

# Ecosystem feedbacks in a 21st century climate: carbon, nitrogen, and land cover change

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# Planetary distress



Sea ice retreat (Jonathan Hayward/CP file photo, [www.thestar.com](http://www.thestar.com))

Drought mortality, Texas ([txforests.tamu.edu](http://txforests.tamu.edu))

Pine beetle, CO (RJ Sangosti/Denver Post)

High Park fire, CO (RJ Sangosti/Denver Post)

Coastal flooding, NC (U.S. Coast Guard)

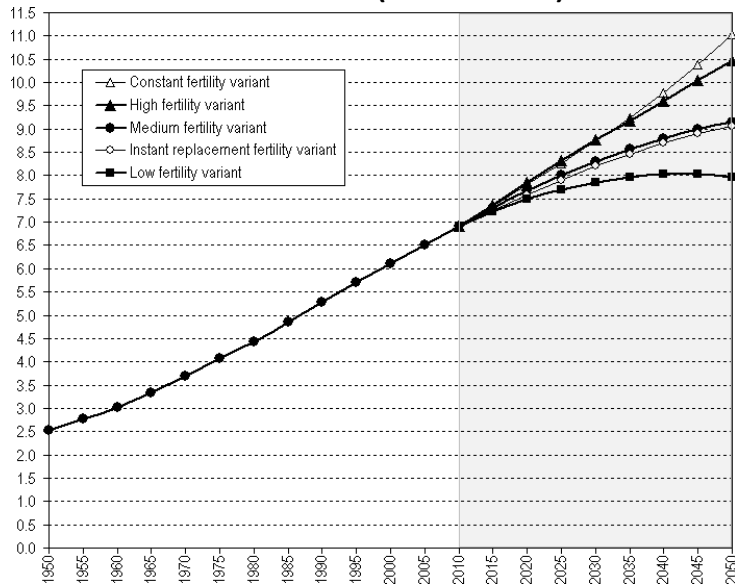
Texas drought (<http://farmprogress.com>)

Calving face of the Ilulissat Isfjord, Greenland, 7 June 2007 ([www.extremeicesurvey.org](http://www.extremeicesurvey.org))

Habitat loss, NM (UCAR)

# The Anthropocene

Population of the world, 1950-2050, according to different projection variants (in billion)



**Source:** United Nations, Department of Economic and Social Affairs, Population Division (2009): World Population Prospects: The 2008 Revision. New York

Human activities (agriculture, deforestation, urbanization) and their effects on climate, water resources, and biogeochemical cycles

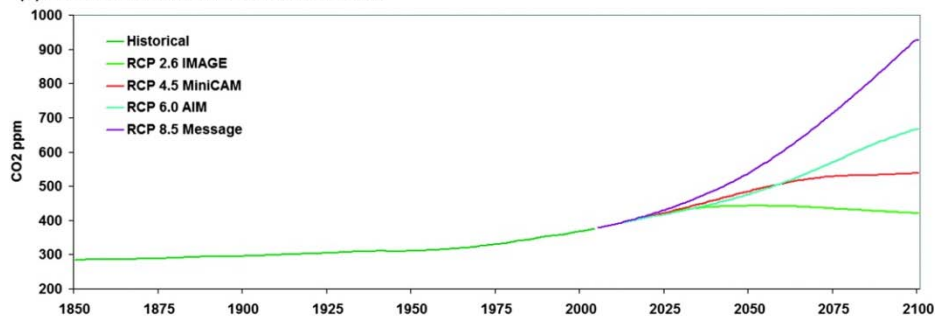
What is our collective future?

Can we manage the Earth system, especially its ecosystems, to create a sustainable future?

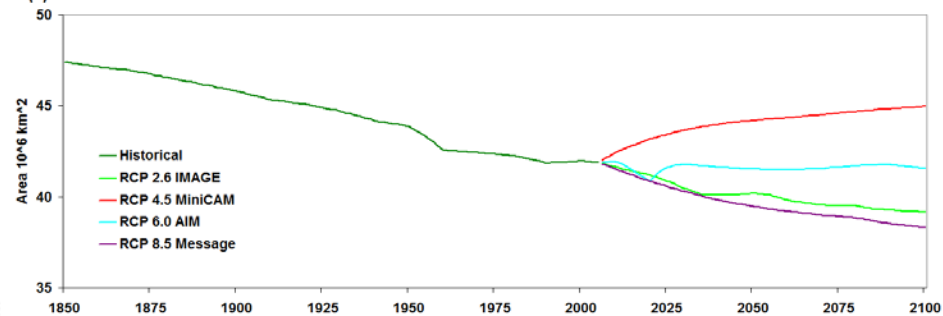


# Planetary stressors

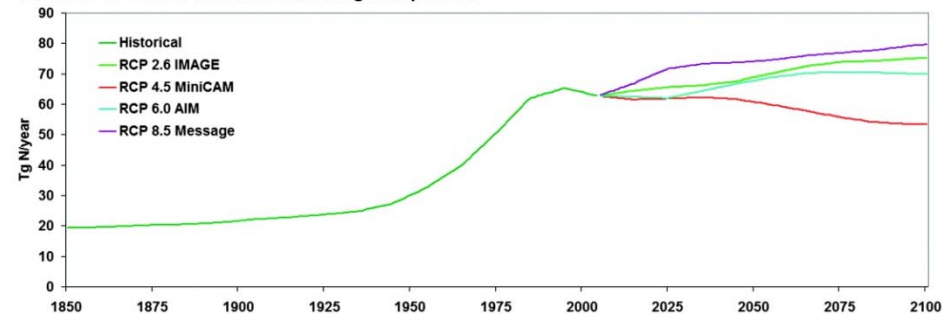
(b) CCSM 4.0 Global Prescribed Surface CO<sub>2</sub>



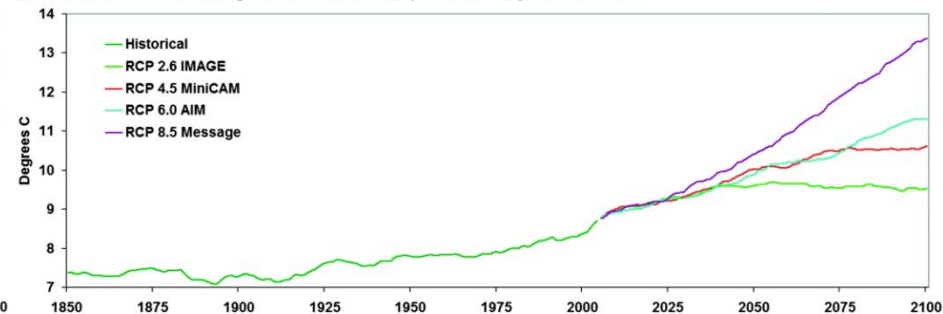
(a) CMIP5 Total Global Tree PFT Area



(c) CCSM 4.0 Global Total Airborne Nitrogen Deposition

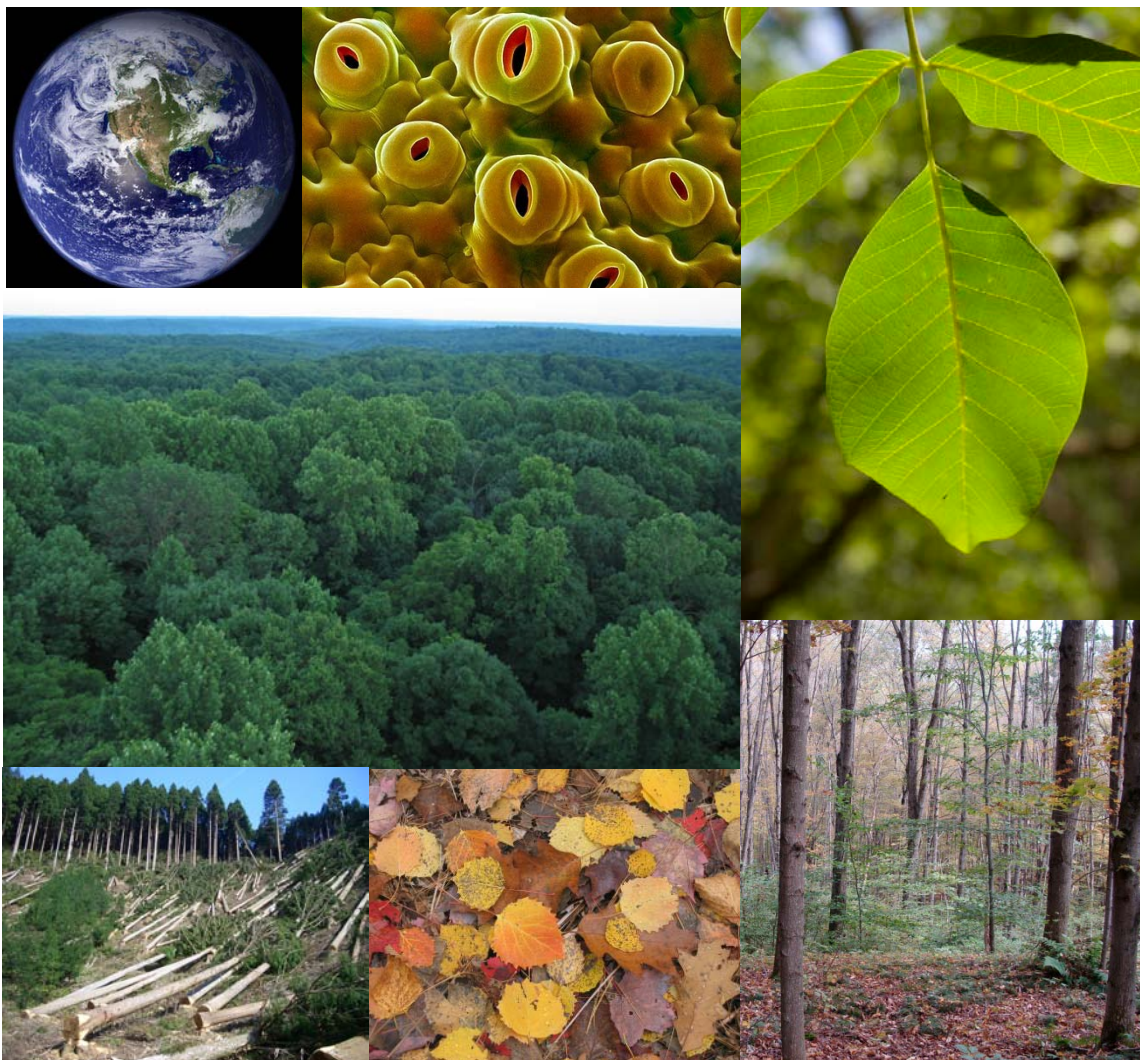


(a) CCSM 4.0 Global Averaged Land 2m Air Temperature - 10 year smoothed



- Increasing atmospheric CO<sub>2</sub>
- Land use and land cover change
- Increasing N deposition
- Climate change

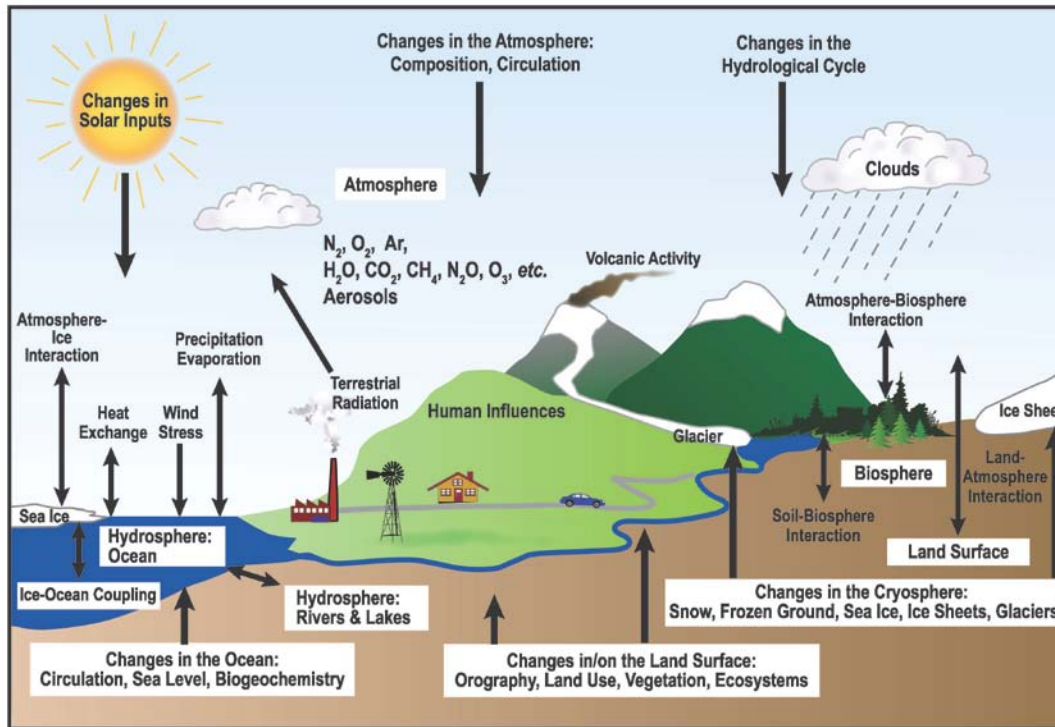
# Ecology and climate change



What are the processes and feedbacks by which terrestrial ecosystems contribute to global environmental change?

Can we manage the biosphere to mitigate climate change?

