



# Land-based climate change mitigation: modeling bioenergy production, afforestation and avoidance of deforestation

PhD defense of

Florian Humpenöder

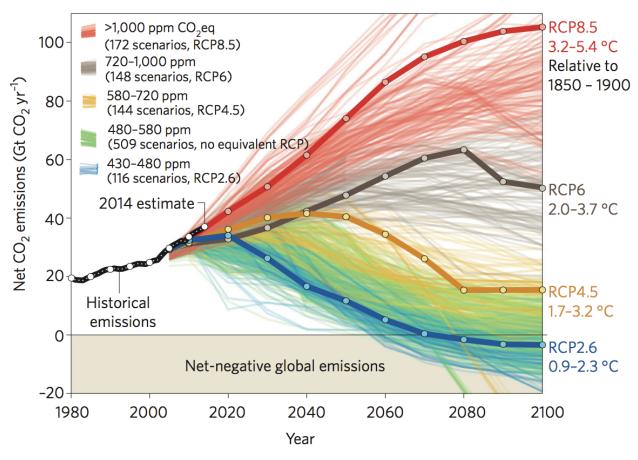
15 October 2015

#### **Outline**

- Motivation
- Methodology
- Main results
- Conclusions
- Outlook

### **MOTIVATION**

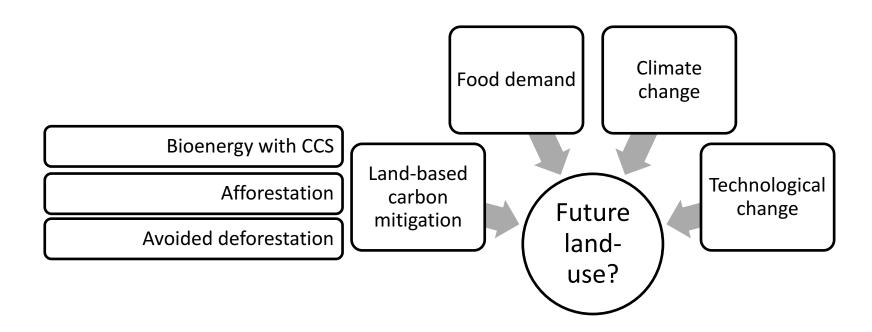
# Ambitious climate targets require negative emissions from land-based mitigation



Fuss et al. 2014 Betting on negative emissions *Nature Clim. Change* **4** 850–3; Figure 1a Data sources: IPCC AR5 database, Global Carbon Project and Carbon Dioxide Information Analysis Center

Main results

#### **Research questions**

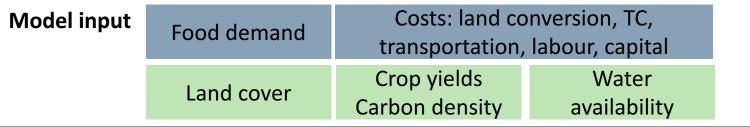


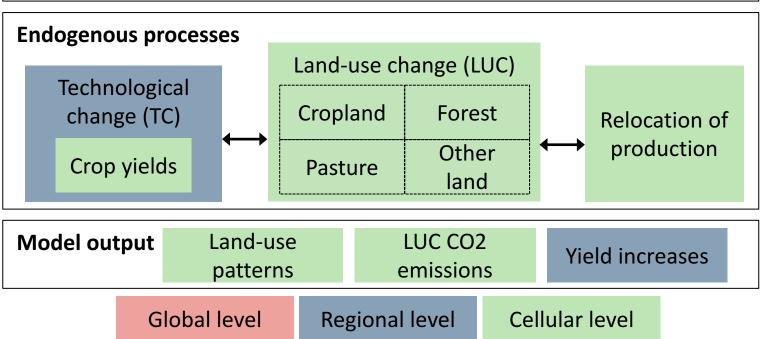
- What is the global potential of land-based carbon mitigation in the 21st century?
- What are the associated land requirements?
- What are the implications for the agricultural sector?

## **METHODOLOGY**

#### MAgPIE: economic land-use optimization model

Objective function: minimization of total global costs (recursive dynamic)





Motivation

Methodology

Main results

Conclusions

Outlook

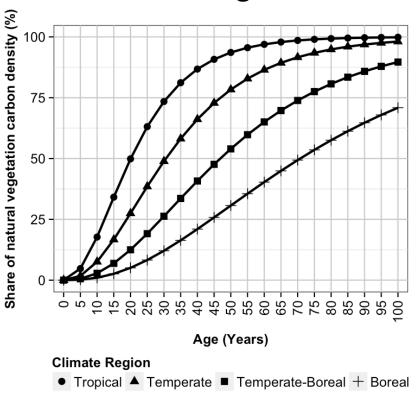
#### **Afforestation / Avoided deforestation**

Afforestation

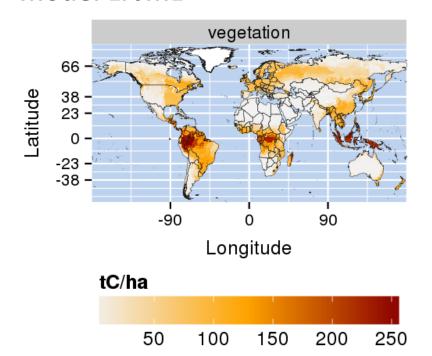
- Global CO<sub>2</sub> price as economic incentive for
  - Avoided deforestation (LUC CO<sub>2</sub> emissions \* CO<sub>2</sub> price)
  - Afforestation (neg. CO<sub>2</sub> emissions \* CO<sub>2</sub> price = cost reduction)
- Costs for forest established, management and monitoring
  - Indirect costs for investments in TC to free up agricultural land for afforestation
- Afforestation decision is based on a time horizon of 30 years
  - Limited foresight for carbon sequestration
- Afforestation is implemented as managed regrowth of natural vegetation

#### Afforestation / regrowth of natural vegetation

# Growth curves for climate regions based on Chapman-Richards volume growth model



Spatially explicit carbon density of potential natural vegetation from the biophysical process model LPJmL



Humpenöder et al. (2014), Environ. Research Letters

#### **Bioenergy in MAgPIE**

- Exogenous
  - Bioenergy demand on top of food demand
- Endogenous
  - CO<sub>2</sub> price as incentive for deployment of bioenergy with CCS
  - Capture rate and conversion efficiency determine CDR
  - Land-use costs for bioenergy production, and costs for CCS infrastructure and sequestration



### **MAIN RESULTS**

#### Structure of the thesis

Chap II	Land use protection for climate change mitigation
	A. Popp, F. Humpenöder et al. (2014), Nature Climate Change
Chap III	The global economic long-term potential of modern biomass in a climate-constrained world
	D. Klein, F. Humpenöder et al. (2014), Environ. Research Letters
Chap IV	Trade-offs between land and water requirements for large- scale bioenergy production
	M. Bonsch, F. Humpenöder et al. (2014), GCB Bioenergy
Chap V	Investigating afforestation and bioenergy CCS as climate change mitigation strategies
	F. Humpenöder, A. Popp et al. (2014), Environ. Research Letters
Chap VI	Land-use and carbon cycle responses to moderate climate change: implications for land-based mitigation?
	F. Humpenöder, A. Popp et al. (2015), Environ. Sci. Technol.

#### **Chapter V**

#### **OPEN ACCESS**

IOP Publishing

Environmental Research Letters

Environ. Res. Lett. 00 (2014) 000000 (13pp)

# Investigating afforestation and bioenergy CCS as climate change mitigation strategies

Florian Humpenöder<sup>1,2</sup>, Alexander Popp<sup>1</sup>, Jan Phillip Dietrich<sup>1</sup>, David Klein<sup>1,2</sup>, Hermann Lotze-Campen<sup>1</sup>, Markus Bonsch<sup>1,2</sup>, Benjamin Leon Bodirsky<sup>1,2</sup>, Isabelle Weindl<sup>1,3</sup>, Miodrag Stevanovic<sup>1,2</sup> and Christoph Müller<sup>1</sup>

Motivation Methodology Chapter V Conclusions Outlook

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<sup>&</sup>lt;sup>2</sup> Technical University of Berlin, Berlin, Germany

