

# GLOBAL SCALE ANALYSIS AND EVALUATION OF AN IMPROVED MECHANISTIC REPRESENTATION OF PLANT NITROGEN AND CARBON DYNAMICS IN THE COMMUNITY LAND MODEL (CLM)

Bardan Ghimire, William Riley, Charles Koven

Climate Sciences Department, Lawrence Berkeley National  
Laboratory

March 4, 2015



U.S. DEPARTMENT OF  
**ENERGY**

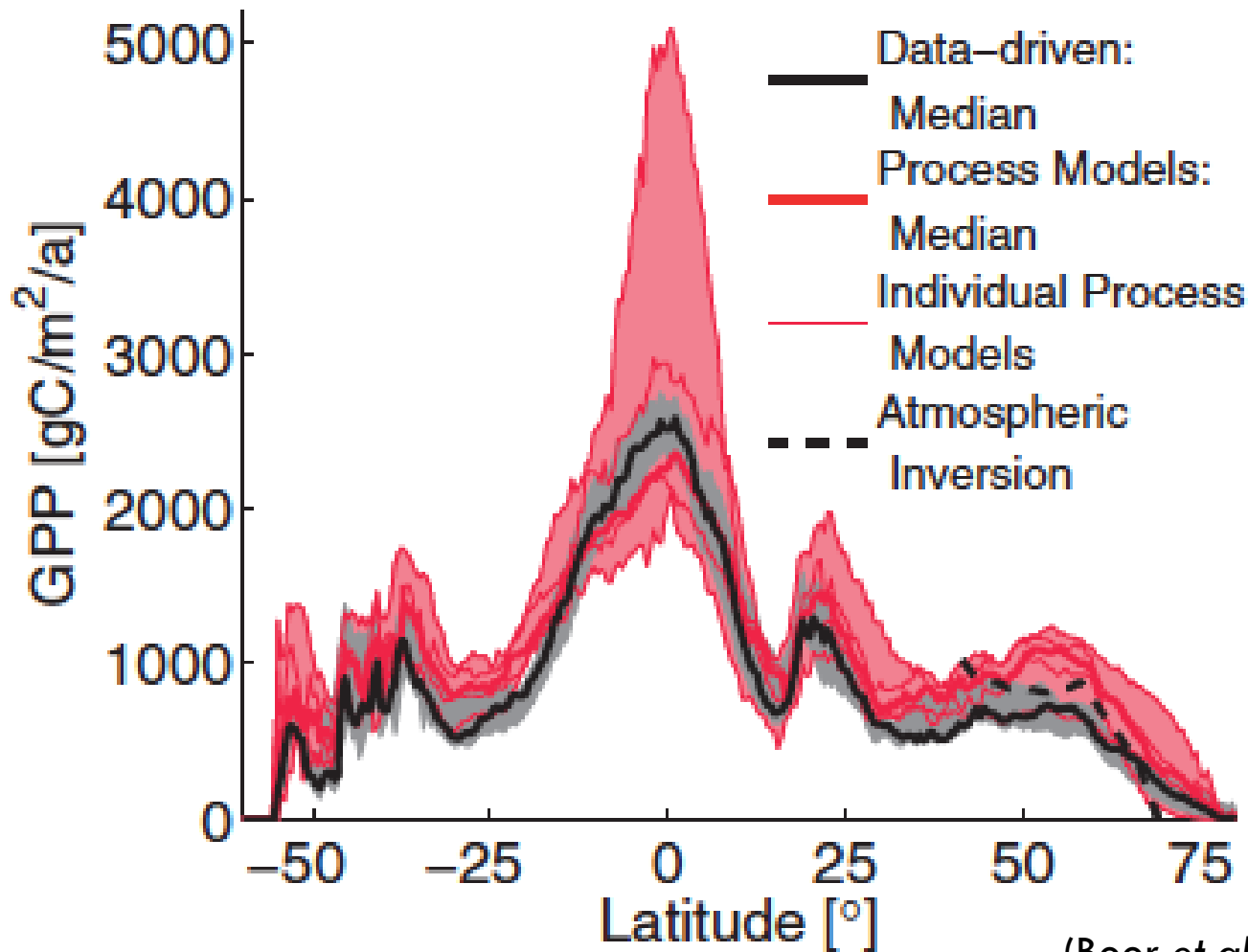
# Improvements of Plant Nitrogen Cycle Processes in CLM

2

- Plant nitrogen uptake
  - ▣ Linked to root physiology
    - Root nutrient uptake efficiency
    - Root biomass
  - ▣ Michaelis-Menten kinetics
- Plant nitrogen allocation
  - ▣ Plant organs (root, stem, leaf)
  - ▣ Functions (photosynthesis, respiration, structure)
- Plant photosynthesis
  - ▣ Strongly linked to leaf nitrogen allocated to photosynthetic enzymes