# Earth system models



(IPCC 2007)

## ***Prominent biosphere feedbacks***

- Land use and land cover change
- Carbon cycle
- Reactive nitrogen

Earth system models use mathematical formulas to simulate the **physical**, **chemical**, and **biological** processes that drive Earth's atmosphere, hydrosphere, biosphere, and geosphere

A typical Earth system model consists of coupled models of the **atmosphere**, **ocean**, **sea ice**, and **land**

Land is represented by its **ecosystems**, **watersheds**, **people**, and **socioeconomic** drivers of environmental change

The model provides a comprehensive understanding of the processes by which people and ecosystems **feed back**, **adapt to**, and **mitigate** global environmental change

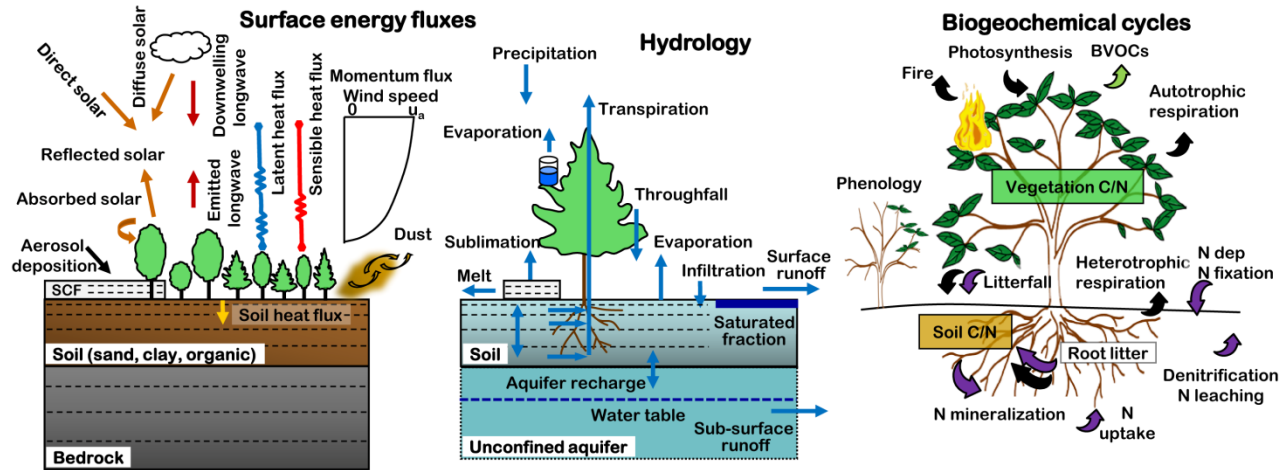
# The Community Land Model (CLM4)

Fluxes of energy, water, carbon, and nitrogen and the dynamical processes that control these fluxes in a changing environment

Oleson et al. (2010) NCAR/TN-478+STR

D. Lawrence et al. (2011) JAMES, 3, doi: 10.1029/2011MS000045

D. Lawrence et al. (2012) J Climate 25:2240-2260

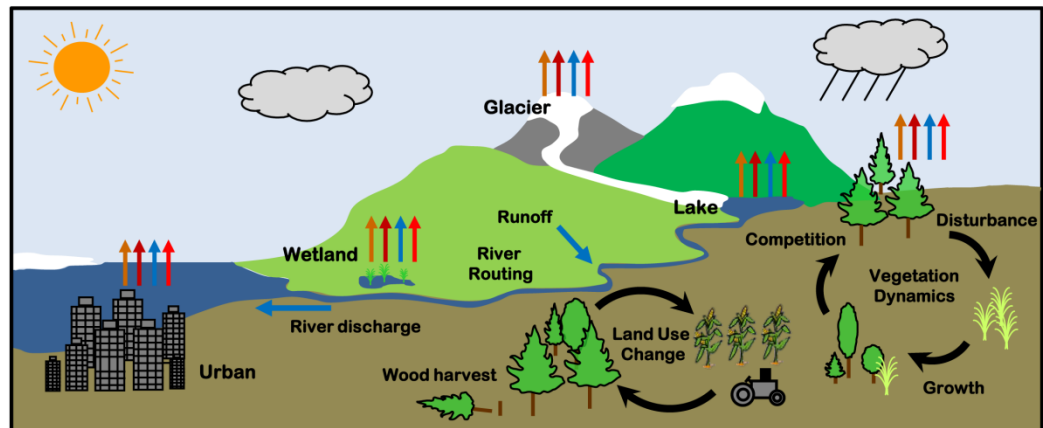


## Spatial scale

- $1.25^\circ$  longitude  $\times$   $0.9375^\circ$  latitude (288  $\times$  192 grid)

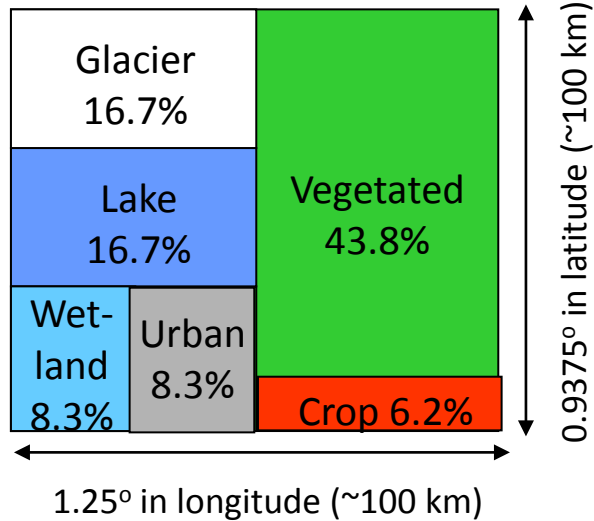
## Temporal scale

- 30-minute coupling with atmosphere
- Seasonal-to-interannual (phenology)
- Decadal-to-century climate (disturbance, land use, succession)
- Paleoclimate (biogeography)



# Land surface heterogeneity

Sub-grid land cover and plant functional types



The model simulates a **column** extending from the soil through the plant canopy to the atmosphere. CLM represents a model grid cell as a mosaic of up to 6 primary **land cover tiles**. Vegetated land is further represented as tiles of individual **plant functional types**

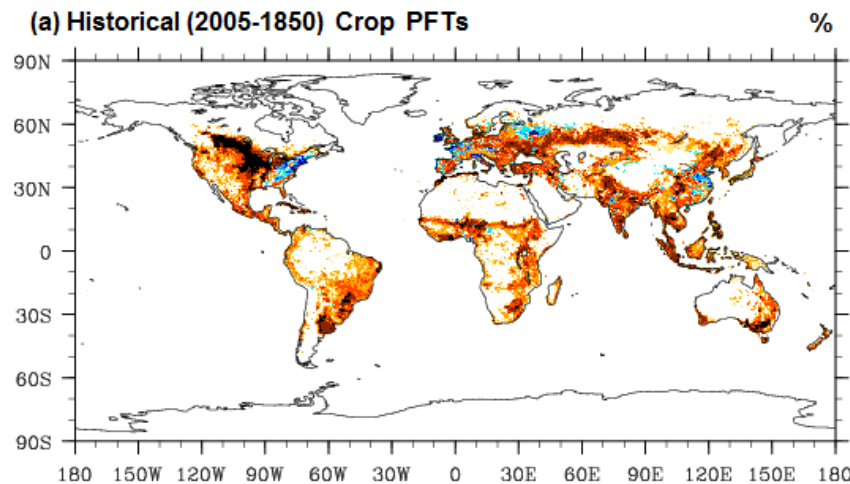
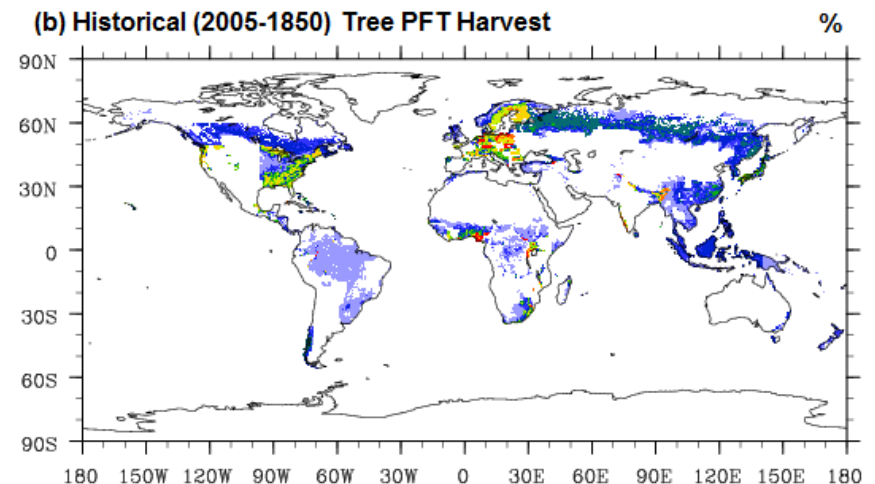
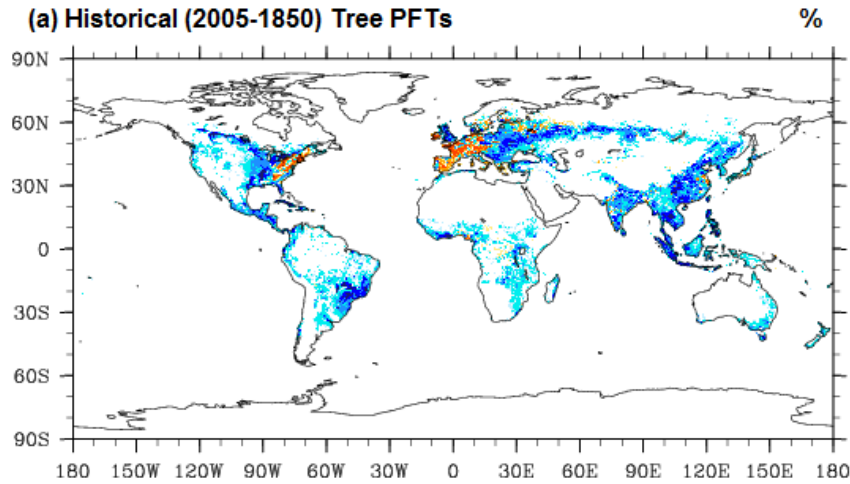




# Historical land use and land cover change, 1850 to 2005

## Change in tree and crop cover (percent of grid cell)

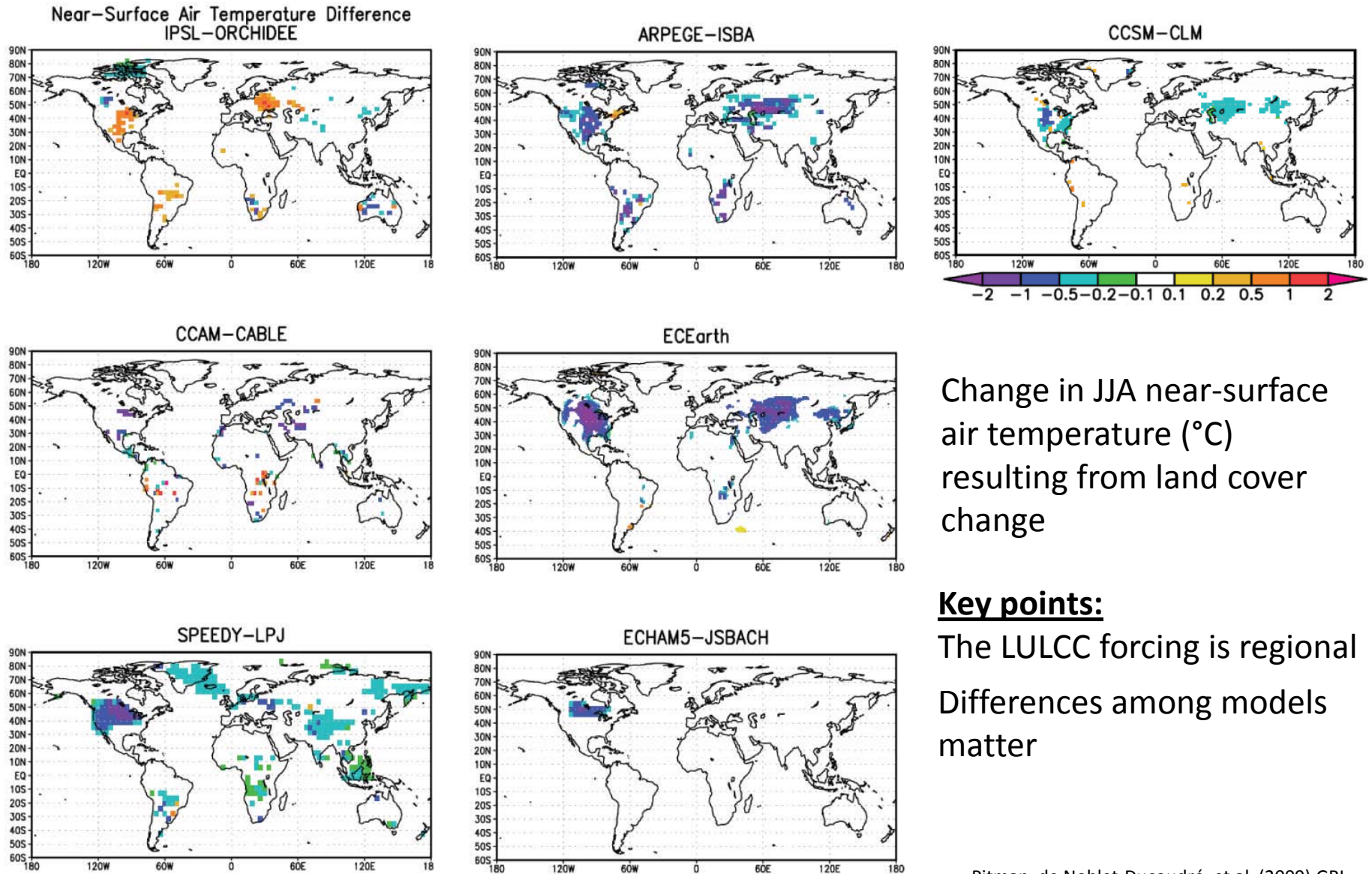
## Cumulative percent of grid cell harvested



