Land use change analysis across scales from global to local



Professor Mark Rounsevell, School of Geosciences

Change in cultivated areas

EQUATOR

Cultivated Systems: Areas in which at least 30% of the landscape is cultivated

In 2000, cultivated systems covered 24% of the terrestrial surface. More land was converted to cropland in the 30 years after 1950 than in the 150 years between 1700 and 1850

EQUATOR

Source: Millennium Ecosystem Assessment

Some of Epstein's* reasons to model

- Explain as distinct from predict, e.g. plate tectonics *explains* earthquakes, but cannot *predict* the time and place of their occurrence)
- Guide data collection
- Illuminate core dynamics
- Discover new questions
- Bound (bracket) outcomes to plausible ranges
- Illuminate core uncertainties
- Demonstrate trade-offs / suggest efficiencies
- Challenge the robustness of prevailing theory through perturbations
- Expose prevailing wisdom as incompatible with available data
- Train practitioners
- Discipline the policy dialogue
- Educate the general public

*Epstein, J.M. 2008. 'Why Model?'. Journal of Artificial Societies and Social Simulation 11(4): 12

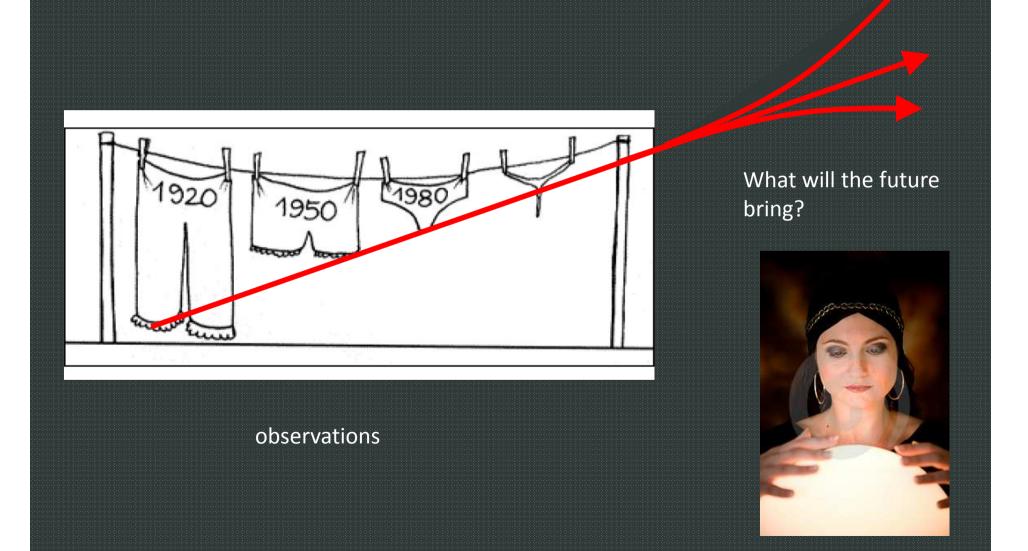
Models and scenarios

"The future isn't what it used to be ..."

Herman Kahn The 'father' of scenario thinking



What will the future bring?

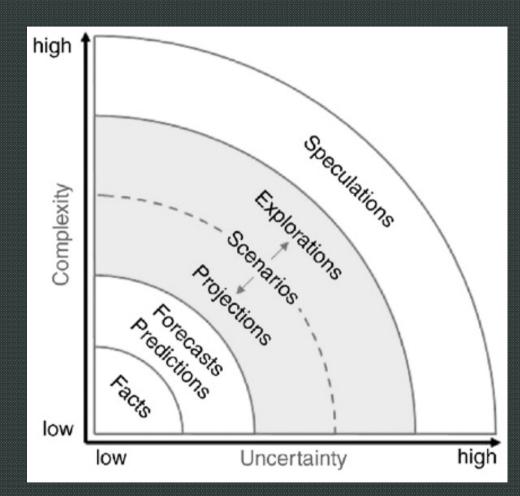


The way we address 'futures' in complex systems depends on:

(a) how well we understand a system's *complexity / causalities*;

(b) how *uncertain* we are about future developments of key drivers





Source: Zurek, M., Henrichs, T., 2007. Linking scenarios across geographical scales in international environmental assessments. Technological Forecasting and Social Change.

Scenarios as images

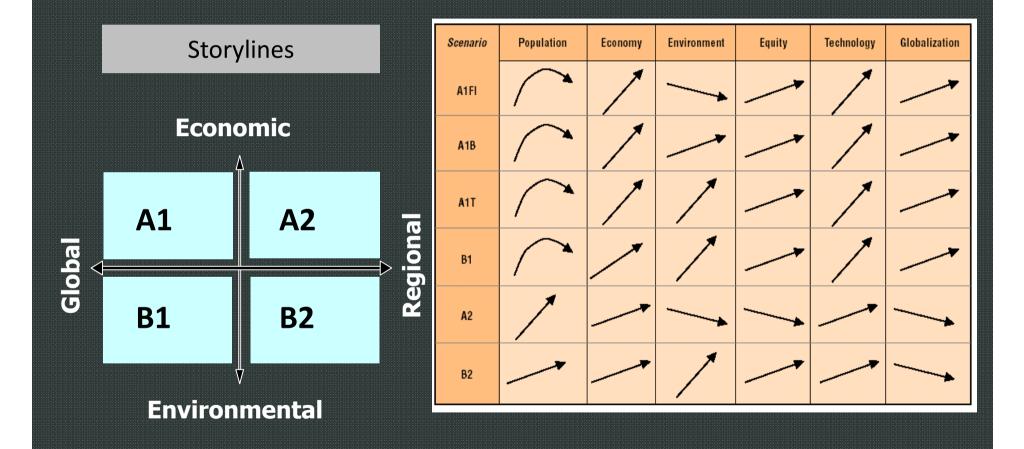
My painting is visible images which conceal nothing; they evoke mystery and, indeed, when one sees one of my pictures, one asks oneself this simple question **'What does that mean'?**

René Magritte, 1947



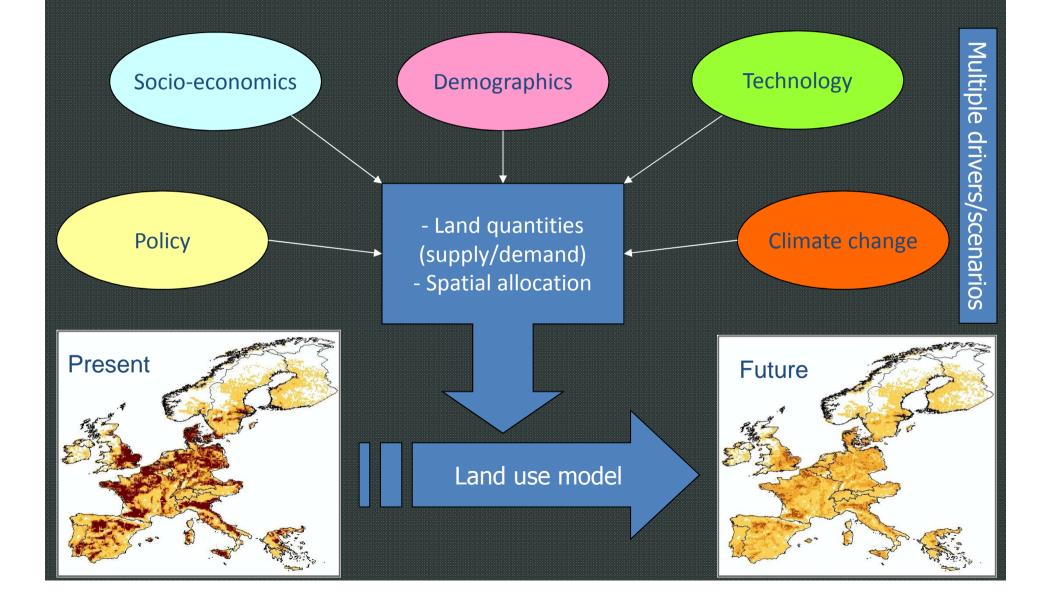
and shares a second second

The IPCC SRES* framework



*Special Report on Emissions Scenarios

European land use modelling



European agricultural drivers

Policy	Macro-(socio)economics		
	Demand	Supply	
Market intervention (subsidies, quotas)	Population (consumption)	Resource competition (e.g. urban)	
Rural development (LFAs)	Consumer preferences (meat, organic)	Climate change (temp, precip, CO ₂)	
Environmental policy (NVZs, ESAs)	Market liberalisation (WTO)	Technology & management	
	EU enlargement		

An agricultural land use (quantity) change model

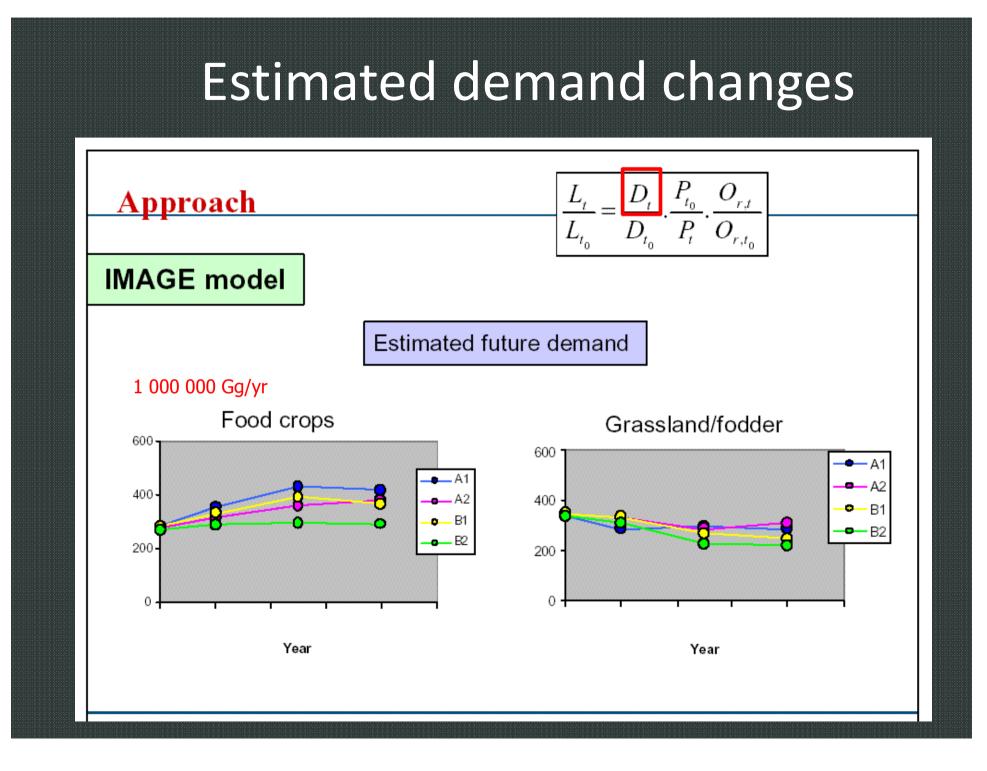
Based on a simple supply and demand function (Borlaug theory):

$$\frac{L_{t}}{L_{t_{0}}} = \frac{D_{t}}{D_{t_{0}}} \cdot \frac{P_{t_{0}}}{P_{t}} \cdot \frac{O_{r,t}}{O_{r,t_{0}}}$$

- start moment, baseline
- D ... Demand for production [t]P ... Productivity [t/ha]
- Overproduction, relative [-] *O* ...

