

Towards a robustly calibrated FATES SP configuration

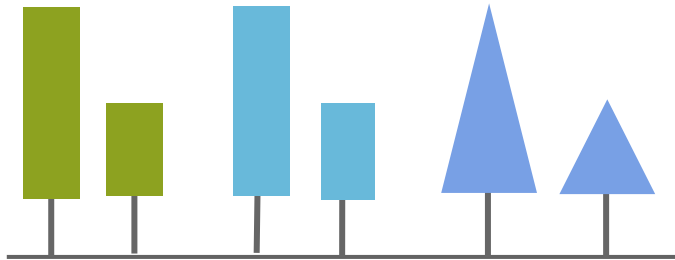
Progress down the calibration cascade

*Adrianna Foster**, Linnia Hawkins, Daniel Kennedy, Katie Dagon, Keith Oleson, Erik Kluzek, Sam Levis, Will Wieder, Gordon Bonan, Dave Lawrence, Jessica Needham, Charlie Koven, Rosie Fisher, Ryan Knox, Greg Lemieux

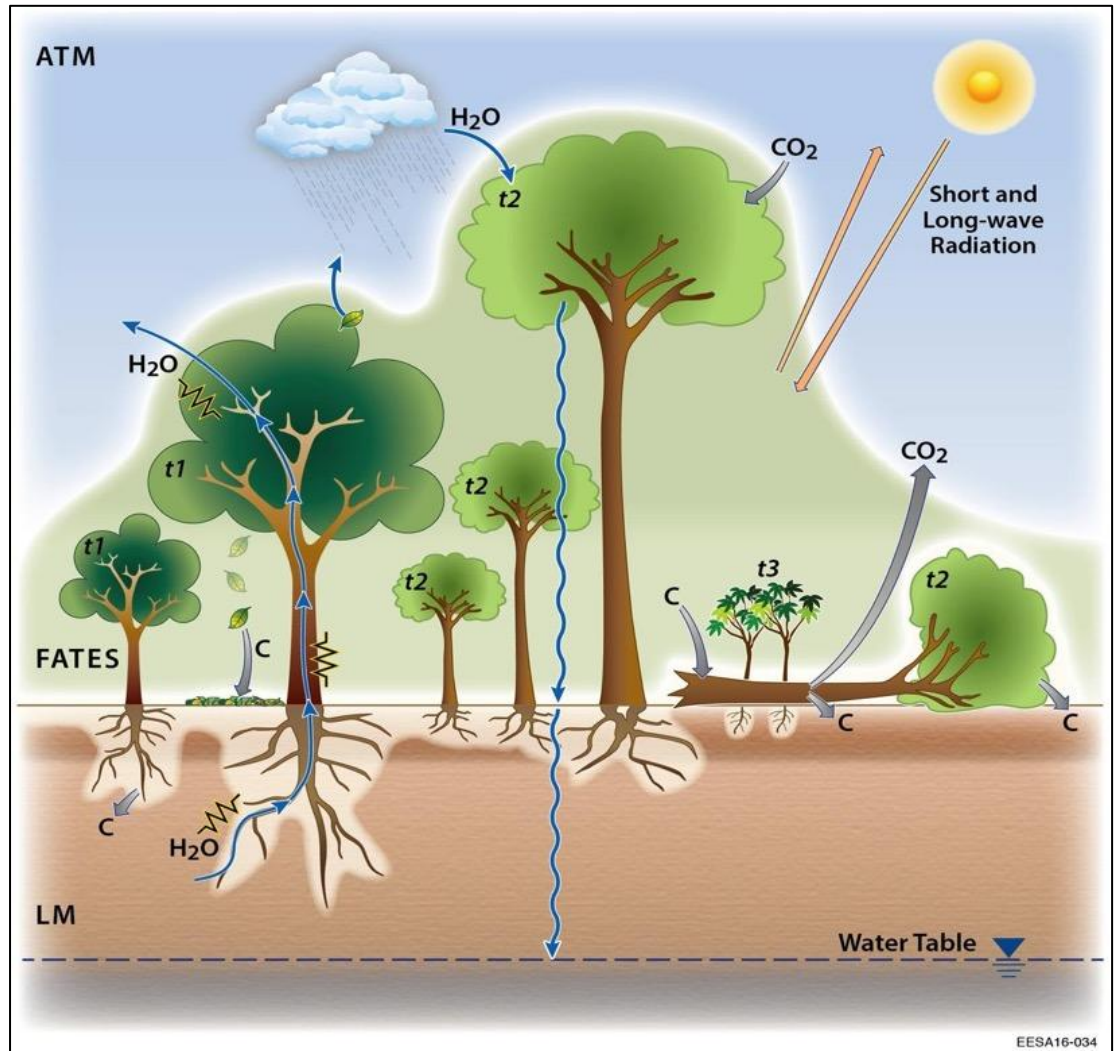
**Project Scientist I, NCAR CGD Terrestrial Sciences Section*

2024 Land Model & Biogeochemistry Winter Working Group Meeting
February 29, 2024





cohort-specific model
30-minute photosynthesis and fluxes
daily growth and allocation

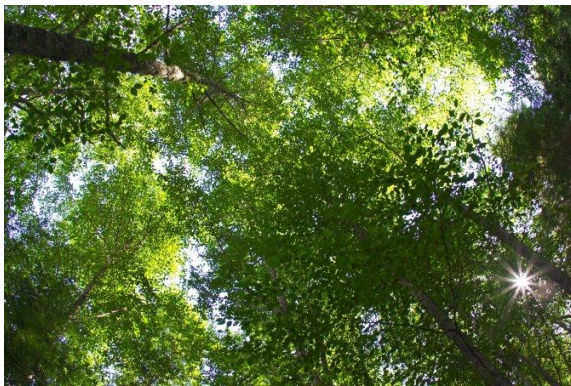
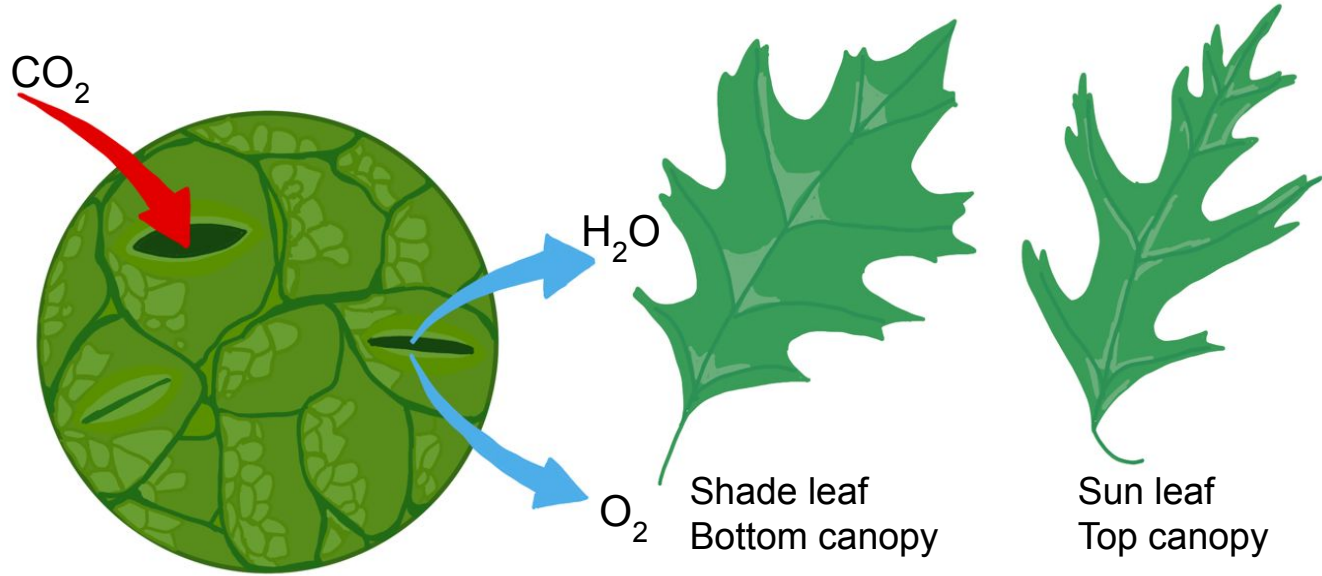
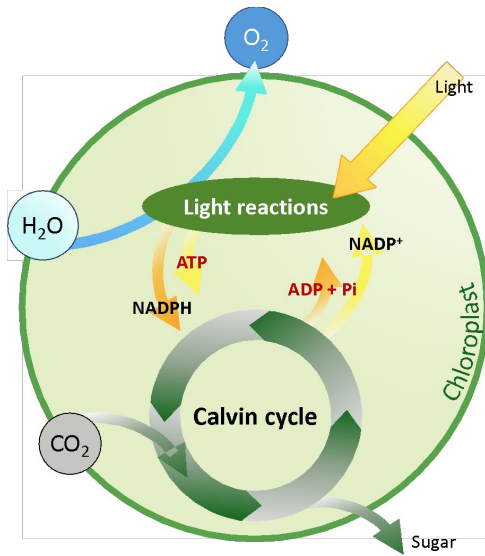


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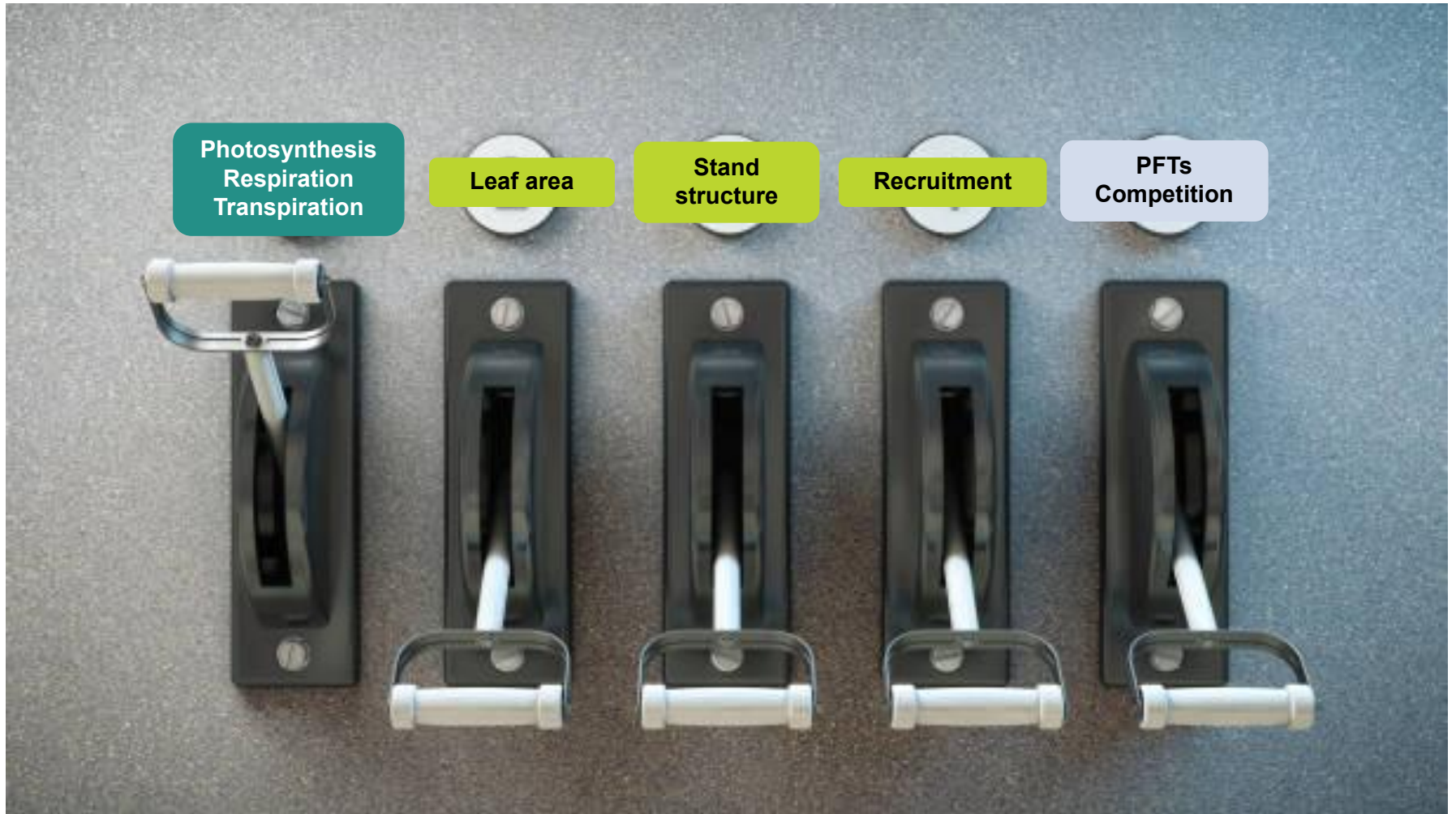


Adrianna Foster – afoster@ucar.edu

FATES operates at multiple scales of a forested ecosystem



Difficult to calibrate across all scales



FATES complexity modes

Satellite Phenology

One cohort and patch
Observed LAI for each PFT
No disturbance, growth, or mortality

No Competition

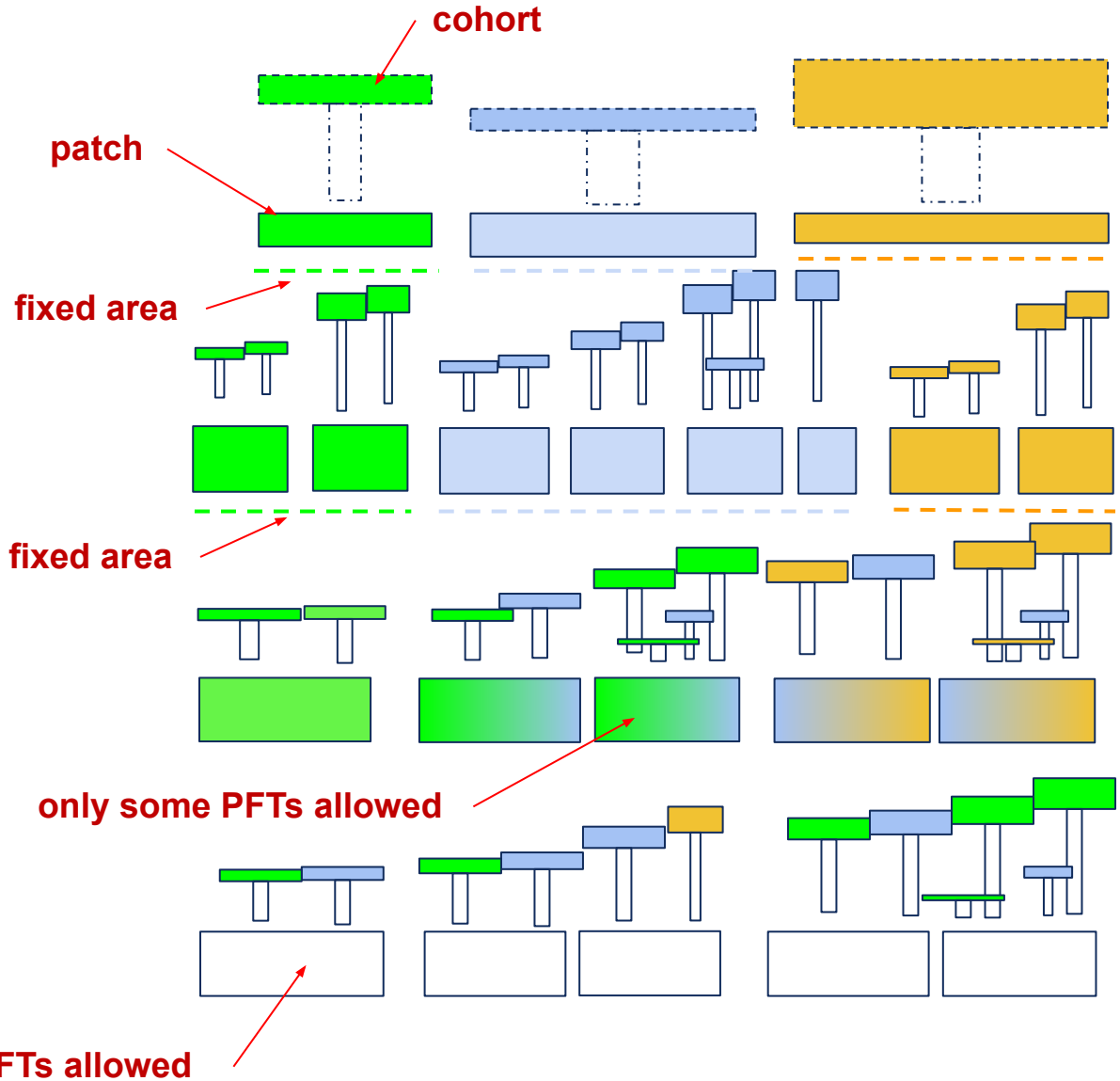
All PFTs given a fixed area to grow
Growth & disturbance
Fixed biogeography

