



# CLM5!

## David Lawrence and the Land Model Working Group

What is new or improved in CLM5?

How did we ever get to the stage of a finalized model? \*

Is the model any good?

What's next: CTSM / CLM6?

\* Finalized should be in “ ”s

# What's New for CLM5



**A LOT!**

More than 50 scientists and software engineers from 15 different institutions involved in development of CLM5

# What's New for CLM5



**Rosie Fisher**

**Keith Oleson**

**Sean Swenson**

Will Wieder

Charlie Koven

Danica Lombardozi

Ben Sanderson

Erik Kluzek

Bill Sacks

Peter Lawrence

Yaqiong Lu

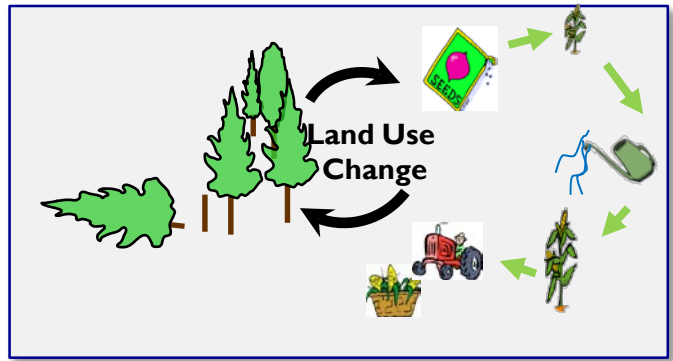
Fang Li

Daniel Kennedy

# What's New for CLM5

- Hydrology:** dry surface layer, variable soil depth with deeper (8.5m) max depth, revised GW and canopy interception, adaptive time stepping, increased soil layer resolution
- Snow:** canopy snow, wind effects, firn model (12 layers), glacier MEC, fresh snow dens.
- Rivers:** MOSART(hillslope → tributary → main channel)
- Nitrogen:** flexible leaf C:N ratio, leaf N optimization, C cost for N (FUN)
- Vegetation:** plant hydraulics and hydraulic redistrib, deep roots tropical trees, Medlyn photosynth, **Ecosystem Demography (FATES), prognostic roots, ozone damage**
- Fire:** updates, trace gas and aerosol emissions
- Crops:** global crop model with transient irrigation and fertilization (9 crop types), grain product pool, revised irrigation scheme
- Carbon:** revisions to carbon allocation and soil carbon decomposition
- Land cover/use:** dynamic landunits, updated PFT-distribution, wood harvest by mass, **shifting cultivation**
- Isotopes:** carbon and **water** isotope enabled

**CLM5 default configuration**  
**CLM5 optional feature**



## 2<sup>nd</sup> CLM Tutorial **September 12-16, 2016**

- **Lectures** on underlying model physics, hydrology, biogeochemistry, ecology, etc
- **Practical sessions** about how to run, modify, and analyze CLM simulations
- Presented science and software of **CLM5 / CESM2**
- More than **85** applicants, 46 accepted plus 8-10 auditors
- All tutorial material including lectures and practical sessions  
<http://www.cesm.ucar.edu/events/tutorials/2016-clm/>



# CLM versions and configurations

**CLM2** May 2002 (CCSM2)

**CLM3** June 2004 (CCSM3)

**CLM3.5** June 2007 (CCSM Distinguished Achievement Award to LMWVG)

**CLM4** June 2010 (CCSM4 and CESM1; CMIP5)

- carbon-nitrogen cycling
- prognostic vegetation phenology, LAI, and height
- transient land cover change
- urban model
- updated hydrology including groundwater
- updated snow incl. dust and black carbon dep.
- organic soil + deep ground column (permafrost)



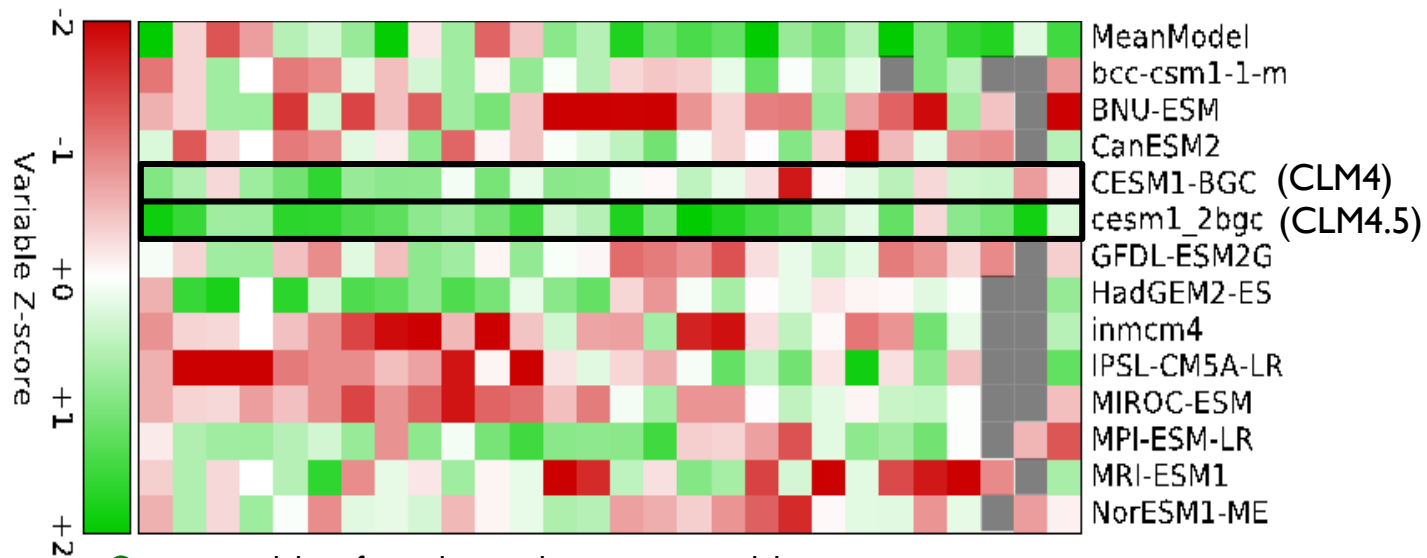
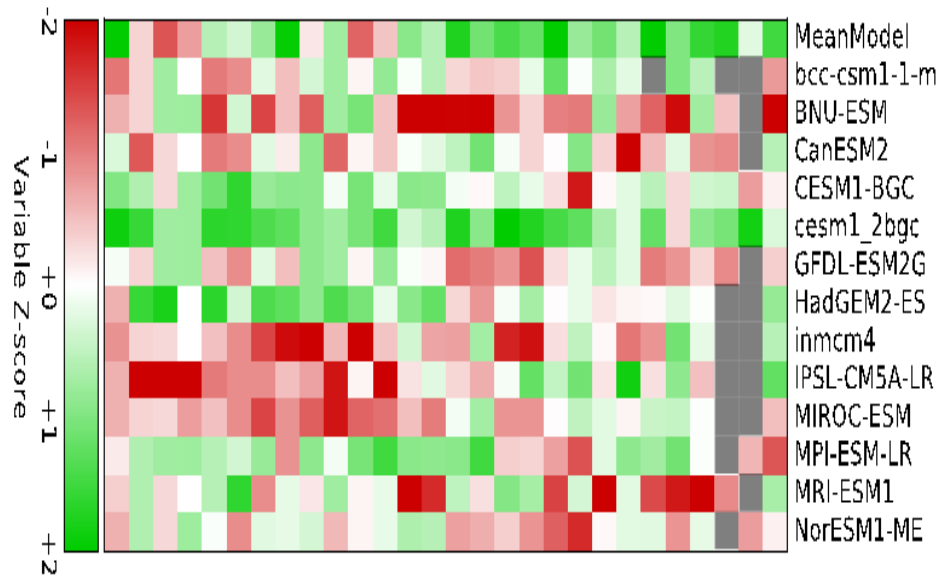
# CLM versions and configurations

## **CLM4.5** June 2013 (CESM1.2)

- vertically-resolved soil BGC and revised nitrification-denitrification, N-fixation
- cold region hydrology updates incl perched water table, VIC option
- snow cover fraction updates
- revised canopy radiation scheme
- co-limitation and temperature acclimation on photosynthesis
- updated lake model
- prognostic wetlands and flooding (optional)
- updated fire model with natural and anthropogenic triggers and suppression
- BVOC updated to MEGAN2.1
- CH<sub>4</sub> emissions

# International LAnd Model Benchmarking (ILAMB) project

scores for RMSE, interannual variability, pattern correlation, variable-to-variable comparisons, +



Green: model performs better than average model

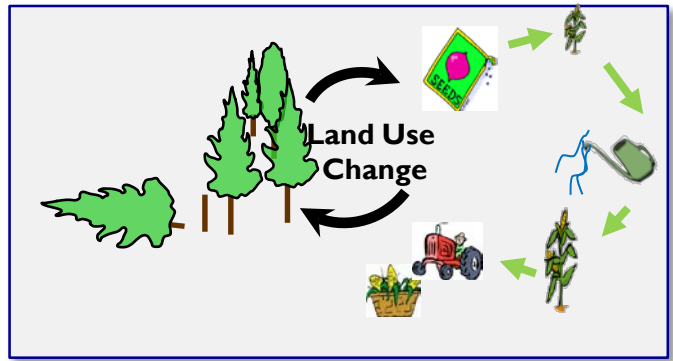
Red: model performs worse than average model



# What's New for CLM5

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**CLM5 default configuration**  
**CLM5 optional feature**



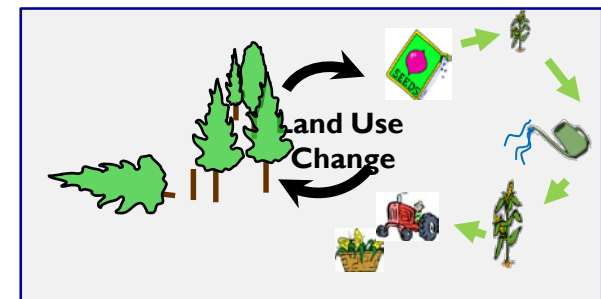
# How did we get here?

- Hydrology: dry surf. layer, var. soil depth w/ deeper (8.5m) max soil, revised GW and canopy interc
- Snow: canopy snow updates, wind effects, firn model (12 layers), glacier MEC, fresh snow dens.
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**Implemented CLM5 default configuration**

**CLM5 optional feature**

**Not yet implemented**



How did we get here?





