## MODELING THE GLOBAL SOCIETY-BIOSPHERE-CLIMATE SYSTEM: PART 1: MODEL DESCRIPTION AND TESTING

#### J. ALCAMO, G.J.J. KREILEMAN, M.S. KROL, G. ZUIDEMA

National Institute of Public Health and Environmental Protection (RIVM) P.O. Box 1, 3720 BA, Bilthoven, the Netherlands

Abstract. This paper describes the IMAGE 2.0 model, a multi-disciplinary, integrated model designed to simulate the dynamics of the global society-biosphere-climate system. The objectives of the model are to investigate linkages and feedbacks in the system, and to evaluate consequences of climate policies. Dynamic calculations are performed to year 2100, with a spatial scale ranging from grid (0.5° x 0.5° latitudelongitude) to world regional level, depending on the sub-model. The model consists of three fully linked sub-systems: Energy-Industry, Terrestrial Environment, and Atmosphere-Ocean. The Energy-Industry models compute the emissions of greenhouse gases in 13 world regions as a function of energy consumption and industrial production. End use energy consumption is computed from various economic/demographic driving forces. The Terrestrial Environment models simulate the changes in global land cover on a gridscale based on climatic and economic factors, and the flux of CO<sub>2</sub> and other greenhouse gases from the biosphere to the atmosphere. The Atmosphere-Ocean models compute the buildup of greenhouse gases in the atmosphere and the resulting zonal-average temperature and precipitation patterns. The fully linked model has been tested against data from 1970 to 1990, and after calibration can reproduce the following observed trends: regional energy consumption and energy-related emissions, terrestrial flux of CO<sub>2</sub> and emissions of greenhouse gases, concentrations of greenhouse gases in the atmosphere, and transformation of land cover. The model can also simulate long term zonal average surface and vertical temperatures.

Keywords: integrated modeling, integrated assessment, greenhouse gas emissions, global change, climate change, land cover change, C cycle.

## **1. Introduction**

Scientific and policy questions about the global system of society, biosphere and climate are by nature multi-disciplinary, and have local, regional and global aspects. Nevertheless, most global change research focuses on either a single aspect or spatial scale of the system. The objective of the IMAGE 2.0 model described in this paper is to fill in some multi-disciplinary gaps in global change research by providing a disciplinary and geographic overview of the society-biosphere-climate system. It is our belief that this approach can provide new scientific information about the relative importance of linkages/feedbacks in the society-biosphere-climate system, and new policy information linking human activity with its consequences on the global biosphere and climate. The purpose of this paper is to summarize the development and testing of the model, emphasizing its scientific foundation; a companion paper (Alcamo *et al.*, 1994) presents some preliminary applications of the model.

Earlier versions of IMAGE (Integrated Model to Assess the Greenhouse Effect) are described in Rotmans (1990) and Rotmans *et al.* (1990), and are part of the ESCAPE framework presented in CEC (1992). The IMAGE 1.0 model proposed a global-average integrated structure for climate change issues by combining (1) an energy-model for

#### J. ALCAMO ET AL.

greenhouse gas emissions, (2) a global C cycle model and (3) highly parameterized mathematical expressions for global radiative forcing, atmospheric temperature response, and sea level rise (Rotmans, 1990). The global-average calculations of IMAGE 1.0 were useful for evaluating policies at both the Dutch national level and international level (e.g. IPCC, 1990). Following this work, the developers of IMAGE 1.0 contributed to the ESCAPE framework, which combined parameterized global-average climate calculations with grid-based impact calculations for Europe (CEC, 1992). As part of the ESCAPE framework, an innovative approach was taken to estimate emissions from energy (CEC, 1992) and land use (Bouwman *et al.*, 1992) for world regions. The IMAGE 2.0 model contains elements of these two submodels together with several other new submodels.

In comparison to previous integrated models, IMAGE 2.0 covers not only the entire globe, but also performs many calculations on a global grid  $(0.5^{\circ} \times 0.5^{\circ})$  latitude-longitude); this spatial resolution increases model testability against measurements, allows an improved representation of feedbacks, and provides more detailed information for climate impact analysis (discussed further in Sec. 1.2). Moreover, the submodels of IMAGE 2.0 are in general more process-oriented and contain fewer global parameterizations than previous models, which enhances the scientific credibility of calculations (NRP, 1993). Of course, these developments also add greatly to the computational and data handling tasks of the model.

## 1.1 OBJECTIVES OF THE MODEL

The scientific goals of the IMAGE 2.0 model are:

- To provide insight into the relative importance of different linkages in the societybiosphere-climate system;
- To investigate the relative strengths of different feedbacks in this system;
- · To estimate the most important sources of uncertainty in such a linked system and
- To help identify gaps in knowledge about the system in order to help set the agenda for climate change research.

The policy-related goals of the model are:

- To link important scientific and policy aspects of global climate change in a geographically-explicit manner in order to assist decision making;
- To provide a dynamic and long-term (50 to 100 years) perspective about the consequences of climate change;
- To provide insight into the cross-linkages in the system and the side effects of various policy measures;
- To investigate the influence of economic trends and technological development on climate change and its impacts and
- To provide a quantitative basis for analyzing the costs and benefits of various measures (including preventative and adaptive measures) to address climate change.

These objectives steer the design and development of the model. The accomplishment of

some of these goals are illustrated by model applications in Alcamo et al. (1994).

1.2 MODEL SUB-SYSTEMS

The model consists of three fully linked sub-systems of models (Figure 1):

- The Energy-Industry System;
- · The Terrestrial Environment System and
- The Atmosphere-Ocean System.

The *Energy-Industry* models compute the emissions of greenhouse gases in 13 world regions as a function of energy consumption and industrial production. End use energy consumption is computed from various economic driving forces. The following submodels are included: Energy Economy, Energy Emissions, Industrial Production, and Industrial Emissions.

## IMAGE 2.0 Framework of Models and Linkages



Figure 1: Schematic diagram of IMAGE 2.0 showing its framework of models and linkages.

#### J. ALCAMO ET AL.

The *Terrestrial Environment* models simulate the changes in global land cover on a grid-scale based on climatic and economic factors. The role of land cover and other factors are then taken into account to compute the flux of  $CO_2$  and other greenhouse gases from the biosphere to the atmosphere. This sub-system includes the following submodels: Agricultural Demand, Terrestrial Vegetation, Land Cover, Terrestrial Carbon, and Land Use Emissions.

The *Atmosphere-Ocean* models compute the buildup of greenhouse gases in the atmosphere and the resulting zonal-average temperature and precipitation patterns. The following sub-models are included: Atmospheric Composition, Zonal Atmospheric Climate, Oceanic Climate, and Oceanic Biosphere/Chemistry.

One of the main scientific contributions of IMAGE 2 is its representation of many of the important feedbacks and linkages between models in these sub-systems, and between sub-systems. The sub-systems are described in Sections 2 to 4 of this paper.

## 1.3 TEMPORAL AND SPATIAL SCALES

In order to provide a long-term perspective about the consequences of climate change, the model's time horizon extends to year 2100. The time steps of different submodels vary, depending on their mathematical and computational requirements, but typically vary from one day to five years.

Another goal of the model is to provide as much information as possible on a grid of  $0.5^{\circ}$  latitude by  $0.5^{\circ}$  longitude. This is because nearly all potential impacts of climate change (e.g., impacts on ecosystems, agriculture, and coastal flooding) have a strong spatial variability. Moreover, land use-related greenhouse gas emissions (e.g., N<sub>2</sub>O from soils or NH<sub>4</sub> from agricultural activities) greatly depend on "local" environmental conditions and human activity. In addition, climate feedbacks, such as the effect of temperature on soil respiration or the effect of changing CO<sub>2</sub> levels on plant productivity also vary substantially from location to location. There are two additional reasons for computing grid-scale information. First, policy makers are interested in regional/national policies to address climate change. Indeed most climate policies are location-specific (e.g. sequestering carbon in forest plantations, or reducing N<sub>2</sub>O by modifying agricultural practices). Second, grid-scale information makes model calculations more testable against observations as compared to more aggregated models.

