

# Quantifying the Role of Northern Eurasia in the Global Carbon and Water Dynamics during the 21<sup>st</sup> Century

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# Northern Eurasia

The coldest land mass at continental scales.  
Home of about 20 indigenous nations

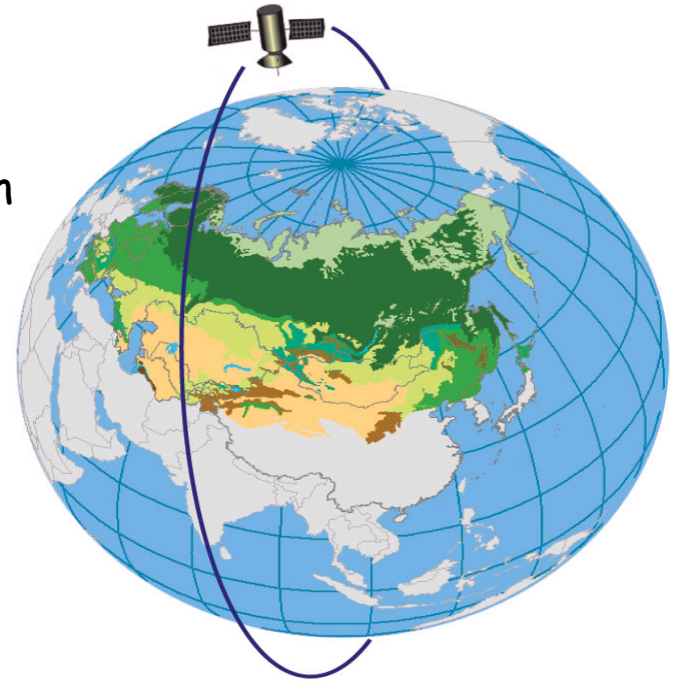
22% of global forests; Accounts for more than  
50% of industrial coniferous wood

2/3 of the area is underlain by permafrost  
which contains from 500-900 Pg C

Dramatic climate changes occurred in  
the last few decades

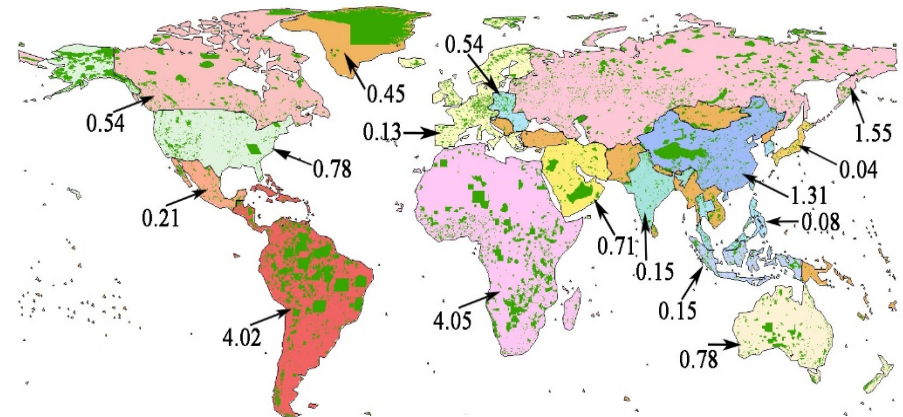
Unregulated and devastating anthropogenic activities

One of the most vulnerable regions of the globe

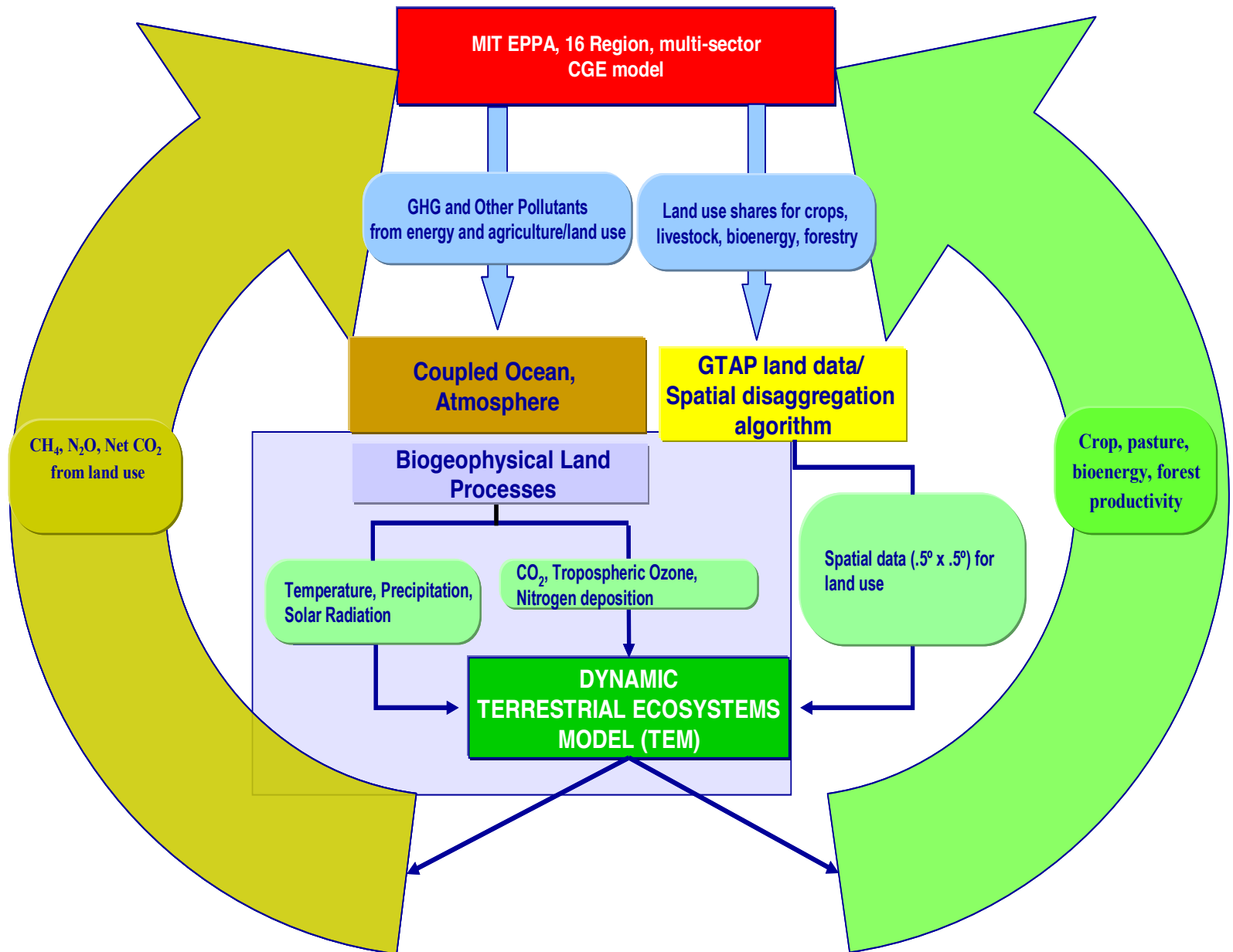


# Research Questions

- How the land use and land cover in Northern Eurasia and the globe will be affected by the global natural and anthropogenic changes in this century?
- How carbon and water cycles will be affected by the changes of land use and land cover and climate at the regional and global scales? - **Implications to the global climate system and socioeconomic system**



# Coupled Natural and Human Systems



# Major Features of EPPA and TEM

## Socioeconomic Model EPPA

- Multiple regions - Globe divided into 16 economic regions
- Multiple fuels - Fossil, Nuclear, Wind, Solar, Biomass, Biofuels
- Multiple sectors - Industry, Transportation, Households, Agriculture, Forestry
- Based on GTAP (Global trading database developed at Purdue)

## Land Ecosystem and Biogeochemistry Model TEM

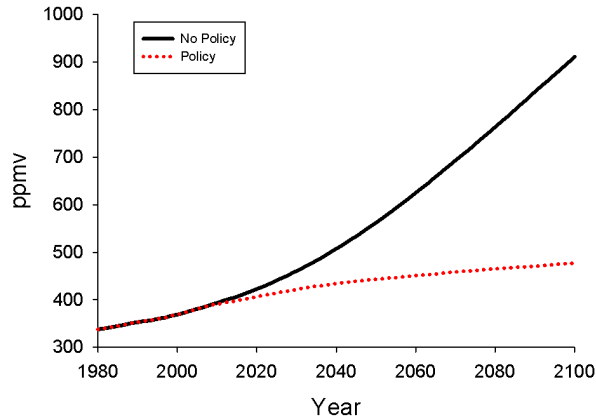
- Cycling of carbon, nitrogen, and water
- Spatial information on soils, vegetation, climate, elevation, atmospheric chemistry (carbon dioxide, tropospheric ozone)
- Coupled with permafrost and fire dynamics

# Major Features of SiBCliM

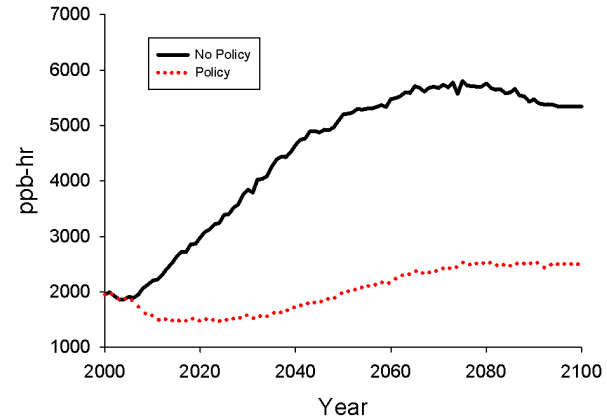
- A static envelope-type large-scale bioclimatic model based on the vegetation classification of Shumilova (1962)
- SiBCliM uses three bioclimatic indices: (1) growing degree-days above  $5^{\circ}\text{C}$ ; (2) negative degree-days below  $0^{\circ}\text{C}$ ; and (3) an annual moisture index (ratio of growing degree days above  $5^{\circ}\text{C}$  to annual precipitation)
- SiBCliM has been updated to include permafrost (the active layer depth)

