooting an arrow, and did so "realistically", yet without revealing the physical defects, because the posture was such that these would not be apparent. How did the third painter portrait Tamerlane? In fact, in order to shoot the arrow from his bow, Tamerlane was kneeling down, so one would not notice that one leg was shorter. To aim, Tamerlane shut an eye, so one could not tell out the squint which affected his eyes (because you need to see both of them open, to tell out). This way, the life of the third painter was saved.

I also pointed out that this story of Tamerlane and the three painters involves fairly complex epistemic structures of belief and intentionality, and these are involved in the characters' reasoning about the human body of one of them, and about the depiction of that body in a portrait (i.e., in a given kind of representation). There are factors involving *ontologies*: Tamerlane shares with the three painters their all's being instances of kind 'human being', but, Tamerlane doesn't possess the specific skills associated with kind 'painter'. At any rate, he contracts out to painters the task of painting his portrait. The painters are utterly at his mercy, because his authority is absolute. Tamerlane, being an instance of kind 'absolute ruler', of which there only is (at most) one in a given polity, possesses a very high degree of authority on all other agents within the polity, and they in turn not only do not possess authority on him (except his doctor, if he considers him authoritative and follows his advice), but also hardly can resist his orders. Therefore, it is extremely dangerous for them to provoke his susceptibility, which is both affected by emotion, and is rational at the same time. He does not need to be concerned about the same in the reverse relation (unless he does so to so many and to such a degree, that the polity would rebel as well as his own otherwise obedient army).

Now refer to Fig. 8.2.7.1. This is figure 4 from Nissan (2008b, p. 574). The diagram shows an agent's mind, action, and structure, in relation to norms and to the potrait which in turn represents one of the agents, namely, Tamerlane. In section 3.6 of Nissan (2008b), 'Intentions and Effects of Portraying the Ruler' (ibid., pp. 546– 555), I discussed eight examples from different cultures and historical periods, of cultural factors and effects associated with the portrait of a person in power. In section 3.15 in Nissan (2008b), 'Tamerlane Reading the Mind of Painter1' (ibid., pp. 564–565), episodic formulae express how Tamerlane may have reasoned about the first painter's own reasoning when choosing to paint him in the manner he did. The value of this kind of analysis is that is provides a formal means for representing reasoning about an individual's portrait, and also the fact that there is a difference between a portrait and an image unaffected by cultural factors. Even a photograph, for example a mug shot, carries an important luggage of cultural traditional conventions.



**Fig. 8.2.7.1** An agent's mind, action, and structure, in relation to norms and to the portrait which in turn represents one of the agents. This is relevant for making sense of the story of Tamerlane and the three painters who, in turn, endanger themselves by painting his portrait

## 8.3 The Burgeoning Forensic Disciplines of Expert Opinion

# 8.3.1 General Considerations, and Some of the Specialties

Franke and Srihari (2008) provided an overview of *computational forensics*, at the very beginning of the proceedings of an international workshop about that domain. By *computational forensics*, what is meant is computer techniques for any discipline

within forensic science.<sup>38</sup> Concerning the booming of forensic specialties, Hans Nijboer remarked<sup>39</sup> (2000, p. 3):

[W]e can observe the fast development of forensic techniques and forensic specialties in the broader sense. Between archaeology or accountancy in its forensic form and the forensic zoology we indeed see over [one] hundred different forensic disciplines, of which some are well-established (like forensic psychiatry) and some have just started in developing 'objective' standards (shoe-print comparison)

- a development among whose critics he is.

It has become clear that DNA based techniques are in fact not perfect but they are not too weak. But at the same time it was discovered that many techniques and methods lack a sound basis in a broader scientific sense. Very often objective standards and information about the validity and reliability of specific forensic techniques are simply unknown (ibid., p. 7).

Student enrolment is affected by the blooming of the forensic sciences.<sup>40</sup> An exception to the generally declining enrolment in chemistry at U.K. university departments, is the number of students who want to study forensic chemistry. In the present Section 8.3, we are going to raise some points concerning an array of forensic disciplines, combining forensic science, engineering-related issues, and forensic psychology. In the remaining sections of this chapter, we are going to deal with sample areas, each in turn. These areas in which computing or electronics, or sometimes more specifically knowledge-based systems of pattern-matching software, have actually been applied. Or then, they are areas in which there may be some potential for application.

Reliance on expert testimony may be problematic,<sup>41</sup> from the viewpoint of legal evidence theory, in that (in an Anglo-American perspective) there is a risk of tacitly

<sup>&</sup>lt;sup>38</sup> *Computational forensics* is about what computing can do for forensic science. It should not be mistaken for *computer forensics* (itself part of *digital forensics*), i.e., the forensic discipline concerned with illegal actions involving a computer. In a sense, we find here a distinction similar to the one between *computational science* – i.e., *scientific computing:* what computing can do for science – and *computer science*, the science of computing.

<sup>&</sup>lt;sup>39</sup> Nijboer's (2000) was an overview of current issues in legal evidence. In the tenth anniversary issue of the e-journal *International Commentary on Evidence*, published at Berkeley in California, Nijboer (2008) provided comparative comments on current issues in evidence and procedure from a Continental perspective, as have emerged during the 2000s. He "discusses three dimensions of generality in evidence and procedure: (1) generality of fundamental issues in evidence and fact-finding and insights about them across national borders, (2) generality of issues of criminal evidence across various relevant disciplines (and professions), and (3) generality with respect to specific issues of criminal evidence and its principles and rules addressing the various probanda of specific crimes (murder, theft, rape, arson, negligence causing a serious traffic accident, et cetera)." Nijboer (2008) made frequent references to case law of the European Court of Human Rights (ECHR).

<sup>&</sup>lt;sup>40</sup> Brenner (2000) is a glossary of forensic science. James and Nordby (2003, 3rd edn. 2009) is an edited volume with overview chapters on various forensic disciplines. In that volume, Zeno Geradts (2005, 2nd edn.; 2009, 3rd edn.) provides an overview of the *use of computers in forensic science*.

<sup>&</sup>lt;sup>41</sup> There is a literature about expert evidence. For example, Carol Jones (1994) is concerned with expert evidence in Britain.

shifting paradigm from fact-finding by courts because the court has freely formed an opinion (*free proof*), to some form of binding reliance on expert testimony. In itself, reliance on expert witnesses may be problematic, perhaps because they may be misunderstood, but also because, in all frankness, trained judges tend to have a better reputation that both lawyers (whose reviled variant is the "shyster"), and expert witnesses (whose reviled variant is reputed to be the "hired gun", or to no lesser degree the more benign, if unfortunately rather benighted, astrologer-type; at any rate, lawyers during cross-examination typically try to discredit the expert witness of the other side).

If the perspective we are to adopt is historical, it will be important to point out that *free proof* (that has its detractors, among legal theorists in Anglo-American jurisdictions) was an achievement, especially as meant, or in the form it took, in Continental Europe. It replaced the so-called *legal proof* (in Latin *probatio legalis*, in French *preuve legale*, in German *gesezliche Beweistheorie*), and emancipated the judicial evaluation of the evidence from the older law of proof. This also involved the demise of torture as means for obtaining evidence; torture was deemed necessary for obtaining proof as necessary, in turn, to secure conviction, according to the system of legal proof, as opposed to the system of free proof that replaced it. In Continental Europe, free proof replaced rules of *quantum and weight;* these did not use to be part of the English and American judiciary systems.

Another kind of problem is that some important areas of expert testimony, such as forensic psychology or psychiatry, are treated variably, according to the country in which the court is, apart from the diffidence that lawyers are claimed to have of psychologists (see, e.g., Nissan, 2001f). Whatever negative may happen without expert testimony? In a section entitled "Evidence sans Expert", barrister and consultant psychiatrist Mahendra (2007, p. 1490), writing in England, commented on a recent court case:

That expert evidence plays a crucial role in modern litigation is well accepted. It is required by a court which acknowledges its lack of expertise on the relevant issues on which it requires the assistance of experts. But this does not mean that evidence which would normally be within the province of the expert is not present in the course of a trial even while no expert is present. This evidence may influence the judge and, where present, a jury.

One such area concerns mental disorder which, being commonly found, may then play some part in these deliberations and, yet, may not be subject to expert opinion in these circumstances. As lay individuals are known to hold all manner of views, not all reliable or valid, on psychiatric matters there may be scope for misunderstanding and even injustice. The issue came up in R v Osbourne [2007] EWCA Crim 481, [2007] All ER (D) 206 (Mar).

Forensic psychology<sup>42</sup> is not necessarily about the state of mind of a perpetrator, or of a victim. It has important things to say about the reliability of identification from memory. Uncertainty about an identity turns out in a broad array of forms, when

<sup>&</sup>lt;sup>42</sup> See for example a volume, *Forensic Psychology*, edited by Joanna Adler (2010, 2nd edn. [originally of 2004]). In that book, section 1, entitled 'Forensic Psychology in Context', comprises chapter 1, 'Forensic psychology: concepts, debates and practice', by Joanna R. Adler; and chapter 2, 'Public perceptions of crime and punishment', by Jane Wood and G. Tendayi Viki.

it comes to legal matters. Oftentimes, it is about personal identity: the identity of a human individual, possibly a culprit (not just in real life, but in whodunit fiction as well) or one otherwise liable, or, then, a victim. Identification is oftentimes required of witnesses.

The literature on the assessment of witness reliability is very extensive; writing about eyewitness identification would be a book in its own right.<sup>43</sup> In her 2008 course handouts in *Psychology, Law and Eyewitness Testimony* at her website at the University of Aberdeen in Scotland, psychologist Amina Memon has provided useful entry points into the scholarly literature: "Gary Wells (USA) has an excellent website containing numerous articles on eyewitness memory"<sup>44</sup>; "Maryanne Garry (New Zealand) provides access to all her publications on false memories".<sup>45</sup> "Loftus also provides access to her articles on misinformation and false memory as well as some good links".<sup>46</sup> "Paul Ekman makes his papers on deception available on his website".<sup>47</sup> "Gary Well's website [has] lots of good links"<sup>48</sup>; and so forth. Other

<sup>45</sup> http://www.vuw.ac.nz/psyc/staff/maryanne-garry/index.aspx

Section 2, 'Investigation and Prosecution', comprises chapter 3, 'USA and UK responses to miscarriages of justice', by Tom Williamson; chapter 4, 'The interpretation and utilisation of offender profiles: a critical review of 'traditional' approaches to profiling', by Laurence Alison and Emma Barrett. Section 3, 'Testimony and Evidence', comprises chapter 5, 'Eliciting evidence from eyewitnesses in court', by Mark R. Kebbell and Elizabeth L. Gilchrist; and chapter 6, 'The ageing eyewitness', by Amina Memon, Fiona Gabbert and Lorraine Hope. Section 4, 'Correlates of Criminality - sensations and substances', comprises chapter 7, 'The status of sensational interests as indicators of possible risk', by Vincent Egan; chapter 8, 'Drug use and criminal behaviour: indirect, direct or causal relationship?", by Ian P. Albery, Tim McSweeney and Mike Hough; and chapter 9, 'Drug arrest referral schemes and forensic perspectives on the treatment of addiction', by Andrew Guppy, Paul Johnson and Mark Wallace-Bell. Section 5, 'Persistent Offending', comprises chapter 10, 'Life-course persistent offending', by Alex R. Piquero and Terrie E. Moffitt; and chapter 11, 'Stalking, Lorraine Sheridan and Graham Davies'. Section 6, 'Intervention and Prevention', comprises chapter 12, 'Domestic violence: current issues in definitions and interventions with perpetrators in the UK', by Elizabeth L. Gilchrist and Mark Kebbell, chapter 13, 'Effective programmes to prevent delinquency', by Brandon C. Welsh and David P. Farrington; and chapter 14, 'Parenting projects, justice and welfare', by Anthony H. Goodman and Joanna R. Adler. Section 7, 'Punishment and Corrections', comprises chapter 15, 'Women in prison', by Nancy Loucks; and chapter 16, 'Applied psychological services in prisons and probation', by Graham Towl.

<sup>&</sup>lt;sup>43</sup> For a treatment of the psychology of person identification, see Clifford and Bull (1978). In Bull and Carson (1995), the chapter 'Assessing the Accuracy of Eye-witness Identifications' (Cutler & Penrod, 1995) has long been a useful entry point to the subject. Eyewitness psychology (e.g., Loftus, 1974 sqq, Ross et al., 1994) is but one area of forensic psychology. The *American Journal of Forensic Psychology* was established in the early 1980s; the British *Journal of Forensic Psychiatry* & *Psychology*, at the end of that same decade.

<sup>&</sup>lt;sup>44</sup> http://www.psychology.iastate.edu/faculty/gwells/homepage.htm (cf fn. 19in Chapter 4).

<sup>&</sup>lt;sup>46</sup> http://www.seweb.uci.edu/faculty/loftus/

<sup>&</sup>lt;sup>47</sup> http://www.paulekman.com/downloadablearticles.html

<sup>&</sup>lt;sup>48</sup> http://www.psychology.iastate.edu/~glwells/

than concerning witnesses, forensic psychology may, e.g., concern the custody of children of divorced parents.<sup>49</sup> And then there is forensic psychiatry.<sup>50</sup>

Cutler and Penrod (1995) are concerned with eyewitness identification of criminals in the United States, and Ross, Read, and Toglia (1994) are likewise concerned with criminal investigations with adult witnesses. In Bull and Carson (1995), Daniel Yarmey's chapter (Yarmey 1995) 'Earwitness and evidence obtained by other senses' is also about the identification of a person, such as a perpetrator. Hammersley and Read (1993), which appeared in a volume on the identification of suspects and its psychology, deals with voice identification by humans and computers.<sup>51</sup>

*Henry Lee's Crime Scene Handbook* (Lee, Palmbach, & Miller, 2001) is devoted to how to conduct an investigation,<sup>52</sup> starting by protecting and managing a crime scene; the *Handbook* includes a chapter, "Logic Trees", that could justifiably be of interest to such computer scientists who are interested in formalising general reasoning for the purposes of assisting crime analysis. One of the case studies in that volume is on shooting scene reconstructions. For a treatment of science in the criminal investigations, see, e.g., Kaye (1995) and Saferstein (1995); the latter considers forensic ballistics,<sup>53</sup> chemistry, and medicine. Cook et al. (1998)

<sup>&</sup>lt;sup>49</sup> For a U.S. perspective, see Ackerman (1995).

<sup>&</sup>lt;sup>50</sup> See, e.g., Lonsdorf (1995), Belfrage (1995), Chiswick and Cope (1995), Faulk (1994), Lloyd (1995), Gunn and Taylor (1993). Eigen (1995) considers forensic psychiatry in the context of British history.

<sup>&</sup>lt;sup>51</sup> Also see Hollien (1990), about voice in forensic contexts.

<sup>&</sup>lt;sup>52</sup> Kaye's (1995) *Science and the Detective: Selected Reading in Forensic Science* is a useful introduction. Lane, Tingey, and Tingey (1993) is a specialised encyclopaedia, but in a rather popularistic perspective. As to the *Encyclopedia of Forensic Sciences* (Siegel, Knupfer, & Saukko, 2000), its 1440 pages contain more than 200 articles.

<sup>&</sup>lt;sup>53</sup> Concerning forensic ballistics, http://en.wikipedia.org/wiki/Ballistics states the following: "In the field of forensic science, forensic ballistics is the science of analyzing firearm usage in crimes. It involves analysis of bullets and bullet impacts to determine the type. Rifling, which first made an appearance in the fifteenth century, is the process of making grooves in gun barrels that imparts a spin to the projectile for increased accuracy and range. Bullets fired from rifled weapons acquire a distinct signature of grooves, scratches, and indentations which are somewhat unique to the weapon used. The first firearms evidence identification can be traced back to England in 1835 when the unique markings on a bullet taken from a victim were matched with a bullet mold belonging to the suspect. When confronted with the damning evidence, the suspect confessed to the crime. The first court case involving firearms evidence took place in 1902 when a specific gun was proven to be the murder weapon. The expert in the case, Oliver Wendell Holmes, had read about firearm identification, and had a gunsmith test-fire the alleged murder weapon into a wad of cotton wool. A magnifying glass was used to match the bullet from the victim with the test bullet. Calvin Goddard, physician and ex-army officer, acquired data from all known gun manufacturers in order to develop a comprehensive database. With his partner, Charles Waite, he catalogued the results of test-firings from every type of handgun made by 12 manufacturers. Waite also invented the comparison microscope. With this instrument, two bullets could be laid adjacent to one another for comparative examination. In 1925 Goddard wrote an article for the Army Ordnance titled 'Forensic Ballistics' in which he described the use of the comparison microscope regarding firearms investigations. He is generally credited with the conception of the term 'forensic ballistics', though he later admitted

and Jamieson (2004) are important articles, proposing rational approaches to crime scene investigation. Dixon (1999) discusses police investigative procedures.

In situations which involve forensic scientists, sometimes human remains<sup>54</sup> are only an incomplete skeleton. Consider the problem of determining whether the person was a man or a woman. "The estimation of sex from skeletal remains is often difficult because of the great overlap of the ranges of the measurements between both sexes in general", in the words of Riepert, Drechsler, Schild, Nafe, and Mattern (1996, p. 140), a study whose "data from a large sample [being radiographs of the ankle] provide an objective basis for sex identification. The single measurement of the calcaneus length allows an estimation of sex with nearly 80% accuracy" (ibid.).

Sometimes, it is the identity of an object or other asset that is of interest; this, in turn, is amenable to the detection of the values of some attributes of the object, such as the owner, or geographic origin. To clarify the difference between (i) personal identification, (ii) the identification of attributes of a human individual other than one's unique identity as partly captured by one's full name, and (iii) the identification of attributes of an object other than ownership, consider such differences within the scope of the practice of one of the forensic disciplines: forensic entomology.<sup>55</sup>

Identifying a corpse is an example of (i), whereas identifying its whereabouts at death or shortly afterwards is an example of (ii). The latter is exemplified in the following quoted passage (Turner, 1987, p. 134), which, next, also illustrates (iii), concerning the geographic area of origin of a consignment of marijuana:

Human corpses, whether they have been produced naturally or as the result of foul play, are processed by [...] insect decomposers in the same way as any other piece of carrion. Forensic entomology is concerned with interpreting the insect evidence. This involves providing information about the time of death, and possibly changes in the location of the body based on a study of the insects present in the corpse when it is found. A good illustration of this is provided by a Russian case history (Arutyunov, 1963, in Keh, 1984). Living fly larvae found on a partially skeletonized body in a seawater tank were identified as species that are intolerant of salt-water. It was therefore deduced that the body had been dumped in the tank only a short time before it was discovered. The age of the larvae suggested death occurred about 2 weeks prior to the finding of the corpse. These observations were confirmed by the murderer's confession. The victim had been shot 2 weeks previously and then the body had been moved by car and put into the tank the day before it was discovered.

A detailed knowledge of insects, their habits, life histories and delectations have also been useful in solving less macabre forensic problems. In an interesting and well-publicized recent case [(Joyce, 1984)] the New Zealand police intercepted a large consignment of marijuana. When the usual chemical analyses failed to identify the source of the marijuana the consignment was examined for insects. The bodies of sixty insects were recovered and

it to be an inadequate name for the science. In 1929 the St. Valentine's Day Massacre led to the opening of the first independent scientific crime detection laboratory in the United States."

<sup>&</sup>lt;sup>54</sup> Boddington, Garland, and Janaway (1987) and Cox and Mays (2000) are at the interface with forensic osteology within forensic pathology. In Krogman and İşcan (1986), the topic is the human skeleton in forensic medicine.

<sup>&</sup>lt;sup>55</sup> Forensic entomology is the subject of Catts and Goff (1992), Catts and Haskell (1990), Keh (1984), Stærkeby (2002). An overview of forensic entomology is provided by Gail Anderson (2005, 2nd edn.; 2009, 3rd edn.).

from these entomologists were able to precisely pinpoint the origins of the marijuana to a region 200 km SW of Bangkok, near a stream or lake where fig trees and termites are found. As in the previous case the detailed entomological evidence was of paramount importance in convicting the suspects.

As seen, one of the areas of application of forensic entomology is in the service of *post mortem* analysis. Also related to the latter (within forensic pathology) – though not necessarily so, as there are other applications as well in criminal investigation – are techniques from the forensic analysis of soils and geological evidence: Junger (1996) set "to determine the discriminative qualities of the various procedures to discern at what point soils become indistinguishable from one another" (from the abstract).

One hundred samples were collected from three different sites; a beach, an island isolated by a river, and a bus parking lot. The samples were analysed using color determination, particle size distribution analysis and mineralogical profiles of the twenty-five most common soil minerals. Of the three hundred samples examined, over one-half could be discriminated by color alone, the remainder needing only particle size distributions analysis for differentiation, negating the need for lengthy mineralogical examinations (ibid.).

Moreover – cost being a factor in decision-making about how to analyse the evidence – these tests required only "very inexpensive equipment", and the calculations were not demanding in terms of either training or cost (ibid.). Cole and Ackland (1994) provide case studies in homicide investigation, in respect of forensic pathology, and in a British context.

In general on legal medicine, see, e.g., Schneider, Nagano, and Geserick (1994). Legal medicine's aims (not confined to perpetrator identification) include, e.g., problems hospitals are faced with, in care for the critically ill newborn. Clements (1994) is on forensic obstetrics, in respect of safety and liability for malpractice in British law. Clark and Crawford (1994) is on the history of legal medicine and of medical jurisprudence. Sometimes, veterinary surgeons act as witnesses (BVA, 1979).

And then, there is (human) forensic odontology, or forensic dentistry (Bowers, 2002; Glass, 2005, 3rd edn. 2009). Whereas the dentist who used to have a person in care may help in identification by means of stored X-ray items, there is, as well, a different kind of application: "Bite marks left on human tissue and bitten material have become an important aspect of scientific evidence used for the conviction or acquittal of a suspect", to say it with the abstract of Nambiar, Bridges, and Brown (1995), where use of a computer program for shape analysis is described.

Forensic chemistry and toxicology,<sup>56</sup> while sometimes resorted to in relation to forensic medicine, have a wider range of applications. In general, note that particular classes of techniques find disparate applications in the forensic sciences. Bob Ardrey (1994) is concerned with mass spectrometry, for such purposes. Or, then, consider chromatographic analysis; Ian Tebbett (1992) is concerned with gas chromatography in forensic science.

<sup>&</sup>lt;sup>56</sup> See Molina's (2009) *Handbook of Forensic Toxicology for Medical Examiners;* as well as, e.g., Pardue (1994), Cone and Deyl (1992).

Ukpabi and Peltron (1995) provide a review of the use of the scanning electron microscope is made in order to identify the cause of fibre damage, for application within "forensic textiles" (*sic*) as being an area of textile studies.<sup>57</sup> Trace evidence analysis is discussed in Deedrick (2001) concerning fabric processing, and in Ballou (2001) on fibre from wigs. Biermann and Grieve (1996) reported about a database of mail order garments and its statistical evaluation, for the forensic purpose of estimating the frequency of fibre types found in clothing. But see in Section 8.3.2.

## 8.3.2 Statistics Comes into the Picture

At the end of Section 8.3.1, we mentioned textile fibre types and their frequency as found in clothing. Allen and Pardo (2007a, pp. 116–119) offered a critique, in terms of the *reference-class problem* (see Section 2.4 above) of how probability theory was applied to juridical proof concerning carpet fibres in Finkelstein and Levin (2003). The problem, Allen and Pardo claim (2007a, pp. 117–118),

arises from an ambiguity in the sentence, "Based on manufacturing records, an expert testifies the frequency of such fibers in carpets is less than 1 in 500." What does this mean? Whose records? Which records? Does the statistic refer to those who make a particular kind of carpet, or all U.S. manufacturers, or all manufacturers in the world? Or all carpets ever made in the history of the world to date? And once we know the class to which it applies, why is this the appropriate class in which to place Jones [a suspect, a neighbour of where a crime was perpetrated] and his carpet sample [i.e., carpet fibres taken from Jones's house, and matching an unusual carpet fibre found at the scene]? Is the fiber more or less prevalent in his part of the world, country, state, region, age group, gender, profession, socioeconomic class, and so on? Each of the different classes suggested by these questions would reveal different probabilities and likelihood ratios, but the evidence under consideration has not changed. Indeed, the evidence would likely have widely varying likelihood ratios. The probative value of the evidence cannot be simply the ratio derived from any arbitrarily chosen reference class. [...] A second problem with their conclusions concerns how the fiber evidence connects with other evidence.

In fact, had there been the case that there is (ibid., p. 119)

conclusive evidence that the crime scene fiber had been planted after the fact to frame Jones would reduce the value of the fiber evidence to zero. Even if we have no evidence about this possibility, how do we know that it was brought from the suspect's home? Even if it was, how do we know that it was from carpeting in his home rather than, say, from having been picked up on the shoes of the actual perpetrator when he was at a party at the home of the person wrongly accused of the crime? These possibilities further show the disjunct between the value of evidence, on one hand, and the likelihood ratio calculated on the basis of a specified reference class, on the other. [... T]here may be no data for other plausible reference classes, which means that the mathematics can be done only by picking these or some variant. [...] Using the data one has does not kake the proffered analysis correct or true in some sense; instead, it is reminescent of relying on the lamppost more for support than illumination.

<sup>&</sup>lt;sup>57</sup> Those authors themselves were affiliated with the Department of Clothing and Textiles, at the Faculty of Human Ecology of the University of Manitoba in Winnipeg, Canada.

Statistics turns up in a multitude of contexts from forensic science. Actually, application in legal contexts dates back from the early modern period.<sup>58</sup> "Legal applications of probabilistic and statistical reasoning have a long history, having exercised such pioneers as Nicolas Bernoulli, Condorcet, Laplace, Poisson and Cournot (Zabell, 1988). After a period of neglect interest has resurfaced in recent years, and the topic has given rise to many challenging problems" (Mortera & Dawid, 2006).

Many pioneers of probability and statistics, including the Bernoullis, Condorcet, Laplace, Poisson and Cournot, were motivated by problems of quantification and combination of legal evidence and judgement. But the trail they blazed became disused and overgrown as statisticians lost interest in such questions while legal evidence scholars confined themselves to issues of admissibility, precedent and other such formal rules, paying remarkably little attention to problems of interpretation. Very occasionally some aspect of statistical evidence or argument would break surface – significant legal cases include the 1865 Howland will case and the 1894 Dreyfus case – but it was not until the 1968 Californian case of People v. Collins, in which the prosecution presented a fallacious statistical argument in an attempt to magnify the impact of eye-witness identification evidence, that the issues became subject to serious discussion and argument. This stimulated what became known in the academic legal community as "the new evidence scholarship" [...] The probabilities debate remained academic until 1985 when, with the advent of DNA profiling and its numerical "random match probabilities", presentation of, and argument about, statistical evidence of various kinds started to become much more common in the courts (Dawid, 2004b).

Dawid and Mortera (1994) suggest a reason for the delay in the actual emergence of statistics in court: "The infamous trial *People v. Collins* (1975) was one of the first cases where statistical analysis of evidence was made. Unfortunately the analysis was so poor that it set back the introduction of statistical evidence in court for many years" (ibid., p. 2).<sup>59</sup>

A critic of Bayesianism in judiciary contexts, Ron Allen remarked about probability levels (Allen, 2008a, p. 320):

The equally obvious probabilistic interpretation to give to these numbers is that they are relative frequencies, as propensity and classical accounts are plainly inapposite. That raises an immediate difficulty because virtually never is the data presented at trial in relative frequency formats, and even when it is (DNA evidence, good statistical evidence of disparate treatment), it must be combined with evidence that is not ("The defendant raped me", "I was treated in a way that people with different skin color were not").

Allen (2008a, pp. 320–321) proceeded to claim:

The solution to this probelm appears equally obvious: subjective Bayesianism. One can translate impressions about evidence into subjective beliefs and then compute posterior probabilities in the light of new evidence. This not only maintains consistency among belief states, but has the added advantage of seeming to approximate what trials seem to be about, which is updating beliefs in the light of new evidence. Yet another advantage of

<sup>&</sup>lt;sup>58</sup> See on this Nissan (2001b), reviewing Rosoni (1995).

<sup>&</sup>lt;sup>59</sup> In the context of forensic science, see the book on Bayesian networks by Taroni et al. (2006), Aitken (1995), Aitken and Taroni (2004), Robertson and Vignaux (1995). An introduction to statistics for forensic scientists was authored by David Lucy (2005).

this approach is that it provides an answer to other important questions such as the meaning of relevance, prejudice, and probative value. "Relevance" means a likelihood ratio of anything other than 1:1; "prejudice" means that the evidence is likely to affect the rationality of appraising the likelihood ratio, and "probative value" means how far from a 1:1 ration the likelihood ratio is.

And yet: "I believe it is wrong allo the way down, from the most general questions of the basic structure of proof at trial to the most detailed question of the probative value of discrete pieces of evidence" (ibid., p. 321). In the rest of that paper, and in much of his published *oeuvre*, Allen shows why. His arguments are cogent, and cannot be safely ignored. We have given more space to them in other places throughout this book. At any rate, there is a raging controversy between those endorsing probabilisitc accounts of judicial proof, and those opposing that kind of approach. Computing scientists turning to modelling legal evidence can only ignore the controversy at their risk and peril.

Gastwirth and Miao (2009), concerned with race discrimination in employment practices, provided a statistical analysis of the data in disparate impact cases from the United States. They took issue with the specific rationale behind a court ruling, petitioners' brief, and respondent's brief. The petitioners were claiming reverse discrimination at a Fire Department after an examination was cancelled. Baldus and Cole (1980) is a book on statistical proof of discrimination.

David Kaye (1982) was concerned with statistical evidence of unlawful discrimination of various kinds: discrimination in *ad hoc* decision making, discrimination in the application of a rule, discrimination in the formulation of a rule, and discrimination in the operation of a rule. Michael Finkelstein (1980) discussed the judicial reception of multiple regression studies in race and sex discrimination cases. Kaye (1982, pp. 775–776) was especially concerned with

how statistical proof fits into discrimination litigation in two areas in which such evidence commonly is employed. The courts have relied heavily on statistical evidence in cases in which a criminal defendant alleges that he was indicted by an unconstitutionally selected grand jury or an unconstitutionally empanelled petit jury (Finkelstein, 1978, pp. 18–58). In essence, a claim of disparate treatment is presented, and statistical analysis of the pattern of selection is therefore appropriate. There is no constitutionally per-missible basis for systematically excluding, say, members of defendant's race from the population of citizens who are eligible for jury duty. Where direct evidence of dis-crimination is unavailable, statistical methods have been pressed into service.

#### Writing in 1980, Kaye concluded that, among the other things (1982, p. 782–783):

The courts tend to adopt a fairly realistic attitude to-ward such matters as defining the relevant population, and recent opinions reveal increasing awareness of classical hypothesis testing in evaluating measured differences. However, the process of drawing a conclusion for legal purposes entails an integration of statistical and non-quantitative information, making classical hypothesis testing inapposite to factfinding in litigation. A full-fledged Bayesian analysis of the probability of discrimination is theoretically more satisfying but is too controversial and, in a sense, too powerful to have much chance of becoming judicially accepted and of contributing to accurate decision making by judges or juries. Presenta-tion of the likelihood function avoids the objections to Bayesian inference, but a more mundane calculation of the probability that an observed difference would arise in the absence of discrimination might be more easily comprehended by a court. Such a calculation should be the starting point for any formal analysis, and consideration should be given to supplementing this calculation with fuller presentations, such as displays of prediction intervals and likelihood functions.

Houck (1999) discussed statistics in relation to trace evidence. "The inability to place a specific probability estimate on chance association has led to a widespread view that trace evidence is much weaker than DNA evidence, a problem which has been referred to as "the tyranny of numbers" [(Houck, 1999)].

However, as noted by Houck (1999, p. 3), "the tyranny of numbers is a consequence of an over-reliance on deduction and mathematics, and these ultimately limit a discipline by requiring it to fit in a preordained model. [...]" Bayesian statistical approaches have become popular in many branches of forensic science in recent years" (Pye, 2006, pp. 24–25). Pye further remarks (ibid., p. 25):

Quantitative methods, including formal hypothesis testing, clearly have an important role to play in the assessment of all forms of trace evidence, but they can rarely provide a complete answer. Issues of "uniqueness", "rarity", "randomness" and "representativeness" in relation to trace evidence are usually difficult to quantify in an exact mathematical or meaningful statistical way. Statistical estimates of frequency of occurrence are usually context-dependent, based on the extent and timing of any sampling carried out, and on the methods used for sample collection and data analysis.

As pointed out by Houck (1999), "context, is in fact, the crucial component to a proper grasp of the significance of trace evidence. Without context, we are communicating mere facts with no foundation of meaning, much in the way Poincar[é]'s pile of stones is not a house". The existence of a suitable context for the evaluation of the significance of trace evidence depends partly on the experience/knowledge of the trace evidence examiner, the availability of database information relating to the materials under examination, and the willingness of those instructing the forensic examiner to provide relevant information relating to the circumstances of the case. The examiner is not always provided with information which may have an important bearing on the assessment of the *evidential value* of the scientific findings. Partly for this reason, the examiner should, normally restrict his/her assessment to the likely *scientific significance* of any apparent similarity. The wider issue of evidential significance is more properly a matter for the court. Over the past fifteen years there have been great improvements.

Richard Overill and Jantje Silomon devoted a paper (2010) to what they term *digital metaforensics*, i.e., "quantifying the investigation" into digital crime cases (cf. Section 4.3.4 above). Their article, in line with those authors' record of research, resorts to statistics, and concerns (ibid., from the abstract):

two related areas of digital forensics. The first involves quantifying the extent to which the recovered digital evidential traces support the prosecution's contention that a particular digital crime has been committed. The second addresses the issue of quantifying the cost-effectiveness of the digital forensic investigative process, in order to optimise the deployment of valuable and scarce resources for maximum efficacy.

Their thrust is to provide metrics that would appear to be more precise than such qualitative statements as "very likely".

Not surprisingly, defence lawyers assigned to digital crime cases have become aware of this discrepancy and have attempted to exploit it to persuade the court that the prosecution does not possess evidence of sufficient probative value. However, the development of potentially

suitable methodologies and techniques for the quantitative interpretation of digital forensic investigations is underway [...] and offers the prospect of bringing a degree of numerical certitude to the recovered evidence in such cases.

It remains to be seen whether this is not merely an illusion. The skeptics concerning Bayesianism in a judicial context may point out that merely quantifying does not ensure that the quantification, apart from sounding grand, is also credible for good reason.

### 8.3.3 Some More Forensic Disciplines

Apart from subserving legal medicine, forensic toxicology is also involved in environmental poisoning (Sigmund, 1995). Other forensic disciplines are concerned with the environment; such is the case of forensic engineering for environmental cases (Shuirman & Slosson, 1992), or, then, of forensic economics as applied to the liability for environmental damages, caused by hazardous substances pollution.<sup>60</sup> When it comes to engineering, there are fields of application (other than assessment of environmental damage) which correspond to subareas of expertise within forensic engineering. Forensic engineering may be in the realm of civil engineering (in cases of structure collapse), or, for example, automotive engineering.<sup>61</sup> There is a role, in court, for computer-aided accident reconstruction (Bohan, 1991). Johnson (1985) was concerned with the (mis)interpretation of the causes of motorcycles collision vis-à-vis driver behaviour.<sup>62</sup> A car crash involves impact. Another kind of impact is involved in forensic ballistics.<sup>63</sup>

William Bodziak published (2000) the book *Footwear Impression Evidence*. He also provided an overview of forensic footwear evidence in the form of a book chapter (2005b), preceded by a chapter (Bodziak, 2005a) concerning vehicles, namely, about forensic tire impression and tire track evidence. Let us consider the Wikipedia entry<sup>64</sup> for "Forensic footwear evidence". The incentive to resort to such expertise is

<sup>&</sup>lt;sup>60</sup> Ward and Duffield (1992) is in a U.S. perspective.

<sup>&</sup>lt;sup>61</sup> Within automotive engineering, Peters and Peters (1994) is relevant for U.S. law.

<sup>&</sup>lt;sup>62</sup> Also see José Almirall's paper (2001), "Manslaughter Caused by a Hit-and-Run: Glass as Evidence of Association".

<sup>&</sup>lt;sup>63</sup> Sellier and Kneubuehl (1994) is in forensic ballistics, in a medical context.

<sup>&</sup>lt;sup>64</sup> It is remarkable that there are concise, yet valuable introductions to various forensic science disciplines, posted as entries on Wikipedia. These include a general entry "Forensic science"; various entries from the physiological sciences ("Forensic pathology", "Forensic dentistry", "Forensic anthropology", "Forensic entomology"); entries with affinity to the social sciences ("Forensic psychology", "Forensic psychiatry"); entries in other specdialisations ("Fingerprint analysis", "Forensic accounting", "Ballistics", "Bloodstain pattern analysis", "DNA analysis", "Forensic toxicology", "Forensic footwear evidence", "Questioned document examination", "Explosion analysis"); entries on cybertechnology in forensics ("Information forensics", "Computer forensics"); entries related to engineering ("Forensic engineering", "Fire investigation", "Vehicular accident reconstruction"); entries on people in forensics ("Edmond Locard", "Bill Bass"); and related articles ("Crime scene", "CSI effect", "Trace evidence"). For all of these, see

because of the availability of footprints. The problem is that how strong the evidence is is questionable. The same entry admits: "The Unabomber, Theodore Kaczynski, was known to keep shoes with smaller soles attached to the base in order to confuse investigators about the size of the suspects."<sup>65</sup> The introduction to a Wikipedia entry for "Forensic footwear evidence"<sup>66</sup> reads as follows:

*Forensic footwear examination* is the study of footwear impressions evidence created. Such evidence is used in legal proceedings to determine the identities of persons at the crime scene. Footwear evidence is often the most abundant form of evidence at a crime scene and in some cases can prove to be as specific as a fingerprint. Initially investigators will look to identify the make and model of the shoe or trainer which made an impression. This can be done visually or by comparison with evidence in a database both methods focus heavily on pattern recognition and brand or logo marks. Information about the owner of any footwear can be gained from the analysis of wear patterns which are dependent on angle of footfall and weight distribution. Detailed examination of footwear impressions can help to link a specific piece of footwear to a footwear imprint as each shoe will have unique wear charateristics.

Perhaps the value of such evidence is especially for excluding suspects. Many people can be expected to wear shoes of the same model and size. Nevertheless, the shoe itself may be available, and more solid evidence can be obtained from it, for identifying the person who was wearing it: *"Footwear insole imprints* are imprints left in the inside of footwear caused by contact from the person's foot. Analysis of the insole imprints can be used to link a person(s) to a piece of footwear." Moreover:

*Footwear trace evidence* is trace evidence that is recovered from footwear. Types of trace evidence that could be recovered include skin, glass fragments, body hair, fibres from clothing or carpets, soil particles, dust and bodily fluids. The study of this trace evidence could be used to link a piece of footwear to a location or owner.

For our present purposes, it is interesting that information technology is helpful in the form of *footwear databases:* 

Forensic investigators can use computerized footwear databases to quickly compare the class characteristics between footwear impression and outsole profile of footwear outsoles stored in the database. This greatly reduced the time required to match shoeprint to. Examples include the Footwear Intelligence Technology (FIT) launched by the Forensic Science Service (FSS) in February 2007. Such systems contains information on thousands of footwear patterns with daily updates from both manufacturers and police forces.

A team at the University of Buffalo led by Sargur Srihari reported (Ramakrishnan, Malgireddy, & Srihari, 2008; Ramakrishnan & Srihari, 2008) about shoe-print extraction from latent images, by resorting to *conditional random fields*.

http://en.wikipedia.org/wiki/ followed with the name of the entries, with each blank space replaced with an underscore.

 $<sup>^{65}</sup>$  Don Foster's stylometric analysis (see Foster, 2001, chapter 3) was important for identifying the Unabomber. Also the latter's sister-in-law, a professor of philosophy came to believe she knew he was the Unabomber because of what he wrote and the way he wrote. See in Section 6.1.10, and in fn. 94 in Chapter 6 in particular.

<sup>&</sup>lt;sup>66</sup> http://en.wikipedia.org/wiki/Forensic\_footwear\_evidence.

Let us turn to a few other specialties. If real estate is involved in a case, this may concern situations where a structure did or may collapse, or where there was a fire and structural engineering and fire simulation experts need investigate (either concerning negligence, or arson).<sup>67</sup> Their models in fire simulation within a building are in *computational fluid dynamics*. In less dramatic circumstances involving real estate, surveyors may testify as expert witnesses in court (Clarke, 1985; Watson, 1975).

*Forensic accounting* (e.g., for *fraud investigation*) is specialised per countries: see Lemar and Chilvers (1995) for Britain; Frank, Wagner, and Weil (1994) and Bologna and Lindquist (1995) for the U.S.A.; and Zier (1993) for Canada. The Wikipedia entry<sup>68</sup> remarks in the introduction:

*Forensic Accounting* is the specialty practice area of accounting that describes engagements that result from actual or anticipated disputes or litigation. "Forensic" means "suitable for use in a court of law", and it is to that standard and potential outcome that Forensic Accountants generally have to work. *Forensic Accountants*, also referred to as *Forensic Auditors* or *Investigative Auditors*, often have to give expert evidence at the eventual trial. All of the larger accounting firms, as well as many medium-sized and boutique firms, have specialist Forensic Accounting departments. Within these groups, there may be further subspecializations: some Forensic Accountants may, for example, just specialize in insurance claims, personal injury claims, fraud, construction, or royalty audits.

We have already seen how link analysis and data mining have been put to good use in order to uncover frauds: by mining email databases in the Enron case

<sup>&</sup>lt;sup>67</sup> As http://en.wikipedia.org/wiki/Fire\_investigation points out: "Fire investigation is one of the most difficult of the forensic sciences to practice. In most forensic disciplines, even the basic question of whether a crime has been committed is normally obvious. During a fire investigation, an entire process must be undertaken just to determine if the case involves arson or not. The difficulty of determining whether an arson fire has occurred or not arises because fires destroy evidence. A fire investigator looks at what is left behind after a fire and obtains information to piece together the events that occurred in the moments leading up to the fire. One of the challenging aspects of fire investigation is the multi-disciplinary base of the investigator's job. Fires can be caused by or involve most things people see or use. For this reason, fire investigators need to know not only basic science of fire behavior, but knowledge of many different areas of study (including construction, electricity, human behaviour, vehicles etc.) is helpful. If the fire origin has, for example, a gas appliance, an investigator should know enough about appliances to either include or exclude it as a possible cause of the fire. Fire investigators must also know their own limitations and call upon experts to assist when needed. Accordingly, fire investigators sometimes work with forensic electrical engineers (when examining electrical appliances, household wiring, etc.) or others skilled in forensic engineering (gas-powered appliances, air handling equipment, gas delivery systems, etc.)." Concerning certification of the experts, the same entry explains: "In the USA, some states require that fire investigators obtain certification as a Certified Fire Investigator (CFI). The International Association of Arson Investigators, a professional group of fire investigators, grants CFI certification. The National Association of Fire Investigators (NAFI), a professional association of fire and explosion investigators, offer several National Board Certified fire investigation certifications, including Certified Fire and Explosion Investigatior (CFEI), Certified Vehicle Fire Investigator (CVFI), and Certified Fire Investigation Instructor (CFII). For more information, please visit their website at http://www.nafi.org."

<sup>&</sup>lt;sup>68</sup> http://en.wikipedia.org/wiki/Forensic\_Accounting.

(Section 6.2.1), by trying to identify fraudsters and accomplices at online auction sites (Section 6.2.3), the U.S. Federal Defense Financial Accounting Service's EDS project (Section 6.2.6), and the tool for detecting fuel frauds developed in Poland (Section 6.2.8). The latter project is a case in point for how conventional forensic accounting is in practice powerless when faced with very complex flows of transactions, unless use is made of link analysis or data mining technology.

# 8.4 The Contribution to Forensic Science of Anthropology and Archaeology

## 8.4.1 Forensic Archaeology and Anthropology

Some interdisciplinary interfacing of forensics sometimes occurs with kinds of reconstruction other than forensic; for example, forensic archaeology applies techniques from archaeology to criminal investigation.<sup>69</sup> Forensic archaeology applies techniques from archaeology to criminal investigation: see Hunter et al. (1997). The following is quoted from a call for participation in a workshop on Archaeology and Forensic Science, held at the British Academy in London on 27 February 2007, in concomitance with the Council for British Archaeology's 2007 Winter General Meeting.

Forensic archaeology is a relatively new concept in Britain and these presentations explore how archaeology in its many facets has developed from its traditional roots into the arena of criminal investigation. As these talks show, this is mostly, but not exclusively, concerned with searching for and excavating clandestine graves, including mass graves. Search involves systematic sequencing of various techniques including the use of aerial imaging, geophysical survey, as well as cadaver dogs but, unlike more traditional archaeology, is affected by the decay dynamic of buried human remains. Recovering modern buried human remains also poses problems in that the type of evidence needed can be very different from the evidence archaeologists and anthropologists normally identify. It also needs to be obtained within the constraints of a novel legal framework and presented in court. These issues are pursued and, using case studies, a number of different scenarios are outlined which detail the different methodologies used in excavation and the different types of evidence – archaeological, anthropological and environmental – that could be used to obtain a successful conviction.

The titles of the talks are indicative of how disciplines meet within forensic archaeology: "Archaeology and the crime scene", "Physical anthropology: forensic identification, trauma and case studies", "Geophysics: divergence, human decay dynamics and case studies", "Applications of ecology, botany, and palynology to criminal investigation". *Palynology* (see Section 8.5.5 below) is the study of pollen, in respect of morphology, biochemistry, and biogeography. The public consisted of archaeologists: active, retired, or students.

<sup>&</sup>lt;sup>69</sup> See Hunter et al. (1997).

Even though the quotation given earlier states that forensic archaeology is rather new in Britain, it must be said that whereas in the United States, forensic science is strong in physical anthropology, apparently Britain is ahead in other disciplines for forensic identification (including of human remains), that are grounded in forensic archaeology. Various scientific disciplines contribute techniques to archaeology, and experts conversants with both archaeology and forensics find more rigour within the former disciplinary tradition, which has much to contribute to forensics.

In the rest of this chapter, as well as in Sections 8.4.2, 8.5.2, and 8.5.5, I am going to provide information from notes I took at the 2007 London workshop referred to. John Hunter of the University of Birmingham is an archaeologist who moved into forensic archaeology, and (like the other speakers from the workshop) assists the police and appears in court as an expert witness. He started his talk by dispelling the misconception that forensic archaeology (i.e., archaeology used in forensic environments) is forensic science used in archaeology.

Around a serious crime event, the incident is attended to by an array of professionals: the scene of crime officer, the senior investigating officer, the coroner, the Home Office pathologist, the Forensic Science Service, the scientific support manager, the Crown Prosecution Service, and others.

A common ground fo archaeology and forensic science is the search and recovery of human remains, skeletal analysis, and analytical science. Key divergences include: the timeframe of operation (archaeologists choose when going out, whereas a police investigation cannot be deferred, e.g., because of bad weather), hierarchies (Hunter referred to himself as being quite powerful within his archaeological team, whereas when he is called to assist the police, or is called to testify in court, the mutual positioning is different), a two-way knowledge base (which is not the case of archaeological practice), legal constraints (on disclosure), the role of the expert witness (as opposed to an archaeologist addressing scholars), and "publication" to a jury (as opposed to a peer-reviewed journal).

Concerning appearing in court as an expert witness, Hunter (like another speaker on the same day) pointed out that whereas one usually thinks about trials in terms of justice being done, actually trials are games, and the barrister who has been most persuasive, wins. It is the task of the barrister of the other side to try to ruin your professional reputation as an expert witness.

Moreover, unlike archaeology, forensic archaeology deals with the recent dead and the living. When dealing with graves, in archaeology it is necessary to distinguish between context and non-context. In contrast, in forensic archaeology is is necessary to distinguish between context and contamination. Preserving the integrity of the grave can facilitate finding out about identity, cause and manner of death, and the interval since death. Have the remains *been* buried (by somebody), or have they *become* buried? A buried body may cause different types of vegetation change: the vegetation is different from the surroundings, for example, either higher, or lower. It is lower on the grave than surrounding vegetation, is the grave was originally covered with stones. Apart from the vegetation change, there also is a topographic change. There can be expected to be a disturbance caused by body remains. There may be linkage between sites. The cues on (or in) the terrain may be artefactual, ecological, or ecofactual (e.g., intrusive vegetation).

There is a window of opportunity that should not be lost, when the police is looking for a body after a death presumed to be recent. After three weeks from death, the body is decaying, and this continues for other three weeks, during which the body is emitting temperature. Thermal imaging in order to find out a burial, when there has been a crime, needs to exploit that window of opportunity. Non-invasive imaging techniques are available, and recommended. The more invasive a forensic technique, the greater the risk of losing forensic evidence, because of various reasons. A non-invasive imaging technique can reconstruct the volume and shape (inside the ground) of a mass grave: how deep it is, how long, and so forth. This can be visualised by computer in three dimensions, as a volumetric model, and animated (by having the system of reference with the three axes rotate). The same example was made during the same workshop by Cheetam, in a talk about the forensic and archaeological application of survey methods from geophysics; the given volumetric model was developed by applying a technique that measures earth resistivity (see in Section 8.5.2 below).

Hunter pointed out that the search for a grave may have a positive outcome, i.e., recovery, or a negative outcome, i.e., elimination. It may be a search concerning a recent incident, with a named victim, with a suspect being identified, and with an unknown disposal site, yet with the body remains being recovered. Or then it may be an old incident, with no name to the victim, with no suspect, but with a specific location. An example of the latter kind of situation is the case of a witness who reports seeing (or that a relative had seen), thirty years before, a child being buried at a specific location. This is a more usual kind of intelligence.

When searching for a grave, there are distinctions to be made concerning spatial scope. It may be a search in the backgarden of a given urban house, using imaging techniques from geophysics. Or then, the scope may be broader, and aerophotography may be resorted to. It is only if and once the remains *are* found, that one can look into the matter and say whether there was a murder or not. Questions proper to ask include: How was the grave dug? Was it dug in a hurry, or carefully prepared? Is there foreign material in the grave? Did the perpetrator leave any traces in or around the grave? The grave is a very rich source of material. There is a pattern to how people tend to dispose of bodies. They tend to dispose of bodies in places they know. The expert in court only gives information. It is the barrister's task to interpret. For example, the expert may say whether the material taken out of the grave was taken off site, or whether the material found in the grave was put there from on-site or off-site.

*Taphonomics* studies decay. Analysis in taphonomics interacts with other disciplines. The expert is likely to ask the entomologist, the climatologist, and so forth. One of the examples illustrated by Hunter was a mass grave excavation, showing depositional events and taphonomic variables. One may find commingled, saponified remains. An important notion is joints: fifteen main points on the body. As mentioned earlier, a computer-generated section of the mass grave can be visualised

in three dimensions and rotated (actually, such imaging matters because it delimits the outer contour of the mass grave).

## 8.4.2 Factors Involved in Forensic Anthropology

#### 8.4.2.1 Preliminaries

The second lecture at the workshop on Archaeology and Forensic Science, held at the British Academy in London on 27 February 2007, was given by forensic archaeologist and anthropologist Corinne Duhig, affiliated with Anglia Ruskin University and with Wolfson College of the University of Cambridge, and a consultant for "Gone to Earth", a small firm (with three consultants in all, operating individually in the whole of Britain). The logo of "Gone to Earth is the profile of a fox excavating a bone. Actually, scavengers such as foxes (and crows) disturb burials and sometimes cause remains to be uncovered. It must be said that in Britain there is a policy different from policies from the Continent concerning foxes: as there is no rabies in the country, foxes are not systematically culled. Foxes are frequent in urban backgardens. (What they do to your garden may prompt unprinted expletives.)

By the late 2000s, body remains (even ancient) are more likely to be reported in the United Kingdom that it used to be a few decades ago. The forensic anthropologist's<sup>70</sup> (and apparently Duhig's own) breakdown of casework by type is: ca. 75% non-forensic (non human, or archaeological), the rest being forensic (homicide, suicide, misadventure, or open), or "other". Physical anthropology as applied to forensic identification, trauma and case studies, is different from physical anthropology as done in mainstream archaeology. The role of the forensic anthropologist is search and excavation, assistance to the Home Office Pathologist (who by the late 2000s has been more receptive to the anthropologists than, say, twenty years earlier), defleshing and reconstruction (a body still with soft tissue is reduced by the anthropologist to a skeleton, and then rebuilding is carried out; in archaeology, too, there is cleaning and rebuilding, but of course there is no recent soft tissue).

Then the anthropologist develops an anthropological profile for identification. A lot of it is exclusion; for example, the pathologist is notified by the anthropologist that the body does not match the profile. Other tasks of the anthropologist include skeletal trauma mapping, sequencing and interpretation, and taphonomic interpretation.<sup>71</sup> The remains may be fresh, or decomposing, or fully skeletonised, or burnt, or cremated (usually perpetrators don't know how to cremate well), or disrupted (e.g., because of a road accident, or an airplane crash), of dismembered (which was deliberately done by a perpetrator), or processed (by a perpetrator, to make the remains less identifiable).

<sup>&</sup>lt;sup>70</sup> Marcella Sorg (2005; 3rd edn. 2009) provides an overview of *forensic anthropology*.

<sup>&</sup>lt;sup>71</sup> William Haglund (2005; 3rd edn. 2009) provides an overview of *forensic taphonomy*, which is about burial.

The Big Four of identification are: ethnology, sex, age, and stature. Ethnology for the forensic anthropologist at present in the United Kingdom involves a greater range than archaeologically (as, e.g., now there are people from South Asia, the Far East, and sub-Saharan Africa in the country, and that wasn't the case in antiquity or the early Middle Ages). It is concerning the identification of sex and age, that anthropologists are most useful to the police. Homicide demographics involve mainly young adult males. This is very different from archaeological remains. As to stature, one ought to bear in mind two things:

- (a) informant error, as people quite frequently overestimate the height of others, and moreover (especially males) their own stature;
- (b) size for postulated activity, e.g., a required limb length to do something: the forensic anthropologist has to work out from length and angulation of limbs, whether it is possible for the given person to have done a given activity, e.g., movement. Could that child have extended an arm and picked up that given thing?

# 8.4.2.2 Ante-mortem Skeletal Pathology, and Para-, Peri-, and Post-mortem Traumas

As explained by Corinne Duhig in the same lecture, the identification of a person from body remains involves various factors. It depends on reliable record or recollection of informants, as well as preservation in remains. For *ante-mortem skeletal pathology*, the range of values includes: life-history trauma (battery, torture); evidential trauma; and non-trauma. Identification as based on preservation in remains also depends on epigenetic/non-metric traits (e.g., dental variables can be extremely variable); on body build (degree of muscularity: it depends on how much tissue you have, in the available remains); on handedness (was that person left-handed?); and on shoe size (the latter is something that is not asked in archaeology).

Let us turn to "*para-mortem*" *trauma*. This is a term invented by Duhig herself. Identifying para-mortem trauma properly has important implications at a criminal trial. Violence may have been directed at a person alive or perceived to be alive, or, in contrast, at or close to the time of death. Violence may have been for the purpose of homicide or suicide, or of causing pain, or of mutilation. Injuries may have been produced by blunt weapons, or by sharp weapons, or by projectiles. The latter, in turn, may include, e.g., bomb fragments. Moreover, para-mortem trauma may have resulted from accidental injury and death (e.g., in an air crash). Forensic anthropologists do not have the responsibility for determining the type of death.

Types of para-mortem trauma include: blunt trauma, sharp-weapon trauma, and projectile wounds. In particular, blunt trauma (which is involved, e.g., in crimes of passion) may be: simple depressed fracture of skull; various crushed features of skull; or fracture of the post-cranial skeleton (i.e., of the skeleton other than the skull). Kinds of post-cranial fracture importantly include defence injury to a forearm (as a person under physical attack usually rises the forearms to protect him- or herself). Sharp-weapon trauma consists of incisions. These may be stab wounds (which tend to be on the edge of ribs), or cut/slash wounds. The latter often are superficial; they are common in accidents. As to projectile wounds, they may be entry wounds (more regular; if in the skull); or exit wounds (less regular, larger; if in the skull). Small calibre projectiles often stay in, and have no exit, so there would be an entry wound, but no corresponding exit wound. Holes in the skull, which in a forensic context are identified as projectile wounds, if found in archaeological remains instead, at first sight may be believed to be due to the skull being damaged because of defective preservation. For the forensic anthropologist analysing paramortem trauma, it is important to determine *wound sequencing*, i.e., the direction and sequencing of wounds. May I add that this is interesting in view of *models of time* from artificial intelligence or, more broadly speaking, from computer science (see Section 8.4.2.3). Constraints preclude some candidate sequencing. This could be a promising direction for computer application to forensic anthropology.

Having dealt, with *para-mortem trauma*, let us turn to *peri-mortem trauma*. This concerns early decomposition stages. It also concerns violence directed at a body: dismemberment, defleshing, and so forth, as having been carried out by a perpetrator. It is also of interest to determine for which purpose, such violence directed at a dead body was carried out. And finally, there is *post-mortem trauma*. It concerns later decomposition stages. Post-mortem trauma may be due to human activity (accidental disturbance, or second burial), or to animal activity (damage, scattering), and so forth. Peri-mortem and post-mortem processing wounds include, e.g., cutting by blades or by saws, for the purpose of dismemberment.

#### 8.4.2.3 A Digression on Formal Models of Time

An important class of temporal representations from artificial intelligence is such methods that are based on variants of *temporal logic*. We are not referring to formal representations of tense in natural language. Temporal logics are independent of natural language, and therefore are not directly concerned with tense. Temporal logics as used in artificial intelligence<sup>72</sup> were introduced by Allen (1983b, 1984, 1991),<sup>73</sup> and originally were only concerned with intervals (by means of an *interval calculus*, rather than with time points. Temporal logics have been used, for example,

<sup>&</sup>lt;sup>72</sup> Within artificial intelligence, see e.g. Shoham and McDermott (1988) about temporal reasoning.

<sup>&</sup>lt;sup>73</sup> A useful online survey of temporal logic is Galton (2008). van Benthem (1995) is more detailed and more technical; whereas van Benthem (1983, 2nd edn. 1991) is a book on temporal logic. Fisher, Gabbay, and Vila (2005) is a handbook. Cf. Antony Galton's book (1987) and critique (1990) of James Allen's *theory of action and time*. Also consider Alur, Henzinger, Kupferman (2002) *alternating-time temporal logic*, which eventually gave rise to Wooldridge and van der Hoek's (2005) *Action-based Alternating Transition Systems (AATS)*, used by Bex et al. (2009) in order to represent reasoning about the narrative of an alleged crime (see Section 3.4.4.4 in this book).

Surveying the broader context of kinds of temporal representations, Fabio Alberto Schreiber explains (1994, section 3): "In the logicians' community there is a strong debate on the need of creating a non standard *Temporal Logic*. Scholars having mathematical and physical background and interests claim that times can be designated by terms in a first order theory, which is more

for tasks in engineering (e.g., Knight, Ma, & Nissan, 1999). In James Allen's interval calculus, there is a composition table of basic interval-to-interval relations, e.g., if they contain each other, or partly overlap. That approach to qualitative reasoning about time inspired Tony Cohn's approach to qualitative reasoning about space. It is based on Clarke's *calculus of individuals* and uses a set of eight basic relations on spatial regions, i.e., how one region connects to another. Cohn, Gooday, and Bennett (1995) compare structures in spatial and temporal logics. Cui, Cohn, and Randell (1992) show how space and time are both taken care of in their formalism. Cohn et al. (1994) show how temporal continuity is exploited in their qualitative spatial calculi. The papers Nissan (2001g, 1997b) are about formalisms of space, more broadly meant.

In Section 5.3.3.2 we considered *time granularity*, different *grainsizes* being, for example, a year or a day. Bettini et al. (2000), a book on time granularities and how they are processed in representations from computer science, in particular from the viewpoints of database design, of constraint reasoning, and of automated knowledge discovery. Also see Bettini, Wang, and Jajodia (2002); cf. Schreiber (1991, 1994).

By contrast to temporal logics, different kinds of representation were developed for linguistics by semanticists, in order to represent the semantics of *tense*, as intended by linguists: Alice ter Meulen's book (1995) was reviewed by Nissan (1998b), a review reworked into appendix B of Nissan (2011a). In her book, "temporal reasoning is considered a form of logical reasoning, in which quantificational force, binding, and context change are core concepts" (ter Meulen, 1995, p. 3). Her structured semantic objects are *Dynamic Aspect Trees (DATs*).

Computer science also has temporal representations for concurrency. One which is considerably complex, and is used to modelling concurrent computation, is is Tony Hoare's notation (and respective theoretical framework) known as *Communicating Sequential Processes (CSP)*, which he published in a book by the same title (Hoare, 1985). It is a powerful technique, and requires a good understanding of the theory behind it. A current textbook on the subject is Roscoe's *The Theory and Practice of Concurrency* (Roscoe, 1998). The latter book is about the untimed version of CSP, with modelling without measuring the passage of time. By contrast, for modelling also such measurements (in either real numbers, or as discrete time points), there exists a version of Hoare's approach that has been named *Times CSP*:

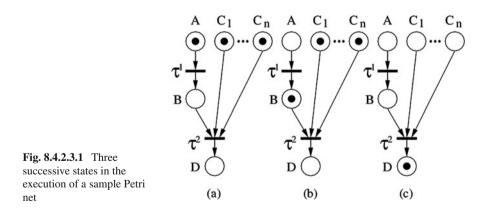
than adequate for time modeling. Besides [Bertrand] Russel and [Willard] Quine, these authors – referred often to as *detensers* – comprise [James] Allen, [Drew] McDermott, [Robert] Kowalski and others. People interested in linguistic aspect of logic, on the other hand, feel that time is tightly woven into languages, under the form of different tenses of the verb, and they relate modal to temporal notions [...] [Arthur] Prior and [Georg Hendrik] Von Wright belong to this *tensers* school. Just to show how things become complicate, we only mention that, in his theory of tense, [Hans] Reichenbach defines three different times for each tense: an *utterance* time, at which the sentence is expressed, a *reference* time, which we refer to in the sentence, and an *event* time, which is the object of the sentence".

it reinterprets CSP over time, records the exact time at which each event occurs, it associates with events non-negative real numbers.<sup>74</sup>

A simpler representation for concurrent processes and temporal constraints is Petri nets. Think of such a variant of a flipper game, that little balls (we are going to call them *tokens*) are scuttling along routes between obstacles, that can be figured out as being small doors, or closed valves (these we call *transitions*). There are one or more such conduits that each reaches such a valve (i.e., incoming arcs upstream of the transition), and one or more conduits that proceed forth from it (outgoing arcs downstream of the transition). In each conduit, there will be at most one ball at a time. One or more balls will stop at the transition, and this valve will not open, unless from each and every incoming arc, a ball has arrived. If all such balls are there, then the valve would open (i.e., the transition *fires*), and the balls would move further. There is a major departure with respect to the real physical world. In the latter, you would expect that if you had, say, three marbles right before the valve, and the valve opens, then beyond that valve those marbles will still be three balls. Not so with the kind of directed graphs that are known as *Petri nets*. If beyond the valve there only is one outgoing arc, then those three marbles would turn into just one marble, whereas if two arcs leave the open valve, then those three balls will become two: one for each outgoing arc. Petri nets are such directed graphs, that along every route (itself made up of arcs), there is an alternation of *places* (drawn as hollow circles), and *transitions* (drawn as a barrage: a short line drawn across). Moreover, tokens move through the graph according to rule we have described. See Fig. 8.4.2.3.1.

As I wrote in Nissan (2011a, appendix A):

Petri nets have proved to be a major paradigm for other computer application domains, e.g., for scheduling in manufacturing, or for logic validation when modelling digital systems. This has not been the case in legal computing. Petri nets were applied to legal systems



<sup>&</sup>lt;sup>74</sup> It is covered in a textbook by Steve Schneider (1999). Also see Schneider (2001). He has also co-authored a book on security protocols (Ryan, Schneider, Goldsmith, Lowe, & Roscoe, 2000).

in Holt and Meldman (1971).<sup>75</sup> In the literature of the discipline of artificial intelligence and law, a few papers are concerned with temporal structure (Bauer-Bernet, 1986; Poulin et al., 1992; Vila and Yoshino, 1995, 1998;<sup>76</sup> Knight, Ma, and Nissan, 1998), and Petri nets have been applied quite sporadically, less frequently than temporal logic, the latter being an approach in artificial intelligence which was introduced by Allen ([1983a, 1983b], 1984). Farook and Nissan (1998) have applied Petri nets to the representation of mutual wills. Valette and Pradin-Chézalviel (1998), in the same journal special issue as the former, applied time Petri nets to the modelling of civil litigation. Rossiter et al. (1993) described an application of Petri nets (within a formal model for quality assurance) to legal documentation organized as hypertext. Raskin et al. (1996) modelled by means of Petri nets, *deontic* states, i.e., states of obligation or permissibility.

For most purposes, the representation of asynchronous, concurrent processes is best suited by Petri nets indeed. The representation of concurrency among processes is not well suited by *finite state automata*, because for a large number of tasks, the number of states becomes unwieldy. Petri nets were originally defined by Petri in 1962 (Petri, 1966), and then refined and named after him by Holt (e.g., Holt, 1971; cf. Miller, 1973). Research into this paradigm developed during the 1970s and boomed in the 1980s. The literature is vast, with a choice of general works and a variety of proceedings. Among the books, see, e.g., Proth and Xie (1996), Peterson (1981), David and Alla (1992), Reutenauer (1990), Fernandez and Best (1988). Over the years, several different classes of Petri net formalisms were introduced, but we confined ourselves, in this article, to a simple application of the standard kind. As to fancy kinds of Petri nets, it may be that some amongst the present readership may find it useful to find about *predicate/transition nets* and then apply it in their own research (Genrich & Lautenbach, 1979). Reutenauer (1990) was concerned with the mathematics of Petri nets. Brown (1989a, 1989b) provides a treatment of Petri nets in terms of formal logic. In algebraic logic, the box calculus is a causal algebra with multilabel communication, within the Petri nets paradigm (Best & Hall, 1992; Esparza & Bruns, 1994). Olderog (1991) draws a comparison of three formalisms for representing concurrent processes; these include Petri nets.

#### 8.4.2.4 Software Tools for Human Anatomy

There exists software for anatomy. For example, a workshop on the Mathematical Foundations of Computational Anatomy (MFCA'06) was held in September 2006

<sup>&</sup>lt;sup>75</sup> Also by Anatol Holt, cf. Holt (1971, 1988). In Holt (1988), *diplans* were introduced, for the purposes of studying coordination in the workplace and of automation. "Diplans are the expressions of a new graphical language used to describe plans of operation in human organizations. With diplans, systems of constraint, which may or may not take the form of procedure definitions, can be specified. Among the special strengths of diplans is their ability to render explicit the interactive aspects of complex work distributed over many people and places – in other words, coordination. Diplans are central to coordination technology, a new approach to developing support for cooperative work on heterogeneous computer networks." (ibid., from the abstract).

<sup>&</sup>lt;sup>76</sup> Cf. Vila and Yoshino (2005), and cf. Fisher et al. (2005) on temporal logics in AI.

in conjunction with the MICCAI'06 conference. Works in computational anatomy are also presented, for example, at the Annual International Conferences of the IEEE Engineering in Medicine and Biology Society (EMBS), and at the Annual Meetings of the International Society for Computer Assisted Orthopaedic Surgery (CAOS).

Arbabi, Boulic, and Thalmann (2007a, 2007b) described a fast method for finding the range of motion in the human joints, and in the hip joint in particular. The context is the diagnosis of hip disease: "Finding the range of motion for the human joints is a popular method for diagnosing", and the claim was made that it is both more trustworthy "and easier to find the range of motion by employing computer based models of the human tissues. In this paper we propose a novel method for finding range of motion for human joints without using any collision detection algorithm. This method is based on mesh classifying in a cylindrically segmented space" (Arbabi et al., 2007b, from the abstract). The method illustration was the determination of the range of motion in the human hip joint, but actually the method could be applied more generally to the joints in the human body.

From that same Swiss team in Lausanne, also see Abaci et al. (2007a), on object manipulation and grasping "in an object manipulation context. Our proposal is a novel method that combines a tubular feature classification algorithm, a hand grasp posture generation algorithm and an animation framework for human-object interactions. This method works on objects with tubular or elongated parts, and accepts a number of parameter inputs to control the grasp posture" (ibid., from the abstract).

Being able to model grasping by computer, as well as being able to determine by computer the range of motion in the human joints (even though this is for the purposes of diagnosis in vivo), is arguably relevant for questions akin to the one asked at the end of Section 8.4.2.1 above: "Could that child have extended an arm and picked up that given thing?".

The history of the project of modelling hip joints is related in the following, which is quoted from Magnenat-Thalmann and Gilles  $(2007, p. 25)^{77}$ :

Since 2002, Prof. Nadia Magnenat-Thalmann of the Swiss National Center of Competence in Research Co-Me has been leading a project on interactive clinical visualization for hip joint examination. The goals of this research are to build a 3D patient-specific functional model of the hip joint, of the hip joint, and to develop interactive tools allowing clinicians to examine hip behaviour. Such tools will be invaluable aids in diagnosis and treatment planning, particularly for osteoarthritis and impingement syndrome pathologies.

Also consider, e.g., *MuscleBuilder*, a computer-graphic modelling tool for human anatomy (Aubel & Thalmann, 2007; cf. 2000, 2001, and Gutiérrez et al., 2005, 2007). In cultural terms, this is an extension of the genre of anatomy handbooks, which itself is grounded in the history of the ideas, as well as of the arts. Jonathan Sawday's (1996) is a book in cultural history, concerned with the dissection of the human body in the culture of the English Renaissance, in relation to conceptualisations of the body in several domains, including the arts.

<sup>&</sup>lt;sup>77</sup> Nadia Magnenat-Thalmann leads a team in Geneva, whereas Daniel Thalmann leads a team in Lausanne. Cf. in Section 5.2.15 above.

Take illustrations in anatomy handbooks, through history, as made by illustrators by observing dissected bodies. Bernez (1994) discussed the aesthetics of seventeenth-century Dutch painter Gérard de Lairesse's illustrations for Bidloo's *Anatomia Humani Corporis*. Bernez shows how anatomic drawings within the history of art actually reflected moralising intents, about life and death, on the part of the artists, and, paradoxically, aesthetic ideal as well. Bernez shows that de Lairesse's anatomic drawings are somehow amenable to a seventeenth-century Dutch genre he practised, the *Vanitas:* "Anatomy as Vanitas: the allegorical representations of life's brevity [...]" (ibid., p. 213). "The Vanitas was a genre of still-life painting in which certain objects representing the fruitfulness of nature or the value of human activities were contrasted with elements which evoked the triumph of death" (ibid.).

*EnVision* (2002) relates about a project led by Michael I. Miller, director of the Center for Imaging Science at Johns Hopkins University, concerning the application to neuroscience of computational anatomy:

"Computational anatomy could be described as a digital textbook of anatomy, with all its variability in healthy humans, adjusted for things like gender, age, and ethnicity, and also in pathological situations that affect anatomy", said Grenander. "The main difficulty is that anatomical substructures form highly complex systems, with variation being the rule", Miller said. As he said in an interview published earlier this year [(Taubes, 2002)], "If machines can compute structures that are equivalent to the structures we see in the world, then we can begin to understand them. In computational anatomy, we now have equations that describe how tissues can grow and bend and morph and change. These equations seem to generate very realistic structures".

Miller's application is to the brain, a soft tissue, "to learn how tissues grow, assume new shapes, and 'morph' into mature structures" (ibid.). Miller is quoted as saying: "Our mathematical formulation deforms structures in a coordinate space, and thus the original structures are entirely recoverable computationally. That is the difference between morphing and morphometrics" (ibid.). In morphing, just a photometric transformation is carried out, without any coordinate system allowing recovery of the previous shape. "For the past decade, Miller's group has been developing computational methods to analyse gross anatomical structures in the human brain, with the objective of creating tools to help neuroscientists and diagnosticians learn from changes in brain substructures. The underlying mathematics are supplied by metric pattern theory, a formalism developed by Ulf Grenander in the Division of Applied Mathematics at Brown University" (ibid.).

Several of the short papers in the special issue on "The Digital Patient" of *ERCIM News* (April 2007) describe such projects that revolve around computational models of human anatomy, and being carried out in various European countries. For example, Xavier Pennec (2007) introduces a project applied to the brain (one of Pennec's partners in France is also a partner of Miller).<sup>78</sup>

<sup>&</sup>lt;sup>78</sup> At http://www-sop.inria.fr/asclepios/projects/ARCBrainVar/ a description is found of Pennec's project.

Among the applications, two that are generally relevant for our present concerns include "the spatial normalization of subjects in neuroscience (ie mapping all the anatomies into a common reference system) and atlas-to-patient registration in order to map generic knowledge to patient-specific data" (Pennec, 2007). Arguably, atlas-to-patient mapping is relevant for computational anatomy to be of any use to forensic anthropology.

González Ballester, Büchler, and Reimers (2007) "are constructing advanced statistical digital models of bone shape and biomechanical properties. These models will lead to the design of a new breed of orthopaedic implants that will guarantee an optimal fit for the whole range of patients" (ibid., p. 27). "During this project, we have extended our ability to analyse the surface shape of anatomies to also include internal structures and bone density information. This results in a compact statistical description of the variability in bone shape and density, and the correlation between them" (ibid.). This suggests, I would say, that conceivably, some similar model could be of use to forensic anthropology and perhaps to forensic ballistics, in order to simulate what may have brought about the conditions observed in a dead human body in a forensic setting.

Computational models of human anatomy find expression also other than through the 3D visualisation of the anatomy. The simulation of pain in robotics has been reported about. Reportedly in the late 2000s, the University of Gifu was expecting to make use of a patient-robot for medical training, in particular in the palpation of patients, before having the trainees exercise in palpation directly on humans. The patient-robot was developed by Yuzo Takahashi. The robot has 24 internal sensors, and if touched in a body part (corresponding to a human body part), it speaks up and conveys the physical distress being simulated. Eight kinds of symptomatologyare recognised in the prototype, and the inclusion of more is envisaged. Its skin produces the sensation, when touched, of human skin.

Victor Ng-Thow-Hing is active both in robotics (e.g. Hauser & Ng-Thow-Hing, 2010), and in biomechanical anatomical models of human and animal bodies, a field in which he was supervised by Eugene Fiume in Toronto (Ng-Thow-Hing, 1994, 2001; Agur, Ng-Thow-Hing, Ball, Fiume, & McKee, 2003; Teran et al., 2005; Wu, Ng-Thow-Hing, Singh, Agur, & McKee, 2007). Musculotendon units were built by sketching interactively profile curves directly onto the bones; the curves can be subsequently adjusted to interactively edit the shape of the resulting muscle. As an alternative for producing an initial shape of the muscle, it is also possible to load into the system pre-built muscles from an anatomical library. The muscle models generated were used as *force actuators*, in a robotic simulation sense. The simulation framework allows muscles to be visualised, and the simulation combines the muscles with articulated skeletons. These are made up of rigid bones and of joints; there are various joint constraints.

Hutchinson, Ng-Thow-Hing, and Anderson (2007) applied an anatomical model to reconstruct the turning and running performance of the dinosaur *Tyrannosaurus rex*. This is an example of *computational palaeontology*. That model combined *mass models* as those used by Ng-Thow-Hing in *digital human modelling* at Honda, the *B-spline model* he was using for muscle, and generated a versatile shape primitive

for estimating mass properties of body tissue. Just as he could do that for extant animal species or for humans, he was able to do that for the fossil species, and the model was validated with an ostrich carcass.

## 8.5 Aspects of the Contribution to Forensic Science of Geology, Geophysics, and Botany

### 8.5.1 Forensic Geology

Forensic geology (also called geoforensics, or forensic geoscience) is an important discipline, for criminal investigation as well as for the purposes of litigation, e.g. concerning environmental damages.<sup>79</sup> Laurance Donnelly (2003, p. 8) pointed out: "Over the past one hundred years or so, several crimes have been solved due to the expertise provided by geologists. However, due to the sensitive and confidential nature of police investigations, only occasionally are these reported in the scientific literature". In a 1893 German-language handbook for examining magistrates, "Hans Gross, a criminal investigator and professor of criminology [...] was one of the first to advocate the use of microscopes in mineralogical studies analysing 'dust' and 'dirt' on shoes and 'spots' on cloth'' (Donnelly, 2003, pp. 8-9). This approach was "subsequently used by George Popp in 1904, during a murder investigation (the Eva Disch case), in Frankfurt, Germany" (ibid., p. 9). In France, Edmond Locard (1877–1966), a star of criminalistics who used inventively a variety of techniques (see Section 8.7.1 below), concerned himself with the analysis of dust traces, too, and described them at length (Locard, 1930). "The Federal Bureau of Investigation (FBI) have been using forensic geology since 1935, initially to help solve the Matson kidnapping case" (Donnelly, 2003, p. 9).

Turning to the 2000s, Bergslien et al. (2006) have been trying to apply field portable X-ray fluorescence (FPXRF) spectrometry to both forensic and environmental geology. "There are many environmental applications that may also intersect the forensic arena, such as tracking pollutants in the environment to their source" (ibid., p. 19). A forensic application they reported about "involves analysis of mineral and rock deposits on automobile tires, shoes, carpets etc. and direct comparison with materials found at the crime scene. Knowledge of compositional changes in geological formations may aid in tracing movements of a crime suspect or victim" (ibid.).

At the inaugural meeting of the Forensic geoscience Group of the Geological Society of London, on 20 December 2006 (Ruffell, 2006), Donnelly pointed out (Donnelly, 2006, pp. 3–4):

<sup>&</sup>lt;sup>79</sup> Books on forensic geology, or geoforensics, as it is also called, include Pye and Croft (2004), Pye (2007), and Murray and Tedrow (1975).

There are a number of geologists in the UK, and internationally, who currently work with, or have recently worked with the police, other law-enforcers, environmental agencies and humanitarian organisations to help bring some types of crimes to successful conclusions. Some geoscientists have also been involved in forensic investigations in the mining, engineering, minerals and water sectors of industry, or during the investigations of geohazards (also known as natural disasters). The common ground for all these sub-disciplines is that geoscience practice and results may end up as part of a public, international or legal enquiry by government or in courts of law.

Forensic Geoscientists may be broadly divided into two principal fields, depending on their skills, expertise and capabilities. Firstly, there are the laboratory-based geologists who may include for example; geochemists, mineralogists, petrologists, micro-palaeontologists and isotope specialists. These may be involved with forensic investigations to; provide physical evidence for use in court, assist in an investigation, provide intelligence or identify the location of a crime scene. In short, geoscientists may link an offender (or object) to the scene or link the victim to an offender. Secondly, there are field-based geologists, who use their skills in exploration (including for example: geophysics, geochemistry, geomorphology, hydrogeology, environmental geology, remote sensing and geotechnics) to search the ground (to locate murder victim's graves, weapons and other objects).

As opposed to "[t]raditional police methods of finding graves [which] often involve large-scale 'finger-tip searches' and 'trial-and-error' excavations", which apart from inefficiency, "may even destroy evidence and ignore subtle ground disturbances", geologists "are trained to 'read the ground" (Donnelly, 2003, p. 9).

Donnelly proceeds to enumerate the main geologists' techniques for crime scene investigations: the *mineralogical, petrological,* and *geochemical analysis* of rock and soil, or even *fossils* (resorting to palaeontology), for evidence in both criminal and civil cases.

Another method is the use of *geological maps* (and conceivably, *geographical information systems* produced by information technology, indeed a category within *geoinformatics* or *geomatics*, could be somewhat customised to reflect, e.g., ease to excavate).

In the UK, maps published by the British Geological Survey (BGS) have been used in police investigations to identify potential burial sites and topographic features mentioned in witness or suspect statements. Since search investigations were usually undertaken under a limited budget, geological maps can be used to eliminate areas of ground which are less likely to conceal buried objects [... E.g., in Kent, w]here the cretaceous bedrock was exposed, the use of a spade was considered unlikely. (Donnelly, ibid.).

McCann, Culshaw, and Fenning (1997) proposed that (in the words of Fenning & Donnelly, 2004, p. 11) "an initial desk or background study of the survey area" – as distinct from a visit to the site "in order to obtain what can only described a 'feel' of the site (i.e. putting the desk study into context)" – should collect all available relevant information about the site, including, among the other things, "Present and historical topographical maps, usually from the Ordnance Survey", "Geomorphological research studies and reports", "Present and historical geological survey maps and associated descriptive memoirs from the British Geological Survey", "Aerial and satellite photography, both current and historical", "Present and historical soil survey maps with surface vegetation detail", "Web search of the English Heritage database of geophysical survey results related to archaeological

investigations (Linford, 2002)", "Library/web search for relevant scientific and press publications and photographs, including university research papers", "Information on the nature and physical properties of the survey target (e.g. buried metallic weapon, victim's discarded clothing, or buried human remains)" – in the words of Fenning and Donnelly (2004, ibid.), where the method of McCann et al. (1997) is adapted to forensic investigations.

Geomorphological observations enable to interpret "subtle natural ground disturbances arising from the particular crime. These might include vegetation changes, undulations, spring lines, breaks in slope, convex and concave slopes, disturbed ground, periglacial deposits, the occurrence of loose soil, drag marks, and the compaction of ground" (Donnelly, ibid.). The interpetation needs to discern whether these exhibit the effects of natural physical processes, or result from human activity, "for example mining subsidence, waste disposal, tipping and digging" (ibid.). Besides, *remote sensing* is another category of forensic techniques from geology.

Several other techniques of forensic geology belong in *geophysics*, and are treated in Section 8.5.2 below; as we are going to see, geophysical techniques for forensic investigations involve information technology, and there appears to be an important potential for more applications of computing. Donnelly (2003) explains the basics of geophysics in a forensic context as follows: "Geophysical surveys provide an alternative, more cost-effective method for locating disturbed ground and buried objects. Geophysical surveys measure the vertical and lateral variation of physical properties of the ground. These include electrical conductivity, magnetic, electromagnetic and gravity, etc. If a buried object provides a property contrast this can be used to detect its presence" (ibid., p. 9).

It is to be remembered that specialists from different disciplines are involved in the forensic science side of criminal investigations, whether on the crime scene, or afterwards (or before the scene of the crime is identified). "Search teams are inter-disciplinary and involve the integration of specialists such as ground search personnel, dog handlers, helicopter pilots, forensic scientists, pathologists, mountain rescue, photographers, divers, forensic anthropologists, forensic archaeologists and scene of crime examiners" (Donnelly, 2003, p. 11).

Donnelly (2003, pp. 10–11) provides a case study: the Moor Murders from the 1960s. Several young children were abducted and murdered, and the perpetrators buried them in unmarked graves on Saddleworth Moor, a remote region in the Pennines, Northern England, on the Lancashire and West Yorkshire border. In the mid 1980s the case was reopened, as not all children had been found. During the 1990s, Donnelly himself had been involved in the search for the last remaining body (Donnelly, 2002b, 2004). In personal communication (26 June 2007, reproduced by kind permission) he explained the background and latest developments:

I have been working with the Police for 13 years now. Originally, most of my work was undertaken covertly and without the knowledge of others outside the police. However, since my 2002 presentation at Westminster Palace (see *Geoscientist* [Donnelly] 2002[c]), on forensic geology, there has been a steady increase in UK geologists' involvement in forensic geology, including both research and case work. There are now several universities, research organisations and consultancies. This is of course, fantastic news. Before this

event there were a few geologists in the UK working with the Police, mainly involved with the identification of rock and soil for helping to solve some crimes.

My primary objective has, and continues to be, to find the grave of a young boy, I believe to be buried in a remote location in part of northern England. In December 2006 I set up the Geological Society of London Forensic Geoscience Group. The first inaugural meeting was held in London, in December 2006 (see attached). Working with the police has presented unique opportunities and enabled me to explain the skills, capabilities, expertise and role of geologists, in police and forensic investigations. As a result, there is now little doubt in the police the valuable role geology may bring to help solve/investigate a crime, but only if geologists, and the geologists understanding the role of other investigators (and also his/her limit of expertise).

The setting up of the FGG, in the Geological Society of London [...] is aimed at advance the study and understanding of forensic geology. Our inaugural meeting, held at Burlington House in December 2006, was successful [...]. In October 2007, FGG are supporting the 'Soil Forensic Conference' in Edinburgh [...]. This event will give UK geologists the opportunity to discuss and debate the role of geologists with the police and to identify the ways forward for our profession.

In geology, there exist *soil fingerprinting techniques*, and these can be used for forensic applications. Consider the *SoilFit* project: "The UK SoilFit project (http://www.macaulay.ac.uk/soilfit/) [...] aims to integrate data from state-of-theart soil fingerprinting methods with data currently held in spatially referenced soils databases. This approach could potentially improve both matching of evidential soil samples and prediction of probable geographical origin" (Dawson et al., 2006).

A decision support tool is being developed to assist the forensic scientist in selecting the most appropriate analytical strategy depending on sample size, type and condition. A software prototype has been written to process the data and identify, with probabilities, the soil type. This information is then fed into a prototype rulesbased GIS model to identify areas with appropriate soils, which can be narrowed down by layering intelligence of other spatial data (e.g. distance from roads, broad vegetation types). These prototypes have been built to demonstrate and evaluate the approach for crime investigation. (ibid.)

# 8.5.2 Techniques from Geophysics in Forensic Archaeology vs. in Archaeology

One branch of forensic geology is forensic geophysics. Geophysical survey consists of surveying the subsurface of the earth by the measurement of its physical properties. "An individual survey may take hours, days or months to complete. Geophysical surveys provide an alternative, more cost-effective method for locating disturbed ground and buried objects, but the choice of instrument, methodology and interpretation need to take several inter-related factors into account.

These include the physical properties of the target (human remains, buried ransom money, jewellery, weapons), the geological profile, depth of burial, topography, ground conditions, age of the burial and the experience and – of course – skills of the operators" (Donnelly, 2002a). Fenning and Donnelly (2004) remarked: "[I]n the last twenty years, the application of geophysical methods in archaeological surveying, plus advances in geophysical instrumentation and computing technology, has allowed geophysicists to conduct high-resolution surveys of the top 1-2 m below ground surface" (ibid., p. 11).<sup>80</sup>

The third lecture at the workshop on Archaeology and Forensic Science, held at the British Academy in London on 27 February 2007, was given by Paul Cheetham, on "Geophysics: Application to Forensic Science". Cheetham's affiliation is with the School of Conservation Science at Bournemouth University. His early formation was in statistics and computing, before he turned to geophysics. He is the foremost authority, in Britain, on geophysics application to forensic science. He started his lecture by pointing out that forensic science being fashionable sometimes causes journalists to describe as "forensic" excavations, such excavations which have nothing forensic about them and are archaeological (or possibly carried out for historical purposes, e.g., excavating remains of Napoleonic troops for the purposes of studying their body parasites). Nevertheless, he stressed, oftentimes archaeologists employ better techniques than forensic science.<sup>81</sup> He stated that he sometimes gasps at articles published in forensic science journals, because of how they lag behind things well established from scientific methods as applied to archaeology.

Moreover, in pursuing some directions of research, one may notice discontinuity in the forensic literature, e.g., three isolated papers (whose respective authors did not continue in the given direction) may not cite each other, and no referee apparently pointed that out, and moreover that technique is considerably more advanced as used in archaeology. Such a picture with sporadic papers in forensic science about techniques from geophysics that don't even cite each other, and of research projects being discontinued, was contrasted to the situation in archaeological science, that has a tradition of steady work building upon previous work, when it comes to applying techniques from geophysics.

What are the chances, for a given technique, to be applied again and again in crime scene investigation (or, for that matter, while assisting the scientific police)? "If you do it quicker and cheaper, the police will call you back". During his talk, Cheetam also specifically considered different techniques from geophysics, and the likely reasons why their ranking according to prominence for forensic science vs. archaeology is different.

The big growth area in geophysics has been in smaller scale higher-resolution near-surface survey in what is loosely termed applied engineering, environmental geophysics, or industrial geophysics. This rise has run coincident with a decline in mineral prospection. In a sense, this was an incentive for geophysics to change the direction of its main thrust for application.

Types of geophysics required for forensic science include: near-surface survey; delineation of discrete small features of the terrain (this requires good lateral resolution); and part of the recovery process. It is archaeological geophysics, which is leading. Forensic geophysics may learn from it. When surveying the subsurface of

<sup>&</sup>lt;sup>80</sup> Also Bevan (1991) is concerned with the search for graves resorting to geophysics. By contrast, the approach to the detection of clandestine graves in Davenport et al. (1992) is multidisciplinary.
<sup>81</sup> See Gaffney and Gater (2003), Mellett (1996).

the earth by geophysical techniques, normally measurements are taken above the surface, and are non-intrusive. When the application is forensic, one looks for specific kinds of evidence (e.g., graves), not for anything (just defined by scale) as in archaeological geophysics. When what has to be found is bodies and neonates, such bodies are too small for most techniques from geophysics.

Methods from geophysics that are frequently used in archaeology include: magnetometry; earth resistivity; topsoil magnetic susceptibility; ground penetrating radar (not as good as the previous methods); and electomagnetics. The latter technique for archaeology was developed by the French; according to Cheetham, it is the Cinderella among those techniques. In contrast, forensically, the ranking of the techniques is different. Ground penetrating radar is a good technique, Cheetham stated, for forensic purposes. (Fenning and Donnelly (2004) describe it as enjoying popularity and acclaim in the forensic domain: see below).

Cheetham went on, remarking that earth resistivity can be used for looking for graves or for metal, but is not often used in forensic contexts (see below). Electromagnetics is often recommended, but is almost not used. Magnetometry is applies in metal detectors. Topsoil magnetic susceptibility is only employed for specific uses, within a forensic context, and ranks lower with respect to its rank among techniques for archaeology. We are going to be more precise further down in this chapter, thanks to an invaluable survey by Fenning and Donnelly (2004).

Forensic graves are very different from archaeological graves, in respect of the effectiveness of detecting graves and cremations with the most frequently used geophysical survey techniques. Ground penetrating radar works especially well in sand, rather than in other kinds of terrain. (Cheetham brought as an example a commercial ad for the technique, with a picture showing a demonstration on the sand in front of the Sphinx in Egypt. He pointed out that for an advert, it made sense, because this technique works very well in sand.) Ground penetrating radar is not good for finding small objects.<sup>82</sup> In archaeometry, ground penetrating radar is put to good use for intensively recording an area, slicing the data into images, possibly animating the images by *time-slice* (e.g., to show ancient cultivations or archaeological features). Our Section 8.5.3 is devoted to the concept of *time slicing*. Time-slicing from geophysics is applied, then, to archaeometry, using computational methods.

Earth resistivity, Cheetham claimed during his lecture, is the Cinderella of forensic techniques from geophysics. Nevertheless, Cheetham pointed out, it is a superbly reliable technique in archaeology, with variants: resistivity electrode arrays are applied to archaeology, even though they are cumbersome. Earth resistivity is good for finding graves. Nevertheless, it is almost never used in forensics, because it is regarded as a low technique by geologists: two hours were reported, for surveying a  $7 \times 6$  m area. But in archaeology, better is done. Apparently there is no good reason for not applying the method in forensics: it is a matter of lack of investment.

<sup>&</sup>lt;sup>82</sup> Also Fenning and Donnelly (2004) point out that, e.g., coins could be located at depths up to 0.5 m using a sophisticated instrument, but only larger objectsd would be detected if buried deeper (ibid., p. 15).

Reluctance to employ this method for forensic purposes has been its perceived slowness; nevertheless, in applications in archaeology this problem has been overcome. An important application of earth resistivity is in volumetric models, rotated by computer animation, of graves or mass grave. Cheetham brought as an example of application to mass graves the same computer graphic model we had already mentioned by reporting about Hunter's talk (see at the end of Section 8.4.1).

Table 1 in Fenning and Donnelly (2004, p. 12)<sup>83</sup> summarises features of various geophysical survey methods.

- The *seismic* method's measured parameter is the travel times of reflected/refracted seismic waves, and the 'operative' physical parameters are the density and elastic moduli that determine the propagation velocity of seismic waves. The seismic method "is either applied to layered geological structures or used to determine depth of bedrock beneath superficial deposits. As such, it is rarely applied in forensic geophysics where a distinct target, such as a buried human body, is the survey objective" (Fenning & Donnelly, ibid., p. 13).
- In the *gravity method*, the measured parameter is the spatial variations in the strength of the gravitational field of the Earth, whereas the operative physical parameter is "the density difference between local rocks and an air-filled cavity" (ibid.), and in fact it is "usually employed to detect subsurface cavities, such as caves, graves and disused mine shafts" (ibid.). Fenning & Donnelly (ibid.) describe the gravity method as costly, time-consuming, and rarely applied in forensic geophysics.
- In the *magnetic* method, the measured parameter is spatial variations in the strength of geomagnetic field, whereas the operative physical parameter is magnetic susceptibility and remanence. This method would not be forensically useful if a corpse was buried naked. "The naked human body has virtually no associated magnetic anomaly and, when buried, is very unlikely to be detected by a magnetic survey. However, a fully clothed body is a different matter. Clothing may include metal buttons, zip-fasteners, shoe eyelets and belt buckles, while pockets may contain spectacles, keys, pens and other ferrous metallic objects" (Fenning & Donnelly, ibid.).
- The [*electrical*] *resistivity* method comes in a range of techniques, which "[a]ll involve inserting four steel electrodes into the ground and measuring vertical and horizontal variation in resistivity" (ibid.). Or, then, a *multi-electrode* array is sometimes used. In the resistivity method, the operative physical parameter is electrical conductivity, whereas the measured parameters are earth resistance, polarisation voltages or frequency-dependent ground resistance.
- The *induced polarisation* method has the same measured parameters as the resistivity method, but the operative physical parameter is electrical capacitance in

<sup>&</sup>lt;sup>83</sup> It is based on Kearey and Brooks (1984). Incidentally, a current edition of that book is Kearey, Brooks, and Hill (2002).

stead of conductivity. Reportedly, it is less effective and slower a method than resistivity surveys (ibid., p. 14).

- In the *self-potential* method, which is reportedly inexpensive (ibid.), the measured parameter is "naturally occurring ground [electrical] potential due to electrochemical reactions between different rock and groundwater levels and flow" (ibid.), and the operative physical parameter is electrical conductivity. Fenning & Donnelly (ibid.) suggest that, notwithstanding the lack of publications about using this method for forensic purposes of discovering dead bodies, the self-potential method has potential (our pun intended) in that domain.
- In the *electromagnetic* methods, the measured parameter is the response to electromagnetic radiation, whereas the operative physical parameters are electrical conductivity and inductance. "An effective and rapid surveying alternative to resistivity profiling is the electromagnetic inductive conductivity (IC) profiling method, which allows continuous recording of the subsurface conductivity at a walking pace. Electrical conductivity is the reciprocal of electrical resistivity" (ibid.). "No case histories relating to direct detection of buried human remains are known", but in the literature applications of the method were described, "in defining archaeological features such as graves and tombs" (ibid.).
- In the *ground-penetrating radar (GPR)* method (e.g., Hammon, McMechan, & Zeng, 2000; Mellett, 1996), the measured parameter is the response to high-frequency electromagnetic radiation, and the operative physical parameters are electrical conductivity and the dielectric constant. Whereas in the electromagnetic inductive conductivity method, "instruments are one-man, portable and operat[ing] in the frequency range of 10–15 kHz", "[t]he much higher frequency range of 25 MHz to 2 GHz is the realm of GPR which has received substantial publicity for its ability to produce high-resolution cross-sections of the surface" (Fenning & Donnelly, 2004, p. 14). Reportedly, Hildebrand, Wiggins, Henkart, and Conyers (2002), who "compared seismic reflection and GPR imaging over a dead pig buried in a wooden coffin at a test site in Illinois" (Fenning & Donnelly, 2004, p. 13), found that "the GPR survey was many times faster than the seismic reflection survey" (ibid.).
- Moreover, *metal detector* methods involve a "one-man, portable hand-held scanning devic[e] with an audible signal or meter output" (Fenning & Donnelly, 2004, pp. 14–15). The smaller the metal object, the shallower the underground range of the instruments. A large object would be detected even if buried somewhat deeper (ibid.).
- And finally, "[t]he advantages of using mobile multi-sensor systems in forensic studies are clearly apparent where there are large tracts of survey and copious detailed data points are required" (ibid.); such mutisensor systems consist of arrays of sensors "which can be man-carried or vehicle-mounted and walked/towed across site" (ibid.), sometimes making use of *differential global-positioning systems* (*DGPS*).

The general rule for all those methods is that "[t]he physical property contrast between a target and the surrounding host material of soil and rocks is essential if geophysical methods are to be effective" (Fenning & Donnelly, 2004, p. 12). "In addition to an understanding of the capabilities of geophysical methods, it is essential that the limitations of these methods be clearly understood.

MacDougall et al. (2002) point out various limitations which can make areas unattractive for geophysical surveys" (Fenning & Donnelly, ibid.). For example, "gates, buildings, fences, overhead power cables, parked or moving vehicles and machinery", being "man-made metallic features at ground surface", are detrimental for a survey to be conducted, and so it the "[p]resence of man-made metallic and non-metallic features below ground surface e.g. cables, pipes, sewers, reinforced concrete" (ibid.). This is also the case of "[e]lectrical interference e.g. mobile phones, electrical machinery, power cables", of "[c]urrent construction or farming activities", of "[s]evere ground topography", of access problems such as bushes and vegetation, of the "[p]resence of farm animals", and of "[s]easonal factors e.g. tourists, weather" (ibid.).

Fenning and Donnelly's article (2004) has been invaluable for writing part of this section. That article also analyses three case histories. The interested reader is urged to refer to that paper. Whatever we have quoted from it here, can only be an appetiser, not the main course.

### 8.5.3 A Clarification About Time Slicing

*Time-slicing* (mentioned in the Section 8.5.2, with data from ground-penetrating radar) is a concept that occurs in a number of different disciplines. Time-slicing can be found in computer operating system design; in cinematography; in synchrotron radiation from physics; in power engineering; and so forth. In a computer's operating system which, on a serial machine, has to simulate the parallel execution of a large number of programs, this is achieved by means of time slicing: at each time slice, a small number of instructions are executed for each program, one at a time. If the strategy is that a fixed number of instructions is to be executed for each program at each time slice, longer programs will take more time slices. Other strategies are possible.

In contrast, in telecommunications, time slices (i.e., burst, or time slots when the data are transmitted) enable a reduction in power consumption, e.g., of mobile receivers, because when the relevant data are not available, the front end (i.e., the receiver) is switched off, and later on it is informed when to wake up, when the next burst (intended for it) is expected.

As to special effects in cinematography and computer animation, the Wikipedia entry for "Bullet time"<sup>84</sup> remarks that "Technical and historical variations of this effect have been referred to as time slicing, view morphing, flo mo, mort temps and virtual cinematography":

<sup>&</sup>lt;sup>84</sup> http://en.wikipedia.org/wiki/Bullet\_time (accessed in March 2007).

a computer-enhanced variation of slow-motion special effects used in some recent films and computer games. It is characterized both by its extreme permutation of time (slow enough to show normally imperceptible and un-filmable events, such as flying bullets) and by the ability of the camera angle – the audience's point-of-view – to move around the scene at a normal speed while events are slowed. This is almost impossible with conventional slow-motion, as the physical camera would have to move impossibly fast; the concept implies that only a 'virtual camera', often illustrated within the confines of a computer-generated environment such as a game or virtual reality, would be capable of 'filming' bullet-time types of moments.

In beam physics, a report in the *Advanced Light Source (ALS) News* (ALS News, 2000) stated that

[i]n early 1996, Alexander Zholents and Max Zolotorev of Berkeley Lab's Center for Beam Physics proposed the laser time-slicing technique as a way to achieve effective bunch lengths in the femtosecond range. At the heart of the proposal was the use of a high-power, femtosecond laser synchronized with the electron bunches so that a pulse of laser light passed collinearly with an electron bunch through an undulator or wiggler. The high electric field of the shorter laser pulse modulated a portion of the longer electron bunch, with some electrons gaining energy and some losing energy. Subsequently, when the energy-modulated electron bunch reached a bend magnet (or other section of the storage ring with a nonzero dispersion), a transverse separation occurred. A collimator or aperture selected the synchrotron radiation from the displaced bunch slices.

Later on, according to the results of Schoenlein et al. (2000), a Berkeley team – in the words of ALS News (2000) –

generated 300-femtosecond pulses of bend-magnet synchrotron radiation at the Advanced Light Source (ALS) with the aid of a laser 'time-slicing' technique. Their proof-of-principle experiment demonstrates that this technique is a viable one for producing ultrashort pulses of x rays. An ALS bend-magnet beamline will soon be commissioned that will be dedicated to time-resolved x-ray diffraction, EXAFS, and other techniques capable of probing the long-range and local structure of matter on a femtosecond time scale.

Readers conversant with artificial intelligence are likely to know about *slice* from the terminology of *naive physics:* that notion of *slice* was introduced in Patrick Hayes' (1985) so-called *ontology for liquids*, a naive physics model that can handle phenomena in fluid dynamics, and involves spatio-temporal histories of objects. On p. 90, Hayes wrote the following concerning the difference between the formal concepts of *history* and *situation*:

A history differs from a situation in being restricted spatially and extended temporally: it is a connected piece of space-time in which 'something happens', more or less separate from other such pieces. Histories, unlike situations, have a *shape*: much of [Hayes' treatment is] devoted to ways of describing their shape.

Examples of histories include the inside of a room during the afternoon, a horserace and the pouring of water from one cup into another. The idea is that a history shall contain an event, isolating it temporally and spatially from other events. We include the special case in which nothing happens at all. A *state* [...] is an instantaneous 'slice' of a history at a certain time-instant. [...] If *h* is a history and *t* a time-instant (we assume a global timescale of some sort with an inequality defined on it), the h@t (read *h* at *t*) is the 'slice' of *h* at *t*. This is a state, that is, a spatial entity at a particular time.

# 8.5.4 From Soil to Scent: Between Current Practice and Imagining the Digital Potential

### 8.5.4.1 Scent-Detection, Odorology, Cadaver Dogs, and Gas Soil Surveying: The Detection of the Scent of an Individual, vs. the Detection of a Kind (Graves)

Tribondeau (accessed 2006) credits a country in Eastern Europe with the origination of a particular technique for identification, *odorology* (s.v. *odorologie*, quoted here in my own translation):

Developed since recently by the French police, this practice, which appeared about thirty years ago in Hungary (where it enables solving over 4000 cases per year), enables the identification of perpetrators through their olfactive print (*empreinte olfactive*). Concretely, investigators places cotton ribbons on the scene of the crime; then these conserved inside hermetically closed phials. It just takes, for especially trained dogs, to sniff a piece of cloth imbued with the scent of a suspect who eventually turns up, and subsequently the various phials who are opened in front of these dogs. Like with explosives and narcotics, the dog will stop in front of the phial with the same scent as the suspect. In Hugary, over 18,000 olfactive prints are collected every year. A phial may last during at least ten years.

This is a further development of the widespread employment of dogs for *scent-detection*. The latter method is "Relatively nondestructive. Proven effective even 170 years after burial. Effective over water" (Davenport et al., 1992). These are advantages, whereas disadvantages are as follows: "Most effective when air, ground moist. Dog may be trained for other uses and not properly trained for this type of work; handler may overstate qualifications" (ibid.). Davenport et al. (1992) were concerned with the detection of clandestine graves, and the dogs used were *cadaver dogs*. Using dogs or pigs is also widespread for finding truffles underground, or the method is also in use for detecting landmines, typically for the purpose of demining an area. Davenport et al. (ibid.) had carried out experiments with the detection of pig carcasses, and adopted a multidisciplinary approach to their detection:

Excessive heat causes some discomfort to the dog and this may affect the dog's ability to locate a scent. When the temperature is extremely high the dog will still locate the scent; however in most cases, it will need to be within approximately a meter of the source. Even if the temperature is high, the results will improve if the ground is moist. Extremely low temperatures also limit the dog's ability to detect the scent from a distance, especially if the source is buried. If the source is buried in snow with temperatures allowing only minimal melting, the dog must be directly over the source to locate it. If the temperature is warm enough to allow for significant melting the dog can locate the source from a greater distance.

Apart from scent-detection by cadaver dogs, also *soil gas* surveying was carried out (ibid.):

The soil gas surveying performed at the research site holds promise of providing a useful, albeit labor intensive, technique to locate graves. Organic gases were detected within three meters of two of the grave sites; however, the investigators had the privilege of knowing in advance the locations of these sites. Soil gas surveying is best in soils with a low clay content (so as not to clog the probes) and over unfrozen ground.

What can possibly be the use of computing for the techniques mentioned in this chapter? Arguably, even unsophisticated computing methods can be used for the purposes of organisation and classification, e.g., of the dogs and their records. In odorology, such relatively unsophisticated methods from information technology may be nevertheless useful. On the other hand, it may be that chemical sensors as in *electronic noses* are not sophisticated enough; they would only pick up the sort of scent components they were devised to detect. Dogs are much more sensitive. Nevertheless, pattern matching methods, and perhaps data mining methods, from computing could perhaps complement the use of dogs. At any rate:

Despite the importance of the olfactory sense to mankind, the sense of smell in man is often considered the least refined of the human senses, far less sensitive than that of other animals. For example, the human nose possesses only about one million aroma receptors that work in tandem to process olfactory stimuli whereas dogs have about 100 million receptors that distinguish scents at least 100 times more effectively than the average human [(Ouellette, 1999)]. Furthermore, the ability to detect chemicals in the environment is critical to the survival of most prokaryotic and eukaryotic organisms. A clear indication of the importance of olfactory systems in higher eukaryotes is the significant proportion (up to 4%) of the genome that is devoted to encoding products used in building olfactory sensory tissues [(Firestein, 2001)]. The relatively low sensitivity and discrimination capabilities of the human nose, coupled with the common occurrence of olfactory fatigue, has led to the need for electronic instruments with sensors capable of performing repeated discriminations with high precision to eliminate human fatigue.<sup>85</sup>

There are smells that humans could not identify accurately, and electronic noses can, either more accurately or more safely. Electronic noses may not be as good as dog noses (but some are claimed to be as good instead, as we are going to see), but when the task is to smell such substances that would be dangerous even to such police dogs that regularly detect narcotics, electroni noses may be the solution. We devote the next section to electronic noses indeed.