<sup>&</sup>lt;sup>3</sup> Humboldt University of Berlin, Berlin, Germany

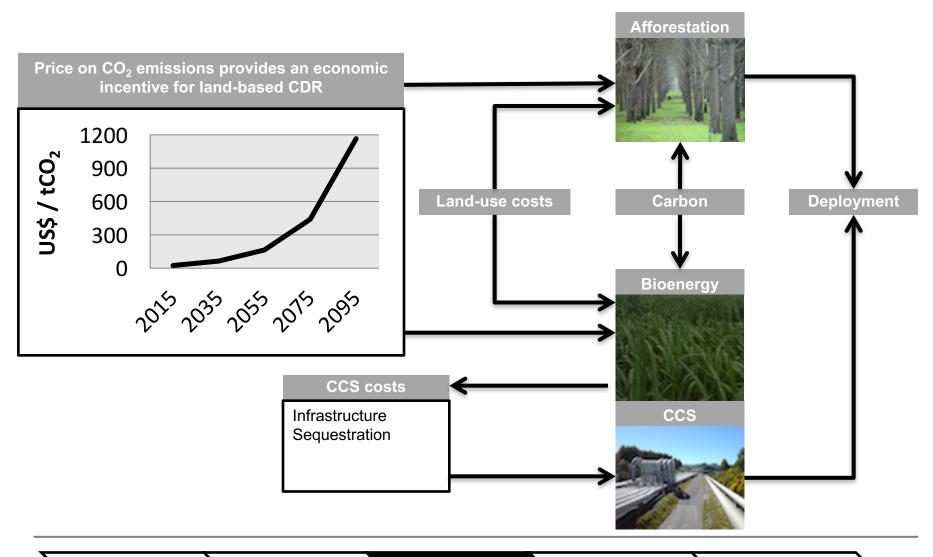
#### **Motivation**





- At what CO<sub>2</sub> price are afforestation and bioenergy with CCS deployed?
- How much land do these two options need for how much CDR?
- How much intensification would be needed for maintaining food production simultaneously?

### Study design



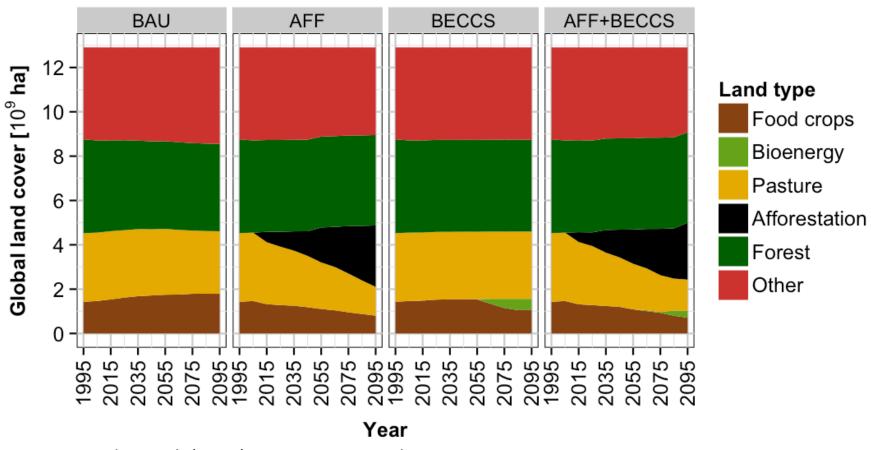
Motivation > Methodology

Chapter V

Conclusions

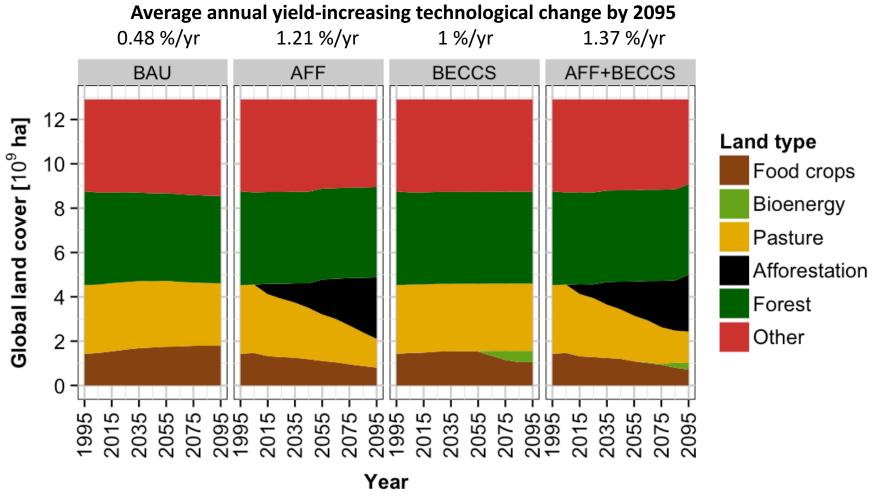
Outlook

# Strong afforestation at low CO<sub>2</sub> prices, bioenergy with CCS only at higher CO<sub>2</sub> prices



Humpenöder et al. (2014), Environ. Research Letters

# Large-scale land-based mitigation requires strong intensification of agricultural production

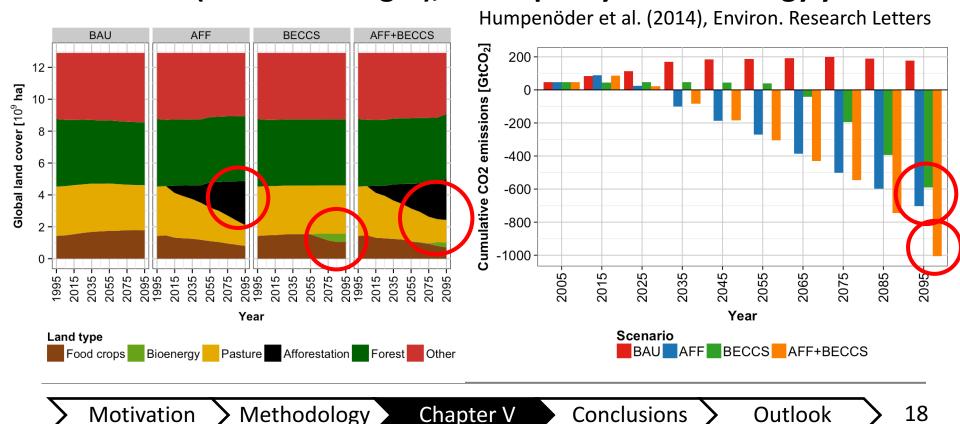


Humpenöder et al. (2014), Environ. Research Letters

Motivation Methodology Chapter V Conclusions Outlook

### Land requirement and CDR

- Afforestation requires about 5 times as much land as bioenergy with CCS for similar CDR by 2100
- Sensitivity of land-based mitigation to CO<sub>2</sub> price, planning horizon (limited foresight), CCS capacity and bioenergy yield



### **Chapter VI**



Article

pubs.acs.org/est

# Land-Use and Carbon Cycle Responses to Moderate Climate Change: Implications for Land-Based Mitigation?

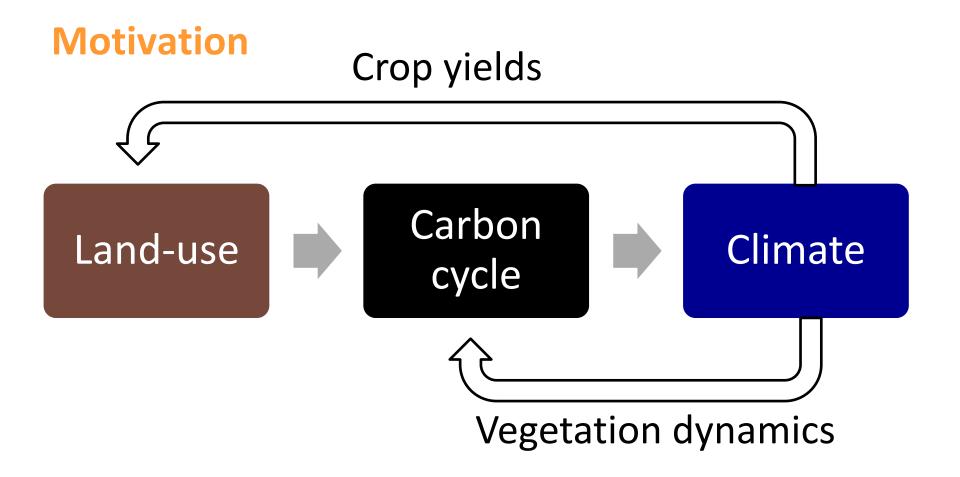
Florian Humpenöder,\*,†,‡ Alexander Popp,† Miodrag Stevanovic,†,‡ Christoph Müller,† Benjamin Leon Bodirsky,†,§ Markus Bonsch,†,‡ Jan Philipp Dietrich,† Hermann Lotze-Campen,†,∥ Isabelle Weindl,†,∥ Anne Biewald,† and Susanne Rolinski†

<sup>&</sup>lt;sup>†</sup>Potsdam Institute for Climate Impact Research (PIK), 14473 Potsdam, Germany

<sup>&</sup>lt;sup>‡</sup>Economics of Climate Change, Technische Universität Berlin (TU Berlin), 10623 Berlin, Germany

<sup>§</sup>The Commonwealth Scientific and Industrial Research Organisation (CSIRO), Brisbane, Australia

Humboldt-Universität zu Berlin, 10099 Berlin, Germany



- What are the direct and indirect effects of moderate climate change (RCP2.6) on terrestrial carbon stocks?
- What are the implications for land-based mitigation?