# How did we get here?

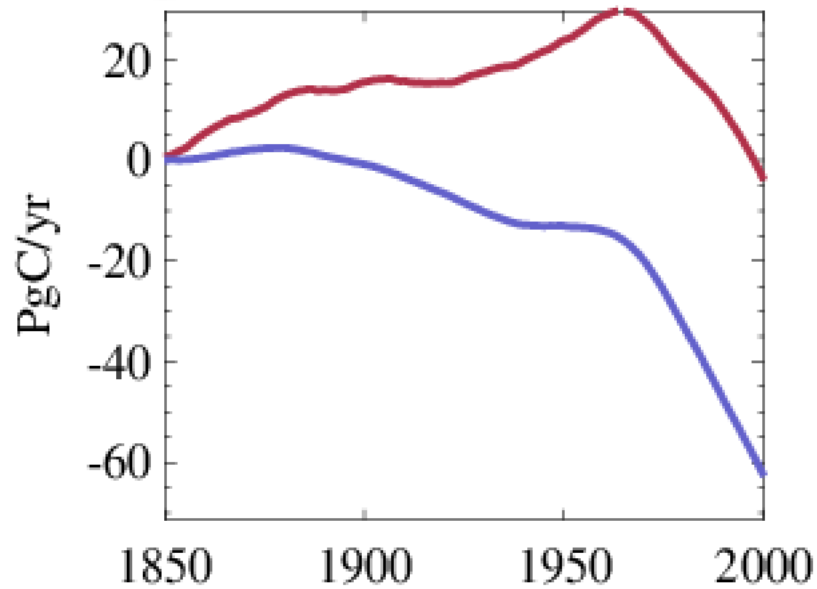
July to December, 2016

- Integrating new features
- Fixing problems
- Dealing with edge cases
- Assembling datasets
- CLM Tutorial
- Multiple false starts, trials, and tribulations with optimized parameter calibration

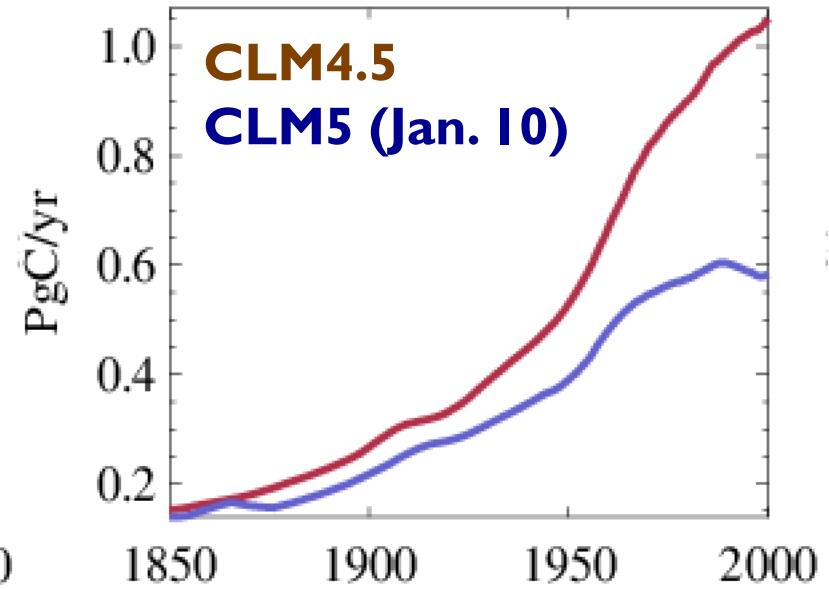
# Problem with wood harvest



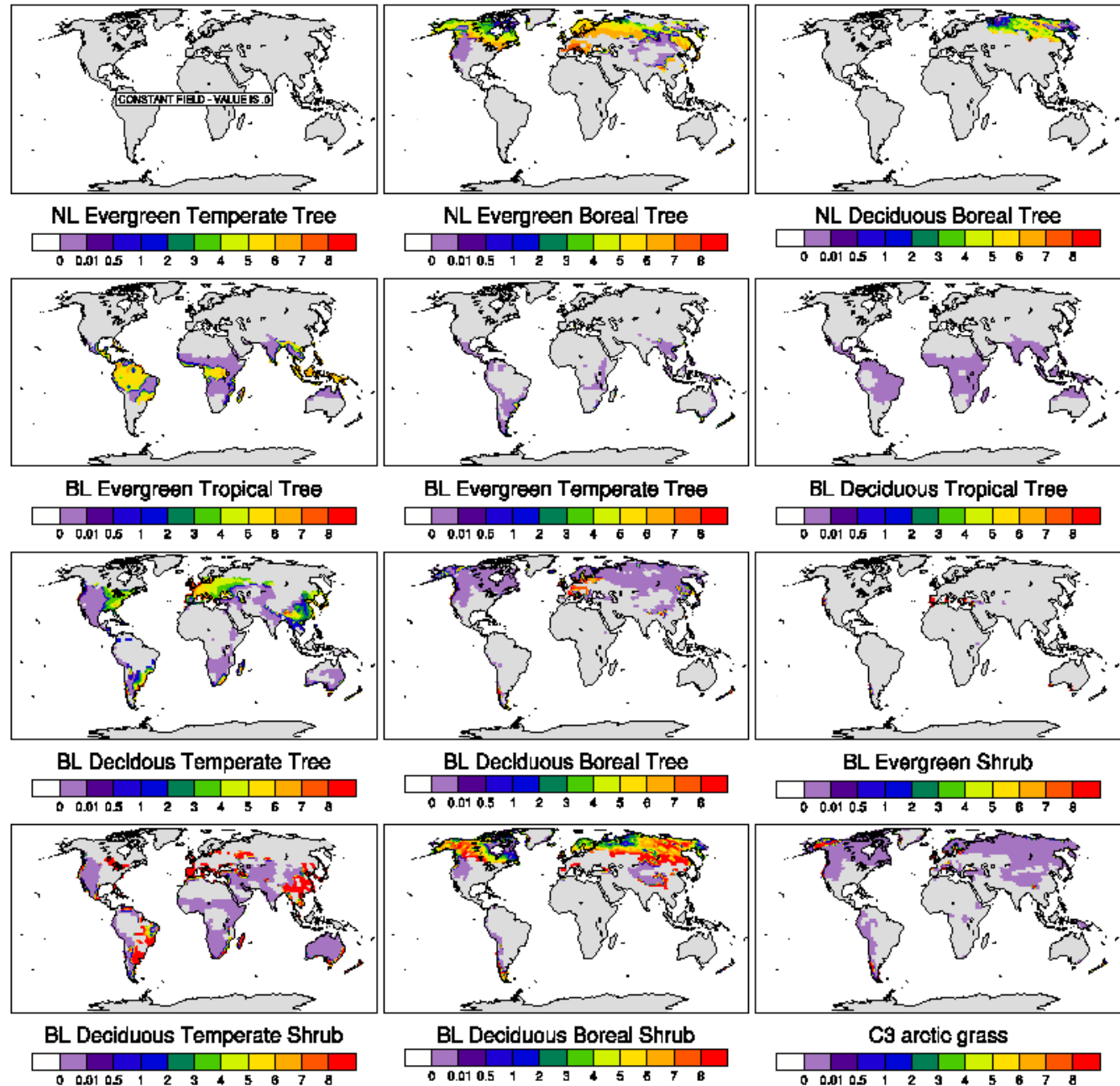
global Accumulated NBP



global WOOD\_HARVESTC



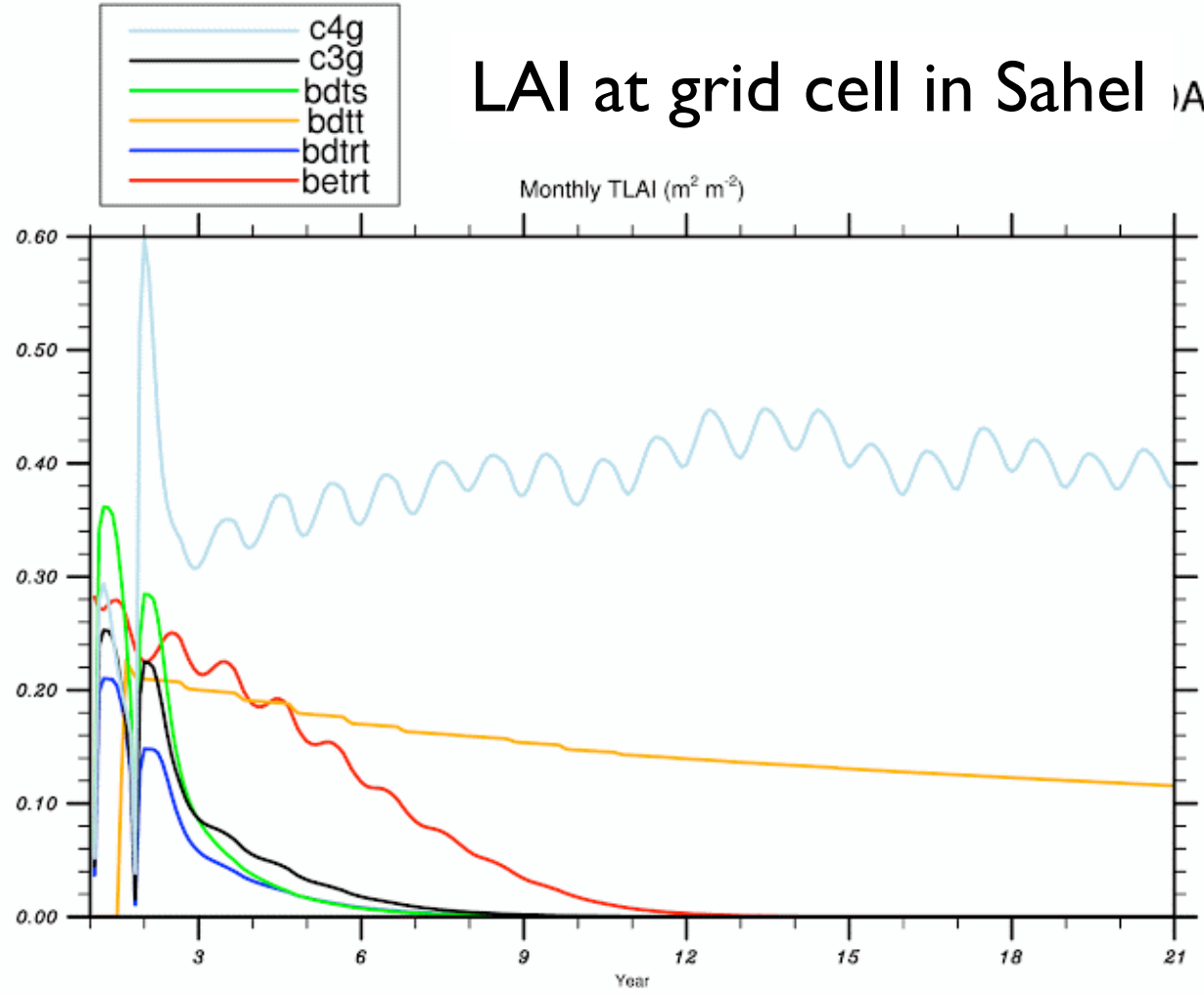
CLM  
Annual Max  
LAI  
(from some run  
circa Jan 10)



CLM Safety Tip:  
Once a PFT in a  
grid cell dies, it  
**stays** dead for the  
remainder of  
simulation

