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Lineament mapping and its application in landslide hazard assessment: a review

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Abstract This paper presents an overview of the use of lineaments in landslide hazard mapping. The lineaments are normally derived either from aerial photographs or satellite imagery. The relative advantages and disadvantages of digital image processing and manual (visual) lineament interpretation are discussed. Most researchers prefer the manual technique, despite the fact it is more time-consuming and subjective, as it allows a higher degree of operator control. Ways of increasing objectivity in the interpretation are suggested. It is hoped that lineament mapping will increasingly be incorporated in landslide hazard assessment hence the paper emphasizes the need for care and a proper understanding of these methods and their limitations.

Keywords Landslide hazard · Lineament · Subjectivity · Remote sensing imagery

Résumé L'article présente une revue sur l'utilisation des linéaments pour la cartographie de l'aléa de glissement de terrain. Les linéaments sont normalement obtenus à partir de photographies aériennes ou d'images satellitaires. Les avantages et inconvénients des traitements numériques des images et des interprétations manuelles (visuelles) des linéaments sont discutés. La plupart des chercheurs préfèrent les techniques manuelles, malgré le fait qu'elles sont longues et subjectives, considérant qu'elles permettent un

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meilleur contrôle par l'opérateur. Des moyens d'améliorer l'objectivité dans l'interprétation sont suggérés. On peut espérer que la cartographie de linéaments sera incorporée de façon plus importante dans l'évaluation des aléas de glissement de terrain. C'est pourquoi l'article met l'accent sur la nécessité de bien maîtriser ces méthodes et connaître leurs limites.

Mots clés Aléa de glissement de terrain · Linéament · Subjectivité · Imagerie à distance

Introduction

The structural geology of the area has a significant influence on the occurrence of landslides. One way of incorporating structural information into the landslide hazard assessment is by utilizing lineament mapping (Anbalagan and Singh [1996;](#page-15-0) Atkinson and Massari [1998;](#page-15-0) Nagarajan et al. [2000](#page-17-0); Temesgen et al. [2001;](#page-18-0) Saha et al. [2002](#page-18-0); Lin and Tung [2003](#page-17-0) and many others). Lineament mapping needs to be undertaken with care and with a proper understanding of its methods and limitations. Thus the main objectives of this paper are to review the methods of lineament detection and to suggest the best practice in lineament mapping to be used as part of a landslide hazard assessment.

Lineaments and remote sensing

Numerous terms have been used to describe lineaments, e.g. geologic lineaments, tectonic lineaments, photo lineaments, fracture traces and photo linear or geophysical lineaments, based on the assumed origin of the feature or sometimes the data source from which it has been derived (Sander [2007](#page-18-0)).

Hobbs [\(1904](#page-16-0)) originally proposed the term lineament for significant lines of landscape caused by joints and faults, revealing the architecture of the rock basement. The most widely used definition is by O'Leary et al. ([1976\)](#page-17-0) who described a lineament as a mappable, linear feature of a surface whose parts are aligned in a rectilinear or slightly curvilinear relationship and which differ from the pattern of adjacent features and presumably reflect some sub-surface phenomenon. Haeberlin et al. [\(2004](#page-16-0)) and Gomez and Kavzoglu ([2005\)](#page-16-0) refer to a surface expression that may reveal the hidden architecture of the rock basement. Remote sensing indicates lineaments as lines or linear formations with either lighter or darker pixels compared to the background pixels (Vassilas et al. [2002;](#page-18-0) Kocal et al. [2004\)](#page-17-0). However, sometimes a lineament is clearly shown on the imagery but does not appear to correspond to any observable physical feature. There are sound reasons for assigning a geological meaning to some lineaments even if they do not always correspond to features in the field (Campbell [1987](#page-16-0)), as the feature may be deep seated or partially covered by unrelated strata (Richards [2000](#page-18-0)). Where these unrelated younger strata obscure the geological lineaments in the deep bedrock, with reactivation they often result in an array of brittle fractures on the surface (Leech et al. [2003\)](#page-17-0).

There are two main types of lineament—positive and negative, referring to ridge trends and river valleys respectively. Whilst the topographically negative straight lineaments may represent joints, faults and shear zones, the topographically positive straight lineaments may be interpreted as dykes and dyke swarms (Koch and Mather [1997](#page-17-0); Solomon and Ghebreab [2006\)](#page-18-0). The slightly curved and sub-parallel lineaments indicate foliation or bedding trends, depending on rock type (crystalline or limestone) while circular features may delineate ring dykes (Koch and Mather [1997](#page-17-0)).

As far as landslides are concerned, negative lineaments are more important as the fractures which produce them cause weak lines and increase the probability that a landslide will occur.