Nevertheless, we are unable at this time to provide grid-scale calculations for all components of climate change. In particular, this is infeasible for economic calculations because of the difficulty in specifying economic/demographic factors (e.g. trade relationships, technological development, and similar data) on a country- or sub-country scale for the entire world over the long time horizon of the model. As an intermediate step, economic calculations are performed for 13 world regions (Figure 2), which follows common practice in global economic studies. The criterium for grouping countries together in a particular region is mainly economic similarity, and our grouping conforms somewhat to that used by the IPCC, OECD, U.N., and other international organizations. A list of countries comprising the world regions is given in Appendix 1. (We should note that



Figure 2: Aggregation of countries into world regions in IMAGE 2.0.

these organizations themselves do not have a common method for aggregating countries.) However, the IMAGE 2.0 model has the additional requirement that countries within a region be adjacent or nearby because of the model's approach to global land cover simulation (see below).

## 1.4 A NOTE ON MODELING APPROACH

Since the IMAGE 2.0 model is based on large global data sets and poorly-understood global processes, it is unavoidable that many parameters are ill-defined and have large degrees of freedom. With this in mind, our basic approach is to propose submodels that have comparable level of process detail, and to adjust a limited number of parameters with greatest degree of freedom to obtain model calculations in reasonable agreement with 1970-90 data. We selected the period 1970-90 because of data availability, although we intend to test the model against data from a longer historical period. We first tested individual submodels and adjusted their parameters, then linked and tested the three subsystems of models, and finally the fully linked model. In the following paragraphs we

identify the key parameters that can be adjusted in each of the submodels. Results of the fully linked model are presented in Section 5.

Of course, this procedure does not ensure that adjusted parameters and other inputs will be correct for scenario analysis under changed economic and environmental conditions; nevertheless, it does indicate the adequacy of the model in explaining global changes that occurred during the 1970-90 period, such as the increase in energy-related emissions, estimated changes in deforestation rate and terrestrial carbon fluxes, and the build-up of various greenhouse gases in the atmosphere.

## 2. Energy-Industry System of Models

The objective of the *Energy-Industry* system of models is to compute the emissions of greenhouse gases from world regions as a function of energy consumption and industrial production. The models are designed especially for investigating the effectiveness of improved energy efficiency and technological development on future emissions in each region, and can be used to assess the consequences of different policies and socio-economic trends on future emissions.

2.1 ENERGY ECONOMY MODEL

The *Energy Economy* model divides the energy economy of each world region (Figure 2) into five energy sectors (Table 1) and computes the demand for end use "heat" and "electricity" in each of these sectors (six energy carriers are included, Table 1). Such an end use approach makes it easier to assess the potential of energy conservation measures in reducing overall energy consumption and, in turn, in reducing greenhouse emissions. Details of the models are given in de Vries *et al.* (1994).

The end use heat and electricity is computed from elasticity functions that relate

Energy Carriers	Energy Sector	Corresponding Activity Level
Coal	Industry	Value-added industrial production
Oil	Transportation	Number of vehicles
Fuelwood	Residential	Personal expenditures
Other Biomass	Commercial	Value-added commercial services
Electricity	Other	GNP

TABLE 1 End Use Energy Carriers and Sectors in Energy Economy Model

"activity levels" of each sector (Table 1) with end use energy consumption. Elasticity coefficients are derived for each world region with data from 1970 to 1990. The computation of end use energy also includes an energy conservation function which relates energy prices from 1970 to 1990 with the motivation for energy conservation during that period. The main adjustable variables in the model are the parameters of this energy conservation function, and the above elasticity coefficients, the main driving forces in the model are regional changes in population and GNP.

The computed end use electricity in each sector is converted into a required power plant capacity by taking into account an average power conversion rate for each region. The final step of calculations is to compute primary consumption of energy by specifying a region-specific fuel mix to deliver the end use heat in each sector, and to fulfill the required power plant capacity.

## 2.2 ENERGY EMISSIONS MODEL

The *Energy Emissions* model applies emission coefficients to the energy consumed in each energy sector to compute the amount of  $CO_2$ ,  $CH_4$ ,  $N_2O$ , and other greenhouse gases released from each region (Table 2). These sector-specific emission coefficients are obtained from the literature, but adjusted within their known range until good agreement is obtained between model calculations and data for global and regional emissions in 1990. In addition, the model takes into account emissions of  $CH_4$  that are related to fuel transportation/transformation such as  $CH_4$  leakage from natural gas pipelines. Because the Energy Emissions model is linked to the Energy Economy model, the model user can investigate emissions by altering the fuel mix in a sector, or by improving the efficiency of different technologies used to provide energy. In addition, control strategies of non- $CO_2$  gases can be investigated by prescribing reductions of gases due to abatement technologies.

## 2.3 INDUSTRIAL PRODUCTION AND INDUSTRIAL EMISSIONS MODELS

The Industrial Production and Emissions models are used to compute emissions of greenhouse gases or their precursors that are not directly associated with energy combustion. (Emissions coming from the combustion of fuel by industry are taken into account in the "Industry" sector of the Energy Emissions model described above.) Examples of these emissions are: halocarbon emissions from refrigerators and industrial products,  $CO_2$  from the cement industry, and VOCs from chemical manufacturing. Because emissions are related to the level of industrial activity, future activity is computed by the Industrial Production model which uses a simple indexing method to compute future industrial output in different regions.

## 2.4 LINKAGES OF ENERGY/INDUSTRY WITH THE REST OF IMAGE 2.0

In the Atmospheric Composition model (see below), emissions from the Energy-Industry

	ases accounted for in the IMAGE 2.0 mo	uci.
Source	Greenhouse Gas	IMAGE 2.0 Submodel**
Fuel combustion in end use sectors (Table 1).	$CH_4$ , $CO$ , $CO_2$ , $NO_x$ , $N_2O$ , $VOC$	EE
Energy conversion, transformation and transportation.	$CH_4$ , CO, CO <sub>2</sub> , NO <sub>x</sub> , N <sub>2</sub> O, VOC	EE
Industrial processes	N <sub>2</sub> O, VOC, halocarbons	IE
Cement manufacturing	CO <sub>2</sub>	IE
Wetland rice fields	CH <sub>4</sub>	LUE
Natural wetlands	CH <sub>4</sub> *	LUE
Landfills	CH <sub>4</sub>	LUE
Animal enteric fermentation	CH <sub>4</sub>	LUE
Animal waste	CH <sub>4</sub> , N <sub>2</sub> O	LUE
Natural soils	N <sub>2</sub> O*	LUE
Fertilized soils	N <sub>2</sub> O*	LUE

CH<sub>4</sub>, N<sub>2</sub>O

CO,\*

TABLE 2

Main sources of greenhouse gases accounted for in the IMAGE 2.0 model

Emissions calculated on grid-scale. Regional totals calculated for other sources.

\*\* EE = Energy Emissions model,

Biomass burning (Deforestation, agricultural

waste burning, savanna burning)

Aquatic sources

Soil Respiration

IE = Industrial Emissions model,

CH<sub>4</sub>\*,CO\*,CO<sub>2</sub>\*, NO<sub>x</sub>\*, N<sub>2</sub>O\*, VOC\*

LUE

TC

LUE, TC

LUE = Land Use Emissions model.

TC = Terrestrial Carbon model

sub-system of IMAGE 2.0 are added to emissions of CO<sub>2</sub> and other greenhouse gases coming from the terrestrial biosphere; the model then computes the resulting build-up of greenhouse gases in the atmosphere. The Energy-Industry sub-system is also linked to other parts of IMAGE 2.0 via the demand for fuelwood; this demand is computed in the Energy Economy model and then used by the Land Cover model (described below) to compute new deforested areas. (However, only part of the fuelwood demand is assumed to lead to deforestation). The Terrestrial Carbon model (also described below) computes the change in terrestrial carbon flux owing to fuelwood extraction. Biofuel demands computed by the Energy Economy model are also taken into account in the Land Cover model as an additional demand for land competing with the demand for land to satisfy food demand. This linkage allows the model to comprehensively evaluate the effect of using biofuels on greenhouse gas emissions. No feedbacks of global change on energy use are taken into account.

## **3.** Terrestrial Environment System of Models

The aim of the *Terrestrial Environment* system of models is to simulate global land cover on a grid-basis, and its effect on greenhouse gas emissions and carbon flux from the biosphere to the atmosphere. This set of models can be used to evaluate the effectiveness of land use policies for controlling the build-up of greenhouse gases including changed agricultural practices or sequestration of carbon in forest plantations. They can also be used to evaluate the impact of climate change on global ecosystems and agriculture.

## 3.1 AGRICULTURAL DEMAND MODEL

Transformations of global land cover are strongly related to changing land use for agricultural products, which require croplands, pasture land, rangelands, and managed forests. The purpose of the Agricultural Demand model is to estimate the societal demands for agricultural products that lead to significant land use demand. These calculations are performed for the same 13 world regions as used in Energy-Industry system (Figure 2) and using the same main driving factors (population, GNP), and are detailed in Zuidema *et al.* (1994).