After: Rounsevell, M.D.A. Ewert, F. Reginster, I., Leemans, R. and Carter, T.R. (2005). Future scenarios of European agricultural land use. II: projecting changes in cropland and grassland. Agriculture, Ecosystems and Environment, 107, 117-135

 $\boldsymbol{O}_{r,t}$



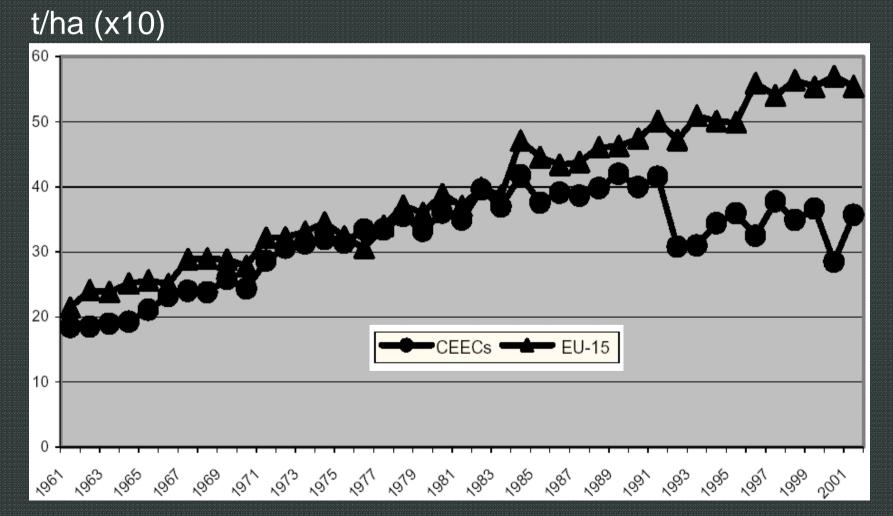
CO₂ effect estimates

 Values for the effect of CO₂ on crop/grass yields estimated from the literature (baseline = 1.00)

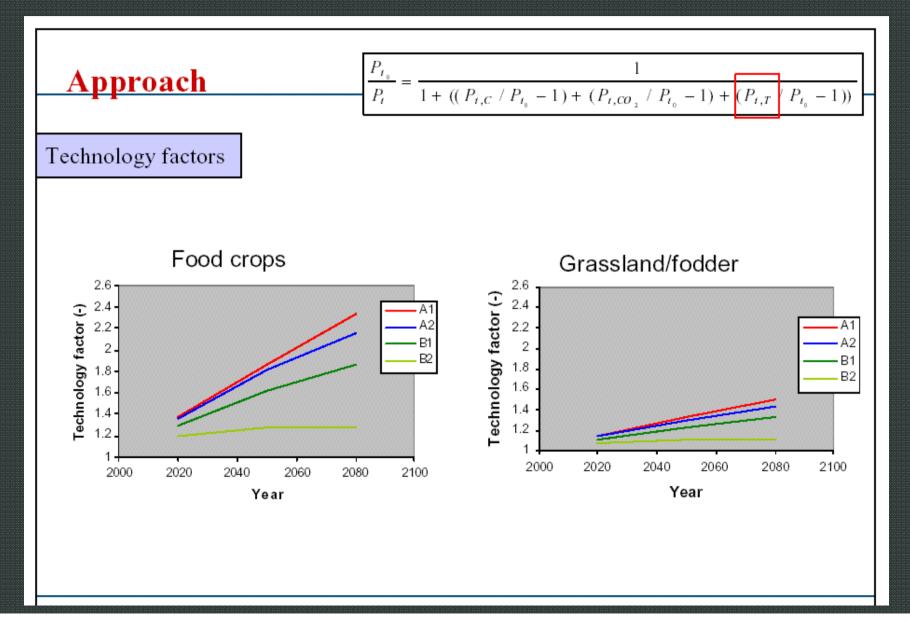
Scenario	2020	2050	2080
A1F1	1.04	1.16	1.32
A2	1.04	1.13	1.27
B1	1.04	1.09	1.11
B2	1.04	1.11	1.15

Change in wheat yields

The role of technology

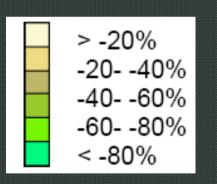


Technology change factors

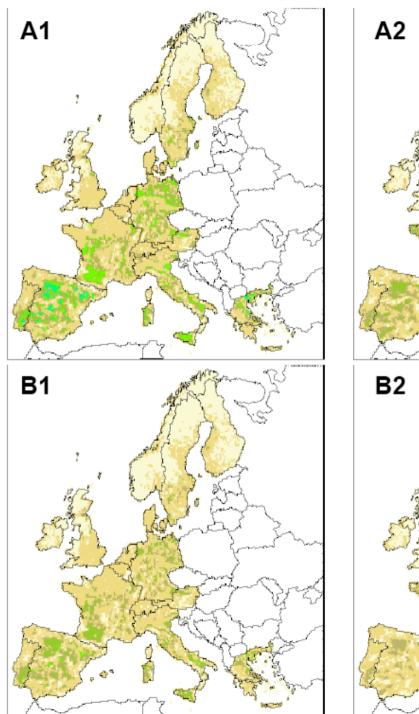


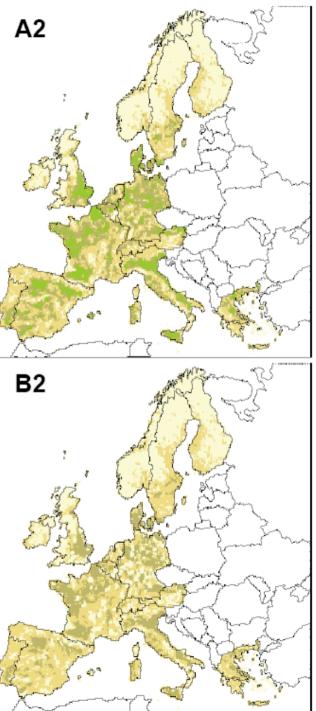
Change in cropland area (for food production) by 2080 compared to baseline (%) for the 4 SRES storylines and HADCM3

Land use Intensification versus land use expansion

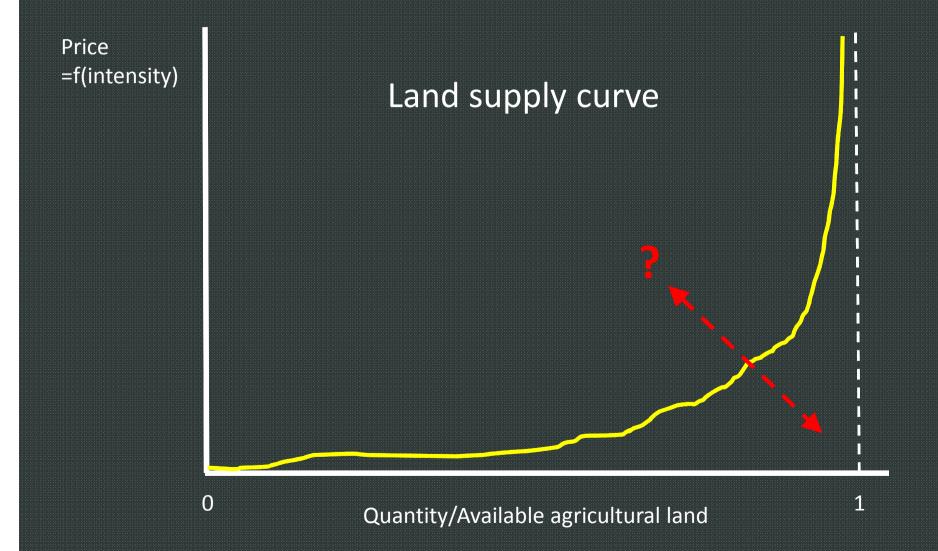


After: Schröter et al. (2005). Ecosystem service supply and vulnerability to global change in Europe. *Science*, **310** (5752), 1333-1337



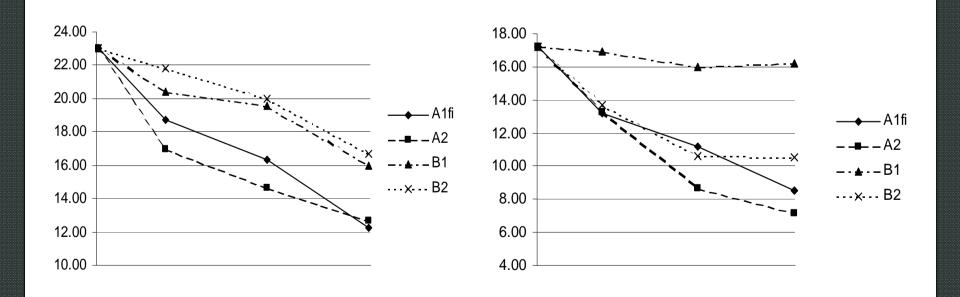


Land use intensification vs expansion

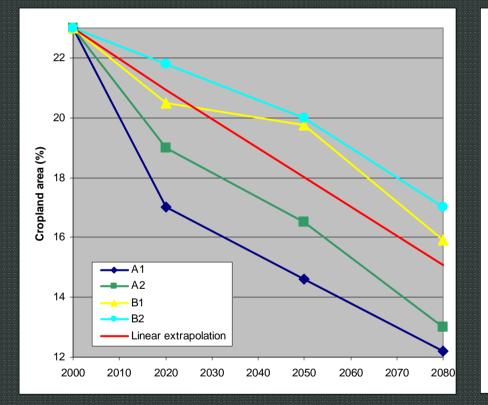


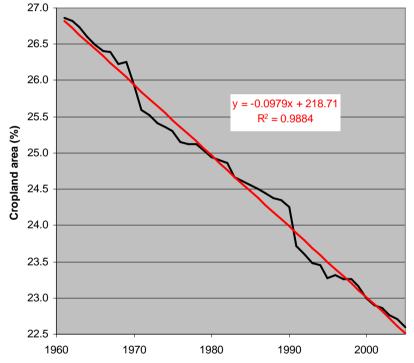
European change quantities

Ca. 50% declines in agricultural (food) production areas by 2080 (EU15)!



Change in cropland areas within the EU15 (% land surface)

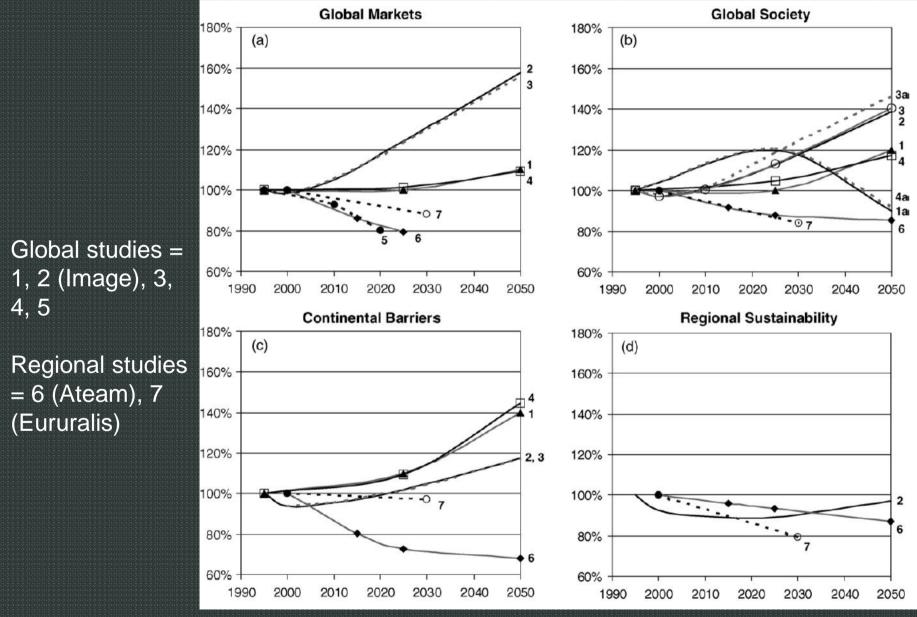




Past observed (source: FAO)