#### 8.5.4.2 Electronic Noses

Odour assessment in industry resorts to any of the following:

- human sensory analysis,
- chemosensors, or
- gas chromatography.

With *gas chromatography*, information is obtained about volatile organic compounds, "but the correlation between analytical results and actual odor perception is not direct due to potential interactions between several odorous components".<sup>86</sup> Moreover, the police resorts to police dogs; individuals searching for truffles resorts

<sup>&</sup>lt;sup>85</sup> Wilson and Baietto (2009, p. 5101).

<sup>&</sup>lt;sup>86</sup> http://en.wikipedia.org/wiki/Electronic\_nose (when accessed in April 2011, it had been last modified in March of the same year).

to truffle dogs or pigs; and personnel searching for landmines may resort, among the other things, to dogs or even pigs, but in that case this is not only because the olfaction of such animals is superior to human olfaction, but also because casualties among such animals in case landmines detonate are more acceptable than human casualties. There also is a technique that resorts to wasps: "In the Wasp Hound odor-detector, the mechanical element is a video camera and the biological element is five parasitic wasps who have been conditioned to swarm in response to the presence of a specific chemical".<sup>87</sup>

*Electronic sensing* (or *e-sensing*) technologies aim at endowing devices with the capability of reproducing human senses using *sensor arrays* and *pattern recognition* systems. In e-sensing, an *electronic nose* is such a device that is intended to detect odours or flavours. One also speaks of *machine olfaction* in order to denote the automated simulation of the sense of smell. Electronic-nose technology<sup>88</sup> is the subject of a fifty-page survey by Alphus Wilson and Manuela Baietto (2009).

Since 1982, research has been conducted to develop technologies, commonly referred to as electronic noses, that could detect and recognize odors and flavors. The stages of the recognition process are similar to human olfaction and are performed for identification, comparison, quantification and other applications. However, hedonic evaluation is a specificity of the human nose given that it is related to subjective opinions. These devices have undergone much development and are now used to fulfill industrial needs.<sup>89</sup>

Wilson and Baietto explain (2009, p. 5100):

The sensor technology of artificial olfaction had its beginnings with the invention of the first gas multisensor array in 1982 [(Persaud & Dodd, 1982)]. Advances in aroma-sensor technology, electronics, biochemistry and artificial intelligence made it possible to develop devices capable of measuring and characterizing volatile aromas released from a multitude of sources for numerous applications. These devices, known as electronic noses, were engineered to mimic the mammalian olfactory system within an instrument designed to obtain repeatable measurements, allowing identifications and classifications of aroma mixtures while eliminating operator fatigue [ $^{90}$ ]. Unlike other analytical instruments, these devices allow the identification of mixtures of organic samples as a whole (identifiable to a source that released the mixture) without having to identify individual chemical species within the sample mixture [ $^{91}$ ]. Hundreds of different prototypes of artificial-nose devices have been developed to discriminate complex vapor mixtures containing many different types of volatile organic compounds (VOCs) [ $^{92}$ ]. These prototypes collectively represent various

<sup>&</sup>lt;sup>87</sup> http://en.wikipedia.org/wiki/Electronic\_nose Also see http://en.wikipedia.org/wiki/Wasp\_Hound

<sup>&</sup>lt;sup>88</sup> Also see Pearce, Schiffman, Nagle, Nagle, & Gardner's (2002) *Handbook of Machine Olfaction: Electronic Nose Technology.* 

<sup>&</sup>lt;sup>89</sup> http://en.wikipedia.org/wiki/Electronic\_nose.

<sup>&</sup>lt;sup>90</sup> Davide, Di Natale, and D'Amico (1995); Pelosi and Persaud (1988); Persaud (1992); Persaud, Bartlett, and Pelosi (1993), Shirley and Persaud (1990); Shurmer (1990).

<sup>&</sup>lt;sup>91</sup> Davide et al. (1995); Gardner (1991); Lonergan et al. (1996).

<sup>&</sup>lt;sup>92</sup> Ouellette (1999); Yea, Konishi, Osaki, and Sugahara (1994).

electronic aroma detection (EAD) technologies that utilize different sensor types including metal-oxide [ $^{93}$ ], semiconductive polymers [ $^{94}$ ], conductive electroactive polymers [ $^{95}$ ], optical [ $^{96}$ ], surface acoustic wave [ $^{97}$ ] and electrochemical gas sensors [ $^{98}$ ].

These electronic noses are typically used for recognition, rather than quantification<sup>99</sup>:

<sup>98</sup> On pp. 221–245 in Gardner and Bartlett's (1999) *Electronic Noses: Principles and Applications*.
 <sup>99</sup> But nevertheless, *olfactometers* (when used in one of the senses of that terms) are used to both qualify and quantify. The following is quoted from http://en.wikipedia.org/wiki/Olfactometer

An *olfactometer* is an instrument typically used to detect and measure ambient odor dilution. Olfactometers are utilized in conjunction with human subjects in laboratory settings, most often in market research, to quantify and qualify human olfaction. Olfactometers are used to gauge the odor detection threshold of substances. To measure intensity, olfactometers introduce an odorous gas as a baseline against which other odors are compared. Many scientists use the term "olfactometer" to refer to a device used to study insect behavior in presence of an olfactory stimulus. It consists of a tube with a bifurcation (with "T" or "Y" shape) where an insect walks and decides between to choices, usually clean air versus air carrying an odor. This is why this device is also called dual choice olfactometer. Alternatively, an *olfactometer* is a device used for producing aromas in a precise and controlled manner.

The following sense (as defined ibid.) is unrelated to electronic noses: "A flow-olfactometer is a complex instrument for creation of well defined, reproducible smell or pain stimuli in the nose without tactile or thermal stimulation. Stimulus rise time is fast enough to allow for recording of Olfactory Evoked Potentials (OEPs)." This device "produces a constant heated and humidified flow of pure air. This air flow runs continuously to the subjects nose. For the length of the stimulus pulse the continuous air flow is replaced by a bloc of odorized air" (ibid.). Contrast this to *dynamic dilution olfactometers* (ibid.):

The new generations of dynamic dilution olfactometers quantify odors using a panel and can allow different complementary techniques:

- odor concentration and odor threshold determination
- odor suprathreshold determination with comparison to a reference gas
- hedonic scale assessment to determine the degree of appreciation
- evaluation of the relative intensity of odors
- allow training and automatic evaluation of expert panels

These analyses are often used in site diagnostics (multiple odor sources) performed with the goal of establishing odor management plans.

A concept related to the latter is *electrogustometry*, i.e., the measurement of *taste threshold*, i.e., the minimum amount of electrical current required to excite the sensation of taste. When using an *electrogustometer*, current is made to pass through the tongue, and a metallic taste is perceived.

<sup>&</sup>lt;sup>93</sup> Egashira and Shimizu (1993); Nanto, Sokooshi, and Kawai (1993); Shurmer et al. (1989).

<sup>&</sup>lt;sup>94</sup> Yim et al. (1993); Pisanelli, Qutob, Travers, Szyszko, and Persaud (1994).

<sup>&</sup>lt;sup>95</sup> Lonergan et al. (1996); Freund and Lewis (1995); Hatfield, Neaves, Hicks, Persaud, and Tavers (1994); Persaud, Qutob, Travers, Pisanelli, and Szyszko (1994).

<sup>&</sup>lt;sup>96</sup> Staples (1999).

<sup>&</sup>lt;sup>97</sup> Again in Staples (1999).

Conventional electronic noses are not analytical instruments in the classical sense and very few claim to be able to quantify an odour. These instruments are first 'trained' with the target odour and then used to 'recognise' smells so that future samples can be identified as 'good' or 'bad' smells. Electronic noses have been demonstrated to discriminate between odours and volatiles from a wide range of sources.<sup>100</sup>

Electronic noses have a range of applications including *at-line quality control*,<sup>101</sup> various tasks in research and development (R&D),<sup>102</sup> and in process and production departments.<sup>103</sup> A possible application is to olfactive nuisance monitoring, but typical applications have been in the food & beverage sector (e.g., in order to detect spoiled produce), or to flavour & fragrance, or to cosmetics & perfume, as well as to packaging, and in the pharmaceutical and chemical industries.

The working principle of an electronic nose is that is should mimic human (or at any rate, natural) olfaction (it is said sometimes: "the mammalian sense of smell"), and that is should do so as a *non-separative mechanism*. That is to say, an odour (if this is what the device is intended to detect) or a flavour (if this is the device's target instead) should be perceived as a *global fingerprint*. An electronic nose is an instruments that consists of the following:

- head space sampling,
- sensor array,
- pattern recognition modules.

The latter generate signal patterns which in turn are used for characterising odours. "As a first step, an electronic nose need to be trained with qualified samples so as to build a database of reference. Then the instrument can recognize new samples by comparing volatile compounds fingerprint to those contained in its database. Thus they can perform qualitative or quantitative analysis".<sup>104</sup> The architecture of the system is as follows<sup>105</sup>: "Electronic Noses include three major parts: a sample delivery

<sup>&</sup>quot;Electrogustometric taste threshold depends on the duration of current pulse and area of contact of electrode and tongue" (http://en.wikipedia.org/wiki/Electrogustometry).

<sup>&</sup>lt;sup>100</sup> http://en.wikipedia.org/wiki/Machine\_olfaction (when accessed in April 2011, it had been last modified in February of the same year).

<sup>&</sup>lt;sup>101</sup> As listed at http://en.wikipedia.org/wiki/Electronic\_nose tasks of electronic noses within quality control include: conformity of raw materials, as well as of intermediate and final products; batch to batch consistency; detection of contamination, spoilage, or adulteration; origin or vendor selection; and monitoring of storage conditions.

<sup>&</sup>lt;sup>102</sup> Tasks of electronic noses at R&D laboratories include: formulation or reformulation of products; benchmarking with competitive products; shelf life and stability studies; selection of raw materials; packaging interaction effects; simplification of consumer preference test (ibid).

<sup>&</sup>lt;sup>103</sup> Tasks of electronic noses in process and production departments include: managing raw material variability; comparison with a reference product; measurement and comparison of the effects of manufacturing process on products; following-up cleaning in place process efficiency; scale-up monitoring; and the monitoring of cleaning in place (ibid.).

<sup>104</sup> http://en.wikipedia.org/wiki/Electronic\_nose

<sup>&</sup>lt;sup>105</sup> Ibid.

system, a detection system, a computing system". Electronic noses "generally comprise: an array of sensors of some type; the electronics to interrogate those sensors and produce the digital signals, and finally; the data processing and user interface software".<sup>106</sup> In particular<sup>107</sup>:

The **sample delivery system** enables the generation of the headspace (volatile compounds) of a sample, which is the fraction analyzed. The system then injects this headspace into the detection system of the electronic nose. The sample delivery system is essential to guarantee constant operating conditions.

Let us turn to detection<sup>108</sup>:

The **detection system**, which consists of a sensor set, is the "reactive" part of the instrument. When in contact with volatile compounds, the sensors react, which means they experience a change of electrical properties. Each sensor is sensitive to all volatile molecules but each in their specific way. Most electronic noses use sensor arrays that react to volatile compounds on contact: the adsorption of volatile compounds on the sensor surface causes a physical change of the sensor. A specific response is recorded by the electronic interface transforming the signal into a digital value. Recorded data are then computed based on statistical models.

The more commonly used sensors include metal oxide semiconductors (MOS), conducting polymers (CP), quartz crystal microbalance, surface acoustic wave (SAW), and Metal Oxide Semiconductors- Field Effect Transistors (MOSFET), Based on Ion Mobility Spectrometry (IMS), Based on Optical Florescence.

In recent years, other types of electronic noses have been developed that utilize mass spectrometry or ultra fast gas chromatography as a detection system.

The one remaining component of the architecture is the computing system:

The **computing system** works to combine the responses of all of the sensors, which represents the input for the data treatment. This part of the instrument performs global fingerprint analysis and provides results and representations that can be easily interpreted. Moreover, the electronic nose results can be correlated to those obtained from other techniques (sensory panel, GC, GC/MS). Many of the data interpretation systems are used for the analysis of results. These include artificial neural network (ANN),<sup>109</sup> Fuzzy logic,<sup>110</sup> pattern recognition modules, etc.<sup>111</sup>

The entire system being a means of converting complex sensor responses into an output that is a qualitative profile of the odour, volatile or complex mixture of chemical volatiles that make up a smell.<sup>112</sup>

<sup>106</sup> http://en.wikipedia.org/wiki/Machine\_olfaction

<sup>107</sup> http://en.wikipedia.org/wiki/Electronic\_nose

<sup>108</sup> Ibid.

<sup>&</sup>lt;sup>109</sup> Neural networks are the subject of Section 6.1.14 in this book.

<sup>&</sup>lt;sup>110</sup> Fuzzy logic is the subject of Section 6.1.15 in this book.

<sup>&</sup>lt;sup>111</sup> http://en.wikipedia.org/wiki/Electronic\_nose

<sup>&</sup>lt;sup>112</sup> http://en.wikipedia.org/wiki/Machine\_olfaction

A particular application of machine olfaction is to the discovery of explosives.<sup>113</sup> This is the case of the *Fido Explosives Detector*.<sup>114</sup> This is a tool of ICx Technologies, Inc.,<sup>115</sup> and is based on a proprietary technology invented in 2007 by Timothy Swager of the Massachusetts Institute of Technology. Fido detects trace levels of explosive materials. The name *Fido* reflects the claim that the device's performance at detecting explosives is comparable to that of highly trained explosives detection dogs. There are several configurations of the device: handheld, desktop, or robot-mounted. It has been integrated into both *Packbot* (of the firm iRobot) and *Talon* (of Foster-Miller), and put to use by the U.S. Army in both Iraq and Afghanistan.

The vapour pressure of the chemicals in explosives is low, and this makes the task of discovering explosives by means of an electronic nose more difficult (Jha & Yadava, 2010, p. 364):

An electronic nose consists of chemical sensor array with pattern recognition system to detect and identify vapour prints of target chemical compounds in gaseous phase. Its applications range from monitoring of hazardous chemicals in the environment, detection of disease through body odour or breathe, smell sensing and monitoring of food degradation through bacterial metabolites emission, to detection of explosives and narcotics through sniffing of the suspects. The detection of trace vapours emanating from hidden explosives is of paramount importance to homeland security and forensics. The security applications include sniffing hidden bombs, landmines, and suspected baggages or persons. The forensic uses involve early identification of devices and contraband activities for prevention of difficult countermeasures later. However, developing a portable electronic nose technology for these purposes is a difficult task due to extremely low vapour pressure of most of the chemical compounds comprising modern explosives.

Moreover, there are environmental differences which complicate the challenge (ibid.):

<sup>&</sup>lt;sup>113</sup> Electronic noses for the detection of explosives are the subject of Pamula (2003); Yinon (2003); Gardner and Yinon (2004); Jha and Yadava (2010). Of course, there are venues of research into the detection of explosives, other than resorting to electronic noses. For example, David Moore (2007) provided a survey of advances in trace explosives detection instrumentation. In particular, section 4.2 in Morre (2007) is concerned with vapour concentration methods, and also section 5 is on *trace vapour detection.* Wang (2004) discussed microchip devices for detecting terrorist weapons. Brenda Klock's project plan (2001) concerns aviation in the United States: her plan outlined "the field evaluation for threat detection in X-ray images of bags containing explosives at full and subcertification weights" (ibid., from the abstract). "X-ray systems in airports are designed to display images of baggage and its contents, including guns, knives, other weapons, and explosives. X-ray systems include a function designed to maintain on-the-job vigilance. Threat Image Projection (TIP) was developed to increase the proficiency of the primary skills required of a screener to interdict threats at the checkpoint. TIP exposes screeners to images of threats (e.g., weapons or explosives) by randomly projecting these threat images onto passenger bags as the bags move through the X-ray system. Alternately, TIP can also project the image of an entire bag containing a threat when there is a suitable gap between passenger bags" (ibid., p. iv).

<sup>&</sup>lt;sup>114</sup> http://en.wikipedia.org/wiki/Fido\_Explosives\_Detector Also see: http://www.icxt.com/ products/detection/explosive/fido/

<sup>115</sup> http://www.icxt.com/

The reliable detection of explosives vapour signature or vapour prints at such low concentrations is a challenging task even for some most advanced detection techniques today. The difficulty is further compounded as the trace explosive vapours are usually camouflaged in complex background of several interfering volatile organic compounds. The compositions of latter vary wildly over various kinds of sites of interest. For example, ambient air over landmines will be drastically different from that near the body of a person boarding an aircraft hiding a bomb or a busy market place threatened with a hidden bomb.

It is far from being the case that only one class of methodologies is employed in electronic noses for detecting explosives. Jha and Yadava (2010) resort to a surface acoustic wave (SAW) platform (ibid., pp. 364–365):

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In the model reported about by Jha and Yadava (2010), pattern recognition is performed by means of a neural network<sup>116</sup> with error backpropagation. Actually their article "proposes simulated SAW sensor array model as a validation tool for pattern recognition algorithms" (ibid., p. 369). Data preparation was by dividing the output of each sensor by the respective vapour concentrations and frequency shifts due to polymer coatings. Let

$$\Delta f_{ij} = C^i = \Delta f_p^j$$

respectively stand for the output of each sensor, the respective vapour concentrations, and frequency shifts. Their logarithms are taken to define a new matrix as

$$\Delta f_{ij} \leftarrow \log(\Delta f_{ij} / C^i \Delta f_p^j)$$

This is followed by the step of this data matrix being mean-centred and variancenormalised with respect to the vapour samples for each sensor in the array. This is called *dimensional autoscaling* (Osuna & Nagle, 1999). It is implemented as

$$\Delta f_{ij} \leftarrow (\Delta f_{ij} - \overline{\Delta f_j}) / \sigma_j$$

<sup>&</sup>lt;sup>116</sup> Neural networks are the subject of Section 6.1.14 in this book.

where

$$\overline{\Delta f}_{ij} = (1 / N) \sum_{i=1}^{N} \Delta f_{ij}$$

and

$$\sigma_j = \sqrt{(1/N)\sum_{i=1}^N (\Delta f_{ij} - \overline{\Delta f_j})^2}$$

"represents the column mean and standard deviation, respectively. Then, the denoising was done by truncating the full rank SVD [i.e., singular value decomposition] expansion of the redefined data matrix by a matrix of lower rank. The procedure implicitly assumes that the rank of the data matrix is lower than the number of sensors in the array. The details of SVD denoising are presented. The data matrix regenerated on the basis of truncated SVD approximates the original data with reduced noise. The preprocessed data matrix as explained above is then PCA [i.e., principal component analysis] processed, and the first few principal components are taken to define the set of features to represent vapour identities. The classification is done by artificial neural network based on the training by error backpropagation algorithm" (Jha & Yadava, 2010, p. 369).

There even exist an application of electronic noses to medical pathology. Dogs can smell some human diseases: "The connection between differences in the aroma of diseased vs. healthy human tissues and diagnostic detection of human pathogenesis is supported by studies using the extraordinarily keen olfactory abilities of well trained dogs whose sense of smell is one million times greater than human's in the ability to detect melanoma tissues [(Pickel, Manucy, Walker, Hall, & Walker, 2004)], bladder cancer [(Willis et al., 2004)], as well as lung and breast cancers [(McCulloch et al., 2006)]."(Wilson & Baietto, 2009, p. 5125). But electronic noses can also be used for the purposes of detecting diseases: "Many medical researchers have published experimental data in the last ten years to demonstrate the feasibility of using the electronic nose to diagnose human diseases and to identify many different pathogenic microorganisms through the detection of the VOCs [i.e. volatile organic compounds] they emit both in vitro and in vivo [(Casalinuovo, Di Pierro, Coletta, & Di Francesco, 2006)]" (Wilson & Baietto, 2009, p. 5125).<sup>117</sup>

One also talks about electronic tongues (Wilson & Baietto, 2009, p. 5134):

New emerging technologies are continually providing means of improving e-noses and EAD capabilities through interfaces and combinations with classical analytical systems for rapid discrimination of individual chemical species within aroma mixtures. E-nose instruments are being developed that combine EAD sensors in tandem with analytical detectors such as with fast gas chromatography (FGC) [<sup>118</sup>]. More complicated technologies such as

<sup>&</sup>lt;sup>117</sup> Also see Persaud's (2005) 'Medical applications of odor-sensing devices'.

<sup>&</sup>lt;sup>118</sup> Staples (2000).

optical gas sensor systems also may improve on traditional e-nose sensor arrays by providing analytical data of mixture constituents [<sup>119</sup>]. These technologies will have the capability of producing recognizable high resolution visual images of specific vapor mixtures containing many different chemical species, but also quantifying concentrations and identifying all compounds present in the gas mixture. Similar capabilities for identifying components of solid and liquid mixtures may be possible with devices called electronic tongues [<sup>120</sup>]. Several recent reviews provide summaries of electronic tongue technologies and discuss potential applications for food analyses [<sup>121</sup>].

Whereas Wilson and Baietto (2009) did not mention forensic science specifically, it stands to reason that electronic noses and electronic tongues could find there application as well.

### 8.5.5 Forensic Palynology

Patricia E. J. Wiltshire gave the fourth and last lecture, at the workshop on Archaeology and Forensic Science, held at the British Academy in London on 27 February 2007. The talk had the title "From Archaeology to CSI" (i.e., crime scene investigation), but the analysis of pollen or other plant remains (a field in which Europe is ahead of the United States, in forensic contexts) played an important part in it. The speaker (who was also introduced to the audience by a nickname, "Pollen Pat", by which colleague in the Forensic Science Service sometimes refer to her), is affiliated with the Forensic Science Service as well as with the University of Aberdeen. She has worked on about 200 crime cases, and often appears in court as an expert witness. Originally she was an environmentalist. From palynology (i.e., the analysis of pollen), she spread into all of forensic science, and in fact, that was the talk in which more, and the most shocking, photographs of decaying human bodies were shown. Nevertheless, it was a lucid, well-argued talk extolling the role of palynology in solving forensic cases.

As exemplified during the talk, these typically were cases of of murder. For example, a girl of 15 had been beaten to death. Her boyfriend was suspected, but he denied the charge, and denied he had been in a schoolyard where the girl was believed to have been beaten by a gang of youngsters. Nevertheless, Wiltshire found the pollen of a tree from his garden all over the body of the girl, as well as on the knees of the young man's trousers. He eventually got a life sentence, and his mother was convicted for covering up for him.

In some other cases brought as examples, no murder was involved; e.g., the speaker had advised the police whether some marks visible on a package had been

<sup>&</sup>lt;sup>119</sup> White, Kauer, Dickinson, and Walt (1996).

<sup>&</sup>lt;sup>120</sup> Winquist, Holmin, Krantz-Rülcker, Wide, and Lundström (2000); Söderström, Borén, Winquist, and Krantz-Rülcker (2003).

<sup>&</sup>lt;sup>121</sup> Gutés, Céspedes, and del Valle (2007); Winquist (2008); Scampicchio, Ballabio, Arecchi, Cosio, and Mannino (2008).

made in Europe or in Mombasa, Kenya. In another case, she belied a rape accusation: a girl claimed she had been pushed on a garden wall, but none of the pollen from the wall appeared on her garments. In the case that concluded the talk, namely, the case of a man wounded in the bottom, the speaker enabled the police to recategorise what at first the police had been believed to be a vicious sex crime, with the criminal still at large. She advised them to wait, before taking that direction of inquiry. Pollen analysis enabled her to reconstruct how the critically wounded man, with two very long stabs entering his body from his anus, got those wounds. Apparently he had been drunk, and tried to climb on a wall at a park, but in so doing, he had impaled himself.

Wiltshire began her talk by pointing out that where microorganisms are inhibited, plant remains (seeds, leaves, stems, pollen, spores) can be preserved for thousands of years. In such cases, the taxonomical identification of the plant to which the wellpreserved pollen belongs can be straightforward. Analysis of assemblages of these plant remains has allowed the reconstruction (or at least this is what some think) of ecological environments. Such ideal preservation does not obtain, in most cases, for pollen from archaeological or even recent, forensic contexts. Poor preservation makes it difficult to determine the taxonomical identification of pollen remains.

Botany has been used extensively in archaeology over the last thirty years, through macrofossil analysis and palynology. It can be applied to analysing the function of artefacts (food or medicine remains), or the function of features: retting (soaking), water and food storage, textiles. To be precise, palynology is the study of palynomorphs, i.e., any microscopic objects from the reproduction of plants, such as pollen grains, plant spores, fungal or fossil spores, and so forth. (Actually, palynology studies morphological, biochemical, and biogeographical aspects of these.) When palynology is forensic, it is interfaced to other forensic disciplines, some of them also from ecology, e.g., pedology, i.e., soil analysis. Clearly pedology is important for forensic purposes (e.g., for analysing soil in or around graves, or as traces found on shoes).

Palaeoecological pollen (e.g., as found in blank peat) is easy to identify, whereas, as mentioned, archaeological or forensic pollen is not, as it is in phases of decomposition. This is a problem, for the forensic application of palynology, because what is "forensic" must be defensible in court, and an expert witness is under attack by the barrister of the other side (whereas ethically, the duties of the prosecution expert witness are to the court, rather than to the police). Wiltshire mentioned an authority who once said that palynology is rubbish, because it cannot be proven. Forensic analysis has shown that palynology is very crude (whether paelaeoecological, or forensic). Still, the discipline is not alone in that situation. Take medicine. Ecology is not an absolute science; it is like medicine, in that you cannot test hypotheses. What you do have, is symptoms. The discipline not being exact hasn't prevented Wiltshire from working on about 200 crime cases. Some of her work is clandestine, and involves dressing up, e.g., as a shop assistant.

A forensic expert has to recognise anomalies, and one must know what *is* right, to know what is *not* right. An ecosystem can be recognised by proxy indicators of the place: wood, leaves, seeds, pollens, spores, diatoms, and so forth. Like in medicine,

these are symptoms. From the state of the flora on which a human body fell, it was understood it (a dead girl) was dumped in early August.

Any proxy indicator picked up by an offender might be traced back to the source: this is *Locard's Principle*.<sup>122</sup> Petrol cans, because of static electricity, have palynological indicators stick to them. Parasitic worm eggs of such worms that parasitise frogs are yet another proxy indicator, and they indicate that there must be a stream or pond. The worm eggs are secondary proxy indicators of frogs, and frogs are secondary proxy indicators of a stream or pond. Worm eggs do not belong in palynology, but by their very nature, they are relevant to the work of a forensic expert who is a palynologist. Palynology can be useful at all stages of decomposition of a corpse. Nevertheless, it is important to avoid contamination of the evidence while dissecting (like the crime scene or the perpetrator of a crime, also staff handling the evidence could leave traces, and it is paramount to be able to tell which is what.)

Let us broaden the discourse about palynology, before turning to software for that discipline. *Palynology* is the study of palynomorphs, both living and fossil. The term was introduced by Hyde and Williams (1944). *Actuopalynology* (as opposed to *palaeopalynology*) is "the study of palynomorphs which are either living, still retain their cell contents, or whose cell contents have been removed by maceration"; one of its branches is *forensic palynology* (used to "to determine the past location of items or persons based on the pollen and spores on or in them"). Note that whereas the antonym of *palaeopalynology* is *actuopalynology*, the antonym of *palaeontology* is *neontology* (i.e., the study of still extant or recent animal or vegetal taxa).

As to applications of *archaeological palynology* ("the analysis of pollen, spores, and other palynomorphs from archaeological sites"), they "include the reconstruction of prehistoric diet, funary practices, artifact function and source, archaeological feature use, cultivation and domestication of plants, and human impact on vegetation", according to definitions at a webpage by Owen Davis (1999). Archaeological palynology and quaternary palynology are part of *environmental palynology*, i.e., "The use of palynomorphs, their identification, distribution, and abundance to determine past changes in the biota, climate, or surficial geology of an area" (ibid.). A distinct area is *stratigraphic palynology*, i.e., "The use of palynomorphs, their identification, distribution, distribution, and abundance to correlate among sedimentary sequences" (ibid.); "the study of sedimentary sequences often includes both stratigraphic and environmental palynology" (ibid.). One of the areas of palynology is *mellisopalynology*, i.e., the study of pollen in honey or other bee products. Another area is *aeropalynology*. Another subdiscipline is *pollen analysis*.

According to a somewhat circular definition provided by Peter Hoen (1999), *palynomorph* are "A general term for all entities found in palynological preparations"; with the useful addition that: "In addition to pollen grains and spores, the

<sup>&</sup>lt;sup>122</sup> On Edmond Locard, a star in the history of French and world criminalistics, see in Section 8.7.1 below.

term encompasses acritarchs, dinoflagellates and scolecodonts, but not other microfossils, such as diatoms, that are dissolved by hydrofluoric acid". Therefore, the delimitation is according to a technique of analysis. According to a broad definition, provided by Owen Davis (1999), palynomorphs "include pollen, embryophyte spores, algae, fungal spores, dinoflagellates [which are unicellular aquatic organisms], microforaminifera, chitinozoans [marine fossils, shaped like flasks, occurring individually or in chains, usually assumed to be animal remains], acritarchs [consisting of a central cavity enclosed by a wall of single or multiple layers and a chiefly organic composition], and amoebas. Thus, they "include both plant and animal structures that are microscopic in size (from about 5  $\mu$ m to about 500  $\mu$ m), and are composed of compounds that are highly resistant to most forms of decay other than oxidation, being composed of sporopollenin, chitin, or related compounds. In the strict sense, palynomorphs are recognized as microscopic structures that are abundant in most sediments and sedimentary rocks, and are resistant to the routine pollen-extraction procedures including strong acids, bases, acetolysis, and density separation. In a broader sense, other microfossils sometimes are given 'courtesy appointments' as 'palynomorphs' even they do not survive routine pollenextraction procedures" (Davis, 1999). The term palynomorph was introduced in Tschudy (1961).

References in forensic palynology include Bryant and Mildenhall (1996), Bryant, Jones, and Mildenhall (1996), and Faegri and Iversen (1989, p. 174 ff). Also refer to the webpage on forensic palynology of the California Criminalistic Institute,<sup>123</sup> to Terry Hutter's forensic palynology website,<sup>124</sup> to the website of Dallas Mildenhall's Foresic Services in New Zealand,<sup>125</sup> and to a website of Lynne Milne,<sup>126</sup> at the University of Western Australia.

There exist software resources for palynology. For example, the European Pollen Database (EPD) can be queries through its website.<sup>127</sup> It also publishes a newsletter. "The EPD is a relational database handled by Borland's (now Corel) PARADOX software. It contains raw data of pollen counts, C14 dates, geographical location and description of sites, lithological description of the records, chronologies, and bibliographic references. [...] The EPD tables can be downloaded and read directly either by PARADOX or by other software such as Microsoft Access. Single files are available in other formats (ASCII and Tilia)" (from the EPD main page), Tilia being "a free software program written by Eric Grimm", and on which, information is provided at the Tilia website.<sup>128</sup>

The EPD website refers to "Web tools provided by the World Data Center for Paleoclimatology [and used in order] to retrieve basic information about a site, as

<sup>123</sup> http://www.ns.net/cci/Reference/Pollen/pollen.htm

<sup>124</sup> http://www.geoscience.net/Forensic\_Palynology.html

<sup>125</sup> http://www.gns.cri.nz/help/laboratory/foren.html

<sup>126</sup> http://science.uniserve.edu.au/faces/milne/milne.html

<sup>&</sup>lt;sup>127</sup> http://www.ncdc.noaa.gov/paleo/epd/epd\_main.html

<sup>128</sup> http://www.ncdc.noaa.gov/paleo/tilia.html

well as summary pollen diagrams: the Pollen Data Search Engine allows you search by P.I., place, or time; Webmapper is a visual map tool for locating data". The Pollen Data Search Engine is accessible online,<sup>129</sup> whereas at another address one can access Webmapper.<sup>130</sup> The EPD e-list is hosted at the University of Colorado.

Pierre A. Zippi's PAZ Software<sup>131</sup> develops Mac-supported (but allegedly crossplatform) specialty scientific software solutions, applications having been developed for geological, biostratigraphic and earth science. Biostratigraphic services, such as data analysis, paleo data digitisation, and charting, are available<sup>132</sup>; whereas Paleontology sample preparation services are available at another website of the same firm.<sup>133</sup> One of the products of PAZ software is Palynodata Table Maker 1.0, which (as advertised) "Converts unwieldy Palynodata references and taxa list to tabdelimited ASCII text files. The resulting tab-delimited text files may be imported into spreadsheets, databases or mail merge applications. Greatly increases the usefulness of this large stratigraphic database". TILIA.12 To Spread (for MacOS) is used to "convert older Tilia 1.12 ASCII data files to tab-delimited spreadsheet files. NAPDToSpread will convert Tilia 2.0 files to spreadsheets. Free with WellPlot"; and so forth. Stephen Juggins' webpage<sup>134</sup> provides information on more software for palynology.

### 8.5.6 Computing in Environmental Forensics

There exist applications of computing to environmental law (McBurney & Parsons, 2001; de Vey Mestdagh, 1999), and there exist computer tools for environmental forensics. The latter field is the subject of Murphy and Morrison (2002), which I reviewed (Nissan, 2003g). Practitioners of environmental forensics are concerned with chemistry, materials science, fluid dynamics, statistics, possibly biology, and they are required to know what the law is, how it works, and how they can construct and present their case effectively, which is typically but not exclusively when they are heard during litigation as expert witnesses. "Environmental forensic investigations frequently deal with the release of contaminants" (ibid., p. xiii). Site history (Bookspan, Gravel, & Corley, 2002, i.e., chapter 2 in Murphy & Morrison, 2002), e.g., at a landfill, requires acquiring documents, from archives or verbal depositions. I see a potential for dedicated software tools for assisting in this: not so much for retrieval (the paper trail is, after all, on paper, and archive material may well date back from before the computer era), as for organizing the development of the investigation report (Nissan, 2003g, p. 572).

<sup>129</sup> At http://www.ncdc.noaa.gov/paleo/ftp-pollen.html

<sup>130</sup> http://www.ncdc.noaa.gov/paleo/pollen.html

<sup>&</sup>lt;sup>131</sup> In Garland, Texas. See the website http://www.pazsoftware.com/

<sup>&</sup>lt;sup>132</sup> At the website http://www.biostratigraphy.com

<sup>&</sup>lt;sup>133</sup> At the website http://www.paleolab.com

<sup>&</sup>lt;sup>134</sup> Accessible at http://www.staff.ncl.ac.uk/stephen.juggins/int\_nn.htm

Computing is explicitly covered in the next chapter in Murphy and Morrison (2002), as the need for aerial photos (current or historical) of a site lends the subject to that book's chapter 3 (i.e., Ebert, 2002),<sup>135</sup> on photogrammetry, photointerpretation, and digital imaging and mapping. Electronics is on occasion linked to chemical spillages: a case study (section 3.5.2 in that same book) involves circuit board fabrication plants.

Chapter 5 in Murphy and Morrison's book, namely, Philp (2002), is on isotope measurements. "Bulk isotopic values have been readily available for many years but one of the most significant analytical advances in geochemistry in the past few years has undoubtedly been the development of combined gas chromatography – isotope ratio mass spectrometry (GCIRMS)" (ibid., p. 111). Computing and plotters are conspicuous in such analyses.

When it comes to environmental forensics rather than just environmental science, there is a factor that need be considered, considering computer-assisted modelling as pertaining to various areas of environmental science. "There are currently in excess of 400 groundwater flow (advective) and contaminant transport models" (ibid., p. 338, which is in chapter 8: Morrison, 2002). "In the United States, it is estimated that computer-based predictions of contaminant transport influence legal and policy decisions involving the allocation of at least 1 billion dollars each year" (ibid., p. 339). Several sources of uncertainty affect models.

The calculation-intensive subsurface models (Morrison, 2002) include, e.g., vapour, liquid, colloidal, or cosolvent transport through pavement or soil. "Preferential flows" of infiltrating liquid exploit preferential pathways, either artificial (dry wells, cisterns, utility line backfill, etc.), or natural: "worm channels, decayed root channels [...], soil fractures, slickenslides, swelling and shrinking clays, highly permeable soil layers, and insect burrows" (ibid., p. 335). This is fertile ground for computational science ( $\neq$  computer science).

"The origin of inverse modeling for contaminant transport in groundwater is predated by research in the heat transfer literature" (ibid., p. 339). Inverse (or reverse) models are also called "backward extrapolation models", "hindcasting" 125 (patterned after "forecasting"), and "backward random walk" (339). "In its simplest application, inverse modeling relies upon measured properties or contaminant concentrations to extrapolate to some point in the past, the age and the location of a contaminant release, most frequently by using geostatistical and optimization approaches" (ibid., p. 339). "In cases where light non-aqueous phase liquids (LNAPLs) are of interest, numerical models are available to predict LNAPL plume migration over time [...] and to age date the release using a direct estimate and nonlinear parameter estimation approach" (ibid., p. 342).

Potential sources of uncertainty affecting inverse models include: "The reasonableness of the sected porosity and hydraulic conductivity value(s)" (ibid., p. 343),

<sup>&</sup>lt;sup>135</sup> James I. Ebert is an environmental and forensic scientist who is also a certified photogrammetrist, and a trained archaeologist and anthropologist who has taken part in a project in palaeoanthropology and environmental research at Olduvai Gorge in Tanzania.

"The consistency of the groundwater flow direction and velocity over time", "The validity of the selected hydraulic gradient(s) values over time and distance from the release", "The number of data points and time interval during which the data were collected", "The nature of the release (steady versus non-steady", "The loading rate" (possibly based on production records), "The value(s) selected for aquifer(s) thickness (model specific)", "The horizontal and transverse dispersivity values" (ibid., p. 343), "Contaminant retardation and/or degradation rates" (ibid., p. 344), "Identification of the leading edge of the contaminant plume (model specific)", "The effect of recharge/discharge rates (if applicable) of water into the system and its impact on plume geometry and contaminant velocity" (ibid., p. 344). Bear in mind that a court may have to decide on whether some aspect of the model was reasonable, e.g., rejecting the defendant's model. Robert D. Morrison, the author of Ch. 8 in the same book, actually provides legal illustrations for a few of the items listed above. This way, for the "effect of recharge/discharge rates", he states (ibid., p. 344):

In the *Velsicol* case, for example, the court wrote, 'the district court rejected the defendant's water model as inaccurately under representing the extent of chemical contamination in the groundwater supply. In refuting the defendant's model, the court reasoned that Velsicol had failed to factor in the massive dumping of liquid waste, the ponding of water in the trenches, and the draw down on the aquifer caused by new homes.'

Chapter 9 in Murphy and Morrison (2002), "Forensic Air Dispersion Modeling and Analysis", features techniques such as the Gaussian plume model analysis. A "case study is a toxic tort in which the plaintiffs claimed dioxin and furan exposure" (ibid., p. 385). "Chapters 10 through 12 [in Murphy & Morrison (2002)] introduce statistical aspects associated with an environmental forensic investigation. Chapter 10 summarizes statistical tests for comparing data sets and evaluating temporal or spatial relationships. Chapters 11 and 12 present advanced pattern recognition techniques, of increasing utility within today's greater computing power. Chapter 11 discusses particulate pattern recognition techniques used for source identification" (ibid., p. xiv).

Thomas D. Gauthier's "Statistical Methods" (chapter 10 in Murphy & Morrison, 2002) points out that of the "variety of statistical analysis techniques[, m]ost examples in the literature involve rather sophisticated applications including principal components analysis and chemical mass balance receptor modeling (discussed elsewhere in [Murphy & Morrison, 2002]). These techniques are powerful analytical tools and provide useful insights for data interpretation but the results can be difficult to explain to a judge or jury" (ibid., pp. 391–392). "Relatively simple statistical analysis techniques can be used in environmental forensic investigations to compare data sets, characterize associations between variables, evaluate trends, and make predictions. Moreover, it is often possible to assign a degree of confidence to the results. This advantage is particularly useful in litigation scenarios where experts are often asked to assign a probability to the correctness of their opinion" (ibid., p. 425).

For the identification of air pollution sources, dispersion or receptor modeling (Watson & Chow, 2002, i.e., chapter 11 in Murphy & Morrison, 2002) is a relevant

tool. Modeling small particles suspended in the air goes by the name "particulate pattern recognition". "Receptor models use the variability of chemical composition, particle size, and concentration in space and time to identify source types and to quantify source contributions that affect particle mass concentrations, light extinction, or deposition" (ibid., p. 430). Such models include, e.g., *multiple linear regression on chemical markers* (ibid., p. 432), *temporal and spatial correlation eigenvectors* (ibid., p. 433),<sup>136</sup> and (which is of particular interest in our present book) *neural networks* (ibid., section 11.2.6, pp. 433–434): "Training sets that have known source–receptor relationships are used to establish the linkages in the neural net that are then used to estimate source contributions for data sets with unknown relationships. The network assigns weights to the inputs that reproduce the outputs. Neural networks can provide functional relationships that are solutions to the MLR and CMB equations" (ibid., p. 433), i.e., respectively, to the multiple linear regression and to the chemical mass balance equations. Moreover (ibid., p. 434):

Spectral analysis [...], intervention analysis [...], lagged regression analysis [...], and trend analysis [...] models separate temporal patterns for a single variable and establish temporal relationships between different variables. These models have been used to identify sources, to forecast future pollutant concentrations, and to infer relationships between causes and effects. It is especially important to include meteorological indicators in time series models [...] and to use data sets with comparable measurement methods and sampling frequencies.

Glenn Johnson, Robert Ehrlich, and William Full (2002, i.e., chapter 12 in Murphy & Morrison, 2002) provide an in-depth tutorial into the use of principal components analysis and receptor models in environmental forensics. Such numerical methods are used in order to determine the three parameters enumerated at the end of the following quotation (ibid., p. 462):

The identification of chemical contaminant sources is a common problem in environmental forensic investigations. Successful inference of sources depends on sampling plan design, sample collection procedures, chemical analysis methods, and knowledge of historical industrial processes in the study area. However, in compex situations where multiple sources contribute similar types of contaminants, even careful project training and design may not be enough. If sources cannot be linked to a unique chemical species (i.e., a tracer chemical), then mapping the distributions of individual contaminant concentrations is insufficient to infer source. If, however, a source exhibits a characteristic 'chemical fingerprint' defined by diagnostic proportions of a large number of analytes, source inference may be accomplished through analysis of multiple variables; that is, through use of multivariate statistical methods. The objective of a multivariate approach to chemical fingerprinting is to determine (1) the number of fingerprints present in the system, (2) the multivariate chemical composition of each fingerprint, and (3) the relative contribution of each fingerprint in each collected sample.

Out of the spectrum of numerical methods from the past twenty years, more recently developed "procedures are designed to solve more general problems, which take

<sup>&</sup>lt;sup>136</sup> For *eigenvectors*, see in fn. 24 in Chapter 6.

into account complications such as bad data, commingled plumes (i.e., mixing of source fingerprints), and the presence of sources not assumed or anticipated at the start of an investigation" (ibid., p. 462). "In terms of experimental design, the source apportionment problem in environmental forensic investigations falls between two extremes.

At one extreme, all potential sources are known in terms of their chemical composition, location, history, and duration of activity. At the other extreme, none of these are known with certainty. Chemicals at the receptor (e.g., estuary sediments, groundwater at a supply well) may be the result of activities long absent from the vicinity of the site" (ibid., p. 462). Morever (ibid., p. 463):

In the first case (a priori knowledge of all sources) the problem is a relatively simple one. Appropriate sampling locations can be determined using a conventional experimental design, which is part of conventional experimental statistics. Determination of contribution of each source can be extracted using a variety of linear methods, such as chemical mass balance receptor models (see chapter 11 of [Murphy & Morrison, 2002]). However, even when the contributing sources are known, environmental forensic investigations often proven to be more complex than initially anticipated. Chemicals in the environment may not retain their original composition. [...] The result of degradation will be resolution of one or more fingerprints, not originally anticipated.

When knowledge is uncertain, or unavailable, *exploratory data analysis* is to be used. indeed (ibid., p. 463):

At the other extreme, where nothing is known with certainty, potential sources may be suspected, but samples of the sources (i.e., fingerprint reference standards) may not have been collected, and may not exist in the literature. The industrial history of a region may be imperfectly known. Often, a small, low profile operation may be a major but completely overlooked source of contamination. For cases towards this end of the spectrum, we must take leave of the elegance of conventional experimental statistics, and move into the realm of exploratory data analysis (EDA). The fundamental difference between these two approaches (experimental statistics and EDA) is the former is associated with creation of explicit hypotheses, and evaluation of data in terms of well-defined tests and strong probabilistic arguments. In contrast, the objective of EDA is to find patterns, correlations and relationships in the data itself, with few assumptions or hypotheses [...]. If the fruits of an EDA result in a map where the concentrations of a multivariate fingerprint increase monotonically towards an effluent pipe, and the fingerprint composition is consistent with the process associated with that source, the obvious inference is that the potential source is the actual source. We recognize that we are not working in the realm of classical statistics or formal hypothesis testing, and that EDA is based on less rigirous probabilistic statement. However, such an approach should not be construed as 'second best'. In environmental forensic, an EDA approach may be the only valid option.

Besides, it is important to consider that there may be bad or questionable data: "Unfortunately such errors rarely manifest themselves as random noise. More often, they contribute strong systematic variability. If unrecognized, the result may be derivation of 'fingerprints' which have little to do with the true sources. Therefore, a necessary adjunct to any data analysis in environmental forensics is identification of outliers" (ibid., p. 464). Nevertheless, even "inclusion of vigilant outlier identification and data cleaning procedures" may "resul[t] in deletion or modification of data", and then "the data must be clearly identified, and justification for the action must be provided in the narrative that accompanies the analyses" (ibid.).

To infer the sources of contaminants and their contribution, receptor modeling as described in chapter 12 ofd Murphy and Morrison (2002) is used. The *receptor modeling problem* is formally introduced in section 12.1.2 (ibid., p. 464):

The objectives are to determine (1) the number of chemical fingerprints in the system; (2) the chemical composition of each fingerprints; and (3) the contribution of each fingerprints in each sample. The starting point is a data-table of chemical measurements in samples collected from the receptor (e.g., estuarine sediments, ambient air in a residential area). These data are usually provided in spreadsheet form where rows represent samples and columns represent chemical analytes. To the multivariate data analyst this table is a matrix. We will refer to the original data table as the m row by *n* column matrix **X**, where *m* is the number of samples and *n* is the number of analytes. We wish to know the number of fingerprints present (*k*) and chemical composition of each (objectives 1 and 2 above). This can be expressed as a matrix **F**, which has *k* rows and *n* columns. We also wish to know a third matrix **A**, which has *m* rows and *k* columns, and represents the contribution of each fingerprint in each sample (objective 3 above). Thus the following linear algebraic equation formally expresses the receptor modeling problem.

$$\begin{array}{c} \mathbf{X} \\ \text{Matrix dimensions} \end{array} = \begin{array}{c} \mathbf{A} \\ (m \times n) \end{array} \stackrel{\mathbf{F}}{(m \times k)} \quad (k \times n) \end{array}$$

Subsequent sections in chapter 12 are devoted to methodological categories and are themselves further subdivided rather densely. They include "Principal Components Analysis" (section 12.2) – the acronym is PCA – as applied to environmental chemometrics, and "Self-Training Receptor Modeling Methods" (section 12.3), which in turn includes

- polytopic vector analysis (PVA): this is an algorithm that evolved over forty years, and whose roots are "in principal components analysis, pattern recognition, linear algebra, and mathematical geology" (ibid., p. 498),
- the unique vector rotation method, and
- the so-called SAFER method (the acronym stands for Source Appointment by Factors with Explicit Restrictions), which "is used in extended self-modeling curve resolution" (ibid., p. 508).

"These three [of section 12.3 in Murphy & Morrison (2002)] are analogous in that (1) they do not require a training data set; (2) they are PCA based methods; (3) they involve solution of quantitative source appointment equations by development of oblique solutions in PCA space; and (4) each involves the use of non-negative constraints" (ibid., p. 498). In fact, this is a particular class of algorithms, in Johnson et al. (2002), that deserves special attention in the book your are reading now, which is specifically concerned with the uses of artificial intelligence for legal evidence. Machine learning, as well as self-training algorithms (such as in artificial neural networks) are well-known to artificial intelligence practitioners. But self-training methods are also known from multivariate statistical analysis. Section

12.3 in Johnson et al. (2002), "Self-training receptor modeling methods", is about "models designed to resolve three parameters of concern in a multivariate, mixed chemical system: (1) the number of components in the mixture, (2) the identity (i.e., chemical composition or fingerprints) of each component, and (3) the relative proportions of each component in each sample" (ibid., p. 497). Before Johnson et al. (2002), the full polytopic vector analysis (PVA) algorithm had not been set in any single paper (ibid., p. 498).

"PVA was developed for analysis of mixtures in the geological sciences, but it has evolved over a period of forty years, with different aspects of the algorithm presented in a series of publications, by a number of different authors" (ibid.). The originator was a palaeontologist, John Imbrie (1963), and this initially resulted in a series of Fortran programs. This eventually became CABFAC (Calgary and Brown FACtor Analysis), which "quickly became the most commonly used multivariate analysis algorithm in the geosciences" (ibid., p. 499). Later on, "William Full, as a PhD candidate at the University of South Carolina in the early 1980s, developed the DENEG algorithm, which allows end-members (sources) to be resolved without a priori knowledge of their composition, and without use of a training data set (Full et al., 1981, 1982)" (Johnson et al., 2002, p. 499). PVA involves resolution of oblique vectors as source compositions. This vector analysis is polytopic, because "PVA involves resolution of a k - 1 dimensional solid, a "simplex" or "polytope", within k dimensional principal component space" (ibid.). So if k = 4, the polytope is a tetrahedron. The algorithms at the core of PVA are implemented under default options in the commercial versions of the SAWVECA software of Residuum Energy, Inc., Dickinson, Texas. Johnson et al. explained (2002, pp. 506–507):

In TTFA, the subroutine that allows estimates of source composition in the absence of known sources is the unique vector rotation method [...]. This method begins by establishing a  $n \times n$  matrix where each row vector is 100% of a single analyte (i.e. 'unique vectors'). In turn, each of these vectors is iteratively rotated within principal component space.

Moreover (Johnson et al., 2002, pp. 508–509):

Another receptor modeling method, SAFER (Source Apportionment by Factors with Explicit Restrictions) is used in extended self-modeling curve resolution (ESMCR: Henry and Kim, 1990; Kim and Henry, 1999). Unlike PVA and TTFA, ESMCR does not typically involve transformation to unit length. [...] The SAFER method begins by defining the 'feasible region' where the simplex vertices and edges may reside. The inner boundary of the feasible region is defined by the convex hull of the data cloud [...]. The non-negativity constraints on the analytes define the outer boundary of the 'feasible region'. [...] For a three-component sistem [...], a feasible mixing model may be defined by direct inspection of the data plotted in the principal component space, and manually located within the fea-

PVA is one 'self-training' method that allows source profiles to be derived in absence of *a priori* knowledge of their chemical composition, but other such methods have seen considerable application in environmental chemical data. One of these is target transformation factor analysis (TTFA), which developed within analytical chemistry/chemometrics rather than mathematical geology/geochemistry (Roscoe and Hopke, 1981; Gemperline, 1984; Hopke, 1989; Malinowski, 1991).

sible region (this method is termed SAFER3D). A method of resolving higher dimensional mixing models has recently been described (Kim and Henry, 1999). That method calls on the use of additional explicit physical constraints. Examples of additonal constraints may include (1) total mass of samples, (2) *a priori* knowledge of a subset of contributing sources, (3) upper and lower limits on ranges or ratios of analyte compositions, or (4) constraints based on laws of chemistry (Kim and Henry, 1999). As was the case for the unique vector iteration method, SADER has been applied primarily in source apportionment studies in air (Henry et al., 1997).

#### 8.6 Forensic Engineering

*Forensic engineering* is a discipline<sup>137</sup> practised by such engineers who appear in court as expert witnesses, or at any rate are involved in dispute resolution and have to develop hypotheses and argue for them in a legal setting, including in front of arbitration panels, or in mediation and conciliation; for the difference between trial, arbitration, and mediation, see Hohns (1987), from the perspective of the forensic engineer in construction related disputes. Specter (1987) provides the following definition: "Forensic engineering may be generalized as the art and science of practitioners who are qualified to serve as engineering experts in matters before courts of law and in arbitration proceedings" (ibid., p. 61). The definition on Wikipedia<sup>138</sup> is as follows:

Forensic engineering is the investigation of materials, products, structures or components that fail or do not operate/function as intended, causing personal injury for example. The consequences of failure are dealt by the law of product liability. The subject is applied most commonly in civil law cases, although may be of use in criminal law cases. Generally the purpose of a forensic engineering investigation is to locate cause or causes of failure with a view to improve performance or life of a component, or to assist a court in determining the facts of an accident. It can also involve investigation of intellectual property claims, especially patents.

Forensic engineering typically concerns failure: the failure of structures, foundations, materials, or machinery, or of construction as a process. See, e.g., Lewis and Hainsworth (2006). The journal in the field is *Engineering Failure Analysis*. Construction related disputes are just one of the areas within forensic engineering, and involve civil engineers. A special area is automotive engineering, for investigating car crashes. "Forensic engineering involves more than engineers. We have on our roster chemists, architects, contract administrators, fire cause investigators, and experts in packaging, radiology and computer technology" (Garrett, 1987, p. 17).

<sup>&</sup>lt;sup>137</sup> In James and Nordby (2005, 2nd edn.; 2009, 3rd edn.), a volume on forensic science, the chapters about forensic engineering comprise one about structural failures, by Randall Noon (2005a; 2009a, 3rd edn.), then a chapter about basic fire and explosion investigation, by David Redsicker (2005, 2009, 3rd edn.), and a chapter on vehicular accident reconstruction, by Randall Noon (2005b; 2009b, 3rd edn.).

<sup>&</sup>lt;sup>138</sup> http://en.wikipedia.org/wiki/Forensic\_engineering.

Typically, scholarship in the field concerns failure theories, hypothesis testing, and failure investigations. It also concerns legal problems, practices, and policy connected with the testimony of forensic engineers. Not only engineers, but also trial lawyers and insurance adjusters are involved. In 1987, Pergamon Press (now Elsevier) started to publish a journal in the domain, entitled *Forensic Engineering*. In the United States, there is the *Journal of the National Academy of Forensic Engineers*. *Expert* (1985) is a guide for forensic engineers, published by the Association of Soil and Foundation Engineers. Suprenant (1988) is a textbook. Other books in forensic engineering include Noon (1992, 2000), and Lewis, Gagg, and Reynolds (2004). The latter was authored at the Open University in Britain, and it is interesting to see how the website of that institution promotes both its forensic service to external clients, and its curriculum in forensic engineering,<sup>139</sup> as can be seen, the academic disciplinary compartment is Materials Engineering, home the focus there is on product failure, and individual researchers are specialised in a rather narrow category of materials:

Product failure has been studied in the Materials Engineering Department since its inception, and forms the basis of several courses presented by the department (T839 Forensic Engineering). The loose grouping of individuals study a very wide range of cases, from metal fatigue of crankshafts ([...]), stress corrosion or ozone cracking of fuel lines ([...]), breakage of glass bottle causing personal injury ([...]), failure of power hand tools ([...]) to infringement actions in medical devices and garden products ([...]). Cases are studied within a framework set by litigation, enquires by insurers, or companies and institutions. Work has also been funded by the Consumer Research Laboratories in order to improve the design of handpumps and rising mains for use in developing countries. Independent research by the group has revealed new and unsuspected failure modes in both traditional and entirely new materials. All members have had recent experience of court procedure and giving expert advice before tribunals. This group has links with the *Fracture and Fatigue* and *Residual Stress* groups in the department. [...]

"[T]he insurance industry and the legal profession [are] the primary users of forensic engineering services" (Garrett, 1987, p. 17). Clients typically require "quality technical people to help them solve the puzzle of 'What happened?'" (ibid., p. 17). "[Y]ou are hired by an insurance company, a lawyer, a builder, a manufacturer, or an irate or injured citizen" (Knott, 1987, p. 11). "We ask clients to refrain from deciding in advance what kind of an expert they need. They may ask for a metallurgist when what they really need is a traffic engineer. And they may need several experts, not just one" (Garrett, 1987, p. 18). "If your client is an insurance company, it is usually interested in proof that it should or should not pay a claim" (Knott, 1987, p. 11) "The work is done to determine the probable cause of a failure or an accident. The lawyer will have to prove the case in court, and a proof in law is not the same as a proof in engineering" (ibid.). There are different categories of what is to be proven, in such cases in which a forensic engineer may be called to testify. "The law has evolved into distinct arenas. For example, strict liability, negligence,

<sup>139</sup> http://materials.open.ac.uk/research/res\_forensic.htm.

and warranty. You may be able to show that the manufacturer had a first-rate quality control program. This is an excellent defense in negligence but has absolutely no application in strict liability" (ibid.).

Software for engineering, especially simulations for *failure analysis*, or then software for *structural risk evaluation*, or software modelling the plasticity and fracture of solid materials, will be of use to the forensic engineer in some categories of cases. Importantly, the entry for "Forensic engineering" in Wikipedia makes a distinction between forensic science and forensic engineering:

There is some common ground between forensic science and forensic engineering, such as scene of crime and scene of accident analysis, integrity of the evidence and court appearances. Both disciplines make extensive use of optical and scanning electron microscopes, for example. They also share common use of spectroscopy (infra-red, ultra-violet and nuclear magnetic resonance) to examine critical evidence. Radiography using X-rays or neutrons is also very useful in examining thick products for their internal defects before destructive examination is attempted. Often, however, a simple hand lens suffices to reveal the cause of a particular problem. Trace evidence is often an important factor in reconstructing the sequence of events in an accident. For example, tyre burn marks on a road surface can enable vehicle speeds to be estimated, when the brakes were applied and so on. Ladder feet often leave a trace of movement of the ladder during a slipaway, and may show how the accident occurred.

Section "methods" (ibid.) remarks:

Methods used in forensic investigations include reverse engineering, inspection of witness statements, a working knowledge of current standards, as well as examination of the failed component itself. The fracture surface of a failed product can reveal much information on how the item failed and the loading pattern prior to failure. The study of fracture surfaces is known as fractography. Fatigue often produces a characteristic fracture surface for example, enabling diagnosis to be made of the cause of the failure. The key task in many such investigations is to identify the failure mechanism by examining the failed part using physical and chemical techniques. This activity is sometimes called root cause analysis. Corrosion is another common failure mode needing careful analysis to determine the active agents. Accidents caused by fire are especially challenging owing to the frequent loss of critical evidence, although when halted early enough can usually lead to the cause. Fire investigation is a specialist skill where arson is suspected, but is also important in vehicular accident reconstruction where faulty fuel lines, for example, may be the cause of an accident.

# 8.7 Individual Identification

# 8.7.1 The Cultural Context: The History of Identification Methods

It is important to understand the history of the use of fingerprints for identification purposes, in order to realise how the mutual expectations of law enforcers and of perpetrators have evolved. This in turn is potentially useful for the purposes of future AI tools that would reason about the evidence. Understanding the dynamics of how both law enforcers and perpetrators had to become more and more clever, makes one realise that one cannot come up as well with the ultimate technique of detection. Hardware and software you may produce may prove useful for a while, or even for a long time, but requirements will change, and older techniques will either have to change, or have to be supplemented with something else. Within AI, the area concerned with how to reason with an agent's beliefs about the beliefs of another agent is known as *agents' beliefs* (e.g., Ballim, By, Wilks, & Liske, 2001; Barnden, 2001).

The following example shows how a course of action taken by perpetrators with the intention of suppressing the evidence, actually backfired. During the Troubles in Northern Ireland in the 1970s and 1980s, bombs prepared by terrorists sometimes contained the gloves they had been using. Their assumptions was that the blast would destroy the gloves, but it was not so. Law enforcers hoped to find, inside the remains of such gloves, the fingerprints of perpetrators – that is to say, evidence that the terrorists had placed inside the bombs by believing that by so doing, they would destroy the evidence.

Those fingerprints were detected, because of their coating of lipids (traces of the fat on the skin of fingertips). Radioactivity was used, in order to make that coating of lipids (fat from the fingertips) apparent, using a photographic technique or based on luminescence, and the former appeared to be better than the latter.<sup>140</sup> Let us recapitulate, with more technical details:

- The people making bombs would wear gloves.
- When they finished they would place the gloves with the device.
- The fingerprints (contrary to what the bombers had assumed) could then be recovered from the inside of the gloves.
- The radioactive SO2 (sulfur dioxide) absorbed could then be detected<sup>141</sup> by luminescence or by photographic techniques (using silver halides).<sup>142</sup> The graphite

 $<sup>^{140}</sup>$  Around 1980s, such circumstances were still secret, but by 2010, when I was informed verbally, they were in the public domain.

<sup>&</sup>lt;sup>141</sup> E.g., in Goode, Morris, and Wells (1979), a team from the Atomic Weapons Research Establishment of the British Ministry of Defence, based at Aldermaston, Berkshire, described the application of radioactive bromine isotopes for the visualisation of latent fingerprints. A vapour phase bromination procedure was investigated for reaction with unsaturated lipids present in a fingerprint deposit.

<sup>&</sup>lt;sup>142</sup> The light-sensitive chemicals used in photographic film and paper are silver halides. A *silver halide* is one of the compounds formed between silver and one of the halogens, namely: silver bromide (AgBr), silver chloride (AgCl), silver iodide (AgI), and three forms of silver fluorides. As a group, they are often given the pseudo-chemical notation AgX. Silver halides, except for silver fluoride, are extremely insoluble in water.

<sup>&</sup>quot;Silver halides are used in photographic film and photographic paper, as well as graphic art film and paper, where silver halide crystals in gelatin are coated on to a film base, glass or paper substrate. The gelatin is a vital part of the emulsion as the protective colloid of appropriate physical and chemical properties. Gelatin may also contain trace elements (such as sulfur) which increase the light sensitivity of the emulsion, although modern practice uses gelatin without such components. When absorbed by an AgX crystal, photons cause electrons to be promoted to a conduction band (de-localized electron orbital with higher energy than a valence band) which can be attracted by a sensitivity speck, which is a shallow electron trap, which may be a crystalline defect or a cluster of

fine powder for conventional fingerprint recording could not be used. The photographic techniques proved to be the most efficient.

A medal dated 1969, designed by Jiri Harcuba, was struck in Czechoslovakia, in bronze, silver, and for the first time, with a golden proof, for the centenary of the death of Jan Evangelista Purkyně, a physician considered the discoverer and founder of *dactyloscopy*, i.e., the identification of persons based on their fingerprints. (Defying the Soviet invasion, the Czech mint also struck Harcuba's medal, also dated 1969, commemorating Jan Palach, the student who set himself ablaze in protest.) Purkyně (1787–1869) is actually much better known as the father of his-tology: the middle cortex of the cerebellum were named *Purkinje cells*, after him. Outside the Czech Rebublic or Slovakia, his family name is usually spelled *Purkinje*.

No mention of Purkyně is made in the entry for "dactyloscopie" in Nathanaël Tribondeau's glossary of criminalistics (Tribondeau, accessed 2006). About the origination of the technique, it just states: "Utilisée pour la première fois en 1880 par l'Anglais William J. Herschel" ("Used for the first time by an Englishman, William J. Herschel"). He got an entry in his name: "Born in 1738 and deceased in 1922, he is the inventor, along with Francis Galton [Darwin's cousin], of dactyloscopy (the collection and analysis of fingerprints). It was looking for some surer means than just a signature, for the authentication of commercial documents, that this English official seconded to Bengal conceived of the idea, from 1880, of having his suppliers mark contracts with their fingerprints, to avoid future disputes. It was only later on, that this procedure was used by the scientific police, with the success we all know about" (my translation).

What Tribondeau does not say about the adoption by fingerprints in France, is related in an article by Jean-Marc Berlière (2005) about the Scheffer Affair, about the first conviction of a suspect, in France, revolving around on identification by fingerprints. Berlière explains that with the emergence, in the positivist era, of the realisation, turned into an obsession in France, that recidivists are responsible for most crimes (this actually came along with now discredited theory of Cesare Lombroso about the born criminal), perpetrators smarted up to the challenge, and

silver sulfide, gold, other trace elements (dopant), or combination thereof, and then combined with an interstitial silver ion to form silver metal speck" (http://en.wikipedia.org/wiki/Silver\_halide).

Apart from applications to photography, experiments have been conducted for medical purposes: silver halide optical fibres for transmitting mid-infrared light from carbon dioxide lasers, allow laser welding of human tissue, as an alternative to traditional sutures. Another use is in the making of lenses, exploiting photochromism: Silver halides are also used to make corrective lenses darken when exposed to ultraviolet light. "When a silver halide crystal is exposed to light, a sensitivity speck on the surface of the crystal is turned into a small speck of metallic silver (these comprise the invisible or latent image). If the speck of silver contains approximately four or more atoms, it is rendered developable – meaning that it can undergo development which turns the entire crystal into metallic silver. Areas of the emulsion receiving larger amounts of light (reflected from a subject being photographed, for example) undergo the greatest development and therefore results in the highest optical density" (ibid.).

law enforcement was faced with the problem of how to identify a person who has been using several false names.

Alphonse Bertillon proposed for identification to consider the *identité anthropométrique*, based on measurements of the bones of adults. The French police adopted this technique in 1883. There is a sense in which it was of little help, as perpetrators were unlikely to leave their bones around, yet it was rather useful for identifying recidivists who were using a false name, provided they had been *bertillonnés*, i.e., had their anthropometric measurements taken before. On 16 February 1883, a recidivist was recognised for the first time, based on anthropometric measurements.

By the end of 1883, 49 ex-cons had been identified that way; 241 during the next year (ibid., p. 350, fn. 3). The technique featured, arousing much interest, at the international exposition of Paris of 1889. "Its zenith was when, in the spring of 1892, it enabled Bertillon to identify 'Ravachol', who at the time was terrifying Paris, with a Koenigstein who had been *bertillonné* at Saint-Étienne prison two years earlier" (ibid., p. 350, my translation). The technique could tell apart two dissimilar persons, but similar anthropometric data could not be ascribed with certainty to the similar person. This was a major flaw.

Fingerprints were to prove a better technique. Fingerprints were observed by Italian anatomist Marcello Malpighi (1628–1694). That Purkyně described fingerprints in 1823 is mentioned by Berlière (who wrongly Hispanicises his first name as *Juan*). So is empirical use in British-ruled India, as well as the role of the physician Henry Faulds, or the classifications developed by Francis Galton, Edward Henry, and Juan Vucetich during the 1890s.

Berlière relates the role which Bertillon had, in the first conviction in France based on fingerprints.<sup>143</sup> On 16 October 1902, the body of a male servant was discovered inside the Parisian apartment of a dentist. The motive appeared to be theft. On a broken glasscase, many fingerprints were found. On one side of the glass, there was the print of a thumb, the prints of three other fingers being on the other side: these were the fingerprints of a person who has held the glass after it was broken.

One difficulty was that the fingerprints were overlapping, because of the transparency of the glass. An advantage for Bertillon was that he got the fingerprints of four adjacent fingers of the right hand, i.e., the only hand for which fingerprints had been stored. Bertillon searched the archives, card by card, without classification criteria to guide the search, and identified Henri-Léon Scheffer, born in 1876, who had been arrested and had had his fingerprints taken on 9 March 1902.

Bertillon's report to the examining magistrate, stating this identification, is dated 24 October 1902. Berlière points out (p. 351, fn. 7) that this case is usually misrepresented as though it was the first time that a perpetrator was identified based only

<sup>&</sup>lt;sup>143</sup> The historical origins of identification by fingerprints have been discussed, e.g., by Simon Cole (1999), a criminologist who is prominent among those who question the accuracy, sufficiency, and individuality of fingerprint identification.

on fingerprints. That was not the case, as an intimate relation had been discovered between the victim and Scheffer, and the latter had been among the suspects.

For Berlière, Bertillon's role in identification by fingerprints becoming an established technique is paradoxical, as Bertillon was aware of publications about fingerprints from other countries, yet had been quite reluctant to adopt this method, mainly because of the difficulty to classify fingerprints, but also because he considered them not to be distinctive enough (a laughable claim, vis-à-vis the weakness of his own anthropometric method). Locard was sarcastic about Bertillon in that respect. Edmond Locard (1877–1966) was a younger star of French criminalistics, who established France's first scientific police laboratory (*Laboratoire de Police scientifique*) in Lyons in January 1910, and published during the 1930s a *Traité de criminalistique* in seven volumes of lasting value to forensic laboratories worldwide. Locard's thesis on legal medicine is dated 1902.

Berlière remarks that stubbornness was a trait of Bertillon's personality, and that this played a role in his determined attitude against Dreyfus, when, an expert witness in court, he insisted on interpreting the graphological evidence unreasonably. Berlière points out that this was one reason Locard disliked Bertillon quite intensely. Berlière mentions a major error made by Locard himself: in 1945, a woman was sentenced to forced labour for life, having been identified by him as the anonymous Nazi collaborator who had denounced a partisan in the French Resistance; she was only freed after the error was recognised as such in 1956.

Locard himself developed (among the other things) graphometrics, and solved some cases based on graphological evidence; e.g., he solved a case in which a husband guided the hand of his dying wife in writing a will in his favour (in 1923, Locard published a paper about 'L'Écriture à la main guidée' in the *Revue de droit pénal et de criminologie et Archives internationales de médecine légale* in Bruxelles). Vols. 5 and 6 of Locard's *Traité de criminalistique* were published in 1935, and in fact they are entitled *L'Expertise des documents écrits*, being devoted to the analysis of written documents. Vol. 1 appeared in 1931, and was devoted to fingerprints and to other traces (*Les Empreintes et les traces dans l'enquête criminelle*). Vols. 3 and 4 appeared in 1932, and were about identification evidence (*Les Preuves de l'identité*).

Apparently Bertillon's endorsement of fingerprints came after the physician Lacassagne (one of the founders of criminalistics) and Galton had extolled to him the method. He remained reluctant to see his own method, based on anthropometric measurement, made obsolete by fingerprint identification. His successor who took over from him at the police, quoted by Berlière (p. 358), testified that in February 1914, upon Bertillon's death, out of the 1,200,000 cards held by the scientific police, only 60,000 had been classified based on the fingerprints. France adopted classification based on fingerprints considerably later than Argentina, the United Kingdom, and other countries (ibid.). Argentina was pioneering in criminalistics, and there actually is an anecdote (it was even related in the *Reader's Digest*) about Locard, in his student days, becoming enthralled with the discipline one day, when he was accompanying his medicine professor, the famous Lacassaigne. They had to wait because of the rain, and Lacassaigne gave him an Argentinean journal,

asking Locard to translate an article for him on the spot. What Locard read on that occasion determined his professional future. Alexandre Lacassagne (1843–1924) became "Professeur de Médecine Légale" in 1880, and established research in the domain in Lyons, where it was carried further by Étienne Martin, Pierre Mazel, Jacques Bourret, as well as by his most famous continuator, Edmond Locard.<sup>144</sup>

In his memoirs of the First World War, 'Aziz Bek, Head of Intelligence of the Fourth Ottoman Army, described an episode, which started when a spy stole documents (being unable to photograph or copy them on the spot) and then returned them. The commander of the 43th Division in Syria had noticed the disappearance of the defence plans, and on their reappearance he would not touch them. He had a laboratory detect fingerprints, then discreetly obtained the fingerprints of all officers, soldiers and clerks at the division headquarters. A circular was distributed, that had to be signed and returned. This way, a signature would identify the fingerprints unwittingly left on the paper. This led to the identification of an officer and of a soldier, and further investigation uncovered their links to a spy ring ('Aziz Bek [1933–1937] 1991, pp. 116–117).

Twenty years earlier, a course of action such as this one hadn't been taken, in France, with the *bordereau* ascribed to Alfred Dreyfus, but then such forensic "expertise" that had been sought at the time, had the goal of confirming his alleged guilt, rather than discovering the actual identity of the spy. "Evidence" had included supposed similarities in the handwriting, as well as the fact that when Dreyfus was ordered to write down under dictation a text identical with that of the dossier, he was visibly shaking (who wouldn't, in his shoes?).

The example of the forensic "expertise" seeking to confirm that Dreyfus had written the given document, illustrates the pitfalls of *confirmationism* (tests seeking to confirm rather than disprove a hypothesis),<sup>145</sup> and more broadly, of tunnel thinking. The forensic experts were so committed to the claim that the suspect was guilty, that it was almost a foregone conclusion that they would find what they were looking for. This suggests that cognitive science and artificial intelligence research producing computational simulations of tunnel thinking could provide some clarification

<sup>&</sup>lt;sup>144</sup> Berthold Laufer, who was the United States leading Sinologist during the first three decades of the twentieth century, also authored a report on the history of fingerprinting (Laufer, 1913, 1917). Berthold Laufer was born in Cologne, Germany, in 1874. After earning his doctorate at the University of Leipzig in 1874, Berthold Laufer moved on the following year to the United States. He had obtained an invitation to the American Museum of Natural History in New York City, thanks to the famous anthropologist Franz Boas (1858–1942). Laufer eventually became curator of Asiatic Ethnology and Anthropology at the Field Museum of Natural History, Chicago, where he had moved in 1907, leaving a lectureship in Anthropology and East-Asiatic Languages at Columbia University. He died in 1934, upon leaping from the roof of the hotel in which he lived in Chicago, but the mode of his demise goes unmentioned in Latourette's (1936) biographical memoir of Berthold Laufer for the U.S. National Academy of Sciences.

<sup>&</sup>lt;sup>145</sup> *Confirmation bias* as occurring in the police interrogation rooms, see e.g. Kassin, Goldstein, and Savitsky (2003), Meissner and Kassin (2002), and Hill, Memon, and McGeorge (2008). Confirmationism is sometimes referred to as *cognitive dissonance*. This name for the concept was spread by a book by Leon Festinger (1919–1989), *A Theory of Cognitive Dissonance* (Festinger, 1957).

at the theoretical level, which would eventually be put to use in the design of tools for assisting with reasoning about the evidence. It would be blue sky research eventually finding (hopefully) practical application in a better design of tools. One possibility would be to develop an AI tool that would test protocols or possibly other software, trying to ensure that they are not marred by pitfalls of the kind mentioned earlier. In a sense, such pitfalls have already been sometimes argued to affect widespread techniques. The adoption of the Dempster-Shafer statistical technique is rather widespread in AI tools, but a major problem stemming from the adoption of Dempster-Shafer is that it is apparently tilted towards *confirmationism* instead of *falsificationism*.

# 8.7.2 DNA and Fingerprints

## 8.7.2.1 DNA Evidence: A Brief Introduction

Computational methods for determining individuality (Srihari & Su, 2008) encompass several domains in forensic science, from fingerprint analysis to handwriting recognition. In the 1990s and 2000s, DNA has become the evidence per excellence for personal identification. DNA evidence is usually considered to be hard evidence about a person's identity.<sup>146</sup> Nevertheless, DNA fingerprinting is not uncontroversial.<sup>147</sup> Concerning DNA evidence, consider the application to paternity claims.<sup>148</sup>

<sup>&</sup>lt;sup>146</sup> An overview of techniques of DNA analysis is provided by Duncan, Tacey, and Stauffer (2005, 2nd edn.; 2009, 3rd edn.), whereas in the same volume, Susan Herrero (2005, 2nd edn.; 2009, 3rd edn.) provides an overview of legal issues in forensic DNA. DNA fingerprinting is treated, e.g., in Baldin (2005), Inman and Rudin (2002), National Research Council (1996), Stockmarr (1999), Lauritzen and Mortera (2002), Meester and Sjerps (2004), Easteal, McLeod, and Reed (1991), Krawczak and Schmidtke (1994), and Butler (2001). See a brief, yet important debate (Krane et al., 2008), with useful bibliographies by the various commentators, about *sequential unmasking* in DNA identification. It was republished in www.bioforensics.com under the rubric *forensic bioinformatics*.

<sup>&</sup>lt;sup>147</sup> Roberts (1991) is about the controversy about DNA fingerprinting. Nielsen and Nespor (1993) is on human rights in relation to genetic data and screening, in various contexts.

<sup>&</sup>lt;sup>148</sup> Of course, historically there was interest in ascertaining paternity even before medical knowledge and technology would enable such checks credibly. For example, discussing early modern English midwifery books, Mary Fissell remarks (2003, p. 65): "Midwifery books of the 1670s and 1680s were obsessed by the issues of fatherhood. How could you know the father of a child? In certain circumstances, such as illegitimate births, knowing the father had long been important. These texts devoted much more attention to resemblance between parents and their children than did previous midwifery texts. This crisis in paternity had multiple roots. There was no sudden increase in illegitimate births that might have prompted such an interest. Some of the crisis may be due to longer-term intellectual changes that gradually made similitude a happenstance rather than an indicator of profound connection. No longer did resemblance mean something important about relatedness." Fissell further explains (ibid., pp. 65–66): "The crisis can also be understood in political terms. In [the] 1670s and 1680s, the question of monarchical succession – the transmission from one generation to another – became ever more pressing. Charles II did not have any legitimate sons, and his brother James's Catholicism made him a highly problematic successor. The

An article by an Oslo-based team, Egeland, Mostad, and Olaisen (1997), describes PATER, a software system for probabilistic computations for paternity and identification cases, in cases where DNA profiles of some people are known, but their family relationship is in doubt. PATER is claimed to be able to handle complex cases where potential mutations are accounted for.

Another project resulted in, e.g., Dawid, van Boxel, Mortera, and Pascali (1999), Dawid, Mortera, and Pascali (2001), and Dawid, Mortera, and Vicard (2010), Vicard, Dawid, Mortera, and d Lauritzen (2008), and Vicard and Dawid (2006), specifically about the statistics of disputed paternity. A prominent statistician, Philip Dawid, now at the University of Cambridge, at the time when he was affiliated with University College, London was remarking as follows at his research interests webpage<sup>149</sup>:

I have been interested in the application of Probability and Statistics to a variety of subject areas, in particular to Medicine (especially medical diagnosis and decision-making), Crystallography, Reliability (especially Software Reliability) and, most recently, *Legal Reasoning*. I have acted as expert advisor or witness in a number of legal cases involving DNA profiling. This has led me to a thorough theoretical examination of the use of Probability and Statistics for *Forensic Identification*. I head an international research team focusing on the analysis of complex forensic DNA identification cases using Probabilistic Expert Systems. These legally inspired investigations have also highlighted the many logical subtleties and pitfalls that beset evidential reasoning more generally. To address these I have established a multidisciplinary research programme on *Evidence, Inference and Enquiry* [<sup>150</sup>] at University College London. This is bringing together researchers from a wide diversity of disciplinary backgrounds to seek out common ground, to advance understandings, and to improve the handling of evidence.

duke of Monmouth's rebellion (the duke being the king's illegitimate son), the Rye House Plot, the Popish Plot [i.e., a libel against Catholics leading to executions] – all kept political instability at the forefront of popular awareness. The high politics of legitimate succession moved right into the birthing room in the Warming Pan Baby scandal, which erupted when James II's wife, Mary of Modena, gave birth a male heir – or did she? She had had eight previous pregnancies, all stillbirths or very short-lived infants. This baby was full-term and healthy, and some observers claimed it was a fraud. They suggested that a healthy baby had been smuggled into the birthing room, concealed in a warming pan, and substituted for Mary's sickly or stillborn babe."

From antiquity to the mid eighteenth century, the *theory of maternal imagination* had currency. It claimed that white parents could have a black child (or vice versa) if the mother, at the time of conception, saw or imagined a man with the other skin colour. A pregnant woman seeing an image of St. John the Baptist wearing hairy skins (or himself hairy) was believed to have given birth to a hairy daughter, who was depicted on the frontispiece of several 17th and early eighteenth century midwifery books. Fissell discussed such imagery. And books sometimes even suggested, Fissell points out, that a woman could deceive her husband by imagining her husband while having intercourse with her lover, so her illegitimate child would resemble her husband rather than her lover.

<sup>&</sup>lt;sup>149</sup> It can be accessed at http://www.ucl.ac.uk/~ucak06d/research.html Philip Dawid's work on identification evidence, disputed paternity, and in forensic statistics includes Dawid (1994, 1998, 2001a, 2001b, 2002, 2004a, 2005a, 2005b, 2008), Dawid and Mortera (1996, 1998), Dawid and Evett (1997, 1998), Dawid and Pueschel (1999), Dawid et al. (1999, 2001), Dawid, Mortera, Pascali, and van Boxel (2002), Dawid, Mortera, Dobosz, and Pascali (2003), Dawid, Mortera and Vicard (2006), Mortera, Dawid, and Lauritzen (2003), Vicard and Dawid (2004, 2006).

<sup>&</sup>lt;sup>150</sup> www.evidencescience.org

The Wikipedia entry for "Genetic fingerprinting" contains much detail.<sup>151</sup> Its introduction states:

Genetic fingerprinting, DNA testing, DNA typing, and DNA profiling are techniques used to distinguish between individuals of the same species using only samples of their DNA. Its invention by Dr. Alec Jeffreys at the University of Leicester was announced in 1985. Two humans will have the vast majority of their DNA sequence in common. Genetic fingerprinting exploits highly variable repeating sequences called minisatellites. Two unrelated humans will be unlikely to have the same numbers of minisatellites at a given locus. In STR profiling, which is distinct from DNA fingerprinting, PCR is used to obtain enough DNA to then detect the number of repeats at several loci. It is possible to establish a match that is extremely unlikely to have arisen by coincidence, except in the case of identical twins, who will have identical genetic profiles.Genetic fingerprinting is used in forensic science, to match suspects to samples of blood, hair, saliva or semen. It has also led to several exonerations of formerly convicted suspects. It is also used in such applications as identifying human remains, paternity testing, matching organ donors, studying populations of wild animals, and establishing the province or composition of foods. It has also been used to generate hypotheses on the pattern of the human diaspora in prehistoric times.

Genetic testing is subjected to regulations (ibid.):

Testing is subject to the legal code of the jurisdiction in which it is performed. Usually the testing is voluntary, but it can be made compulsory by such instruments as a search warrant or court order. Several jurisdictions have also begun to assemble databases containing DNA information of convicts. The United States maintains the largest DNA database in the world: The Combined DNA Index System, with over 4.5 million records as of 2007. The United Kingdom, maintains the National DNA Database (NDNAD), which is of similar size. The size of this database, and its rate of growth, is giving concern to civil liberties groups in the UK, where police have wide-ranging powers to take samples and retain them even in the event of acquittal.

There exist computer tools for carrying out statistical analysis concerning DNA evidence. "[U]sing object-oriented Bayesian networks we have constructed a flexible computational toolkit, and used it to analyse complex cases of DNA profile evidence, accounting appropriately for such features as missing individuals, mutation, silent alleles and mixed DNA traces" (Mortera & Dawid, 2006, section 8, p. 26).<sup>152</sup> Aitken, Taroni, and Garbolino (2003) described their own graphical model for the analysis of possible cross-transfer of DNA material, affecting DNA profiles intended for use as evidence. They resorted to Bayesian networks.

<sup>151</sup> http://en.wikipedia.org/wiki/Genetic\_fingerprinting

<sup>&</sup>lt;sup>152</sup> The kind of situations across which one may come is illustrated, e.g., by *DNA mixtures:* "A *mixed DNA profile* is typically obtained from an unidentified biological stain or other trace thought to be associated with a crime. This commonly happens in rape cases, in robberies where an object might have been handled by more than one individual, and also in a scuffle of brawl. For a mixed DNA trace there is no constraint on the number of distinct alleles observed for each marker, since the trace might have been formed as a mixture of biological material from more than one person" (Mortera & Dawid, 2006, section 6.3, p. 16).

#### 8.7.2.2 Statisticians' Disagreements About How to Evaluate DNA Samples

Whereas suspect recognition based on facial composites (let alone on an artist's sketch) is an *indicative tool*, DNA evidence and fingerprint evidence are *implicative tools*. Even though one would have thought that DNA evidence is one area in which the use of statistics faces less challenges than other uses of Bayesianism in law, actually statisticians' disagreements about how to evaluate DNA samples shows that here, too, there are severe problems.<sup>153</sup> Even though controversies about DNA evidence only very rarely reach the public, they received a popular treatment in two issues of Britain's *New Scientist* magazine in August 2010. The second report was introduced as follows (Geddes, 2010, p. 8):

Last week, a *New Scientist* investigation showed how different forensic analysts can reach very different conclusions about whether or not someone's DNA matches a profile from a crime scene. This week we show how, even when analysts agree that someone could be a match for a piece of DNA evidence, the statistical weight assigned to that match can vary enormously.

In an inset, 'When lawyers question DNA' (on p. 9 in Geddes, 2010) in the special report on DNA evidence in the second issue, Scottish forensic scientist Alan Jamieson, who at scholars' conferences is often a wise and sobering voice about expert testimony, pointed out that defence lawyers can obtain the prosecution's statistical data concerning DNA samples, provided they are only permitted to use them in order to dispute them in the case at hand, and not for the purposes of other investigations and trials; and that moreover, if the case does not reach court, the refutations put forth by the defence would never reach to public domain.

The *New Scientist* report by Geddes (2010), 'What are the chances?', was subheadlined: "In the second part of our investigation, Linda Geddes shows that *the odds attached to a piece of DNA evidence can vary enormously*" (added emphasis). The article began with a case of conviction then still being appealed in California: "Charles Richard Smith has learned the hard way that you can prove almost anything with statistics. In 2009 a disputed statistic provided by a DNA analyst landed him with a twenty-five-year jail sentence". This was for sexual assault at a parking lot in Sacramento, CA, in January 2006, when a woman was forced into oral sex with the perpetrator. A swab of cells from Smith's penis showed his own DNA and that of another person, and indicated that he had been sexually intimate with an unknown person. The DNA analyst as "Smith's trial said the chances of the DNA coming from someone other than [the victim] were 1 in 15,000. But both the prosecution and the analyst's supervisor said the odds were more like 1 in 47", and a later review reduced this to 1 in 13, "while a different statistical method said the chance

<sup>&</sup>lt;sup>153</sup> Criticism also comes from critics of the application of probability theory to juridical proof in general, such as Ron Allen: even though one would have thought that DNA evidence would be a "safer" domain for statisticians, it is not quite so. Allen and Pardo (2007a) offered a critique, in terms of the *reference-class problem* (see Section 2.4 above) of how probability theory was applied to juridical proof concerning DNA random-match evidence in Nance and Morris (2002, 2005).

of seeing this evidence if the DNA came from [the victim] is only twice that of the chance of seeing it come from someone else." Geddes (2010, p. 8) further remarked:

"Usually DNA evidence is pretty strong", says David Balding, a statistical geneticist at University College London, whose calculation puts the lowest probability on the link between Smith and [the victim]. "My point is that the number juries are provided with often overstates the evidence. It should be a smaller number".

On 15 May 1997, Odd O. Aalen from Norway posted a question, in an e-list about statistics in legal evidence<sup>154</sup>: "Does anybody on this list know about criminal court cases where purely statistical evidence has been the sole or major evidence, and where the defendant has been convicted on this basis? I am thinking here of purely numerical evidence as opposed to substantive proof and statistical calculations related to this". On that very day, a reply came from Robert Lempert, a well-known scholar from the University of Michigan: "There have by now been a couple of DNA cases like this". Arguably, this shows how important the debate on statistics is.

Another posting on the same day provided more detail. It was by Bernard Robertson, editor of *The New Zealand Law Journal*, and definitely a "Bayesian enthusiast" in the controversy about Bayesianism in law. He stated: "The case of Adams provides an interesting example as the only prosecution evidence was DNA while the defence produced some more conventional evidence which tended to point the other way and also produced Professor Donelly to explain how to use Bayes Theorem to reduce the posterior odds below 'beyond reasonable doubt'." Robertson pointed out that this generated publications in the legal literature in England.

In an article by mathematicians from Queen Mary and Westfield College, London – Balding and Donnelly (1995) – a contribution was made to clarify the role of the modes of statistical inference, in the controversy over the interpretation of DNA profile evidence in forensic identification. They claimed that this controversy can be attributed in part to confusion over which such mode of inference is appropriate. They also remark that whereas some questions in the debate were ill-posed or inappropriate, some issues were neglected, which can have important consequences. They propose their own framework for assessing DNA evidence,

in which, for example, the roles both of the population genetics issues and of the nonscientific evidence in a case are incorporated. Our analysis highlights several widely held misconceptions in the DNA profiling debate. For example, the profile frequency is not directly relevant to forensic inference. Further, very small match probabilities may in some settings be consistent with acquittal.

Besides, there is also another kind of risk with DNA evidence. "Even in DNA cases, there is always the possibility of lab error or planted evidence" (Allen, 2008a, p. 328, note 1). The presence of DNA or of fingerprints from a given person at the scene of a crime does not necessarily mean that the person they identify was involved at the crime. In England in 2011, a retired teacher was arrested, demonised by the media,

<sup>&</sup>lt;sup>154</sup> bayesian-evidence@vuw.ac.nz

and then released in connection with the kidnapping murder of a young woman architect, as there was evidence indicating his presence where she lived, but he was the landowner. He may have had other opportunities of losing hair or leaving fingerprints at the place. Besides, DNA evidence may be mislabelled inside a laboratory. Or then, perpetrators may leave on purpose DNA evidence, perhaps hair, but even blood from a person they want to implicate.

There is even the risk of fake DNA. based on a paper by an Israeli team of scientists led by Dan Frumkin that had appeared in the journal Forensic Science International: Genetics, an unsigned item the British periodical Criminal Law & Justice Weely, Vol. 173, No. 34 (August 22, 2009) reported on p. 531, under the headline 'Fake DNA', that Frumkin's team had taken DNA from human hair was taken and multiplied many times, and that an enhanced sample of that DNA "was then inserted into blood cells that had been purged of their previous DNA. Dr Frumkin suggested that, in theory, criminals could use the technique to plant samples of blood or saliva at crime scenes to cover their tracks and implicate another party." One would not expect to find a sample of saliva at a crime scene other than by the victim or the perpetrator if they were alone and in some isolated place, but if DNA from hair could be planted inside saliva, then the very expectations about how saliva could occur at a crime scene means that perpetrators could frame somebody. "The researchers said that the use of DNA is often the key to proving the guilt or innocence of suspects and that by using the technique they had developed, genetic profiles could easily be synthesized" (ibid.), even though this is currently beyond the ability of your usual perpetrator.

### 8.7.2.3 Human Fingerprints

Let us turn to *human fingerprints*,<sup>155</sup> which as usually found in investigative contexts are of the hand palm, and in particular, of the tips of the fingers.<sup>156</sup> Steps involving identification by fingerprints are as follows:

- A particular person (suspect X) handles an object (an exhibit).
- That exhibit is exposed to the environment.
- The exhibit is eventually recovered and treated, revealing fingerprints.

<sup>&</sup>lt;sup>155</sup> See, e.g., Jain and Maltoni (2003) and Champod, Lennard, Margot, and Stilovic (2004). Also see the discussion in, e.g., Stoney (1997), Cole (2001, 2004, 2005, 2006a, 2006b), Cole et al. (2008), Balding (2005), Saks and Koehler (2008).

<sup>&</sup>lt;sup>156</sup> Sometimes, the terms *fingerprint* and *fingerprinting* are used metaphorically. We have already come across *soil fingerprinting techniques* in a project in forensic geology that resorts to a decision support system, at the end of Section 8.5.1. In Section 8.5.6, we considered *chemical fingerprints*, identifying an individual component in a mixture (taken to be a multivariate, mixed chemical system). Another metaphorical use of the term *fingerprint* is found in *digital steganog-raphy*, a discipline we dealt with in Section 6.2.1.5 (which itself spans more, thematically). One sometimes talks about fingerprints, and a fingerprint vault scheme, in *digital steganography*: see

#### 8.7 Individual Identification

- The developed fingerprints are imaged.<sup>157</sup>
- The images of the fingerprints are transferred to a database.
- The images of fingerprints are compared, and if this is done automatically, then a pattern matching algorithm is used.
- Suspect X is identified.

The introduction to the Wikipedia entry for "Fingerprint" states<sup>158</sup>:

A *fingerprint* is an impression of the friction ridges of all or any part of the finger. A friction ridge is a raised portion of the epidermis [skin] on the palmar (palm and fingers) or plantar (sole and toes) skin, consisting of one or more connected ridge units of friction ridge skin. These ridges are sometimes known as "dermal ridges" or "dermal papillae".

Fingerprints may be deposited in natural secretions from the eccrine glands present in friction ridge skin (secretions consisting primarily of water) or they may be made by ink or other contaminants transferred from the peaks of friction skin ridges to a relatively smooth surface such as a fingerprint card. The term fingerprint normally refers to impressions transferred from the pad on the last joint of fingers and thumbs, though fingerprint cards also typically record portions of lower joint areas of the fingers (which are also used to make identifications).

*Fingerprint identification*, based on traces left by the skin of some persons' finger tips, is much debated in the literature, and until the end of the twentieth century its accuracy was hardly questioned, once it had come to be accepted by the beginning of that century. As we are going to see, the probative value of fingerprint evidence is no longer as secure as it used to be, and we are going to come back to that. Itiel Dror and colleagues' paper "When emotions get the better of us: The effect of contextual top-down processing on matching fingerprints" (Dror, Péron, Hind, &

Li et al. (2005). In *forensic ballistics*, one speaks of *ballistic fingeprinting*. Also in intrusion detection within computer security, metaphorically one speaks of *fingerprints* and *fingeprinting* (Section 6.2.1.12), in relation to attempts to identify an intruder.

One sometimes speaks of fingerprinting for the identification of an individual rhinoceros. Amin, Bramer, and Emslie (2003) described experiments with "rhino horn fingerprint identification", i.e., "the identification of the species and origin of illegally traded or confiscated African rhino horn", using techniques of intelligent data analysis. Rhino horns are akin to compacted hair and fingernails, and their chemical composition refelcts what the animal has been eating throughout its life. In turn, the chemistry of the food is affected by climate and geology. The so-called *fingerprint* of a rhino horn is a combination of variable values. In the project reported about by Amin et al. (ibid.), *Discriminant Function Analysis* was the principal technique of data analysis used, the prediction of the category in which a given case belongs is obtained by deriving mathematical functions that provide the greatest possible discrimination among categories. The same paper discussed a further stage, at which it was intended to use artificial neural nets for classification, or the automatic induction of classification trees (for the latter, cf. Quinlan, 1986; Kothari & Dong, 2002; Siroky, 2009; Chen et al., 2011). Contrast the task in the rhino project, to the task of identifying an individual, which is the case of techniques for the recognition of cattle based on characteristics of the animal's back skin that are akin to fingerprints.

<sup>&</sup>lt;sup>157</sup> A discussion of fingerprint development and imaging, with the chemistry involved in the development explained in clear detail, can be found in an excellent PowerPoint presentation posted online, and authored by Steve Bleay of Britain's Home Office Scientific Development Branch (Bleay, 2009).

<sup>&</sup>lt;sup>158</sup> http://en.wikipedia.org/wiki/Fingerprint.

Charlton, 2005) is a paper in cognitive psychology, applied to how experts perform at matching fingerprints. Dror and Charlton (2006) and Dror et al. (2006) tried to identify the causes of why experts make identification errors. Dror and Rosenthal (2008) tried to meta-analytically quantify the *reliability* and *biasability* of forensic experts.

"On the palmar surface of the hands and feet are raised surfaces called friction ridges. The scientific basis behind friction ridge analysis is the fact that friction ridges are persistent and unique" (from the Wikipedia entry for 'Fingerprint'). The Wikipedia entry, which as accessed in late 2007, was detailed and engaging (our present readers are encouraged to access it), states:

Fingerprint identification (sometimes referred to as *dactyloscopy*) or palmprint identification is the process of comparing questioned and known friction skin ridge impressions (see *Minutiae*)<sup>159</sup> from fingers or palms to determine if the impressions are from the same finger or palm. The flexibility of friction ridge skin means that no two finger or palm prints are ever exactly alike (never identical in every detail), even two impressions recorded immediately after each other. Fingerprint identification (also referred to as individualization) occurs when an expert (or an *expert computer system* operating under *threshold scoring* rules) determines that two friction ridge impressions originated from the same finger or palm (or toe, sole) to the exclusion of all others.

A *known print* is the intentional recording of the friction ridges, usually with black printer's ink rolled across a contrasting white background, typically a white card. Friction ridges can also be recorded digitally using a technique called *Live-Scan*. A *latent print* is the chance reproduction of the friction ridges deposited on the surface of an item. Latent prints are often fragmentary and may require chemical methods, powder, or alternative light sources in order to be visualized.

Computerisation brought about major changes in the *modus operandi* of fingerprint identification. The following is quoted from the Wikipedia entry<sup>160</sup>:

Before computerization replaced manual filing systems in large fingerprint operations, manual fingerprint classification systems were used to categorize fingerprints based on general ridge formations (such as the presence or absence of circular patterns in various fingers), thus permitting filing and retrieval of paper records in large collections based on friction ridge patterns independent of name, birth date and other biographic data that persons may misrepresent. The most popular ten print classification systems include the Roscher system, the Vucetich system, and the *Henry Classification System* [...]

In the Henry system of classification,  $1^{\overline{6}1}$  there are three basic fingerprint patterns: Arch, Loop and Whorl. There are also more complex classification systems that further break down patterns to plain arches or tented arches. [...]

An explanation of fingerprint appearance is provided by Bistarelli, Santini, and Vaccarelli (2006, pp. 360–361, section 2.1):

The most evident structural characteristic of a fingerprint is the pattern of interleaved ridges and valleys that often run in parallel. Ridges vary in width from 100 to 300 lm and the period of a ridge/valley cycle is typically about 500 lm. If analyzed at global level, almost

<sup>&</sup>lt;sup>159</sup> http://en.wikipedia.org/wiki/Minutiae.

<sup>&</sup>lt;sup>160</sup> http://en.wikipedia.org/wiki/Fingerprint.

<sup>&</sup>lt;sup>161</sup> On which, see http://en.wikipedia.org/wiki/Henry\_Classification\_System.

all of the patterns exhibit one or more regions characterized by a distinctive shape and called *singular regions*. These regions can be classified into three typologies according to their shape: loop, delta, and whorl are characterized respectively by a  $\frown$ ,  $\Delta$ , and O shape. A particular presence of these singular regions defines the whole fingerprint class: the five classes in Henry's scheme [(Jain & Maltoni, 2003)] are *arch, tented arch, right loop, left loop, and whorl.* 

At local level, other important features called minutiae refer to ridge discontinuities. Minutiae ar sometimes called "Galton details",<sup>162</sup> in honor of the first person who categorized them and observed that they remain unchanged over the individual's entire life [(Lee & Gaensslen, 1991, 2nd edn. 2001)].<sup>163</sup> Most frequently, the minutiae types can be identified by terminations, where a ridge line ends, and bifurcations, where a ridge bifurcates forming a "Y" [...], even if several types have been observed, described by their shape (dot, island, hook, lake, ridge crossing and multiple bifurcations).

Another important point in the image, which can be used also to align the fingerprint images, is the "core point", corresponding to the center of the north most loop type singular region. In fingers without loop or whorl regions, the core is associated with the point of maximum ridge line curvature. The most important minutiae characteristics are the location coordinates inside the image, their form type (e.g. termination, bifurcation, island, etc.) and the orientation of the ridge (in degree) on which the minutia is found.

Advances in research make it possible to avoid having to develop the prints first, in order to examine fingerprints<sup>164</sup>:

Within the Materials Research Centre, University of Swansea, UK, University of Swansea, UK, Professor Neil McMurray and Dr Geraint Williams have developed a technique that enables fingerprints to be visualised on metallic and electrically conductive surfaces without the need to develop the prints first. The technique involves the use of an instrument called a scanning Kelvin probe (SKP), which measures the voltage, or electrical potential, at preset intervals over the surface of an object on which a fingerprint may have been deposited. These measurements can then be mapped to produce an image of the fingerprint. [...]

Currently, in crime scene investigations, a decision has to be made at an early stage whether to attempt to retrieve fingerprints through the use of developers or whether to swab surfaces in an attempt to salvage material for DNA fingerprinting. The two processes are mutually incompatible, as fingerprint developers destroy material that could potentially be used for DNA analysis, and swabbing is likely to make fingerprint identification impossible.

The application of the new SKP fingerprinting technique, which is non-contact and does not require the use of developers, has the potential to allow fingerprints to be retrieved while still leaving intact any material that could subsequently be subjected to DNA analysis. [...]

In the United States (ibid.):

The FBI manages a fingerprint identification system and database called IAFIS, which currently holds the fingerprints and criminal records of over fifty-one million criminal record subjects, and over 1.5 million civil (non-criminal) fingerprint records. U.S. Visit currently holds a repository of over 50 million persons, primarily in the form of two-finger records (by 2008, U.S. Visit is transforming to a system recording FBI-standard tenprint records).

<sup>&</sup>lt;sup>162</sup> Psychologist and anthropologist Francis Galton (1821–1911), Charles Darwin's cousin.

<sup>&</sup>lt;sup>163</sup> Allegedly, the first edition was a bestseller of Lee and Gaensslen's (1991) *Handbook of Fingerprint Recognition*. The second edition, of 2001, is a major revision. A more recent handbook is *Handbook of Fingerprint Recognition* by Davide Maltoni, Dario Maio, Anil K. Jain, and Salil Prabhakar (2003, 2nd edn. 2009).

<sup>&</sup>lt;sup>164</sup> http://en.wikipedia.org/wiki/Fingerprint.

Most American law enforcement agencies use Wavelet Scalar Quantization (WSQ), a wavelet-based system<sup>165</sup> for efficient storage of compressed fingerprint images at 500 pixels per inch (ppi). [...] For fingerprints recorded at 1000 ppi spatial resolution. law enforcement (including the FBI) uses JPEG 2000 instead of WSQ. [...]

#### 8.7.2.4 Fingerprints from Dead Bodies

Sometimes forensic fingerprinting specialists are faced not with the task of pinpointing a live suspect criminal from the fingerprints he or she left, but rather with trying to achieve identification for a dead body, based on the skin of the finger tips. Take the case of mummified bodies. "The identification of mummified bodies places high demands on the skills of a forensic fingerprinting specialist. From a variety of methods, he must be able to choose the most appropriate one to reproduce the skin ridges from fingers, which are often shrunk and deformed", as stated in the English abstract of a paper by Ineichen and Neukom (1995), of the Zurich cantonal police: their "article introduces and discusses a method for indirect fingerprinting. In this method, a negative cast of the mummified fingertip is first produced with a silicon mass. This 3-dimensional negative is then filled with several layers of a white glue/talc mixture, until a skin-thick positive is attained. Using this artificial skin it is possible to reproduce, in a relatively short time, a fingerprint which is free of disturbing skin wrinkles and deformities" (ibid.).

The problem with using fingerprints from dead bodies is that deformation can be expected to be much worse that the elastic deformation that normally affects fingeprints from living persons. Bear in mind that fingers are in three dimensions, whereas fingerprints appear on a surface. Computer methods for fingerprint matching (the fingerprints having been left by persons while alive) have to cope with the problem of elastic deformation. In dead bodies, the deformation caused by decay is plastic, not just elastic. That is to say, the shape that the fingertip has taken will not revert to the previous shape the way that the finger tip of a living person, when pressed against a surface, is going to go back to its previous shape when not pressed.

### 8.7.2.5 The Problem of Assessing Fingerprint Sufficient Similarity

Are fingerprints really reliable? The courts in the United States and elsewhere have usually been rather unresponsive to challenges to identification accuracy. But there is another problem with the use of *latent prints*, i.e., of such fingerprints that were found at a crime scene (Cole, Welling, Dioso-Villa, & Carpenter, 2008, p. 167):

[A]side from being unresponsive to the question of accuracy, the individuality issue is problematic in its own right (Saks & Koehler, 2008). It is commonly said that the 'individuality' or 'uniqueness' of friction ridge skin is one of the 'fundamental premises' of latent print individualization (Moenssens, 1999).<sup>166</sup> Such discussions generally treat this premise as

<sup>&</sup>lt;sup>165</sup> See http://en.wikipedia.org/wiki/Wavelet\_Scalar\_Quantization

<sup>&</sup>lt;sup>166</sup> Cf. Moenssens (2003).

one that has been satisfied – i.e. the 'individuality' of friction ridge skin is 'known' or 'proven'. By this, it would appear that fingerprint proponents mean that the exact duplication of any area of friction ridge skin is extremely unlikely. But such an assertion has little meaning without knowing the conditions under which extreme similarity would be considered 'duplication', what scale of area of friction ridge skin is being discussed and at what level of resolution friction ridge skin is observed. Assertions of 'uniqueness' or 'individuality' could, for all we know, mean nothing more than that, when analysed at the level of molecules, no two areas of friction ridge skin, as well as many other objects in the world, but also of little value in measuring how accurately source attributions can be made from those objects by human experts using visual analysis.

For practical legal purposes, mere non-duplication is not what really matters. Rather (ibid.):

Obviously, what is wanted is not the mere assertion of non-duplication, but, rather, measurements of the variability of different areas of friction ridge skin and, crucially, multiple images derived from the same areas of friction ridge skin. In short, the issue is not so much the individuality of an area of friction ridge skin itself, but rather the range of variability of legible impressions that can be produced by a given area of friction ridge skin relative to the range of impressions that could be produced by analogous areas of friction ridge skin from different individuals.

Perhaps most importantly, it makes little sense to discuss the 'individuality', or even the 'variability', of 'fingerprints' as if it were a quality that inhered in friction ridge skin. These qualities can only exist in conjunction with some sort of perceptual system, whether human or mechanical.