# Why are plants dying?

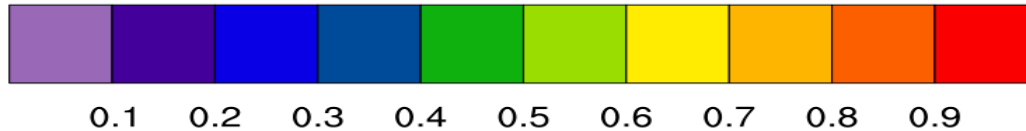
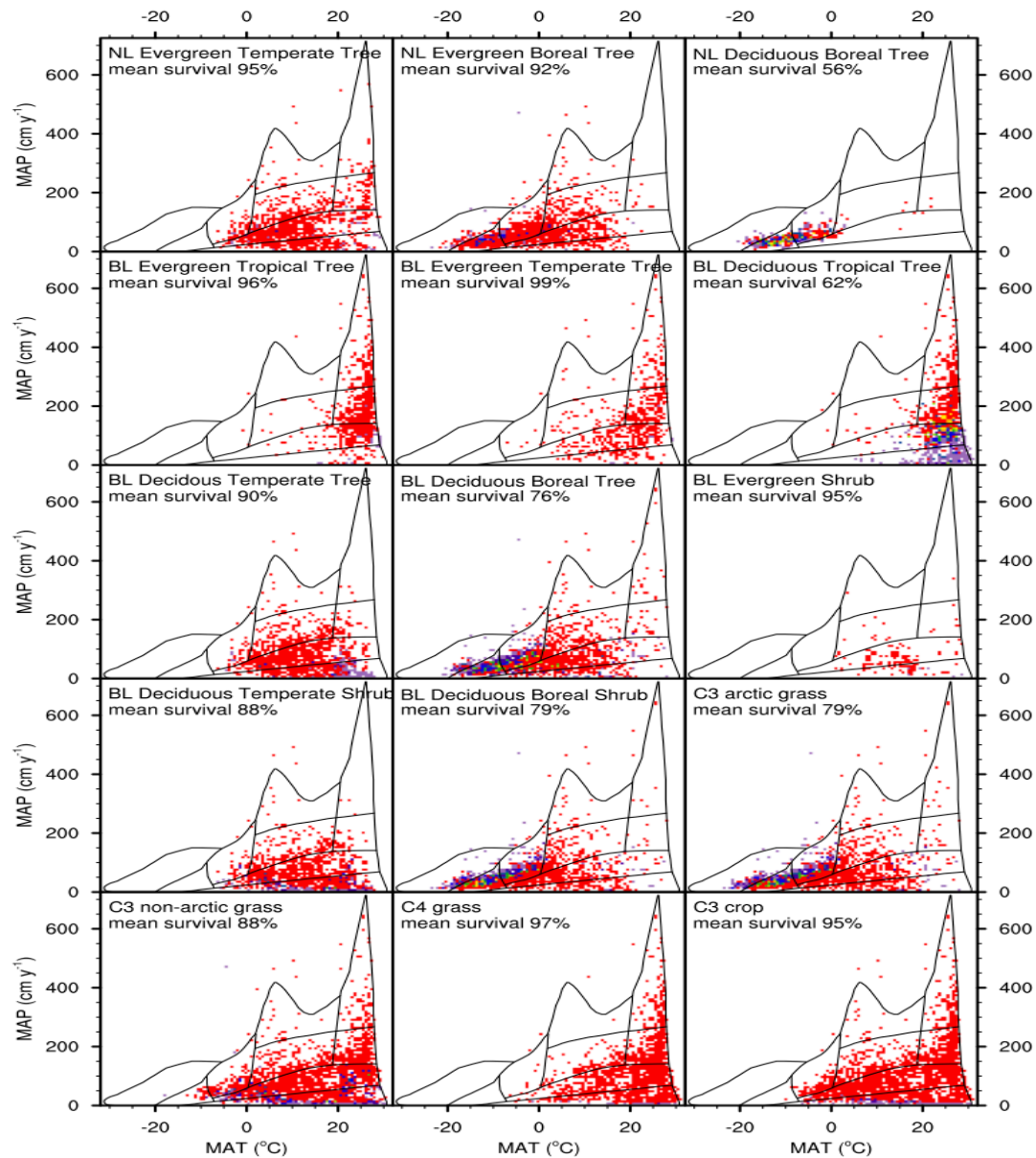
## LAI at grid cell in Sahel



→ Reworked initialization strategy, with more initial C/N in veg and soil

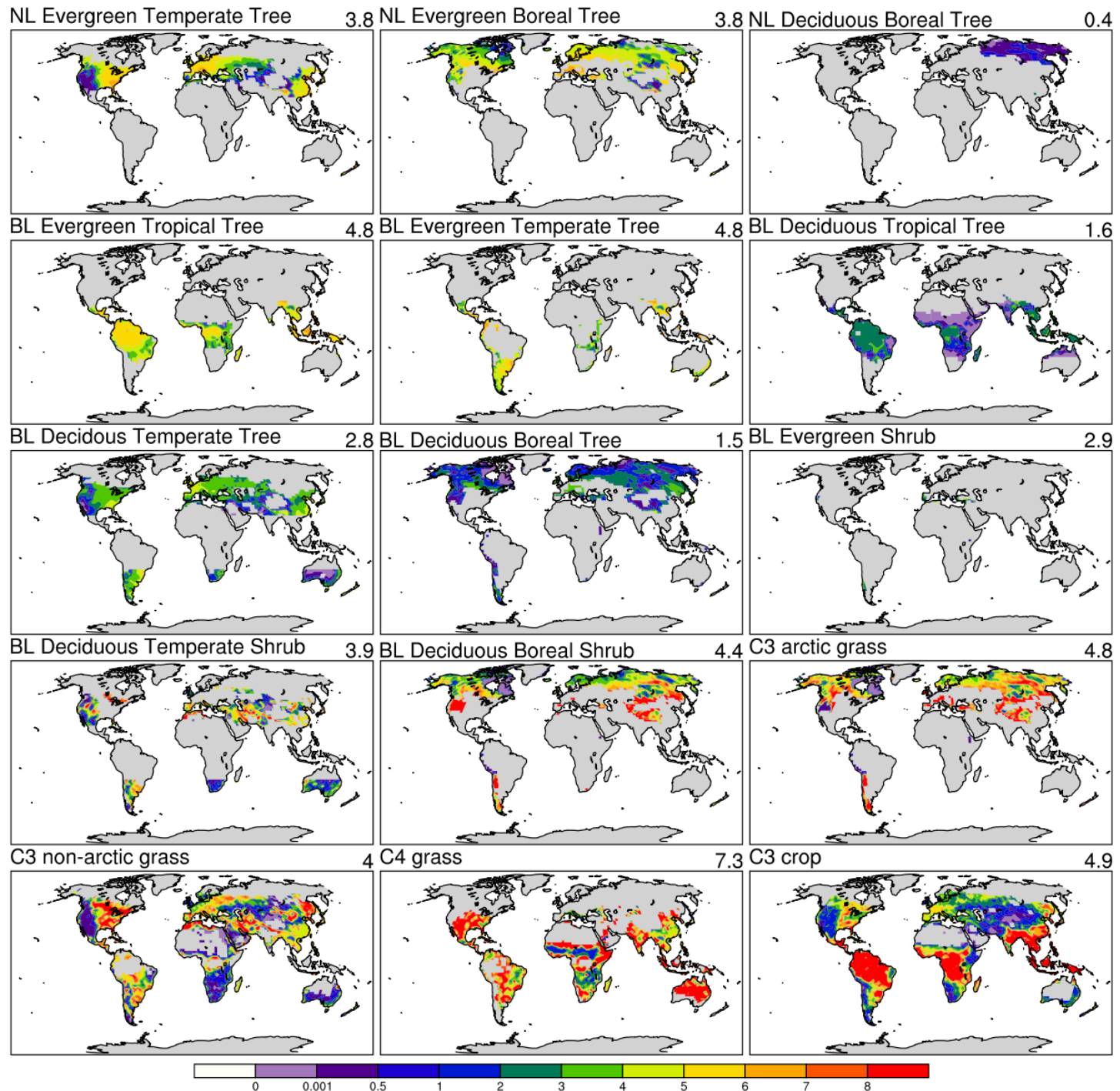
Helped, but majority of issue seems to be with parameters