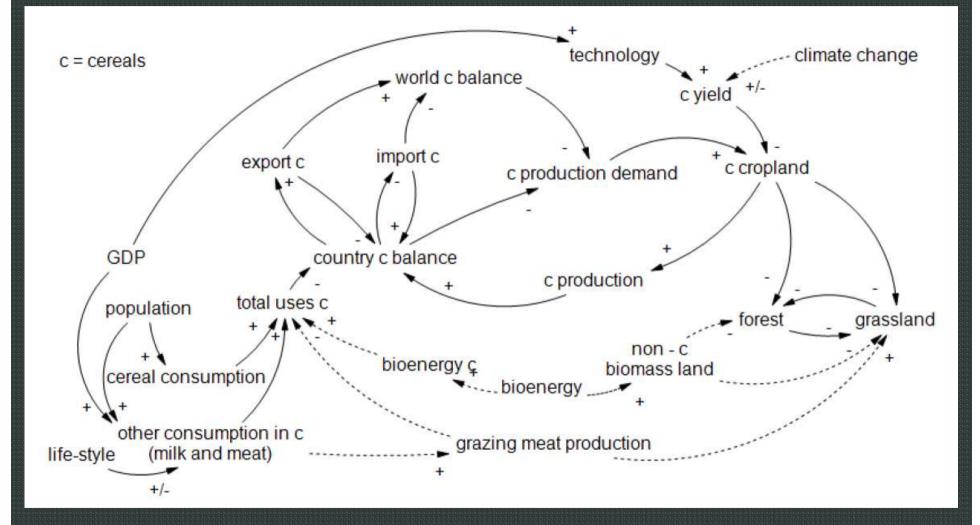
Potential futures (IPCC-SRES)

Change in European cropland areas for a range of scenario studies

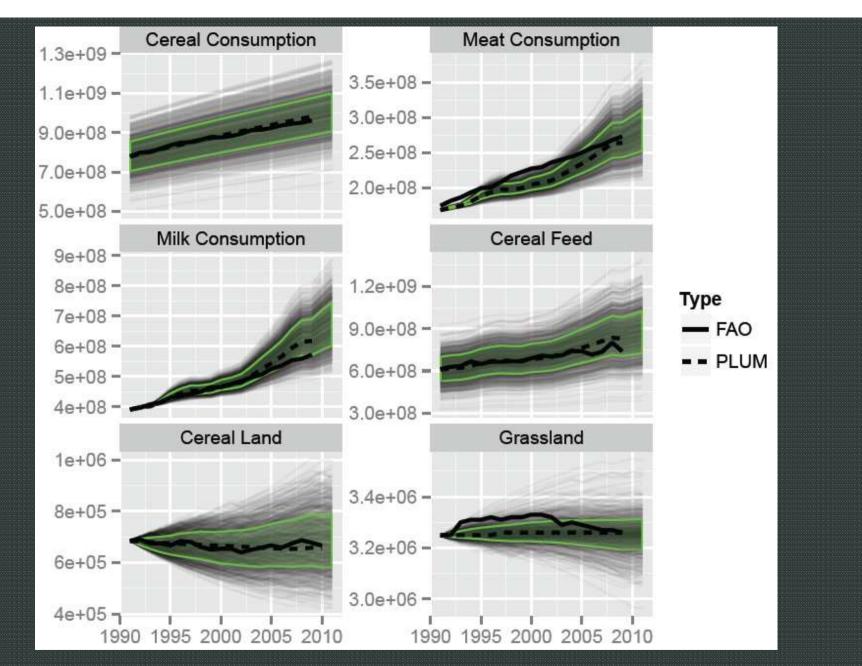


Source: Busch, G. (2007). Future European agricultural landscapes - What can we learn from existing quantitative land use scenario studies? *Agriculture, Ecosystems & Environment*

Global land use modelling using PLUM*

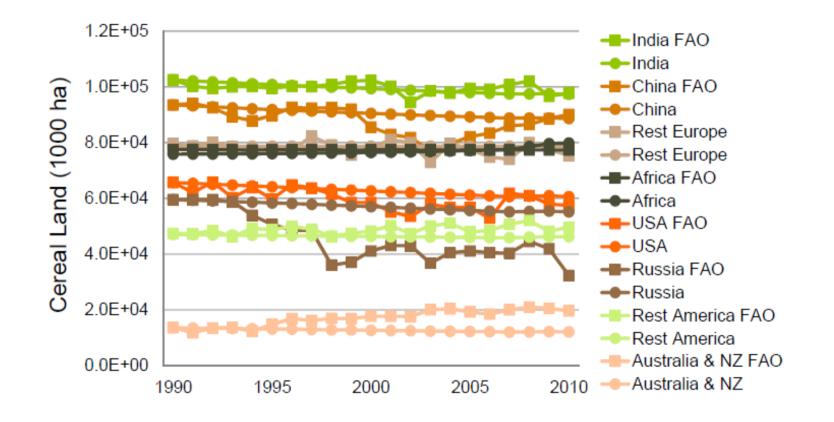


Overview of the concept underpinning *PLUM (Parsimonious Land Use Model) in the form of a causal loop diagram (relationships with dashed lines are not implemented in the current version of PLUM).



Global observed (FAO, black line) and modelled (PLUM, dashed black line) cereal consumption (tons), meat consumption (t), milk consumption (t), cereal feed (t), cereal land (1000 ha) and grassland (1000 ha). The faint grey lines are single model runs and the grey shaded area indicates the standard deviation of the output for the model runs.

Cereal land for regions



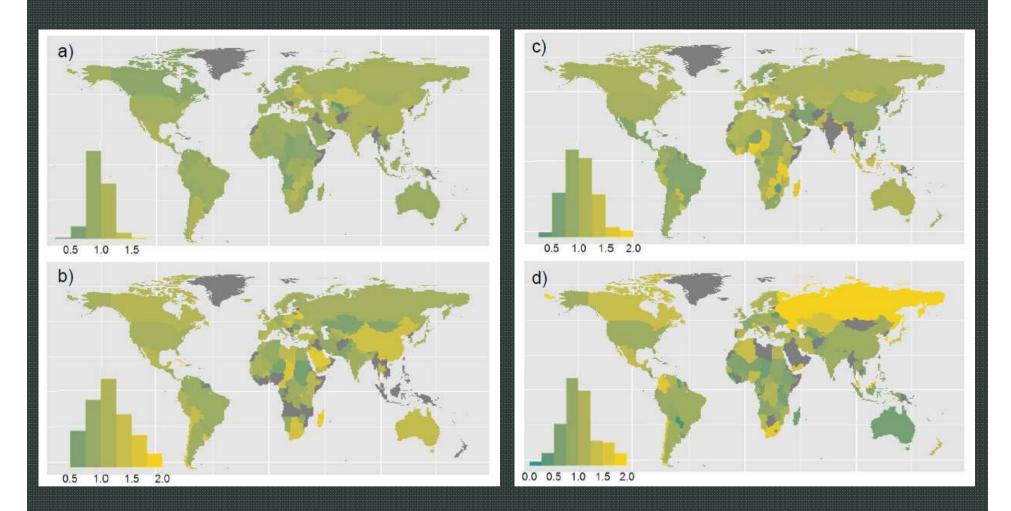
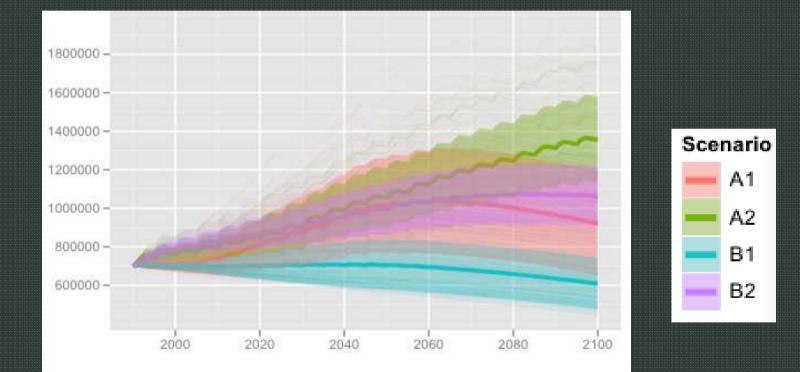


Figure 4: *Rc* for (a) cereal consumption (-), (b) milk consumption (-), (c) meat consumption (-), (d) cereal land (-) in 2009. The colour codes on the maps match the distribution of *Rc* shown in the histogram in the left-hand corner of each panel. Counties for which the model overestimates are more than double the observed and countries that are not included in the model (see Appendix A) are displayed in grey.

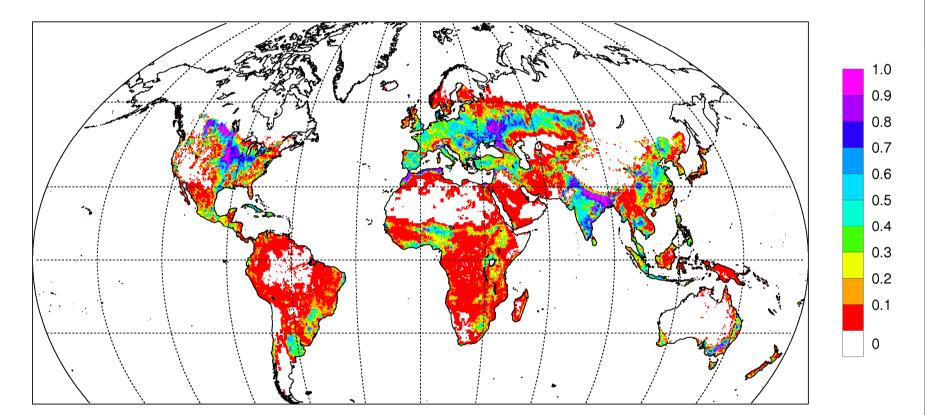
Scenario quantifications



Cereal land (1000 ha)