# Large uncertainty in model predictions of carbon sinks

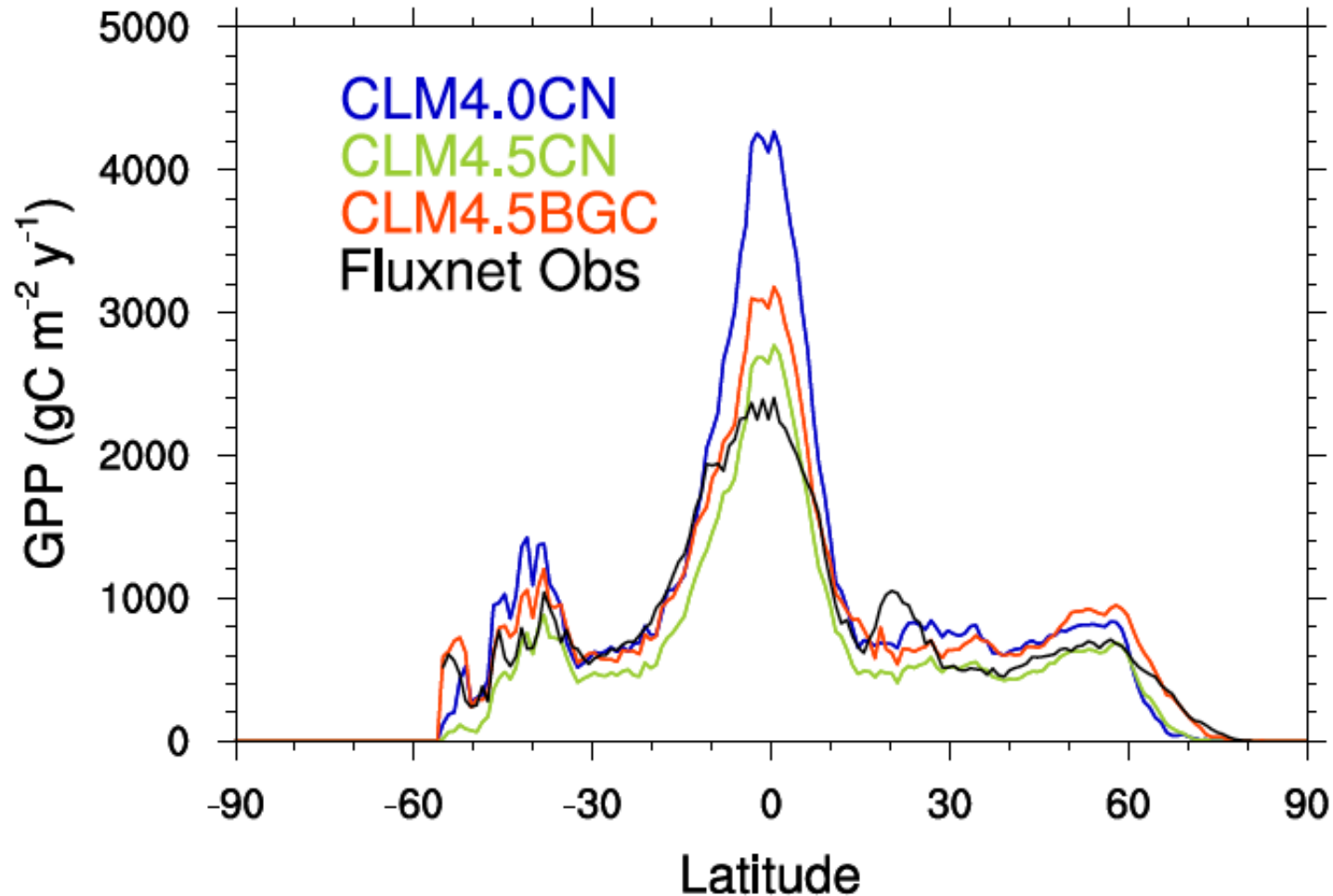
3



(Beer *et al.* 2010, Science)

# CLM predictions of historical carbon sinks

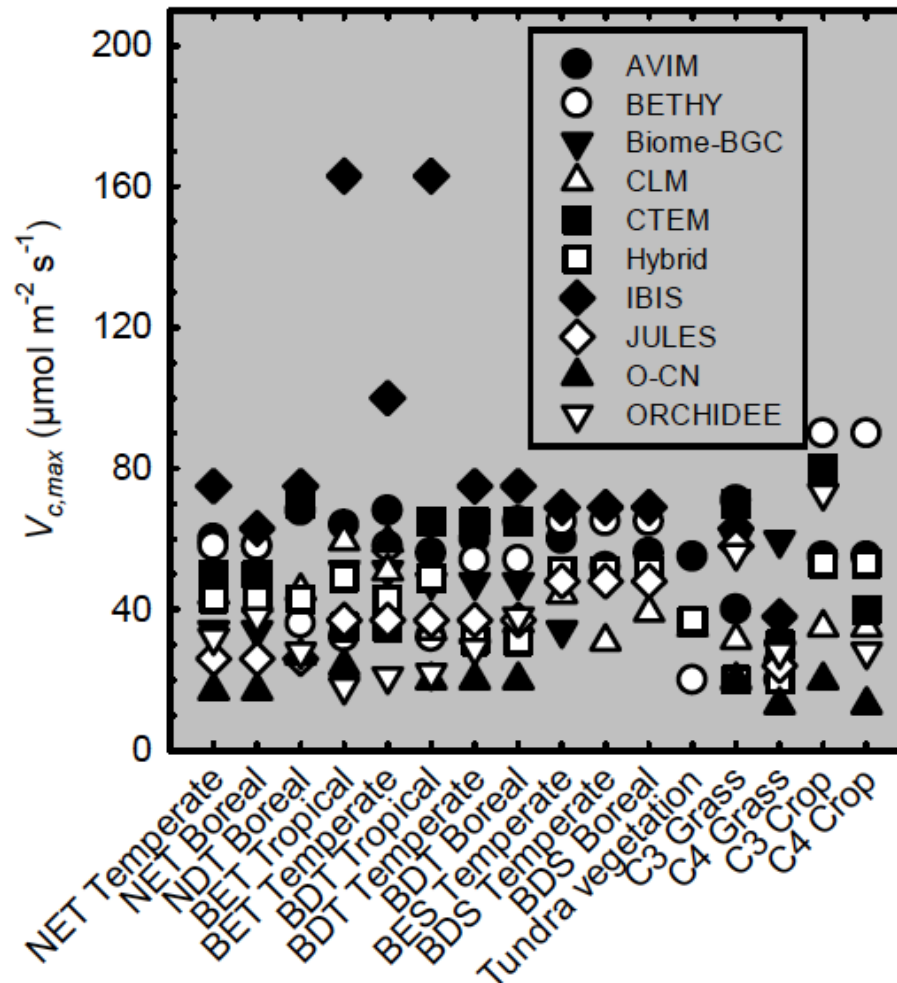
4



# Large variation of $V_{c,max}$ in models lead to variations in GPP among models

5

$V_{c,max}$  is maximum rate of Rubisco-mediated carboxylation



(Rogers 2014, PR)

# Modeling Carbon Assimilation

6

## □ Farquhar Model

$$A_g = \min (W_c, W_j, W_p)$$

Rubisco limited carboxylation

$$W_c = \frac{\max (C_i - C_p, 0)}{(C_i + K_{ct}) \left(1 + \frac{O_2}{K_{ot}}\right)} V_{cmax}$$