# Global Climate and Atmospheric Conditions

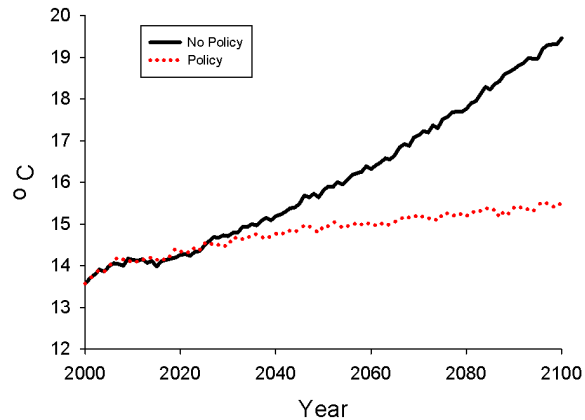
a) Atmospheric CO<sub>2</sub> concentrations



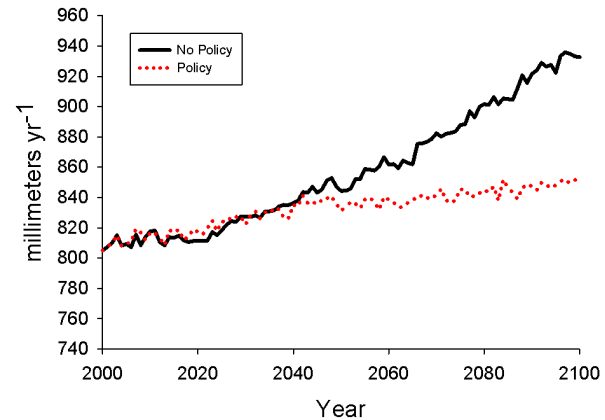
b) AOT40 ozone index



c) Global mean air temperature

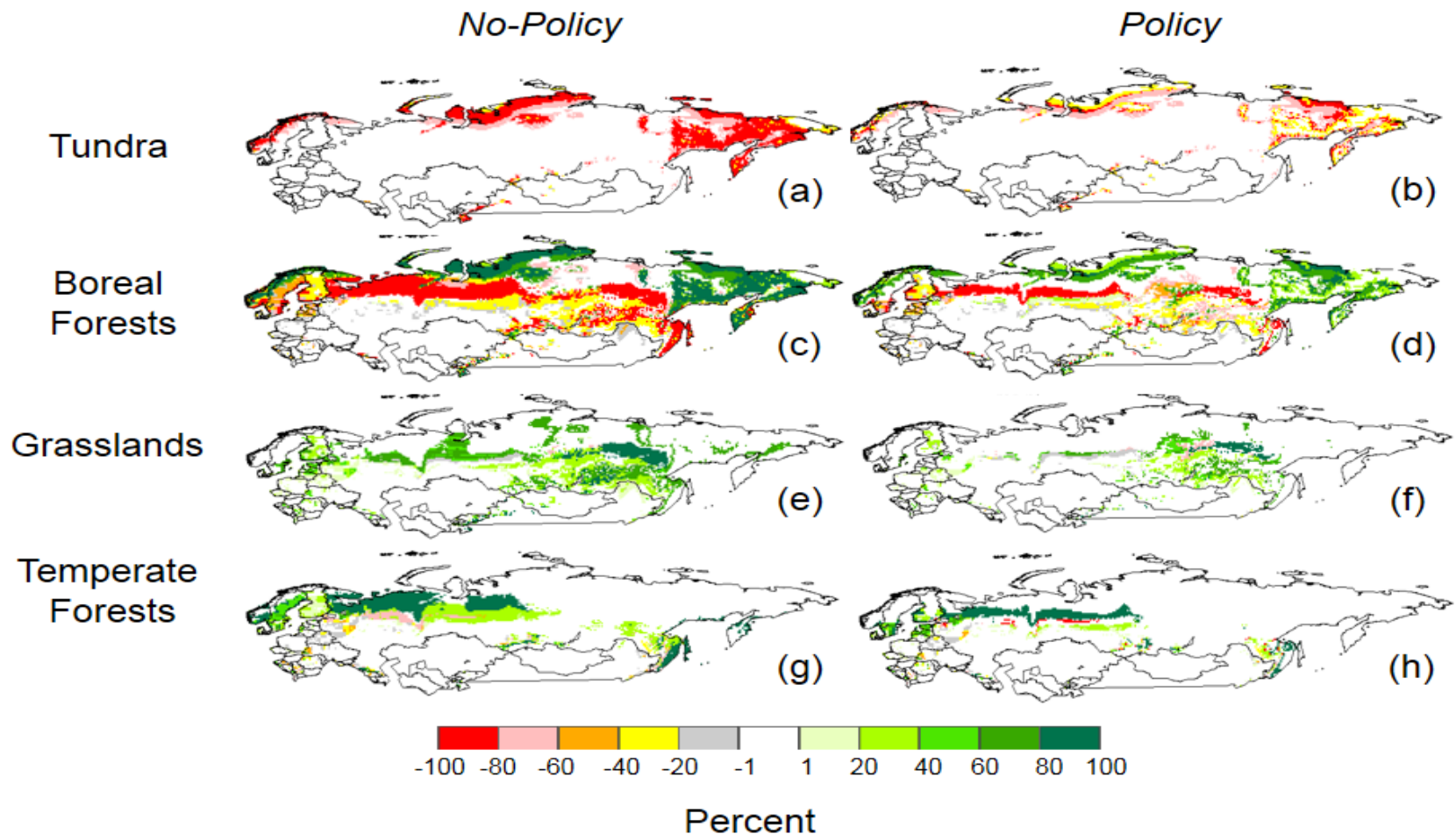


d) Global mean precipitation



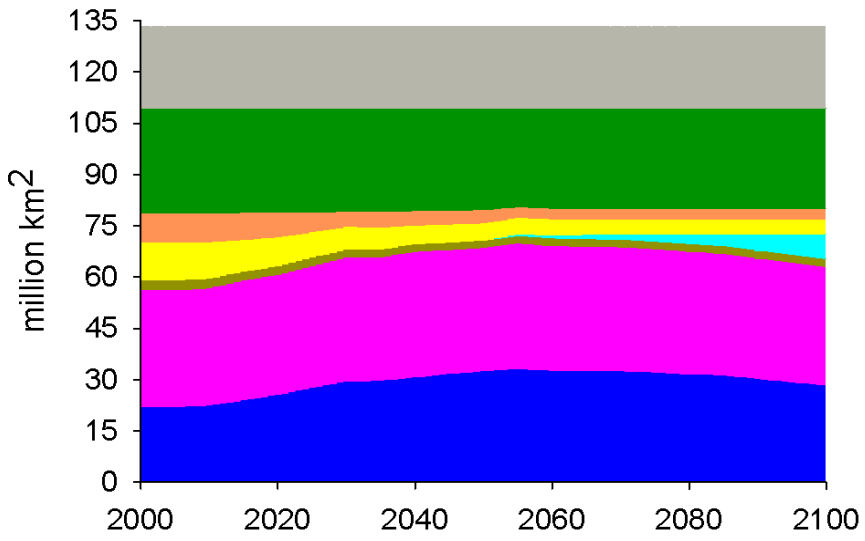


Shifts in tundra, boreal forests, grasslands, and temperate forests over the 21<sup>st</sup> century. Values represent the changes in vegetation coverage from year 2000

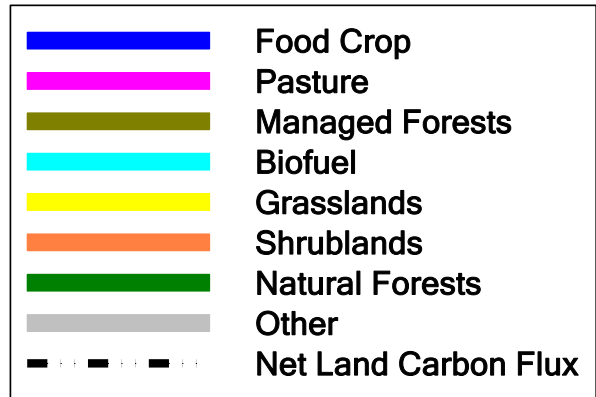
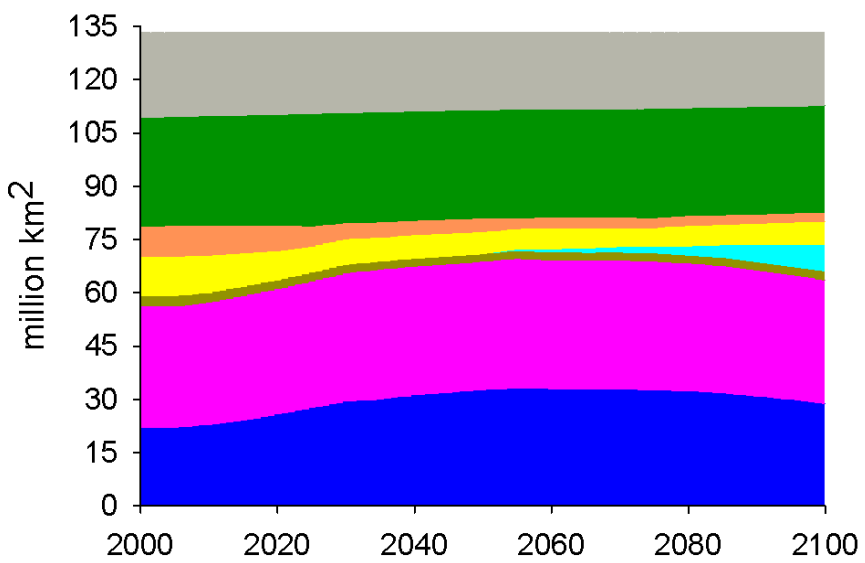