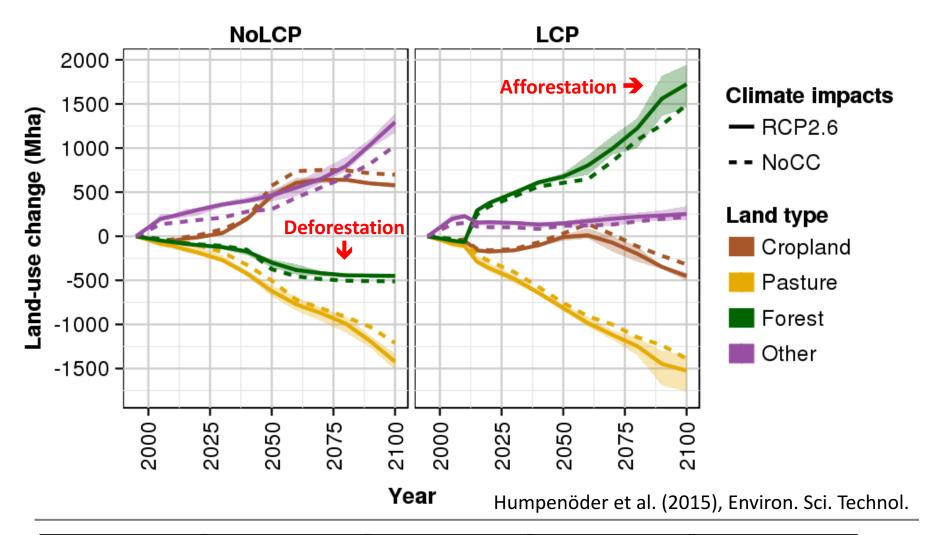
Motivation Methodology Chapter VI Conclusions Outlook

#### Study design

#### **Two dimensions**

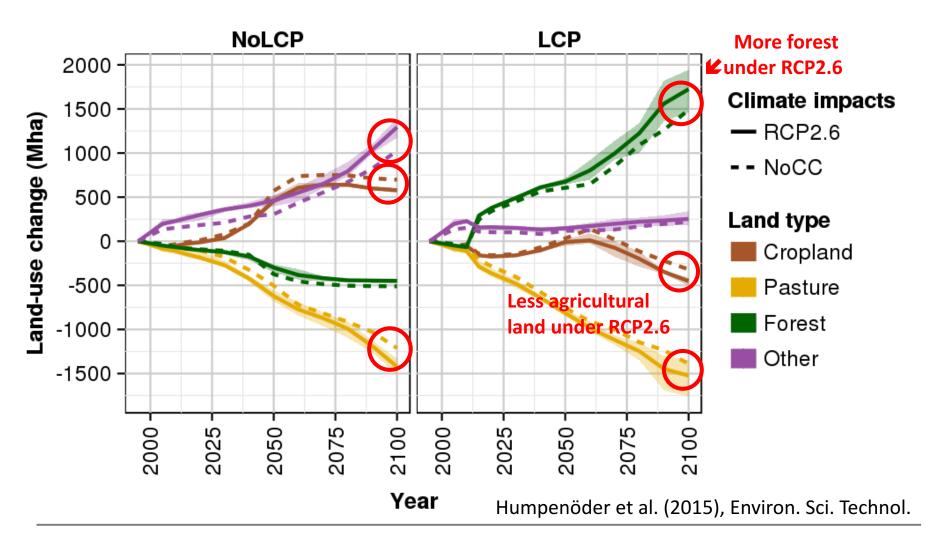
- Land-based climate policy
  - LCP: CO<sub>2</sub> price as incentive for afforestation / avoided deforestation
  - NoLCP: No CO<sub>2</sub> price
- Climate impacts on the land system
  - RCP2.6: Crop yields and carbon densities derived by LPJmL for RCP2.6 (incl. CO<sub>2</sub> fertilization) based on five different GCMs
  - NoCC: Crop yields and carbon densities are static at 1995 levels

# Land-based climate policy (LCP) has strong effects on land-use dynamics



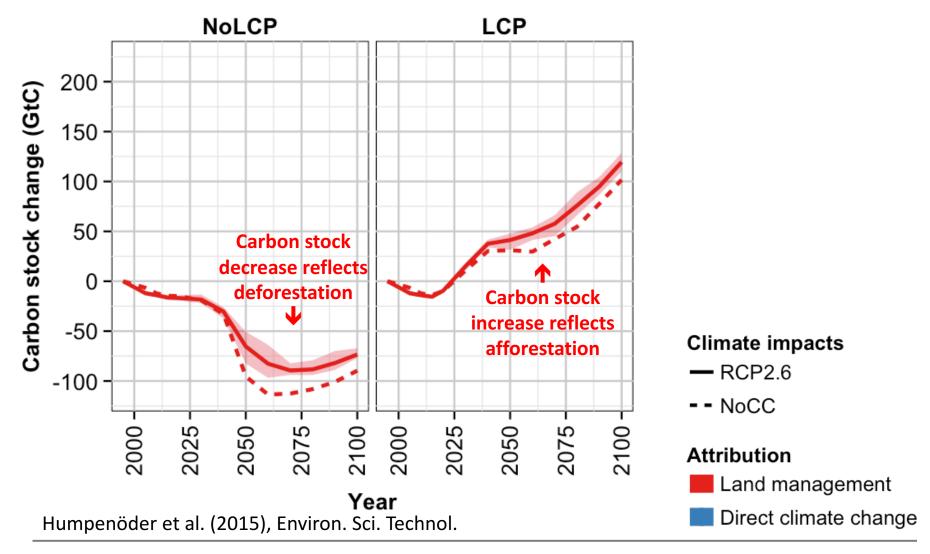
Motivation > Methodology Chapter VI Conclusions > Outlook