Electron transfer limited carboxylation

$$W_j = \frac{\max (C_i - C_p, 0)}{(4C_i + 8C_p)} J$$

End product utilization

$$W_p = 0.5V_{cmax}$$

(Farquhar *et al.* 1980, Planta)

# Calculation of $V_{cmax}$ in CLM

7

$$V_{cmax} = a_{r25} \cdot F_{NR} \cdot F_{LNR} \cdot N_L$$

$$N_L = \frac{1}{CN_L \cdot SLA}$$

$a_{r25}$  = specific activity of Rubisco at 25°C

$F_{NR}$  = nitrogen fraction of Rubisco

$F_{LNR}$  = fraction of leaf nitrogen in Rubisco

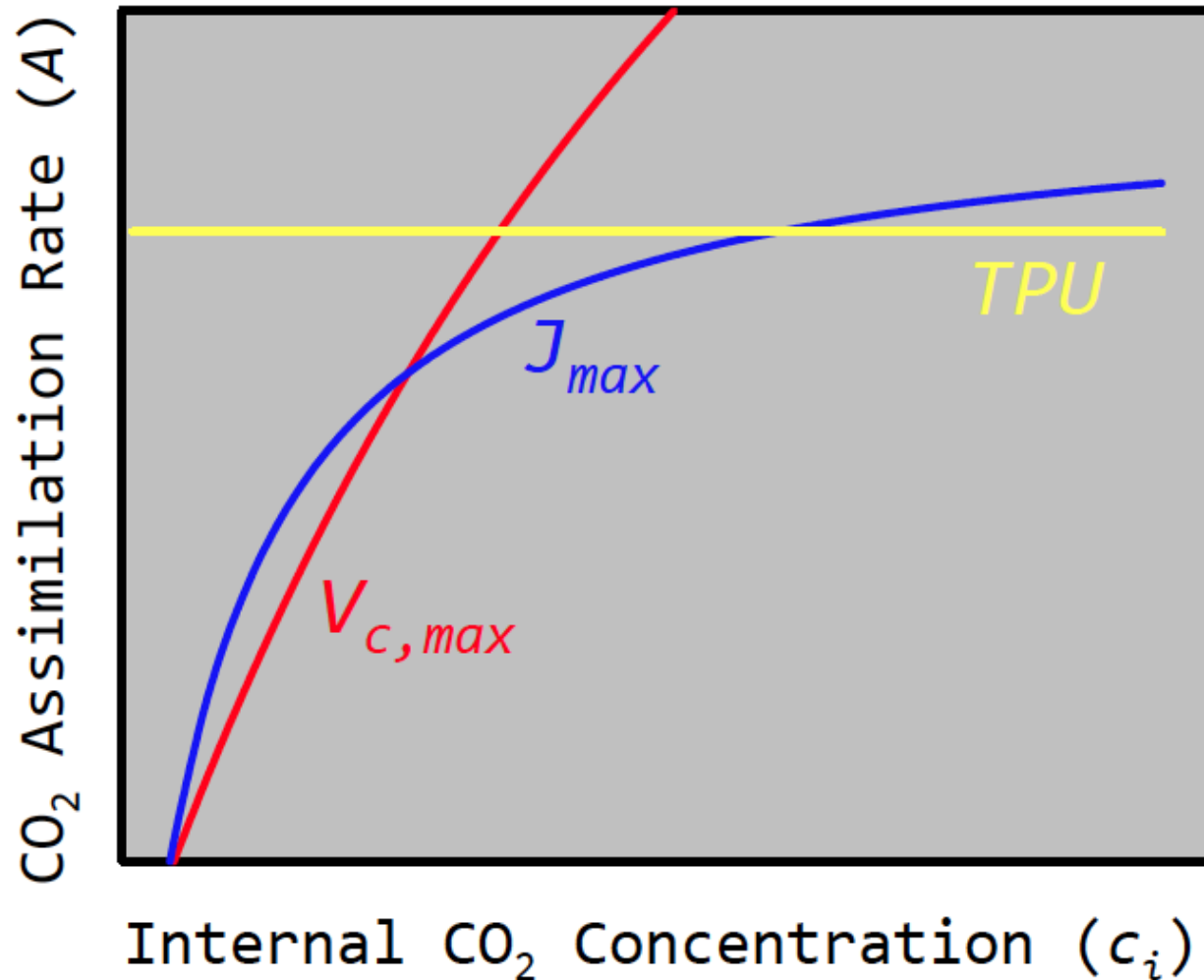
$N_L$  = leaf nitrogen content

$CN_L$  = carbon to nitrogen ratio of leaf

$SLA$  = specific leaf area

# Parameters estimated from A-C<sub>i</sub> curve

8





# CLM GPP downregulation

9

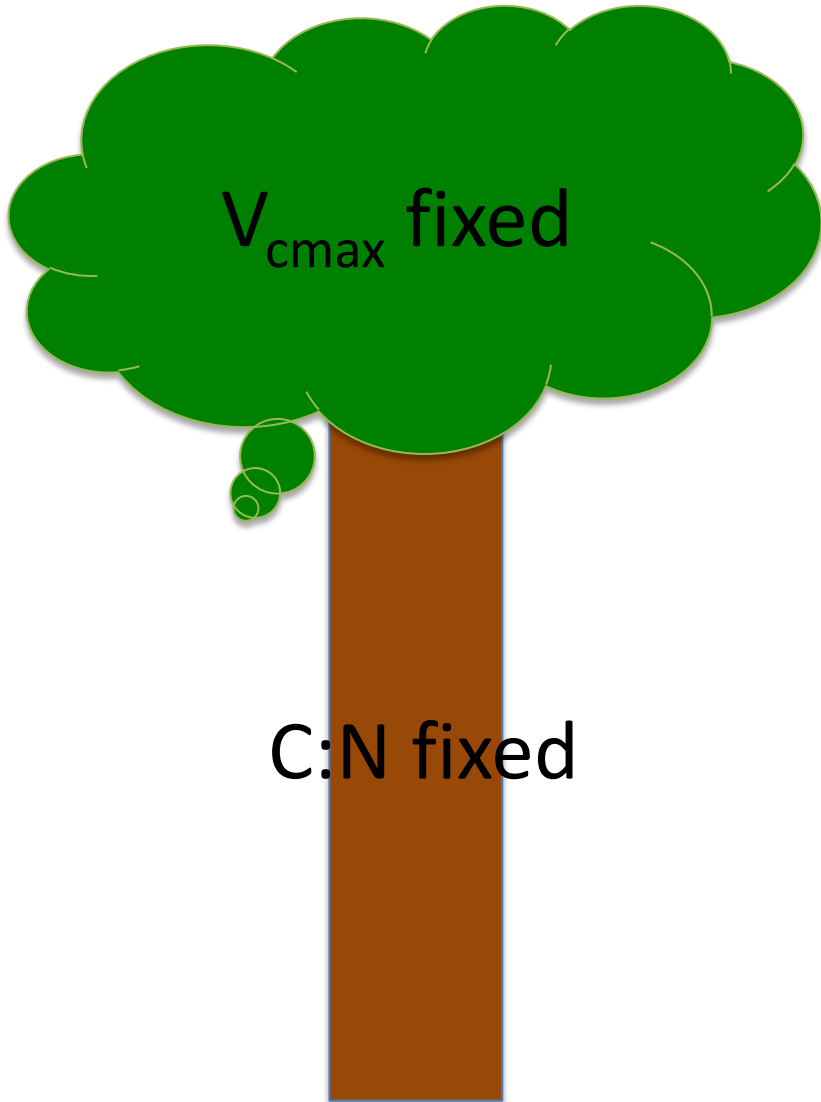
- Downregulation of potential GPP based on nitrogen availability
- Potential  $V_{cmax}$  used to calculate potential GPP
- Problems with potential  $V_{cmax}$ 
  - ▣ Plants do not photosynthesize at potential rates and then downregulate
  - ▣ Inconsistent with field observations of actual  $V_{cmax}$
  - ▣ Lack of understanding on modeling these potential photosynthesis rates in a changing climate

# Modifications to CLM4.5

10

- Removal of GPP downregulation
  - ▣ Prognostic leaf nitrogen
  - ▣ Dynamic  $V_{cmax}$  linked to prognostic leaf nitrogen
- Nitrogen allocation
  - ▣ Plant scale N allocation based on carbon allocation and C:N ratio
  - ▣ Leaf scale functional N allocation for reaction enzymes
- Flexible C:N ratio
- Plant nitrogen uptake
  - ▣ Linked to root traits
    - Root nitrogen uptake efficiency
    - Root biomass
  - ▣ Michaelis-Menten equation