# Global Land-Use Change under the No-Policy Scenario

No  
Vegetation  
Shift



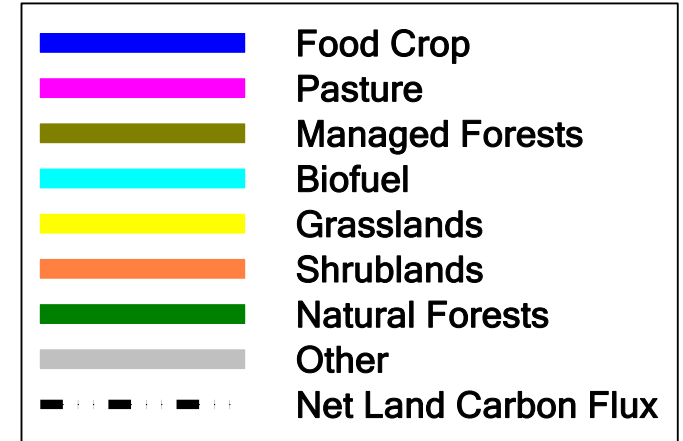
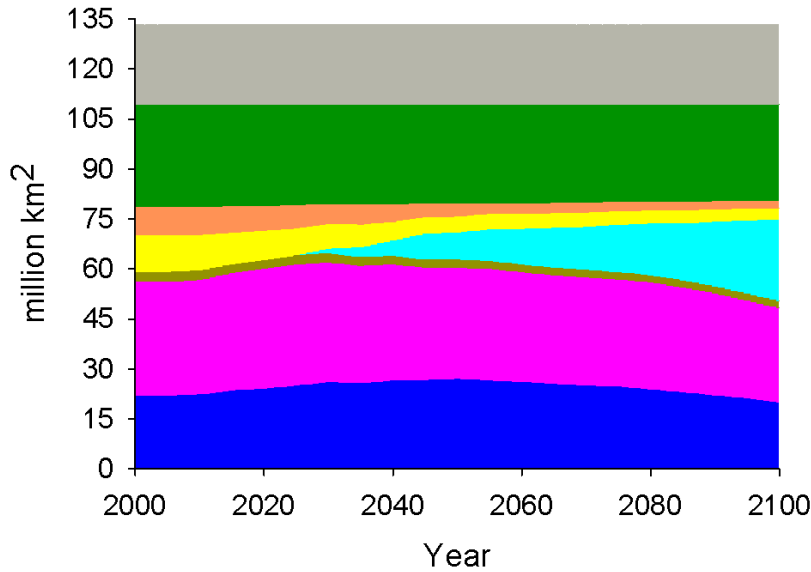
Vegetation  
Shift



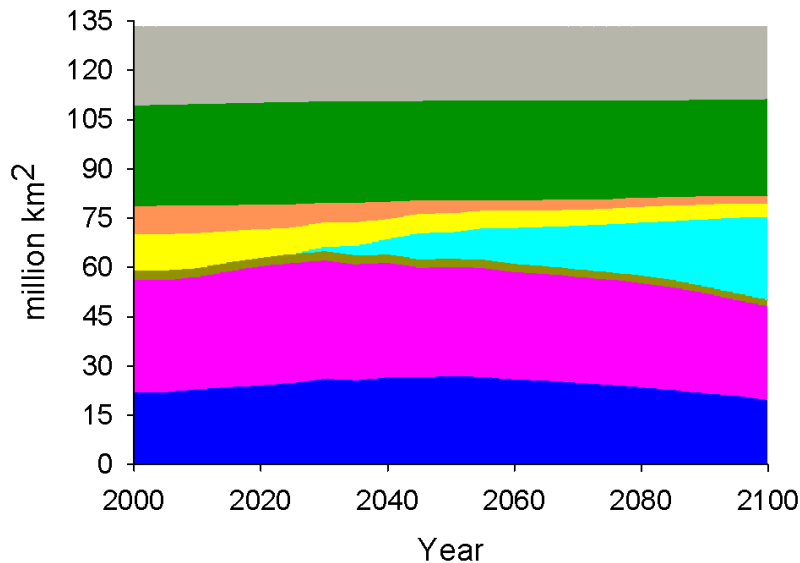
★ NE vegetation shift has a small impact on global LCLUC

# Global Land-Use Change under the Policy Scenario

No  
Vegetation  
Shift



Vegetation  
Shift



Policy allows more lands to biofuel crops.

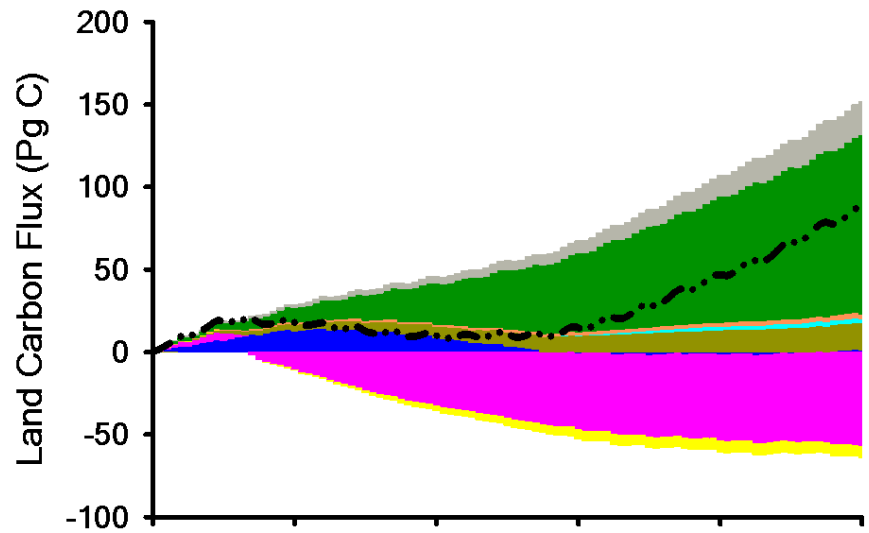
## Changes in global land cover (million km<sup>2</sup>) over the 21<sup>st</sup> century for land use change and NE vegetation shift

Land Cover	Current (2000)	No Policy (2100)			Policy (2100)	
			Median Climate Sensitivity			Median Climate Sensitivity
Food Crops	22.12		28.84		19.87	
Biofuel Crops	0.00		7.53		25.11	
Pasture	34.12		34.78		28.39	
Managed Forests	3.00		2.43		1.98	
Natural Forests	30.60		30.17		29.49	
Shrublands	8.67		2.48		2.29	
Grasslands	10.94		6.53		4.25	
Other	23.85		20.54		21.92	
Total	133.30		133.30		133.30	

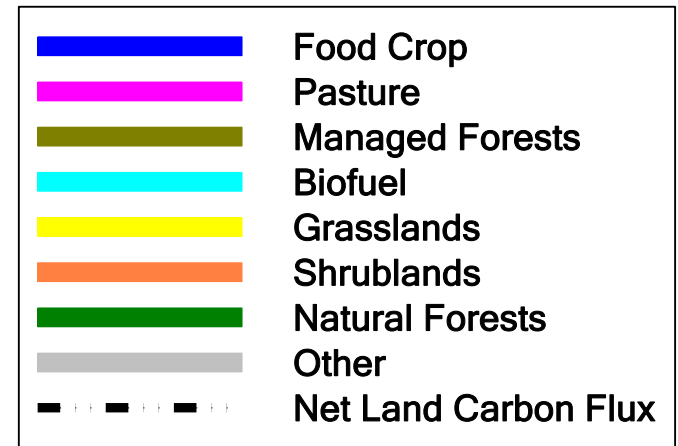
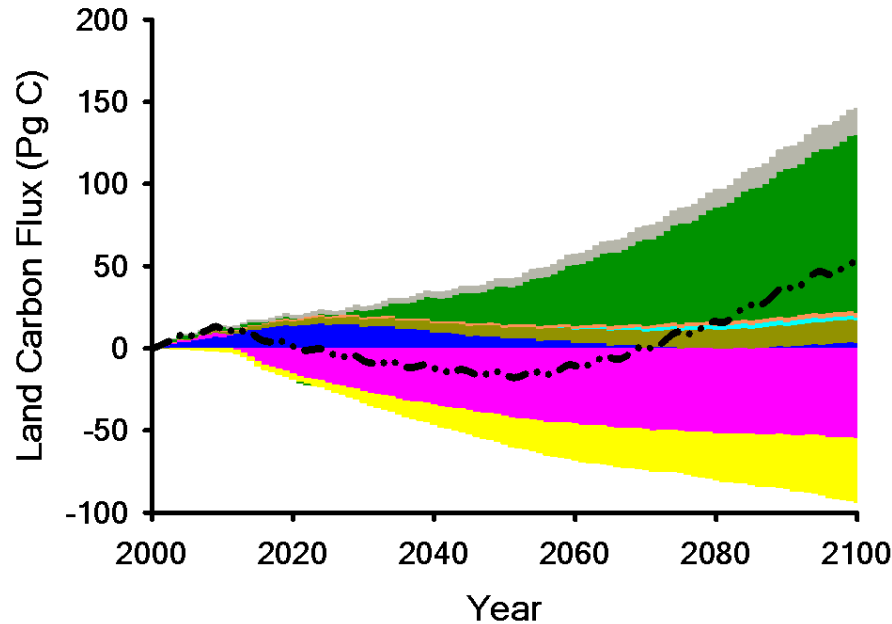
✦ Various land cover types changed due to land use change & NE vegetation shift