# Climate impacts under RCP2.6 reduce cropland requirements (positive effect on crop yields)



Motivation > Methodology Chapter VI Conclusions > Outlook

# Land-based climate policy (LCP) has strong effects on carbon stock dynamics



Motivation

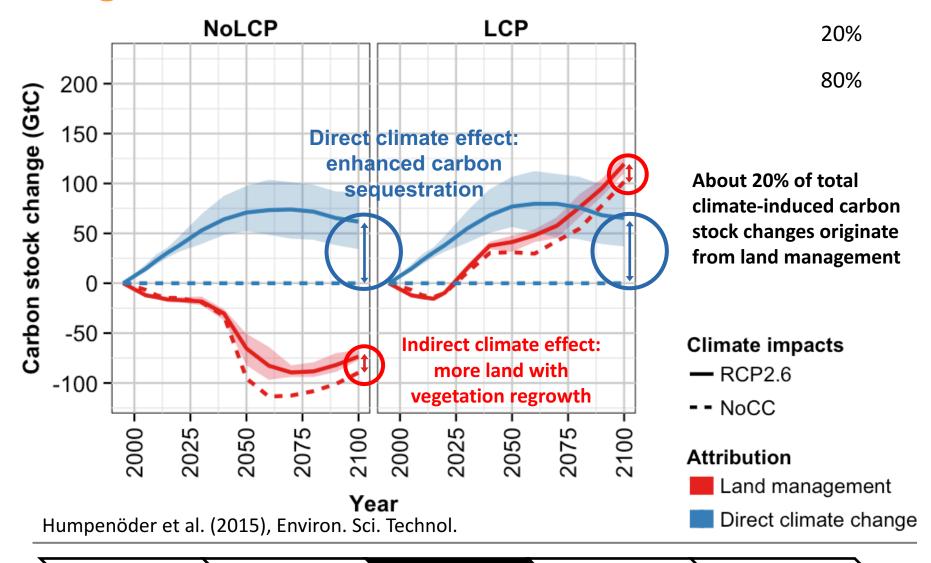
Methodology

Chapter VI

**Conclusions** 

Outlook

# Climate change (RCP2.6) has beneficial effects on global terrestrial carbon stocks



Motivation

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Outlook

### **CONCLUSIONS**

#### **Conclusions**

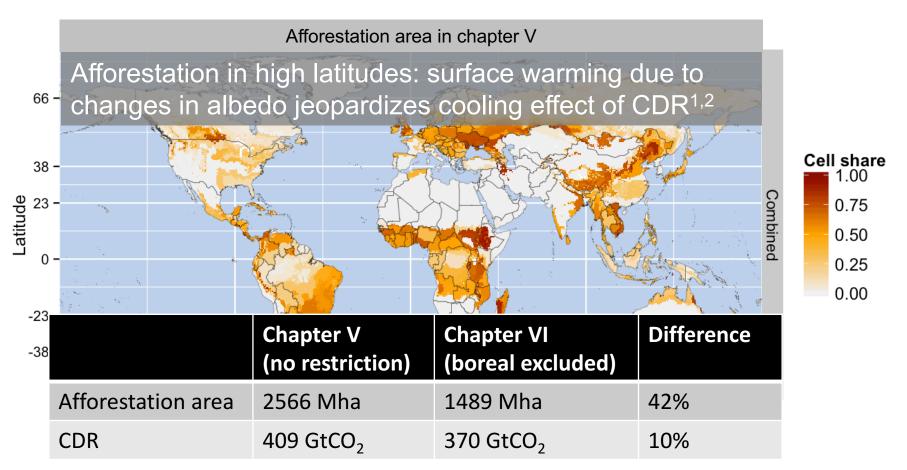
- Afforestation and bioenergy with CCS could remove considerable amounts of carbon from the atmosphere but have substantially different land requirements
- Large-scale land-based mitigation and maintaining food production at the same time would require strong continuous intensification of agricultural production
- A moderate increase of the atmospheric CO<sub>2</sub> concentration (RCP2.6) has beneficial effects on global terrestrial carbon stocks, but does not further increase the potential of landbased mitigation
- Future analysis of mitigation pathways in IAMs should consider land-use and associated carbon cycle responses to climate change

### **OUTLOOK**

#### **Outlook**

Accounting for surface albedo effects of afforestation

#### Afforestation and surface albedo effects



<sup>&</sup>lt;sup>1</sup>Schaeffer M, Eickhout B, Hoogwijk M, Strengers B, van Vuuren D, Leemans R and Opsteegh T 2006 CO2 and albedo climate impacts of extratropical carbon and biomass plantations, Global Biogeochemical Cycles <sup>2</sup>Bala G, Caldeira K, Wickett M, Phillips T J, Lobell D B, Delire C and Mirin A 2007 Combined climate and carbon-cycle effects of large-scale deforestation *PNAS* **104** 6550–5

Motivation Methodology Main results Conclusions Outlook

#### Outlook

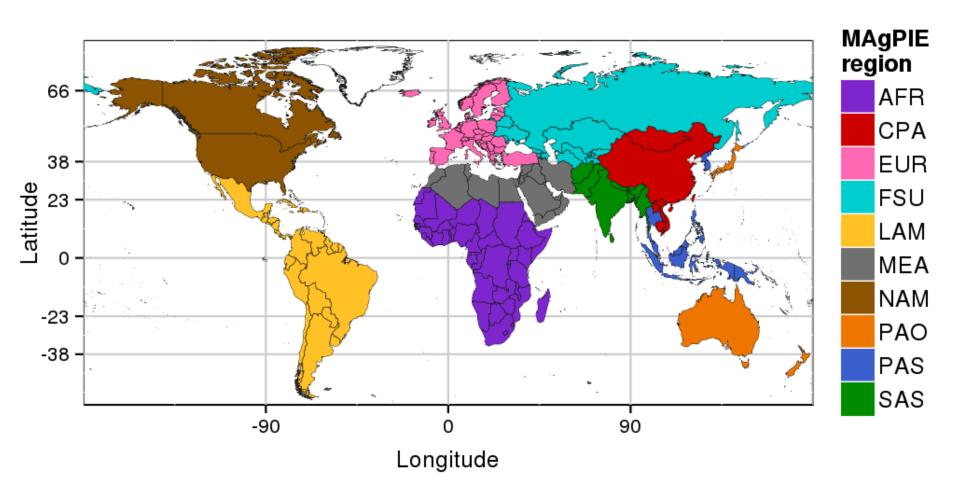
- Accounting for surface albedo effects of afforestation
- Permanence of terrestrial carbon sinks
- **Exploring interactions of land-based mitigation with options** in other sectors
- Food security issues of large-scale land-based mitigation

Outlook

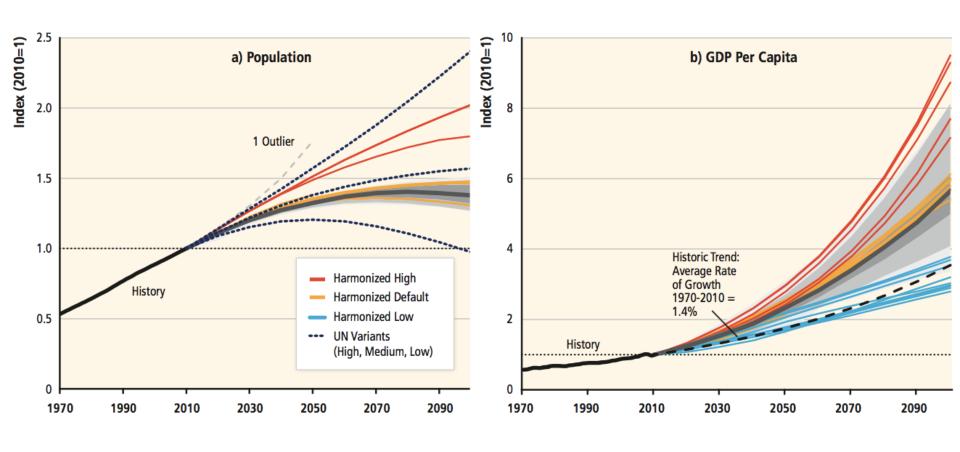


### **BACKUP SLIDES**

#### MAgPIE world regions

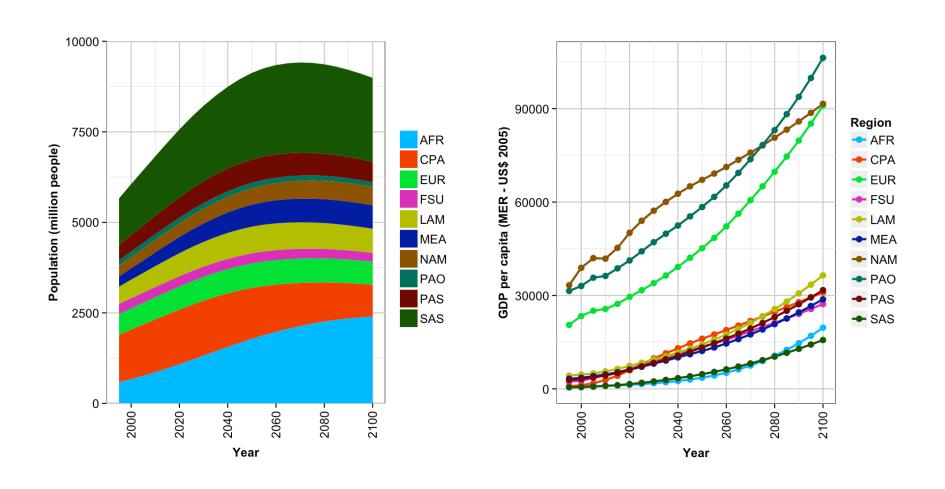


### **Population and GDP projections**

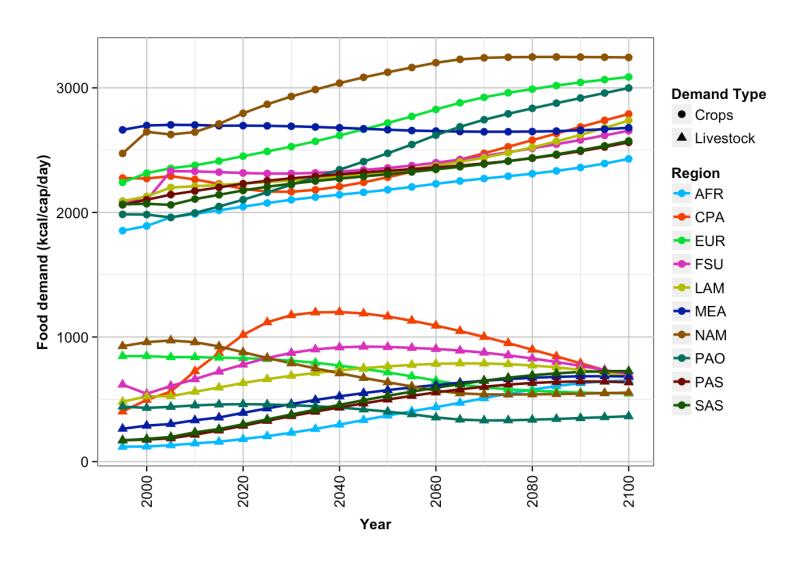


#### **Population (SSP2)**

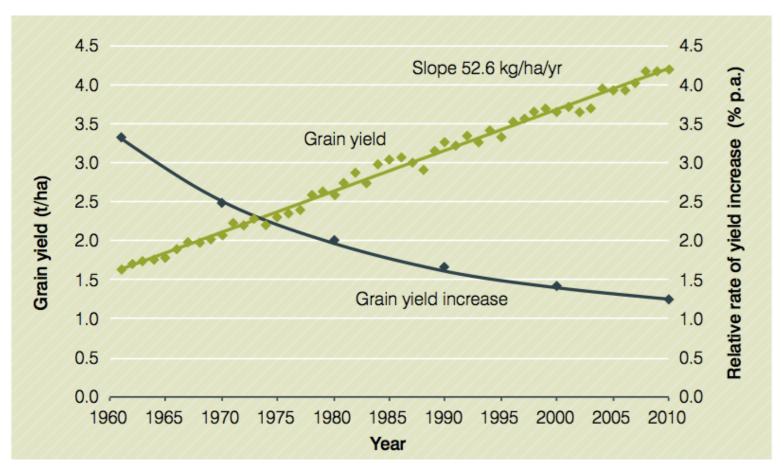
#### **GDP** per capita (SSP2)