# Survival Probability

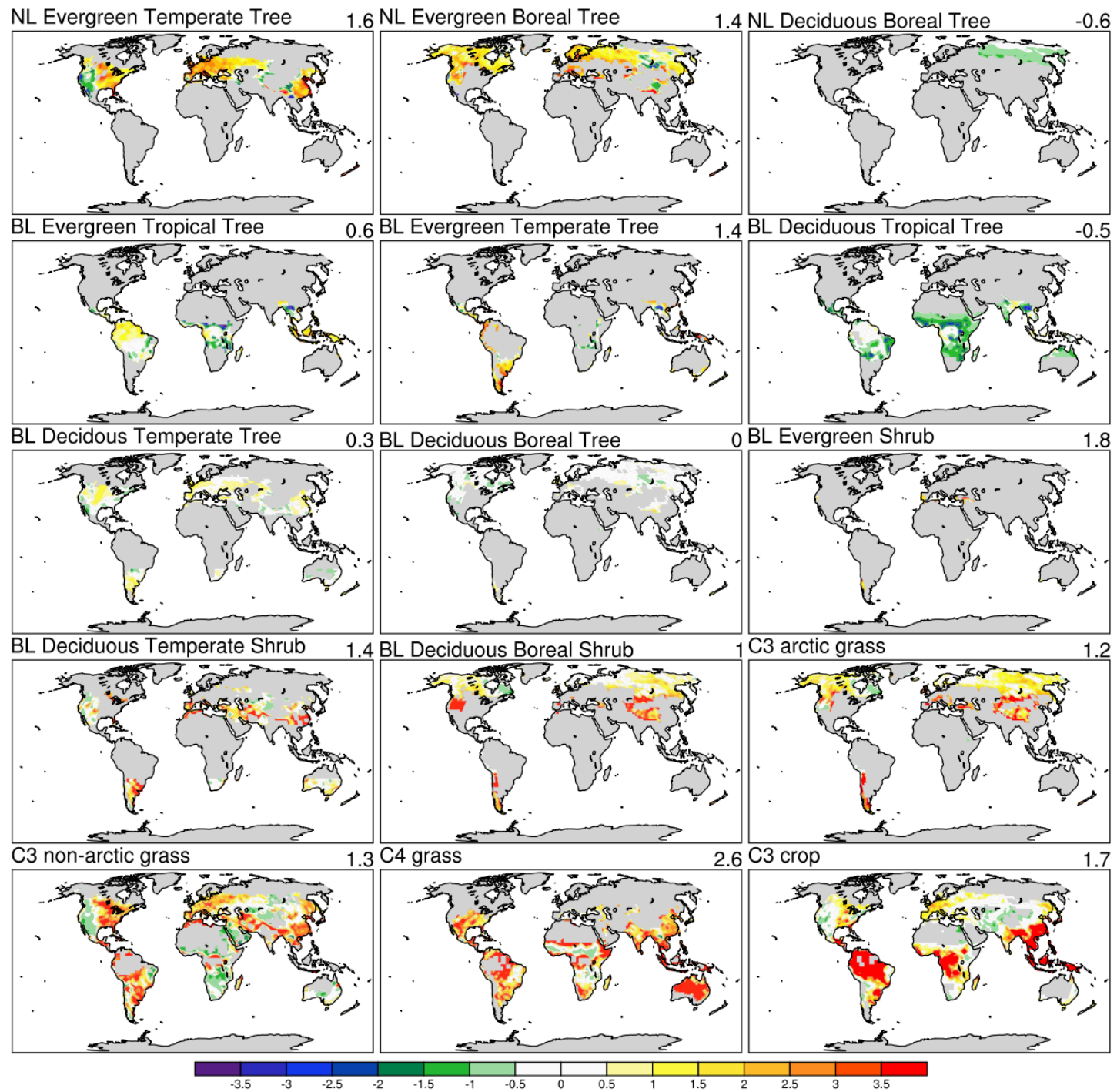




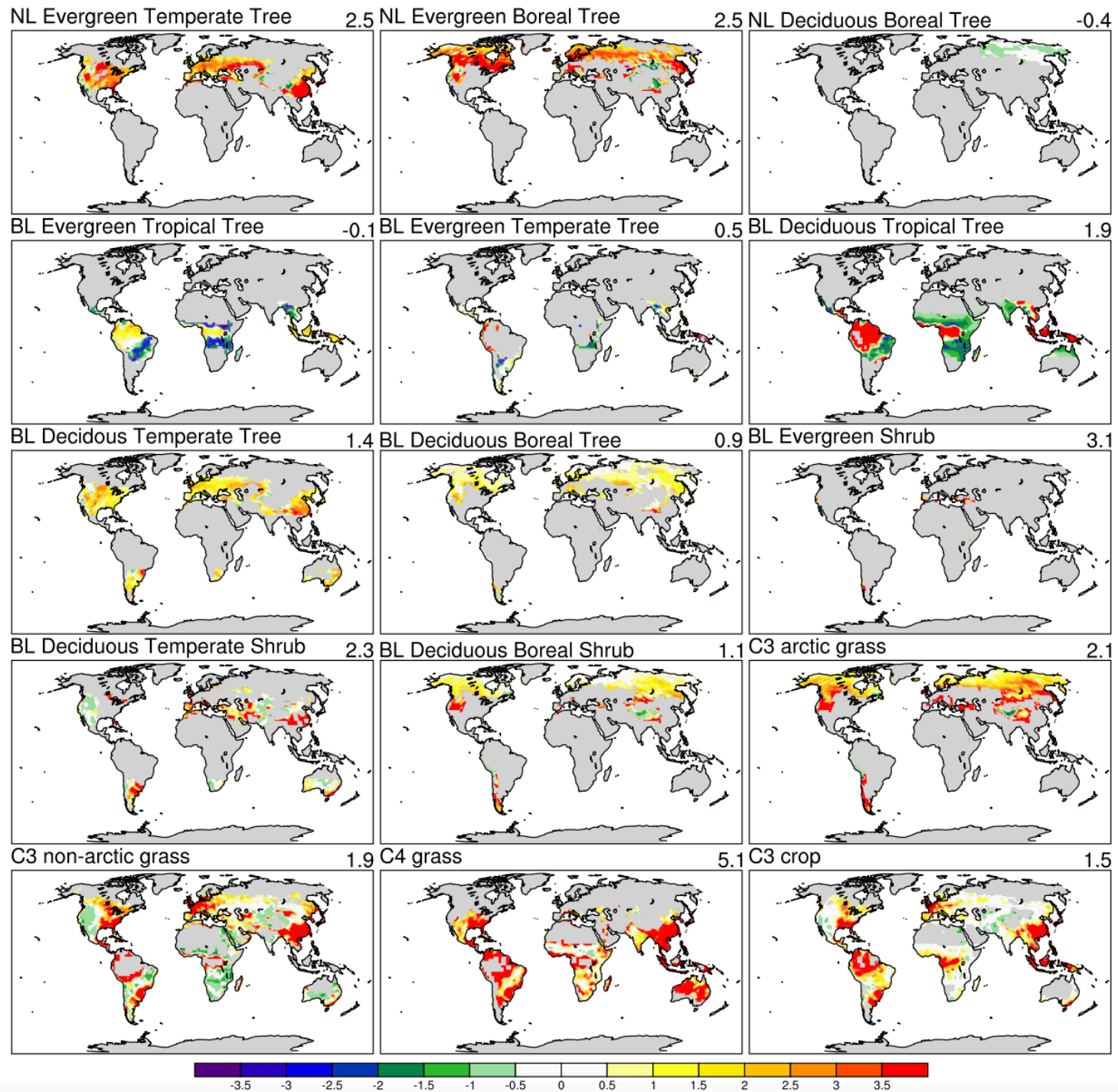
# CLM5 Annual max LAI



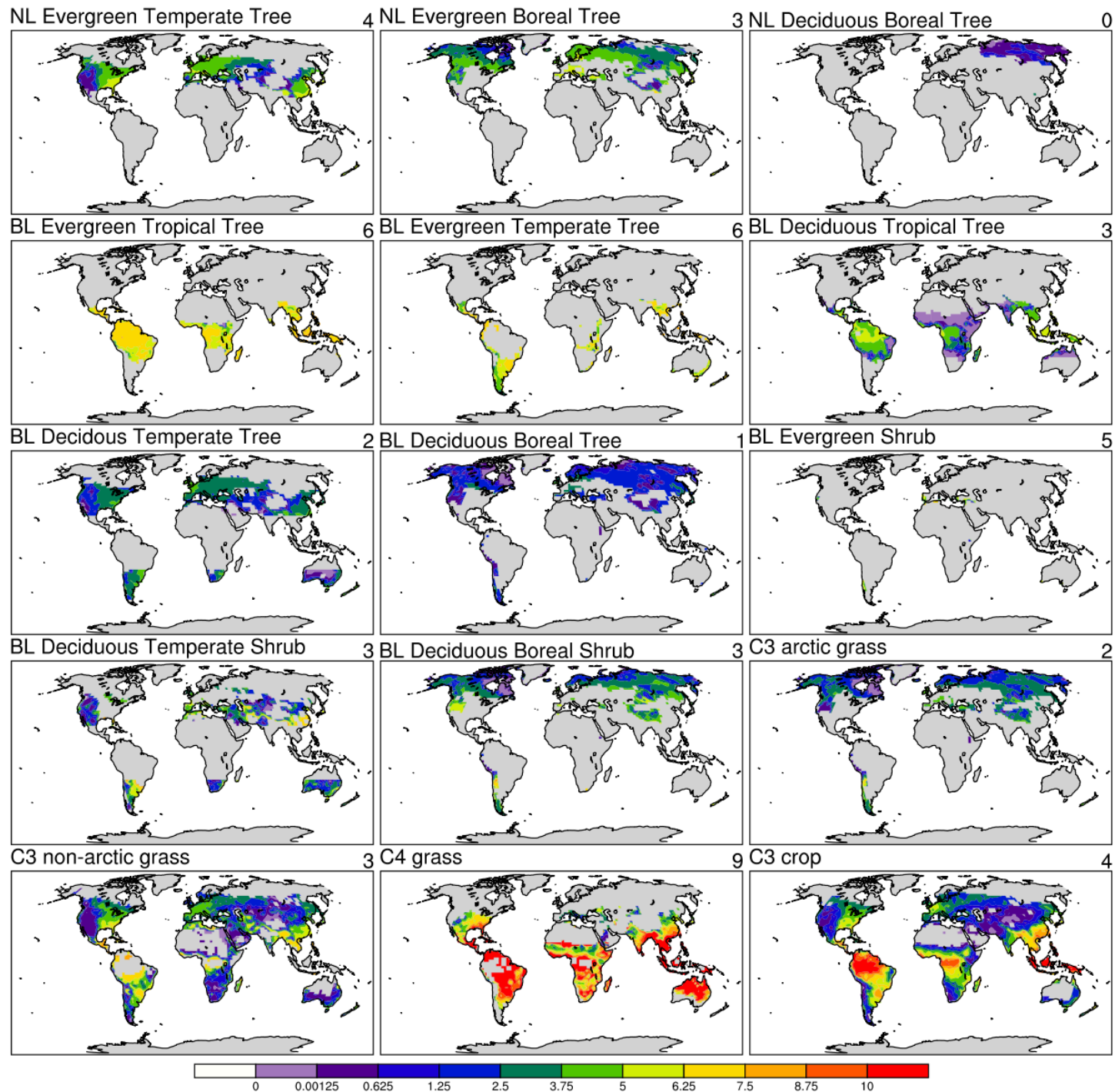
# CLM5 bias in annual mean LAI



# CLM4.5 bias in annual mean LAI



# CLM5 Daily mean GPP





# Is CLM5 in improvement over CLM4.5?

- Mechanistically and capability-wise, definitely yes
- Model skill against observations?
  - TBD, some fields like GPP, LH, LAI, river discharge, albedo, fire either not degraded or improved
  - Carbon flux interannual variability lower
- Some more details in talks today and tomorrow
- Will take some time to be able to fully characterize and understand the model