### Historical LULCC in CLM4

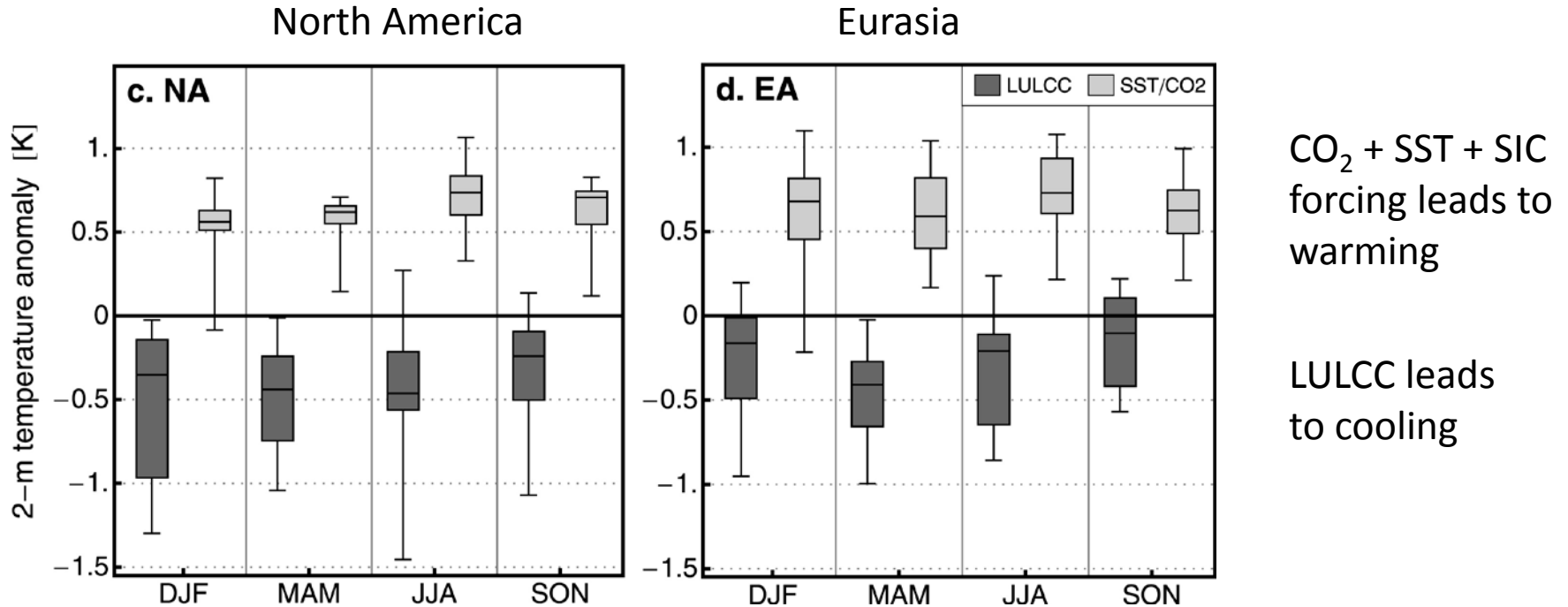
- Loss of tree cover and increase in cropland
- Farm abandonment and reforestation in eastern U.S. and Europe
- Extensive wood harvest

# The LUCID intercomparison study



# LULCC relative to greenhouse warming

Multi-model ensemble of the simulated changes between the pre-industrial time period and present-day



de Noblet-Ducoudré, Boiser, Pitman, et al. (2012) J Climate 25:3261-3281

CO<sub>2</sub> + SST + SIC forcing leads to warming

LULCC leads to cooling

## Key points:

The LULCC forcing is counter to greenhouse warming

The LULCC forcing has large inter-model spread, especially JJA

The bottom and top of the box are the 25th and 75th percentile, and the horizontal line within each box is the 50th percentile (the median). The whiskers (straight lines) indicate the ensemble maximum and minimum values.

# Surface albedo

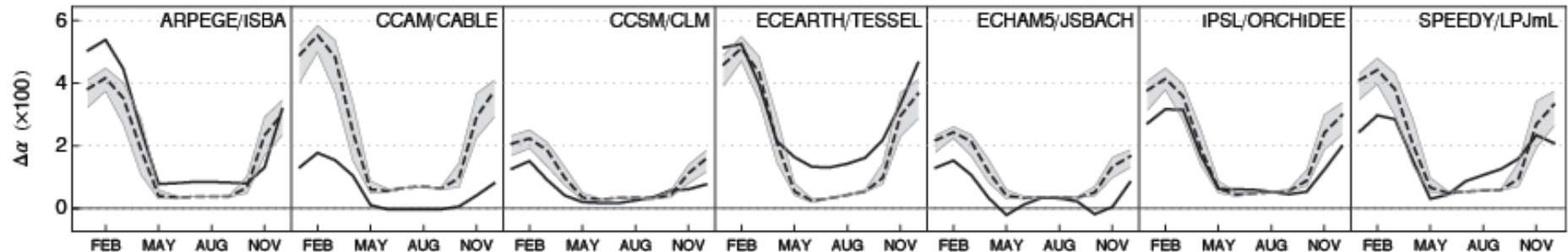


Colorado Rocky Mountains

## LULCC effects

- Forest masking of snow
- High albedo of crops

## Surface albedo change due to LULCC



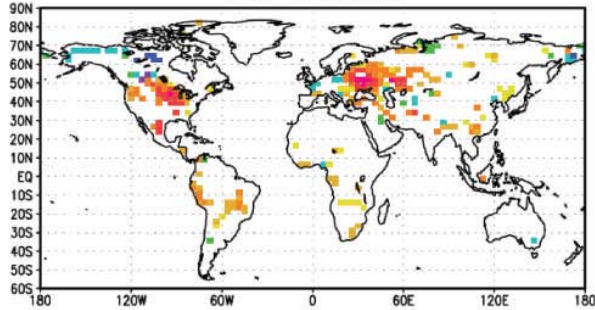
— Simulated

- - - MODIS reconstruction

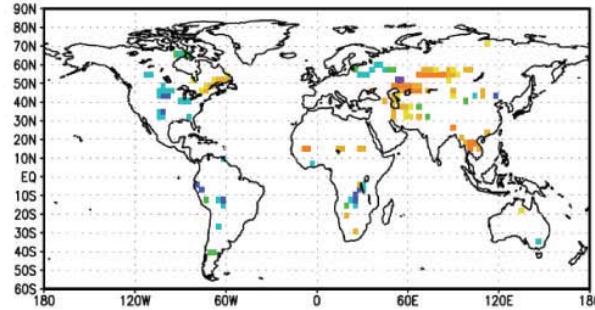
- Models differ in their albedo increase (extent of land cover change, albedo parameterization)
- Some models are more faithful to MODIS reconstructions than other models

# Evapotranspiration

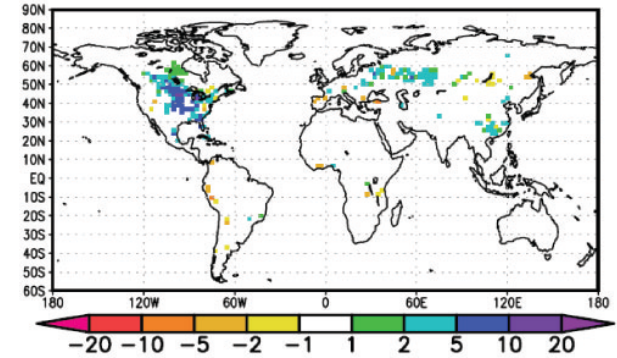
Latent Heat Flux Difference  
IPSL-ORCHIDEE



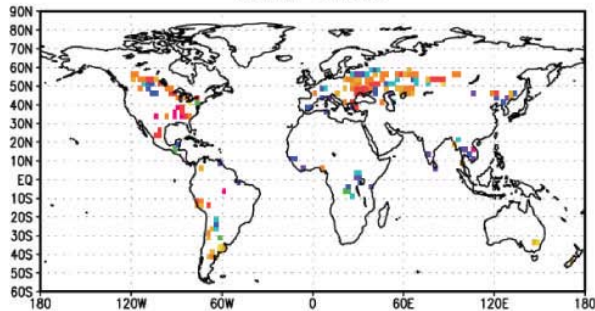
ARPEGE-ISBA



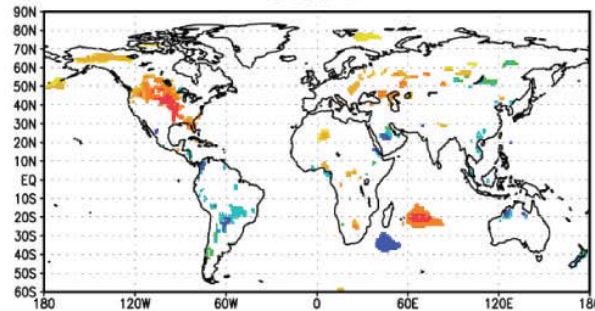
CCSM-CLM



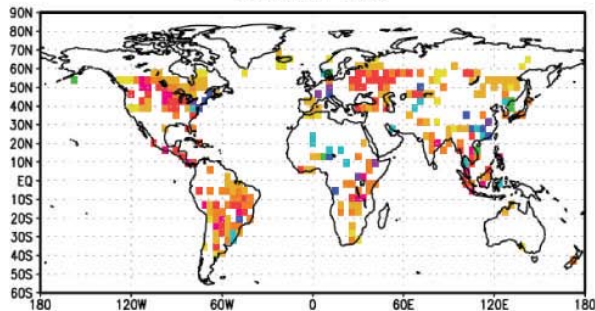
CCAM-CABLE



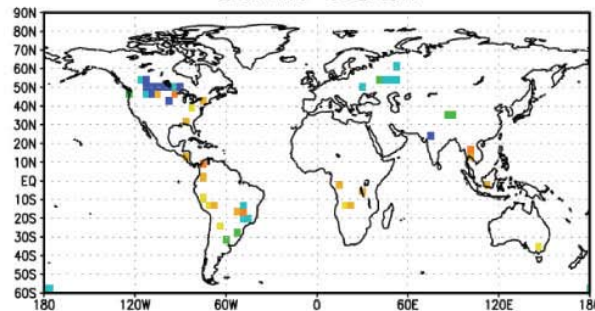
ECEarth



SPEEDY-LPJ



ECHAM5-JSBACH

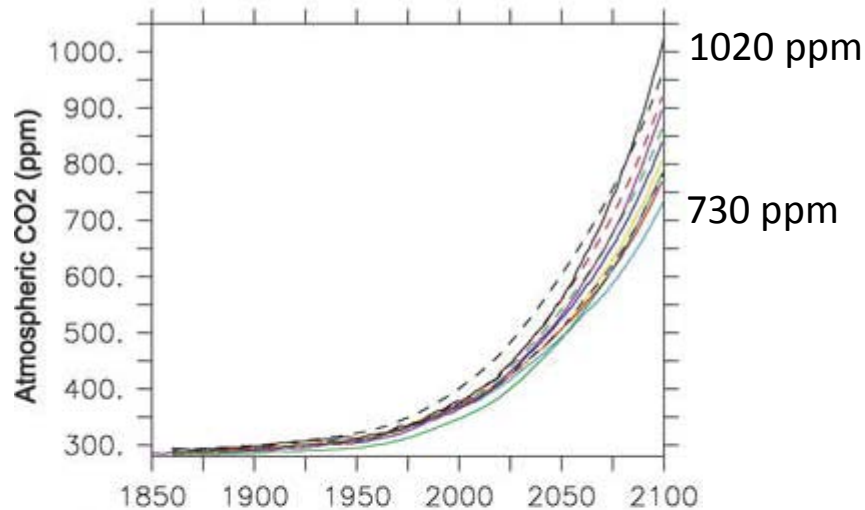


Change in JJA latent heat flux ( $\text{W m}^{-2}$ ) resulting from land cover change

## Key points:

The LULCC forcing is regional  
Differences among models matter

# C4MIP – Climate and carbon cycle



## Carbon cycle-climate feedback

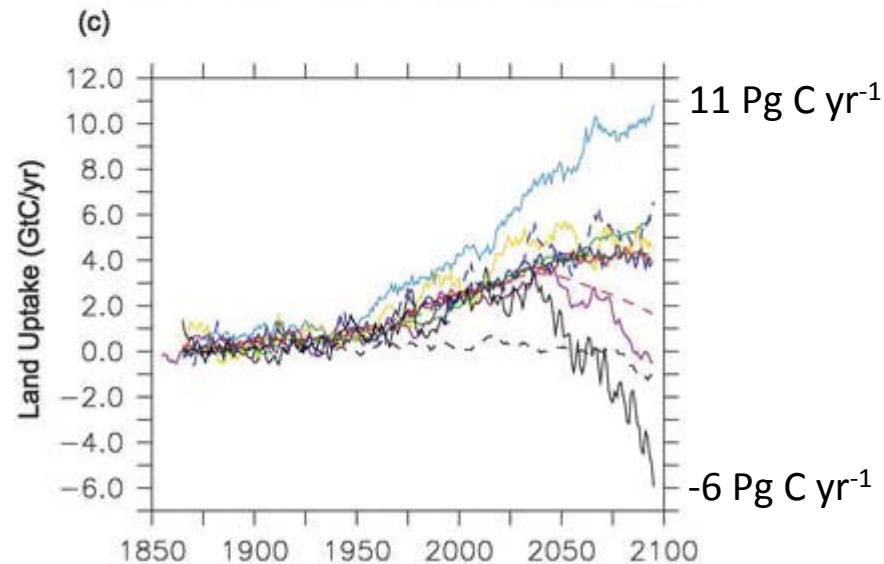
11 carbon cycle-climate models of varying complexity

CO<sub>2</sub> fertilization enhances carbon uptake, diminished by decreased productivity and increased soil carbon loss with warming

290 ppm difference in atmospheric CO<sub>2</sub> at 2100

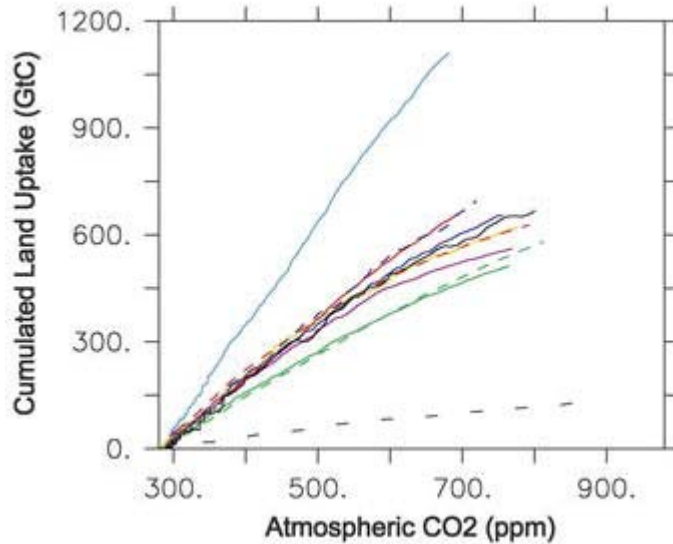
17 Pg C yr<sup>-1</sup> difference in land uptake at 2100