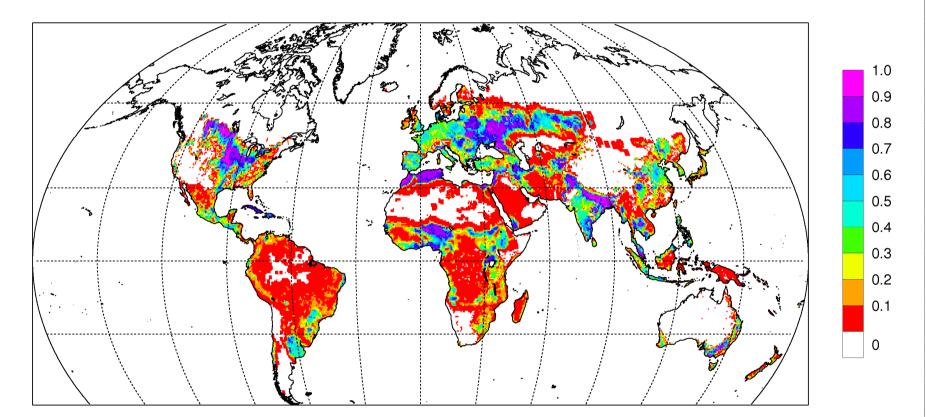
NPP and 8 neighbours

scenarios_A2_downscaled_col_twin_2000-2000.tab — CROPLAND

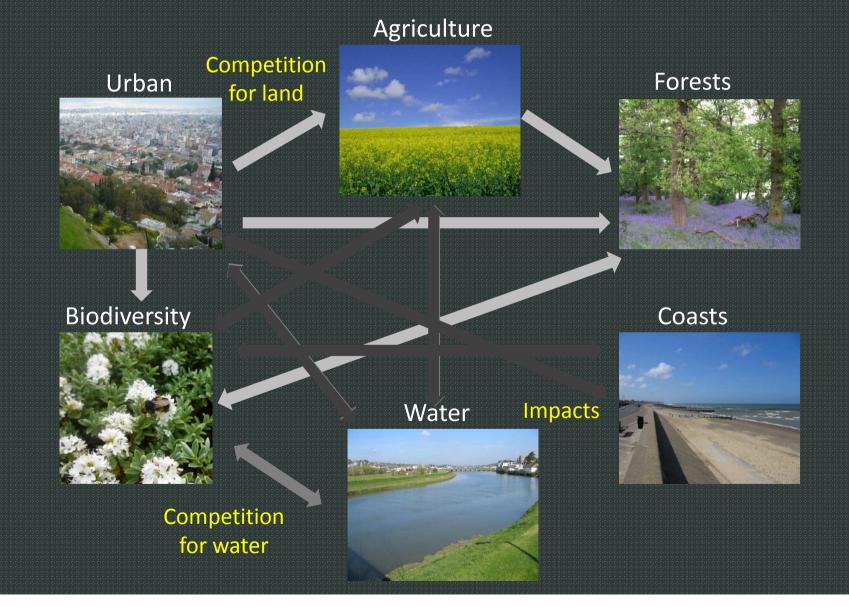


NPP and 8 neighbours

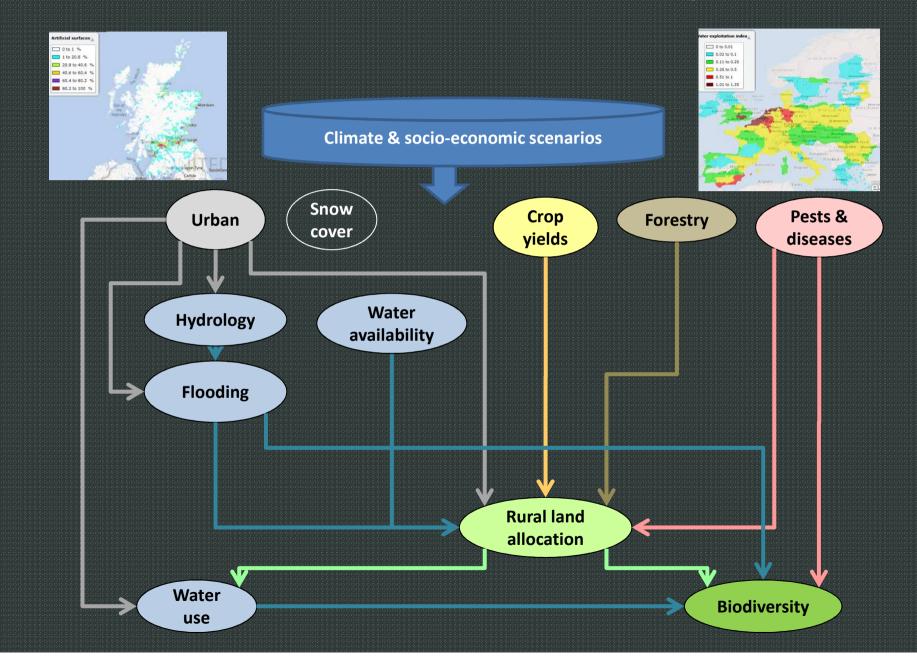
scenarios_A2_downscaled_col_twin_2050-2050.tab — CROPLAND



CLIMSAVE integrated assessment platform



Simplified cross-sectoral linkages



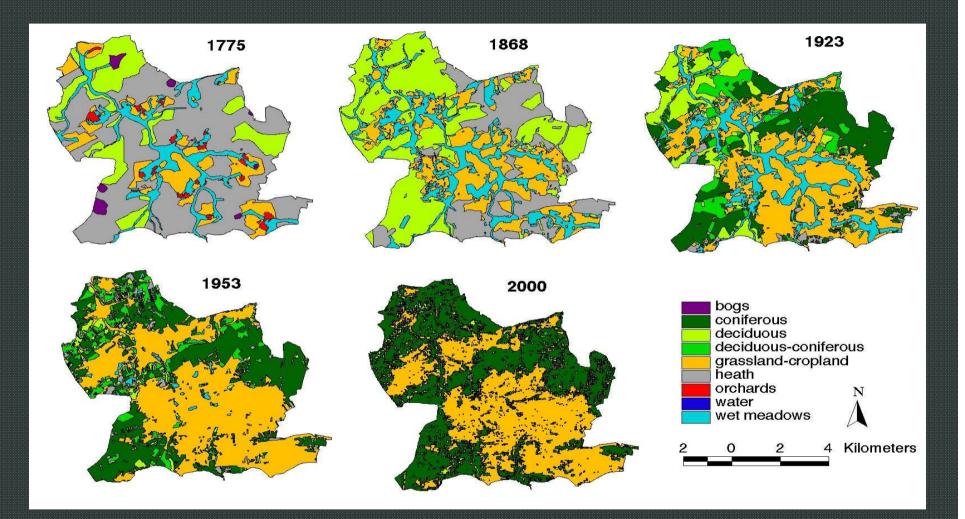
The CLIMSAVE IAP



Human Behaviour in Land System Models



Past land cover change (1775-2000) in Lierneux (Belgian Ardennes)

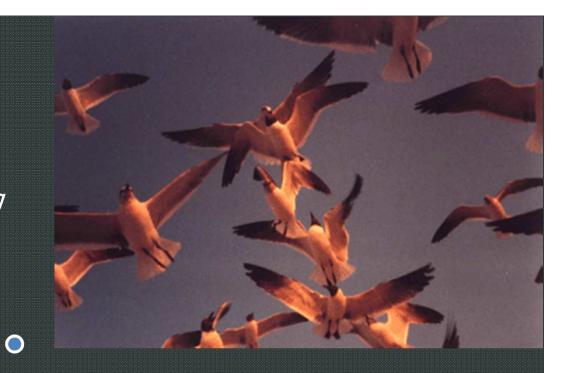


Change drivers: depopulation, accessibility/transport, economics (competition, ...)

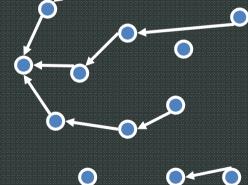
(Source: Carine Petit, thèse de doctorat, UCL, 2001)

FLOCK OF BIRDS

An example of a *self-organising system*









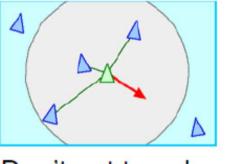
A flock of birds

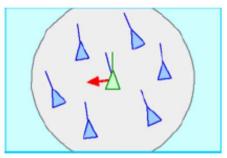


http://vimeo.com/16583119

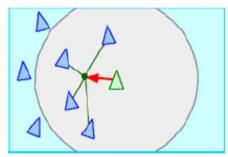
Boids

- developed by Craig Reynolds in 1986 (for SIGGRAPH)
- aimed to simulate complex flocking behaviour with simple rules





Don't get too close to others Folow average heading



Move towards average position

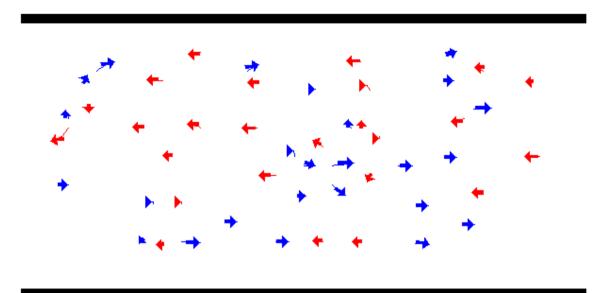
(images from http://www.red3d.com/cwr/boids/index.html, which has many interesting links)

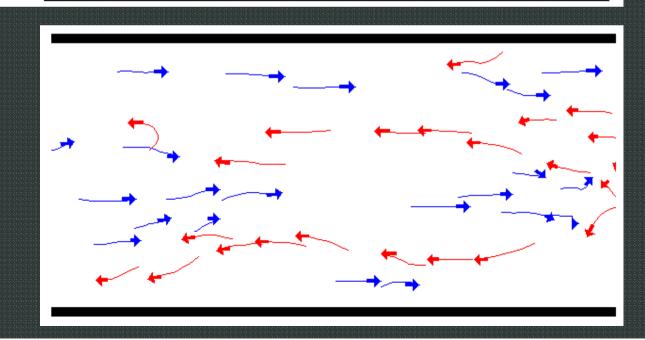
Demo at http://www.theparticle.com/applets/swarm/FlockingSwarmWithControls/index.html

http://www.theparticle.com/applets/swarm/FlockingSwarmWithControls/index.html

Lane Formation in a Street

This applet demonstrates how lanes of uniform walking direction form in a street:





Sheep grazing in Norway

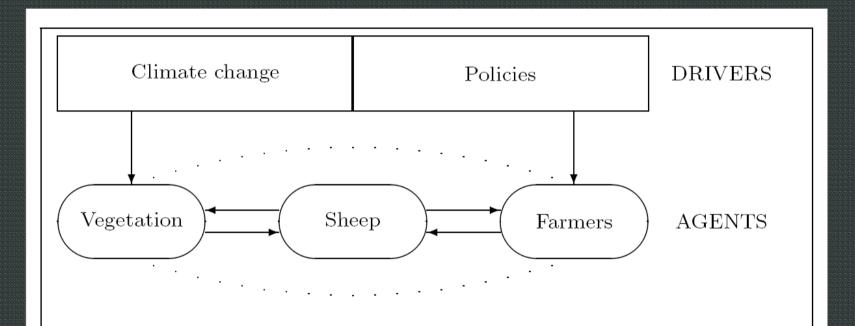


Figure 2: Conceptual framework of the Norway model

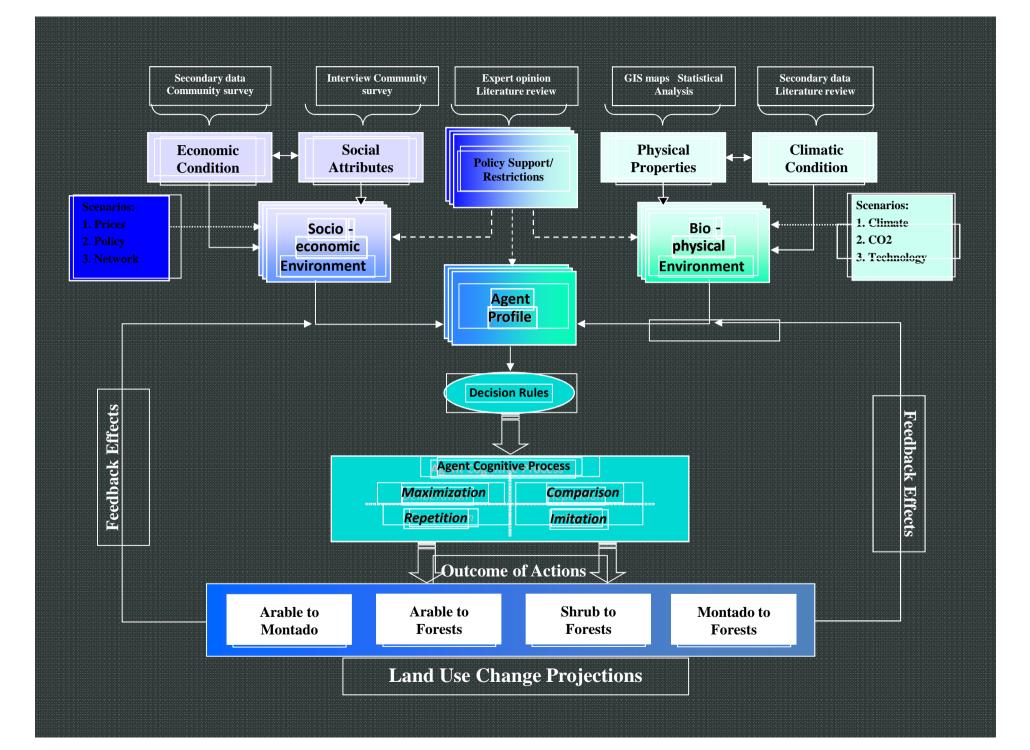
Source: David Dabin. A simple model to demonstrate the principles, which currently lacks the human dimension (work in progress)