# Global Net Carbon Exchange under the No-Policy Scenario


No  
Vegetation  
Shift



Vegetation  
Shift

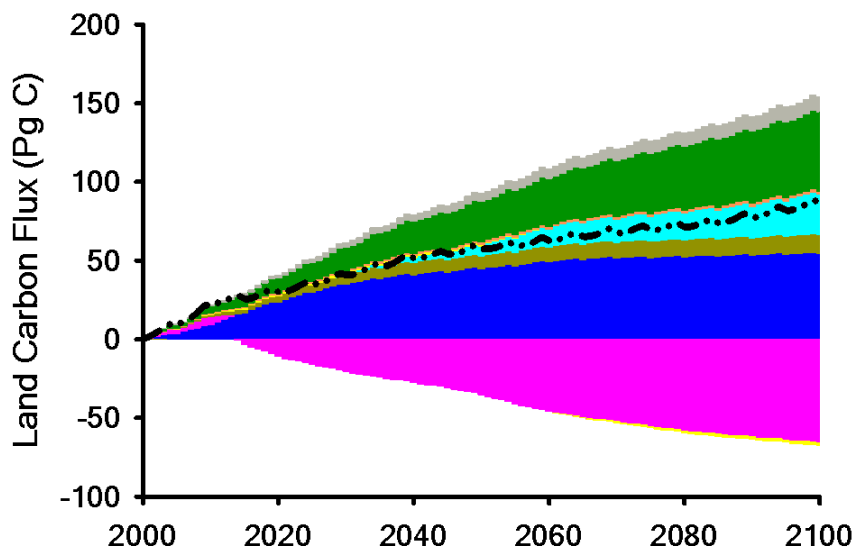


 Vegetation shift reduces the global C sink

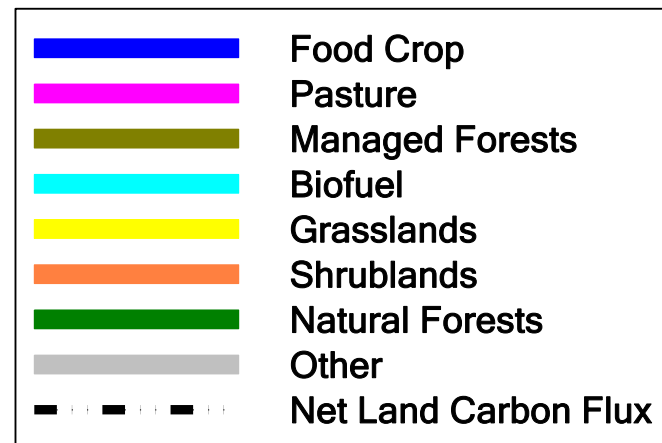
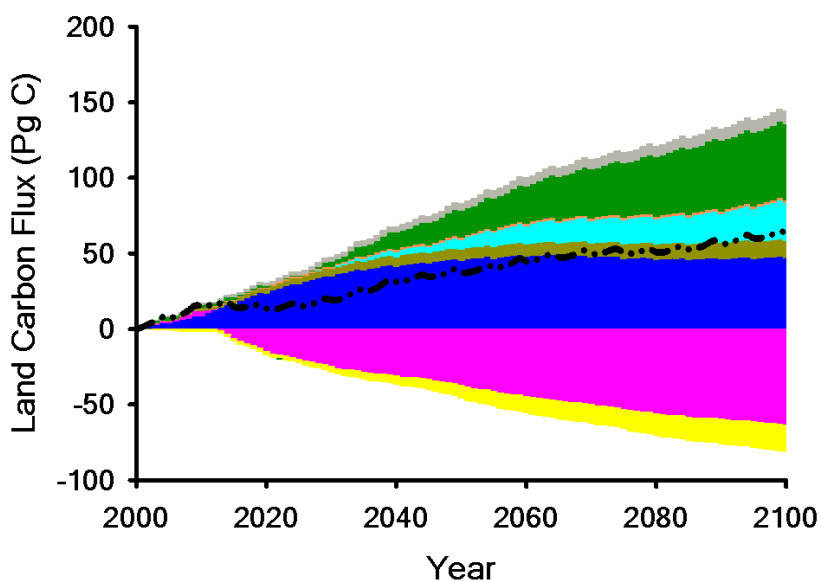
 Grassland expansion due to conversion - losing carbon

# Global Net Carbon Exchange under the Policy Scenario

No  
Vegetation  
Shift



Vegetation  
Shift



✦ Vegetation shift reduces the global sink

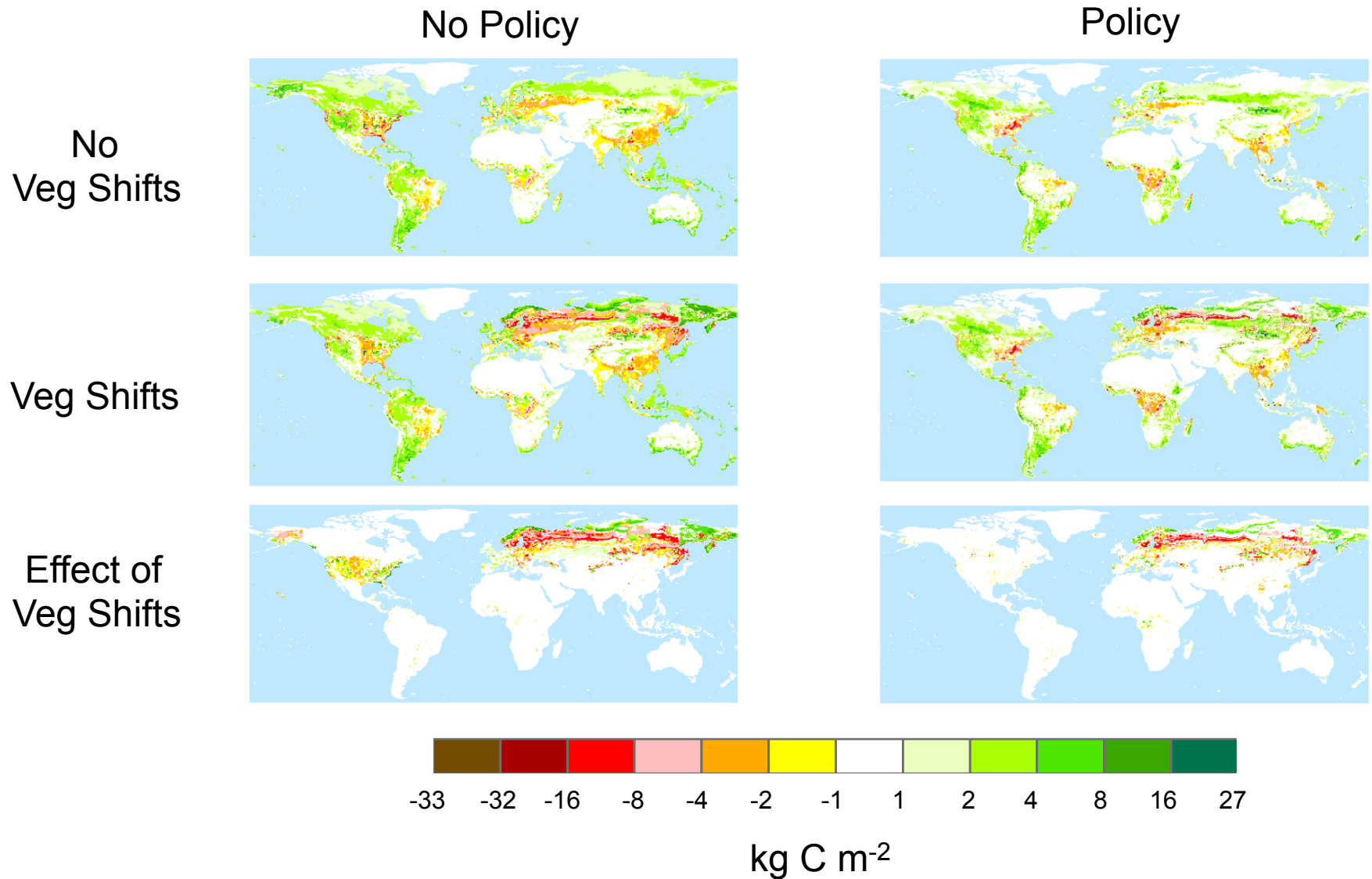
✦ Grassland expansion due to conversion - losing carbon not the magnitude as no-policy scenario

## Net land carbon flux (Pg C) from global terrestrial ecosystems during the 21<sup>st</sup> century for land-use change and NE vegetation shift

Land Cover	No Policy (2001 to 2100)		Policy (2001 to 2100)	
		Median Climate Sensitivity		Median Climate Sensitivity
Food Crops		+8.94		+21.92
Biofuel Crops		0.00		+3.38
Pasture		-21.44		-20.84
Managed Forests		+3.09		+3.75
Natural Forests		+25.19		+12.42
Shrublands		+0.33		+0.23
Grasslands		-34.84		-15.02
Other		+1.99		+1.84
Total		-16.74		+7.68