Let us consider the common task of identifying suspect perpetrators, based on prints left by their fingers, in the British context. In the words of a scholar based in London, Mike Redmayne (2002, p. 25):

Fingerprint experts have no statistics on which to base their conclusions. There is a large degree of consensus that individual fingerprints are unique, and that a certain number of similarities between two prints proves identity beyond almost any doubt. But there are no figures on which to base these judgments: no way of quantifying the cut-off point at which sufficient similarity proves identity. David Stoney has written perceptively about the process of fingerprint identification. He suggests that, on perceiving enough points of identity, the expert makes a 'leap of faith' and becomes 'subjectively certain' of identity. In many countries there is a convention that a particular number of points is required before a match is announced. In England and Wales, the magic number was long sixteen. Latterly, few people saw much logic in the 'sixteen points' rule, and it was abandoned in 2001. But the convention helps to explain why, when the expert in *Charles* went to court on just twelve points, his evidence was vulnerable to a *Doheny*-style challenge.

The *Doheny* case is one in which identification revolved on the DNA evidence. Also from England and Wales, it was judged in 1997 by the Court of Appeal, "which after agonising over" the risks of misconceptions on the part of jurors of what DNA evidence stands for (Redmayne, 2002, p. 20),

hit upon an ingenious solution. Rather than explaining the subtle but important distinction between the probability of guilt given the DNA evidence and the probability of the DNA evidence given guilt in semantic terms, it would provide a simple illustration to convey the key issues [...]. Its sample jury instructions for DNA cases proceeds as follows:

Members of the jury, if you accept the scientific evidence called by the Crown, this indicates that there are probably only four or five white males in the United Kingdom from whom that semen could have come. The defendant is one of them. If that is the position, the decision you have to reach, on all the evidence, is whether you are sure that is was the defendant who left that stain or whether it is possible that it was one of the other small number of men who share the same DNA characteristics.

The quotation, previously given, about fingerprints, as taken from Redmayne (2002, p. 25), is about the case of Neil Charles, convicted of robbery and false imprisonment, and the principal evidence about whom was a fingerprint; moreover, "[t]here was circumstantial evidence to link him to the crime scene – he had been seen acting suspiciously nearby earlier in the day, and [closed-circuit TV] cameras caught him in the area later on" (p. 25). "The defence strategy was simple: to get the expert think of his testimony in *Doheny* terms, so as to draw out an admission that Charles was just one of *n* men who might have left the print" (p. 25). "But the Court of Appeal would not allow two experts to explore these issues further because they had not been called at trial. In any case, it did not think the *Doheny* analogy apt because 'the Crown's case did not rest on any random occurrence ratio [sc. match probability]'." (ibid., p. 25, Redmayne's brackets).

Redmayne remarks that fingerprint identification is such powerful evidence that perhaps "really there is no room for a *Doheny* argument. The expert makes the leap of faith, leaving no quantifiable gap over which the jury must jump [...]. But as the match threshold moves down from 16 points, there is less room for complacency" (ibid., p. 26). There has been contention about the admissibility of fingerprint evidence. Yvette Tinsley, from the Victoria University of Wellington, New Zealand, discussed a possible reform of identification procedures (Tinsley, 2001).

Scotland's Fingerprint Inquiry<sup>167</sup> is likely to have repercussions also outside Scotland, in the long term. The Inquiry Report was expected in 2011. Oral hearings took place in the summer and autumn of 2009. On 14 March 2008, Scotland's Cabinet Secretary for Justice, Kenny MacAskill, announced a public judicial inquiry (set up by Scottish ministers under the Inquiries Act 2005). Its remit has been to investigate the steps taken to verify the fingerprints associated with the case of *H.M. Advocate* v. *McKie* in 1999, and related matters.

The background is as follows. Charged for the murder of Marion Ross, David Asbury was convicted in May 1997, and the prosecution case against him included fingerprint evidence. During the investigation into the murder, a fingerprint was found on the doorframe of the bathroom in Marion Ross's home. That fingerprint (which became known as "Y7"), was identified as belonging to Shirley McKie, a serving police officer involved in the murder investigation. During Asbury's trial, McKie denied that the fingerprint was hers. After the murder trial, she was prosecuted for perjury: the charge was that she had lied while giving evidence on oath, because of what she had said in her evidence at David Asbury's trial. The evidence before the jury at McKie's trial

<sup>&</sup>lt;sup>167</sup> http://www.thefingerprintinquiryscotland.org.uk

included evidence from defence fingerprint experts that Y7 was not her fingerprint. The jury, unanimously, found Shirley McKie not guilty of perjury. The identification of Y7 was made, originally, by officers of the Scottish Criminal Record Office. Various fingerprint experts have expressed differing views as to whether Y7 is the fingerprint of Shirley McKie. In August 2000 David Asbury was granted interim liberation pending an appeal against his conviction for murder. His conviction was quashed in August 2002. The Crown did not oppose his appeal. Shirley McKie raised an action for damages arising from the identification of Y7 as her fingerprint. It was settled out of court by the Scottish Ministers, without admission of liability, in February 2006.<sup>168</sup>

The Scottish government set up the Fingerprint Inquiry to fulfil its commitment to hold an independent, public, judicial inquiry into the circumstances surrounding the Shirley McKie case. The Fingerprint Inquiry's<sup>169</sup> terms of reference, as agreed by the Scottish Ministers, are as follows:

- To inquire into the steps that were taken to identify and verify the fingerprints associated with, and leading up to, the case of HM Advocate v. McKie in 1999
- to determine, in relation to the fingerprint designated Y7, the consequences of the steps taken, or not taken, and
- to report findings of fact and make recommendations as to what measures might now be introduced, beyond those that have already been introduced since 1999, to ensure that any shortcomings are avoided in the future.

An editorial (Koehler, 2008) in a special issue of the journal *Law, Probability and Risk*, by Jonathan Koehler from Arizona State University in Tempe, began by noting:

Ten years ago, the notion that a top academic journal should publish an exchange on the scientific validation of fingerprint evidence would have been a non-starter. Until then, all but a few self-interested defendants and defence attorneys believed that when a fingerprint examiner matched a crime scene print (a latent print) to a suspect's reference print, the evidence was absolute and irrefutable. A fingerprint match proved identity if not guilt. Today, however, scientists, attorneys and others are taking a hard look at the forensic sciences in general and fingerprint evidence in particular. The oft-repeated claims that fingerprints are unique and that the source of fingerprint fragments can be identified with certainty have received special attention.<sup>170</sup>

<sup>&</sup>lt;sup>168</sup> The quotation is from the webpage "About the Inquiry: Background" at the site of the inquiry itself, at http://www.thefingerprintinquiryscotland.org.uk/inquiry/23.html

<sup>&</sup>lt;sup>169</sup> Set up under the Inquiries Act 2005, it is one of the first inquiries under that Act to use the Inquiries (Scotland) Rules 2007.

<sup>&</sup>lt;sup>170</sup> The uniqueness claim was rejected by Balding (2005), Cole (2004) and Saks and Koehler (2008). Koehler noted (2008, p. 85): "Kaye (2003) points out the serious flaws in a study that some rely on as proof of fingerprint uniqueness. As for the certainty of fingerprint identifications, the data (not surprisingly) show that fingerprint examiners are fallible. Many commit false-positive and false-negative errors in proficiency tests and in casework (Cole, 2005, 2006a, 2006b). Indeed, some critics argue that there is no scientific reason to believe that fingerprint examiners can make reliable identifications at all (Epstein, 2002)." A bibliography of legal scholarship rejecting the validity of fingerprint identification can be found in the long very last footnote of Cole (2009), and it should be looked up there.

In an article from the United States cautious about the reliability of fingerprint evidence, Cole et al. (2008) began by pointing out: "Efforts to harness computer fingerprint databases to perform studies relevant to fingerprint identification have tended to focus on 10-print, rather than latent print, identification or on the inherent individuality of fingerprint images." (ibid., p. 165). That is to say (ibid., p. 166):

Latent print individualization is a forensic technique that endeavours to attribute a 'mark' (a crime scene or 'latent' print) to the 'friction ridge skin' (the corrugated skin that covers human fingers, palms and soles) of an individual. Such attributions are currently achieved through a visual comparison of the mark with an exemplar 'print' whose origin is known. These attributions are made by human latent print examiners (LPEs). Computer algorithms (Automated Fingerprint Identification Systems or AFIS) are often used to search large databases for 'candidate' prints to present to the examiner, but there is neither an agency or a jurisdiction that currently allows a computer system to make *latent* print attributions nor an algorithm that claims an ability to make such attributions. This is not the case for 10-print attributions, in which the source of a set of 10 'inked', or intentionally recorded, prints is attributed. Such attributions are sometimes made by computer algorithms (Cherry & Imwinkelried, 2006).

Professional LPEs are restricted to three conclusions: individualization, inconclusive and exclusion (Scientific Working Group on Friction Ridge Analysis Study and Technology, 2003).<sup>171</sup> Thus, the only 'inclusionary' conclusion – i.e. the only conclusion that implicates a suspect – is the conclusion of 'individualization'. 'Individualization', in turn, is defined as the claim that a particular area of friction ridge skin is the only possible source of a particular mark (Scientific Working Group on Friction Ridge Analysis Study and Technology, 2003). In other words, all other possible sources have been eliminated as possible sources of the mark.

Cole et al. (2008) questioned *accuracy*, i.e., how often it is that individualisations based on latent prints are correct: "Does the accuracy vary predictably in response to particular variables, such as, say, the amount of information contained in the mark or the skill level of the examiner?" (ibid., p. 166). They also questioned *sufficiency:* "How much consistent friction ridge detail is it necessary to find, in order to support a conclusion of individualization?" (ibid.). Their third question concerned *individuality:* "How rare are the various friction ridge features used in latent print analysis within various populations? How rare are various combinations of friction ridge features? How similar are the most similar areas of friction ridge skin, of some specified size?" (ibid.). Cole et al. (2008, pp. 166–167):

There have been essentially no empirical studies addressing the accuracy questions (Haber & Haber, 2003, 2008), although some preliminary studies are now beginning to be undertaken (Wertheim et al., 2006; Langenburg, 2004; Haber & Haber, 2006). Purported answers to the sufficiency question are known to have been legislated rather than derived from empirical data (Champod, 1995; Evett & Williams, 1996; Cole, 1999). Current professional guidelines developed in the United States mandate an essentially circular definition of 'sufficiency': 'Sufficiency is the examiner's determination that adequate unique details of the friction skin source area are revealed in the impression' (Scientific Working Group

<sup>&</sup>lt;sup>171</sup> Tthe Scientific Working Group on Friction Ridge Analysis, Study and Technology (SWGFAST) was established in 1995, and its mission is to establish consensus guidelines and standards for the forensic examination of friction ridges. See http://www.swgfast.org/ Several resports are posted at that site.

on Friction Ridge Analysis Study and Technology, 2002, section 1.5). The most sustained scholarly attention has been devoted to individuality, but much of it has focused on demonstrating or asserting the mere fact of the absolute non-duplication of complete fingertip-sized areas of friction ridge skin, rather than on measuring the degree of variability. This is true of both of the two major strands of fingerprint research. Statistical research focused on estimating the probability that exact duplicate areas of friction ridge skin (usually complete fingertips) exist (Pankanti et al., 2002; Stoney, 2001). Anatomical research focused on detailing the formation of friction ridge skin, while occasionally commenting that this process was sufficiently complex to support an assumption of non-duplication as a 'working principle' (Cummins & Midlo, 1943; Wilder & Wentworth, 1918; Wertheim & Maceo, 2002).

Nonetheless, defenders of latent print individualization have tended to seek to shift the debate to individuality when pressed concerning accuracy, a tendency that one of us has elsewhere called 'the fingerprint examiner's fallacy', the argument that the accuracy of a source attribution technique may be inferred from the uniqueness or variability of the target object (Cole, 2004, 2006b). [...]

What Cole et al. (2008) themselves did, was to carry out experiments measuring how accurate an automated fingerprint matching system was at identifying the source of *simulated latent* print (i.e., fingerprints taken, as though, from a crime scene, while actually having been obtained for the purposes of the experiment). The computer system carried out the task of a human latent print examiner fairly weel, except in that it (like presumably the human expert) tended to produce false positives (ibid., p. 165): "there are non-mate images that scored very highly on the AFIS's<sup>172</sup> similarity measure. These images would be susceptible to erroneous conclusions that would be given with a very high degree of confidence. Not surprisingly, the same was also true of the simulated latents which contained less information." They claimed that this is useful for assessing human experts, too: "We suggest that measuring the accuracy and potential for erroneous conclusions for AFISs might provide a basis for comparison between human examiners and automated systems at performing various identification tasks" (ibid.).<sup>173</sup>

# 8.7.3 Computational Techniques for Fingerprint Recognition

### 8.7.3.1 General Considerations

Research in *biometrics* within computer science has found various applications,<sup>174</sup> and in particular, identification by means of fingerprints is no longer confined to use by the police. In the words of Bistarelli et al. (2006, pp. 359–360):

<sup>&</sup>lt;sup>172</sup> AFIS stands for "automated fingerpint identification system".

<sup>&</sup>lt;sup>173</sup> Incidentally, note that Srihari, Srinivasan, and Beal (2008) discussed the discriminability of the fingerprints of twins. Sargur Srihari's team at the University of Buffalo is active in both computer-assisted handwriting recognition, and computer-assisted fingerprint recognition.

<sup>&</sup>lt;sup>174</sup> For example, see fn. 177 in Chapter 6.

The term "biometrics" is commonly used today to refer to the authentication of a person by analyzing his/her physical characteristics (like fingerprints) or behavioral characteristics (like voice or gait). Since these characteristics are unique to an individual, their measurement provides a more reliable system of authentication than ID cards, keys, passwords, or other traditional systems while accessing restricted areas in office buildings and factories, or controlling the security of computer networks, electronic commerce, and banking transactions. The reason is that all these secret keys can be easily stolen or cloned to steal the personal identity, or they can also be forgotten by the owner preventing the whole identification process. Biometric characteristics are, instead, generally more difficult to duplicate and they naturally always "follow" the owner. Moreover, an advantage of biometrics is that they cannot be lent (like a physical key), and thus, they [guarantee the owner's] on-site presence.

The most common biometric techniques are signature verification, retinal analysis, facial analysis, fingerprint verification, hand geometry, and voice verification. These technologies are comparable by the aid of several indicators, such as permanence (measurement should be invariant with time), uniqueness (different values for different persons), universality (everyone should have this trait), acceptability (if people are willing to accept this technology), performance (the recognition accuracy and system requirements) and circumvention (how [easy it is] to fool the system). Fingerprint matching is one of the most diffused biometric techniques used in automatic personal identification, because of its strong reliability and its low implementation cost; moreover, it is also the most mature and explored technology of all [biometric techniques].

Computational fingerprint recognition techniques – examining the pattern of ridges and furrows in fingerprints, and their *minutiae points*, that is to say, *ridge ending* and *ridge bifurcation* – are an active area within image processing. Na, Yoon, Kim, and Hwang (2005) discussed the shortcoming of such techniques. Brislawn, Bradley, Onyshczak, & Hopper (1996) described the FBI compression standard for digitised fingerprint images. Criminal investigation is just one of the area in which fingerprints are used for identification. "The fingerprint sensors are becoming smaller and cheaper, and automatic identification based on fingerprints is becoming an attractive alternative/complement to the traditional methods of identification" (Khuwaja, 2006, p. 25), not only in criminal investigation, but, along with other so-called *biometric* methods employed in *personal authentication systems*, and based on an individual person's body or sometimes behavioural features, also in e-banking, e-commerce, smart cards, and access to sensitive databases, and sometimes for access into premises with security requirements. The procedure is not without problems. Khuwaja remarks (ibid., pp. 24–25):

The quality of the finger image is the most significant factor in a reliable process (Emiroglu and Akhan, 1997; Jiang et al., 2001). One aspect of fingerprint identification systems, which largely has been overlooked, is the need for a determination on a pixel-by-pixel basis of the reliability of the information. In an image, one region might be highly reliable, while another is not. Sets of information must be extracted from an image by the system, a process known as encoding. This process is made difficult by the fact that different prints of the same finger may be substantially different due to effects such as (a) pressure; increased pressure leads to ridge joining and decreased pressure leads to ridge breaking. (b) dirt and moisture; this can cause phantom joints; (c) elasticity of the skin; the whole image can become sheared and distorted; (d) background; the latent may be taken from a complex background, both in relif and pattern; (e) inking; the amount of ink used to take finger impressions significantly affects the images; and (f) smudging; often regions of the print image are smudged.

Moreover, when fingerprints are scanned, there may be imperfections in the images (ibid., p. 25). Such imperfect images "require some preprocessing before the features on them can be extracted. The imperfections in the images manifest themselves in the form of noncontinuous regions and noncontinuous ridges (Costello, Gunawardena, & Nadiadi, 1994). These areas need either to be enhanced or ignored for valid recognition of the fingerprint" (Khuwaja, ibid.)

Automatic fingerprint identification systems are widely used, and there exist several pattern matching techniques applied to matching fingerprints, but the matching is time-consuming. There exists a series of Fingerprint Verification Competitions (FVC), in which the systems entered by competitors are tested on databases, and the performance is in terms of authentication reliability and speed.

Apart from the time it takes to match fingerprints, another problem is deformation. Hao, Tan, and Wang (2002, section 1) explain this as follows:

In most [automatic fingerprint identification systems], the representation of fingerprints is based on minutiae such as ridge ending and ridge bifurcation, with each minutia being characterized by its locations and orientation. With this representation, the matching problem is reduced to a point pattern matching problem. In the ideal case described by Jain et al. (1997), the matching can be accomplished by simply counting the number of spatially overlapping minutiae. But in practice, the sensing system maps the three-dimensional finger on to two-dimensional images. Once the location, pressure and direction of impression change, the mapping will change accordingly, which inevitably leads to nonlinear deformation of fingerprint images. Two fingerprint images may have translation, rotation or even nonlinear deformation between them. If the time span between two impressions is long, the images may also change due to cuts on finger or skin disease.

In most systems, fingerprint is represented with a set of minutiae which is called template. The representation itself may be noisy due to presence of spurious minutiae and absence of genuine minutiae. Also, the properties of minutiae such as the location and orientation may be inaccurately estimated due to image degradation and imperfect preprocessing.

Considering all these situations, a good fingerprint matching algorithm should meet the following two criteria:

- Be robust to all kinds of possible deformation which are commonly observed in fingerprints and are hard to model.
- Be robust to small perturbation on minutiae and minutiae properties.

Terje Kristensen (2010) reported about a computer application to fingerprint identification, intended to reduce the matching time. To carry out classification a Support Vector Machine (SVM) algorithm<sup>175</sup> was resorted to. "The given fingerprint database is decomposed into four different subclasses and a SVM algorithm is used to train the system to do correct classification. The classification rate has been estimated to about 87.0% of unseen fingerprints. The average matching time is decreased with a factor of about 3.5 compared to brute force search applied" (ibid.).

 $<sup>^{175}</sup>$  Support vector machines or vector support machines are the subject of Section 6.1.9.3. Moreover, we have said something about support vector machines at the end of Section 6.1.2.3.

A variety of approaches is encountered in the scholarly literature of automated fingerprint matching. For example, Chen and Kuo (1991) applied *tree matching*. Isenor and Zaky (1986) resorted to *graph matching* in order to solve the problem of *elastic deformation*. The matching is based on *euclidean distance* in Jain, Prabhakar, Hong, and Pankanti (2000) as well as Lee and Wang (1999), who represented the fingerprint with texture information extracted by *Gabor filters*.

In image processing, a *Gabor filter*, named after Dennis Gabor, is a linear filter used for edge detection. Frequency and orientation representations of Gabor filters are similar to those of the human visual system, and they have been found to be particularly appropriate for texture representation and discrimination. In the spatial domain, a 2D Gabor filter is a Gaussian kernel function modulated by a sinusoidal plane wave. The Gabor filters are self-similar: all filters can be generated from one mother wavelet by dilation and rotation.<sup>176</sup>

$$g(x,y;\lambda, heta,\psi,\sigma,\gamma) = \exp\left(-rac{x'^2+\gamma^2y'^2}{2\sigma^2}
ight)\exp\left(i\left(2\pirac{x'}{\lambda}+\psi
ight)
ight)$$

The real component is:

$$g(x,y;\lambda,\theta,\psi,\sigma,\gamma) = \exp\left(-\frac{x'^2+\gamma^2 y'^2}{2\sigma^2}\right)\cos\left(2\pi\frac{x'}{\lambda}+\psi\right)$$

The imaginary component is:

$$g(x,y;\lambda,\theta,\psi,\sigma,\gamma) = \exp\left(-\frac{x'^2+\gamma^2y'^2}{2\sigma^2}\right)\sin\left(2\pi\frac{x'}{\lambda}+\psi\right)$$

where

$$x' = x\cos\theta + y\sin\theta$$

and

$$y' = -x\sin\theta + y\cos\theta$$

<sup>&</sup>lt;sup>176</sup> From Wikipedia (http://en.wikipedia.org/wiki/Gabor\_filter). The impulse response of a Gabor filter "is defined by a harmonic function multiplied by a Gaussian function. Because of the multiplication-convolution property (Convolution theorem), the Fourier transform of a Gabor filter's impulse response is the convolution of the Fourier transform of the harmonic function and the Fourier transform of the Gaussian function. The filter has a real and an imaginary component representing orthogonal directions. The two components may be formed into a complex number or used individually" (ibid.). With the convention that " $\lambda$  represents the wavelength of the sinusoidal factor,  $\theta$  represents the orientation of the normal to the parallel stripes of a Gabor function,  $\psi$  is the phase offset,  $\sigma$  is the sigma of the Gaussian envelope and  $\gamma$  is the spatial aspect ratio, and specifies the ellipticity of the support of the Gabor function" (ibid.), the Gabor filter is given by the following formulae. As a complex number:

Fasel, Bartlett, and Movellan (2002) compared Gabor filter methods for another problem in pattern-matching that is relevant for biometrics, namely, the *automatic detection of facial landmarks*.<sup>177</sup>

Jain, Ross, and Prabhakar (2001) combined texture features and minutiae features, while being specifically interested in solid-state fingerprint sensors: in fact, these only provide a small contact area "for the fingertip, and, therefore, sense only a limited portion of the fingerprint. Thus multiple impressions of the same fingerprint may have only a small region of overlap. Minutiae-based matching algorithms, which consider ridge activity only in the vicinity of minutiae points, are not likely to perform well on these images due to the insufficient number of corresponding points in the input and template images. We present a hybrid matching algorithm that uses both minutiae (point) information and texture (region) information for matching the fingerprints" (ibid., from the abstract).

Kovács-Vajna (2000) combined triangular matching and dynamic time warping to tolerate nonlinear deformation of fingerprints.<sup>178</sup> Tan and Bhanu (2006) applied genetic algorithms<sup>179</sup> to fingerprint matching. The genetic algorithm "tries to find the optimal transformation between two different fingerprints. In order to deal with low-quality fingerprint images, which introduce significant occlusion and clutter of minutiae features, we design a fitness function based on the local properties of each triplet of minutiae" (ibid., from the abstract). They found that their approach compares favourably with an approach based on mean-squared error estimation.

Ito, Nakajima, Kobayashi, Aoki, and Higuchi (2004) proposed an algorithm for fingerprint matching, which resorts to the *Phase-Only Correlation* function. It uses phase spectra of fingerprint images, and we are going to devote to it a special subsection (see Section 8.7.3.3). Kong, Zhang, and Kamel (2006) were concerned with *palmprint identification*, and for that purpose, they resorted to *feature-level fusion;* as they explained in the abstract:

Multiple elliptical Gabor filters with different orientations are employed to extract the phase information on a palmprint image, which is then merged according to a fusion rule to produce a single feature called the Fusion Code. The similarity of two Fusion Codes is measured by their normalized hamming distance. A dynamic threshold is used for the final decisions. A database containing 9599 palmprint images from 488 different palms is used to validate the performance of the proposed method.

<sup>&</sup>lt;sup>177</sup> The article by Fasel et al. (2002) "presents a systematic analysis of Gabor filter banks for detection of facial landmarks (pupils and philtrum). Sensitivity is assessed using [...] a non-parametric estimate of sensitivity independent of bias commonly used in the psychophysical literature. We find that current Gabor filter bank systems are overly complex. Performance can be greatly improved by reducing the number of frequency and orientation components in these systems. With a single frequency band, we obtained performances significantly better than those achievable with current systems that use multiple frequency bands. [...]" (ibid., from the abstract).

<sup>&</sup>lt;sup>178</sup> Cf. Kovács-Vajna, Rovatti, and Frazzoni (2000); Farina, Kovács-Vajna, and Leone (1999); and cf. Zs. Kovács-Vajna, "Method and Device for Identifying Fingerprints", U.S.A. Patent No. US6,236,741, filing date: 19.02.1997, issued: 22.05.2001; Zs. Kovács-Vajna, "Method and Device for Identifying Fingerprints Using an Analog Flash Memory", U.S.A. Patent No. US6,330,347, filing date: 28.07.1998, issued: 11.12.2001.

<sup>&</sup>lt;sup>179</sup> Genetic algorithms are the subject of Section 6.1.16.1 in this book.

Ying Hao, Tieniu Tan, and Yunhong Wang, from the National Lab of Pattern Recognition at the Institute of Automation of the Chinese Academy of Sciences in Beijing, proposed an algorithm for fingerprint matching that is based on error propagation (Hao et al., 2002). They remarked that traditional methods treat fingerprint matching "as point pattern matching, which is essentially an intractable problem due to the various nonlinear deformations commonly observed in fingerprint images" (ibid., from the abstract). According to their own method (ibid.):

Firstly, ridge information and Hough transformation are adopted to find several pairs of matching minutiae, the initial correspondences, which are used to estimate the common region of two fingerprints and the alignment parameters. Then a MatchedSet which includes the correspondence and its surrounding matched minutiae pairs is established. The subsequent matching process is guided by the concept of error propagation: the matching errors of each unmatched minutiae are estimated according to those of its most relevant neighbor minutiae. In order to prevent the process from being misguided by mismatched minutiae pairs, we adopt a flexible propagation scheme.

The matching algorithm they proposed comprises three steps (ibid., section 2). In the first step, each and every minutia "in the reference template is matched with each minutiae in the input template and all resulting potential correspondences are used to find several most reliable one, the initial correspondences, using Hough transformation" (ibid.). In the second step, "all minutiae surrounding the correspondence are matched and those minutiae pairs whose matching error are less than certain thresholds are added to the MatchedSet" (ibid.). In the third step, the algorithm adjusts "the matching error of each unmatched minutia according to the information provided by the MatchedSet recursively until the number of elements in MatchedSet stops increasing. A conformation process which checks the consistency of the matching errors of elements in the MatchedSet is made to label and remove the mismatched minutiae after each iteration" (ibid.). The MatchedSet is initialised after the two templates have been aligned and the common region estimated. Error threshold are chosen with care, so that only reliable pairs are added to the initial MatchedSet (ibid., section 2.3).

Arun Abraham Ross (2003) developed, under Anil Jain's supervision, a "hybrid fingerprint system that utilizes both minutiae points and ridge feature maps to represent and match fingerprint images" (from the abstract of the thesis). For image filtering, Ross used Gabor filters (Ross, 2003, section 2.3). Filtered images were underwent *tessellation* (i.e., mosaicking), for ridge feature mapping (ibid., section 2.4 and chapter 3). A deformable model was resrted to, in order to account for the elasticity of fingertips. Ross explained (ibid., in the abstract of the thesis):

The hybrid matcher is shown to perform significantly better than a traditional minutiaebased matcher. The ridge feature maps extracted by this technique have also been used to align and register fingerprint image pairs via a correlation process, thereby obviating the need to rely on minutiae points for image registration. To address the problem of partial prints obtained from small-sized sensors, a fingerprint mosaicking scheme has been developed. The proposed technique constructs a composite fingerprint template from two partial fingerprint impressions by using the iterative control point (ICP) algorithm that determines the transformation parameters relating the two impressions. To mitigate the e\_ect of nonlinear distortions in fingerprint images on the matching process, an average deformation

#### 8.7 Individual Identification

model has been proposed. The model is developed by comparing a fingerprint impression with several other impressions of the same finger and observing the common ridge points that occur in them. An index of deformation has been suggested in this context to aid in the selection of an 'optimal' fingerprint impression from a set of impressions. Finally, techniques to combine fingerprint information with the other biometric traits of a subject (viz., face and hand geometry) are presented.

The mosaicking is because of the following problem (Ross, 2003, pp. 55–56):

[T]he average number of minutiae points extracted from a Digital Biometrics optical sensor ( $500 \times 500$  image at 500 dpi) is 45 compared to 25 minutiae obtained from a Veridicom sensor image ( $300 \times 300$  image at 500 dpi). This loss of information affects the matching performance of the veriffcation system – the relatively small overlap between the template and query impressions results in fewer corresponding points and therefore, results in higher false rejects and/or higher false accepts.

#### The remedy is as follows (Ross, 2003, pp. 56–57):

To deal with this problem, we have developed a fingerprint mosaicking scheme that constructs a composite fingerprint template using evidence accumulated from multiple impressions. A composite template reduces storage, decreases matching time and alleviates the quandary of selecting the "optimal" fingerprint template from a given set of impressions. In the proposed algorithm, two impressions (templates) of a finger are initially aligned using the corresponding minutiae points. This alignment is used by a modified version of the well-known iterative closest point algorithm (ICP) to compute a transformation matrix that defines the spatial relationship between the two impressions. The resulting transformation matrix is used in two ways: (a) the two template images are stitched together to generate a composite image. Minutiae points are then detected in this composite image; (b) the minutia sets obtained from each of the individual impressions are integrated to create a composite minutia set.

## 8.7.3.2 Bistarelli, Santini, and Vaccarelli's Algorithm, Suiting the Hardware Constraints of a Smartcard Architecture

A team from Pisa and Pescara, Italy, comprising Stefano Bistarelli et al., proposed (2006) what they called "a light-weight fingerprint matching algorithm that can be executed inside the devices with a limited computational power" (ibid., p. 359). Their implementation is on a smartcard, and is support by the Java Card<sup>TM</sup> platform.<sup>180</sup> In devising their algorithm, they based in on "on the minutiae local structures (the "neighborhoods"), that are invariant with respect to global transformations like translation and rotation" (ibid.). Such local structure information

<sup>&</sup>lt;sup>180</sup> On which, see http://www.javacardforum.org/ See Chen (2000b) about the architecture of Java Card. "Performing a biometric verification inside a smartcard is notoriously difficult, since the processing capabilities of standard smartcard processors are limited for such a complex task. With *Match-on-Card* (MoC) technology, the fingerprint template is stored inside the card, unavailable to the external applications and the outside world. In addition, the matching decision is securely authenticated by the smartcard itself, in this way, the card has only to trust in itself for eventually unblocking stored sensitive information, such as digital certificates or private keys for digital signature. Our verification MoC algorithm was developed to work in this very strictly bounded environment" (Bistarelli et al., 2006, p. 359).

about the minutiae characteristics, i.e., ridge pattern micro-characteristics, spares the system the need to pre-align the processing fingerprint templates, "which would be a difficult task to implement inside a smartcard" (ibid., p. 360). The CPU (i.e., the central processing unit) of a smartcard pose limitations: "matching on smartcard environment is bounded by the hardware simplicity (CPU limitations first of all), and thus waiting for a complete minutiae match could lead to a waiting time which is too long for the user. In our algorithm we solve this problem by stopping the computation as soon as it is possible to assert, with satisfactory confidence, that the considered templates belong to the same fingerprint" (ibid., p. 367).

"The main characteristic of the algorithm is to have an asymmetric behavior, in respect to the execution time, between correct positive and negative matches" (ibid., p. 359). Correct positive martches are when the same fingerprint is recognised. Correct negative matches are when two different fingers left the prints. The asymmetric execution time "is because the match procedure stops immediately when few minutiae pairs result in a positive match. If this check does not succeed, for example if the two fingers are different, or if the two acquisitions of the same finger are very disturbed, the procedure is fully executed (lasting longer) and the match decision is taken only at its end" (ibid., p. 360). Bistarelli et al. explained (2006, p. 367):

Our proposed matching algorithm computes how much the neighborhood of a minutia in the candidate template is similar to the neighborhood of each minutia in the reference template. At the end of this scan step, the two most similar minutiae (those whose "similarity value" is the lowest) are matched and then discarded from subsequent scan phases concerning other different minutiae of the candidate template. All these similarity measures are summed together during the process and, at the end, the algorithm can decide if the two templates match by applying a threshold on this global score.

The problem with smartcard hardware limitations is solved "by stopping the computation as soon as it is possible to assert, with satisfactory confidence, that the considered templates belong to the same fingerprint" (ibid.). In fact, the "algorithm stops as soon as it finds some minutiae pairs (i.e. a number between 2 and 5) matching with a very good average similarity value, or even immediately when only the last examined minutiae pair has a matching value lower than a very rigourous threshold. Otherwise, if these two conditions are not true, the algorithm explores all the minutiae pairings space" (ibid.).

We translate into text the flowchart in Bistarelli et al. (2006, p. 367, figure 6). The input of the algorithm is the candidate minutia *C* from a candidate template. *C* is taken to be matched. The reference template is also taken as input, and each of its minutiae is called *R* (where "the minutia information exactly corresponds to its neighborhood features: the terms 'minutia' and 'neighborhood' can be used as synonyms, since to match a minutia we need to match its neighborhood", ibid.).<sup>181</sup>

<sup>&</sup>lt;sup>181</sup> "The algorithm scans sequentially the minutiae of the reference template until a good match for the input minutia is found. Both candidate and reference minutiae lists are stored according to the increasing minutia reliability value: in this way we try to stop the procedure more quickly by scanning a reduced portion of the template minutiae lists. In fact, a minutia with a high reliability in a given template, when not cut away by partial overlapping, will probably have a high reliability

- **Step 1.** Initially, minutia *R* in the reference template is taken, and *MinutiaDissimilarity* is initialised to zero.
- **Step 2.** Take neighbour *I* or *R*.
- Step 3. Take neighbour *J* of *C*.
- Step 4. Is *J* matched? If yes, increment *J* by one and go to Step 3. If no, go to Step 5.
- Step 5. Find *NeighDissimilarity* between *I* and *J*. This corresponds to these four substeps (Bistrarelli et al., 2006, p. 368), where (ibid., p. 366) *Ed* stands for "euclidean distance" (between the central minutia and its neighbour), *Dra* stands for "distance relative angle" (this is the angle between a segment which joins two minutiae points,<sup>182</sup> and the central minutia ridge direction), *Oda* stands for "orientation difference angle" (this is the difference angle between the central minutia orientation angle and the neighbour ridge orientation angle),<sup>183</sup> and *Rc* stands for "ridge count" between the central minutia and its neighbour (See Fig. 8.7.3.2.1):
  - 1. To find the difference in absolute value between corresponding features:

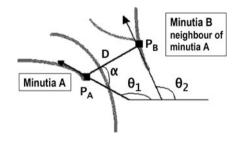
$$EdDiff = |Ed_1 - Ed_2|,$$
  

$$rcDiff = |Rc_1 - Rc_2|,$$
  

$$draDiff = |Dra_1 - Dra_2|$$

and

$$odDiff = |Oda_1 - Oda_2|$$
.



**Fig. 8.7.3.2.1** Features of the minutiae. Redrawn from figure 5 of (Bistarelli et al., 2006)

also in other templates obtained from the same finger. Thus, the stopping conditions can be met earlier than in a casual disposition of the minutiae in the list. Moreover, it is obviously better to prematurely stop the procedure with few but 'good' minutiae than with low quality ones. The minutia of the reference template matched in this way, is then marked as 'already matched' and is not considered in the successive iterations." (Bistarelli et al., 2006, p. 368).

<sup>&</sup>lt;sup>182</sup> Such as the ending of one ridge, and a bifurcation point of two other ridges close by.

<sup>&</sup>lt;sup>183</sup> The orientation difference angle is the difference between two angles, which are each an angle between a horizontal straight line, and the straight line that is tangent to the respective ridge (thus being the central minutia ridge direction) at the given minutia point (such as the ending of the ridge, or a bifurcation point). It is the minutia point being one of the two ends of the segment we mentioned concerning the distance relative angle.

8 The Forensic Disciplines: Some Areas of Actual or Potential Application

- 2. To check that every feature difference value is below the corresponding acceptance threshold; if only one difference value exceeds the relative threshold, the two neighbors cannot correspond in the two respective neighborhoods (*edDiff* must not be greater than the limit set by *edDiffThr*; *rcDiff* than *rcThr*, *edDiff* than *draThr* and *odDiff* than *odThr*). The set of the four feature difference thresholds can be globally defined as the features *bounding box*, which makes the algorithm tolerant to small non-linear distortions.
- 3. To multiply each feature difference for the corresponding eight value: thus,

edWghtDiff = edDiff × edWght, rcWghDiff = rcDiff × rcWght, odWghtDiff = odDiff × odWght

and

$$draWghtDiff = draDiff \times draWght.$$

The different weight alues are necessary to attribute more importance to the features that match better such as, in our test experience, the euclidean distance. Before multiplying for the weight value, we have normalized the feature differences with respect to the bounding box thresholds (to have homogenous values).

4. To sum together all the four weighted differences to represent the global dissimilarity between the two neighbors:

```
\begin{aligned} NeightDissimilarity &= edWghtDiff \\ &+ rcWghtDiff \\ &+ draWghtDiff \\ &+ odWghtDiff. \end{aligned}
```

- Step 6. Is BBox, i.e. the bounding box, OK? If yes, go to Step 7. If no, discard *NeighDissimilarity*, then increment *J* by one and go to Step 3.
- Step 7. Is J=LastNeigh verified? If yes, go to Step 8. If no, increment J by one and go to Step 3.
- **Step 8.** Match *I* and *J* with best *NeighDissimilarity:*

the algorithm finds for the first neighbor of the reference minutia, the most similar neighbor in the input minutia among those satisfying the bounding box checks; the most similar is the one for which the algorithm finds the lowest *NeighDissimilarity* value" (ibid., p. 368). "The chosen most similar neighbor in the reference minutia is then marked and not considered while matching other neighbors" (ibid.).

"The obtained *NeighDissimilarity* value is then added to the global similarity score between the minutiae, *MinDissimilarity*" (ibid., p. 368)

*MinutiaeDiss*+ = *NeighDissimilarity* 

Moreover:

Increment by one the value of *NM*, that is the number of neighbours matched.

- **Step 9.** Is the *NM*=*N* verified? That is to say: has the required minimum number *N* of neighbours been matched?
- **Step 10.** Match *R* and *C*. (*MatchCost* is a temporary average.)

MatchCost = MinutiaeDiss/NM MinutiaeMatched + +

That is to say:

"if the neighborhoods of the two R and C minutiae have been matched [...], the *MinDissimilarity* score between M and N is finally divided by the number of matched neighbor pairs and then added to the global dissimilarity value between the candidate and reference templates: the *MatchCost*. The number of matched minutiae *MinutiaeMatched* is then incremented" (ibid., p. 368).

- **Step 11.** Are stop conditions verified? If yes, return a successful match. If no, repeat this procedure with the next candidate minutia *C*.
- **Step 12.** Is *I*=*LastNeigh* verified? That is to say:

"at the end of the two neighborhoods scanning and if the procedure has found less than N matching neighbor pairs between the two minutiae ("Yes" case [to the test I=LastNeigh]), these two minutiae can not be considered as matching because their neighborhoods agree on too few points of evidence to be a reliable pair, even if their *MinDissimilarity* value is very low. Thus, the following minutia R in reference template has to be checked ("No" case in [the test of **Step 13**]), but if there are no more minutiae R to be examined, the entire procedure [...] is repeated for the next minutia C in the decreasing reliability order of the candidate template." (ibid., p. 368).

If yes, go to **Step 13.** If no, increment *J* by one and go to **Step 3.** That is to say: if no, the procedure is repeated for all the other neighbours in the minutia of the reference template, excluding the ones already marked.

**Step 13.** Is *R=LastMin* verified? If yes, repeat this procedure with the next candidate minutia C. If no, increment R by one and go to **Step 1**.

## 8.7.3.3 The Tohoku Algorithm for Fingerprint Matching Based on Band-Limited Phase-Only Correlation

Tatsuo Higuchi's team at Tohoku University and Tohoku Institute of Technology published (Ito et al., 2004) an algorithm for fingerprint matching, which resorts

to the *phase-only correlation (POC)* function.<sup>184</sup> It uses phase spectra of fingerprint images. The algorithm was claimed to be "highly robust against fingerprint image degradation due to inadequate fingertip conditions" (ibid., p. 682). It was also claimed that it "exhibits efficient identification performance even for difficult fingerprint images that could not be identified by the conventional matching algorithms" (ibid.). They experimented with the technique they developed, and carried out comparisons to other techniques, by using a prototype (from Yamatake Corporation) of a fingerprint verification system with a pressure-sensitive sensor; the fingerprint database was with fingerprints from employees of the 700-strong staff of Yamatake Corporation.

Given two  $N_1 \times N_2$  images (such as two fingerprints to be compared),  $f(n_1, n_2)$  and  $g(n_1, n_2)$ , let their index ranges be:

$$n_1 = -M_1 \dots M_1$$
 (where  $M_1 > 0$ )  
 $n_2 = -M_2 \dots M_2$  (where  $M_2 > 0$ )

Let us consider those two functions' respective two-dimensional *discrete Fourier* transforms,  $F(k_1, k_2)$  and  $G(k_1, k_2)$ :

$$\begin{split} F(k_1,k_2) &= \sum_{n_1,n_2} f(n_1,n_2) W_{N_1}^{k_1n_1} W_{N_2}^{k_2n_2} \\ &= A_F(k_1,k_2) e^{j\theta_F(k_1,k_2)}, \end{split}$$

and

$$G(k_1, k_2) = \sum_{n_1, n_2} g(n_1, n_2) W_{N_1}^{k_1 n_1} W_{N_2}^{k_2 n_2}$$
$$= A_G(k_1, k_2) e^{j\theta_G(k_1, k_2)},$$

where the ranks of  $k_1$  and  $k_2$  are defined as:

$$k_1 = -M_1 \dots M_1$$
 (where  $M_1 > 0$ )  
 $k_2 = -M_2 \dots M_2$  (where  $M_2 > 0$ )

and where

$$W_{N_1} = e^{-j\frac{2\pi}{N_1}}$$
$$W_{N_2} = e^{-j\frac{2\pi}{N_2}}$$

<sup>&</sup>lt;sup>184</sup> The concept was used earlier by e.g. Kuglin and Hines (1975), and Kenji, Aoki, Sasaki, Higuchi, and Kobayashi (2003).

8.7 Individual Identification

Moreover, the operator

 $\sum_{n_1,n_2}$ 

stands for

$$\sum_{n_1=-M_1}^{M_1} \sum_{n_2=-M_2}^{M_2}$$

 $A_F(k_1, k_2)$  and  $A_G(k_1, k_2)$  are *amplitude components*. By contrast,

$$e^{j heta_F(k_1,k_2)}$$

and

$$e^{j heta_G(k_1,k_2)}$$

are *phase components*. The following formula gives the *cross spectrum*,  $RFG(k_1, k_2)$ , of the two two-dimensional discrete Fourier transforms,  $F(k_1, k_2)$  and  $G(k_1, k_2)$ :

$$R_{FG}(k_1, k_2) = F(k_1, k_2)\overline{G(k_1, k_2)}$$
  
=  $A_F(k_1, k_2)A_G(k_1, k_2)e^{j\theta(k_1, k_2)}$ 

In the latter formula,  $\overline{G(k_1, k_2)}$  stands for the complex conjugate of  $G(k_1, k_2)$ . By definition, we denoted in that same formula the phase difference as follows:

$$\theta(k_1, k_2) = \theta_F(k_1, k_2) - \theta_G(k_1, k_2)$$

Moreover, the operator

$$\sum_{k_1k_2}$$

stand for

$$\sum_{k_1=-M_1}^{M_1} \sum_{k_2=-M_2}^{M_2}$$

The ordinary  $r_{fg}(n_1, n_2)$  is the correlation function

$$r_{fg}(n_1, n_2) = \frac{1}{N_1 N_2} \sum_{k_1, k_2} R_{FG}(n_1, n_2) W_{N_1}^{-k_1 n_1} W_{N_2}^{-k_2 n_2}$$

and is the two-dimensional *inverse discrete Fourier transform*. The *normalised cross-phase spectrum*, also called the *normalised cross-spectrum*, is given by definition by the following formula:

$$\hat{R}_{FG}(k_1, k_2) = \frac{F(k_1, k_2)\overline{G(k_1, k_2)}}{|F(k_1, k_2)\overline{G(k_1, k_2)}|} \\ = e^{j\theta(k_1, k_2)}.$$

The phase-only correlation function is given by the formula:

$$\hat{r}_{ff}(n_1, n_2) = \frac{1}{N_1 N_2} \sum_{k_1, k_2} W_{N_1}^{-k_1 n_1} W_{N_2}^{-k_2 n_2}$$
  
=  $\delta(n_1, n_2)$   
=  $\begin{cases} 1 & \text{if } n_1 = n_2 = 0\\ 0 & \text{otherwise.} \end{cases}$ 

As a particular case, if the two images are identical, if follows from the latter formula that their phase-only correlation function is the *Kronecker delta function*,  $\delta(n_1, n_2)$ . In the application at hand, it is two fingerprints that are compared. Ito et al. (2004) found it advantageous to resort for that purpose to the phase-only correlation function, as opposed to the ordinary correlation function, because of how accurate the phase-only correlation function is in image matching: it exhibits a much higher discrimination capability. In fact, when it is plotted as a surface in three dimension, the phase-only correlation function gives a distinct sharp peak when the two images being compared are similar to each other, whereas the peak drops significantly if the two images are not similar. Also with ordinary correlation, there is a peak if the two images are not similar or identical, and the peak is not there is the two images are not similar, but with the phase-only correlation the difference is much sharper. "Other important properties of the POC function used for fingerpint matching is that it is not influenced by image shift and brightness change, and it is highly robust against noise" (Ito et al., 2004, p. 683).

In section 3 of Ito et al. (2004), the definition of phase-only correlation function was modified into a *band-limited POC function*, one that is dedicated to fingerprint matching tasks. Meaningless high-frequency components in the calculation of the cross-phase spectrum were eliminated from the new definition. Depending on the fingerprint image, if the ranges of the *inherent frequency band* are given by

 $k_1 = -K_1 \dots K_1 \qquad \text{(where } 0 \le K_1 \le M_1\text{)}$  $k_2 = -K_2 \dots K_2 \qquad \text{(where } 0 \le K_2 \le M_2\text{)}$ 

– where the parameters  $K_1$  and  $K_2$  can be automatically detected by image processing – the effective size of the *frequency spectrum* is given by the formulae

$$L_1 = 2K_1 + 1$$
  
 $L_2 = 2K_2 + 1.$ 

The band-limited phase-only correlation function was defined as follows:

$$\hat{r}_{fg}^{K_1K_2}(n_1, n_2) = \frac{1}{L_1L_2} \sum_{k_1 = -K_1}^{K_1} \sum_{k_2 = -K_2}^{K_2} \hat{R}_{FG}(k_1, k_2) \times W_{L_1}^{-k_1n_1} W_{L_2}^{-k_2n_2},$$

where

$$n_1 = -K_1 \dots K_1$$
$$n_2 = -K_2 \dots K_2.$$

Ito et al. remarked (2004, p. 684):

Note that the maximum value of the correlation peak of the band-limited POC function is always normalized to 1 and is not depending on the frequency band size  $L_1$  and  $L_2$ . The shape of the band-limited POC function for the two identical images is always the Kronecker's delta function  $\delta(n_1, n_2)$ . Also, note that the original POC function can be represented as

$$\hat{r}_{fg}(n_1, n_2) = \hat{r}_{fg}^{M_1M_2}(n_1, n_2).$$

As an alternative method for defining a frequency-selective POC function, had the Tohoku team adopted instead some adequate *low-pass filter* to the cross-phase spectrum, this would have resulted in the shape and height of the correlation peak depending on the type of the low-pass filter (Ito et al., 2004, pp. 684–685, citing Kenji et al., 2003), and what is more, this would have required fitting a model peak function to the correlation array, in order to evaluate the similarity between images, whereas with the band-limited POC function this is not required (Ito et al., 2004, p. 685).

Ito et al. (2004, p. 685, figure 5) give an example in which the original POC function would give a false negative, that is to say, when a registered fingerprint was matched to an impostor's fingerprint, the original POC limited gave a peak. By contrast, the band-limited POC function, for the same input pair of fingerprint, gave no peak. Therefore, the band-limited POC function is more reliable – it discriminates much better – than the original POC function, for the purposes of fingerprint matching.

The algorithm for fingerprint matching using the band-limited POC function takes an input  $f(n_1, n_2)$ , i.e. the registered fingerprint image, and  $g(n_1, n_2)$ , i.e. the fingerprint image to be verified. The output is a matching score between  $f(n_1, n_2)$  and  $g(n_1, n_2)$ . The steps of the algorithm are as follows (Ito et al., 2004, p. 686):

**Step 1.** Store in advance a set of rotated images  $f_{\theta}(n_1, n_2)$  of  $f(n_1, n_2)$  over the angular range

$$-\theta_{\max} \leq \theta \leq \theta_{\max}.$$

with an angle spacing 1°. **Step 2.** Calculate the POC function

$$\hat{r}_{f_{\theta}g}^{M_1M_2}(n_1,n_2)$$

between  $f_{\theta}(n_1, n_2)$  and  $g(n_1, n_2)$ .

Step 3. Calculate the rotation angle

$$\Theta = \arg \max_{\theta} \{ S_1^{M_1 M_2} [f_{\theta}, g] \}$$

by evaluating the similarity between  $f_{\theta}(n_1, n_2)$  and  $g(n_1, n_2)$ ,

in order to select the rotation-normalised image  $f_{\Theta}(n_1, n_2)$ .

**Step 4.** Estimate image displacements  $(\tau_1, \tau_2)$  between  $f_{\Theta}(n_1, n_2)$  and  $g(n_1, n_2)$  from the peak location of

$$\hat{r}_{f \otimes g}^{M_1 M_2}(n_1, n_2)$$

- **Step 5.** Extend the size of  $f_{\Theta}(n_1, n_2)$  and  $g(n_1, n_2)$  by  $\tau_1$  and  $\tau_2$  pixels for  $n_1$  and  $n_2$  directions, to obtain  $f'(n_1, n_2)$  and  $g'(n_1, n_2)$ .
- **Step 6.** Extract the effective fingerprint regions  $f''(n_1, n_2)$  and  $g''(n_1, n_2)$  from  $f'(n_1, n_2)$  and  $g'(n_1, n_2)$ .
- **Step 7.** Detect the inherent frequency band  $(K_1, K_2)$  from the two-dimensional discrete Fourier transforms of  $f''(n_1, n_2)$ .
- Step 8. Calculate the band-limited POC function

$$\hat{r}_{f''g''}^{K_1K_2}(n_1, n_2)$$

Step 9. Compute the *matching score* 

$$S_P^{K_1K_2}[f^{\prime\prime},g^{\prime\prime}]$$

(by summing the highest peaks of the band-limited POC function: there may be several peaks, because elastic deformation causes them to be produced: see below), and then give the matching score as output, and terminate the execution of the algorithm.

In their experiments, Ito et al. explain (2004, p. 686), they used  $\theta_{max} = 20^{\circ}$ . They also explained (ibid.):

In many cases, the band-limited POC function has multiple peaks, which is caused by elastic fingerprint deformation. The fingerprint image can expand or contract when a fingertip contacts with the sensor surface. Each portion of the fingerprint image will be shifted independently, which means several sub-domains in the image are moving individually. In this case, the POC function produces several peaks corresponding to the multiple translated subdomains. The height of every correlation peak reflects the matched area of each sub-domain. Hence, we decide to employ the sum of these peaks as an evaluation criterion in order to make the proposed matching algorithm robust against elastic deformation.

## 8.8 Bloodstain Pattern Analysis, and the Use of Software for Determining the Angle of Impact of Blood Drops

#### 8.8.1 The Basics

Do not confuse *DNA profiling* and *bloodstain pattern analysis* (*BPA*).<sup>185</sup> In order to carry out the latter (which some prefer to call *blood spatter analysis*), the analyst (or examiner) has to consider, for each blood pattern, factors including the number of blood patterns in the environment (e.g., on the floor and the walls inside a room), dispersion, shape, size, volume, orientation, and location. What is reconstructed (if reconstruction is successful, but not always this is feasible) is the events that occurred during the criminal incident. The analyst has to classify the bloodstain pattern, and then to associate that pattern back to a source event, that is conjectured to have unfolded at the crime scene. Concerning BPA, the Wikipedia entry<sup>186</sup> provides this usefully concise information:

Bloodstain pattern analysis (BPA) is one of several specialties in the field of forensic science. The use of bloodstains as evidence is not new, however the application of modern science has brought it to a higher level. New technologies, especially advances in DNA analysis, are available for detectives and criminologists to use in solving crimes and apprehending offenders. The science of bloodstain pattern analysis applies scientific knowledge from other fields to solve practical problems. Bloodstain pattern analysis draws on biology, chemistry, maths, and physics among scientific disciplines. As long as an analyst follows a scientific process, this applied science can produce strong, solid evidence, making it an effective tool for investigators.

<sup>&</sup>lt;sup>185</sup> Bloodstain pattern analysis is the subject of a valuable short introduction by Louis Akin (2005), of books by Tom Bevel and Ross Gardner (2008), and by Stuart James and William Eckert (1999), whereas the book by James et al. (2005a) is more recent (whereas their James et al., 2005b is an overview article about the recognition of bloodstain patterns). MacDonell (1993) is still cited sometimes, in the 2000s, in such studies that also cite more recent literature. Cf. MacDonell and Bialousz (1979). Stuart James also edited a paper collection on the subject (James, 1999). With respect to the second edition of 2002, the third edition of Bevel and Gardner's book (2008) includes new chapters that "detail a true taxonomic classification system, with a supporting decision map to aid analysts in the field; a specific methodology based on scientific method; conducting experiments in support of bloodstain pattern analysis; anatomical issues associated to bloodstain pattern analysis; issues surrounding the examination of clothing in bloodstain pattern analysis; as well as a chapter detailing the various presumptive testing and enhancement techniques for bloodstains" (ibid., from the summary). The contents of the third edition include: Bloodstain pattern analysis: its function and a historical perspective - Bloodstain pattern terminology - Bloodstain classification - A methodology for bloodstain pattern analysis - The medium of blood - Anatomical considerations in bloodstain pattern analysis - Determining motion and directionality - Determining the point of convergence and the area of origin - Evaluating impact spatter bloodstains - Understanding and applying characteristic patterns of blood - Bloodstained clothing issues - Presumptive testing and enhancement of blood - Documenting bloodstains - An introduction to crime scene reconstruction and analysis [this is also the subject of a book by those same authors: Gardner and Bevel (2009)] - Presenting evidence - Experimentation in bloodstain pattern analysis - Dealing with the risk of bloodborne pathogens - Appendix A weight/measurement conversion table - Appendix B: Trigonometric functions and their application in bloodstain pattern analysis.

<sup>&</sup>lt;sup>186</sup> http://en.wikipedia.org/wiki/Bloodstain\_pattern\_analysis.

8 The Forensic Disciplines: Some Areas of Actual or Potential Application

Bloodstain pattern categories include: passive bloodstains, projected bloodstains, and transfer/contact bloodstains. The same Wikipedia entry explains: "The definitions used below are from the suggested IABPA terminology list". In particular: "Passive bloodstains are those stains created by the force of gravity". Passive drops are "Bloodstain drop(s) created or formed by the force of gravity acting alone". Drip pattern denotes "A bloodstain pattern which results from blood dripping into blood". Flow pattern is "A change in the shape and direction of a bloodstain due to the influence of gravity or movement of the object". Pool pattern is "A bloodstain pattern formed when a source of blood is stationary for a period of time".

"A projected stain occurs when some form of energy has been transferred to a blood source". The respective terminology includes:

*Low Velocity Impact Spatter (LVIS)* – A bloodstain pattern that is caused by a low velocity impact/force to a blood source.

*Medium Velocity Impact* Spatter (*MVIS*) – A bloodstain pattern caused by a medium velocity impact/force to a blood source. A beating typically causes this type of spatter.

*High Velocity Impact Spatter (HVIS)* – A bloodstain pattern caused by a high velocity impact/force to a blood source such as that produced by gunshot or high-speed machinery.

*Cast-Off Pattern* – A bloodstain pattern created when blood is released or thrown from a blood-bearing object in motion.

*Arterial Spurting* (or *Gushing*) *Pattern* – Bloodstain pattern(s) resulting from blood exiting the body under pressure from a breached artery.

Back Spatter – Blood directed back towards the source of energy or force that caused the spatter.

*Expiratory Blood* – Blood that is blown out of the nose, mouth, or a wound as a result of air pressure and/or air flow which is the propelling force.

"A transfer or contact stain is produced when an object with blood comes in contact with an object or surface that does not have blood. It may be possible to discern the object that left the blood impression." The respective terminology includes: *wipe pattern*, this being "A bloodstain pattern created when an object moves through an existing stain, removing and/or altering its appearance"; and *swipe pattern*, this being "The transfer of blood from a moving source onto an unstained surface. Direction of travel may be determined by the feathered edge."

As indicated above, there are other terms currently used in BPA and different ways of classifying bloodstain patterns. For example there is a debate over the misnomer of the LVIS, MVIS, and HVIS as it relates to the physical term 'velocity'. A sub-committee of the SWGSTAIN [i.e., the Scientific Working Group on Bloodstain Pattern Analysis] has been tasked with addressing the terminology issues and develop a taxonomy for bloodstain patterns.

When it comes to *velocity impact stains*, the same entry explains:

Contrary to what the name states, the terms low-, medium-, and high-velocity impact spatter do not describe the velocity of the blood droplets as they fly through the air. The variation in the 'velocity' is meant to describe the amount of energy transferred to a blood source in order to create the stains. Velocity is a speed (m/s) with a direction. Often the terms force and energy are quoted in conjunction with the unit ft/s or m/s which is an incorrect. Force is related to velocity and mass (N or 1 kg  $\cdot$ m·s-2). Energy (work) is related to the force exerted on an object (J or N·m or kg  $\cdot$ m·s-2).

*Physical* considerations apply: "Once blood has left the body it behaves as a fluid and all physical laws apply". In particular, *gravity* "is acting on blood (without the body's influence) as soon as it exits the body. Given the right circumstances blood can act according to ballistic theory." *Viscosity* "is the amount of internal friction in the fluid. It describes the resistance of a liquid to flow". *Surface tension* "is the force that gives the ability to blood to maintain its shape".

*Blood spatter flight characteristics* do matter: "Experiments with blood have shown that a drop of blood tends to form into a sphere in flight rather than the artistic teardrop shape. This is what one would expect of a fluid in freefall. The formation of the sphere is a result of surface tension that binds the molecules together. This spherical shape of blood in flight is important for the calculation of the angle of impact (incidence) of blood spatter when it hits a surface. That angle will be used to determine the point from which the blood originated which is called the Point of Origin or more appropriately the Area of Origin.<sup>187</sup> A single spatter of blood is not enough to determine the Area of Origin at a crime scene. The determination of the angles of impact and placement of the Area of Origin should be based on the consideration of a number of stains and preferably stains from opposite sides of the pattern to create the means to triangulate."

It is important to determine angles of impact.

As mentioned earlier a blood droplet in freefall has the shape of a sphere. Should the droplet strike a surface and a well-formed stain is produced, an analyst can determine the angle at which this droplet struck the surface. This is based on the relationship between the length of the major axis, minor axis, and the angle of impact. A well-formed stain is in the shape of an ellipse [See Fig. 8.8.1.1]. Dr. Victor Balthazard, and later Dr. Herbert Leon MacDonell,<sup>188</sup> realized the relationship of the length-width ratio of the ellipse was the function of the sine of the impact angle. Accurately measuring the stain will easily result in the calculation the impact angle. [...] Because of the three-dimensional aspect of trajectories there are three angles of impact,  $\alpha$ ,  $\beta$ , and  $\gamma$ . The easiest angle to calculate is *gamma* ( $\gamma$ ). Gamma is simply the angle of the bloodstain path measured from the true vertical (plumb)<sup>189</sup> of the surface [...] The next angle that can be quite easily calculated is *alpha* ( $\alpha$ ). Alpha is the impact angle of the bloodstain path moving out from the surface (see [Fig. 8.8.1.2] with alpha at the top by the stain). The third angle to be calculated is *beta* ( $\beta$ ). Beta is the angle of the bloodstain path wertical (z) axis [...] All three angles are related through the equation quoted below.

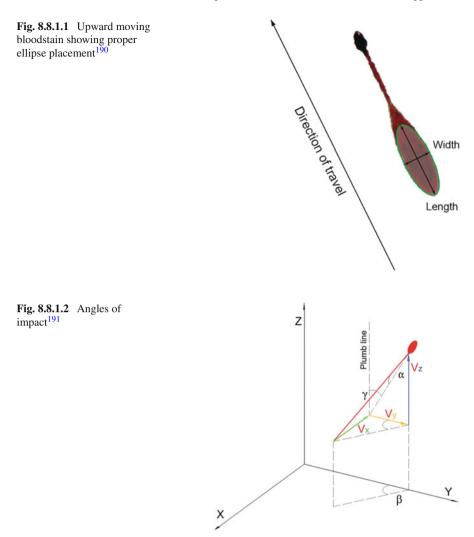
Let *L* be the length of the ellipse, that is to say, its major axis. Let *W* be the width of the ellipse, that is its minor axis. Let  $\alpha$  be the angle of impact. Those variable are related by the equation

$$\sin \alpha = W/L$$

<sup>&</sup>lt;sup>187</sup> The *point of origin* is also called the *point of hemorrhage*. Louis Akin "prefers to use the term *point of hemorrhage* to distinguish the area from which the blood was disgorged from other *points of origin*, the latter phrase being a widely used term in blood spatter, ballistics, crime, and accident scene investigation and reconstruction. Although most experts use the word *point*, the word *area* is a more conservative one to use" (Akin, 2005, p. 7).

<sup>&</sup>lt;sup>188</sup> The author of MacDonell (1993).

<sup>&</sup>lt;sup>189</sup> The plumb line is parallel to the z axis, in a Euclidean space in three dimensions.



Therefore,

 $\alpha = \arcsin\left(W/L\right)$ 

The three angles  $\alpha$ ,  $\beta$ , and  $\gamma$  are related by this equation:

 $\tan \beta = (\tan \alpha) / (\tan \gamma)$ 

<sup>&</sup>lt;sup>190</sup> In the public domain; http://en.wikipedia.org/wiki/File:BPA\_ellipse\_example.png Image made by Kevin Maloney.

<sup>&</sup>lt;sup>191</sup> In the public domain; http://en.wikipedia.org/wiki/File:BPA\_AOI.png Image made by Kevin Maloney.http://upload.wikimedia.org/wikipedia/en/9/91/BPA\_AOI.png is the full resolution version.

Measurements need be carried out with diligence and accuracy by the bloostain pattern examiner (analyst). "In the past analysts have used a variety of instruments. Methods currently used include:

- Viewing loop with an embedded scale in 0.2 mm increments or better that is placed over the stain. The analyst then uses a scientific calculator or spreadsheet to complete the angle calculations.
- Bloodstain Pattern Analysis (BPA) software that superimposes an ellipse over a scaled close-up image of an individual bloodstain. The programs then automatically calculates the angles of impact" (from the Wikipedia entry).

## 8.8.2 Software

There exists *bloodstain analysis software* for calculating the angles of impact, in bloodstain pattern analysis:

Accurately measuring the stain and calculating the angle of impact requires due diligence of the analyst. In the past analysts have used a variety of instruments. Methods currently used include:

Viewing loop with an embedded scale in 0.2 mm increments or better that is placed over the stain. The analyst then uses a scientific calculator or spreadsheet to complete the angle calculations.

Bloodstain Pattern Analysis (BPA) software that superimposes an ellipse over a scaled close-up image of an individual bloodstain. The programs then automatically calculates the angles of impact.

Using software produces a very accurate result that is measurable and reproducible. One software product for bloodstain pattern analysis is the *Crime Scene Command* program,<sup>192</sup> produced by On Scene Forensics in Austin, Texas, and which is claimed to be easy to use. The originator of Crime Scene Command is Louis L. Akin. There is an *On Scene Blood Spatter Calculator*, for use on homicide scenes. A testimonial by a forensic instructor, Thomas Hanratty, from Milwaukee, Wisconsin, found at the producer's website, for *Crime Scene Command*, claims: "An officer, either a first responder<sup>193</sup> or a detective, merely plugs in a few measurements and the dreaded math calculations are performed for him/her. Best of all, a record is generated of a

<sup>&</sup>lt;sup>192</sup> See http://www.onsceneforensics.com/Crime\_Scene\_Command.htm

<sup>&</sup>lt;sup>193</sup> Concerning *first responding officers*, also called *first responders* (which strictly speaking is a broader category, as sometimes the earliest responders are members of the public), Miller (2003) writes: "The first responders at a crime scene are usually police officers, fire department personnel or emergency medical personnel. They are the only people who view the crime scene in its original condition. Their actions at the crime scene provide the basis for the successful or unsuccessful resolution of the investigation. They must perform their duties and remember that they begin the process that links victims to suspects to crime scenes and must never destroy the links" (ibid., p. 118).

wealth of materials, if the entire program is used; including witnesses, suspects, an evidence log, photo log and bloodstains. And it's all in one complete report."

The key benefits claimed by On Scene Forensics for *Crime Scene Command* are as follows.<sup>194</sup> The software

- Makes a record of the case information as a number one report.
- Serves as a scene personnel log showing the name, agency, badge number, time in and out, of each person who enters the scene.
- Makes a detailed record of the circumstances surrounding the death of the victim:
  - Weather conditions
  - Environmental conditions
  - Position of victim
- Performs all bloodstain computations instantly including:
  - Angle of impact in degrees
  - Point of origin
  - Transfer stain description and location
- Performs all bullet trajectory computations from a bullet hole in a solid surface including:
  - Gives caliber of bullet
  - Angles of impact in degrees
  - Trajectory path
- Suspect page records all information on the suspect.
- Records evidence found at the scene in a printable log.
- Records photographs taken at the scene in a printable log.
- Records witness statements, res gestae statements, and officers' notes on scene.
- Easy to read permanent record can be stored as a word document on hard drive or disk, and printed, faxed, or emailed.
- Can be used as notes when testifying.

## 8.8.3 Point or Area of Origin

The description at the end of the previous subsection refers, among the other things, to to *point-of-origin calculations*. Apart from the angles of impact, another thing that needs to be calculated is the *area of origin* indeed. The IABPA definition is: "Point (Area) of Origin – The common point (area) in three-dimensional space to which the trajectories of several blood drops can be retraced." The *area of origin* is shown in Fig. 8.8.3.1. "The area of origin can give a general location [(Bevel & Gardner, 2008, p. 195)] or relative posture [(James et al., 2005a, p. 219)] of a bleeding victim

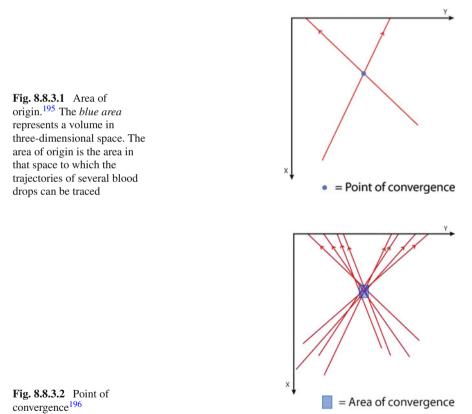
<sup>&</sup>lt;sup>194</sup> Also see Sections 8.8.4 and 8.8.5.

who has received a blow. In the literature, there are several limits used for area-oforigin calculations. These include a tennis ball, a grapefruit, a soccer ball, and a basketball" (Maloney, Killeen, & Maloney, 2009, p. 518).

The Wikipedia entry for "Bloodstain Pattern Analysis" explains:

The *area of origin* is the area in three-dimensional space where the blood source was located at the time of the bloodletting incident. The area of origin includes the area of convergence with a third dimension in the z direction. Since the z-axis is perpendicular to the floor, the area of origin has three dimensions and is a volume.

The term *point of origin* has also been accepted to mean the same thing. However it has been argued, there are problems associated to this term. First, a blood source is not a point source. To produce a point source the mechanism would have to be fixed in threedimensional space and have an aperture where only a single blood droplet is released at a time, with enough energy to create a pattern. This does not seem likely. Second, bodies are dynamic. Aside from the victim physically moving, skin is elastic and bones break.

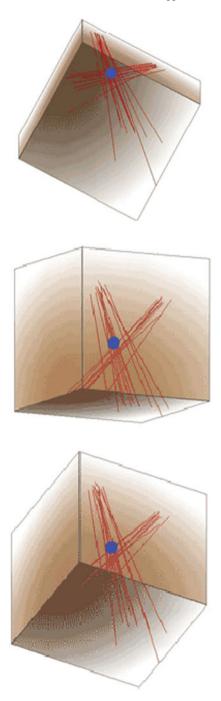


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<sup>&</sup>lt;sup>195</sup> In the public domain; http://en.wikipedia.org/wiki/File:BPA\_Origin.gif (animation). Image made by Kevin Maloney in 2005.

<sup>&</sup>lt;sup>196</sup> In the public domain; http://en.wikipedia.org/wiki/File:BPA\_POC.png Image made by Kevin Maloney.

Fig. 8.8.3.3 Area of convergence<sup>197</sup>



<sup>&</sup>lt;sup>197</sup> In the public domain; http://en.wikipedia.org/wiki/File:BPA\_AOC.png Image made by Kevin Maloney.

Once a force is applied to the body there will be an equal and opposite reaction to the force applied by the aggressor (Newton's third law of motion). Part of the force will move the blood source, even a millimetre, and change the origin while it is still producing blood. So the source becomes contained in a three-dimensional volume, or region. As with the area of convergence, the area of origin is easily calculated by using BPA software. There are other longer, mathematical methods of determining the area or origin, one of which is the tangential method.

Other important concepts are the *point of convergence* and the *area of conve1rgence*. "The point of convergence is the intersection of two bloodstain paths, where the stains come from opposite sides of the impact pattern" (from the Wikipedia entry). See Fig. 8.8.3.2. "The area of convergence is the box formed by the intersection of several stains from opposite sides of the impact pattern" (ibid.). See Fig. 8.8.3.3. "To determine the point/area of convergence an analyst has to determine the path the blood droplets travelled. The tangential flight path of individual droplets can be determined by using the angle of impact and the offset angle of the resulting bloodstain. 'Stringing' stains is a method of visualising this. For the purpose of the point of convergence, only the top view of the flight paths is required. Note that this is a two-dimensional (2D) and not a three-dimensional (3D) intersection" (ibid.). "In the past, some analysts have drawn lines along the major axes of the stains and brought them to an area of convergence on the wall. Instead of using a top-down view, they used a front view. This provides a false point/area of convergence" (ibid.).

## 8.8.4 More Concerning Software

On Scene Forensics provides for *Crime Scene Command*<sup>198</sup> this description of the program at a glance:

This user friendly program installs in seconds and is easy to use without having to attend special classes. The program does all the trigonometric calculations necessary to determine the angle of impact and point of origin for blood spatter, the angle of impact and trajectory for bullet holes, and to estimate the time of death at a homicide scene. There is a crime scene log to enter the name, identification, agency, and purpose for everyone who enters the crime scene. There are separate pages for witnesses, victims, the scene environment, as well as death information for the pathologist. The program will estimate the time of death within four hours for the 18 hours after death.

Photographs of the crime scene, the individual bloodstains, and bullet holes, and items of evidence can be stored with each stain or pattern. The entire program and all the reports it generates can be printed with a single click of a mouse.

The software makes a permanent record of the crime scene that can be stored to hard drive printed as a Word document, faxed, or emailed. The printed reports can be used as bench notes and used on the stand to refresh memory and they satisfy the requirement for a scientific record of crime scene reconstruction.

<sup>&</sup>lt;sup>198</sup> See Sections 8.8.2 and 8.8.5.

The Crime Scene Command program also includes screens for recording witness statements and making notes at the scene.

Crime Scene Command is meant to be used at the crime scene and is best installed on a laptop computer so that it can be taken to the scene. It is designed to be user friendly to patrol officers and not just to specially trained technicians. The program can be used at any crime scene, not only homicide scenes.

We have referred (in Section 8.8.2) to software products of On Scene Forensics. Another software product for bloodstain pattern analysis is HemoSpat, from a Canadian firm, FORident Software Inc.<sup>199</sup> Its owener and lead developer is Andy Maloney. He developed the software, whereas his brother Kevin Maloney is the firm's expert in bloodstain pattern analysis (but neither a co-owner, nor an employee; he is affiliated with the Forensic Identification Section of the Ottawa Police Service). At its website for HemoSpat, the firm claims that it is more efficient than the competing *BackTrack* software, because the latter "forces the analyst to follow specific steps which kaes it difficult and time consuming to correct mistakes or allow others to review your work. BackTrack does not allow you to use angled surfaces and has problems with current digital image sizes". By contrast, "HemoSpat maintans the analytical data from each project making peer review and verification possible." Like Crime Scene Command, that tool, too, is claimed to be easy to use. Version 1.3 of *HemoSpat* was released in September 2009, and version 1.4.1. was released in January 2011. The firm's website also states: "The March/April 2011 issue of the Journal of Forensic Identification contains an article titled 'One-Sided Impact Spatter and Area-of-Origin Calculations'. This is the result of a combined effort of FORident Software, L'Institut de Recherche Criminelle de la Gendarmerie Nationale in Paris, France, and the Forensic Identification Section of the Ottawa Police Service in Ottawa, Canada." To say it with the abstract of Maloney, Nicloux, Maloney, and Heron (2011):

It is common practice when calculating area of origin from impact spatter to use stains from both "sides" of the pattern – stains to the left and to the right of the blood source. Impact spatter at crime scenes, however, often provides the analyst with bloodstain patterns that are not as pristine as those created in a controlled environment. One situation that may arise is impact spatter consisting of stains from only one side of the pattern because of the removal of an object after the impact, such as a door or a person, or because the stains from one side are not on a planar surface. This study looks at a method of calculating the area of origin using stains from only one side of the pattern and shows that these partial patterns may still provide usable calculations to determine the area of origin.

Maloney et al. (2011, p. 132) explain how the practical need arises:

Bloodstain analysts must work with the data they are presented with at the crime scene, regardless of quantity or quality. Sometimes this means eliminating partial impact patterns because too few stains may be found for a regular analysis. This study demonstrates that at least some incomplete impact patterns – "one-sided" patterns – need not be eliminated from the analysis of the scene because they can still provide an acceptable calculation of the area of origin.

<sup>&</sup>lt;sup>199</sup> See http://hemospat.com/index.php FORident Software Canada, Inc., 132-207 Bank St., Ottawa, Ontario, Canada K2P 2N2. Their email address is inf@hemospat.com

Some articles published by the Maloney brothers in the *Journal of Forensic Identification* can be downloaded from Andy Maloney firm's website. Maloney et al. (2011) is one of these. Another paper is 'The Use of Hemospat to Include Bloodstains Located on Nonorthogonal Surfaces in Area-of-Origin Calculations' (Maloney et al., 2009), abstracted as follows:

Determining the origin of impact patterns at crime scenes can be a challenge when there is limited or less-than-ideal information. This is made even more difficult if the analyst cannot incorporate data from nonorthogonal and orthogonal surfaces in the same analysis. Using HemoSpat software for impact pattern analysis allows analysts to remove several limitations, maximize the use of this information, and produce precise and reliable results.

By contrast (Maloney et al., 2009, p. 514):

Historically, bloodstain pattern analysts using forensic software for area-of-origin calculations had to exclude nonorthogonal (angled) surfaces from their calculations. Analysts could not incorporate orthogonal and nonorthogonal surfaces at the same time in their analyses [(Eckert & James, 1993, pp. 152–154; Carter, 2001b)].

Maloney et al. pointed out (2009, p. 523):

The task of analyzing bloodstains on nonorthogonal surfaces is made easier by using the HemoSpat software. This allows the analyst to remove objects from the scene, analyse them in a controlled and safe environment, and incorporate the data in an area-of-origin calculation.

From the same website, one can also download a white paper (FORident Software, 2009) about the validation of HemoSpat. The goal was "to validate the accuracy of the HemoSpat bloodstain analysis software against an accepted standard and to examine the reproducibility of the results." This was done in collaboration with the Royal Canadian Mounted Police (RCMP). A comparison was made with the *BackTrack* computer program for bloodstain pattern analysis. Kevin Maloney had earlier participated in the validation of BackTrack (Carter et al., 2005). Maloney, Carter, Jory, and Yamashita (2005) is concerned with the representation in three dimensions of bloodstain pattern analysis. Both BackTrack and HemoSpat use the *tangent method* outlined by Carter (2001a). Carter (2001b) is an electronic book on the computer-assisted directional analysis of bloodstain patterns, and is provided with the BackTrack Suite. "The users have more direct control over the ellipse in HemoSpat using the mouse, whereas BackTrack requires the user to enter numbers to adjust the ellipse" (FORident Software, 2009, p. 3).

## 8.8.5 Effects of Velocity on Blood Drops and Blood Spatter

#### Louis L. Akin

#### 8.8.5.1 Introduction

The software Crime Scene Command (CSC)<sup>200</sup> by On Scene Forensics was created in response to complaints by law enforcement officials that blood pattern software

<sup>&</sup>lt;sup>200</sup> See Sections 8.8.2, 8.8.4, and 8.8.5.

programs were difficult to learn and required classroom instruction. CSC is intended to be user friendly enough for a person with only a basic knowledge of blood patterns to use. It automatically calculates the angle of impact and area of origin and averages the area of origin for several impact stains. The program has additional features such as a scene personnel log, evidence collection log, and separate tabs for information on victims, suspects and witnesses including statements. It also calculates bullet trajectories. Its only drawback is that it does not produce a 3-dimensional diagram like the others do, but that complexity is what requires classroom instruction or a nerd to operate the programs and was left out to produce a fast, reliable, easy to learn and user friendly program.

Through a variety of schools, classes, and seminars, homicide detectives and crime scene technicians or criminalists are garnering a level of expertise that has not previously existed in law enforcement. New technologies, sciences, and applied sciences are available for detectives and criminalists to use in solving crimes and apprehending offenders. Blood pattern analysis may require special schooling and expertise. However, blood pattern evidence collection is an example of an applied science that a homicide detective or first responding police officer can learn to use at a scene without having to become an expert in the field.

Blood spatter interpretation or analysis itself may be compared to tracking. It may take considerable training to reach the level of a tracker who can say that a footprint was made two days before by a pigeon-towed 180 male who has bunions. It does not require that level of training or expertise to be able to look at a footprint and determine which way the person was going. Just pick out the heel and toe.

Likewise, although an expert may be able to see things in the blood pattern that the first responding officer at a crime scene doesn't, a responder can preserve the evidence and take the measurements of the stains in a pattern just as he does at an accident scene. He or she could even learn to determine generally where a victim was positioned by looking at the blood spatter the same way he could tell which way a footprint is going.

A basic understanding of blood spatter analysis will also allow the first responding officer to assist in correctly collecting and preserving blood stain data at the scene. Fortunately, the principles and procedures to learn are not complicated, and while it is easier to use software to make the calculations, the basic principles can be learned from a source as brief as this article and applied by using a hand held calculator. Some critical determinations, such as establishing the point of convergence that shows where the victim was standing can be done without use of a calculator at all.

This basic understanding is important, because the interpretation of blood spatter patterns and other evidence at crime scenes may reveal critically important information such as:

- The positions of the victim, assailant, and objects at the scene during the attack.
- The type of weapon that was used to cause the spatter.
- The number of blows, shots, stabs, etc. that occurred.

- The movement and direction of victim and assailant, after bloodshed began.
- It may support or contradict statements given by witnesses (James & Eckert, 1999, pp. 10–11).

The investigator may use blood spatter interpretation to determine:

- What events occurred.
- When and in what sequence they occurred.
- Who was, or was not, there.
- What did not occur.

The lists of precisely what information can be learned by the interpretation of blood stain patterns are similar for Bevel and Gardner (2002), James and Eckert (1999), Hueske (1999), Akin (2004), and Sutton (1998).

#### 8.8.5.2 Photography, and Traditional Determination of Velocities of Blood Spatter

Without a doubt, the most important thing to at a crime scene in regard to blood spatter analysis is to photograph the scene and the blood spatter. The photographs should all be made at a 90 degree angle from the surface on which the blood stains are found and a scale should always be in the photograph so the viewer can tell the size of the drops in the pictures.

The velocity of the blood spatter when it strikes a surface is a reasonably reliable indicator of the speed of the force that set the blood in motion in the first place. The velocity is that of the force causing the blood to move rather than of the speed of the blood itself and it is measured in feet per second (fps); high velocity blood, for instance, *may* be caused by a bullet moving at 900 fps, medium velocity blood spatter may be caused by a spurting artery or by a blunt instrument striking the already bloody head or limb of a victim.

Low velocity stains are produced by normal gravity and the stains are generally 3 mm or larger. It is usually the result of blood dripping from a person who is still, walking, or running, or from a bloody weapon. Dripping blood falls at a  $90^{\circ}$  angle and forms a  $360^{\circ}$  circumference stain when it hits a flat surface, depending, of course, on the texture of the surface. See Fig. 8.8.5.2.1 for an example of low velocity spatter.

Medium blood spatter is produced by an external force of greater than 5 fps and less than 25 fps. The stains generally measure 1-3 mm in size. Blood stains this size are often caused by blunt or sharp force trauma, that is, knives, hatchets, clubs, fists, and arterial spurts. They might also result from blood being cast off a weapon or other bloody object.

Most medium velocity blood found at crime scenes will be created by blood flying from a body as a result of blunt or sharp force or the body colliding with blunt or sharp surfaces. It may be the result of a punch, a stab, or a series of blows. A void space may be created by anything that blocks the blood from falling on the

Fig. 8.8.5.2.1 An example of low velocity blood spatter



surface where it would have normally landed. The object creating the void may be either the victim or the attacker's body or a piece of furniture that was moved. See Fig. 8.8.5.2.2 for an example of medium velocity spatter.

High velocity blood spatter is produced by an external force greater than 100 fps and the stains tend to be less than 1 mm. The pattern is sometimes referred to as a mist. High velocity patterns are usually created by gunshots or explosives, but may also be caused by industrial machinery or even expired air, coughing, or sneezing. In any case, the spatter tends to be tiny drops propelled into the air by an explosive force. High velocity droplets travel the least far because of the resistance of the air against their small mass. See Fig. 8.8.5.2.3 as an example of high velocity spatter.



Fig. 8.8.5.2.2 An example of medium velocity blood spatter

Fig. 8.8.5.2.3 An example of high velocity blood spatter



#### 8.8.5.3 Blood Spatter Flight Characteristics

Experiments with blood have shown that a drop of blood tends to form into a sphere rather than a teardrop shape when in flight. The formation of the sphere is a result of surface tension that binds the molecules together.

Fresh blood is slightly more viscous than water, and like water it tends to hold the spherical shape in flight rather than a tear drop shape as seen in cartoons.

This spherical shape of a liquid in flight is important for the calculation of the angle of impact (incidence) of blood spatter when it hits a surface. That angle will

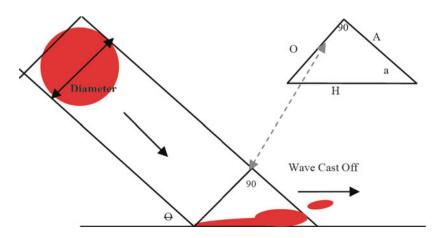


Fig. 8.8.5.3.1 Side view of blood drop in air, and then striking a flat surface

be used to determine the point from which the blood originated which is called the Point of Origin or as this author prefers, the Point of Origin (PO).

Generally, a single spatter of blood is not enough to determine the Point of Origin at a crime scene. The determination of the Angle of Impact and placement of the PO should be based on the consideration of a number of spatters and preferably spatters that will provide an arc of reference points in order to create a triangulation effect.

The process for determining the Angle of Impact is not complicated. When a drop of blood strikes a flat surface the diameter of the drop in flight will be equivalent to the width of the spatter on the surface as seen in Fig. 8.8.5.3.1. The length of the spatter will be longer, depending on the angle at which the drop hit. The following diagram will help the reader to understand this concept.

#### 8.8.5.4 Point of Convergence (POC)

For purposes of instruction, we will consider a case in which a fan shape blood pattern is found on a floor as the result of a gun shot wound to the head. When blood disperses in various directions from a wound the blood drops will tend to fan out. As the drops strike the floor, they will elongate into oval shapes. An imaginary line drawn through the middle of the oval shape lengthwise will run back to the area where the blood came from.

If lines are drawn through several of the blood spatters as in Fig. 8.8.5.4.1 the lines will cross at the point where the person was standing. That point is called the Point of Convergence and will be flat on the floor (if that is where the spatter is located). Somewhere above that point is where the blood originated. If the victim was shot in the head, it may be 4–6 feet (roughly the height of an average person) above that point. Where the blood left the person's body is called the Point of Origin

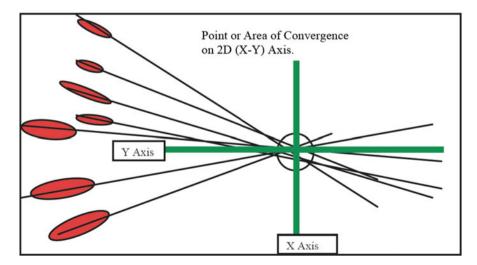


Fig. 8.8.5.4.1 Lines through the central axes of the spatter cross at the Point of Convergence

as previously mentioned. To find the Point of Origin (PO), first determine the twodimensional Point of Convergence (POC) on the floor as seen in Fig. 8.8.5.4.1.

#### 8.8.5.5 Determining the Angle of Impact (AOI), and the Point of Origin

The next step in the process is to determine the Angle of Impact (AOI) for representative bloodstains. Specialized blood spatter calculator software that performs all the calculations automatically is available from online vendors, but for those who do not mind doing the trigonometry all the calculations can be done on an ordinary hand held scientific calculator or even by the use of printed copies of arc sine tables.

The Angle of Impact is the angle at which the blood drop hit the floor. It can be determined by taking the inverse arc sin of the width divided by the length ratio of an individual blood spatter.

If using software just enter the width and length into the table on the screen and the calculation will be done automatically. If using a hand held calculator, divide the length of the drop into its width, then take the arc sinee which is the second function on a hand held calculator (or just look on a trigonometric functions table) to get the degrees of the AOI.

For example, if a drop measures 0.5 mm wide and 1.0 mm long, dividing 1.0 into 0.5 would give a ratio of 0.5. The arc sin of 0.5 is 30 degrees. Find that by using the cosecant function on the calculator, or by looking at an arc sinee table. This calculation determines that the blood drop hit the ground at 30 degrees and it is already known that it came from the Point of Convergence.

Measure the distance from the individual drop to the Point of Convergence and multiply that number by the *tangent* (TAN) of the Angle of Impact. This calculation (by the Theorem of Pythagoras) will tell how high up the spatter originated from. The following paragraph explains this more thoroughly.

The *Point of Origin* (PO) is located above the Point of Convergence (POC) on the perpendicular axis. In this case that would be 90 degrees perpendicular to the floor. It is the point from where the blood was disgorged from the body. To determine where that point is located first measure the distance from each blood stain along its central axis to the POC. Then take the TAN of the degrees AOI. Third, multiply the TAN of the AOI by the distance. Measure that distance from the floor up the perpendicular axis and you will arrive at the Point of Origin.

In conclusion, *blood pattern analysis experts* can develop vast amounts of information from the patterns of blood at a crime scene. First responding officers and homicide detectives will be more aware of the value of blood spatter evidence if they understand the fundamentals of pattern analysis. Additionally, *first responding officers* and *detectives* can glean a great deal of information themselves at the scene without becoming experts and they can assist the experts later with the data that they gathered at the scene. If the blood spatter evidence is properly photographed and if accurate measurements are taken of the length and width of the individual spatters and the distance from each spatter to the Point of Convergence, the analyst can later make the necessary calculations based on that data and draw conclusions from them. If the measurements and photographs are not taken, critical information may be lost forever.

## Chapter 9 Virtopsy: The Virtual Autopsy\*

## 9.1 Introduction

#### 9.1.1 Preliminary Considerations

In forensic medicine, autopsy remains the gold standard for determining the cause and manner of death. An autopsy consists of two parts. First, an external examination is performed, in which all external findings are documented with photographs and in a written report. Second, the body is opened for the internal examination. All organs are removed, inspected, measured, and sampled for histology, in order to identify pathologies that lie within the organs. All internal findings are added to the written report.

This approach has some disadvantages. Due to its invasiveness, important evidence can be destroyed. In cases of advanced decomposition, liquefied organs lose their structural integrity if their surrounding body cavity is opened. Additionally, some cultural and religious belief systems prohibit the autopsy procedure.

The quality of the final report highly depends on the skills of the investigator to find and appropriately describe the findings. Findings that are overlooked, or conclusions that are poorly formulated, translate into a loss of evidence, that cannot be corrected once the body is buried.

The Virtopsy project began in 2000, at the Institute of Forensic Medicine of the University of Bern, in Switzerland. Its aim is to apply high tech methods from the fields of measurement engineering, automation and medical imaging to create a complete, minimally invasive, reproducible and objective forensic assessment method. The data generated can be digitally stored or quickly sent to experts without a loss of quality. If new questions arise, the data can be revised even decades after the incident.

In the rest of this chapter, the techniques used in the Virtopsy procedure are described, including: post-mortem computed tomography (PMCT) and post-mortem computed tomography angiography (PMCTA), post-mortem magnetic

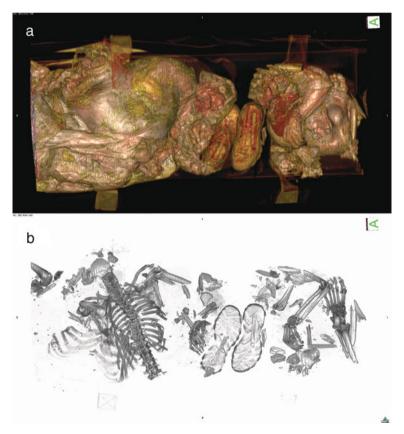
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<sup>\*</sup>This chapter is contributed by Lars C. Ebert, Thomas Ruder, David Zimmermann, Stefan Zuber, Ursula Buck, Antoine Roggo, Michael Thali, and Gary Hatch.

resonance imaging (PMMR) and minimally invasive tissue and liquid sampling as means for documenting internal findings. These results can be combined with and surface scanning and photogrammetry which document the external findings. Following the introduction of the techniques, we explain the different ways of presenting the data, depending on the audience. Finally, the impact and acceptance of Virtopsy within the Swiss justice system is discussed.

## 9.1.2 Indications for Virtopsy

The Virtopsy approach is applied to a majority of the cases that undergo forensic evaluation at our institute. The additional information acquired through postmortem imaging prior to autopsy is often used to plan the autopsy, confirm autopsy findings and allow for a second-look if further questions arise in during the forensic investigation.



**Fig. 9.1.2.1** Volume reconstructions of a CT scan of a train suicide victim (Osirix, Osirix foundation, Switzerland). (a) Surface reconstruction. (b) Bone reconstruction for quick assessment of the completeness of the body



**Fig. 9.1.2.2** Volume rendering of a gunshot victim (Leonardo, Siemens, Germany). Highly x-ray dense materials such as the shotgun pellets and artificial hip joint are automatically color coded to aid with better perception

In all cases of uncertain or unknown identity, the whole corpse of the decedent is scanned for radiologic identification through comparison of ante-mortem data with post-mortem CT. In the case of train-pedestrian incidents, CT data is useful to identify missing organs or skeletal parts (Fig. 9.1.2.1). Additionally, CT is able to detect and, depending on the density of the object, identify foreign bodies such as medical implants (useful for identification) or projectiles and bullet fragments (relevant to the forensic investigation) (Fig. 9.1.2.2). All homicides, deaths under the age of 18 years of age, and complicated cases are also evaluated with the Virtopsy method.

# **9.2** Technical Aspects of Virtopsy: Imaging Modalities and Techniques

#### 9.2.1 The Virtobot System

Some tasks in forensic imaging are either repetitive or require a high accuracy. Automation could help to increase the quality of examinations and reduce costs. At the Institute of Forensic Medicine in Bern, we developed a robotic system to satisfy these needs. The so-called *Virtobot* (Ebert et al., 2010) is a 6-axes industrial robot, that is mounted onto an external axis along with the computed tomography couch (CT couch), so it can access the entire scannable volume (Fig. 9.2.1.1). It has a changeable end-effector and can therefore mount different tools. We incorporated a surgical navigation system to allow for a closed loop robot control. Currently modules for automated surface scanning and minimally invasive biopsy exist.



Fig. 9.2.1.1 *Right to left*: The Virtobot system with mounted surface scanner, optical tracking system for biopsy, CT scanner and heart-lung machine for post-mortem CT angiography

#### 9.2.2 Photogrammetry and Surface Scanning

The exact three-dimensional recording of the body surface with all injuries as well as the documentation of suspected injurious objects (Thali, Braun, & Dirnhofer, 2003) – including for example vehicles – is carried out with the GOM TRITOP/ATOS III System (Gesellschaft für Optische Messtechnik mbH, Germany). This system delivers a high resolution, three-dimensional scan of the object. It can be employed for true-color 3D digitizing of smallest injuries as well as larger objects such as cars or trucks.

GOM TRITOP is an industrial optical measuring system, based on the principle of digital image-photogrammetry (Luhmann, Robson, Kyle, & Harley, 2006).<sup>1</sup> It is used for full-automatic, highly accurate measurements of 3D coordinates of discrete object points.

The flexible GOM ATOS III optical measuring machine is based on the triangulation principle. Two cameras observe striped patterns projected onto the object.

<sup>&</sup>lt;sup>1</sup> Luhmann et al. (2006) is a standard reference on close range photogrammetry, "which uses accurate imaging techniques to analyse the three-dimensional shape of a wide range of manufactured and natural objects. Close range photogrammetry, for the most part entirely digital, has become an accepted, powerful and readily available technique for engineers and scientists who wish to utilise images to make accurate 3-D measurements of complex objects" (ibid., from the blurb). The mathematics of close range photogrammetry handles orientation, digital image processing, and the reconstruction of a model in three dimensions. Imaging technology includes both hardware and software. Important topics include targeting and illumination.

Up to four million highly precise 3D coordinates are then calculated from each single measurement. The measurements from different views are transformed into one coordinate system using reference targets to capture the whole objects surface. Next, a high resolution polygon mesh of the object surfaces is generated.

In forensic applications the color information of the measured object is very important for further analyses. The corresponding color value from the photogrammetric recordings is assigned in the TRITOP software to each point of the 3D surface model created in ATOS, resulting in a colored 3D model of the object.

For optimizing work flow, the surface scanner can be mounted to the Virtobot system and from there, it digitalizes the body surfaces of the deceased automatically. This system significantly decreases scanning times and only one operator is required. By using automation, a constant quality of the scans can be maintained, since the process is operator independent. A module for automated photogrammetry is currently in development.

#### 9.2.3 Post-mortem Computer Tomography (PMCT)

#### 9.2.3.1 CT Scanners

A CT scanner makes measurements of the x-ray attenuation through a predefined plane of a cross section of the body. The resulting dataset is a 3D volume consisting of volume pixels (voxels). In helical CT imaging, an x-ray tube rotates around the body, while the body is continuously moved through the gantry (Kalender, Seissler Klotz, & Vock, 1990). Since the resulting data are a set of 2D projections, the x-ray density of each voxel is then calculated by using filtered backprojection. The resulting voxels contain the information about the attenuation of x-ray that is displayed as density, measured in Hounsfield units (HU). 0 HU have been defined to be equivalent to the density of water, -1000 HU (i.e., one thousand below zero) to the density of air. The density of all other organic and inorganic materials vary individually and are used to distinguish between different tissues. On regular CT scanners HU range from -1000 to +3070, but the upper limit may be extended to be +30710HU. Multislice scanners have a row of several detectors to decrease scanning times and therefore motion artifacts. Dual Source CTs make use of two perpendicular x-ray sources with different energy levels and allow for better differentiation of dense materials.

Typical resolution achieved with standard CT scanners is about 0.5-1.5 line pairs/mm. This means that objects of about 0.5 mm can be discerned. Standard post-mortem full body CT scans with a slice thickness of 1.25 mm and an increment of 0.7 mm consist of around 1500 single images (512\*512 pixel in plane resolution).

The fact that CT imaging is based on x-ray attenuation allows for excellent assessment of osseous lesions such as fractures, collections of gas such as vascular gas embolism or detection of foreign bodies. The comparison of individual HU values of different foreign bodies may assist to identify if a given foreign body is metallic or non-metallic. Three dimensional image reconstruction software applications such as multi planar reformation (MPR) can display gunshot wound trajectories. The assessment of organ injuries with CT falls short of the sensitivity and specifity of MR imaging or autopsy, however, large organ lacerations can be detected. The volume of a fluid or gas collection can be measured (Jackowski et al., 2004) and the weight of organs can be estimated (Jackowski et al., 2006) based on voxel size.

#### 9.2.3.2 Identification by Means of CT Scanning

CT scanning is a common examination performed in clinical radiology, which provides an ample pool of ante-mortem studies for use in cases of unknown identification. With the increased use of medical imaging techniques in clinical medicine, an increasing number of ante-mortem datasets is available. Prominent landmarks in these scans, such as the paranasal sinuses, but also medical implants such as dental implants, bone screws and plates, pacemakers and others can be used for comparison with post-mortem CT datasets for identification. By using maximum intensity projections, post-mortem CT datasets. These techniques are reliable, even if the body has damages due to trauma or putrefaction. The advantages of these techniques are their quickness, reliability and low costs compared to other means of identification such as DNA analysis.

## 9.2.4 Magnetic Resonance Imaging (MRI)

Magnetic resonance imaging (MRI) is a medical imaging technique. In contrast to CT, MRI is not based on x-rays but uses a strong magnetic field. The strength of the magnetic field is measured in Tesla [T], and current MR units work with 1.5 T or 3 T magnets, creating a magnetic field that is roughly 50,000–100,000 times more powerful than the magnetic field of the earth.

In medical imaging MRI is based on the magnetization of hydrogen atoms in the body. Hydrogen atoms consist of a single proton and a single electron. When placed in a strong magnetic field, the protons of the hydrogen atom align themselves, similar to compass needles, along the axis of the magnetic field ( $B_0$ ). In order to create an MR image, a short radio frequency (RF) pulse is emitted, altering the alignment of the protons by flipping the axis of the protons out of the magnetic field ( $B_0$ ).

The time a given proton needs to realign along the axis of the magnetic field after the emission of a RF pulse is called spin-lattice relaxation time (T1). The RF pulse not only flips all protons out of the axis of the magnetic field, is also synchronizes the phase of each individual proton spin. The desynchronization of the spins after the emission of the RF pulse is called spin-spin relaxation time (T2). Tissue differentiation on MR images is based on the individual relaxation times T1 and T2 of different tissues.

MRI provides greater contrast for soft tissues than CT and is therefore useful for neurological, cardiovascular, and musculoskeletal imaging. In the post-mortem

setting, MRI is a powerful adjunct to CT, its ability to visualize soft tissue organs complements the ability of CT to visualize osseous lesions.

However, there are a few important differences between ante-mortem and postmortem MRI. The absence of motion artifacts in the post-mortem setting allows for better depiction of anatomical details. The assessment of the cardiovascular system in living patients, involves not only the morphology but also the function of the heart – an aspect that obviously cannot be evaluated in post-mortem MRI. After the cessation of cardiac motion, gravity causes fluids to pool in the dependent parts of the body and the corpuscular elements of fluids, such as blood cells will sediment within the vascular bed. The relaxation times T1 and T2 are both temperature dependent and image contrast may change with decreasing body temperature of a decedent (Fig. 9.2.4.1).

Also note the following shortcomings or limitation:

- With respect to CT, MRI is more time consuming and the time needed for postmortem MRI may vary significantly, ranging from less than 1 h for focused regional imaging to several hours for whole body MRI.
- MRI scanning is limited to cases that do not involve metallic fragments or MRI incompatible implants. A prior CT scan can help to search for these types of foreign bodies.

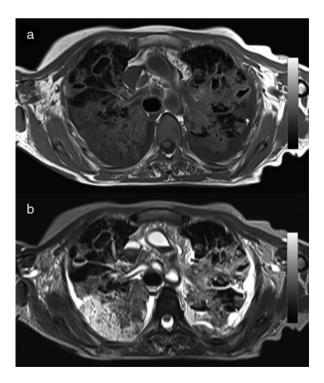


Fig. 9.2.4.1 Two different MRI scans showing a case of tuberculosis. (a) T1 weighted scan with bright fat and dark water content. (b) T2 weighted image with bright water content

## 9.2.5 Post-mortem CT Angiography

The assessment of the vascular bed and lesions of the vascular bed in non-contrast CT studies is very limited. In living patients the visualization of the vessels is achieved by intravascular injection of a contrast medium. The blood circulation distributes the contrast medium to the peripheral vessels and the internal organs, before it is excreted through the kidneys.

For the post-mortem setting, a non-dynamic CT angiography has been developed using the roller pump of a modified heart-lung machine to distribute the contrast medium in the vascular system. Vascular access is gained through a cut-down at the level of the femoral vessels.

- For visualization of the arterial system, a tube is inserted into the femoral artery and contrast medium is injected at a constant pressure. A second tube is inserted in the femoral vein, to drain and collect the overflowing blood from the venous system. Imaging is performed immediately after the instillation of the contrast medium.
- For visualization of the venous system, the injection and drainage tube are simply switched and the procedure and imaging are repeated.



Fig. 9.2.5.1 Volume reconstruction of a CT angiography (Osirix). The surrounding tissue has been virtually removed to expose the arterial system. This image shows a case of aortic dissection In contrast to ante-mortem angiography, an important portion of the fluid components of blood have leaked out of the vessels and sedimented into the dependent portions of the body. This fluid has to be replaced for the post-mortem angiography and the contrast medium is therefore diluted with a high molecular hydrophilic or lipophilic solution:

- polyethylene glycol (PEG), discussed by Ross et al. (2008),
- or diesel oil, discussed by Grabherr et al. (2006).

Using a high molecular solution rather than a small molecular solution as a volume expander for the contrast medium, prevents leakage out of the vessel wall and subsequent edema.

Post-mortem CT angiography allows for excellent visualization of the entire vascular system of a decedent (Fig. 9.2.5.1). Vascular injuries and extravasation of contrast medium can thereby be diagnosed based solely on imaging. Intraabdominal or thoracic hemorrhages can be traced back to the lacerated vessel/s. Small vascular lesions that can be difficult to visualize during autopsy, may be identified after CT-angiography.

#### 9.2.6 Tissue/Liquid Sampling

In order to define pathologies on a cellular level, a histological examination on tissue samples can be performed. For this technique, the tissue sample is sliced, stained and evaluated under a microscope. During autopsy, a tissue sample is retrieved by cutting a piece from each organ. Apart from the invasiveness of this approach, the quality of the samples is relatively poor, since it can be contaminated with other tissues or body fluids. Several techniques for minimally invasive tissue and liquid sampling have been developed or adapted from clinical medicine by the Virtopsy group.

The standard procedure for minimally invasive sampling involves placing an *introducer needle* to the exact location the tissue sample should retrieved from. A biopsy gun retrieves the tissue sample though the introducer needle. Three methods to place the introducer needle have been used at our institution: CT guided, navigated and robotic needle placement.<sup>2</sup>

• In CT guided needle placement, the needle is placed by a radiologist under realtime fluouroscopic guidance inside the x-ray beam. Since CT only displays one slice of the body, accurate needle placement is limited by the possible gantry

 $<sup>^{2}</sup>$  CT guided need placement is discussed in Aghayev et al. (2007). Navigated needle placement is discussed in Aghayev et al. (2008). Robotic needle placement is discussed in and Ebert et al. (2010).

tilt. Additionally, it comes with radiation exposure for the radiologist. These problems lead to the implementation of a technique based on surgical navigation.

- In surgical navigation, arrays of infrared markers are attached to every tool and anatomic structure that should be navigated. A tracking system then accurately determines the three-dimensional position of each marker. Based on this information and a CT dataset, a computer system tells the user where the needle is in 3D space, relative to a defined target, and guides the user to the target. This method works without radiation exposure to the radiologist, but requires training and skill on the part of the operator.
- In order to completely eliminate the human factor, a biopsy module was developed for the Virtobot system. It can automatically and precisely place introducer needles based on trajectories planned with CT data.

#### 9.2.7 Virtopsy Workflow

The workflow of a Virtopsy is case specific. Depending on the individual case history, the Virtopsy team decides what image modalities are required to answer the forensic questions concerning the cause of death (Fig. 9.2.7.1). In forensic cases where the body displays patterned injuries or if reconstructive questions are opened, a colored 3D documentation of the body surface is recorded.

Using the Virtobot system, the entire body is documented with photogrammetry and surface scanning. Two scalebars and An array of optical and radiopaque markers are applied to the body. For the following photogrammetry, a series of photographs are taken from different positions. The TRITOP software automatically processes the photos and calculated the exact 3D coordinates of the uncoded reference markers as well as the camera positions. This data is exported to the surface scanners ATOS software to subsequently perform the surface scan of the object. Furthermore, the photographs are used for texturing of the surface model. If the Virtobot is used for scanning, the robotic system approaches different predefined positions in space and the attached surface scanner measures the topology automatically. In order to get a complete scan of the body, it has to be turned from supine to prone.

After external documentation, a CT scan is performed. Since the radiopaque markers are visible in the surface scan as well as the CT scan, data from both modalities can be merged into one set of data. In case of suspected vascular injuries or internal hemorrhage, a CT angiography is performed after accessing the femoral arteries and connecting the heart lung machine.

