



The effects of an improved dynamic vegetation phenology representation in a global land surface model

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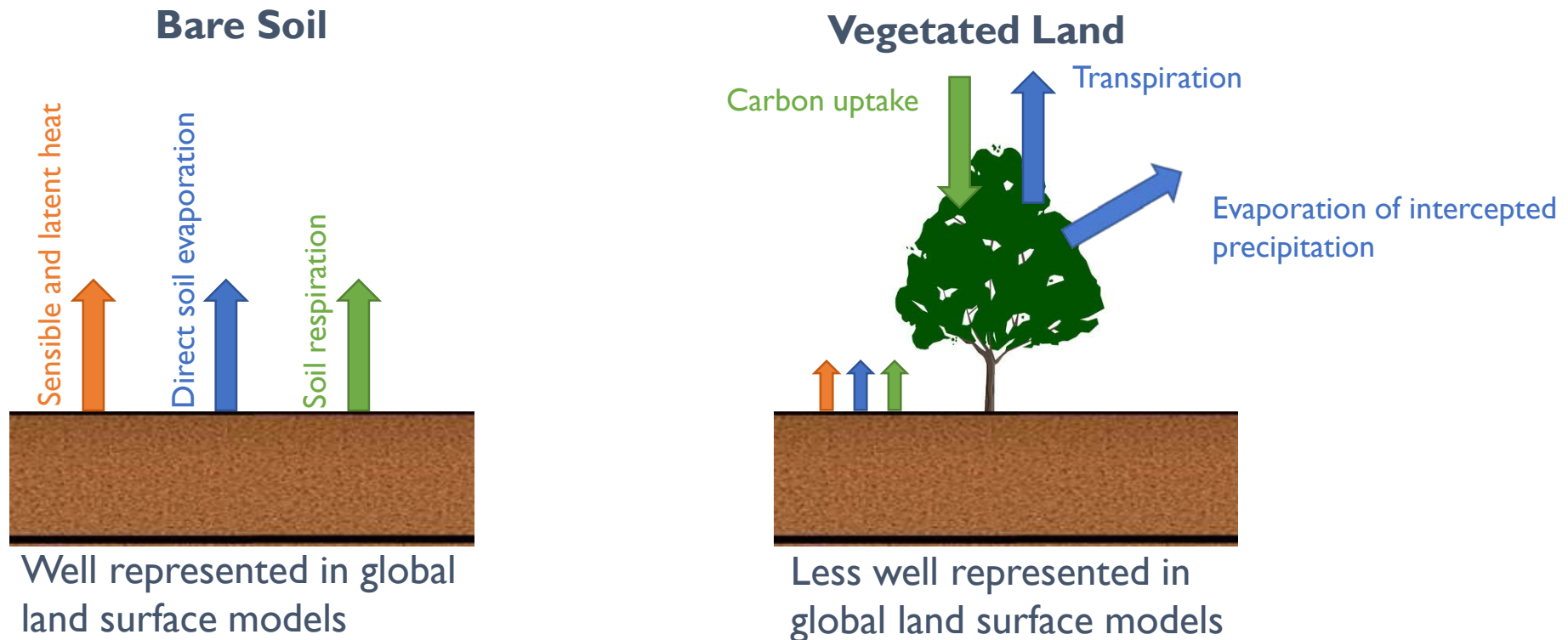
- (1) Global Modeling and Assimilation Office, NASA Goddard Space Flight Center
- (2) GESTAR, Universities Space Research Association
- (3) Science Systems and Applications Inc.