✦ Global C sink is determined by climate and land-use change as well as NE vegetation shift

# Distribution of Land Carbon Gain/Loss across Globe (2000-2100)

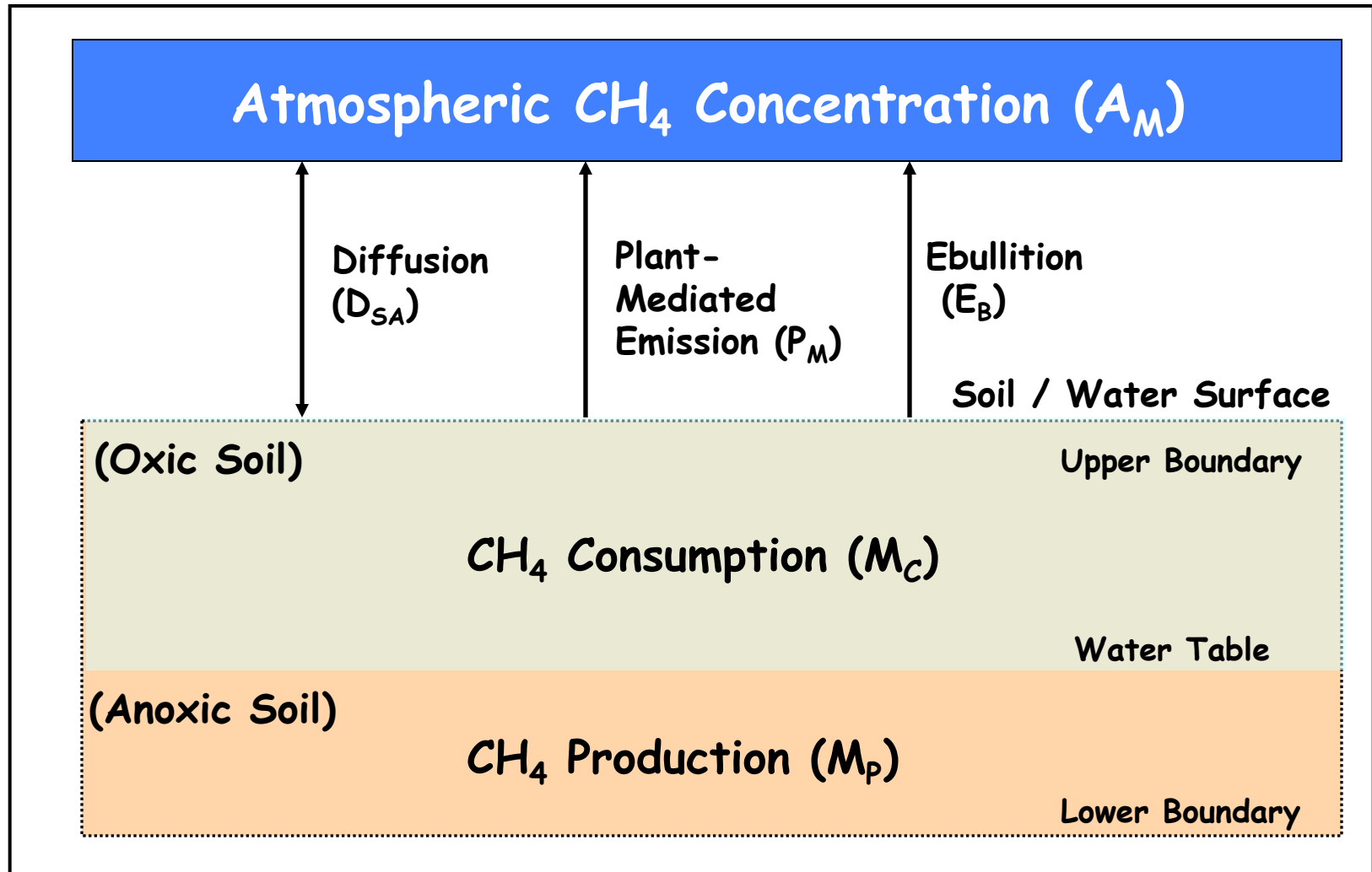




# Summary-1

- Impacts of NE vegetation shifts on global managed lands:
  - Allow **~1% expansion** of food crops and pastures with No Policy
  - Allow **~4% expansion** of biofuels with Policy
  - Allow **~2% expansion** of managed forests with no policy
- Impacts of NE vegetation shifts on global terrestrial carbon fluxes
  - Enhances carbon **emissions** from some areas and enhances carbon **sequestration** in other areas
  - Overall, decreases the terrestrial carbon sink **by 74%** or creates a carbon source (**~17 Pg C**) over the 21<sup>st</sup> century

# Methane Consumption and Emission Model

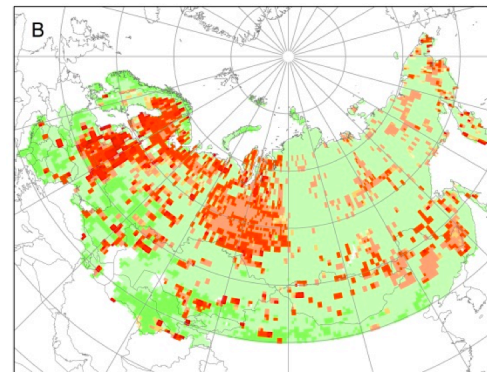
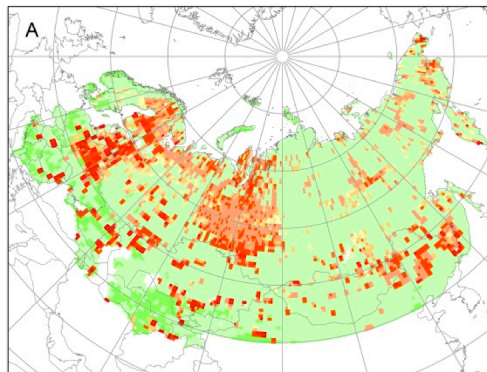


(Zhuang et al., 2004 GBC)

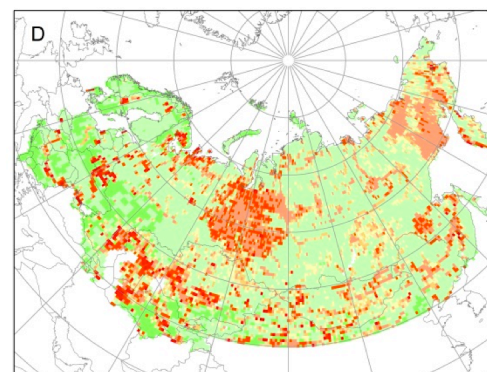
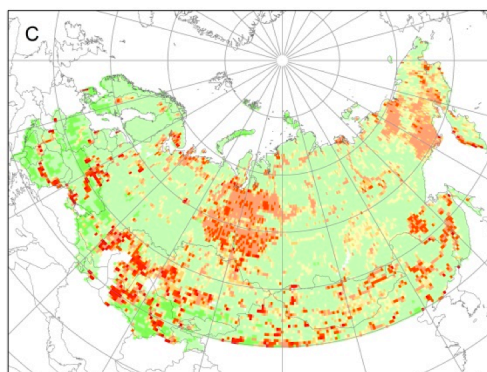
1990s

2090s

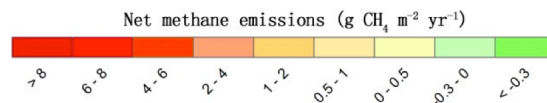
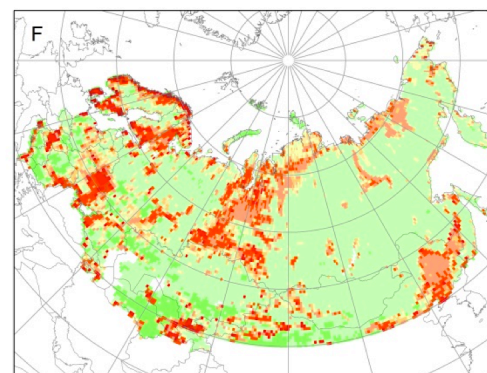
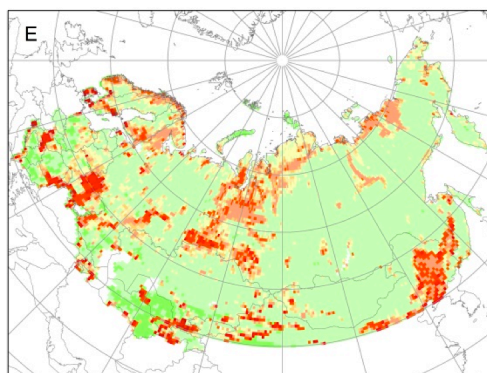
WET1