If the body has shown to be free of ferromagnetic foreign bodies such as metal fragments in the CT scans, it is moved to the adjacent MRI suite for an MRI scan. Depending on the suspected pathology, the proper sequences are selected. After finishing the imaging procedures, the body is ready for the standard legal examination. Based on the data gathered during medical imaging, the autopsy approach can be planned.

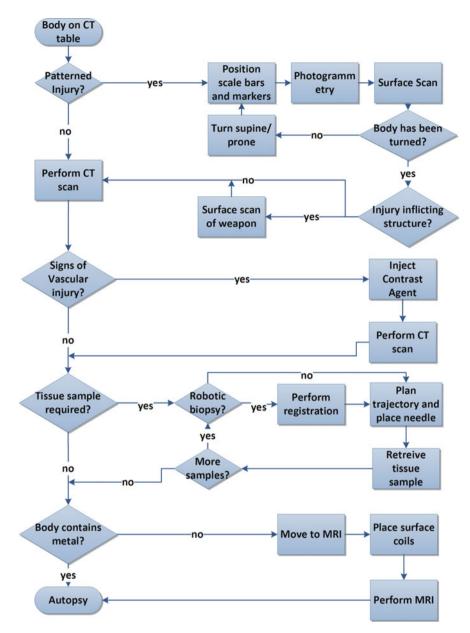


Fig. 9.2.7.1 Workflow of a standard Virtopsy

## **9.3 Visualisation: The Main Concepts for Storage, Processing** and Visualization of Medical Image Data

#### 9.3.1 Data Storage

Modern radiological scanners generate vast amounts of data. To ensure intraoperability between different manufacturers, the DICOM<sup>3</sup> (Digital Imaging and Communication in Medicine) standard was introduced in the early 1990s. The standard not only defines how data is stored, but also the necessary communication protocols. CT and MRI datasets consist of a three-dimensional array of volume pixels (voxels). In CT imaging, each voxel has a size and a Hounsfield value, e.g. an x-ray density. In MRI imaging, the value of a voxel is unitless but otherwise stored in the same format. Surface scanning usually generates three-dimensional polygon meshes. Different standard formats exist for storing polygon meshed, the one most commonly used especially in conjunction with rapid prototyping techniques is STL.

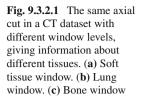
Medical imaging data is stored and analyzed by radiologists using a *Picture Archiving and Communication System (PACS)*. PACSs communicate with medical imaging hardware using the DICOM standard and provide backup services for data integrity. Additionally, dedicated workstations offer different tools for visualization. The configuration as well as the available functions depend on how it is being used and how it can optimally be integrated into the workflow of an institute.

## 9.3.2 Imaging in Two Dimensions (2D Imaging)

Standard means of looking at medical imaging volume datasets are transversal, cross-sectional cuts. Since current computer screens only can display up to 256 shades of gray, only a selected segment of the 3070 values of the standard Hounsfield scale can be displayed at a time. This is achieved by applying a technique called *windowing*. In windowing, a range of Hounsfield values is defined and transformed to grayscale values. Higher values are depicted as white, lower values as black. By using different windows, different tissues or pathologies can be visualized. They are named to by the tissue that is seen best, i.e. soft tissue, lung, and bone window (Fig. 9.3.2.1).

Modern workstations allow the user to change the plane of the image (the angle of the cutting plane through the volume of data) in realtime. This allows for views that follow local anatomies rather than transversal cuts. If necessary, curved cuts are possible to follow the course of vessels or generate panoramic dental views, so-called *orthopantomograms* (Fig. 9.3.2.2). For diagnostic purposes, PACSs allow the user to measure distances and surface areas on reconstructed planes.

<sup>&</sup>lt;sup>3</sup> http://medical.nema.org/





## 9.3.3 Imaging in Three Dimensions (3D Imaging)

Cross sectional imaging is only able to provide two-dimensional views of data that is actually three-dimensional. All PACSs feature a multi planar reformation (MPR) tool, that allows the user to reformat images in the axial, coronal and sagittal image plane. MPR permits localization in three simultaneous planes as well as the exact adjustment of CT exams, for instance to match follow-up exams with a previous study or for the assessment of complex findings (Fig. 9.3.3.1).

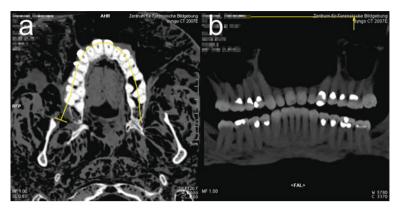
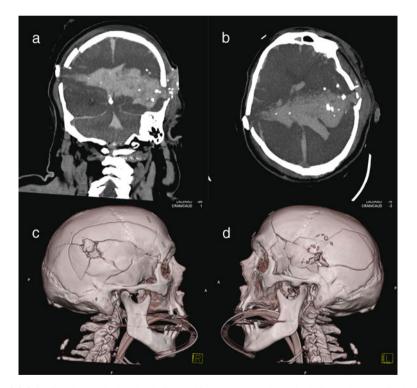


Fig. 9.3.2.2 Dental reconstruction for comparison with ante-mortem images (Leonardo). (a) Curve along which the orthopantomogram is calculated. (b) MIP orthopantomogram along the path in a



**Fig. 9.3.3.1** Gunshot to the head. (**a**) Coronal image (MPR) along the bullet trajectory displaying entry wound (*left*) and exit wound (*right*). (**b**) Axial view of the bullet trajectory. (**c**) Volume reconstruction of the entry wound displaying the bone damage (Leonardo). (**d**) Volume reconstruction of the exit wound (Leonardo)

An other technique to display a dataset as a whole is the so-called volume rendering. Similar to windowing, a transparency and a color is assigned to each voxel, based on its Hounsfield value. The function defining this mapping is called transfer function. Since the x-ray densities of different tissues are known, predefined transfer functions allow the depiction of bone, soft tissue and skin in colour.

Different shaders allow for a better three-dimensional perception of the generated images. Some special shaders are used for specific task. While standard volume rendering techniques take all transpacencies and colors of voxels along a ray into account, Maximum Intensity Projection (MIP) only uses the highest value. This allows for excellent skeletal, angiographic, and metallic detail. A Minimum Intensity Projection on the other hand only uses the lowest Hounsfield value, which best displays gas collections inside the body.

#### 9.3.4 Animation

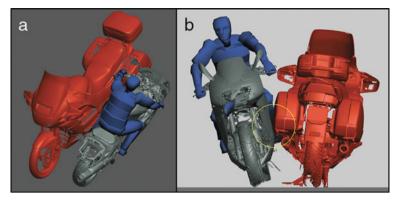
Unlike medical imaging data, surface scanning produces textured 3D polygon meshes. Since polygon models are easier to manipulate than volume datasets, it allows repositioning of the models and the reconstruction of a sequence of events based on injury patterns and other facts.

For this task, dedicated animation software such as 3D studio MAX (from Autodesk, USA) is used. The polygon models (bones, surface etc.) can be imported directly. A virtual bone system for animation (biped) can be created and adapted to the properties of the polygon model that is to be animated. The biped consists of a set of joints that are linked to each other and have the same range of motion as the corresponding real joint. Bipeds are relatively easy to animate compared to polygon models with thousands or even millions of polygons. The polygon model is now linked to the *biped* (*rigging*) and every motion on the biped is copied to the polygon model (Fig. 9.3.4.1).

For animation, the biped can be put into different postures at different point in times, the animation is then calculated by interpolating between these postures. This technique is called *keyframing*. It is important to note that animation should be used carefully and should only show motions or positions that are based on facts.

There is in the scholarly literature some discussion of how jurors (in jurisdictions with a jury) may be affected by viewing computer animations: this may be facilitating, but unless special care is taken, there is some risk of prejudicial effects (Kassin & Dunn, 1997).<sup>4</sup>

<sup>&</sup>lt;sup>4</sup> Schafer and Keppens (2007), who were discussing computer animation in the context of computer-assisted teaching in evidence courses, have remarked: "In this animation, two competing theories that both claim to account for the evidence are modelled side by side. According to the prosecution, the evidence found was produced by a cold-blooded killing, according to the defence, it was caused by events more consistent with the assumption of self defence. As we can see from the models, only the defence hypothesis produces the type of evidence that was found, in particular it accounts for the bullet trajectory found in the victim. The user can directly change the



**Fig. 9.3.4.1** Biped reconstruction of a traffic accident based on surface scans of the motorcycles. The positions during impact have been reconstructed by combining damages on the vehicle with injury patterns documented by photogrammetry, surface scanning and CT

## 9.3.5 Segmentation

Volume estimations in medical image datasets are possible with a technique called segmentation. In segmentation, each voxel in a dataset is assigned to a material. This way, each organ, pathology, gas collection, fluid collection or tissue can be assigned to a material. Since the volume of a single voxel is known, the volume of all voxels belonging to a material can be calculated. By combining this information with a known density of the tissue, even the weight of organs can be estimated.

Depending on the modality and the pathology or tissue to segment, automatic, semi-automatic and manual techniques exist. In manual segmentation all voxels of a specific material have to be selected by hand. Semi-automatic methods such as region growing and line wire algorithms assist the user to quickly select similar

position of the people involved, the computer calculates how this would have affected the evidence that was created. The scientific knowledge that underlies these models is complex. To calculate the relevant trajectories requires knowledge of geometry and kinetics, to reason about the ability of the accused to shoot from a specific position requires biological, biomechanical and medical knowledge. How much can a hand holding a heavy gun rotate? What would the recoil do to the ligaments? Moreover, it is not contested knowledge, and hence of little interest to the lawyer pleading the case. Nonetheless, the manipulation of the relevant parametric and geometric equations is taken care of by the computer. The user only needs to manipulate the physical objects (victim, gun, accused) to test different theories and explanations. To hide expert knowledge in this way does create problems if these models are used as evidence, in particular if they are used in an adversarial, partisan context. There is also the danger that computing constraints add facts that are either not established, or not established in legally permissible ways (Selbak, 1994; Kassin & Dunn, 1997; Menard, 1993). In our example for instance, the jury may be subconsciously swayed by the facial expressions of the animates, even though they have not been introduced through a witness into the court proceedings. These problems in using computer models in courts are however an advantage when using them for teaching. Without the need for time consuming mathematical preparation, students can be directly exposed to critical scientific thinking and substantive forensic subjects."

structures. Fully automatic methods are usually organ specific, sensitive to artifacts and contrast changes inside the dataset and fail to deliver data in decomposed bodies or in cases with significant pathologies or extensive damages.

Some software packages such as animation software require polygon meshes and cannot be use with on volume datasets directly. For visualization involving animation, the selected materials can be converted into a 3D polygon mesh by using the marching cubes algorithm. A combination of volume and polygon based rendering can then be used to demonstrate the relevant pathologies.

## 9.3.6 Image Fusion

Different modalities are used in Virtopsy. Each modality has a specific field of application with respect to different pathologies. In order to get a complete picture and correlate injuries visible in different modalities, it may be necessary to fuse different datasets and combine their information (Thali, Braun, Wirth, Vock, & Dirnhofer, 2003).

Since all datasets have their own independent local coordinate system, a coregistration has to be performed. The standard means of registration is a paired-point registration, where a set of markers is visible in both modalities. The markers are selected in both modalities and the transformation is calculated by minimizing the distance error between the paired point. If the surfaces are similar enough, surface matching can be performed instead.

## 9.3.7 Rapid Prototyping

Another application of segmentation is rapid prototyping. *Rapid prototyping* is actually a broader concept from *software engineering* – and it is often adopted while developing in a principled manner software systems in general – but in the present context it refers to a group of techniques that quickly generate physical models based on *Computer Aided Design (CAD)* data in small quantities.

State of the art methods for rapid prototyping are *stereolithography* and *3D printing*. Both techniques build up the physical model layer by layer. While stereolithography uses a liquid resin, which is selectively hardened by ultraviolet (UV) light, 3D printing spreads layers of powder onto a table and selectively binds them with colored glue. Unlike milling techniques, these techniques allow for the creation of occluded structures (internal cavities). 3D printing additionally delivers fully colored models.

Rapid prototyping cannot work with volume datasets, requiring polygon meshes and therefore will only work in conjunction with data that is prepared using segmentation techniques. Rapid prototyping techniques can be used for educational purposes or to present medical findings in a way, that is easily understood by medical laypersons, which is a common scenario in forensic investigations (Dolz, Cina, & Smith, 2000).

#### 9.3.8 Post-mortem vs. Ante-mortem Imaging

Even though medical imaging techniques used in Virtopsy are the same as methods used in clinical medicine, interpretation of post-mortem image data sets has some differences. Changes common in deceased individuals can be mistaken for pathologies. This includes, but is not limited to: collections of gas due to decomposition, clotted blood and internal lividity. MRI scans change their appearance, if the body temperature is too low. Therefore it is advisable that post-mortem studies be evaluated by radiologists who are experienced in post-mortem imaging.

#### 9.3.9 Medical Image Data for Radiologists and Pathologists

Traditionally, radiologists look at volume datasets using transverse cuts either through the body, or through single organs. The possibility to measure distances and surfaces is of additional diagnostic value. The slice stack is browsed through several times with different window levels, in order to view each tissue with the most appropriate contrast.

If necessary, for instance in cases of train suicides, a volume rendering can help to quickly perform an inventory of all body parts. For special purposes such as dental identification, methods such as MIP or VRT are used. Since the use of postmortem CT angiography alters the liquid levels in vessels, volume measurements performed during autopsy are not reliable after such an intervention. In those cases, segmentation techniques are used instead.

*MIP* stands for *Maximum Intensity Projection*, whereas *VRT* stands for *Volume Rendering Techniques*. An explanation for both follows.

• *Volume rendering* displays the dataset as a whole, thereby providing a better perception of the three-dimensional structure of a CT dataset. So-called transfer functions are applied to the Hounsfield values<sup>5</sup> to derive voxel properties,

$$HU = \frac{\mu_X - \mu_{\text{water}}}{\mu_{\text{water}} - \mu_{\text{air}}} \times 1000$$

<sup>&</sup>lt;sup>5</sup> Hounsfield units are a measure of density. For example Aamodt et al. stated (1999, p. 143): "Our aim was to assess in Hounsfield units (HU) the CT density of the inner cortical surface of the proximal femur after this bone had been removed. One HU is defined as a number on a density scale in which the X-ray absorption of water has been assigned the value of zero and the air the value of -1000."

http://en.wikipedia.org/wiki/Hounsfield\_scale provides this definition: "The *Hounsfield scale*, named after Sir Godfrey Newbold Hounsfield, is a quantitative scale for describing radiodensity. [...] The Hounsfield unit (HU) scale is a linear transformation of the original linear attenuation coefficient measurement into one in which the radiodensity of distilled water at standard pressure and temperature (STP) is defined as zero Hounsfield units (HU), while the radiodensity of air at STP is defined as –1000 HU. For a material X with linear attenuation coefficient  $\mu_X$ , the corresponding HU value is therefore given by

such as color and transparency. (A *voxel* is the volume unit, just as a *pixel* is a unit in the plane, in two-dimensional images.)

• *Maximum intensity projection (MIP)* is a way of presenting CT datasets by only displaying the voxel with the highest value along a projection ray. Information about the three-dimensional structure is lost, but it allows comparing CT datasets to orthopantomograms for dental identification.

Orthopantomograms, also called orthopantograms, OPG, or panorex, are not known to the non-specialist by that name, but the thing they name is familiar to dentists' patients, as they are a panoramic scanning *dental X-ray* of the upper and lower jaws, showing in two dimensions a half-circle from ear to ear. One advantage of such *panoramic* images is their coverage is broad, capturing both facial bones and the teeth, and another advantage is that also patients find the image is easy to understand. Such images can even be made in patients who cannot open their mouth, as the image is shot by introducing in the mouth a flat plastic spatula: dentists ask patients to bite on it, and the process takes about one minute. It is not only on living individuals that such dental X-rays can be taken, and they are useful indeed for identifying bodies. Dental radiology uses either film technology (which requires a chemical development process, and with the film on either a flat cassette, or a rotating cylinder), or *digital technology*. The first dental panoramic digital systems were designed in 1985–1991. In 1995, Signet, a French firm, introduced DXIS, the first dental digital panoramic X-rays system available on the market. In 1997, Siemens followed, with SIDEXIS. Since then, many manufacturers have been offering their own panoramic digital systems for dental X-rays.<sup>6</sup>

where  $\mu_{water}$  and  $\mu_{air}$  are the linear attenuation coefficients of water and air, respectively. Thus, a change of one Hounsfield unit (HU) represents a change of 0.1% of the attenuation coefficient of water since the attenuation coefficient of air is nearly zero. It is the definition for CT scanners that are calibrated with reference to water. *Rationale*[:] The above standards were chosen as they are universally available references and suited to the key application for which computed axial tomography was developed: imaging the internal anatomy of living creatures based on organized water structures and mostly living in air, *e.g.* humans. [...] The Hounsfield scale applies to medical grade CT scans but not to cone beam computed tomography (CBCT) scans."

The HU of air is -1000; the HU of fat is -120; the HU of water is 0; the HU of blood is +30 to +45; the HU of muscle is +40; the HU for contrast is +130; the Hu of bone is +400 or more (ibid.). "A practical application of this is in evaluation of tumors, where, for example, an adrenal tumor with a radiodensity of less than 10 HU is rather fatty in composition and almost certainly a benign adrenal adenoma" (ibid.). Something about the history of the technology: "CT machines were the first imaging devices for detailed visualization of the internal three-dimensional anatomy of living creatures, initially only as tomographic reconstructions of slice views or sections. Since the early 1990s, with advances in computer technology and scanners using spiral CT technology, internal three-dimensional anatomy is viewable by three-dimensional software reconstructions, from multiple perspectives, on computer monitors. By comparison, conventional X-ray images are two-dimensional projections of the true three-dimensional anatomy, i.e. radiodensity shadows. It was established by Sir Godfrey Newbold Hounsfield, one of the principal engineers and developers of computed axial tomography (CAT, or CT scans)." (ibid.).

<sup>&</sup>lt;sup>6</sup> http://en.wikipedia.org/wiki/Orthopantomogram states the following concerning the equipment: "Dental panoramic radiography equipment consists of a horizontal rotating arm which holds an

# 9.3.10 Medical Image Data for Medical Laypersons

If radiological data has to be presented to non-medical professionals, grayscale transverse cuts as used by radiologists are insufficient, since interpretation of these data requires experience and training. This is especially important in forensics, since

The image is formed as follows (ibid.): "Normally, the person bites on a plastic spatula so that all the teeth, especially the crowns, can be viewed individually. The whole orthopantomogram process takes about one minute. The patient's actual radiation exposure time varies between 8 and 22 seconds for the machine's excursion around the skull. The collimation of the machine means that, while rotating, the X-rays project only a limited portion of the anatomy onto the film at any given instant but, as the rotation progresses around the skull, a composite picture of the maxillo-facial block is created. While the arm rotates, the film moves in a such way that the projected partial skull image (limited by the beam section) scrolls over it and exposes it entirely. Not all of the overlapping individual images projected on the film have the same magnification because the beam is divergent and the images have differing focus points. Also not all the element images move with the same velocity on the target film as some of them are more distant from and others closer to the instant rotation center. The velocity of the film is controlled in such fashion to fit exactly the velocity of projection of the anatomical elements in different places are recorded blurred as they scroll at different velocity."

There is image distortion (ibid.): "The dental panoramic image suffers from important distortions because a vertical zoom and a horizontal zoom both vary differently along the image. The vertical and horizontal zooms are determined by the relative position of the recorded element versus film and generator. Features closer to the generator receive more vertical zoom. The horizontal zoom is also dependent on the relative position of the element to the focal path. Features inside the focal path arch receive more horizontal zoom and are blurred; features outside receive less horizontal zoom and are blurred. The result is an image showing sharply the section along the mandible arch, and blurred elsewhere. For example, the more radio-opaque anatomical region, the cervical vertebrae (neck), shows as a wide and blurred vertical pillar overlapping the front teeth. The path where the anatomical elements are recorded sharply is called 'focal path'."

*Digital dental radiology*, using electronic sensors and computers, offers advantages (ibid.): "One of the principal advantages compared to film based systems is the much greater exposure latitude. This means many fewer repeated scans, which reduces costs and also reduces patient exposure to radiation. Lost X-rays can also be reprinted if the digital file is saved. Other significant advantages include instantly viewable images, the ability to enhance images, the ability to email images to practitioners and clients (without needing to digitize them first), easy and reliable document handling, reduced X-ray exposure, that no darkroom is required, and that no chemicals are used."

X-ray source and a moving film mechanism (carrying a film) arranged at opposed extremities. The patient's skull sits between the X-ray generator and the film. The X-ray source is collimated toward the film, to give a beam shaped as a vertical blade having a width of 4–7 mm when arriving on the film, after crossing the patient's skull. Also the height of that beam covers the mandibles and the maxilla regions. The arm moves and its movement may be described as a rotation around an instant center which shifts on a dedicated trajectory. The manufacturers propose different solutions for moving the arm, trying to maintain constant distance between the teeth to the film and generator. Also those moving solutions try to project the teeth arch as orthogonally as possible. It is impossible to select an ideal movement as the anatomy varies very much from person to person. Finally a compromise is selected by each manufacturer and results in magnification factors which vary strongly along the film (15–30%). The patient positioning is very critical in regard to both sharpness and distortions."

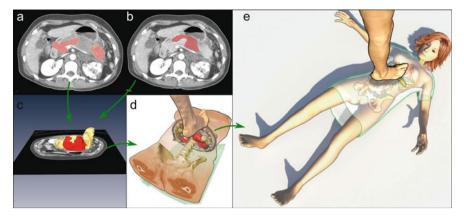


Fig. 9.3.10.1 Visualizing a pancreatic rupture after kick to the chest. (a) Segmented pancreas. (b) Segmented extravasated blood. (c) Polygon model of the segmented pancreas and blood. (d) Combination of volume rendering and polygon models. Transparent soft tissue is displayed by volume rendering. Bone, pancreas and blood are displayed as polygon models. (e) Final result of the reconstruction that can be put into a virtual crime scene, based on the physical evidence found

lawyers, judges and the jury are not accustomed to this kind of data. A rather simple way of depicting axial cuts is by coloring and labeling different organs. Additionally, a volume rendering showing the plane can help with better orientation.

3D imaging is especially useful for presenting information to an audience of medical laypersons, since it is self-explanatory in most cases. While bone fractures can be displayed directly using volume rendering techniques, some injuries require a combination of segmentation, polygon rendering and volume rendering. Additionally, 3D images can be combined with additional information such as force vectors, position of weapons or attackers during attack, if this is supported by evidence (Fig. 9.3.10.1).

## 9.4 Virtopsy and the Swiss Justice System

## 9.4.1 Advantages of Virtopsy in Court

Court members are normally laypersons with respect to forensic medical issues. For them, pictures of conventional autopsy can be distasteful and difficult to interpret. A real autopsy is, honestly, a rather grim process. On the other hand, Virtopsy pictures allow for a more or less abstract look at the inside of a human being. Therefore, Virtopsy pictures are routinely less distasteful and/or disturbing for court members. These types of pictures are more easily understandable, are normally less error prone (e.g. left side / right side confusion), enable three-dimensional color coded reconstructions and provide excellent visualization of given anatomy. Furthermore, three-dimensional images can easily be shown in court rooms and interactively discussed with court members and other relatives of the deceased. Since Virtopsy data can be stored, with no loss of quality, they can be reused years after they have been made in case additional questions arise, possibly averting the need for exhumation. Virtopsy methods in general are non-destructive, which obviates the possibility of destroying evidence during the procedure.

## 9.4.2 Virtopsy in the Current Legal System and Practice of Switzerland

Notwithstanding the foregoing, and in particular, notwithstanding these advantages in dealing with criminal cases, Virtopsy is not yet anchored within the present Swiss legal system, meaning the Virtopsy technique is actually not specifically mentioned, in either acts of law or decrees. Moreover, prevailing case law and legal doctrine theory has yet to deal with this forward looking approach in forensic investigation.

The Virtopsy technique is based on research, ongoing for nearly a decade; however it is not yet part of the standard operating procedures of the Swiss Academy of Legal Medicine, which develops the guidelines that define due diligence in the field. On the other hand, the technique is part of the training program for future forensic pathologists at several Swiss universities. These seemingly disparate facts indicate that Virtopsy is not yet an element of what would be considered best practice in Switzerland.

However, the technology is used within certain areas of Switzerland, where the technique is implemented and well established (i.e., the Institute of Forensic Medicine at the University of Bern and its catchment area: the cantons of Bern, Aargau and Solothurn, and in the Canton Wallis, the district Oberwallis). Members of the legal practice in Bern, and in more and more in other cantons such as Lausanne and Zurich, take advantage of the new technique and apply it in conjunction with expert testimony as well evidence that helps to establish the burden of proof in criminal cases.

# 9.4.3 Criminal Procedure in Switzerland: The Legal Basis for Virtopsy Imaging Methods?

#### 9.4.3.1 Background

Since January 1, 2011 a new, national Swiss Code of Criminal Procedure (SCCP) has been in effect. In Switzerland, the penal authorities include the following: in criminal prosecution the police, the office of the District Attorney, misdemeanor penal authorities, as well as several Courts such as trial court, the appeal board and appeal court at the cantonal level, and the Federal Supreme Court of Switzerland at the national level. Article 14 of the SCCP allows each canton to organize its own trial courts (such as circuit court, district court, and county court, etc.).

Article 328 of the SCCP,<sup>7</sup> which deals with procedure at the lowest court level, contains no specific regulation regarding the conduct of jury trails, which are therefore not yet instituted in Switzerland. Hence, professional judges preside over the courtroom in Switzerland.

#### 9.4.3.2 Legal Basis for Virtopsy in Switzerland

Virtopsy is primarily used for identification of the deceased and for post-mortem investigations of extraordinary deaths (which include offenses, suicides, accidents and unclear deaths). The main Article in SCCP is Article 253, section 3 of which prescribes: "Otherwise, if there is a suspicion of criminal activity, or the identification of a body is in question, the district attorney may take possession of the body and direct further investigations, at times including an autopsy".<sup>8</sup> At this point an interpretation of the law is indispensable, according to the relevant rules of interpretation (grammatical, historical, systematical and teleological interpretation element). Under these rules further investigations cover also medical imaging method like a CT or MRI and other Virtopsy methods. This is the legal basis for the application of Virtopsy tools in criminal prosecution in cases of death.

On the other hand, imaging methods can also be used to investigate injuries of living persons (victims of crime or defendants), identification or cases of drug smuggling.. Articles 249 to 252 of the SCCP regulate the search and examination of living people. Articles 249, 250 concern the examination of the surface and therefore includes the use 3D surface scanning. Articles 251, 252 concern examination of the inside of the body, and are therefore relevant to CT and MRI examinations.<sup>9</sup>

These Articles of the SCCP constitute the basis to perform examinations with Virtopsy and imaging methods in Switzerland. We should add that Article 197 Section 1, subparagraph c of the SCCP implies that a compulsory examination like those named for cases of either (extraordinary) death or of living people (victims of a crime or defendants), have to be the "mildest method" possible. The non- or minimally-invasive methods of Virtopsy better satisfy this regulation when compared to full-invasive autopsy.

#### 9.4.3.3 Evidence Law in Switzerland

In general, the key article of law relevant to Virtopsy in Swiss Evidence Law is Article 139 of the SCCP. All means of evidence that science and experience have shown to be valid for discovering the truth are to be utilized in an investigation. Virtopsy and its imaging methods are such means of evidence; especially because of the fact that imaging methods are non- or minimally-invasive and hence better

<sup>&</sup>lt;sup>7</sup> See Niklaus Schmid's (2009) Handbuch des Schweizerischen Strafprozessrechts, N 380.

<sup>&</sup>lt;sup>8</sup> Article 253 Section 3 Swiss Code of Criminal Procedure (SCCP).

<sup>&</sup>lt;sup>9</sup> Articles 249–252 Swiss Code of Criminal Procedure (SCCP).

preserve body integrity and human dignity than the classical examinations such as invasive autopsy.

Imaging methods such as CT, MRI or surface scanning are scientifically accepted, in both medicine and surveying. It is the choice of the expert to decide which methods or examinations are necessary to provide an expert opinion.<sup>10</sup> In our opinion, the forensic expert opinion of the 21st century should include all reasonable and available means of evaluation, including medical imaging methods. However, Virtopsy methods do not meet the criteria for exclusion of evidence under Article 140 SCCP.<sup>11</sup>

According to Article 76 Section 4 SCCP the statements of experts can be recorded using technical aids such as images. Hence the use of images is explicitly approved by legislation for use court.<sup>12</sup>

In Switzerland the prosecuting authorities bear the burden of proof. The party of the proceedings, hence the prosecuting attorney as well as the defense can file requests to present evidence. The defending attorney is only bound to the interests of his client. He has the same rights as the defendant himself. The defense can collect its own evidence. Therefore it would be possible for the defending attorney to ask for expert testimony, which might Virtopsy methods.

Additionally, hospital CT and MRI can be used for forensic purposes. There is no ranking of evidence, but a so-called free consideration of evidence by the judge. All means of evidence are basically considered equal, although some evidence seems to be especially trustworthy like evidence produced by electronic equipment. The conviction of the judge is not based on the external but interior authority of a mean of evidence. Free consideration of evidence by the judge is limited, however and may be dependent on expert testimony.

Experts assist the penal authority by imparting their specialist knowledge, as relevant to the case at hand. Experts must deliver results and opinions based on a contentious and state of the art application of the scientific method.<sup>13</sup> The expert is the assistant of the penal authority (prosecuting attorney and court) in his field of expertise, rather like *amicus curiae* in Common law Countries. She or he does not make legal judgements or comments about the evidence. The experts have to possess special knowledge and skills in their respective field of expertise.

A legal inspection (a.k.a the external examination) of the body and the autopsy are performed by forensic experts or by an institute of forensic medicine.<sup>14</sup> During a Virtopsy a radiology expert does a reading of the CT or MRI images and surveying engineers perform surface scans. It is possible therefore for several experts to be employed in the same trial.

<sup>&</sup>lt;sup>10</sup> Schmid Niklaus, N 944 f.

<sup>&</sup>lt;sup>11</sup> Article 140 Swiss Code of Criminal Procedure.

<sup>&</sup>lt;sup>12</sup> Article 76 Section 4 Swiss Code of Criminal Procedure (SCCP).

<sup>&</sup>lt;sup>13</sup> Schmid Niklaus, N 929 f.

<sup>&</sup>lt;sup>14</sup> Article 253 Section 3 Swiss Code of Criminal Procedure (SCCP).

In Switzerland there is no standing directory of court experts. However according to Article 183 Section 2 SCCP, the Swiss Federation or the cantons can employ permanent or official experts for some special fields, (e.g. the forensic, radiology, and engineering experts of the Institute of Forensic Medicine of the University of Bern). Furthermore, it is mandatory that experts are completely independent and impartial.<sup>15</sup> Both prosecuting authorities and defendants have the opportunity to comment on the qualifications of the expert and the content of the expert report in advance.<sup>16</sup> Hence, there is the possibility of an objection for both sides according to Article 393 SCCP.<sup>17</sup>

The impartial and independent, professional judge has to follow the rule of consideration of evidence and may not give more weight to the visually impressive, intuitive and exact nature of 3D-pictures of the Virtopsy. But in other countries, particularly where juries are involved, the impressive 3D renderings may have considerable sway.

According to Article 189 SCCP<sup>18</sup> if an expert opinion is unconvincing, imprecise, contrary to accepted expectations, or incomplete – in short, if there is any doubt regarding the correctness of the expert opinion – the judge can order a second opinion or an clarification from the first expert opinion. In such cases, Virtopsy has the advantage of the digital nature of the data, which allows for submission anywhere in the world to obtain second expert opinions.

To summarize, the Virtopsy and its imaging methods can be principally used as evidence by either the prosecution or the defense. The professional judge can also request viewing. The images must be annotated by expert commentary by an expert and must be included in the report in an "image folder". The image folder augments classical examination methods such as autopsy in court.

<sup>&</sup>lt;sup>15</sup> Schmid Niklaus, N 936.

<sup>&</sup>lt;sup>16</sup> Schmid Niklaus, N 937 f.

<sup>&</sup>lt;sup>17</sup> Schmid Niklaus, N 940 f.

<sup>&</sup>lt;sup>18</sup> SCHMID, N 951 f.

# Chapter 10 Concluding Remarks

In this book, an attempt has been made to capture an array of subjects which all deserve attention, when techniques from computing are applied to the modelling of legal evidence, or then of argumentation, or of both. One chapter covers the treatment of tools for representing and processing narratives as known from natural-language processing. It has become a bulky book, and it originally started as an overlong paper. Looking back on the evolution of what has come to be this book, I doubt I would have had ab initio the courage to undertake such a comprehensive exposition. I owe much to the referees, who encouraged me to abound with the presentation of techniques, as opposed to a more superficial overview. For the very reason that this book tries to cover so much, we had to deal with tools or with discussing problems that have contingently or more fundamentally arisen within different jurisdictions.

This long trip took us from some general and historical considerations (Chapter 1) to an early encounter with models of forming an opinion (Chapter 2), and more specifically with modelling adjudicators' shifts of opinion (belief revision). We then turned (Section 2.2) to models of reasoning about a charge and about a given explanation (in ECHO), or of generating an explanation as exonerating as possible (in ALIBI). In the rest of Chapter 2 we could not avoid the crux of much mathematical and computational modelling of reasoning about legal evidence, namely, we had to come to terms with there being a fierce and well-argued controversy about Bayesianism concerning juridical proof.

We devoted Chapter 3 to the modelling of argumentation. We also discussed there agents' beliefs. Next, in Chapter 4 we discussed various aspects of computer assistance for organisational aspects. We began Chapter 4 with procedural-support systems for organising the evidence, and then proceeded to some criminal justice information systems, next to a discussion of the evaluation of costs and benefits while preparing a case (but also costs and benefits of argumentation itself). In Section 4.4, we discussed factors affecting the suitability or the reliability of eyewitnesses, and in particular we considered a computer tool, ADVOKATE. In Section 4.5, we considered various matters concerning policing. We considered

organisational problems of police intelligence systems. Then we discussed the handling of the suspects. We discussed polygraph tests (a deeply controversial tool). We also discussed lineups, and computerised versions of identity parades. We concluded Chapter 4 with a discussion of relevance. We then devoted Chapter 5 to the formal or computational modelling of narratives, whereas Chapters 6 and 7 are about link analysis and data mining techniques.

A panoply of forensic disciplines and their respective tools are the subject of Chapter 8, starting with crime scenario modelling, then continuing with computer processing of human faces, which occurs in various contexts, such as the generation of facial composites. We then discussed various forensic disciplines: forensic anthropology and forensic archaeology, forensic geology, physics, and botany, and then environmental forensics and, more briefly, forensic engineering. We then turned to individual identification by DNA and fingerprint evidence. We discussed problems affecting such evidence. We also presented two different computational models for fingerprint-matching. The Virtopsy team in Bern contributed Chapter 9, about how to conduct a virtual autopsy by means of computer imaging, before carrying out an invasive physical autopsy: planning the latter by means of the virtual autopsy is useful in order to make it less invasive. Also the presentation of evidence in court is facilitated by means of the VIRTOPSY technique.

Let us take an overarching view of the broad set of domains we have been considering. Introducing our present work, relations among disciplinary areas were outlined. It is befitting at this stage to consider again, in increasing degrees of detail, the relations of containment among different disciplinary areas, and how they contribute to each other. Therefore, please refer to Figs. 10.1, 10.2, and 10.3.

It has been a long journey, throughout this bulky book. The sheer scope of the enterprise makes it very difficult for the end result to always prove satisfactory, and this is why two chapters were entrusted to specialists of a specific domain, and the other chapters, too, are interleaved, here and there, with outer contributions. It is my hope that readers will agree that it has been a worthwhile journey, and that it opened new views, whether the reader is a specialist or a new learner.

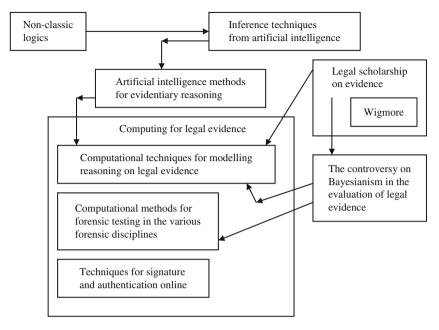


Fig. 10.1 Contributing or containment relations among disciplinary areas

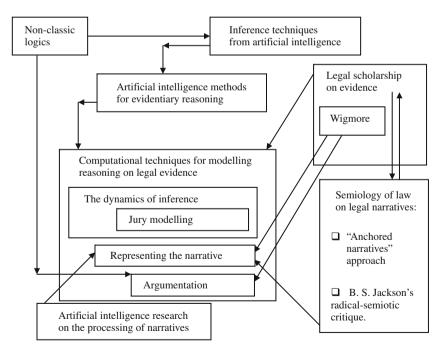


Fig. 10.2 Contributing or containment relations in further detail

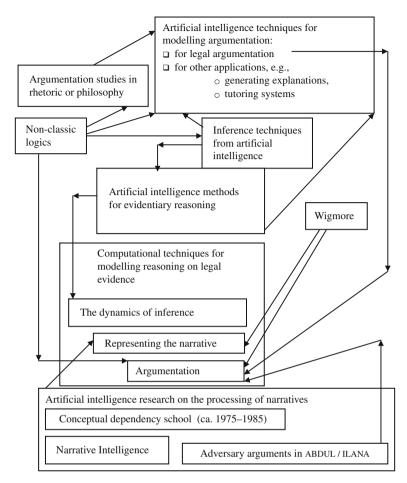


Fig. 10.3 Contributing or containment relations with a focus on computational models of argumentation and their application to law

# **Appendix: Glossary**

This glossary defines such relevant concepts that are drawn from law (whether or not they were treated in the chapters of this book), or from computing (especially artificial intelligence), or argumentation, provided that they were mentioned in some relevant chapter. Tools are defined, if they had been mentioned or discussed in the book. So are abstract concepts, but not names of persons.

Importantly, with a few exceptions (in biometrics and concerning facial composites), this glossary does not cover forensic science or engineering, or forensic psychology or medicine. Much nomenclature had been introduced in the chapters about data mining or the forensic disciplines. Here and there, some passage in the glossary has appeared in sections in Nissan (2008a). This is the case of entries concerning: character evidence, logic and law, the doctrine of chances, *mens rea*, and hearsay.

There was little point to try and replicate, here, definitions for concepts from forensic science that can be found in Brenner's *Forensic Science Glossary* (2000). Even in such areas that were covered, there is no claim of completeness in this glossary. Sometimes a concept was developed more, simply because the present author was so inclined. It is hoped at any rate that this glossary will prove helpful, supplementing or presenting in a different manner such material that was expounded in the chapters of this book. There being a detailed Subject Index is intended to much facilitate access.

- **Abductive inference** A mode of inference, theorised by Charles Peirce. It departs from deductive inference. See Section 2.2.1.6 above. "*Abduction*, or *inference to the best explanation*, is a form of inference that goes from data describing something to a hypothesis that best explains or accounts for the data. Thus abduction is a kind of theory-forming or interpretive inference" (Josephson & Josephson, 1994, p. 5).
- **ABDUL/ILANA** A tool developed by computational linguists. It was an AI program that used to simulate the generation of adversary arguments on an international conflict (Flowers et al., 1982).
- Actus reus The actual performance of a forbidden action, or that action itself, as opposed to the intention (*mens rea*).

- Ad hominem argument Such an argument that attacks the person who is claiming the truth of a proposition, in order to attack that proposition. Ad hominem arguments are the subject of Walton (1998b).
- Adjudicative fact-finding Judicial decision-making (returning a verdict, as distinct from the later stage, of sentencing). Sometimes different kinds of courts can be alternative venues for adjudication for the same case, apart from the option of turning to arbitration rather than a court of justice. Moreover, sometimes alternative venues are known to have a tendency to adjudicate differently. A U.S. taxpayer disagreeing with the Inland Revenue Service (IRS) has four venues of appeal. Two of these require that before turning to them, the taxpayer pay up front what the IRS demands, whereas the other two venues can be approached without paying in advance the disputed tax bill, but these other venues are known to be more biased against the taxpaver. Without paying in advance, a taxpaver can request a conference with an IRS appeals officer, but such officers are Treasury employees, and clearly favour the IRS. Also without paying in advance, a taxpayer can appeal to the U.S. Tax Court, but in 1989 it issued split decisions 55% of the time (i.e., the finding was a compromise), and that kind of court only decided 4% of cases in favour of taxpayers. But if taxpayers pay up front what the IRS requests and then sue in order to recover, then two venues are open: the U.S. Claims Court (which in 1989 favoured taxpayers in 8% of cases), and the U.S. District Court: in 1989 it found for the taxpayers in 18% of cases, and so appears to be the venue least unfavourable to taxpavers (Topolnicki & MacDonald, 1991, p. 84). In a different domain, contracts are sometimes drawn by specifying which geographic jurisdiction is to adjudicate in case of litigation, and not infrequently (especially when the parties are from different countries), the parties expect that adjudication at one's own place may prove to be more favourable. Thus, sometimes the parties reason as though as the ideal of perfect objectivity of adjudicators was an ideal at variance with actual practice.
- Admissionary rules Typically in the U.S. law of evidence: rules about which kinds of evidence can be admitted and heard in court. As opposed to *exclusionary rules*.ADR See alternative dispute resolution.
- **Adversarial** A type of criminal procedure, which is typical of Anglo-American jurisdictions. As opposed to the *inquisitorial* system. During the 1990s, some countries on the European Continent with an inquisitorial system have to some degree shifted towards an adversarial system. In Britain, public inquiries are in theory inquisitorial, rather than adversarial. See **inquisitorial**.
- Adversary argument One of two classes of arguments (the other class being *persuasion* arguments), "depending on the goals and expectations of the participants. [...] In [...] *adversary* arguments, neither participant expects to persuade or be persuaded: The participants intend to remain adversaries, and present their arguments for the judgment of an audience (which may or may not actually be present). In these arguments, an arguer's aim is to make his side look good while making the opponent's look bad" (Flowers et al., 1982, p. 275). The ABDUL/ILANA program models such arguers (ibid.).

- **ADVOKATE** A computer system for the evaluation of the credibility of eyewitness evidence (Bromby & Hall, 2002). It is described in Section 4.4 in this book.
- **Age-progression software** A kind of computer graphic software, useful to the police for the purposes of locating missing people, in that it predicts how a given person (based on an old photograph) would have aged meanwhile. See Section 8.2.3.
- Agent beliefs Models from AI for treating them were applied to modelling the reasoning about legal evidence, in Ballim et al. (2001) and Barnden (2001). This area is called *attribution* in psychology. See Section 3.4
- AI See Artificial intelligence.
- **AI & Law** Artificial intelligence as applied to law, this being an established discipline both within legal computing and within artificial intelligence.
- **ALIAS** A particular multi-agent architecture, with abductive logic-based agents. It was applied to the modelling of reasoning on the evidence in a criminal case, in Ciampolini and Torroni (2004), using LAILA, a language for abductive logic agents. See Section 2.2.1.5.
- **Alibi** In the proper, legal sense of the term, an alibi states an alternative location. Loosely speaking, one sometimes uses the term more generally, to refer to an alternative, exonerating account provided by a criminal suspect, or by a defendant being tried. It disconfirms a claim which is essential for the accusers for them to prove the charge. "The defence of alibi presupposes that the accused was somewhare else when the offence happened. If he does not remember where he was, then he can give no particulars. If he was alone at the time, he must still give such particulars as he can of where he was and when" (Osborne, 1997, p. 135). See Section 2.2.2.8.
- **ALIBI** A computer system developed by Nissan and his students in various prototypes as early as Kuflik et al. (1989). In an AI perspective, it is a planner which produces alternative explanations, and with respect to an input accusation, it seeks exoneration or a lesser liability. See Section 2.2.2.
- **Alternative dispute resolution (ADR)** In civil cases, *case disposition* (q.v.) includes, among the other options: the court finding for one of the parties, or settlement out of court, or *alternative dispute resolution*. The latter may be either *arbitration*, or *binding* or *nonbinding mediation*.
- **Ambiguity aversion** "Ambiguity aversion is a person's rational attitude towards probability's indeterminacy. When a person is averse towards such ambiguities, he increases the probability of the unfavorable outcome to reflect that fear. This observation is particularly true about a criminal defendant who faces a jury trial" (from an extended abstract of Segal & Stein, 2006). "Because most defendants are ambiguity-averse, while the prosecution is not, the criminal process systematically involves and is thoroughly affected by *asymmetric ambiguity-aversion*" (ibid.). Indeed: "The prosecution, as a repeat player, is predominantly interested in the conviction rate that it achieves over a long series of cases. It therefore can depend on [...] general probability as an adequate predictor of this rather. The defendant only cares about his individual case and cannot depend on this general probability". Because of the ambiguity, from the

defendant's perspective, of his individual probability of conviction, "[t]he defendant consequently increases this probability to reflect his fear of that ambiguity" (ibid.). "Asymmetric ambiguity-aversion foils criminal justice. The prosecution can exploit it by forcing defendants into plea bargains that are both inefficient and unfair. Because plea bargain is a predominant method of case-disposition across the United States, this exploitation opportunity is particularly pernicious" (ibid.).

- Amicus curiae In some countries, an expert witness above the parts, appointed by the court.
- Anchored narratives (or AN for short) The *theory of anchored narratives* was proposed by Wagenaar et al. (1993). The central idea of this approach is that juridical proof is organized around plausible narratives where "plausibility" is determined by the relationship between the story offered at trial and the background knowledge/common sense of the decision maker. A shortcoming of the theory of anchored narratives is that has no operationalization of "not guilty".

In the theory of anchored narratives, narrative (e.g., the prosecution's claim that John murdered his wife) is related to evidence (e.g., John's fingerprints on the murder weapon) by a connection that must be satisfactory for the narrative to hold once the evidence is accepted: "[...] triers of fact [i.e., judges or, in some countries, the jury] reach their decisions on the basis of two judgments; first an assessment is made of the plausibility of the prosecution's account of what happened and why, and next it is considered whether this narrative account can be anchored by way of evidence to common-sense beliefs which are generally accepted as true most of the time" (Jackson, 1996, p. 10). For the story to be comprehensively anchored, each individual piece of evidence need be not merely plausible, but safely assumed to be certain, based on common-sense rules which are probably true (see generalisations). Critics point out that this begs the question: generalizations only hold with some degree of probability, if this can be pinpointed. Moreover, Ron Allen pointed out that in the theory of anchored narratives, there is no operationalization of "not guilty" or "not liable". His own related, but earlier work is free from that fault. See Section 5.1.2.

- **Anti-forensics** Strategies to evade computer forensic investigations, in: *digital anti-forensics* (q.v.). See Section 6.2.1.5.
- Appeal The right to appeal against a judgment is an ancient Roman principle. It was renewed during the Middle Ages. For example, in Montpellier, a town (now in southwestern France) which obtained privileges of autonomy from the Crown of Aragon, "appeal procedure was used from 1204 [and the town] enacted in 1212 a statute fixing a time limit for first and second appeals exclusively to their [local authorities]. But the kings in France, the counts in Provence swiftly monopolised the competency concerning "final appeals"; and by the end of the XIIIth century, it became impossible for the towns to keep such powers" (Gouron, 1992, pp. 34–35). The reverse of the medal, if the right of some judiciary authorities not to have their judgment appealed against: historically in the United States, one of various meanings that *freedom of proof* "a slippery term" (Twining, 1997, p. 462) used to have (unlike the current sense: see free proof) was this

one: "freedom from hierarchical controls over fact-finding: for example freedom of triers of fact from appeal or review by a superior authority" (ibid., p. 448). Countries have a hierarchy of courts, and appeal is to a higher court.

Appeal to expert opinion See Expert opinion, Appeal to.

- **Applicant** In some kinds of trial, this is the plaintiff; then the name for the defendant is *respondent*. The term *applicant* is used in the procedure of employment tribunals in England and Wales. In the *Civil Procedure Rules 1993*, in England and Wales, the term *plaintiff* was replaced with *claimant* (thought to be a more transparent, and more widely understood term: the same reform excised other traditional terms as well).
- **Araucaria** A relatively widespread tool for visualising arguments (Reed & Rowe, 2001, 2004). It was developed at thew University of Dundee, in Scotland. The software is freely available. It was also discussed in chapters 11 and 12 in Walton, Reed, and Macagno (2008). See Section 3.7.
- **Arbitration** In civil cases, a form of *case disposition* (q.v.). Like *mediation*, arbitration is a form of *alternative dispute resolution* (that is, alternative to the courts).
- **AREST** A particular expert system, described by Badiru et al. (1988), and whose application was the profiling of suspects of armed robbery. See in the notes of Section 6.1.3.
- **Argumentation** How to put forth propositions in support or against something. An established field in rhetorics, within AI & Law it became a major field during the 1990.
- **ArguMed** Verheij (1999, 2003) described the *ArguMed* computer tool for visualising arguments. It was described by Verheij (1999, 2003). One of its peculiarities is the concept of *entanglement* (q.v.). See Section 3.7.
- Argumentation layers Prakken and Sartor (2002) usefully "propose that models of legal argument can be described in terms of four layers. The first, logical layer defines what arguments are, i.e., how pieces of information can be combined to provide basic support for a claim. The second, dialectical layer focuses on conflicting arguments: it introduces such notions as "counterargument", "attack", "rebuttal" and "defeat", and it defines, given a set of arguments and evaluation criteria, which arguments prevail. The third, procedural layer regulates how an actual dispute can be conducted, i.e., how parties can introduce or challenge new information and state new arguments. In other words, this level defines the possible speech acts, and the discourse rules governing them. Thus the procedural layer differs from the first two in one crucial respect. While those layers assume a fixed set of premises, at the procedural layer the set of premises is constructed dynamically, during a debate. This also holds for the final layer, the *strategic* or heuristic one, which provides rational ways of conducting a dispute within the procedural bounds of the third layer" (Prakken & Sartor, ibid., section 1.2). See Section 3.8.
- Arraignment In criminal cases: "All trials on indictment begin with the 'arraignment' which consists of formally putting the counts in the indictment to the accused and inviting him to plead [i.e., to plead guilty or not guilty] to each.

The jury are not empanelled at this stage and in most [English] courts the procedure is that matters are 'listed to plead' where nothing else is dealt with but the taking of the plea" (Osborne, 1997, p. 138), Exceptionally (in England) if solicitors write to the Crown Prosecution Service and to the court "that there is categorically to be a not guilty plea, the matter may be listed for trial without this preliminary stage" (ibid.).

**Artificial intelligence (AI)** Chapter 1 in Patrick Winston's (1984) popular textbook explained (ibid., pp. 1–2):

There are many ways to define the field of Artificial Intelligence. Here is one:

• Artificial Intelligence is the study of ideas that enable computers to be intelligent.

But what is intelligence? Is it the ability to reason? Is it the ability to acquire and apply knowledge? Is it the ability to perceive and manipulate things in the physical world? Surely all of these abilities are part of what intelligence is, but they are not the whole of what can be said. A definition in the usual sense seems impossible because intelligence appears to be an amalgam of so many information-representation and information-processing talents.

Nevertheless, the goals of Artificial Intelligence can be defined as follows:

- One central goal of Artificial Intelligence is to make computers more useful.
- Another central goal is to understand the principles that make intelligence possible.

Nissan (1991, section 1) introduced the bipolarity of goals of artificial intelligence as follows, in a rather florid style catering to a broad audience:

In the framework of a discussion about the epistemology of computing, Bernard Stiegler (1986) employs a metaphor based on the myth of *Epimetheus and Prometheus*. According to that myth, Epimetheus endowed animals with various qualities, but forgot man. Unfledged and defenceless, to survive, man had to be endowed with reason by Prometheus, who sacrificed himself in the process. Here, this metaphor is going to be transposed onto the following idea, different from Stiegler's: the Aler [i.e., the practitioner or scholar of artificial intelligence] is an Epimetheus who yearns for becoming Prometheus for the machine. Because of the very nature of the different interests catered to by the two terms in the binomial *science* and *technology*, the technologist relishes his or her Epimethean role. Rational, industrial criteria justify this, and are justified themselves by the social-cultural pattern that produced, e.g., Edison (and for which, see, e.g., Jenkins, 1987, section II). So far, computer technology has endowed the machine with new attributes, just as the myth has Epimetheus endowing the spectrum of animal species with various combinations and dosage of faculties, that - albeit non-ratiocinative are suitable for inserting them in the natural environment. No actual system - scientific prototypes, or industrial applications that computing has produced, escapes Epimetheus' limits. Not only [that]: nowadays, we [are] witness[ing] a trend in computing that aims at the *mainstreamization*, in computing practice, of AI methods, that are adapted by making them more similar to traditional algorithmic programming. The idea is, that you can describe objects in cohesive clusters, or adopt the AI technique of defining and searching a constraint space of possibilities, with just practical aims, with no cognitive preoccupations (or with just ergonomically [i.e., labour-facilitating] motivated cognitive preoccupations). Aristocrats of AI science may turn up their nose at such down-to-earth interests, when wearing the gown of [fundamental] research, but actually that possible attitude does not exclude taking interest, as a side occupation, in applied projects, hopefully rentable. Scientific and technological interests each have a specific dignity: admitting the criteria of practice is *not* degradation, it is not tantamount to the guilt of Peer Gynt, who in Ibsen's drama [of 1867] wears a tail to gain [acceptance into] the Trolls' country.

[Whatever] the computer system – implemented or extrapolated as feasible – we were to consider, we are condemned to spot there, at most, Epimetheus' gift – a task-dependent suitability – while being reluctant to consider the system as being *already* intelligent, with no double quotes. This does not necessarily imply a mind/mechanism or soul/matter dualism, even though it may culturally motivate some dependency or counter-dependency (the latter claiming, *because* this runs against dualism, that intelligence *can* be achieved, with a certain technical paradigm, or more in general).

Dissatisfaction with given AI artifacts matches the criteria of Promethean eschatology, practically impossible to please on the ground of all cognitive desiderata. Realistically, such criteria have to be drastically simplified to be coped with step by step, and then they have to be gradually redefined more tightly, while we progress on the alternative trestles of widening the *technical can-do space* and of gaining more *scientific insight*. The\c arbitrariness of technical representation shapes, and provisionally delimits, scientific conception, but the latter, in turn, provides feedback for technological development. Awareness that scientific conceptions are a product of *social constructivism*, not just an *objective* product of either occasional serendipity or methodic [perspiration], is helpful to protect the scientist from overly enthusiasm. However, new adepts not always appreciate that, which can explain why in certain domains (e.g., linguistics), AI often becomes an *obtrusive* tool, or even a new theory on its own, instead of being recognized as being a versatile, non-partisan testbed where *representation* subserves *theory*, does not *replace* it.

Different research taxonomies of AI are surveyed by Hall and Kibler (1985); cf. Ringle (1979, 1983). Anyway, AI is most often conceived as fitting in a spectrum between the two ends: simulation of cognition as being the main concern, and the working, but cognitively indifferent tool. The contrast between science and technology – as we witness it in AI, notwithstanding the headway made by the tandem since the Seventies eternalizes distance to be covered; this is easily admitted, once we draw a comparison with the history of science and technology during the positivism era, when distances were thought to be smaller than they later proved to be (and when the [20th] century was figured out by extrapolating into "triumph" current "militant" conceptions of the [19th] century). Nowadays, there is the factor of *impatience*, as Latour (1986) has pointed out: "used to precede, engineers find it uneasy to follow [folk expectations], instead of just stupefy".

What is most specific in the contrast, inside AI, between technological opulence and scientific eschatology, is tightly bound to a terminological choice, that took sides with only one element of the binomial: by naming the discipline *artificial intelligence* (or, less explicitly and more modestly, *AI*), the distance left to be covered has been seized by the wrong end. A practical, concrete, down-to-earth choice (the nearest end), could have been: defining a *cumulative, open-ended* meter, *callidiority* (from Latin *callidior*, i.e. "smarter [than]").

This meter has both the merit and the fault of sparing technology the lashing of cognitive science ambitions, as the callidiority meter measures only past steps, not relativeness with respect to an Omega Point. Yet, such meter could cost ungluing the binomial. For technology, it may mean sinking into marshes – [in] the eyes of AI *scientists* – similar to those that, for up-to-date programmers [since the 1980s], COBOL [programming-language] administrative data processing has become. Production-system based commercial products would be repeated *ad nauseam*, acritically, as a this-worldly relish of a mortal fallen angel, nearly deaf to the *Memento mori* 

admonition of newly underfunded basic research. Several AIers fear such an *AI Winter*, that could stem out of premature industrial disillusion, after too feverish a fashion. [And indeed, it took place during the 1990s, with blue-sky research on open-ended problems no longer being funded the way it used to be during the 1980s. The very term *expert system* went out of favour, then being replaced with *intelligent system*.] On the other hand, ungluing the binomial is a scenery that by now cognitive scientists, AI researchers, and the scientific culture of AI cannot afford to accept. Indeed – and this is the fundamental importance of AI – AI as implemented or to be implemented is, nowadays, the testbed that makes theories materialize. Intellect hopes in the advantages of matter. Once we have started considering it feasible to bring the Heavenly Jerusalem down to the Earthly one, not to loose hold has become a cultural imperative.

**Association rules** "Association rules represent relationships between items in very large databases" (Chan et al., 2001b). Association rules are discovered by means of *data mining* (for which, see Chapter 6).

An example would be "given a marker database, it was found that 80% of customers who bought the book 'XML for beginners' and 'internet programming' also bought a book on 'Java programming'." If X and Y are two sets of disjoint terms, then an association rule can be expressed as conditional implication  $X \Rightarrow Y$  i.e. the occurrence of the set of items X in the market basket implies that the set of items Y will occur in this market basket. Two important aspects of an association rule are confidence and support [...]. The confidence of an association rule r:  $X \Rightarrow Y$  is the conditional probability that a transaction contains Y given that it contains X, i.e. confidence  $(X \Rightarrow Y) = P(X,Y)/P(X)$ . The support of an association rule is the percentage of transactions in the database that contains both X and Y, i.e., Support  $(X \Rightarrow Y) = P(X,Y)$ . The problem of mining association rules can be stated simply as follows: Given predefined values for minimum support and minimum confidence, ind all association rules which hold with more than minimum support and minimum confidence." (Chan et al., 2001b, p. 278, citing Agrawal & Srikant, 1994 for the definition of confidence and support).

- **ATT-Meta** A system for agents' simulative reasoning by agents on each other, which deals with agents' beliefs in respect of a formal approach to uncertain reasoning about them. Barnden (2001) applies it to reasoning about legal evidence.
- **Attribution** In psychology: how people (and computational cognitive models) reason about their own beliefs and the ones they ascribe to others. In AI, this area is called *agents' beliefs*. See Section 3.4.
- **Auxiliary probative policy (rules of)** A category of rules excluding or restricting the use of admitted evidence. As opposed to *rules of extrinsic policy*. In interpretations of the American law of evidence, according to Wigmore's terminology, *rules of auxiliary probative policy* are such exclusionary rules that are intended to promote rectitude of decision, avoiding unreliability or alleged prejudicial effect.
- **AVBPA** *Audio and Video-Based Biometric Person Authentication*: an acronym for the name of a series of conferences in biometrics.
- **AVERs** The visualisation component of the architecture of a sense-making software tool for crime investigation, as envisaged by Bex et al. (2007). AVERs was "implemented as a web front-end to an SQL database. A case can be represented visually through multiple views; in this paper we will focus on the two graphical views, that is, the evidence view and the story view" (section 6 ibid.). Ideally,

they wanted to design a more sophisticated tool than such *investigative analysis software*. Their approach to the story of the prosecution and the defence is qualitative, and does not resort to probabilistic quantification. It fits within logical and computer science research into argumentation, but this is combined with reasoning about stories and evidence. See Section 5.4.

#### Background generalisations See generalisations.

- Backup evidence question In argumentation studies, Walton's (1997) Appeal to Expert Opinion offered (ibid., pp. 211–225) an argumentation scheme for "Argument for Expert Opinion", then reproduced in Walton et al. (2008, pp. 381–382). See s.v. Expert opinion, Appeal to above. The expert source is E; the subject domain is S; and A is a proposition about which E claims to be true (or false). The backup evidence question is: "Is E's assertion based on evidence?". It is articulated in three detailed subquestions: "What is the internal evidence the expert herself used to arrive at this opinion as her conclusion?"; "If there is external evidence for example, physical evidence reported independently of the expert can the expert deal with this adequately?"; "Can it be shown that the opinion given is not one that is scientifically unverifiable?".
- **Bail** "Bail is the release of a person subject to a duty to surrender to custody in the future" (Osborne, 1997, p. 95). In English law, the Bail Act 1976 provides that "a defendant who fails without reasonable cause to surrender to custody is guilty of the offence of absconding", and it lies on the defendant to prove reasonable cause (e.g., sudden serious illness, or an accident on the way to court, for which evidence must be given). The Bail Act 1976 abolished the "common practice to grant an accused bail 'on his own recognisance'. This was a fixed sum of money which the accused did not have to provide at the time of granting bail but which, should he fail subsequently to surrender to custody would be forfeited" (Osborne, ibid.).
- **Bayes, naïve** For a given sample we search for a class  $c_i$  that maximises the posterior probability

$$P(c_i \mid x; \theta')$$

by applying Bayes rule. Then x can be classified by computing

$$c_{l} = \arg_{\substack{\text{max} \\ c_{i} \in \mathbf{C}}} \mathbf{P}(c_{i}|\theta')\mathbf{P}(x|c_{i};\theta')$$

Also see naïve Bayesian classifiers.

**Bayes' theorem** When dealing with a hypothesis *H*, and some evidence *E*, Bayes' theorem states:

#### P(H|E) = P(E|H)P(H)/P(E)

this can be read as follows: the *posterior probability* P(H|E), i.e., the probability that *H* is true given *E*, is equal to the product of the *likelihood* P(E|H), i.e., the probability that *E* given the truth of *H*, and the *prior probability* P(H) of *H*, divided by the *prior probability* P(E) of *E*.

- **Bayesian debate** A controversy among legal scholars, concerning legal evidence and the use of statistics, and in particular of Bayes' theorem. See Sections 2.3 and 5.1. On statistics in DNA evidence, see Section 8.7.2.2.
- **Bayesian enthusiasts** Such legal scholars of evidence or forensic statisticians who strongly support the use of Bayes' theorem as a foundation for statistical analysis as applied to legal evidence. Opposed by the Bayesio-skeptics. Note that whereas some in both camps accept these labels, there also are objections, and *Bayesians* vs. *skeptics* are more acceptable labels.
- **Bayesian networks** A Bayesian network is a directed acyclic graph (i.e., a graph without loops, and with nodes and arrows rather than direction-less edges), such that the nodes represent propositions or variables, the arcs represent the existence of direct causal influences between the linked propositions, and the strengths of these influences are quantified by conditional probabilities. Whereas in an *inference network* the arrow is from a node standing for evidence to a node standing for a hypothesis, in a Bayesian network instead the arrow is from the hypothesis to the evidence. In an inference network, an arrow represents a relation of support. In a Bayesian network, an arrow represents a causal influence, and the arrow is from a cause to its effect.

Judea "Pearl has always argued for a subjective degree of belief interpretation of the probabilities in Bayesian networks" (ibid.), these being a formalism he introduced and developed in a series of papers in the 1980s, leading to a book (Pearl, 1988). Judea Pearl's "departure from standard Bayesianism arises because he thinks that prior probability distributions are inadequate to express background knowledge, and that also needs to use causal judgments which cannot be expressed in probabilistic terms" (Gillies, 2004, p. 284).<sup>1</sup>

- **Bayesian reasoning or Bayesian updating or Bayesian conditionalisation** The use of the formula of Bayes' theorem in order to go from the *prior probability* P(H) of a hypothesis H, to the *posterior probability* P(H|E) of H, i.e., the probability that the hypothesis H is true, given the evidence E.
- **Bayesianism** "*Bayesianism* is, roughly speaking, the view that relating hypotheses to evidence can be solved by bayesian reasoning" (Gillies, 2004, p. 287).
- **Bayesianism** (**Imperialistic**) A charge made, by supporters of alternative systems of probability, or then by those suspicious of probabilities altogether, not only in a legal scholarship context: Imperialistic Bayesianism consists of the attitude of the Bayesian who dismisses (too quickly, the charge claims) any approach to uncertainty that is not based on Bayes' Theorem.

<sup>&</sup>lt;sup>1</sup> Dechter, Geffner, and Halpern (2010) is a jubilee volume honouring Judea Pearl.

- **Bayesio-skeptics** Such legal scholars of evidence who have misgivings about the validity or desirability of Bayes' theorem, or even of other probabilistic or statistical formalisms, in the analysis of the evidence of given criminal cases (while not necessarily opposed to such use in civil cases). The term *skeptics* is more widely acceptable, being less charged, albeit less specific.
- **Bench trial** A trial in which the verdict is given by some (trained, professional) judge or judges, instead of by a jury (i.e., popular judges). In some countries there are no jury trials. In countries with jury trials, there are as well bench trials, which apply in different categories of cases.
- **Beyond a reasonable doubt.** The standard for deciding to convict, in a criminal case. The corresponding Latin formula is: *in dubio pro reo* ("If in doubt, find for the defendant"). In contrast, in a civil case the standard for the verdict is less demanding: *more likely than not*. See **utility**. "Proof beyond a reasonable doubt is such proof as precludes every reasonable hypothesis except that which it tends to support and which is wholly consistent with the defendant's guilt and inconsistent with any other rational conclusion" (Stranieri & Zeeleznikow, 2005a, Glossary, s.v. *Proof beyond reasonable doubt*). In contrast, "Proof by a fair preponderance of the evidence is the standard of proof required in civil cases; a decision is made according to that evidence which as a whole is more credible and convincing to the mind and which best accords with reason and probability" (ibid., s.v. *Proof by a fair preponderance of the evidence*).

In the *Carneades* argumentation tool (Gordon & Walton, 2006; Gordon et al., 2007), without sticking to the legal sense of the phrase, the strongest *standard of proof* for an argument was defined to be BRD (*beyond reasonable doubt*): "A statement meets this standard iff it is supported by at least one defensible pro argument, all of its pro arguments are defensible and none of its con arguments are defensible". Cf. Scintilla of evidence, and Preponderance of the evidence.

A curious effect of the different standards for criminal and civil cases can be seen in the 1995 case of celebrity sportsman O. J. Simpson, that at a criminal trial, a jury on 4 October 1995 found not guilty of the murder of his ex-wife and her friend (a June day in 1994, Nicole Brown Simpson and Ron Goldman had been stabbed to death outside her Brentwood home in California), yet later on, in 1997, was considered "responsible" for their deaths by a civil court that ordered him to pay compensation (not paid because of bankruptcy). This is further complicated by the rule against *double jeopardy*: a defendant in the United States cannot be tried all over again. In late November 2006, Simpson's book entitled *IF I did it, Here's How it Happened* was announced amid an outcry. Publication was decided upon on 1 July 2007, but the family of the male victim acquired the rights to the revenue (e.g., Hunt, 2007). Nevertheless, basically it is quite correct that the justice system cannot afford other than a very demanding standard of proof at criminal trials.<sup>2</sup>

 $<sup>^2</sup>$  In early October 2008, thirteen years to the day after his acquittal from the charge of murder, the former football star was convicted of armed robbery, in the context of an event that he claimed was

Another example is that of actor Robert Blake, who in 2002 was arrested for the murder of his wife Bonnie Lee Bakley, one year after her murder. Retired stuntman Ronald "Duffy" Hambleton testified against Blake, claiming that he had tried to hire him to kill his wife. Blake was acquitted of murder in 2005, but her family filed a civil suit and Blake was found to be liable for her murder. In an appeal, the prosecution suggested that detectives failed to investigate whether associates of Christian Brando (who the woman had been claiming, in a letter to him, had fathered her baby) may have murdered Bakley. Hambleton was one of Brando's associates, and a witness claimed that Brando (who had an alibi) haid said "Somebody should put a bullet in that bitch's head". This makes it all the more interesting, that Blake was found liable by a civil court, after being acquitted by a criminal court.

This other example is from the U.K., and concerns the Omagh bombing,<sup>3</sup> in Northern Ireland (i.e., Ulster). It killed 29 people in 1998. The police failed to secure a criminal conviction. Only one man, Sean Hoey, faced criminal charges over the Omagh killings, and he was acquitted in December 2007. Another man, Colm Murphy, was found guilty in Dublin's Special Criminal Court of conspiring to cause the Omagh bombing, but his conviction was later quashed. On 8 June 2009, four men were found to be responsible for the terrorist attack, and the Real IRA was found liable, in a landmark civil case brought by relatives of the victims at Belfast High Court. They had sued five men (one of them was cleared), as well as the Real IRA as an organisation, for up to £14 million.

The case opened in April 2008. Evidence for the case was heard (until March 2009) in both Belfast and Dublin, thus making legal history. It took Mr Justice Morgan three months to sift through the evidence. Those sued were Michael McKevin (the leader of the Real IRA), Liam Campbell, Colm Murphy, and Seamus Daly (these four were found responsible), as well as a man who was cleared, Seamus McKenna (the evidence against him came from his estranged wife, who was eventually considered an unreliable witness).

The judge awarded more than £1.6 million in damages to 12 named relatives who took the action. Much of the evidence was obtained by an undercover FBI agent, David Rupert, who infiltrated the Real IRA. Records and traces on two phones used by the bombers on the day of the attack were important evidence, and the judge deemed it proved that Campbell and Daly were in possession of the phones before and after the attack. Quite importantly, the burden of proof was as required in a civil case, and it is in this context that one has to understand the judge's statement that he considered the case against Campbell overwhelming.

**Big Floyd** A ink analysis tool of the FBI (Bayse & Morris, 1987), with inferential capabilities, and applying the notion of template matching for detecting the likelihood that particular types of crimes were committed. See Section 6.1.2.3.

an attempt to recover his own property. One wonders whether the jury could have been insensitive to the highly publicised previous case. See *Trial by the media*.

<sup>&</sup>lt;sup>3</sup> Omagh is pronounced Oma. The town of Omagh is in County Tyrone.

**Biometrics** "Biometrics, which refers to identifying an individual based on his or her physiological or behavioral characteristics, has the capability to reliably distinguish between an authorized person and an imposter. A biometric system can be operated in two modes: (1) verification mode and (2) identification mode (Jain et al., 2000). The former is called *person verification*, or *person authentication*. A biometric system operating in the verification mode either accepts or rejects a user's claimed identity, while a biometric system operating in the identification mode establishes the identity of the user without any claimed identity information" (Khuwaja, 2006, pp. 23–24). Jain, Bolleand, and Pankanti (1999) and Li and Jain (2009) are books on the subject. Bromby (2010) discussed how biometrics can aid certification of digital signatures.

The most mature technique for person verification, or one of the most mature, is fingerprint-based identification (Isobe, Seto, & Kataoka, 2001; Seto, 2002). Other approaches are based on "face, hand geometry, iris, retina, signature, voice print, facial thermogram, hand vein, gait, ear, odor, keystroke dynamics, etc." (Khuwaja, 2006, p. 24). For example, *iris recognition* is the subject of Li, Yunhong, and Tan (2002), Yunhong, Tan, and Jain (2003). *Retina recognition* is discussed by Yoichi Seto (2009).

*Biometric fusion* (or *information fusion in biometrics*: Ross & Jain, 2003) is "[t]he general method of improving performance via collection of multiple samples" (Rattani et al., 2008, p. 485). *Multi-biometrics* is "[t]he ability to utilize multiple biometrics modalities (multimodal), instances within a modality (multi-instance), and/or algorithms (multi-algorithmic) prior to making a specific verification/identification or enrollment decision" (ibid.), where *enrollment* is "[t]he initial process of collecting biometric data from a user and then storing it in a template for later use" (ibid., p. 484). See Section 8.7 on *individual identification.*<sup>4</sup>

**Blackboard systems** "A blackboard system is a group of knowledge modules collaborating with each other by way of a shared database (blackboard), in order to reach a solution to a problem. Its basic components are: the blackboard, knowledge sources (independent modules that collectively contain the knowledge required to solve the problem) and a control mechanism (or scheduler) which directs the problem-solving process by deciding which knowledge source is most appropriately used at each step in the solution process. The knowledge sources have a condition part and an action part. The condition component specifies the situations under which a particular knowledge source could contribute to an activity. The scheduler controls the progress toward a solution in blackboard systems, by determining which knowledge sources to schedule next, or which problem sub domain to focus on" (Stranieri & Zeleznikow, 2005a, Glossary) See Section 6.1.6.1 in this book. Blackboard systems have found application in legal computing: "GBB is an expert system shell based on the blackboard paradigm. It provides the blackboard database infrastructure, knowledge source

<sup>&</sup>lt;sup>4</sup> In particular, see Section 8.7.3.1. Also see in the last footnote of Section 6.2.1.9.

languages and control components needed by a blackboard application. It is used in the construction of the CABARET legal knowledge based system" (Stranieri & Zeleznikow, 2005a, Glossary). Ashley's (1991) HYPO system (which modelled adversarial reasoning with legal precedents) was continued in the CABARET project (Rissland & Skalak, 1991), and the CATO project (Aleven & Ashley, 1997). Besides: "The PROLEXS project at the Computer/Law Institute, Vrije Universiteit, Amsterdam, Netherlands is concerned with the construction of legal expert shells to deal with vague concepts. Its current domain is Dutch landlord-tenant law. It uses several knowledge sources and the inference engines of the independent knowledge groups interact using a blackboard architecture" (Stranieri & Zeleznikow, 2005a, Glossary). Blackboard systems are the subject of Hayes-Roth (1985) and of Engelmore and Morgan (1988).

- **Blue ribbon jury** Specially qualified jury, instead of a jury whose members are ordinary members of the public. This is one of several possible remedies to *trial complexity* (Hewer & Penrod, 1995, p. 533).
- **Bolding-Ekelöf degrees of evidential strength** Introduced in Bolding (1960), Ekelöf (1964). Åqvist (1992) proposed a logical theory of legal evidence, based on the Bolding-Ekelöf degrees. Shimony and Nissan (2001) restated Åqvist's approach in terms of the probabilistic version of Spohn's (1988) *kappa calculus* as developed in AI research. (The *kappa value* of a *possible world* is the *degree of surprise* in encountering that possible world, a degree measured in non-negative integer numbers.)
- Burden of proof (or persuasion burden). Which party in a trial should prove or disprove a given claim. "There is a distinction between the evidential and legal burden of proof" (Jefferson, 1992, p. 19). In criminal cases, the defendant's "burden is called the evidential burden or onus of proof. The prosecution's burden is the legal one" (ibid.). See Evidential burden (as well as onus of proof) and Legal burden. The burdens of proof are also important in scientific inquiry; Scientific uncertainty and burdens of proofs in, respectively, scientific practice and environmental law are discussed from the vantage point of the philosophy of science in Lemons et al. (1997). Allen and Pardo assert (2007a, p. 108, fn 1), concerning formalisation, that

there are attempts to defend an expected-utility approach to burdens of persuasion with an argument that is valid if, but only if, burdens of persuasion apply to cases as a whole (the defendant is liable or not, guilty or not), but this is false; they apply to individual elements (Allen, 2000).

**Burden, evidential** One of the two kinds of **burden of proof**, as opposed to **legal burden**. In criminal law in England, "[i]n most offences the Crown does not need to negative [sic] any defence the accused might have. It has to show the actus reus and mens rea, if any. If the defendant wishes to rely on a defence, he must raise it and show evidence in support, as Lord Diplock said with regard to mistake in *Sweet* v *Parsley* [1970] AC 132. The same can be said about self-defence, provocation, automatism and duress" (Jefferson, 1992, p. 19).

There is a distinction between the evidential and legal burden of proof. The difference may be illustrated by reference to automatism [...]. Before the accused can rely on this defence, he must put forward some evidence that he was acting automatically when he, say, hit his lover over the head with a heavy ashtray. The evidence might consist of a witness's saying that he saw what happened or a psychiatrist's drafting a report. In legal terms he has to adduce or lead evidence. If he does not adduce such evidence, his plea will fail at that stage and the prosecution does not have to lead evidence that his plea should not succeed. If he does, the prosecution has to disprove that he was acting automatically. His burden is called the evidential burden or onus of proof. The prosecution's burden is the legal one. (ibid.).

**Burden, legal** One of the two kinds of *burden of proof*, as opposed to *evidential burden*. In criminal law in England, "before the accused can rely on [a given] defence, he must put forward some evidence [to that effect]. If he does not adduce such evidence, his plea will fail at that stage and the prosecution does not have to lead evidence that his plea should not succeed. If he does, the prosecution has to disprove [what he claimed in his defence]. His burden is called the evidential burden or onus of proof. The prosecution's burden is the legal one" (Jefferson, 1992, p. 19).

In most area of the criminal law the prosecution must prove both the *actus reus* and the *mens rea* "beyond reasonable doubt". [...] The same principle applies to most defences. The prosecution has, for example, to disprove duress and self-defence. Older cases to the contrary are no longer authoritative. To this principle there are three exceptions.

*Insanity* For the accused to have this defence he must show that he was insane at the time of the offence. The standard of proof is on the "balance of probabilities". That phrase means in effect that if it is more likely than not that the accused was insane, he has the defence. [...] The legal reason assigned for this exception is that every person is presumed to be sane; [...]. The effect is that if the jurors are not certain either way, the accused does not have this defence.

Parliament expressly placing the burden on the accused [...] Parliament can alter the burden by statute and has done so on several occasions [for given kinds of offence and defendant's defence]. [...] Where Parliament places the burden of proof on the accused, the standard of proof is on the balance of probabilities, unless Parliament states otherwise.

"Exception, exemption, proviso, excuse or qualification" in a statutory offence [... In a case for the possession of morphine,] Lord Ackner held that Parliament could place the burden of proof on the accused either expressly or "by necessary implication". When deciding whether the burden was by implication on the accused, the court had to look not just for the language of the enactment but also at its substance and effect. The practical consequences could also be investigated. [...] On the facts the prosecution had merely to obtain an analyst's report [which is not a burdensome task for the prosecution]. Therefore, the burden remained on the Crown. [...] Where Parliament places the burden of proof on the accused, he bears the legal burden and not just the evidential one. [...] The types of argument utilised in *Hunt* will be used in later cases to decide whether an exception in a statute places the burden of proof on the accused. Doing so has to be justified and could not be justified simply on the basis of the grammar of the section containing the offence. In deciding whether Parliament intended to place the burden on the accused one should look at the practicalities. If one side would have serious difficulties in proving something, there was an inference that that party did not bear the burden. It was also a factor whether the crime was serious or not. If it was serious, it was more likely than not that the prosecution bore the onus. The burden was not likely to be placed on the accused, for it ought not easily to be held that Parliament did not intend to protect the innocent. (Jefferson, ibid., pp. 19–22).

- CABARET A computer system for argumentation from AI & Law (Rissland & Skalak, 1991). See Section 3.9.1. Blackboard systems (q.v.) have found application in legal computing: "GBB is an expert system shell based on the blackboard paradigm. It provides the blackboard database infrastructure, knowledge source languages and control components needed by a blackboard application. It is used in the construction of the CABARET legal knowledge based system" (Stranieri & Zeleznikow, 2005a, Glossary). Ashley's (1991) HYPO system (which modelled adversarial reasoning with legal precedents) was continued in the CABARET project (Rissland & Skalak, 1991), and the CATO project (Aleven & Ashley, 1997).
- **CACTUS** A piece of software (a simulation system based on a multi-agent architecture) for training police officers in managing public order events, while communicating as they would in a real situation (Hartley & Varley, 2001). See at the end of Section 6.1.6.2.
- **Carneades** A computer tool, implemented using a functional programming language and Semantic Web technology, based on a particular formal model of argumentation (Gordon & Walton, 2006). See Section 3.7.
- **Case-based learning** Learning from case studies, in an educational setting (Williams, 1992). It has provided inspiration for *case-based reasoning* in artificial intelligence. Leake (1996) remarked (citing Williams, 1992): "Although case studies already play a useful role in legal and medical education, students using them generally do not confront the complexity of real episodes and do not have the opportunity to act to execute, evaluate, and revise their solutions".
- **Case-based reasoning (CBR)** A methodology in artificial intelligence, that instead of matching rules from a ruleset to a situation at hand, tries to match it to some entry from a pool of past cases, by calculating how close they are according to various features (e.g., Leake, 1996; Veloso & Aamodt, 1995). This is similar to, and at least in part overlapping with, *analogical reasoning* (Veloso, 1994). Stranieri and Zeleznikow (2005a) provide this definition:

Case based reasoning is the process of using previous experience to analyse or solve a new problem, explain why previous experiences are or are not similar to the present problem and adapting past solutions to meet the requirements of the present problem.

The contrast between *rule-based* and *case-based* intelligent systems from artificial intelligence should not be mistaken for the contrast between such legal jurisdictions that mainly judge based on precedent (which is the case of Anglo-Saxon countries), and such jurisdictions (such as France) where adjudication is mainly based on rules as stated in law as made by legislators.

Moreover, the two opposite pairs do not overlap even when either rule-based or case-based reasoning is adopted in intelligent software systems applied to the legal domain. Bain's JUDGE system (Bain, 1986, 1989a, 1989b) is, among the other things, a tool whose AI mechanism is case-based reasoning. It adopts a hybrid approach involving both rule based and case based systems. JUDGE is a

cognitive model of judges' decision-making when sentencing (and indeed it was based on interviews with judges).

Also see model-based case-based reasoning paradigm.

- **CaseMap** A commercial software tool for organizing the evidence. It is produced by CaseSoft, an American firm (www.casesoft.com) See *procedural-support systems*, and Section 4.1.1.
- **Case disposition** The manner a case is concluded, i.e., in criminal cases, by conviction, by acquittal, or by plea bargain (a predominant mode in the United States), or by the prosecution's decision not to prosecute, or by the alleged victim withdrawing the charges, or by the defendant dying or becoming incapacitated during the trial. In civil cases, case disposition includes: by the court finding for one of the parties, or by settlement out of court, or by *alternative dispute resolution* (either *arbitration*, or *binding* or *nonbinding mediation*), or by withdrawal of one of the parties (i.e., an employee who cannot afford to pay legal expenses so s/he could have his or her day in court at an employment tribunal), or by forgival and reconciliation.
- **CATO** A computer system for argumentation from AI & Law (Aleven & Ashley, 1997). See Section 3.9.1.

Chances, doctrine of See doctrine of chances.

- **Character** In reference to *evidence of disposition and character*: "The word 'disposition' is used to denote a tendency to act think or feel in a particular way. The word 'character' may include disposition, or sometimes mean 'general reputation' or merely the question of whether or not the accused has a criminal record" (Osborne, 1997, p. 313). See **character evidence**, and see **evidence of disposition**.
- **Character vs. action** In argumentation: Walton et al. (2008, p. 330) describe argumentation schemes relating an agent's character to an agent's actions. In particular, §31.3, "Abductive Scheme for Argument from Action to Character", is as follows:

*Premise*: Agent *a* did something that can be classified as fitting a particular character quality.

Conclusion: Therefore, a has this character quality.

Critical Questions

CQ1: What is the character quality in question?

CQ2: How is the character quality defined?

CQ3: Does the description of the action in question actually fit the definition of the quality?

By contrast, §31.4, "Scheme for Argument from Character to Action (Predictive)" is as follows:

*Premise*: Agent *a* has a character quality of a kind that has been defined.

*Conclusion*: Therefore, if *a* carries out some action in the future, this action is likely to be classifiable as fitting under that character quality.

Critical Questions CQ1: What is the character quality in question? CQ2: How is the character quality defined? CQ3: Does the description of the action in question actually fit the definition of the quality?

Thus, in both cases the critical questions are the same. Walton et al. (2008, pp. 330–331) added this comment:

*Comment*: Even though the critical questions are the same for both, the predictive scheme for argument from character to action needs to be distinguished from the retroductive scheme that reasons from character to a particular action, and these two schemes need to be distinguished from the argument from a past action to an agent's character.

Their §31.5, 'Retroductive Scheme for Identifying an Agent from a Past Action' (ibid., p. 331) is as follows:

Factual Premise: An observed event appears to have been brought about by some agent a.

*Character Premise*: The bringing about of this event fits a certain character quality Q. *Agent Trait Premise*: *a* has Q.

Conclusion: a brought about the event in question.

Cf. in Walton's *Legal Argumentation and Evidence* (2002, p. 44). Douglas Walton devoted a book to character evidence (Walton, 2006b).

Character evidence Arguments in favour or against a party in a trial, based on flattering or unflattering biographical data. According to the jurisdiction, use of such evidence is not always permitted. Evidence of prior convictions is a form of evidence of disposition and character. Another form is uncharged conduct, by which *uncharged misconduct* is intended: such past misconduct for which no charges were brought. There is much debate about the question of whether evidence of prior convictions has sufficient probative value to be heard by the trier of fact (a jury or a trained judge). At least in some cases (typically, against suspect child-molesters), it may be helpful to point toward what may have been the factual proof, to let it be known that the defendant had already been convicted of the same kind of offence. Nevertheless, in the law of evidence in some countries, exclusionary rules about which evidence can be used apply: rules of *extrinsic policy* give priority to other values (such as the protection of personal rights) over rectitude of decision. It is important to bear in mind that *legal truth* and *factual truth* are not identical. Yet, even withholding from a jury the information that the defendant had prior convictions, such a policy does not extend to a claim that police officers and law enforcement personnel should forego the use of prior convictions, while carrying out criminal investigations. Such a claim has been made, and goes by the name of *jury observation fallacy*.

Osborne (1997, p. 319) remarks about English law: "The general rule was that the character of any party in a civil case, or any witness in any case, is open to attack. The purpose of such attack is of course to show that the party or witness should not be believed". Yet "the fundamental rule [...] is that the prosecution may not for the purpose of proving an accused's guilt adduce evidence

of the character of the defendant whether of previous behaviour, previous convictions, or general reputation. The reason is obviously the extreme prejudice to the accused in the eyes of the jury. The main exception to this is the use of the 'similar fact' principle'' (ibid.). See **similar fact evidence**. Osborne remarks (ibid.):

It has been recognised from the 18th century that an accused could call witnesses to speak to his good character, or cross-examine prosecution witnesses in order to get them to do so. This was exceptional and was intended as an additional protection for an accused, who could not testify before 1898. The important point to note however is that *character is indivisible*. One cannot assert a good character for one type of behaviour without the prosecution having the right to cross-examine or call evidence about other aspects of one's character. [...] It [is] not open to an accused to put only half of his character in issue.

The defendant loses his shield (his protection from bad character evidence) if he makes *imputations* on the character of the prosecutor or of prosecution witnesses, but determining what is an imputation is not easy. See **shield**, and see **imputation**.

"There were numerous cases in the period 1990–1993 which left unclear what direction the judge [to the jury] the judge should give in respect of a defendant with good character who chooses not to testify" (ibid., p. 320). Should good character only, or primarily instead, affect credibility? If it only affects credibility, then as the defendant didn't testify, good character evidence is of no use. It is useful, instead, if it is admitted by the court that good character is capable of being relevant to innocence.

Allen and Pardo (2007a) offered a critique, in terms of the *reference-class problem* (q.v.) of how probability theory was applied to juridical proof concerning character impeachment evidence in Friedman (1991).

Within research into argumentation, see Douglas Walton's (2007) *Character Evidence: An Abductive Theory.* 

- **Claimant** In civil cases in England and Wales, the party that turns to the courts for adjudication against another party. In the *Civil Procedure Rules 1993*, the term *plaintiff* was replaced with *claimant* (thought to be a more transparent, and more widely understood term: the same reform excised other traditional terms as well).
- **Common law** In countries like Britain there are both *statutory law*, i.e., laws passed by parliament, and *common law*, i.e., the body of sentences passed by judges, and that serve as precedent. On the European Continent, what really matters is statutory law, and the courts must abide by it when adjudicating.
- **Complexity (of a trial), or complex litigation** Such features that may push a case beyond a jury's ability, because a difficult challenge is posed to reasoned decision-making. Tidmarsh (1992) and Hewer and Penrod (1995, p. 531) discuss *substantive definitions* of trial complexity, i.e., based on the substance of a case (e.g., antitrust, securities and takeover litigation, or commercial disputes, and products liability torts, or sometimes breach of contract cases); *procedural definitions* of trial complexity (e.g., complexity during the pre-trial phase, complexity during the trial, complexity in the implementation or administration of remedies following the verdict, and complexity arising from the number of

parties); and "*laundry list*" *definitions* (based on the number of parties, the number of witnesses, the presence of a class action, the existence of a product liability claim, the presence of related cases involving multiple or complex factual or legal issues, the extent of discovery).

Hewer and Penrod (1995, p. 533) recommend the following actions in order to alleviate problems arising from trial complexity according to three dimensions, namely, complex evidence, complex law, and voluminous evidence (for short henceforth: E, L, V): Better organisation of voluminous evidence (E, V); Explain complex legal issues more clearly (L); Limit the volume of evidence (E, V); Limit the time for presentation of evidence (E, V); Stipulate to facts before the trial (E, V); Allow fewer trial interruptions (V); Provide jury with notebooks including pictures and information about witnesses and exhibits (E, V); Allow juror note-taking (E, L, V); Allow jurors to question witnesses (E); Instruct the jurors prior to the evidence (E, L); Provide jurors with written copy of the judge's instructions (L); More thorough responses to juror questions during deliberations (E, L, V); Specially qualified (blue ribbon) juries (E, L, V); Special masters, i.e., neutral experts to assist jury (E, L, V); Special verdict forms with detailed questions for the jury to answer (L); Judge commenting or summarising of evidence (E, V); Greater reliance on summary judgement (E, L, V); Bifurcation of issues (E, V); Bifurcation of parties (V).

We have dealt with complexity in another sense in Section 6.2.1.7: the *GOMS* (*Goals, Operators, Methods, Selections*) family of models of *cognitive complexity* includes the *GOMS Keyboard-Level Model* (*KLM*), developed by Kieras (2001), and which provides a tractable means of measuring human involvement in an operational process.

**Composites** Composite images of human faces, used for suspect identification. Facial portraits, or *mugs*, typically are not composites, but rather a photograph (*mugshots*), or then portraits of suspects are, drawn by a sketch artist manually, based on a verbal description of a victim or eyewitness (*Identi-kit* procedures). An alternative to mugs and to artist's sketches is a *composite*, by which initially a photographic *photofit* was intended. The term *photofit* is still in use in the U.S., whereas in the U.K. the more general term *composite* is preferred. Old computerized systems for composites include E-FIT, PROfit (CD-FIT), and Mac-A-Mug Pro. An advanced tool is CRIME-VUs. See Section 8.2.2.

In non technical language, especially in the media, the differences between the various kinds of pictorial or photographic support for suspect identification tend to be blurred, and also the status of the person sought is imprecise. For example, in Italian the media would refer to *fotografie di pregiudicati*, e.g., literally, "photographs of ex-cons", whereas in Israeli Hebrew mug shots are often referred to informally as *foto-rétsakh*, i.e., literally, "photo-murder".<sup>5</sup> Such descriptors are grossly imprecise. (The Hebrew for "composite" is *klasterón*.)

<sup>&</sup>lt;sup>5</sup> I received the following (impressionistic) explanation for how the term *foto-rétsakh* came into being – denoting not only mugshots, but also such passport-sized photographs that are perceived to resemble the police's mugshots. In the 1940s and 1950s, one method of shooting facial photographs

Such images are sometimes made public, not only in order to track down a person wanted on suspicion of a crime, or some youngster or old and forgetful person who has disappeared. Police may release an artist's impression of the face of a dead person they want to identify. That is to say, they already have him or her, but are unaware of that person's identity. The same may apply to a sufferer of amnesia.

- **Compusketch** A system for assisting a witness in approximating his or her description of the facial features of a criminal suspect. It is a computerised version of the Photofit process. See Section 8.2.2.
- **Computational forensics** Computer techniques subserving any discipline within forensic science. See Frank and Srihari (2008). *Computational forensics* should not be mistaken for **computer forensics** (q.v.).
- **Computer crime** Crime that exploits the vulnerability of computer systems, and takes place through breaches of *computer security*. See Section 6.2.1.5.
- **Computer forensics** Another name for *forensic computing*. Also see **digital forensics**. See Section 6.2.1.5. This is quite different from what is meant by **computational forensics** (q.v.).
- **Computer investigation** Actions undertaken, either by the police or by an organisation that experienced computer crime, in order to identify suspect perpetrators as well as in order to find out they managed to evade computer security measures.
- **Computer security** A discipline that provides a preventative response to *computer crime*.
- **Confabulation** A defect of testimony: the witness is also inferring, not merely reporting. *Confabulation* in depositions may occur because witnesses discussed their recollections, and this had an effect on what they later think they remember. In particular, if it was two eyewitnesses who saw the same event and then discussed it, this may influence what they later claim to remember; this is sometimes referred to as *memory conformity*.
- **Confirmationism** An approach to questioning witnesses, which seeks to confirm a given account. It is a flawed approach, and Voltaire lampooned it. *Confirmation bias* as occurring in the police interrogation rooms, see e.g. Kassin et al. (2003), Meissner and Kassin (2002), and Hill et al. (2008).

Confrontation right The right of a defendant to confront his accusers in court.

**Consistency question** In argumentation studies, Walton's (1997) *Appeal to Expert Opinion* offered (ibid., pp. 211–225) an argumentation scheme for "Argument for Expert Opinion", then reproduced in Walton et al. (2008, pp. 381–382). See s.v. Expert opinion, *Appeal to* above. The expert source is *E*; the subject domain is *S*;

was to have a man who had to be photographed introduce his head into a hole in a black curtain. The resulting photograph supposedly appeared to portray a murderer. But perhaps this explanation I was given in 2010 is a rationalisation *ex post facto*, which makes it appear as though it was a passport-sized photograph that was initially called *foto-rétsakh*. More plausibly, the term denoted mugshots ab initio, and it was only by metaphorical interpretation of the thing denoted (i.e., the *signified*, as opposed to the *signifier*, which is the word itself), that the term was also applied by some to passport-sized photographs with a dark backdrop (especially of an old kind), if that.

and *A* is a proposition about which *E* claims to be true (or false). The consistency question is: "Is *A* consistent with what other experts assert?". It is articulated in two subquestions: "Does *A* have general acceptance in *S*?"; "If not, can *E* explain why not, and give reasons why there is good evidence for *A*?".

**Contrary-to-duty obligations** A norm is violated, yet there are norms about how to deal with such a situation of violation. S.v. **time** in this Glossary, we consider some procedural constraints on temporal sequence at a trial, and how they can be allowed sometimes to be violated. Wishing to model this in terms of AI techniques, it makes sense to resort to techniques concerning contrary-to-duty obligations. Contrary-to-duty obligations are sometimes called *reparational obligations*, when the concept is concerned (as it often has been in the scholarly work of logicists within research into deontic logic) as *remedial obligation* for a state of affairs contravening a previous obligation; see, e.g., Parent (2003).

A related example is that known by philosophers as the one of the *gentle murderer*: one shall not murder, but if he does, let him do it gently; "gentle murder" is also called the *Forrester paradox* (Forrester, 1984). Research on contrary-toduty obligations is related to *conditional obligations*; on the latter, see Chellas (1974), and on the relation between the two classes of obligations, see Tomberlin (1981). Horty (1993) deals with both classes in terms of nonmonotonic deontic logic.

For a discussion of contrary-to-duty obligations (or contrary-to-duty impera*tives*), see e.g. Carmo and Jones (2002), which is an encyclopedic entry, as well as Chisholm (1963), Åqvist (1967), Hage (2001), Carmo and Jones (1996), Prakken and Sergot (1996, 1997), and Governatori and Rotolo (2002). An approach that resorts to Petri nets (a graph representation expressing constraints on temporal precedence) for the representation of deontic states (i.e., states of obligation), including contrary-to-duty obligations, has been proposed in Raskin et al. (1996). By the same team, the paper by van der Torre and Tan (1999) is on contrary-toduty reasoning. Ursu and Zimmer (2002) are concerned with the representation of duty and contrary-to-duty statements, in computer-aided design tools of the class of critiquing intelligent design assistants. Examples given by Ursu and Zimmer in section 4, of a secondary (contrary-to-duty) obligation that comes into effect when the primary obligation is violated, include: "Preferred design: uniform wall thickness should be used", yet: "When unavoidable" - i.e., when walls must have a different thickness - "transition from one wall thickness to another should always be as smooth as possible". Or then this other example: "There must be an alternative escape route from all parts of the building. However, in the following situations a single route is acceptable".

**Convince Me** A computer tool for supporting argumentation (Schank & Ranney, 1995). It is one of the tools reviewed in van den Braak et al. (2006) It is based on Thagard's Theory of Explanatory Coherence (e.g., Thagard, 2000a). The arguments consist of causal networks of nodes (which can display either evidence or hypotheses), and the conclusion which users draw from them. *Convince Me* predicts the user's evaluations of the hypotheses based on the arguments produced, and gives a feedback about the plausibility of the inferences which the users draw.

- **Coplink** A tool for criminal intelligence analysis, developed for the Tucson police at the University of Arizona, and performing *network link analysis*. See Section 6.2.5.
- **Corpus** (plural: **corpora**) A collection of documents. For example, corpora are what *information retrieval* tools and *text mining* search automatically. See Section 6.1.9.
- **Corroborative evidence** "Corroborative evidence is that which independently tends to support or confirm other evidence" (Osborne, 1997, p. 303). "The general rule [in England] has always been that evidence does not require corroboration and that the court may act on the uncorroborated evidence of one witness alone, however serious the charge" (ibid.). Still in English law:

Until 1995, however, there were individual classes of cases where the type of evidence. or the type of witness, were deemed inherently "suspect" in some way so as to require extra caution from a court before it considered its verdict. The law on corroboration evolved in a haphazard and piecemeal way and was burdened with difficult technicalities. Classically, three kinds of witness were thought to be sufficiently suspect to require corroboration of their evidence before there could be a conviction, namely children, accomplices, and victims of a sexual offence. There were, in addition, rules which indicated that corroboration should generally be looked for in any case where a witness might have some personal motive for wishing to secure the conviction of the accused, for example someone who had a grudge against the accused, or who might himself have fallen under suspicion of the crime in question. In these cases, a judge would have to remind the jury, in very technical terms, of the risk of convicting on the evidence of the "suspect" witness and then go on to describe what items of evidence could have the technical quality of corroboration on the particular facts of the case. Judges were notoriously prone to get aspects of corroboration wrong, either by directing the jury with insufficient force about the risks of acting without corroboration, or by misidentifying items of evidence in the case which they might say were technically capable of amounting to corroboration but which in fact lacked the necessary quality (ibid.).

Reform abolished the requirement for corroboration of evidence from given categories of witnesses, and also the requirement for the judge to give a warning to the jury ceased to be mandatory and became discretionary (ibid., pp. 304–305).

**Criminal trial** (as opposed to *civil trial*). In Anglo-American jurisdictions, the sequence is as follows. Initially, there is the *indictment*. Then, the accused is asked to plea *guilty* or *not guilty*. If the defendant pleas guilty (which typically is because of a *plea bargain*), the court hears the facts from the prosecution (with no need to present evidence), then the defence may intervene, and finally the sentence is given. If the defendant pleas not guilty, the case will have to be prosecuted. There is an adjournment to an agreed date. Then the adjourned hearing takes place, following *adversarial* lines (as typical of the *common law* system of Anglo-American jurisdictions). There is the prosecution witness, there is an *examination in chief* of the witness on the part of the prosecution, followed by *cross-examination* of the prosecution. Then there is the close of the prosecution case. (Now the defence may submit that there is no call to answer. If the court accepts this, then the defendant is discharged. Otherwise:) Defence calls

witnesses. For each one of the defence witnesses, there is an *examination in chief* of the witness by the defence, then *cross-examination* on the art of the prosecution, and sometimes *re-examination* by the defence. Then there is the defence's closing speech to the bench. Now the prosecution may have one more speech, but if this is the case, then the defence must have the last word. Now the factfinders (either lay magistrates, i.e., jurors, or one or more stipendiary magistrates, e.g., trained, professional judges) retire to consider their decision. (if there is a jury, the jury receives instructions from the judges before it retires.) Then the magistrates return and give the verdict (and state no reason). If the verdict is *not guilty*, then the defendant is discharged. If the verdict is *guilty*, then the court hears the facts from the prosecution (with no need to present evidence), and next the defence may intervene. Finally, the sentence is given. See *utility*, and *beyond a reasonable doubt*.

- **CRIME-VUs** A project which produced EvoFIT (under the lead of Charlie Frowd), a computer graphic tool for suspect identification, and validated it with techniques from experimental psychology. The project was conducted at the University of Central Lancashire in Preston, and the Faces Lab of the University of Stirling, Scotland. The approach combines facial composites, sketches, and morphing between facial composites. See Section 8.2.2.4.
- **Cross-examination** Questioning of one of the parties, or of a witness called by one of the parties at a trial, by the other party's lawyer. See **examination**. During cross-examination, not always questions are direct. Implication and innuendo are often effective. By accumulating details, it is in their *final statement to the court* (also called *final argument*, or more often *closing arguments*) that lawyers propose an account that puts facts in relation to each other, make characterisations, and draw conclusions.
- **CSI** Crime scene investigation.
- **Daedalus** A tool for supporting the activities of the *sostituti procuratori* (examining magistrates and then prosecutors) in the Italian judiciary. Developed by Carmelo Àsaro. A related tool is *Itaca*. See *procedural-support systems*, and Section 4.1.3.
- **DART** A tool for supporting argumentation (Freeman & Farley, 1996), which was applied to legal situations also by Gulotta and Zappalà (2001). See Section 3.7.
- **Dead Bodies Project** A project (Zeleznikow & Keppens, 2002, 2003; Keppens & Schafer, 2003a, 2004, cf. 2005, 2006) intended to help at *inquests* aiming at ascertain the causes of death, when *prima facie* a crime cannot be ruled out. See Section 8.1.
- **Decision tree** A conditional structure of flow control. Decision trees (as well as IF/THEN rules) are automatically extracted from databases by *machine-learning* tools. Several machine-learning commercial products that primarily produce decision trees were described by Mena (2003, section 7.9, pp. 221–229):
  - AC (http://www.alice-soft.com)
  - Attar XperRule (http://www.attar.com/)
  - Business Miner (http://www.businessobjects.com)

- C5.0 (http://www.rulequest.com/), also a rule-extractor; for expecially large databases (its algorithm is also used in SPSS's Clementine)
- CART (http://www.salford-systems.com), also a rule-extractor; very powerful and accurate, but relatively slow, and for numeric data only
- Cognos Scenario<sup>6</sup>
- Neurosciences aXi Decision Tree<sup>7</sup>
- SPSS Answer Trees<sup>8</sup>
- as well as several free decision tree software tools.<sup>9</sup>
- **Deafeasibility** Carbogim et al. (2000) presented a comprehensive survey of defeasible argumentation. In this book, we have dealt with *defeasibility* in Sections 3.3 and 3.9.1. "Nonmonotonic reasoning [q.v.], because conclusions must sometimes be reconsidered, is called *defeasible*; that is, new information may sometimes invalidate previous results. Representation and search procedures that keep track of the reasoning steps of a logic system are called *truth maintenance systems* or TMS. In defeasible reasoning, the TMS preserves the consistency of the knowledge base, keeping track of conclusions that might later need be questioned" (Luger & Stubblefield, 1998, p. 270).
- **Defence** In court, and previously during the preparations for the trial, the formal standing (and actions taken in that role) of the accused (the defendant) and of his lawyers on his behalf (but he may be representing himself, without resorting to a lawyer).
- **Defendant** The party against whom the *plaintiff* (who in particular may be the *prosecution*) turns to the courts for adjudication. In some kinds of trial, the names are *applicant* for the plaintiff, and *respondent* for the defendant.
- **Dempster-Shafer theory** In statistics and in artificial intelligence: "Dempster-Shafer theory [Shafer, 1976] has been developed to handle partially specified domains. It distinguishes between uncertainty and ignorance by creating belief functions. Belief functions allow the user to bound the assignment of probabilities to certain events, rather than give events specific probabilities. Belief functions satisfy axioms that are weaker than those for probability theory. When the probabilistic values of the beliefs that a certain event occurred are exact, then the belief value is exactly the probability that the event occurred. In this case, Dempster-Shafer theory and probability theory provide the same conclusions" (Stranieri & Zeleznikow, 2005a).
- **Deontic, deontology** Pertaining to duty and permissibility. Deontic logic has operators for duty. Deontological arguments appeal to principles of right or wrong, ultimate (rather than *teleological*) principles about what must, or ought or must not or ought not to be or be done.

<sup>&</sup>lt;sup>6</sup> http://www.cognos.com/products/scenario/index.html

<sup>&</sup>lt;sup>7</sup> http://www.neurosciences.com

<sup>&</sup>lt;sup>8</sup> http://www.spss.com/spssbi/answertree/

<sup>&</sup>lt;sup>9</sup> Such free software tools are linked to from the data mining portal www.kdnuggets.com

- **Deontic logic** A modal logic of obligation and permission. Established in the 1940s. It was especially prominent in AI & Law research from the 1970s. See, e.g., Nissan (2008a), Åqvist (1984, 1986), Jones and Sergot (1992). Also see **contrary-to-duty obligations**.
- **Digital anti-forensics** Strategies to evade computer forensic investigations, as well as ways to exploit critical failures in computer forensics software or in the reliability of computer security systems. Section 6.2.1.5.
- **Digital forensics** A discipline that provides techniques and strategies for tackling crime involving digital media.
- **Digital forgeries** Forged items involving digital media, such as images. They are to be detected by *digital forensics*, or in particular *digital image forensics*. See Section 8.2.5.

Digital image forensics See image forensics.