The Agricultural Demand model begins by calculating the per capita human consumption for different crops and meat products based on an assumed elasticity relationship between consumption and per capita income. These elasticity coefficients are estimated from 1970-90 data of the U.N. Food and Agriculture Organization, and are the main adjustable parameters in the model. Total human (as opposed to animal) demands for these products are then computed for a given income and population scenario. The same procedure is followed to compute the total demand for meat in a region.

The demand for meat is converted into a required number of livestock, and feed requirements of animals are divided into "concentrates" from crops and crop residues, and "roughage" from rangeland and pasture land. The demand for animal feed concentrates adds to the demand for crops computed above for the human population. These two factors together lead to the total regional demand for crops and other non-meat agricultural products. This demand is converted into actual cropland demand in each region by taking into account export and import from each region. The demand for animal feed roughage is converted into a demand for grassland by taking into account the average amount of rangeland required per animal.

World timber production and trade is currently not included in the model, but demand for fuelwood is computed in the Energy Economy model (described above). Similarly, world food trade is presently prescribed rather than computed by the model, although it is planned to include a simple trade model in the next version.

3.2 TERRESTRIAL VEGETATION MODEL

Global land cover transformations depend not only on demand for land, but also on its potential. The purpose of this model is to compute "potential land cover", i.e. the potential

vegetation and potential crop productivity in a global grid for a given climate and soil. This model is described in Leemans and van den Born (1994). Calculations are performed on a spatial grid of 0.5° latitude by 0.5° longitude.

Two different models make up the Terrestrial Vegetation model:

A modified version of the BIOME model (Prentice *et al.*, 1992) is used to compute potential vegetation. The basic idea of this model is that global vegetation patterns can be derived by conglomerations of *plant functional types*, each having definable environmental constraints. If environmental conditions can be described at a particular site (e.g., mean coldest-month temperature, and effective temperature sums), then the types of plants which occur can also be predicted. Different plant types are then aggregated into the land cover categories of IMAGE 2.0 (described below under Land Cover model.) This aggregation procedure is the main way to calibrate the model to current vegetation. In the present version of the model the use of the BIOME model is limited. Land cover is initialized according to Olson *et al.* (1985). The BIOME potential vegetation is allocated to a cell only when it is abandoned agricultural land. Full use of the BIOME model will be made in the next version of the IMAGE 2 model.

The FAO Crop Suitability model (FAO, 1978) computes the potential productivity of eight crop classes on a global grid. These are the "constraint-free rain-fed yields" based exclusively on local climatic conditions. First, the potential growing period of a particular crop is estimated from local temperature and moisture conditions. If the growing period is found to be sufficient for a particular crop, then its potential productivity is estimated from a simple relationship between the crop's rate of photosynthesis and local climatic variables.

The climate-related yields computed by the FAO model are adjusted for grid-specific soil conditions by a "soil factor" (ranging from 0.1 to 1.0) which takes into account three soil quality indicators: (i) nutrient retention and availability, (ii) level of salinity, alkalinization, and toxicity, (iii) and rooting conditions for plants (related to soil texture), all three assumed to be constant in time.

## 3.3 LAND COVER MODEL

This model simulates land cover transformations on a global grid by reconciling the regional demand for land use with the "local" potential for land. The model is described in detail in Zuidema *et al.* (1994). The two main inputs to the model are (1) regional demands for cropland and rangeland (from the Agricultural Demand model) and fuelwood demand (from the Energy Economy model), and (2) "local" potential for land (from the Terrestrial Vegetation model). Table 3 gives an overview of the factors taken into account to compute global land cover.

Global land cover is divided into 17 categories (see Figure 5a) on a global grid of  $0.5^{\circ}$  latitude by  $0.5^{\circ}$  longitude; these categories are aggregated from the 51 categories in Olson's (1985) data base. We use Olson's data to initialize the model in 1970. Land use demands for different types of cropland are satisfied by a single land cover category --

Factors	Included	in	Calculation	of	Land	Use	Demand	and	Land	Cover	Potential	in	Terrestrial	Environment
System of IMAGE 2.0.														

Factors For Land Use Demand	Factors for Land Cover Potential			
Demand for 8 classes of crops	Climate-limited potential productivity of 8 classes of crops			
Demand for 4 classes of livestock	Reduction to crop productivity due to local soil conditions			
Demand for fuelwood	Land requirement per unit livestock			
Land for biofuels and plantations	Climate-limited potential vegetation types (other than crops)			

"agricultural land", while the demand for rangeland can be satisfied by several types of grassland, depending on what exists "locally" -- warm grassland, cool grassland and tropical dry savanna. We assume that in Africa, India plus S. Asia and East Asia, urban residential fuelwood demand leads to forest clearing and subsequently to another land cover type (Zuidema *et al.*, 1994).

The basic idea of the Land Cover model is to change gridded land cover within a "world region" until the total demands for the region are satisfied. (For this reason, countries within a region must be geographically close to one another.) In a sense the model produces pictures of future landscapes logically consistent with demand and potential. Of course, satisfying the demands of a world region by increasing agricultural production anywhere within its territory is an unsatisfactory assumption. Yet the alternative -- taking into account country-scale or grid-scale land use demands -- is infeasible at this time because of the data and analysis necessary for estimating these demands for the entire world and over a long projection period. The model takes into account several types of land conversion including many crucial to global change such as tropical deforestation arising from demand for cropland and rangeland or demand for fuelwood, or reforestation of abandoned agricultural land.

In order to satisfy the regional agricultural demand correctly, we would need to fully comprehend the basic driving forces of land cover transformations. Since these forces are in general poorly understood, our approach is to prescribe transparent, logical "rules" to match land demand with potential. These land use rules are tested to see if they can explain known transformations of land cover from 1970 to 1990. If they can explain historical changes, they can also provide some basis for simulating future land use changes. These rules, together with a "management factor" (which takes into account the effect of technology on yield per hectare), are the main adjustable variables in the model. As an example of their straightforward nature -- there are two weighted rules that guide the assignment of new agricultural areas: (1) new areas should occur adjacent, if possible, to existing agricultural land (because of availability of transport, infrastructure, and population), and (2) new areas should occur in locations of highest potential productivity. Similar sets of rules are specified to satisfy fuelwood and rangeland demand. The model is calibrated by adjusting the management factor until the computed coverage of agricultural land in each region agrees with FAO estimates (FAO, 1992).

## TABLE 3

#### 3.4 TERRESTRIAL CARBON MODEL

Because  $CO_2$  is the most important contributor to global radiative forcing, it is of particular importance to accurately estimate its global sources and sinks. Elsewhere in IMAGE 2.0, we compute the source of  $CO_2$  from fossil fuel combustion (Energy Emissions model), and its net geochemical sink in the ocean (Ocean Biosphere/Chemistry model). In the Terrestrial Carbon model we estimate the sources, sinks, and reservoirs of C in the terrestrial biosphere resulting from natural processes and human disturbances. The model is described in detail in Klein Goldewijk *et al.* (1994). This is a grid-scale adaption of the terrestrial part of the C cycle model proposed by Goudriaan and Ketner (1984).

The model describes the  $CO_2$  flux of the biosphere by computing Net Ecosystem Productivity (NEP), i.e. the difference between  $CO_2$  assimilated by Net Primary Productivity (NPP) and  $CO_2$  released by organic decay processes. NPP is pre-defined by land cover category, but scaled to temperature and moisture availability in order to take into account a possible change in productivity if local climate changes. The initial NPP is the main adjustable parameter of the model.

To properly take into account organic decay processes, the reservoirs and fluxes of C within each land cover type are estimated. First, the C in living plant material is partitioned into different biomass components: leaves, branches, stems and roots. Next, rates of decay to non-living matter (litter, humus and charcoal) are assigned based on turnover times of the living plant materials. Last, the decay of non-living matter leads to release of  $CO_2$ .