## Food demand per capita (SSP2)

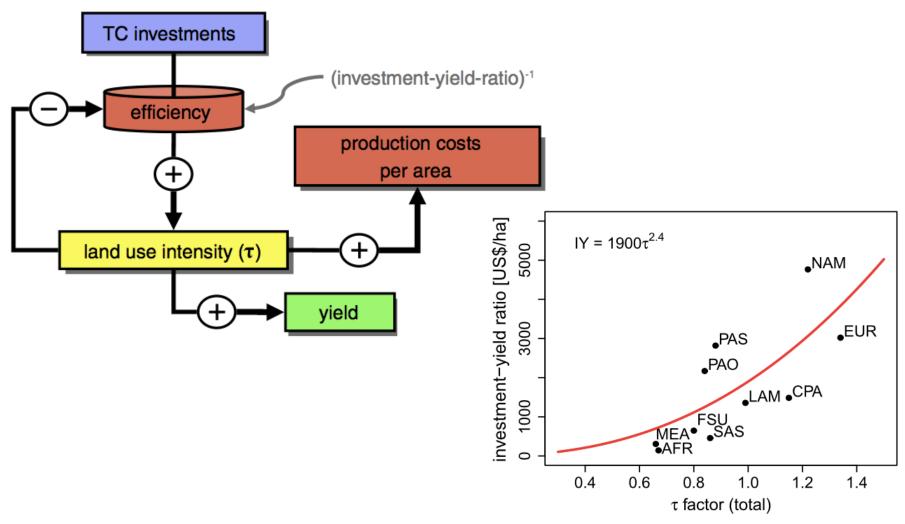


## Historical development of grain yields



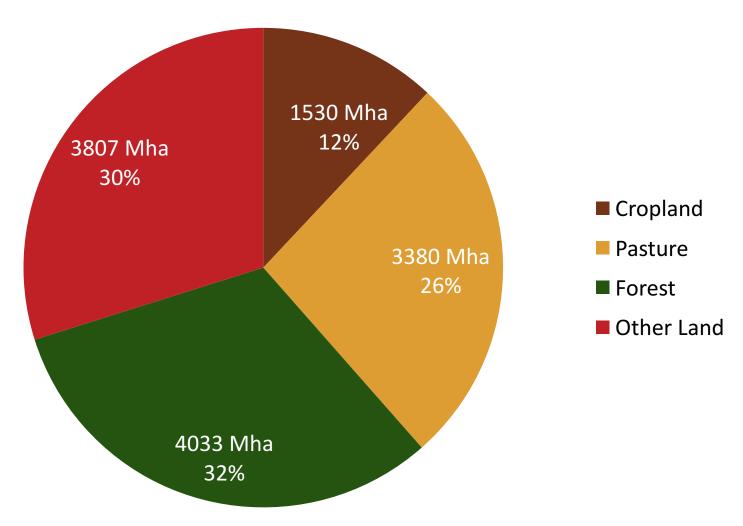
Fischer T, Byerlee D and Edmeades G 2014 Crop yields and global food security: Will yield increase continue to feed the world? ACIAR Monograph 2014; 158. Australian Centre for International Agricultural Research; Data based on FAOSTAT (2013)

## TC in MAgPIE



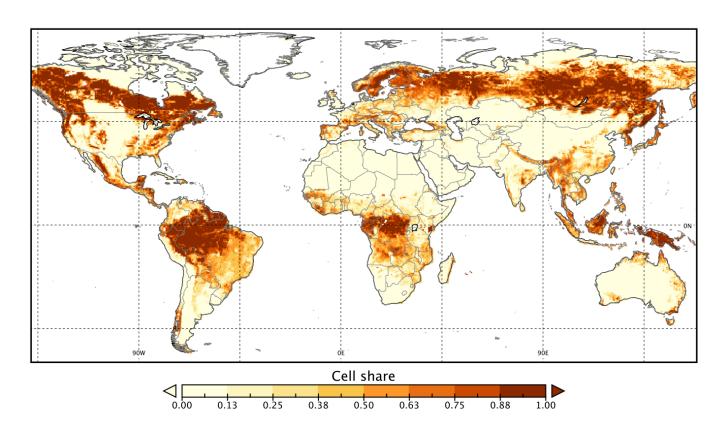
Dietrich J P, Schmitz C, Lotze-Campen H, Popp A and Müller C 2014 Forecasting technological change in agriculture—An endogenous implementation in a global land use model Technological Forecasting and Social Change 81 236–49

## **Current global land-use**



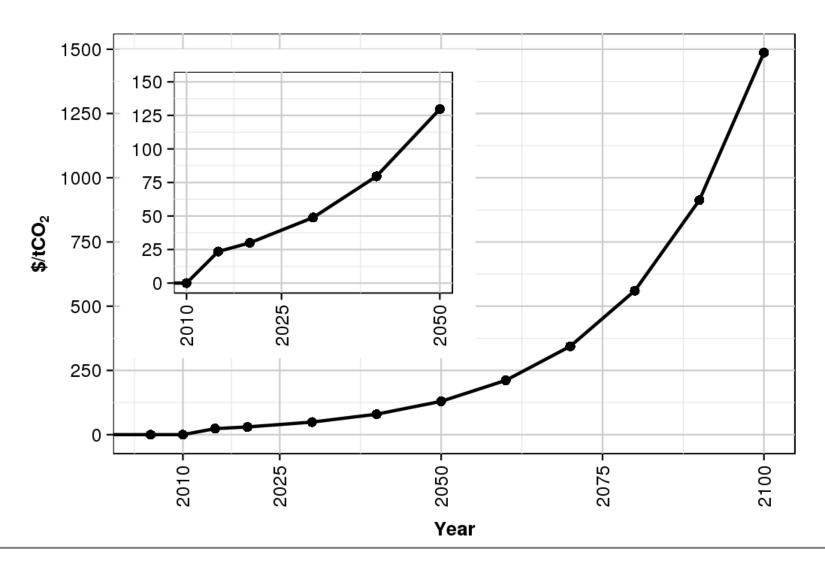
Own illustration based on Foley et al (2011), Ramankutty et al (2008) and FAO (2010)

## Global forest cover in the year 2000

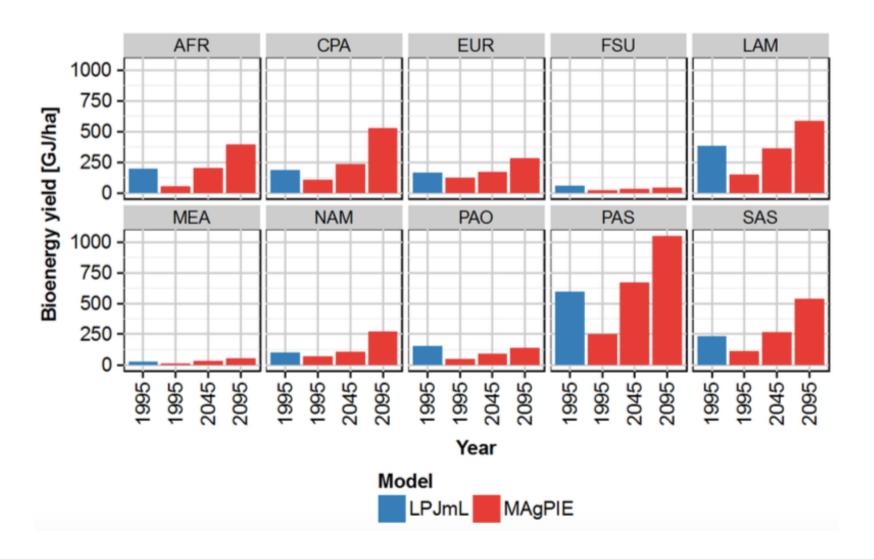


Based on Erb K-H, Gaube V, Krausmann F, Plutzar C, Bondeau A and Haberl H 2007 A comprehensive global 5 min resolution land-use data set for the year 2000 consistent with national census data *Journal of Land Use Science* **2** 191–224