Lineaments may be continuous or discontinuous and, under certain circumstances, may be regarded as the surface manifestation of fault and fracture zones (Pal et al. [2006\)](#page-17-0). Furthermore, good correlation between structures mapped in the field and lineament systems has suggested lineaments may be regarded as representative of fracture networks (Morelli and Piana [2006\)](#page-17-0). However, the presence of a dense vegetation canopy, extensive weathering and recent non-consolidated deposits (fluvial terraces, pediments or alluvial sediments) may prevent the identification of lineaments (Cortes et al. [1998;](#page-16-0) Gustafsson [1994](#page-16-0)) whilst not all faults are expressed topographically (Novak and Soulakellis [2000\)](#page-17-0). As a consequence, the lack of expression of a lineament in remote-sensed imagery does not necessary mean that there is no joint or fault in the particular areas. Nevertheless, remote sensing (e.g. aerial photo or satellite imagery) is generally better at identifying these linear or slightly curvilinear features compared with field inspection. The continuity of a fault may also be better shown in satellite imagery because the ''noise'' caused by the high detail offered by aerial photos disappears (Arlegui and Soriano [1998](#page-15-0)).

Remote sensing has been widely used in lineament studies since the introduction of Landsat MSS in 1980. Among the types of remote sensing imagery that have been used for landslide hazard assessment studies are Landsat, IRS, LISS, ASTER, aerial photo, and Spot (Table [1](#page-2-0)). Where possible, the conventional aerial photo is complemented with satellite imagery as a wider synoptic view is more likely to allow long lineaments to be detected. Currently, most researchers use middle resolution satellite imagery which is easier to use and cheaper than aerial photos. Unless archived aerial photos are available, it is expected that this trend will continue, especially as the cost of satellite imagery is expected to decrease in the future.

In addition to landslide hazard assessment, where often the lineament mapping is only briefly referred to, in geological studies there is generally a more extensive discussion of the lineaments. In economic geology, for example, lineaments may indicate natural stopes where minerals are found, while in structural geology they give an almost unparalleled overview of the large structural features, the trends of which may be difficult to identify in the field. An indication of the kind of studies which have used lineament mapping is given in Table [2](#page-5-0).

Generally, Landsat is the most popular satellite imagery (see Table [2](#page-5-0)), probably due to its relatively cheap cost; indeed the archive of Landsat imagery may be downloaded free from the internet. An advantage of the older archival imagery is that it may indicate features not so obvious on the more recent imagery, due to increasing urbanization etc. It should be stressed, however, that where possible the lineament should be ''ground-truthed''.

Lineament interpretation

Two main types of interpretation are used: manual interpretation based on visual interpretation and automatic interpretation utilizing computer algorithms.

Manual lineament interpretation

Conventional lineament interpretation was originally undertaken using hardcopy aerial photos under the stereoscope, where the visually interpreted lineaments are

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delineated on the transparent overlays and transferred to a map. Advances in technology have allowed digital manipulation of the satellite imagery and the exploitation of the 3D environment. The basis of visual interpretation is generally tonal contrast and/or textural pattern (Akman and Tüfekçi [2004;](#page-15-0) Gomez and Kavzoglu [2005;](#page-16-0) Sarup et al. [2006](#page-18-0)). These patterns mainly relate to geomorphological features (Table [3](#page-8-0)).

It is suggested that before lineament delineation is undertaken, the general orientation of the drainage pattern should be considered. As most drainage patterns follow the major lineament trends (Süzen and Toprak [1998](#page-18-0); Devi and Singh [2006;](#page-16-0) Sarup et al. [2006](#page-18-0)), this will give some indication as to the general structural orientation.

The review of the digital processing for visual interpretation summarized in Table [2](#page-5-0) indicates that most researchers utilize standard image processing such as image enhancement and filtering. The techniques include: the application of false colour (Karpuz et al. [1993](#page-17-0); Venkataraman et al. [1997](#page-18-0); Warner [1997;](#page-18-0) Bense [1998](#page-16-0); Moun-trakis et al. [1998](#page-17-0); Cortes et al. [2003](#page-16-0); Akman and Tüfekçi [2004;](#page-15-0) Ali and Pirasteh [2004;](#page-15-0) Ricchetti and Palombella [2005;](#page-18-0) Rao [2006;](#page-18-0) Sarup et al. [2006](#page-18-0); Solomon and Ghebreab [2006;](#page-18-0) Pradhan et al. [2006](#page-18-0)); the application of principal component analysis in RGB (Mountrakis et al. [1998](#page-17-0) ; Solomon and Ghebreab [2006](#page-18-0); Srivastava and Bhattacharya [2006\)](#page-18-0); the combination of satellite bands and principal component band (PC) (Venkataraman et al. [1997;](#page-18-0) Mountrakis et al. [1998;](#page-17-0) Novak and Soulakellis [2000\)](#page-17-0). Some researchers prefer the use of only individual bands; the most popular bands for Landsat TM are band 4 (Sahoo et al. [2000;](#page-18-0) Ali and Pirasteh [2004;](#page-15-0) Juhari and Ibrahim [1997;](#page-16-0) Gomez and Kavzoglu [2005](#page-16-0); Solomon and Ghebreab [2006\)](#page-18-0), band 5 (Arlegui and Soriano [1998;](#page-15-0) Kavak [2005](#page-17-0)) and band 7 (Süzen and Toprak [1998](#page-18-0)) or band ratio (Mountrakis et al. [1998](#page-17-0)). Other techniques include a combination of satellite imagery draped over a digital elevation model (DEM) (Akman and Tüfekçi 2004); fusing of the relatively lower multispectral resolution with the higher resolution pan imagery (Ricchetti and Palombella [2005;](#page-18-0) Mathew et al. [2007\)](#page-17-0); the utilization of a DEM (Pena and Abdelsalam [2006](#page-17-0); Lin et al. [2007](#page-17-0)); and a fusion of the relatively lower multispectral resolution with the higher resolution pan imagery draped over the DEM (Virdi et al. [2006\)](#page-18-0).