It is often assumed that C in natural ecosystems is in equilibrium with the atmosphere and thus have a NEP of zero, implying no net release of  $CO_2$  to the atmosphere. However, when land is converted from one type to another, this balance is disturbed. To compute  $CO_2$  flux due to human disturbances, we make a consistent set of assumptions regarding the fate of biomass under each type of conversion (e.g. forest to grassland, or grassland to agriculture). For instance, when a tropical forest grid cell is converted to either grassland or agricultural land, it is assumed that certain fractions of its biomass components are burned on-site, immediately releasing  $CO_2$ . In addition, the remaining biomass is allocated to non-living C reservoirs which may accelerate decay processes, and the new land cover type often has a lower NPP; the sum of these changes may result in an additional long term low flux of  $CO_2$  from this location. Other land conversions are treated in a similar way, with assumptions being made about the fraction of biomass burned and the allocation of remaining biomass.

The model also takes into account various feedbacks to the biosphere including the effect of moisture availability and temperature on soil respiration, and the effect of temperature and  $CO_2$  on NPP (" $CO_2$  fertilization"). The  $CO_2$  fertilization effect, in turn, takes into account local limitations to enhanced C uptake due to temperature, moisture availability, nutrient availability and elevation. Both global warming and the rising concentration of  $CO_2$  constantly change the equilibrium state of C in the natural ecosystem to which the actual ecosystem is approaching.

## 3.5 LAND USE EMISSION MODEL

In this model we compute emissions of CO,  $CH_4$ ,  $NO_x$ ,  $N_2O$ , and VOC stemming from different types of land use/cover (Table 2). (The flux of  $CO_2$  from the terrestrial environment is computed by the Terrestrial Carbon model described above). The Land Use Emissions model is described in Kreileman and Bouwman (1994). Land cover patterns and transformations computed by the Land Cover model are used for calculations in this submodel, together with emission coefficients and additional data. The emission coefficients are the main adjustable parameters of the model. Some of the more important processes covered by the model are:

Biomass Burning (Forest, Grassland, Savanna, Agricultural waste). The clearing and burning of vegetation releases not only  $CO_2$  but other greenhouse gases as well. The emissions of CO,  $CH_4$ ,  $N_2O$ ,  $NO_x$ , and VOCs are estimated by using a fixed ratio between these compounds and emitted  $CO_2$  (as calculated by the Terrestrial Carbon model). The C release by seasonal burning of savanna and agricultural waste is assumed to be compensated for by subsequent vegetation. For these sources only the net emissions of non  $CO_2$  gases are taken into account.

Animals, Livestock. Enteric fermentation of animals is a significant source of atmospheric  $CH_4$ . To obtain total regional emissions, the total number of animals in a region are computed by the Agricultural Demand model and this number is multiplied by a fixed emission factor per animal.

*Natural Wetlands.* Anaerobic biological processes in wetlands are estimated to be a large source of  $CH_4$ . The area of wetlands is included in the land cover data base, and are multiplied by a fixed emission factor to obtain  $CH_4$  emissions.

Irrigated Rice Fields. Anaerobic decomposition in rice paddies is an important source of atmospheric  $CH_4$ . The total rice-growing area is estimated by the Land Cover model described above based on regional rice demands, and this area is multiplied by a fixed emission factor to compute  $CH_4$  emissions.

Other Sources of Greenhouse Gases. Additional sources of greenhouse gases included in the model are landfills, animal waste, agricultural residue burning, and natural soils (Table 2).

## 3.6 LINKAGES WITHIN THE TERRESTRIAL ENVIRONMENT SYSTEM

The models within the Terrestrial Environment system are linked in a straightforward way. Nevertheless, some of these linkages deserve attention since they represent important feedback processes that are not usually considered.

In the grid-based part of the computations climate indices play an important role. These indices determine not only the potential vegetation at a specific location, but also the potential productivity of crops at that location, some of the main quantities in the C cycle simulation (eg. NPP) and emissions of non  $CO_2$  gases (eg.  $CH_4$  from rice paddies). The climate indices are, of course, shared by the models within the Terrestrial Environment system. In this way the changes in land cover, the changes in the terrestrial C cycle, and the

changes in land cover related emissions of non CO<sub>2</sub> gases are inherently consistent.

Another obvious link concerns the effect of changing land cover on emissions. Increasing agricultural demand can lead to expanding agricultural area and shrinking area of natural vegetation. In this way anthropogenic influences also affect the natural emissions of greenhouse gases, a feedback process that is usually not represented in emissions scenarios (IPCC, 1990; IPCC, 1992).

## 3.7 LINKAGES OF THE TERRESTRIAL ENVIRONMENT SYSTEM WITH THE REST OF IMAGE 2.0

Emissions from the terrestrial environment are combined with emissions from the global energy system (calculated by the Energy/Industry models) and are input to the Atmosphere-Ocean models in order to compute the build-up of greenhouse gas concentrations and the resulting radiative forcing and global temperature and moisture patterns. The computed change in climate and  $CO_2$  are then fed back to the Terrestrial Environment System to calculate changes in potential vegetation, potential crop productivity, NPP, and so on.

Changes in land cover are used by the Zonal Atmospheric Climate model to re-compute latitudinal-average albedo. Changes in albedo may affect the zonal energy balance.

We have already referred to the link between the Industry-Energy and Terrestrial Environment subsystems via the demand for fuelwood and biomass. The additional demand for land owing to these fuel demands are taken into account in the Land Cover model.

## 4. Atmosphere-Ocean System of Models

The purpose of this system of models is to compute the build-up of greenhouse gases in the atmosphere and the resulting change in global temperature and precipitation patterns. A detailed overview of this system is given in de Haan *et al.* (1994). The basic idea of these models is to compute transient changes in climate resulting from changes in greenhouse gas emissions, and to do it in a way that is more computationally economic than a general circulation model (GCM). This makes it feasible to dynamically link the Atmospheric-Ocean models with the Energy-Industry and Terrestrial Environment sets of models described above, and makes it possible to use the entire IMAGE 2.0 model iteratively for policy analysis.

Unlike most GCMs used up to now, the model includes not only  $CO_2$ , but all major greenhouse gases explicitly in its radiative scheme. Consequently the model can be used to analyze such problems as the effect of a shift in energy supply from oil to biofuels. Such a shift will reduce  $CO_2$  emissions but enhance non- $CO_2$  emissions.

The tradeoff of using the present set of atmosphere-ocean models is a lower degree of scientific realism as compared to a GCM, in that IMAGE 2.0 parameterizes many atmospheric/oceanic processes that are explicitly described in a GCM. As an example,

zonal heat circulation in IMAGE 2.0 is parameterized as a diffusion process by a few simple expressions based on observations, whereas it is usually explicitly calculated in GCMs. Furthermore, IMAGE 2.0 requires GCM results to scale down zonal average temperature and precipitation patterns to the grid level (see discussion of linkages below).

## 4.1 Atmospheric Composition Model

As a starting point,  $CO_2$  and other emissions as well as C sequestration computed by the Terrestrial Environment System are combined with emissions from the Industry-Energy System and are input to the Atmospheric Composition model. This model is described in Krol and van der Woerd (1994). The temporal trends of the average tropospheric concentration of the following gases are computed:  $CO_2$ ,  $CH_4$ ,  $N_2O$ , CFCs and other halogenated species,  $O_3$ , OH radicals, and CO. The influence of emissions of  $N_2O$  and NMHCs on atmospheric composition are accounted for. Although simple, the model does explicitly describe the non-linear relationship between chemical species most relevant to radiative forcing.

The calculation of  $CO_2$  takes into account the fluxes between the atmosphere, ocean and biosphere. Computation of  $CH_4$  includes anthropogenic and natural sources, and losses by deposition onto the biosphere, dispersion from the troposphere to stratosphere, and oxidation by OH radicals. Because of the importance of the OH sink, the level of OH is explicitly computed, taking into account loss through CO oxidation. Tropospheric levels of N<sub>2</sub>O and CFCs are computed using fixed atmospheric lifetimes.

To compute tropospheric  $O_3$ , the model takes into account its precursors,  $NO_x$ ,  $CH_4$  and CO. For the lower stratosphere, the level of  $O_3$  is parameterized by the availability of free Cl and in the upper stratosphere by the levels of Cl and active N and ambient temperature. The parameterizations used for  $O_3$  and other calculations in the Atmospheric Composition model are derived from "multi one-dimensional" atmospheric chemistry models (Thompson *et al.*, 1989).

The level of sulphate aerosol is computed in a very provisional way by scaling the current spatial distribution of sulphate aerosol to the trend of global sulphur emissions. We distinguish between the sulphate aerosol originating from anthropogenic and biogenic sources. Hence, for scenario analysis, we can in a very preliminary fashion, take into account the different trends in anthropogenic versus biogenic sulphur emissions.