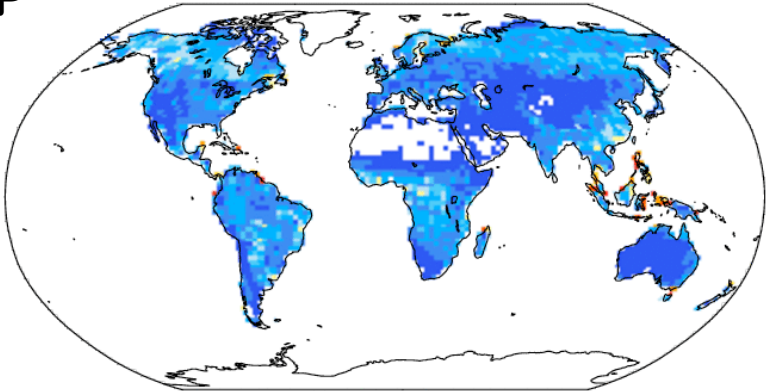
# Improvements



RMSE(FPSN) CLM5SP\_fn12r225

0.87

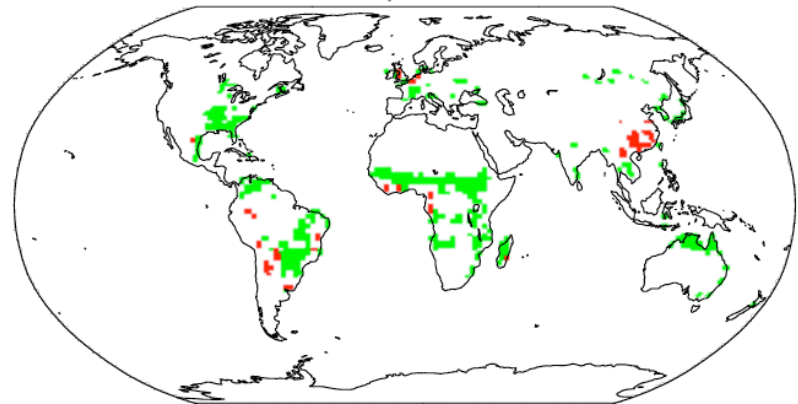
**CLM5SP**



Model relative to Obs

green: CLM5SP\_fn12r225

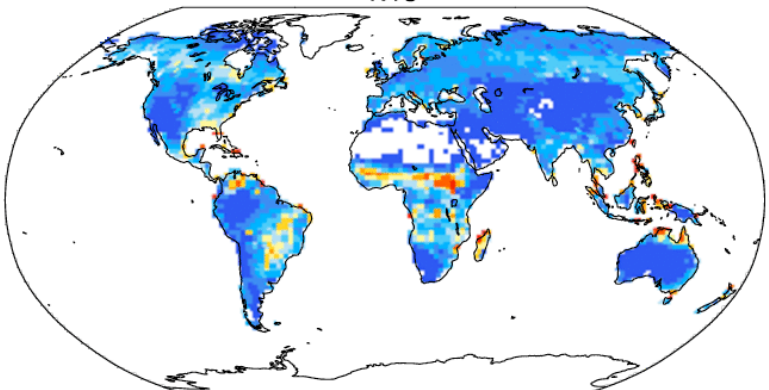
red: clm45sp



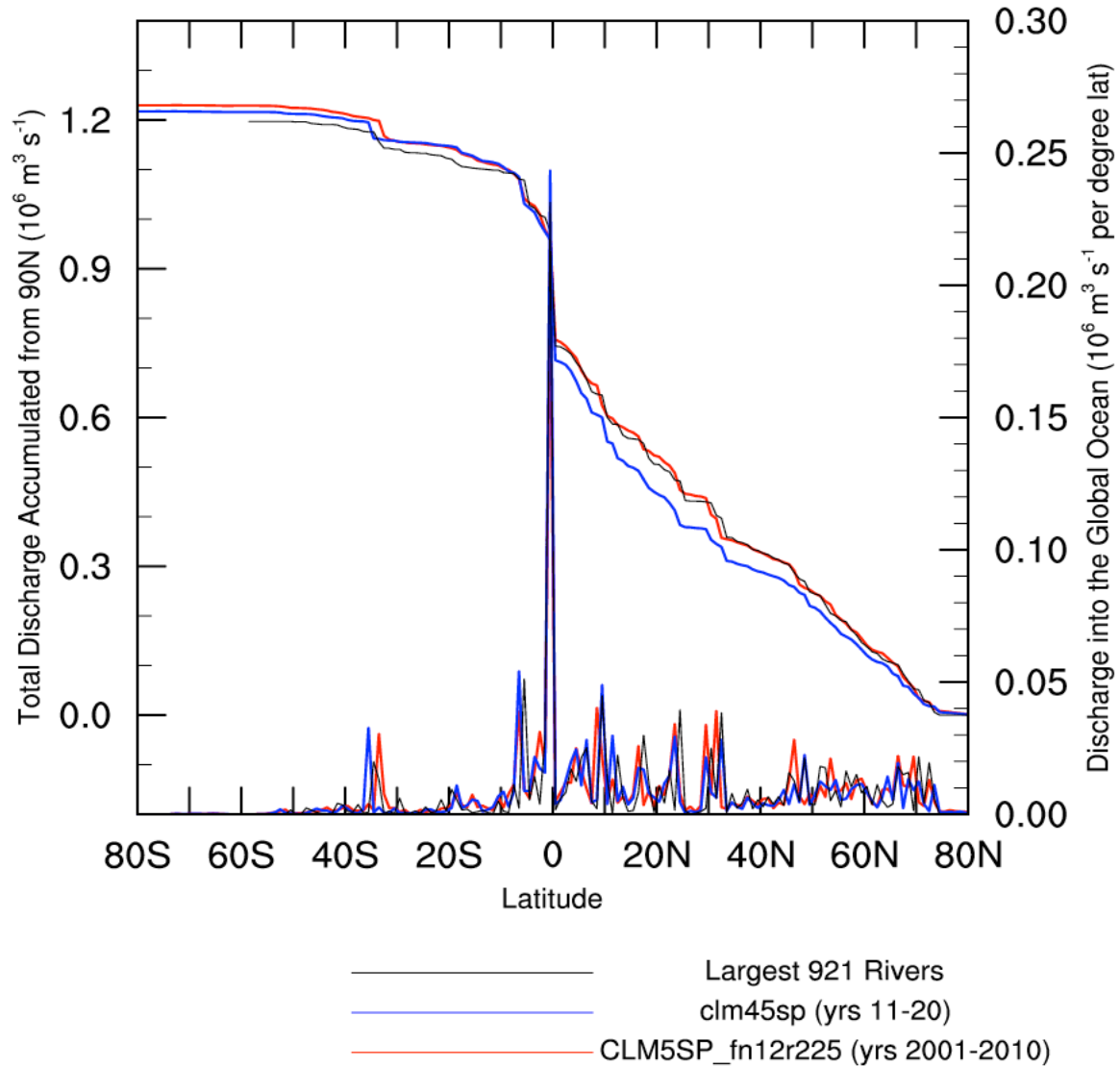
RMSE(FPSN) clm45sp (control)

1.13

**CLM4.5SP**



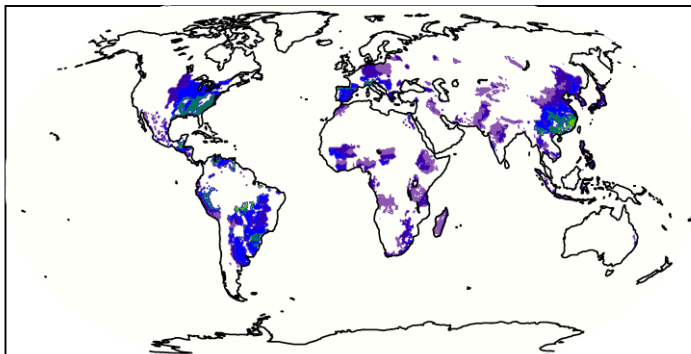
# Annual river discharge



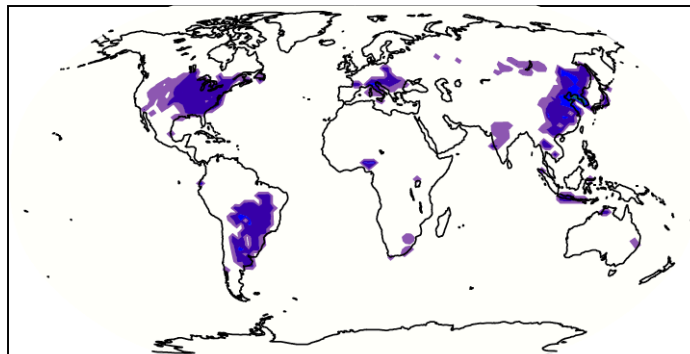


# Crop yields

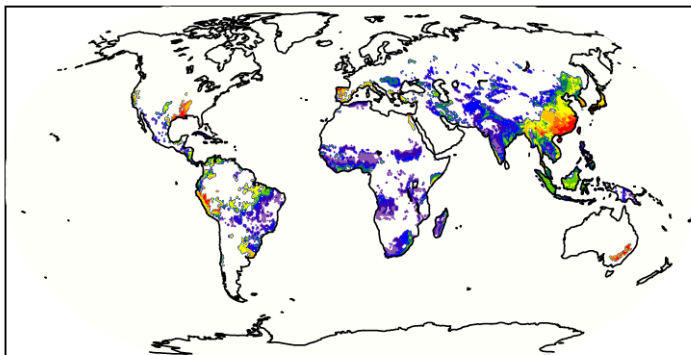
FAO Soy



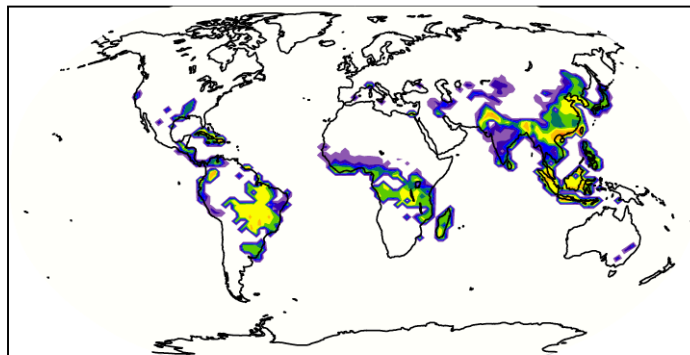
CLM5 Soy



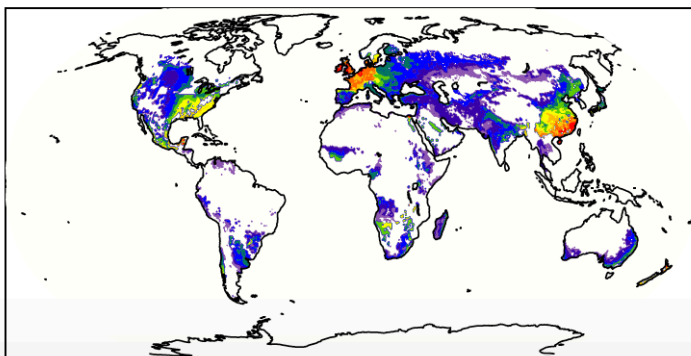
FAO Rice



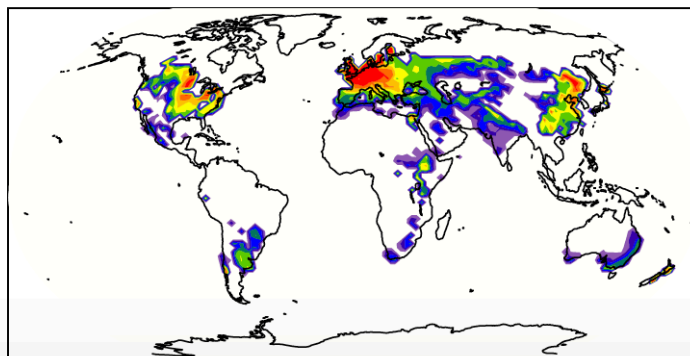
CLM5 Rice



FAO Wheat



CLM5 Spring Wheat

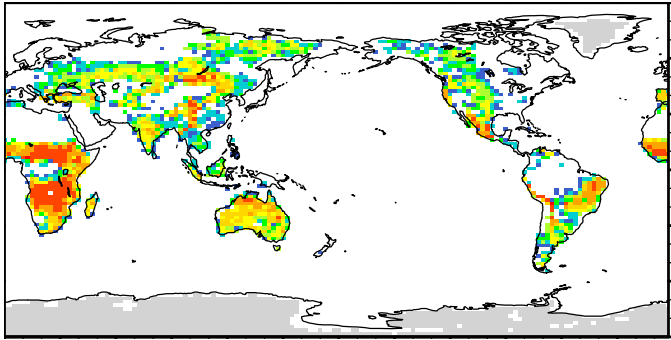






Burned area

)



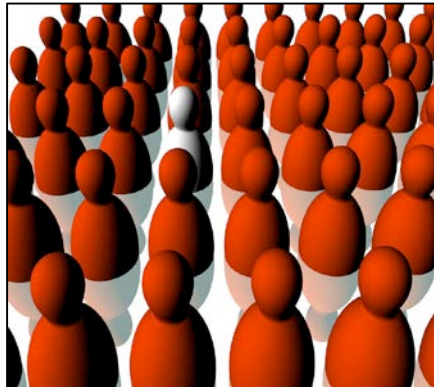


- Documentation
  - JAMES papers (CESM Special Collection)
  - Technical Description
  - User's guide
  
- Land-oriented CMIP6 activities
  - Rationalize CLM output streams
  - LUMIP, LS3MIP land-only runs

# Beyond CLM5

- FATES
- Multilayer canopy
- Hillslope hydrology
- ...

... and the proliferation of models?



Can we move beyond “Shantytown” syndrome?