**Discretion** The faculty of making a choice, rather than being compulsively directed. In the legal context, there is e.g., **prosecutorial discretion** (q.v.). But there also is *judicial discretion*. Duke University's George Christie began 'An Essay on Discretion' (Christie, 1986) by stating (ibid., p. 747):

Few terms have as important a place in legal discourse as "discretion". Despite the importance of the term, however, those who use it do not agree on its meaning. It is universally accepted that discretion has something to do with choice; beyond this, the consensus breaks down.

If there is little agreement about the meaning of discretion, there is even less agreement about its desirability. Indeed, participants in the judicial process and observers of that process take a schizophrenic view of discretion. Sometimes they praise it and sometimes they execrate it.

In particular, there is a distinction between *primary discretion* and *secondary discretion* (ibid., pp. 747–748):

In the judicial context, [Maurice] Rosenberg distinguishes between primary discretion and secondary discretion. Primary discretion arises when a decision-maker has "a wide range of choice as to what he decides, free from the constraints which characteristically attach whenever legal rules enter the decision process." Used in this sense, discretion can mean simply that a person has the authority to decide. Courts, judges, and legal scholars often use the term *discretion* in this sense, referring simply to authority to decide, or unconstrained choice.

That is Rosenberg's *primary discretion*. Moreover (Christie, ibid., pp. 748–749; the brackets are Christie's):

Rosenberg contrasts the primary form of discretion with "the secondary form, [which] has to do with hierarchical relations among judges."

The secondary form of discretion enters the picture when the system tries to prescribe the degree of finality and authority a lower court's decision enjoys in the higher courts. Specifically, it comes into full play when the rules of review accord the lower court's decision an unusual amount of insulation from appellate revision. In this sense, discretion is a review-restraining concept. It gives the trial judge a right to be wrong without incurring reversal. In the limiting case, the choice made by a person exercising primary discretion is by definition the correct choice. The correctness of the choice cannot be attacked because there are no external criteria on which to base such an attack. When secondary discretion is involved, one can attack the correctness of the choice, although the authority of the person to make that choice cannot be attacked. Thus secondary discretion involves the authority to make the wrong decision.

Christie mentions two examples Rosenberg gave, from college football, and notes: "In both cases, everyone agreed that the officials were clearly wrong; but, in both instances, no redress for those errors was possible" (ibid., p. 749). Rosenberg however was "concerned with the effect of secondary discretion on appellate courts' treatment of certain contested rulings of trial courts, particularly procedural rulings such as denials of motions for new trials" (Christie, ibid.). However, as "in any hierarchically organized bureaucracy, there are limits to the amount of perverseness that superiors are prepared to tolerate in their sub-ordinates" (ibid.), practically "Rosenberg's secondary discretion – the authority to make wrong decisions – usually boils down to the authority to make decisions to which reviewing authorities will accord a presumption of correctness." (ibid.) Nevertheless: "The reviewing authority will intervene only if the initial decisionmaker *abused* his discretion" (ibid.). Christie conceded (ibid., fn 12):

Behind this linguistic formula, of course, lie the difficult questions: How perverse must the initial decision be before it will be said to be an abuse of discretion? And are there any objective criteria for deciding degrees of abuse?

Christie then proceeded to remark about when the two kinds of discretion merge, and what the difference is (ibid., 749–750):

A cynic might contend, however, that Rosenberg's notion of secondary discretion merges with what he calls primary discretion when an inferior is given the authority to make wrong choices that cannot be overturned. There is no practical difference between the authority to make whatever decision one chooses and the authority to make decisions that will be enforced even if they are felt to be wrong. Indeed, primary and secondary discretion do sometimes seem to merge at the edges, but one clear distinction exists – different types of criticism can be leveled at decisions made under different types of discretion.

Also consider *strong discretion*: "According to Dworkin, strong discretion characterises those decisions where the decision-maker is not bound by any standards and is required to create his or her own standards" (Stranieri & Zeleznikow, 2005a, Glossary). Stranieri and Zeleznikow (2005a) also explained:

[Dworkin 1977] presents a systematic account of discretion by proposing two basic types of discretion, that he called strong discretion and weak discretion. Weak discretion describes situations where a decision-maker must interpret standards in her own way, whereas strong discretion characterises those decisions where the decision-maker is not bound by any standards and is required to create his or her own standards. [MacCormick, 1981] does not dispute this conceptualisation but contends that Dworkin's distinction between typologies is one of degree and not of type.

**Discretionary** As opposed to *mandatory*. In particular, as applied to judicial decision-making: what is up to the judge to decide, unfettered by mandatory

rules. See Section 4.2.5. However, see the entry for **discretion** above. Kannai, Schild, and Zeleznikow (2007) offer an artificial intelligence perspective on legal discretion. Meikle and Yearwood (2000) are concerned with the provision of support for the exercise of discretion, and how the need to avoid the risk of adversely affecting it when using a computer tool, inspired the structural design of EMBRACE, a decision support system for Australia's Refugee Review Tribunal. Leith (1998) has warned about the risks, with AI applications to law, that judicial discretion be restricted, if computer tools come to be involved in the judicial decision-making process.

Meikle and Yearwood (2000) classify legal decision-making in four quadrants, according to two operational dimensions: "One dimension is the extent to which a system should either be an "outcome predictor" (a highly convergent aim) or should give access to diverse resources about the issues of interest (a highly divergent aim). This is the *predictive-descriptive* dimension. The other is the extent to which a system either needs to support discretion (by permitting complete autonomy, perhaps because the domain has no constraints) or needs to support weak discretion (by permitting only that allowable within prescribed constraints). This is the *strong-weak discretion* dimension" (Meikle & Yearwood, 2000, p. 101).

It was proposed that EMBRACE, as well as Bench-Capon's PLAID (Bench-Capon & Staniford, 1995), may be placed in the quadrant characterised by strong discretion and descriptiveness (instead of predicted outcome, which when there is strong discretion lets the user override the prediction either partly or altogether). We argue that the evolution of *Daedalus* is from weak to strong discretion (provided that validation steps are safeguarded), and that the approach is descriptive, whereas predictiveness is avoided out of a concern to ensure fairness to the suspects.

Also see Lara-Rosano and del Socorro Téllez-Silva's article (2003) on fuzzy<sup>10</sup> support systems for discretionary judicial decision making.

- **Disposition** "The word 'disposition' is used to denote a tendency to act think or feel in a particular way. The word 'character' may include disposition, or sometimes mean 'general reputation' or merely the question of whether or not the accused has a criminal record" (Osborne, 1997, p. 313). See **evidence of disposition**.
- **DNA evidence** An important use (yet not the only use) of such evidence is for the purposes of identifying perpetrators. See Section 8.7.2.
- **Dock identification** "An old practice, now disapproved [in England], is the so-called 'dock identification' [...] where a witness is asked if the man seen at the scene of the crime is present in court. There will clearly be a tendency to look at the man in the dock and pick him just because he is there in that position" (Osborne, 1997, p. 305). "Obviously there is no theoretical objection to a witness testifying that the accused is the man he saw commit the crime. This is direct evidence by a first-hand observer. [Yet], where this happens (i.e. where the witness sees the accused at the trial for the first time after the offence) it is known as a 'dock

<sup>&</sup>lt;sup>10</sup> Fuzzy logic is the subject of Section 6.1.15 in this book.

identification' and is frowned on except in exceptional circumstances" (ibid.). A remedy is *identification parades*, for which, see Section 4.5.2.3.

**Doctrine of chances** The odds that a new event is just a coincidence, in view of similar past events. In legal scholarship, it is discussed along with uncharged conduct as being a kind of character evidence, and in particular with the somewhat different concept of similar fact evidence (see s.vv.). Sometimes an expert witness would err clamorously with the statistics: "Forensics and expert witness investigations currently have a high profile in the media, principally in the field related to medical practitioners. The discrediting of evidence provided in the notorious Sally Clark case by Professor Sir Roy Meadows, has made many 'experts', not only medical, but also those operating in different professions, stop and take stock of how we undertake expert witness work, be it within the realm of Civil or Criminal Law" (Smith, 2006). In Britain, Sally Clark, a lawyer by profession, lost her apparently healthy firstborn son, aged 2<sup>1</sup>/<sub>2</sub> months, to sudden death in December 1996, and then, in January 1998, also her second baby, aged two months, in similar circumstances. She was convicted in November 1999 (by a 10–2 majority) of smothering her two babies; she was sentenced to prison for life, and spent years in prison after her second baby died, in circumstances similar to the death of her firstborn son. Meadows had claimed that there was only one chance in 73 million for this to be a coincidence (no witness qualified in statistics was in court); in so claiming, the Leeds professor was shockingly inaccurate, as the death of siblings is not necessarily statistically independent. Eventually, the mother was released and the expert witness disgraced. After a while, he was reintegrated in the medical profession, and shortly afterwards Mrs. Clark died in her early forties. (In another British case, a young woman was able to refute a similar charge, by bringing evidence that her maternal lineage, traced back to India, had a story of infant death.) A prominent forensic statistician, Philip Dawid, has discussed the Sally Clark case ([2003] EWCA Crim 1020) in Dawid (2004b), which is highly readable even for ones with little mathematical background. A more technical paper is Dawid (2001b). Also see Dawid (2005b, Sec. 4.3 and in particular, Sec. 4.3.1). Already in January 2000, Stephen Watkins' editorial, 'Conviction by Mathematical Error?', was published in the British Medical Journal. Dawid finds that both Meadows' and Watkins' calculations were flawed. He was an expert witness in statistics for the defence at the appeal hearing.

Arguably the expert witness's testimony against Sally Clark had been influenced by a case in the United States, in which several babies of the same mother had been believed to have died of cot death, yet she was eventually convicted of having killed them herself.

The following quotations are quoted from Nissan (2001c, section 3: 'The Doctrine of Chances & Uncharged Conduct'); at the time, I was kindly referred to these by Peter Tillers (p.c., 9 Feb. 2000). In the *New York Times*, George Judson (1995) reported from Owego, N.Y., that a defendant, who was a "48-year-old woman accused of smothering her five infant children a quarter of a century ago, was convicted of their deaths today in Tioga County Court. In 1972, a leading medical journal cited the deaths of two infants from rural New York, 'MH' and

'NH', as compelling evidence that Sudden Infant Death Syndrome ran in families. Today, a jury found that the babies [...] were murdered by their mother, as were two brothers and a sister before them". The defendant "had confessed to state troopers last year that she had smothered her babies", "a chilling and detailed confession", yet according to her she "had testified that she made the confession only to end hours of questioning by state troopers, saying that her children had simply stopped breathing, sometimes even as she fed them" (ibid.). According to the confession, the babies crying spells were the trigger; in contrast, she "suggested in her confession", the boy she and her husband adopted afterwards is alive as "unlike the five others, he had survived his crying spells because his father was out of work and at home during his infancy, and she had not been left to cope with the child alone". The five murder verdicts are of murder by depraved indifference (i.e., without the conscious intention to kill). The Hoyt case from upstate New York "was striking [...] also for the family's place at the center of research" which at the time was prominent in promoting a medical theory on cot deaths (ibid.). "But to a forensic pathologist in Dallas, [...] the death of five children in one family from SIDS was statistically impossible, and she believed that [the aforementioned] research was leading pediatricians to disregard danger signs within some families" (ibid.). Benderly (1997) approaches the effect of the Hoyt diagnosis of old and recent multiple murder verdicts from the viewpoint of scientific error and its effects on subsequent research. Williams (1996), referring to the Hoyt case, pointed out: "Criminal defense lawyers know how difficult it is to overcome a confession in a criminal trial, for juries find it hard to fathom why anyone would falsely implicate oneself". "Confessions are usually used as ground truth but are not 100 per cent reliable" (Vrij, 1998a, p. 89); even "people considered as guilty by virtue of a confession may actually be innocent, as some innocent people do confess" (ibid.).

Prof. Tillers also kindly referred me (p.c., 9 Feb. 2000) to the "famous case 'Brides in the Bath'": "Rex v. Smith, 11 Cr. App. R. 229, 84 L.J.K.B.<sup>11</sup> 2153 (1915) (husband perhaps drowned a number of wives to recover insurance proceeds; at first sight the drownings were accidental but...)". Prof. Tillers also referred me to the news from the *New York Times* of Sunday, March 19, 1995; in the words of the report – from Hot Sulphur Springs, Colorado – "A woman whose 11 marriages earned her the nickname the Black Widow was convicted on Friday of torturing and killing her ninth husband" (NYT, 1995). This particular husband had "hired a private investigator when he began to suspect that she was lying about how many times she had been married", and had intended to sue her for fraud and emotional distress. She was divorced from all previous husbands, except the eighth (her marriage to the ninth was annulled for that very reason), and "except for an elderly man who died of natural causes", and this includes her having divorced (twice) from "the lawyer who helped her avoid questioning in the 1972 shooting death of her third husband". In closing arguments, defense

<sup>&</sup>lt;sup>11</sup> L.J.K.B. stands for Law Journal Reports, Kings Bench.

lawyers denied there was any physical evidence to dismiss the alibi of the two defendants (the woman and her boyfriend, also convicted, had claimed they had been away, camping). As to the admissibility of character evidence, it is remarkable that the two defendants were convicted even though "[t]estimony about her previous marriages was not allowed during her trial" (ibid.).

Moreover, Prof. Peter Tillers kindly sent me an article by a professor of Law from the University of California at Davis, Edward Imwinkelried (1990), a paper which "has an extensive discussion of the American view of the 'doctrine of chances". Imwinkelried's paper, "The use of evidence of an accused's uncharged misconduct to prove mens rea: the doctrines that threaten to engulf the character evidence prohibition", states: "The admissibility of uncharged misconduct evidence is the single most important issue in contemporary criminal evidence law. The issue has figured importantly in several of the most celebrated criminal trials of our time". The introduction starts by describing a hypothetical case in which: "The accused is charged with homicide. The indictment alleges that the accused committed the murder in early 1990. During the government's case-in-chief at trial, the prosecutor calls a witness. The witness begins describing a killing that the accused supposedly committed in 1989. The defense strenuously objects that the witness's testimony is 'nothing more than blatantly inadmissible evidence of the accused's general bad character'. However, at sidebar the prosecutor makes an offer of proof that the 1989 killing was perpetrated with 'exactly the same modus operandi as the 1990 murder'. Given this state of the record, how should the trial judge rule on the defense objection?" (Imwinkelried, ibid.).

Federal Rule of Evidence 404(b), "which is virtually identical to Military Rule 404(b)" (the paper was published in the American Military Law Review), "forbids the judge from admitting the evidence as circumstantial proof of the accused's conduct on the alleged occasion in 1990. [...] Thus, the prosecutor cannot offer the witness's testimony about the 1989 incident to prove the accused's disposition toward murder and, in turn, use the accused's antisocial disposition as evidence that the accused committed the alleged 1990 murder". Yet, the judge is permitted "to admit the evidence when it is relevant on a noncharacter theory", as "uncharged misconduct evidence 'may, however, be admissible for other purposes, such as proof of motive, opportunity, intent, preparation, plan, knowledge, identity, or absence of mistake or accident'. In our hypothetical case, the trial judge could allow the prosecutor to introduce the 1989 incident to establish the accused's identity as the perpetrator of the 1990 killing. If the two killings were committed with the identical, unique modus operandi, the uncharged incident is logically relevant to prove the accused's identity as the perpetrator of the charged crime without relying on a forbidden character inference. Hence, the judge could properly admit the testimony with a limiting instruction identifying the permissible and impermissible uses of the evidence" (Imwinkelried, ibid.).

"Unless the judge clearly explains the law governing stipulations, a juror might suspect that any accused who knew enough about the crime to stipulate to the *mens rea* must have been involved personally in the crime. [...] When the question is the existence of the *mens rea*, the prosecutor ordinarily has a much

more compelling need to resort to probative uncharged misconduct evidence. [...] The character evidence prohibition is violated when we permit a prosecutor to rely on the theory depicted in [Imwinkelried's] Figure 2 to justify the admissibility for uncharged misconduct evidence. [...] The courts should admit uncharged misconduct evidence under the doctrine to prove *mens rea* only when the prosecutor can make persuasive showings that each uncharged incident is similar to the charged offense and that the accused has been involved in such incidents more frequently than the typical person. [...]" (Imwinkelried, ibid., quoted the way it is excerpted in the the summary).

Inwinkelried's (1990) stated purpose in his paper "is to describe and critique [...] two lines of authority. The first section of the article discusses one line, namely, the case law advancing the proposition that the first sentence in Rule 404(b) [namely: 'Evidence of other crimes, wrongs, or acts is not admissible to prove the character of a person in order to show action in conformity therewith'] is automatically inapplicable whenever the prosecutor offers uncharged misconduct to support an ultimate inference of mental intent rather than physical conduct. The next section of the article analyses the second line of authority. That line includes the decisions urging that under the doctrine of objective chances, the prosecutor routinely can offer uncharged misconduct on a non-character theory to prove intent. Both lines of authority are spurious, and both represent grave threats to the continued viability of the character evidence prohibition".

**Double-counting the evidence** If the same item of evidence is then used again to make the evidence weightier, this is an example fo double-counting (Robertson & Vignaux, 1995, section 6.2, p. 95):

Each piece of evidence must be considered only once in relation to each issue, otherwise its effect is unjustifiably doubled. However, this does not mean that once an intem of evidence has been used by one decision-maker for one purpose it cannot be used by another decision-maker for another purpose. Thus, the fact that the police have used an item of evidence to identify a suspect does not mean that the court cannot use it to determine guilt.

If a defendant is treated as though his or her guilt were likelier, for the very fact that this suspect is being tried, this is an example of the evidence being double-counted (ibid.):

Of course, the court must not use the fact that the accused is in the dock as evidence of guilt and then also consider the evidence produced, since to do so would be to doublecount the evidence which led to the arrest and which is also used in court. Wigmore cautioned jurors "to put away from their minds all the suspicion that arises from the arrest, the indictment and the arraignment".

This does not mean that the evidence on which the arrest was made, or on which this suspect was identified and retained in the first place, should be given a lesser weight, in order to compensate (ibid.):

Fear of double-counting evidence has misled some about the weight of the evidence which caused the suspect to come under suspicion. A man might be stopped in the street because he is wearing a bloodstained shirt and we are now considering the value of the evidence of the shirt. It has been suggested that because this was the reason for selecting this particular suspect we should change the way the evidence should be thought about, that it is less useful than if the suspect was arrested on the basis of other evidence.

This is not correct. The power of the evidence is still determined by the ratio of the two probabilities of the accused having a bloodstained shirt if guilty and if not guilty. It is just that there happens to be less evidence in one case than the other. When the suspect is stopped because of a bloodstained shirt there may be no other evidence. When the suspect is arrested on the basis of other evidence and then found to have a bloodstained shirt, the likelihood ratio for the bloodstained shirt is to be combined with a prior which has already been raised by the other evidence. Once again the power of an item of evidence is being confused with the strength of the evidence as a whole.

## Doxastic Of or pertaining to belief.

Doxastic attitude An attitude of holding some belief.

**Doxastic logic** A modal logic of belief. In doxastic logic (or *logic of belief*), belief is treated as a modal operator. A doxastic logic uses Bx to mean "It is believed that x is the case." Raymond Smullyan (1986) defined several types of reasoners.<sup>12</sup> An *accurate reasoner* never believes any false proposition (modal axiom **T**). An inaccurate reasoner believes at least one false proposition. A conceited reasoner believes his or her beliefs are never inaccurate. A conceited reasoner will necessarily lapse into an inaccuracy. A *consistent reasoner* never simultaneously believes a proposition and its negation (modal axiom **D**). A normal reasoner is one who, while believing p, also *believes* he or she believes p (modal axiom 4). A *peculiar reasoner* believes proposition *p* while also believing he or she does not believe p. A peculiar reasoner is necessarily inaccurate but not necessarily inconsistent. It can be shown that a conceited reasoner is peculiar. The converse of a normal reasoner is a stable reasoner. If a stable reasoner ever believes that that he or she believes p, then he or she really believes p. A modest reasoner never believes  $Bp \rightarrow p$  (that is, that believing p entails that p is true), unless he or she believes p. A *timid reasoner* does not believe p (being afraid, as though, to believe p) if he or she believes that believing p entails believing something false. A queer reasoner is of type G and believes he or she is inconsistent, but is wrong in this belief. A type G reasoner is a reasoner of type 4 (see below) who believes he or she is modest.

According to Löb's Theorem, any reflexive reasoner of type 4 is modest. If a consistent reflexive reasoner of type 4 believes that he or she is stable, then he or she will become unstable: she will become inconsistent. A reasoner is of type 4 if he or she is of type 3 and also believes he or she is normal. A reasoner is of type 3 if he or she is a normal reasoner of type 2. A reasoner is of type 2 if he or she is of type 1, and if for every p and q he or she (correctly) believes: "If I should ever believe both p and  $p \rightarrow q$  (p implies q), then I will believe q." A type 1 reasoner has a complete knowledge of propositional logic: he or she sooner or later believes every tautology, i.e., any proposition provable by truth

<sup>&</sup>lt;sup>12</sup> This was summarised in http://en.wikipedia.org/wiki/Doxastic\_logic (to which we are indebted for the concepts in this entry).

tables (modal axiom N). If a type 1 reasoner ever believes p and believes  $p \rightarrow q$  (p implies q) then he or she will eventually believe q (modal axiom K).

A type 1<sup>\*</sup> reasoner is somewhat more self-aware that a type 1 reasoner. In fact, a type 1<sup>\*</sup> reasoner believes all tautologies; his or her set of beliefs (past, present and future) is logically closed under *modus ponens*,<sup>13</sup> and for any propositions p and q, if he or she believes  $p \rightarrow q$ , then he or she will believe that if he or she believes p then he or she will believe q.

- **Dynamic uncertain inference** Snow and Belis (2002) analysed "a celebrated French murder investigation" (p. 397), namely, the case of which Omar Raddad was convicted in Nice, in 1994, and then pardoned, the conviction being very controversial (the victim's body was found with, near it, a sentence accusing Raddad written on the floor, scrawled in the victim's blood). Snow and Belis (2002) "apply ideas about credibility judgments structured by graphs to the problem of dynamic uncertain inference. By *dynamic*, we mean that assessments of credibility change over time without foreknowledge as to the types of evidence that might be seen or the arguments that the [crime] analyst might entertain over time" (ibid., p. 397), in contrast with such "kind of belief change that occurs" when the possible outcomes of experiments "are typically known before one learns the actual outcomes" (ibid., pp. 397–398).
- **ECHO** A computer tool, based on artificial neural networks, for abductive reasoning, developed by Paul Thagard and first applied to the modelling of reasoning on the evidence in a criminal case in Thagard (1989). See Section 2.2.1.
- EMBRACE A decision support system for Australia's Refugee Review Tribunal.
- **Entanglement** A concept expressing an undercutting move in argumentation, in Verheij's (1999, 2003) *ArguMed* computer tool for visualising arguments (see Section 3.7). It was described by Verheij (1999, 2003). In the words of Walton et al. (2008, p. 398):

In ArguMed, undercutting moves, like asking a critical question, are modelled by a concept called entanglement. The question, or other rebuttal, attacks the inferential link between the premises and conclusion of the original argument, and thereby requires the retraction of the original conclusion. On a diagram, entanglement is representated as a line that meets another line at a junction marked by an X.

**Entrapment** Such circumstances of obtainment of evidence that the perpetrator was deceived, by being allowed or even enabled or incited to commit an offence, with law enforcement personnel present or even participating.<sup>14</sup> Osborne (1997, p. 298) remarked that in England, some cases

clearly established that, even when policemen acting in plain clothes and participating in a crime go too far and incite criminals to commit offences which would otherwise not have been committed, the law of evidence will not be used to discipline the police.

<sup>&</sup>lt;sup>13</sup> In logic, modus ponens states that from p being true and  $p \rightarrow q$ , we can deduce that q is true. As to  $p \rightarrow q$ , this is a *rule* (also called *clause*) such that "If p is true, then q is true"; q is a *logical consequence* of p.

<sup>&</sup>lt;sup>14</sup> See in the notes of Section 4.5.2.1 in this book.

There is no defence of "entrapment" known to English law and the law of evidence could not be used to create such a defence by the device of excluding otherwise admissible evidence. Where police had gone too far, the question of their misconduct will be dealt with in police disciplinary proceedings; but insofar the accused was concerned, entrapment would only be relevant to mitigate the sentence imposed, not to the question of admissibility.

- **Epistemic paternalism** According to philosopher of knowledge Alvin Goldman (1991), the attitude by which the rules of evidence prescribe that the jurors will not be provided with some of the evidence. See Section 4.3.2.2.
- **Evidence-based crime prevention** Crime prevention policy and practice as ideally being based on scientific evidence from criminology within the social sciences, rather than the crime policy agenda being driven by political ideology and anecdotal evidence (Farrington, Mackenzie, Sherman, & Welsh, 2006). *Evidence* in the phrase under consideration is not to be understood as *legal evidence*.<sup>15</sup>
- **Evidence discourse** Presenting or discussing the evidence, and in particular legal evidence, especially from the viewpoint of discourse analysis. Other disciplinary viewpoints are possible. In an article in a law journal, a scholar from the University of Bristol, Donald Nicolson (1994), discussed epistemology and politics in mainstream evidence discourse, from the viewpoint of critical legal theory, "in relation to three core concepts: truth, reason and justice" (ibid., p. 726). "The main contention of this article is that, given both its intellectual ancestry and political function, mainstream discourse of evidence can best be understood as a form of positivism. This 'fact positivism' is to the study and practice of fact-finding what legal positivism is to the study and practice of law. Both encourage the view that the task of lawyers and adjudicators is neutral and value-free. Both focus attention on logic, whether of rules or of proof, and away from the inherently political and partial nature of law and facts" (ibid.).
- **Evidence, theory of juridical** Conventional, vs. the one advocated by Allen (1994), whose "theory of juridical evidence is designed to replace the conventional theory that the necessary and sufficient conditions of evidence are provided by the rules of evidence with the thesis that evidence is the result of the interaction of the intelligence and knowledge of the fact finder with the sum of the observations generated during trial. If the conventional theory is true, the rules of evidence should provide a complex and relatively thorough statement of the grounds for the admission of evidence. They do not", as "The general rules of relevancy provide virtually no comprehensible criteria for admission and exclusion", whereas Allen's own theory of juridical evidence provides a set of necessary and sufficient conditions for admissibility (Allen, 1994, p. 630).
- **Evidence, law of** The set of rules that regulate which evidence should be admissible in court. The following is quoted from my own discussion (Nissan, 2001c) of Twining (1997):

<sup>&</sup>lt;sup>15</sup> Of course, evidence matters for various disciplines. For example, in the paper collection *Evidence*, edited by Bell, Swenson-Wright, and Tybjerg (2008), there are chapters on evidence in law, history, or science.

William L. Twining's 'Freedom of proof and the reform of criminal evidence', relevant for common law, is quite valuable because of the depth vision afforded by the author's charting recent and broader trends of legal theory in Anglophone countries. To Twining, the critics of the common law of evidence, recommending simplification and reduction in scope of its rule, "have won the argument, albeit in a slow and piecemeal fashion. One result is, as I have argued elsewhere, that the common law of evidence is much narrower in scope and of much less practical importance than the discourse of commentators, educators and practitioners has typically suggested" (441). A second trend, "which has proceeded much further in England" than in the U.S. (442), "has been the disaggregation of 'The Law of Evidence' into several bodies of law: Criminal Evidence, Civil Evidence and, increasingly, rules of evidence in tribunals, arbitration and other fora are treated as distinct" (442). "A further result of this trend has been a growing recognition that problems of proof, information handling, and 'evidence' arise at all stages of legal processes" (443). [...] In Preliminary Treatise of Evidence at Common Law (1898), "a Harvard scholar, James Bradley Thayer, advanced an interpretation of the law of evidence which has been accepted by most commentators as the classic statement of the modern common law" (Twining: 450), and based on two principles (ibid., from Thayer: 530): "That nothing is to be received which is not logically probative of some matter requiring to be proved" (the exclusionary principle), and: "That everything which is thus probative should come in, unless a clear ground of policy or law excludes it" (the inclusionary principle). In Wigmore's and others' reception, rules excluding or restricting the use of admitted evidence are either intended to promote rectitude of decision (avoiding unreliability or alleged prejudicial effect), these being Wigmore's "rules of auxiliary probative policy"; or, instead - these being exclusionary "rules of extrinsic policy" - they "give priority to other values over rectitude of decision" (Twining: 450). As per Twining's "interpretation, the Thayerite view is that the common law of evidence is a disparate series of exceptions to a principle of free proof" (Twining: 453), it being "broadly true that surviving English law of evidence conforms to the Thayerite model" (463).

## Evidence of character See character evidence.

**Evidence of disposition** A category of evidence that fits into the broader category of evidence of disposition and character, and consists of evidence that a particular person has a tendency to act, think, or fell in a particular way. "Evidence of disposition is in general inadmissible for the prosecution both because it is not necessarily logically relevant to the issue of the accused's guilt of the offence with which he is now charged and also because it is clearly highly prejudicial to the accused for the jury to be told of his previous disposition. The risk is that the average jury will lose sight of everything else in the case apart from the striking revelation of the accused's bad character" (Osborne, 1997, p. 313), and if the defendant has convictions for "crimes in the past that are notoriously impopular with the public", there may "be a tendency in laypersons to wish to punish the accused again for his former crimes whatever his guilt of the present offence" (ibid.). Moreover, "drinking and quarrelling are not per se crimes" (ibid.), yet they are disposition, and using such traits of the accused in court is not admissible: in England, "evidence of the misconduct of the accused on another occasion may not be given if its only relevance is to show a general disposition towards wrongdoing or even a general disposition to commit the type of crime of which he is now accused" (ibid.). "The exception to the general rule is the case of socalled 'similar fact' evidence" (ibid.). See similar fact evidence. Moreover, an exception to the inadmissibility of evidence of bad character or disposition of the accused in a criminal case, is that the prosecution has the right to cross-examine in order to obtain such evidence, and the right to adduce such evidence, if the defendant has claimed good character. The prosecution has the right of rebuttal.

- **Evidence of opinion** The kind of evidence provided by an *expert witness*, whereas in contrast: "The general rule is that a witness may only testify as to matters *actually observed* by him and he may not give his *opinion* on those matters. The drawing of inference from observed facts is the whole function of the trier of fact, i.e., in a criminal case the jury" (Osborne, 1997, p. 333) in countries where criminal cases are adjudicated at *jury trials* rather than by trained judges at *bench trials*.
- **Evidence, requirement of total** A principle in the philosophy of science. See Section 4.3.2.2. There exist a weak and a strong version:

(W-RTE) A cognitive agent X should always fix his beliefs or subjective probabilities in accordance with the total evidence in his possession at the time.

(S-RTE) A cognitive agent X should collect and use all available evidence that can be collected and used (at negligible cost).

There also is a "control" version, formulated but rejected by Alvin Goldman (1991):

(C-RTE) If agent X is going to make a doxastic decision concerning question Q, and agent Y has control over the evidence that is provided to X, then, from a purely epistemic point of view, Y should make available to X all of the evidence relevant to Q which is (at negligible cost) within Y's control.

In a social or legal context, the latter principle is improper, because harmful experimentation on human, as well as invasion of privacy, are objectionable. *Exclusionary rules of evidence* are another such example that the *requirement of total evidence* does not apply. Goldman calls such aspects of the philosophical discussion knowledge *social epistemics*. See Section 4.3.2.2.

**Evidence, theory of** "The distinction between the structure of proof and a theory of evidence is simple. The structure of proof determines what must be proven. In the conventional [probabilistic] theory [which Ron Allen attacks] this is elements to a predetermined probability, and in the relative plausibility theory [which Ron Allen approves of] that one story or set of stories is more plausible than its competitors (and in criminal cases that there is no plausible competitor). A theory of evidence indicates how this is done, what counts as evidence and perhaps how it is processed" (Allen, 1994, p. 606).

## Evidential burden See Burden, evidential.

Evidential computing Another name for *forensic computing*.

**Evidential damage doctrine** A doctrine advocated by Ariel Porat and Alex Stein's *Tort Liability Under Uncertainty* (2001). It proposes to shift the *persuasion burden* (i.e., the *burden of proof*) to the defendant, in such cases that a tort plaintiff cannot adequately prove his or her case (and would currently lose the case) because the defendant's wrongful actions impair the plaintiff's ability to prove

the facts underlying the plaintiff's lawsuit for damage (any damage actionable in torts). Such situations that would fall under the evidential damage doctrine, include any action in which the defendant's negligence is established, but causation is indeterminate. For example, toxic exposure, or environmental torts, or such medical malpractice cases in which the doctor was negligent but the patient had a preexisting condition.

**Evidentialism** In epistemology (the philosophy of knowledge), "a thesis about epistemic justification, it is a thesis about what it takes for one to believe justifiably, or reasonably, in the sense thought to be necessary for knowledge" (Mittag, 2004). Evidentialism is defined by this thesis about *epistemic justification*:

(EVI) Person S is justified in believing proposition p at time t if and only if S's evidence for p at t supports believing p.

Mittag points out (ibid.): "Particular versions of evidentialism can diverge in virtue of their providing different claims about what sorts of things count as evidence, what it is for one to have evidence, and what it is for one's evidence to support believing a proposition". What is evidence, for evidentialism? Mittag explains:

Evidence for or against p is, roughly, any information relevant to the truth or falsity of p. This is why we think that fingerprints and DNA left at the scene of the crime, eye-witness testimony, and someone's whereabouts at the time the crime was committed all count as evidence for or against the hypothesis that the suspect committed the crime. The sort of evidence that interests the evidentialist, however, is not just anything whatsoever that is relevant to the truth of the proposition in question. The evidentialist denies that such facts about mind-independent reality are evidence in the sense relevant to determining justification. According to (EVI) only facts that one has are relevant to determining what one is justified in believing, and in order for one to *have* something in the relevant sense, one has to be aware of, to know about, or to, in some sense, "mentally possess" it. The sort of evidence the evidentialist is interested in, therefore, is restricted to mental entities (or, roughly, to mental "information"). In addition, it is only one's own mental information that is relevant to determining whether one is justified in believing that p. For example, my belief that Jones was in Buffalo at the time the crime was committed is not relevant to determining whether you are justified in believing that Jones committed the crime.

There exist objections to evidentialism. For example: even "though one once had good evidence for believing, one has since forgotten it. Nevertheless, one may continue to believe justifiably, even without coming to possess any additional evidence. Evidentialism appears unable to account for this" (Mittag, 2004). Of course, "I forgot what the evidence is" would not make a good impression in a courtroom, but *justifying belief* in the philosophy of knowledge does not necessarily has the same standards of evidence one would expect in civil or criminal courts.

Another objection, which is relevant also for the theory of evidence in law, refuses to identify *probability* with *justification* of belief in a given proposition. One's evidence *supporting* a proposition may be modelled by means of some theory of probability, but this is contentious. Mittag explains (ibid.):

A body of evidence, e, supports believing some proposition p only if e makes p probable. If we suppose for simplicity that all of the beliefs that constitute e are themselves justified, we can say that e supports believing p if and only if e makes p probable. However, one might argue that, even with this assumption, one's evidence e can make p probable without one being justified in believing that p. If this is so, the resulting evidentialist thesis is false.

Alvin Goldman, for example, has argued that the possession of reasons that make p probable, all things considered, is not sufficient for p to be justified (*Epistemology and Cognition*, 89–93). The crux of the case he considers is as follows. Suppose that while investigating a crime a detective has come to know a set of facts. These facts do establish that it is overwhelmingly likely that Jones has committed the crime, but it is only an extremely complex statistical argument that shows this. Perhaps the detective is utterly unable to understand how the evidence he has gathered supports this proposition. In such a case, it seems wrong to say that the detective is justified in believing the proposition, since he does not even have available to him a way of reasoning from the evidence to the conclusion that Jones did it. He has no idea *how* the evidence makes the proposition that Jones did it likely. Thus, the evidentialist thesis, so understood, is false.

The appeal to probability and statistics here is not essential to this sort of objection, so it would be a mistake to focus solely on this feature of the case in attempting to respond. [...]

- **Evidential reasoning** A major area within artificial intelligence since the 1970s, as well as a prominent area within legal scholarship, in contrast within AI & Law it only emerged as a conspicuous area since around 2000.
- **Evidential strength** There are quantitative approaches for modelling evidential strength. See **Bolding-Ekelöf degrees of evidential strength**.
- **EvoFIT** A tool for suspect identification, resorting to a genetic algorithm<sup>16</sup> refining a population of facial composites. EvoFIT was developed within the CRIME-VUs project. The team working on EvoFIT is led by Charlie Frowd of the University of Central Lancashire. See Section 8.2.2.4.
- **Examination or examination in chief** Questioning of a witness called by one of the parties at a trial, by the lawyer of the same party. It is followed by cross-examination by the lawyer of the other party, and then possibly by re-examination by the lawyer of the party that called the given witness. Moreover, also a judge can ask questions. More in general, *examination* (as opposed to *examination in chief*) refers to the questioning in court, at any stage, of the parties to a trial, or of their witnesses, by any qualified questioner (a lawyer of the some party or of the other party, or a judge, or the other party if he represents himself without a lawyer).

It is important not to confuse examination in court, with questioning by the police during investigation. Legal proceedings only start once the investigation stage ends: once a suspect is charged, the police can no longer question him or her. *Post-charge questioning* (on the part of police investigators) of terrorism suspects, possibly extended to other categories of criminals, was considered by the British government in November 2007, drawing criticism from civil liberties groups.

<sup>&</sup>lt;sup>16</sup> Genetic algorithms are the subject of Section 6.1.16.1 in this book.

During investigation, questioning seeks to uncover information. This is not the case in court. Both when a party is examined in court by his own lawyer, and when the other party is cross-examined, in practice the purpose of the questioning is *not* to discover new information (which lawyers dread in court, as it is a risk), but rather to cause the examinee to reply in such a manner that would diminish the prospects of the success of the party against whom the questioning lawyer is pitted. Only when it is a judge who is asking questions, the questioning is genuine, i.e., seeking information not previously known to the questioner. Hickey (1993) discussed presupposition under cross-examination.

The following anecdote was related by American legal scholar Roger Park during a talk he gave in Amsterdam in December 1999. During the 19th century, a lawyer at a trial hoped to expose the bad character of the man he was questioning (see character evidence.). He asked him whether he had ever been in prison. The man replied that he had. Then the lawyer asked him about the circumstances of this happening. The man explained that he had been made a prisoner by the Indians (Native Americans). The effect was opposite to that intended by the lawyer: given the worldview of both lay and trained judges in the United States in the 19th century, the implication was that the examinee was of good character, a hero. This illustrates the dangers, for a lawyer and the party he or she represents, if the questions are such that information not previously known to the lawyer emerges. Importantly, persons being questioned in court must stick to giving answers without digressing. This is a major constraint, and therefore the lawyer examining the party he represents or that party's witnesses, has the duty to skilfully ask such questions that would enable all those important facts to emerge that would enable the lawyer to construct an effective argumentation. Jackson (1994, p. 70) pointed out:

Consider, for a moment, the very basic process of courtroom examination. Legal theory tells us that the barrister is not giving evidence; he or she is merely asking questions. The evidence is given entirely by the witness. But both linguistic analysis and the philosophy of language (specifically, the theory of speech acts) show that this is an unrealistic account. Grammatically, no doubt, the barristers are asking questions, not making statements. But a question, from the viewpoint of speech act analysis, is an act requesting new information. It is commonly (though not universally) so used at the investigation stage. But the elicitation of new (to him/her) information is precisely what the barrister is *not* seeking to do. It is a commonplace in the training of barristers that they should never ask a question to which they do not already know the answer – more accurately, to which they do not think they know what the witness's answer will be. So questioning by the barrister has a quite different function, the function of presenting an argument, engaging in a battle, sometimes even making claims of fact.

Jackson then discusses "each of these three functions" (ibid.). Take asserting facts: "A barrister who made straightforward factual claims, in the grammatical form of assertions, would readily be pulled up short" [by the judge] (ibid., p. 71). Therefore, assertions are made "[a]ssuredly not up front", but "e.g. through the presuppositions of questions". "Of course, the barrister is not on the stand, giving evidence on oath. But it is precisely because his factual statements have *not* thereby been problematised that they become, when uttered, all the

more persuasive" (ibid.). "Not one of these techniques I have briefly described – Socratic questioning (constructing a narrative argument); engagement in battle (destroying the witness rather than the story); stating facts (by presupposition) – is regarded as unprofessional": quite on the contrary. "[C]riminal investigators should not be inhibited from what they see as the legal constraints on what can be said in court from pursuing a full narrative or holistic account", as that is what it takes to persuade the court, and that without incurring in "the shyster lawyer syndrome" by which an unscrupulous lawyer is preferable to a respectable one (ibid., p. 71). Characterizations are involved, e.g. as hostile examinations by a barrister "seek to evoke stereotypes of respondents, not simply responses" (ibid., p. 70). It is still Jackson who states (ibid., pp. 70–71):

I wish here to make a distinction between cross-examination which is designed to destroy the story, and cross-examination which is designed to destroy the witness. It is the latter with which I am concerned. It may be illustrated through the "Don't know" pattern. The barrister may ask the witness a series of questions, to which s/he anticipates that the witness does not know the answer. These questions may relate to matters of quite marginal relevance. But the repetition of "Don't know" by the witness in respect of even marginal matters will create, and is designed to create, in the minds of the jury an image of a "Don't know" witness. It is an example of a simple rhetorical technique, *pars pro toto* – which evokes one of the basic narrative assumptions of everyday life: we do not rely upon what is said by people who appear not to know what they are talking about. Trite, maybe. Illogical, certainly. But immensely powerful.

Here is an example of *pars pro toto* negatively affecting a person's perceived credibility, in the television appearance of that person as being a guest, or "victim" (as guests at broadcasts are called in the slang of the trade). "Believing himself off screen, the victim keeps his head still, but surreptitiously swivels his eyes – perhaps for a glimpse of the audience, or the clock, or for a peep at the monitor. Immediately, by chance or by malicious design, the camera switches to him and he looks shifty, cunning and wicked" (Janner, 1984, p. 147). This is because of a stereotype about swivelling eyes. Viewers are made to see the "vic-tim" swivelling his eyes, that precise moment being highlighted, yet in the stream of events this may have been innocent and unimportant, rather than evidence about his truthfulness when making a specific statement, or about his character in general.

- **Exchange principle (Locard's)** Anyone or anything entering a crime scene takes something of the scene with them, and leaves something of themselves behind when they depart.
- **Exclusionary principle** In the American law of evidence, according to a formulation originally proposed by James Bradley Thayer, the principle "That nothing is to be received which is not logically probative of some matter requiring to be proved". See also **inclusionary principle**.
- **Exclusionary rules** Typically in the U.S. law of evidence: rules about which kinds of evidence must be excluded and not heard in court. As opposed to *admissionary rules*. See (**rules of**) **extrinsic policy** and (**rules of**) **exclusionary rules**, i.e., kinds of exclusionary rules.

Some kinds of evidence are excluded as a matter of policy. Sometimes, for reasons of policy, the law of some given jurisdiction may choose to disregard evidence that by common sense would prove adultery. By the law of England and Wales, until Parliament reformed family law in 1949, this was the case of evidence that could prove adultery because of lack of access of the husband, if a child was nevertheless born. Prior to 1949, such evidence was not admissible.

Sir Douglas Hogg, in his role as barrister in *Russell v. Russell* in 1924 (he had ceased to be Attorney-general earlier that year), had already tried to obtain admissibility for such evidence. "The question for the House of Lords was whether evidence of non-access might be given in divorce proceedings by one spouse with the result of bastardizing a child of the marriage. The answer was of great importance, not only to the parties to the suit, the sole evidence of the wife's adultery being the testimony of the husband that he did not have access to his wife at any time when the child could have been conceived, but also to all those who were interested in the proceedings in the Divorce Court, either as possible parties or as practitioners" (Heuston, 1964, p. 458).

The House of Lords decided the case ruled such evidence inadmissible: it "held that on grounds of decency and public policy the law prohibited the introduction of such evidence." (ibid.). Hogg had admitted that the evidence would be inadmissible in a legitimacy case, but "Hogg's argument was that the rule prohibiting the introduction of such evidence had never been applied to a case in which the object of the suit was to dissolve the bond of marriage on the ground of adultery, it only applied where there was a marriage in existence and the legitimacy of a child born in wedlock was in question" (ibid.). Hogg argued that "Where the issue is adultery the birth of a child is mere accident" (quoted ibid.). "This ingenious argument was rejected by the majority of the House, Lord Finlay saying: 'To what an extraordinary state would the admission of this evidence in the present case reduce the law of England! The infant may be illegitimate for the purpose of proving adultery; but legitimate for the purpose of succeeding to property or a title!" (ibid.). Writing in an American journal on legal evidence, Hans Nijboer (2008) provided comparative comments on current issues in evidence and procedure from a Continental perspective, as have emerged during the 2000s. He

finds that while legal scholars are increasingly communicating with legal scholars in other countries and scientists from other fields, there is a simultaneous counter-tendency toward adoption of crime-specific rules of substantive law and evidentiary measures for specific kinds of crime (such as protection of witnesses in rape cases, where the protection complicates the fact-findings process). He concludes from this that there is a tension between greater generality in regard to the first two dimensions and increasing specificity in regard to the third.

- **Expert evidence** Evidence as supplied by an expert witness. The expert's *expert opinion* is part of the evidence in a case.
- **Expert opinion, Appeal to** In argumentation studies, Walton's (1997) *Appeal to Expert Opinion* offered (ibid., pp. 211–225) an argumentation scheme for "Argument for Expert Opinion", then reproduced in Walton et al. (2008,

pp. 381–382). Its major premise is: "Source E is an expert in subject domain S containing proposition A." The minor premise is: "E asserts that proposition A is true (false)." The conclusion is: "A is true (false)." Walton accompanied this with critical questions to be asked, and these come in different categories: **expertise question, field questions, opinion questions, trustworthiness questions, consistency questions**, and **backup evidence questions** (q.v.).

**Expert witness** A witness called to give testimony in court not because of having been involved in the facts of the case being tried, but because of his or her professional expertise in one of the forensic sciences, bearing on the evaluation of specific elements. Cf. s.v. *Witness vs. expert testimonies*. An expert witness is called to provide *evidence of opinion*.

"[T]he seminal 1993 United States Supreme Court decision *Daubert v. Merrell Dow Pharms.*<sup>17</sup> [is] now widely described as the most important expert evidence decision ever written by the Supreme Court" (Cole 2009, p. 111). "Broadly speaking, *Daubert* [...] might be said to concern 'the problem of expertise"" (*ibid.*, p. 112) namely (*ibid.*):

Given that courts have long allowed expert witnesses to testify—and given the increasing use of such experts—how are courts to evaluate the testimony of proffered "experts"? Ought anyone who claims the mantle of expertise be permitted to testify in that guise? Or, should courts police claims to the title of "expert" by permitting only those experts deemed legitimate to testify? American courts have long tended toward the latter view; *Daubert* made this commitment (in the federal courts and in the many jurisdictions that subsequently adopted *Daubert* or *Daubert*-like rules) explicit. But, this preference only generates another philosophical dilemma: how are courts supposed to adjudicate claims to expertise when many, if not all, of those claims by their very nature are so technical that legally-trained judges cannot reasonably be expected to be competent to sit in judgment upon them? In other words, the law faces a specific instance of the question asked by the philosophical field known as "epistemology": how does one certify knowledge as legitimate?

In Britain, not always an expert witness has to appear in court in person, and sometimes it is enough for the expert to provide a report. Nevertheless, typically an expert witness must be ready to be cross-examined and to defend the credibility of his or her opinion on the matter at hand, and his or her professional credibility. An evidently biased expert witness would impress the court unfavourably. Like lawyers, expert witnesses, too, sometimes have a poor image: the lawyer being perceived to be a "shyster", and the expert witness – a "hired gun".

A philosopher, Ghita Holmström-Hintikka (2001), applied to legal investigation, and in particular to *expert witnesses* giving testimony and being interrogated in court, the Interrogative Model for Truth-seeking that had been developed by Jaakko Hintikka for use in the philosophy of science. A previous paper of hers (Holmström-Hintikka, 1995), about expert witnesses, appeared in the journal *Argumentation*.

<sup>&</sup>lt;sup>17</sup> Daubert v. Merrell Dow Pharms., Inc., 509 U.S. 579 (1993).

Bond, Solon, and Harper (1999) is a practical guide for expert witnesses. Carol Jones (1994) is concerned with expert evidence in Britain. Chris Pamplin, the editor of the *UK Register of Expert Witnesses* (http://www.jspubs.com), "analyse[d] the results of a major survey of the expert witness marketplace" and among the other things, remarked (Pamplin, 2007a, pp. 1480–1481):

Another change over the years that many experts will find more welcome is the reduction in the number of cases for which they are required to give their evidence in court. It is now altogether exceptional for experts to have to appear in court in "fast-track" cases, and it is becoming less and less likely in those on the "multi-track". In 1997 we recorded that the average frequency of court appearances was five times a year; some four years later this had dropped to 3.8; it now stands at 3.1.

If this is convenient for the expert witnesses (their worst-case scenario is being cross-examined in court and leaving the court with their reputation in shatters), it must be said that justice may be the loser, in the interest of efficiency, if expert witnesses are not challenged in court every time that they deserve to. The "oracular" expert witness ought to be a nightmare for justice. Yet, case management requires that there will be a limit on how much evidence is to be obtained. In Pamplin's words (2007b, p. 1488):

Limiting the amount and scope of expert evidence has long been one of the functions of the case management procedures of the civil courts. The time and expense involved in the provision of expert evidence means that the courts must have regard to the proportionality of any request. Indeed, the court should refuse permission where reasons for the request are viewed as frivolous.

However, given that the need for additional evidence is sometimes critical to the court's ability to make an informed decision, and that the expert evidence itself is often of a highly technical nature, two questions arise:

- How should the courts deal with such requests?
- How much influence should the experts or the parties have upon the court's decision?

If an expert feels that there is insufficient evidence before the court to prove or disprove a case, does the expert have discretion to request that further tests be carried out? If so, what is the expert's role in that evidence-gathering process? These were questions considered recently by the Family Court. [In *Re M (a child)* [2007] EWCA Civ 589, [2007] All ER (D) 257 (May), a case that contrasts with *Re W (a child) (non-accidental injury: expert evidence)* [2007] EWHC 136 (Fam), [2007] All ER (D) 159 (Apr). And also at an employment tribunal: *Howard v Hospital of St Mary of Furness* [2007] All ER (D) 305 (May).]

Expert witnesses do not only intervene in courts. Once instructed by a client, they (e.g., forensic engineers advising about product liability) may advise the client about the strength of their case. The client may renounce litigation, or give in to the plaintiff by settling out of court.

"Selecting the right expert may be crucial in court" (Holland, 2007). "An expert who can guarantee availability during the trial, and who can respond to any additional requests promptly will stand out from the other candidates" (ibid.,

p. 1486). "Ideally solicitors would like the expert to be recommended by a colleague, a barrister or client, as this is the best evidence that the expert is up to the job. Many [London] City firms also have internal databases of experts" (ibid.).

With a little application, there is much a prospective expert candidate can do to satisfy these criteria. However, the expert should always bear in mind that the expert's role is to provide impartial assistance to the court or tribunal. In addition to the criteria above, another paramount factor is the independence of the expert from the appointing party. If the expert is not perceived to be independent, the judge will not give credit to his evidence and opinions and this could be damaging to the client's case. (ibid., p. 1487).

Moreover, expert testimony may be involved in *alternative dispute resolution*, this being either *arbitration*, or *binding* or *non-binding mediation*. (see **case disposition**.) Baria Ahmed (2007) points out:

A potential expert in alternative dispute resolution (ADR) may adopt a range of roles: an expert consultant may form part of the advocacy team; a party retained expert may provide an opinion on the instructing party's position; the parties may instruct a neutral expert, appointed through an independent body such as the Royal Institute of British Architects, chosen by the parties jointly or appointed by the mediator or arbitrator; finally, the appointed mediator or arbitrator may themselves be an independent expert in light of their experience in the subject matter of the dispute. In the case of Early Neutral Evaluations and Expert Determinations, the neutral expert is tasked with providing either an "opinion" on the applicable law or a "decision" on the facts. [...] ADR processes, however, permit a non-traditional use of experts. The mediator, for example, may request that the expert makes a presentation of their views with all other participants present, or bring the parties' retained experts together without their respective clients to review findings, or choose to test their opinions in open/closed meetings.

An American legal scholar, Erica Beecher-Monas (2008), argued that during the 2000s, "courts throughout the common law system have taken an increasingly antithetical approach to expert testimony." She contrasted civil cases and criminal cases. In the former, but also

in criminal DNA identification cases, courts appear to be actively engaged in scrutinizing the scientific testimony that comes before them. Defense attorneys appear to have little difficulty in challenging questionable scientific testimony. Research scientists are brought into the discourse as experts for the parties or the court. Courts are articulating the bases for their admissibility decisions, and these decisions are being reviewed on appeal.

She pointed out that the situation was different in criminal cases other than involving DNA: "In the criminal cases, however, where criminal identification procedures other than DNA are concerned, each of the participants in the legal process has failed." She found that prosecutors were not particular about how credible their expert witnesses were:

Prosecutors repeatedly present experts whose testimony they have reason to know is (at best) dubious. Defense attorneys fail to bring challenges to the scientific validity of even patently flawed expert testimony. Courts, when challenges do arise, fail to engage in serious gatekeeping. And reviewing courts refuse to find shoddy gatekeeping to be an abuse of discretion. The consequence of this antithetical approach to admissibility, is that the rational search for truth, in which the adversary system is supposedly engaged, is taken seriously only in civil cases.

So the problem was not only with the prosecutors. She conceded that "the civil courts are busy minutely scrutinising scientific studies proffered as the basis for expert testimony" but in criminal cases other than DNA, in stark contrast, "the criminal courts are admitting into evidence testimony (again, with the exception of DNA) for which those studies have never been done." The critique expressed by Beecher-Monas (2008) is not isolated. The American legal scholar Michael Risinger<sup>18</sup> (2007a) sarcastically gave his paper,<sup>19</sup> concerning the courts admitting expert testimony of dubious value,<sup>20</sup> a title reminding of the atom bomb's fictional enthusiast Dr. Strangelove: D. Michael Risinger, 'Goodbye to All That, Or a Fool's Errand, By One of the Fools: How I Stopped Worrying About Court Responses to Handwriting Identification (And 'Forensic Science' in General) and Learned to Love Misinterpretations of *Kumho Tire v. Carmichael*,<sup>21</sup> Itiel

<sup>&</sup>lt;sup>18</sup> From the Seton Hall University School of Law, in Newark, New Jersey.

<sup>&</sup>lt;sup>19</sup> It is followed by an Appendix which is an article in its own right (Risinger, 2007b). Cf., e.g., Risinger et al. (2002). Both of these are concerned with expert testimony in handwriting identification.

 $<sup>^{20}</sup>$  Risinger's paper (2007a) is described in its abstract as (among the other things) "a picaresque romp through the author's career, much of which has been spent coming to grips with the realities of forensic science, and the courts' abdication of their role as gatekeepers in judging the reliability of prosecution-proffered expertise." Moreover, "the article illustrates how the lower federal courts have managed to ignore or misinterpret *Kumho Tire v. Carmichael* in such a way as to create a jurisprudence of expertise wholly at odds with the clear mandate of the Supreme Court, often by converting decisions with no precedential status into precedents of breathtaking breadth." Michael Risinger has criticised dubious forensic expertise (especially in handwriting identification) in his articles as early as the 1980s.

<sup>&</sup>lt;sup>21</sup> Cole (2009), responding to Risinger (2007a), remarked in a footnote: "On a completely irrelevant note: the first part of Professor Risinger's title refers to Robert Graves's memoir Goodbye to All That, whose discussion of the experience of being gassed in the First World War indirectly inspired my undergraduate thesis on German preparations for chemical warfare between the two world wars." Let me add that the intertextual reference in the second part title of Risinger's article is to the title of a black comedy film from 1964, on the nuclear scare, in which Peter Sellers played three major roles. It is the film Dr. Strangelove or: How I Learned to Stop Worrying and Love the Bomb, commonly known as Dr. Strangelove, directed, produced by Stanley Kubrick; the screenplay was jointly written by him with Peter George and Terry Southern. It was based on Red Alert by Peter George. Eventually in the plot, on board of an airplane with a damaged radio (so it cannot be recalled), "Aircraft commander Major T. J. 'King' Kong (Slim Pickens) goes to the bomb bay to open the damaged doors manually, straddling a nuclear bomb as he repairs arcing wires overhead. When he effects his electrical patches, the bomb bay doors suddenly open, the bomb releases and Kong rides it to detonation like a rodeo cowboy, whooping and waving his cowboy hat. The H-bomb explodes and [in automated retaliation, the Soviet Union's] Doomsday Device's detonation is inevitable" (quoted from http://en.wikipedia.org/wiki/Dr. Strangelove Also see http://www. filmsite.org/drst.html about the same film). The motif of the man riding a shot bomb like a cowboy apparently was after a real-life episode. The protagonist was Harry DeWolf, a future vice admiral and Chief of Staff of the Royal Canadian Navy. After retiring, he published a memoir under the title 'My Ride on a Torpedo' (DeWolf 1966), which he began by mentioning that when he retired, "a newspaperman commenting on my service career wrote that I had once ridden a torpedo

Dror and colleagues' paper "When emotions get the better of us: The effect of contextual top-down processing on matching fingerprints" (Dror et al., 2005) is a paper in cognitive psychology, applied to how experts perform at matching fingerprints. Dror and Charlton (2006) and Dror, Charlton, and Péron (2006) tried to identify the causes of why experts make identification errors. Dror and Rosenthal (2008) tried to meta-analytically quantify the *reliability* and *biasability* of forensic experts.

Some jurisdictions encourage conferences of experts sitting side by side and giving testimony together: this is the case of Australia's Federal Court (see **hot-tubbing**) sometimes at a **public inquiry** (q.v.) in Britain, which are inquisitorial (see **inquisitorial**, towards the end of that entry).

- **ExpertCop** A piece of software (a geosimulator, combining simulation and a geographic information system) for training police officers in allocating police presence in given urban environments, for the purpose of preventing crime (Furtado & Vasconcelos, 2007). See Section 6.1.6.2.
- Expertise question In argumentation studies, Walton's (1997) Appeal to Expert Opinion offered (ibid., pp. 211–225) an argumentation scheme for "Argument for Expert Opinion", then reproduced in Walton et al. (2008, pp. 381–382). See s.v. Expert opinion, Appeal to above. The expert source is *E*; the subject domain is *S*; and *A* is a proposition about which *E* claims to be true (or false). The expertise question is: "How credible is *E* as an expert source?". It is articulated in five detailed subquestions: "What is *E*'s name, job or official capacity, location and employer?"; "What degrees, professional qualifications, or certification by licensing agencies does *E* hold?"; "Can testimony of peer experts in the same field be given to support *E*'s competence?"; "What is *E*'s record of experience, or other indications of practiced skill in *S*?"; "What is *E*'s record of peer-reviewed publications or contributions to knowledge in *S*?".
- **Extrinsic policy (rules of)** A category of rules excluding or restricting the use of admitted evidence. As opposed to *rules of auxiliary probative policy*. In interpretations of the American law of evidence, according to Wigmore's terminology,

like a cowboy around the deck of a destroyer" (*ibid.*, p. 167). This was on 2 July 1940, aboard the Canadian destroyer *St. Laurent*. DeWolf was skipper, with the rank of lieutenant commander. A young torpedoman who was painting a torpedo lifted the safety catch and pulled back the firing lever. The torpedo leaped free toward the stern, and in frenzy butted causing damage, and at any moment its safety device could be unwound to arm the dormant warhead, which would then explode on contact. The torpedo "would lurch forward with each motion of the ship. It would lurch forward with each motion of the deck; then, as the deck became level, the torpedo would stop, like a bull in the ring, undecided in which direction to make its next charge" (*ibid.*, p. 170). The torpedo rolled against the guardrails, and DeWolf and another officer tried to hold it there, and his colleague "ran to get a key to turn off the compressed air that was driving the propellers", but the ship rolled, the torpedo advanced, I resisted as much as I could, while going forward hand over hand along the guardrail with my legs locked on the maverick" (*ibid.*, p. 170, 172). "These antics, no doubt, led to the story of 'riding the torpedo" (*ibid.*, p. 172). Two colleagues arrived at the scene, wrestled the torpedo steady, and the air was turned off (*ibid.*).

*rules of extrinsic policy* are such exclusionary rules that give priority to other values over rectitude of decision. These are rules which are not so much directed at ascertaining the truth, but rather which serve the protection of personal rights and secrets.

**Eyewitness testimony** Historically, the preferred kind of evidence (e.g., by biblical law it is the only admissible kind of testimony). Othello states this request to Iago: "Give me the ocular proof" (*Othello*, III.iii.365). James Ogden (1992) remarks that this request was echoed (comically, for that matter) in late seventeenth-century plays. Ogden states: "*Othello* was one of the most popular plays after the Restoration; some twenty revivals are recorded. Thomas Rymer [(1692)] noted that 'from all the Tragedies acted on our English Stage, *Othello* is said to bear the Bell away'. To Rymer himself it was 'a Bloody Farce' which 'may be a lesson to Husbands, that before their Jealousie be Tragical, the proofs may be Mathematical'".

One of the major areas in eyewitness testimony is *identification evidence*. Psychological research has shown that eyewitness testimony is fraught with problems, and that it is precisely the most confident witnesses that may be prone to errors.

- **FacePrints** A project and tool of Johnston & Caldwell at New Mexico State University, for assisting a witness to build a facial composite of a criminal suspect. See Section 8.2.2.
- **Facial reconstruction** The forensic reproduction of an individual human's face from skeletal remains. Computer-graphic tools exist which support this task. See Section 8.2.6.
- **Facticity** Law's commitment to relate as validly as possible to occurrences and events outside itself (and which took place in the past), normally requiring various mechanisms of representation based on some sort of truth by correspondence.
- **Fact positivism** As defined by Donald Nicolson (1994), it "is to the study and practice of fact-finding what legal positivism is to the study and practice of law. Both encourage the view that the task of lawyers and adjudicators is neutral and valuefree. Both focus attention on logic, whether of rules or of proof, and away from the inherently political and partial nature of law and facts" (ibid., p. 726).
- **Factfinders** Also called *triers of fact*. In a judicial context: the judicial decisionmakers who are empowered to give the verdict; i.e., the *jury* (jurors are also called *lay triers of fact*, or *lay factifinders*, or *lay magistrates*, or then *popular judges*, the latter, e.g., at the Assizes in Italy) in a *jury trial*, or the professional judge or judges (also called a *stipendiary magistrate*), in a *bench trial* (a trial with no jury). In a jury trial, before the juror retire to consider their decision, the judge instructs the jury about how to go about the decision-making process. In the United States, instructions to the jury tend to be a standard formula, whereas in England, judges tend to produce an elaborate speech to the jury, highly customized for the case at hand. Also see **Jury**.
- **Factual truth** The past cannot be reproduced or relived. It can only be reconstructed. Moreover, there are factors such as *rules of extrinsic policy* to exclude use of some kinds of evidence, such rules being intended to privilege some values (e.g., the protection of personal rights) over the *rectitude of decision* as aiming at

the factual truth, or even considerations in terms of cost/benefits – that militate for there consciously there being an increased likelihood of a gap between the factual truth, and the *legal truth* that will result from the verdict.

- **Factum probandum** (plural: *facta probanda*) That which is to be demonstrated by means of the *factum probans* (or of several *facta probantes*).
- Factum probans (plural: *facta probantes*) Evidence in support of a *factum probandum*.
- **FADE (Fraud and Abuse Detection Engine)** A data mining system developed by the online auction site eBay in order to detect fraud perpetrator at its site (Mena, 2003, p. 254).
- **False positive** At a criminal trial, a false positive is a wrong conviction,<sup>22</sup> whereas a *false negative* is a wrong acquittal. In data mining software tools for the detection of suspicious transactions, a false positive is a false alarm, whereas

<sup>&</sup>lt;sup>22</sup> Already Borchard's book (1932) was concerned with wrongful convictions; it is significant that is was published by Yale University Press. Cf. Leo (2005). http://www.innocenceproject.org/ is a website that documents real life cases of miscarriages of justice. Clive Walker and Keir Starmer's edited book (1999) Miscarriage of Justice: A Review of Justice in Error examines the various steps within the criminal justice system which have resulted in the conviction of the innocent, and suggests remedies to avoid such situations in the future. The perspective is especially that of England and Wales. There are two initial chapters in Part I, "The nature of miscarriages of justice", and these are chapter 1, "The Agenda of Miscarriages of Justice", and chapter 2, "Miscarriages of Justice in Principle and Practice", both of them by Clive Walker. Part II, "The Criminal Justice Process in England and Wales and Miscarriages of Justice", comprises chapter 3, "Police Investigative Procedures", by David Dixon; chapter 4, "The Right to Legal Advice", by Andrew Sanders and Lee Bridges; chapter 5, "The Right to Silence", by Keir Starmer and Mitchell Woolf; chapter 6, "Forensic Evidence", by Clive Walker and Russell Stockdale; chapter 7, "Disclosure: Principles, Processes and Politics", by Ben Fitzpatrick; chapter 8, "Public Interest Immunity and Criminal Justice", by Clive Walker with Geoffrey Robertson; chapter 9, "Trial Procedures" by John Jackson; chapter 10, "The Judiciary", by Clive Walker with James Wood; chapter 11, "Post-conviction Procedures", by Nicholas Taylor with Michael Mansfield; chapter 12, "Victims of Miscarriages of Justice", by Nicholas Taylor with James Wood; and chapter 13, "The Role and Impact of Journalism", by Mark Stephens and Peter Hill. This is followed by Part III, "Miscarriages of Justice in Other Jurisdictions", which comprises chapter 14, "Miscarriages of Justice in Northern Ireland", by Brice Dickson; chapter 15, "Miscarriages of Justice in the Republic of Ireland", by Dermot Walsh; chapter 16, "Miscarriages of Justice in Scotland", by Clive Walker; and chapter 17, "The French Pre-trial System" by John Bell. Part IV, "Miscarriages of Justice in Summary", comprises chapter 18, "An Overview", by Helena Kennedy and Keir Starmer. An earlier edition, entitled Justice in Error, appeared in 1993. Between the two editions, there had been intervening reforms in England and Wales. The 1999 book, Miscarriages of Justice, considers these reforms, and considers whether the concerns expressed earlier have been adequately addressed. The chapters in the 1993 version were: "The criminal justice process in England and Wales and miscarriages of justice", which comprises chapters 3 to 13: "Police Investigative Procedures: Researching the Impact of PACE" by Clive Coleman, David Dixon, and Keith Bottomley; "The Right to Legal Advice" by Andrew Sanders and Lee Bridges; "The Right to Silence" by Fiona McElree and Keir Starmer; "Forensic Evidence" by Russell Stockdale and Clive Walker; "Prosecution Disclosure - Principle, Practice and Justice" by Patrick O'Connor; "Trial Procedures" by John Jackson; "Post-conviction Procedures" by Michael Mansfield and Nicholas Taylor; "The Prevention of Terrorism Acts" by Brice Dickson. Next, Part III, "Miscarriages of Justice in Other Jurisdictions", comprises chapters 14 to 17: "Miscarriages of Justice in the Republic of Ireland" by Dermot Walsh; and "The French Pre-trial System" by John Bell.

a false negative is an undiscovered case. With data mining, Mena remarks (2003, p. 221):

Often an alert of a suspected crime needs verification by human personnel and may require special processing, such as putting a transaction in a special queue or status. A false positive needs special attention and time, while a false negative may cause further losses. In other words, the costs of both are different. However, in both instances, consideration must be given that doing nothing is the worst possible action and option facing a business, government agency, or law enforcement unit. The cost of doing nothing may, in time, be the most expensive option of all, especially in situations involving the destruction of trust, data, systems, property, and human life.

- **Field question** In argumentation studies, Walton's (1997) *Appeal to Expert Opinion* offered (ibid., pp. 211–225) an argumentation scheme for "Argument for Expert Opinion", then reproduced in Walton et al. (2008, pp. 381–382). See s.v. *Expert opinion, Appeal to* above. The field source is *E*; the subject domain is *S*; and *A* is a proposition about which *E* claims to be true (or false). The expertise question is: "Is *E* an expert in the field that *A* is in?". It is articulated in four detailed subquestions: "Is the field of expertise cited in the appeal [to expert opinion] a genuine area of knowledge, or an area of technical skill that supports a claim to knowledge?"; "If *E* is an expert in a field closely related to the field side?"; "is the issue one where expert knowledge in *any* field is directly relevant to deciding the issue?"; "Is the field of expertise cited an area in which there are changes in techniques or rapid developments in new knowledge, and, if so, is the expert up to date in these developments?".
- **Final submissions** The final speeches to the bench of the lawyers for both parties, before the court decides about the case.
- **FinCEN (Financial Crimes Enforcement Network)** The U.S. Treasury agency set up to detect money laundering. A project for FinCEN, whose goal is to identify money laundering networks, by carrying out network link analysis, was reported about by Goldberg and Wong (1998). Links are created in databases of financial transactions.<sup>23</sup>
- **Fingerprints** The fingerprints of human hands are, relatively to other *biometric* features, more reliable characteristics of an individual person, "because of their immutability and individuality [...]. Immutability refers to the permanent and unchanging character of the pattern on each finger from before birth until decomposition after death. Individuality refers to the uniqueness of ridge details across individuals; even our two hands are never quite alike. Fingerprint techniques have the benefit of being a passive, nonintrusive identification system and have the additional advantage to use low-cost standard capturing devices (Espinosa-Duró, 2002)" (Khuwaja, 2006, p. 25). In biometrics, also *palmprints* are used, of the entire palm of a hand (Kumar, Wong, Shen, & Jain, 2003). In the 2000s, a trend

<sup>&</sup>lt;sup>23</sup> See Section 6.1.2.2 and fn. 36 in Chapter 6.

became felt, in scholarship, to question the reliability of fingerprint evidence. See Sections 8.7.2 and 8.7.3.

- **Fingerprint identification** The identification, by specialized forensic experts (*fingerprint experts*), or the identity of an individual whose fingerprints are available. There is a debate as to how many similarities between two prints proves identity beyond almost any doubt. See Sections 8.7.2 and 8.7.3. *Fingerprint identification* is not the same as *fingerprint verification*. Both kinds require *fingerprint recognition*. By analogy with fingerprints of a person's hand being unique identifiers, DNA identification techniques have been called *DNA fingerprinting*. Also in intrusion detection within computer security, metaphorically one speaks of *fingerprints* and *fingeprinting* (Section 6.2.1.12), in relation to attempts to identify an intruder.
- **Fingerprint compression** Digitised fingerprint cards are held, e.g., by the FBI, in massive quantities, so when digitized, image compression is required. Compression, however, should not be such that features necessary for matching would be lost. "Because fingerprint ridges are not necessarily continuous across the impression due to minutiae, ridges endings, or bifurcations, the information needed to determine that one fingerprint matches another resides in the fine details of the minutiae and their relationships. Consequently, these details have to be retained for matching algorithms" (Khuwaja, 2006, p. 25). Compression techniques use, e.g., wavelet packets (Khuwaja, 2004).
- Fingerprint matching algorithms Computational algorithms from image processing, that match a given input fingerprints card against either a single stored fingerprints card (in *fingerprint verification*), or a fingerprints database (in *fingerprint identification*). Some fingerprint matching algorithms use neural networks (e.g., Leung, Leung, Lau, & Luk, 1991; Khuwaja, 2006). "One advantage of any neural network, which performs a fingerprint recognition task, is that it will learn its own coarse-grained features; thus, precise locations do not form any part of an input set (Hughes & Green, 1991)" (Khuwaja, 2006, p. 26). See Section 8.7.3.
- **Fingerprint recognition** Such image processing, possibly computational, that fingerprints are analysed, and matched against a pool of fingerprint cards. If the process is computational on digitised images, fingerprint matching algorithms are applied. The purpose may be either *fingerprint identification*, or just *fingerprint verification*. The finer level is *minutiae detection*, as opposed to coarse-grained features such as ridges in a fingerprint image.
- **Fingerpring scanning** An input technique for digitized fingerprint databases, that transforms extant *fingerprint cards* (as used in manual processing and recognition) into digitized images.
- **Fingerprint sensors** Equipment for an input technique for taking a person's fingerprints, by obtaining a digitized fingerprint image directly from that person. Igaki, Eguchi, and Shinzaki (1990) described a *holographic fingerprint sensor*.
- **Fingerprint verification** A person who claims a given identity has his or her fingerprints checked. The outcome is binary: either acceptance, or rejection. This

is less processing-intensive than the *fingerprint identification* of suspects, and is more typical of situations when security measures are taken, in order to prevent undue access, i.e., in *fingerprinting for security*, an application for which a *personal authentication system* is used.

- **FLINTS** A software tool for criminal intelligence analysis. It performs *network link analysis*, and developed by Richard Leary, who originally applied it in the West Midlands Police. See Chapter 7.
- **Foil** At an *identity parade* (i.e., a *lineup*), or then in a *photoarray*, any out of several look-alikes, known to be innocent, and who appear alongside the suspect. The eyewitness is made to identify the suspect, but without a bias (such as suggesting that the perpetrator is actually one of those persons). Wells (1993) suggested criteria for minimising *foil bias*. See Section 4.5.2.3.
- **Forensic computing** A discipline that provides techniques and strategies for *computer investigations*, in response to *computer crime*. Also known as *evidential computing*, or *computer forensics*. The latter is distinguished from *digital forensics*. See Section 6.2.1.5.
- **Forensic sciences** Various scientific specialties (such as chemistry, areas within medicine, psychology, handwriting analysis, fingerprint analysis, and so forth) when applied for the purposes of crime analysis and fact investigation, or for evaluations for the use of the court. There is a multitude of such specialties, with an increasing role in court. Sometimes globally referred to as in the singular: *forensic science*.
- Forensic test A test applying any of the forensic sciences.
- **Free proof** Historically in Continental Europe (in the Romanist tradition), *free proof* – in German *frie Beweiswurdigung*, in French *l'intime conviction* – pertains to the evaluation of the evidence, according to a system which replaced the socalled *legal proof* (in Latin *probatio legalis*, in French *preuve legale*, in German *gesezliche Beweistheorie*), and emancipated the judicial evaluation of the evidence from the older law of proof (this also involved the demise of torture as means for obtaining evidence). In Continental Europe, free proof replaced rules of *quantum and weight*; these did not use to be part of the English and American judiciary systems.

In the United States, in the context of Common Law systems from Anglo-Saxon countries), *free proof* or *freedom of proof* (not a term of art in England) historically lent itself to several different usages, but in current discussions in legal scholarship in the U.S.: freedom of triers of facts (i.e., factfinders, judicial decision-makers) from *exclusionary rules* affecting the evidence. See Twining (1997), Stein (1996).

**Generalisations** Or *background generalisations*, or *background knowledge*, or *empirical generalisations*: common sense heuristic rules, which apply to a given instance a belief held concerning a pattern, and are resorted to when interpreting the evidence and reconstructing a legal narrative for argumentation in court.

- **Geoinformatics or geomatics** The science and technology of gathering, analysing, interpreting, distributing and using geographic information. It encompasses surveying and mapping, remote sensing, geographic information systems (GIS), and the Global Positioning Systems (GPS).
- **Guilty plea** Typically, in criminal procedure in Anglo-American jurisdictions, the option a defendant is offered, to admit guilt on the part of the defendant at the beginning of a trial, and this typically in connection with a *plea bargain* being offered, with an explicit grant of sentencing concessions (a lighter sentence) for such a plea. In countries in Continental Europe, typically there was no possibility of a guilty pleas, prosecution was obligatory instead of discretionary, and plea bargaining was not envisaged, and was frowned upon.
- **Handwriting identification** A discipline (Morris, 2000) which in the context of the forensic sciences, is part of the domain of *questioned documents evidence* (Levinson, 2000). See Section 6.1.10.
- Hearsay Stated imprecisely: verbal statements attributed to others, or rumours. It is not admitted as evidence in court, if the person to whom the statement is ascribed could be called as a witness<sup>24</sup> (See Sections 4.6.1 and 2.5.1). More precisely, the hearsay rule (in English and American law) "requires a court to exclude any written or oral statement not made in the course of the proceedings which is offered as evidence of the correctness of the matter asserted. A statement which is relevant independently of the real intention of the speaker or the truth of what is stated is not adduced for a testimonial purpose and is therefore outside the scope of the rule" (Pattenden, 1993, p. 138). In fn. 2 ibid., Rosemary Pattenden clarifies "independently of the real of the speaker": "For example, in a contract case a person is contractually bound if he makes an oral statement which a reasonable man would regard as an acceptance of a proffered offer, even though he did not intend by his words to accept the offer". In fn. 3, she explains "or the truth of what is stated": "For example, a statement offered to prove that the declarant could speak or a statement which it is alleged is libellous. The distinction between 'original' and 'testimonial' use of an out-of-court statement is not, however, absolute. The statement 'I am alive' asserts and demonstrates the same thing".

As to the rationale behind the hearsay rule (which she challenges), Pattenden states:

The basis of the hearsay rule is supposedly the dangers which attach to the use of statements not made by witnesses within the confines of the courtroom where the declarant can be subjected to immediate cross-examination. However, when the question of admitting an out-of-court assertion arises in a criminal trial, no attempt is ever made to measure the real danger which the statement presents to the fact-finding process. Instead the court concentrates on conceptual issues – is the statement being used testimonially? If the answer is yes, does it fall within one of the narrow and inflexible common law

 $<sup>^{24}</sup>$  Also consider that a broader category is *out-of-court witness statements* (Heaton-Armstrong et al., 2006), which also include statements made to the police by a witness or defendant who also has to give testimony in court.

exceptions to the rule (all of which were created before the end of the nineteenth century) or one of the more recent, but equally limited, statutory exceptions to the rule. If the answer to the second question is no, the evidence is automatically rejected. There is never any question of weighing the probative value of the evidence against the risk of unreliability (Pattenden, ibid., p. 138).

Craig Osborne (1997) remarked: "It is apparent when reading reports of decided cases that courts not always appreciate the existence of a hearsay problem", as "there are also instances of the very existence of any problem at all being over-looked" (ibid., p. 254). "It is by no means the case that words said outside court and repeated in it will amount to hearsay. What matters is whether the statement from the speaker outside court is *tendered to prove the truth of its contents*" (ibid., p. 255). *Express assertions* are excluded by the hearsay rule (ibid.):

With express assertions there must be an intention to communicate, thus non-verbal behaviour such as nods, gestures, pointing or signs may well amount to an express assertion when what the person making the sign did is recounted to the court by another witness. As there must however, be some intention to communicate nobody has ever suggested that, say, a footprint, or yawning is subject to the hearsay rule.

*Implied assertions* are problematic. "This is where the maker of the statement did not intend to assert any particular fact" (ibid., p. 256). "The reason why it has often been suggested that these kind [sic] of statements ought to be admissible as exceptions to the hearsay rule is that there is a smaller risk of untruthfulness with implied assertions. [...] The authorities in England are not entirely conclusive" (ibid.).

For the United States, Ron Allen has claimed (2008a, p. 326):

- 1. The rules of evidence favour admissibility even in the face of legitimate claims of irrelevancy. The standard bearer here is of course the Supreme Court's decision in *Old Chief v. U.S.* [519 U.S. 171 (1997]), but that simply acknowledged the obvious truth of the narrative structure of proof at trial.
- 2. This narrative structure is enhanced by liberal admission of evidence, and even the rule once claimed as the embodiment of the exclusionary practices of Anglo-American law the hearsay rule has morphed into a rule of admission (Allen, 1992). All statements by parties are admissible, for example, no matter when or under what conditions made, as are all present sense impressions and statements of states of mind or physical conditions. Business records and government reports all come in readily, along with 35 or so other categories of admission. If none of the formal exceptions work, the courts may make up ad hoc exceptions to facilitate admission (Federal Rule of Evidence 807). Although there are some technical exclusionary rules, in reality, like hearsay, they often make promises that they do not keep. Another wide ranging example is the character evidence rules which promise exclusion but permit generous admissibility due to provisions such as FRE 404(b).

An expert system dealing with the hearsay rule is the *Hearsay Rule Advisor* (*HRA*). It was developed as an LL.M. project by Susan Blackman (1988), under the supervision of Marilyn MacCrimmon (1989). That expert system "provides advice on whether a statement comes within the definition of hearsay and if so,

whether the statement comes within an exception to the general rule excluding hearsay statements" (MacCrimmon, ibid., p. 468). The initial questions the user is asked by this expert system – MacCrimmon explains (ibid., pp. 467–468) –

classify exceptions based on the context of the trial (whether the declarant is available to testify and the type of trial, civil or criminal). This part of the program eliminates some exceptions as more facts become known. At this time the exceptions included in the program are: dying declarations, declarations against interest, declarations in the course of duty, and business documents (British Columbia only). Hearsay exceptions in the HRA are classified on the basis of four dimensions: EVENT, PERCEIVE, BELIEVE [and] INTEND. First the system searches for an approximate match between the user's facts and the events in the system. Once a match is found, the user is asked questions designed to assess whether the three dimensions of PERCEIVE, BELIEVE and INTEND for a particular exception are satisfied by the user's facts. These questions are tailored to fit the EVENT identified so that the system does not waste time with irrelevant or inapplicable questions. These dimensions fit the story model of Pennington and Hastie with the proviso that I assume that belief states are encompassed by the definition of psychological states as is implicit in [their examples]. Legal liability often turns on whether a person knows, thinks, believes certain things and not simply on whether they are in a particular emotional state.

We begin with the declarant as the principal actor. The action is the making of the statement. The EVENT is defined as the events which initiate the required belief states which initiate the goal of telling the truth. Thus for dying declaration the initiating events are the declarant is wounded, and the declarant is dying. It is assumed that these events initiate the belief that the declarant is saying that initiates the goal of telling the truth. For the exception, declarations in the course of duty, the initiating events are the declarant is performing a duty and others are relying on his or her actions which initiate the belief state that the declarant expects to be discovered if he or she makes an error which in turn initiates the goal of avoiding censure by his or her employer.

The dimensions of PERCEIVE [and] BELIEVE may be related to states of the world which enable the declarant to make a true statement. Circumstances which facilitate accurate perceptions are often required. [...] INTEND focuses on the facts of the specific case being considered in order to establish the requisite belief state. [...]

It is quite important to understand that different jurisdictions can be expected, generally speaking, to treat hearsay, too, differently. Take the Italian context (Ferrua, 2010, section 19):

Suppose *P* gave witness in court concerning what (being crucial for convicting defendant Q) he was told by *N*, and that the latter, called as witness, is taking advantage of the right to avoid this being a next of kin, or at any rate, that *N* refuses to reply or does not appear at the hearing, and therefore deliberately avoids being cross-examined. There is no doubt that the guilt of the defendant cannot be proven based on statements that *N* may have made during the inquiry. But what are we to say concerning what *N* related to *P*, who provided indirect testimony?

True, *P* is not avoiding being cross-examined, but should we allow conviction based on *P*'s testimony, which reproduces verbatim what *N*'s related, arguably amounts to admit it based on *N*'s statements, who always deliberately avoided being cross-examined. The only conceivable way to deny this would be to claim that the "statements" referred to by the criterion of evaluation<sup>25</sup> are only the ones made during the trial, by

<sup>&</sup>lt;sup>25</sup> This is merely a criterion of evaluation ("criterio di valutazione"), not an exclusionary rule ("regola di esclusione probatoria").

strict analogy with what is in force concerning the cross-examination rule [under the Italian jurisdiction].  $^{26}$ 

At any rate, the Court of Cassation in Italy ruled on 4 October 2004 that indirect testimony is only inadmissible ("l'inutilizzabilità della testimonianza indiretta"),<sup>27</sup> as per "articolo 195 commi 3 e 7 c.p.p.", if the primary source is not indicated, or if it was requested by one of the parties that primary source be called as witness, and it was not (except because of death, infirmity, or because the person cannot be found). In particular, the Court of Cassation ruled that indirect testimony is admissible, and has to be considered, in such a case that the primary source resorted to the right not to reply, while being a defendant tried for a related crime.<sup>28</sup>

**Hot-tubbing** A particular approach to expert witnesses, known by that name especially with reference to a practive at Australia's Federal Court, but also known (although not by that name) from public inquiries in Britain (see s.v. *Inquisitorial*, towards the end of that entry). In a comparative review, Erica Beecher-Monas (2008) explained:

In Australia, [...], the Federal Court has encouraged (through its court rules) both "hottubbing" and joint conferences of experts. In the joint conference court rules, judges attempt to control expert witness partisanship by directing expert witnesses to confer, or to produce a document identifying the matters on which the experts agree and those on which they disagree. Under the "hot-tubbing" rules, experts testify together in court, responding to questions from attorneys and each other, as well as the judge. Judges may also appoint their own witnesses, although they rarely do so in criminal trials.

There is a difference between hot-tubbing and joint conferences of experts, in respect of lawyers' interventions (ibid.):

"Hot-tubbing" is also known as taking concurrent evidence. In this procedure, the experts for both sides simultaneously take the stand in court and question each other about their opinions on the record. They are also subject to questioning by the court

 $<sup>^{26}</sup>$  The original text from Ferrua (2010) is concerned with the second part of "art. 111 comma 4 Cost.", and it is as follows: "Supponiamo che *P* abbia testimoniato in giudizio su quanto, decisivo per la colpevolezza dell'imputato *Q*, gli ha confidato *N* e che quest'ultimo, chiamato a deporre, si avvalga della facoltà di astensione come prossimo congiunto o, comunque, rifiuti di rispondere o diserti il dibattimento, sottraendosi così per libera scelta al contraddittorio. Nessun dubbio che la colpevolezza dell'imputato non possa essere provata in base alle dichiarazioni eventualmente rilasciate da *N* nell'indagine preliminare. Ma che dire per quanto raccontato a *P*, che ha deposto come teste indiretto? È vero che *P* non si sottrae al controesame, ma consentire la condanna sulla base della sua testimonianza, dove è testualmente riprodotto il racconto di *N*, non equivale forse a consentirla sulla base delle dichiarazioni di *N* che si è sempre sottratto per libera scelta al contraddittorio? La sola via per rispondere negativamente sarebbe, per l'appunto, di sostenere che le 'dichiarazioni' a cui si richiama il criterio di valutazione siano solo quelle costituite nel processo, in stretta analogia con quanto vale per la regola del contraddittorio."

<sup>&</sup>lt;sup>27</sup> The notion of *inutilizzabilità*, i.e., *inadmissibility* of criminal evidence, was discussed in an Italian context in Gambini (1997) and in Grifantini (1993, 1999).

 $<sup>^{28}</sup>$  An attempt at formalisation of the reasoning about hearsay was made by Tillers & Schum in "Hearsay Logic" (1992).

and the lawyers. Hot-tubbing, in contrast to joint conferences of experts, permits the participation of legal counsel in exchanges among the experts.

## Moreover, with *hot-tubbing* the parties have a say concerning procedure (ibid.):

In joint conferences, experts are supposed to work together (with only the experts present) to prepare a document probing areas of agreement and disagreement, to be submitted to the court. In its pristine form, a joint conference will exclude lawyers. In practice, however, there appears to be some flexibility – and the parties may have some ability to modify the joint conference procedure. For example, in one antitrust case, the parties refused to participate in a "hot tub" procedure and agreed to a joint conference only if they could treat the joint conference as mere negotiations, so that any communication or joint report could only be admissible with consent of the parties. If the parties can play such a significant role, it is questionable how far a joint conference can go toward solving the problem of partisan experts.

- **HUGIN** A piece of Belief Net software, using which Neil and Fenton (2000) carried out calculations in order to present probabilistic legal arguments, concerning the **Jury Observation Fallacy** (q.v.).
- **HYPO** A computer system for argumentation, fairly well-known in the discipline of AI & Law (Ashley, 1991). See Section 3.9.1. HYPO "is a case based reasoner developed by Ashley and Rissland at University of Massachusetts at Amherst. It analyses problem situations dealing with trade secrets disputes, retrieves relevant legal cases from its database, and fashions them into reasonable legal arguments. It has turned out to be the benchmark on which other legal case based reasoners have been constructed" (Stranieri & Zeleznikow, 2005a, Glossary).
- **IBIS** An Issue-Based Information System that supports decomposing problems into issues. *QuestMap* (Carr, 2003) is a computer tool for supporting argumentation. It is based on IBIS, mediates discussions, supports collaborative argumentation, and creates information maps, in the context of legal education.
- **Identikit** A system for generating composite faces, for the purposes of assisting a witness to describe the features of a criminal suspect. *Identikit* uses plastic overlays of drawn features. See Section 8.2.2.
- **Identity parade** Also called *line-up*, or *identification parade*. A suspect stands in a line alongside *foils*, i.e., persons known to be innocent and who look alike, and the victim or witness has to identify the suspect. A computerised version is *ID parade discs*, on which video clips from a database appear, along with a video clip showing the suspect. See Section 4.5.2.8. In contrast, it is usually undesirable to have a *dock identification*, when the witness sees at the trial the accused for the first time after the offence. Even for such a case in which there was a parade, being an "identification procedure between crime and trial at which the witness has picked out the accused to assist the police", Osborne (1997, p. 305) raises a problem with *hearsay* (evidence admissibility rules include exclusionary rules which incloude the hearsay rule, as well as the rule against admission of a previous consistent statement):

If the witness confirms at the trial that he has previously picked out the accused, is he not, in effect, testifying as to a prior consistent statement? Moreover the hearsay implications are compounded if some other person is called to confirm that the witness picked out the accused at the identification parade. The point is inadequately analysed and it is far from clear as to whether the courts have acknowledged the hearsay problem at all. See, e.g.,  $R \vee Osbourne$  and Virtue [1973] 1 QB 678 where the witnesses in court could not remember whom they had picked out at an identification parade. A police inspector who had been present was allowed to testify about what had happened at the parade without the court acknowledging the hearsay point (Osborne, ibid.).

It may be that computer tools for use at identity parades may incorporate some function for recording the outcome with a given witness in such a way that would be useful in court, but it may depend on the jurisdiction (e.g., it would be in agreement with the "philosophy" of validating steps in Asaro's *Daedalus* in Italy, as opposed to Anglo-American procedural law). It would be interesting to see whether how the software caters to validation may in turn result in something objectionable. Thereofore, it would be useful to have a legal professional involved in discussions, during the software requirement analysis and design phase.

- **IFS** (Internet Fraud Screen) A data mining tool giving credit-card fraud alerts, developed by CyberSource for Visa U.S.A. for matching fraud transactions. IFS "uses a combination of rule-based modeling and neural-network modeling techniques" (Mena, 2003, p. 271). IFS's "profile scores look at more than a dozen different information items, including the customer's local time and the risk associated with the customer's e-mail host. CyberSource also provides e-retailers with an IFS report that includes risk profile codes, address verification systems (AVS) codes, and other relevant information to help e-merchants calibrate their risk thresholds and score settings. This helps the e-business subscribers to control the level of risk they want to operate under" (ibid.).
- **Image forensics** A branch of forensic science whose goal is the detection of *image tampering*. The tampering is typically done by computer (*digital forgeries*), and the computational methods for detection (*digital image forensics*) belong to image processing within signal processing. See Farid (2008), Popescu and Farid (2007), Johnson (2007). We have discussed such techniques in Section 8.2.5.
- **Imputation** A charge, including a charge possibly implied by a defendant while attacking the credibility of others, and affecting their *character*. (See **character evidence**.). In a section entitled "Imputations on the character of the prosecutor or his witnesses or on the deceased victim of the alleged crime", Osborne (1997, p. 323) explains that before *Selvey* v *DPP* [1970] AC 304, in English law "there was a problem as to whether the accused lost his shield [i.e., its being inadmissible for the prosecution to adduce bad character evidence about him, or to ask such questions during cross-examination that would aim at proving his bad character] by making imputations on prosecution witnesses which were necessary to *develop his defence*, or whether he only lost it if the imputations were *merely to attack* their credibility". For example, it may be that a defendant would need to claim that it actually was "a prosecution witness who actually committed the offence" (ibid.). In *Selvey* v *DPP*, the House of Lords held that prosecution is allowed to cross-examine "the accused as to character where he casts imputations on prosecution witnesses either in order to show their unreliability or where he

does so in order to establish his defence" (Osborne, ibid., p. 324), yet with exceptions: "In a rape case the accused can allege consent without losing his shield", "If what is said amounts in reality to no more than a denial of the charge then an accused does not lose his shield", and "There is an unfettered judicial discretion to exclude cross-examination as to character even if strictly permissible but there is no general rule that this discretion should be exercised in favour of the accused even where the nature of his defence necessarily involves his attacking prosecution witnesses" (ibid.). "The difficult question which is for the judge to decide is: "What is an imputation?" The courts have tried, not always with great success, to draw a distinction between what is merely a *denial* of the charge by the accused in forceful language and what amounts to an imputation" (ibid.). For example, if a defendant claiming that a witness is "a liar", should this be merely treated as a denial of the charge, or is it to be treated as an imputation, because "this may in effect be an allegation of perjury"? (ibid.).

- **Inclusionary principle** In the American law of evidence, according to a formulation originally proposed by James Bradley Thayer, the principle "That everything which is thus probative should come in, unless a clear ground of policy or law excludes it". See also **exclusionary principle**.
- **Independent Choice Logic (ICL)** Poole (2002) applied this formalism to legal argumentation about evidence. The formalism can be viewed as a "first-grade representation of Bayesian belief networks with conditional probability tables represented as first-order rules, or as a [sic] abductive/argument-based logic with probabilities over assumables" (p. 385).
- **Inductive reasoning** "Inductive reasoning is the process of moving from specific cases to general rules. A rule induction system is given examples of a problem where the outcome is known. When it has been given several examples, the rule induction system can create rules that are true from the example cases. The rules can then be used to assess other cases where the outcome is not known" (Stranieri & Zeleznikow, 2005a, Glossary).
- Inference The process of deriving conclusions from premises.
- **Inference engine** "An inference engine is that part of an expert or knowledge based system that contains the general (as opposed to specific) problem solving knowledge. The inference engine contains an interpreter that decides how to apply the rules to infer new knowledge and a scheduler that decides the order in which the rules should be applied" (Stranieri & Zeleznikow, 2005a, Glossary).
- **Inference network** "The inference net model is a probabilistic retrieval model; since it uses a probability ranking principle. It computes Pr(I|document), which is the probability that a user's information need is satisfied given a particular document" (Stranieri & Zeleznikow, 2005a, Glossary).
- **Inquest** In Britain: a judicial or official inquiry, usually before a jury, typically in order to identify the causes of a death, in case this is not certified by a physician, or where the possibility of a crime cannot be ruled out a priori. The *Dead Bodies Project* (developed by Jeroen Keppens and others during the 2000s) has been described in Section 8.1.

Inquiry See investigation.

**Inquisitorial** A type of criminal procedure, which is typical of many European countries on the Continent. As opposed to the adversarial system, typical of Anglo-American jurisdictions. The adversarial system features a symmetry between the parties, whereas in the inquisitorial system the court is rather structurally aligned with the prosecution  $vis-\dot{a}-vis$  the defendant, yet the court is to be convinced and adjudicates. It is of interest to consider how professionals used to the adversarial system perform, when they have to abide by the inquisitorial system. In England and Wales, as well as in Scotland, whereas the adversarial system characterises court proceedings, public inquiries are in theory inquisitorial (see **public inquiry**). This is also the case of the *Coroner's court*. Professor Sir Ian Kennedy, who chaired the public inquiry (which lasted two years and nine months, from 1998 until 2001) into the conduct of children's heart surgery at the Bristol Royal Infirmary between 1984 and 1995, and he described in a paper (Kennedy, 2007) his experience in that capacity. In 2005, Parliament passed the Inquiries Act, but the paper is general enough to retain interest even under the new regime of public inquiries (ibid., p. 15). In the interest of openness, information technology (IT) was resorted to (ibid., p. 14):

The Inquiry needed to be completely open so that everyone could see and hear the same evidence. This was achieved by the use of IT with scanning of all the documents: this came to over 900,000 pages. A "Core Bundle" of relevant documents was prepared as a CD available to all legal representatives.<sup>29</sup> The daily proceedings could be seen at three separate locations as well as Bristol. It was also vital to create a website (this received over 1 million hits during the Inquiry and won a prestigious NHS<sup>30</sup> prize).

The approach was inquisitorial, and therefore (ibid., p. 38):

In keeping with its inquisitorial approach, the Inquiry made it clear that there were no "parties", no "sides", to advance their particular view of events. Witnesses were called by the Inquiry and were the Inquiry's witnesses. They were there to assist the Inquiry. They were not there to score points in their own favour or against others. Legal representatives initially found these challenging propositions. They were used to taking sides on behalf of a client. But, gradually, they understood.

<sup>&</sup>lt;sup>29</sup> In a section about the use of information technology, Kennedy explained (2007, pp. 41–44): "By scanning all relevant documents into the Inquiry's data-base, it was possible to ensure that the Inquiry, and particularly its legal team, could have access to all the relevant evidence collected at the earliest possible stage, and in a manageable form on computers. The creation of a CD containing the 'Core Bundle' achieved the same effect for both the Panel and the legal representatives of all those involved in the Inquiry. Witnesses' statements, and comments on them, were equally added to the database and were thus accessible to those involved. Once they began, the hearings were effectively 'paper free'. Counsel to the Inquiry, and other legal representatives on the occasions on which they addressed the Inquiry, were simply able to identify the unique code given to each document for it to be transmitted onto the computer screens of the panel, other lawyers and onto the screens available to the public. It was estimated that, by not having to search through shelves of box files to find the relevant document and the[n] pass it around to all, the Inquiry was able to accomplish anything from a quarter to a third more work on an everage day of hearings." <sup>30</sup> National Health Service.

Its being inquisitorial in a country used to the adversarial system, it is challenging for those conducting the inquiry, as well as to the lawyers (ibid., pp. 37–38):

It is often said that Public Inquiries are inquisitorial by nature. But the reality often is otherwise. One explanation is that those chairing Inquiries are usually unfamiliar with how to translate the idea into practice. Moreover, since they are very commonly judges, their first instinct is to revert to what is familiar and convert the Inquiry's proceedings into a courtroom. And courtrooms, in England, are not characterized by an inquisitorial approach (with the exception of the Coroner's court). Rather they are characterized by what can be described, perhaps a little provocatively, as a gladiatorial approach. The gladiators are the lawyers, usually counsel. The judge watches and gives the thumbs up, or down, at the end. Lawyers provide a further explanation to why the proceedings, though theoretically inquisitorial, soon take on an inquisitorial quality. This is because lawyers also are familiar with courts and the procedure of courts. It comes as no surprise that they will seek to treat the Inquiry as if it were just another court.

This has also to do with how the process of arriving at the legal truth is conceived of (ibid., p. 38), as the lawyers' attitude during the Inquiry

also rests on a fundamental premise, particularly of counsel, that there only is one way to discover the truth and that it is through the cut and thrust of examination and crossexamination. Leave aside the fact that we have already seen that the concept of a single "truth" may be self-delusionary, the approach misses the point of what the Inquiry is seeking to do. It is not seeking to paint a picture just in black and white; that something happened and something else did not, that someone did wrong. It does not occupy a binary world of right and wrong, good and bad. What it is trying to do is understand, and understanding rarely comes in black and white. Furthermore, whatever else may emerge from gladiatorial contest, understanding rarely does.

Some lawyers are counsel to the inquiry, whereas some other persons are the legal representatives of groups and organisations involved in the inquiry (ibid., p. 39). The most prominent duty of counsel to the inquiry is "to take witnesses" appearing before the Inquiry through their evidence", ensuring that "the Inquiry heard both the witness' account, any challenges to it and their responses to these challenges" (ibid.). Counsel to the Inquiry also organise the material collected by the inquiry. As to legal representatives, what they do during the hearings of an inquiry different from what they would be doing in court. This is because the procedure of the inquiry as defined by Kennedy for the Bristol Public Inquiry does not envisage that it would be the legal representatives who would examine and cross-examine the witnesses: it was up to the counsel to the inquiry to do so (ibid., pp. 39–40). In fact, "there is no *right*, as such, to cross-examination of witness (usually by lawyers) at a Public Inquiry. The Inquiry must, of course, behave fairly at all times" (ibid., p. 40). "The position of the Inquiry was simple. It wanted to hear witnesses telling their stories, rather than have the story filtered through the interventions of their legal representatives, who might seek to gloss over this, or over-emphasise that, out of their perception of what it was good for the Inquiry to hear" (ibid., p. 41).

Also the status of expert witnesses was that of an amicus curiae, called to assist the Inquiry (at a bench trial, especially under the inquisitorial system, it would be to assist the court): "Just like other witnesses, experts also were the Inquiry's experts. They gave evidence to assist the Inquiry in its task", rather than representing one of the two sides in the adversarial system (ibid., p. 38). "They were advised as to the assistance that the Inquiry needed and gave their evidence accordingly, whether in the hearings, or in the conduct of several analytical studies carried out by the Inquiry" (ibid.). Nevertheless, this being Britain (ibid., pp. 38–39):

Again, this was unfamiliar territory to legal representatives. They were used to experts appearing for one "side" or another. They urged that the expert should brief them and then they would question a particular witness, or advise the Inquiry, in the light of what they gleaned from the expert's briefing. I indicated that the Inquiry wished to hear from the experts and did not wish to hear their views "second hand", through counsel. I went further, and said that the Inquiry would benefit from experts taking part in the hearings at the same time as other witnesses, so that the Inquiry could test arguments as they were put, and witnesses could refer to experts as peers, sitting alongside them, in discussing areas of technical expertise.

(This is like **hot-tubbing**, q.v., at Australian courts.) Bear in mind that the public inquiry was about a hospital, and whereas some physicians were regular witnesses or were being investigated, some other physicians were called as expert witnesses. Therefore (ibid., p. 39):

This they did, and the Inquiry would sometimes listen spellbound as expert and witness discussed matters of significant complexity, whether it was the correct response to a particular anatomical anomaly in the heart, or why paediatric intensive care was different from the care of adults, or how a particular statistical conclusion could be arrived at. [...] They made it plain that honest professionals could legitimately differ. [...]

- **Insecurity governance or insecurity management** A branch of information technology concerned with how to respond, on an organisational level, to threats to *computer security*.
- **Instructing party** The client of either a lawyer or an expert consultant (an expert witness). The lawyer or the consultant is *instructed* by the client.
- **Interesting case** In law: "For a first instance decision to be interesting it must: 1) be appealed, or 2) includes a new principle, rule or factor in its ratio decidendi, or 3) exhibits an outcome vastly at odds with other similar cases" (Stranieri & Zeleznikow, 2005a, Glossary). Not the same as **landmark case** (q.v.).
- **Interesting pattern** In knowledge discovery from databases (KDD) and in data mining: "A pattern is interesting if it is a) easily understood by humans, b) valid (with some degree of certainty) on new or test data, c) potentially useful and d) novel. A pattern is also interesting if it validates a hypothesis that the user sought to confirm" (Stranieri & Zeleznikow, 2005a, Glossary).
- **InvestigAide B&E** An expert system (Valcour, 1997) for the Canadian Police, whose purpose was to support the processing and investigation of breaking and entering cases, by assisting in gathering and recording case data, and providing such information as suspect characteristics.
- **Investigation** Actions undertaken, typically by the police, in order to identify criminal suspects, or the extent of criminal activities. In the Unites States, the term *investigation* is used. In Britain, it is *inquiry*.

- **Itaca** A tool, modelled after **Daedalus** (q.v.), for the Court of Cassation in Rome, under contract to Siemens, as per the design of Mr. Justice Carmelo Àsaro (who when a prosecutor in Lucca, developed *Daedalus* single-handedly). See **procedural-support systems**, and Section 4.1.3.
- **Jury or lay factfinders** In some countries, a group of citizens, not trained judges, who adjudicate trials of some categories of crime. In Anglo-Saxon countries, the judge can instruct the jury, but does not participate in the determination of the verdict. In Italy, some cases are heard by a mixed court (first introduced in colonial Libya), of trained judges and jurors, and after the verdict is given, the justification of the verdict must also be given: it is written by a trained judge, who if outvoted by the jurors may write a so-called *sentenza suicida*, i.e., a deliberately flawed justification in order to bring about an appeal. In Anglo-Saxon jurisdictions, a *retrial* may be ordered if some stringent conditions are met. Also see **factfinders**.
- **Jury observation fallacy** A claim, so named, against the use of knowledge of prior convictions of a criminal suspect. See **character evidence**. Fenton and Neil (2000) tried to support this claim by making use of Bayesian networks to present probabilistic legal arguments. Adrian Bowyer summarised this stance in a letter published in the latest issue of June 2001 of the *London Review of Books (LRB)*, a letter immediately signalled in an e-list posting by Mike Redmayne:

Writing about Labour's proposal in its Criminal Justice White Paper that defendants' past convictions should be revealed to juries, John Upton (LRB, 21 June) fails to mention the Jury Observation Fallacy. According to this, if a jury finds someone not guilty on the evidence presented in court – in other words, without taking previous convictions into account – the fact that this defendant has previous convictions for similar crimes usually makes it more, not less, probable that he or she is indeed innocent of this particular crime. This is because, when a crime is committed, the police quite reasonably go out and feel the collars of those with previous convictions for similar crimes. They therefore tend to fish in a highly non-representative pool, rather than picking suspects from the general population. This tips the probabilities in the defendant's favour to an extent that is not outweighed by the likelihood of a certain fraction of past offenders becoming recidivists. If the defendant is considered innocent on the facts of the case, then his past convictions should be seen as evidence not so much of guilt as of the failures of police procedure.

Mike Redmayne (a legal scholar of the London School of Economics, quite at home with probabilistic modelling) was unconvinced by some of the assumptions made. In a posting discussing Fenton and Neil (2000) at an e-list,<sup>31</sup> he claimed:

Your conclusion is sensitive to the probability that a defendant will be charged given a previous conviction and no hard evidence. If the probability is less than 1 in 200, the fallacy disappears. One point about this is that there are further screening stages between charge and trial, and even between trial and acquittal (the judge can be asked to certify that there is "a case to answer"). It would be very difficult for a case to get to the jury when (more or less) the only evidence against a defendant is that he has previous convictions for crimes similar to the one with which he's now charged. If there is other

<sup>&</sup>lt;sup>31</sup> bayesian-evidence@vuw.ac.nz

evidence against the defendant, surely that affects your conclusion, because it increases the probability of guilt?