## 4.2 ZONAL ATMOSPHERIC CLIMATE MODEL

In the second part of the computations, the Zonal Atmospheric Climate model uses the computed atmospheric levels of greenhouse gases and sulphate aerosol together with other data, to compute the earth's energy balance (de Haan *et al.*, 1994). First, the radiative forcing due to greenhouse gases ( $H_2O$ ,  $CO_2$ ,  $CH_4$ ,  $N_2O$ ,  $O_3$ , CFC-11 and CFC-12) is computed using shortwave and longwave parameterizations from MacKay and Khalil (1991). Also included is the cooling effect of backscattering of solar radiation on sulphate aerosol. For radiative forcing calculations, the atmosphere is divided into 18 layers.

Next, the earth's heat balance is computed in eight vertical layers and along  $10^{\circ}$  latitudinal bands using a set of heat balance equations for the atmosphere and surface heat exchanges with land and ocean (Peng *et al.*, 1982). Temperature is the only prognostic variable in the model in that all processes are parameterized relative to a temperature field which depends on latitude and altitude. Horizontal heat and moisture transport is treated in a simple way by assigning constant diffusion coefficients, and vertical transport by an altitude-dependent diffusion coefficient. As noted previously, surface albedo includes the effect of changing land cover computed by the Land Cover model. Both sea-ice coverage of the oceans and snow coverage of land are parameterized to surface temperature, and cloud cover is represented as a single effective layer. The height and optical thickness of clouds are the main calibration variables in the model.

The main output of the model is annual average surface air temperatures in  $10^{\circ}$  latitudinal bands covering the entire globe, both land and ocean. The model also makes a crude estimate of average latitudinal precipitation rate by taking the difference between computed rates of surface evaporation and divergence of H<sub>2</sub>O.

4.3 OCEANIC CLIMATE MODEL

In order to accurately calculate the energy balance and  $CO_2$  level of the atmosphere, it is necessary to account for the ocean's role as an enormous sink of heat and  $CO_2$ . This is done in the IMAGE 2.0 ocean models (de Haan *et al.*, 1994). In the Oceanic Climate model, the world's oceans are divided into vertical layers of 400m thickness, and horizontal segments of 10° latitude, in order to link with the latitudinal bands of the Zonal Atmospheric Climate model.

Advective circulation in the world's oceans is prescribed in the model based on the "conveyor belt" concept of Broeker and Peng (1982), and includes both horizontal flow, as well as upwelling and downwelling estimates. Dispersion coefficients are adjusted so that the model agrees with observed profiles of <sup>14</sup>C and <sup>3</sup>H. By representing the ocean's circulation patterns, the model can estimate the dispersal of heat via horizontal and vertical transport.

## 4.4 OCEAN BIOSPHERE/CHEMISTRY MODEL

To correctly compute  $CO_2$  levels in the atmosphere it is also important to take into account the ocean's physical/chemical uptake of  $CO_2$ , as well as the flux of C from oceanic phytoplankton. These processes are covered by the Ocean Biosphere/Chemistry model (de Haan *et al.*, 1994; Klepper *et al.*, 1993). The physical-chemical uptake of  $CO_2$  at the ocean-atmosphere interface is treated in the conventional way by taking into account temperature-dependent equilibria between atmospheric  $CO_2$  and aquatic carbonate compounds. The role of oceanic phytoplankton in releasing and assimilating  $CO_2$  is represented by non-linear equations relating nutrients, light, and temperature to phytoplankton growth. Also included is the process by which non-living organic matter sinks to lower oceanic layers, serving as a "carbon pump" of atmospheric  $CO_2$ . While this carbon pump is not thought to be important now, it may play a role in future build-up of atmospheric  $CO_2$  if oceanic circulation changes. The sensitivity of the model to such changes is investigated by changing the ocean circulation in a prescribed way, see for instance de Haan *et al.* (1994). The Ocean Biosphere/Chemistry model and the Ocean Climate model are defined on the same grid and share the description of dispersion.

The model incorporates a variety of feedbacks from the atmosphere to the oceanic environment including the effect of temperature on  $CO_2$  aqueous solubility, the effect of temperature and  $CO_2$  on phytoplankton productivity, and the effect of temperature on the recycle rate of non-living matter to phytoplankton. Many feedback processes influencing the oceanic C cycle have been identified. Feedbacks vary both in their effect on the C cycle and in their uncertainty (Klepper *et al.*, 1993). Here only the fairly well established processes are included.

## 4.5 LINKAGES WITHIN THE ATMOSPHERE-OCEAN SYSTEM

Within the Atmosphere Ocean system many climate related feedbacks exist. Obviously changes at the interface of atmosphere and ocean are treated consistently in both models.

Warming of the atmosphere affects atmospheric composition. Increase of temperature in the troposphere leads to higher  $H_2O$  mixing ratios. This has a positive effect on the formation of OH radicals, thus enhancing the atmospheric sink for  $CH_4$  and other gases.

Increases of sea surface temperature affect not only the equilibrium concentration of dissolved C, but also the sea ice coverage. This changes the area of the open sea where gas exchange is possible. This effect is important, especially since the  $CO_2$  solubility is largest in colder waters, i.e. at high latitudes, where the sea ice is located.

## 4.6 LINKAGES BETWEEN THE ATMOSPHERE-OCEAN SYSTEM AND THE REST OF IMAGE 2.0

At each model time step, new computed patterns of surface air temperature and precipitation are input to the Terrestrial Environment System to calculate changes in potential vegetation, which leads to a new land cover pattern, land use emissions, and so on. Computed temperature and precipitation are also fed back to other parts of the Terrestrial Environment System, for example, to modify the rates of primary productivity in the Terrestrial Carbon model, and to modify the rate of  $N_2O$  emissions computed by the Land Use Emissions model. The coupling of land cover and surface albedo has already been mentioned. At this point there is no linkage between the moisture/heat flux to the atmosphere assumed in the Zonal Atmospheric Climate model and global land cover computed by the Land Cover model, although this linkage is a high priority in the next version of IMAGE 2.

Since output data from the Atmosphere-Ocean models are in the form of latitudinal averages, these data must be transformed to the global grid of IMAGE 2.0 calculations. This transformation is performed with data from the current climate data base of Leemans and Cramer (1991) and with interpolated results from a general circulation model of

Manabe and Wetherald (1987).

The transformation of zonal average climate changes to grid-scale changes is, of course, a source of model uncertainty. To investigate this uncertainty we compare downscaling results using four different GCMs. Model runs were performed with identical, Business as Usual type forcing functions, while using results of climate change due to  $CO_2$  doubling from four different GCMs (GFDL, GISS, OSU, UKMO). On the time horizon of the model (1970 to 2100) differences in global quantities were small. Differences in  $CO_2$  concentrations never exceeded 15 ppmv, or 2%, differences in  $CH_4$  concentrations were limited to 0.02 ppmv (less than 1 %), global temperatures were only 0.04°C apart. Larger differences appeared in the areas of agricultural land (3% global, but up to 20% in specific regions) and the geographic distribution of agricultural land. Especially at higher latitudes, where the climate change signal is strongest, significant differences were found in, for instance, the total forested area and the northward shift of agricultural area.

#### 5. Model Testing

## 5.1 Comparison to 1970-90 Data

The individual submodels and fully linked version of IMAGE 2.0 have been tested against measurements and other data from 1970-90. This period was selected because of the availability of data, although we plan to use data from a longer historical period for additional validation tests. In this section we briefly review results for the entire linked model. The results of individual submodels are examined in more detail in the papers quoted in sections 2,3 and 4 of this paper.

For these tests it was necessary to assume or estimate the initial states of all models in 1970. Submodels with highly dynamic behaviour were initialized in 1900 in order to establish their non-equilibrium states in the year 1970. For the initialization of the Terrestrial Carbon model, it was assumed that the various reservoirs of terrestrial C were in steady state in 1900; using this steady state as an initial condition, the model was then run to 1970, using as input the historical changes in  $CO_2$  and climate. To initialize the Zonal Atmospheric Climate, Ocean Climate, and Ocean Biosphere/Chemistry models, these models were linked and run to equilibrium by setting the atmospheric concentrations of greenhouse gases constant at their estimated 1900 levels. Starting from this equilibrium state, the linked models were then run in transient mode from 1900 to 1970, using historical concentrations of  $CO_2$  and other greenhouse gases.