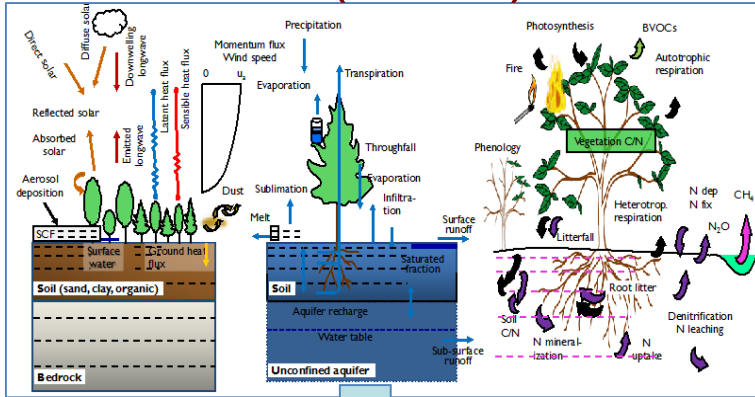


... and continue efforts to modularize and modernize the code and support tools?

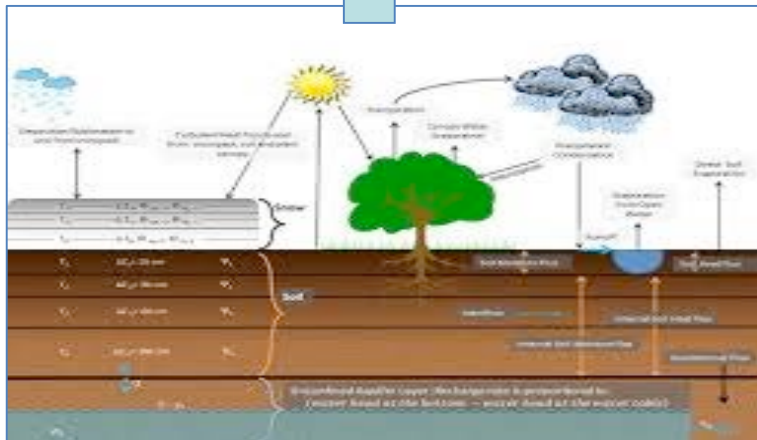
# The Community Terrestrial Systems Model

a model for research and prediction in **climate**, **weather**, **water**, and **ecosystems**

## CLM (CGD)



## CTSM



## Unify land modeling across NCAR

- More efficient use of NCAR and community resources
- Accelerate advances
- Increase flexibility and robustness of process representation, spatial architecture, and numerical solution (SUMMA concepts)
- Enable more hypothesis-driven science
- Integrate and expand land modeling research community
- Expand funding opportunities?

Noah-MP, WRF-Hydro (RAL)

# Andrew Slater, 1971-2016





# Development targets for CLM5

- Land cover and land use change

- Global / transient crop capability with irrigation, fertilization, and cultivation of crops (land management) as default for historical and projection runs

- More realistic land cover change impact on water and energy fluxes

- Carbon and nutrient cycles

- Improved 20<sup>th</sup>C land carbon stocks and carbon stock trends

- Address ecological stones thrown at CLM4 (plants don't get N for free, leaf N isn't static, photosynthetic capacity should respond to environment, stomatal conductance not linked to N-limitation)

- Hydrology

- Hydrology representation closer to state-of-art hydrology understanding

- Increase utility for use in water resource and water-carbon interaction research

- Land-atmosphere chemistry coupling

- Enhanced interactions, fire emissions, ozone damage to plants, CH<sub>4</sub> emissions

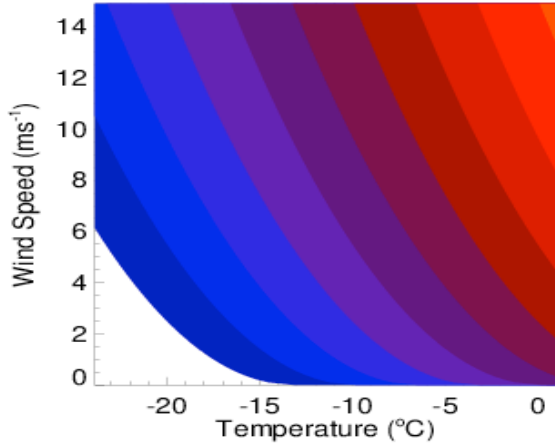
- Ecosystem Demography model – future biogeochemical core of CLM

- Functional CLM5(ED) for use in studies of biome boundaries, trait filtering, etc

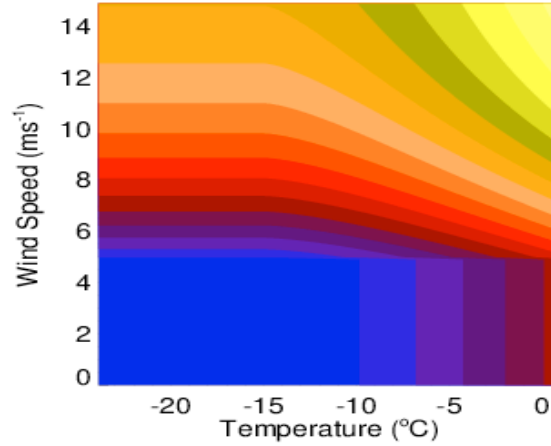
- CESM2 coupled runs with CLM(ED) within CMIP6 timeframe; will not be CESM2 default configuration

# Improvements to fresh snow density and snow compaction

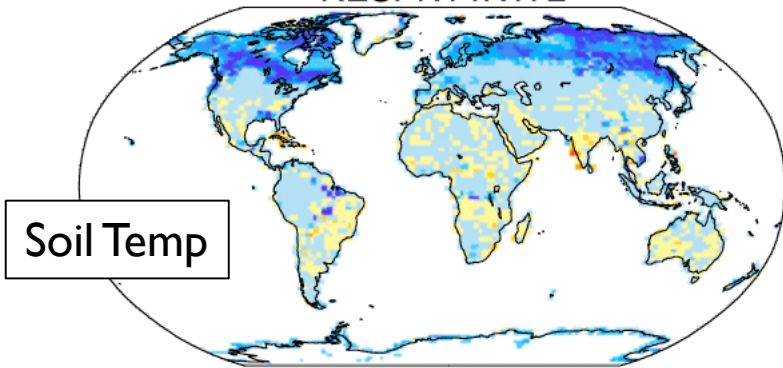
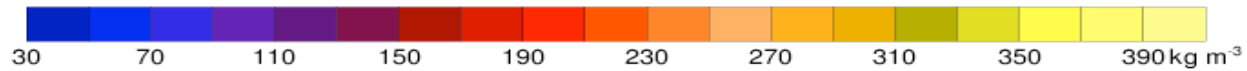
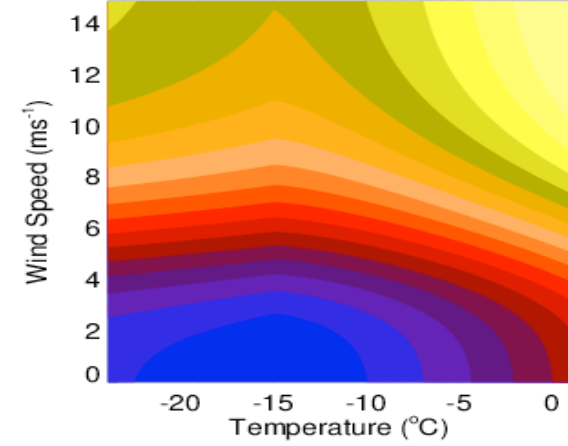
**CLM4/CLM4.5**  
**Pahaut (1976)**



**CLM5 (Feb)**  
**Liston et al.(2007)**



**CLM5 (May)**  
**Slater**



Soil Temp



- Improved snow densities
- Cooler soil temperatures
- Eliminates spurious Antarctica snow melt

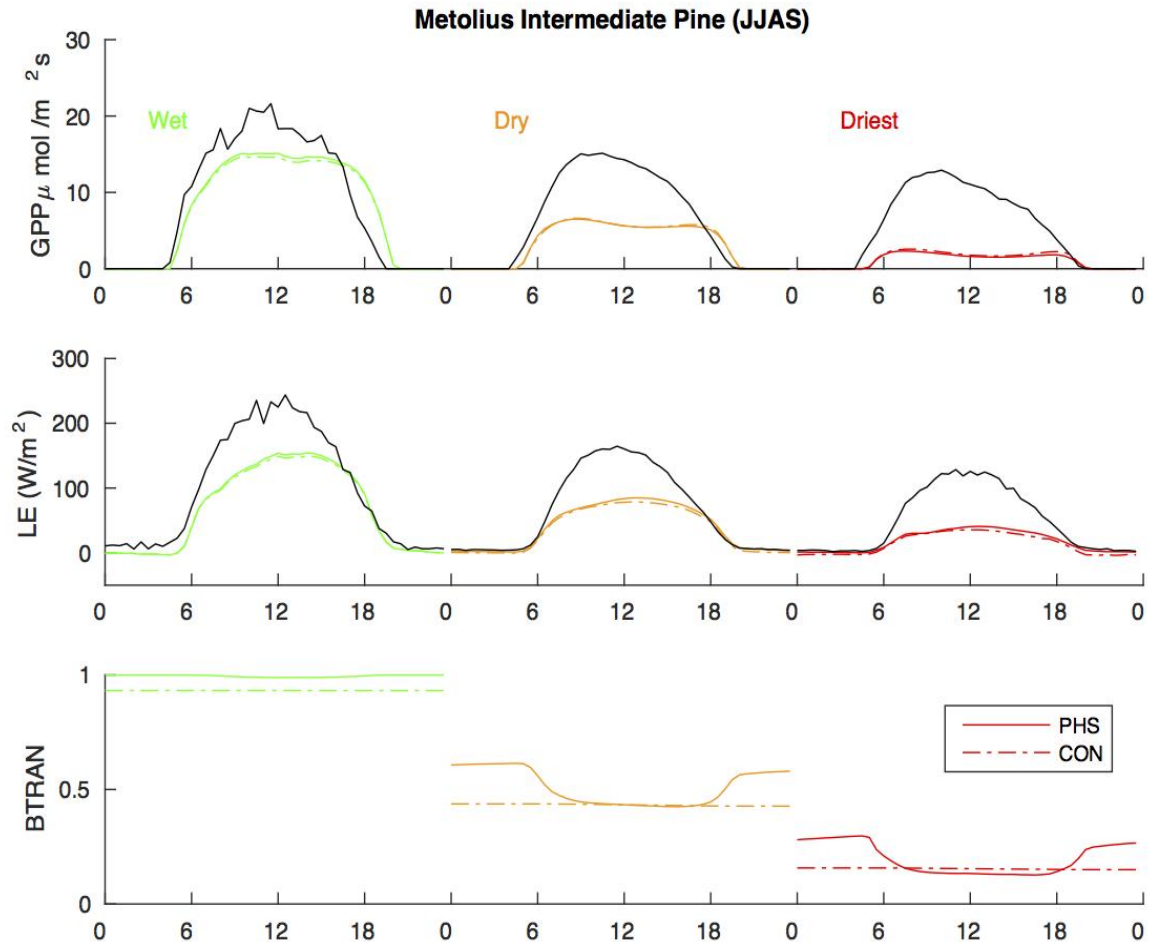
## To do list: Software development

- Integrate “loose-end” projects
  - Carbon / nitrogen conservation for dynamic landunits
  - Plant hydraulics
  - Dynamic roots
  - Water isotopes (BeTR)
  - Winter wheat
  - Crop tilling
  - Dynamic local river flood stage
  - Permafrost excess ice
  - Switch for PFTs on own column
  - Prescribed soil moisture code
  - ....
- Code cleanup
  - Rapid code integration for science has lead to accumulation of lots of “Technical Debt”
- Performance
  - CLM5BGC-crop costs ~5-10x over CLM4CN
- Model output rationalization
  - Over 550 fields archived by default