There is also likely to be evidence against a defendant other than a previous conviction because most suspects come to police attention independently of their having previous convictions. They may have been caught in the act, or, very often, reported by a member of the public - e.g. the victim.

A few cases will get to court when there is very little evidence other than the defendant's similar previous convictions. At this point, I wasn't sure quite what you meant by "similar" in your model. Similarity can include more than a crime being of the same legal category. It can include similarities in modus operandi, geographical proximity, and so forth. It is where previous convictions have this sort of similarity (sometimes called "striking similarity") that a case may get to the jury on previous convictions alone. (I also suspect that the police rely on such similarities when deciding which suspects to arrest.) If "similar previous conviction" is expanded in this manner, mightn't previous convictions have more probative value than you allow? These are obviously points about the operational reality of the criminal justice system, and you can't be blamed for not mentioning them. [...]

- **Jury research** Thriving among psychologists in North America. It has produced various models of jurors' decision-making, as well as empirical results. See Section 2.1.7.
- **Kappa calculus** In AI: a formalism introduced by Spohn (1988). The *kappa value* of a *possible world* is the *degree of surprise* in encountering that possible world, a degree measured in non-negative integer numbers. The probabilistic version of the kappa calculus was applied in Shimony and Nissan (2001) in order to restate Åqvist's (1992) logical theory of legal evidence, which Åqvist based on the *Bolding-Ekelöf degrees of evidential strength* (Bolding, 1960; Ekelöf, 1964). See Section 2.6.
- **Knowledge acquisition** "Knowledge acquisition is the transfer and transformation of potential problem-solving expertise from some knowledge source to a program" (Stranieri & Zeleznikow, 2005a, Glossary).
- **Knowledge based system** "A knowledge based system is a computer program in which domain knowledge is explicit and contained separately from the system's other knowledge" (Stranieri & Zeleznikow, 2005a, Glossary).
- **Knowledge discovery** "Knowledge discovery is the non trivial extraction of implicit, previously unknown and potentially useful information from data" (Stranieri & Zeleznikow, 2005a, Glossary).
- **Knowledge engineering** "Knowledge engineering involves the cooperation of domain experts who work with the knowledge engineer to codify and make explicit the rules or other reasoning processes that a human expert uses to solve real world problems" (Stranieri & Zeleznikow, 2005a, Glossary).
- **Knowledge engineering paradox** "The knowledge engineering paradox is that the more competent domain experts become, the less able they are to describe the knowledge they use to solve problems" (Stranieri & Zeleznikow, 2005a, Glossary).
- **Knowledge engineering process** "The knowledge engineering process is the process of transferring knowledge from the domain experts to the computer system.

It includes the following phases: knowledge representation, knowledge acquisition, inference, explanation and justification" (Stranieri & Zeleznikow, 2005a, Glossary).

**Knowledge representation** "Knowledge representation involves structuring and encoding the knowledge in the knowledge base, so that inferences can be made by the system from the stored knowledge" (Stranieri & Zeleznikow, 2005a, Glossary).

## Legal burden See Burden, legal.

- **LAILA** A language for abductive logic agents, used in ALIAS, a multi-agent architecture. It was applied to the modelling of reasoning on the evidence in a criminal case, in Ciampolini and Torroni (2004). See Section 2.2.1.5.
- Landmark case In law (and by extension, in case-based reasoning within artificial intelligence): "A landmark case is one which alters our perception about knowledge in the domain landmark cases are comparable to rules. Landmark cases are the basis of analogical reasoning" (Stranieri & Zeleznikow, 2005a, Glossary). Not the same as **interesting case** (q.v.).
- **Learning** "Learning is any change in a system that allows it to perform better the second time on repetition of the same task drawn from the same population" (Stranieri & Zeleznikow, 2005a, Glossary).
- **Legal positivism** "Legal positivists believe that a legal system is a *closed logical system* in which correct decisions may be deduced from predetermined rules by logical means alone" (Stranieri & Zeleznikow, 2005a, Glossary).
- **Legal realism** "Legal realists are jurisprudes for whom the reliance on rules is an anathema. They argue that judges make decisions for a range of reasons which cannot be articulated or at least are not apparent on the face of the judgement given" (Stranieri & Zeleznikow, 2005a, Glossary). See, e.g., Rumble (1965).<sup>32</sup>

<sup>&</sup>lt;sup>32</sup> Wilfrid Rumble began the first footnote in his paper by pointing out: "There is no infallible method to determine who is a legal realist. The most authoritative list is probably that compiled by Karl Llewellyn in 1931, with the assistance of Jerome Frank and Felix S. Cohen. See Llewellyn, Jurisprudence: Realism in Theory and Practice (Chicago, 1962), 74-76" (Rumble, 1965, p. 547, fn. 1). Karl N[ickerson] Llewellyn (1893-1962) was professor at the University of Chicago Law School. His work focused mostly on the topic of legal realism. Llewellyn (1962, repr. 2008) is a compilation of his writings from the 1930s through the 1950s. "Oliver Wendell Holmes, Jr., book, The Common Law, is regarded as the founder of legal realism. Holmes stated that in order to truly understand the workings of law, one must go beyond technical (or logical) elements entailing rules and procedures. The life of the law is not only that which is embodied in statutes and court decisions guided by procedural law. Law is just as much about experience: about flesh-and-blood human beings doings things together and making decisions. Llewellyn's version of legal realism was heavily influenced by [Roscoe] Pound and [Oliver Wendell] Holmes [Jr.]. The distinction between 'law in books' and 'law in action' is an acknowledgement of the gap that exists between law as embodied in criminal, civil, and administrative code books, and law. A fully formed legal realism insists on studying the behavior of legal practitioners, including their practices, habits, and techniques of action as well as decision-making about others. This classic study is a foremost historical work on legal theory, and is essential for understanding the roots of this influential perspective" (Llewellyn, ibid., from the 2008 publisher's blurb).

- Lex posterior "Lex posterior is the legal principle that states the later rule has precedence over the earlier rule" (Stranieri & Zeleznikow, 2005a, Glossary).
- Lex specialis "Lex specialis is the legal principle that states the priority is given to the argument that uses the most specific information" (Stranieri & Zeleznikow, 2005a, Glossary).
- Lex superior "Lex superior is the legal principle that states that a ruling of a higher court takes precedence over one made by a lower court" (Stranieri & Zeleznikow, 2005a, Glossary).
- Liability Being legally bound or responsible. One category of liability is a defendant's criminal liability. Another category is tort liability, which, e.gt., includes products liability torts and claims. Liability issues arising from the use of expert systems in the field of law were discussed by Karin Alheit (1989), as a particular case of liability in relation to the use of expert systems, for which, see Zeide and Liebowitz (1987). Alheit pointed out, in general concerning knowledgeprocessing software, that "[t]here exists a tremendous litig[ation] potential over their use, misuse, and even non-use" (Alheit, ibid., p. 43, referring to Zeide and Liebowitz 1987).
- **Linear regression** "In linear regression, data is modelled using a straight line of the form  $y = \alpha x + \beta$ .  $\alpha$  and  $\beta$  are determined using the method of least squares. Polynomial regression models can be transformed to a linear regression model" (Stranieri & Zeleznikow, 2005a, Glossary).
- **Lineup** Also called *identity parade*. A suspect stands in a line alongside *foils*, i.e., persons who look alike, and the victim or witness has to identify the suspect. A computerised version is *ID parade discs*, on which video clips from a database appear, along with a video clip showing the suspect. See Section 4.5.2.3.
- **Lineup instructions** Instructions given to eyewitness before an identification lineup. It is essential that such instructions must not be suggestive. For example, witnesses must not be given the impression that the perpetrator is believed to be one of the persons lines up; in fact, it may be that all of them are innocent. See Section 4.5.2.3.
- Link Analysis Network link analysis arose in human factors research, originally in order to determine the layout of machine shops in American industry during the First World War (Gilbreth & Gilbreth, 1917). Link analysis is currently supported by computer tools. One of its applications is to crime investigation, and it is conducted by intelligence analysts. Its aim is to discover crime networks, to identify the associates of a suspect, to track financial transactions (possibly by data mining), to detect geographical patterns (possibly by kind of crime), and so forth. In Coady's words (1985),

Link Analysis is the graphic portrayal of investigative data, done in a manner to facilitate the understanding of large amounts of data, and particularly to allow investigators to develop possible relationships between individuals that otherwise would be hidden by the mass of data obtained.

See Chapters 6 and 7.

- **Litigation Risk Analysis** A proprietary method of Marc B. Victor, for quantifying legal and factual uncertainties by assuming probabilities, for constructing a decision tree, and for using it in order to evaluate the risks of litigation. See Section 4.3.2.3.
- Local stare decisis "Local stare decisis is the tendency of judges to be consistent with the decisions of other members of their own region (or registry)" (Stranieri & Zeelznikow, 2005a, Glossary).
- **Logic** In *How to Do Things with Rules*, William Twining and David Miers (1976, pp. 140–142) made the following remarks about the relation between logic and law; these remarks are of lasting value:

The place of formal logic in legal reasoning is one of the most problematic topics in Jurisprudence. [...] First, it is important to realize that the term "logic" is used, even by philosophers, in a number of different senses. [...] Secondly, even where "logic" is confined to reasoning leading to necessary conclusions, very general questions of the kind "what is the role of logic in legal reasoning?" are ambiguous and misleadingly simple. For example, this question has been variously intepreted to mean: "To what extent do judges and advocates *explicitly* resort to deduction in justifying their decisions?"; "To what extent can judgments and other examples of argument towards conclusions of law be *reconstructed* in terms of formal logic?"; "To what extent is it *desirable* to do so?", or even: "What illumination can be gained by applying the techniques of formal logic to examples of legal reasoning?" All these questions are different, although they are related to each other. They are complex questions; beware of glib answers to them.

Thirdly, there is an unfortunate tendency in juristic controversy to present answers to some of these questions as disagreements between extremists. For instance, it is not uncommon to contrast a view that a legal system is a closed and complete system of rules from which all conclusions on points of law in particular cases can be deduced as a matter of logical necessity (sometimes referred to as "the slot-machine model") with the dictum of Mr Justice Holmes [(Holmes, 1881, p. 1)] that "(t)he life of the law has not been logic, it has been experience", which can be interpreted to mean that deductive logic plays no role at all in legal reasoning. Stated in this extreme form, both views are patently absurd. It is encouraging to find that few jurists who have been accused of adopting the slot-machine model have been guilty of any such crudity and that even a cursory reading of Holmes reveals that he was concerned to show that logic is only one of a number of factors in "determining the rules by which men should be governed" rather than to deny that it had, or should have, any influence in this respect.

The reference to Holmes is to Oliver Wendell Holmes, the Younger (1841–1935), who was a progressive judge in the U.S. Supreme Court. Twining & Miers go on to quote from an essay by Anthony Gordon Guest [(1961, pp. 195–196)]: "arguments need not be cast in a strictly syllogistic form, provided that they exhibit a logical structure. In the dialectic of the law, logic has an important part to play at a stage when a suggested rule has to be tested in order to discover whether or not its adoption will involve the contradiction of already established legal principles. [...]". Then, Twining & Miers (ibid., p. 142) offer a caveat concerning *arguments about inconsistency*: "Such arguments need to be treated with caution for a number of reasons: First, it is quite common for some kind of rules to 'hunt in pairs'. [...] Secondly, arguments about 'inconsistency' and 'contradiction' may often be more appropriately expressed as arguments about what

constitutes an appropriate level of generality for a rule or a concept in a particular context". Maxims that point in contradictory directions exist in the common law; they 'hunt in pairs' indeed, and the phenomenon is termed *normative ambiguity* (ibid., p. 210). Twining & Miers illustrate this phenomenon with pairs of proverbs (e.g., "Too many cooks spoil the broth", but "Many hands make light work": ibid.). They go on to list legal examples (ibid., pp. 210–211), then they remark (ibid., p. 212):

First, one must be wary of exaggerating the extent and the importance of normative ambiguity. Often the canons of interpretation may give clear and explicit guidance in a given case, especially where several canons cumulatively support the same conclusion. The difficulties tend to arise where several factors have to be weighes against each other as they favour different results. Secondly, it is important to distinguish between rule-statements which are logical contradictories and those which merely have different tendencies. [...] Moreover there are typically no rules dictating which of two canons is to prevail in such situations. Thus, just as they have carefully avoided laying down strict rules for determining the *ratio decidendi* of a case, so the common law judges have left themselves a fairly wide leeway of discretion in legislative interpretation. The canons indicate factors to be taken into account in deciding a particular case, but do not indicate precisely what weight should be given to such factors.

**Loose talk** An important concept for the evaluation of the truthfulness of a proposition. Cf. philosopher Terry Horgan account of vagueness he called **transvaluationism** (q.v.) Whereas in court, it is recognised that sometimes people speak other than literally, or with various degrees of precision, and yet are not lying, arguably also advanced natural-language processing capabilities, with which some legal software may be eventually endowed, ought to recognise that much.

Let us consider Dan Sperber and Deirdre Wilson's notion of *loose talk* (Sperber & Wilson, 1986), by means of an example they provide (Sperber & Wilson, 1990). "At a party in San Francisco, Marie meets Peter. He asks her where she lives, and she answers: 'I live in Paris'." Contrast this to a situation in which the location of the event when the occurance takes place is different: "Suppose Marie is asked where she lives, not at a party in San Francisco, but at an electoral meeting for a Paris local election". There is a difference, concerning the truth value of Marie's utterance, in terms of *relevance* (relevance for discourse, not the relevance of evidence). "It so happens that Marie lives in Issy-les-Moulineaux, a block away from the city limits of Paris. Her answer is literally false, but not blatantly so. If Peter presumed literalness, he will be misled". Yet, assumptions are warranted, that in terms of artificial intelligence could be represented in terms of a nesting of beliefs that agents ascribe to each other. It is not precise that Marie lives in Paris, in the sense that this is inside the city limits.

In ordinary circumstances, however, Mary's answer is quite appropriate, and not misleading. How come? This is easily explained in terms of relevance theory. A speaker wants, by means of her utterance, to make her hearer see as true or probable a certain set of propositions. Suppose these propositions are all quite easily derivable as implications of a proposition Q. Q however has also other implications whose truth the speaker does not believe and does not want to guarantee. Nevertheless, the best way of achieving her aim may be for her to express the single proposition Q, as long as the hearer has some way of selecting those of its logical and contextual implications that the speaker intends to convey and of ignoring the others.

## This example, Sperber and Wilson claim, reflects quite a general phenomenon:

Our claim is that such a selection process is *always* at work, is part, that is, of the understanding of *every* utterance. Whenever a proposition is expressed, the hearer takes for granted that some subset of its implications are also implications of the thought being communicated, and aims at identifying this subset. He assumes (or at least assumes that the speaker assumed) that this subset determines sufficient cognitive effects to make the utterance worth his attention. He assumes further (or at least assumes that the speaker assumed) that there was no obvious way in which achieving these effects might have required less effort. He aims at an interpretation consistent with these assumptions, i.e. consistent with the principle of relevance. When this criterion determines a single interpretation (or closely similar interpretations with no important differences between them) communication succeeds.

For Peter to interpret the answer Marie gave him while in San Francisco, various things are relevant, and the city limits of Paris are not among them. Marie can predict how Peter will understand her answer.

In our example, Peter will be able to infer from Mary's answer quite an amount of true or plausible information: that Marie spends most of her time in the Paris area, that Paris is familiar to her, that she lives an urban life, that he might try to meet her on his next trip to Paris, and so on. It it such cognitive effects which make Marie's utterance sufficiently relevant to be worth his processing effort, in a way Marie manifestly may have anticipated. So, Peter is entitled to assume that Mary intended him to interpret her utterance in this way. Peter would be mislead by Marie's answer only if he were to conclude from it that she lives within the city limits of Paris. However it is clear that Marie had no reason to assume that Peter would have to derive such a conclusion in order to establish the relevance of her utterance. Therefore her utterance does not warrant it.

Marie's answer can be expected to be loosely understood. "This loose understanding does not follow from a strictly literal interpretation having been first considered and then discarded in favor of looseness [...]. In fact, at no point is literalness presumed". When does it become relevant to understand literally? Suppose that it was in Paris, and for the purposes of a Paris local election, that Marie had stated that she lives in Paris. "If she answers that she lives in Paris, the proposition expressed will itself be crucially relevant, hence the utterance will be understood literally, and Marie will have lied". In fact: "An utterance may be literally understood, but only at the end rather than at the beginning of the comprehension process, and only when relevance requires it". The procedure is actually the same: "The same procedure – derive enough cognitive effects to make up an interpretation consistent with the principle of relevance – yields in some cases a literal interpretation, in others a loose one. In other cases still, it yields a figurative interpretation".

**Mac-a-Mug Pro** A system for assisting a witness in approximating his or her description of the facial features of a criminal suspect. It is a computerized version of the Photofit process. See Section 8.2.2.

- **Machine learning** A branch of artificial intelligence and of data mining. Basically, machine learning enables AI systems to improve their performance, by augmenting their knowledge. "Most machine-learning based software products are capable of generating decision trees or IF/THEN rules. Some are capable of producing both" (Mena, 2003, p. 221). Mena describes:
  - Several products that primarily produce *decision trees* (ibid., section 7.9, pp. 221–229);
  - Several *rule-extracting tools* (ibid., section 7.10, pp. 229–232);
  - Several *machine-learning software suites* (Mena, 2003, section 7.11, pp. 233–248):
    - ANGOSS (http://www.angoss.com)
    - Megaputer (http://www.megaputer.com)
    - Prudsys (http://www.prudsys.de/discoverer)
    - Oracle data mining suite<sup>33</sup>
    - Quadstone (http://www.quadstone.com)
    - SAS (http://www.sas.com); cf. de Ville (2006).
    - SPSS (http://www.spss.com/spssbi/clementine)
    - Teradata Warehouse Miner (http://www.teradata.com)
    - thinkAnalytics (http://www.thinkanalytics.com)
- **MarshalPlan** A computer tool prototype of David Schum and Peter Tillers, supporting the organization of the evidence, and combining Wigmore Charts, an algebraic approach, and hypertext. Entering its fully operational phase around 2005, yet the project started in the early 1990s. See **procedural-support** systems, and see Section 4.1.1.
- **Mechanical Jurisprudence** An article by For Roscoe Pound<sup>34</sup> (1908) was entitled "Mechanical Jurisprudence". For the concept this title expresses, cf. Christie (1984a). Pound opposed the ossification of legal concepts into self-evident truths. By *mechanical jurisprudence*, which he called that way and he condemned, Pound referred the the wooden application of previous precedents to the facts of cases without regard to the consequences. For Pound, the logic of previous precedents alone would not solve jurisprudential problems. In opposition to mechanical jurisprudence, Pound offered his theory of *sociological jurisprudence*. Pound (1908) declared:

Herein is the task of the sociological jurist. Professor Small defines the sociological movement as "a frank endeavor to secure for the human factor in experience the central place which belongs to it in our whole scheme of thought and action." The sociological movement in jurisprudence is a movement for pragmatism as a philosophy of law; for

<sup>33</sup> http://www.oracle.com/ip/analyze/warehouse/datamining

<sup>&</sup>lt;sup>34</sup> The much cited American legal scholar Nathan Roscoe Pound (1870–1964) was Dean of Harvard Law School from 1916 to 1936. He also was the first one to receive a Ph.D. in botany from the University of Nebraska, which was in in 1898.

the adjustment of principles and doctrines to the human conditions they are to govern rather than to assumed first principles; for putting the human factor in the central place and relegating logic to its true position as an instrument.

One sentence in Pound (1908) resonates with current endeavours to treat law by means of artificial intelligence:

Undoubtedly one cause of the tendency of scientific law to become mechanical is to be found in the average man's admiration for the ingenious in any direction, his love of technicality as a manifestation of cleverness, his feeling that law, as a developed institution, ought to have a certain ballast of mysterious technicality.

Note however that it is not the purpose of AI to change legal conceptions. It is AI that has to adapt itself, when applied to law, to what legal scholars advocate. Pound (1908) claimed: "Jurisprudence is last in the march of the sciences away from the method of deduction from predetermined conceptions."

- **Mediation** In civil cases, a form of **case disposition** (q.v.). Like *arbitration*, mediation is a form of *alternative dispute resolution* (that is, alternative to the courts). Mediation can be either *binding* or *non-binding*.
- **Memory conformity** If two eyewitnesses who saw the same event then discussed it, this may influence what they later claim to remember. More in general, one has *confabulation* (which is undesirable) when the witness is also inferring, not merely reporting. Concerning the latter, see, e.g., Memon and Wright (1999); Gabbert et al. (2003, 2004); Luus and Wells (1994); Meade and Roediger (2002); Meudell et al. (1995); Principe and Ceci (2002); Skagerberg (2007).
- Mens rea The intention to transgress on the part of the defendant, and how specifically it is (if at all) intended to transgress. As opposed to *actus reus*, which is the performance of a forbidden action. Sometimes the intention does not match the action performed. A cardinal doctrine of English criminal law is expressed by the maxim: *Actus non facit reum nisi mens sit rea*, i.e., "An act does not itself constitute guilt unless the mind is guilty". "The maxim draws attention to the two essential elements of a crime" (Curzon, 1997, p. 21): "the physical element (the *actus reus*), i.e. the prohibited *conduct* [...] (the so-called 'condition of illegality')", and "the mental element (the *mens rea*), i.e. the *condition of mind* [...] (the so-called 'condition of culpable intentionality')" (ibid.). "Some writers suggest a third element absence of a valid defence, i.e. a defence which might reduce or negate defendant's criminal liability" (ibid.).

Models of time as known from artificial intelligence are potentially relevant for modelling such situations, because of the requirement of a temporal coincidence of *actus reus* and *mens rea*, and this can hold over an interval; the following casenote is quoted from Curzon (ibid.):

In Fagan v. MPC (1969), X accidentally drove his car on to Y's foot; he then deliberately left it there for a few minutes. X was charged with assault [...] and claimed that there was no coincidence of act and intent. It was held that X's conduct in driving the car on to Y's foot and allowing it to remain there constituted a continuing act; the assault was committed when X decided to leave the car on Y's foot. James J[ustice] stated: "It is not necessary that mens rea should be present at the inception of the actus reus; it can be imposed on an existing act. On the other hand, the subsequent inception of mens

*rea* cannot convert an act which has been completed without *means rea* into an assault" (Curzon, ibid.).

"Before 1935, [in English law] it was said that where the accused had caused the victim's death, he had to show that he did not have the *mens rea* for murder. This burden was placed on the prosecution in *Woolmington* v *DPP* [1935] AC 462" (Jefferson, 1992, p. 23). "Under the influence of *DPP* v *Smith* [1961] AC 290 (HL) it was thought that a person intended to do what the natural consequences of his behaviour were. In legal terms a man was presumed to intend the natural consequences of the Criminal Justice Act 1967 abolishes it" (ibid.).

Take involuntary manslaughter. "If death has occurred but the defendant did not possess an intent to kill or cause grievous bodily harm, then providing the action or omission was not totally accidental and therefore blameless, any ensuing prosecution will be for manslaughter" (Bloy, 1996, p. 159). The following categories are enumerated by Bloy (ibid.): *unlawful act manslaughter, reckless* (*subjective*) *manslaughter*, and *gross negligence*. For the former:

The modern definition was expressed by the House of Lords in *Newbury and Jones* (1976). Lord Salmon said an accused was guilty of manslaughter if it was proved that he intentionally did an act which was unlawful and dangerous and that the act inadvertently caused death. In deciding whether or not the act was dangerous the test is would "all sober and reasonable people" recognise that it was dangerous, *not* whether the *accused* recognised it as such. (Bloy, ibid.).

The test [for the dangerous character of the act] is clearly based upon an objective assessment of the circumstances. For example, what conclusions might a reasonable person be expected to reach about the impact of a burglary, late at night, where the occupant of the property is not far short of his 90th birthday? If it is to be reasonably expected that he has a weak heart, or [is] in poor health, then the act of burglary immediately becomes a dangerous act. If however, the reasonable person would not suspect that the victim might in some way be vulnerable to the type of enterprise which is undertaken then a manslaughter conviction is unlikely to be secured on the basis that the act is not a dangerous act. (Bloy, pp. 162–163).

For manslaughter as being the outcome of *gross negligence*, in English law: "The decision of the House of Lords in *Adomako* (1994) is of great significance in helping to clarify the ambit of gross negligence manslaughter and whether or not recklessness is a relevant concept within this species of manslaughter" (Bloy, ibid., p. 166). A patient undergoing surgery suffered a cardiac arrest and subsequently died, because the anaesthetist "failed to notice that an endotracheal tube had become disconnected from the ventilator supplying oxygen to the patient" (ibid., p. 167). "The time period between the disconnection occurring and the [anaesthetist] noticing that this was the cause of the problem was six minutes. [The anaesthetist] was charged with manslaughter and convicted It was not denied by the appellant that he had been negligent but it was his contention that his conduct was not criminal" (ibid.). Bloy (ibid.) explains the attitude of the Court of Appeal and then of the House of Lords, which both dismissed Adomako's appeal: The Court of Appeal treated the issue as one of breach of duty and stated the ingredients of involuntary manslaughter by breach of duty to be:

- the existence of a duty;
- the breach of the duty causing death; and
- gross negligence on the part of the accused which the jury considered justified a criminal conviction;

In respect of the *mens rea* the Court of Appeal was of the opinion that proof of any of the following states of mind might convince a jury that a defendant had been grossly negligent:

- indifference to an obvious risk of injury to health;
- actual foresight of the risk coupled with the determination to run it;
- an appreciation of the risk coupled with an intention to avoid it but also coupled with such a high degree of negligence in the attempted avoidance as the jury considered justified the conviction; and
- inattention or failure to advert a serious risk which went beyond "mere inadvertence" in respect of an obvious and important matter which the defendant's duty demanded he should address.

Twining and Miers (1976), while discussing *normative ambiguity* (see our entry for **logic**) provide examples of pairs of maxims pointing in different directions. The following pair is about *mens rea* (ibid., p. 211): "All statutory criminal offences are presumed, irrespective of their wording to include a *mens rea* requirement" (*Sweet* v. *Parsley* [1970] A.C. 132), but: "The presumption that all statutory offences include a *mens rea* requirement may be rebutted by the seriousness of the conduct to be prohibited" (*R. v. St Margaret's Trust* [1958] 1 W.L.R.<sup>35</sup> 522). Also see Fitzgerald (1961) "Voluntary and involuntary acts", and Hart's (1961b) "Negligence, mens rea and criminal responsibility". Throughout the history of law, there has been variation in how intention has been treated *vis-à-vis* liability (e.g., Jackson, 1971). Jackson (2010) points out:

Legal doctrine does not require proof that the *mens rea* "caused" the *actus reus*; what it requires (normally) is (merely) that the *mens rea* exists "contemporaneously" with the *actus reus* – in order that we may attribute to the latter the appropriate moral opprobrium, i.e. to show from the offender's intention the required immorality of his act.

**Meter-models** Quantitative models of the jurors' decision-making process. In such models, the verdict decision is based on the comparison of a meter reading of the final belief, to a threshold to convict. Different classes of such models include probabilistic models, algebraic models, stochastic models, and such modelling that is based on AI formalisms for belief revision. In the algebraic approach, belief updating is additive, whereas in probabilistic models is multiplicative. See Sections 2.1.1 and 2.1.6.

<sup>&</sup>lt;sup>35</sup> W.L.R. stands for the Washington Law Review.

- **MIMIC** Short for the name *Multiple Image-Maker and Identification Compositor*. A system for generating composite faces, for the purposes of assisting a witness to describe the features of a criminal suspect. MIMIC uses film strip projections. See Section 8.2.2.2.
- **Minutiae detection** Part of *fingerprint recognition*, and a prerequistie for *fingerprint matching algorithms*. This is a finer level than coarse-grained features such as ridges in a fingerprint image. See, e.g., Jiang et al. (2001), Espinosa-Duró (2002). See Section 8.7.
- **Model-based case-based reasoning paradigm** Within case-based reasoning, in artificial intelligence: "The model based approach assumes that there is a strong causal model of the domain task. It generally involves selecting among partially matched cases, in which symbolic reasoning is used to determine the difference between the given problem and the retrieved cases" (Stranieri & Zeleznikow, 2005a, Glossary).
- **Modus ponens** In logic, a form of inference by which if  $P \rightarrow Q$  holds and P holds, then Q holds.
- **Multi-agent system** In artificial intelligence, an approach such that intelligent behaviour is coordinated among a number of separate intelligent agents, these being autonomous software modules (sometimes embodied in robots). They are called *autonomous agents*. A precursor was the *blackboard* paradigm (for which, see **blackboard systems**). See Section 6.1.6.
- **Multimedia forensics** A branch of forensics concerned with uncovering perpetrators of piracy targeting protected digital content or encrypted applications. Typically, perpetration consists of unauthorised music and movie copying, either for private use of for selling pirated copies, thus eating a big bite of the profit of the record industry and the movie studios. Chang-Tsun Li (of the University of Warwick, England), has published a book (Li, 2008) on state-of-the-art *pirate tracking software*. A particular technique, *traitor tracing*, can be applied to multimedia forensics, but the term has previously been used also in the literature about cryptography. See Sections 8.2.5 and 6.1.2.5.
- **Naïve Bayesian classifiers** "Naïve Bayesian classifiers assume the effect of an attribute value on a given class is independent of the other attributes. Studies comparing classification algorithms have found that the naïve Bayesian classifier to be comparable in performance with decision tree and neural network classifiers" (Stranieri & Zeleznikow, 2005a, Glossary). For a given sample we search for a class  $c_i$  that maximises the posterior probability

$$P(c_i \mid x; \theta')$$

by applying Bayes rule. Then x can be classified by computing

$$c_{l} = \arg_{\substack{\max\\c_{i} \in C}} P(c_{i}|\theta')P(x|c_{i};\theta')$$

- **Nearest neighbour algorithm** "The nearest neighbour algorithm is used in information retrieval where data that is closest to the search is retrieved. To perform this search, we need a 'metric' (distance function) between the occurrence of each piece of data. The *k*th nearest neighbour algorithm classifies examples in a sample by using two basic steps to classify each example: (a) Find the *k* nearest, most similar examples in the training set to the example to be classified; (b) Assign the example the same classification as the majority of *k* nearest retrieved neighbours" (Stranieri & Zeleznikow, 2005a, Glossary).
- **Negotiation** "Negotiation is the process by which two or more parties conduct communications or conferences with the view to resolving differences between two parties. This process might be formal or mandated as in legal and industrial disputes, semi-formal, as in international disputes or totally informal as in the case of two prospective partners negotiating as to how they will conduct their married life" (Stranieri & Zeleznikow, 2005a, Glossary).
- **Network representation schemes** "A network representation scheme is a knowledge representation scheme using graphs, in which nodes represent objects or concepts in the problem domain and the arcs represent relations or associations between them. Semantic networks are an example of a network representation scheme" (Stranieri & Zeleznikow, 2005a, Glossary).
- **Neural networks** "A neural network receives its name from the fact that it resembles a nervous system in the brain. It consists of many self-adjusting processing elements cooperating in a densely interconnected network. Each processing element generates a single output signal which is transmitted to the other processing elements. The output signal of a processing element depends on the inputs to the processing element: each input is gated by a weighting factor that determines the amount of influence that the input will have on the output. The strength of the weighting factors is adjusted autonomously by the processing element as data is processed" (Stranieri & Zeleznikow, 2005a, Glossary). "Neural networks are particularly useful in law because they can deal with a) classification difficulties, b) vague terms, c) defeasible rules and d) discretionary domains" (ibid.). See Section 6.1.14.
- **Network topology** "A neural network topology is a specification of the number of neurons in the input layer, the output layer and in each of the hidden layers" (Stranieri & Zeleznikow, 2005a, Glossary).
- Nonmonotonic reasoning Such reasoning that it is not true that adding new information would never make the set of true statements to decrease. This is a standard concept in artificial intelligence. As a textbook explains " (Luger & Stubblefield, 1998, p. 269):

Traditional mathematical logic is *monotonic*: It begins with a set of axioms, assumed to be true, and infers their consequences. If we add new information to this system, it may cause the set of true statements to increase. Adding knowledge will never make the set of true statements decrease. This monotonic property leads to problems when we attempt to model reasoning based on beliefs and assumptions. In reasoning with uncertainty, humans draw conclusions based on their current set of beliefs and assumptions. In reasoning with uncertainty, humans draw conclusions based on their current set of beliefs;

however, unlike mathematical axioms, these beliefs, along with their consequences, may change as more information becomes available. *Nonmonotonic reasoning* addresses the problem of changing belief. A nonmonotonic reasoning system handles uncertainty by making the most reasonable assumptions in light of uncertain information. It then proceeds with its reasoning as if these assumptions were true. At a later time, a belief may change, necessitating a reexamination of any conclusions derived from that belief.

## Obligation See deontic logic, and contrary-to-duty obligations.

- **Ontology** "An ontology as an explicit conceptualisation of a domain" (Stranieri & Zeleznikow, 2005a, Glossary). See Sections 6.1.7.3 and 6.1.7.4. "Legal ontologies are generalised conceptual models of specific parts of the legal domain. They provide stable foundations for knowledge representation" (Mommers, 2003, p. 70). For example, Mommers (2003) presented an ontology "based on an analysis of the relation between the legal domain and knowledge about that domain. It is explained how knowledge in the legal domain can be analysed in terms of three dimensions (acquisition, object and justification), and how these dimensions can be employed in alternative designs for collaborative workspaces" (ibid.). Boer, van Engers, and Winkels (2003) discussed using ontologies in order to compare and harmonise legislation.<sup>36</sup>
- **Onus of proof** The same as **evidential burden.** See **Burden, evidential**. "In any given scenario the onus of proof indicates the degree of certainty for a given outcome to occur. In a criminal case in Common Law countries such proof must be beyond reasonable doubt, whereas in most civil cases in such countries, the proof required is by a fair preponderance of the evidence (i.e. more than 50% likely to occur)" (Stranieri & Zeleznikow, 2005a, Glossary). Jefferson explains (1992, p. 19):

There is a distinction between the evidential and legal burden of proof. The difference may be illustrated by reference to automatism [...]. Before the accused can rely on this defence, he must put forward some evidence that he was acting automatically when he, say, hit his lover over the head with a heavy ashtray. The evidence might consist of a witness's saying that he saw what happened or a psychiatrist's drafting a report. In legal terms he has to adduce or lead evidence. If he does not adduce such evidence, his plea will fail at that stage and the prosecution does not have to lead evidence that his plea should not succeed. If he does, the prosecution has to disprove that he was acting automatically. His burden is called the evidential burden or onus of proof. The prosecution's burden is the legal one.

<sup>&</sup>lt;sup>36</sup> "In the E-POWER project relevant tax legislation and business processes are modeled in UML to improve the speed and efficiency with which the Dutch Tax and Customs Administration can implement decision support systems for internal use and for its clients. These conceptual models have also proven their usefulness for efficient and effective analysis of draft legislation. We are currently researching whether conceptual modeling can also be used to compare 'similar' legislation from different jurisdictions to improve the capacity of the Dutch Tax and Customs Administration to react to future consequences of increased movement of people, products, and money between EU member states and increased harmonization between tax authorities in Europe. In addition, addressing the problem of comparing models is also expected to improve our methodology for modeling legislation." (Boer et al. 2003, p. 60).

- **Open-textured legal predicate** "Open textured legal predicates contain questions that cannot be structured in the form of production rules or logical propositions and which require some legal knowledge on the part of the user in order to answer" (Stranieri & Zeeleznikow, 2005a, Glossary).
- **Opinion question** In argumentation studies, Walton's (1997) *Appeal to Expert Opinion* offered (ibid., pp. 211–225) an argumentation scheme for "Argument for Expert Opinion", then reproduced in Walton et al. (2008, pp. 381–382). See s.v. *Expert opinion, Appeal to* above. The expert source is *E*; the subject domain is *S*; and *A* is a proposition about which *E* claims to be true (or false). The opinion question is: "What did *E* assert that implies *A*?". It is articulated in four detailed subquestions: "Was *E* quoted as asserting *A*? Was a reference to the source of the quote given, and can it be verified that E actually said *A*?"; "If *E* did not say *A* exactly, then what did E assert, and how was *A* inferred?"; "If the inference to *A* was based on more than one premise, could one premise have come from *E* and the other from a different expert? If so, is there evidence of disagreement between what the two experts (separately) asserted?"; "Is what *E* asserted clear? If not, was the process of interpretation of what *E* said by the respondent who used *E*'s opinion justified? Are other interpretations plausible? Could important qualifications have been left out?".
- **Outlier** A major anomaly, a notable departure from a pattern. Outliers may be a useful indicator for the purposes of crime detection. See Chapter 6. "Data objects that are grossly different from or inconsistent with the remaining set of data are called outliers" (Stranieri & Zeleznikow, 2005a, Glossary).
- **Overfitting** "Overfitting occurs when the data mining method performs very well with data it has been exposed to but performs poorly with other data" (Stranieri & Zeleznikow, 2005a, Glossary).
- **Overtraining of neural networks** "A neural network over-trains if it has been exposed to an abundance of examples, far too many times. In this case it can learn each input-output pair so well that it, in effect memorises those cases. The network classifies training set cases well, but may not perform so well with cases not in the training set" (Stranieri & Zeleznikow, 2005a, Glossary).
- **Palmprints** In biometrics, the print of the entire palm of a hand (Kumar et al., 2003), instead of just *fingerprints*. This is used in personal authentication systems, but is not practical in criminal investigation, as it is only seldom that a suspect would leave an entire palmprint, rather than fingerprints. See Section 8.7.
- **PATER** A software system for probabilistic computations for testing paternity claims (Egeland, Mostad, & Olaisen, 1997). See Section 8.7.2.1.
- **Pattern recognition** "The creation of categories from input data using implicit or explicit data relationships. Similarities among some data exemplars are contrasted with dissimilarities across the data ensemble, and the concept of data class emerges. Due to the imprecise nature of the process, it is no surprise that statistics has played a major role in the basic principles of pattern recognition" (Principe et al., 2000, p. 643).

- **PEIRCE-IGTT** A piece of software: an abductive inference engine from artificial intelligence, developed by a team led by John Josephson. One of its applications was to the modelling of reasoning on the evidence in a criminal case. See Section 2.2.1.5.
- **Pentitismo** In the Italian criminal justice system, an arrangement on the part of the prosecution, by which some political terrorist or member of the Mafia who was himself highly liable, were permitted to turn into a **state witness** (q.v.) against other defendants. There is some similarity to the *supergrass* system of Britain.

In Italy, a somewhat equivalent system is the *pentitismo*: in the late 1970s, as well as during the 1980s and still during trials held during the 1990s, on occasion a "repentant" terrorist would act as state witness against one or more defendants. Such a witness used to be called a *pentito*, or a *superpentito*. Sometimes the deal drew strong criticism, and in all fairness, defeated justice, such as when the murderer of a journalist obtained, by turning state witness, his own liberty, as well as that of the woman who had been his girlfriend before they were separately arrested in different circumstances. Once released, he immediately proceeded to wed another woman. One photograph that was highly visible in the mass media showed him talking, and, inside the same frame, the grim face of the father of the journalist whose murder justice had renounced punishing. It has also happened that the sincerity of a superpentito, securing convictions, was quite dubious. This was the case of the state witness during the Sofri case (for the 1972 terrorismrelated killing of a police inspector), as well as of a witness from the Mafia against former prime minister Andreotti, who was convicted for the violent death of a journalist. Also the testimony of a state witness who had raped and murdered in the Circeo case, securing the convictions of other far rightists for a bombing with massive casualties in Bologna (it took place on 2 August 1980), appears to be discredited.

- **Personal authentication systems** Systems for verifying the personal identity of a person, using biometric characteristics; e.g. using fingerprints with *digital signature technologies* (Isobe et al., 2001; Seto 2002).
- **Personal stare decisis** "Personal stare decisis is the tendency of judges to be consistent with themselves" (Stranieri & Zeleznikow, 2005a, Glossary).
- Persuasion argument One of two classes of arguments (the other one being *adversary* arguments), "depending on the goals and expectations of the participants. [It] consists of arguments in which the participants are motivated to reach a common agreement, for example in order to solve some problem": "the participants are both willing to be persuaded as well as trying to persuade" (Flowers et al., 1982, p. 275). This is relevant for computer tools for supporting negotiation.

Persuasion burden See burden of proof.

**Photoarray** An alternative to a *lineup* at which a suspect and foils are physically present and standing alongside each other. In a photoarray, the eyewitness is made to see a set of photographs instead. Also called *photospread*. An alternative is such an identity parade that there is no physical presence, but the eyewitness is made to see video clips of the suspect and foils. See Section 4.5.2.3.

- **Photofit** A system for assisting a witness in approximating his or her description of the facial features of a criminal suspect. See Section 8.2.2.
- **Pirate tracing software** A kind of software subserving *Multimedia forensics*, for uncovering perpetrators of piracy targeting protected digital content or encrypted applications. See Sections 8.2.5 and 6.1.2.5.
- **Plaintiff** The party that turns to the courts for adjudication against another party (the defendant). In some kinds of trial (at employment tribunals in England and Wales), the names are: *applicant* for the plaintiff; *respondent* for the defendant. In the *Civil Procedure Rules 1993*, in England and Wales, the term *plaintiff* was replaced with *claimant* (thought to be a more transparent, and more widely understood term: the same reform excised other traditional terms as well).
- **Plausibility, relative** "The distinction between the structure of proof and a theory of evidence is simple. The structure of proof determines what must be proven. In the conventional [probabilistic] theory [which Allen attacks] this is elements to a predetermined probability, and in the relative plausibility theory [which Ron Allen approves of] that one story or set of stories is more plausible than its competitors (and in criminal cases that there is no plausible competitor). A theory of evidence indicates how this is done, what counts as evidence and perhaps how it is processed" (Allen, 1994, p. 606). See Allen (1991, 2008a, 2008b).
- **Plausible inference** "Polya developed a formal characterisation of qualitative human reasoning as an alternative to probabilistic methods for performing commonsense reasoning. He identified four patterns of plausible inference: inductive patterns, successive verification of several consequences, verification of improbable consequences and inference from analogy" (Stranieri & Zeleznikow, 2005a, Glossary).
- **Plea** A statement made in court by other party in argument of the case. In particular, in Anglo-American criminal procedure,<sup>37</sup> the answer given by the defendant at the start of the trial, after the indictment. The answer is either *guilty*, or *not guilty*.
- **Plea bargain** In Anglo-American criminal procedure, and in countries influenced by that system: an offer which the prosecution has a discretion to make, so that in return for a *guilty plea* at the start of the trial (before evidence is submitted to the court), the defendant is offered sentencing concessions (a lighter sentence). Bargaining about the sentence also takes place if one of the defendants is offered the option to become a prosecution witness against other defendants. In countries on the European Continent, it used to be the case that there could be no plea bargaining. *Plea bargaining* applies in criminal cases, and should not be mistaken for a *settlement out of court*, stopping the proceedings in the trial of a civil case.
- **Police science** A field encompassing all aspects of law enforcement, focusing on the factors that affect crime and the police response to crime (Greene, 2006). One aspect of this discipline is the generation or refinement of methods of investigation, enabled by technological advances.

<sup>&</sup>lt;sup>37</sup> Kamisar, LaFave, Israel, and King (2003) covers criminal procedure in the United States of America.

- **Polygraph testing** Testing by means of hardware equipment, recording levels of arousal while the person tested is being questioned. Various methods exist. Polygraph testing and polygraph evidence are admitted in some countries (such as the United States), while being frowned upon for good reason in some other countries (including the United Kingdom). See Section 4.5.2.1. In the U.S., the Polygraph Protection Act of 1888 banned most polygraph tests for personnel selection purposes; the police in the U.S. resorts to such tests extensively during investigation. In some other countries (e.g., in the U.K.), the police is not allowed to use polygraph tests.
- **Post-charge questioning** Questioning of a suspect on the part of the police, after legal proceedings have started. This is not supposed to happen. Legal proceedings only start once the investigation stage ends: once a suspect is charged, the police can no longer question him or her. *Post-charge questioning* (on the part of police investigators) of terrorism suspects, possibly extended to other categories of criminals, was considered by the British government in November 2007, drawing criticism from civil liberties groups.
- **Preponderance of the evidence** On balance, the evidence seems to favour adjudication one way rather than in the other. This standard of proof is weaker than *beyond reasonable doubt*. Without sticking to the legal sense of these phrases, in the *Carneades* argumentation tool (Gordon & Walton, 2006), a standard of evidence stronger than *scintilla of evidence* and weaker than *beyond reasonable doubt* is The second weakest is PE (preponderance of the evidence): "A statement meets this standard iff its strongest defensible pro argument outweighs its strongest defensible con argument". A stronger standard (yet weaker than BRD, *beyond reasonable* doubt) is DV, which is defined as follows: "A statement meets this standard iff it is supported by at least one defensible pro argument and none of its con arguments is defensible".
- **Principal component analysis** In statistical data analysis: "Principal components analysis (PCA) is the technique most often used to identify features that do not contribute to the prediction from a data-set. PCA involves the analysis of variance between features and the class variable in a prediction exercise. PCA requires specialist statistical software, since the calculations are cumbersome. PCA is applicable only to features that are numeric" (Stranieri & Zeleznikow, 2005a, Glossary).
- **Principled negotiation** "Principled negotiation promotes deciding issues on their merits rather than through a haggling process focussed on what each side says it will and will not do" (Stranieri & Zeleznikow, 2005a, Glossary).
- **Prior convictions (evidence of)** See **character evidence** (of which this is a kind); **jury observation fallacy.**
- **Private privilege** The rule by which some categories of witnesses cannot be compelled to disclose certain kinds of information or documents. This includes protection from *self-incrimination*, either for the accused who under English law "may not be asked questions which tend to show that he may be guilty of any other offence than that with which he is presently charged" (Osborne, 1997,

p. 338) – and for other witness: "In a criminal case no witness can be compelled to answer any question which would, in the opinion of the judge, have a tendency to expose the witness to any criminal charge" (ibid.). Another kind of private privilege is *legal professional privilege*, by which lawyer–client communications, as well as communications with third parties for the purpose of actual or pending litigation, are protected from disclosure. Yet, the client may waive this privilege, and direct his or her lawyer accordingly. Moreover, communications to facilitate crime or fraud are not privileged.

- **Privilege** A rule that protects some kinds of communication or material documents from disclosure at trial or during a police investigation. There is *private privilege*, and there is *public interest privilege*.
- **Probabilistic information retrieval models** "Probabilistic information retrieval models are based on the probability ranking principle which ranks legal documents according to their probability of relevance to the query given every available source of information. The model estimates the probability of relevance of a text to the query, on the basis of the statistical distribution of terms in relevant and irrelevant text, given an uncertainty associated with the representation of both the source text and the information need, as well as the relevance relationship between them" (Stranieri & Zeleznikow, 2005a, Glossary).
- **Probability** Donald Gillies (2004, p. 286) provides this usefully concise explanation:

Probability theory originated from the study of games of chance, and these still afford a good illustration of some of the basic concepts of the theory. If we roll a fair dice, the probability of getting 5 is 1/6. This is written P(5)=1/6. A *conditional probability* is the probabilities of a result given that something else has happened. For example, the probability of 5 given that the result was odd, is no longer 1/6, but 1/3; while the probability of 5 given that the result was even, is no longer 1/6, but 0. A conditional probability is written P(A|B). So we have P(5|odd)=1/3, and P(5|even)=0. A related concept is *independence*. Two events A and B are said to be *independent* if the conditional probability of a die are normally assumed to be independent, that is to say, the probability of getting a 5 is always the same, namely 1/6, regardless of what results have appeared so far. An important concept for probability in AI is *conditional independence*. A and B are said to be *conditional independent* given C, if P(A|B&C) = P(A|C).

#### Also see **Probability**, prior and posterior.

- **Probability, objective** "An *objective probability* is one which is supposed to be a feature of the objective world, such as mass or electrical charge. A well-known objective interpretation of probability is the frequency interpretation. For example, to say that the probability of 5 is 1/6 on this interpretation is taken to mean that, in a long series of rolls of the die, the result 5 will appear with a frequency of approximately 1/6. Those who adopt this interpretation estimate their probabilities from frequency data" (Gillies, 2004, p. 287).
- **Probability, prior and posterior** With reference to Bayes' theorem, which when dealing with a hypothesis *H*, and some evidence *E*, states:

$$P(H|E) = P(E|H)P(H)/P(E)$$

this can be read as follows: the *posterior probability* P(H|E), i.e., the probability that *H* is true given *E*, is equal to the product of the *likelihood* P(E|H), i.e., the probability that *E* given the truth of *H*, and the *prior probability* P(H) of *H*, divided by the *prior probability* P(E) of *E*. A synonym of *prior probability* is a *priori probability*. A synonym of *posterior probability* is a *posteriori probability*.

- **Probability, subjective** It "is taken to be the measure of the degree of belief of a particular individual that some event will occur. For example, if I say that my subjective probability that it will rain in London tomorrow is 2/3, this means that I believe to degree 2/3 that it will rain in London tomorrow. A woman's degree of belief can be measured by the rate at which she is prepared to bet, or her betting quotient. It can be shown that, starting from this way of measuring belief, the standard axioms of probability can be derived. An application of the subjective theory of probability to Bayesianism produces what is known as *subjective Bayesianism*. Here P(H) is taken to represent the prior degree of belief in H after he has come to know evidence *E*. A rational man on this approach changes his degree of belief in the light of new evidence *E* from P(H) to P(H|E), where the value of P(H|E) is calculated using Bayes Theorem" (Gillies, 2004, p. 287).
- **Probative value** "Probative value is a relational concept that expresses the strength with which evidence supports an inference to a given conclusion. It is a crucial concept for determining admissibility (see Fed[eral] R[ules of] Evid[ence] 403, which instructs judges to exclude evidence when its probative value is substantially outweighted by its prejudicial, confusing, or duplicative effect) and for determining whether parties have satisfied their burdens of proof" (Allen & Pardo, 2007a, p. 108, fn. 2).
- **Procedural** *Procedural*, as opposed to *substantive*, as opposed to *procedural*, pertains to how to administer the judiciary process. For example, the order in which the parties and their witnesses testify belongs in procedure.
- **Procedural representation scheme** In artificial intelligence: "A procedural representation scheme is a knowledge representation scheme in which knowledge is represented as a set of instructions for solving a problem. Examples of procedural representation schemes include production rules", i.e., IF-THEN rules (Stranieri & Zeleznikow, 2005a, Glossary).
- **Procedural-support systems** A category of computer tools for assisting humans in handling court cases. "Procedural-support systems are AI & Law programs that lack domain knowledge and thus cannot solve problems, but that instead help the participants in a dispute to structure their reasoning and discussion, thereby promoting orderly and effective disputes" (Prakken & Renooij, 2001). "When procedural-support systems are to be useful in practice, they should provide support for causal reasoning about evidence" (ibid.). Available operational tools include *CaseMap, MarshalPlan*, and (in Italy) *Daedalus*. See Section 4.1.
- **Production rule** In artificial intelligence: a rule consisting of a *condition part* (or *left-hand part*) and an *action part* (or *right-hand part*). It is also called an *IF-THEN rule*.

- **Production rule system** In artificial intelligence: "Production rule systems are expert systems which consist of a set of production rules, working memory and the recognise-act cycle (also known as the rule interpreter)" (Stranieri & Zeleznikow, 2005a, Glossary).
- **PROLEXS** "The PROLEXS project at the Computer/Law Institute, Vrije Universiteit, Amsterdam, Netherlands is concerned with the construction of legal expert shells to deal with vague concepts. Its current domain is Dutch landlord-tenant law. It uses several knowledge sources and the inference engines of the independent knowledge groups interact using a blackboard architecture" (Stranieri & Zeleznikow, 2005a, Glossary). See Section 6.1.14.9 in this book, and s.v. **blackboard systems.** PROLEXS is the subject of Walker, Oskamp, Schrickx, Opdorp, and van den Berg (1991) and of Oskamp et al. (1989).
- **Prosecutorial discretion** The choice being left to the prosecutor (in some jurisdictions, especially in the Anglo-American adversarial system), whether to prosecute or not, and if not, to propose a *plea bargain*. As opposed to *obligatory prosecution*, which until recently used to be common in Continental Europe. Prosecution, as being the decision to charge a suspect with a crime, is the subject, e.g., of books by Miller (1969) and by Jacoby, Mellon, Ratledge, and Turner (1982). Cf. Kingsnorth, MacIntosh, and Sutherland (2002).<sup>38</sup> **Discretion** (q.v.) is a broader concept.
- **Public inquiry** As public inquiries in Britain are inquisitorial, as opposed to the adversarial system that characterises the courts, the impact of this contrast is explained at the entry for **inquisitorial**. As early as the Bristol Public Inquiry in the late 1990 (it was chaired by Sir Ian Kennedy: see **inquisitorial**), "the Inquiry established a process whereby the statements of witnesses who were not to be called were made available on the Inquiry's website, together with the comment, if any, of someone identified by the Inquiry's lawyers as having been the object of criticism in the statement" (Kennedy, 2007, p. 37). That was also the case of witnesses that were called to give oral evidence before the Inquiry, but then their statements with the comments were not posted at the website until the

<sup>&</sup>lt;sup>38</sup> Flowe et al. (2010) pointed out: "Prosecutors have the discretion to determine whether a suspect will be charged and what charges the suspect should face (Bordenkircher v. Hayes, 1978). Prosecutors also have a legal and ethical obligation to protect felony suspects who are not just innocent-in-fact, but who are also innocent-in-law (California District Attorneys Association, 1996). Charges should not be filed even if the prosecutor has a personal belief in the suspect's guilt. Rather, issuing decisions should be guided by whether the evidence in the case is legally sufficient and admissible. Previous archival research has found that felony charges are more likely to be issued if there is physical evidence to support the allegations (Albonetti, 1987; Feeney, Dill, & Weir, 1983; Jacoby et al., 1982; Miller, 1969; Nagel, & Hagan, 1983) and if the crime is serious, such as when a victim has been injured (Kingsnorth et al., 2002). Factors that may lead prosecutors to not file charges include: A primary aggressor has not been identified (e.g., the California Primary Aggressor Law requires a primary aggressor be identified), the suspect is thought to be innocent, or there are 'interests of justice' concerns, such as the suspect will provide testimony in a more serious case (Silberman, 1978). Despite the fact that much research has been carried out examining the relationship between evidentiary factors and felony issuing decisions, little is known about the role that eyewitness identification evidence may play in prosecution."

witness had given oral evidence. That way, the contributions of the various witnesses were known in advance. This made it possible to schedule the witness' appearance accordingly. Resorting to a website did away with *Salmon letters* (ibid.):

Not only was this [web-supported procedure] fair to all, but it allowed the Inquiry to take account of and explore differences of view when questioning witnesses. Moreover, it meant that the Inquiry could avoid a procedure known as the issuing of "Salmon letters", named after Lord Justice Salmon who chaired the Royal Commission on Tribunals in 1966. The purpose of "Salmon letters" was to put individuals on notice should they have been criticised in evidence. It was a procedural response to the evidence heard, designed to ensure fairness. I took the view that it reflected an approach which equated Public Inquiries with judicial proceedings. It was, therefore, inappropriate and, moreover, unnecessary. Fairness could be maintained in a far more coherent and sensible way. In effect, the "Salmon letters" procedure introduced an unnecessary formal step into the proceedings, which commonly provoked legal to-ing and fro-ing. By getting witnessed to reveal and confront their various accounts well in advance, everyone knew where they stood. There was no need to have resort to some additional, and time-consuming, and, frankly, out-dated procedural mechanism.

- **Public interest privilege** Also called *public interest immunity*. A category of *privilege*, by which "evidence is excluded because of some public interest in withholding it which outweighs the usual public interest in open litigation" (Osborne, 1997, p. 340). A lesser legal concept than *privilege* is *confidential-ity*, and it, too, is such that communications in professional–client relationships are sometimes protected (which is, instead, a right, and is considered *private privilege*, for the client of a lawyer). "[O]ne originally separate basis of public privilege which has merged somewhat into the mainstream is the rule that no question may be asked in proceedings which would tend to lead to the identification of any person who has given information leading to the institution of a prosecution" (ibid., p. 342).
- **Questioned documents evidence** Evidence from forensic tests (Levinson, 2000), concerning the authenticity of documents or parts thereof, of their authorship ascription, of their date, or of the hand in which they are written. There exist techniques for determining authenticity, age, ink and paper sources, equipment used, forgeries, alterations, and erasures, as well as *handwriting identification*, the latter being the subject of Morris (2000). See Section 6.1.10. The following is quoted from the introduction to the useful entry for 'Questioned document examination' in Wikipedia<sup>39</sup>:

**Questioned document examination** (QDE) is known by many names including *forensic document examination, document examination, diplomatics, handwriting examination,* and sometimes *handwriting analysis*, although the latter name is not often used as it may be confused with graphology. Likewise a forensic document examiner is not to be confused with a graphologist, and vice versa. The questioned document division of a crime lab is sometimes referred to as "QD" in popular media.

The task of forensic document examination is to answer questions about a disputed document using a variety of scientific processes and methods. Many examinations involve a comparison of the questioned document, or components of the document, to a

<sup>&</sup>lt;sup>39</sup> http://en.wikipedia.org/wiki/Questioned\_document\_examination

set of known standards. The most common type of examination involves handwriting wherein the examiner tries to address concerns about potential authorship.

One task of a forensic document examiner is to determine if a questioned item originated from the same source as the known item(s), then present their opinion in court as an expert witness. Other tasks include determining what has happened to a document, determining when a document was produced, or deciphering information on the document that has been obscured, obliterated or erased.

Professional organisations include the American Society of Questioned Document Examiners (ASQDE), the American Academy of Forensic Science (AAFS), the Southwestern Association of Forensic Document Examiners (SWAFDE), and the Southeastern Association of Forensic Document Examiners (SAFDE) in the U.S.A.; the Canadian Society of Forensic Science (CSFS); the Australasian Society of Forensic Document Examiners (ASFDE) in Australia and Asia; the Gesellschaft für Forensische Schriftungtersuchung (GFS) in Frankfurt (Germany); the Asociación Profesional de Peritos Calígrafos de Cataluña (in Spain); the National Association of Document Examiners (NADE); the Association of Forensic Document Examiners (AFDE); and so forth.

- **Questioning** During police investigations, the process of asking suspects, or actual or potential witnesses, such questions that seek to uncover information. This is quite different from *examination* in court. It is important not to confuse examination in court, with questioning by the police during investigation. Legal proceedings only start once the investigation stage ends: once a suspect is charged, the police can no longer question him or her. *Post-charge question-ing* (on the part of police investigators) of terrorism suspects, possibly extended to other categories of criminals, was considered by the British government in November 2007, drawing criticism from civil liberties groups.
- **Questmap** A computer tool for supporting argumentation (Carr, 2003). *QuestMap* is based on IBIS, mediates discussions, supports collaborative argumentation, and creates information maps, in the context of legal education. Collaborative problem identification and solving is the purpose of IBIS, an Issue-Based Information System. Problems are decomposed into issues. See Section 3.7.
- **Ratio decidendi** The rationale of a decision made by an adjudicator in a court case. The ground or reason for the decision. The point in a case that determines the judgement. "*Ratio decidendi* is Latin for the "reasons for decision", that is the legal reasons why the judge came to the conclusion that he or she did. It is the fundamental basis for the rule of law in common law systems. Stare decisis says that the ratio decidendi will apply to subsequent cases decided by courts lower in the hierarchy" (Stranieri & Zeleznikow, 2005a, Glossary).
- **Reason!Able** A computer tool for supporting argumentation (van Gelder, 2002). Some tools envisage collaboration among users, yet *Reason!Able* only has one user per session. It guides the user step-by-step through the process of constructing an argument tree, containing claims, reasons, and objections, the latter two kinds being complex objects which can be unfolded to see the premises. See Section 3.7.

**Rebutter** A defendant's answer in matter of fact (about the accusation and the evidence) to a plaintiff's (or, in particular, prosecution's) *surrejoinder*. (See **replication**.)

**Reference-class problem** Allen and Pardo (2007a, p. 109) find that scholarship which applies probability theory to juridical proof

suffers from a deep conceptual problem that makes ambiguous the lessons that can be drawn from it - the problem of reference classes. The impolications of this problem are considerable. To illustrate the problem, consider the famous blue bus hypothetical. Suppose a witness saw a bus strike a car but cannot recall the color of the bus; assume further that the Blue Company owns 75 percent of the buses in the town and the Red Company owns the remaining 25 percent. The most prevalent view in the legal literature of the probative value of the witness's report is that it would be determined by the ratio of the Blue Company buses to Red Company buses, whether this is thought of as or plays the role of a likelihood ratio or determines information gain (including an assessment of a prior probability) [...] But suppose the Red Company owns 75 percent (and Blue the other 25 percent) of the buses in the county. Now the ratio reverses. And it would do so again if Blue owned 75 percent in the state. Or in the opposite direction: it would reverse if Red owned 75 percent running in the street where the accident occurred (or on that side of the street) and so on. Or maybe the proper reference class has to do with safety standards and protocols for reporting accidents. Each of the reference classes leads to a different inference about which company is more likely liable, and nothing determines the correct class, save one: the very event under discussion, which has a likelihood of one and which we are trying to discover.

"The blue bus hypothetical [...] exemplifies the general implications of reference classes, and those implications would hold for practically any attempt to quantify a priori the prbative value of evidence" (ibid., p. 113).

**Regression** In statistics: "In linear regression, data is modelled using a straight line of the form  $y = \alpha x + \beta$ .  $\alpha$  and  $\beta$  are determined using the method of least squares. Polynomial regression models can be transformed to a linear regression model." (Stranieri & Zeleznikow, 2005a, Glossary).

**Rejoinder** The defendant's answer to the plaintiff's *replication*. (See **replication**.)

**Relevance** Pertinence of a piece of evidence, for the purposes of proving that which is to be proven in court, as a criterion for such evidence to be heard or excluded instead. Yovel (2003) provided a mildly formalised treatment, with a notation in *MicroProlog* style, of what in legal scholarship about evidence is known as *relevance*. See Section 4.6 in this book. Here is a definition from a legal textbook on evidence: "The purpose of calling evidence in court is to try to prove certain facts to be true. Evidence which assists in this process is relevant and that which does not assist is irrelevant. It is the first rule of evidence, and one to which there are no exceptions, that irrelevant evidence is never admissible in court. This does not mean that relevant evidence is always allowed, because sometimes the court disallows it despite its relevance. The greater proportion of this book is about rules which limit the extent to which relevant evidence can be used" (Templeman & Reay, 1999, p. 1). Modern theories of relevance are the subject of Tillers (1983). Also see Richard Lempert's (1977) 'Modeling Relevance'.

There also exist other senses of *relevance*: in *sensitivity analysis* from statistics, including when it is applied to legal evidence, "An item of evidence is called 'relevant' to a hypothesis is observing the evidence changes the probability that the hypothesis is true" (Levitt & Laskey, 2002, p. 375). Moreover, for the *relevance of an utterance*, see in the entry for **loose talk** in this Glossary.

Teun van Dijk (1989) describes the concept of relevance as it applies to a class of modal logics broadly called "relevance logics" as a concept grounded firmly in the pragmatics, and not the semantics or syntax of language. Within a discursive community, the data items in a generic argument must be relevant to the claim to the satisfaction of members of the community. The purpose of van Dijk's article was stated as follows (ibid., p. 25):

In this paper an attempt will be made to provide a general and informal discussion of "relevance" and related notions from this linguistic point of view. More particularly, it will be argued that the relevance requirement must be satisfied by any compound sentence, viz. by all connectives, and by any coherent discourse, i.e. not only deductive or argumentative, in natural language. Although such a claim might have feed-back in the philosophy of logic, we will be concerned with the applications of some recent ideas from relevance logics in the explicit characterization of these properties of natural language.

# Reparational obligations See contrary-to-duty obligations.

- **Replication** In American law: the plaintiff's (or the prosecution's) reply to the "defence", intended as the original statement of the defendant or his defence lawyer (or team of lawyers). The plaintiff's *replication* may prompt an answer in matters of fact, called the defendant's *rejoinder*, which may prompt the plaintiff's *surrejoinder*, which may prompt the defendant's *rebutter*, which may prompt that plaintiff's *surrebutter*.
- **Resolution** "Resolution is a semi-decidable proof technique for first order predicate calculus, which given an unsatisfiable well formed formula, proves it to be unsatisfiable. If the well formed formula is not unsatisfiable, there is a possibility that the algorithm may not terminate" (Stranieri & Zeleznikow, 2005a, Glossary).
- **Respondent** In some kinds of trial, the defendant; then the name for the plaintiff is *applicant*.
- **Rule base** (or **ruleset**). "The rule base of a legal (or indeed any) rule based expert system is that part of the system in which the rules are stored. It is kept separate from the other part of the expert system, the inference engine" (Stranieri & Zeleznikow, 2005a, Glossary).
- **Rule-based expert system** "A rule based expert system is a collection of rules of the form : IF condition(s) THEN action. Rule based systems include production rule systems, and some would argue, logic based systems as well" (Stranieri & Zeleznikow, 2005a, Glossary).
- **Rule-extracting tools** A category of *machine learning* tools. Several commercial rule-extracting tools were described by Mena (2003, section 7.10, pp. 229–232):
  - AIRA (http://www.godigital.com.br), and Excel add-on
  - DataMite,<sup>40</sup> for relational databases
  - SuperQuery (http://www.azmy.com)
  - WizWhy (http://www.wizsoft.com)

<sup>40</sup> http://www.lpa.co.uk/ind\_top.htm

### Salmon letters See public inquiry.

- **Scheme** *Argumentation schemes* are "predefined patterns of reasoning. A single scheme describes an inference, the necessary prerequisties for that inference, and possible critical questions that might undercut the inference" (van den Braak & Vreeswijk, 2006).
- **Scintilla of evidence** A tenuously probative piece of evidence, enough to motivate probing further, searching for more evidence. Without sticking to this sense of the phrase, in the *Carneades* argumentation tool the weakest standard of evidence is SE (*scintilla of evidence*): "A statement meets this standard iff it is supported by at least one defensible pro argument".

### Secondary obligation See contrary-to-duty obligations.

Sensitivity analysis An analysis of how given pieces of evidence being available, would affect the demonstrability of given claims. It can be used when evaluating litigation risk: see Section 4.3.1. It can be useful for a costs/benefits analysis of whether to obtain some piece of evidence: see Section 4.3.2. Levitt and Laskey (2002, Sections 1.4.4 and 1.5.4) discussed and exemplified such a sensitivity analysis, in the context of their analysis of the evidence in a murder case by means of Bayesian networks (BNs). Their example concerns the French case in which Omar Raddad was convicted in 1994 of murdering his employer, but then pardoned because of how controversial the case was. Levitt & Laskey (ibid., p. 375) wrote:

The BN knowledge representation can capture useful quantitative behaviour regarding alternative explanations for the same items of evidence. For example, the relevance of items of evidence regarding Raddad depends on their relationship in the evidential argument implied by the BN, and [...] they can change as evidence accrues. In particular, the evidence of Raddad's location at the time of the murder is co-dependent with the evidence from the examiner's testimony about the time of death. The relevance of one depends dynamically on the other, and they co-vary as evidence is accrued to the global evidential argument about Raddad's guilt or innocence that is modelled by [a given] BN [...]. This introduction of the examiner's testimony [...] does not change the probability of Raddad's guilt. That is, the evidence is not relevant to Raddad's guilt given the evidence accrued up to that point. The examiner's report becomes relevant when we accrue the evidence that Raddad was with his relatives on Monday. In the presence of the examiner's report, the evidence provides an alibi and greatly reduces the probability of guilt. Subsequently, the evidence regarding a possible typographical error of the recording of the day of the death changes the relevance of Raddad's alibi for his whereabouts on Monday from very strongly relevant to very weakly relevant.

The process of exploring complex models to identify subtleties such as this can be facilitated by computational tools, which are in turn enabled by the sophisticated representational and inferential capabilities of the modular BNFrag [i.e., Bayesian network fragments] architecture described in this Article. For example, sensitivity analysis can be used to examine the impact of changes in modeling assumptions of the strength of relevance of evidence to hypothesized conclusions. [...] The term sensitivity analysis has multiple, related, but different definitions in the literature on statistics and scientific experimentation. [... W]e illustrate the use of a particular sensitivity analysis, sometimes called an "importance measure," specifically to compute a measure of the weight or relevance of evidence items to a BN query. An item of evidence is called "relevant" to a hypothesis is observing the evidence changes the probability that the hypothesis is true. [...]

- **Sentenza suicida** In Italy: a justification of a verdict written by a trained judge in a deliberately flawed manner, so that an appeal trial would necessarily take place, thus overturning a verdict given by jurors who outvoted that judge at a *mixed court* (nonexistent in Anglo-Saxon countries): see jury.
- Settlement out of court In a civil case, an agreement among the parties not to continue in the case being litigated. It involves a compromise as to compensation. A settlement out of court should not be mistaken for *plea bargaining*, which applies in criminal cases.
- **Shield** For a defendant in a criminal case: such protection that makes it inadmissible for prosecution to cross-examine in order to obtain bad character evidence, or to adduce such evidence. See **character evidence**, and see **imputation**. Situations in which the defendant loses his shield include such that come into being if he claims good character for himself, or bad character for prosecution witnesses (or for the prosecutor).
- **Shield bidding** A form of malpractice related to *online auction fraud*. It is also known as *bid shielding*. It "occurs when the buyer uses another email address or a friend (the shield) to drive up prices and discourage bids on an item she wants. At the last minute, the shield withdraws the high bid, allowing the buyer to win the item at a lower price. Most auction sites forbid retracting a bid once it's made, and on eBay shill and shield bidding is clearly prohibited" (Wahab, 2004). See Section 6.2.3.
- **Shilling** A form of malpractice related to *online auction fraud*. It is known as *bid shilling*, or *shill bidding*. "The ability to disguise identity, revoke bids, and maintain multiple on-line identities may facilitate undesirable practices like *shilling*. Shilling is where sellers arrange for false bids to be placed on the items they are selling. Sellers place the bid themselves by using multiple identities or by using confederates. The idea is to force up the cost of a winning bid and encourage interest in the auction" (Mena, 2003, p. 256). "*Shill bidding*: is the intentional sham bidding by the seller to drive up the price of his/her own item that is up for bid. This is accomplished by the sellers themselves and/or someone that is associated with the seller making bids to purposely drive up the price of the seller's item." (Wahab, 2004). Cf. **shield bidding**. See Section 6.2.3.
- Similar fact evidence An exception to the rule which in criminal law prevents the disclosure of evidence of disposition and character (see evidence of disposition). In England, "the law will permit the prosecution to adduce evidence of previous misconduct where its nature, *modus operandi* or some other circumstance, shows an unmistakable similarity to the offence charged. This must be strong enough to go beyond any question of coincidence so as to lead the jury to conclude 'this is the work of the same man'" (Osborne, 1997, pp. 313–314). For a somewhat different concept, see doctrine of chances.
- **Situation theory** A formal theory that considers actors within the situation in which they are.

Situation Theory grew out of attempts by Jon Barwise in the late 1970s to provide a semantics for "naked-infinitive" perceptual reports such as "Claire saw Jon run". Barwise's intuition was that Claire didn't just see Jon, an individual, but Jon doing something, a situation. Situations are individuals having properties and standing in relations. A theory of situations would allow us to study and compare various types of situations or situation-like entities, such as facts, events, and scenes. One of the central themes of situation theory of meaning and reference should be set within a general theory of information, one moreover that is rich enough to do justice to perception, communication, and thought. By now many people have contributed by the need to give a rigorous mathematical account of the principles of information that underwrite the theory.<sup>41</sup>

- Slate A particular computer tool; it supports human users' reasoning by argumentation (Brigsjord, Shilliday, Taylor, Clark, & Khemlani, 2006).
- Slot-machine model An extreme logicist view of a legal system. See logic.
- **Smurfing** "the breaking up of large sums of money into smaller units, and subsequent passing of each segment through multiple accounts. Used by money launderers, the practice is designed to make the money trail extremely difficult to follow" (Sparrow, 1991, p. 252, fn. 1). See Chapter 6.
- **Social epistemics** Social aspects of the philosophy of knowledge, according to Alvin Goldman (1987a, 1987b). Because of such social aspects, the *requirement of total evidence* is an invalid principle, and an example of contravening on it is *exclusionary laws of evidence* in court: jurors are not given all the evidence, and Goldman (1991), who approves of this, calls this *epistemic paternalism*.
- **SPLIT-UP** "SPLIT-UP is a hybrid rule based/ neural network system developed at La Trobe University that uses textbooks, heuristics, expert advice and cases to model that part of the Family Law Act 1975 (Australia) which deals with property division. Explanation is provided through the use of Toulmin argument structures" (Stranieri & Zeleznikow, 2005a, Glossary. It was they who developed SPLIT-UP).
- **Stare decisis** Stare decisis is a fundamental principle in common law legal systems. The principle dictates that the reasoning, loosely, *ratio decidendi*,<sup>42</sup> used in new cases must follow the reasoning used by decision-makers in courts at the same or higher level in the hierarchy. Stare decisis is unknown to civil law, where judgments rendered by judges only enjoy the *authority of reason*.
  - *Traditional stare decisis* is when the same decision has to be taken as a higher court judging about the same facts.

*Local stare decisis* is when the same decision has to be taken as the same court judging about the same facts.

<sup>&</sup>lt;sup>41</sup> From the summary of Aczel, Israel, Katagiri, and Peters (1993). "Situation theory is the result of an interdisciplinary effort to create a full-fledged theory of information. Created by scholars and scientists from cognitive science, computer science and AI, linguistics, logic, philosophy, and mathematics, it aims to provide a common set of tools for the analysis of phenomena from all these fields. Unlike Shannon-Weaver type theories of information, which are purely quantitative theories, situation theory aims at providing tools for the analysis of the specific content of a situation (signal, message, data base, statement, or other information-carrying situation). The question addressed is not how much information is carried, but what information is carried" (from the publisher's blurb of Aczel et al. 1993).

<sup>&</sup>lt;sup>42</sup> The ground or reason for the decision. The point in a case that determines the judgement.

*Personal stare decisis* is when the same decision has to be taken as the same judge judging about the same facts.

**State witness** One of the intended defendants in a criminal case, who having been offered a deal by the prosecution, turns into a witness, allied with the prosecution, against at least one defendant. This is not only the case of minor offenders. Sometimes offenders with a heavy liability are offered to become state witnesses, or at any rate to inform investigators in such a manner that would secure convictions. In Britain, a state witness is said to be giving *Queen's evidence*.

In Britain, a *supergrass* may be a very important informer, not necessarily a state witness. The supergrass system in Britain emerged in 1972, and in its heyday years it was used against armed robbers in London. It also was used to combat terrorism in Northern Ireland. The first police informer within the supergrass system was Bertie Smalls, who shopped hundreds of associates in 1976; the operation was masterminded by Scotland Yard detective Tony Lundy.

In Italy, a somewhat equivalent system is the *pentitismo*: in the late 1970s, as well as during the 1980s and still during trials held during the 1990s, on occasion a "repentant" terrorist would act as state witness against one or more defendants. Such a witness used to be called a *pentito*, or a *superpentito*. Sometimes the deal drew strong criticism, and in all fairness, defeated justice, such as when the murderer of the journalist Walter Tobagi obtained, by turning state witness, his own freedom, as well as that of the woman who had been his girlfriend before they were separately arrested in different circumstances. Once released, he immediately proceeded to wed another woman. One photograph that was highly visible in the mass media showed him talking, and, inside the same frame, the grim face of the father of the journalist whose murder justice had renounced punishing. It has also happened that the sincerity of a superpentito, securing convictions, was quite dubious. This was the case of the state witness during the Sofri case (for the 1972 terrorism-related killing of a police inspector), as well as of a witness from the Mafia against Italy's former prime minister Giulio Andreotti, who was convicted for the violent death of a journalist. Also the testimony of a state witness who had raped and murdered in the Circeo case, securing the convictions of other far rightists for a bombing with massive casualties in Bologna, appears to be discredited.

- Statistically oriented case-based reasoning paradigms In artificial intelligence: "In statistically oriented case based reasoning paradigms, cases are used as data points for statistical generalisation. The case based reasoner computes conditional probabilities that a problem should be treated similarly to previously given cases" (Stranieri & Zeleznikow, 2005a, Glossary). See case-based reasoning.
- **Statistical reasoning** "In contrast to symbolic reasoning, statistical reasoning derives its results by checking whether or not there is a statistical correlation between two events. Examples of statistical reasoning include neural networks and rule induction systems. Whilst rule based systems are considered to be examples of symbolic reasoning; the rules are often derived using statistical tests" (Stranieri & Zeleznikmow, 2005a, Glossary).
- Statutory law In countries like Britain there are both *statutory law*, i.e., laws passed by Parliament, and *common law*, i.e., the body of sentences passed by judges, and

that serve as precedent. "Statutory law is that body of law created by acts of the legislature – in contrast to constitutional law and law generated by decisions of courts and administrative bodies" (Stranieri & Zeleznimkow, 2005a, Glossary).

- **Stevie** An argumentation-based computer tool intended for supporting criminal investigation. Stevie enables analysts to view evidence and inferences, The program is described as distilling out of that information coherent *stories* which are "hypothetical reconstructions of what might have happened", and which are defined as "a conflict-free and self-defending collection of claims" which moreover is temporally consistent (van den Braak & Vreeswijk, 2006). See Section 3.10.2.
- **Story** A narrative: see Chapter 5. In *Stevie*, a *story* is "a conflict-free and self-defending collection of claims" which moreover is temporally consistent (van den Braak & Vreeswijk, 2006). See Section 3.10.2.
- **Story model** Of Nancy Pennington and Reid Hastie (1986, 1988, 1992, 1993), for modelling jurors' decision making. It is based on the information processing paradigm from cognitive psychology.
- **Striking similarity** A strong similarity between a crime to previous convictions of a criminal suspect or defendant, such that the crime under trial and the ones from previous convictions are in the same legal category, and shared similarities such as the *modus operandi*, geographic proximity, and so forth. It is where there is such "striking similarity", that a case may get to the jury on previous convictions alone. See *jury observation fallacy*.
- **Substantive** *Substantive*, as opposed to *procedural*, pertains to the rules of right administered by a court, rather than to how to administer it.
- **Supergrass** In Britain, an informer whose collaboration is extremely fruitful for police investigators. Such an informer may or not be a **state witness** (q.v.). The latter is always the case, instead, of Italy's **pentitismo** (q.v.). The supergrass system in Britain emerged in 1972, and in its heyday years it was used against armed robbers in London. It also was used to combat terrorism in Northern Ireland. The first police informer within the supergrass system was Bertie Smalls, who shopped hundreds of associates in 1976; the operation was masterminded by Scotland Yard detective Tony Lundy.
- **Surrebutter or surrebuttal** A plaintiff reply to a defendant's *rebutter*. (See *replication*.)
- Surrejoinder A plaintiff reply to a defendant's rejoinder. (See replication.)
- **Teleological** Of an argument (as opposed to *deontological* reasoning): of a "[reason given for acting or not acting in a certain way may be on account of what so acting or not acting will bring about. [...] All teleological reasoning presupposes some evaluation" (MacCormick, 1995, p. 468).
- **Text mining** "sometimes alternately referred to as *text data mining*, roughly equivalent to *text analytics*, refers to the process of deriving high-quality information from text. High-quality information is typically derived through the divining of patterns and trends through means such as statistical pattern learning. Text mining usually involves the process of structuring the input text (usually parsing, along with the addition of some derived linguistic features and the removal of

others, and subsequent insertion into a database), deriving patterns within the structured data, and finally evaluation and interpretation of the output. 'High quality' in text mining usually refers to some combination of relevance, novelty, and interestingness. Typical text mining tasks include text categorisation, text clustering, concept/entity extraction, production of granular taxonomies, sentiment analysis, document summarisation, and entity/relation modelling (i.e., learning relations between named entities)".<sup>43</sup> See Chapter 6. Commercial tools include:

- AeroText provides a suite of text mining applications for content analysis. Content used can be in multiple languages.
- Attensity hosted, integrated and stand-alone text mining (analytics) software that uses natural language processing technology to address collective intelligence in social media and forums; the voice of the customer in surveys and emails; customer relationship management; e-services; research and e-discovery; risk and compliance; and intelligence analysis.
- Autonomy suite of text mining, clustering and categorisation solutions for a variety of industries.
- Basis Technology provides a suite of text analysis modules to identify language, enable search in more than 20 languages, extract entities, and efficiently search for and translate entities.
- Endeca Technologies provides software to analyse and cluster unstructured text.
- Expert System S.p.A. suite of semantic technologies and products for developers and knowledge managers.
- Fair Isaac leading provider of decision management solutions powered by advanced analytics (includes text analytics).
- Inxight provider of text analytics, search, and unstructured visualisation technologies. (Inxight was bought by Business Objects that was bought by SAP AG in 2008).
- LanguageWare text analysis libraries and customisation tooling from IBM.
- LexisNexis provider of business intelligence solutions based on an extensive news and company information content set. Through the recent acquisition of Datops LexisNexis is leveraging its search and retrieval expertise to become a player in the text and data mining field.
- Nstein Technologies text mining solution that creates rich metadata to allow publishers to increase page views, increase site stickiness, optimise SEO, automate tagging, improve search experience, increase editorial productivity, decrease operational publishing costs, increase online revenues. In combination with search engines it is used to create semantic search applications.

<sup>&</sup>lt;sup>43</sup> Based upon the Wikipedia entry http://en.wikipedia.org/wiki/Text\_mining (the way it was in late July 2010).

- SAS solutions including SAS Text Miner and Teragram commercial text analytics, natural language processing, and taxonomy software leveraged for Information Management.
- Silobreaker provides text analytics, clustering, search and visualisation technologies.
- SPSS provider of SPSS Text Analysis for Surveys, Text Mining for Clementine, LexiQuest Mine and LexiQuest Categorize, commercial text analytics software that can be used in conjunction with SPSS Predictive Analytics Solutions.
- StatSoft provides STATISTICA Text Miner as an optional extension to STATISTICA Data Miner, for Predictive Analytics Solutions.
- Thomson Data Analyzer enables complex analysis on patent information, scientific publications and news.

Open source resources include<sup>44</sup>:

- GATE natural language processing and language engineering tool.
- UIMA UIMA (Unstructured Information Management Architecture) is a component framework for analysing unstructured content such as text, audio and video, originally developed by IBM.
- YALE/RapidMiner with its Word Vector Tool plug-in data and text mining software.
- Carrot2 text and search results clustering framework.
- **Time** *Legal time* is a debated issue in legal theory (e.g., Jackson, 1998b), as well as in AI & Law.<sup>45</sup> For the latter, see a thematic journal issue (Martino & Nissan, 1998) devoted to temporal representation for legal applications. In our present context, it is worth mentioning especially the treatment of a crime narrative in section 5 (pp. 233–238) in Gian Piero Zarri's article (Zarri, 1998) in that journal issue. Zarri described and applied his NKRL system of representation of time, causality and intentionality. Poulin, Mackaay [sic], Bratley, and Frémont (1989) described a "time specialist" software using "intervals as the basic temporal element" (ibid., p. 747) as well as a language, EXPERT/T, based on a temporal logic for legal rules. Temporal logics are popular in AI (Fisher et al., 2005; Knight et al., 1999). Also see "Time in automated legal reasoning" by Vila and Yoshino (2005). For another formalism that is oriented, instead, to the semantic representation of verbal tense, Alice ter Meulen's trees for temporal representation, stemming from theoretical semantics, refer to a book review by Nissan

<sup>&</sup>lt;sup>44</sup> http://en.wikipedia.org/wiki/Text\_mining

<sup>&</sup>lt;sup>45</sup> Moreover, the *recency effect* is debated in psychology, in relation to legal evidence (Furnam, 1986).

(1998b). One of the products of CaseSoft,<sup>46</sup> an American firm producing software for legal professionals, is the *TimeMap* chronology-graphing software. Let us consider constraints on *temporal sequence* in a criminal trial in Anglo-American jurisdictions. The phases of such a trial are as follows:

### Indictment;

The accused is asked to plea guilty or not guilty;

- If the defendant pleas guilty plea-bargain:
  - 1. The court hears the facts from the prosecution (with no need to present evidence);
  - 2. Defence may intervene;
  - 3. Sentence.
- If the defendant pleas not guilty, the case will have to be prosecuted;
  - 1. Adjournment to an agreed date;
  - 2. Adjournment hearing (following adversarial lines);
  - 3. Prosecution opening speech;
  - 4. Prosecution calls witnesses;
    - 4.1. Examination in chief;
    - 4.2. Cross-examination;
    - 4.3. (sometimes) re-examination;
  - 5. Close of the prosecution case;
  - (The defence may submit that there is no case to answer. If the court accepts this, the defendant is discharged. Otherwise:)
  - 7. Defence calls witnesses:
    - 7.1. Examination in chief;
    - 7.2. Cross-examination;
    - 7.3. (sometimes) re-examination;
  - Defence's closing speech to the bench (= closing arguments = final submissions);
  - 9. (Prosecution may have one more speech, but then defence must have the last word.)
  - 10. The magistrates retire to consider their decision (the decision is taken either by a bench of lay magistrates, i.e., a jury, or a stipendiary magistrate, i.e., a trained judge);
    - if the fact-finders are a jury, before they retire they are given final instructions by the judge;
  - 11. The magistrates return and give a verdict (and state no reason);
    - 11a. If the verdict is "not guilty", then the defendant is discharged;
    - 11b. If the verdict is "guilty", then:
      - 11b.1. The court hears the facts from the prosecution (with no need to present evidence);
      - 11b.2. Defence may intervene;
      - 11b.3. Sentence.

1115

<sup>&</sup>lt;sup>46</sup> http://www.casesoft.com

How is the delivery of the evidence affected, by the constraints on the temporal sequence of the phases of a trial? There are important implications for the possibility to introduce evidence. Consider for example employment tribunals in England and Wales (thus, we are not dealing now with criminal cases). The Applicant (i.e., the plaintiff) gives his statement, which is read aloud by himself, or silently by the Court. He is then examined by his barrister (he has one, unless he is representing himself), and then cross-examined by the Respondent's barrister. (If the Applicant is an employee, then the Respondent will typically be his employer.)

Some new evidence, not found in the written statement and in the bundle of documentary evidence, may emerge when the Applicant is asked questions as a witness. Cross-examination of the Applicant is followed sometimes by his being subjected to re-examination by his own side's barrister, and then (also optionally) the Court may ask him questions. Then, all witnesses for the Applicant undergo (each in turn) the same cycle of giving their respective statement, being examined, cross-examined, possibly re-examined, and asked questions by the Court. Next, the same happens for the Respondent.

A major problem for the Applicant arises, if witnesses for the defence present new evidence when examined and cross-examined, as the Applicant's barrister may be unaware on the spur of the moment of what to ask next to such an item of evidence emerging, whereas the (former) employee being the Applicant would be quite able, cognitively but not procedurally in the trial, to ask such questions that would expose untruthful evidence when it is submitted by the defence's witnesses when examined or cross-examined. Procedural constraints prevent the Applicant himself from intervening (unless he has no barrister and is representing himself, which in other respects would be a big disadvantage), let alone making a further statement giving evidence in response to the defence's witnesses. (This is not formally forbidden, but in practice this is strongly and tacitly discouraged, because of how complicate the trial would become.)

A further disadvantage for the Applicant is if after he and his witnesses have finished giving evidence, the barrister for the defence submits some further item of documentary evidence (this may be very important, and deliberately withheld for the purposes of an "ambush"): the Court may criticise such a move, yet accept that the new evidence be added to the bundle. The Applicant's barrister may protest, or refrain from doing so if he or she deems that protesting would be impolitic. Even when summing up in the end, the barrister for the Applicant will be unable to introduce new information as evidence, even though the Applicant may have such information that is relevant or even crucial.

It happens sometimes that by agreement between the parties, a witness for the Applicant will be able to give evidence after one or more witnesses of the Respondent, because the witness being late is cogently unable to come before (e.g., if he has to fly from abroad). Nevertheless, it is up to the parties and to the Court to agree about this. It may be of advantage to the Applicant, if the late witness for the Applicant will be asked questions (possibly, even by the Court) that would enable to assess some evidence that had previously been introduced by a witness for the Respondent. This way, such evidence may be refuted, that would not have been otherwise, because of procedural constraints.

The situation with a late witness for the Applicant is such that procedural constraints on the temporal sequence are overridden because of the agreement between the parties, which enables that witness give evidence after one or more of the witnesses for the Respondent. Out of courtesy, the Court may then instruct the defence that if the defence would like to call back its witnesses that had given evidence before, *after* the late witness of the Applicant, this request would be granted. The defence may then renounce this (perhaps in order not to be perceived as having been put at a disadvantage).

Another way for time constraints to be involved, is that the hearing at the tribunal is booked several months in advance, and one's barrister will have to be paid according to the expected length of the hearing. One tactic of the Respondent may be to cause their witnesses (including ones who do not really introduce important evidence) use more time than expected, so that a new additional hearing, months away, will have to be booked, at which some more witnesses of the Respondent will give evidence, then the Applicant's barrister will sum up, and the Respondent's barrister will sum up. At this additional hearing, the Applicant will have to be silent, not being able to introduce more evidence. Booking another hearing may be beyond what is affordable to the more impecunious party, which oftentimes is an employee of a big corporation. This may in practice compel the Applicant to accept a settlement.

Yet another problem is that sometimes employment tribunals (a president and two further members) are double-booked by the administration of the tribunals, and they themselves only learn about this early during the hearing. For the more impecunious party, this is a major burden, making it more likely that one more hearing will have to be booked. This, too, militates towards the more impecunious party being more likely to accept a settlement.

All of this is interesting both legally, and for AI modelling. The temporal sequence conditions how the evidence can be introduced, and whether evidence can be given in reply. Techniques from AI can represent this. Yet, AI practitioners need know about such procedural constraints. Importantly, there are less exclusionary rules on evidence at employment tribunals in England and Wales, than there are on criminal evidence.

In employment cases, a first deadline applies to the submission of which documentary evidence will go into the bundle. The solicitors of the two parties reach an agreement. Exceptionally (as seen earlier) some new document may be submitted during the hearing, subject to the discretion of the Court. Some time after the bundle of documentary evidence is finalised, the two parties exchange witness statements. This must be simultaneous, in order to avoid that a last-minute change is done in the statement that comes late, so that it would respond to some "surprise" in store in the statement of the other party that arrived early. Exceptionally, on the day after the exchange of statements it may happen that the solicitors for the defence claim to the solicitor of the Applicant that they forgot to email or to fax one of the witnesses statements. The Applicant may renounce to protest, considering that the Court may override the protest.

All of this is fertile ground for AI modelling. Temporal constraints are so important, at a hearing, that they may make or break a case.

We have explained such situations, that a constraint is not satisfied, but then a standard arrangement is adopted. This can be modelled in terms of **contrary-to-duty obligations** (q.v.).

- **Toulmin's model** A widespread model of argument structure (Toulmin, 1958). It consists of the following parts: Data (the premises), Claim (the conclusion), Qualifier (the modality of how the argument holds), Warrant (support for the argument), Backing (support for the Warrant), and Rebuttal (an exception). See Section 3.2.
- **Traitor tracing** A technique applied to *pirate tracking software*, within *multimedia forensics*. The term *traitor tracing* has previously been used also in the literature about cryptography. See Section 6.2.1.5.
- **Transvaluationism** An account of *vagueness* proposed by philosopher Terry Horgan. Cf. **loose talk** (q.v.). Vagueness in statements given in court is usually recognised not to amount to untruthfulness. Horgan (2010, p. 67) states:

The philosophical account of vagueness I call "transvaluationism" makes three fundamental claims. First, vagueness is logically incoherent in a certain way: it essentially involves mutually unsatisfiable requirements that govern vague language, vague thought-content, and putative vague objects and properties. Second, vagueness in language and thought (i.e., semantic vagueness) is a genuine phenomenon despite possessing this form of incoherence – and is viable, legitimate, and indeed indispensable. Third, vagueness as a feature of objects, properties, or relations (i.e., ontological vagueness) is impossible, because of the mutually unsatisfiable conditions that such putative items would have to meet.

An important concept in Horgan's treatment is that of sorites sequence, an example of which is "a sequence of men each of whom has a tiny bit more hair on his head than his predecessor" (when applying vagueness to the descriptor *bald*). Horgan explains (2010, pp. 70–71):

A second essential feature of vagueness is what I call "boundarylessness" – a term I adopt from Sainsbury (1990). This feature, which obtains with respect to a sorites sequence, involves the simultaneous satisfaction by the sequence of the following two conditions:

The Difference Condition: Initially in the sorites sequence there are items with a specific status and every predecessor of an item with this status has the same status. Eventually in the sequence there are items with the polar-opposite status, and every successor of an item with this status has the same status. No item in the sequence has both the initial status and the polar-opposite status.

*The Transition Condition*: There is no determinate fact of the matter about status-transitions in the sorites sequence.

Examples of polar-opposite statuses are baldness vs. nonbaldness, heaphood vs. nonheaphood, satisfying the predicate "is bald" vs. satisfying the expression "is not bald", truth vs. falsity. The Transition Condition needs further conceptual unpacking. It involves, essentially, two conceptual aspects or dimensions, one individualistic and the other collectivistic.

*The Individualistic Same-Status Principle (ISS Principle)*: Each item in the sorites sequence has the same status as its immediate neighbors.

*The Collectivistic Status-Indeterminacy Principle (CSI Principle)*: There is no correct overall distribution of statuses to the items in the sequence.

The ISS Principle is so called because it involves items in the sequence considered individually – each considered in relation to its immediate neighbors. The CSS Principle is so called because it involves the items in the sequence considered collectively. Both principles are essentially involved in the idea of boundarylessness – the idea of an absence of sharp boundaries.

- **TreeAge Pro** Decision tree software, for performing a Litigation Risk Analysis. See Section 4.3.1.
- **Trial by mathematics** Originally, the title of Tribe (1971), about the Bayesian approach to modelling judicial decision-making in criminal cases. Nevertheless, the phrase is likelier to occur in polemical contexts.
- **Triangulation** A form of *online auction fraud* (see Section 6.2.3). "Involves three parties: the perpetrator, a consumer, and an online merchant. The perpetrator buys merchandise from an online merchant using stolen identities and credit card numbers. Then, the perpetrator sells the merchandise at online auction sites to unsuspecting buyers. Later, the police seize the stolen merchandise to keep for evidence, and the buyer and merchant end up the victims" (Wahab, 2004).
- Triers of fact See *factfinders*. Jurors are lay triers of fact.
- **Trustworthiness question** In argumentation studies, Walton's (1997) *Appeal to Expert Opinion* offered (ibid., pp. 211–225) an argumentation scheme for "Argument for Expert Opinion", then reproduced in Walton et al. (2008, pp. 381–382). See s.v. *Expert opinion, Appeal to* above. The expert source is *E*; the subject domain is *S*; and *A* is a proposition about which *E* claims to be true (or false). The trustworthiness question is: "Is *E* personally reliable as a source?". It is articulated in three more detailed subquestions: "Is *E* biased?"; "Is *E* honest?"; "Is *E* conscientious?".
- **Truth maintenance system** (*TMS* for short) Within artificial intelligence, such representation and search procedures that keep track of the reasoning steps of a logic system. "Nonmonotonic reasoning [q.v.], because conclusions must sometimes be reconsidered, is called *defeasible*; that is, new information may sometimes invalidate previous results. [...] In defeasible reasoning, the TMS preserves the consistency of the knowledge base, keeping track of conclusions that might later need be questioned" (Luger & Stubblefield, 1998, p. 270).
- Uncharged conduct or uncharged misconduct A kind of bad character evidence: such past behaviour for which no charges were brought. See character evidence.
- Utility One theoretical approach to adjudication is in terms of utility: see Friedman (1997, pp. 277–278); Lempert (1977, pp. 1021, 1032–1041). Let there be two options: plaintiff (**p**) wins, i.e., the court finding for the plaintiff, or defendant (**d**) wins, i.e., the finding is for **d**.

It would seem wisest to select the option with the greater expected utility. The formulae are:

$$EU(p) = P(\Pi) \times U(p,\Pi) + P(\Delta) \times U(p,\Delta)$$

and

$$EU(d) = P(\Pi) \times U(d,\Pi) + P(\Delta) \times U(d,\Delta),$$

"where  $\mathbf{EU}(\mathbf{p})$  and  $\mathbf{EU}(\mathbf{d})$  represent the expected utilities of judgments for the plaintiff and the defendant, respectively;  $\mathbf{P}(\mathbf{\Pi})$  represents the probability that the facts are such that the plaintiff is entitled to judgment, and  $\mathbf{P}(\Delta)$  represents the comparable probability with respect to the defendant" (Friedman, p. 277). Of the two arguments of the (social) utility function **U**, the first one represents the winner ("the party who receives the judgment"), and the second one stands for the party that in truth deserves to win ("the party who is in fact entitled to judgment"). "Thus, for example,  $\mathbf{U}(\mathbf{p}, \Delta)$  equals the social utility of a judgment for the plaintiff when the truth, if it were known, is such that the defendant should receive judgment.  $\mathbf{U}(\mathbf{p}, \mathbf{\Pi})$  and  $\mathbf{U}(\mathbf{d}, \Delta)$  must each have greater utility than  $\mathbf{U}(\mathbf{p}, \Delta)$ and  $\mathbf{U}(\mathbf{d}, \mathbf{\Pi})$ ; it is helpful to assume that the first pair has positive utility and the second pair has negative utility" (ibid., pp. 277–278). The *standard of persuasion*  $\mathbf{O}(\mathbf{\Pi})$  is the degree of confidence when  $\mathbf{EU}(\mathbf{p}) = \mathbf{EU}(\mathbf{d})$ . The *plaintiff wins* is optimal "only if the fact-finder's degree of confidence in the plaintiff's case is at least as great as this level" (ibid., p. 278), if it is a civil case.

$$\begin{split} O(\Pi) &= P(\Pi)/(1-P(\Pi)) = \\ (U(d,\Delta) - U(p,\Delta)/(U(p,\Pi)) - U(d,\Pi)) \end{split}$$

In contrast, in a criminal case the standard is *beyond a reasonable doubt*. The negative utility of wrongly convicting an innocent,  $U(\mathbf{p}, \boldsymbol{\Delta})$ , "far exceeds any of the other utilities in magnitude" (ibid., p. 278). In civil cases, the usual conception is that  $U(\mathbf{p}, \boldsymbol{\Pi}) = U(\mathbf{d}, \boldsymbol{\Delta})$  and that  $U(\mathbf{p}, \boldsymbol{\Delta}) = U(\mathbf{d}, \boldsymbol{\Pi})$ . "This means that the standard of persuasion, expressed in odds, equals 1, or 0.5 expressed as a probability. This, of course, is the familiar 'more likely than not', or 'balance of probabilities', standard" (ibid., p. 278).

- **Virtopsy** A computational technique developed by a team in Bern, Switzerland, for carrying out "a virtual autopsy": information acquired through post mortem imaging prior to autopsy is often used to plan the autopsy, confirm autopsy findings and allow for a second look if further questions arise in during the forensic investigation. See Chapter 9.
- **Voir dire** The jury selection process, with safeguards: the parties can have prospective jurors rejected, as a safeguard intended to weed out such jurors that are perceived to be prone to be biased. "Courts in the USA permit attorneys much more latitude in jury selection (voir dire) than do criminal court procedures world-wide" (Cutler & Penron, p. 208). Nevertheless, "US federal courts and

many state courts (e.g. Massachusetts, California) perform the most perfunctory voir dire and do not permit attorneys to ask questions about jurors' attitudes. Indeed, judges in these courts are not obligated to permit attorneys to ask any questions during voir dire" (ibid.). This is a severe limitation on voir dire as a safeguard, and attorneys are in a sense forced to rely on stereotypes about categories of prospective jurors, rather than on informed evaluations. Moreover, *voir dire* also applies to the acceptance of an *expert witness* being opposed by the opposing attorney. In the words of Knott (1987, p. 14):

The opposing attorney will ask questions that will show that you have limited expertise in the specific field at hand, and therefore your testimony should be limited or disallowed. The attorney is really trying to prevent certain opinions from being introduced and is doing it on the grounds that your expertise does not extend into that area. He or she will ask you questions and, on the basis of your answers, will move to reject you as an expert.

Note: You will not be allowed to say anything more in your defense. The judge will assume the answers you gave during voir dire were complete. Your attorney may ask you additional questions to clear up the confusion, but don't count on it. Note that if the opposing attorney is successful, he or she may have destroyed you and your client's case.

Weight (evidential) The probative value of the evidence.

- Wigmore Charts A graphic method of structuring legal arguments, currently conspicuous in some more formal approached within legal evidence scholarship; first introduced by American jurist John Henry Wigmore in the *Illinois Law Review*, 8 (1913), 77. See Section 3.2.
- Witness: two-witness rule Mandated by Biblical law for capital cases: two eyewitnesses are necessary, and circumstantial evidence or other evidence is not valid. This rule has been influential. Bernard Jackson, who discussed the matter at length in Jackson (1977), explains (Jackson, 1990, p. 18):

[T]he two-witness rule of the Bible has been widely adopted in countries influenced by Canon law, as indeed have some of the necessary means of avoiding its rigours. When the medieval Canon lawyers sought to construct an institution of corroboration by similar fact evidence (testes singulares), they justified their argument by analysis of the facts of the story of Susannah, found in the Apocrypha to the Hebrew Bible. True enough, they said, Susannah could not be rightly convicted when one elder said that she committed adultery under an oak while the other said it was under a holm tree. But that was only because the two elders had claimed to have observed the event together. Had they not made this claim, their evidence would not have been regarded as logically contradictory: for though adultery may not be committed simultaneously under two different trees, it may be so committed successively. Moreover, we all know (so the Canon law doctors argued) that adultery with the some lover is an act which is prone to be repeated – *factum iterabile* – unlike some other crimes against Canon law, such as the murder of a Bishop (especially the same Bishop). I have traced the use of this argument for corroboration by similar fact evidence from a Canonist Summa of the mid-12th century, written in Bologna, to English treason trials of the 17th century, and a famous divorce case of the same period, which then became one of the principal foundations for the so-called Moorov doctrine which Lord Hailsham so fully read into his speech in the House of Lords in the modern leading case of Kilbourne.

In Jewish law, this argument would not have been valid for conviction in a criminal case, and two eyewitnesses would have still been necessary, who witnessed the same event and reported about it with no contradiction.

Witness vs. expert testimonies Evidence as given by individuals who have knowledge of specific details in a legal narrative at hand, as opposed to evidence given by professionals (expert witnesses) based on their professional expertise.

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<sup>&</sup>lt;sup>57</sup> In fact, Sir Arthur Conan Doyle was the son of Charles Doyle, who illustrated the book when it first appeared in book form, in 1888.