As to the results -- The Energy Economy model calculates the consumption of energy in five sectors, and these figures are quite close to official data from 1970-90 for all regions. Sample results are presented for OECD Europe and East Asia in Figure 3. The computed energy consumption differs somewhat from official data, but the model captures the slump in energy consumption in OECD Europe after 1980, and the steady rise in energy consumption in East Asia during this period. Results for other regions (de Vries *et* 



Figure 3: Comparison of end use energy consumption by sector as calculated by IMAGE 2.0 and data from International Energy Agency, 1970-90 in OECD Europe and East Asia.

*al.*, 1994) are similarly good. It seems that the simple economic-energy relationships contained in the Energy Economy model are adequate for reproducing recent trends.

Based on the computed sectoral energy consumption and other data, the Energy-Emissions model computes energy-related emissions of greenhouse gases. Estimates from this model are within  $\pm 25\%$  of 1990 data from the four IPCC world regions (Figure 4).



Figure 4: Comparison of calculated  $CO_2$  emissions with IPCC estimates for four world regions. (a) IMAGE 2.0 calculations, (b) Data from IPCC (1990) (CIS and EE = Commonwealth ofIndependent States and Eastern Europe; CPA = Centrally Planned Asia).

This mainly shows that the emission categories and coefficients in the model have been correctly selected and calibrated, at least for 1990.

The Land Cover model computes global changes in land cover in the period 1970 to 1990 by taking into account actual demand for agricultural commodities together with estimated potential crop productivity and vegetation. As noted earlier in this paper, estimates of potential crop productivity and vegetation come from the Terrestrial Vegetation model. This model is shown elsewhere (Leemans and van den Born, 1994) to give a reasonable representation of areas of potential wheat and other crop productivity.

To illustrate results from the Land Cover model, we present the initial land cover (1970) of Europe and Africa in Figure 5a, and the computed change in land cover (i.e. disappeared land cover) between 1970 and 1990 in Figure 5b. The computed changes in these two decades are very different for the two continents. In Europe, decreasing demand for agricultural land due to increased crop yields led to reversion of agricultural land (indicated by red grid cells in Figure 5b) to other types of land cover (mostly deciduous forest and grassland). By contrast, increasing yields could not keep pace with the crop requirements of Africa's increasing population (even after taking into account food imports during these decades). Added to crop demands were increased demands for fuelwood and rangeland, also stemming from increased population. Taking these demands for land together, the Land Cover model computes an expansion of agricultural land at the expense of tropical forest in Zaire, grasslands and woodlands in Ethiopia, and forest and grasslands in West Africa (Figure 5b). As noted previously, the amount of agricultural land in different regions is calibrated to agree with FAO estimates for 1990. However, the rate of deforestation is indirectly computed by the model and therefore serves as a check of the model's ability to simulate actual land cover changes. Computed regional total deforestation agrees with FAO estimates (Table 4). Moreover, Zuidema et al. (1994) show



land cover types in Olson, et al (1985).



Figure 5 (b): Computed changes in land cover, 1970-90, in Europe and Africa.

22

		Latin America	Africa	Asia	Other regions	World
Period 1970 - 1980						
Myers (1980)	All countries (1)	4.2	2,3	3.9	-	10.4
Houghton et al. (1983)	All countries (1)	2.9	2.9	3.4	0.1	9.2
FAO (1982)	Tropical countries	5.6	3.7	2.0	-	11.3
IMAGE 2.0	Tropical countries	5.6	3.2	5.1	-	13.8
IMAGE 2.0	All countries	6.9	3.5	7.7	5.3	23.4
Period 1980 - 1990						
WRI (1992)	Tropical countries	8.3	5.0	3.6	-	16.9
FAO (1993)	Tropical countries	7.4	4.1	3.9	-	15.4
IMAGE 2.0	Tropical countries	5.9	3.1	4.8	-	13.7
IMAGE 2.0	All countries	6.7	3.4	6.4	8.7	25.2

## **TABLE 4**

Deforestation rates in various world regions (Mha a<sup>-1</sup>).

<sup>(1)</sup> Assuming a limited number of conversions of land cover

that computed deforestation rates for the 1980s are within a factor of two of FAO estimates for countries with the highest rate of deforestation. Nevertheless, we expect the spatial accuracy of calculations to improve in the next version of IMAGE 2 when factors such as irrigation and soil degradation are included, and locations of roads and rivers are taken into account.

After land is converted, the Terrestrial Carbon model computes the resulting change in  $CO_2$  flux from the terrestrial biosphere due to human disturbance. As noted previously, this model also takes into account NPP and soil respiration. For 1980, we estimate that land cover changes resulted in a net flux of about 1.0 Gt C a<sup>-1</sup> to the atmosphere, while uptake to the terrestrial biosphere was approximately 1.9 Gt C a<sup>-1</sup> (Table 5). The Ocean Climate and Ocean Biosphere/Chemistry models compute an oceanic uptake of 1.4 Gt C

Author	Land cover changes	Terrestrial biosphere uptake	Ocean uptake	Fossil fuel emission	Net accumulation in the atmosphere
Houghton et al. (1983)	-0.7 - 2.1	-	1.5 - 2.5	4.5 - 5.9	
Detwiler & Hall (1988)	0.3 - 1.7	-	1.8 - 2.5	4.8 - 5.8	
Tans et al. (1990)	0.4 - 2.6	-	0.6-2.4	5.3	-
Goudriaan (1992)	1.0	1.2	2.0	5.0	2.8
IPCC (1992)	0.6 - 2.5	-	1.2 - 2.8	5.3	-
Sedjo (1992)	1.0	0.7	1.8 - 2.5	4.8 - 5.8	2.9
IMAGE 2.0	1.0	1.9	1.4	5.1	2.8

 TABLE 5

 Global Carbon Budget for 1980 (Gt C or, equivalently, Pg C).



Figure 6: Computed atmospheric concentration of CO<sub>2</sub>, 1970-90. Comparison of base case with constant fuel prices and constant yield per hectare (Sec. 5.2). Note scale begins at 320 ppm.

 $a^{-1}$ , and the Energy Emissions model estimates fossil fuel emissions to be 5.1 Gt C  $a^{-1}$ . This implies a net accumulation of 2.8 Gt C  $a^{-1}$  in the atmosphere. The computed accumulation of C in the atmosphere leads the Atmospheric Composition model to slightly overestimate atmospheric CO<sub>2</sub> concentration in 1990 (Figure 6).

The spatial distribution of  $CO_2$  sources and sinks for 1980 (Figure 7) shows that the northern boreal forests act as extensive sinks. Red grid cells scattered in Figure 7 indicate relatively high fluxes of  $CO_2$  to the atmosphere. These fluxes arise from biomass burning associated with recently cleared forest and other land. Unfortunately, there are no comprehensive data sets for comparing our spatial  $CO_2$  flux calculations. However, the calculated total regional  $CO_2$  fluxes due to anthropogenic disturbances are consistent with other estimates (see Klein Goldewijk *et al.*, 1994).

The Land Use Emissions model also updates its estimates of  $CH_4$ ,  $N_2O$ , and other emissions (Table 2) when new land cover is computed. For instance, the computed distribution of  $N_2O$  emissions from natural soils in Latin America (Figure 8) reflects the clearing of forests and the changed soil and environmental conditions.

As for the validation of the Atmospheric-Ocean set of models in IMAGE 2.0, the Atmospheric Composition model is able to reproduce the observed trends in  $CH_4$ ,  $N_2O$ ,









Figure 9: Deviation of computed surface temperatures (1970) from climate average data of Oort (1983).

 $O_3$ , and other greenhouse gases. As noted above, the build-up of  $CO_2$  is slightly overestimated. Using the current composition of the atmosphere, the Atmosphere-Ocean models can reproduce fairly well the current latitudinal profile of surface temperatures (Figure 9). Furthermore, both the climate sensitivity of the climate model and the uptake of C by the ocean are within their accepted uncertainty ranges (IPCC, 1992). More details of the validation of these models are given in de Haan *et al.* (1994).

Apart from comparisons with data, the IMAGE 2.0 model is also being tested by mathematical uncertainty analysis; i.e., by assigning uncertainties to model inputs, and then propagating these uncertainties through model equations to estimate the uncertainty of model output. Preliminary results are available for the Energy Economy, Energy Emissions and Atmospheric Composition model. For the Atmospheric Composition model, an uncertainty analysis of input parameters (for a reference emissions scenario) produced an output uncertainty of  $CH_4$  of about 25% (coefficient of variation) in year 2100, with one of the main sources of uncertainty being the parameterization of sensitivity to  $NO_x$  in the model (Krol, 1994).