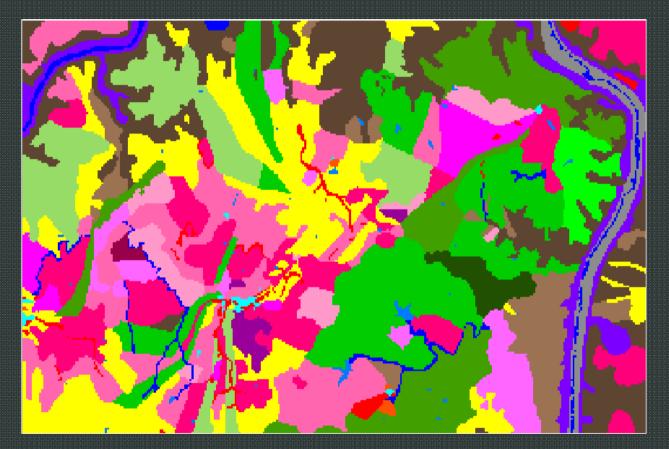






Agents' environment

Land use map (2000):

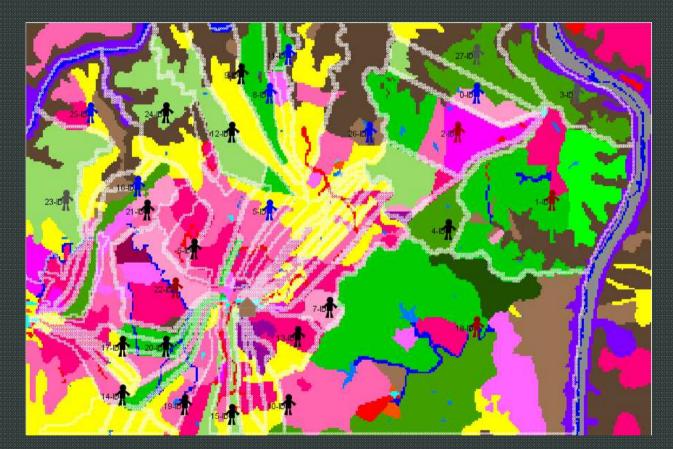


Legend:

agro-sylvo pastoral – magenta arable or pasture – yellow forest plantations – green dense shrubs – dark brown natural pasture with some mixed forest – lime shrubs – brown olive groove – red horticulture – orange waterlines – blue reservoirs – sky blue bare rocks – gray mediterranean shrubs – violet hamlet and farm buildings – cyan

Agents' profile and cognition

Farmers and Ownership:



Legend: Innovative – red Active – blue Absentee – gray Retiree – black Social attributes 1. age 2. residence 3. education 4. profession Economic attributes

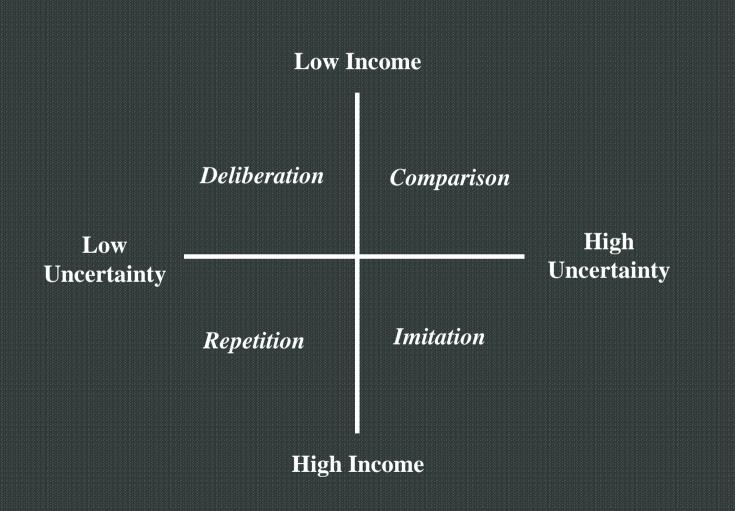
- 1. farm size
- 2. income source
- 3. number workers
- 4. available successor

ABM: agents' attributes

Profiles of the reactive agents:

Code	name	hectares	age	gender	educa	prof	residence	time	start	obtain	hect	pers	SUCC	sell	basis	markt
ADS1	Maria do Carmo S	127	4	"M'	1	2	1	"P'	1	"I"	3	"N'	"Y"		"F"	
AdS10	Manuel Querreiro (136	4	"M'	1	1	1	"F"	3	" "	3	"N'	"Y"		"L"	
AdS11	Arsénio Colaço	149	3	"M'	1	1	1	"F"	2	" "	1	"N'	"N'		"L"	
AdS12	Manuel António Pa	107	2	"M'	4	1	2	"F"	1	" "	2	"Y"	"N'		"L"	
AdS13	FernandodaLuzF	187	4	"M'	1	1	1	"F"	2	" "	3	"N'	"N'		"L"	
AdS14	Manuel Colaço	14	3	"M'	1	2	2	"P'	2	" "	1	"N'	"N'		"L"	
AdS15	Fernando e Xico P	31	2	"M'	1	2	2	"P'	3	" "	2	"N'	"Y"		"L"	
AdS16	Maria Rosa	42	4	"F"	1	1	1	"F"	3	" "	1	"N'	"N'		"R"	
AdS17	Claudia Melo	140	2	"F"	4	2	2	"P'	1	"B"	3	"Y"	"Y"		"L"	
AdS18	José Madeira	78	3	"M'	1	2	2	"P'	2	" "	2	"Y"	"N'		"C/H"	
AdS19	Luis Claudino	159	3	"M'	3	2	3	"F"	2	"B"	3	"N'	"Y"		"F"	
ADS2	Francisco António	73	4	"M'	1	1	1	"F"	3	" "	2	"Y"	"Y"		"NONE"	
AdS20	Manuel Fabião	780	2	"M'	2	1	2	"F"	2	"B"	4	"Y"	"Y"	Ν	"H'	0
AdS21	Manuel da Graça	20	4	"M'	1	1	1	"F"	3	" "	1	"N'	"N'	Y	"R"	I
AdS22	Leonel Belchior	343	3	"M'	3	1	2	"F"	2	"B"	3	"Y"	"N'	Ν	"F/L/M'	0
AdS23	José Gasparo Mac	167	4	"M'	1	1	3	"P'	2	" "	3	"Y"	"Y"	Ν	"F"	Ν
AdS24	Paula Madeira & A	101	2	"F"	3	2	3	"P'	1	" "	3	"Y"	"Y"	Ν	"F"	L
AdS25	Manuel Madeira	144	3	"M'	4	1	2	"F"	2	" "	3	"Y"	"Y"	Ν	"F/L"	I
AdS26	Severino Cavaco	43	4	"M'	3	2	3	"P'	2	" "	1	"N'	"Y"	Ν	"F"	Ν
AdS27	Augusto Madeira	75	4	"M'	1	1	1	"F"	3	" "	2	"N'	"N'	Ν	"R"	_
AdS28	Ze do Carmo (filho	167	4	"M'	1	1	3	"P'	2	" "	3	"Y"	"Y"	Ν	"F"	Ν
ADS3	Antonio Mauel Ros	25	4	"M'	0	1	1	"P'	2	" "	1	"N'	"N'		"R"	
ADS4	Francisco Alvito	20	2	"M'	1	1	1	"F"	2	"B"	3	"N'	"N'		"L"	
AD\$5	Joaquim Manuel S	117	4	"M'	1	1	3	"P'	2	" "	3	"N'	"Y"		"L"	
AdS6	Catarina Rodrigues	: 11	4	"F"	0	1	1	"F"	2	" "	1	"N'	"Y"		"R"	
ADS7	António Nicolau	13	4	"M'	4	2	1	"F"	2	"I"	1	"N'	"Y"		"R"	
AdS8	Carlos Mateus	144	2	"M'	1	1	1	"F"	2	" "	3	"Y"	"Y"		"L"	
Ad\$9	Joaquim Francisco	45	4	"M'	1	1	1	"F"	3	"B"	1	"N'	"N'		"R"	

Cognitive strategies

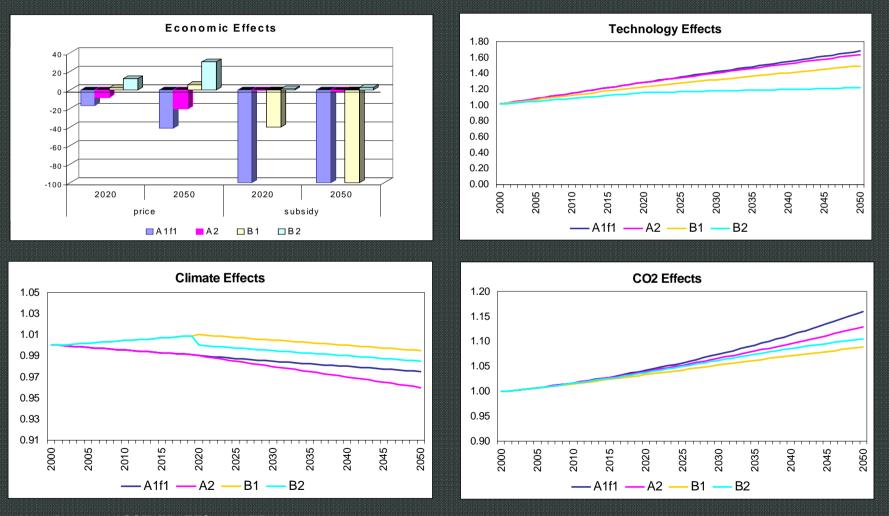


Agent profile and cognition (typology of behaviour)

Profile	Characteristics	Strategies
Innovative	 Large farm ownership High education Young farmers Diversified source of income 	Maximization, repetition
Active	 Small to medium farm ownership Moderate to High education Young farmers Traditional source of income 	Maximization comparison, repetition
Absentee	 Medium to large farm ownership Profession other than farming Young to old farmers Diversified source of income 	Imitation, repetition
Retiree	 Small farm ownership Low education Old farmers Pension and land rent 	Repetition

Source: Lilibeth Acosta-Michlik and Anne Van Doorn

Exogenous drivers



Note: Based on ACCELERATES and ATEAM projects

Model platform and results



Land use in 2050 in the Alentejo, Portugal

Legend: Pink – Montado Green – woodland Yellow – cropland Black/brown – abandoned/scrub