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## A

Aamodt, A., 1008, 1036 Aarne, A., 346 Abaci, T., 902 Abbott, D. W., 752 Abelson, R., 350, 383, 437 Abelson, R. P., 333, 437 Abiteboul, S., 538 Abraham, K. I., 703 Abrahams, A. S., 550 Ackerman, M. J., 883 Ackermann, W., 317 Ackland, P. R., 885 Ackley, D. H., 724 Aczel, P., 1110 Addario, S. M., 242 Adderley, R., 84, 154, 483-484, 517 Adibi, J., 677 Adler, J. R., 881-882 Adriaans, P., 484 Agamanolis, S., 342 Agbaria, A., 698 Aggarwal, C. C., 494 Aghayev, E., 999 Agrawal, R., 246, 623, 748, 1028 Agur, A., 904 Ahmed, B., 1065 Aikenhead, M., 662 Aitken, C., vii, x, 7, 855, 887, 945 Aked, J. P., 614 Akehurst, L., 149 Akhan, M. B., 958 Akiba, T., 335 Akin, L. L., 973, 975, 977, 983-989 Albonetti, C., 1103 Alchourrón, C. E., 17 Alcoff, L. M., 329, 331-333 Aleven, V., 169, 529 Alexander, R., 200, 343, 430, 632, 875 Alexy, R., 170 Alheit, K., 1086 Alker, H. R., Jr., 353 Alkiora, P., 282 Al-Kofahi, K., 607 Alla, H., 901 Allan, K., 73 Allen, J. F., 81 Allen, R. J., ix, 6-7, 107-109, 127, 170, 246, 256, 281, 283, 325-328, 335, 367, 886-888, 898, 901, 946-947, 1024, 1034, 1039, 1055, 1057, 1074, 1099, 1102, 1106 Alm, J., 720 Almerigogna, J., 38 Almirall, J., 890 Alston, W. P., 92, 392 Altman, A., 503 Alur, R., 898 Alvesalo, A., 759 Ambler, S., 182 Amgoud, L., 170, 259 Amigoni, F., 524, 532 Amin, R., 949 Amos, W., 417 Anandaciva, S., 863 Andersen, E., 677 Anderson, A., 611 Anderson, A. R., 304, 310-314, 317, 321 Anderson, F. C., 904 Anderson, G. S., 884 Anderson, M., 377 Anderson, T., ix, 131-132, 477 Anderson, T. J., 333 André, E., 396 Animali, S., 19, 111 Anjaria, C., 202 Anouncia, S. M., 548 Antoniou, G., 169, 182, 480 Aoki, T., 968

Appelbaum, P. S., 67 Appelt, D. E., 379 Appling, D. S., 377 Åqvist, L., 117–126 Arbabi, E., 902 Ardrey, B., 885 Arecchi, A., 924 Argamon, S., 600 Arnold, K., 690 Arnold, W., 744 Arrigoni Neri, M., 546, 548-549, 551 Arthaber, A., 136 Artikis, A., 481 Arumainayagam, Y., 602 Arutyunov, 884 Asaro, C., 209, 212-213, 222-223, 231, 238, 241 - 242Asgeirsdottir, B. B., 281 Asher, N., 84 Ashley, K. D., 169, 529, 602 Astrova, I., 546 Atabakhsh, H., 508, 511, 752 Atallah, M. J., 559 Atib, H., 511 Atkinson, J. M., 334 Atkinson, K., 31, 159, 161, 165, 170, 173 Aubel, A., 902 Audi, R., 152 August, S., 356 Aulsebrook, W. A., 874-875 Aumann, R. J., 153 Aune, B., 152 Aussenac-Gilles, N., 547 Austerweil, J., 353 Avcıbaş, İ., 872 Avery, J., 205 Aylett, R., 388 Azuelos-Atias, S., 259

## B

Baber, C., 842 Backstrom, L., 494 Backway, H., 290–291 Bacon, J. M., 550 Baddeley, A. D., 863 Badiru, A. B., 513 Baeza-Yates, R., 598 Baietto, M., 916–917, 923–924 Bain, W. M., 243, 245, 1036 Bainbridge, D., 243–245 Baker, K. P., 512 Bakken, D. E., 709 Bala, N., 149 Balachandran, B., 742 Balding, D. J., 105, 947-948, 955 Baldus, D., 888 Ball, E., 150 Ball, G. R., 616-617 Ball, W. J., 182 Ballabio, D., 924 Ballim, A., 92, 151-152, 938 Ballou, S., 886 Balsamo A., 216 Banka, H., 490 Banko, M., 590 Banzhaf, W., 678 Baranek, P. M., 242 Barb, A. A., 410 Barber, H., 385 Barbrook, A. C., 410 Bargis, M., 216 Barnden, J., 3, 151 Barnden, J. A., 8, 152, 938 Barnett, V., 519 Baron, J., 88, 153-154 Barragán, J., 253 Barrett, E. C., 842, 882 Barron, J., 539 Barry, B., 342 Bartlett, J., 295, 917 Bartlett, J. C., 264 Bartlett, M. S., 961 Barwise, J., 320 Barzilay, R., 590 Basden, A., 150 Basta, S., 762, 765 Batagelj, V., 498-499 Bates, J., 384, 386 Bauer, E., 702 Bauer-Bernet, H., 901 Baumes, J., 680 Baxendale, P. B., 596 Bayles, M. D., 196 Bayram, S., 872 Bayse, W. A., 510, 1032 Beal, M., 616, 957 Beatie, B. A., 344 Becker, P., 874 Beecher-Monas, E., 1065, 1076 Begeman, M. L., 167 Behrman, B. W., 283 Bekerian, D. A., 293 Belchior, M., 535 Belfrage, H., 883 Belis, M., 16, 115-117, 1054 Bell, B. E., 38

Bell, G., 391 Bellucci, E., 629 Belnap, N., 439 Belnap, N. D., 303, 313-314, 317 Bem, D. J., 282 Ben-Amos, D., 344, 346 Bench-Capon, T. J. M., 31, 157, 159-161, 165, 169-171, 173, 183, 186-187, 205, 246, 248, 481, 554, 620, 657-660, 1048 Benderly, B. L., 1050 Benenson, I., 516, 534 Benferhat, S., 17 Ben-Menahem, Y., 49 Bennani, Y., 517 Bennell, C., 511 Bennet, P., 863 Bennett, B., 84, 899 Bennett, K. P., 681 Bennett, W. L., 32, 36, 324-325, 335 Bennun, M. E., 57 Bergen, B., 340 Bergman, P., 841 Bergslien, E., 905 Berlière, J.-M., 939-941 Berners-Lee, T., 547 Bernez, M. O., 903 Berry, M. W., 598-599, 676 Bertels, K., 533 Bertin, J., 498 Bertino, E., 538 Besag, J., 724 Besnard, P., 170 Best, E., 901 Bettini, C., 454-455, 899 Bevan, B. W., 909 Bevel, T., 841, 973, 978, 985 Bex, F. J., 31, 159-161, 165, 170, 174-175, 327, 333, 336, 476–481, 525, 898, 1028 Beyth, R., 32 Bhanu, B., 961 Biagioli, C., 550 Bialousz, L. F., 973 Bie, R., 702 Biedermann, A., 7 Biermann, T. W., 886 Billingham, S., 233 Billington, D., 480 Binder, D. A., 841 Binmore, K., 153 Binsted, K., 335, 340 Biondani, P., 236 Birdwell, J. D., 511 Birkhoff, G., 532

Birks, J. D. S., 447 Birmingham, W., 210, 414, 490, 511, 533, 770, 842.894 Birnbaum, L., 164 Bistarelli, S., 950, 957, 963-967 Bivens, A., 525, 706 Black, H. C., 185 Black, J. B., 347-348 Blackburn, C., 244 Blackman, S. J., 30, 301, 1074 Blair. D., 351 Blascovich, J. J., 285 Bleay, S., 949 Block, A., 275 Blockeel, H., 553 Bloy, D., 1092 Blueschke, A., 616 Blythe, J., 498, 503 Boaer, D., 149 Boba, R., 280-281 Bobrow, D., 350 Bodard, F., 247 Boddington, A., 884 Bodenhausen, G. V., 332 Bodziak, W. J., 890 Boer, A., 1096 Bohan, T. L., 890 Bolding, P. O., 117, 1034, 1084 Bolelli, T., 617 Bolettieri, P., 861 Bolle, R., 959 Bolleand, R., 1033 Bolles, R. C., 392, 548 Bologna, J., 892 Bond, C., 1064 Bondarenko, A., 170 Bondi, V. A., 111 Bookspan, S., 928 Boone, K. B., 150 Boongoen, T., 858 Borchard, E. M., 1069 Bordalejo, B., 410 Borén, H., 924 Borges, F., 657–658 Borges, R., 657-658 Borgulya, I., 667 Bosse, T., 743 Boster, F. J., 328 Boulic, R., 902 Bourcier, D., ii, 170, 657-658 Bowers, M. C., 885 Boyd, C., 721 Boykov, Y., 722, 725

Boyle, M. M., 73 Brace, N., 863 Bradac, J., 618 Bradac, J. J., 618 Bradfield, A. L., 283, 292 Bradley, B., 342 Bradley, J. N., 958, 1056, 1061, 1079 Brady, R., 320 Brainerd, C. J., 38 Braman, D., 315 Bramer, M., 949 Branch, J., 697, 706, 949 Brandenburger, A., 153 Brandes, U., 494, 497-500, 503-504 Brann, N. L., 690 Branting, K. L., 183, 203 Bratanić, M., 618 Bratley, P., 84, 901, 1114 Bratman, M., 155 Braun, M., 994, 1007 Braz, M. E., 11, 328 Breck, E., 378 Breeze, A., 409 Bregman, N. J., 95 Breiger, R. L., 494 Breiman, L., 490-491 Breimer, E., 697 Brenner, J. C., 880, 1021 Brereton, D., 273 Bressan, S., 537 Breuker, J., ii, 553-554, 556 Brewka, G., 172 Bridges, T. E., 885 Brigham, J. C., 265, 270, 283 Brigsjord, S., 175-176, 1110 Brimacombe, E., 292 Brin, S., 503, 721, 726-727, 731 Bringsjord, S., 150, 349, 384, 431 Brislawn, C. M., 958 Brkic, J., 661 Bromby, M., 263-269, 700, 1033 Bromby, M. C., 268-270, 1023 Brooks, K., 342 Brooks, K. M., 342, 384 Brooks, M., 911 Brown, C. T., 901 Brown, D. C., 14 Browne, M., 599, 676 Bruce, V., 863, 865 Bruninghaus, S., 602 Bruns, G., 901 Bryan, M., 384, 538 Bryant, V. M., Jr., 927

Bryson, J., 396 Buber, M., 400, 497 Buchanan, B. G., 106, 193, 877 Büchler, P., 904 Buck, U., 991 Buckingham Shum, S. J., 168 Buckley, C., 596 Buckley, J. P., 282 Budzikowska, M., 591 Bugental, D. B., 285 Bull, R. H. C., 149-150, 282-283, 295, 859, 882-883 Buller, D. B., 149 Buora, G. B., 546 Burgoon, J. K., 149 Burnett, D. G., 41, 561-565 Burns, H. J., 38 Burt, R. S., 494 Burton, A. M., 865 Busch, J., 618 Butler, J. M., 943 Butler, M., 842 By, T., 152 Byrne, M. D., 51

# С

Caballero, J., 709 Cabras, C., 24 Cacioppo, J. T., 28, 285 Cahlon, B., 859 Caldwell, C., 859, 863-864, 1068 Callan, R., 52, 488-489, 653 Callaway, C. B., 203, 381, 384 Callen, C. R., 30, 301, 328 Calzolari, N., 547, 550 Caminada, M., 170 Campbell, C., 681, 1032 Camptepe, A., 680 Camurri, A., 88 Candel, I., 38 Canter, D., xi Capobianco, M. F., 495 Cappelli, A., 550 Capstick, P. H., 444 Caputo, D., 264 Carbogim, D., 181, 480, 1045 Carbonell, J. G., Jr., 164, 353, 404 Carenini, G., 170, 172 Carley, K., 678 Carlsen, K. A., 38 Carmo, J., 490, 1042 Carofiglio, V., 149-150 Carpenter, R., 952

Carr, C. S., 167-168, 1077, 1105 Carrier, B., 687 Carroll, G., 353 Carson, D., 864, 882-883 Carter, A. L., 983 Carter, D. L., 280 Caruso, S., 295 Casalinuovo, I. A., 923 Casanovas, P., 553 Casas-Garriga, G., 728 Case, T. I., 29 Casey, E., 560, 687 Cassel, J., 401-402 Cassell, J., 396 Cassinis, R., 61, 394 Castelfranchi, C., 18, 79, 149-150, 173, 257-259 Catania, B., 538 Catarci, T., 546 Catts, E. P., 884 Cavazza, M., 342, 356, 381, 388 Cawsey, A., 149 Cayrol, C., 17, 170 Ceci, S., 73, 1091 Cellio, M. J., 588 Ceserani, V., 539 Céspedes, F., 924 Chadwick, D. W., 150 Chae, M., 717 Chaib-Draa, B., 172 Chaiken, S., 28 Chakrabarti, D., 741 Champod, C., 948, 956 Chan, C.-Y., 706 Chan, H., 246, 273 Chan, J., 243, 490 Chan, K. L., 536 Chance, J. E., 265, 283, 837-839, 859 Chaney, F. B., 506 Chang, E., 246 Chang, S.-F., 872 Channell, R. C., 506 Chaoji, V., 492, 678, 682-684 Chapanis, A., 506 Chapanond, A., 678 Charles, F., 356, 381 Charles, J., 483 Charlton, D., 950, 1067 Charlton, K., 149 Charman, S. D., 270, 283, 863 Charniak, E., 117, 350, 352 Chau, D. H., 720, 731, 742-745 Chau, M., 508, 759

Chaudhary, M., 602 Chellas, B. F., 1042 Chen, C., 702 Chen, H., 484, 508, 511, 611, 723, 748, 759 Chen, P., 620 Chen, W., 490, 722 Chen, X., 490-491, 949 Chen, Y.-C., 717, 722 Chen, Z., 667, 960, 963 Cheng, H., 748 Cheng, T., 112 Cherry, M., 956 Cheswick, B., 706 Chilvers, D. R., 892 Chisholm, R. M., 304, 1042 Chiswick, D., 883 Chiu, C., 717, 722 Cho, H., 717 Choi, B. H., 548 Chong, F. T., 706 Choo, R. K. K., 714 Choudhary, A. N., 483 Chow, J. C., 930 Chow, K. P., 260, 263, 692-694 Christie, D., 863 Christie, G. C., 173, 191, 194, 411, 661, 1046-1047, 1090 Christmann, A., 681 Christopher, S., 280 Christou, G., 207 Chua, C. H., 717 Chung, A. C. S., 722-724 Chung, M.-S., 525 Church, S. M., 317 Churchill, E., 396 Cialdini, R., 28 Ciampolini, A., 45, 1023, 1085 Cina, S. J., 1007 Ciocoiu, M., 550 Cios, K. J., 671 Clark, C., 864 Clark, M., 885 Clark, N. K., 282 Clark, P., 182 Clark, R. A., 28 Clark, S. E., 283, 293 Clarke, P. H., 892 Clarke, R. V., 154, 281, 899, 1049 Clay, M., 92 Clements, R. V., 885 Clifford, B., 292, 882 Coady, W. F., 510 Cocker, M., 444, 446, 451-452

Coelho, A. L., 536 Coenen, F., 246 Cogan, E., 419 Cohen, D., 258 Cohen, F., 260-261 Cohen, F. S., 1085 Cohen, L. E., 154 Cohen, P., 182 Cohen, P. R., 80 Cohen, R. F., 503 Cohen, W. W., 675, 678 Cohn, A. G., 84, 899 Colby, K. M., 87 Cole, D. J., 885 Cole, J. W. L., 888 Cole, S. A., 940, 948, 952, 955-957, 1063, 1066 Coleman, K. M., 611-612 Coletta, M., 923 Collins, J., 617 Collins, J. F., 887, 935 Colombetti, M., v, 546, 548-549, 551 Colwell, K., 18, 59, 150 Colwell, L. H., 150, 182 Combrink-Kuiters, C. J. M., 245-246 Conan Doyle, A., vii, 340, 496, 781 Conant, E., 876 Cone, E. J., 885 Conklin, J., 167 Conley, J. M., 334 Connah, D., 356 Console, L., 846, 853 Conte, R., 18 Continanza, L., 524, 532 Conway, J. V. P., 617 Convers, L. B., 912 Cook, R., 855, 883 Cook, T., 841 Cooper, J., 514 Cope, N., 9 Cope, R., 883 Corcho, O., 546 Corkill, D., 532 Corley, J., 928 Corney, M., 611 Correira, A., 349-351 Cortes, C., 608, 681, 729 Cortiguera, H., 388 Cosio, S. M., 924 Costa, M., 245 Costello, B. D., 959 Coull, S., 682, 697, 699, 703-705 Coulson, S., 340

Coulthard, M., 618 Cox, M., 376, 884 Cox, M. T., 376-377 Cozman, F. J., 52 Crandall, D., 498 Crandall, J. R., 706 Crawford, C., 386, 885 Creamer, G., 676 Crittendon, C., 340 Croft. D. J., 905 Crombag, H. F. M., 292-293 Cross, R., 298, 300 Crowcroft, J., 709 Crowley, K., 346 Crump, D., 302 Cui, Z., 84, 899 Cule, B., 728 Culhane, S. E., 95 Cullingford, R. E., 353, 359-361 Cully, D., 95 Culshaw, M. G., 906 Cummins, H., 957 Curzon, L. B., 1091-1092 Cutler, B. L., 273, 283, 291, 293-294, 882-883, 1120 Cybenko, G., 652

# D

D'Amico, A., 917 Dagan, H., 306 Dahlgren, K., 379 Dalton, R., 450 Dames. N., 495 Danet, B., 618 Daniels, J. J., 602 Daniels, T. E., 687 Darling, S., 292 Darr, T., 533 Dauer, F. W., 341 Daugherty, W. E., 150 Dauglas, M., 341 Dave. K., 601 Davenport, G., 341-342, 384-385 Davenport, G. C., 909, 915 Davey, S. L., 283 David, R., 901 Davide, F. A. M., 917 Davidson, R. J., 285 Davies, G. M., 859, 862-863, 882 Davis, D., 367 Davis, L., 675 Davis, O., 926-927 Davis, T., 149

Dawid, A. P., 887, 944-945, 1049 Dawson, L., 908 Daye, S. J., 413 De Antonellis, V., 513 de Cataldo Neuburger, L., 149 de Kleer, J., 20, 844, 853 de la Motte, R., 343 De Mulder, R. V., 246 De Nicola, A., 546 de Rosis, F., 149-150 de Vel. O., 611 De Vey Mestdagh, C. N. J., 525 de Vey Mestdagh, K., 928 de Ville, B., 1090 Debevec, P., 872-873 Debreceny, R., 611, 675-678 Dechter, R., 1030 Deedrick, D. W., 886 Deffenbacher, K. A., 38 DeJong, G. F., 353, 594 Dekel. E., 153 Del Boca, A., 414 Del Favero, B., 118 del Socorro Téllez-Silva, M., 1048 del Valle, M., 924 Delannoy, J. F., 173 Delaval, A., 550 Delia, J. G., 28 Demazeau, Y., 533 Demelas-Bohy, M.-D., 593 den Broek, P. V., 378 Denney, R. L., 150 Denning, D., 698 DePaulo, B. M., 149 Dershowitz, A. M., xiv, 50 Dershowitz, N., 418 Desai, K., 616 Devine, P. G., 294 Devlin, P., 264 Dewey, J., 392 Deyl, Z., 885 Di Battista, G., 498 Di Francesco, P., 923 Di Natale, C., 917 Di Pierro, D., 923 Diaz, R. M., 310 Díaz-Agudo, B., 387 Dick, J. P., 182 Dickey, A., 631 Dickinson, T. A., 924, 934 Diesner, J., 678 Dignum, F., 172 Dijkstra, P., 508, 525

Dill, F., 1103 Dillon, T., 246 Ding, Y., 550 Dintino, J. J., 279 Dioso-Villa, R., 952 Dirnhofer, R., 994, 1007 Dix, J., 170 Dixon, D., 884, 1069 do Carmo Nicoletti, M., 490 Dobosz, M., 944 Dodd, G., 917 Doering, N., 149 Dolan, C., 380 Doležel, L., 344, 346 Dolnik, L., 29 Dolz, M. S., 1007 Domike, S., 404 Domshlak, C., 117 Donders, K., 38 Dong, M., 490, 949 Donikian, S., 342 Donnelly, L. J., xiii, xiv, 406, 905, 908, 910-913 Donnelly, P., 947 Donos, G., 207 Doob, A., 242, 252 Doob, A. N., 242 Doran, S., 273 Dore, A., 446-447 Doutre, S., 157, 161, 170 Dowdall, J., 150 Doyle, A. C., vii, 496, 781 Doyle, J., 20 Doyle, J. K., 15 Doyle, J. M., 38, 297 Dozier, C., 602 Dragoni, A. F., xiii, 7, 16-31, 54, 111, 115, 403, 411, 416 Drechsler, T., 884 Dreger, H., 698, 709 Drew, P., 334, 898 Driver, R. E., 149 Drizin, S., 282 Dror, I., 842, 949 Dror, I. E., 843, 871, 950, 1067 Droser, M. L., 448 Drugge, J., 149 Du, X., 723 Duan, N., 392 Dubois, D., 17 Duckham, M., 513 Duda, R. O., 489, 600 Duff, P., 38

Duffield, J. W., 890 Dulaunoy, A., 706 Dumortier, J., 588, 596 Duncan, G. T., 306, 943 Dundes, A., 344, 346 Dung, P. M., 161, 170-171, 182 Dunn, J. M., 317 Dunn, M. A., 1005–1006 Dunne, P. E., 157, 161, 170-172, 258, 660 Dunning, D., 264 Durandin, G., 150 Durfee, E., 532-533 Dworkin, R., 631, 1047 Dyer, M. G., 63-64, 81, 87, 349, 353, 356-357, 359, 361–371, 374, 378, 380, 383, 397, 399, 412, 415, 417, 429 Dysart, J. E., 264

#### Е

Eades. P., 498-499 Eagly, A. H., 28 Earl, L. L., 596 Earle, J., 149 Easteal, S., 943 Ebbesen, E. B., 273 Ebert, J. I., 929 Ebert, L. C., 991, 993, 999 Eck, J. E., 280 Eckert, W. G., 973, 983, 985 Eco, U., 690, 779 Ecoff, N. L., 285 Edelman, S., 489 Edmundson, H. P., 596 Edwards, D., 82 Egashira, M., 918 Egeland, T., 944, 1097 Egeth, H. E., 293 Egger, S. A., 276 Eggert, K., 306 Eguchi, S., 1071 Ehrlich, R., 931 Eigen, J. P., 883 Einhorn, H. J., 33 Ekelöf, P. O., 117, 211, 1034, 1059, 1084 Ekholm, M., 282 Ekman, P., 89, 150, 284-285, 882 Elhadad, M., 590 Elhag, A., 554 Eliot, L. B., 629 Elisseeff, A., 492 Ellen, D., 617 Ellis, H. D., 859, 862 Elphick, C. S., 447

El-Sana, J., 538 Elsayed, T., 682 Elsner, M., 353 Elson, D. K., 385, 495-496 Elvang-Goransson, M., 182 Embrechts, M. J., 492, 706 Emiroglu, I., 958 Emslie, R., 949 Endo, Ts., 356 Endres-Niggermeyer, B., 589 Engel, M., 92 Engelmore, R., 528, 1034 Epstein, J. A., 149 Epstein, R., 955 Eraly, A., 431-432 Erickson, B., 618 Ericson, R. V., 176 Ernst, D. R., 305 Erwin, D. H., 448 Eshghi, K., 45 Eskin, E., 744 Esmaili, M., 742 Espar, T., 334 Esparza, J., 901 Espinosa-Duró, V., 1070, 1094 Esposito, A., 618 Esuli, A., 599, 861 Etzioni, O., 601 Euliano, N. R., 488 Evangelista, P. F., 492, 939 Evenchik, A., 164 Evett, I., 944 Evett, I. W., 739, 855, 956 Ewart, B. W., ix, x, 479, 483, 620-621 Eyers, D. M., 550

#### F

Faas, S., 394 Faegri, K., 927 Faggiani, D. A., 280 Fagni, T., 599 Fahey, R., 324 Fahlman, S. E., 653 Fakher-Eldeen, F., 54, 62, 406 Falcone, R., 18, 79 Falkenhainer, B., 846 Falkowski, M., 758 Faloutsos, C., xiii, 720, 722, 731, 735, 740-742 Faloutsos, F., 741 Fan, G., 529 Faratin, P., 205 Farber, P. L., 445

Farid, H., 872, 874, 1078 Farina, A., 961 Farley, A. M., 170, 174, 184-187, 1044 Farook, D. Y., 84, 901 Farrington, D., 882, 1055 Farzindar, A., 596-597 Fasel, I. R., 961 Faught, W. S., 88 Faulk, M., 883 Faust, K., 498, 593 Feeney, F., 1103 Fein, S., 332 Feinbert, S., 285 Feldman, M. S., 32, 36, 324-325, 335 Feldman, R., 600-601 Fellbaum, C., 547 Felson, M., 154 Feng, Y., 490, 722 Fenning, P. J., 906–908, 910–913 Fensel, D., 547, 550 Fenton, N. E., 110, 1077, 1083 Ferber, J., 524 Ferguson, T. J., 283 Fernandez, C., 546, 901 Fernández-López, M., 546 Ferrario, R., 551 Ferrentino, P., 88 Ferrua, P., 216, 1075-1076 Ferrucci, D. A., 150, 349, 384, 431 Festinger, L., 27, 942 Feu Rosa, P. V., 486, 619 Fieguth, P., 722 Field, D., 851 Fikes, R. E., 83, 383 Fillmore, C. J., 62 Findlay, M., 38 Findler, N. V., 545 Finin, T. W., 379 Finkelstein, M. O., 886 Finkelstein, M., 888 Finklea, K. M., 273 Fiorelli, P., 289 Fiorenza, E., 92 Firestein, S., 916 Fischer, P. C., 538 Fischhoff, B., 32 Fisher, M., 898, 901, 1114 Fisher, R., 149 Fissell, M. E., 943-944 Fitts, P. M., 506 Fitzgerald, P. J., 615, 1093 Fitzmaurice, C., 214, 242, 245 Fiume, E., 904

Fix, E., 674 Fleischer, M., 533 Flowe, H. D., 273, 1103 Flowers, M., 164, 172, 371, 380, 403, 1021-1022, 1098 Flycht-Eriksson, A., 547 Follette, W. C., 367 Fong, C. T., 282 Forbus, K., 846 Foresman, T. W., 515 Forgas, J. P., 743 Forrester, J. W., 1042 Foskett, D., 539 Foster, D., 614-615, 891 Foster, J. C., 687 Fowler, R. H., 861 Fox, F., 68 Fox, J., 182 Fox, R., 40, 44-47 Fox, S., 377 France, D. L., 909, 915 François, A. R. J., 392, 548 Frank, E., 285, 491 Frank, M., 285 Frank, M. G., 150 Frank, O., 496 Frank, P. B., 892 Frank, S. L., 380 Franke, K., 879 Frazzoni, M., 961 Freeman, J. B., 170, 177, 183-187 Freeman, K., 170, 174, 185, 205, 1044 Freeman, L. C., 494–495, 498 Freeman, W. T., 722 Frémont, J., 84, 901, 1114 Fresko, M., 600 Freund, M. S., 918 Freund, Y., 702 Fridrich, J., 872, 1166, 1204 Friedman, E., 720 Friedman, H., 321 Friedman, J. H., 490 Friedman, M. T., 170, 622 Friedman, R. D., 367, 1039, 1119 Friedman, R., 698 Friesen, W. V., 285 Frincke, D. A., 709 Frisch, A. M., 347 Frowd, C., xiii, 866-867, 1044, 1059 Frowd, C. D., 863-866 Fu, C.-M., 112 Fu, X., 858 Fuhr, N., 537

Fujisawa, H., 616 Fulford, R., 416 Full, W. E., 931, 934 Fung, T. H., 45 Furnam, A., 1114 Furtado, V., 11, 516, 534–536, 1067

#### G

Gabbay, D., 259 Gabbert, F., 898 Gaensslen, R. E., 951 Gaes, G., 243 Gaffney, C., 909 Gagg, C., 936 Gaines, D. M., 14 Galindo, F., ii, 239 Galitsky, B., 384, 404 Gallagher, T., 450 Galperin, A., 669 Galton, A. P., 898, 939-941 Gambini, R., 221, 1076 Gan, H., 344 Gangemi, A., 553 Gao, L., 525 Garani, G., 538 Garbolino, P., 7, 945 Garcia Landa, J. A., 344 Garcia-Rojas, A., 551 Gärdenfors, P., 17, 92, 419 Gardner, A. von der Lieth., 81 Gardner, J. W., 917-918, 921 Gardner, R. M., 841, 973, 978, 985 Gargi, U., 391 Garland, A. N., 884 Garnham, A., 347 Garrett, R. E., 935-936 Garrioch, L., 292 Garry, M., 38, 882 Garven, S., 38 Gastwirth, J. L., 888 Gater, J., 909 Gauthier, T. D., 930 Gawler, M., 183, 620 Gayler, R., 762 Gearey, A., 323 Geddes, L., 8, 946-947 Gedeon, T. D., 630, 633 Geffner, H., 1030 Geiger, A., 408, 411–413 Geiselman, R. E., 294 Gelbart, D., 596, 606 Gelfand, M., 704 Gellatt, D., 724

Gemmell, J., 391 Gemperline, P. J., 934 Geng, L., 490 Genrich, H., 901 Geradts, Z., 880 Gerard, S., 379 Gerasimov, M. M., 876-877 Gerhard, D., 38 Gerkey, B., 532-533 Gerlofs, J.-M., 161 Gerritsen, C., 743 Gervás, P., 347, 380, 387-388 Geserick, G., 885 Ghorbani, A. A., 701 Giannakopoulos, P., 207 Giannotti, F., 762 Gibbons, B., 618 Gibbons, J., 618 Gibson, J. J., 843 Gibson, S. J., 864 Gigerenzer, G., 259 Gilbert, D. T., 99 Gilbert, M., 161, 172 Gilbreth, F. B., 274, 506, 1086 Gilbreth, L. M., 274, 506, 1086 Gilles, B., 902 Gillies, D., 1030, 1101–1102 Gilman, S. L., 68, 332 Gilmore, G., 306 Gini, G., v Giorgini, P., 17 Giovagnoli, A., 414 Giuffrida, R., 215, 546 Gladwell, M., 332 Glasee, E., 555 Glass, R. T., 885 Glenn, C. G., 347-348 Glover, T. E., 295-296 Goad, W., 704 Göbel, J., 710 Goble, C. A., 550 Goble, L., 321 Goel, A., 377, 687 Goff, M. L., 884 Golan, T., 561 Goldberg, H. G., 511, 1070 Goldberg, M., 678-680, 682-685, 743 Golden, R. M., 379 Goldenberg, J., 600 Goldfarb, C. F., 538 Goldin, H. E., 289

Goldman, A. I., 92, 250-252, 283, 300, 1057, 1059, 1110 Goldman, N., 352 Goldman, R. P., 353 Goldman, S. R., 371-372 Goldsmith, M., 900 Goldsmith, R. W., 53, 210, 212, 247 Goldstein, A. G., 265, 283, 859 Goldstein, C. J., 27, 283, 942 Goljan, M., 872 Gómez-Gauchía, H., 388 Gómez-Pérez, A., 546, 550 Gonçalves, T., 606 González Ballester, M. A., 904 González Císaro, S. E., 544, 550 González-Calero, P. A., 387 Good, I. J., 302 Gooday, J. M., 899 Goodchild, M. F., 515 Goode, G. C., 938 Goodman, G., 282 Goodrich, P., 328, 336 Goranson, H. T., 547 Gordon, T. F., ii, xi, 165-166, 170, 182, 332, 1031, 1036, 1087, 1100 Gotts, N. M., 84 Gouron, A., 1024 Governatori, G., ii, 1042 Grabherr, S., 999 Granhag, P. A., 149 Grant, J., 79, 306 Grassano, R., 150 Grasso, F., 149-150, 161, 170-172 Gravel, A. J., 928 Gray, C., 264 Gray, G. L., 611, 675-678 Green, A. D. P., 1071 Green, E., 6 Greene, E., 38, 283 Greene, J. R., 1099 Greening, C. P., 274, 506 Greenwood [=Atkinson], K., 173 Greenwood, K., 161 Greer, S., 845 Gregg, D. G., 714-715, 717 Gregory, F., 275 Grey, T., 305-306 Grey, T. C., 305 Grice, H. P., 159, 301, 303, 309 Grieve, M. C., 886 Grifantini, F. M., 1076 Griffiths, P. E., 89 Groarke, L., 161

Grootendorst, R., 170 Grosz, B., 85, 91, 350 Grover, C., 596 Grubbs, F. E., 519 Gruber, T. R., 387, 545-546, 554 Grüninger, G., 545 Grüninger, M., 545-546 Gu, J., 718–719 Gudjonsson, G. H., 281-283 Guest, A. G., 1087 Guha, R. V., 546, 754 Guidotti, P., 245 Gulotta, G., 28-29, 149, 174, 239, 1044 Gunawardena, C. A., 959 Gunn, J., 883 Guo, W., 550 Guo, X., 602 Gupta, H., 511 Gupta, P., 700 Gurr, C., 161 Gutebier, T., 445 Gutés, A., 924 Gutiérrez, M., 551, 902 Güven, S., 390 Guyon, I., 492 Gwadera, R., 728 Gyongyi, Z., 727, 731

## H

Haber, L., 956 Haber, R. N., 956 Habermas, J., 173, 303 Hachey, B., 596 HaCohen-Kerner, Y., 244-246, 405 Hafstad, G., 292 Hagan, J., 1103 Hage, J., 1042 Haggerty, T., 89 Haglund, W. D., 896 Hahn, U., 551, 594 Haïm, S., 338, 407 Hainsworth, S., 935 Hall, B., 282 Hall, D., 343 Hall, J., 901 Hall, M. J. J., 268-270, 1023 Hall, R. P., 1027 Hall, S., 923 Halliwell, J., 104-106, 692-693 Halpern, J. Y., 1030 Halpin, H. R., 379 Hamard, S., 842 Hamblin, C. L., 155–156

Hamill, J. T., 504 Hamilton, D. L., 332 Hamkins, J. D., 65 Hamlin, C., 506 Hammersley, R., 883 Hammon, W. S., 912 Hamscher, W., 853 Han, I., 100, 103, 600, 629, 638, 667, 673, 721, 728, 748 Hanba, J. M., 292 Hancock P. J. B., 863-865 Hand, D. J., 483 Handler Miller, C., 342 Hanlein, H., 613 Hanrahan, P., 872 Hansel, M., 233 Hao, Y., 959, 962 Harder, C., 515 Harley, E. M., 38 Harley, I., 994 Harman, G., 48, 173 Harman, G. H., 48 Harper, P., 1064 Harper, W. R., 274, 505-506, 509-510 Harris, D. H., 274, 505-506, 509-510 Harris, M. D., 62 Harris, R., 520, 687-688 Harrison, J. M., 617 Hart, H. L. A., 302, 631 Hart, P. E., 489, 600 Hartley, J. R. M., 536, 1036 Hartwig, M., 149 Hasan-Rokem, G., 408 Hasegawa, O., 335 Hasel, L. E., 283, 863 Hashtroudi, S., 38 Haskell, N. H., 884 Hastie, R., 14-15, 30-37, 51, 324-325, 335, 1075, 1112 Hatfield, J. V., 419, 918 Hauck, R. V., 511, 603, 748-750 Hauser, K., 904 Hawkins, K., 247 Hayes, P. J., 588, 914 Hayes-Roth, B., 82, 394, 396, 402, 526, 1034 Haygood, R. C., 274, 506 Haykin, S., 652 Hayvanovych, M., 680 Headrick A. M., 616-617 Hearst, M., 621 Heather, M. A., 901 Heaton-Armstrong, A., 283, 1073

Hecht-Nielson, R., 664

Heiser, J., 687 Hektor, J., 710 Hella, M., 247 Hempelmann, C. F., 559 Hemphill, M. R., 618 Henderson, Z., 865 Hendler, J., ii, 547 Hendrix, G. G., 350, 545 Henkart, P. C., 912 Henrion, M., 118 Henry, J., ix Henry, R. C., 934-935, 940 Henzinger, T. A., 898 Hepler, A. B., x Herold, J., 548 Herrero, S., 943 Hershkop, S., 676 Hervás, R., 387 Heuston, R. F. V., 299, 1062 Hewer, L., 1034, 1039-1040 Hewstone, M., 332, 478 Heylen, D., 394 Heylighen, F., 305 Hickey, L., 1060 Hicks, P. J., 918 Higuchi, T., 968, 972 Hildebrand, J. A., 912 Hill, C., 27, 911, 942, 1041 Hilton, J. L., 332 Hilton, O., 617 Hind, S.-L., 949 Hines, D. C., 968 Hinton, G. E., 346, 379, 489, 649, 724 Hinz, T., 291 Hirschman, L., 378 Hirst, G., 547 Hiscock-Anisman, C., 18, 150 Hitch, G. J., 73

Hitchcock, D., 171

Ho, Sh.-Sh., 392

Hobbs, D., 275 Hobbs, J., 379, 392, 548

Hobbs, J. R., 379

Hobson, J. B., 619-620, 626, 658

Hobbs, P., 406

Hobson, P., 548

Hoen, P., 926

Hochberg, J., 560

Hodges, J. L., 674

Hoffman, H. G., 38

Hogarth, J., 242

Hoare, C. A. R., 899

Ho, D., 89

# 1280

Hogarth, R. M., 33 Hogue, A., 32 Hohmann, H., 170 Hohns, H. M., 935 Holland, B., 1064 Holland, N., 356 Hollien, H. F., 883 Holloway, R. T., 513 Holmes, O. W., Jr., 1085, 1087 Holmes, R., 28 Holmin, S., 924 Holmström-Hintikka, G., 171, 1063 Holstein, J. A., 32 Holt, A. W., 901 Holz, T., 706, 710 Holzner, S., 537 Honbo, D., 483 Hong, L., 960 Hoonlor, A., 492 Hope, L., 295, 859 Hopke, P. K., 934 Hopper, T., 958 Horie, C. V., 445 Horn, D., 489 Horn, R., 511 Horowitz, I., 328 Horrocks, I., 547 Horry, R., 264, 283 Horsenlenberg, R., 282 Horty, J. F., 439, 1042 Horwich, P., 250 Hosch, H. M., 95 Houck, M. M., 889 Hovy, E., 403, 601 Howe, C. J., 410 Howe, M. L., 38 Howe, M., 38 Howlett, J. B., 510 Hreinsdottir, H., 281 Hryciw, B., 283 Hu, M., 601 Hu, W., 607-610, 701, 1009 Huang, H., 529 Huang, R., 702 Huang, Y. P., 762 Huard, R. D., 402 Huber, R. A., 616–617 Hubert, M., 519 Hueske, E. E., 985 Hughes, P. A., 1071 Hughson, I., 596 Huhns, M., 533 Hulber, M. F., 525

Hulstijn, J., 340 Humphreys, G., 873 Hung, N. D., 171 Hunt, L., 1031 Hunter, A., 170 Hunter, D., 170, 619-620, 626, 639, 656-657, 659-660, 662 Hunter, J. R., 893 Hunter, J., 842 Huntley, C., 384 Hutchins, M., 752 Hutchinson, J. R., 904 Huttenlocher, D., 494 Hutton, N., 242-243 Hwang, B.-Y., 544 Hwang, C. H., 379 Hwang, H. S., 958 Hyde, H. A., 495, 926

## I

İşcan, M. Y., 884 Iacoviello, F. M., 30 Idika, N., 744 Igaki, S., 1071 Imbrie, J., 934 Imielinski, T., 623 Imwinkelried, E. J., 956, 1051–1052 Inbau, F. E., 282 Ineichen, M., 952 Inman, K., 943 Ireland, C. G., 863 Ireson, J., 233 Iscan, M. Y., 874 Isenor, D. K., 960 Ishikawa, H., 544, 723 Ishizuka, M., 396 Ishtiaq, F., 448-450 Ismail, R., 721 Isobe, Y., 1033, 1098 Israel, D., 1110 Israel, J. H., 1099 Ito, T., 717, 961, 967, 970-972 Iversen, J., 927 Ivkovic, S., 623 Izard, C. E., 88, 866

# J

Jackowski, C., 996 Jackson, B. S., 119, 259, 323–324, 328, 334, 1024, 1060, 1093, 1114, 1121 Jackson, G., 855 Jackson, P., 602, 607 Jacoby, J., 1103 Jacovides, M., 392-393 Jahnke, M., 696 Jain, A. K., 390, 1033 Jain, R., 390-391 Jajodia, S., 454, 899 James, M., 503 James, S. H., 880, 935, 973, 978, 983, 985 Jameson, A., 29, 83, 384, 403 Jamieson, A., 841, 884, 946 Jan, J., 76, 728 Janaway, R. C., 884 Janner, G., 1061 Janowitz, M., 150 Jayne, B. C., 282 Jedrzejek, C., 758-761 Jeffay, K., 697 Jefferson, M., 1034-1036, 1092, 1096 Jenkins, R. V., 1026 Jenkinson, B., 687 Jennings, N., 205, 257 Jennings, N. R., 524, 592 Jensen, D., 727-728 Jerdon, T. C., 448 Jha, S. K., 921–923 Jiang, D., 728 Jiang, X., 958, 1094 Jiao, Y., 692 Jia-Yu Pan, J.-Y., 741 Jin, F., 722 Jin, Sh., 529 Jin, X., 702 Jing, H., 591 Joachims, T., 605 Johannes Keizer, J., 551 John, T., 274 Johnson, B. C., 618 Johnson, G. W., 933-934 Johnson, M. K., 38, 183–184, 186–187, 872-874 Johnson, N. S., 347-348 Johnson, P. E., 205 Johnson, P. N., 353 Johnson, S. L., 890 Johnston, V. S., 859, 863-864, 1068 Jones, A., 1042 Jones, A. J. I., 1046 Jones, C. A. G., 880, 1064 Jones, J. G., 927 Jones, P., 855 Jones, R., 149 Jones, R. E., 506 Jones, S. S., 344

Jory, S., 983

Jøsang, A., 111, 721 Josephs, S., 282 Josephson, J. R., 40, 44, 48, 1021 Josephson, S. G., 40, 44, 48, 1021 Joshi, A., 490, 553 Josselson, R., 351 Joyce, C., 884 Juan, L., ii, 709, 940 Judson, G., 1049 Julius, A., 331 Jung, C., 721 Junger, E. P., 885 Junkin, T., 409

#### K

Kadane, J., x, 7, 52 Kahan, D. M., 315 Kahn, D., 689-690 Kakas, T., 45 Kalender, W. A., 995 Kalera, M. K., 616 Kalja, A., 546 Kamber, M., 100, 103, 600, 629, 638, 667, 673 Kamel, M., 961 Kamisar, Y., 1099 Kanehisa, M., 704 Kanellis, P., 687 Kangas, L. J., 514, 517 Kannai, R., 1048 Kantrowitz, M., 356, 384 Kaoru, H., 106, 668 Kaptein, H., 8 Karasz, J. M., 513 Karchmer, C., 280 Karttunen, L., 856 Karunatillake, N., 257 Karypis, G., 728 Kashy, D. A., 149 Kasiviswanathan, H., 616 Kass, A. M., 373 Kassin, S. M., 27, 65, 90, 281-283, 942, 1005-1006, 1041 Katagiri, Y., 1110 Katai, O., 428 Kataoka, M., 1033 Katayama, K., 544 Kato, Z., 722 Katz, L., 499-503, 721 Kauer, J. S., 924 Kaufman, L., 490, 877 Kaufmann, M., 498, 622 Kawai, T., 918 Kawakami, H., 428

Kaye, B. H., 883 Kaye, D. H., 367, 888, 955 Kearey, P., 911 Keh, B., 884 Keila, P. S., 678 Keller, E., 618 Kelly, J., 675, 728, 794 Kelsen, H., 302, 304 Kemp, K. N., 67 Kemp, R., 863 Kempe, D., 494 Kenis, P., 498 Kenji, T., 968, 971 Kennedy, D., 306 Kennedy, I., 1080, 1103 Kephart, J., 744 Keppel, R. D., 514, 518-519 Keppens, J., 49, 104, 844-848, 850-858, 1005, 1044, 1079 Kerner, Y., 244 Kerr, N. L., 328-329 Ketcham, K., 38 Khemlani, S., 1110 Khuwaja, G. A., 700, 958-959, 1033, 1070-1071 Kibble, R., 173 Kibler, D. F., 1027 Kiechel, K. L., 281 Kieras, D., 694, 1040 Killeen, J., 979 Kim, B. M., 934–935 Kim, Ch.-S., 958 Kim, D. S., 701 Kim, P., 391 Kim, R. K., 281 Kim, S.-M., 601 Kim, S.-R., 503 Kinder, J., 698 Kindermann, R., 722 King, B. F., 450 King, N. J., 1099 Kingsnorth, R., 1103 Kingston, J., 567, 755 Kinkade, R. G., 506 Kinton, R., 539 Kintsch, W., 349-350 Kirkendol, S. E., 149 Kirkpatrick, S., 724 Kirsch, I., 38 Kirschenbaum, A., 289 Kirschner, P. A., 168 Kitayama, Sh., 89 Kitchener, A. C., 447

Klein, M. C. A., 382, 550, 743 Klein, S., 382 Kleinberg, J. M., 494, 498, 721, 726-727, 741 Kleinman, S., 238 Klimt, B., 677 Klock, B. A., 921 Klotz, E., 995 Klovdahl, A. S., 498, 510 Klusch, M., 532-533 Knecht, L. E., 588 Kneller, W., 292 Kneubuehl, B. P., 890 Knight, B., 84, 90, 669, 899, 1114 Knott, A. W., 936 Knox, A. G., 445-446, 458 Knupfer, G. C., 883 Kobayashi, K., 968, 972 Kobayashi, M., 717 Koehler, J., 955 Koehler, J. J., 948, 952, 955 Kohavi, R., 702 Köhnken, G., 294 Kohonen, T., 489-490, 517, 664 Köller, N., 617 Kolmogorov, V., 725 Kolodner, J. L., 353, 383 Komoroske, J., 728 Kompatsiaris, Y., 548 Kong, A., 961 Konishi, R., 917 Koo, Y. H., 548 Koppen, M., 380 Koppenhaver, K., 617 Korb, K., 149 Korniss, G., 494 Kort, F., 657 Korycinski, C., 596 Kosala, R., 553 Kothari, R., 490, 949 Kou, Y., 762 Kovacs, D., 632 Kovács-Vajna, Z. M., 961 Kowalski, K., 45 Kowalski, R. A., 45, 170, 350, 899 Krabbe, E. C. W., 129-130 Krackhardt, D., 498-499, 503-504 Krane, D., 943 Krantz-Rülcker, C., 924 Kraus, S., 79, 85, 90, 164, 529 Krause, P., 182 Krawczak, M., 943 Kreibich, C., 696, 709 Krishna, P. V., 703

Krishnamoorthy, M. S., 678, 680 Krishnapuram, R., 490, 553 Kristensen, T., 959 Krogman, W. M., 884 Kronman, A. T., 306 Kruiger, T., 170 Kruse, W., 687 Kruskal, J. B., 495 Ku, Y., 717, 722 Kudenko, D., 385 Kuflik, T., 53, 62, 65, 406, 1023 Kuglin, C. D., 968 Kulikowski, C., 655 Kumar, A., 1070, 1097 Kumar, P., 483 Kuo, C. H., 960 Kupferman, O., 898 Kurosawa, A., 342 Kurzon, D., 324 Kuwabara, K., 720 Kvart, I., 118 Kwan, J. L. P., 379 Kwan, M. Y. K., 260, 263, 692-693, 717-719, 736-740 Kyle, S., 994

## L

La Moria, R. D., 514 Labor, E., 409 Lacis, A., 616 LaFave, W. R., 1099 LaFond, T., 743 Lagasquie-Schiex, M.-C., 170 Lagasquie-Schiex, S., 170 Lagerwerf, L., 48 Lai, K. Y., 260 Lai, P., 263, 692 Laifo, J., 386 Lakoff, G. P., 344, 347, 614-615 Lam, S. C. J., 546 Lamarque, P. V., 340 Lambert, J., 855 Lan, X., 494 Landman, F., 857 Lane, B., 883 Lane, S. M., 38 Lang, J., 17 Lang, R. R., 349 Langbein, J. H., 289 Lange, T. E., 380 Langenburg, G. M., 956 Langston, M. C., 380 Lanier, K., 149

Lapalme, G., 80, 596 Lara-Rosano, F., 1048 Laskey, K. B., 115, 255, 1107, 1108 Lassila, O., 547 Lassiter, D., 282 Lassiter, G. D., 149 Latendresse, M., 698 Latour, B., 1027 Latourette, K. S., 942 Lau, W. H., 1071 Laufer, B., 942 Laughery, K. R., 861 Laurel, B., 385 Lauritsen, J. L., 244 Lauritzen, S. L., 943-944 Lautenbach, K., 901 Law, F. Y. W., 260, 263, 692 Lawrence, S., 601 Laxman, S., 728 Leach, A.-M., 148 Leake, D. B., 373, 377, 1036 Leal, S., 149 Leary, R., xi, xiii, 479, 511 Leary, R. M., 511, 550, 559, 566, 714, 767, 1072 Lebbah, M., 517 Lebowitz, M., 353, 383 Lee, B., 717 Lee. C. H., 112 Lee, C.-J., 960 Lee, G., 380 Lee, H. C., 883 Lee, H.-K., 503 Lee, J., 181, 480, 546, 601 Lee, J.-M., 544 Lee, K., 149 Lee, L., 601 Lee, M., 852 Lee, R., 246, 755-756 Lee, T.-K., 706 Lee, V., 762 Leedham, G., 616 Leedy, L. W., 511 Lefebvre, W. C., 488 Leff, L., 537 Legary, M., 687 Legosz, M., 273 Legrand, J., 667 Lehmann, F., 545 Lehnert, W. G., 353-354, 399 Lehrer, K., 92 Leijenhorst, H., 842 Leippe, M. R., 93, 283

Leith, P., 248, 662, 1048 Lemar, C., 892 LeMay, C. S., 149 Lemons, J., 1034 Lempert, R., 1119 Lenat, D., 546, 754 Lenci, A., 547 Leng, P. H., 246 Leng, R., 845 Lengers, R. J. C., 652 Lennard, C., 948 Lenzi, V. B., 550, 559 Leo, R. A., 282, 499, 1069 Leon, C., 27, 388 Leone, A., 961 Leskovec, J., 721, 741 Lesser, V., 532 Lester, J. C., 203, 381, 384, 396 Leung, S. H., 1071 Levene, M., 538 Levesque, H. J., 80 Levi, J. N., 275 Levi, M., 618 Levin, B., 886 Levine, F. J., 283 Levine, T. R., 281 Levinson, J., 617, 1073, 1104 Levitt, T. S., 115, 255, 1107, 1108 Levy, D., 88, 497 Lewis, B., 183, 620 Lewis, C. M., 149, 161 Lewis, C. W., 935 Lewis, D., 304, 310 Lewis, N. S., 918 Lewis, P. R., 935-936 Lewis, T., 519 Leyton-Brown, K., 524 Li, Ch.-Ts., 689 Li, J., 611 Li, M., 700 Li, Q., 692, 949 Li, S. Z., 722, 724, 1033 Li, Y., 723 Li, Z., 391, 550 Liang, T., 629 Liao, Y., 607 Liberman, A., 28 Lieblich, A., 351 Liebowitz, J., 1086 Light, M., 378 Light, R., 537 Lim, R., 95 Lin, C. H., 709

Lind, A. E., 618 Linde, C., 82 Lindquist, R. J., 892 Lindsay, D. F., 283 Lindsay, D. S., 38 Lindsay, J. L., 149 Lindsay, R. C. L., 95, 149, 264, 283, 295 Linford, N., 907 Lingras, P., 490 Lipske, M., 445-446, 449-451, 464, 468-470, 474 Lipton, L., 48-49, 327 Lipton, P., 48 Lisetti, C. L., 871 Liske, C., 152, 938 Liu, B., 601 Liu, D., 526 Liu, H., 385, 611 Liu, V., 687 Lively, S., 109 Llewellyn, K. N., 323, 1085 Lloyd, C., 883 Lloyd-Bostock, S., 214 Lo Piparo, A., 216 Lobina, E., 343 Locard, E., 407, 890, 905, 926, 941-942, 1061 Lockwood, K., 720 Lodder, A. R., 168, 221, 252, 629 Loftus, E. F., 38, 63, 283, 297, 882 Logie, R., 292 Loh, W.-Y., 490 Lohr, S. L., 244 Loiselle, C., 353 Loizou, G., 538 Lonergan, M. C., 917-918 Longley, P. A., 515-516 Lönneker, B., 380, 388-389 Lönneker-Rodman, B., 388 Lonsdorf, R. G., 883 Lord, J., 444 Lord, P. W., 550 Louchart, S., 388 Loui, R. P., 168, 170, 182 Louis, J.-H., 150 Löwe, B., 65, 418–426 Lowe, G., 900 Lowes, D., 183 Loyall, A. B., 384 Loyek, C., 548 Loyka, S. A., 280 Lu, C. T., 762 Lu, Q., 494 Lucas, R., 483

Lucy, D., 887
Luger, G. F., 20, 25, 146, 169, 352, 480, 850, 1045, 1095, 1119
Luhmann, T., 994
Luhn, H. P., 596
Luk, A., 1071
Lukáš, J., 872
Lundström, I., 924
Luo, Y., 550
Lutomski, L. S., 53
Luus, C. A. E., 73, 283, 1091
Lykken, D. T., 284
Lynch, K. J., 749

#### М

Ma, J., 84, 90, 899 Maas, A., 294 Macagno, F., 154, 156 MacCormick, D. N., 1047 MacCormick, N., 129, 324, 1112 MacCrimmon, M., 8, 30, 45, 115, 301, 323-324, 1074-1075 MacDonald, E. M., 1022 MacDonald, T. K., 264 MacDonell, H. L., 973, 975 MacDougall, K. A., 913 Maceo, A., 957 Machado, I., 400 MacIntosh, R., 1103 Mackaay [sic], E., 84, 901, 1114 MacKeith, J. A. C., 281 Mackenzie, D. L., 1055 MacLane, S., 532 MacMillan, M., 263, 265, 298 Macneil, I., 306 Macrae, C. N., 332 Maedche, A., 547 Magdon-Ismail, M., 680 Mage, J. J., 285 Magerko, B., 386 Magliano, J. P., 380 Magnenat-Thalmann, N., 902 Magnussen, S., 270, 283 Maguire, D. J., 515 Maguire, M., 274 Mahendra, B., 881 Maher, M. J., 480 Mahesh, K., 560 Maida, A. S., 92, 152, 545 Maimon, O. Z., 702 Maio, D., 951 Maji, P., 490 Makinson, D., 17

Maley, Y., 324 Malgireddy, M., 891 Malinowski, E. R., 934 Malone, B. E., 149 Malone, C., 38 Malone, D. S., 99 Maloney, A., 982-983 Maloney, K., 976, 979-980, 983 Malpass, R. S., 38, 294-295, 863 Malsch, M., 408 Maltoni, D., 948, 951 Manco, G., 762 Mandler, J. M., 347-348 Mani, I., 487, 588-594 Mann, S., 149 Mannila, H., 483, 728 Manning, C., 38, 598 Manning, K., 617 Mannino, S., 924 Manouselis, N., 551 Manschreck, T. C., 87 Manucy, G., 923 Marafioti, L., 219 Marando, L., 95 Marcus, P., 237 Mares, E. D., 317, 319-321 Margot, P., 371, 844, 948 Marinai, S., 616 Marinaro, M., 618 Marineau, R. F., 497 Markus, H. R., 89 Marron, S., 697 Mars, N. J. I., 550 Marshall, C. C., 182 Martens, F. T., 279 Martens, T. K., 294 Martin, A. W., xiv, 7, 32-33, 942 Martin, P., 379 Martino, A. A., xiii, 2-4, 8, 36, 54, 93, 152, 207, 209, 212-213, 411, 1114 Martins, J. P., 20 Marwitz, D. B., 862 Maslow, A. H., 383 Mataric, M., 532–533 Mateas, G., 380, 385-387, 400 Mateas, M., 351, 356, 381, 386, 400-401, 404 Mathur, A. P., 744 Matkovskly, I. P., 752 Mattern, R., 884 Matthijssen, L. J., 182, 204 Maudet, N., 259 Maxion, R. A., 703 Maxwell-Scott, A., 283

Maybury, M. T., 594 Maylin, M. I. S., 864 Mays, S., 884 Mazzoni, G. A. L., 38 McAllister, H. A., 95 McBurney, P., 161, 170-171, 173, 928 McCabe, S., 38 McCallum, A., 678 McCann, D., 699, 906-907 McClelland, J. L., 42, 346, 379 McConachy, R., 149 McConville, M., 845 McCormick, E. J., 506 McCornack, S. A., 18, 150 McCulloch, M., 923 McCulloch, W. S., 644 McDermott, D., 898 McDowell, J., 379 McEnery, A. M., 183 McGeorge, P., 27 McGrath, C., 498, 503 McGuinness, D. L., 547 McGuire, P. G., 9 McGuire, R., 164, 172 McGuire, W. J., 28 McHugh, J., 687, 695 McKee, N. H., 904 McKellar, P., 263, 265 McKeown, K. R., 495 McKinnon, A. D., 709 McLeod, M., 410-411 McLeod, N., 943 McMechan, G. A., 912 McMenamin, G. R., 614 McNall, K., 65, 90, 282-283 McNally, R. J., 38 McNeal, G. S., 30, 301 McQuiston-Surret, D., 863 Me, G., 511-512 Mead, S. J., 381 Meade, M. L., 73, 1091 Meehan, J. R., 338-339, 376, 382-383 Meester, R. W. J., 943 Mégret, M., 150 Mehrotra, H., 700 Meijer, E. H., 445 Meikl, T., 196, 248, 623, 662, 1048 Meikle, T., 248, 662, 1048 Meissner, C. A., 27, 265, 281–283, 942, 1041 Meissner, K., 551 Meister, J. C., 380, 388-389 Meldman, J. A., 81, 901 Melinder, A., 270, 283

Mellett, J. S., 909, 912 Mellon, L., 1103 Melnik, M., 720 Melo, A., 535-536 Memon, A., 18, 27, 38-39, 73, 150, 264, 270, 282-283, 291-292, 295, 409, 859, 872, 882, 1091 Memon, N., 73 Mena, J., xiv, 484, 486-489, 492-493, 505-509, 512, 514, 516, 519-521, 523, 525, 534, 536-537, 547-548, 552, 601, 616, 682, 695-697, 699, 701, 708, 712-713, 717, 752-753, 859-860, 1044, 1069, 1078, 1090, 1107, 1109 Menard, V. S., 1006 Mendelsohn, S., 289 Menezes, R., 535 Merckelbach, H., 38, 282 Merkl, D., 621, 664, 666 Merlino, A., 594 Merricks, T., 92 Merrill, T. W., 305 Merton, R. K., 32 Mertz, E., 334 Messo, J., 38 Meudell, P. R., 73, 1091 Meyer, R. K., 317, 320-321 Meyer, T., 351, 546 Miao, W., 888 Michie, D., 675 Michon, J. A., 32, 292 Midlo, C., 957 Miers, D., 1087–1088, 1093 Miikkulainen, R., 380, 666 Mildenhall, D. C., 927 Miller, D. G., 38 Miller, F., 1103 Miller, L. S., 613 Miller, M. T., 690, 841, 883, 977 Miller, P., 865 Miller, R. E., 901 Milne, R., 149, 282, 927 Milton, J. L., 506 Ming Hsiang, T., 513 Minh, T. T. H., 537 Minkov, E., 675 Minsky, M., 24, 350, 394, 648 Mironov, A., 704 Mishler, E. G., 351 Misra, S., 483, 703 Missikoff, M., 546 Mitchell, H. B., 722 Mitchell, T. M., 379, 491, 853, 1069

Mitra, S., 490 Mitschick, A., 551 Mittag, D., 251, 1058 Mittal, V. O., 590 Mizanur Rahman, S. M., 700-701 Modgil, S., 170 Moens, M.-F., 588, 595-597, 602, 622 Moenssens, A., 952, 956 Moh, S.-K., 317 Mohamed, D. H., 559 Mohay, G., 611 Mokherjee, D., 153 Molina, H. G., 727 Molluzzo, J. C., 495 Mommers, L., 1096 Monachini, M., 547 Monahan, J., 38 Monmonier, M. S., 516 Moore, D. S., 921 Moore, J., 172 Moorman, K., 376 Mora, E., 334 Morelli, L. M., 61 Moreno, J. L., 497-498 Morey, D., 594 Morgan, J. E., 150 Morgan, T., 528, 1034 Morris, C. G., 510, 1032 Morris, J. R., 938 Morris, R. N., 617, 1073, 1104 Morris, S. B., 946 Morrison, R. D., 928-933 Morton, A., 7, 306 Mørup, M., 741 Morzy, M., 717 Moskowitz, H., 629 Mostad, P., 944, 1097 Motoda, H., 611 Mott, B., 203 Moulin, B., 80, 82-84 Movellan, J. R., 961 Mrvar, A., 498-499 Mueller, E. T., 339, 378-379, 383 Muhlenbruck, L., 149 Mukherjee, I., 702 Müller, J., 396 Mumford, D., 725 Munn, K., 545 Murbach, R., 243 Murphy, B. L., 928-933 Murphy, R. G., 445 Murray, D. M., 283 Murray, R. C., 905

Murtaugh, M., 341 Musatti, C. L., 63 Musgrove, P. B., 483, 517 Musgrove, P., 84, 154, 483–484 Myers, T., 537

## Ν

Na, H.-J., <mark>958</mark> Nachenberg, C., 742 Nadiadi, Y. M., 959 Naess, E., 709 Nafe, B., 884 Nagano, T., 885 Nagel, I. H., 1103 Nagel, S., 246, 657 Nagle, H. T., 917, 922 Nakhimovsky, A., 537 Nambiar, P., 885 Nance, D. A., 946 Nanto, H., 918 Napier, M. R., 512 Narayanan, A., 378, 616 Narchet, F. M., 281 Nattkemper, T. W., 548 Nau, D. S., 550 Navarro, A., 388 Navigli, R., 546 Neave, R., 875 Neaves, P., 918 Nebel, B., 17 Neil, M., 110, 1077, 1083 Neill, A., 340-341 Neimark, J., 38 Nenov, V. I., 380 Nespor, S., 943 Netzer, O., 600 Neufeld, P., 282 Neukom, R., 952 Neumann, K., 283 Nevatia, R., 392, 548 Neves, J., 245 Neville, J., 494, 727-730, 743 Newburn, T., 176 Newell, A., 528 Newman, C., 863 Newman, M. E., 494 Ng, H. T., 379, 872 Ng-Thow-Hing, V., 904 Nicolle, D., 876 Nicoloff, F., 65 Nicolson, D., 2, 1055, 1068 Nielsen, L., 943 Nielsen, T., 281

Niemi, P., 282 Niesz, A. J., 356 Nigro, H. O., 544, 550 Nijboer, H., 408, 1062 Nijboer, J. F., 237, 880 Nijholt, A., 340, 394 Nilsson, N. J., 83, 383 Nirenburg, S., 560 Nissan, E., ix, xii, xiii, 1-4, 6-8, 11, 16-19, 23-24, 26-28, 32, 36, 53-55, 57, 61, 67-68, 76-77, 80-84, 86, 89-91, 117, 126, 137, 150, 152, 173-174, 207, 209, 212-213, 247, 289, 323, 331, 336-337, 339-340, 343-344, 380, 394-395, 403-404, 406-408, 411-413, 416, 418, 429-434, 458, 460-461, 483, 487, 494, 538, 553, 587, 603, 611, 668-670, 767, 841, 859, 878, 881, 887, 899-901, 928, 1017, 1023, 1034, 1046, 1049, 1055, 1084, 1114 Nissen, K., 617 Nitta, K., 335 Niu, X., 392, 692 Noedel, M., 841 Nonn, E., 243 Noon, R. K., 935-936 Noordman, L. G. M., 380 Nordby, J. J., 880, 935 Norman, D. A., 350 Norman, J., 170 Norman, T. J., 110 Norvig, P., 353 Norwick, R. J., 281–282 Notsu, A., 428 Novitz, D., 341 Nowakowska, M., 86, 357 Nunez, D. T., 864

## 0

Oard, D. W., 682 Oatley, G. C., x, 479, 511, 620–621, 844 Obaidat, M. S., 703 O'Barr, W. M., 316, 334, 618 O'Brien, B., 328 O'Brien, T. P., 149 Ochaeta, K. E., 717, 719 Oehler, D., 450 Ofshe, R. J., 282 Ogata, T., 388 Ogden, J., 1068 Ogston, E., 533 Ohta, M., 544 Oinonen, K., 394 Okada, N., 356 Okada, T., 346 Olaisen, B., 944, 1097 Olderog, E.-R., 901 O'Looney, J., 516 Olsen, S. H., 340 Olshen, R. A., 490 Olson, E. A., 95-99, 270, 283 Olson, S. L., 444 Oltramari, A., 551 Omelayenko, B., 550 Onega, S., 344 Ongvasith, P., 511 Onvshczak, R. J., 958 Onyshkevych, B., 560 Opdorp, G. J., 529, 1103 Orgun, M. A., 546 Ormerod, T. C., 842 O'Rorke, P., 394 Ortony, A., 340, 346, 394 Osaki, T., 917 Osborn, A. S., 617 Osborne, C., 282, 288, 294, 862, 1023, 1026, 1029, 1037-1039, 1043, 1048, 1054, 1056-1057, 1074, 1077-1079, 1100, 1104, 1109 O'Shea, C., 706 Oskamp, A, ii, 529, 1103 O'Sullivan, M., 150, 285 Osuna, R. G., 922 Otgaar, H. P., 38 Oudot, L., 706 Ouellette, J., 916-917 Overill, R. E., 260-263, 687, 692-694, 889 Owen, G., 253-255 Owens, C. C., 373 Oxtoby, O., 864 Ozisikyilmaz, B., 483 Özsoyoğlu, Z. M., 538

## Р

Pacuit, E., 418–421, 424 Pacuit, P., 419 Page, L., 503, 721, 726–727, 731 Paglieri, F., 173, 257–259 Paiva, A., 400 Pakes, F. J., 32, 392 Pal, S. K., 490 Palagiri, C., 706 Paley, B., 294 Pallotta, G., 96 Palmbach, T., 883 Palmer, J. C., 38 Palmer, M. S., 379 Pamplin, C., 1064 Pamula, V. K., 921 Panangadan, A., 392 Pandit, S., 720, 722-723, 725-728, 730-736 Pang, B., 600-601 Pankanti, S., 957, 960, 1033 Pannu, A. S., 621, 674-675 Paolucci, M., 18 Papadimitriou, C. H., 694 Papageorgis, D., 28 Papapanagiotou-Leza, A., 207 Papert, S., 648 Papineau, D., 321 Pardo, M. S., 107-110, 256, 281, 288, 293, 326-327, 367, 886, 946, 1034, 1039, 1102, 1106 Pardue, H. L., 885 Parent, X., 1042 Parikh, R., 418-419 Park, J. F., 935 Park, J. S., 701 Park, N., 242, 252 Park, R. C., 367 Parkinson, B., 89 Parry, A., 82 Parsons, S., 170, 173, 182, 205, 928 Parton, D. A., 233 Partridge, R. E., 521 Parunak, H., 533 Pascali, V. L., 944 Passonneau, R. J., 379 Patel-Schneider, P. F., 547 Pattenden, R., 30, 301, 1073 Pavlidis, I. T., 150 Pawlak, Z., 490 Paxson, V., 709 Pearce, T. C., 917 Pearl, J., 49, 102, 104, 118, 120, 127, 1030 Pearman, D. A., 448 Pease, K., 214, 233, 242, 245 Pedersen, J., 727 Pedreschi, D., 762 Pedrycz, W., 490, 671 Pei, J., 104-105, 728 Peinado, F., 347, 380, 387-388 Peirce, C. S., 44, 48, 855 Pelosi, P., 917 Peltron, W., 886 Pennec, X., 903-904 Pennington, D. C., 214, 245 Pennington, N., 32-33, 36-37, 51, 214,

324-325, 335, 1075, 1112

Pennock, D. M., 601 Penrod, S. D., 38, 270, 283, 291, 293-294, 297, 882-883, 1034, 1039-1040 Penry, J., 862-863 Perdisci, R., 697 Perego, R., 961 Pérez y Pérez, R., 385 Perlis, D., 79, 347, 377 Perloff, M., 439 Péron, A., 1067 Peron, C. S. J, 687, 949 Perrins, C., 449 Persaud, K. C., 917-918 Petacco, A., 96 Peter, R., 445 Peters, B. J., 890 Peters, G., 490 Peters, S., 1110 Peterson, D, M., 8 Peterson, J. L., 901 Peterson, M., 280 Petkov, E., 554 Petri, C. A., 901 Petridis, M., 669 Petty, R. E., 28 Peuquet, D. J., 392 Pevzner, P., 704 Pezdek, K., 291 Pfeifer, R. L., 149 Pfeiffer III, J., 494 Pharr, M., 873 Philipps, L., 104, 106, 659-660 Phillips, M., 384 Philp, R. P., 929 Phua, C., 762 Phuoc, N. Q., 503, 721 Pickel, D., 923 Pickering, A., 292 Pickrell, J. E., 38 Pieprzyk, J., 742 Pietroski, P. M., 154 Pike, G., 863 Pildes, R. H., 305, 317 Pillaipakkamnatt, K., 618–619, 643 Pingali, G., 390 Pisanelli, A. M., 918 Pitts, W., 644 Pizzi, D., 388 Plamper, J., 89 Plantinga, A., 7, 92 Plewe, B., 515 Plumwood, V., 320 Podlaseck, M., 390

Poesio, M., 547 Poggi, I., 149 Politis, D., 207 Pollard, D. E. B., 340 Pollock, J. L., 25, 88, 146-148 Pong, T.-C., 722 Pons, S., 414 Poole, D. L., 44, 112-115, 182, 1079 Poosankam, P., 709 Popescu, A. C., 872, 1078 Popescu, A.-M., 601 Popov, V., 494 Porat, A., 1057 Porter, A., 286 Porter, S., 18, 149 Posner, R. A., 250 Potter, J., 82 Pouget, F., 706 Poulin, D., 84, 901, 1114 Poullet, Y., 247 Poulovassilis, A., 538 Pound, R., 1090-1091 Pour Ebrahimi, B., 533 Pozzi, G., 513 Prabhakar, S., 951, 960-961 Prada, R., 400 Prade, H., 17 Pradin-Chézalviel, B., 84, 901 Prag, B., 864 Prag, J., 875 Prakken, H., 8, 45, 131, 161, 165–166, 168-170, 172, 174-175, 182, 185, 196, 208, 327, 333, 477-479, 525, 657, 843, 1025, 1042, 1102 Pregibon, D., 729 Prendinger, H., 396 Preston, H., 865, 1044 Prevost, S., 396 Price, C., 857 Priebe, C. E., 678 Prince, R., 286 Principe, G., 73, 1091 Principe, J. C., 488, 523, 1097 Propp, V., 323, 344-349, 387, 424 Proth, J.-M., 901 Provan, G., 118 Provos, N., 706 Prŷs-Jones, R. P., 446, 448, 451, 469, 471 Pu, D., 616 Pueschel, J., 944 Pühretmair, F., 513 Puni, G., 53, 62, 406 Purchase, H. C., 503

Pye, K., 889, 905 Pyle, D., 552

# Q

Quaresma, P., 606 Quinlan, J. R., 490, 606, 639–640, 702, 949 Quinlivan, D. S., 283, 295–297 Quintana, M.-P., 378 Quinteiro Uchõa, J., 490 Quochi, V., 547 Qutob, A. A., 918

# R

Raab, J., 494, 498 Rabinovich, A., 452 Rachel, A., 69, 150 Radev, D. R., 591 Radford, C., 340-341 Rahman, H., 700, 713 Rahman, M., 701 Rahwan, I., 171 Raitt, F., 851 Raja, A., 270, 283, 376-377, 431, 526 Rakover, S. S., 859 Ram, A., 373-377 Ramakrishnan, V., 617, 891 Ramamoorthi, R., 872 Ramani, K., 550 Ramkumar, M., 872 Randell, D. A., 84, 899 Ranney, M., 166, 1042 Rapaport, W. J., 379 Rarity, J., 863 Raskin, J.-F., 901, 1042 Raskin, V., 149, 559-561 Rasmussen, P. C., 446, 448-451, 464-472, 474-475 Ratcliffe, J. H., 9, 280, 518 Ratledge, E., 1103 Rattani, A., 700, 1033 Rattner, K., 287 Read, J. D., 38, 283, 378, 883 Read, S., 317 Reddy, W. M., 90 Redlich, A., 281 Redmayne, M., 6-7, 109, 246, 335, 858, 953-954, 1083 Redmond, M. A., 244 Redsicker, D. R., 935 Reed, C. A., 156, 167-168, 170-171, 175, 1025 Reed, J. M., 447 Reed, K., 943

Rees. B., 844 Reeves, J., 374, 379, 564 Reichenbach, H., 108, 899 Reid, J. E., 36, 282 Reilly, W. S. N., 384 Reimers, N., 904 Reiner, R., 279 Reis, D., 536 Reiß, M., 617 Ren, A., 701 Renaud, M., 593 Rendell, K. W., 613 Renooij, S., 45, 174, 208, 1102 Resnick, P., 720-721 Restall, G., 317, 320 Rety, J.-H., 341, 385 Reutenauer, C., 901 Reyna, V. F., 38 Reynolds, K., 936 Rhind, D. W., 515 Rhodes, W., 243 Ribarsky, B., 526 Ribarsky, W., 526 Ribaux, O., 511, 844 Ribeiro-Neto, B., 598 Rice, R. E., 496 Richards, R. E., 283 Richards, W. D., 496, 498 Richman, K. D., 282 Rickman, B., 400-401 Ricordel, P., 533 Riedl, M. O., 356, 377, 381, 385 Rieger, C., 352 Riepert, T., 884 Riesbeck, C. K., 64, 352, 373, 428 Riloff, E., 379 Ringle, M., 1027 Ripley, B. D., 674 Ripley, S. D., 449-450, 468 Risinger, D. M., 613, 1066 Rissland, E. L., 169-170, 529, 602, 622, 1036, 1077 Rist, T., 396 Ritchie, G., 340 Ritterband, P., 592 Rizzo, A., 167 Roberto, V., 546 Roberts, A., 297 Roberts, D. L., 447 Roberts, L., 943 Robertson, B., 7, 887, 1052 Robertson, D., 181, 480 Robinson, P., 410

Robson, S., 994 Roediger III, H. L., 73, 1091 Rogers, M., 687 Rogers, S. P., 445 Rogovschi, N., 517 Rokach, L., 100, 490, 606, 702 Roscoe, A. W., 306, 899-900, 1085, 1090 Roscoe, B. A., 934 Rose, R., 264 Rose, T. L., 332 Rosenberg, N., 408 Rosenberg, S. T., 353, 1046-1047 Rosenblatt, F., 644, 647-648 Rosenthal, R., 149, 613, 950, 1067 Rosenwald, L. A., 38 Rosoni, I., 407, 887 Ross, A., 317, 700, 961, 1033 Ross, A. A., 962-963 Ross, D. F., 283, 882-883 Ross, S., 999 Ross, T., 666 Rossiter, B. N., 901 Rotolo, A., 1042 Rousseau, D. M., 54, 67, 80, 82, 86, 91, 394-395, 406 Rousseeuw, P. J., 490, 519, 622 Routley, R., 320 Rovatti, R., 961 Rowe, G. W. A., 167, 175, 1025 Rowe, J. P., 385 Rubinstein, R., 725 Rudin, V., 943 Ruffell, A., xiii, xiv, 905 Rumble, W. E., Jr., 662, 1085 Rumelhart, D. E., 42, 324, 346-348, 350, 379, 649-650 Ruppin, E., 489 Russano, M. B., 281 Ryan, M.-L., 336-337, 349 Ryan, P. Y. A., 900 Rydell, S. M., 283 Ryokai, K., 401-402

#### $\mathbf{S}$

Sabater, J., 18 Sablayrolles, P., 84 Sadorf, E., 617 Safavi-Naini, R., 742 Saferstein, R. E., 883 Sagri, M. T., 553 Sainsbury, R. M., 1118 Saks, M. J., 613, 948, 952, 955 Sakurai, Y., 717

#### 1292

Salfati, R., 62, 406 Salmon, W. C., 108 Salokhe, G., 551 Salton, G., 596 Sammes, T., 687 Sanders, G., 118 Sanders, W. B., 176 Sanger, J., 600-601 Sankur, B., 872 Sansonnet, J.-P., 379 Santini, F., 950, 963 Santos, E., Jr., 117 Santtila, P., 282 Sappington, D., 90 Saraf, S., 418, 420, 424 Saravanan, R., 548 Saretto, C. J., 381 Sartor, G., 104, 106, 168-170, 182, 667, 1025 Sartwell, C., 92, 392 Sasaki, Y., 968 Sastry, P. S., 728 Sattler, U., 546 Saukko, P. J., 883 Saunders, A., 845 Sauter, J., 533 Savage, L. J., 127 Savitsky, K., 27, 283, 942 Savona, E., 275 Sawday, J., 902 Sawyer, A. G., 28 Sbriccoli, M., 289 Scampicchio, M., 924 Schafer, B., 160, 566, 755, 844-848, 851, 855-857, 1005, 1044 Schank, P., 166 Schank, R., 350, 383 Schank, R. C., 352 Schank, R. G., 33, 64 Schapire, R. E., 702 Schartum, D. W., 238 Schek, H.-J., 538 Scherer, K. R., 285 Schiano, D. J., 871 Schiffman, S. S., 917 Schild, H., 884 Schild, U. J., 244, 633, 637, 1048 Schlesinger, P., 412 Schmid, N., 1014-1015 Schmidt, M. A., 445 Schmidtke, J., 943 Schneider, D. K., 353 Schneider, V., 498, 900

Schoenlein, R. W., 914 Schonlau, M., 703 Schooler, J. W., 38 Schraagen, J. M., 842 Schreiber, F. A., 513, 898-899 Schreiber, T. J., 266, 554 Schrickx, J. A., 529, 1103 Schroeder, J., 511, 748, 759 Schubert, L. K., 379 Schulten, E., 550 Schultz, M., 744 Schulz, S., 551 Schum, D. A., ix-x, 7, 19, 32-33, 52-53, 102, 111, 131, 174–175, 208, 210, 240, 477, 495, 782, 785, 800, 806-807, 855, 1076, 1090 Schunn, C. D., 346 Schutze, H., 598 Schwartz, A., 305 Schweighofer, D., 621, 664, 666 Schweighofer, E., 621, 664 Schwikkard, P. J., 287 Scoboria, A., 38 Scott, J., 342 Scott, J. E., 714, 717 Scott, M. S., 9, 280, 498 Scott, R. E., 305 Seabrook, J., 450 Searle, J., 80 Sebastiani, F., 599-600 Sebeok, T. A., 409 Sebok, A., 305 Seelau, E. P., 283 Segal, M., 491 Segal, U., 1023 Seidmann, D. J., 171, 288 Seissler, W., 995 Sejnowski, T. J., 489, 724 Selbak, J., 1006 Sellier, K. G., 890 Selten, R., 259 Seltzer, M., 408 Semin, G., 149 Sengers, P., 351, 356, 381 Sennef, A., 237 Ser. W., 958 Sergot, M. J., 149, 1042, 1046 Seto, Y., 1033, 1098 Sgouros, N. M., 381 Shafer, B., 850-851, 856 Shafer, G., 1045 Shannon, C. E., 642, 694 Shapira, R. A., 30, 301

Shapira, R., 668 Shapiro, E., 360 Shapiro, S. C., 20, 379, 545 Sharkey, N., 380 Sharman, S. J., 38 Sharples, M., 385 Shastri, D., 150 Shaul, Y., 62, 406 Shaw III, J., 38 Shebelsky, R. C., 76 Shemesh, A. O., 68 Shen, H. C., 104, 701, 856 Shen, Q., 846, 852, 855, 857-858, 1070 Shennum, W., 285 Shepherd, J. W., 859, 862 Sheptycki, J., 9, 273-279 Shereshevsky, B.-Z., 289 Sherman, L., 1055 Sherman, S. J., 38 Shetty, J., 677 Shetty, S., 617 Shilliday, A., 1110 Shim, C.-B., 548 Shim, S., 717 Shimizu, Y., 918 Shimony, S. E., xiii, 28, 32, 86, 117, 173, 1034, 1084 Shinzaki, T., 1071 Shiose, T., 428 Shiraev, E., 88 Shirani, B., 687 Shirley, S. G., 917, 954–955 Shoham, Y., 524, 898 Shortliffe, E. H., 106, 193 Shuirman, G., 890 Shurmer, H. V., 917–918 Shuy, R. W., 618 Shyu, C. H., 112 Siddiqui, M. A., 742 Siegel, J. A., 883 Sierra, C., 18, 205 Sigdel, K., 533 Sigfusdottir, I. D., 281 Sigmund, W., 497, 890 Sigurdsson, J. F., 281 Silberman, C. E., 1103 Sillitoe, T. J., 901 Silomon, J. A. M., 260-261, 693-694, 889 Simari, G., 170 Simari, G. R., 171 Simhon, D., 152 Simmons, R. F., 382, 445 Simon, E., 243

Sinai, J., 495 Singh, A., 721 Singh, K., 904 Singh, M., 173, 533 Siroky, D. S., 949 Sirwongwattana, S., 762 Sjerps, M., 943 Skabar, A., 673 Skagerberg, E. M., 73, 292, 1091 Skalak, D. B., 169-170, 529, 1034, 1036 Skillicorn, D. B., 678 Skulsky, H., 341 Slabbert, J. H., 874 Slee, D., 619-620, 626, 658 Slosson, J. E., 890 Smeets, T., 38 Smith, A. S., 1049 Smith, B., 545 Smith, F. D., 842 Smith, H. E., 305 Smith, J. C., 596, 606 Smith, J. M., 538 Smith, P. A., 842 Smith, R. G., 529-532 Smith, R., 1007 Smith, S., 384 Smith, T. C., 356, 384 Smith-Miles, K., 762 Smolenski, M., 758 Smolensky, P., 346, 379 Smullyan, R. M., 1053 Smyth, P., 483 Snell, J. R., 722 Snoek Henkemans, F., 171 Snook, B., 511 Snow, P., 16, 115-116, 272, 1054 Socia, C., 547 Söderström, C., 924 Sokooshi, H., 918 Solan, Z., 489 Solka, J. L., 598-599 Solomon, C. J., 864 Solon, M., 1064 Solow, A. R., 447 Sommer, R., 709 Song, C. H., 548 Song, Q., 701 Song, S. X., 709 Soper, A. J., 669 Soper, A., 669 Sopher, B., 153 Sorg, M. H., 896 Sörgel, D., 547

Sorkin, G., 744 Sosa, E., 92 Sotomayor, S., 329, 332-333 Soukal, D., 872 Sousa, O., 245 Sowa, J., 83-84 Sowa, J. F., 545 Sparck Jones, K., 595 Sparrow, M. K., 494-497, 509-510, 735, 752, 1110 Spears, D., 243 Specter, M. M., 935 Spelman, W., 280 Spencer, M., 410 Sperber, D., 309, 521, 1088 Spiegelhalter, D. J., 675 Spiegelman, C. H., 935 Spisanti, L., 762 Spitzner, L., 706 Spivak, J., 538 Spohn, W., 117-118, 1084 Spooren, W., 48 Sprugnoli, R., 550 Srihari, R. K., 616-617, 879, 891, 957 Srihari, S. N., 879, 943, 1041 Srikant, R., 246, 1028 Srinivasan, H., 616-617, 957 St. John, M. F., 380 Staab, S., 546-547 Stabler, E. P., Jr., 379 Stærkeby, M., 884 Stakhanova, N., 701 Stangor, C., 332 Staniford, G., 170, 248, 1048 Staples, E. J., 918, 923 Starmer, K., 1069 Stauffer, E., 943 Stearns, C. Z., 89 Stearns, P. N., 89 Stein, A., 349 Stein, N. L., 2, 30-31, 137, 171, 250, 288, 301, 347-348, 1023, 1072 Steingrimsdottir, G., 281 Steinwart, I., 681 Stenne, P., 247 Stenross, B., 238 Stephen, J. F., 137, 298, 317, 412, 858, 928 Stephenson, K., 495 Sterling, L., 360, 754-756 Stern, A., 386, 400 Stern, D. N., 90 Stevenage, S. V., 871

Stevens, R., 409 Stevvers, M., 545 Stickel, M. E., 379 Stiegler, B., 1026 Stiff, J. B., 29 Stilovic, M., 948 Stittmeyer, R., 616 Stock, O., 340, 729 Stockmarr, A., 943 Stolfo, S. J., 676 Stolfo, S., 744 Stollman, A., 408, 412 Stone, B. A., 396 Stone, C. J., 490 Stone, J. I., 149 Stone, M., 271 Stoney, D. A., 948, 953, 957 Stork, D. G., 489, 600 Strange, D., 38 Stranieri, A., xiii, 6, 18, 99, 104, 112, 161, 170, 177, 179, 183, 196-197, 202-205, 321, 378, 484-485, 492, 529, 553, 595, 602-603, 618-620, 623, 628-629, 637, 643, 662, 666, 668, 673, 702, 1031, 1033-1034 Strapparava, C., 340 Stratton, J. R., 233 Stridbeck, U., 270, 283 Strömwall, L. A., 149 Stubblefield, W. A., 20, 25, 146, 169, 352, 480, 850, 1045, 1095 Studer, R., 546 Su, C., 943 Su, X., 519 Sugahara, K., 917 Suh, B., 721 Sullivan, J. P., 396 Sullivan, J., 150 Summers, R. S., 129 Sun, J., 741 Sun, Sh. H., 692, 699 Suprenant, B. A., 936 Sutherland, R., 38 Sutherland, S., 1103 Sutton, P. T., 795 Sutton, T. P., 985 Swami, A., 623 Swartjes, I., 342, 394 Sweetser, E., 149 Swenson-Wright, J., 1055 Swiniarski, R., 671 Sycara, K., ix, 80, 149, 151, 161–164, 532-533, 546

Sycara, K. P., 164
Szilas, N., 341, 385
Szymanski, B. K., 492, 494, 525, 678, 705–706
Szymanski, B., 525
Szyszko, S., 918

#### Т

Tacey, M. L., 943 Taddei Elmi, G., 239 Talukder, A., 392 Talwar, V., 149 Tamassia, R., 498 Tan, T., 959 Tan, X., 961 Tan, Y., 150 Tan, Y.-H., 1042 Tanca, L., 513 Tang, J., 149 Tang, T., 687 Tang, Y., 687 Tao, D., 741 Tapiero, I., 378 Tapp, J. L., 283 Tardos, E., 494 Tardy, C. H., 618 Taroni, F., 7, 855, 887, 945 Taruffo, M., 248 Tata, C., 242-244, 248 Tattersall, A., 841 Tatti, N., 728 Taubes, G., 903 Tavers, P., 918 Tavris, C., 38 Taylor, C. C., 149 Taylor, J., 149 Taylor, J. A., 149 Taylor, P. J., 842 Tebbett, I., 885 Tedrow, J. C. F., 905 Teel, K. S., 274, 506 Tenenbaum, J. B., 545 Tenneholtz, M., 503 Teo, L. H., 379 ter Meulen, A. G. B., 899 Teran, J., 904 Terluin, D., 385 Terrones, K. M., 514 Tesauro, G., 744 Teufel, S., 597 Thagard, P., 39-43, 47, 49-53, 167, 478, 659-660, 1042, 1054 Thali, M. J., 991, 994, 1007

Thalmann, D., 395, 551, 902 Thang, P. M., 171 Thelen, M., 379 Theune, M., 342 Thomas, E. A. C., 991 Thomas, M., 615 Thompson, P., 602 Thompson, S., 346 Thompson, W. C., 613 Thórisson, K. R., 396 Thorndyke, P. W., 347-348, 406 Thorpe, J., 233 Tidmarsh, J., 1039 Tillers, P., x, xiii, 6, 8, 45, 53, 108, 110-112, 115, 131, 167, 174, 208, 210, 240, 252, 477, 1049–1051, 1076, 1090, 1106 Tilley, N., 9 Tingey, M., 883 Tingey, R., 883 Tinsley, Y., 954 Tiscornia, D., ii, 553 Toglia, M. P., 283, 883 Toland, J., 844 Tolcott, M. A., 506 Tollis, I. G., 498 Tomberlin, J. E., 1042 Tonfoni, G., 353 Tong. H., 741 Toni, F., 45, 170 Tonini, P., 2 Topolnicki, D. M., 1022 Topp, L. D., 863 Toppano, E., 546 Toral, A., 547 Torasso, P., 846 Torrens, P. M., 516, 534 Torroni, P., 45, 1023, 1085 Tosi, L., 513 Toulmin, S. E., 1118 Townsend, T. N., 703 Trabasso, T., 380 Trankell, A., 150 Travers, P., 918 Travis, C., 392 Tredoux, C. G., 864 Tribe, L. H., 1119 Tribondeau, N., 862, 915, 939 Trithemius, J., 690 Tsai, Ch.-L., 519 Tsai, F. S., 536 Tschudy, R. H., 927 Tsiamyrtzis, P., 285 Tukey, D., 183

Tulving, E., 383
Tupman, W. A., 240
Turner, B., 884
Turner, S. R., 398
Turney, P. D., 601
Turvey, B., 493
Twining, W. L., ix, 2, 21, 36, 38, 131, 174, 333, 477, 569, 800, 1024, 1055–1056
Tybjerg, K., 1055
Tyree, A., 170
Tyrner, J., 863
Tyrrell, A., 607

## U

Uijlings, J., 394 Ukpabi, P., 886 Ulmer, S., 246 Umaschi Bers, U., 399 Umaschi, M., 399–401 Umiker-Sebeok, J., 409 Ungar, L., 600 Ursu, M. F., 1042 Uschold, M., 545–546 Uther, H.-J., 79, 346 Uyttendaele, C., 588, 596

#### V

Vaccarelli, A., 950 Vachher, A., 607 Vafaie, H., 752 Vaithyanathan, S., 601 Valcour, L., 513, 1082 Valente, A., 553, 555-556 Valentine, T., 292 Valette, R., 84, 901 Valeur, F., 686, 688 Valitutti, A., 600 van Andel, P., 408 van Benthem, J., 898 van Boxel, D. W., 944 Van Cott, H. P., 506 van den Berg, P. H., 529 van den Braak, S. W., 166, 176, 477-478, 1042.1112 van der Hoek, W., 249 van der Schoor, J., 477 van der Torre, L. W. N., 901, 1042 van der Vet, P. E., 550 van Dijk, T. A., 191, 303, 314, 349-350, 1107 Van Eemeren, E. H., 170-171 van Gelder, T. J., 167, 1105 van Gent, R., 82, 394, 396, 402 van Harmelen, F., 547

Van Koppen, P. J., 170, 292–293, 325 van Kralingen, R. W., 554 van Mulken, M. J. P., 410 van Noortwijk, C., 246 van Oostendorp, H., 166, 477 Van Reenen, P. Th., 410 Vandenberghe, W., 566-567, 714, 755 Vanouse, P., 404 Vapnik, V. N., 604-605, 608, 681 Varley, G., 536 Vasconcelos, E., 11, 516, 534-535, 1067 Vassiliadis, S., 533 Vatner, A., 282 Vecchi, M., 724 Veefkind, N., 292-293 Veksler, O., 722, 725 Vellani, S., 446-447 Veloso, M., 1036 Vemuri, V. R., 607 Vendler, Z., 152 Verheij, B., 8, 168, 170-171, 325, 328, 476, 478-479 Verheij, H. B., 170 Vicard, P., 944 Viegas, E., 560 Vignaux, G. A., 7, 887, 1052 Vila, L., 84, 898, 901, 1114 Visser, P. R. S., 554 Vock, P., 995, 1007 Volinsky, C., 729 Vonk, W., 380 Vossos, G., 619, 642 Vreeswijk, G. A. W., 166, 170, 176, 182, 477, 1108.1112 Vreeswijk, G., 172 Vrij, A., 18, 149-150, 282, 284-285, 288, 1050 Vrochidis, S., 548

#### W

Wache, H., 547
Wade, K. A., 38
Waegel, W. B., 237
Wagenaar, W. A., 38, 292–293, 325, 327, 477, 1024
Wagner, D., 494, 498
Wagner, M. J., 892
Wagner, S. A., 841
Wahab, M. S., 716, 1109, 1119
Waismann, F., 196
Walker, C., 1069
Walker, D. P., 690
Walker, J., 923

Weyhrauch, P., 385-386 Wharton, C. M., 380 White, J., 28 White, M., 282 White, P. H., 924 White, W. S., 282 Whitely, R., 322 Wicke, C., 264 Wide, P., 924 Wiggins, S. M., 912 Wigmore, J. H., x, 130-131, 299, 784 Wilder, H. H., 957 Wilensky, R., 347-348, 350, 353 Wilhelm, J., 742 Wilkins, D., 618-619, 643 Wilkinson, C., 602 Wilkinson, R., 875 Wilks, Y., 92, 151-152, 350, 938 Williams, K. D., 29 Williams, P., 275 Williams, R. L., 289 Williams, R., 649 Williams, S., 1036 Williamson, T., 176, 283 Willis, C. M., 923 Willmer, M. A. P., 273–274 Wilson, A. D., 923 Wilson, D., 1088 Wilson, G., 923 Wimmer, M. C., 38 Winger, L., 722 Winiwarter, W., 621 Winkels, R., 553-554, 556, 1096 Winkler, J., 38, 283 Winograd, T., 350-351 Winquist, F., 924 Wirth, J., 1007 Wish, M., 495 Witten, I. H., 356, 384, 491 Wogalter, M. S., 862 Wolchover, D., 283 Wong, D. C. M., 1070 Wong, L., 538 Wong, R. W. H., 1070 Wood, J., 38 Wood, W., 28 Woods, D., 18 Woods, J. H., 340 Woods, J., 259

Woods, W. A., 545

Woodworth, M., 149

Westermann, G. U., 390-391

Walker, K. J., 923 Wallace, W. A., 680, 882 Walpole, J., 408 Walsh, W. F., 9 Walt, D. R., 924 Walton, D., 158 Walton, D. N., 129, 155-158 Walton, K., 341 Wang, C., 728 Wang, F. L., 526 Wang, G., 550 Wang, J., 728 Wang, M., 490 Wang, P., 630 Wang, R., 728 Wang, S., 720 Wang, S.-D., 960 Wang, W., 692 Wang, X., 587 Wang, X. S., 959 Wang, Y., 962 Wang, Y. A., 380 Wang, Zh., 728 Wansing, H., 321 Ward, A., 533 Ward, K. M., 890 Wareham, J., 717 Warner, D., 659 Wasserman, S., 498, 593 Waterman, M. S., 704 Watson, J. A. F., 892 Watson, J. G., 930 Wavish, P., 356 Weatherford, M., 762 Weaver, W. G., 694 Webb, G. I., 701–702 Wechsler, H. S., 592 Wegener, D. T., 28 Weidensaul, S., 450 Weil, R. L., 892 Weingardt, J. W., 38 Weir, A., 379 Weir, C., 1103 Weis, J. P., 518 Weiss, G., 524, 532-533 Weiss, S., 655 Weiss, Y., 722 Welling, M., 952 Wells, G. L., 38, 73, 95-99, 270, 283, 291-297 Welsh, B. C., 882, 1055 Wentworth, B., 957 Wertheim, K., 956-957

#### 1298

Wooldridge, M., 80, 130, 155, 159, 173, 249, 524, 528-529 Worboys, M. F., 513 Wöβ, W., 513 Wright, A., 742 Wright, D. B., 283 Wright, D., 73 Wright, R. K., 844 Wrightsman, L. S., 283 Wroe, C., 550 Wu, D., 353 Wu, F., 717 Wu, J., 723 Wu, S. F., 706 Wu, Y., 725 Wu., K.-C., 904 Würzbach, N., 346 Wyzga, W., 511

# Х

Xiang, Y., 508, 511, 748 Xiao, Y., 491 Xie, W., 901 Xie, X., 608 Xie, Y., 741 Xin, D., 748 Xodo, D. H., 544, 550 Xu, A., 752 Xu, C., 702 Xu, J., 702 Xu, J. J., 752 Xu, M., 668 Xu, Z., 550

# Y

Yadava, R. D. S., 921-923 Yaeger, H., 18 Yager, R. R., 666 Yamashita, A. B., 983 Yamashita, B., 983 Yan, X., 728, 748 Yang, Y., 678 Yao, D., 723 Yarmey, A. D., 443, 883 Yau, W., 958 Yazdani, M., 383 Ybarra, L. M. R., 244 Yea, B., 917 Yearwood, J., 177-205 Yedidia, J. S., 722 Yener, B., 678 Yim, H. S., 918 Ying, Y., 681

Yinon, J., 921 Yokohama, S., 544 Yokoo, M., 717 Yoo, S. J., 548 Yoon, D.-H., 958 Yoshino, H., 84, 106, 668 Young, A. J., 150 Young, A. W., 150 Young, P., 28 Yovel, J., 301, 305-306, 308, 317, 1106 Yu, F.-R., 700 Yu, P. S., 728 Yuan, L. Y., 538 Yue, J., 526 Yue, Y., 526 Yuille, J. C., 18, 293 Yunhong, W., 700, 962, 1033

# Z

Zabell, S. L., 887 Zabih, R., 722, 725 Zadeh, L. A., 490, 666 Zadok, E., 744 Zahedi, F., 645 Zajdman, A., 332 Zaky, S. G., 960 Zander, M., 841 Zanni, G., 283 Zantinge, D., 484 Zappalà, A., 174, 239, 1044 Zaragoza, M. S., 38, 239, 292 Zarri, G. P., 84, 389–390, 1114 Zeckhauser, R., 720 Zeide, J. S., 1086 Zelen, M., 495 Zeleznikow, J., 5-6, 18, 99-107, 112, 131, 161, 170, 174, 177-205, 221, 244, 252, 378, 479, 484–486, 491–492, 511, 529, 553-559, 566, 595, 602-604 Zeng, D., 511 Zeng, X., 912 Zeng, Y., 657 Zeng, Z., 728 Zhang, D., 961 Zhao, J., <mark>669</mark> Zheng, R., 611, 748 Zhong Ren, P., 513 Zhou, L., 728 Zhou, W., 728 Zhou, X. J., 728 Zhu, F., 728 Zhu, S. C., 728 Zhu, Z., 697

Zier, J., 892 Zigdon, N., 152 Zimmer, R., 105, 1042 Ziv, A., 332 Zualkernan, I. A., 183–184, 186–187, 205 Zuckerman, M., 149 Zuckermann, G., 405 Zukerman, I., 149 Zulueta Cebrián, C., 239 Zurada, J. M., 488

# A

Abducer, 44 Abduction and logic programming, 45 Abductive diagnosers, 846 Abductive framework, 479 Abductive inference process, 46 Abductive reasoning, 40, 44-45, 48, 117, 155, 409, 477-479, 818, 855, 857 ECHO, 47-49 ABDUL/ILANA, 164, 172, 403, 1021 Ability, normative, 249 ABL (A Behavior Language), 401 Abstract model, 569-571, 573-576 Abstract schema, 131 Acceptability of arguments, 161 Accident reconstruction, 104, 890, 935, 937 computer-aided, 890 Account hijacking, 688-689 Accrual of argument, principle of, 148 Accuracy of identification by eyewitness, 264 Acquisition, knowledge, 266, 1084 Action-based Alternating Transition Systems (AATS), 159, 898 Actions, formal theory of, 86, 357 Actuopalynology, 926 Actus reus, 1021 Acyclic graph, 102, 116, 375, 569 AdaBoost, 702 Adaptive resonance theory (ART), 489 Ad hominem argument, 158, 1022 Adjacency matrix, 500-501, 678 Adjudication opinion-forming modelling, 13-39 belief revision, 16-26 considerations and suggestions, 26-28 focus on juries, 36-39 manipulation devices, 28-29 procedures and jurisdictions, 29-31 quantitative models, 31-36

Adjudicative fact-finding, 1022 Administrator privileges, 696 Admissibility and sufficiency of eyewitness evidence, 267 Admissibility of hearsay evidence, 29 ADNET, see Anti-Drug Network ADR, see Alternative dispute resolution Abductive inference, 1021 Adultery, 299-300, 367, 429 Advanced Light Source (ALS), 914 Adversary argument, 1020 Advice network, 499, 504 ADVOKATE project, 266-270 directed graph techniques, 268 discretionary decisions, 268 taxonomies, 270-273 meteorological phenomena, 272 physical hindrances to observation, 271-272 situational factors, 271 Turnbull rules, 263-266 witness compellability, 269-270 Aetiological narrative, 343 Affect-state patterns, 353 AFIS, 951 Agency of Industrial Science and Technology (AIST), 335 Agent beliefs, 1023 Agents, autonomous, 524-536 abilities, 524 ANITA, 525 application of, 525, 534 bidding, 531 blackboard paradigm, 526-528 common internode language, 530 contract net protocol (CNET), 530 control flow inside the blackboard architecture, 527 DARPA, 534

Agents, autonomous (cont.) digital signatures, 524 distributed problem solving, 529 FAIS (FinCEN Artificial Intelligence System), 525 goal assignment, 533 knowledge source activation record (KSAR), 527 matchmaking problem, 533 node abstraction slot, 529 PROLEXS, 529 sensor agents, 525 subplan assignment, 533 task announcement, 530 tools for training police officers, 534-536 CACTUS, 536 ExpertCop, 534-535 pedagogical agent, 534-535 See also Multiagent systems Agent Stories, 342, 384-385 Age-progression software, 868-871, 1023 **APRIL**, 868 Smoking Simulation, 868 wrinkling/aging algorithms, 868-871 Air pollution, 930 AI, see Artificial intelligence (AI) Algebraic sequential averaging model, 33-35 Algorithm modules, SIGHTS text mining, 680 Algorithm of PEIRCE-IGTT, 45 Algorithms for fingerprint matching, 961–962, 967 ALIAS, 45, 1023 ALIBI, 3, 39, 53-57, 59-65, 67, 73, 75-83, 86, 343, 384, 394, 404–406 "afterlife" of the project, 75-79 ALIBI1, 81 ALIBI2, 62-63, 81, 405 ALIBI3, 62, 81, 405 alternative interpretations, 67 AND/OR tree, 65 architecture and control flow, 55 common-sense knowledge, 62 conceptual factors, 69-75 accomplices, 93 dramatis personae, 79–95 idea simplification, 79 knowledge representation, 61-69 operation stages, 56 output examples, 57-61 a planner for exoneration, 53-99 Prolog, 61, 66 self-exoneration, 404-406 semantic analysis, 62

semantic memory, 65 SKILL, 62, 406 stemming, 66 subjectiveness of perception, 63 syntactical analysis, 62 working and structure, 54-57 Alternative dispute resolution, 1023 Ambiguity Ambiguity aversion, 1023 spreading disambiguation, 45 American Academy of Forensic Science (AAFS), 1105 American Board of Forensic Document Examiners (ABFDE), 613 American Society of Questioned Document Examiners (ASQDE), 1105 American Uniform Commercial Code, 307 Amicus curiae, 617, 1014, 1024 AML (Argument Markup Language), 167 Anacapa charting, 510 Analysis, microscopic, 812 Analysts Notebook, 477, 507 Anatomy, 607, 901-905 Anatomia humani corporis, 903 collision detection algorithm, 902 EnVision, 903 forensic examinations of human hair, 613 force actuators, 904 hand grasp posture generation algorithm, 902 MuscleBuilder, 902 Anchored narratives, 325, 327-328, 477, 1024 Anglo-American legal system, 31, 213-216, 221, 240, 250 adversarial system, 413, 415 evidence law, 250 features. 286 Anglo-Saxon jurisdictions, 2, 30 Animation, in medical imaging, 1005 keyframing, 1005–1006 polygon models, 1005 3D studio MAX, 1005 traffic accident reconstruction, 1006 ANITA (Administrative Normative Information Transaction Agents), 525 Announcement, task, 530 Anomalv -based detection of malware, 744 intrusions, 695, 697 strict anomaly detection, 698 Anthropology, forensic, 896–905 ante-mortem skeletal pathology, 897

finite state automata, 901 interval-to-interval relations, 899 predicate/transition nets, 901 tokens, 900 human anatomy tools, 901-904 Anatomia humani corporis, 903 collision detection algorithm, 902 EnVision, 903 force actuators, 904 hand grasp posture generation algorithm, 902 MuscleBuilder, 902 interpretation. 896 non-invasive imaging techniques, 895 palynology, 893 para-mortem trauma, 897 sequencing, 896 sharp-weapon trauma, 897-898 skeletal trauma mapping, 896 taphonomics, 895 Anti-Drug Network, 712-714 capabilities and services, 712 counterdrug consolidated database (CCDB), 712 **MITRE**, 713 Anti-forensics, 1024 Anti-Semitism, 330 Appeal to expert opinion, 1025 Applicant, 1025 Application protocol-based intrusion detection system (APIDS), 709 Approximation order-of-magnitude, 120 APRIL, 868 Aprilage Progression software, 869-871 Åqvist's grading, 117–120 Åqvist model, 126 Araucaria, 167-168, 843, 1025 Arbitration, 1025 Archaeology, forensic, 877, 893-894 Archive/image bombs, 688 ArcIMS, 515 ArcInfo, 515 ArcSDE, 515 ArcView, 515 AREST, 513, 1025 ArguMed, 168, 1025 Argument accrual of argument, principle of, 148 Argumentation, 129, 150, 154-155, 166-172, 174-175, 177-203, 205, 255, 483, 767, 841, 843, 1025 applications of, 195-205

argumentdeveloper, 201 argument tree, 197-198 dialogical argumentation, 195 domestic violence, 199-200 eTourism, 203-205 GetAid System, 202-203 refugee review tribunal, 200 refugee status, 200-202 Split Up system, 195-200 -based negotiation, 161, 257 Bench-Capon's variation of the Toulmin layout, 186-187 dialogue game, 186 presupposition component, 186 benefits, costs, and dangers, 256-260 categories of concepts, 177 computational tools, 258 considerations, 187 cost-benefit analysis, 257-258 DART, 174 defeasible logic, 480 dialectical, 178 dialectical vs. non-dialectical, 179-181 Freeman and Farley model, 184-186 burden of proof, 185 definitional relationships, 185 explanatory warrants, 185 reasoning mechanisms, 185 sign relationship, 185 generic actual argument model (GAMM), 178-179, 187-195 argument template, 187-190 generic argument, 188–189 inference procedure, 188-189 non-dialectical template, 187-188 human inferences, 193 in deceptive communication, 150 Johnson's variation of Toulmin layout, 183-184 axiomatic reasoning, 183 backings, 184 inquiry, 184 medical diagnosis, 183 supporting evidence, 184 legal arguments, four layers of, 168 dialectical. 168 logical, 168 procedural, 168 strategic or heuristic, 168 limitations of, 175 modelling of reasoning, 175 MYCIN, 193 non-dialectical, 178-181, 192, 203