Some researchers preferred the analysis to be undertaken using an RGB environment which is in colour and different textural information from three bands can be simultaneously analysed (Karpuz et al. [1993;](#page-17-0) Venkataraman et al. [1997;](#page-18-0) Bense [1998;](#page-16-0) Mountrakis et al. [1998](#page-17-0); Cortes et al. [2003;](#page-16-0) Akman and Tüfekçi [2004;](#page-15-0) Ali and Pirasteh [2004;](#page-15-0) Ricchetti and Palombella [2005](#page-18-0); Rao [2006](#page-18-0); Sarup et al. [2006](#page-18-0); Solomon and Ghebreab [2006](#page-18-0); Warner

[1997;](#page-18-0) Pradhan et al. [2006](#page-18-0)). However a number of researchers have preferred to use the individual band in the greyscale environment (Sahoo et al. [2000;](#page-18-0) Ali and Pirasteh [2004;](#page-15-0) Juhari and Ibrahim [1997](#page-16-0); Gomez and Kavzoglu [2005;](#page-16-0) Kavak [2005](#page-17-0); Solomon and Ghebreab [2006\)](#page-18-0). The main reason is probably individual preference, but it has been shown that the human retina has a high response to high frequency images in black and white, whereas the retina response to colour image is poor at high frequency, improving for broad, spatial features (Pratt [1978](#page-18-0)). This would suggest that interpretations for structural studies such as lineament mapping, where image features are of relatively high spatial frequencies, are better performed on black and white images as opposed to colour images (Drury [1986](#page-16-0); Rothery [1987](#page-18-0); Greenbaum [1987](#page-16-0)).

The combination of the relatively higher resolution pan imagery with multispectral imagery has also been undertaken (Ricchetti and Palombella [2005;](#page-18-0) Virdi et al. [2006](#page-18-0); Mathew et al. [2007\)](#page-17-0). This gives higher resolution data that may improve the interpretation. DEM, from either topographical maps, SRTM or aerial photos, has also been utilized (Pena and Abdelsalam [2006;](#page-17-0) Lin et al. [2007\)](#page-17-0). The application of DEM will undoubtedly improve the interpretation because the introduction of the 3D aspect will enhance the understanding of the topography, which is crucial in lineament interpretation. Thus, draping the satellite imagery over the DEM will introduce a stereo view which may increase the interpretation capability (Akman and Tüfekçi [2004](#page-15-0); Virdi et al. [2006\)](#page-18-0).

Another useful application of DEM for delineating lineaments is by utilizing analytical hill shading. This is a technique for generating shaded topographic images of the earth's surface elevations where the reflection of artificial light arriving from a point source of illumination from a given altitude (inclination) and azimuth (declination) is simulated (Masoud and Koike [2006](#page-17-0)). A DEM could be artificially illuminated from any direction desired, which is not possible in optical satellite imagery. This capability is important where the lighting may be in a perpendicular direction in order to enhance any suspected lineament. Another advantage of the shaded-relief image is that as it only shows bare-ground surfaces, unobscured by any vegetation or land use, lineaments that are difficult to see by the usual methods of aerial photo or satellite imagery interpretation may be identified (Oguchi et al. [2003\)](#page-17-0).

Lineament mapping using hillshade by DEM has been successfully utilized by Oguchi et al. [\(2003](#page-17-0)), Norini et al. [\(2004](#page-17-0)), Concha-Dimasa et al. ([2005\)](#page-16-0), and Andreas and Allan [\(2007](#page-15-0)). However caution is required when utilizing the hillshade illumination as it may general a ''false lineament''. In addition, landforms—which are crucial in lineament identification—are known to appear differently with different solar illumination directions. Smith and Clark ([2005\)](#page-18-0) noticed that a drumlin viewed side on will appear linear, but when viewed head-on can look like a circular hill.

Surprisingly, many of the researchers did not undertake any spatial feature manipulation to filter the image and use the imagery but employed only contrast stretching (Bense [1998](#page-16-0); Mountrakis et al. [1998;](#page-17-0) Novak and Soulakellis [2000](#page-17-0); Cortes et al. [2003;](#page-16-0) Akman and Tüfekçi [2004;](#page-15-0) Pena and Abdelsalam [2006](#page-17-0); Rao [2006](#page-18-0); Virdi et al. [2006;](#page-18-0) Lin et al. [2007\)](#page-17-0). This is probably because they preferred to keep the image in the original condition (rather than filtered) to avoid confusion as the image is maintained as it is visually experienced.