WET2



WET3

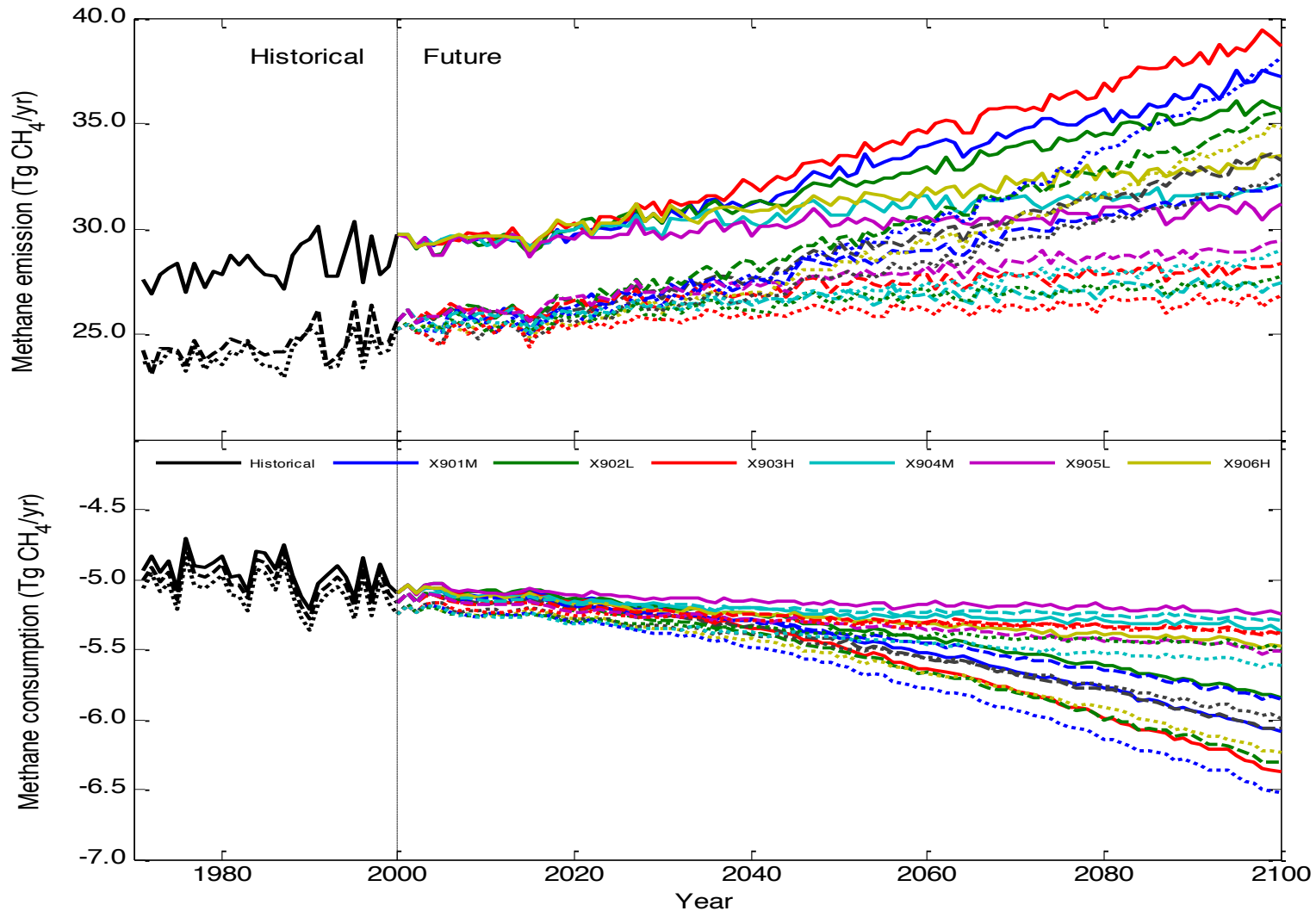


(Zhu and Zhuang et al., 2011)

CH<sub>4</sub> Emission and consumption during the 1990s

20-24 Tg CH<sub>4</sub> yr<sup>-1</sup>

# Annual methane emission and consumption over Northern Eurasia during the 21<sup>st</sup> century



# Summary-2

- Large uncertainty in methane emission quantification is due to **uncertain wetland /peatland area information** for both historical and future periods
- Large uncertainty in methane emissions is due to **uncertain complex hydrological dynamics upon permafrost thaw**
- Net methane emissions over the region affect the total radiative forcing greatly

# Forcing datasets

1) CRU TS3.1

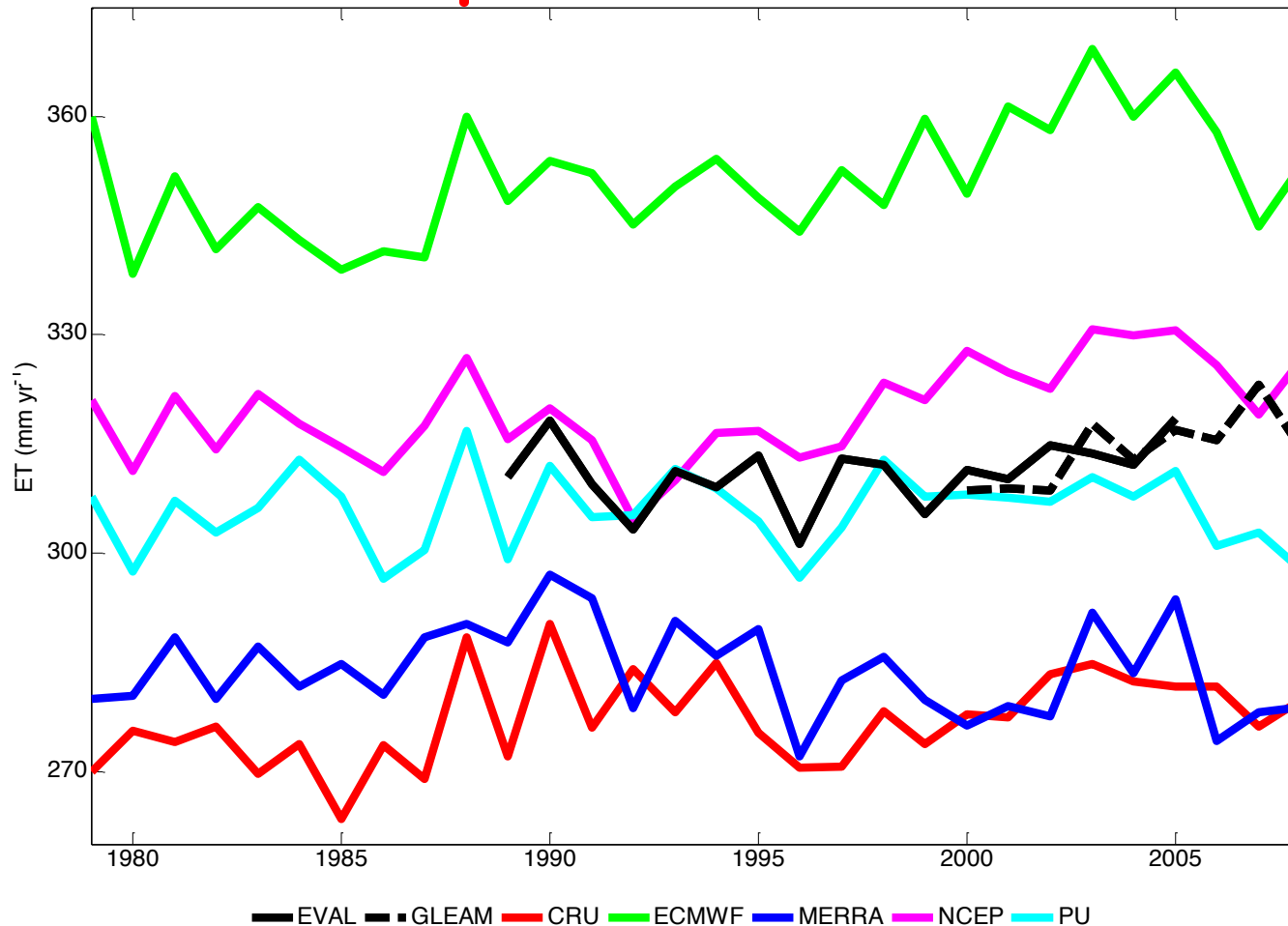
2) ECMWF Interim Re-Analysis (ERA-Interim)