Introduction

Project Objective:

Improve estimates of terrestrial water, energy and carbon fluxes in a global land surface model through a more realistic vegetation representation

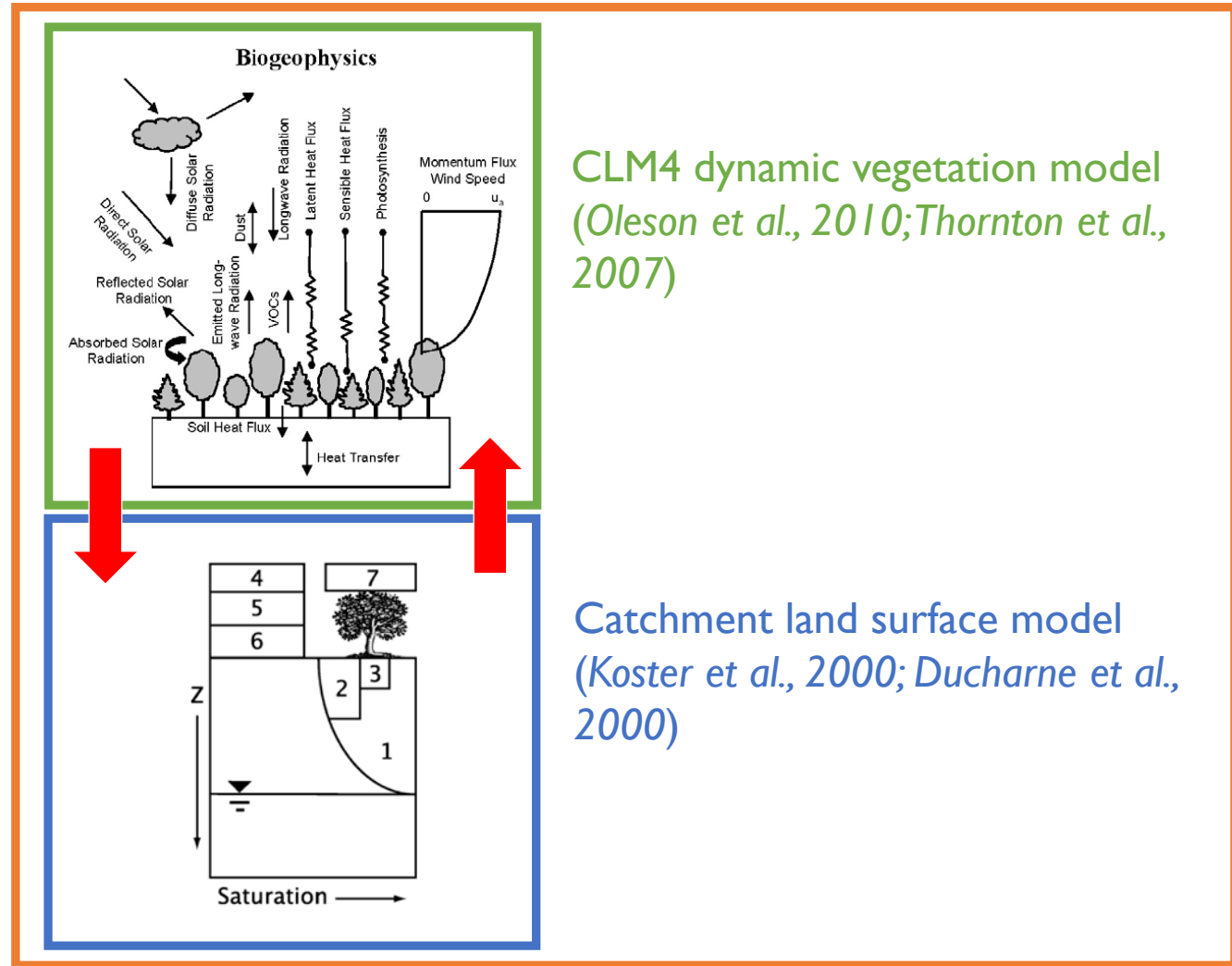
- Land surface fluxes are main mechanism of interaction between land surface and atmosphere



Motivation: Dynamic Vegetation in Catchment-CN land model

Catchment-CN (Koster and Walker, 2014):

Catchment-CN couples land surface hydrology of Catchment model with CLM4 dynamic vegetation model allowing full feedback.