Filtering can be either directional (Karpuz et al. [1993](#page-17-0); Venkataraman et al. [1997;](#page-18-0) Süzen and Toprak [1998](#page-18-0); Sahoo et al. [2000](#page-18-0); Kocal et al. [2004:](#page-17-0) Kavak [2005;](#page-17-0) Solomon and Ghebreab [2006;](#page-18-0) Srivastava and Bhattacharya [2006](#page-18-0); Cengiz et al. [2006\)](#page-16-0) or non-directional (Saha et al. [2002](#page-18-0); Sarup et al. [2006;](#page-18-0) Mathew et al. [2007\)](#page-17-0) or both (Ali and Pirasteh [2004](#page-15-0); Juhari and Ibrahim [1997](#page-16-0); Ricchetti and Palombella [2005](#page-18-0); Pradhan et al. [2006\)](#page-18-0). Most researchers used a high pass filter except Süzen and Toprak [\(1998](#page-18-0)) and Kocal et al.

[\(2004](#page-17-0)) who used a combination of low and high pass filters. The application of the low pass filter before the high pass filter is to filter out the noise first before the high spatial frequency is enhanced (Avery and Berlin [1985](#page-15-0); Süzen and Toprak [1998](#page-18-0)). However, the user should be aware that the application of a directional filter may introduce artefacts as a result of the digital processing of the filter itself and it is sometimes difficult to differentiate between the "true" lineament trends and the artefact (Avery and Berlin [1985](#page-15-0); Drury [1986](#page-16-0); Gupta [1991\)](#page-16-0).

Subjectivity

The subjective nature of any visual interpretive technique, including lineament mapping, means that the result may be controversial (Mabee et al. [1994;](#page-17-0) Gomez and Kavzoglu [2005\)](#page-16-0). To a large extent, the results cannot be reproduced because the identification criteria are not agreed upon by different analysts and usually cannot be expressed in quantitative terms but rather are based on sensory impressions (Wladis [1999\)](#page-18-0). Subjectivity is involved in the identification of the lineament itself, whether it is a lineament or not, and how far the lineament extends. In particular, it may be difficult to position the lineament in a satisfactory manner, especially in highly vegetated or wide valley areas (Gustafsson [1994\)](#page-16-0).

While most researchers are aware of this problem, measures to minimize subjectivity are seldom employed (Mabee et al. [1994\)](#page-17-0). This was found to be generally true in the review undertaken for landslide hazard mapping (Table [1](#page-2-0)); although the subjectivity issue is sometimes mentioned, the measures undertaken to overcome the problem (if any) are not stressed.

The subjectivity can be minimized and confidence in the lineament maps increased through the integration of results from multiple observers (Mabee et al. [1994;](#page-17-0) Sander et al. [1997\)](#page-18-0), or multiple observer trials (Mabee et al. [1994\)](#page-17-0). The latter authors suggest that several operators map the same/ similar locations and that one operator could also observe similar imagery twice with a minimum of one week break between the observations, and that the results are compared, with only the lineaments identified by more than one observer or at least twice by the same observer being used. Such reproducibility tests provide confidence that the feature being mapped is "real" because it can be detected in the repeated trial or by several observers (Mabee et al. [1994\)](#page-17-0).

Automatic lineament extraction

One of the main advantages in the automatic identification of lineaments is its objectivity as it uses computer algorithms. The algorithm may be based on edge enhancement and filtering techniques such as Hough and Haar transforms (Cross [1988;](#page-16-0) Wang and Howarth [1990](#page-18-0); Karnieli et al. [1996](#page-17-0); Majumdar and Bhattacharya [1988;](#page-17-0) Vassilas et al. [2002](#page-18-0)). The principle of these methods is to detect adjacent pixels which abruptly change in grey level by the use of a differential operation (Koike et al. [1995\)](#page-17-0). The Hough Transform is a powerful tool in edge linking for line extraction; the main advantages being its insensitivity to noise and its capability to extract lines even in areas with pixel absence/pixel gaps (Argialas and Mavrantza [2004](#page-15-0)). The transform detects the collinear sets of edge pixels in an image by mapping these pixels into a parameter space (the Hough space) defined in such a way that collinear sets of pixels in the image give rise to peaks in the Hough space (Karnieli et al. [1996](#page-17-0)). The Hough Transform has been utilized successfully in delineating lineaments in many areas, see for example Cross [1988;](#page-16-0) Wang and Howarth [1990](#page-18-0); Karnieli et al. [1996;](#page-17-0) Vassilas et al. [2002;](#page-18-0) Argialas and Mavrantza [2004](#page-15-0) (Table [4\)](#page-10-0).

The Haar Transform provides a transform domain in which differential energy is concentrated in localized regions. It has low and high frequency components and therefore may be used for image enhancement (Majumdar and Bhattacharya [1988](#page-17-0)). This method was successfully used to delineate the major drainage and lineament patterns in part of Cambay Basin in India (Majumdar and Bhattacharya [1988](#page-17-0)).