## Default CLM4.5

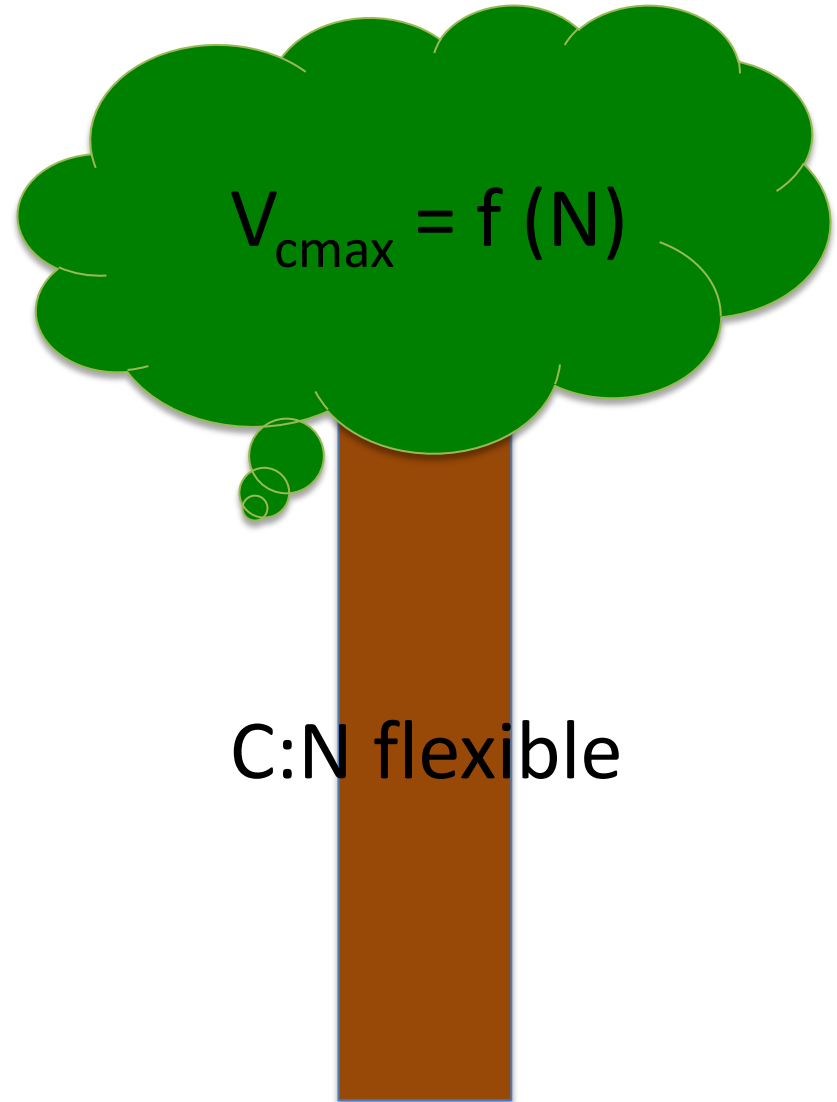


$V_{\text{cmax}}$  fixed

C:N fixed

$$U_N = f(\text{GPP}, \text{C:N}, N_{\text{soil}})$$

## Modified CLM4.5



$V_{\text{cmax}} = f(N)$

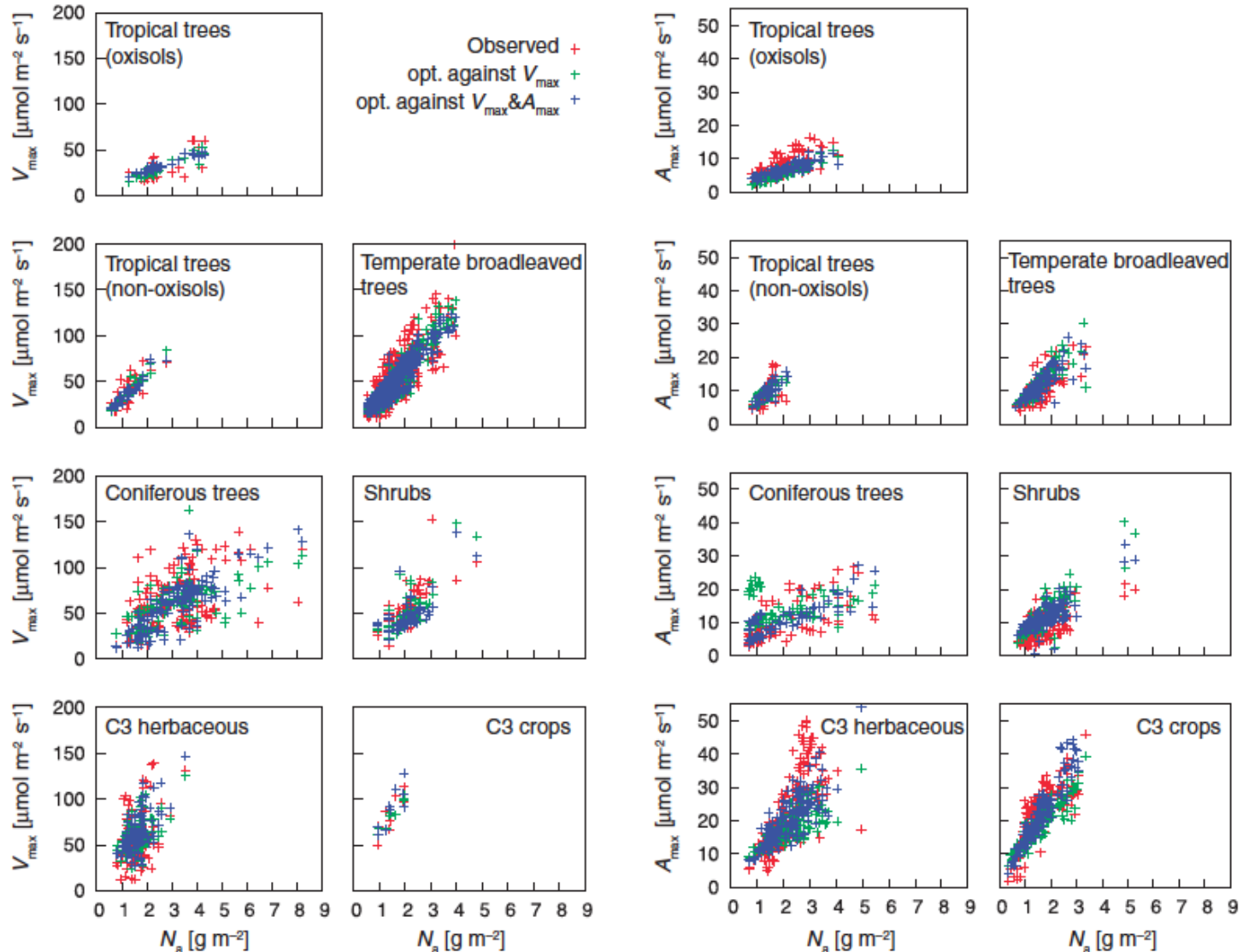
C:N flexible

$$U_N = f(\text{Root}, \text{C:N}, N_{\text{soil}})$$

# 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\*

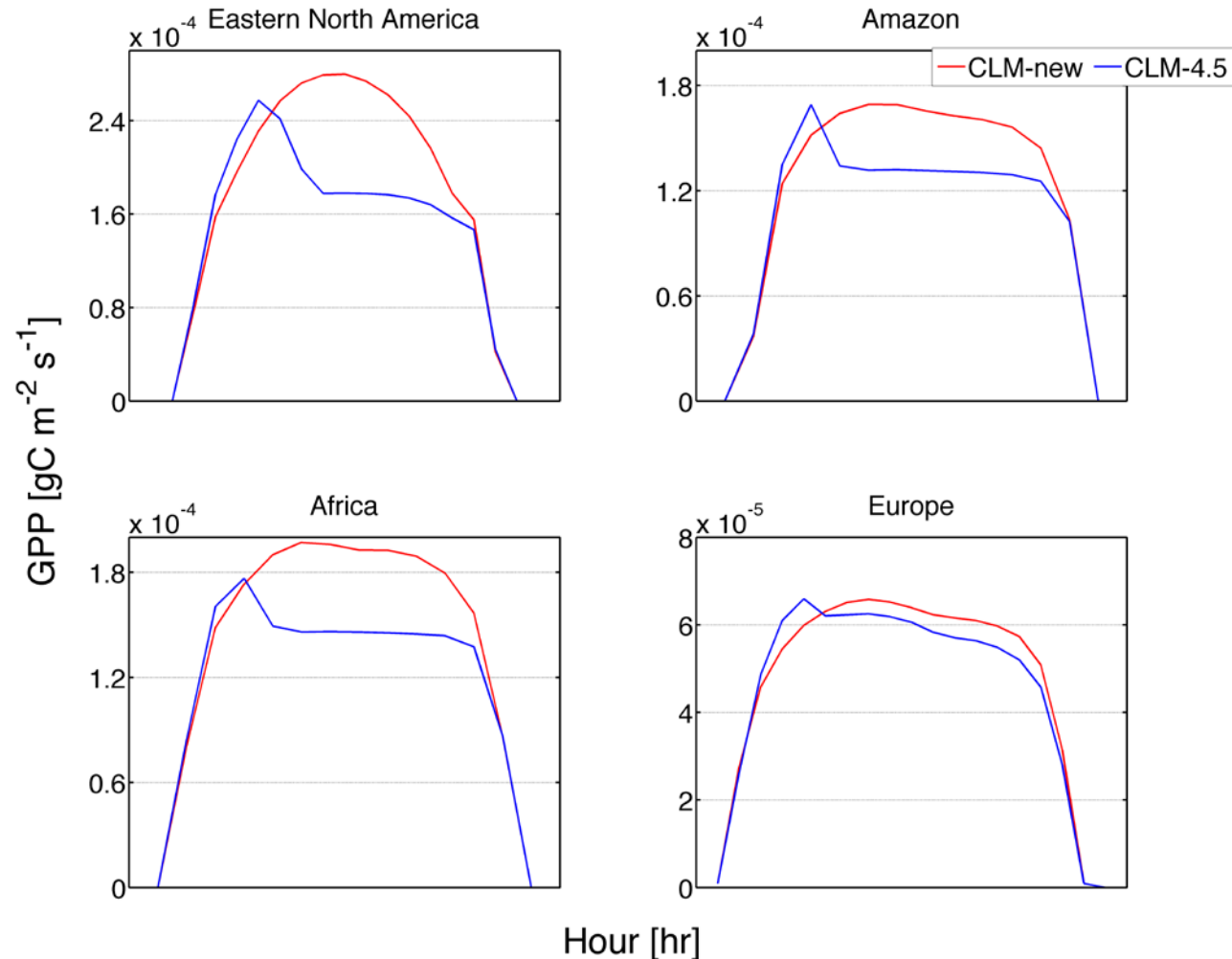
12



# GPP Diurnal Cycle - Point Locations

13

- Dip in daytime GPP diurnal cycle prior to mid-day in CLM-4.5
- GPP dip is a model structure problem caused by GPP downregulation as plants are limited by nitrogen