Summing up, we noted in section 1.4 that each submodel was first tested separately, and a limited number of parameters were adjusted in each submodel so that good agreement was obtained with data. Above, we reported results of the fully linked model, which indicate similarly good agreement with data. This is encouraging because of the non-linearities that arise when the model is fully linked. In another paper (Alcamo *et al.*, 1994) we also find that the model is stable for reference runs up to year 2100. Nevertheless, this first comparison with data is inadequate for identifying the model's strengths and weaknesses. Since the model will be used for prognosis up to year 2100, it



Figure 10:  $CO_2$  emissions from fossil fuels, East Asia, 1970-90. Comparison of base case with constant fuel prices.

should be tested against a longer historical period, which we intend to do. Moreover, to understand the relative importance of different model uncertainties, a comprehensive sensitivity and uncertainty analysis is required. This effort is currently underway as noted above.

## 5.2 PRELIMINARY SENSITIVITY CALCULATIONS

The complete coupled model can provide insight into linkages in the society-biospheresystem for the period 1970-90. As an example, if fuel prices are set constant between 1970-90 in the Energy Economy model, we compute the energy consumption that would have occurred if higher prices had not spurred conservation during these decades. The consequences on energy-related CO<sub>2</sub> emissions are depicted on Figures 10 and 11. For East Asia, emissions in 1990 would have been 241 Tg C as compared to 190 in the base case; while the world total would have been 6634 Tg C as compared to 5887 Tg C in the base case. As for the atmospheric concentration of CO<sub>2</sub> in 1990, constant prices result in 361.1 ppm as compared to 358.3 ppm in the base case (Figure 6).

As another example, we investigated the affect on the system of improved crop yield (due to technology rather than climate) which occurred in every region during the 1970s



Figure 11. Global CO<sub>2</sub> emissions from fossil fuels, 1970-90. Comparison of base case with constant fuel prices.

and 80s. This was done by running the model with a constant yield per hectare for this period, and comparing results to a base run which takes into account actual yield increases. If yield per hectare had not increased, substantially more agricultural land would have been required to satisfy the demand for crops and livestock, and this would have led to higher deforestation rates (Figure 12). For Latin America, a constant yield per hectare results in 898 Mha of remaining forest in 1990, as compared to 957 Mha in the base case. For Africa these figures were 1188 Mha, compared to 1227 Mha; and for the India plus S.Asia region, the model computes that nearly all of its forest area would have been consumed if yield per hectare had not increased (85 Mha vs. 1 Mha). Associated with increased deforestation, is increased biomass burning, and consequently, greater  $CO_2$  fluxes from the terrestrial biosphere (Table 6). This leads to an atmospheric concentration of  $CO_2$  in 1990 of 369.3 ppm as compared to 358.3 ppm in the base case (Figure 6).

## 6. Discussion and Conclusions

As noted above, sensitivity and uncertainty analyses will provide insight into the greatest opportunities for model improvement. In the meantime, Table 7 presents a partial list of some planned model improvements based on recommendations of an International Review Panel of the IMAGE 2.0 model (NRP, 1993), and other information.

With regards to model applications, the purpose of this paper was to present the



Figure 12: Change in forest area in Africa, Latin America and India plus South Asia. Comparison of base case with constant yield per hectare.

scientific development and testing of the IMAGE 2.0 model rather than how it can be used. Preliminary applications of the model are presented in Part 2 of this paper (Alcamo *et al.*, 1994).

In summing up, the main achievement of the model is its presentation of a geographically-detailed, global, and dynamic overview of the linked society-biosphereclimate system. The model represents in some detail the relation between society's economic and demographic trends and the generation of greenhouse gas emissions. (Of course, our representation of society is quite primitive compared to various global macroeconomic models.) It is a first attempt to simulate in geographic detail the transformation of land cover as it is affected by climatic, demographic, and economic factors. It links explicitly and geographically the changes in land cover with the flux of  $CO_2$  and other greenhouse gases between the biosphere and atmosphere, and conversely, takes into account the effect of climate in changing productivity of the terrestrial and oceanic biospheres. At the same time it dynamically couples emissions from society and the

	Base case	Constant yield per hectare
Canada	-0.36	-0.40
USA	-0.07	0.13
Latin America	0.14	0.29
Africa	-0.10	-0.05
OECD Europe	-0.14	-0.13
Eastern Europe	-0.02	0.02
CIS	-0.82	-0.92
Middle East	-0.03	-0.05
India + S. Asia	0.09	0.37
China + C.P. countries	-0.19	0.06
East Asia	0.31	0.89
Oceania	-0.02	-0.01
Japan	-0.01	-0.01
Global	-1.23	0.19

## TABLE 6

 $CO_2$  fluxes from the terrestrial biosphere, 1990 (Pg C). Comparison of base case with constant yield per hectare.

#### TABLE 7

#### Partial list of some model improvements planned for IMAGE 2.0

Energy-Industry Sub-system:

- · Addition of energy supply constraints on energy prices and end use consumption
- · Addition of price-driven mechanism for selecting fuel mix
- Experimental linkage of IMAGE 2.0 with global macro-economic model

Terrestrial Environment Sub-system

- · Addition of soil degradation and irrigation processes
- Addition of information on population density, roads, and rivers
- · Implementation of trade model for agricultural and wood products
- · Improvement of land use rules
- Implementation of dynamic vegetation calculations

#### Atmosphere-Ocean Sub-system

- · Implementation of description of cryosphere
- Implementation of sea level rise calculations
- Improved spatial definition of greenhouse gases and their precursors, where necessary (particularly O<sub>3</sub> and its precursors)
- · Improved treatment of atmosphere/terrestrial fluxes

biosphere with chemical and physical processes in the atmosphere and ocean, and feeds climate changes back to the terrestrial and oceanic biospheres.

Linking the entire system together, the model was able to reproduce 1970-90 trends in energy consumption, emissions related to the energy/industrial system, terrestrial fluxes of  $CO_2$  and other greenhouse gases to the atmosphere, the build-up of greenhouse gases in the atmosphere, and long-term current climate patterns. Geographic detail is available for many of these calculations. This was accomplished by adjusting a limited number of parameters as described in the text.

Because of its components and spatial resolution, the model is particularly well-suited to investigate the scientific and policy-oriented goals laid out in the beginning of this paper. In particular it has the potential to provide new insight into the linkages and feedbacks of the global society-biosphere-climate system.

## Acknowledgements

The authors are indebted to their colleagues who contributed to the development of IMAGE 2.0: G.-J. van den Born, A.F. Bouwman, B.J. de Haan, M. Jonas, K. Klein Goldewijk, O. Klepper, J. Krabec, R. Leemans, J.G. van Minnen, K. Olendrzyński, J.A. Olivier, J. Rotmans, R. Swart, M. Vloedbeld, H.J.M. de Vries, H.J. van der Woerd, R. van den Wijngaart. This research was supported by the Dutch Ministry of Housing, Physical Planning and the Environment (MAP numbers 482505-482509), as well as the Dutch National Research Program on Global Air Pollution and Climate Change, Grant Numbers 851037, 851040, 851042, 851044 and 851045.

## Appendix 1

Countries comprising the 13 world regions in the IMAGE 2.0 framework of models.

#### 1. CANADA Canada

2. USA United States of America

## 3. LATIN AMERICA

Guyana

Honduras

Jamaica

Mexico

Panama

Peru

Paraguay

Puerto Rico

Trinidad and Tobago

Suriname

Uruguay

Venezuela

Madagascar

Mauritania

Mozambique

Morocco

Namibia

Niger

Nigeria

Rwanda

Senegal

Somalia

Sudan

Togo

Tunisia

Uganda

Zambia

Zimbabwe

Western Sahara Zaire

Sierra Leone

South Africa

Swaziland

Tanzania

Malawi

Mali

Nicaragua

Haiti

Argentina Belize Bolivia Brazil Chile Colombia Costa Rica Cuba Dominican Rep. Ecuador El Salvador Falkland Is. French Guiana Guatemala

#### 4. AFRICA

Algeria Angola Benin Botswana Burkina Faso Burundi Cameroon Centr. African Rep. Chad Congo Cote d'Ivoire Djibouti Egypt Equatorial Guinea Ethiopia Gabon Gambia Ghana Guinea Guinea-Bissau Kenya Lesotho Liberia Libya

#### **5. OECD EUROPE**

Austria Belgium Denmark Finland France Germany Greece Greenland Iceland Ireland Italy Netherlands Norway Portugal Spain Sweden Switzerland United Kingdom