B1 Scenario





A2 Scenario



B2 Scenario



Social survey to inform ABM

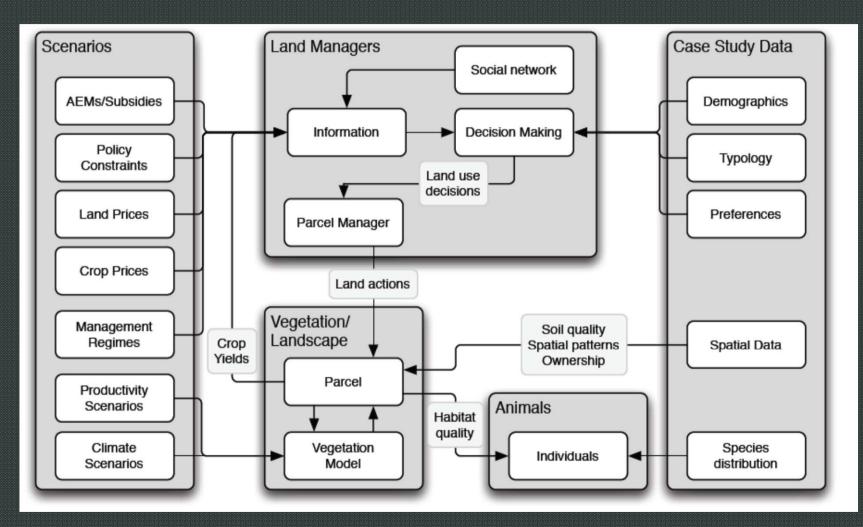
- Brabant-Wallon, Belgium
- Aargau, Switzerland
- Lunan catchment, Scotland







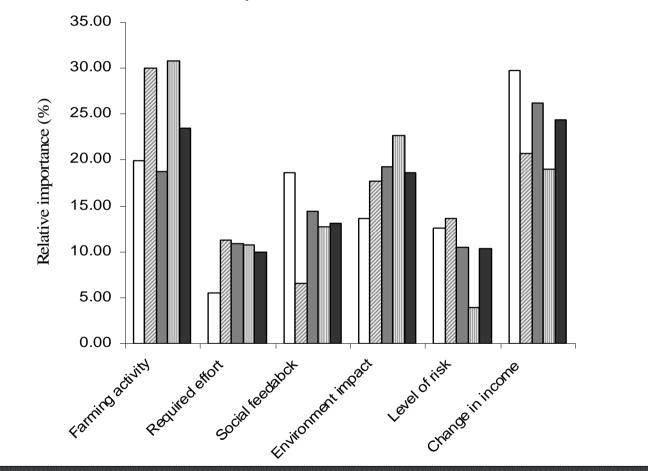
The modelling framework Agent-Based Modelling (ABM)



After: Murray-Rust, D., Dendoncker, N., Dawson, T., Acosta-Michlik, L., Karali, E., Guillem, E. and Rounsevell, M.D.A. (2011) Conceptualising the analysis of socio-ecological systems through ecosystem services and agent based modelling. *Journal of Land Use Science*, **6**, 83-99

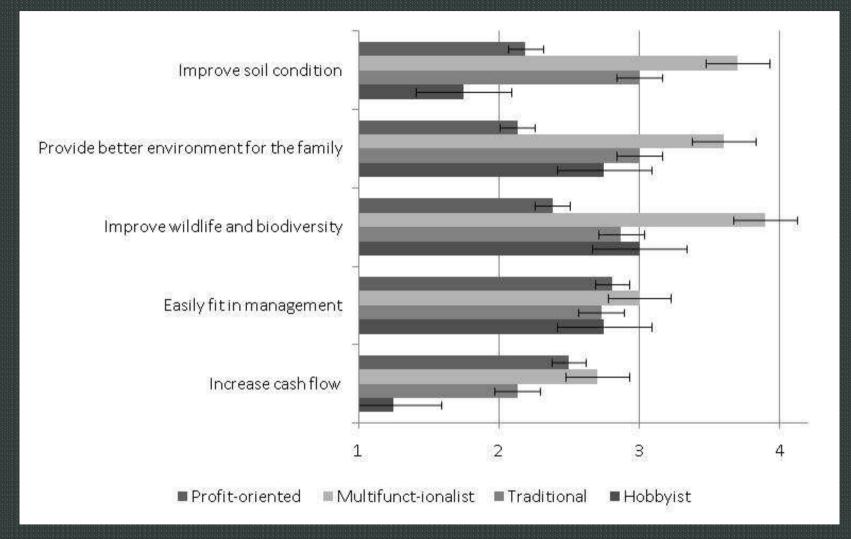
Agent types and preferences

□ Business-oriented □ Lifestyler □ Multifunctionalist □ Traditionalist □ Total sample



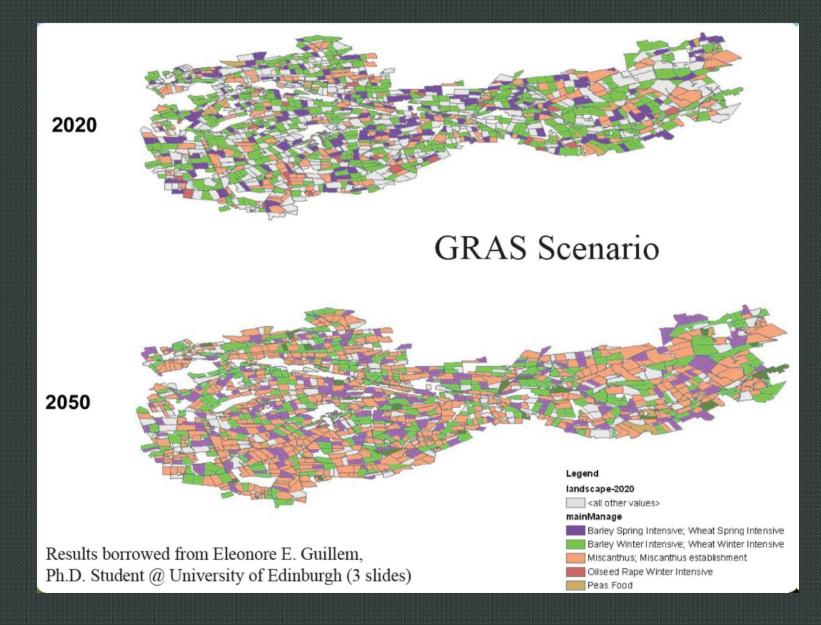
Relative importance of attributes included in the cluster analysis for the Aargau, Switzerland

Response to environmental policy

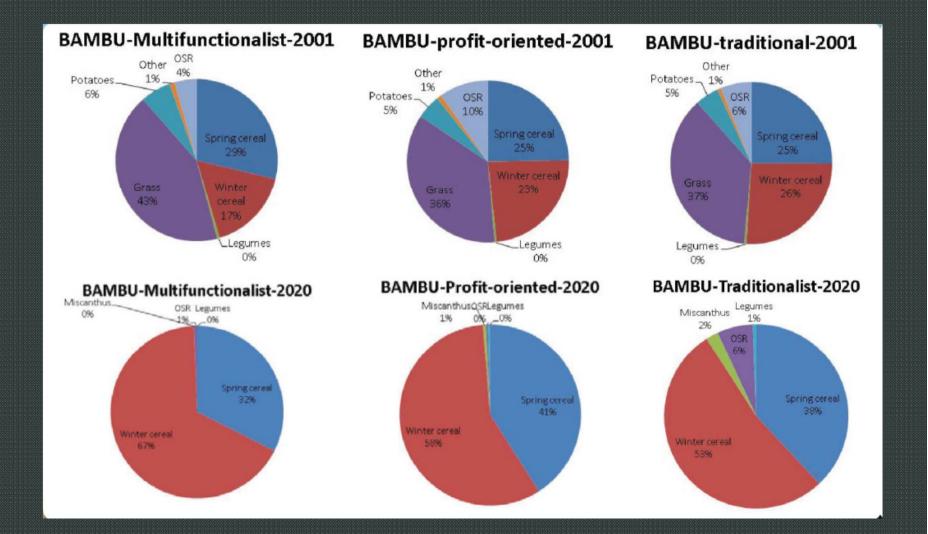


Mean responses for Motivations to agri-environmental scheme participation with standard deviations (1: no influence, 2: slight influence, 3: some influence, 4: big influence) – Lunan catchment, Scotland

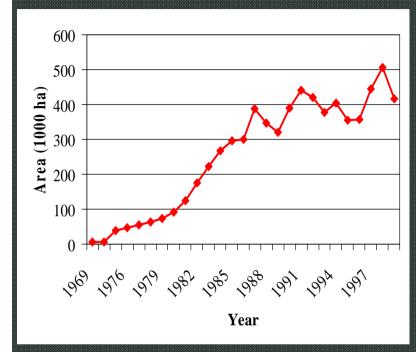
Example simulation for Scotland

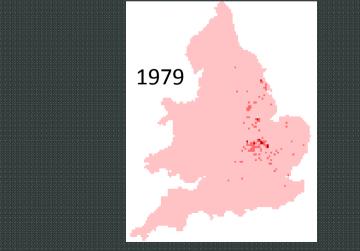


... role of farmer type in scenarios



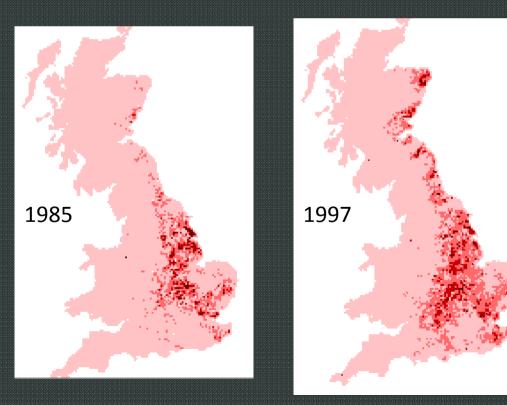
The role of knowledge exchange



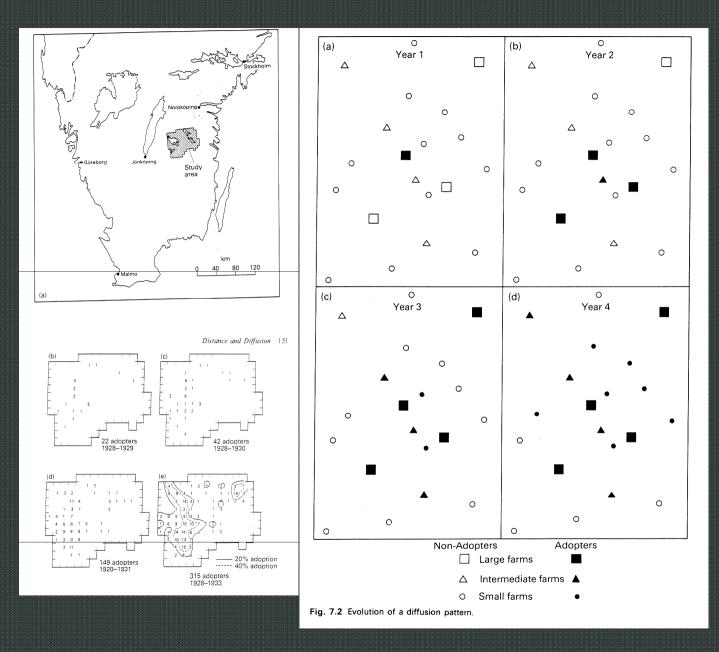


Change in oilseed rape areas in GB (1969-1999)

US soyabean shortage leads to European oilseed subsidy in the early 80s; during the 90s OSR is used as a biofuel crop on set-aside land



HÄGERSTRAND -DIFFUSION OF INNOVATION IN A RURAL COMMUNITY



INNOVATION DIFFUSION

Cellular space
Diffusion through *contact* between actors *Mean information fields* as Neighbourhoods with a distance decay
Stochastic rules

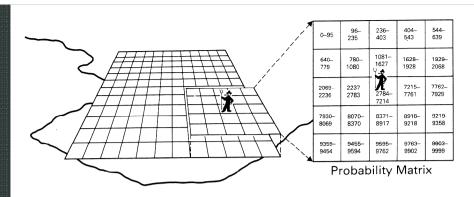


Fig. 7.6 Probability matrix and mean information field (after Hägerstrand (trans. Pred), 1967).