- CLM-new does not show the GPP dip because the nitrogen storage in leaves buffer the diurnal nitrogen limitation



# Annual GPP Bias Comparison

14

Bias = model – reference

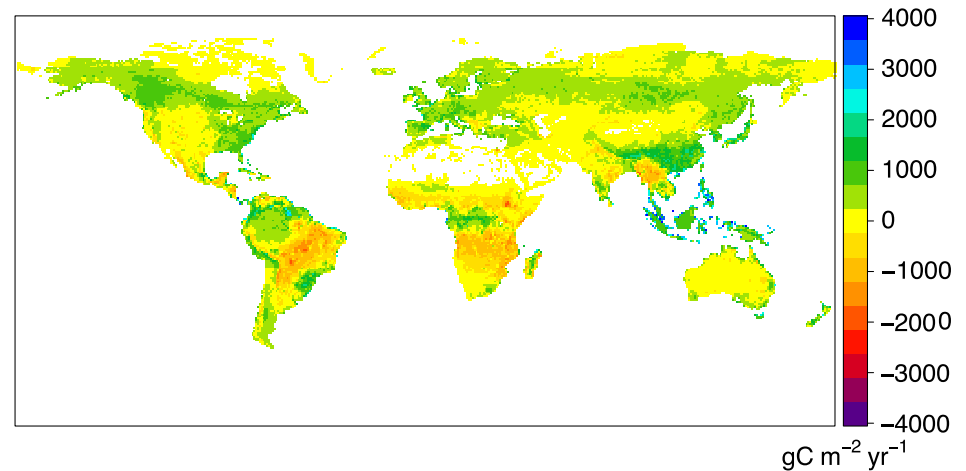
CLM-4.5 over-predicts GPP at high latitudes, especially in North America and Europe.

CLM-new has lower bias in higher latitudes compared to CLM-4.5.

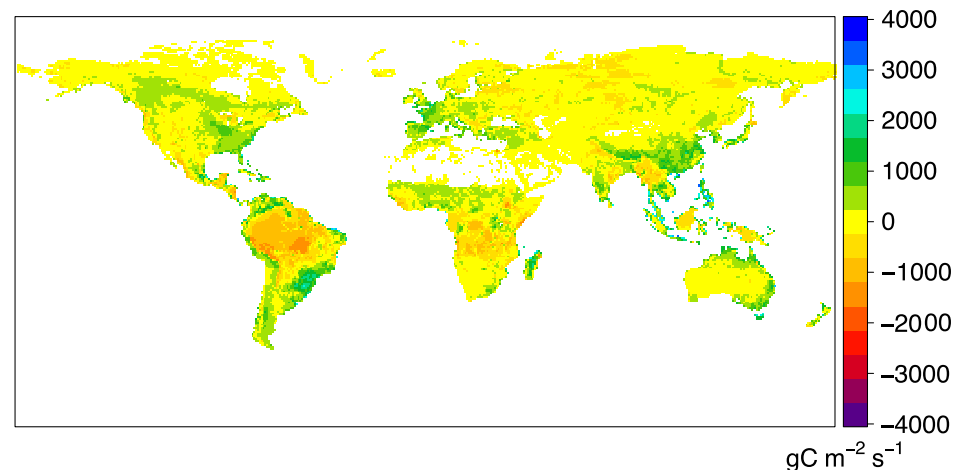
CLM-4.5 over-predicts GPP in Amazon region whereas CLM-new slightly under-predicts GPP.

CLM-4.5 has a global mean bias of  $251 \text{ gC m}^{-2} \text{ yr}^{-1}$  and CLM-new has a global mean bias of  $87 \text{ gC m}^{-2} \text{ yr}^{-1}$  (i.e. around 65% reduction in bias).