The main problems with automatic lineament extraction procedures are that in some situations the filtering technique generates segmented images containing numerous spurious lineament pixels that must be eliminated using complicated edge-linking algorithms; and these lineament extraction routines perform indiscriminate extraction of edge pixels without considering the topographic information inherent in remotely sensed images (Raghavan et al. [1995](#page-18-0)). In addition, these techniques cannot effectively extract lineaments from low-contrast areas and in mountain shadows which produce short dense lineaments that are difficult to relate to tectonically significant structures (Koike et al. [1995](#page-17-0)). In order to overcome these problems, the non-filtering technique of the Segment Tracing Algorithm (STA) may be utilized (Koike et al. [1995](#page-17-0)). The principle of the STA is to detect a line of pixels as a vector element by examining local variance of the grey level in the digital image and to connect retained line elements along their expected directions. The threshold values for the extraction and linkage of line elements are direction dependent. The advantages of the proposed method over usual filtering methods are its capability to trace only continuous valleys and extract more lineaments parallel to the sun's azimuth and located in shadow areas (Koike et al. [1995](#page-17-0)). Raghavan et al. [\(1995](#page-18-0)) combined the STA method with the Hough Transform to scan a line-element image in

order to detect continuous grey-level boundaries and generate their final lineament map. This algorithm was named Segment Tracing And Rotation Transformation (START).

In geological studies, the most popular software is the LINE module of the PCI Geomatica which has a similar approach to STA and has been used in hydrogeological, environmental, structural and mineral exploration studies (Hung and Batelaan [2003](#page-16-0); Kocal et al. [2004;](#page-17-0) Hung et al. [2005;](#page-16-0) Mostafa and Bishta [2005](#page-17-0); Sarp [2005\)](#page-18-0). With automated extraction, an understanding of the parameter setting for lineament extraction optimization is crucial (Mostafa and Bishta [2005;](#page-17-0) Sarp [2005](#page-18-0)). Sarp [\(2005](#page-18-0)) compared the accuracy achieved by manual and automatic lineament extraction and found that the reliability of the automatic extraction in identifying faults was much lower than with manual interpretation.

Not surprisingly, none of the landslide hazard assessments reviewed utilized automatic lineament mapping; indeed, as seen in Tables [1,](#page-2-0) [2](#page-5-0) and [4,](#page-10-0) at present more researchers use manual extraction and automatic extraction is generally only used for testing purposes.

In addition to being relatively less reliable than manual interpretation, another reason why automatic extraction is less frequently used is that the program for automatic lineament mapping is still not widely embedded as an option or part of the image processing in commercial remote sensing software. Only PCI Geomatica bundled the automatic lineament extraction, which is probably the reason it is so popular in automatic lineament extraction. It is likely that the automatic lineament program will become more popular if it is available as an option inside general remote sensing software packages rather just with standalone software. It is obviously much easier for the user to just complete the process within an already familiar remote sensing environment and the time taken for researchers to become familiar with a new software environment is undoubtedly a hindrance. In addition, incorporation into general remote sensing software would reduce the need for data conversion as new software frequently only accepts its own image format for a standalone software.

As noted above, automatic mapping requires an understanding of the complex parameter setting that needs to be used in lineament extraction. Adjustments and proper settings are essential so that the optimum parameters are utilized in different illumination conditions and also in different terrain (Argialas and Mavrantza [2004](#page-15-0); Kocal et al. [2004\)](#page-17-0). The variation in the parameter settings chosen by different researchers may also reduce the objectivity of the interpretation. Most of the previous studies utilizing automatic lineament detection have considered the evaluation of the optimum parameter to be utilised in the lineament mapping algorithm (Table [4](#page-10-0)).

In summary, the automatic method seems still in its early stages compared with the manual method and Gustafsson ([1994](#page-16-0)) found it could not identify false lineaments related to roads, power lines and other man-made features which are time consuming to edit.

Lineament and landslide hazard map

Landslide hazard assessment is considered as one of the main aspects of landslide management and can assist in proper urban development and land use planning, avoiding or regulating development in areas which are prone to landslides.

Only a brief discussion on landslide susceptibility or hazard assessment is given here, as the main intention of the paper to discuss the application of lineament mapping and not the landslide susceptibility or hazard assessment itself. For an excellence discussion on landslide hazard assessment, the reader's attention to drawn to Aleotti and Chowdhury ([1999\)](#page-15-0), Dai et al. [\(2001](#page-16-0)), Van Westen et al. (2006) (2006) and Chacon et al. (2006) (2006) .

It is appreciated that there is a difference between hazard and susceptibility maps; the term hazard including the likelihood of the occurrence of a landslide where triggering variables are considered, while the susceptibility map does not includes the triggering variables (Dai et al. [2002](#page-16-0)). Strictly following these definitions, the terms susceptibility and hazard should not be used synonymously, as often observed in literature (Parise [2001](#page-17-0)). However for ease of discussion, only the term landslide hazard will be utilized in this paper.