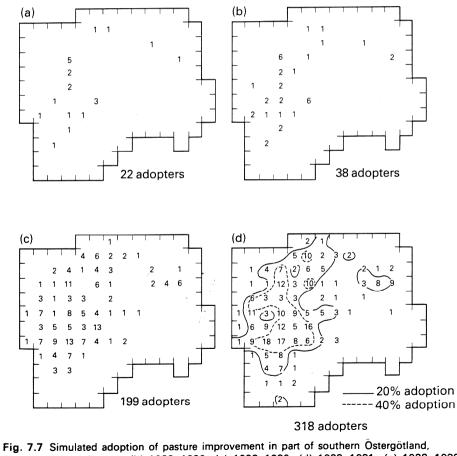
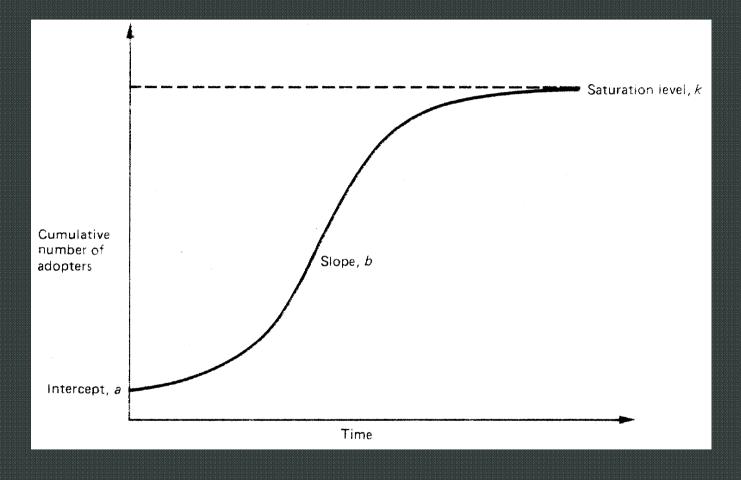


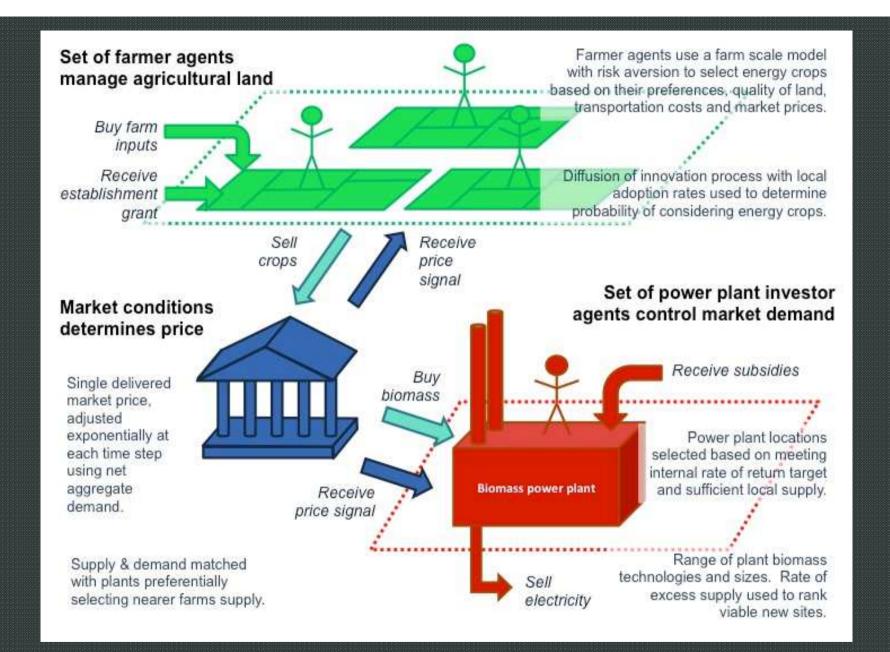
Fig. 7.7 Simulated adoption of pasture improvement in part of southern Ostergotland, Sweden: (a) study area; (b) 1928–1929; (c) 1928–1930; (d) 1928–1931; (e) 1928–1933 (after Hägerstrand (trans. Pred), 1967).

Diffusion of innovation/knowledge

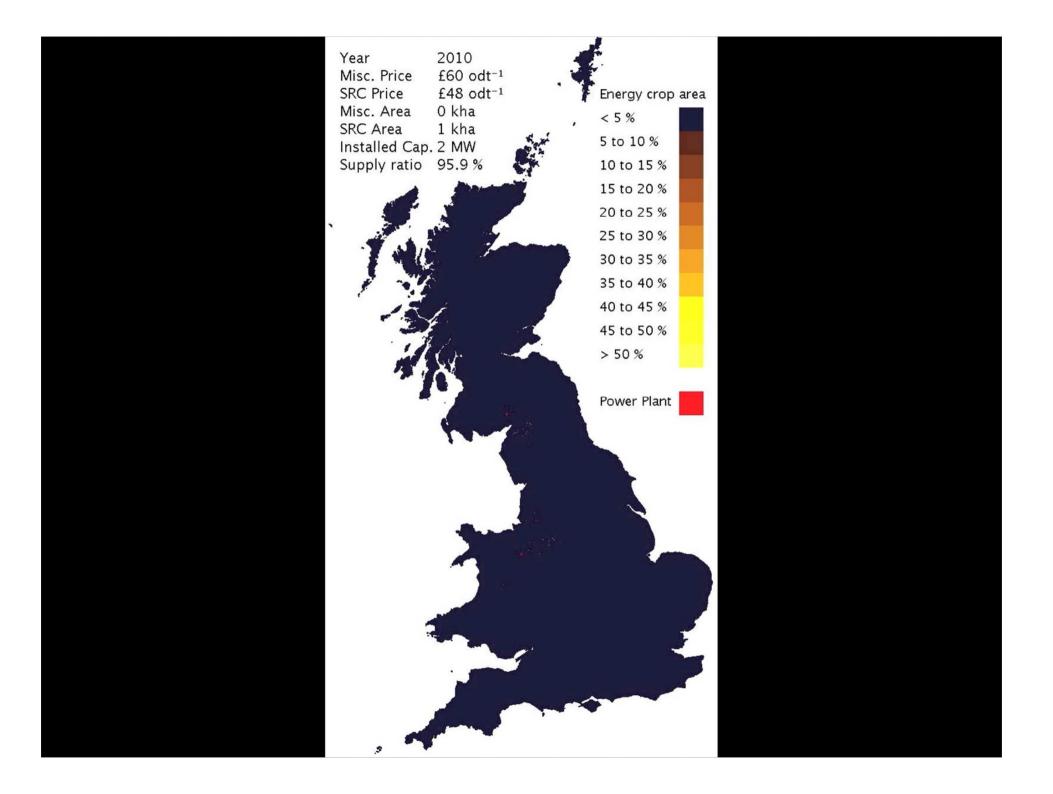


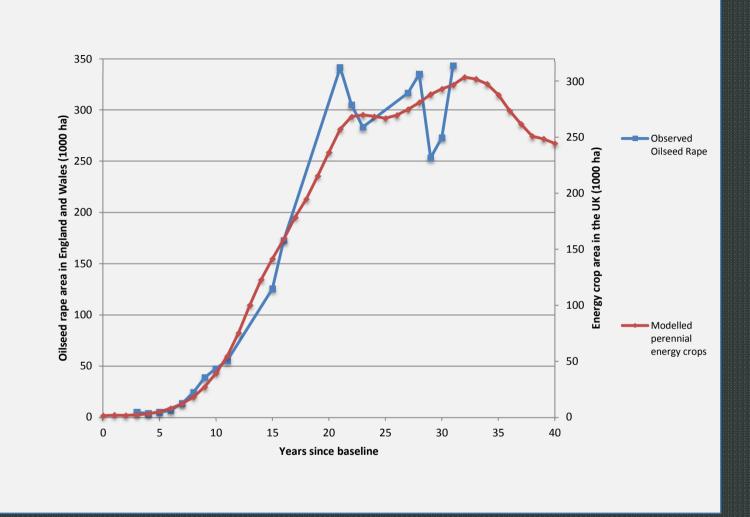
 $N = K / (1 + exp(a+b.d^2-c.t))$

a, b and c are constants, d is distance, and K = 1 (for 0 > N < 1)



Schematic representation of the main agent processes and interactions within the perennial energy crop market model

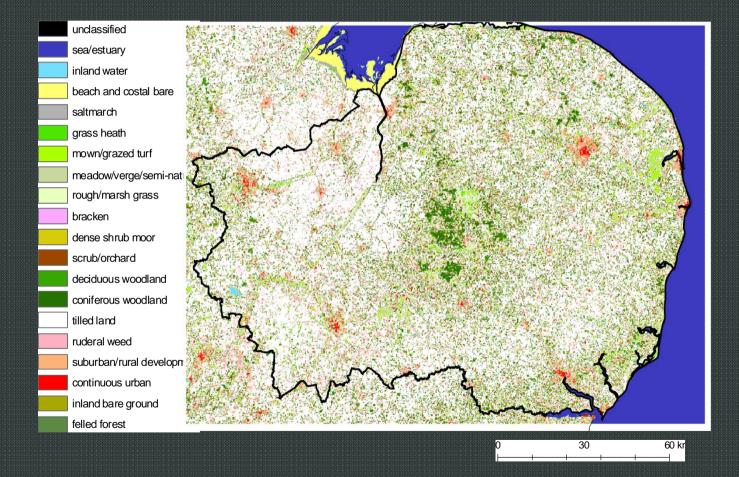




Time lags in adaptation - historic oilseed rape data for England and Wales, against a baseline year of 1966, and mean modelled perennial energy crop areas, using a baseline year of 2010 (Source: Peter Alexander, SRUC, Edinburgh)

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Residential housing (urban land use) in East Anglia



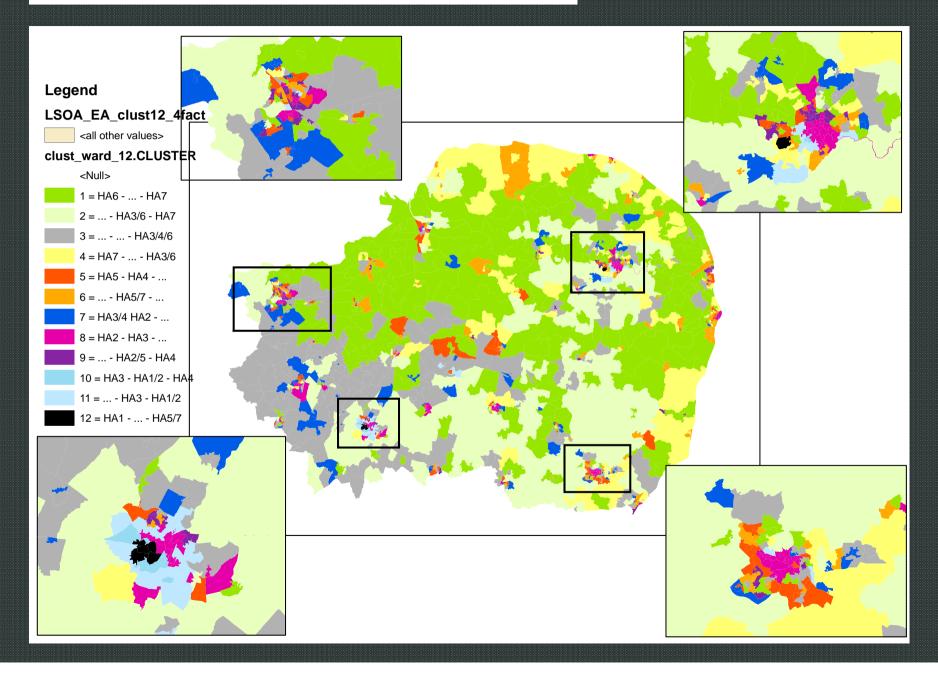
Source: Corentin Fontaine Lilibeth & Acosta-Michlik