Friedlingstein et al. (2006) J Climate 19:3337-3353



# Model uncertainty in feedback is large

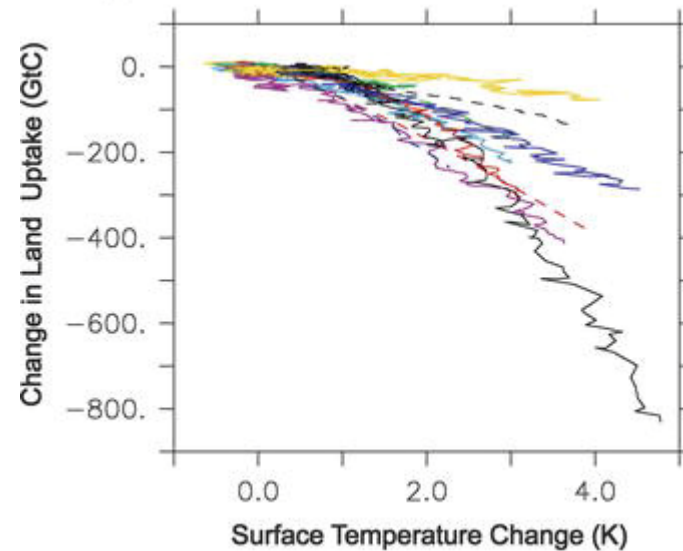
## Concentration-carbon feedback



$$\beta_L = 1.4 \text{ Pg C ppm}^{-1} [0.2-2.8]$$

CO<sub>2</sub> fertilization enhances carbon uptake

## Climate-carbon feedback



$$\gamma_L = -79 \text{ Pg C K}^{-1} [-20 \text{ to } -177]$$

Carbon loss with warming

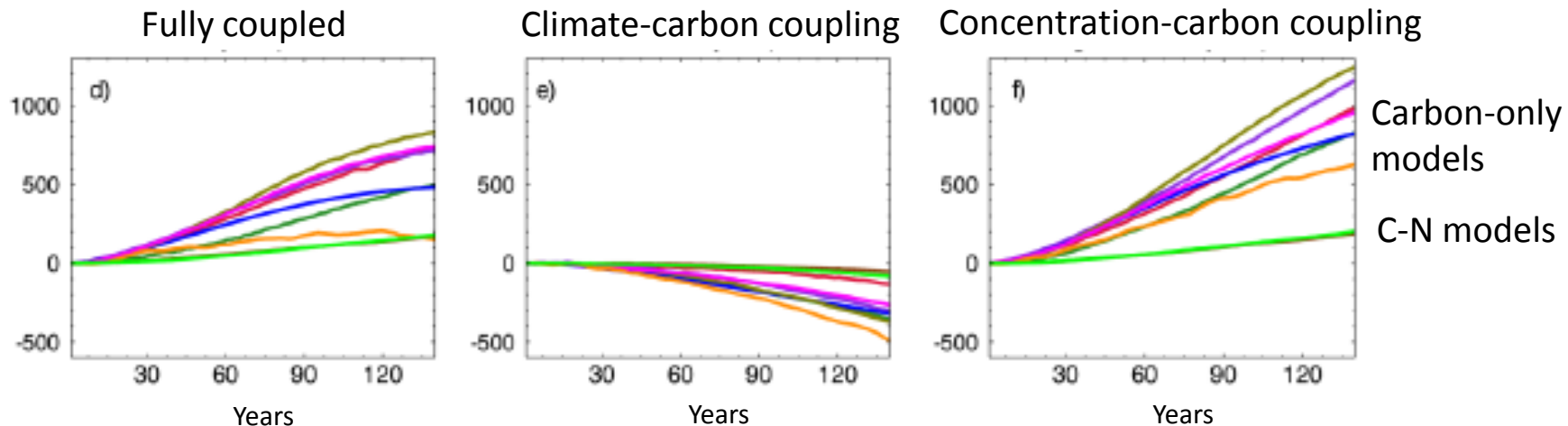
# CMIP5 – Climate and carbon cycle

## Carbon cycle-climate feedback

9 Earth system models of varying complexity  
140-year simulations during which  
atmospheric CO<sub>2</sub> increases 1% per year from  
~280 ppm to ~1120 ppm

Arora et al. (2012) J Climate, submitted

## Cumulative land-atmosphere CO<sub>2</sub> flux (Pg C)



CMIP5:  $\gamma_L = -58 \text{ Pg C K}^{-1} [-16 \text{ to } -89]$

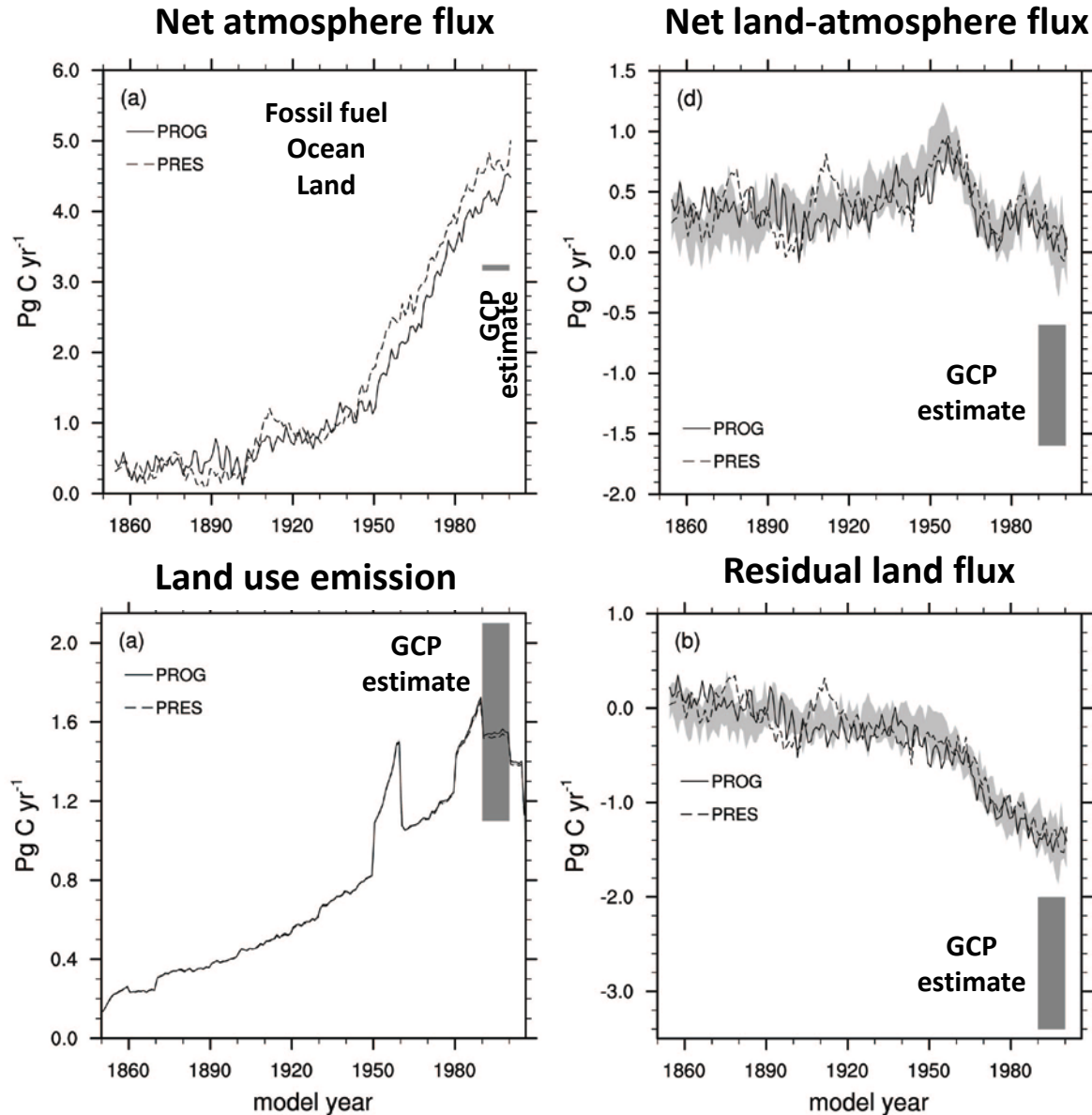
$\beta_L = 0.9 \text{ Pg C ppm}^{-1} [0.2-1.5]$

C4MIP:  $\gamma_L = -79 \text{ Pg C K}^{-1} [-20 \text{ to } -177]$

$\beta_L = 1.4 \text{ Pg C ppm}^{-1} [0.2-2.8]$



# CESM/CLM 20th century terrestrial carbon cycle



The atmosphere accumulates too much carbon, because the land is mostly a source of carbon. The net land flux consists of a land use emission and a “residual” uptake. This uptake is too low.

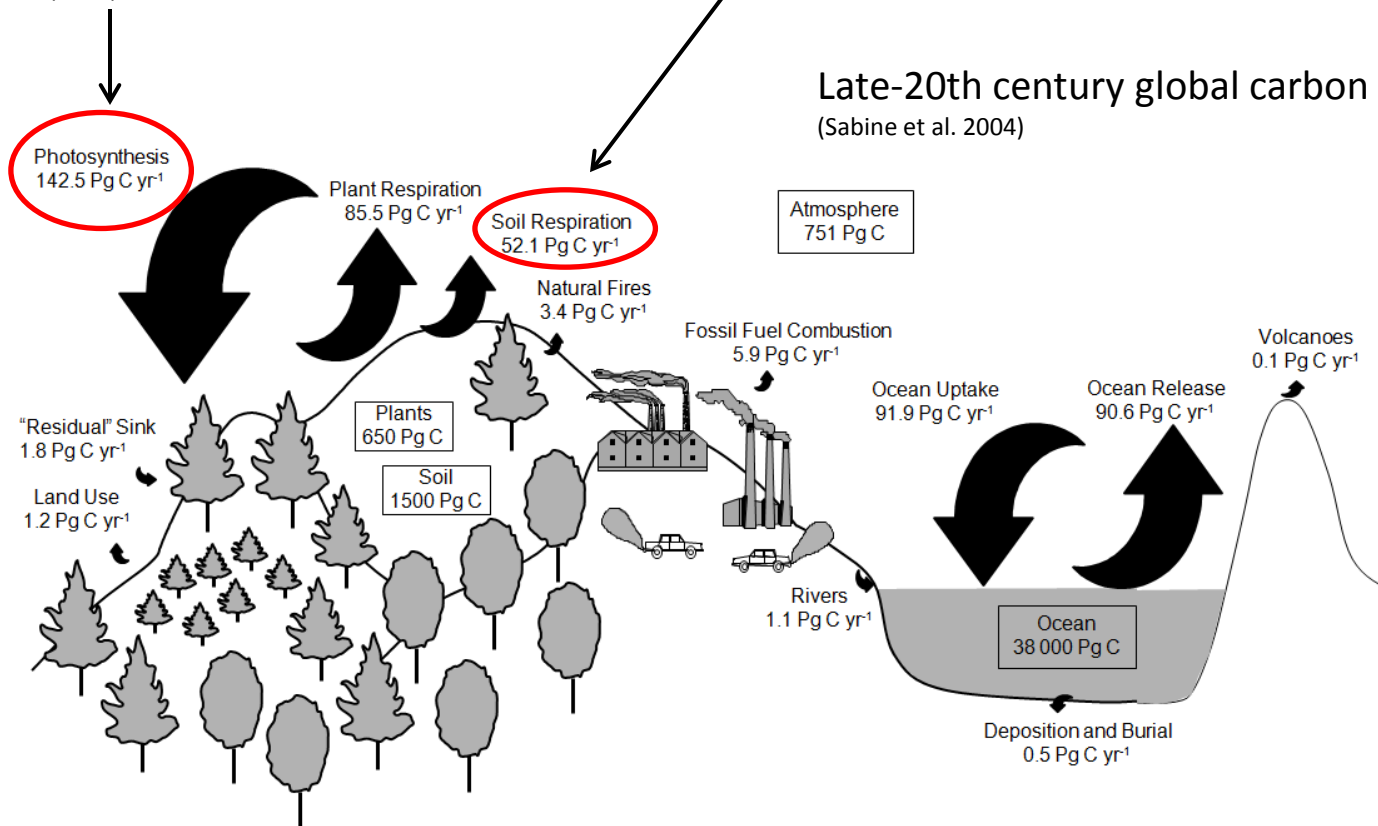
# CLM and nitrogen

CLM simulates high GPP that must be decreased due to N limitation to match observations. Other approaches (light limitation) can similarly match observations without N limitation

Bonan et al. (2011) JGR, doi:10.1029/2010JG001593  
Bonan et al. (2012) JGR, doi:10.1029/2011JG001913

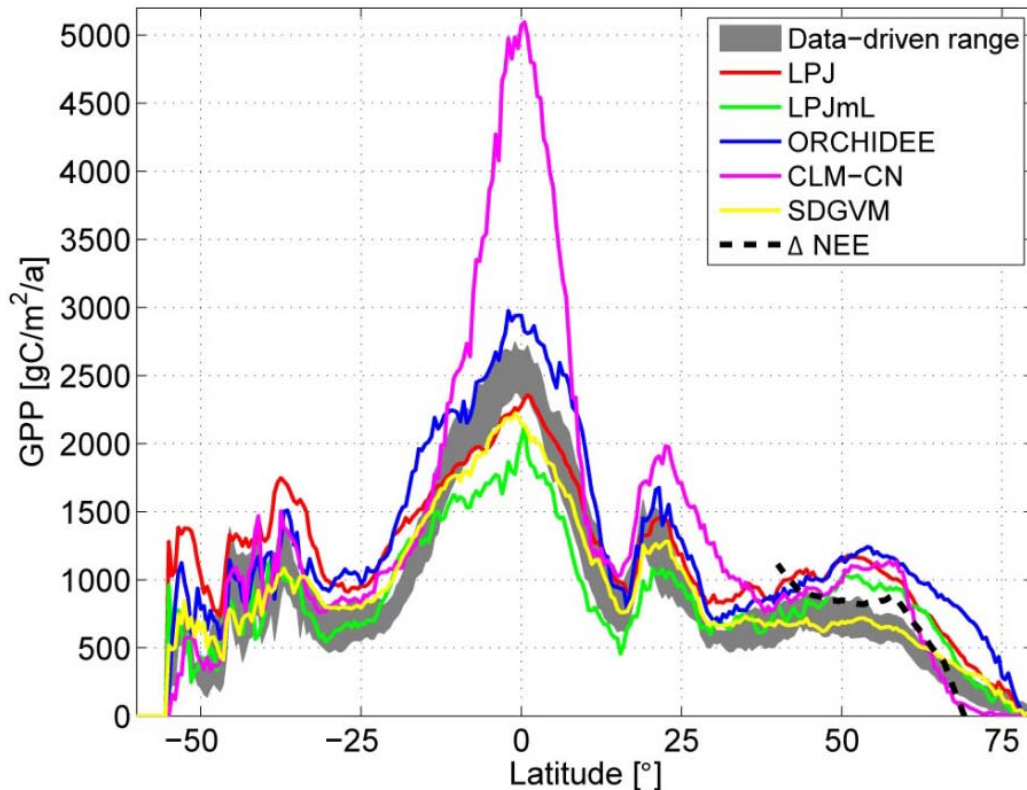
CLM simulates high decomposition rates that must be decreased due to N limitation to match observations. Other models better match observations and do not invoke an N feedback