## 6. EASTERN EUROPE

Albania Bulgaria former Czechoslovakia Hungary Poland Romania former Yugoslavia

7. CIS former USSR

#### 8. MIDDLE EAST

Afghanistan Cyprus Iran Iraq Israel Jordan Kuwait Lebanon Neutral Zone Oman Qatar Saudi Arabia Syria Turkey United Arab Emirates Yemen

#### 9. INDIA plus SOUTH ASIA

Bangladesh Bhutan India Myanmar

# 10. CHINA plus CENTRALLY PLANNED COUNTRIES China Laos Kampuchea Mongolia Korea, Dem.People's Rep. Vietnam

Nepal

Pakistan

Sri Lanka

#### 11. EAST ASIA

Brunei Darussalam East Timor Indonesia Korea, Rep. of

#### 12. OCEANIA Australia

Fiji

13. JAPAN Japan Malaysia Papua New Guinea Philippines

New Caledonia New Zealand

Thailand

33

## References

- Alcamo, J., G.J. van den Born, A.F. Bouwman, B.J. de Haan, K. Klein Goldewijk, O. Klepper, J. Krabec, R. Leemans, J.G.J. Olivier, A.M.C. Toet, H.J.M. de Vries and H.J. van der Woerd: 1994, Modeling the global society-biosphere-climate system, Part 2: Computed scenarios, *Wat. Air Soil Pollut.*, 76 (this volume).
- Broecker, W.S. and T.H. Peng: 1982, Tracers in the sea, Eldigo Press.
- Bouwman, A.F., L. van Staalduinen and R.J. Swart: 1992, The IMAGE land use model to analyze trends in land use related emissions, Report 222901009, RIVM, Bilthoven, the Netherlands.
- CEC (Commission of the European Communities), Directorate General for Environment, Nuclear Safety, and Civil Protection: 1992, Development of a framework for the evaluation of policy options to deal with the greenhouse effect.

Detwiler, R.P. and C.A.S. Hall: 1988, Tropical forests and the global carbon cycle, Science, 239: 42-47.

- FAO (World Food and Agriculture Organization): 1978, Report on the agro-ecological zones project. FAO: Rome.
- FAO: 1982, Tropical forest resources.
- FAO: 1992, AGROSTAT-PC, Computerized information series: User manual, Population, Land use, Production, Trade, Food balance sheets, Forest products. Edition October 1992, FAO, Rome.
- FAO: 1993, Summary of the Final Report of the Forest Resources Assessment 1990 for the Tropical World, FAO, Rome, Italy.
- Goudriaan, J.: 1992, Biosphere structure, carbon sequestering potential and the atmospheric <sup>14</sup>C carbon record, J. *Exp. Bot.*, 43: 1111-1119.
- Goudriaan, J., and P. Ketner. 1984, A simulation study for the global carbon cycle including man's impact on the biosphere, *Clim. Change*, 6: 167-192.
- de Haan, B.J., M. Jonas, O. Klepper, J. Krabec, M.S. Krol and K. Olendrzyński, K.: 1994, An atmosphere-ocean model for integrated assessment of global change, *Wat. Air Soil Pollut.*, 76 (this volume).
- Houghton, R.A., J.E. Hobbie, J.M. Melillo, B. Moore, B.J. Petterson, G.R. Shaver and G.M. Woodwell: 1983, Changes in the carbon content of terrestrial biota and soils between 1860 and 1980: a net release of CO<sub>2</sub> to the atmosphere, *Ecol. Monogr.*, 53: 235-262.
- IPCC: 1990, J.T. Houghton, G.J. Jenkins and J.J. Ephraums (eds), *Climate Change. The IPCC Scientific Assessment*, Cambridge Univ. Press.
- IPCC: 1992, J.T. Houghton, B.A. Callender and S.K. Varney (eds), Climate Change 1992. The Supplementary Report to the IPCC Scientific Assessment, Cambridge Univ. Press.
- Klein Goldewijk, K., J.G. van Minnen, G.J.J. Kreileman, M. Vloedbeld and R. Leemans: 1994, Simulating the carbon flux between the terrestrial environment and the atmosphere, Wat. Air Soil Pollut., 76 (this volume).
- Klepper, O., B.J. de Haan, P. Saager and M.S. Krol: 1993, Oceanic uptake of anthropogenic CO<sub>2</sub>; mechanisms and modeling, Report 481507004, RIVM, Bilthoven, the Netherlands.
- Kreileman, G.J.J. and A.F. Bouwman: 1994, Computing land use emissions of greenhouse gases, Wat. Air Soil Pollut. 76 (this volume).
- Krol, M.S.: 1994, Uncertainty analysis for the computation of greenhouse gas concentrations in IMAGE, in: J. Grasman and G. van Straten (eds), Predictability and Nonlinear Modeling in Natural Sciences and Economics, Kluwer.
- Krol, M.S. and H.J. van der Woerd: 1994, Atmospheric composition calculations for evaluation of climate scenarios, Wat. Air Soil Pollut., 76 (this volume).
- Leemans, R. and G.J. van den Born: 1994, Determining the potential global distribution of natural vegetation, crops, and agricultural productivity, *Wat. Air Soil Pollut.*, 76 (this volume).
- Leemans, R. and W. Cramer: 1991, The IIASA database for mean monthly values of temperature, precipitation and cloudiness on a global terrestrial grid, Research Report RR-91-18, International Institute of Applied Systems Analyses, Laxenburg, pp. 61.
- MacKay, R.M. and M.A.K. Khahil: 1991, Theory and development of a one dimensional time dependent radiative convective climate model, *Chemosphere*, 22: 383-417.
- Manabe, S. and R.T. Wetherald: 1987, Large scale changes of soil wetness induced by an increase in atmospheric carbon dioxide, J. Atm. Sci., 44: 1211-1235.
- Myers, N.: 1980, Report of survey of conversion rates in tropical moist forests, National Research Council, Washington D.C., USA.
- NRP (Dutch National Research Program on Global Air Pollution and Climate Change): 1993, Report of

International Review Meeting IMAGE 2.0, Amsterdam, NRP Report 00-09, NRP, Bilthoven, the Netherlands.

- Olson, J., J.A. Watts and L.J. Allison: 1985, Major World Ecosystem Complexes Ranked by Carbon in Live Vegetation: A Database, NDP-017, Oak Ridge National Laboratory, Oak Ridge, Tennessee.
- Oort, A.H.: 1983, Global Atmospheric Circulation Statistics, 1958-1973. NOAA Prof. Pap. 14., U.S. Dept. of Commerce, Rockville, Md. U.S.A.
- Peng, L., M.-D. Chou and A. Arking: 1982, Climate studies with a multi-layer energy balance model. Part I: model description and sensitivity to the solar constant, J. Atm. Sci., 39(12): 2639-2656.
- Prentice, I.C., W. Cramer, S.P. Harrison, R. Leemans, R.A. Monserud and A. Solomon: 1992, A global biome model based on plant physiology and dominance, soil properties, and climate, J. Biogeography., 19: 117-134.
- Rotmans, J.: 1990, IMAGE: an integrated model to assess the greenhouse effect, Kluwer.
- Rotmans, J., H. de Boois and R.J. Swart: 1990, An integrated model for the assessment of the greenhouse effect, *Clim. Change*, 16: 331-356.
- Sedjo, R.A.: 1992, Temperate forest ecosystems in the global carbon cycle, Ambio, 21: 274-277.
- Tans, P.P., I.Y. Fung and T. Takahashi: 1990, Observational constraints on the global atmospheric CO<sub>2</sub> budget, Science, 247: 1431-1438.
- Thompson, A.M., R.W. Stewart, M.A. Owens and J.A. Herwehe: 1989, Sensitivity of Tropospheric Oxidants to Global Chemical and Climate Change, Atm. Env., 23(3): 519-532.
- de Vries, H.J.M., R.A. van den Wijngaart, G.J.J. Kreileman, J.G.J. Olivier and A.M.C. Toet: 1994, A model for calculating regional energy use and emissions for evaluating global climate scenarios, *Wat. Air Soil Pollut.*, 76 (this volume).
- WRI: 1992, World Resources, 1992-1993. A Guide to the Global Environment. Toward Sustainable Development.
- Zuidema, G., G.J. van den Born, G.J.J. Kreileman and J. Alcamo: 1994, Simulation of global land cover changes as affected by economic factors and climate, *Wat. Air Soil Pollut.*, 76 (this volume).