One of the main aspects in landslide hazard assessment is the combination of pre-disposing factors that contribute to landslide occurrences. The determining factors may be grouped into two categories: (1) the intrinsic variables that contribute to landslide susceptibility, such as geology, slope gradient, slope aspect, elevation, soil geotechnical properties, vegetation cover and long-term drainage patterns; and (2) the extrinsic variables or triggering variables that tend to trigger landslides in an area of given susceptibility, such as heavy rainfall and earthquakes (Dai et al. [2001](#page-16-0)). It is believed that the accuracy of susceptibility mapping increases when all determining parameters are included in the analytical process; however, in reality this is rarely achieved because of the difficulty of obtaining all these data (Ayalew et al. [2004](#page-15-0)) and/or the data are available at very low resolution or at very high cost (Conoscenti et al. [2008\)](#page-16-0).

The most common factors that are incorporated to represent geology in landslide hazard assessment are lithological and structural information on the study area. Generally, a very accurate lithology map is relatively easier

to prepare (and more commonly available) than a structural geology map, but the structural geology of the particular area is known to be one of the main controlling factors in landslide occurrence (Cooke and Doornkamp [1990](#page-16-0)). Structural discontinuities such as joints, faults, foliation and bedding planes form the pre-existing lines of weakness in a rock body. These lines of weakness, often in a fractured zone, are likely to be areas where moisture accumulates and vegetation grows. In addition to indicating lineaments, they affect surface material structures and have a significant influence on terrain permeability and thus slope stability (Nagarajan et al. [1998,](#page-17-0) [2000](#page-17-0); Gomez and Kavzoglu [2005\)](#page-16-0). The presence of moisture will also increase the rate of weathering, further exacerbating the problem of instability. The weak areas commonly are opened up and enlarged by erosion and some may even become small valleys (Ali and Pirasteh [2004](#page-15-0)). The weakness of this line is demonstrated in semi- arid areas where weathering is concentrated around the lineament (Carruthers et al. 1991 in Gustafsson ([1994\)](#page-16-0)).

It is still not common for detailed structural mapping to be undertaken as part of a landslide hazard assessment. Ideally this would involve a detailed survey of the orientation of structural features, but the high cost and difficulty/ lack of accessibility to reasonably unweathered outcrops (especially in tropical countries) are significant deterrents. Many other factors, such as rainfall, land use, landslide distribution and landform mapping should also be incorporated, hence landslide hazard assessment is laborious and time-consuming, especially when manual handling and processing of the data is required (Dai et al. [2001](#page-16-0)). As a consequence, a pragmatic approach has to be taken, with a certain ''give and take'' in balancing the parameters incorporated and the accuracy achieved.

One way of incorporating the structural elements in landslide hazard assessment is by lineament mapping. Although lineament pattern has been shown to be well correlated with landslides (e.g. Atkinson and Massari [1998](#page-15-0); Nagarajan and Khire [1998](#page-17-0); Nagarajan et al. [2000](#page-17-0); Temesgen et al. [2001;](#page-18-0) Saha et al. [2002](#page-18-0); Ambrosi and Crosta [2006;](#page-15-0) Lee and Lee [2006;](#page-17-0) Pradhan et al. [2006](#page-18-0); Yilmaz and Yildirim [2006](#page-18-0)), it is not clear whether lineaments presumed to be of geological origin play an active or passive role in the slope movements, i.e. whether they coincide with a zone of stress concentration, or are simply a zone of weak rock (Ambrosi and Crosta [2006](#page-15-0)).

It is widely observed in the Himalayas that landsliding phenomena are particularly severe close to regional geological lineaments (Pachauri and Pant [1992](#page-17-0); Mathew et al. [2007\)](#page-17-0). However, the relationship is confusing as in some (other) areas, lineaments do not appear to be the main controlling factor. Dai et al. [\(2001](#page-16-0)) and Dai and Lee ([2002\)](#page-16-0) did not use structural information in their study of hazard

assessment in Lantau Island, Hong Kong because the spatial distribution suggested that the correlation between landslides and mapped linear structural features is not good. Many other landslide hazard assessments which did not include structural information have also been reported, e.g. Barredo et al. [2000](#page-16-0); Dai et al. [2001](#page-16-0); Dai and Lee [2002](#page-16-0); Ohlmacher and Davis [2003;](#page-17-0) Perotto-Baldiviezo et al. [2004](#page-18-0); Ermini et al. [2005;](#page-16-0) Ercanoglu [2005](#page-16-0); Guzzetti et al. [2006](#page-16-0); Conoscenti et al. [2008](#page-16-0); Nefeslioglu et al. [2008;](#page-17-0) Thiery et al. [2007](#page-18-0) (see Table [5\)](#page-14-0).

In view of the complex inter-relationships involved in landslides, it is perhaps not surprising that the causative factors included in landslide hazard assessments are not consistent between researchers (Rautela and Lakhera [2000](#page-18-0)). Clearly, there is no general agreement on the scope, techniques and methodologies for landslide hazard evaluation (Guzzetti et al. [1999\)](#page-16-0) as in some areas a certain factor is important while in another region it is not so significant (Nefeslioglu et al. [2008\)](#page-17-0). Thiery et al. [\(2007\)](#page-18-0) stressed that the inclusion of more detailed structural maps (fault and tectonic maps) would give more accurate results. However, where the scale is more than 1:10,000 and for large, complex environments, structural features may be extremely difficult to record because of their spatial variability.