Argumentation (cont.) slate (computer tool), 175-176 Stevie, 176 I-node, 176 S-node, 176 Tools, 166-168 AML (Argument Markup Language), 167 Araucaria, 167–168 ArguMed, 168 Convince Me, 166–167 OuestMap, 167 Reason!Able, 167 Room 5, 168 Toulmin's structure, 181–187 dialectical emphasis, 181 non-dialectical emphasis, 181 ratio decidendi, 183 theory of, 183 Wigmore chart, 130-145, 168, 175, 209, 434, 843, 1121 Argumentative instrumentalism, 259 Argument refutation, 315-316 bias-pluralism, 316 cultural cognition, 316 legal formalism, 317 old syllogistic formalism, 317 relational formalism, 317 rule-breach-remedy, 316 skeletal relevance, 315 Arguments, 129-130 definition, 129 dialogue, 130 systemic, 129 typology, 130 Aristotelian syllogism, 478 Armed threat, 59-61, 81, 405 Arraignment, 1025 Arterial gushing, 974 Artificial emotions, model, 88 Artificial intelligence (AI), 1-2, 5, 7-8, 16, 19, 24, 48, 61, 80, 87, 109–110, 115, 117, 126, 151, 153–155, 171, 178, 207, 268, 333, 335-336, 338, 340, 343, 346, 348, 351-352, 356, 379, 388, 396, 403-405, 419, 428, 437, 478-479, 483-484, 505, 520-521, 524, 529, 541, 545, 547, 568, 596, 638, 652, 698, 701, 722, 743, 754, 758, 844–845, 898, 891, 914, 917, 933, 942, 1026-1028

behaviour specification language, 337

case-based reasoning (CBR), 170, 244-246, 347, 373, 387, 397, 721, 742, 844, 1036–1037 indexing, 245 model-based, 1093 challenges, 339-342 computational narrative processing, 351-356 breadth-first search, 352 marker-passing, 352 conceptual dependencies, 357-358 interpersonal themes, 366-367 knowledge dependency graph, 368 knowledge sources, 365 MOPS (memory organization packages), 361 script, 359 thematic abstraction units (TAUs), 364 explanation patterns (XPs), 375 extended Horn clauses (EHC), 349 lambda abstraction, 376 Artificial intelligence algorithms, 404 Artificial Intelligence and Law, 2, 5, 53, 169.171 Artificial neural networks (ANN), 51, 523, 920 Aspect tree, dynamic (DAT), 899 Association of Forensic Document Examiners (AFDE), 1104 Association rules, 246, 623, 1028 Assumption-based Truth Maintenance System (ATMS), 20, 844, 846 See also Truth maintenance system ASSYST (Applied Sentencing systems), 243 Attack analysis in honeypots, 708 automated monitoring tools, 710 botnets, 709 burglar alarms, 709 classification, 707 fingeprinting tools, 709 fishbowl analogy, 707 high-interaction, 706-707 honeycomb, 709 host-based intrusion detection, 709 low-interaction, 706-707 tarpits, 708 See also Intrusion detection ATT-Meta, 152, 1028 Attorney sensitivity, 293 Attribution, 99, 1028 Auction, 714-740 accumulation fraud, 715 bid shielding, 717 bid shilling, 717

decreasing bid auctions, 714 eBay, 714-718 FADE (fraud and abuse detection engine), 717 fraud by buyers, 718 fraud by sellers, 718 fraudulent bidding, 716 graph mining algorithm, 728 increasing bid auctions, 714 steps in a safe Internet auction, 719-720 Audio and Video-Based Biometric Person Authentication (AVBPA), 1028 Audit. 836-839 Barker, 837 links and hypothesis, 838 links hierarchy, 837 AURANGZEB project, 431 Australasian Legal Information Institute (AustLII), 553 Australasian Society of Forensic Document Examiners (ASFDE), 1105 Authentication, personal, 1097 Authority propagation, 726 Authorship determination, see Handwriting AutoCarto conference, 514 Automated facial expression recognizer, 871 Automated fingerprint identification systems (AFIS), 956 Automated story processing, 378-380 construction-integration model, 380 KERNEL text, 379 Machine learning, 379 parallel distributed processing, 379 plot summarisation, 377 story recognition, 379 See also Interactive story generation Automatic summarisation, 587–598 automatic text abstracting and indexing, 596 FLEXICON, 596 FRUMP, 594 LetSum. 596 Lexical chains, 590 news story categorisation, 588 **REJB**, 597 SALOMON, 588, 595, 597 SOQUIJ, 597 text mining, 587 text tiling algorithm, 590 See also Natural language processing Autonomous agents, 524–536 abilities, 524 ANITA, 525

application of, 525, 533 bidding, 531 blackboard paradigm, 526-528 common internode language, 530 contract net protocol (CNET), 530 control flow inside the blackboard architecture, 527 DARPA, 534 digital signatures, 524 distributed problem solving, 529 FAIS (FinCEN Artificial Intelligence System), 525 goal assignment, 533 knowledge source activation record (KSAR), 527 matchmaking problem, 533 node abstraction slot. 531 PROLEXS, 529 sensor agents, 525 subplan assignment, 533 task announcement, 530 tools for training police officers, 534-536 CACTUS, 536 ExpertCop, 534-535 pedagogical agent, 534-535 See also Multiagent systems Autopsy, see Virtopsy Autoscaling, dimensional, 922 Auxiliary probative policy, 1028 AVERs, 1028-1029

# B

Background generalisations, 21, 1029 Backing, 164-165, 180, 182-184, 186-189, 627,660 Backpropagation backpropagation algorithm, 658 errors backpropagation, 650, 922-923 Back spatter of blood, 974 Backup evidence question, 1029 Backward extrapolation, 929 Backward induction solution, 420, 426 Backward random walk, 929 Bagging method, 523 Bail, 1029 BAILII, 553 Ballistic fingerprinting, 949 Ballistics, forensic, 883, 890, 904, 949 Ballistic theory, 975 Basic Formal Ontology (BFO), 553 BASKETBALL system, 152 Battered wife syndrome, 107 Bayes/Belief Net software, 110

Bayes' theorem, 7, 22, 31, 100-102, 106, 111, 117, 1029-1030 Bayesian and Naive Bayesian approaches in Law, 99–107 Bayesian belief nets, 844 Bayesian conditioning, 19 Bayesian controversy, 109 Bayesian debate, 1030 Bayesian enthusiasts, 7, 111, 1030 Bayesianism, 6-7, 109-111, 115, 118, 127-128, 256, 283, 326, 477, 693, 737, 739–740, 887, 890, 946–947, 1030 Bayesian model, 7, 32-33, 104, 292, 336, 852 Bayesian network (BNs), 49, 52-53, 102, 110, 127, 255, 263, 692-695, 737-739, 809, 852–855, 858, 887, 945, 1030 conditional probability table (CPT), 103 credit card fraud, 102 directed acyclic graph, 49, 102, 263 forensic knowledge, 105 forensic statistics, 105 proponents of, 53 Bayesian probability, 20, 34-36, 107, 112 Bayesian reasoning, 1030 Bayesian theory, 104, 116 Bayesio-skeptics, 7, 256, 1031 Behavioural profiling, 512 Belief-desire-intention (BDI), 155 Beliefs. 149-160 artificial intelligence, 149-152 BASKETBALL system, 152 common knowledge, and consequentialism, 153-154 dispositional beliefs vs. dispositions to believe, 152-153 antecedent, 152 implicit, 153 tacit, 153 impression management, 149 information management, 149 information manipulation theory, 150 nested, 149, 151-153, 422, 520 propagation, 724-725 revision, 16, 23, 26 semantics of lying, 149 suspicion, 149 Walton's approach, 154-160 ad hominem arguments, 158 critical questions, 156–157 evasiveness, 159 examination dialogues, 157 questioning, 157

Belief updating models, 33 Belief vs. commitment, 154 Believability domain, 97 Believable embodied agents, 381, 396 Bench trial, 36, 1031 Beyond a reasonable doubt, 1031–1032 Bias, foil, 294 Bias in neural network momentum and bias, 654 Bid shielding, 717, 1109 shilling, 717 fraudulent bidding, 716 Bifurcation, ridge (in fingerprints), 958 Big Floyd, 510, 1032 Binding shield bidding, 716 shill bidding, 716 Binning, 672 Biological and forensic methods, 269 Biometric fusion, 700 Biometrics, 618, 700, 860, 957-958, 961, 963, 1033 Biostratigraphic services, 928 Bipartite graph, 599, 731, 743 BirdLife International, 451, 470 Bird-sighting, 466-467 Bird taxidermy, 445 Biting, tongue, 284 BitTorrent (BT), 693-694 Blackboard systems, 528-529, 1033 Blog-steganography, 692 Blood pattern analysis, 984, 989 Bloodstain analysis, 841, 973-989 arterial spurting (or gushing), 974 back spatter, 974 blood spatter flight characteristics, 975 expiratory blood, 974 high velocity impact spatter (HVIS), 974 loop viewing, 977 low velocity impact spatter (LVIS), 974 medium velocity impact spatter (MVIS), 974 passive bloodstains, 974 point or area of origin, 978-981 projected bloodstains, 974 software, 977-978 BackTrack, 982–983 Crime Scene Command, 977, 981–983 FORident, 982-983 HemoSpat, 982-983 on scene blood spatter calculator, 977 swipe pattern, 974

transfer/contact bloodstains, 974 upward moving bloodstain, 976 velocity effects on spatter and drops, 983-989 angle of impact (AOI), 989 blood spatter interpretation, 985 characteristics, 987 photography, 985 point of convergence (POC), 988 principles and procedures, 984 velocity impact stains, 974 wipe pattern, 974 Blue ribbon jury, 1034 Bogus burglaries, 483 Bolding-Ekelöf degrees of evidential strength, 117.1034 Boltzmann machine, 724 Bomb, archive/image bombs, 688 Bombay Natural History Society, 448 Boolean algebra, 7 Boosting multi-boosting, 701 multiclass boosting, 702 BORIS, 63, 87, 353, 361, 363-370, 374, 397, 399, 412, 415, 417, 428 Bots. 710 See also Web bots Brain structure, 644 Britain's Natural History Museum, 451, 469-470 British and Irish Legal Information Institute (BAILII), 553 British Geological Survey (BGS), 906 British Museum, 445, 451, 456-457, 470 British Psychological Society, 285 Broadcast News Navigator (BNN), 594 Brokers, higher-risk, 729 BRUTUS, 150, 348, 384, 431 Bullet hole image classification, 701 Bullet time, 913 Burden, evidential, 1034-1035 Burden of proof, 1034-1036 Burglar alarms, 709 Burglary, 479, 802, 820 burglary scene, 803 fingerprint evidence at, 777, 789 investigation of, 802 likelihood of, 621 tool mark, 814

#### С

C++ or Java, 546 CABARET, 169, 529, 1034 CACTUS, 536, 1036 CAD, 1007 Cadaver dogs, 893, 915-916 Calculation-intensive subsurface models, 929 Canadian Legal Information Institute project (CANLII), 553 Carneades, 164-166, 170, 1036 notation, 165-166 proof standards, 165 vs. Toulmin, 164–165 Cartoon, gag, 75–76 Case-based reasoning (CBR), 170, 244-246, 347, 373, 387, 396, 721, 742, 844, 1036-1037 indexing, 247 model-based, 1094 Case disposition, 1037, 1091 CaseMap, 208, 240, 1037 Case preparation, costs and benefits, 249-250 bargaining and game theory, 253-256 non-cooperative bimatrix game, 254 payoff matrix, 254, 255 two-person cooperative games, 254 two-person general-sum game, 254 economic rationality, 249 epistemic paternalism, 250–252 litigation risk analysis, 252-253 Causality, 48, 127, 321, 378, 572, 621 CATCH (Computer Aided Tracking and Characterization of Homicides), 517,859 CATO, 169, 529, 1037 Causal attribution, 478 Causal hypergraph, 848, 853 CDIS, (Counter-drug intelligence system), 755 Centrality, Katz, 499, 721 Centrality, network, 510 Central registration depository, 729 Chaffing and winnowing, 691 Chain of custody, 686 Chain of evidence, 211, 686, 800-801 Character evidence, 1038–1039 Chemical contaminant sources, 931 Child pornography, 511-512 Child testimony, 28 Choice logic, independent, 111, 1079 Choice matrix, Katz, 502 Chromatographic analysis, 885 Chromatography, gas, 885, 916, 920, 923.929 Chronological sequence of events, 805 Ciphertext, 691–692 Claimant, 1039

Classification, 618-621 algorithm ID3, 619 electronic judge, 619 IF-THEN rules, 618 KDD techniques, 619-620 neural networks tools, 619 OVER project, 620 Split Up project, 620 Classification and association rules, 844 Classificatory reasoning, 81 Clear-Best hypotheses, 47 Climatology, 927 CLIME, 555 Close range photogrammetry, 994 Clothing bias, 294 Clustering techniques of legal databases, 621-622 self organising maps (SOM), 621-622 text-mining, 621 Cocain (drug), see Narcotics, Drugs Cocain (project), 728 Code of Criminal Procedure, Italy, 213 Cognitive dissonance, 27, 845, 942 Cognitive performance, noncredible, 150 Cognitive process belief revision, 17 Coherence, 15, 39-41, 51, 167, 660 Collar, Nigel, 451, 470 COLUMBUS model, 343 Combined gas chromatography-isotope ratio mass spectrometry (GCIRMS), 929 Command and Control Data, 783 CommonKADS, 266, 554 Common knowledge, 153–154 Common-sense rules, 328 Communicating sequential processes (CSP), 899 Communication divide in policing, 271 Habermas' theory of communicative action, 173 National Law Enforcement Telecommunications System (NLETS), 536 pragmatics of, 65 supermaxims of, 309 Compatible evidence, 248 Compelling motives, 50 Complexity evidence layer, 570 identification of complex links, 799 operational complexity model (OCM), 694 Complex litigation, 1039–1040 Composites, 1040-1041

Compositional modellers, 846 Compositional modelling, 846, 856 Compression, fingerprint, 1071 Compusketch, 863, 1041 Computational forensics, 879-880, 1041 Computational linguistics, 495 Computational learning theory, 604-605 See also Machine learning Computational models of argument, 161, 169-173, 258, 481 Computational palaeontology, 904 Computational techniques, 4 Computer aided design (CAD), 1007 Computer-assisted dispute resolution, 221, 252, 629 See also Split up Computer crime, 262, 685, 687, 1041 Computer forensics, 520, 685-687, 695, 880, 890 Computer investigation, 1041 Computerised sentencing, 243, 252 Computer Security malware, 708, 710-711, 742-745 anomaly-based detection, 744 densification, 741 detection, 740-747 errors possibility, 744 homophilic machine-file relation, 742, 745-746 network forensics, 741 node potential function, 746 overview of the Polonium technology, 747 PeGaSus, 741 Polonium, 740 randomisation tests, 743 reputation computation, 743 scalability of Polonium, 747 signature-based detection, 744 virus signatures, 744 Computing, forensic, 685, 1072 Concentration, risk of too high data, 240 Concept counting, 594 Concept space analysis, 749 Conceptual dependency theory, 64, 357, 428 Conceptual graphs, 83, 91 Conditional probability, 40, 52, 103, 105–106, 112, 193, 246, 590, 616, 854, 857-858, 1101 Confabulation, 73, 1041 Confirmation bias, 27, 942 Confirmationism, 27, 283, 845, 942-943, 1041 Conflicting evidence, 248

Confrontation right, 1041 Connectionist algorithms, 52 Connectivity criterion, 590 Consistency question, 1041–1042 Constative inscriptions, 568 Constructionism, 89 Consumer preference test, 919 Contaminant chemical, 930-931 retardation, 930 transport in groundwater, 929 Context-free truths. 24 ConTour. 341-342 Contracting, incentive, 79, 90, 93, 529 Contrary-to-duty obligations, 1042 Control question test, 284-285 Conversation disentanglement, 352 Conversion by limitation, 94 Convince Me, 166-167, 1042 COPLINK Criminal Relationship Visualizer, 508, 511, 603, 748-752, 1043 Coplink data indexing, 748–752 concept-space approach, 751 criminal relationship visualisation, 752 data mining, kinds of, 750 WeightingFactor, 750 Coreference resolution, 856 Corpus, 678, 1043 Correlation band-limited phase-only correlation function, 970 eigenvectors, temporal and spatial, 931 phase-only correlation (POC), 967-968 Corroborative evidence, 800, 1043 Costs and benefits, 249-263 argumentation, dangers of, 256-260 bargaining, 253-255 benefits, 256-260 costs, 256–260 digital forensic investigation, 260-263 epistemic paternalism, 250-252 evaluation while case preparation, 249-254 game theory, 253-255 litigating risk analysis, 252-253 Cotton, Ronald, 96 Counter-drug intelligence system (CDIS), 755 Countermeasures, physical, 284 Counter-terrorism analysts, 756 Court of Cassation Italy, 30, 207, 236 CQT, 284 CRD, see Central registration depository Credibility, 115

Credit Act Advisory System (CAAS), 619, 642 Credit card fraud, 102 Crime analysis, 280 Crime emergency ontology event model, 550 Crime Link, 508 Crime scenario modelling, 841-849 abductive diagnosers, 844 Bayesian belief nets, 844 bloodstain analysis, 841 case-based reasoning, 844 classification and association rules, 844 compositional modellers, 846 crime scene examination, 841 crime scene protocols, 841 forensic pathology, 841 model fragments, 846 neural network clustering, 844 resources-for-action, 843 role of crime scene examiner (CSE), 842 survival analysis, 844 Wigmore charts analysis, 843 Crime scene examination, 842 Crime scene examiner (CSE), 842 Crime scene investigation (CSI), 418-427, 690, 841-842, 906, 951 Crime scene protocols, 841 Crime scene reconstruction (CSR), 841 Crime series analysis, 276 Crimes mapping, geographic information systems for, 513-518 ArcIMS, 515 ArcInfo, 515 ArcSDE, 515 AREST, 513 AutoCarto conference, 514 CATCH (Computer Aided Tracking and Characterization of Homicides), 517 DIME (Dual Independent Map Encoding, 515 FLINTS, 513 geo-mapping tools, 513 geosimulation, 516 HITS (Homicide Investigation Tracking System), 517 MapQuest, 515 multi-agent systems (MAS), 516 TIGER (Topologically Integrated Geographic Encoding and Referencing), 515 Crime risk assessment, 513 Crime stain, 772 CRIME-VUs, 862, 864-865, 868, 1044

Crime Workbench, 508 Criminal Evidence Act, 817 Criminal forensic neuropsychology, 150 Criminal intelligence, 8, 176, 275, 280, 496, 506, 511, 741, 748 Criminality, pyramid, 277 Criminal justice information systems, see Justice Information Systems Criminal link analysis, 9 Criminal profiling, see Offender profiling Criminal suspects, 237, 864 Criminal trial, 1043-1044 Criminology agent-based simulation, 743 environmental, 281 forensic psychology and, 621 Cross-border issues of policing, 275 Cross-cultural psychology, 88 Cross entropy, 722-723 Cross-examination, 27, 126, 155, 158, 171, 175, 214, 272, 564, 881, 1044 Crown Prosecution Service, 10, 218, 291, 894 CSI, 418-427, 690, 841-842, 906, 951 CSP, 899 CSR, 841 Cube marching, 1007 CuProS (customization production systems), 537-538 Custodial interrogation, 282 Custodial interrogation of suspects, 282 Custody, chain of, 686 Custody Records System, 824 Customization production systems (CuProS), 537 CyberCafe, 82, 86, 395 Cyber security threats, detection, 536 See also Computer security

## D

Dactyloscopy, 939 See also Fingerprint identification Daedalus, 207–210, 212–243, 248, 1044 advantage of, 209, 238 argumentation structure, 239 battery of validation checks, 222 Bindi extortion case, 222 case history, 229 circumstantial evidence, 232 citazione a giudizio, 222 crime table, 222, 226 cultural prosthesis, 231 embedded validation, 238 general annulment, 215

General data table, 226 inquiry criteria, 218-221 inquiry in Italy, 215-218 appeal, 215 debate in court, 215 preliminary inquiry, 215 Italian Procedural Law, 212-215 jurisdiction effects, 236-237 Laboratory, 228-229, 235 pattern for extortion, 229, 231 person window, 232 plea bargaining, 221 plea bargaining table, 225 pop-up, 227 project's background, 212-213 self-composition, 230 start menu, 223 storehouse, 232 strategic communication, 239 subjects window, 226 supplementary data, 225 suspect's record, 227 text formatting, 229 DAG, see Directed acyclic graph Dalal's principle, 26 Damning, 75-76, 135, 160, 286, 406, 446, 463, 883 Damping factor, 503 DART. 174. 1044 Database nested relations, 761 of emails, 487, 677-679, 892 of fingerprints, 956, 959, 968 relational, 512, 517, 537-538, 540, 546, 569, 676-677, 755-756, 761, 927 Database merging, 17 Data encapsulation, 688 Data fusion, 17, 487 See also Database, Database merging Data handling, 536-587 data warehousing, 536 financial fraud ontology, 566-587 CONSOB, 567, 572, 580, 586 evaluation of the abstract model, 573 FF POIROT, 567-569 generalizations, 571 inferences, 572 investment scam online, 573-575 online fraud detection, 579 posteriori fraud detection, 579 unified modeling language (UML), 584-586 user requirements analysis, 576

VAT@. 567 legal ontologies, 553-559 benefits. 554 CLIME, 555 CommonKADS, 554 e-COURT, 555 FF-POIROT, 557-558 KDE, 556 MARPOL, 556 **MILE, 555** POWER program, 555 RDF-mapped Semantic Web resource, 557 Ontologies, 544-552 C++ or Java, 546 crime emergency ontology event model, 550 data mining, 544 domain ontology, 546 financial fraud ontology, 550 The mosquito anatomy morphology, 552 ontology engineering, 546 **OWL**. 546 partitioned semantic networks, 545 philosophical ontology, 545 Prolog or Lisp, 546 semantic networks, 544-545 SIMPLE, 547 SQL3, 546 upper ontologies, 546 WordNet, 547 XML, 537-539 CuProS (customization production systems), 537 document type definition, (DTD), 539 nested universal relation model, 538 RAFFAELLO, 537 Data inconsistency, 628-637 cell-based algorithm, 628 contradictory data, 633-634 incomplete knowledge, 634 local stare decisis, 634 sample, 634 sampling error, 634 dealing with, 636 index-based algorithm, 630 judicial error, 630 nested-loop algorithm, 630 new legislation or precedents, 635 noise, 628 outlier detection deviation-based, 630

distance-based. 630 statistical-based, 629 reasons. 628 See also Outlier Data mining, 9, 100, 106, 154, 179, 195, 200, 205, 240, 246, 274, 277, 390, 483-493, 506-507, 511-513, 516, 519-524, 534-537, 544, 547, 550-552, 583, 598-600, 602, 606, 611, 619-621, 623, 625-628, 630, 632, 638, 663-664, 667-668, 671-673, 675-676, 679, 682-685, 697-698, 701-702, 710, 713, 717, 720-722, 728, 737-738, 740-742, 744, 748-754, 759-760, 762-763, 844, 892-893, 916 algorithm, 627, 632 application, 486, 491 bagging, 491 behavioural profiles, 491 classification trees, 490 clustering analysis, 490 data preparation, 489 data warehousing, 489 decision trees, 489 feature extraction, 492 goals for financial institution, 519 graph mining, 728 link analysis, 486 machine learning, 491 multiagent technology, 492 multivariate image mining, 548 NETMAP, 486-487 offender profiling, 493 in policing, 274, 277 pattern recognition, 488 performance of, 632 precrime, 512 predictive, 484 recursive, 682-685 advantages, 684 algorithm, 683-684 author identification, 682 InFilter, 682 intrusion detection, 682 masquerade detection, 682 mimicking, 682 processing stages, 684 spoofed internet protocol (IP), 682 spoofing, 682 segmentation, 484 self-organising maps, 489 statistical modelling, 488

Data inconsistency (cont.) statistical prediction, 488 summarisation, 485 See also Summarisation, automatic Data storage, in medical imaging, 1002 Data warehousing, 487, 536 DAT, see Dynamic aspect tree (DAT) Dead Bodies project, 841, 844-845, 1044 Deception detection, 18 indicators of lying, 283 Decision-support systems, 5 architecture, 846 Decision trees, 100, 202, 253, 490-492, 606, 639-640, 642, 1044-1045 Decision tree software, see TreeAge Pro Deductibility theorem, 313 Deep Read, 378 Defamation Act, 417 Defeasibility, 1045 Defeasible reasoning, theory, 148 Defeater, node, 147 Defence hypotheses, 39, 51 Defendant, 1045 Deformation, elastic (in fingerprints), 960 Delta function, Kronecker, 970, 971 Dempster-Shafer theory, 18, 20, 22-23, 103, 112, 1045 DENEG algorithm, 934 Densification of malware, 741 Dental radiology, in medical imaging, 1009 Dental reconstruction, in medical imaging, 1004 Dentistry orthopantomograms, 1002, 1009 Deontic connotations, 54 Deontic logic, 1046 Deontology, 1045 Dependency networks, relational, 727 Depository central registration, 729 Dermal ridges, 949 Desiderata, 27 Detecting Association Rules, 623-625 hypotheses, 624 KDD techniques, 623-625 visualisation, 624 Detection, 518-524 CRISP-DM data mining, 519 digital anti-forensics, 520 intelligence-led policing, 518 link analysis, 519 modus operandi (MO), 519 outlier detection tools, 519

tools vulnerability, 520 WizRule, 521 WizSoft, 521 Detection of malware, 740-747 Detectors, lie, 285-286 DGPS, 912 Diagnostic reasoning, 118 Differential emotion theory, 88 Digital anti-forensics, 1046 Digital divide in policing, 275 Digital forensic investigations, costs and benefits of, 260-263 cost-benefit ratio (CBR), 261 digital metaforensics, 260 return-on-investment (ROI), 260 Digital forensics, 263, 685-687, 692-695, 872, 880, 889, 1046 and Bayesian networks, 692-695 GOMS-KLM model, 694 operational complexity model (OCM), 694 posterior probability, 694 Digital forgeries, 871, 1046 Digital metaforensics, 260, 889 Digital Steganography, see Steganography Dijkstra algorithm, 508 Dilution olfactometerics, dynamic, 918 DIME, 515 Directed acyclic graph, 728 Disabling logs, 688 Disambiguation spreading disambiguation, 45 Discourse coherence, 352 Discovery, knowledge, 485, 554, 618, 628, 658, 1084 Discretion, 1046–1047 judicial, 194, 246-249 prosecutorial, 246-249 Discretionality, 194 Discretionary, 1047-1049 Discriminant function analysis, 949 Disposition, 1048 evidence of, 1056-1057 Dissonance, cognitive, 27, 845, 942 Distraction burglaries, see Bogus official burglaries Distributed situation space (DSS) model, 380 Divorce Court, 299 DNA database, 536, 773

evidence, 109, 409, 772-773, 778, 780, 786, 789, 814, 825, 858, 863, 887, 889, 943, 945-948, 953-954, 1048 fingerprinting, 943, 945, 951, 1071 index system, combined, 945 low copy number DNA, 786-787 markers, 810 mixtures, 945 profile, 775, 947 profiling, 269, 775-787, 809, 887, 944-945, 947, 973 swabbing, 785, 802, 812 testing, 297, 945 typing, 945 Dock identification, 1048-1049 Doctrine of chances, 1049–1052 Document Examiners, National Association of. 1105 Document type definition, (DTD), 539 Dogs, cadaver, 893, 915 Domain name service (DNS), 695 Domain ontology, 546 Domestic violence, 196-200, 635-636 Double-counting the evidence, 1052–1053 Doxastically simple, 421 Doxastic attitude, 1053 Doxastic logic, 251, 1053-1054 Dramatis personae, 90 DTD, 539 Dynamic aspect tree (DAT), 899 Dynamic dilution olfactometers, 918 Dynamic uncertain inference, 1054

# Е

Ease-of-fabrication, 99 eBay, 714-717 ECHO, 15, 39-53, 660, 1054 abductive reasoning, 47-49 greedy algorithm, 43-44 neural computing, 40 PEIRCE-IGTT, 44-47 technical aspects, 40 Thagard's neural network algorithm, 41-43 Thagard's principles of explanatory coherence, 40-41 von Bülow trials, 49-51 EChronicle Systems, 389–393 Economic rationality, 30, 250, 301 e-COURT. 555 EDS Project, 752-754 classification algorithms, 753 data balancing, 753 data mining, 754

splits, 753 Efforts duplication in policing, 278 Eigenvalues, 501 Eigenvectors, temporal and spatial correlation, 931 E-Justice, 207-208 Elastic deformation in fingerprints, 960 e-Learning management, 551 Electrical resistivity method, 911 Electrogustometer, 918 Electronic aroma detection (EAD), 918 Electronic commerce (E-commerce), 550 Electronic judge, 486, 619 See also Traffic accident disputes Electronic nose, 916–924 computing system, 920 detection system, 920 fast gas chromatography (FGC), 923 gas chromatography, 916 sample delivery system, 920 trace vapour detection, 921 vapour concentration, 921 Electronic Privacy Information Center (EPIC), 240 Electronic sensing (e-sensing), 917 Electronic tongues, 923-924 Electrostatic lifting devices, 802 Elvis taxa. 448 Email mining, 675-677, 685 email mining toolkit (EMT), 676 Enron email database, 677-679 framework for. 676 link and network monitoring, 676 rolling histogram, 676 temporal mining, 676 EMBRACE, 248, 662, 1054 Emotion transactional theories of, 89 vitality affects, 89 Encapsulation, data, 688 Engineering, forensic, 935–937 failure analysis, 937 fractography, 937 structural risk evaluation, 937 Enron email database, 677-679 Entanglement, 1054 Entomology, forensic, 884-885 Entrapment, 282, 1054 Entropy cross entropy, 724-725 Enumerative induction, 48 Environmental criminology, 281 Environmental damage assessment, 890

Environmental forensics, 928–935

air pollution, 930 backward extrapolation, 929 backward random walk, 929 calculation-intensive subsurface models, 929 chemical contaminant sources, 931 combined gas chromatography-isotope ratio mass spectrometry (GCIRMS), 929 DENEG algorithm, 934 exploratory data analysis, 932 hindcasting, 929 multiple linear regression, 931 polytopic vector analysis (PVA), 933-934 receptor modeling problem, 933 SAFER method, 933 self-training receptor modeling, 933 target transformation factor analysis (TTFA), 934 temporal and spatial correlation eigenvectors, 931 Environmental palynology, 924 EnVision, 903 EPIC, Electronic Privacy Information Center, 240 Episodic formulae, 81, 343, 428-476, 877-878 application Cardiff Giant case, 429 WaterTime project, 430 stuffed birds forensic testing, 444-476 notation of, 435-444 ability, permissibility, and agency, 439 agent symbol for, 437 belief, 437, 440 binary infix operators, 437 characters' goals, 438 crumpled relations, 437, 439 dread, 442 hope, dread, despair, relief, 441 kinds of giving testimony, 443 logical operators, 436 mathematical notation, 435 perception, 442 realisation, 441 set theory, 436 standard operators, 435 stit operator, 439 symbols, 438 temporal relations, 435-436 representation method, 428-435 Cardiff Giant case, 430 computational representation, 428 event calculus, 433 feveroles case, 430

privatisation and graft, 430 bird taxidermy, 445 bird-sighting, 467 Elvis taxa, 448 forest spotted owlet, 450, 462 Meinertzhagen bird collection controversy, 451-452 Epistemic paternalism, 250-251, 300, 1049 E-Policing, 273 See also Policing Error backpropagation, 922–923 Errors of labels, interpretation, 447 Errors possibility, malware, 744 E-sensing, 917 Esuli's MiPai algorithm, 861 Ethnoreligious identity, 331 See also Badge, Jewish eTourism, 203-205 agent-oriented approach, 203 generic argument, 206 generic argument tree, 203 negotiation, 203 European Court of Human Rights, 288, 880 European Pollen Database (EPD), 927 Evidence -based crime prevention, 1055 discourse, 1055 of disposition, 1056 free judicial evaluation, 289 law of, 1055 layer, complexity, 571 of opinion, 1057, 1063 theory of, 1057 theory of juridical, 1055 Evidential burden, 1057 See also Burdens of proof Evidential computing, 685, 1057 Evidential damage doctrine, 1057-1058 Evidentialism, 251, 1058 Evidential reasoning, 1059 Evidential strength, 1059 Bolding-Ekelöf degrees of, 117, 1034 Evidentiary value model, 210, 212 See also Lund procedure EvoFIT, 864-868, 1053 Examination in chief, 1059-1061 Excavations forensic, 909 trial-and-error, 906 Exchange principle, 1061 Exclusionary principle, 1061 Exclusionary rules, 136, 212, 252, 299-300, 1061-1062

Expected action, 423 ExpertCop, 11, 534-535, 1067 Expert evidence, 1062 Expertise question, 1067 Expert opinion, appeal to, 1062-1063 Expert witness, 109, 171, 522, 602, 881-892, 928, 935, 1063–1067, 1081–1082 on-line directory of expert witnesses, 602 linguist's role, 618 reliance on. 881 role of, 894 Explanation-generation techniques, 109 Explanationism, 110 Exploratory data analysis, 932 Explosives Detector, 921 External feature blurring, 866 Extraction tool, ontology, 586 Extrapolation, backward, 829 Extrinsic policy, 1067–1068 Eyewitness identification, 38, 95, 263-265, 270, 273, 283, 293, 295-297, 882-883 psychology, 415 reliability of suspects, 283 testimony, 50, 266, 270, 273, 415, 611, 859, 1068 reliability of, 267, 270, 283

# F

FacePrints, 860, 864, 1068 Face processing, 858-879 age-progression software, 868-871 **APRIL**, 868 Smoking Simulation, 868 wrinkling/aging algorithms, 868-871 computer tools, 858-859 Face Recognition by Similarity (FRBS), 859 facial expression recognition, 871 facial reconstruction from skeletal remains. 874-877 categories, 875 computer-graphic techniques, 875 identification tools, 859-868 CRIME-VUs and EvoFIT Projects, 864 external feature blurring, 866 FacePrints, 860, 864 face reconstructing from verbal descriptions, 861 holistic-CI, 866 holistic tools, 866 identity kit, 862 ImageFinder interface, 860

mug shots. 860 Photofit. 862 portrait robot informatisé, 860 prefix-permutation indexing, 861 image forensics, 871-874 socio-cultural factors, 877-879 Face Recognition by Similarity (FRBS), 859 Face reconstructing from verbal descriptions, 861 Facial expressions, 335, 394-395, 859, 871, 1006 Facial reconstruction, 874-875, 877, 1068 Facial resemblance, 452 Fact-driven models, 32-33 Factfinders, 18, 29, 36, 144, 174, 215, 249, 412, 415, 1068 Fact-finding errors, 31 Facticity, 1068 Factor analysis, target transformation, 934 Factorial taxonomy, 98 Fact pattern analysis, 246 Fact positivism, 1068 Factual truth, 1068 See also Truth Factum probandum, 1069 Factum probans, 1069 FADE, see Fraud and abuse detection engine Failure analysis, 937 Fair trial, characteristic, 249 FAIS (FinCEN Artificial Intelligence System), 525 Faked kidnapping, 425–426 False confessions, 281 False confessions of suspects, 281 False positive, 1069–1070 Falsificationism, 27, 943 Fast gas chromatography (FGC), 923 Feedback loop, 784 Feed forward networks, 645-649 Feigned cognitive impairment, 150 FF-POIROT, 557-558 FGC, 923 FIDEL GASTRO, 539 Fido Explosives Detector, 921 Field portable X-ray fluorescence (FPXRF) spectrometry, 905 Field question, 1070 File system, new technology, 688 Fillers, 292, 296 Filters Gabor filter, 960–962 low-pass filter, 971 summarisation filter, 487

1316

Financial fraud ontology, 550, 557-559, 566-578, 914, 955 FinCEN (Financial Crimes Enforcement Network), 511, 1070 Fingeprinting in honeypots, 809 Fingerprinting ballistic, 949 genetic, 945 soil fingerprinting, 908, 948 Fingerprints, 1070-1071 computational techniques, 957-964 algorithm for fingerprint matching, 961 automatic fingerprint identification, 959 automatic detection of facial landmarks. 961 convolution theorem, 960 elastic deformation, 960 fingerprint matching algorithm, 959 fingerprint verification competitions (FVC), 959 fusion code, 961 Gabor filters, 960 graph matching, 960 iterative closest point algorithm (ICP), 963 Match-on-Card (MoC) technology, 963 minutiae-based matching algorithms, 961 mosaicking, 963 personal authentication systems, 958 phase-only correlation, 961 ridge bifurcation, 958 ridge ending, 958 support vector machine (SVM) algorithm, 959 tree matching, 960 compression, 1071 from dead bodies, 952-957 automated fingerprint identification systems (AFIS), 956 latent print examiners (LPEs), 956 latent print individualization, 956-957 uniqueness claim, 955 global, 919-920 identification, 949, 1071 inquiry, 954-955 palmprints, 1097 matching, 952, 955, 957, 958-963, 970-971 matching algorithm, 959, 961-964, 1071 recognition, 1071 scanning, 1071 sensors, 1071

verification, 1071-1072 See also Individual identification Finger-tip searches, 906 Firearm databases, 536 Firewalls, 699 Fiscal fraud detection criteria. 764-765 objective functions, 764 rule-based classification, 765 sample selection bias, 763 Fishbowl analogy of Honeypots, 707 Flexnotes, see Headnotes FLINTS 2. 815-819 command and control, 815 desktop environment, 519 enhanced features, 814 functions, 814 geographical analysis, 814 actioning forensic matches, 814 advanced mapping software, 814 tailor made system, 814 toolbar. 819 FLINTS (Force Linked Intelligence System), 8, 209, 511-512, 767-769, 771, 778-785, 787-791, 793-802, 810, 813-819, 821-826, 828, 830, 834-836, 839, 1072 audit trails, 836-839 Barker, 837 links and hypothesis, 838 links hierarchy, 837 expansion to police areas, 783-785 benefits, 784 feedback loop, 784 incident handling, 783 first generation, 780-781 footwear marks, 804 geographical analysis, 824-826 graphical results, 821-824 DNA match, 823 evidence checking, 822 validity of links, 823 hot spot searches, 833-834 results based on incidents, 834 search function, 834 integration, linking and analysis tools, 781-783 intellectual foundations, 800-801 burglary scene, 803 chain of evidence, 800-801 chronological sequence of events, 805 micro-level analysis of events, 801 multiple-case analysis, 801

link detection, 778-780 fingerprint, 778 footwear impressions, 778 tool mark, 778 neo-Wigmorean approach, 802 performance monitoring, 785–787 DNA Low Copy Number (DNA LCN), 786 DNA profiling, 786 DNA swabbing, 785 evidence generation, 785 fingerprint collection, 785 Low Copy Number DNA, 786-787 substance-blind evidence, 785 prolific offenders, 828-833 crime results and suspects photograph, 833 graphical depiction, 832 offence types, 829 operational command units (OCUs), 828 query definition dialog box, 829 search, 827-828 systemising the identification, 774-778 DNA database, 775 DNA profile, 775 indicators of identity, 774 multidimensional identification index. 774,776 persistent offenders, 774 tattoo, 777 virtual persons record, 775 virtual suspect, 775, 777 temporal analysis, 826-827 unknown offenders, 773-774 DNA evidence, 773 virtual offender, 773 use, 787-799 additional links, 798 analysis of evidence, 795 clustering events, 790 conclusion generation, 795 confirmed and rejected links, 791 fingerprint evidence, 797 forensic links, 792 identification of complex links, 799 identification of illegal drugs market, 796 intelligence picture, 799 linking of suspect and evidence, 797 pattern of incidents, 791 potential links, 791 sample performance reports, 793

vehicle searching, 735-736 options, 834 results. 836 vehicle search dialog box, 835 volume crimes and suspects, 785 Fluid dynamics, computational, 895 Foil bias, 292 Foligno, 25 Food processing, 539 See also FIDEL GASTRO Foot tensing, 284 Footwear evidence, 890-891 impressions, 778 marks, 804 Force Linked Intelligence System, see FLINTS (Force Linked Intelligence System) Forensic anthropology, 893-904 ante-mortem skeletal pathology, 897 finite state automata, 901 interval-to-interval relations. 899 predicate/transition nets, 901 tokens, 902 human anatomy tools, 901-905 Anatomia humani corporis, 903 collision detection algorithm, 902 EnVision, 902 force actuators, 904 hand grasp posture generation algorithm, 902 MuscleBuilder, 902 interpretation, 896 non-invasive imaging techniques, 895 palynology, 893 para-mortem trauma, 897 sequencing, 896 sharp-weapon trauma, 898 skeletal trauma mapping, 896 taphonomics, 895-896 Forensic archaeology, 877, 893-894 Forensic ballistics, 883, 890, 904, 949 Forensic computing, 684, 687, 1072 Forensic copy, 686 Forensic dentistry, 885 Forensic disciplines, 890-893 computational fluid dynamics, 892 computer-aided accident reconstruction, 890 environmental damage assessment, 890 footwear evidence, 890-891 forensic accounting, 890 Forensic engineering, 935–937 failure analysis, 937

Forensic engineering (cont.) fractography, 937 structural risk evaluation, 937 Forensic entomology, 884-885 Forensic examination, 262-263, 471, 694, 956 of human hair. 613 Forensic Expertise Profiling Laboratory, 613 Forensic geology, 905–908 differential global positioning systems (DGPS), 912 earth resistivity, 910 electrical resistivity method, 911 electromagnetic methods, 912 features, 911 forensic excavations, 909 geological maps, 906 geological profile, 908 Geomorphological observations, 907 gravity method, 911 ground-penetrating radar (GPR), 910, 912 induced polarisation method, 911-912 magnetic method, 911 magnetometry, 910 metal detector methods, 912 physical properties, 908 self-potential method, 912 soil fingerprinting, 908 SoilFit project, 908 time slicing, 910 topsoil magnetic susceptibility, 910 Forensic geoscientists, 906 Forensic laboratory, 261 Forensic-Led Intelligence System (FLINTS), 767 See also FLINTS Forensic linguistics, 618 Forensic matches, 780 Forensic odontology, 885 Forensic palynology, 924-928 actuopalynology, 926 biostratigraphic services, 928 environmental palynology, 926 NAPDToSpread, 928 palaeoecological pollen, 925 Palynodata Table Maker 1.0, 928 PARADOX software, 928 PAZ Software, 928 pollen data search engine, 928 stratigraphic palynology, 926 Webmapper, 928 Web tools, 927–928 Forensic pathology, 841, 884-885 Forensic pedology, 512

Forensic psychology, 149, 621, 880-883, 890 Forensic rhetoric, 335 Forensics, 685-689 account hijacking, 688 anti-forensic activities, 688 Archive/image bombs, 688 chain of custody, 686 chain of evidence, 686 computational, 879-880, 1041 computer crime, 685 data encapsulation, 688 disabling logs, 688 evidential computing, 685 forensic computing, 685 forensic copy, 686 hash value, 686 MACE alterations, 688 removing/wiping files, 688 traitor tracing, 689 Forensic sciences, 1072 See also DNA; Forensic disciplines Forensic Science Service (FSS), 786, 891 Forensic test, 2, 431, 451, 470, 472, 1072 Forest spotted owlet, 448-450, 462 ForEx, see Forensic examination Forged trademarks, 737 Forgeries in handwritten petitions, 617 Formal theory of actions, 86, 357 Forming an opinion in judicial factfinding, 13 - 39belief revision, 16-26 considerations and suggestions, 26-28 focus on juries, 36-39 manipulation devices, 28-29 procedures and jurisdictions, 29-31 quantitative models, 31-36 Forrester paradox, 1042 Forward chaining, 845 FPXRF, Field portable X-ray fluorescence spectrometry, 905 Fractography, 937 Fraud, 714-739 accumulation fraud, 715 bid shielding, 717 bid shilling, 717 by buyers, 718 credit card, 102 criteria, 764–762 decreasing bid auctions, 714 eBay, 715-717 FADE (fraud and abuse detection engine), 717 financial fraud ontology, 755

Fraud and abuse detection engine, 717 Fraud detection algorithm, 730 Fraudulent actions, temporal awareness, 578 fraudulent bidding, 716 graph mining algorithm, 728 increasing bid auctions, 714 information extraction (IE), 755 investment and securities, 578 NLToolset, 756 objective functions, 764 Ornithological fraud, 449 rule-based classification, 765 sample selection bias, 763 by sellers, 717 VAT fraud, 578, 581-583, 765 See also Fiscal fraud detection Fraudulent bidding, 716 shielding, bid, 717 FRBS, Face Recognition by Similarity, 859 Free proof, 1072 FSS, Forensic Science Service, 786, 891 FUELCON, 669-671 Fuel laundering scam, 758-759, 761 Full-page taxonomy, 98 Fusion biometric fusion, 700 Fuzzy logic, 104, 193, 497, 582-583, 666-668, 920 better tolerance, 667 data classification, 667 indirect contribution to data mining, 667 knowledge discovery, 667 knowledge granulation, 667 Fuzzy sets, 104, 106, 490, 497, 666-667, 858

## G

GAAM, see Generic Actual Argument Model Gag cartoon, 75-76 GALLURA project, 405 Galton details in fingerprints, 951 Game Master (GM) paradigm, 388 Game-theory, 171, 288, 420 Game tree, 254 Gas chromatography, 885, 916, 920, 923, 929 soil gas surveying, 915–916 Gastronomy, 539 See also FIDEL GASTRO GCIRMS, 929 Gender test, 810 Generalisations, 1072-1073 common-sense, 21

Generalised delta learning rule, 650 Generic Actual Argument Model (GAMM), 178-179, 181, 187-195, 201, 205 argument template, 187-190 generic argument, 188–189 inference procedure, 188-189 non-dialectical template, 187-188 Generic argument, 178-179, 188-195, 197, 199, 202-205 representation of, 190 Genetic algorithm (GA), 488, 536, 668-671, 673-675, 678, 724, 864, 866, 961 data transformation, 671-672 evolutionary algorithms, 668 FUELCON, 669-671 k-NN algorithm, 674 MacroGA. 669 nearest neighbours approaches, 674 NetProble, 724 ring or line topology, 669 Genetic fingerprinting, 945 Genetic testing, 945 Gentzen sequent calculi, 318 Geoforensics, see Forensic geology Geographic Information System (GIS), 281, 513-518, 534-535, 621, 906 Geographic information systems for mapping crime, 512-518 ArcIMS, 515 ArcInfo, 515 ArcSDE, 515 AREST, 513 AutoCarto conference, 514 CATCH (Computer Aided Tracking and Characterization of Homicides), 517 DIME (Dual Independent Map Encoding, 515 FLINTS, 513 geo-mapping tools, 513 geosimulation, 516 HITS (Homicide Investigation Tracking System), 517 MapQuest, 515 multi-agent systems (MAS), 516 TIGER (Topologically Integrated Geographic Encoding and Referencing), 515 Geohazards, investigation of, 906 Geoinformatics or geomatics, 1073 Geology, forensic, 905–913 differential global positioning systems (DGPS), 912

Gunshot to the head, 1004

Gushing, arterial, 974

# H

Habermas' theory of communicative action, 173 Hair forensic examinations, 613 Handwriting, 611-617 ASTM Standard E2290-03, 613 CEDAR-FOX, 616 forensic linguistics, 617 forensic stylistics, 614, 617 identification, 613, 617, 1073 testimony, 613 forgeries in handwritten petitions, 617 principle, 612 stylometric analysis, 611 Video Spectral Comparator (VSC), 612 writeprint characteristics, 611 Hash value, 686 Headnotes, 606 Hearsay, 300, 1073-1076 Hearsay rule, 30, 301, 862 Hearsay testimony, 216 Henry classification system, 950 Hidden Markov Models (HMM), 378, 703 Hidden nodes, 41, 644, 650-651 Hierarchy of goals, 164 Hierarchy (tree) of beliefs, 163 Higher-risk brokers (HRB), 729 Hijacking, account, 688 Hindcasting, 929 HITS, 517, 726 HMM, 378, 704 Holistic-CI, 766 Holistic tools, 866 Home Office Large Major Enquiry System (HOLMES 2), 477 Homicide Monster of Foligno-serial killer, 25 HITS (Homicide Investigation Tracking System), 517 Homiletics, 340 Homophilic machine-file relation, malware, 742, 745–746 Homunculus problem, 376 Honeycomb, 709 Host-based intrusion detection, 698 Hostnames, 695 Hot-tubbing, 1076-1077, 1082 HUGIN, 110, 1077 Human faces processing, see Face processing

Geology, forensic (cont.) earth resistivity, 910 electrical resistivity method, 911 electromagnetic methods, 912 features, 911 forensic excavations, 909 geological maps, 906 geological profile, 908 Geomorphological observations, 907 gravity method, 911 ground-penetrating radar (GPR), 910.912 induced polarisation method, 911-912 magnetic method, 911 magnetometry, 910 metal detector methods, 912 physical properties, 908 self-potential method, 912 soil fingerprinting, 908 SoilFit project, 908 time slicing, 910 topsoil magnetic susceptibility, 910 Geo-mapping tools, 513 Geosimulation, 516 GetAid, 202-203 GIS, 281, 513-518, 534-535, 621, 906 GKT, 285 Global fingerprint, 919–920 Global narrative agency, 386 Goal-trees (goal hierarchies), 164 Golden triangle, 860 GOMS-KLM model, 694 Google, 502, 726 Grading mechanisms, 121-124 Grammars, graph-rewriting, 83 Granularity, 899 Graph acyclic graph, 102, 116, 375, 569 conceptual graph, 83 inference-graph, 146 Laplacian graph, 599 Graph matching for fingerprints, 960 Graph mining, 728 Graph mining algorithm, 728 Graphometrics, 941 Graph-rewriting grammars, 83 Graph theoretical and spectral analysis, 678 Graph theory, 65, 253, 494, 497 Greedy algorithms, 43, 51–52 Guerrilla war, 432 Guessing, 47 Guilty knowledge test (GKT), 285 Guilty plea, 1073

Hybrid matching algorithm, 961 Hypergraph grammar, 83 HYPO, 169, 529, 1077 Hypothesis Hypothesis formation, 472

# I

IBIS, 167, 1077 ICL, 112, 1079 ICP, 65 **ICVS. 342** ID3 algorithm, 606, 642 Identification eyewitness, 38, 95, 263-265, 270, 273, 283, 293, 295-297, 882-883 radio-frequency tags, 539 statistics of, 8 steps, 962-963 fingerprint, 949-950, 1071 of potential suspects, 810 See also Individual identification; Identity parade Identikit, 861-863, 1077 Identity parade, 8, 290-297, 1077, 1086 diagnostic value, 292 facial composites, 290 innocents, called foils or look-alikes, 290 lineup instruction bias, 294 mistaken identification, 296 multiple-witness identifications, 293 suggestive eyewitness identification procedures, 295 video identification parade electronic recording (VIPER), 291 See also Lineup ID parade disc, 290 IDS, 388 IDtension project, 341, 385 IEC, 756 IFS. 1078 IF-THEN rule, 618 ImageFinder interface, 860 Image forensics, 871-874, 1078 Image fusion, in medical imaging, 1007 Image mining multivariate image mining, 548 Images, light probe, 872-873 Imaging 3D imaging, 1003-1005 multifluorescence, 548-549 IMP, 29, 80, 384, 403 Impressions, footwear, 778 Imputation, 1078

#### IMT, <mark>18</mark>

Incentive contracting, 79, 90, 93, 529 Incident handling, 7 Inclusionary principle, 1079 Inconsistency, data, 628-637 cell-based algorithm, 630 contradictory data, 633-634 incomplete knowledge, 634 local stare decisis, 634 sample, 634 sampling error, 634 dealing with, 636 index-based algorithm, 630 judicial error, 630 nested-loop algorithm, 630 new legislation or precedents, 635 noise, 628 outlier detection deviation-based, 630 distance-based, 630 statistical-based, 629 reasons, 628 Independent Choice Logic (ICL), 111, 1079 Indexing, knowledge, 375 Indicators of lying, 283 Indispensability criterion, 590 Individual identification, 937-971 confirmationism, 942 dactyloscopy, 939 DNA, 937-972 DNA mixtures, 945 DNA profile evidence, 947 genetic fingerprinting, 945 genetic testing, 945 legal reasoning, 944 maternal imagination theory, 944 paternity claims, 943 PATER software, 944 reference-class problem, 946 falsificationism, 943 Fingerprints, 948-972 assessment problem, 952 ballistic fingerprinting, 949 band-limited phase-only correlation function, 970 computational techniques, 957-964 database (IAFIS), 951 examination of, 951 fingerprints from dead bodies, 952-957 Galton details, 951 Henry classification system, 950 identification steps, 948-949 inverse discrete Fourier transform, 969

Individual identification (cont.) Kronecker delta function, 970-971 live-scan. 950 normalised cross-phase spectrum, 969 phase-only correlation (POC), 967-968 scanning Kelvin probe (SKP), 951 Tohoku algorithm, 967 graphometrics, 941 history of, 937 Purkinje cells, 939 Indo-European invasion of Europe (supposed), 340 Induced polarisation method, 911-912 Induction, 637-643 algorithm, 619, 627, 639-640, 642-643, 673 benefits of. 639 data mining techniques, 638 decision tree, 639 difficulties, 639 enumerative, 48 examples, 642 inductive reasoning, 637, 1079 pattern interestingness, 638 Inference, 31, 47-49, 115, 127, 146-147, 165, 167, 188–189, 200–202, 336, 801, 850, 944, 1079 Inference engine, 1079 Inference-graph, 25-26, 146-149 defeat-links diagram, 147 inference/defeat loops, 147 support-links, 146 Inference network, 49, 263, 1079 Inference to the best explanation (IBE), 49, 127, 326 Inference, uncertain dynamic, 1054 Information Extraction Component (IEC), 756 See also Sterling Software Information extraction (IE), 755 Information Extraction Tools, 754–758 financial fraud ontology, 755 information extraction (IE), 755 NLToolset, 754 Information manipulation theory (IMT), 18 Information processing theory, 31 Information retrieval, 525, 603 See also Text mining Information retrieval models, 1101 Inland Revenue, 275 Inland Revenue Service (IRS), 1022 Innocence, presumption of, 15, 33 Inoculation (in psychology of juries), 29 tactics of. 28

Inquiry, fingerprint, 954–955 Inquisitorial, 1080–1082 Inquisitorial criminal procedure system, 412, 415 Insecurity management, 689, 1082 Institutional friction in policing, 278-279 Insurance crimes, 521 Intelligence gaps in policing, 277 Intelligence-led policing, 9, 273, 278, 518 See also Policing Intelligent legal decision-support systems, 5 Interactive digital storytelling (IDS), 388 Interactive story generation, 380-389 adaptive dilemma-based narratives, 385 agent stories, 384-385 author/story book, 384 automated novel writer, 382 believable embodied agents, 381 BRUTUS, 384 character-and author centric techniques, 381 DAYDREAMER, 383 Dramatica project, 384 Façade, 386 **GADIN**, 385 IDtension project, 385 Machinima, 385 MEXICA. 385 MINSTREL, 384-385, 397-398 narrative mediation, 381 ProtoPropp, 387 ReQUEST, 385 scenario synthesizer, 384 StoryBook, 381 TAILOR, 384 TALE-SPIN, 382 UNIVERSE, 383 Interactive visualisation, SIGHTS text mining, 680 Interesting case, 1082 Interestingness, concept, 627 Interesting pattern, 1082 Internal forum, 214 International Conferences on Virtual Storytelling (ICVS), 342 International tribunals, legacy of, 30, 301 Internet auction fraud, 714-739 accumulation fraud, 715 bid shielding, 717 bid shilling, 717 decreasing bid auctions, 714 eBay, 715-717

Inquest, 1079

FADE (fraud and abuse detection engine), 717 fraud by buyers, 718 fraud by sellers, 718 fraudulent bidding, 716 graph mining algorithm, 728 increasing bid auctions, 714 NetProbe, 721-734 authority propagation, 726 belief propagation, 724-725 cross entropy, 724-725 genetic algorithm, 724 HITS, 726 Markov random field (MRF), 722, 725 overview, 723 PageRank, 726 propagation matrix, 724, 731-734 relational dependency networks (RDNs), 727 simulated annealing, 724 trust propagation, 726 TrustRank, 727 workings of, 730 non-mining model, 736-739 Bayesian network model, 737 evidential traces, 738 forged trademarks, 737 investigation model, 737 prosecution hypotheses, 738-739 PayPal fraud, 718 price quantity pair auction, 715 reputation systems, 720-721 shield bidding, 716 shill bidding, 716 steps in a safe Internet auction, 719-720 TradeMe, 715 Internet child pornography, 511 Interpersonal relations, theory, 497 Interpretation problem, 52 Interrogations, 238, 282 Introspective Meta-eXplanation Pattern (IMXP), 377 Intrusion detection, 695-706 administrator privileges, 696 classification, 697-701 anomaly intrusions, 697-698 artificial intelligence, 698 Biometric fusion, 700 firewalls, 699 host-based, 698 malicious intermediate nodes, 700 Malicious traffic analysis, 700 misuse intrusions, 697

network-based IDSs. 699 signature, 697 strict anomaly detection, 698 TCPdump, 699 domain name service (DNS), 695 hostnames, 695 learning techniques, 701-703 AdaBoost, 702 bullet hole image classification, 701 multi-boosting, 701 multiclass boosting, 702 robust support vector machines, 701 wagging, 702 wireless sensor networks (WSNs), 703 mapping addresses, 695 masquerading, 703-706 modus operandi, 695-696 Nmap, 696 ping sweeps, 696 port scans, 696 probing, 696 scanning, 696 Intrusion prevention system, 700 Inverse discrete Fourier transform, 969 InvestigAide B&, 513, 1082 Investigation, 207, 406, 451, 470, 472, 476, 483, 508, 511, 517, 560, 767, 841, 882, 892, 905, 992 Investigative analysis software, 477 Investment and securities fraud, 578 Ip-cycle, 367 IRS, 1022 Itaca, 209, 236, 241, 1083 Italian criminal procedure code, 216, 221, 246 Italian judiciary, 236, 340

## J

Java Card, 963 JTMS, 20 Judge for the preliminary inquiry, 218 The Judges Apprentice, 243-247 Judges on Wheels, 486, 619 See also Traffic accident disputes Judicial opinion formation, 13-39 belief revision, 16-26 considerations and suggestions, 26-28 focus on juries, 36-39 manipulation devices, 28-29 procedures and jurisdictions, 29-31 quantitative models, 31-36 Judicial sentencing, 214, 242, 245, 248 Juridical fact-finding, 111 Juridical proof, probabilistic account, 107-111

Kidnapping, faked, 425-426 Killer, serial, 25 K-NN algorithm, 674 Knowledge acquisition, 266, 1084 See also CommonKADS Knowledge-based system, 1084 See also Expert system; Artificial intellifence Knowledge discovery, 485, 554, 618, 628, 658, 1084 Knowledge discovery from databases (KDD), 658 Knowledge engineering, 1084 Knowledge interchange format (KIF), 569 Knowledge, misindexing, 275 Knowledge representation, 1085 Kohonen networks, 489, 517, 664 Kripke frames, 319-320 Kronecker delta function, 970-971 Kvart's theory, 118

#### L

Labelling algorithm, 427 LAILA, 45, 1085 Landmark case, 625, 1085 Language for AbductIve Logic Agents (LAILA), 45, 1085 Laplacian graph, 599 Laplacian matrix, 499 Latent print examiners (LPEs), 956 Latent print individualization, 956-957 Latent semantic analysis (LSA), 379 Layered-abduction machine, 46 Lay factfinders, 1083 Laypersons lay factfinder, 1083 medical laypersons, 1010-1011 Learning machine learning, 1090 Learning statistical pattern, 598 Legal argumentation, see Argumentation Legal arguments, four layers of, 168-174 dialectical, 168 logical, 168 procedural, 168 strategic or heuristic, 168 Legal database, classification technique, 618-621 algorithm ID3, 619 electronic judge, 619 IF-THEN rules, 618 KDD techniques, 619, 620 neural networks tools, 619

#### Subject Index

1324

Jurimetrics, 246 Jury blue ribbon, 1034 decision making, formal analysis of, 50 jurimetrics, 246 observation fallacy, 110, 1083-1087 research. 13, 1077 Justice information systems, 239–249 CaseMap, 240 Daedalus, 240 high data concentration, 240 cross-border criminal databases, 240 data mining techniques, 240 MarshalPlan, 240 meta-documentary automation, 239 past and new cases, 243-246 prosecutorial and judicial discretion, 246-249 evidentiary value prescriptive model, 247 judicial sentencing, 248 legal discretion, 247 plea bargaining, 247 polarisation test, 247 theme probability mode, 247 user communities, 241-243 Justification based truth maintenance system (JTMS), 20 See also Truth maintenance system Justification simpliciter, 25, 146

# K

Kappa calculus, 117-119, 120-121, 126-127, 1084 Åqvist's scheme, 119–120 comparison of schemes, 121-125 considerations, 117-119 contextual assessment, 126-127 equivalence to grading mechanisms, 121-124 probabilities reintroduction, 124-125 relative plausibility, 126-128 review of, 119-120 suggested solution, 125 Katz centrality, 499, 721 Katz choice matrix, 502 Katz status index, 499-500, 502-503, 721 KDE, 556 Kelvin probe, scanning, 951 Keyframing, in medical imaging, 1005–1006 polygon models, 1005 3D studio MAX, 1005 traffic accident reconstruction, 1006

OVER project, 620 Split Up project, 620 Legal evidence, theory, 880 Legal formalism, 305-308 classical formulation, 305 aconsequential morality, 305 Negotiable instruments, 305-306 New formalism, 306 purposive rule-following, 305 relational contract theory, 307 relational formalism, 307 Legal formalists, see Proceduralists Legal Information Network for Scotland (LINETS), 242 Legal knowledge discovery algorithms, 625-628 Legal positivism, 1085 Legal realism, 662, 1085 Legal reasoning, 47, 50, 944 See also Argumentation; Relevance; Split up LegalXML, 537 Leibnizian spatio-temporal representation, 428 Lexons, 569 Lex posterior, 1086 Lex superior, 1086 Liability, 1086 Liber spectaculorum, 612 Lie detectors, 285-286 See also Polygraph Tests Light probe images, 872-873 Likelihood ratio, 86, 294 LINDA, 615 Linearly separable, 605 Linear regression, 1086 LINETS, 242 Lineup, 8, 290-292, 294-295, 1077, 1086 diagnostic value, 292 facial composites, 290 innocents, called foils or look-alikes, 290 lineup instruction bias, 294 mistaken identification, 296 multiple-witness identifications, 293 suggestive eyewitness identification procedures, 295 video identification parade electronic recording (VIPER), 291 Lineup instructions, 1086 Line-ups, 863, 1086 See also Identity parade Linguistic probabilities, 106 Linguistics, computational, 62, 406, 547, 598-599

Linguistics, forensic, 618 Linkage blindness in policing, 276 Link analysis, 483, 493-494, 504, 508, 675, 748, 754, 758, 1086 algorithms, 621 application of, 506 call detail records, 507 child pornography, 511 counter-drug analysts, 507 dialed-digit analysis, 507 entity-to-event associations, 505 network, 8, 511 tools applied to criminal intelligence, 511 Coplink, 511 FLINTS, 511 tools for criminal investigation, 508 Anacapa charting, 510 Big Floyd, 510 **COPLINK Criminal Relationship** Visualizer, 508 Crime Link, 508 Crime Workbench, 508 ORIONLink, 509 use of, 506-507 visualising, 505 what-if scenarios, 506 Link analysis in policing, 274 Link detection, 778-780 fingerprint, 778 footwear impressions, 778 tool mark, 778 Link Discovery Tool, 511 Liquids, ontology for, 914 LISP programming language, 39, 546 Litigation risk analysis, 252, 1087 Liverpool, 246 Live-scan, 950 Löb's theorem, 1053 Local stare decisis, 626, 634, 1087 Locard's Principle, 926 Location errors, labeling of, 447 Logic, 1087-1088 independent choice, 111, 1079 problem solvers, 850 Loose talk, 1088-1089 Low Copy Number DNA, 784-787 Wigmorean, neo- (approach), 802 LPEs, 956 Lunacy, 68-69 Morgan Hinchman case, 69 Warder Cresson case, 67–68 Lund Procedure, 210-212 evidentiary relationships, 211

Lund Procedure (*cont.*) evidentiary value, 211 list of evidentiary facts, 211 structured list of themes, 211 subordinate decisions, 212 Lying, 149, 155, 282 indicators of, 280

See also Deception; Fraud

## М

Mac-a-Mug Pro, 1089 MACE alterations, 688 Machine learning, 244, 356, 377, 379, 487, 489-493, 507, 598-599, 606, 626, 632, 667-678, 681, 684, 701-703, 713, 729, 743-744, 753, 853, 933, 1085, 1090 EDS Project, 752-754 classification algorithms, 753 data balancing, 753 data mining, 754 splits, 753 Machine learning algorithm, 606 Machine olfaction, 917, 921 MacroGA, 669 Magnetic method, 911 Magnetic resonance imaging (MRI), 996 Magnetometry, 910 Malicious intermediate nodes, 700 Malicious traffic analysis, 700 Malingered neurocognitive dysfunction, 150 Malingering actors, 150 Malware, 708, 710-711, 742-745 anomaly-based detection, 744 densification, 741 detection, 740-747 errors possibility, 744 homophilic machine-file relation, 742, 745-746 network forensics, 741 node potential function, 746 overview of the Polonium technology, 747 PeGaSus, 741 Polonium, 742 randomisation tests, 743 reputation computation, 743 scalability of Polonium, 747 signature-based detection, 744 virus signatures, 744 Manipulation theory, information, 18 Mano Nera, 96 Manson test, 296

Map geo-mapping tools, 513 Mapping addresses, 695 Mapping, crime geographical analysis, 816 geographic information systems for, 513-518 ArcIMS, 515 ArcInfo, 515 ArcSDE, 515 **AREST. 512** AutoCarto conference, 514 CATCH (Computer Aided Tracking and Characterization of Homicides), 517 DIME (Dual Independent Map Encoding, 515 FLINTS, 513 geo-mapping tools, 513 geosimulation, 517 HITS (Homicide Investigation Tracking System), 517 MapQuest, 515 multi-agent systems (MAS), 516 TIGER (Topologically Integrated Geographic Encoding and Referencing), 515 MapQuest, 515 Maps rarth resistivity, 910 geological, 906 Marching cubes algorithm, 1007 Marker passing, 352–353 Markov Chain Monte Carlo methods, 109 Markov models, 517 Markov random field (MRF), 378, 722-725, 730 MARPOL. 556 MarshalPlan, 53, 131, 207-210, 240, 1090 Masking, 519 Masquerading, 703-706 Mass spectrometry, 885, 920, 929 Matches, forensic, 780 Matching, fingerprint, 952, 957-963, 971 Maternal imagination theory, 944 Mathematical logic, 169, 318 Mathematical modelling, 13 Matrix adjacency matrix, 500-501 Laplacian matrix, 499 payoff matrix, 254-255 propagation matrix, 378, 724-725, 731-732, 734

Katz choice matrix, 502 weight matrix, 653 MAVERICK, 769 Maximum intensity projection (MIP), 1005 MDITDS, 755 Mechanical Jurisprudence, 306, 1090 Mediation, 406, 1091 Medical imaging, 1002-1011 animation, 1005 keyframing, 1005–1006 polygon models, 1005 3D studio MAX, 1005 traffic accident reconstruction, 1006 data storage, 1002 dental radiology, 1009 image fusion, 1007 2D imaging, 1002-1003 3D imaging, 1003-1004 dental reconstruction, 1004 gunshot to the head, 1004 maximum intensity projection (MIP), 1005 volume rendering, 1005 Polygon models, 1005 Medical laypersons, 1010-1011 Meinertzhagen bird collection controversy, 451-454 Memories, false, 38 Memory conformity, 27, 73, 150, 1091 Memory organisation packages (MOPs), 362 Mens rea, 1091-1093 Message-based persuasion, 28 Meta-documentary automation, 239 Metaforensics, digital, 260, 889 Metal detector methods, 912 Meter-models, 13, 1093 Micro-level analysis of events, 801 Microscopic analysis, 812 Middleware-level IDSs, 709 Migration Defense Intelligence, 755 Migration Defense Intelligence Threat Data System (MDITDS), 755 **MILE**, 555 Military espionage, 475 MIMIC, 863, 1094 Mining, data, 9, 100, 106, 154, 179, 195, 200, 205, 240, 274, 277, 390, 483–493, 506-507, 511-513, 516, 519-524, 534-537, 544, 547, 550, 552, 582, 598-600, 602, 606, 619-621, 623, 625-628, 630, 632, 638, 664, 667-668, 671-673, 675-676, 679,

682-685, 697-698, 701-702, 710, 713, 717, 720-722, 728, 737-738, 740-743, 744, 748-754, 759-760, 762-763, 844, 892-893, 916 algorithm, 627, 632 application, 486, 491 bagging, 491 behavioural profiles, 491 classification trees, 490 clustering analysis, 490 data preparation, 487 data warehousing, 487 decision trees, 490 feature extraction, 492 goals for financial institution, 519 link analysis, 486 machine learning, 491 multiagent technology, 495 NETMAP, 486-487 offender profiling, 493 pattern recognition, 488 performance of, 633 precrime, 512 predictive, 484 recursive, 682-685 advantages, 684 algorithm 1, 683 author identification, 682 InFilter, 682 intrusion detection, 682 masquerade detection, 682 mimicking, 682 processing stages, 684 spoofed internet protocol (IP), 682 spoofing, 682 segmentation, 485 self-organising maps, 489 statistical modelling, 488 statistical prediction, 488 summarisation, 485 Mining, graph, 728 Minority opinion, 215 Minutiae detection, 1094 MIP. 1005 MiPai algorithm, 861 Miscarriages of justice, 263 Misindexing, knowledge, 375 Misuse intrusions, 697 Mock-trial, 335 Modal logic of forcing, 65 Modal operators for political action, 93 Model fragments, 846 Modus ponens, 185, 478, 1094

Momentum in neural network momentum and bias, 654 Monster of Foligno-serial killer, 25 Monte Carlo methods, 109 Moorov doctrine, 1121 MOPs. 362 Moral luck. 86 Mosquito anatomy morphology, 552 Motivational calculus, 86 MRF. 724-725 Mug shots, 860 Multi-agent, 28, 77, 173, 516, 524, 534, 1094 Multi-boosting, 701 Multiclass boosting, 702 Multidimensional scaling, 116 Multifluorescence imaging, 548-549 See also Virtopsy Multimedia forensics, 689, 1094 Multimedia, semantic, 548 Multimedia units, theory, 86 Multiple-case analysis, 801 Multiple Image-Maker and Identification Compositor (MIMIC), 863 Multiple linear regression, 931 Multivariate image mining, 548 MURAD subproject of the Aurangzeb model, 431 Murder HITS (Homicide Investigation Tracking System), 517 Monster of Foligno-serial killer, 25 Museum of Natural History (U.S.), 448, 462 Mutual recursion, 458, 461

#### Ν

NADE, 1098 Naïve Bayes, 97, 99, 606, 744 Naïve Bayesian classifier, 100, 1094 NAPDToSpread, 928 Narrative analyst's Notebook, 477 automated understanding, 374 AVERs, 477 HOLMES2, 477 intelligence, 351 plausibility, 323-324 Narrative reporting, 403–404 ABDUL/ILANA, 403 IMP, 403 PAULINE, 403 Terminal Time, 404 NASD, 728-730, 743

MYCIN expert system, 106, 193

Nash equilibrium, 153 National Association of Document Examiners (NADE), 1105 National Association of Securities Dealers (NASD), 728-730, 743 National Crime Squad, 275, 277 National Crime Victimization Survey (U.S.), 244 National Criminal Intelligence Service (NCIS), 275.769.783 National DNA Database, 773, 775, 780, 786, 809, 810-811, 813-824, 945 National Intelligence Model (NIM), 274-275 National Law Enforcement Telecommunications System (NLETS), 536 National Museum of Natural History (U.S.), 450.462 National Science Foundation (U.S.), 208 Natural-language analysis, 593 See also Story-understanding Natural-language processing (NLP), 63, 81, 87, 257, 415, 487, 521, 588, 598, 756 See also Linguistics, computational; Computational linguistics NCIS, 275, 769, 783 Nearest neighbour algorithm, 1095 Nearest neighbours approaches, 674 NEGOPY program, 496 Negotiation, 161, 164, 1095 Neo-Kantian jurisprudence, 304 Nepenthes system, 710-711 Nested beliefs, 152-153, 422, 520 Nested relations (in database design), 761 NetProbe, 720-723, 725, 728, 730-736, 740, 742 Network-based IDSs, 699 Network centrality, concepts, 510 Network forensics, malware, 741 Network representation, 1095 Network topology, 1095 Neural network clustering, 844 Neural networks, 40-41, 51-52, 84, 100, 104, 106, 189, 195, 321, 467, 483-486, 488-489, 492, 507, 517, 523, 525, 619-621, 626-627, 633, 638, 643-667, 675, 698, 701, 706, 744, 753-754, 860, 920, 922, 931, 933, 1094 algorithms, 488 application to law, 656-661 backpropagation algorithm, 658

knowledge discovery from databases (KDD), 658 Kort's method, 657 PROLEXS, 657 application to rule defeasibility, 659 back-propagation of errors, 659 connectionism. 661 ECHO program, 660 brain structure, 644 classification application, 658 designing of, 646 discretionary domains, 662 errors back propagation, 649 feed forward networks, 645-649 architecture, 647 perceptron, 647-649 training data, 648 input activation, 645 learning rate, 653 QuickProp, 653 weight matrix, 653 weight space, 654 momentum and bias, 654 output activation, 645 overtraining of, 1097 perceptron network topology, 644 performance measurement, 656 propagations of, 42 resemblance with brain, 644 self-organising maps, 664-666 hierarchical, 666 neighbourhood function, 664 winning node, 665 setting of, 650 symbolic computing, 643 training, 652 training stopping criteria, 654 cross-validation resampling, 655 overfitting, 655 over-generalisation, 655 overtraining, 655 Undertraining, 654 unsupervised networks, 663 vagueness, 661 Neuropsychology, forensic, 150 New Evidence scholarship, 324-328 anchored narratives approach, 328 explanationism, 326 external anchoring, 327 inference to the best explanation (IBE), 326 internal anchoring, 327 likelihood ratio, 326 macro structure of proof, 325

micro analysis of evidence, 325 "not guilty", 325-326 plausible story of innocence, 327 relative plausibility, 326 Rumelhart approach, 324-325 theory of anchored narratives, 325, 327 New Technology File System (NTFS), 688 NIM, 274-275 **NLETS. 536** NLToolset, 756 Nmap, 695 Nodal points, 860 Node-defeater, 147 Node potential function, malware, 746 Noncredible, cognitive performance, 150 Non-invasive imaging techniques, 895 Nonmonotonic reasoning, 25, 146, 169, 480, 1095-1096 Normalised cross-phase spectrum, 969 Normative ability, 249 Nose, electronic, 916-924 computing system, 920 detection system, 920 fast gas chromatography (FGC), 923 gas chromatography, 916 sample delivery system, 920 trace vapour detection, 921 vapour concentration, 921 NoteMap, 208 NTFS. 688 Nuremberg Tribunal, 30, 301

# 0

Objective function, 607 Oblazione procedure in Italy, 221 Obligations, reparational, 1107 Occam's Razor, principle of, 642 OCU, 793, 828 Odorology, 915-916 See also Olfaction Odour Machine olfaction, 917, 921 OEPs, 918 OET, 586 Offender crime results and suspects photograph, 833 graphical depiction, 832 offence types, 829 operational command units (OCUs), 828 persistent offenders, 774 profiling, 493 prolific, 827 query definition dialog box, 829

Offender (cont.) search, 827-828 unknown offenders, 773-774 DNA evidence, 773 virtual offender, 773 Olfaction dynamic dilution, 918 machine olfaction, 917, 921 See also Scent-detection, Cadaver dogs; Electronic nose Olfactometer, 918 See also Olfaction Olfactometerics, dynamic dilution, 918 Olfactory Evoked Potentials (OEPs), 918 See also Olfaction On-line directory of expert witnesses, 602 Ontology, 387, 428, 544-548, 555, 560, 566, 568, 581, 586-587, 758-762, 1096 database relational notation, 761 engineering, 546 extraction tool (OET), 586 for liquids, 914 FuelFlowVis, 759, 761 link analysis, 762 minimal ontology, 760 nested relations, 761 roles of person's diagrams, 762 transfer diagrams, 762 See also Fuel laundering scam Onus of proof, 1096 See also Burden of proof Open multiagent computation, 481 Open-textured legal predicate, 1097 Operational command unit (OCU), 793, 828 Opinion appeal to expert, 1062–1063 Opinion, evidence of, 1057, 1063 Opinion-forming in judicial factfinding, 13-39 belief revision, 16-26 considerations and suggestions, 26-28 focus on juries, 36-39 manipulation devices, 28-29 procedures and jurisdictions, 29-31 quantitative models, 31-36 Opinion mining of text mining, 600 Opinion question, 1097 Opinions and beliefs, 16 Opposition identification module, SIGHTS text mining, 680 Order-of-magnitude approximation, 120 Organisational problems in policing, 273-281 Organised crime, 275 ORIONLink, 509 Ornithological fraud, 449

Orthopantomograms, 1002, 1009 OSCAR, 88, 146 Outlier, 519, 629–630, 1097 strict anomaly detection, 698 Out-of-court witness statements, 283 Overfitting, 608, 1097 OWL, 543 Owlet species *Athene blewitti*, 468

# P

PACS, 1002 PageRank, 503, 721, 726, 731 Palaeoecological pollen, 925 Palaeontology, computational, 904 Paleoclimatology, 927 Palmprints, 1097 Palynodata Table Maker 1.0, 928 Palynology, forensic, 893, 924-928 actuopalynology, 926 biostratigraphic services, 928 environmental palynology, 926 NAPDToSpread, 928 palaeoecological pollen, 925 Palynodata Table Maker 1.0, 928 PARADOX software, 927 PAZ Software, 928 pollen data search engine, 928 stratigraphic palynology, 926 Webmapper, 924 Web tools, 927-928 See also Forensic palynology Palynomorph, 925-927 Paperwork burden in policing, 277 PARADOX software, 927 Para-mortem trauma, 897 Paranoia, symptoms of, 87 Parol Evidence Rule, 307 PARRY program, 87 Partitioned semantic networks, 542 Part-simple retrieval, 244 PATER, 944, 1097 Paternity claims, 943 Pattern analysis, 246 Pattern learning, statistical, 598 Pattern matching algorithm, 949 Pattern recognition, 488, 922, 1097 PayPal fraud, 718 PAZ Software, 928 PCA, 489, 673, 1100 Pearl, Judea probabilistic belief networks, 118 Pedagogical agent, 534-535 Pedophilia, 512

Pedo-ring, 512 Peer-to-peer (P2P), 693 PeGaSus, 741 Peg unification, 856-857 PEIRCE-IGTT, 44, 47, 1098 Pena alternativa (alternative penalty), 221 Pension planning, 106 Pentitismo, 1098 Perceptron network topology, 644 Peripheral inconsistency, 26 Persistence, principle of, 17 Personal authentication, 1097 Personal injury & products liability claims, 253 Personality traits, 86, 88, 395, 550 Personal stare decisis, 626, 1098 Person authentication, see Verification Personnel shortage in policing, 279 PERSUADER, 161-164 Persuasion persuasion argument, 172, 1098 persuasion machine, 161, 172 persuasion stories vs. arguments, 481 persuasion, studies, 28 Peta Graph Mining library, 741 Petition forgeries in handwritten petitions, 616 Petri nets. 899 Phase-only correlation (POC), 967-968 Philosophical ontology, 545 Photoarray, 1098 Photofit, 862-863, 1099 photogrammetry, close range, 994 Photographs, use of, 294 Physical countermeasures, 284 Picture archiving and communication system (PACS), 1002 Piece-by-piece information, 32 Ping sweeps, 696 Pirate tracing software, 1099 Pisa, Italy, 762 Pisa SNIPER Project, 762 Plaintiff, 1099 Plausibility, 6–7, 45, 105, 110, 118, 126–128, 159, 167, 323-326, 328-329, 336, 1099 Plausible inference, 1099 Plea bargain, 117, 221, 224-225, 247-248, 253, 256, 334, 1099 guilty, 1073 PLOTINUS umbrella project, 431 PMCT, 991, 995, 998

PMCTA, 991 PMMR, 992 POC, phase-only correlation, 967-968, 970 Poisson process model, 35-36 Polarisation induced. 911-912 test. 247 Police and Criminal Evidence Act, 817 Police areas, 783-785 benefits, 784 feedback loop, 784 incident handling, 783 Police National Computer, 8, 10 Police-oriented query, 557-558, 586 Police questioning, 156 Police science, 1099 Policing, 273–297 organisational problems, 273-281 communications divide, 275 compulsive data demand, 277 criminality, pyramid, 277 cross-border issues, 275 data mining, 274, 277 defensive data concentration, 278 digital divide, 275 efforts duplication, 278 information silos, 278 institutional friction, 278-279 intelligence gaps, 277 intelligence-led, 273, 278 intra-agency subculture divide, 279 linkage blindness, 276 link analysis, 274 local issues, 275 occupational subcultures, 279 organised crime, 275 paperwork burden, 277 personnel shortage, 279 record-screening, 276 spatio-temporal crime activity, 281 unit beat, 273-274 self-incriminating confessions, 287-290 identity parades (lineups), 290-297 right to silence, 287-288 wrongful convictions, 287 suspects handling, 281-298 control question test (CQT), 284 custodial interrogation, 279 eyewitness reliability, 283 false confessions, 281 guilty knowledge test (GKT), 285 lying indicators, 283 out-of-court witness statements, 283

2

Policing (cont.) polygraph Tests, 281-286 voice-based lie detectors, 285 Polizia Giudiziaria, 216-217 Pollen data search engine, 928 Pollution, air, 930 Polonium, 742 Polonium scalability, 747 Polonium software, 742, 745 Polonium technology in malware, 747 Polygraph Protection Act (1988), 284 Polygraph tests, 281-287, 1100 Polynomial regression models, 629, 1086 Polytopic vector analysis (PVA), 933-934 Pooled techniques of text mining, 598 Pornography, 512 Port scans, 696 Positivism fact. 1068 legal, 1085 Post-charge questioning, 1100 Post-mortem computed tomography (PMCT), 991, 995, 998 See also Virtopsy Post-mortem magnetic resonance imaging (PMMR), 991-992 POWER program, 555 Poznan ontology, 758-762 database relational notation, 761 FuelFlowVis, 759, 761 link analysis, 762 minimal ontology, 760 nested relations, 761 roles of person's diagrams, 762 transfer diagrams, 762 See also Fuel laundering scam P2P. 693 Pragmatic implication, 65, 90 narrativisation, 334 Prediction statistical prediction, 488 Preferred Extension (PE), 161 Preliminary fact investigation, theory, 111 Preponderance of the evidence, 336, 1100 Preponderance, principle of, 120, 124-125 Presentation bias, 294 Preserved Fish, 561, 564 Presley, Elvis, 395 Prevention, intrusion, 700 Price quantity pair auction, 715 Principal component analysis (PCA), 489, 673, 1100

Principled negotiation, 1100 3D printing, 1007 Prior convictions (evidence of), 1100 Prisoners Dilemma, 254-255 Privacy, Electronic Privacy Information Center (EPIC), 240 Privacy International, 240 Privacy of belief, 156 Private privilege, 1100-1101 Privilege, 696-699, 1100 administrator privileges, 696 classification, 697-701 anomaly intrusions, 697-698 artificial intelligence, 698 biometric fusion, 700 firewalls, 699 host-based, 698 malicious intermediate nodes, 700 malicious traffic analysis, 700 misuse intrusions, 697 network-based IDSs, 699 signature, 697 strict anomaly detection, 698 TCPdump, 699 Probabilistic and statistical reasoning, 887 Probabilistic applications, 111–117 logic and reasoning, 111-115 multidimensional scoring, 115-117 Probabilistic belief networks, 118 Probabilistic information retrieval models, 1101 Probabilistic networks, 102 Probabilistic reasoning, 126 Probabilistic uncertainty, 106 Probability, 5, 7, 33, 115, 167, 944, 955, 1101 objective, 1101 prior and posterior, 1101–1102 subjective, 1102 Probability theory, 18, 31, 103-104, 107, 111-112, 120-121, 131, 174, 267, 693, 886, 944 Probative value, 288, 1102 Probe images, light, 872-873 Probing, 696 Problem formulation, critical questions, 160 Proceduralists, 316 Procedural representation scheme, 1102 Procedural-support systems, 53, 208, 1102 Proceeds of Crime Act, 769 Production rule, 1102 See also IF-Then rule PROLEXS, 529, 657, 1103 Prolific offenders, 827

Prolog or Lisp, 546 Prolog progamming language, 546 Prolog, reflective, 245 Proof, free, 1072 Propagation authority propagation, 726 belief propagation, 724–725 See also Back propagation Propagation matrix, 378, 724-726, 731-734 Prosecution prosecution hypotheses, 39, 51, 737-739 prosecutorial discretion, 248, 1103 Pseudo-scientific claims, 68 PSICO, 80-83 Psychodrama, 497 Psychological profiling, see Offender, profiling Psychology eyewitness psychology, 415 cross-cultural, 88 Psychotherapist, 38 Public inquiry, 1103–1104 Public interest privilege, 1104 Public Prosecutor, 218 Purkinje cells, 939 Purposive-cognitive-affective algorithm, 87 Putative legitimate defence, 92 PVA, polytopic vector analysis, 933-934 Pythagoras theorem, 989

## Q

Quack technology, 286 Quadratic programming (QP), 610 Quantitative methods, 889 Query analyser, 847 formulation, 606 Questioned documents evidence, 1104–1105 QuestMap, 167, 1105 QuickProp, 653

## R

Radar, ground-penetrating radar (GPR), 910, 912–913 Radio-frequency identification tags, 539 Randomisation tests, 743 *Ratio decidendi*, 183, 625–627, 1105 RCMP, 983 RDF-mapped Semantic Web resource, 557 RDNs, 727 Realism, Legal, 662, 1085 Reason!Able, 167, 1105 Reasoning legal, 47, 50

non-demonstrative, 48 Rebutter, 1106 Receptor modeling problem, 933 Recognition, fingerprint, 1071 Record-screening in policing, 276 Recoverability, principle of, 17, 24 Recursion, 116, 682-685 advantages, 684 algorithm 1, 683 author identification, 682 InFilter. 682 intrusion detection, 682 masquerade detection, 682 mimicking, 682 processing stages, 684 segmentation, 485 self-organising maps, 489 spoofed internet protocol (IP), 682 spoofing, 682 statistical modelling, 488 statistical prediction, 488 summarisation, 485 Recursive data mining, 682-685 advantages, 684 algorithm 1, 683 author identification, 682 InFilter. 682 intrusion detection, 682 masquerade detection, 682 mimicking, 682 processing stages, 684 spoofed internet protocol (IP), 682 spoofing, 682 Red Brigades, 25 Reference-class problem, 108, 128, 293, 367, 886, 946, 1106 Referential fallacy, 341 Reflective Prolog, 245 Refugee Review Tribunal (Australia), 201 Regional Forensic Science Group, 783 Registration depository, central, 729 Regression, 490-491, 1106 Regression, linear, 1086 Rejoinder, 1106 Relational contract theory, 307 Relational database technology, 512, 540 Relational dependency networks (RDNs), 727 Relative plausibility, 110, 127, 326, 336, 694-695, 1099 Relevance, 26, 298-322, 374, 888, 1106 argument refutation, 315-316 old syllogistic formalism, 317 bias-pluralism, 316

....

cultural cognition, 315 legal formalism, 317 relational formalism, 317 rule-breach-remedy, 316 skeletal relevance, 315 character. 300 curative admissibility, 300 definitions, 298-301 epistemic paternalism, 300 evidence and beyond, 308-314 conversational relevance, 309 legal decision-making, 309 normative relevance (NR), 313 relevant logic (RL), 310 semantic considerations, 311 truth table TFTT, 310 visual recordings of the re-enactments, 308 hearsay, 300 legal admissibility, 302 legal formalism, 305-306 classical formulation, 305 aconsequential morality, 305 Negotiable instruments, 305-306 New formalism, 306 purposive rule-following, 305 relational contract theory, 307 relational formalism, 307 Leviathan, 303 logic relevance, 303 object of regulation, 301 opinion, 300 perlocutionary, 305 previous convictions, 300 Ravens paradox, 302 relevance logic, 314-315, 317-322 computational resources, 321 discursive importance, 314 epistemic logic, 321 Gentzen sequent calculi, 318 Kripke frames, 319–320 legal proceduralists, 316 linear logics, 321 material conditional, 318 material implication, 317 "minimal relevance" problem, 314 natural deduction, 318 ontologies, 322 paraconsistent logics, 319 practitioners of, 317 Routley-Meyer semantics, 320 semantics of, 319

sequent calculus, 319 split up knowledge, 321 strict implication, 317 variable sharing principle, 319 rule of recognition, 302 rules of auxiliary probative policy, 299 rules of extrinsic policy, 299 social epistemics, 300 Reliability of eyewitness testimony, 283 Religious identities, 68 Remote sensing, 906-907 Removing/wiping files, 688 Reparational obligations, 1107 Replication, 1107 Representational sophistication, 118 Reputation computation, 743 Reputation systems, 720-721 Resistivity earth resistivity, 910 electrical resistivity method, 911 Resolution, 1107 Resources-for-action, 843 Respondent, 1107 Retinal scan, 99 Rhetoric Inoculation (in psychology of juries), 29 tactics of, 28 Rhetoric, forensic, 335 Ridge bifurcation in fingerprints, 958 Rights-based legal systems, 250 Right to silence, 171, 219, 287-290 Ring or line topology, 6 Risk brokers, higher-risk, 729 risk-allocating, non-utilitiarian, 250 Victor's Litigation Risk Analysis<sup>TM</sup>, 252 Robust support vector machines, 701 Role-playing games (RPGs), 388 Room 5, 168 Rough clustering, 490 Rough set theory, 490 Routine activity theory, 154 Routley-Meyer semantics, 320 Royal Canadian Mounted Police (RCMP), 983 RPGs, 388 Rule-based expert systems, 846, 1107 Rule-extracting tools, 1107 Rule induction, 637-643 algorithm, 619, 627, 639-643, 673 benefits of, 639 data mining techniques, 638 decision tree, 639 difficulties. 639

Relevance (cont.)

examples, 642 inductive reasoning, 637 pattern interestingness, 638 Ruleset, 1107

## S

Safe Internet auction, 719-720 SAFER method, 933 SALOMAN project, 602 Sample delivery system, 920 SARA, 280 SAW, 920, 922 Scanning, 696 Scanning, Analysis, Response, and Assessment (SARA), 280 Scanning, fingerprint, 1071 Scanning Kelvin probe (SKP), 951 Scenario Space Builder, 850-852 backward chaining, 850-851 consistency phase, 851 forward chaining, 850-851 initialisation phase, 850 Scent-detection, 915–916 See also Olfaction Schema theory, 859 Scientific computing, 880 Scientific evidence, 50, 885, 954 Scintilla of evidence, 1108 Scottish Crime Squad, 241 SCP. 512 Search based drama manager (SBDM), 386-387 Second-Generation FLINTS. see FLINTS 2 Securities Dealers, National Association of, 728-730.743 Securities fraud, 578 Security computer, 1041 malware, 708, 710-711, 742-745 anomaly-based detection, 744 densification, 741 detection. 740-747 errors possibility, 744 homophilic machine-file relation, 742, 745-746 network forensics, 741 node potential function, 746 overview of the Polonium technology, 747 PeGaSus, 741 Polonium, 742 randomisation tests, 743 reputation computation, 743

scalability of Polonium, 747 signature-based detection, 744 virus signatures, 744 Segmentation, in medical imaging, 1006–1007 Self-exoneration structure, 58-59 Self-incriminating confessions, 287-290 identity parades (lineups), 290-297 right to silence, 287-288 wrongful convictions, 287 Self-Incriminating Confessions Jewish law, 289 Roman law, 289 Self-organising maps (SOM), see Kohonen networks Self-training receptor modeling, 933 Semantic multimedia, 548 Semantic networks, 544-545 Semantic Web, 165, 538, 547, 550-551, 557, 586 Sensing, electronic, 917 Sensitivity analysis, 1106–1107 Sensor fingerprint, 1071 wagging, 702 Sentencing, 214, 242, 245, 248 Sentencing Information System (SIS), 242-243 Sentenza suicida, 1109 Sentiment analysis, 600-601 Sentiment-quantification methods, 600 SEPPHORIS, 83 Sequencing, 896 Sequential identification procedures, 293 Serial killer, 25 Settlement out of court, 1109 Sex estimation from skeletal remains, 884 Sexual offender model's labels, 518 SGA. 388-389 Shallow extraction, 601 Sharp-weapon trauma, 898 Shield bidding, 716, 1109 Shill bidding, 716 Shilling, 1109 Shilling, bid, 717 Shoes footwear evidence, 890-891 Shooting, 58, 67, 327, 408, 433, 445, 556, 841, 878,883 SIGHTS text mining, 679-682 algorithm modules, 680 interactive visualisation, 680 opposition identification module, 680 support vector machines (SVMs), 681 temporal group algorithms, 680

Signature-based detection of malware, 744 Silence, right to, 171, 219, 287-290 Similar fact evidence, 1109 Similarity, striking, 1112 SIMPLE, 547 Simpliciter, justification, 25, 146 Simulated annealing, 724 Simulated kidnapping, 425–426 SIS, 242-243 Situational crime prevention (SCP), 512 Situation theory, 1109 Skeletal ramains facial reconstruction from skeletal remains. 874-877 categories, 875 computer-graphic techniques, 875 Skeletal Trauma Mapping, 896 SKP, 951 Slot-machine model, 1110 Smell, machine olfaction, 917, 921 Smithsonian Institution Research Report, 450, 464 Smith-Waterman algorithm, 704 Smoking simulation, 87 Smurfing, 1110 Sniffing, machine olfaction, 917, 921 Social epistemics, 251, 300, 1110 Social networks analysis, 494-512 application of, 496 business, notion, 495 computational linguistics, 495 NEGOPY program, 496 Sociatry, 497 Sociodrama, 497 Sociomatrix, 500 Sociometry, 497 Software engineering, 173, 550, 564, 1007 Soil fingerprinting, 908, 948 SoilFit project, 908 Soil gas surveying, 915 SOM algorithm, 484 Sotomayor controversy, 332 Spatial-temporal correlation eigenvectors, 931 crime activity, 281 modeling, 548 Spectral Comparator Video, 612 Spectrometry fluorescence, 905 mass, 885, 920, 929 X-ray, 905 Split Up, 195-200, 626-627, 636, 650-651, 656, 661, 673, 1110

Spohn's minimum equation, 121, 124 Spreading disambiguation, 45 Spring-embedder, network, 499 Spurting, arterial, 974 SQL3, 546 Srinkling/aging algorithms, 868-871 SSA. 615 Standard Generalized Markup Language (SGML), 538 Standard historiography, 474 STARE, 371-372 Stare decisis, 625, 634, 1110-1111 local stare decisis, 626, 628, 631-632, 634-635.1087 State witness, 1098, 1111 Statistical learning theory, 609 Statistical pattern learning, 598 Statistical reasoning, 1111 Statistical syllogism, 147-148 Statutory law, 1111–1112 Steganography, 689–692, 948 applications, 691 blog-steganography, 692 chaffing and winnowing, 691 ciphertext, 692 content-aware, 692 cultural context, 692 network, 692 printed, 692 Stereolithography, 1007 Stereotyped plan, 83 Sterling Software, 754 See also Information Extraction Tools Stevie, 176, 1105 I-node, 176 S-node, 176 Stipendiary magistrate, 1068 Stories and arguments, 476-481 See also AURANGZEB project Story generator algorithm (SGA), 388-389 Story management, 385-386 Story model, 1112 Storytelling, 399-402 BORIS story understanding program, 399 Dr. K-, 400-401 kaleidostories. 400 puppets system, 402 SAGE, 399 StoryMat, 401-402 TEATRIX, 400 Stratigraphic palynology, 926 Strict anomaly detection, 698 Striking similarity, 1112

Structural risk evaluation, 937 Structure risk minimisation, 609 3D studio MAX, 1005 Stylometrics, 611–618 Subjective labelling, 427 Subjective probabilities, 105-106, 111, 127, 250.693 Substance-blind evidence, 785 Suicide by hanging, 848 Summarisation, automatic, 587-598 Supergrass, 1111 Supervisory special agent (SSA), 615 Support vector machines, 603-611 ability of, 605 boosting techniques, 606 bullet hole image classification, 608 computational learning theory, 605 exclusive-Or function, 604 Flexlaw, 606 idea of, 609 information gain, 606 information retrieval, 607 linearly separable, 605 machine learning algorithm, 606 objective function, 607 over-fitting problem, 608 quadratic programming (QP), 610 query formulation, 606 sequential minimal optimisation, 605 Support vector machine (SVM), 681, 701 Surface acoustic wave (SAW), 920, 922 Surface scanning, 994 Surrebutter, 1112 Surrejoinder, 1112 Survival analysis, 944 Suspects, criminal, 537 Suspects handling, 281-298 control question test (CQT), 284 custodial interrogation, 282 evewitness reliability, 283 false confessions, 281 guilty knowledge test (GKT), 285 identification of, 810 lying indicators, 283 out-of-court witness statements, 283 polygraph tests, 281-286 voice-based lie detectors, 285 SVM, 681, 701 **SWALE**, 373 Swamping, 519 Switzerland (Justice System), 1011–1015 advantages, 1011-1012 criminal procedure, 1012-1015

evidence law, 1013 legal basis for, 1013 *See also* Virtopsy Symptom fabrication, 150 Synergism, 5 Syntax, syntactic equivalence, 26

# Т

TACITUS, 379 Tags, radio-frequency identification, 539 TALE-SPIN, 337-339, 372, 382 Taphonomics, 895-896 Target transformation factor analysis (TTFA), 934 Tarpits, 708 Task announcement processing, 530 Taste threshold, 918–919 Taxfarming, 286 Taxidermic examinations, 470 Taxonomy factorial, 98 full-page, 98 TCPdump, 699 Telecommunication, National Law Enforcement Telecommunications System (NLETS), 536 Template matching, 510 Temporal and spatial correlation eigenvectors, 931 Temporal group algorithms, 680 Terrorism Act, 769 Testimony out-of-court witness statements, 283 state witness, 1098, 1111 Text mining, 487, 525, 553, 557, 587-588, 593, 598-611, 621, 664, 675, 677-682, 685, 754, 1112-1114 application areas, 603 applications of, 600-601 automated coding, 601 clustering, 621 COPLINK project, 603 filtering, 601 information extraction, 601 link detection, 598 natural-language querying, 601 opinion mining, 600 pooled techniques, 598 SALOMAN project, 602 sentiment-quantification methods, 600 shallow extraction, 601 statistical pattern learning, 598 summarisation, 601

Text mining (cont.) support vector machines, 603-611 ability of, 605 boosting techniques, 606 computational learning theory, 605 exclusive-Or function, 604 Flexlaw, 606 idea of, 609 information gain, 606 information retrieval, 607 linearly separable, 605 machine learning algorithm, 606 objective function, 607 over-fitting problem, 608 quadratic programming (OP), 608 query formulation, 606 sequential minimal optimisation, 606 tasks, 599 test grading, 601 text analytics, 598 tools, 593, 600-601 WESTLAW, 597 See also Email mining Thagard's ECHO algorithm, 42-43 Thagard, Paul, 42–43 Theft and relabeling, 448 Thematic abstraction units (TAUs), 362.399 Theme probability model, 212, 247 Thermal imaging, 895 Thomson data analyzer, 595 ThoughtTreasure, 374 Threat data system, 755 Threat Image Projection (TIP), 921 **TIGER**, 515 Time correlation eigenvectors, temporal and spatial, 931 formal models of, 898-901 fraudulent actions, temporal awareness, 578 granularity, 899 Petri nets, 900 slicing, 910, 913-915 temporal analysis, 826-827 temporal group algorithms, 680 TimeMap chronology-graphing software, 208 TIMUR model, 433 Tissue/liquid sampling, 999 TMS, see Truth maintenance system Tohoku algorithm, 967

Tomography post-mortem computed angiography (PMCTA), 991 post-mortem computer (PMCT), 991, 995, 998 Tongue biting, 284 Tongues, electronic, 923-924 Tool marks, 814 Topkapi Museum, 409 Topology network, 1095 ring or line, 6 Topsoil magnetic susceptibility, 910 Toulmin argument structure, 131-132, 178, 183, 186, 198, 660, 1118 TPD. 748 Trace Meta-eXplanation Pattern (TMXP), 377 Trace vapour detection, 921 Trademarks, forged, 737 TradeMe, 715 Traffic accident disputes, 486, 619 reconstruction, 1006 Traitor tracing, 689, 1118 TRAITS. 86 Transactional theories of emotions, 89 Transvaluationism, 661, 1088, 1118-1119 TreeAge Pro, 252, 1119 Tree diagram of betrayal, 423-424 Tree, dynamic aspect, (DAT), 899 Tree-like representation of formulae, 166 Trend Hunter, 507 Trial-and-error excavations, 906 Trial by mathematics, 1119 Triangle, golden, 860 Triangulation, 716, 1119 True state of affairs, 422 Trust propagation, 726 TrustRank, 727 Trustworthiness question, 1119 Truth maintenance system, 18, 20, 25, 146, 480, 844, 1119 TTFA, 934 Tucson Police Department (TPD), 748 Turnbull rules, 463, 265-266

Two-witness rule, 1121-1122

## U

U.S. National Museum of Natural History, 450, 464 U.S. National Science Foundation, 208 Ultimate evaluation phase, 97 Uncertain inference, dynamic, 1054 Uncharged conduct or uncharged misconduct, 1119 Uncovered essentials, phenomenon, 44 Undeutch hypothesis, 18 Uniform Commercial Code, 306–307 Uniqueness claim about footprints, 955 United Nations Convention relating to the Status of Refugees, 180 United States' National Crime Victimization Survey, 244 Upper ontologies, 546

## V

VAF, 160-161 Vagueness, 106, 304-305, 556, 661-662, 667 Validation Phase, 97 Value-based Argumentation Framework (VAF), 160-161 Vapour concentration, 921 VAT@, 567 VAT fraud, 578, 581-582, 765 See also Fiscal fraud detection Vehicle searching, 835-834 options, 835 results, 836 vehicle search dialog box, 835 Verification, fingerprint, 1071–1072 ViCLASS, 517 Victimization Survey, United States' National Crime, 244 Victor's Litigation Risk Analysis<sup>TM</sup>, 252 Video identification parade electronic recording (VIPER), 291 Video ID system, 291 Video Spectral Comparator (VSC), 612 Videotaped interviews, 156 Violence, domestic, 196-200, 635-636 Violent Crime Linkage Analysis System (ViCLASS), 517 VIPER. 291 Virtobot system, 993–994 Virtopsy, 991–1015 indications for, 992-993 medical imaging, 1002-1011 animation, 1005 data storage, 1002 dental radiology, 1009 image fusion, 1007 2D imaging, 1002-1003 3D imaging, 1003-1004

for medical laypersons, 1010-1011 orthopantomograms, 1002, 1009 picture archiving and communication system (PACS), 1002 post-mortem vs. ante-mortem, 1008 for radiologists and pathologists, 1008-1009 rapid prototyping, 1007 segmentation, 1006-1007 windowing, 1002-1011 post-mortem computed tomography (PMCT), 991 post-mortem computed tomography angiography (PMCTA), 991 post-mortem magnetic resonance imaging (PMMR), 991-992 Swiss Justice System, 1011-1015 advantages, 1011-1012 criminal procedure, 1012-1015 evidence law, 1013 legal basis for, 1013 technical aspects, 993-1001 close range photogrammetry, 994 magnetic resonance imaging (MRI), 996 photogrammetry, 994 post-mortem computer tomography (PMCT), 995, 998 surface scanning, 994 tissue/liquid sampling, 999 virtobot system, 993-994 virtopsy workflow, 1000-1001 Virtopsy workflow, 1000-1001 Virtual embodied agents, 394-396 Cybercafe, 395 embodied conversational agents (ECAs), 394 spark of life (SoL), 396 Virtual theater project, 80, 394-395 Virus signatures, 744 Visualizer, COPLINK, 508, 511, 748-754, 1043 Visual surveillance devices, 274 Vitality affects, 90 Voice-based lie detectors, 285 Voice identification, 883 Voir dire, 1120 Volume crimes and suspects, 785 Volume rendering, 1005 Von Bülow trials, 49, 52 Von Neumann theorem, 115 VSC, 612

Witness ear witness expert witness, 109, 171, 522, 602, 881-892, 928, 935, 1063-1067, 1082 on-line directory of expert witnesses, 602 linguist's role, 618 reliance on, 881 role of, 894 eyewitness accuracy of identification by, 262 admissibility and sufficiency of, 267 identification, 38, 95, 263-265, 270, 273, 283, 293, 295-297, 882-883 psychology, 415 reliability of, 266, 270, 283 testimony, 50, 266, 270, 273, 415, 611, 859, 1068 multiple-witness identifications, 293 two-witness rule, 1121-1122 Out-of-court witness statements, 283 state witness, 1098, 1111 compellability in ADVOKATE project, 269 - 270WizRule, 521 WizSoft, 521 WordNet, 547 World Data Center for Paleoclimatology, 927 Worms, 339, 708-710, 742, 926 Writeprint characteristics, 611 Wrongful convictions, 287

# X

WSNs, 703

XML, LegalXML, 537

# Y

Yale School of natural-language processing, 339 Yugoslavia Tribunal, 30, 301

w

Wagging, 702 Warehousing, data, 536 Warrant, concept, 92 Warrant eavesdropping, 219 Web bots, 525 Web bugs, 537 Web geographical information systems (Web-GISs), 512 See also Geographical information systems Webmapper, 928 Web mining, 490, 553 Web tools, 927–928 Weight matrix, 653 Weight space, 654 Wells and Olson's taxonomy, 95–99 What not guilty, conceptualization, 335 Wheels, Judges on, 486, 619 See also Traffic accident disputes White collar crime criteria. 764-765 objective functions, 764 rule-based classification, 765 sample selection bias, 763 Wigmore chart, 130-145, 168, 175, 209, 434, 843, 1121 analysis, 133-137, 843 background generalisation, 136 factum probandum, 135 factum probans, 135 Newcastel embarrassing situation, 137-145 archetypal situation, 138 argument-structure, 140 missing evidence, 144 notation of, 132-133 factum probandum, 132 factum probans, 132 Windowing, in medical imaging, 1004-1011 Wireless sensor networks (WSNs), 703 Wiretapping, 219