CLM-4.5 Annual GPP Bias



CLM-new Annual GPP Bias



# Latitudinal GPP Variation

15

## Tropics:

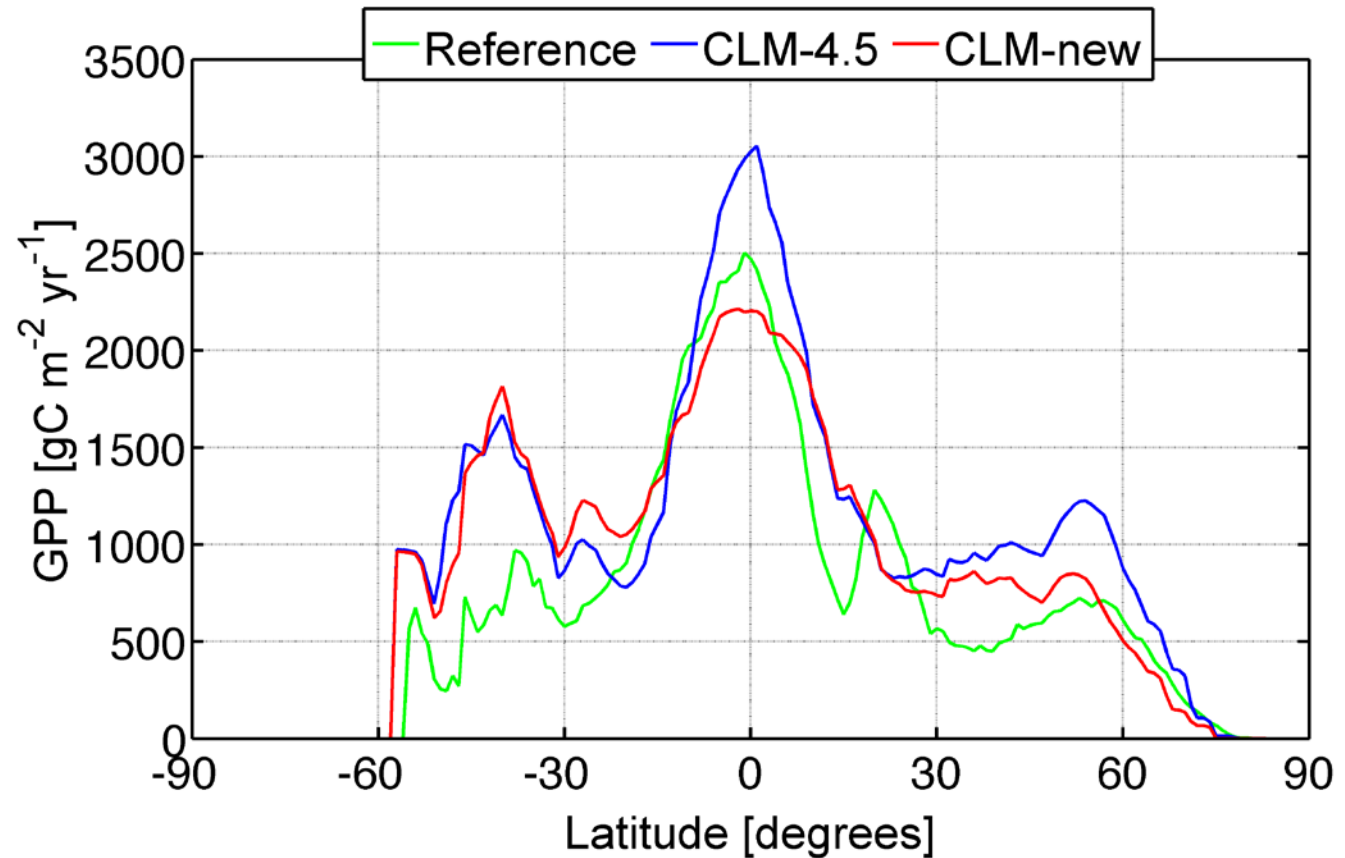
- CLM-new is closer to reference than CLM-4.5
- Sign of bias flipped for CLM-new and CLM-4.5