## **CO2** price trajectory



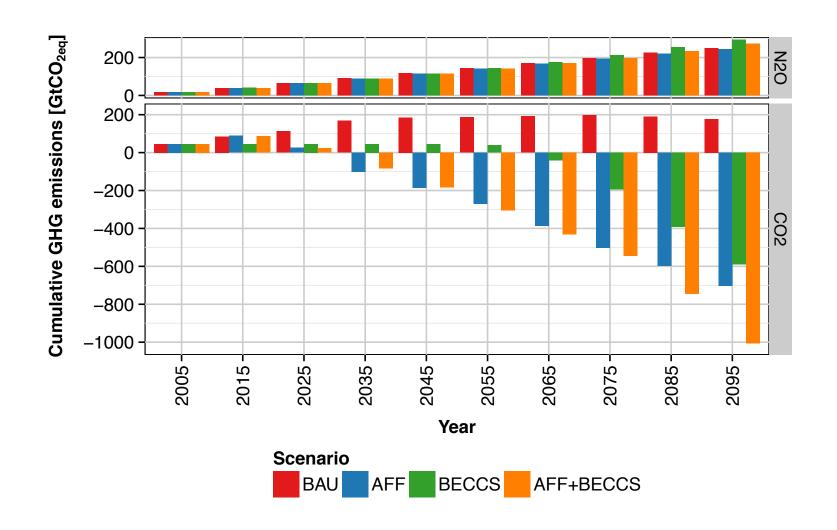
## Herbaceous bioenergy yields (AFF+BECCS)



## Biomass conversion routes with CCS in MAgPIE

- Biomass to Hydrogen (B2H2)
  - capture rate 90%, conversion efficiency 55%
- Biomass Integrated Gasification Combined Cycle (BIGCC)
  - capture rate 80%, conversion efficiency 31%
- Biomass to Liquid (B2L)
  - capture rate 48%, conversion efficiency 41%

## **GHG** emissions



## Sensitivity analysis of land-use and CDR

#### **CCS** capacity

Low: 198 GtCO<sub>2</sub>

Default: 3960 GtCO<sub>2</sub>

High: 79200 GtCO<sub>2</sub>

#### **GHG** tax (growth rate 5%)

• Low:  $5 $/tCO_2$ 

Default: 30 \$/tCO<sub>2</sub>

• High: 50 \$/tCO<sub>2</sub>

#### **Discount rate**

• Low: 4%

Default: 7%

High: 10%

#### **Time horizon**

Low: 10 years

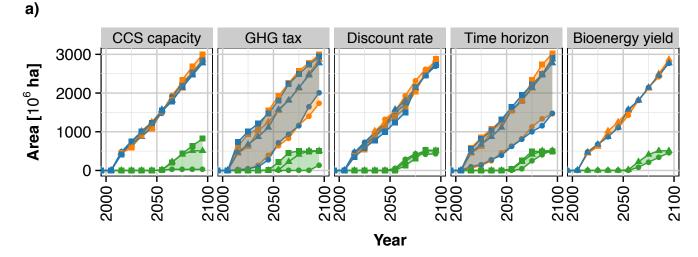
Default: 30 years

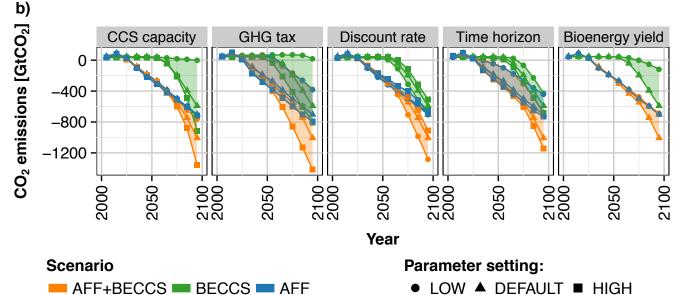
High: 50 years

#### **Bioenergy yield**

 Low: No TC on bioenergy crops

 Default: TC on food and bioenergy crops





# Sensitivity analysis of herbaceous and woody bioenergy production (2095)

#### **CCS** capacity

Low: 198 GtCO<sub>2</sub>

Default: 3960 GtCO<sub>2</sub>

High: 79200 GtCO<sub>2</sub>

#### **GHG** tax (growth rate 5%)

Low: 5 \$/tCO<sub>2</sub>

Default: 30 \$/tCO<sub>2</sub>

High: 50 \$/tCO<sub>2</sub>

#### **Discount rate**

• Low: 4%

• Default: 7%

High: 10%

#### Time horizon

Low: 10 years

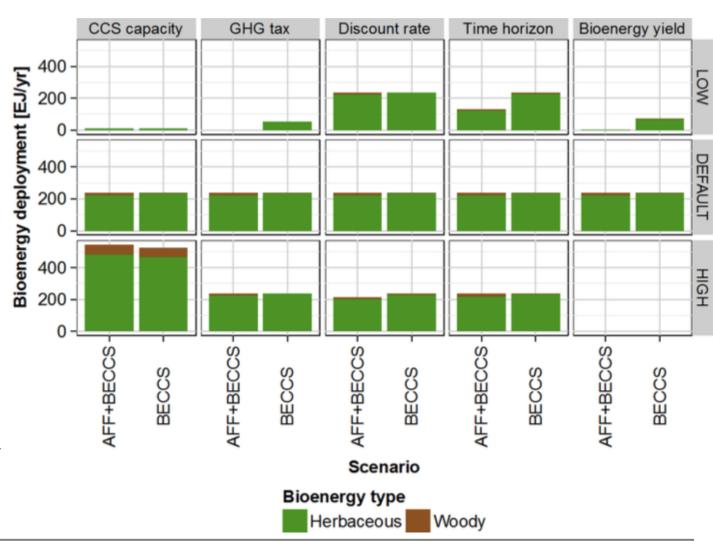
• Default: 30 years

High: 50 years

#### **Bioenergy yield**

 Low: No TC on bioenergy crops

 Default: TC on food and bioenergy crops



# Sensitivity analysis of global bioenergy production

#### **CCS** capacity

Low: 198 GtCO<sub>2</sub>

Default: 3960 GtCO<sub>2</sub>

High: 79200 GtCO<sub>2</sub>

#### GHG tax (growth rate 5%)

• Low: 5 \$/tCO<sub>2</sub>

Default: 30 \$/tCO<sub>2</sub>

High: 50 \$/tCO<sub>2</sub>

#### **Discount rate**

• Low: 4%

• Default: 7%

High: 10%

#### Time horizon

Low: 10 years

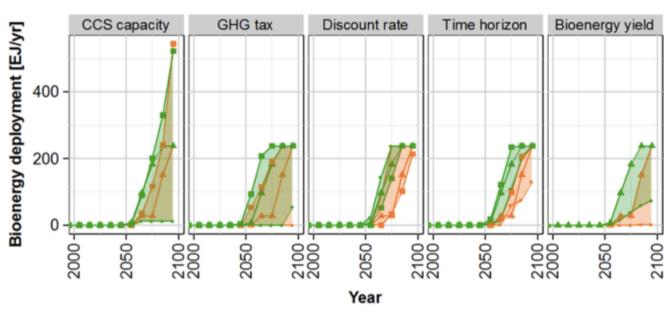
• Default: 30 years

High: 50 years

#### **Bioenergy yield**

 Low: No TC on bioenergy crops

 Default: TC on food and bioenergy crops



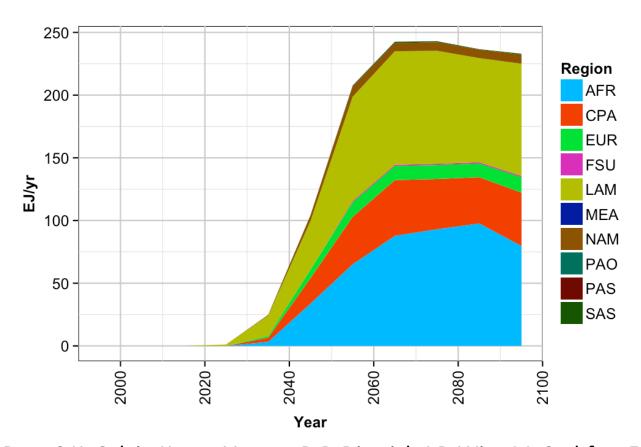
#### Scenario:

■ AFF+BECCS ■ BECCS

#### Parameter setting:

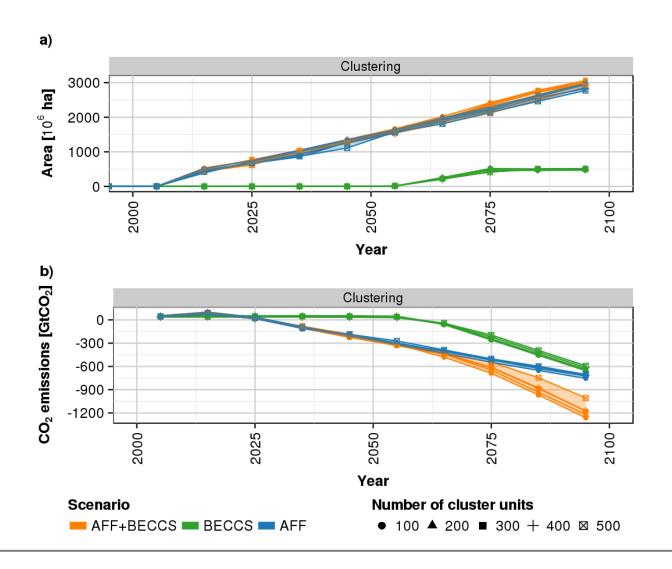
LOW ▲ DEFAULT ■ HIGH

# **Exogenous bioenergy demand in Chapter VI** (450 ppm scenario from REMIND)

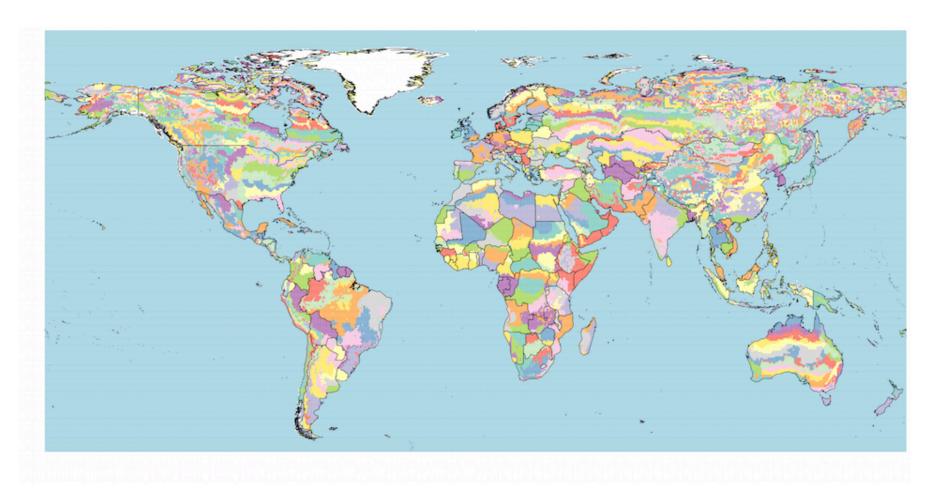


Popp A, Rose S K, Calvin K, van Vuuren D P, Dietrich J P, Wise M, Stehfest E, Humpenöder F, Kyle P, Vliet J V, Bauer N, Lotze-Campen H, Klein D and Kriegler E 2014 Land-use transition for bioenergy and climate stabilization: model comparison of drivers, impacts and interactions with other land use based mitigation options Climatic Change 123 495–509

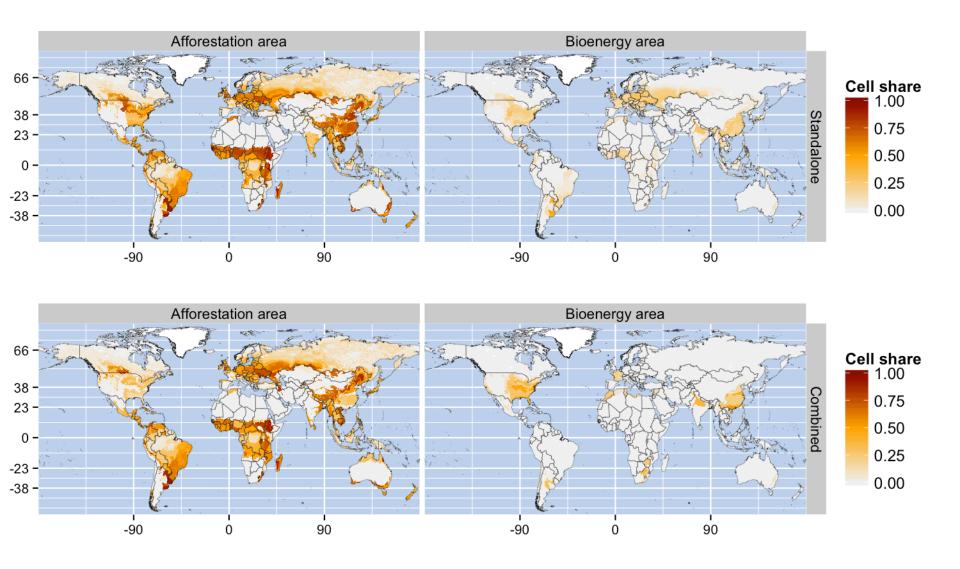
## Sensitivity analysis of cluster / simulation units



# MAgPIE cellular level (500 clusters / simulation units)

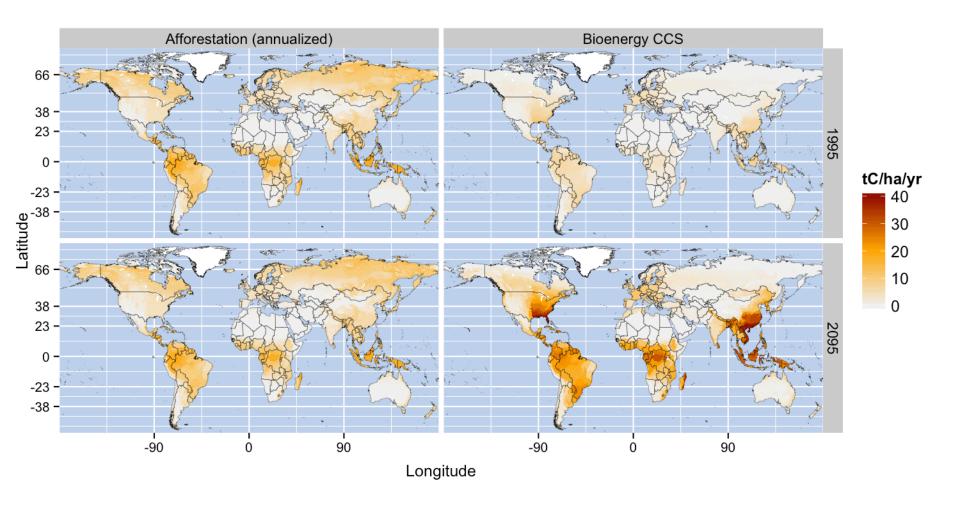


## Afforestation and bioenergy area in 2095



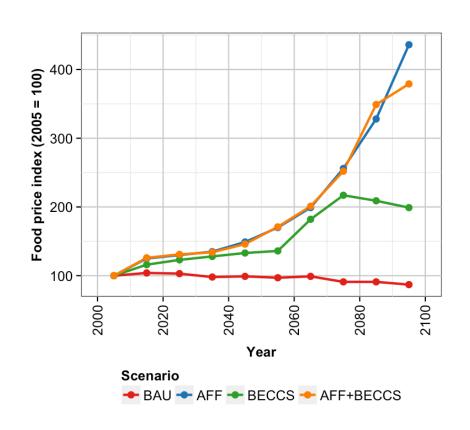
Humpenöder et al. (2014), Environ. Research Letters