Bonan et al. (2012) GCB, in press



# Gross primary production biases

CLM4 (purple line) overestimates annual gross primary production (GPP) compared with data-driven estimates and other models



Beer et al. (2010) Science 329:834-838

## *Causes of GPP bias*

### *Model structural error*

#### Canopy radiative transfer

- Shaded leaf light absorption

#### Photosynthesis-stomatal conductance

- Rubisco and RuBP limited rates

#### Canopy integration

- Nitrogen and photosynthetic capacity

### *Model parameter uncertainty*

$V_{\text{cmax}}$

Bonan et al. (2011) JGR, doi:10.1029/2010JG001593

Bonan et al. (2012) JGR, doi:10.1029/2011JG001913

# Multi-scale model evaluation

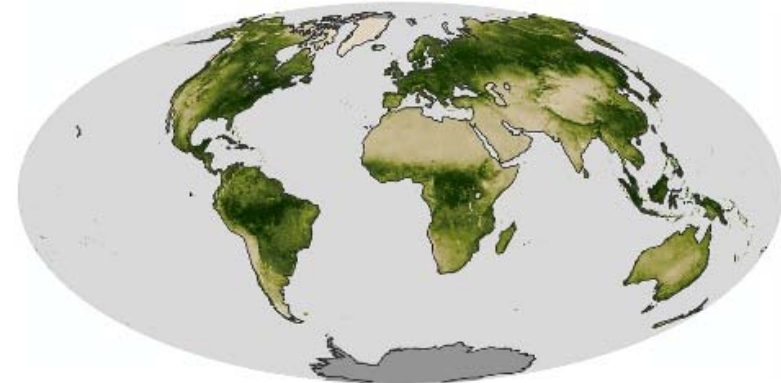
## Canopy fluxes

GPP, latent heat flux

Lasslop et al. (2010) GCB  
16:187-208



## Vegetation



## Global vegetation

GPP, latent heat flux

Jung et al. (2011) JGR, 116,  
doi:10.1029/2010JG001566

## Canopy processes

Theory

Numerical parameterization

Profiles of light, leaf traits, and photosynthesis

Global databases of leaf traits and eddy covariance flux datasets allow model testing with observations across multiple scales, from leaf to canopy to global

## Leaf traits

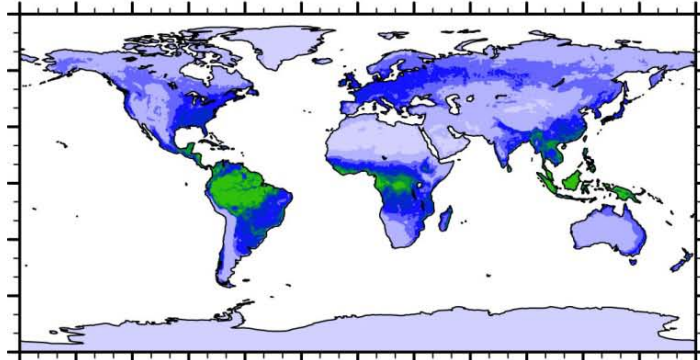
Nitrogen concentration,  $V_{\text{cmax}}$

Kattge et al. (2009) GCB 15:976-991

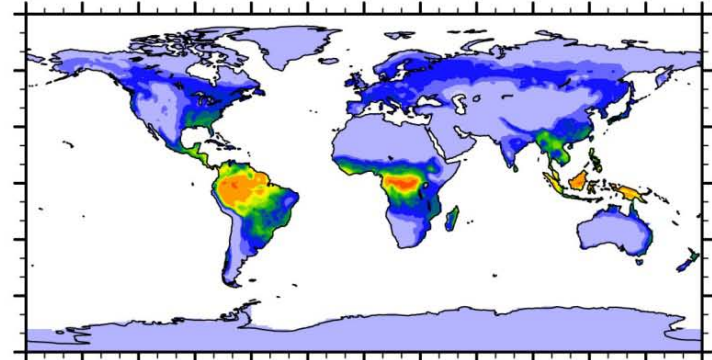


# Gross primary production bias reduction

a) FLUXNET-MTE 117 Pg C yr<sup>-1</sup>

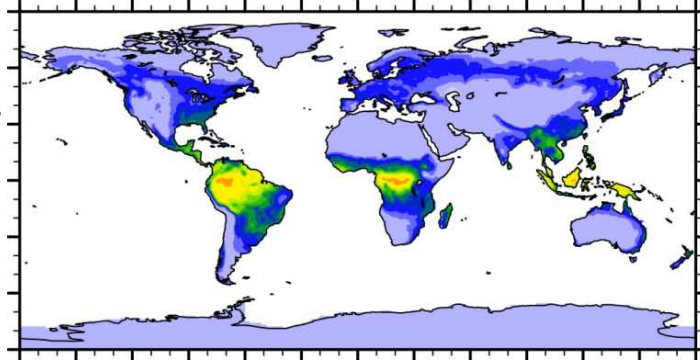


b) CLM4 165 Pg C yr<sup>-1</sup>



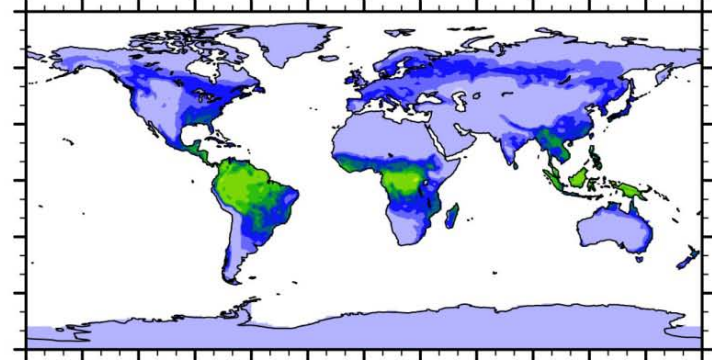
Control

c) RAD 155 Pg C yr<sup>-1</sup>

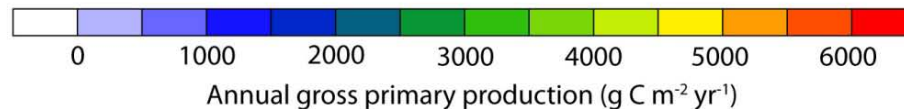


Radiative  
transfer for  
sunlit and  
shaded  
canopy

d) RAD-PSN 130 Pg C yr<sup>-1</sup>

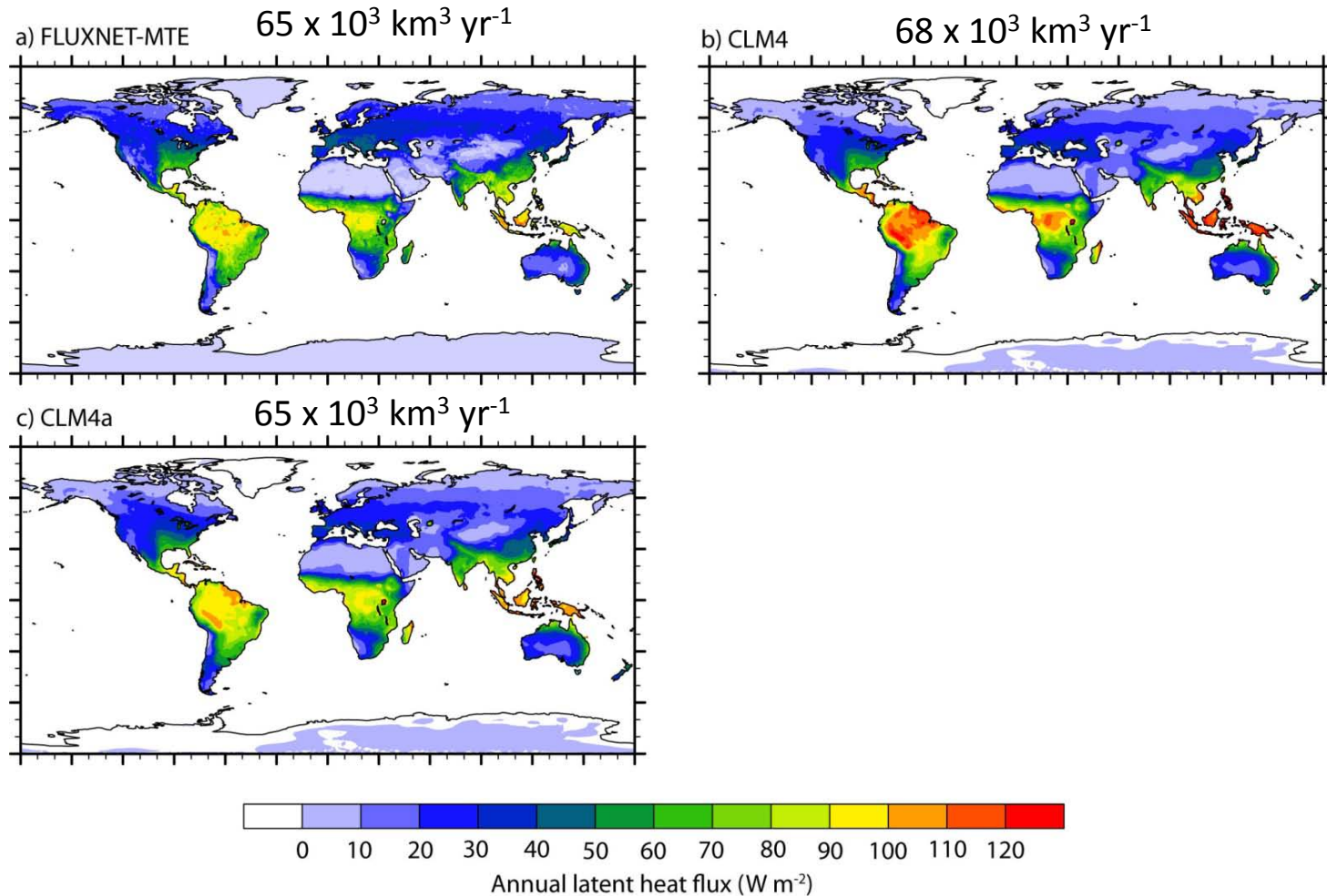


Radiative  
transfer  
and photo-  
synthesis



**CLM4 overestimates GPP. Model revisions improve GPP. Similar improvements are seen in evapotranspiration**

# Improved annual latent heat flux



**Model improvements (CLM4a)  
reduce ET biases, especially in  
tropics, and improve monthly fluxes**

# Is the CLM4 photosynthetic capacity consistent with observations?

To match observed GPP, CLM4 needs to infer strong N reduction of GPP (with therefore reduced photosynthetic capacity)

How does this compare with observations of photosynthetic capacity, including N limitation?

Global databases of leaf traits provide an answer

Global Change Biology (2009) 15, 976–991, doi: 10.1111/j.1365-2486.2008.01744.x

## Quantifying photosynthetic capacity and its relationship to leaf nitrogen content for global-scale terrestrial biosphere models

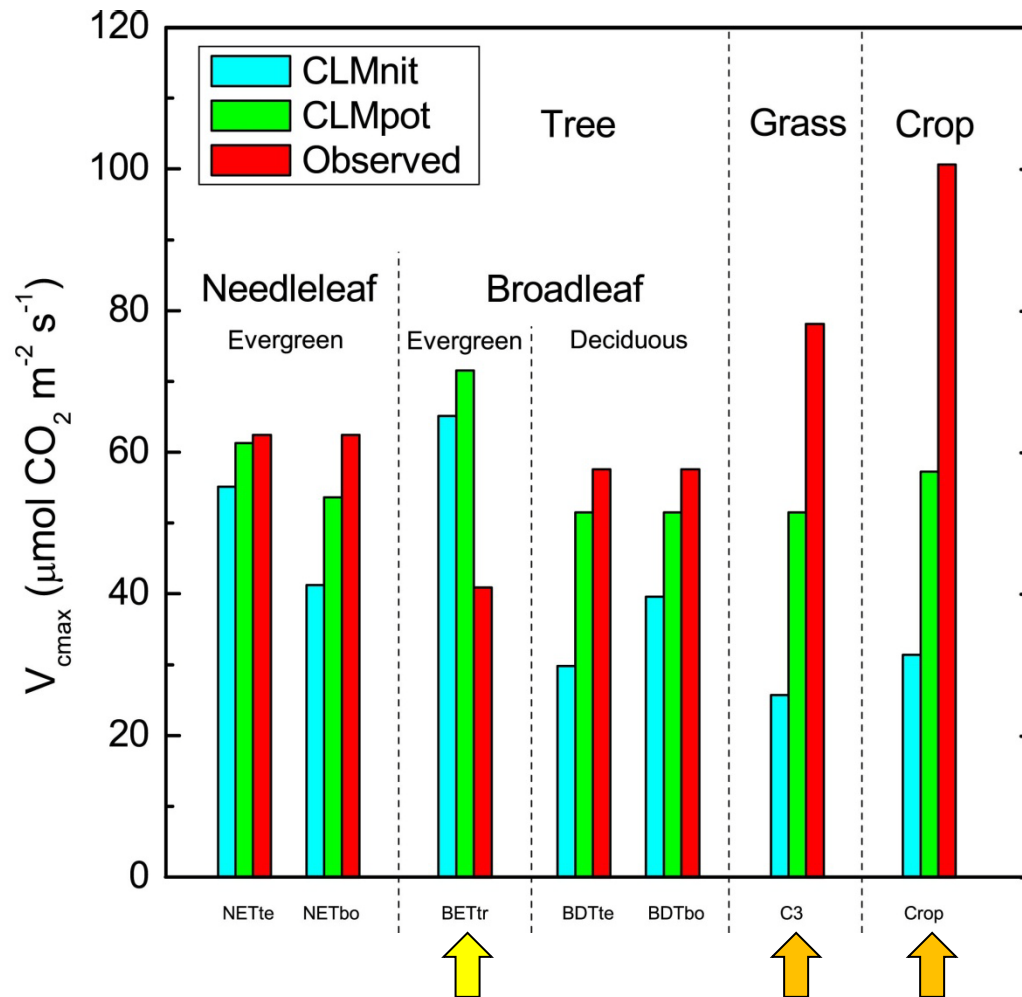
JENS KATTGE\*, WOLFGANG KNORR†, THOMAS RADDATZ‡ and CHRISTIAN WIRTH\*

\*Max-Planck-Institute for Biogeochemistry, Hans-Knöll Street 10, 07745 Jena, Germany, †QUEST, Department of Earth Sciences, University of Bristol, Wills Memorial Building, Queen's Road, BS8 1RJ, UK, ‡Max Planck Institute for Meteorology, Bundesstraße 53, 20146 Hamburg, Germany