Some of the difficulties involved in preparing detailed structural maps may be overcome by utilising lineament mapping. Lineament studies may help reveal generalities that may assist in understanding the cause of landslides (Ayalew and Yamagishi [2005\)](#page-15-0); most medium to large scale landslides studies tend to focus on general aspects of each of the pre-disposing factors.

Where reliable published structural mapping does not exist, large scale lineaments are commonly extracted through visual interpretation of digital satellite imagery (Fourniadis et al. [2007](#page-16-0)). The fault patterns provide basic information about tectonics, because many faults and crustal fractures correspond with lineaments (Koike et al. [1995](#page-17-0)). A review of the incorporation of lineament information in landslide studies has shown that the most popular representation of lineament analysis is the lineament (or fault or structural) buffer (Table [1\)](#page-2-0) with only Atkinson and Massari ([1998\)](#page-15-0), and Sarkar and Kanungo ([2004\)](#page-18-0) utilizing lineament density and Pachauri and Pant [\(1992\)](#page-17-0), Pachauri et al. (1998) (1998) and Süzen and Doyuran (2004) (2004) using both lineament buffer and density.

The distance of the buffer zones chosen varies from as small as 5 m (Nagarajan et al. [2000](#page-17-0)) up to 2,000 m (Pachauri and Pant [1992](#page-17-0)). Although most researchers did not given their reasons for selecting a particular distance for the buffer zone, a few explained their choice (Table [1\)](#page-2-0) was based on such factors as: field evidence of the extent of fragmented rock either side of the fracture itself (Nagarajan et al. [2000\)](#page-17-0); the maximum landslides were observed to be

within the determined distance from a lineament (Temesgen et al. [2001\)](#page-18-0); an average threshold based on a comprehensive assessment of the distance of slope failures from mountain scarps, topographic breaks and any other linear futures (Ayalew and Yamagishi [2005](#page-15-0)); proximity of existing landslides to lineaments (Mathew et al. [2007](#page-17-0)); field observation of such effects as nappes, thrusts and strike-slip faults (Ruff and Czurda [2008](#page-18-0)). The latter authors reported nappe thrusts were observed in the field as 10– 100 m broad thrust zones within which the bedrock was tectonically stressed and highly unstable while minor thrusts and strike slip faults indicate fault zones only a few meters wide. Lee [\(2004](#page-17-0)) gave convenience of calculation as the reason for choosing the buffer distance when producing a landslide hazard assessment in Boun, Korea; this may also be the explanation for the choice made by researchers who did not give a reason.

Apart from the lineament buffer, lineament density is also used in landslide hazard assessment (Atkinson and Massari [1998;](#page-15-0) Pachauri et al. [1998](#page-17-0); Sarkar and Kanungo 2004 ; Süzen and Doyuran 2004) as it is generally considered the probability of landslides occurring is greater in highly fractured areas (often associated with thrusts and folds; Cortes et al. [2003](#page-16-0)) compared to those with a lower fracture density. Morelli and Piana [\(2006](#page-17-0)) recognized two distinct lineament density patterns in Monferrato, Italy: a high density of long lineaments could correspond to long major fault zones/deep tectonic structures; and short lineaments, especially if widely distributed, are likely to be associated with poorly defined areas where movement at various times has resulted in ''overprinting''/superimposition of several structures.

Lineament density has also been used widely in groundwater studies because of the relationship between fractures and sub-surface permeability (Raju and Reddy [1998;](#page-18-0) Lee [2003](#page-17-0); Andreas and Allan [2007](#page-15-0); Münch and Conrad [2007](#page-17-0); Srivastava and Bhattacharya [2006\)](#page-18-0) which will increase the probability of landslides occurring. In groundwater studies, however, lineament density is a positive effect because of the secondary porosity associated with joints and fracture density (Sree Devi et al. [2001\)](#page-18-0) and the correlation between a high density of lineaments and good groundwater potential (Raju and Reddy [1998](#page-18-0)).

It is often not clear why different researchers have used lineament buffer, lineament density or both. This may be simply convention in that particular area. However, it would appear that utilizing both lineament buffer and density may both produce a more accurate landslide hazard assessment and also introduce more uncertainty. The significance of using either one or both factors when undertaking hazard mapping would be a useful topic for further study.