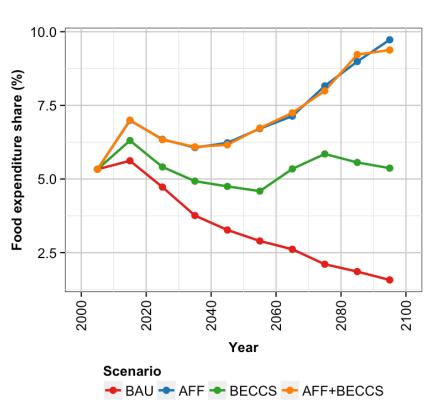
## **Potential CDR rates**



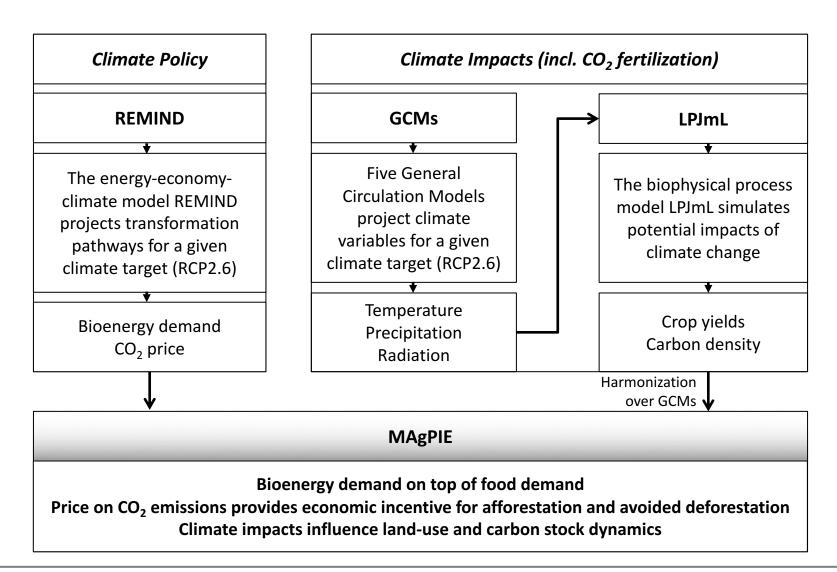
## **Food price index**

## **Food expenditure share**

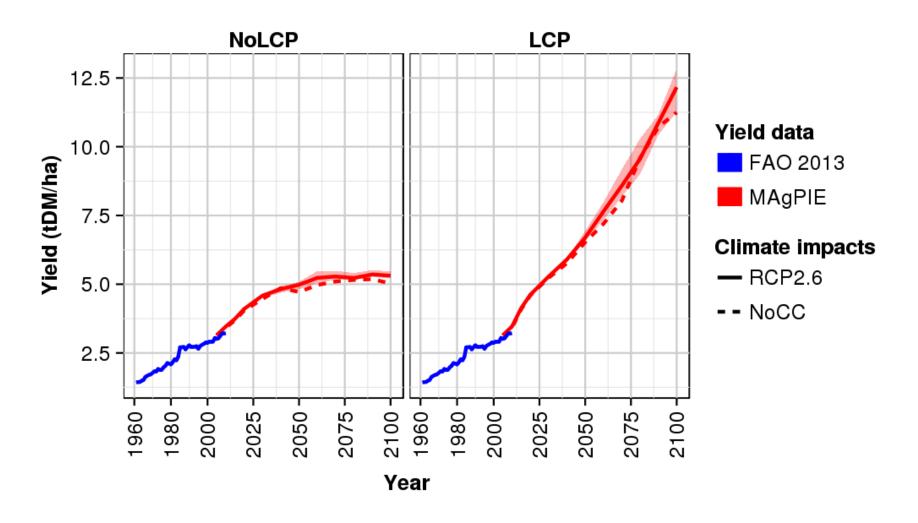




## **Chapter VI - Study design**



## **Agricultural yields**



## **Chapter VI - summary of scenario results**

	NoLCP		LCP	
NoCC	reference		LCP only	
	$\Delta$ carbon stock	full effect	$\Delta$ carbon stock	full effect
	-90 GtC	0 GtC	101 GtC	191 GtC
RCP2.6	RCP2.6 only		combined setting	
	$\Delta$ carbon stock	full effect	$\Delta$ carbon stock	full effect
	-12 GtC	78 GtC	185 GtC	275 GtC
	191 GtC + 78 GtC = 269 GtC ~ 275 GtC			

Carbon stock changes and full carbon mitigation effect in GtC. Carbon stock changes show the net effect of land management and (direct) climate change between 1995 and 2100 at the global scale. The full carbon mitigation effect reflects the difference in these carbon stock changes between the respective scenario and the reference scenario.

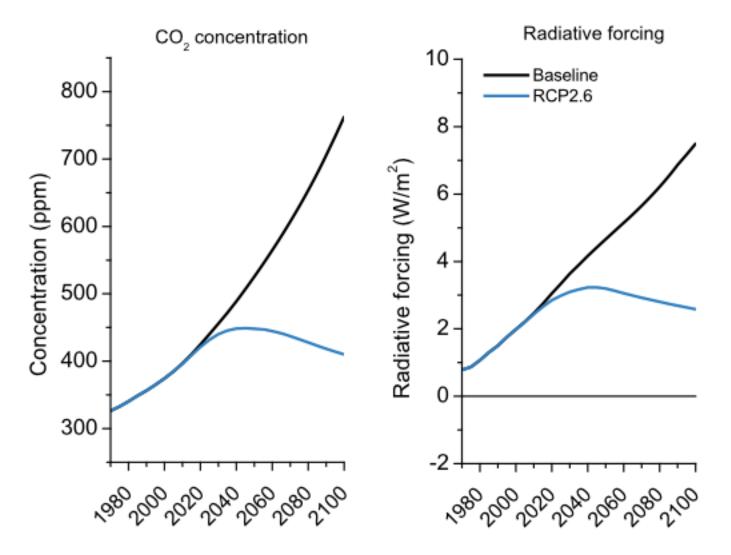
## **Shared Socio-economic Pathways (SSPs)**



## Socio-economic challenges for adaptation

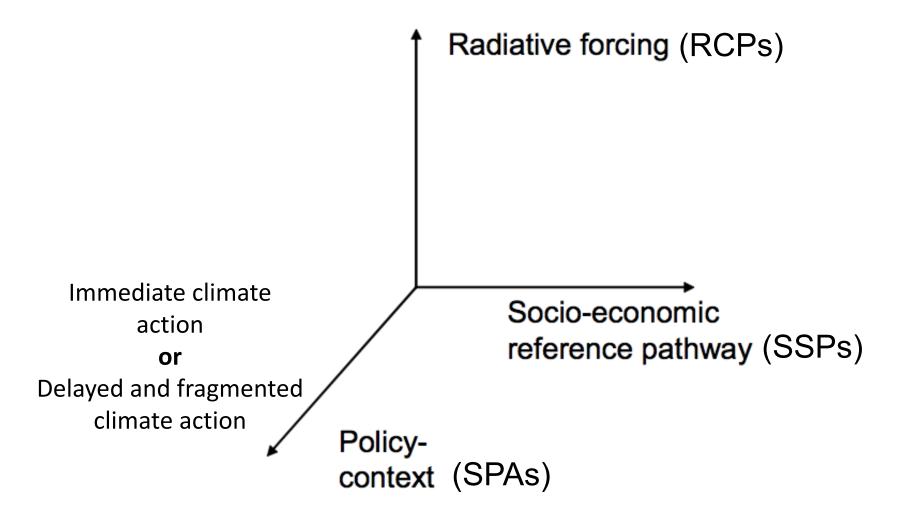
O'Neill B C, Kriegler E, Ebi K L, Kemp-Benedict E, Riahi K, Rothman D S, van Ruijven B J, van Vuuren D P, Birkmann J, Kok K, Levy M and Solecki W 2015 The roads ahead: Narratives for shared socioeconomic pathways describing world futures in the 21st century Global Environmental Change

## **RCP 2.6**



van Vuuren D P, Stehfest E, Elzen M G J den, Kram T, van Vliet J, Deetman S, Isaac M, Goldewi K, Hof A, Beltran A M, Oostenrijk R and van Ruijven B 2011 RCP2.6: exploring the possibility to keep global mean temperature increase below 2°C *Climatic Change* **109** 95–116

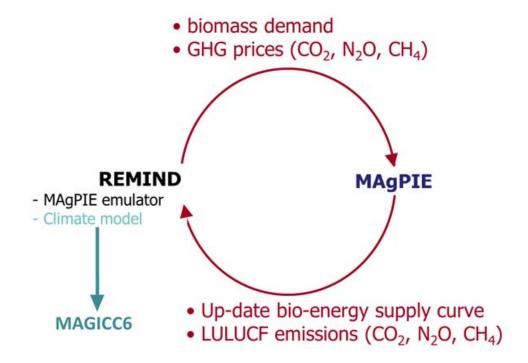
### SSP x RCP x SPA



Based on Kriegler E, Edmonds J, Hallegatte S, Ebi K L, Kram T, Riahi K, Winkler H and van Vuu D P 2014 A new scenario framework for climate change research: the concept of shared climate policy assumptions *Climatic Change* 1–14

## **REMIND-MAgPIE** coupling

 Currently, the coupling of REMIND (energy-economy) and MAgPIE (land-use) aims to find consistent price and quantity paths for bioenergy production and GHG emissions



## Challenges in forest carbon accounting

### Additionality

 Removal or sink in addition to what would have occurred in the absence of a project

#### Permanence

 Natural disturbance (e.g. hurricane, wildfire) or management activities (e.g. harvesting) that release carbon back to the atmosphere

### Leakage

Deforestation is displaced to locations without emission control

Angelsen A and Center for International Forestry Research 2008 Moving ahead with REDD: issues, options and implications (Bogor, Indonesia: Center for International Forestry Research)

## **END**