- Derived the relationship between photosynthetic parameter  $V_{cmax}$  and leaf N from  $V_{cmax}$  (723 data points) and  $A_{max}$  (776 data points) studies
- Used measured leaf N in natural vegetation to estimate  $V_{cmax}$  for various PFTs
- Most comprehensive estimates of  $V_{cmax}$  available
- Includes the effects of extant N availability

# CLM4 photosynthetic capacity

Observed and model  $V_{cmax}$  (25 °C) for several CLM plant functional types



- CLM4 reduces a potential GPP for simulated N availability
- CLM4 realized  $V_{cmax}$  after N down-regulation is less than Kattge observed  $V_{cmax}$ , except for tropical forest
- CLM4 potential  $V_{cmax}$  before N down-regulation is comparable to Kattge observed  $V_{cmax}$ , with some exceptions



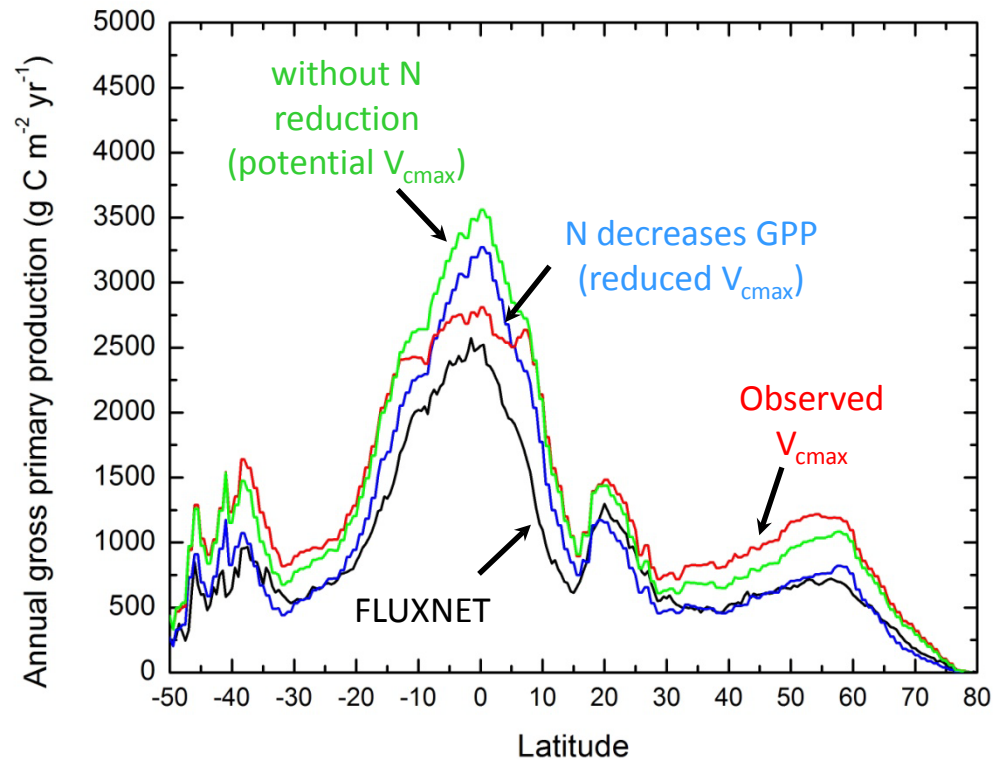
# CLM4 requires low $V_{cmax}$

What happens when we use these  $V_{cmax}$  values?

Best simulation uses low  $V_{cmax}$ .  
When we remove the N down-regulation, the model is too productive

Kattge observed  $V_{cmax}$  increases GPP except in the tropics, which declines because of lower  $V_{cmax}$

**Why is GPP so high if we are using the correct enzyme-limited photosynthetic capacity?**  
**What is missing in the model?**



Bonan et al. (2011) JGR, doi:10.1029/2010JG001593

# Canopy light absorption

**Hypothesis:** CLM4 is too productive (high GPP) in the absence of N down-regulation because of deficiencies in the canopy parameterization. The CLM nitrogen down-regulation compensates for this deficiency

## Model simulations

- Without C-N biogeochemistry
- With satellite leaf area and prescribed  $V_{\text{cmax}}$

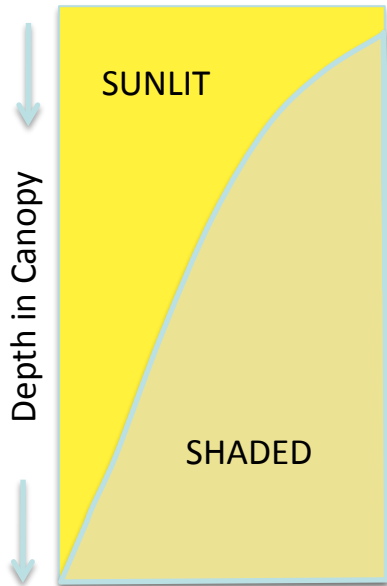
Investigate why CLM requires low  $V_{\text{cmax}}$  and why it performs poorly with the Kattge et al. (2009) values

Photographs of Morgan Monroe State Forest tower site illustrate two different representations of a plant canopy: as a “big leaf” (below) or with vertical structure (right)

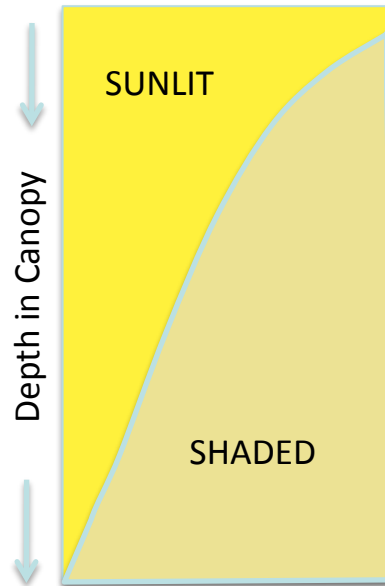


# Multi-layer canopy

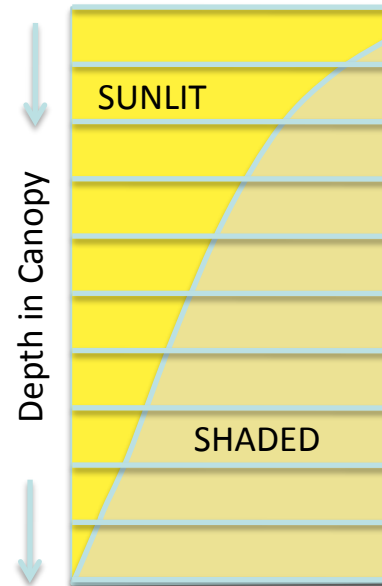
CLM4



CLM4a



CLM4b



## Multi-layer model

- Two-stream approximation for light profile at each layer
- Resolves direct and diffuse radiation at each layer
- Resolves sunlit and shaded leaves at each layer
- Explicit definition of photosynthetic capacity ( $V_{cmax}$ ) at each layer
- Nitrogen scaled exponentially with cumulative LAI.  $K_n$  dependant on  $V_{cmax}$  (Lloyd et al. 2010)
- $V_{cmax}$  from Kattge et al. (2009)
- Bonan et al. (2012) JGR, doi:10.1029/2011JG001913

Same model structure as CLM4, but with revisions described by Bonan et al. (2011) JGR, doi:10.1029/2010JG001593

CLM4a and multi-layer canopy

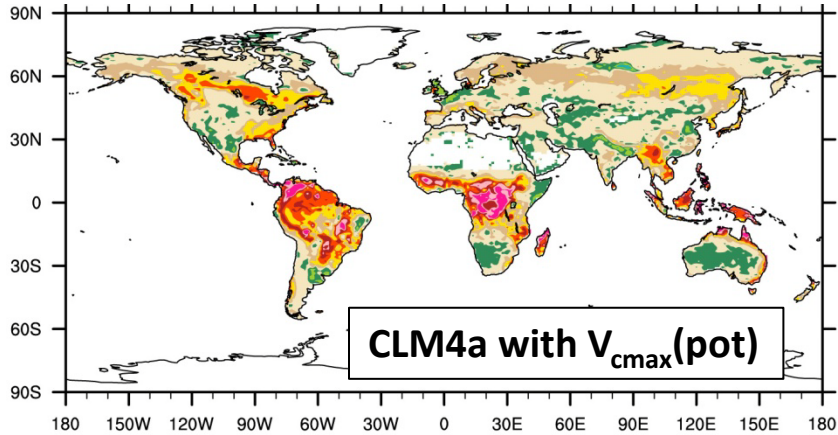
- Corrected radiative transfer for sunlit and shaded canopy
- Corrected  $A$  and  $g_s$
- Nitrogen ( $V_{cmax}$ ) scales exponentially with cumulative LAI ( $K_n=0.11$ )

- Two “big-leaves” (sunlit, shaded)
- Radiative transfer integrated over LAI (two-stream approximation)
- Photosynthesis calculated for sunlit and shaded big-leaves
- Quasi-scaling over canopy using a gradient in specific leaf area

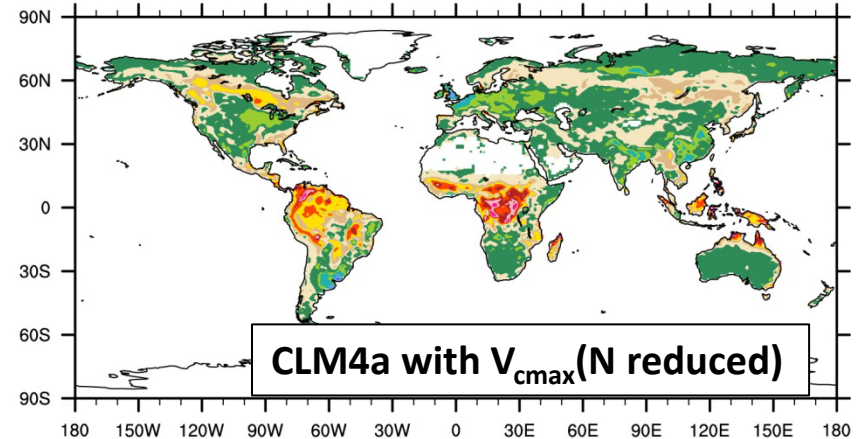
# Two ways to get similar GPP

## Nitrogen down-regulation

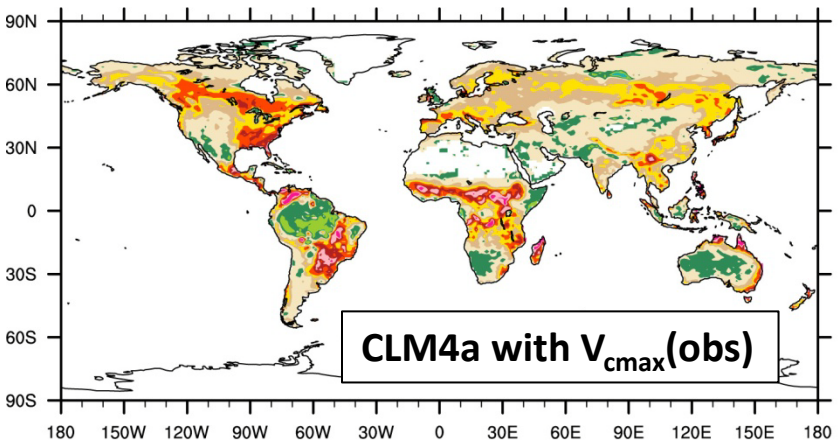
2Lpot



2Lnit

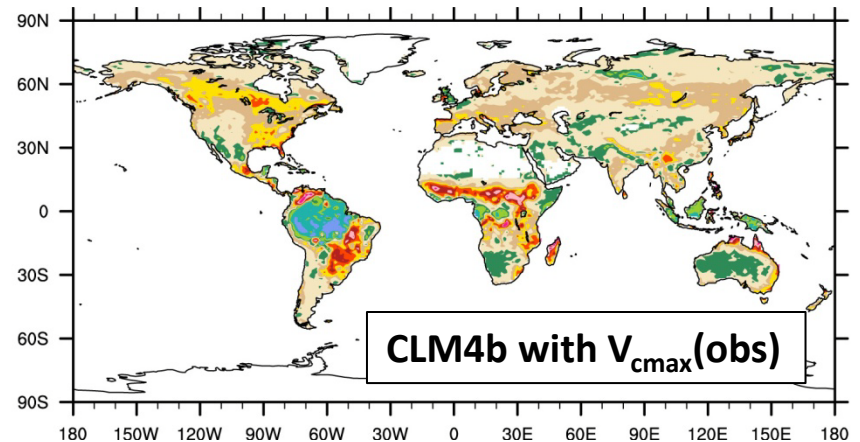


2Lobs



## Light limitation

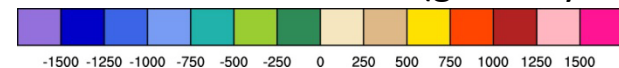
MLkn



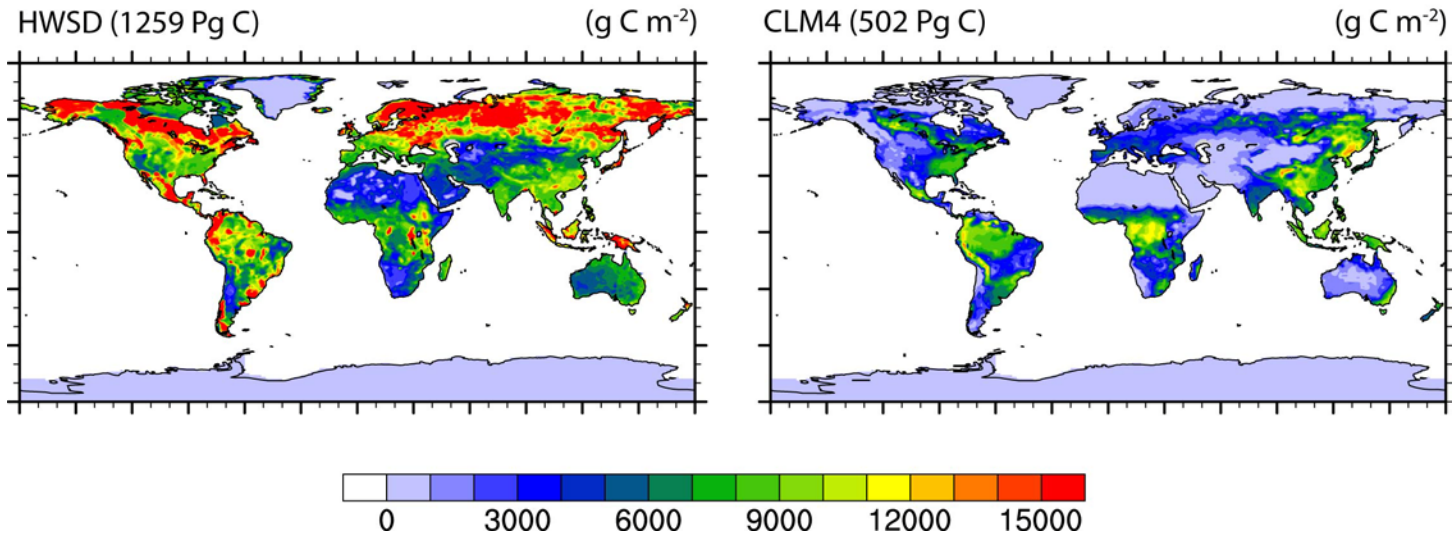
Biases in CLM4b are comparable to, though of opposite sign, those of CLM4a