Prescribed Biogeography

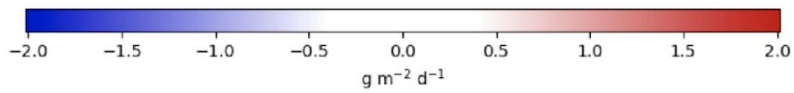
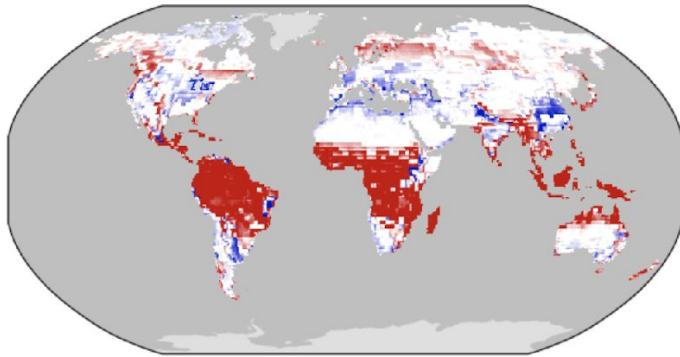
Growth, disturbance, and competition,
but only where each PFT actually grows

Full FATES

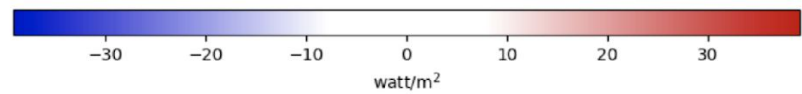
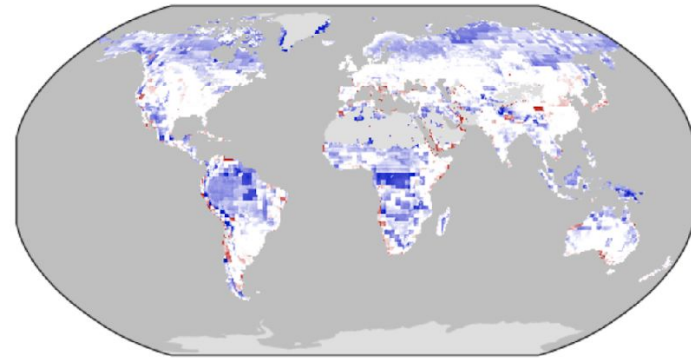
Growth, disturbance, and
competition everywhere



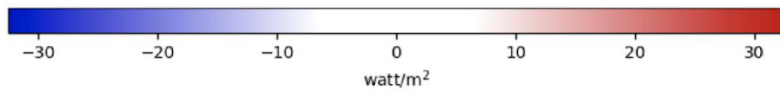
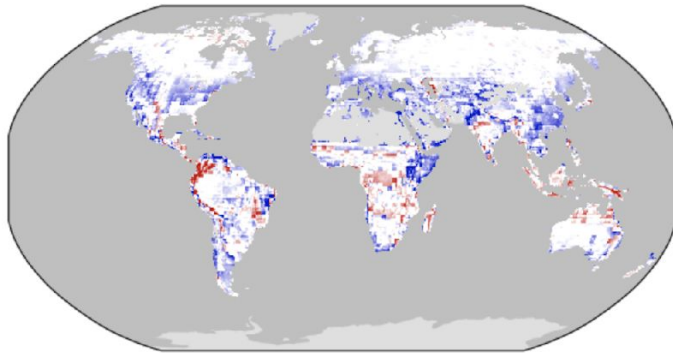
GPP



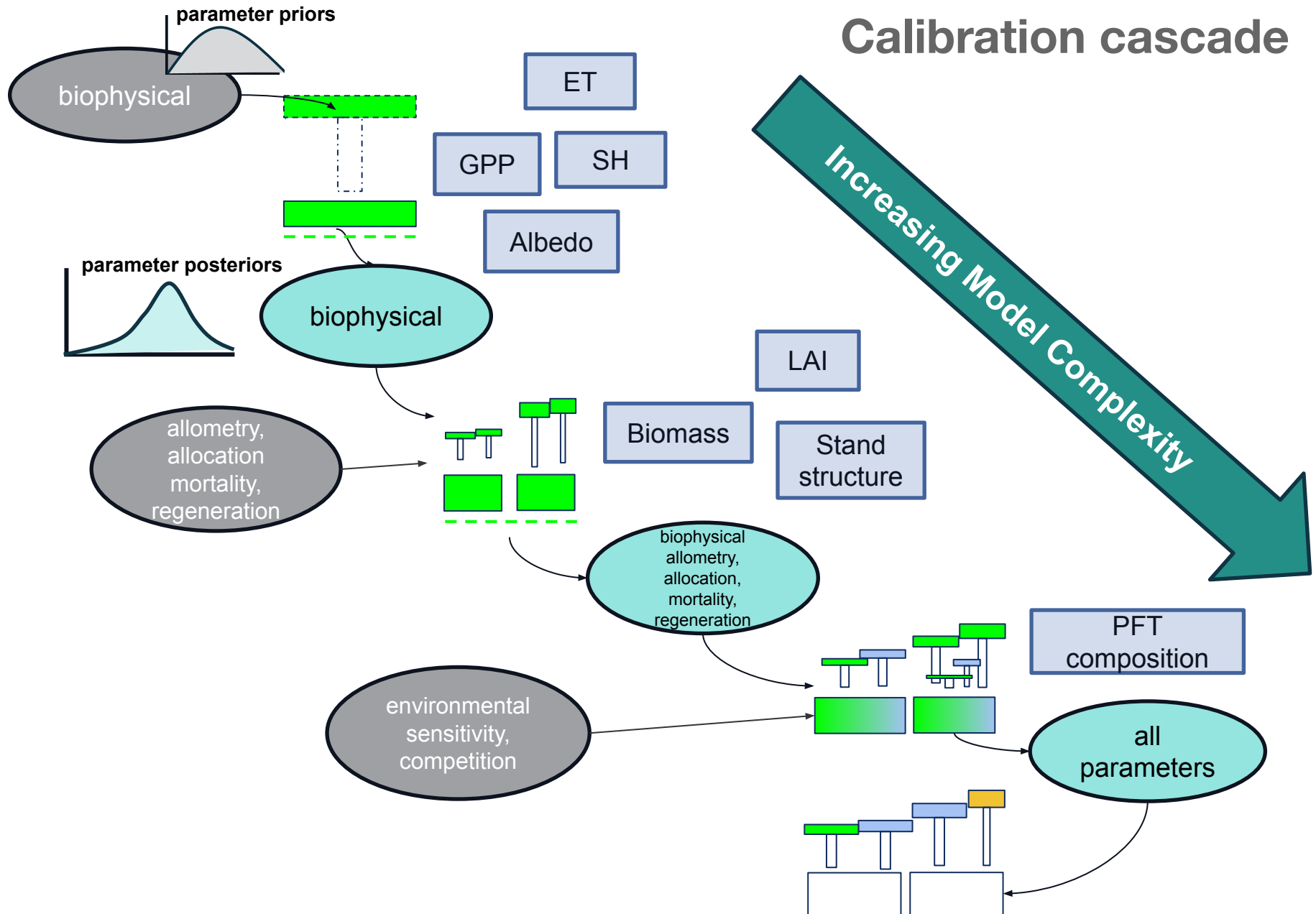
Sensible Heat



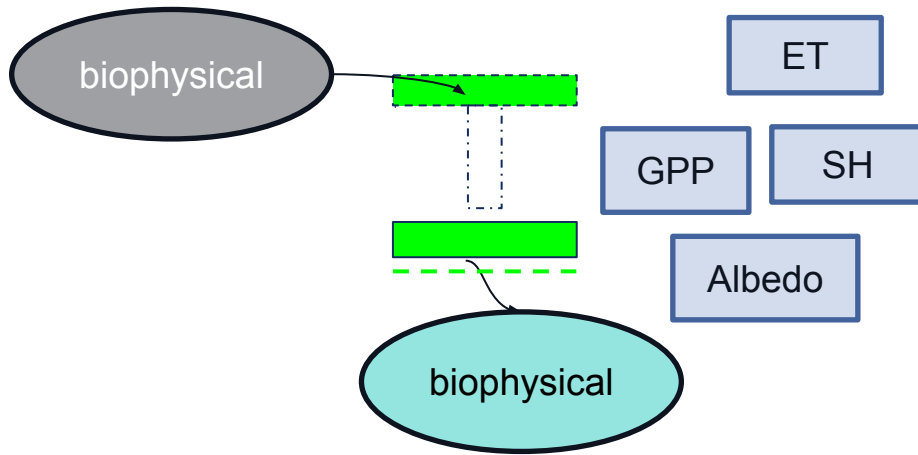
Latent Heat



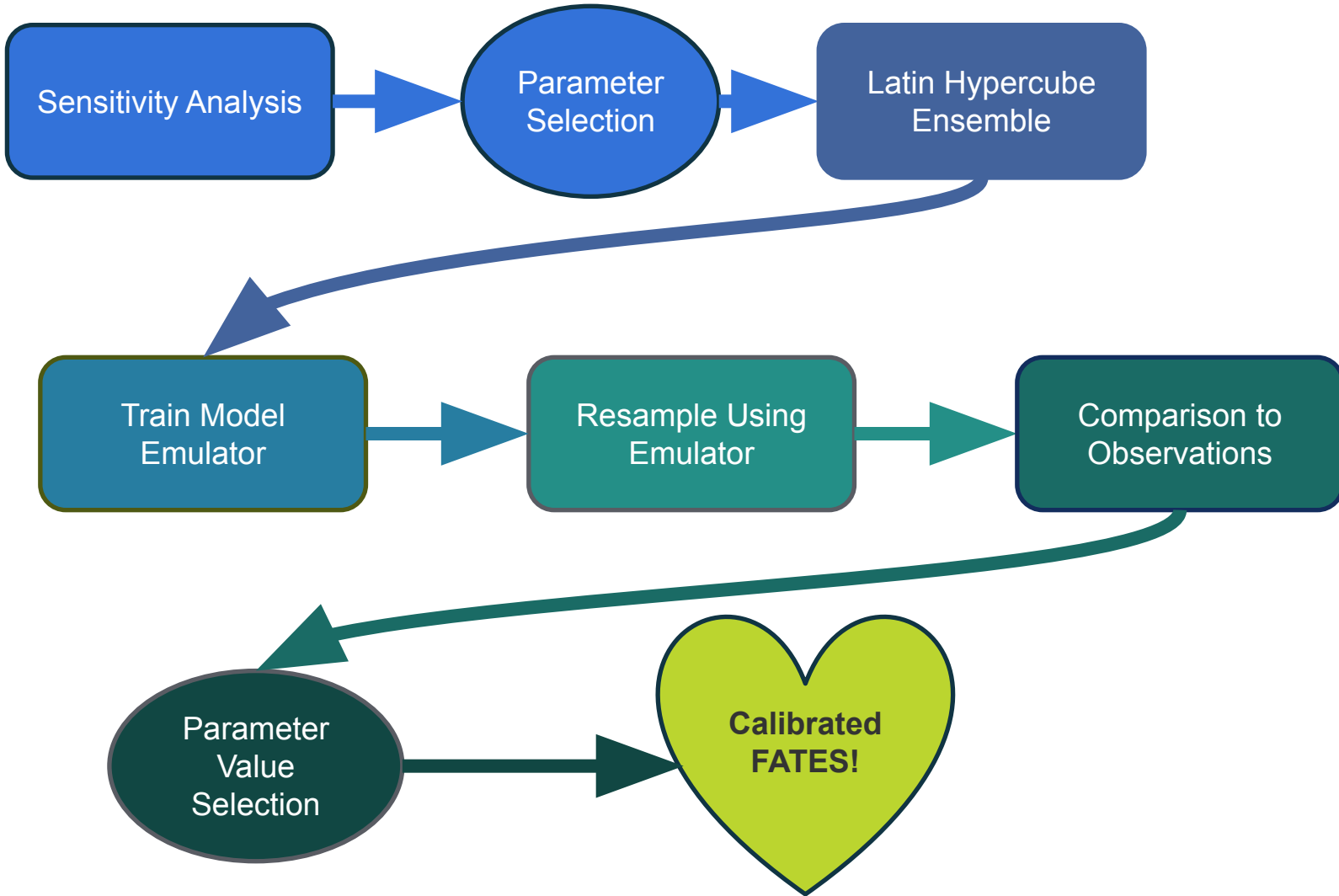
Calibration cascade



Calibration cascade



Overall Roadmap



Model configuration and spin up

FATES SP Mode

Two-stream radiation (more on this from Ryan Knox later this afternoon)

Atkin respiration

Medlyn stomatal conductance

Kumarathunge temperature acclimation

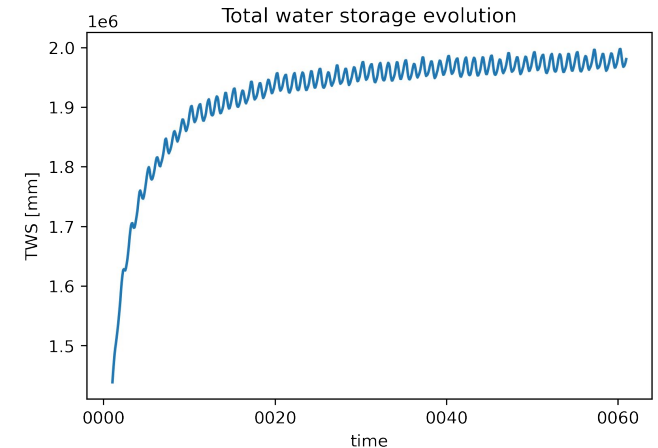
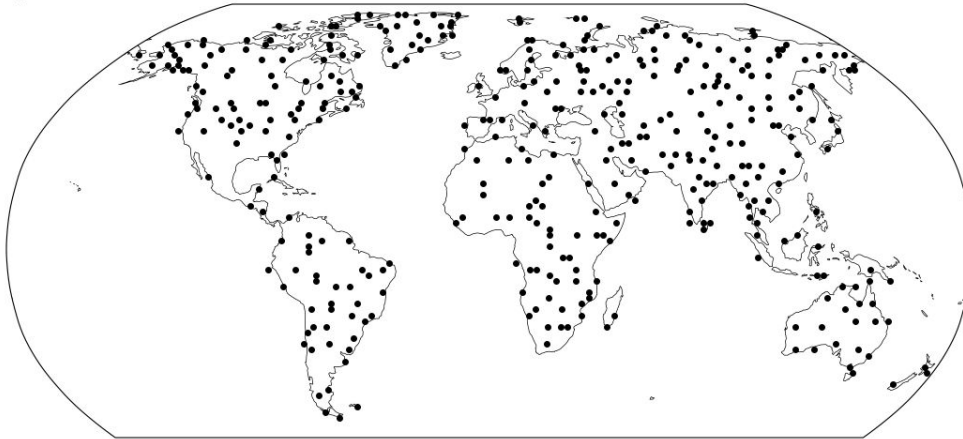
Cycle 2004-2015 GSWP3 climate