Apart from those reported by Atkinson and Massari [\(1998](#page-15-0)), Lee ([2004](#page-17-0)), Gomez and Kavzoglu ([2005\)](#page-16-0), Lee and Lee [\(2006](#page-17-0)) and Fourniadis et al. ([2007\)](#page-16-0), most of the studies undertaken included some form of field checking to reduce some of the ''uncertainty'' in lineament mapping (Table [1](#page-2-0)). Field checking is crucial in lineament mapping as "false" lineaments such as roads, field boundaries or other manmade features can be mistakenly identified. Nagarajan et al. [\(1998](#page-17-0), [2000](#page-17-0)) and Rautela and Lakhera ([2000\)](#page-18-0) checked the lineaments in the field. Pachauri et al. [\(1998](#page-17-0)) only used lineaments which conform to major faults. Limited field verification was also undertaken by Pachauri and Pant [\(1992](#page-17-0)), Temesgen et al. [\(2001](#page-18-0)) and Sarkar and Kanungo [\(2004](#page-18-0)). Saha et al. [\(2002](#page-18-0)) and Saha et al. ([2005\)](#page-18-0) checked their results against major known thrusts but did not actually check the lineaments in the field. A combination of published maps and ASTER and DEM derived from the 1:50,000 topographical map was used by Liu et al. ([2004\)](#page-17-0) while Süzen and Doyuran (2004) (2004) verified their work against the geological map, aerial photos and field mapping. Aerial photos at a scale of 1:20,000 and field verification was also used by Ayalew and Yamagishi [\(2005](#page-15-0)).

Perhaps the choice of different methods was related to budget constraints and/or field conditions; some studies only used current geological or structural maps (e.g. Pistocchi et al. ([2002\)](#page-18-0), Lee and Jasmi [\(2005](#page-17-0)), Lee [\(2005](#page-17-0)), Van Den Eechaut et al. ([2006\)](#page-18-0) and Kim et al. ([2006\)](#page-17-0). However the user must aware that some of the geological maps, especially in developing countries have not been updated. For example in Malaysia, some of the geological maps have not been reassessed since 1985 and the original map was based on aerial photo interpretation which could not be field checked due to thick vegetation. From the authors' experience, the geological map published by the Malaysian Mineral and Geosciences Department ([1985\)](#page-17-0) showed the stretch of highway from Simpang Pulai to Pos Selim to be on granite, but field observations after the hillslope had been excavated for the highway construction proved some areas of metasedimentary rock.

It is suggested that lineament mapping is updated either by aerial photo or satellite imagery, ideally followed by field mapping. In reality, however, cost and the lack of availability of fresh outcrops may hinder the field verification. If the lineament been interpreted using satellite imagery, it is crucial that it is subjected to some form of field verification, or at least cross-checked with the geological map in order to reduce the uncertainty, which will affect the quality of the landslide hazard assessment.

Discussion and conclusions

Manual mapping of lineaments requires a high degree of skill and experience in the visual interpretation process and being to a large extent subjective, has limited

Table 5 The application of landslide susceptibility/hazard assessment without using lineament analysis

reproducibility (Gupta [1991](#page-16-0); Mabee et al. [1994;](#page-17-0) Warner [1997;](#page-18-0) Hung et al. [2005](#page-16-0); Gomez and Kavzoglu [2005](#page-16-0)). The advancement of technology has allowed the interpretation to be undertaken automatically and with more objectivity. In addition it is quicker than the manual technique, which is very time consuming especially if regional mapping is concerned (Masoud and Koike [2006\)](#page-17-0). However, the manual method has the advantage of a high degree of fault tolerance and the operator can learn to re-check and distinguish true geological lineaments from non-geological features such as roads, railway lines, power-cables, canals and crop-field boundaries such that, with skill and experience, these will be omitted from the interpretation (Richetti [2001](#page-18-0); Ali and Pirasteh [2004;](#page-15-0) Kocal et al. [2004](#page-17-0); Yassaghi [2006](#page-18-0)). A comparison between the manual process (visual interpretation) and automatic interpretation is in Table [6](#page-15-0).

Table 6 Comparison between visual and the automatic (digital) lineament extraction methods after (Zlatopolsky [1997;](#page-18-0) Hung et al. [2005](#page-16-0) and Yassaghi [2006\)](#page-18-0)

It is anticipated that in the near future lineament mapping will be increasingly used in landslide hazard assessment, especially for moderate and small scale studies. The price of satellite imagery such as Landsat, ASTER and SPOT, Quickbirds and Ikonos is expected to decrease while the cost of the relevant software and easy access of global positional system technology will definitely reduce the cost of this form of lineament mapping.

Concurrent with this trend, it is likely that there will be more studies utilising not only moderate resolution imagery but also high resolution imagery for lineament studies. However, until automatic lineament mapping is more widely available as an option within the commonly used remote sensing software, the manual technique will remain popular. In addition, until automatic processing can take into account such factors as texture, pattern and shape (which may be important in lineament detection), user observation will probably continue to provide the best results (Sarp [2005](#page-18-0)).

Although it is understood that there are many other factors which need to be taken into account in landslide assessment, it is considered that lineament interpretation has a vital role to play and is probably worth more effort in terms of its interpretation. It is suggested that before lineament interpretation is undertaken, the drainage pattern is first analysed so that general lineament pattern of the area is known. The user should also be aware of the advantages and disadvantages of manual and automatic lineament extraction. If manual interpretation is chosen, efforts should be made to reduce the subjectivity inherent in this method, while with automatic lineament mapping, care must be taken in the selection of the parameters to be used. In both cases, ground-truthing should be undertaken.

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