## Southern Hemisphere (60S to 30S):

- CLM-new and CLM-4.5 are similar

## Northern Hemisphere (30N to 60N):

- CLM-new is closer to reference than CLM-4.5

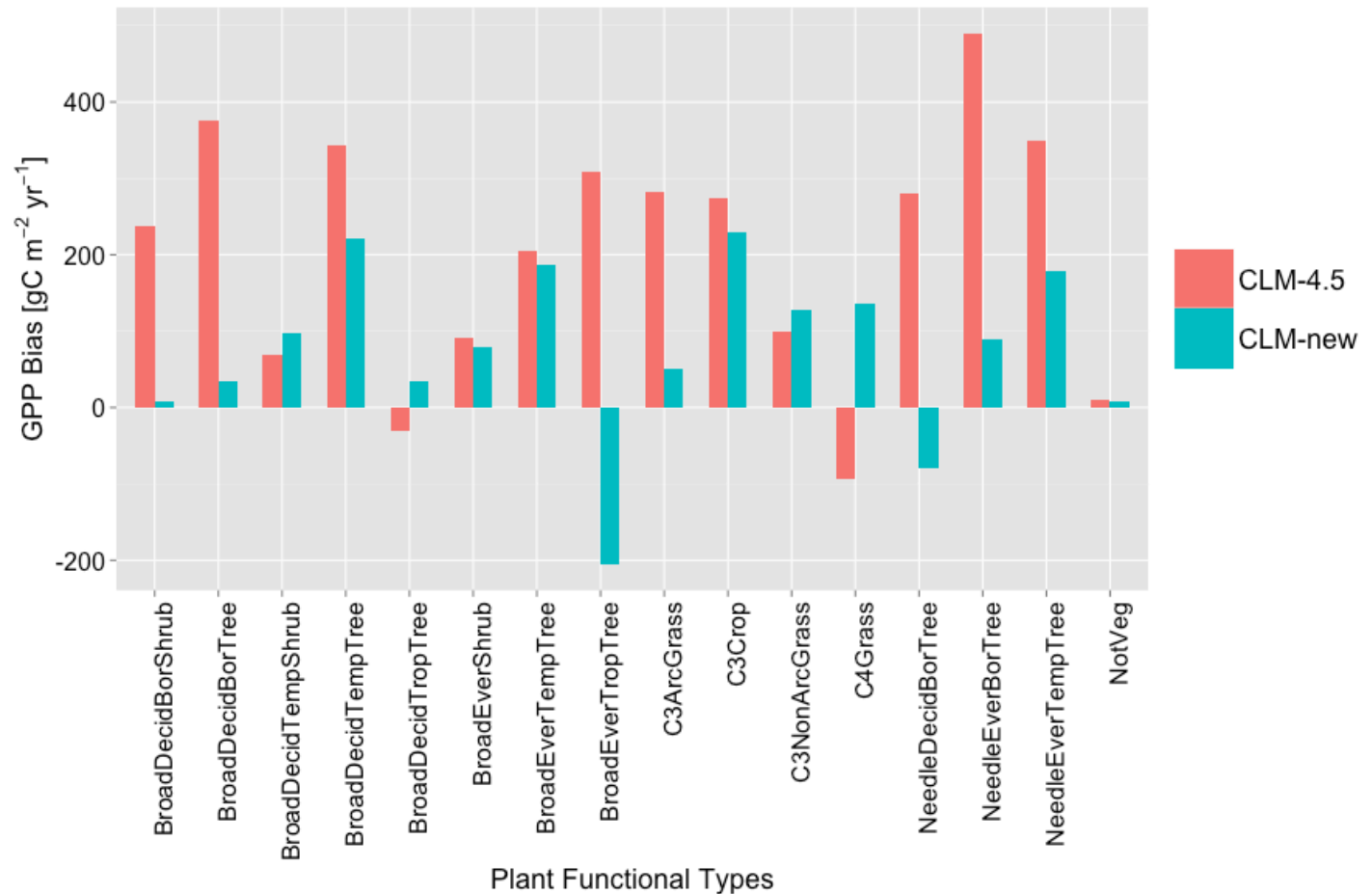


# GPP Bias by PFTs

16

CLM-new has less GPP bias compared to CLM-4.5 for most PFTs

CLM-4.5 GPP bias is more than 200  $\text{gC m}^{-2} \text{yr}^{-1}$  for most PFTs

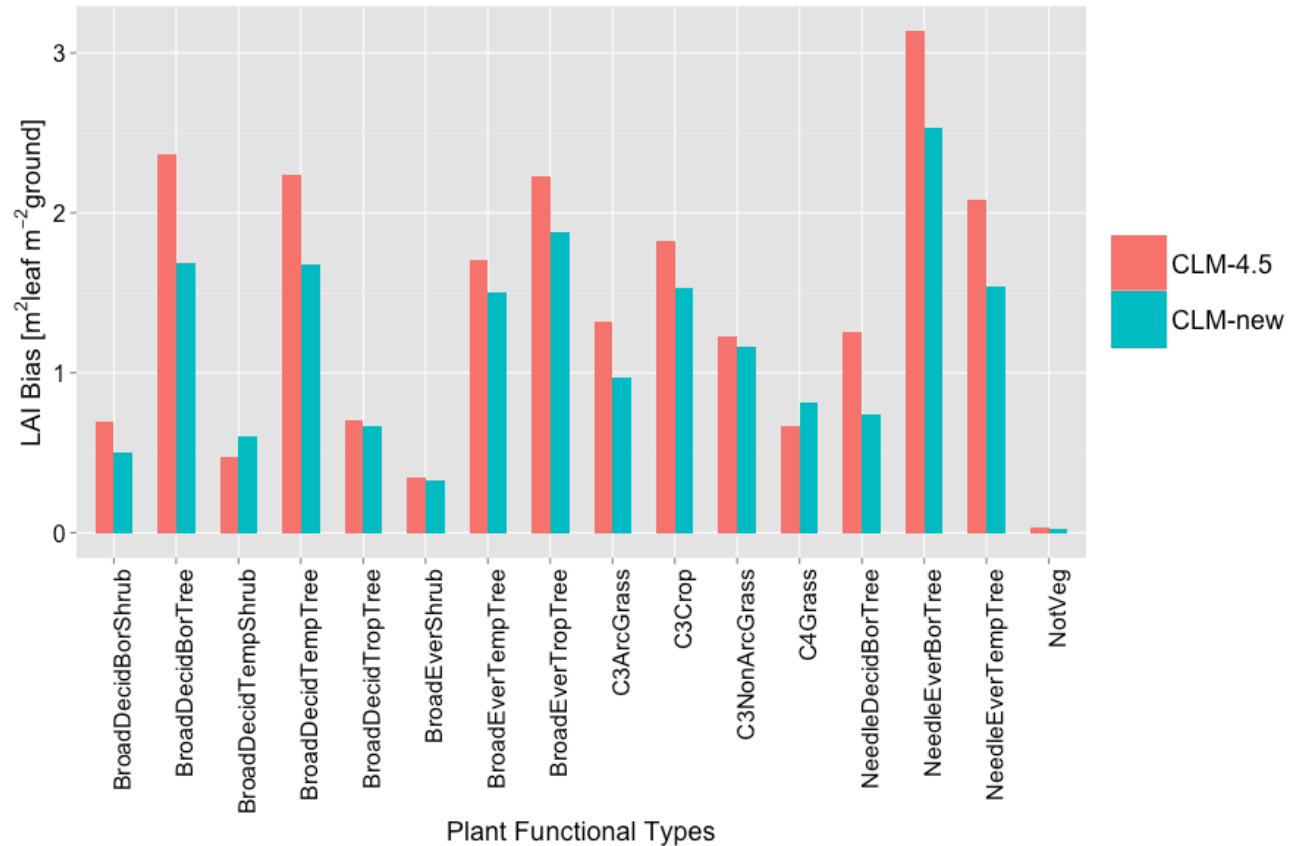




# LAI Bias by PFTs

17

- Prediction of LAI in CLM depends on GPP, specific leaf area and leaf longevity
- Across all PFTs, CLM-4.5 has mean LAI bias of 1.4 and CLM-new has mean LAI bias of 1.1
- Working on incorporating specific leaf area and leaf longevity data from the literature and TRY database



# Summary

18

- **Current Model Developments**
  - ▣ Integration of different plant N cycle mechanisms in the Community Land Model
  - ▣ Leaf physiology: Model structure uses actual photosynthetic parameters (as a function of leaf nitrogen) rather than potential rates
  - ▣ Root physiology: Plant nitrogen uptake based on root physiology using Michaelis-Menten equation
- **Future Model Developments**
  - ▣ Dynamic C and N allocation based on resource and allometric constraints
  - ▣ Bayesian parameter optimization
  - ▣ Belowground N competition between plants and microbes

# Acknowledgements

19

- This research is supported by The Next-Generation Ecosystem Experiments (NGEE Arctic) project of Office of Biological and Environmental Research in the DOE Office of Science.
- Additional computing resources is supported by the Director, Office of Science, Office of Advanced Scientific Computing Research of the U.S. Department of Energy.