Wait for total water storage to evolve and come to equilibrium

Use last 20 years for analysis

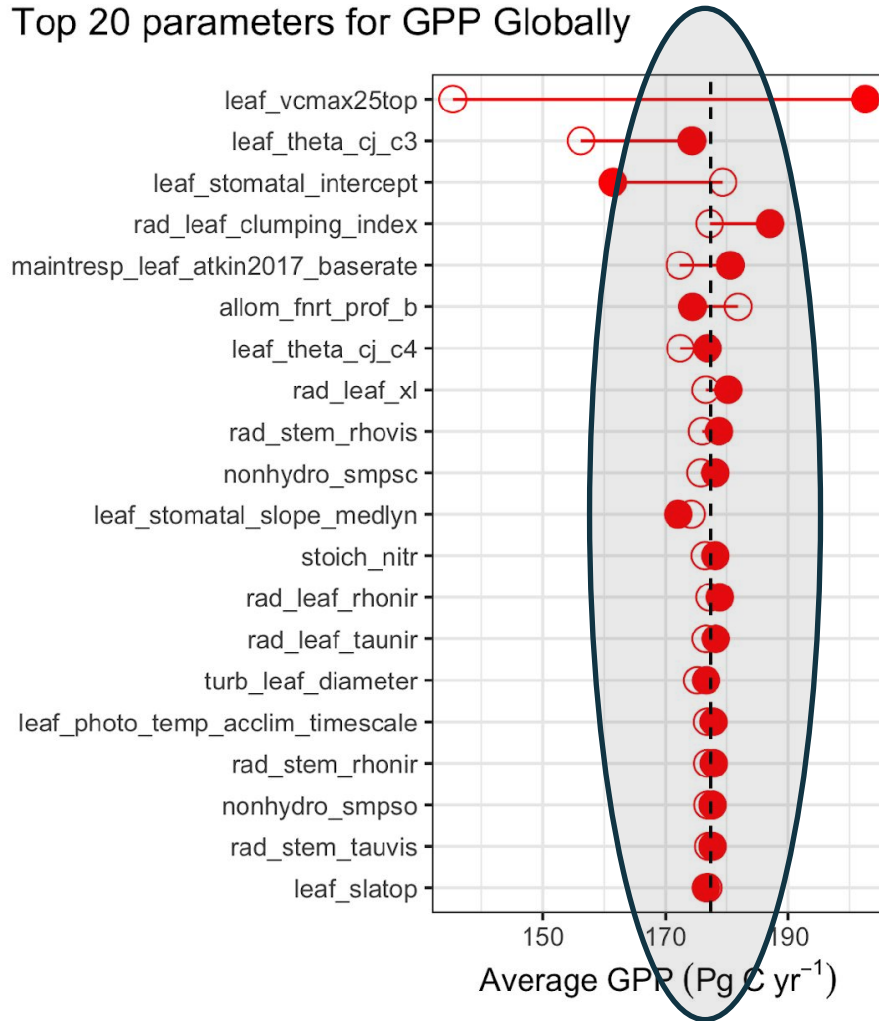
Sparse grid (n = 400)

Sparse Grid

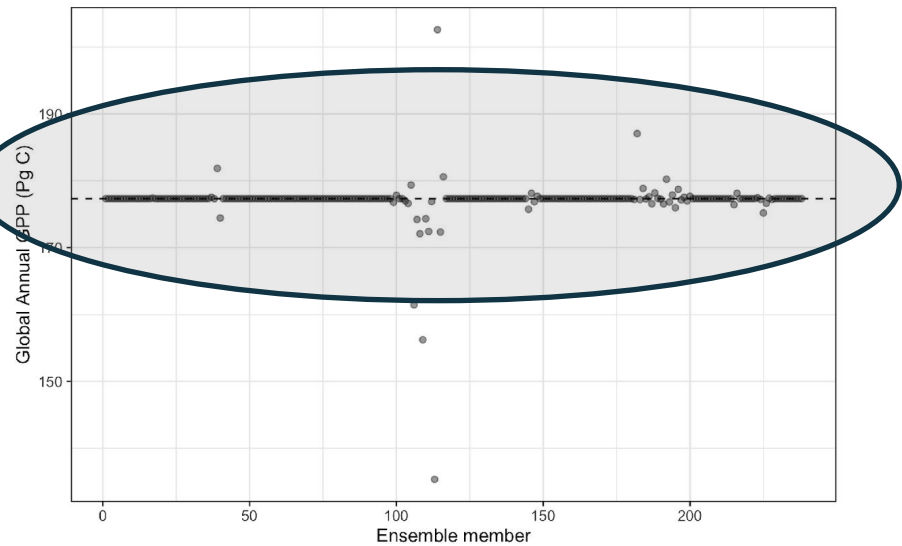


Initial OAAT sensitivity analysis

Top 20 parameters for GPP Globally



Global Annual GPP Sum

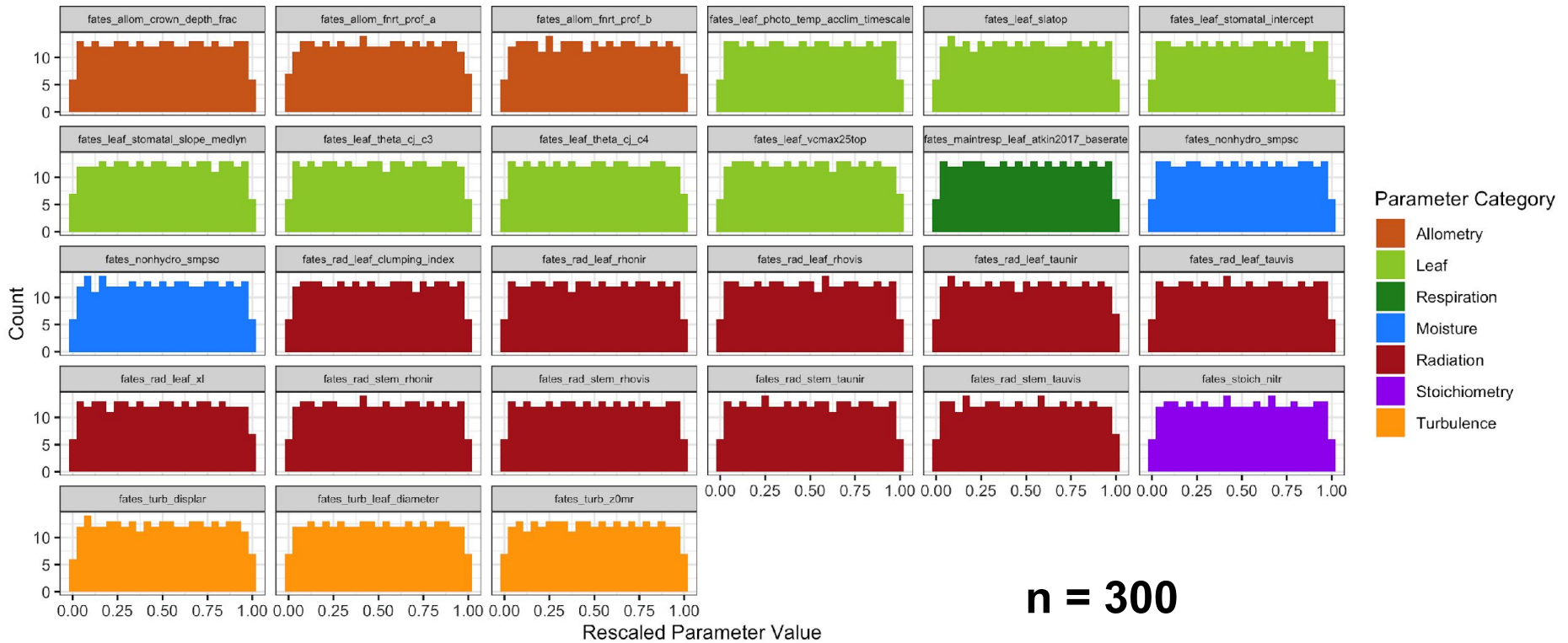


Only calibrating FATES parameters currently*

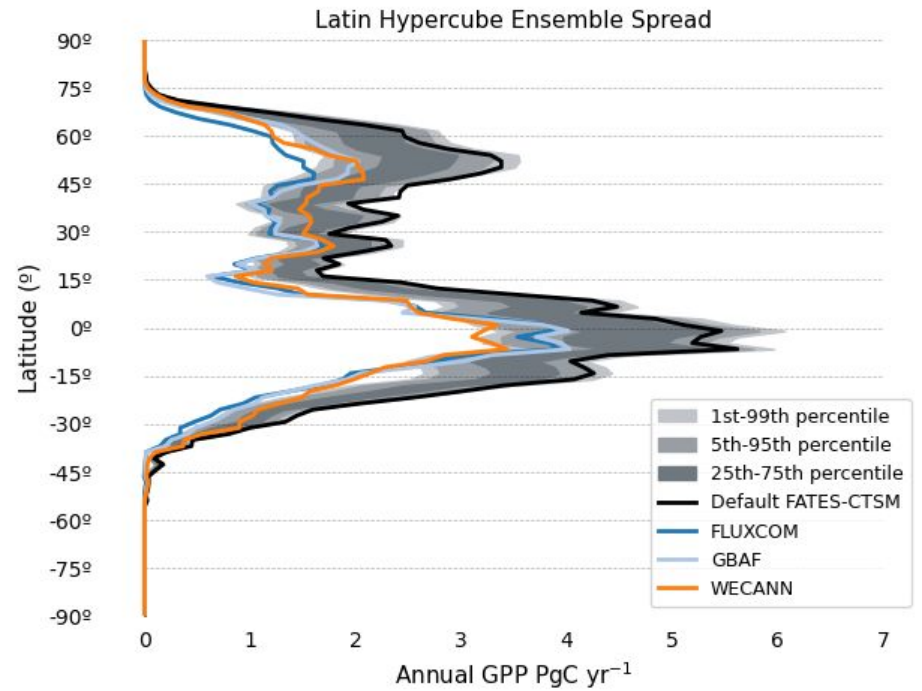
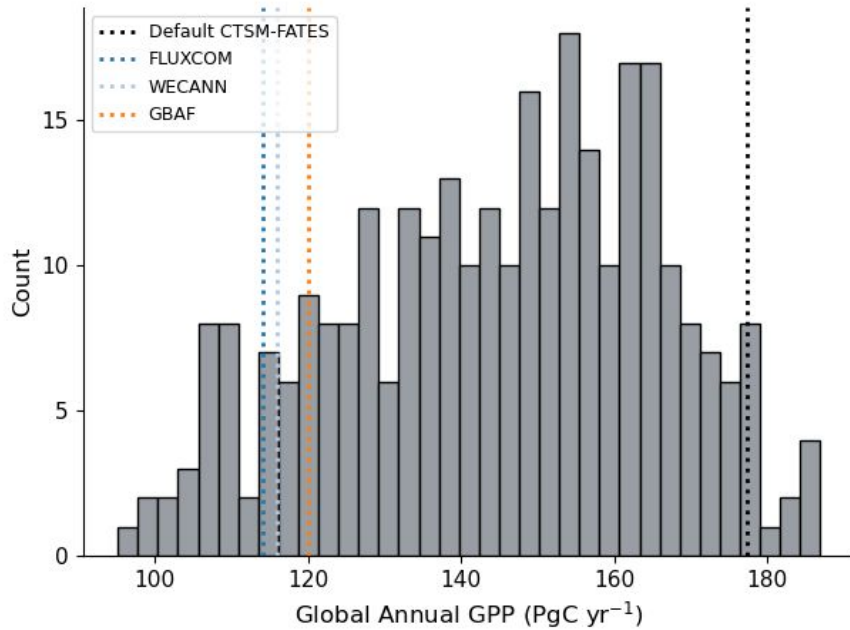
* proceed with caution

Latin Hypercube Ensemble

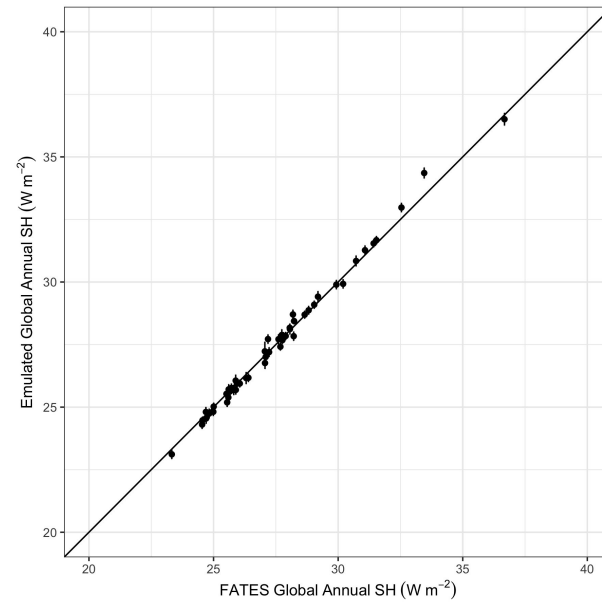
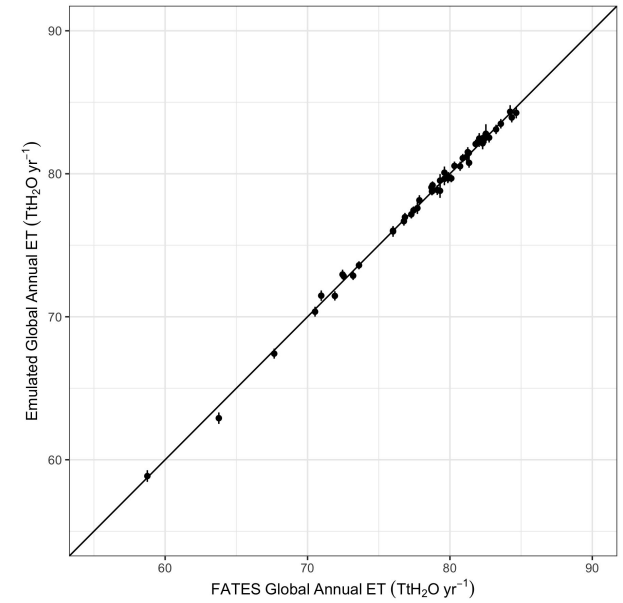
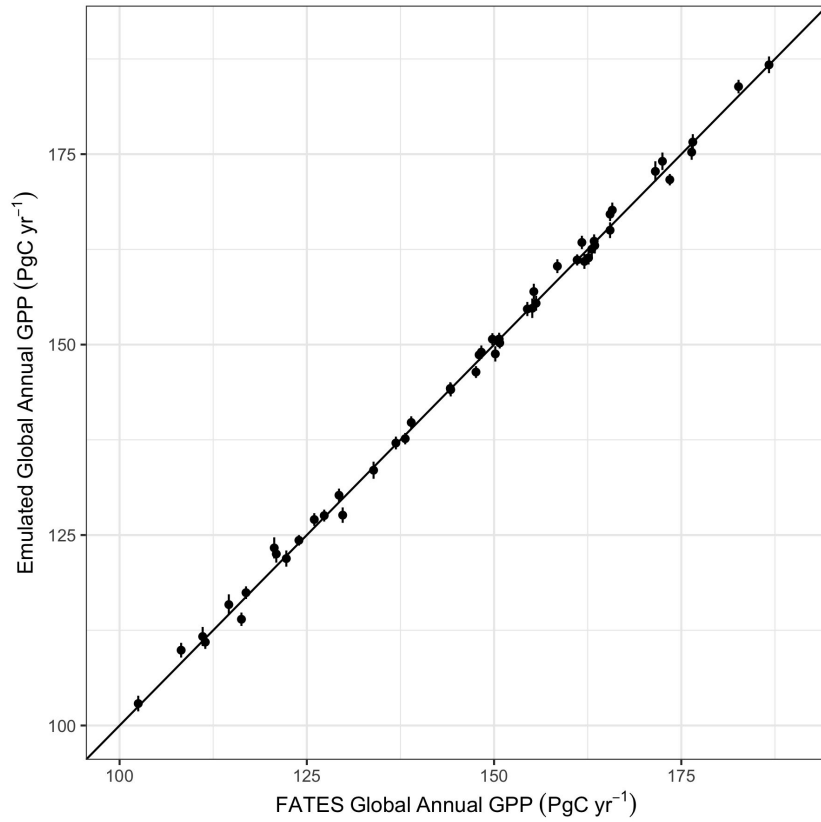
Top 27 parameters across GPP, evapotranspiration, sensible heat, albedo, and surface soil moisture output