3) NASA MERRA

4) NCEP/NCAR reanalysis

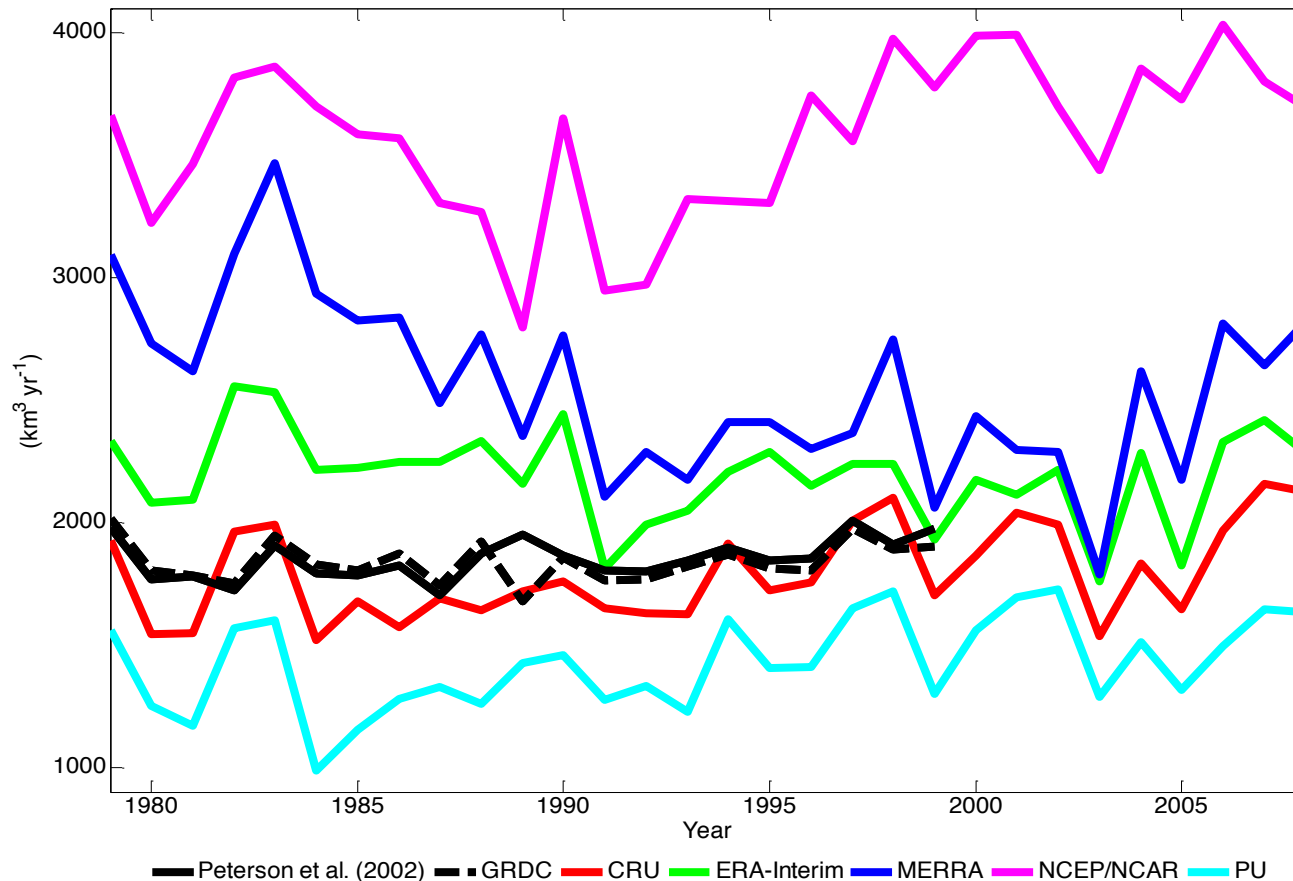
5) Global Meteorological Forcing Dataset for land surface modeling by Princeton University (PU).

# Temporal ET variation



- Large ET spread (31% of mean ET,  $90.1 \text{ mm yr}^{-1}$ ).  $ET_{PU}$  is closer to GLEAM, EVAL.
- mean temporal  $\sigma$  of ET ensemble  $>3$  times the temporal  $\sigma$  of each product
- $ET_{ERA}$  is the highest, with highest T, VPD and u.
- $ET_{CRU}$  are the lowest, agreeing with the lowest T, R and P.

# P-ET for 6 biggest watersheds

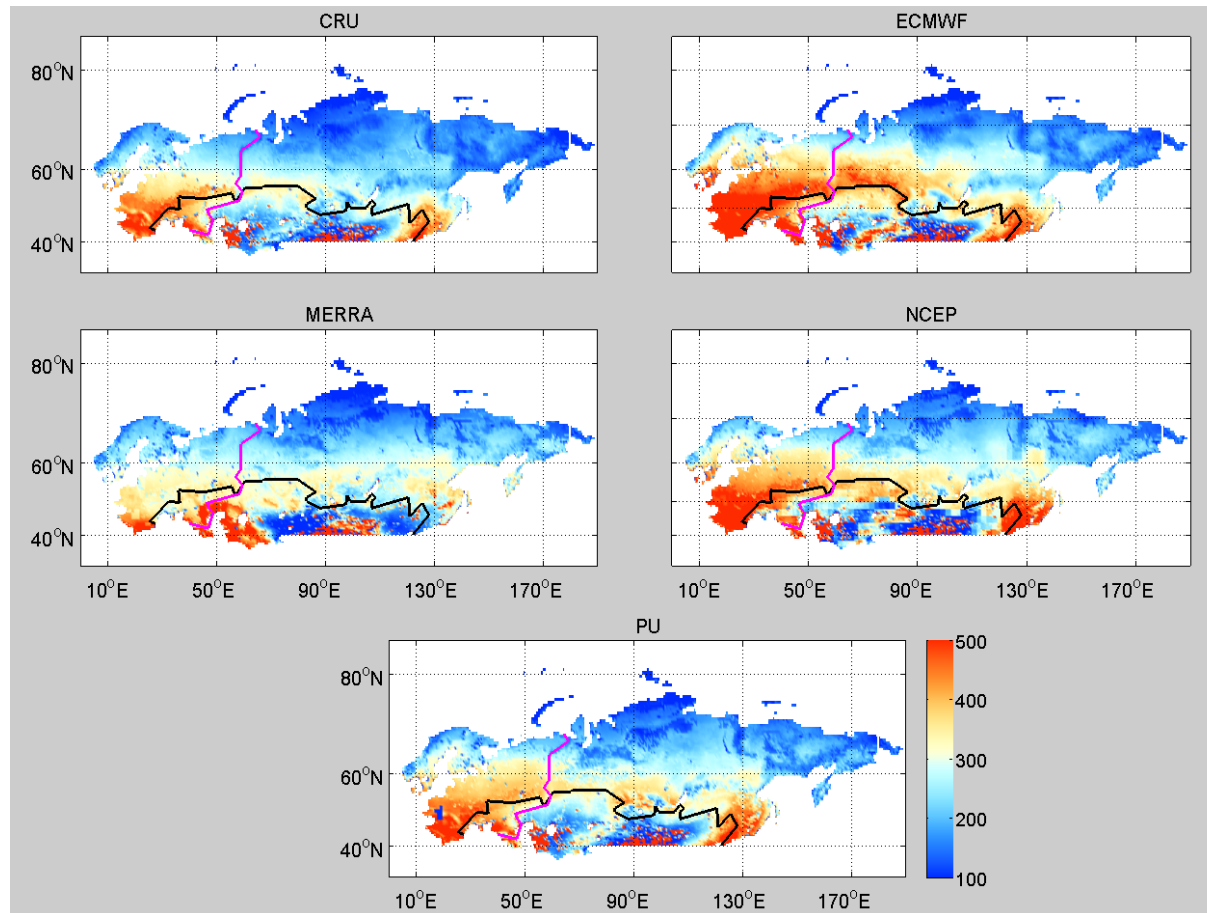


- $(P-ET)_{\text{CRU}}$  and  $(P-ET)_{\text{ERA}}$  are closest to measurements,  $(P-ET)_{\text{NCEP}}$  deviate most.

(Liu and Zhuang et al., 2014)



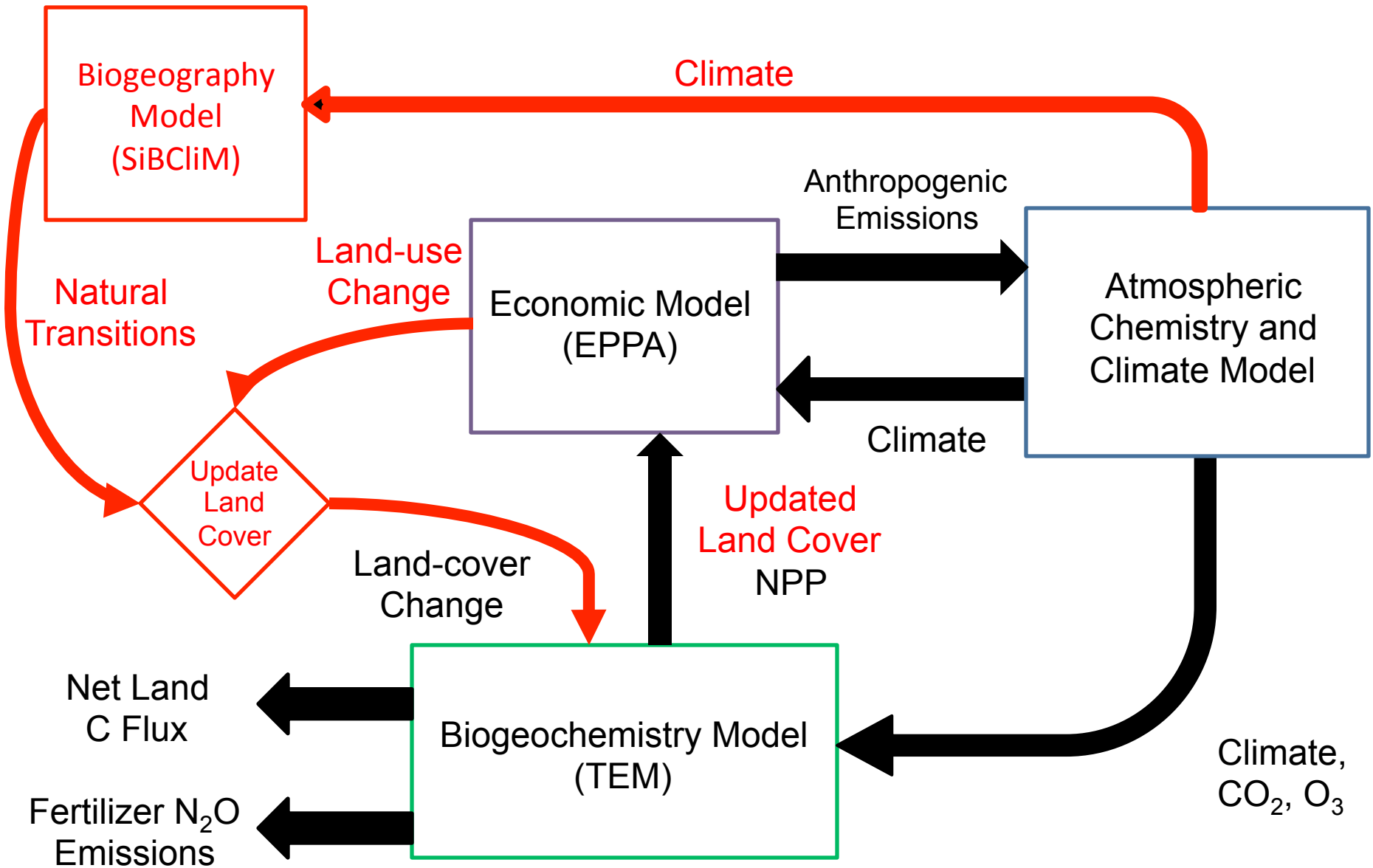
# Spatial variation of ET



- Spatial patterns are overall consistent.
- $ET_{ERA}$  is higher in the west, due to higher P, T and VPD
- $ET_{CRU}$  is overall lower, due to substantially lower R and T
- inter-product spatial  $\sigma$  > the mean spatial  $\sigma$  of each product

# Summary-3

- Uncertain forcing data lead to a large spread of ET (90 mm yr<sup>-1</sup>).
- While CRU dataset appears as a better choice, the quality of forcing data remains a major challenge for accurate quantification of the regional water balance.
- Dominant drivers of ET do not change with change of forcing data, namely T is dominant in the North and P in the South in growing season.