Two-leaf canopy does not capture non-linearity of radiative transfer and photosynthesis

Model - FLUXNET GPP ( $g\ C\ m^{-2}\ yr^{-1}$ )



# Soil carbon biases



**CLM4 has far too little soil carbon**

## *Possible causes of soil carbon bias*

Litter fall

Turnover rates

- Model structure (pools)
- Abiotic controls (temperature, moisture, pH, texture, N)

# Long-Term Intersite Decomposition Experiment (LIDET)

## Observations

10-year study of litter dynamics for a variety of litter types placed in different environments

- 20 sites: 2 tundra, 2 boreal forest, 5 conifer forest, 3 deciduous forest, 3 tropical forest, 2 humid grassland, 3 arid grassland
- 9 litter types (6 species of leaves, 3 species of root) that vary in chemistry

Litter bags sampled once a year for C and N

## Model simulations

- CLM-cn, DAYCENT
- Follow a cohort of litter ( $100 \text{ g C m}^{-2}$ ) deposited on October 1
- Specified climatic decomposition index (CDI) to account for temperature and moisture
- Soil mineral nitrogen

### *DAYCENT*

SOM C:N ratios vary with mineral N. Use low and high C:N ratios

### *CLM-cn*

Configure simulations so that N does not limit decomposition & immobilization ( $f_{pi}=1$ ) and so that N is rate limiting ( $f_{pi}<1$ )



# The models

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## CLM-cn

3 litter pools (labile, cellulose, lignin)

- Base turnover = 20 h – 71 d

4 SOM pools

- Base turnover = 14 d – 27 y
- C:N = 10-12

Rapid decomposition rates

Low SOM C:N ratios (high immobilization)

## DAYCENT

*Surface (leaf)*

2 litter pools (metabolic, structural)

- Turnover = 46 d – 182 d

2 SOM pools

- Turnover = 61 d – 12 y
- C:N = 10-20

*Belowground (root)*

2 litter pools (metabolic, structural)

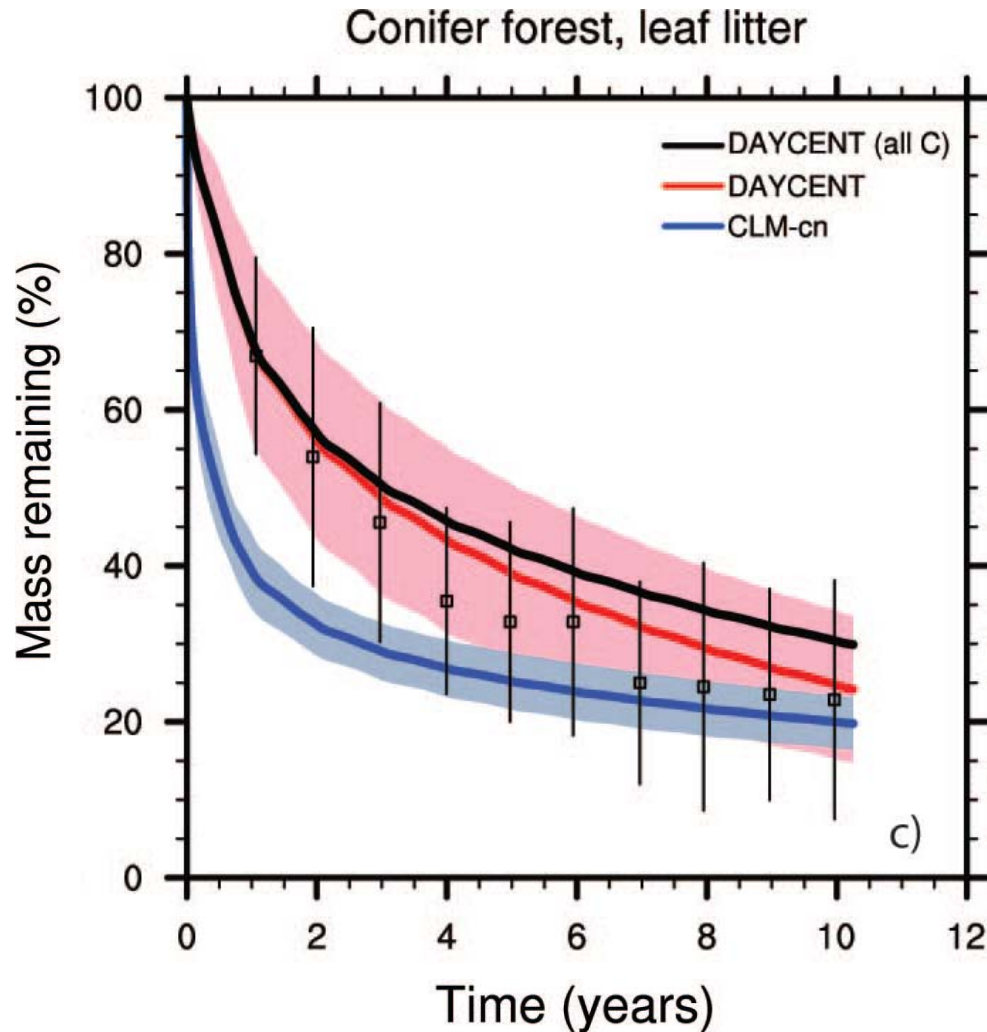
- Turnover = 20 d – 74 d

3 SOM pools

- Turnover = 33 d – 303 y
- C:N = 6-40

Slow decomposition rates  
pH, lignin, L/N, soil texture  
High SOM C:N ratios (low immobilization)

# Leaf litter mass loss – conifer forest



5 sites

6 leaf litter types

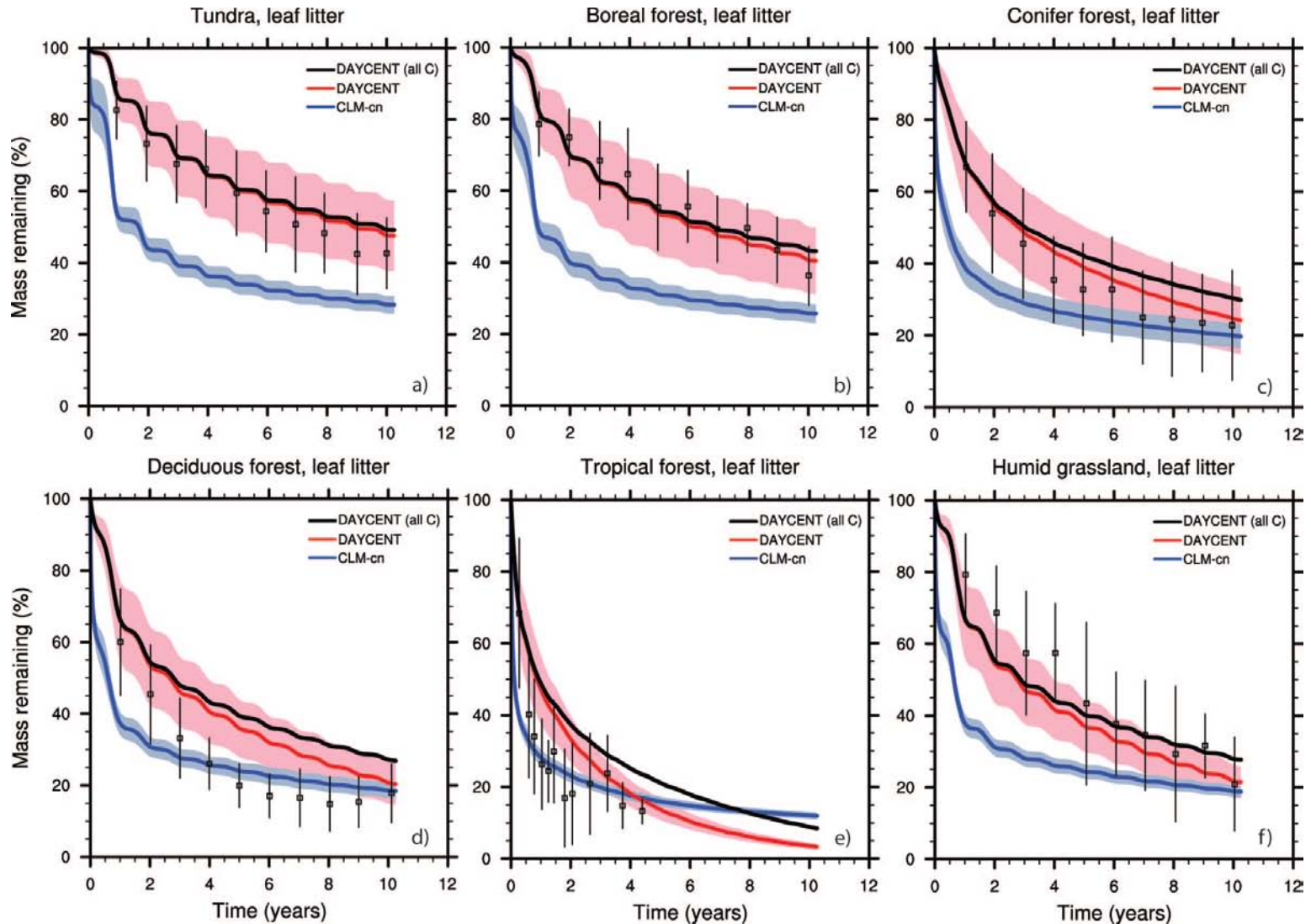
Shown are the site x  
litter mean and  $\pm 1$  SD

DAYCENT simulations  
show surface C and all  
C (surface and soil)

**CLM underestimates  
carbon mass remaining  
(overestimates mass  
loss), especially during  
first several years. This  
is common to all sites.**