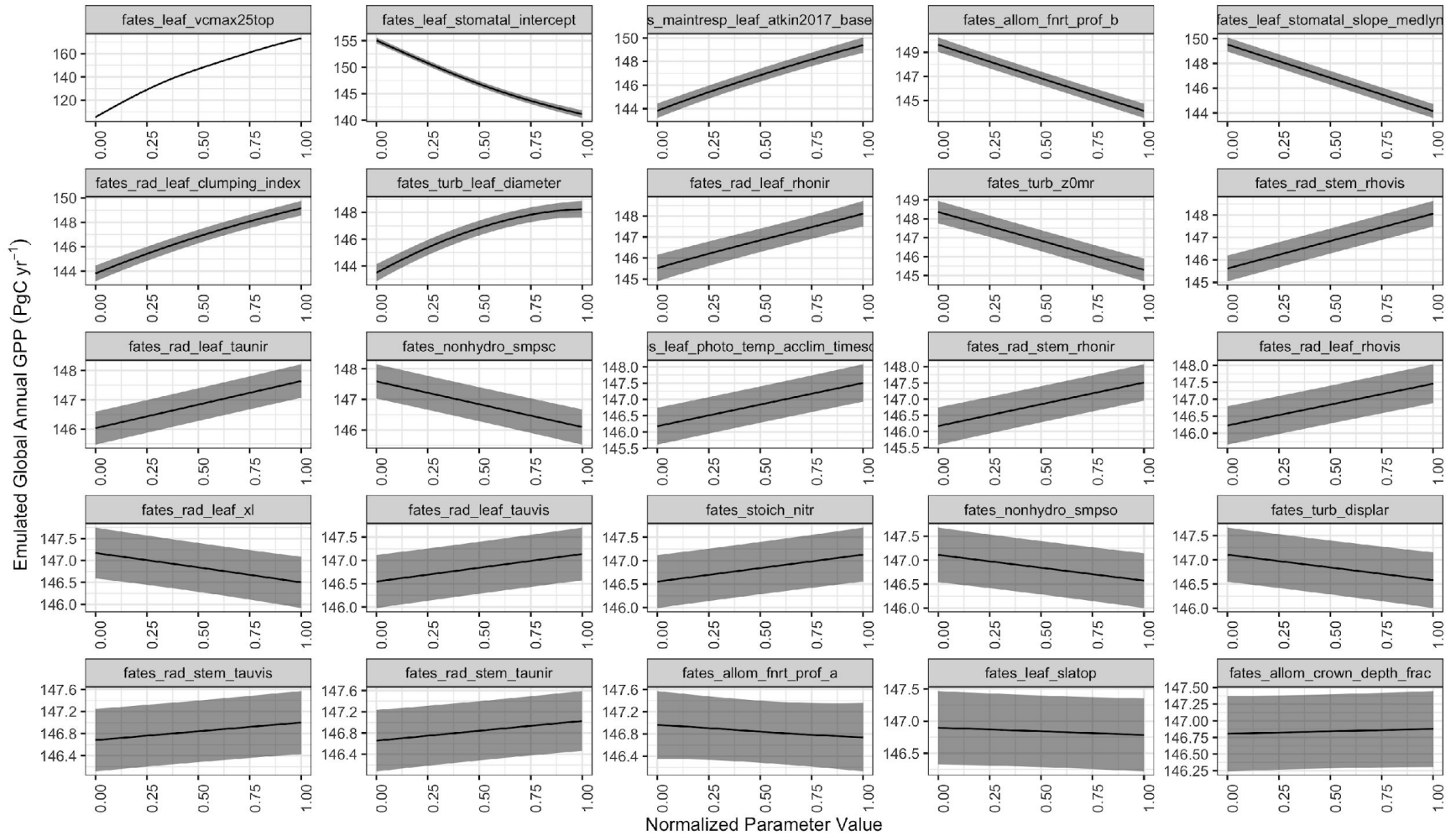
Latin Hypercube Ensemble



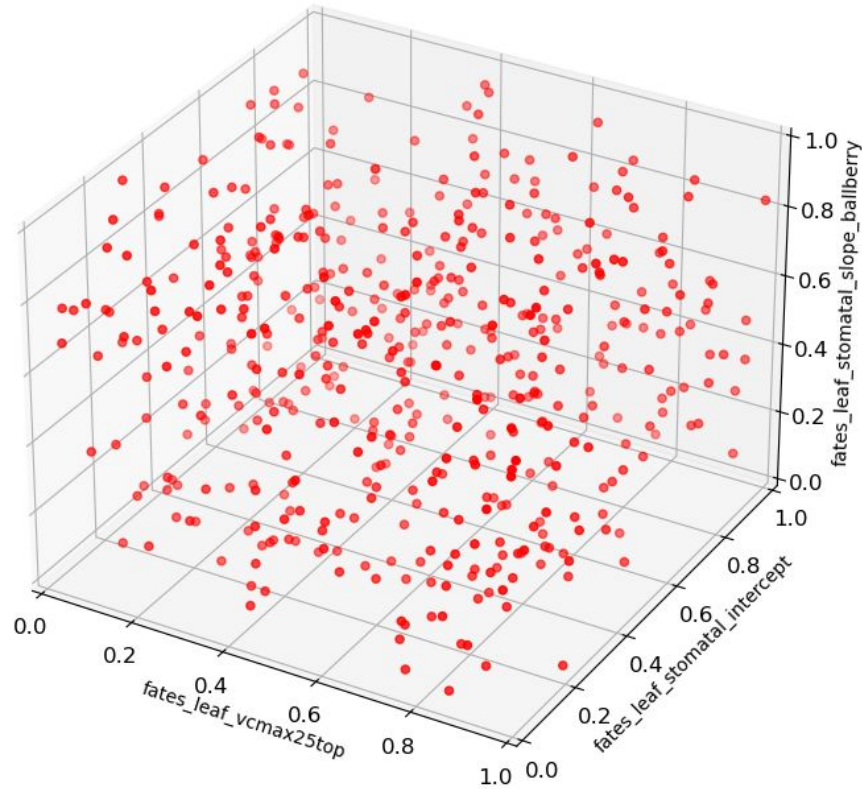
Emulator Validation



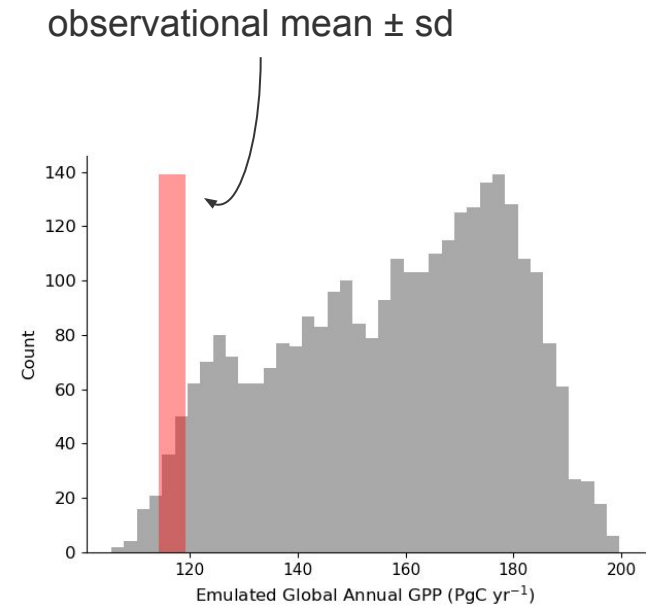
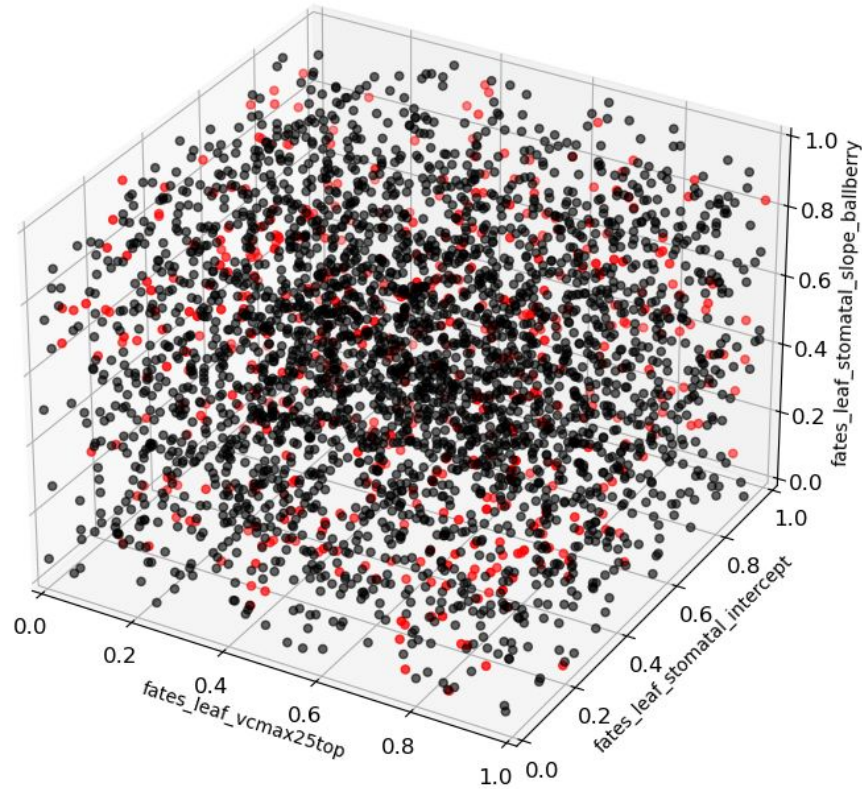
Parameter Sensitivity



Resample parameter space using emulator

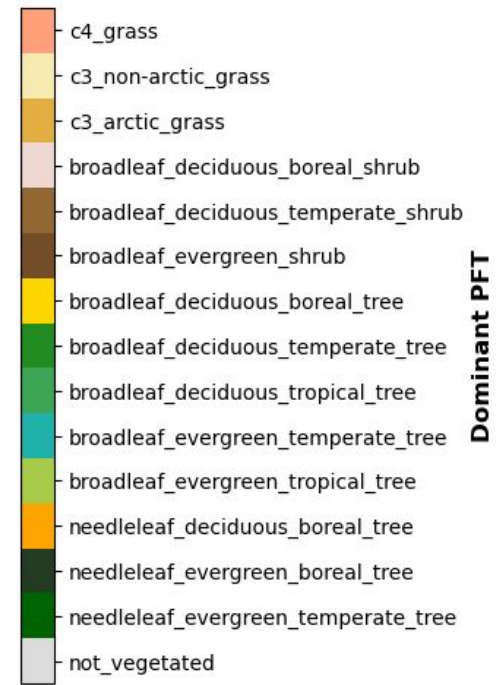
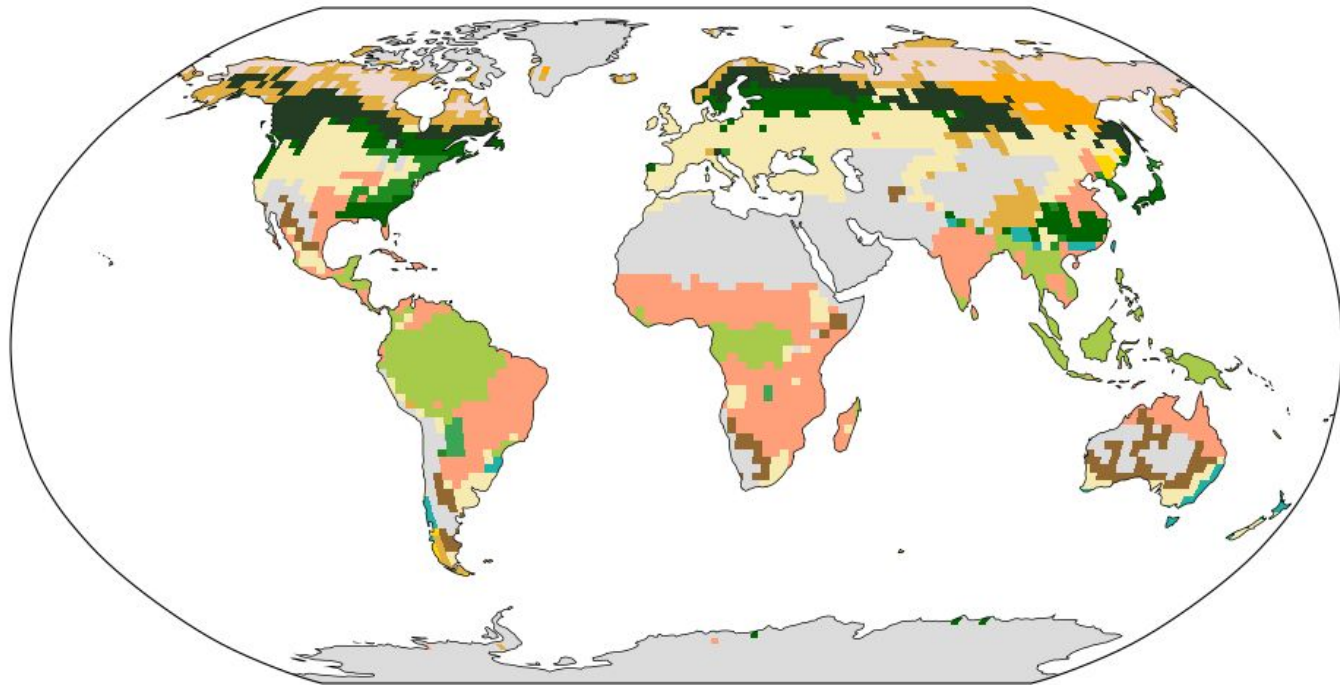