# PHS - Recent Simulations

- Using tower simulation analysis to understand and optimize parameterization for drought response

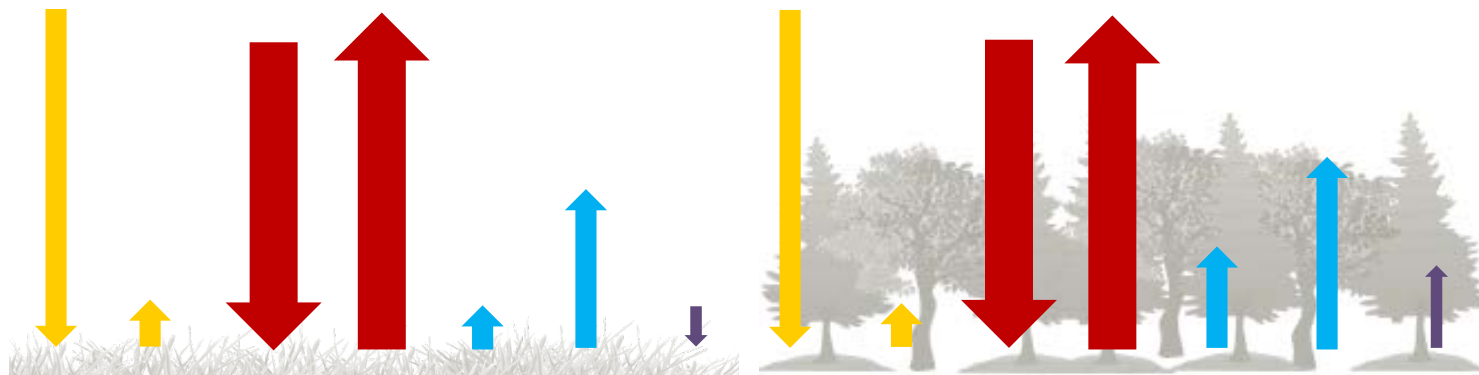


- Finalizing CLM5
  - Integrate Plant Hydrodynamics and a few small code changes onto trunk
  - Parameter optimization (likely that LMWG will provide several parameter sets between now and Sept 1 as process is refined and repeated)
  - Ingest LUMIP/CMIP6 land-cover and land-use change dataset into CLM landuse timeseries file
  - Water isotopes
- Several presentations on simpler land / boundary layer models to allow for more controlled experiments in land impacts on the atmosphere
- ILAMB tutorial was well-attended, ILAMB will be integrated into CESM workflow soon

# Tropical grid [6.13°N, 288.75°E]

## 20 year annual mean

**CTRL**



	SW↓	SW↑	LW↓	LW↑	H	λE	G	SW↓	SW↑	LW↓	LW↑	H	λE	G
[Wm <sup>-2</sup> ]	207.3	30.7	429.2	468.4	26.2	96.5	14.7	207.3	26.4	429.2	463.0	61.2	117.7	-31.8

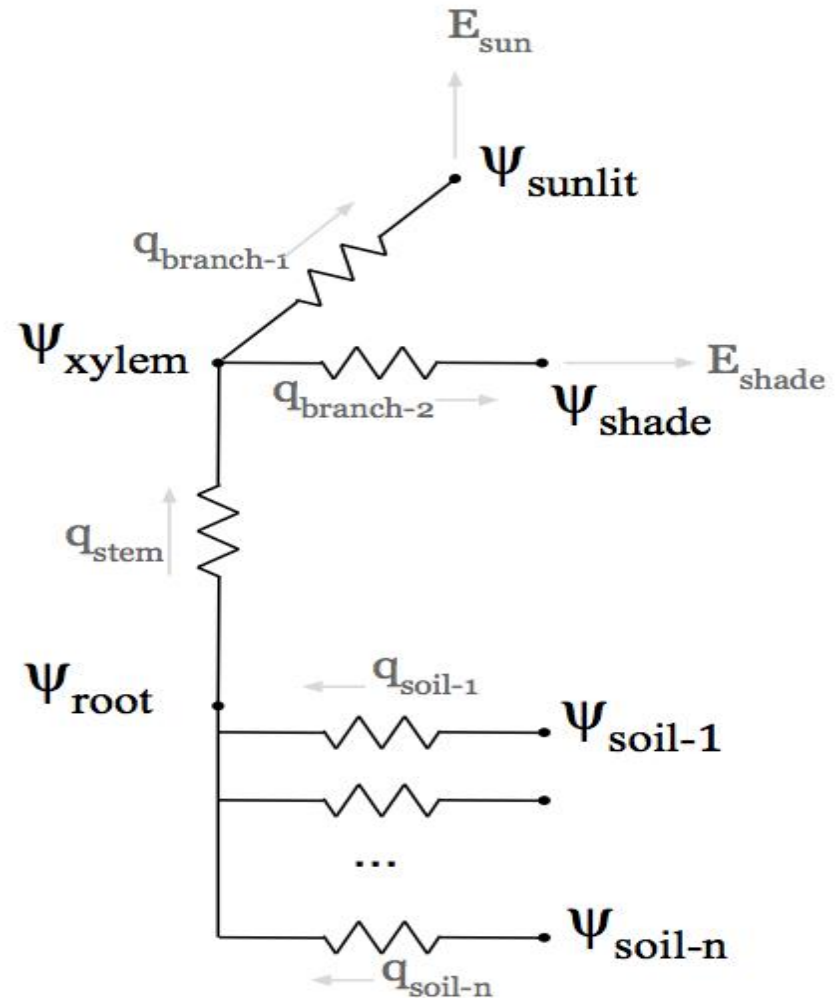
**PFT-COL**



	SW↓	SW↑	LW↓	LW↑	H	λE	G	SW↓	SW↑	LW↓	LW↑	H	λE	G
[Wm <sup>-2</sup> ]	207.3	30.7	429.2	470.8	31.7	103.3	-0.04	207.3	26.4	429.2	459.3	45.2	105.6	-0.03
<b>DIFF</b>	--	0	--	2.4	5.5	6.8	14.7 4	--	0	--	3.7	16	12.1	31.7 7

# Plant Hydraulic Stress

- Simple model to resolve water transport through the Soil Plant Atmosphere Continuum
- Water supply modeled via simple hydraulic framework
- Loss relative to unstressed transpiration modeled based on leaf-level water potential
- Water stress function used to calculate conductance, photosynthesis, and respiration



# To do list: Scientific development

## Update surface dataset tool to ingest CMIP6 land use dataset

### New History

- Hyde 3.2 based
- Landsat F/NF
- Multiple crop types (5)
- Multiple pasture types (2)
- Updated Forest Cover/B
- Updated Wood harvest
- Updated Shifting Cultivation
- Extended time domain (850-2015)

### New Mgt. Layers

#### Agriculture

- Fraction of cropland irrigated
- Fraction of cropland flooded
- Fraction of cropland fertilized
- Fertilizer application rates
- Fraction of cropland tilled
- Fraction of cropland for biofuels

#### Crop rotations

#### Wood Harvest

- Fraction used for industrial products
- Fraction used for commercial biofuels
- Fraction used for fuelwood

### New Future Scenarios

Six futures, SSP-based

### New Resolution

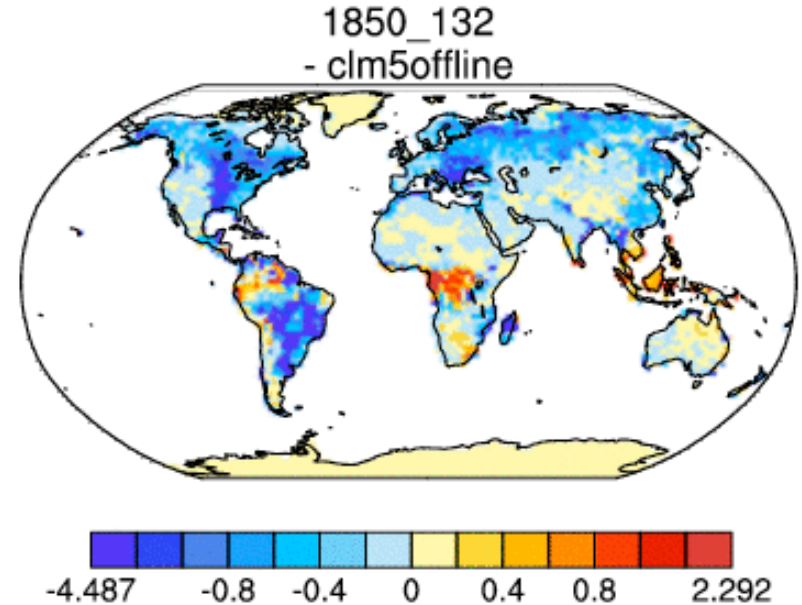
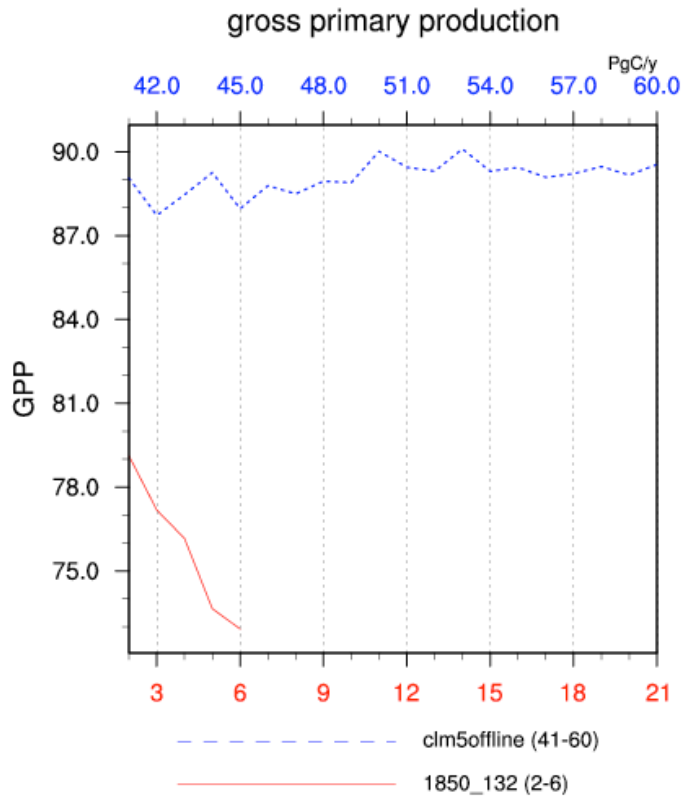
0.25°

### New Transition Matrix

	Pri F	Pri NF	Sec F	Sec NF	C3 Ann	C4 Ann	C3 per	C4 per	C3 N-Fix	Pasture	Rangeland	Urban
Pri F	■											
Pri NF		■										
Sec F			■									
Sec NF				■								
C3 Ann					■							
C4 Ann						■						
C3 Per							■					
C4 Per								■				
C3 N-Fix									■			
Pasture										■	■	
Rangeland										■	■	
Urban												■

~ 50x information content of CMIP5!