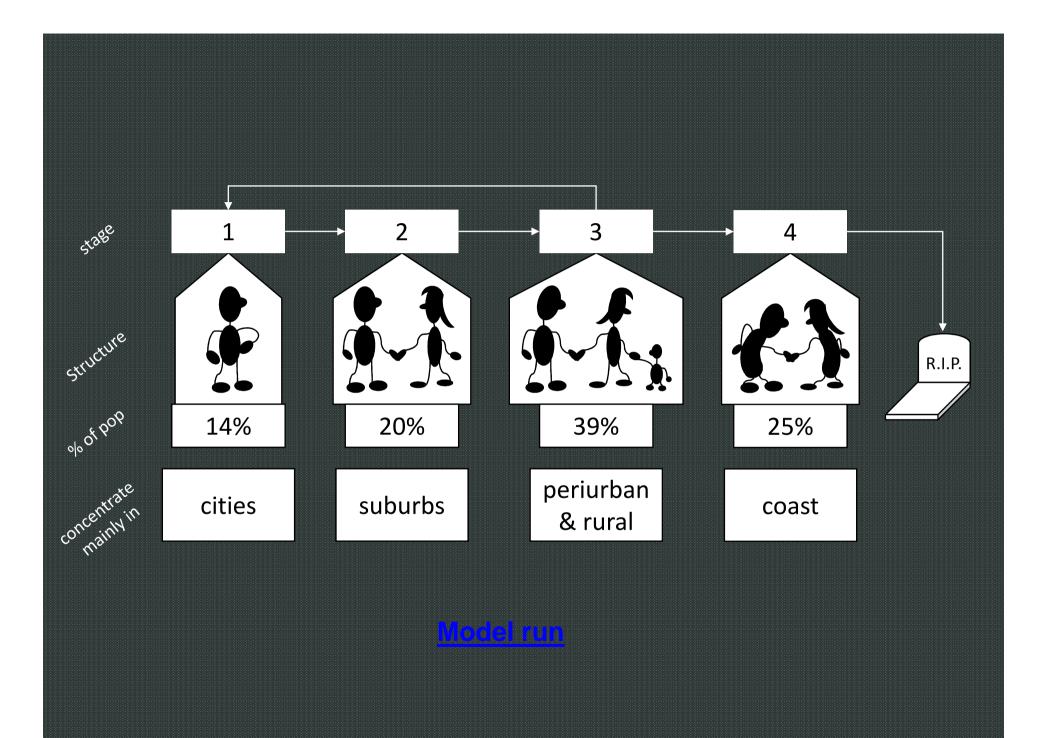
Residential agents

- Socio-economic data analysis
- Agent profiles (household types) & location trends

	CLUSTERS												
		1	2	3	4	5	6	7	8	9	10	11	12
isolated student	HA1										++	+	+++
single person	HA2							+	+++	++	++	+	
couple	HA3		++	+	+			+++	++		+++	++	
couple with dep. children	HA4			+		++		+++		+	+		
single-parent family	HA5					+++	++			++			+
couple with non-dep. children	HA6	+++	++	+	+								
all retired	HA7	+	+		+++		++						+

Household agent location preferences





Where do we see ABM?





O How can we understar l'al What are the processes that co between land use intensification expansion • What is the drive ortance future land use change, e development (with high • What is the role





Challenges for land system science

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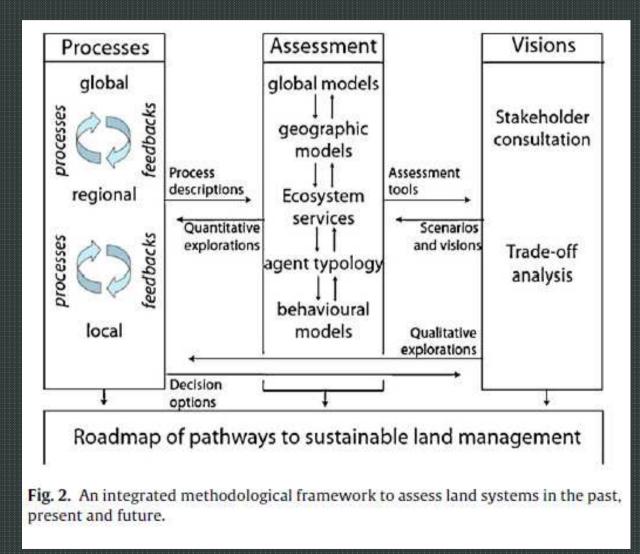
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Key questions

- Which innovative 'visions' can be formulated for future sustainable resource management and land use policy development under a range of environmental and management conditions?
- 2. What are the socio-economic and ecological 'processes' that shape land use transitions?
- 3. How can bottom-up and top-down modelling tools be improved and used in a comprehensive 'assessment' of critical thresholds for resource management with reference to land use change and ecosystem services?

Conceptual framework



Challenges for processes

- Contemporary landscapes are contingent outcomes of past and present patterns, processes and decisions
- Empirical analysis of past and present land-use change to provide insights into the socio-economic and ecological processes that shape land use transitions
- Gradual vs rapid land system dynamics and understanding changes in land use intensity
- Combining empirical analysis with multi-scale modelling to gain new insights into land system change processes

Challenges for modelling

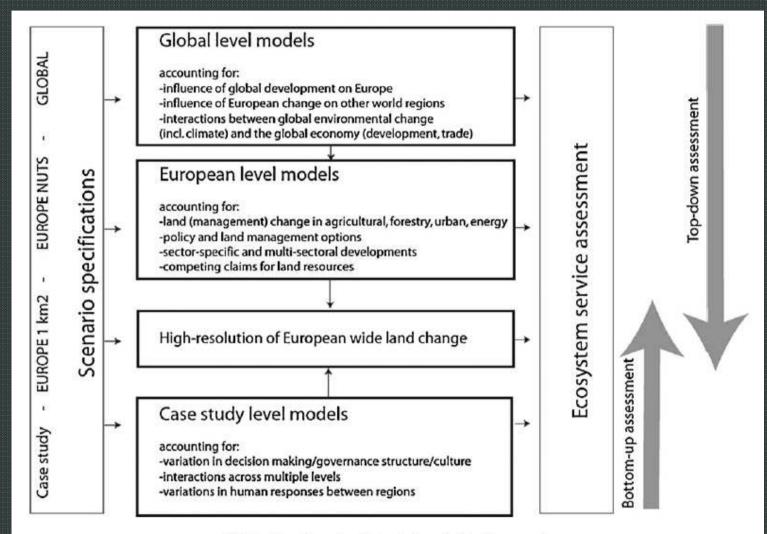


Fig. 4. Overview of an integrated modelling framework.

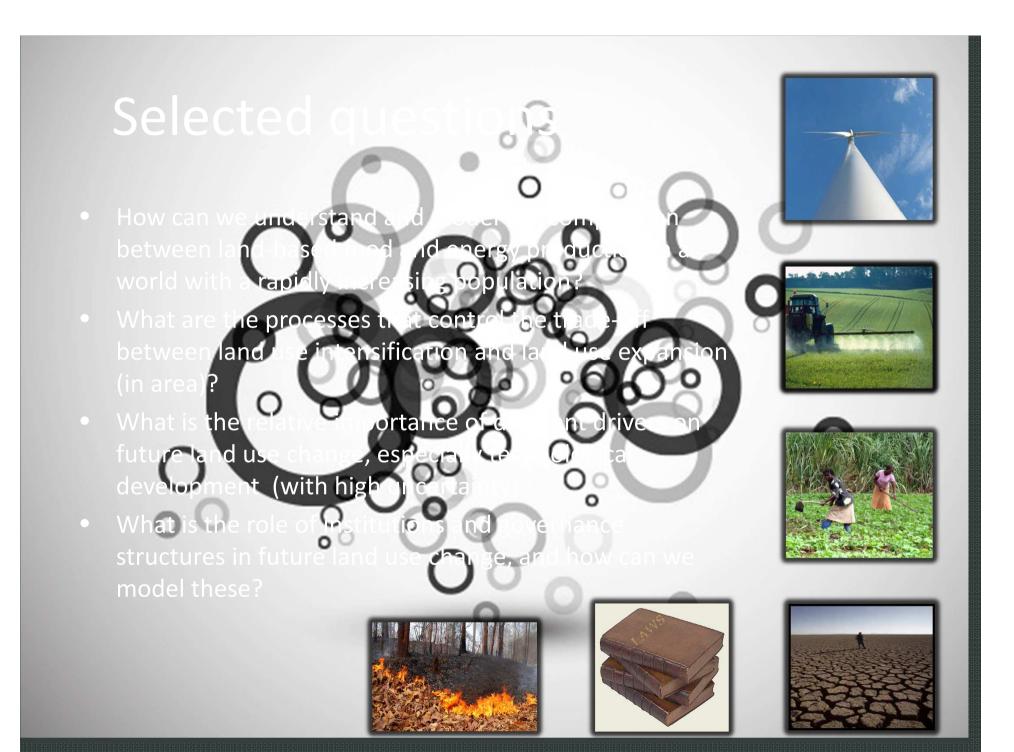
Land system models have an important role in supporting future land use policy, but model outputs require scientific interpretation rather than being presented as predictions

Challenges for land use futures

- Integrating explorative scenarios that reflect possible outcomes with normative visions that identify desired outcomes
- Road-mapping and envisioning techniques to guide future land use transitions derived from societal choices about future landscapes
- The broad and in-depth involvement of stakeholders in order to link scientific findings to political and societal decision-making culminating in a set of key choices and consequences
- Defining the bandwidth of both potential and desirable pathways of future land use change

Key themes in land system science

- <u>Uncertainty</u> (in observation, experiments, models and futures)
- <u>Integration</u> (across methods, disciplines, spatial and temporal scales, land use types, science and practice)
- <u>Tele-connections</u> (through time and space of people, goods, services, knowledge, ...)
- <u>Stakeholders</u> (involved in visions, trade-off analysis, values, institutional analysis, ...)
- A <u>changing paradigm</u> in land system science from pattern to process ...



Conclusions

- Providing insight into human–environment interactions is possible through integrated analysis of empirical and historical land system datasets, if empirical analysis and model simulation are used in combination to explore the drivers of land system change at a range of spatial and temporal scales.
- Integrated modelling based on the ecosystem service concept is expected to contribute substantially to the testing of hypotheses about land system functioning and decision making, assuming that iteration is undertaken between stakeholders, model applications and model outputs.
- The choices that society has about future landscapes can be informed in an innovative way through road-mapping and envisioning techniques that can guide future land use transitions.
- This will allow for the better definition of the bandwidth of both potential and desirable pathways of future land use change.
- There is growing awareness that the effectiveness of science in advising policy making can only be achieved through closer integration.
- This is especially true for land system research which aims to support policy making in the sustainable management of land resources because land plays a central and integrative role in many environmental decision processes from global to local scales.
- Sustainable land use strategies would benefit from being underpinned by a sound process understanding of how policies affect land use and ecosystem services and vice versa, and how the trade-offs and synergies between them work in practice.
- Embedding policy makers and relevant stakeholders in the research process through a carefully planned strategy of knowledge exchange, has the potential to support the formulation of sound, evidence-based policies.
- This paradigm shift in land system science requires a commitment to capacity building (mainly interdisciplinary and intra-disciplinary) that brings together the scientific and decision making communities.