Resample parameter space using emulator



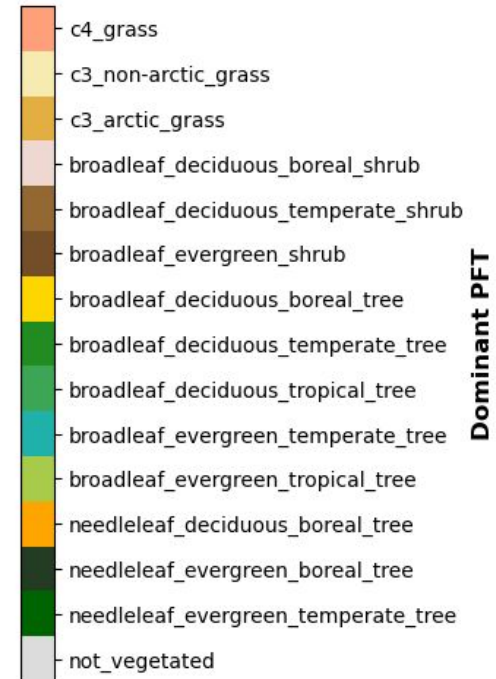
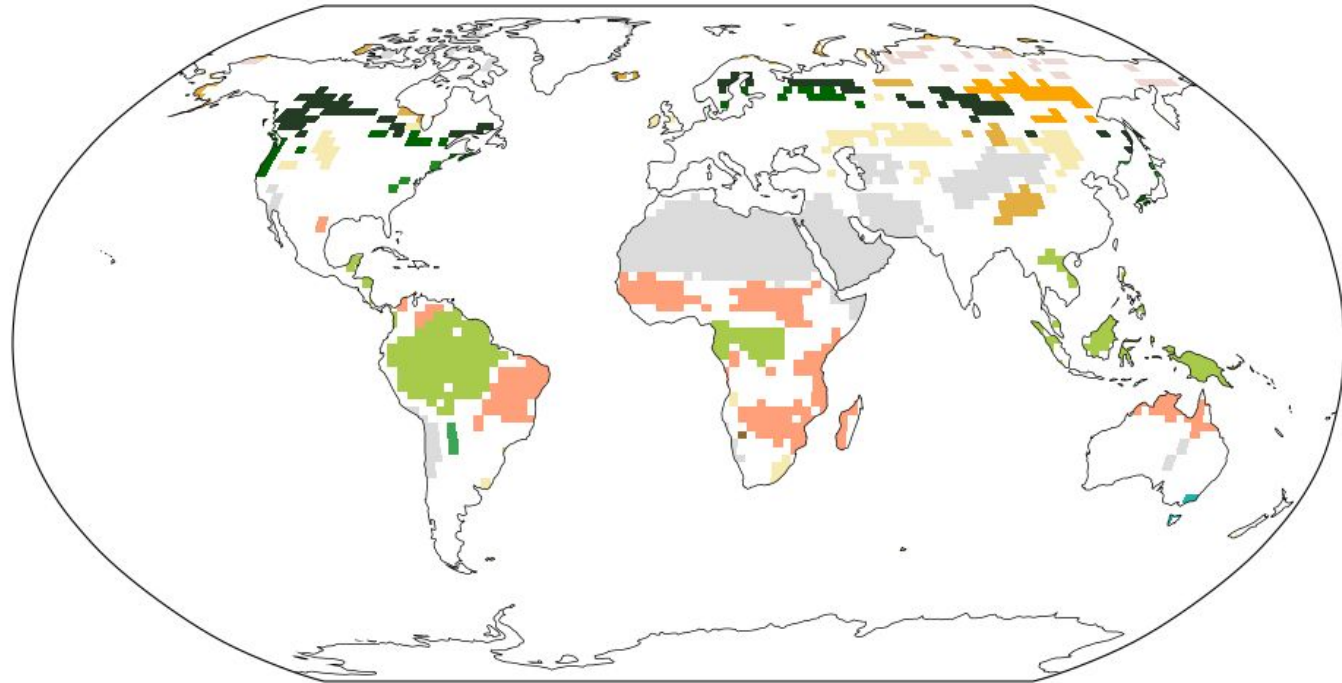
Trying to find PFT-specific gridcells

Dominant PFTs



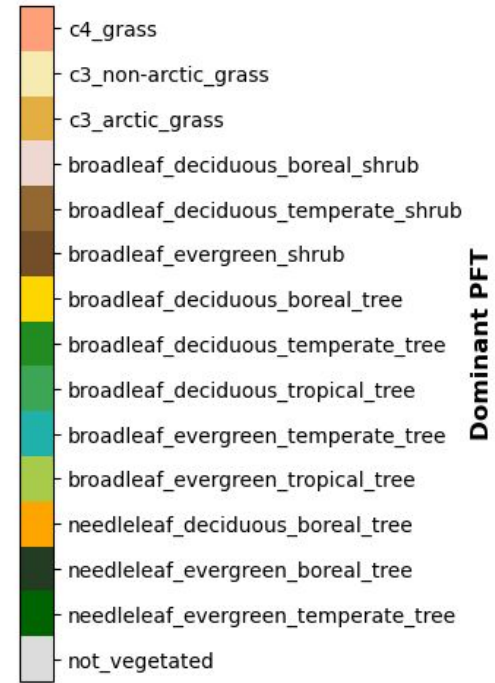
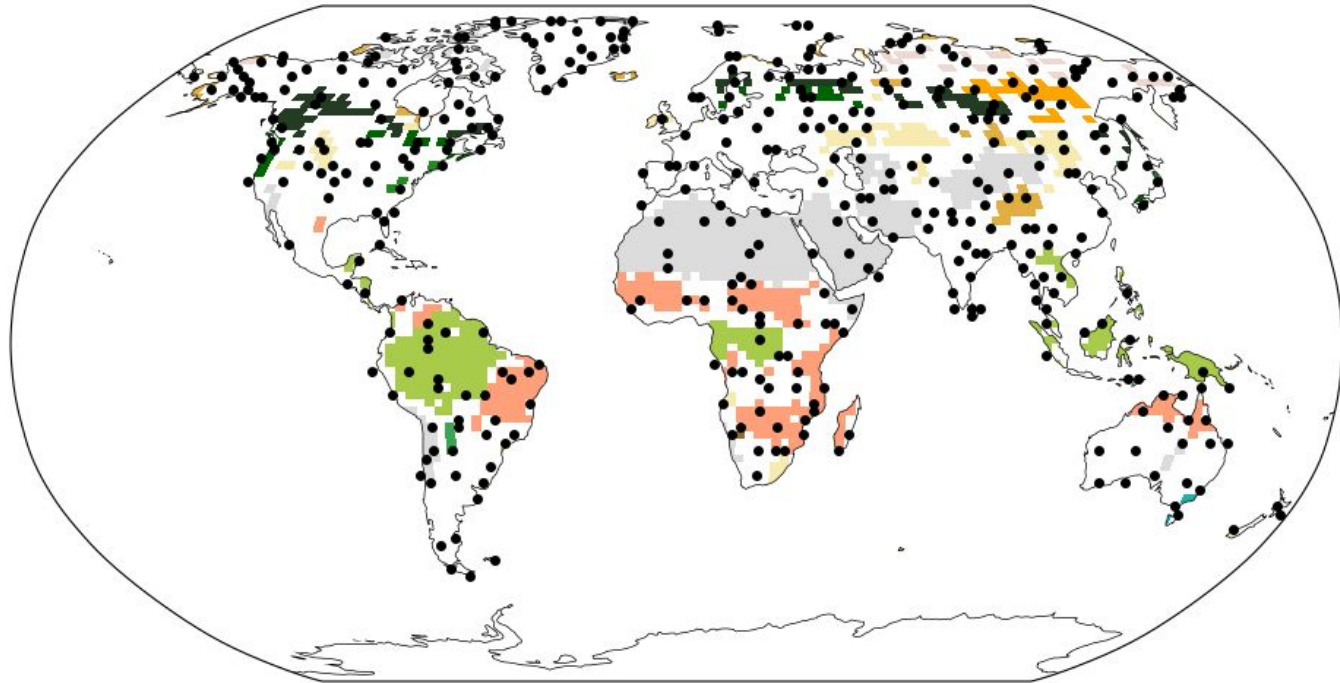
Trying to find PFT-specific gridcells

Dominant PFTs (>60% cover)



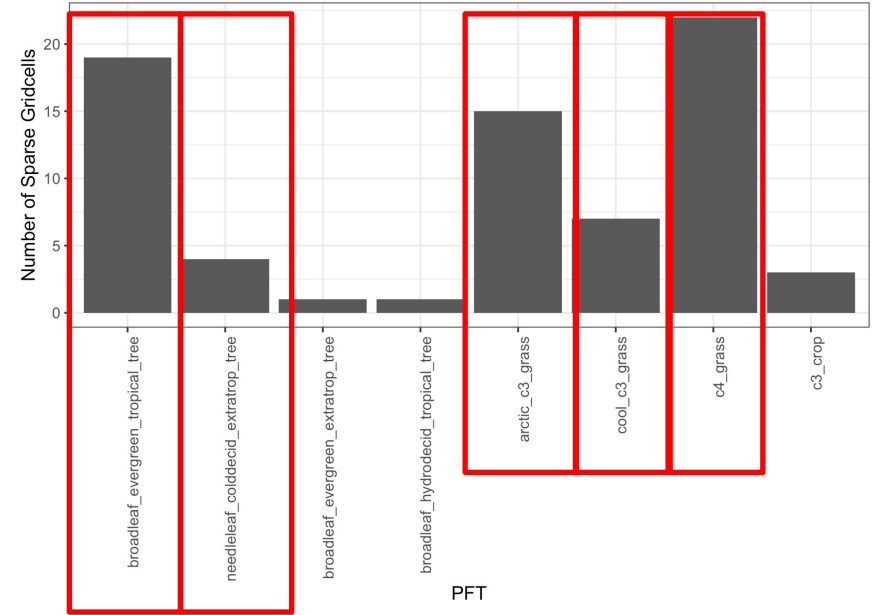
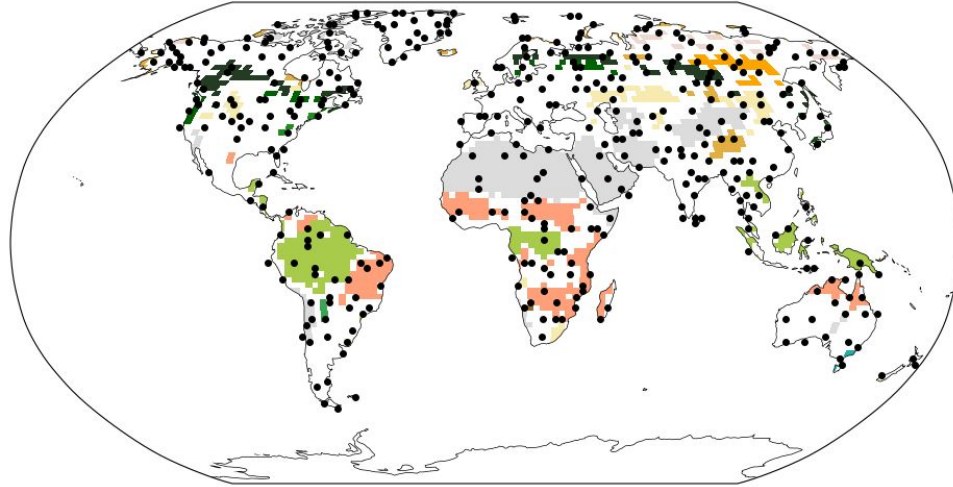
Trying to find PFT-specific gridcells

Dominant PFTs (>60% cover)

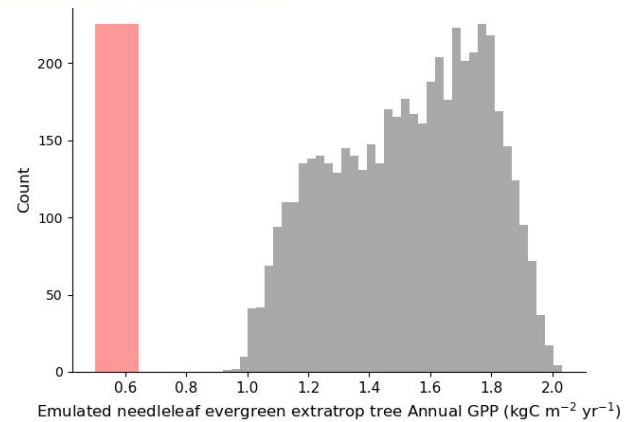
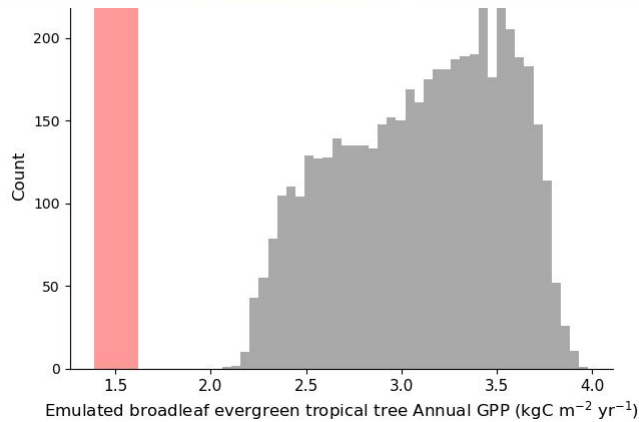
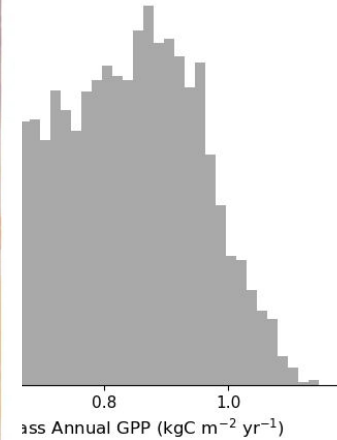
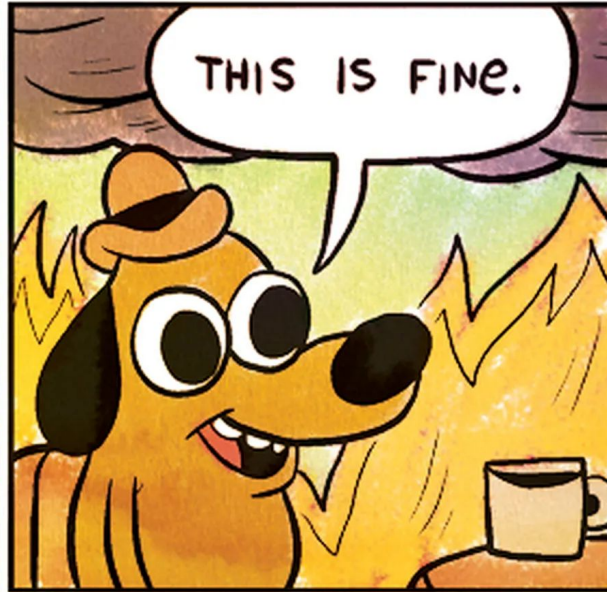


Trying to find PFT-specific gridcells

Dominant PFTs (>60% cover)



Emulate CTSM-FATES output at PFT-specific grids



Back to model configuration

FATES SP Mode

Two-stream radiation (more on this from Ryan Knox later this afternoon)

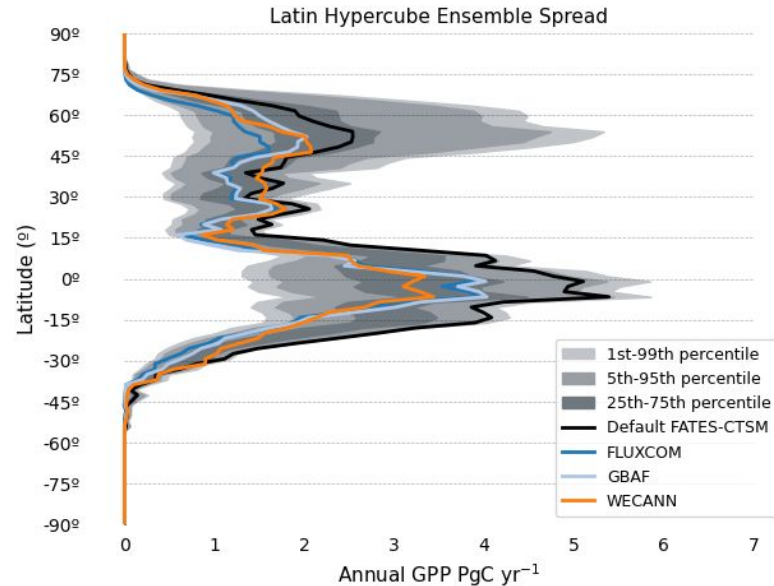
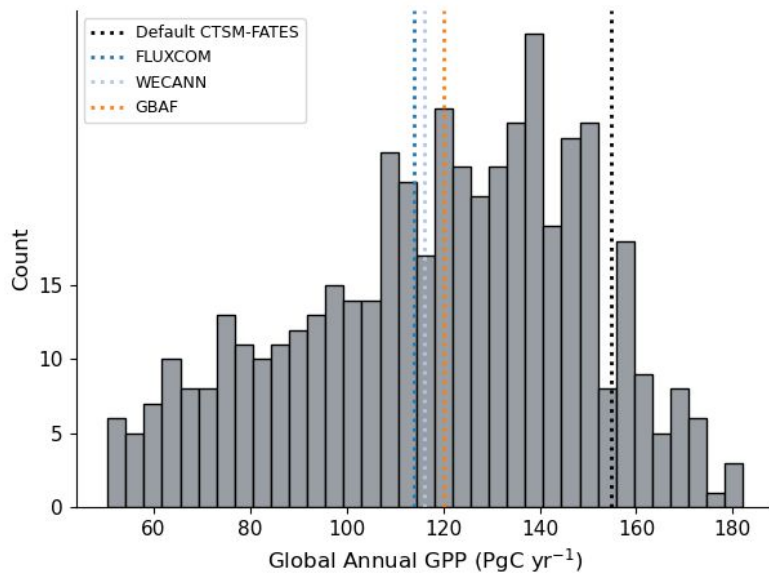
Atkin respiration