# GPP in coupled run



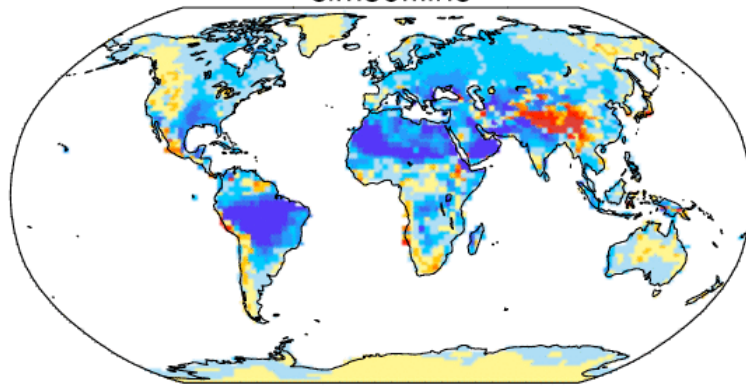
## Why the systematic drop?

- Always a drop, but larger in this run
- Climate differences not uniform
- Forcing height
- Possibly a correlation with VPD bias in CESM
- Higher Ball-Berry or Medlyn stom conductance seem to partially alleviate

# GPP in coupled run

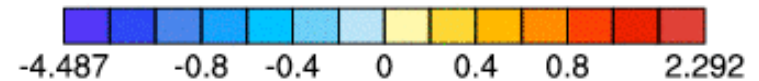
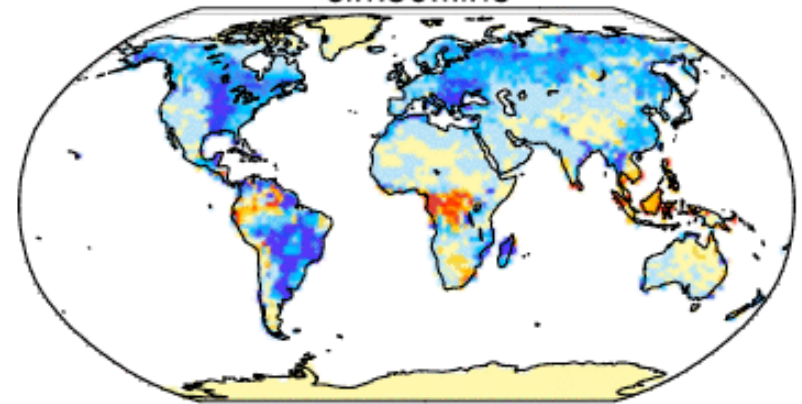
Spec humidity

1850\_132  
- clm5offline



GPP

1850\_132  
- clm5offline



Why the systematic drop?

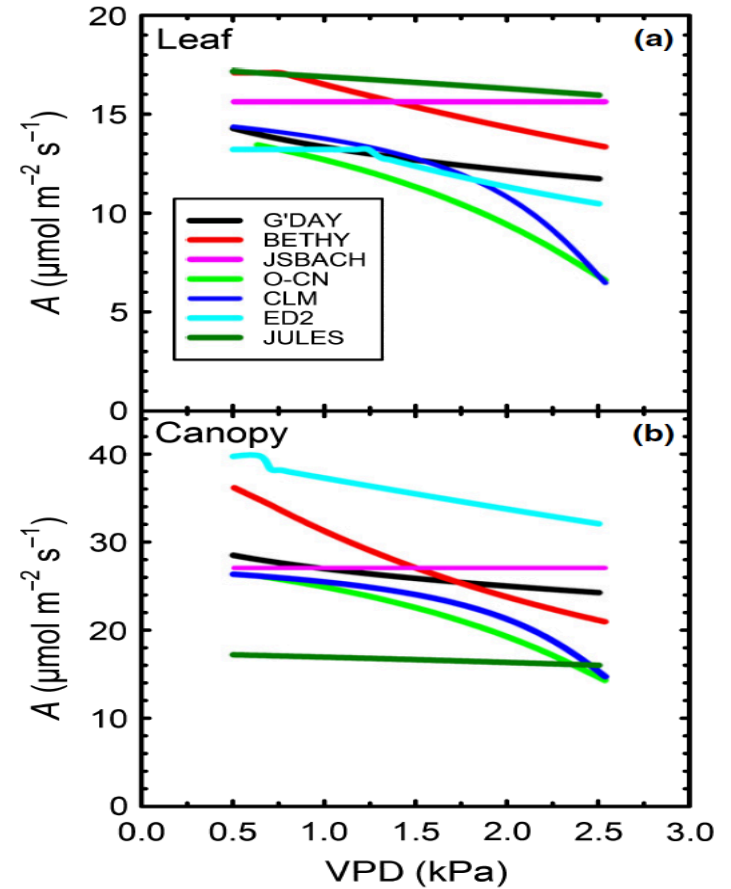
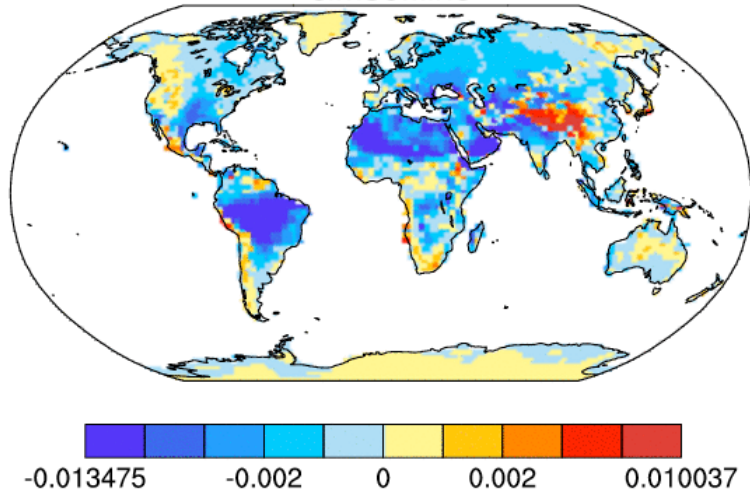
- Always a drop, but larger after parameter calibration
- Forcing height issues in CLM runs?
- Climate differences (T, P) generally not uniform, spec humidity more systematic lower
- Higher Ball-Berry slope params or Medlyn stom conductance seem to partially alleviate

# GPP in coupled run



Spec humidity

1850\_132  
- cIm5offline

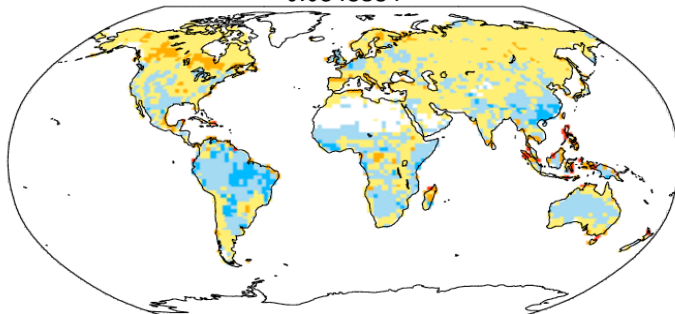


Rogers et al., 2017



# CLM5SP versus CLM4.5SP

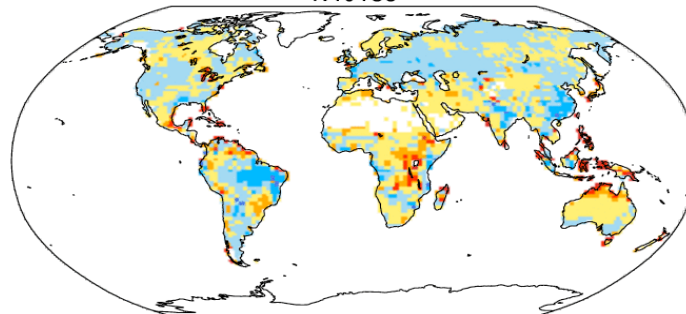
ANN Bias(FPSN) clm5sp\_optcalv4LUNA  
0.0848354



RMSE=0.78



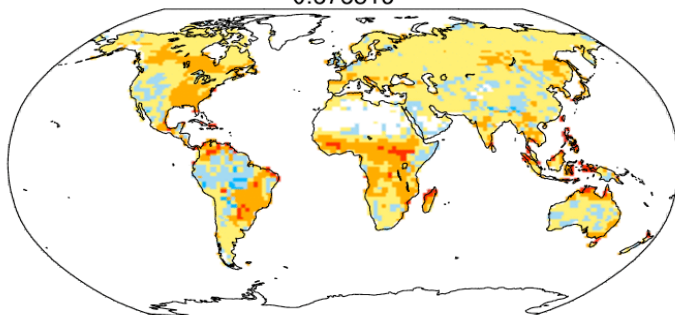
ANN Bias(LHEAT) clm5sp\_optcalv4LUNA  
1.40189



RMSE=9.52



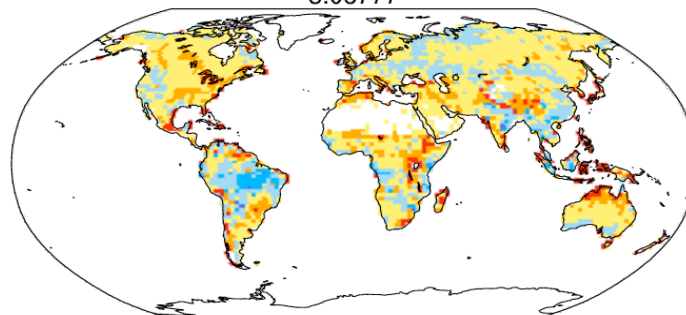
ANN Bias(FPSN) clm45sp  
0.676519



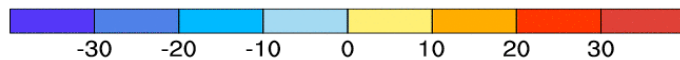
RMSE=1.13



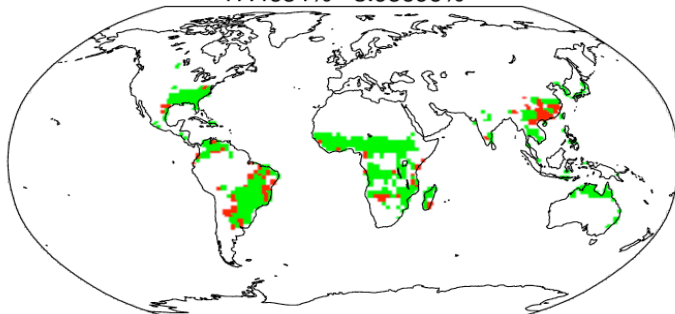
ANN Bias(LHEAT) clm45sp  
5.06777



RMSE=12.55



Model relative to Obs  
17.4654% - 3.98696%



Model relative to Obs  
24.4294% - 12.8374%