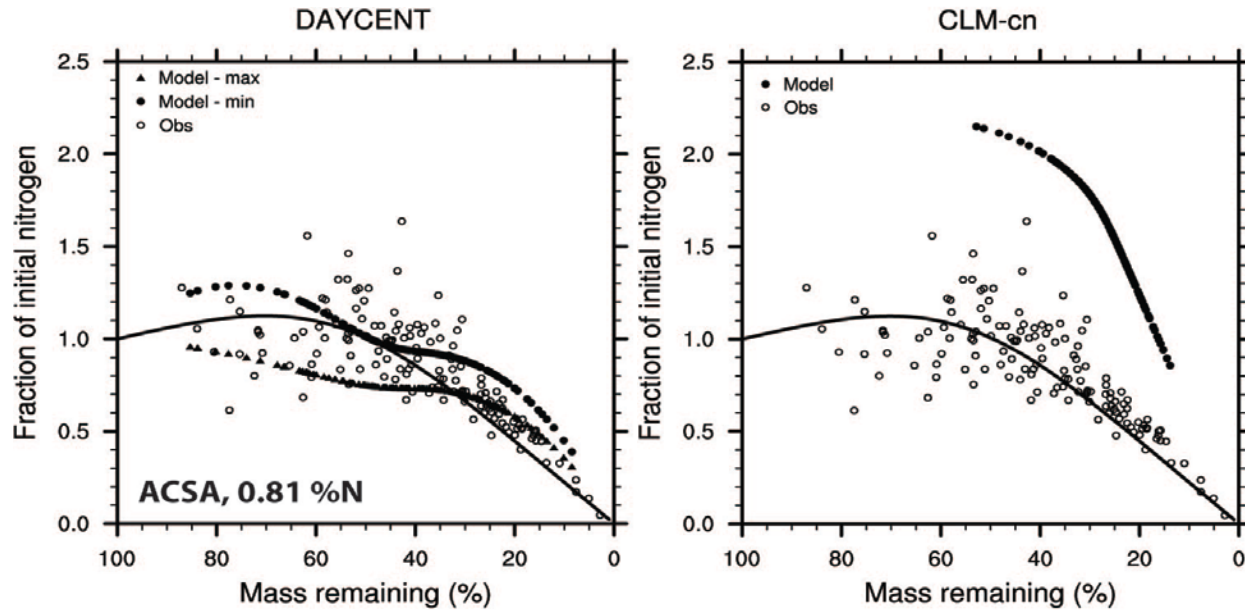


# Leaf litter mass loss – all sites



# Nitrogen dynamics

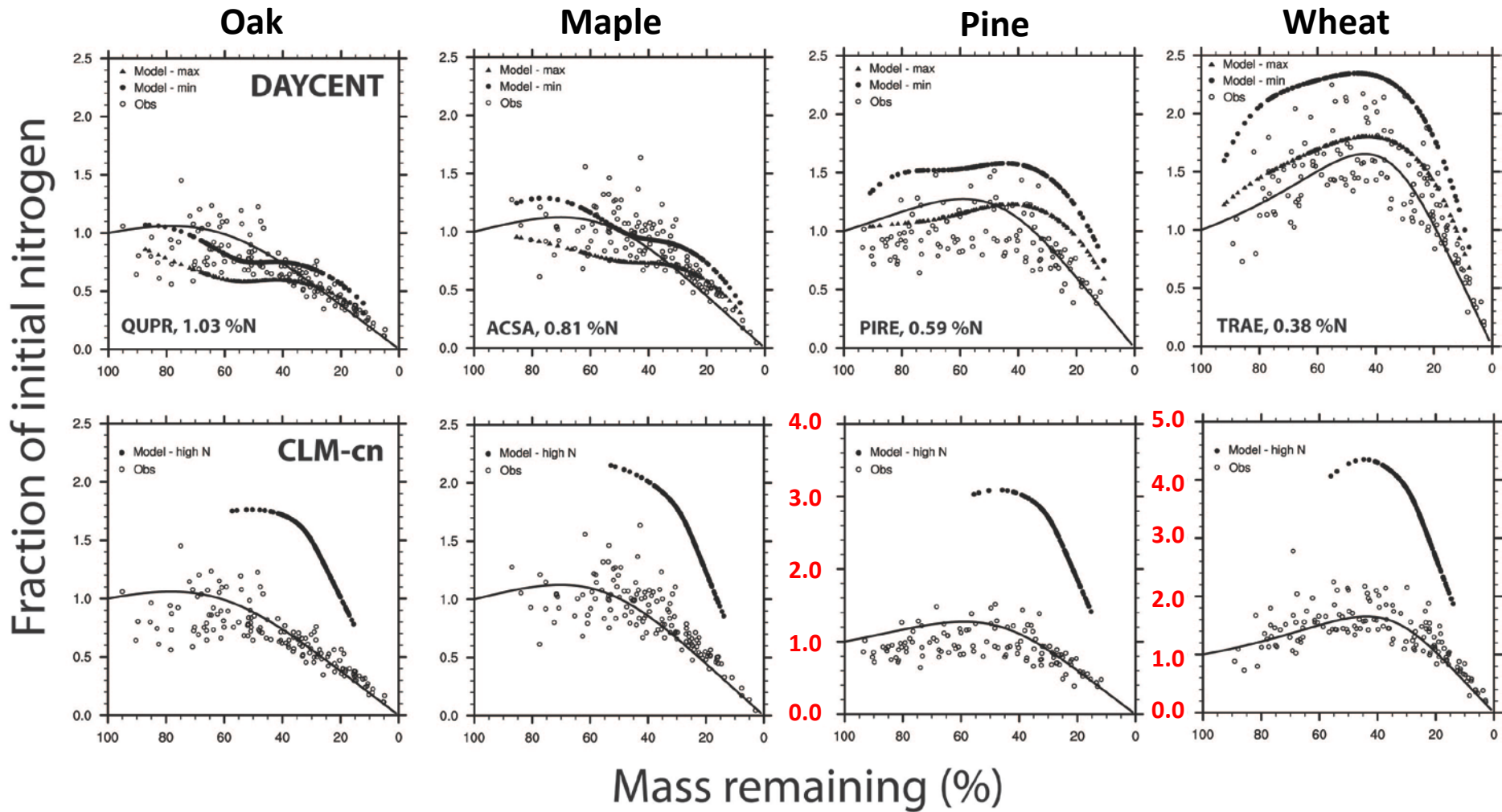
## Maple, 0.81 %N



Observations are sampled once per year. Shown are data for maple leaf litter at all biomes except arid grassland. Model data are sampled similar to the observations.

**CLM overestimates immobilization. Larger bias for leaf litter with lower initial %N**

# Nitrogen dynamics

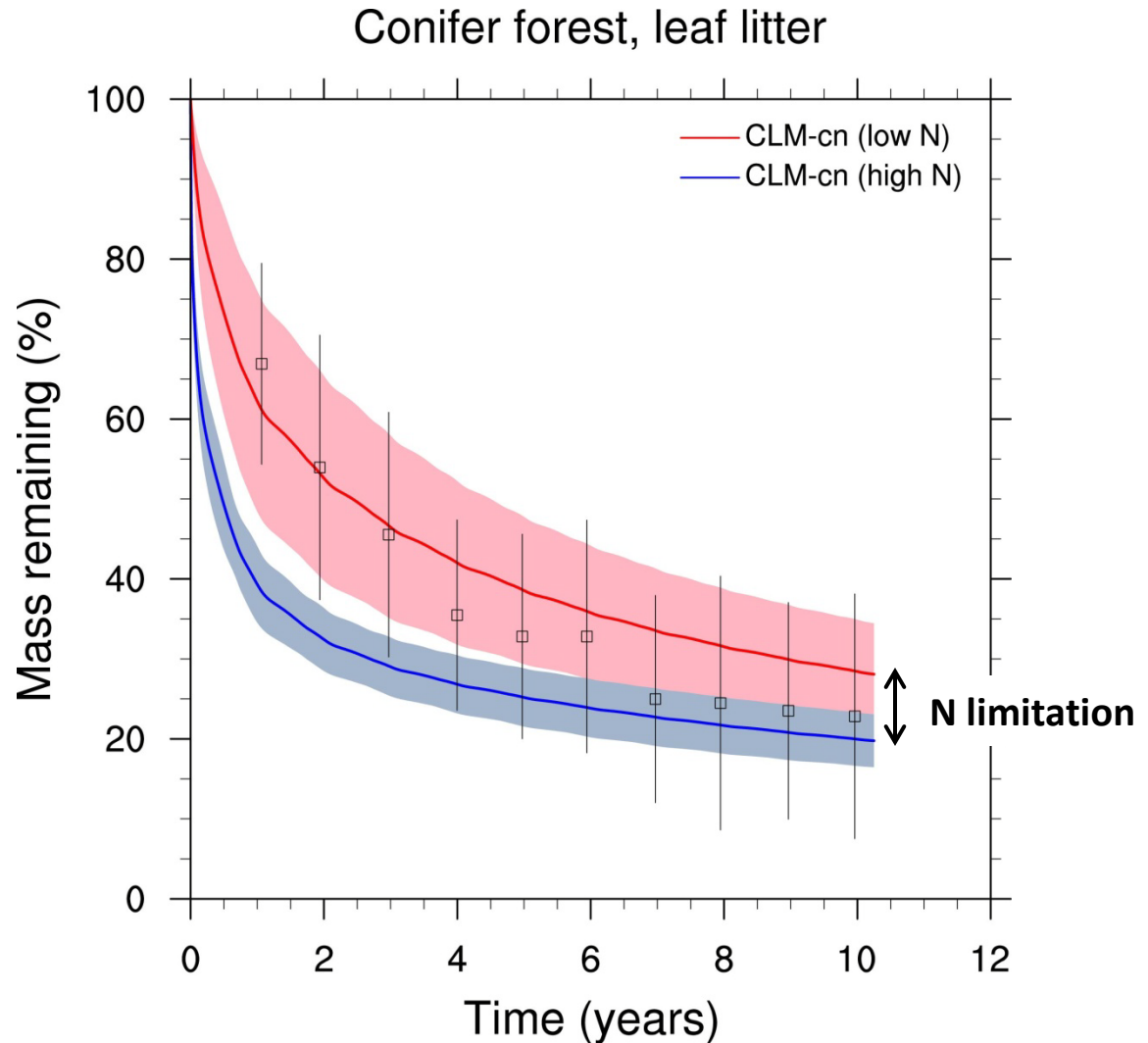


# CLM-cn nitrogen limitation

N limitation reduces decomposition rates in CLM-cn and improves carbon dynamics. Here we use  $f_{pi} = 0.05$ . Similar results can be obtained for other biomes using  $f_{pi}=0.05-0.20$

Decomposition rates in DAYCENT do not need to be similarly reduced

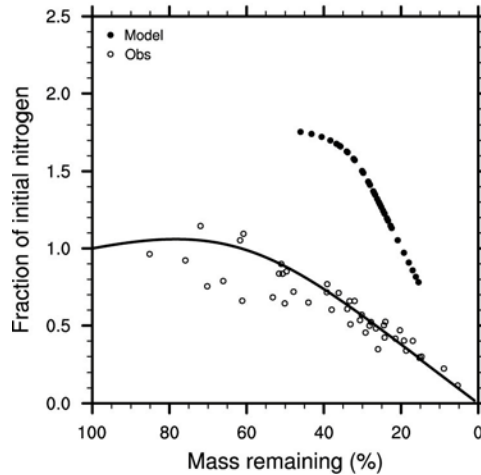
**Different underlying philosophies for the two models, particularly with respect to the influence of soil mineral N on litter C-N dynamics**



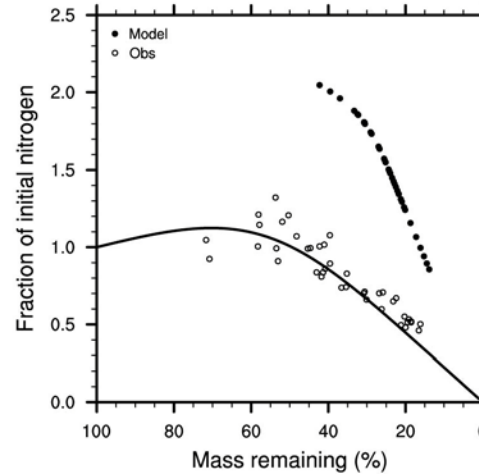
# CLM-cn nitrogen limitation

## Conifer forest

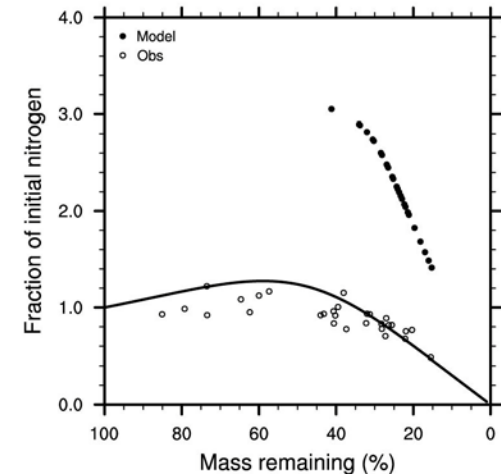
### Oak, 1.03 % N



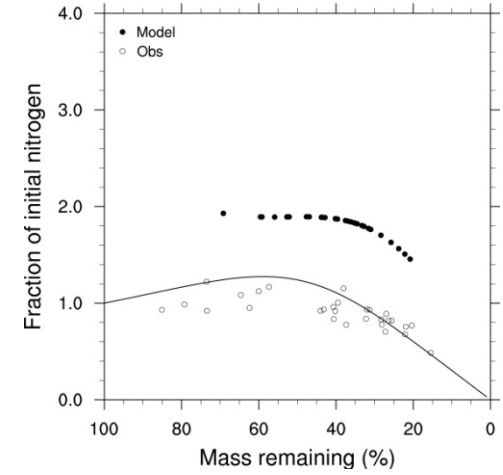
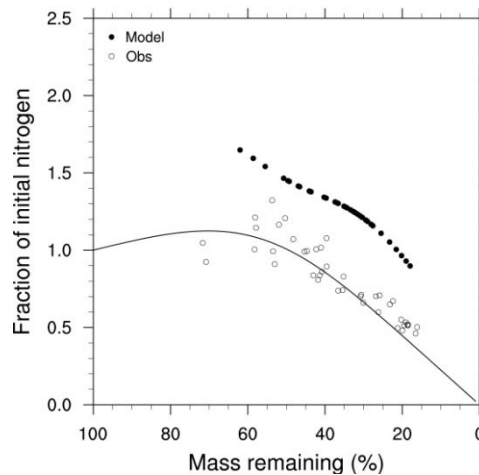
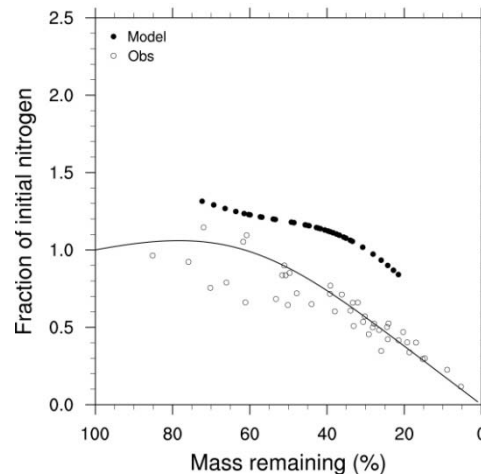
### Maple, 0.81 % N



### Pine, 0.59 % N



**N limiting**



**N limitation (fpi=0.05) reduces bias. Similar results can be obtained for other biomes using fpi=0.05-0.20**

# Conclusions

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- Climate models have evolved to earth system models with much ecology
- Prominent biosphere feedbacks, but much uncertainty
  - land use and land cover change (albedo, ET, carbon)
  - carbon cycle (GPP, heterotrophic respiration)
  - reactive nitrogen (N gas emissions)
- Confidence in model simulations from:
  - physical/chemical/ecological principles
  - mean state (e.g., present-day carbon cycle)
  - historical trends (e.g., 20<sup>th</sup> century warming)
  - processes (e.g., CO<sub>2</sub> enrichment, N fertilization, soil warming , deforestation)



# Integrate ecological studies with earth system models

## Environmental Monitoring



Eddy covariance flux tower

## Experimental Manipulation



Soil warming, Harvard Forest



CO<sub>2</sub> enrichment, Duke Forest



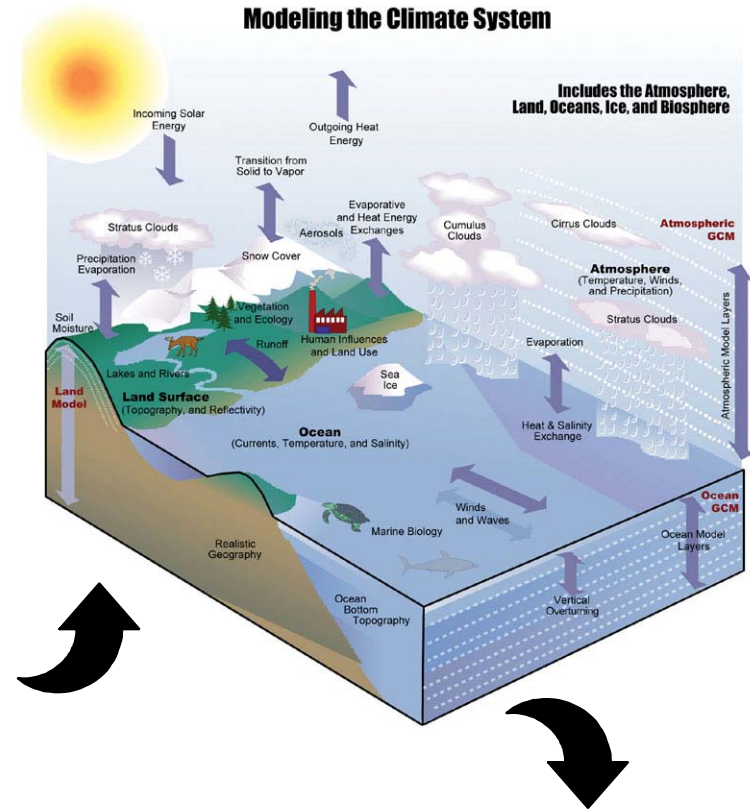
Hubbard Brook  
Ecosystem Study



CO<sub>2</sub> × N  
enrichment,  
Cedar Creek

Test model-generated hypotheses of earth system functioning with observations

## Modeling the Climate System



Planetary energetics  
Planetary ecology  
Planetary metabolism