~~Medlyn stomatal conductance~~ Ball-Berry

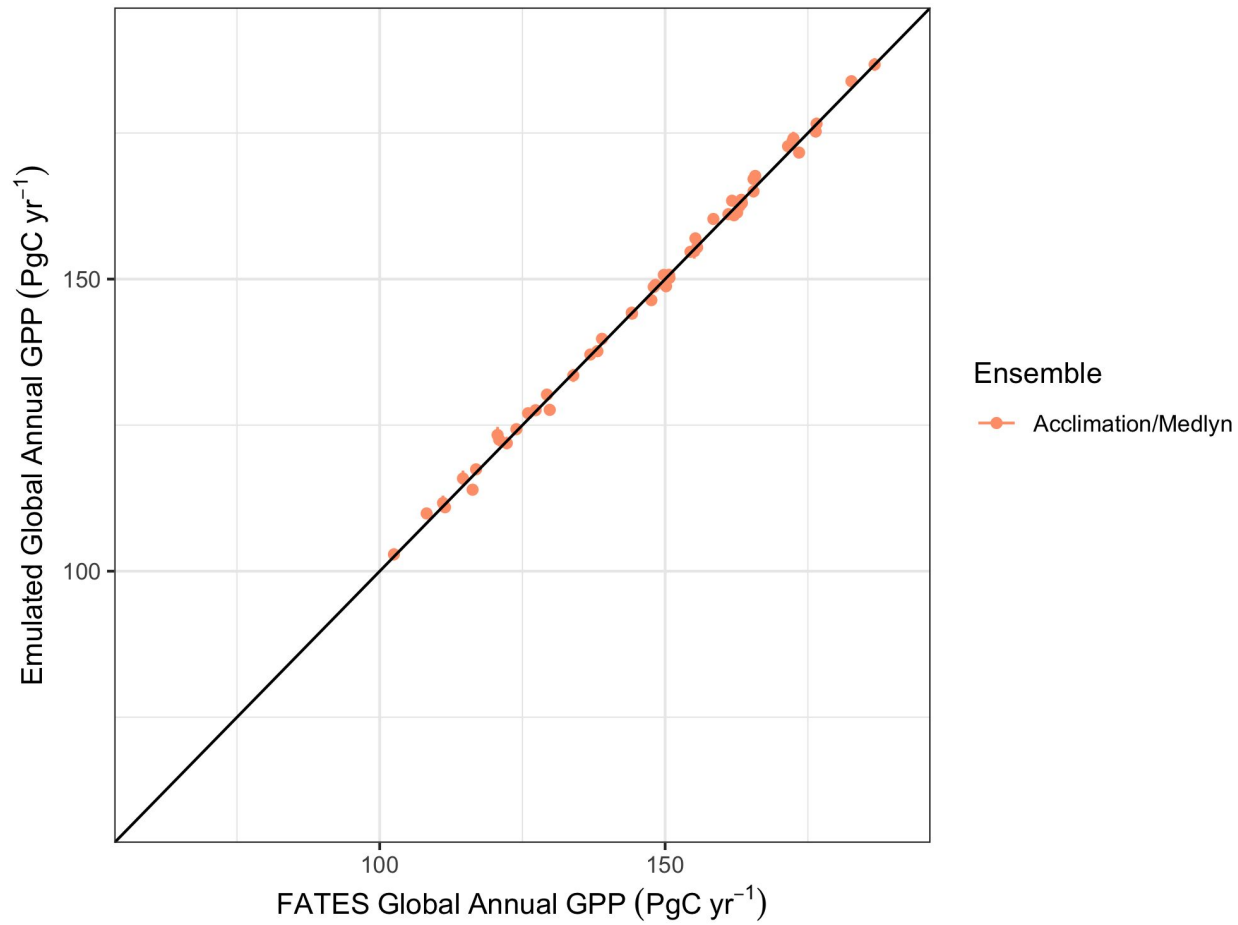
~~Kumarathunge temperature acclimation~~

6 new parameters related to activation/deactivation energy or entropy for $V_{c_{max}}$ & J_{max}

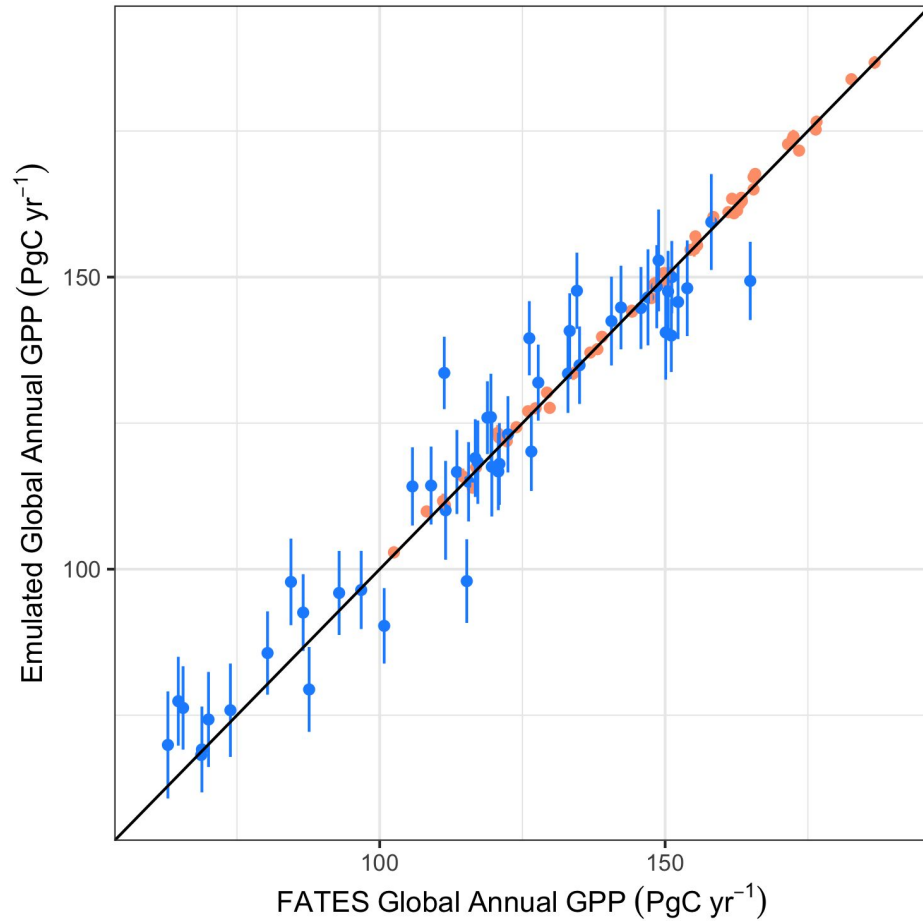
22 parameters total



Updated emulator validation

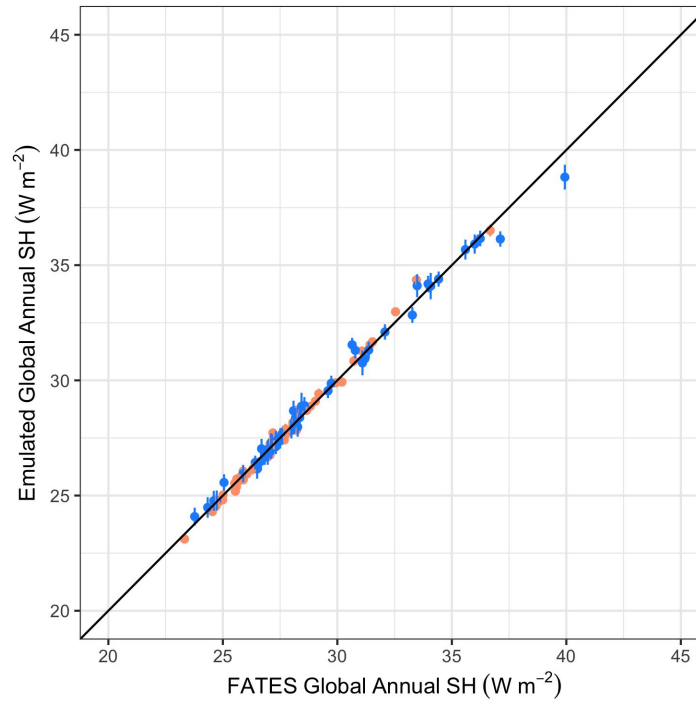
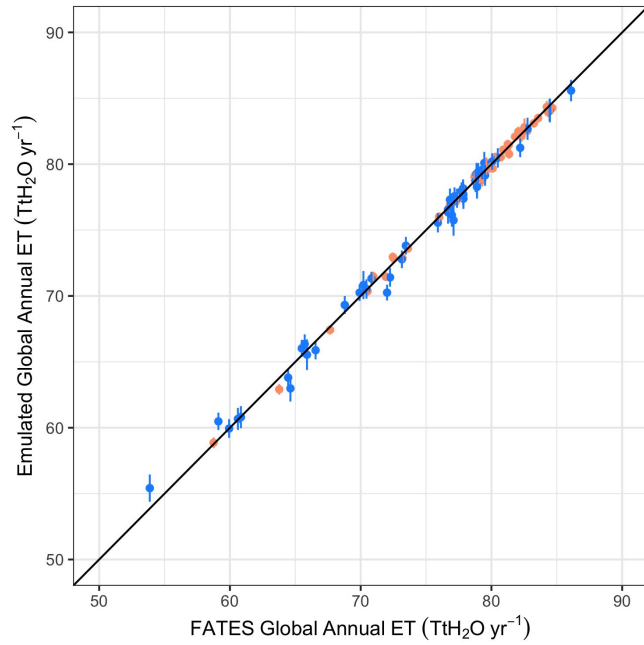


Updated emulator validation



Helped with bias but also gained some uncertainty

Updated emulator validation

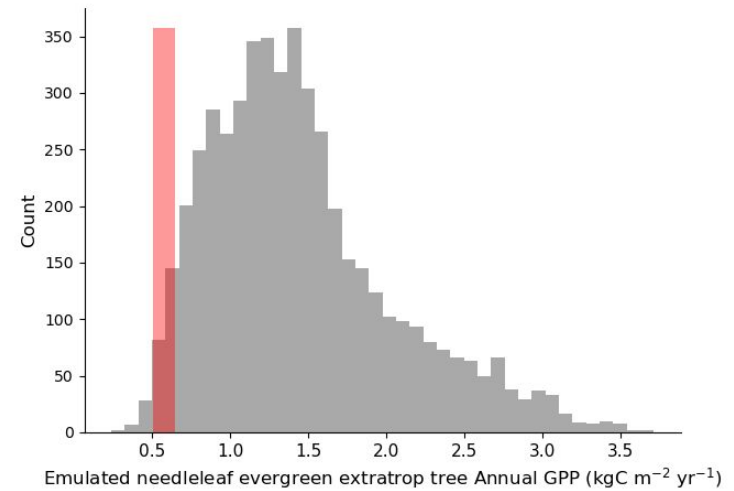
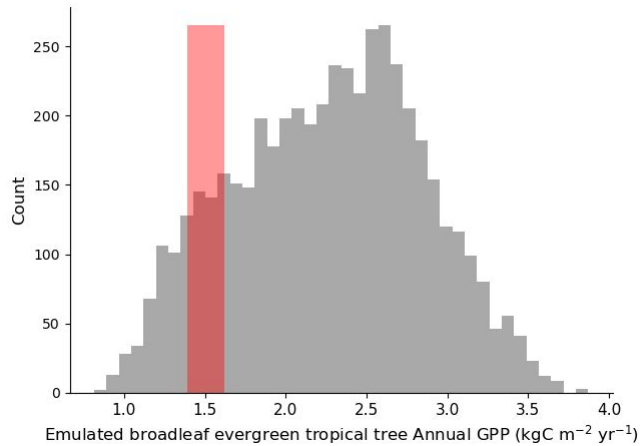
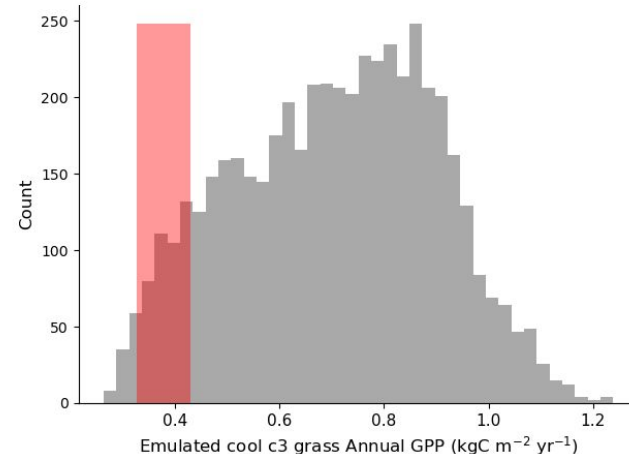
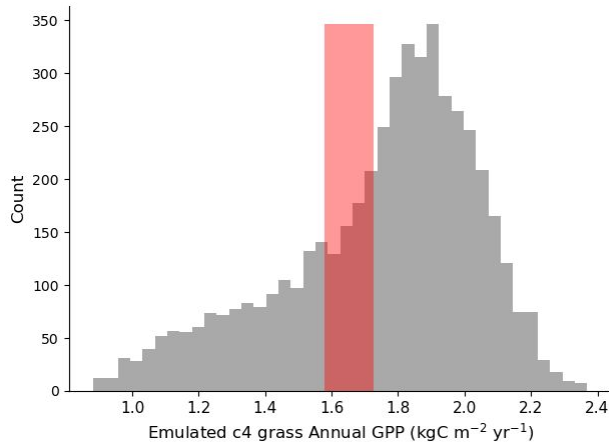


Ensemble

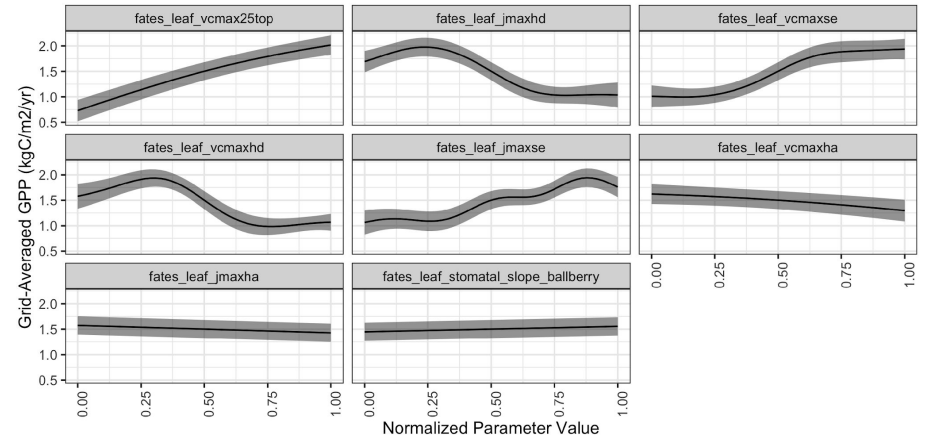
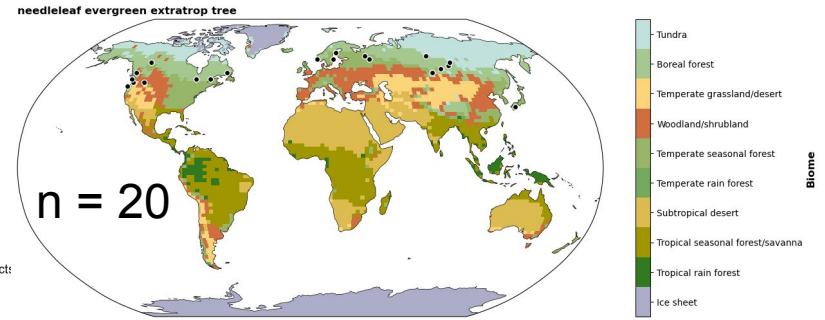
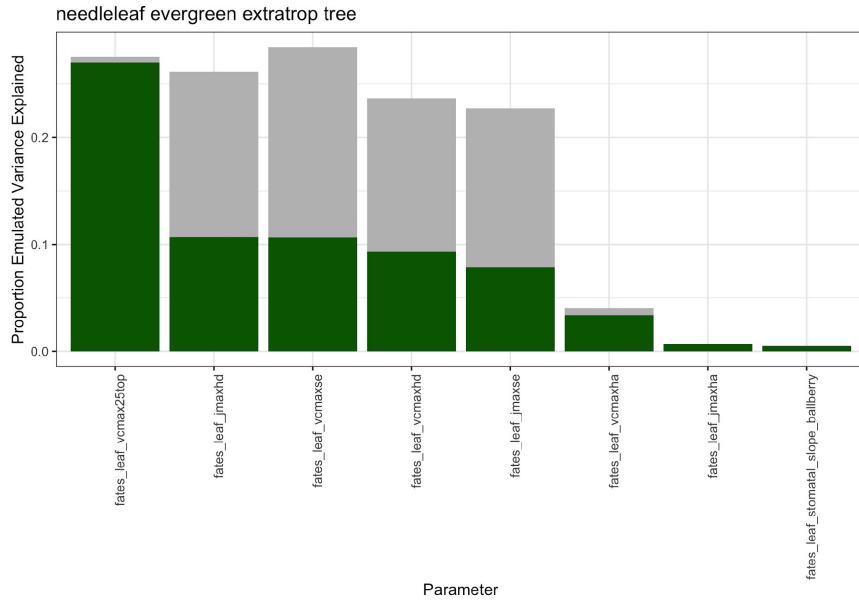
— Acclimation/Medlyn