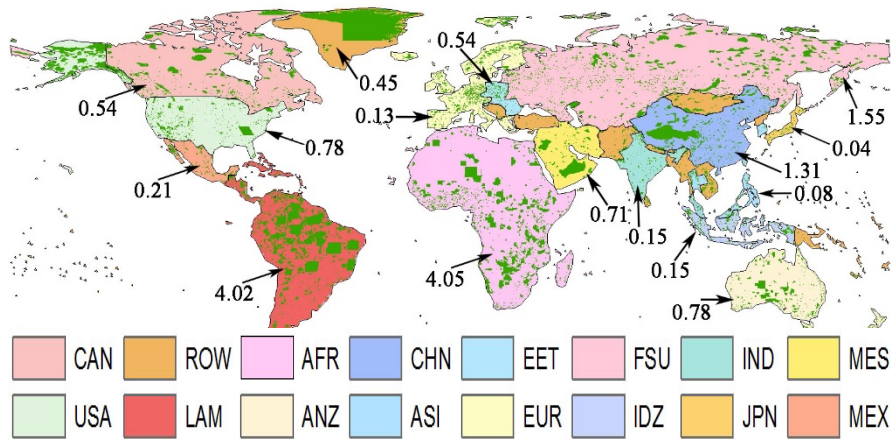


# Protected Areas' Role in Climate-change Mitigation in Northern Eurasia

D. W. Kicklighter<sup>1</sup>, X. Lu<sup>1</sup>, E. Monier<sup>2</sup>, A. P. Sokolov<sup>2</sup>, J.M. Melillo<sup>1</sup>, J. M. Reilly<sup>2</sup>, and Q. Zhuang<sup>3</sup>

<sup>1</sup>MBL, Woods Hole, MA, USA; <sup>2</sup>MIT, Cambridge, MA, USA; <sup>3</sup> Purdue University, West Lafayette, IN, USA

Distribution of Global Protected Areas

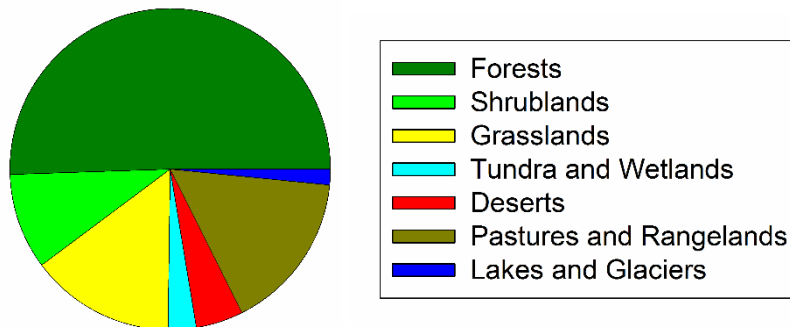


(Fig. 2 in Melillo et al., 2016, *Ambio* **45**, 133-145)

In Northern Eurasia, about **2.1 million km<sup>2</sup>** of land are currently identified as protected areas, which provide society with many ecosystem services including climate-change mitigation. These areas represent about 14% of the protected areas identified across the globe.

Distribution of Land Cover in Protected Areas

Northern Eurasia

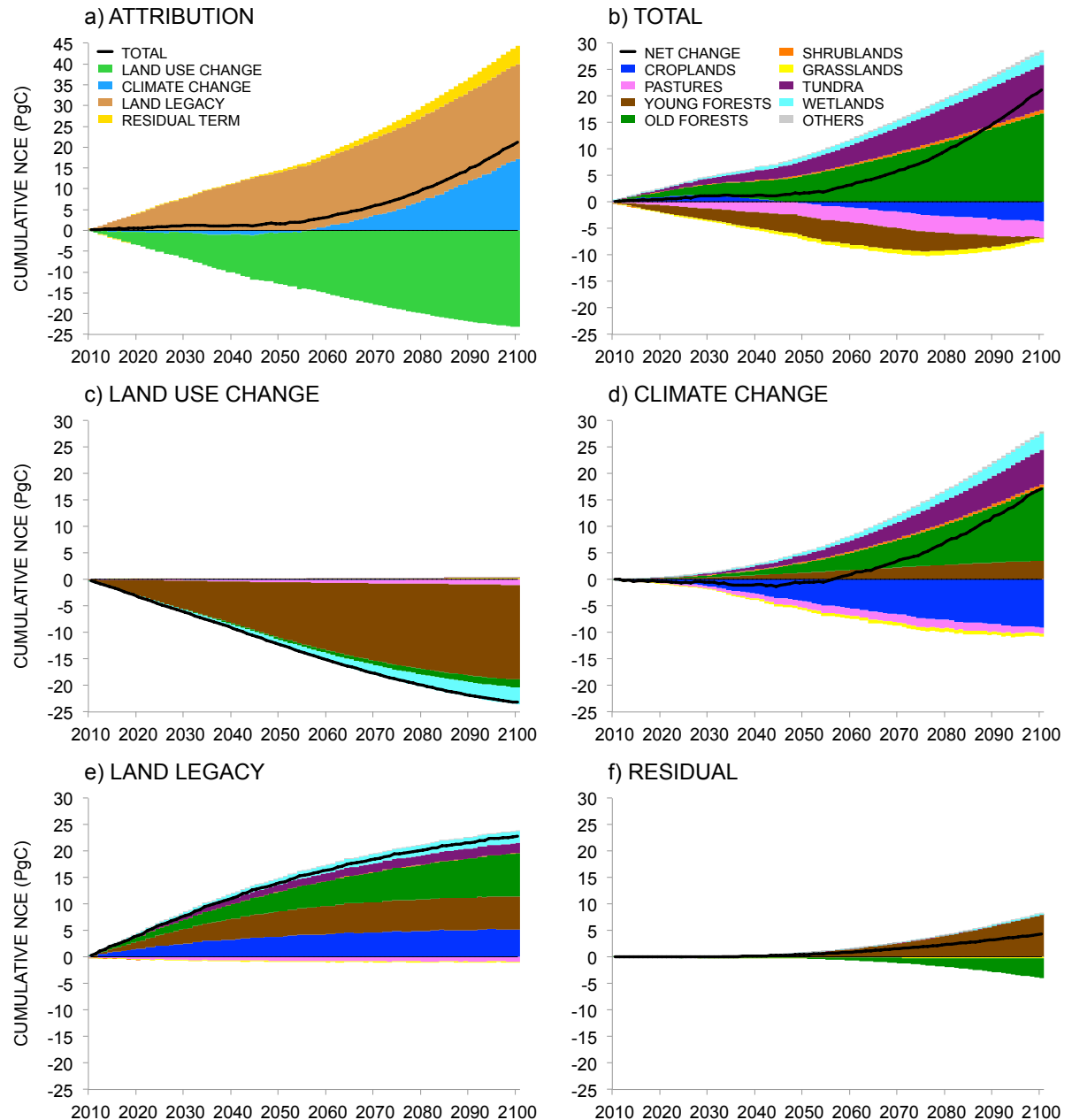


Combining a global database of protected areas, a reconstruction of global land-use history, and a terrestrial biogeochemistry model, we estimate that protected areas in Northern Eurasia currently sequester **0.05 Pg C annually**, which is about one tenth of the carbon sequestered by all land ecosystems annually in this region (0.5 Pg C yr<sup>-1</sup>) and also about one tenth of the carbon sequestered in all protected areas across the globe.

# Importance of land legacy on future carbon dynamics over Northern Eurasia

Erwan Monier, David Kicklighter, Jerry Melillo, Andrei Sokolov, John Reilly, and Qianlai Zhuang

Cumulative net carbon exchange (PgC) over Northern Eurasia from 2005 to 2100 for each component (land legacy, land-use change, climate change, total effects and residual) and decomposed by vegetation types for the RCP8.5 under the median climate sensitivity and averaged over the 5-ensemble members with different representations of natural variability



# Next Steps

- Incorporate local fine-scale socioeconomic dynamics into the global-scale analysis (e.g., land decision making for agriculture, mining, livestock)
  - Implications to the climate system, ecosystem goods and services, adaptation and mitigation
- Incorporate geographically-dependent natural processes and controls of climate and terrestrial biosphere into the global-scale analysis (e.g., fire, permafrost, drought)