— No Acclimation/Ball-Berry

Emulate CTSM-FATES output at PFT-specific grids (take two)

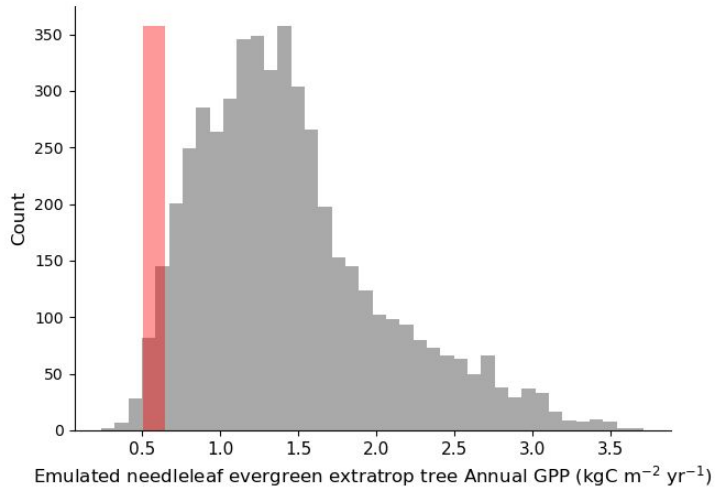


Updated PFT-specific emulators



needleleaf evergreen
extratropical tree

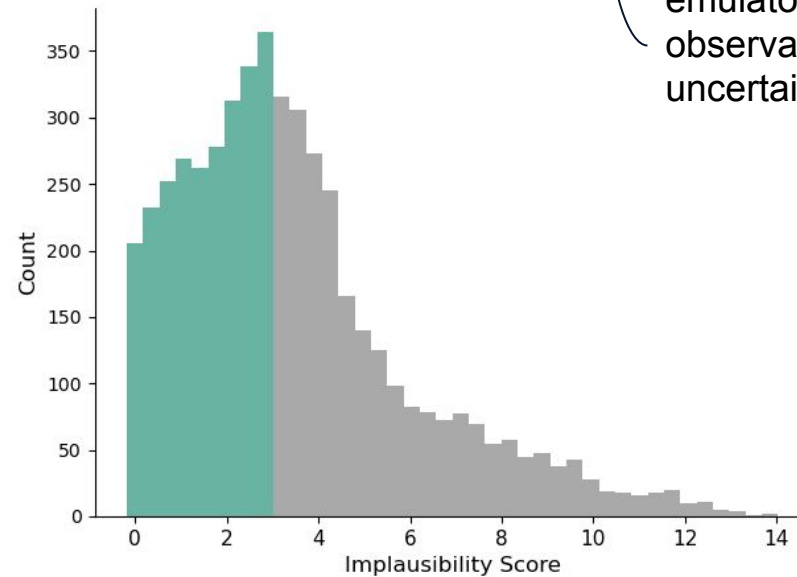
Find “plausible” parameter sets



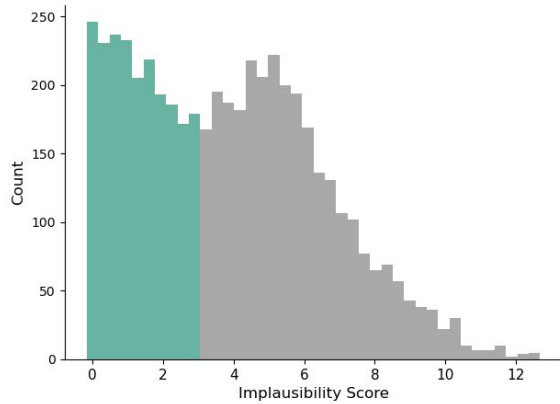
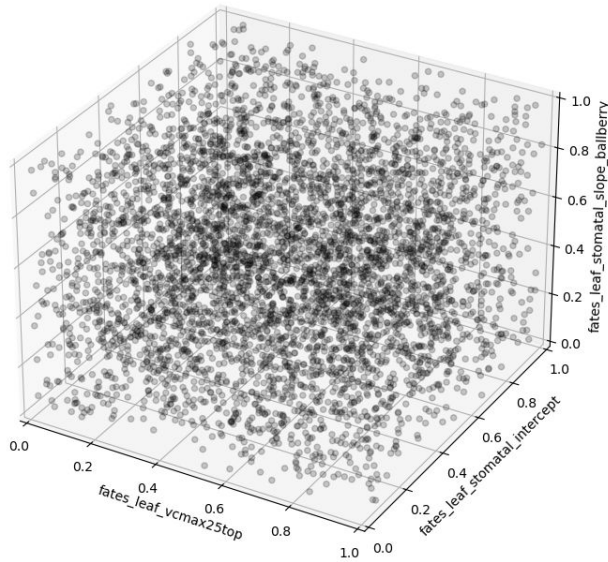
difference from observations

$$p = \frac{|x_i - \bar{X}|}{\sqrt{\sigma_i^2 + \sigma^2}}$$

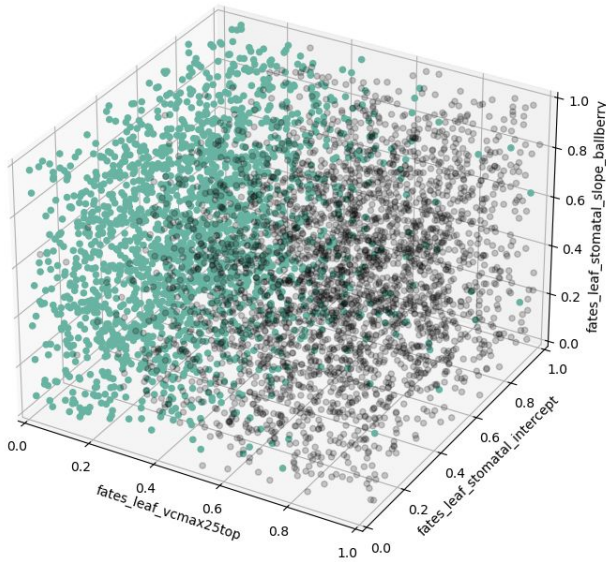
emulator and observational uncertainty



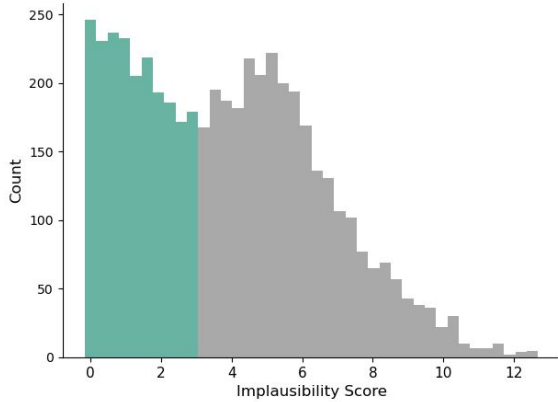
Find “plausible” parameter sets



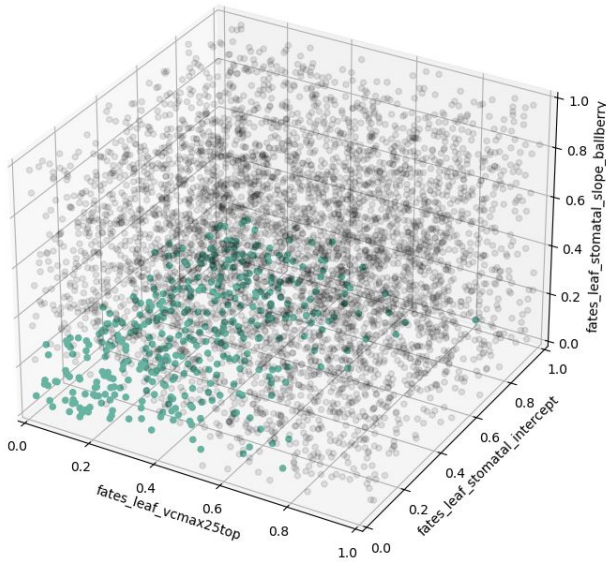
Find “plausible” parameter sets



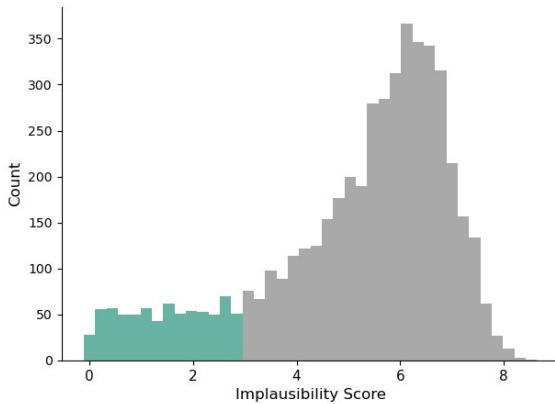
GPP output compared to observations



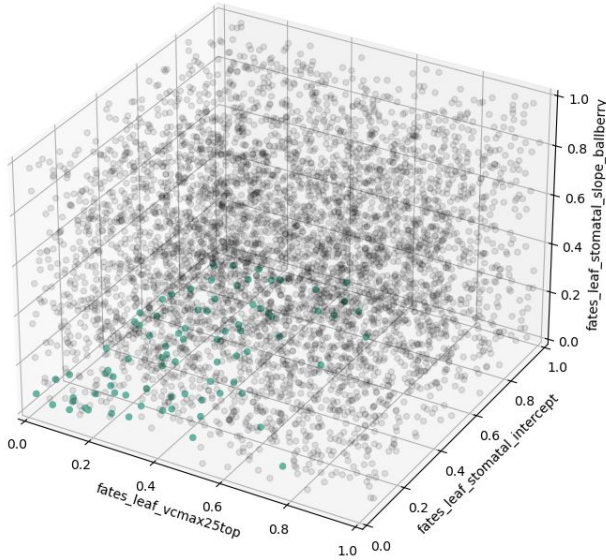
Find “plausible” parameter sets



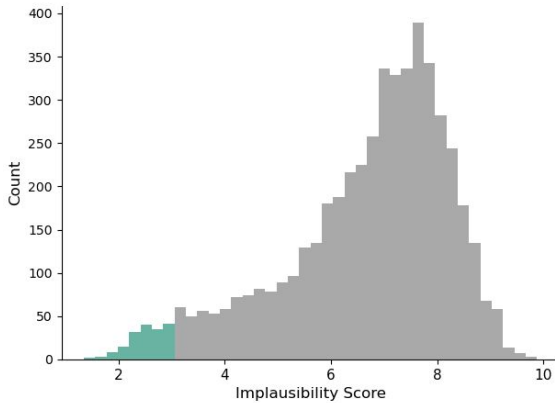
GPP output compared to observations &
SH output compared to observations



Find “plausible” parameter sets

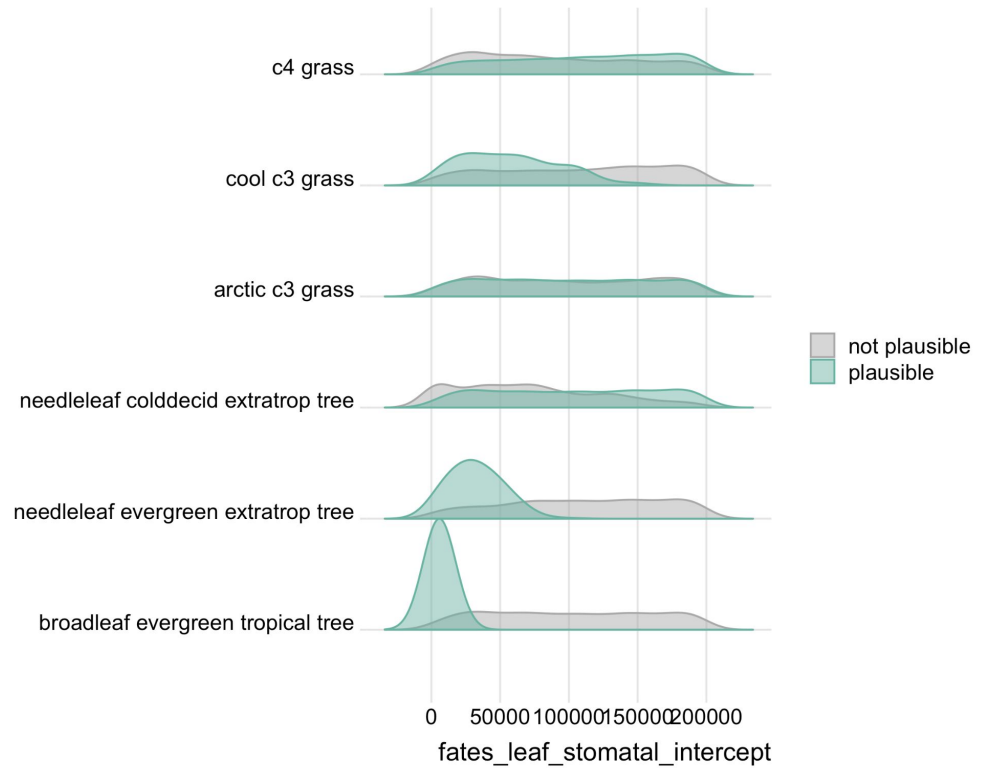
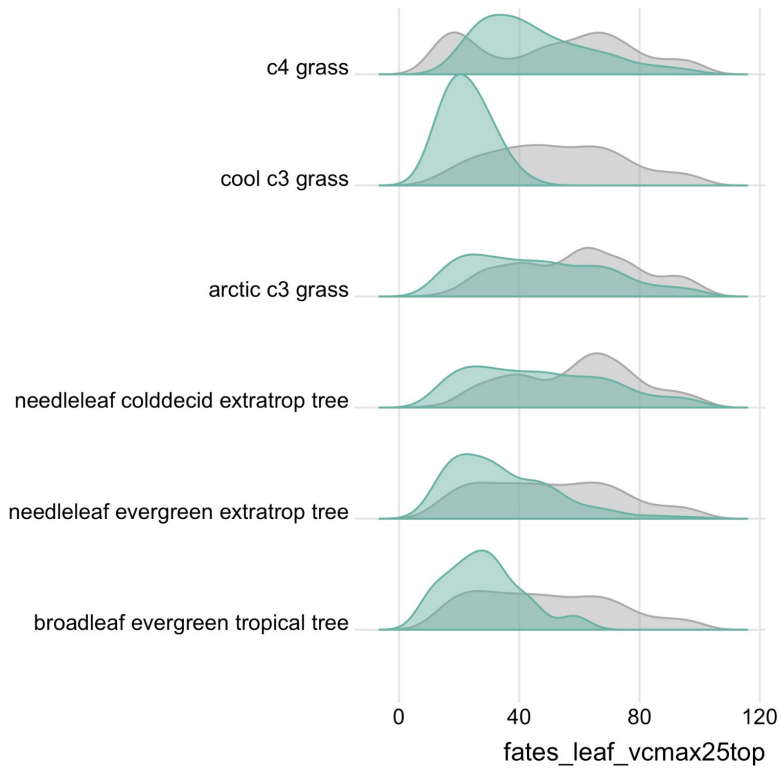


GPP output compared to observations &
SH output compared to observations &
ET output compared to observations



Find “plausible” parameter sets

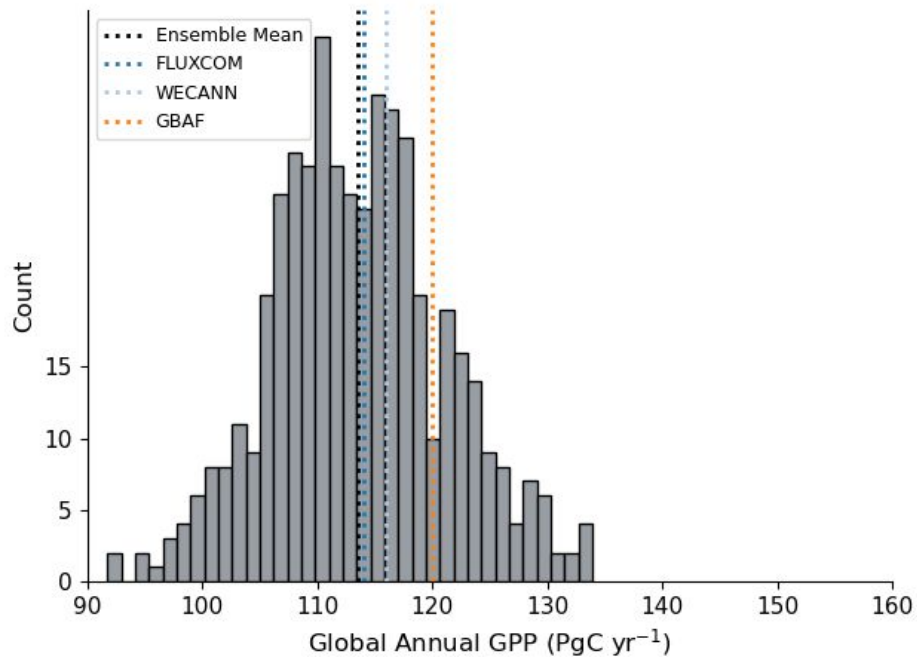
PFT



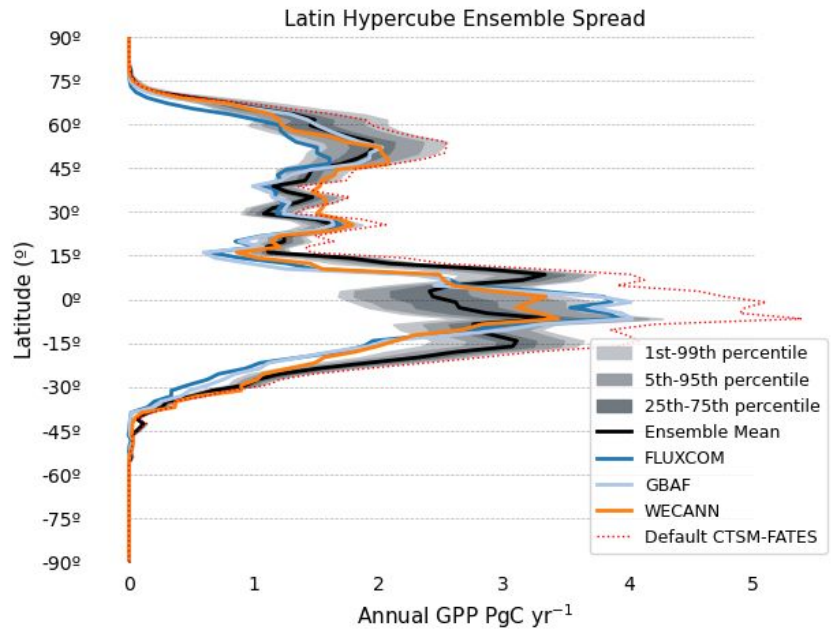
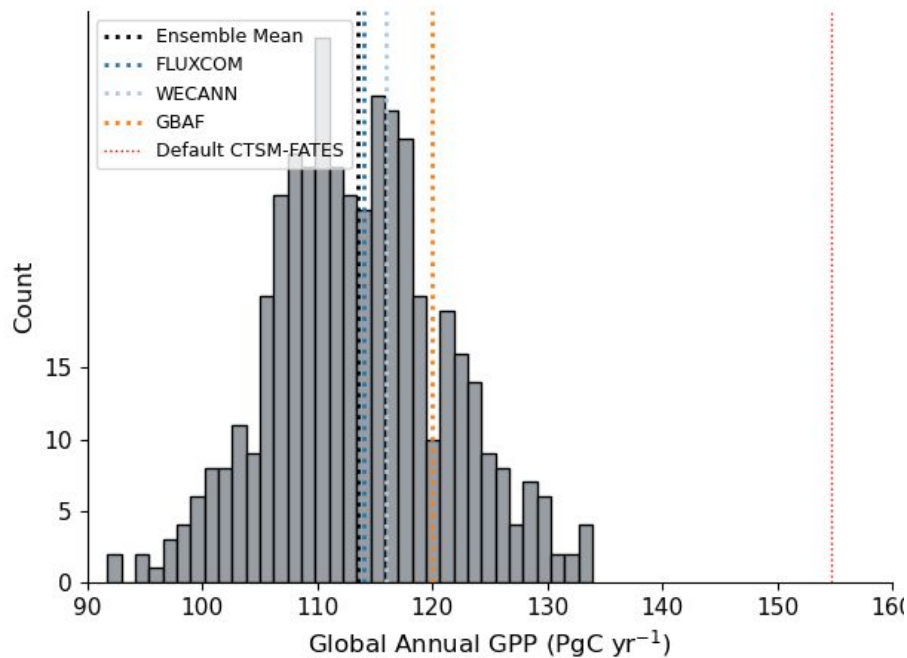
not plausible
plausible



Re-run CTSM-FATES with plausible parameter sets

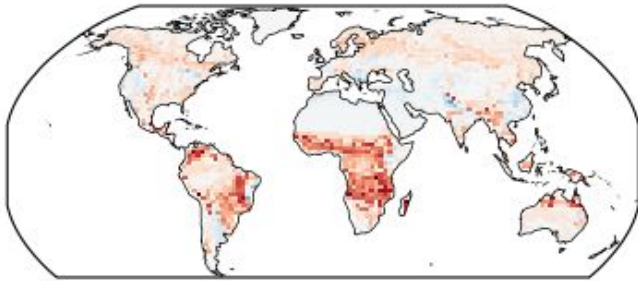


Re-run CTSM-FATES with plausible parameter sets

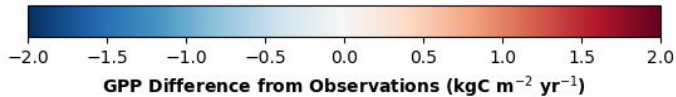
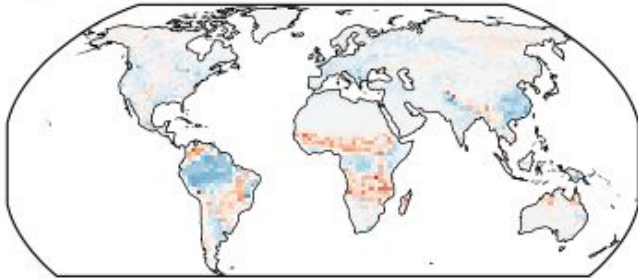


Re-run CTSM-FATES with plausible parameter sets

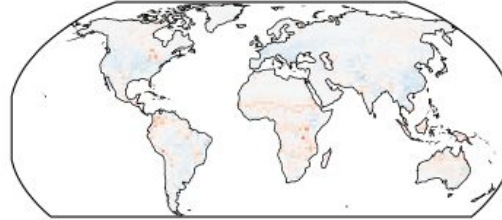
Default CTSM-FATES



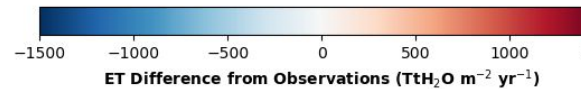
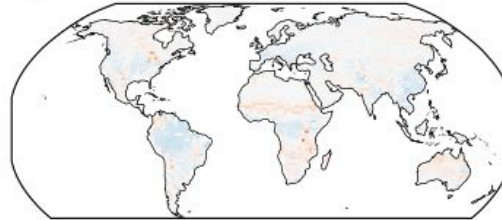
Updated CTSM-FATES



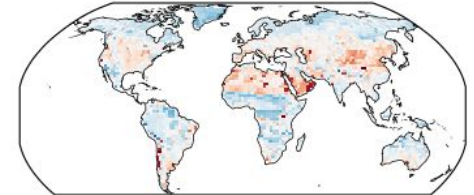
Default CTSM-FATES



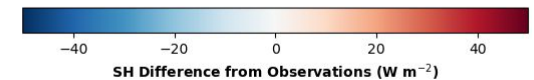
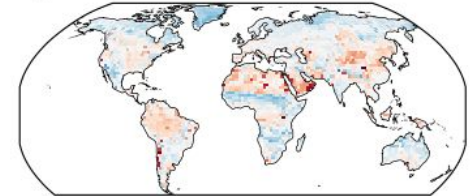
Updated CTSM-FATES



Default CTSM-FATES



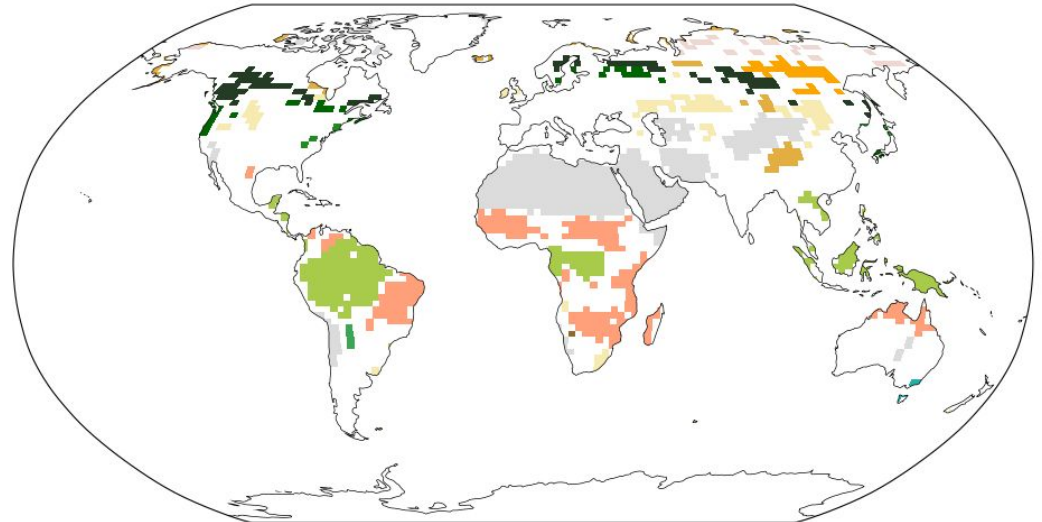
Updated CTSM-FATES



Next steps

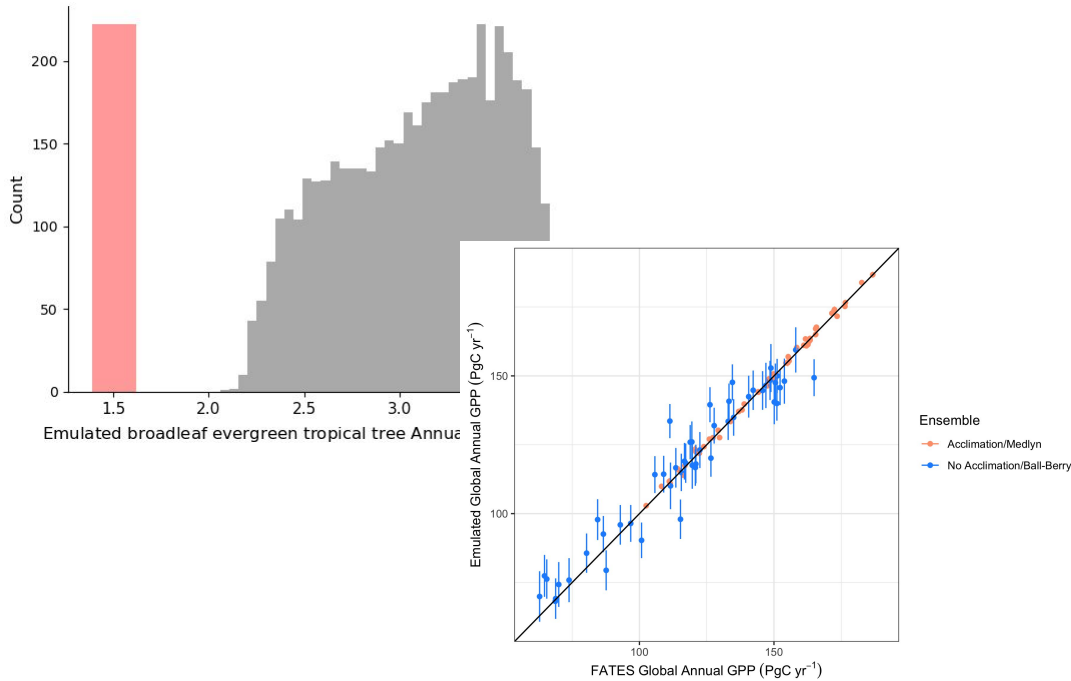
- Re-run LH ensembles with expanded PFT-specific grids for better representability
- Use more output variables to constrain parameter space (e.g., soil moisture, etc.)

Dominant PFTs (>60% cover)

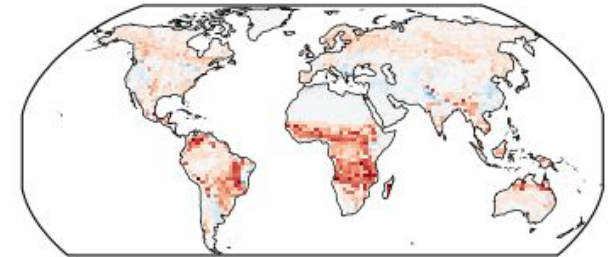


Conclusions

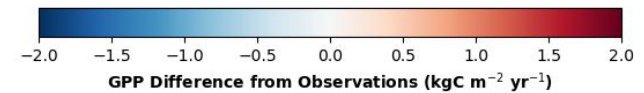
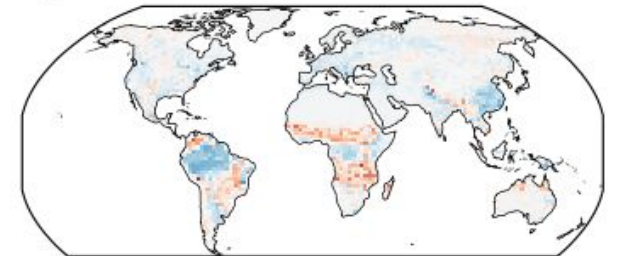
- Emulators can be used to uncover structural problems in our models
- Reduced complexity models are useful for calibrating specific model parameters and reducing confounding/interactive factors



Default CTSM-FATES



Updated CTSM-FATES





Thank you!

afoster@ucar.edu



[@LadyFortran](https://twitter.com/LadyFortran)