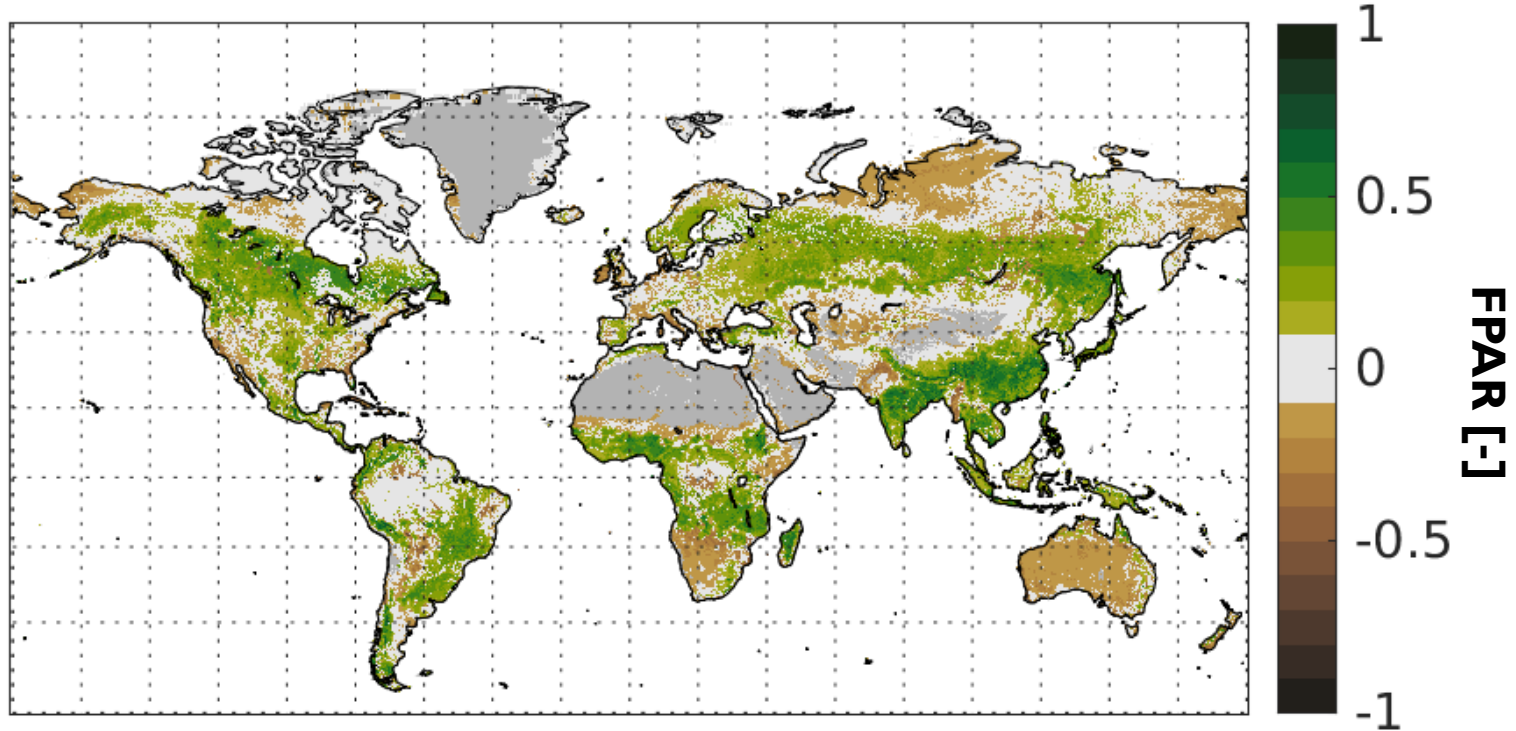


CLM4 dynamic vegetation model
(Oleson et al., 2010; Thornton et al., 2007)

Catchment land surface model
(Koster et al., 2000; Ducharne et al., 2000)

Motivation: Skill of Catchment-CN simulations

Catchment-CN FPAR – MODIS FPAR (2003-2009)



- Mean bias of Catchment-CN simulated Fraction of absorbed Photosynthetically Active Radiation (FPAR) against MODIS FPAR for 2003 - 2009
→ model generally overestimates vegetation activity



Methodology: Strategies for model Error Reduction

- Strategies to reduce model error
 - (1) Changing model structure
 - (2) Calibrating model parameters



Methodology: Strategies for model Error Reduction

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How effective is parameter calibration (alone) at reducing model error and improving realism of modeled vegetation activity?



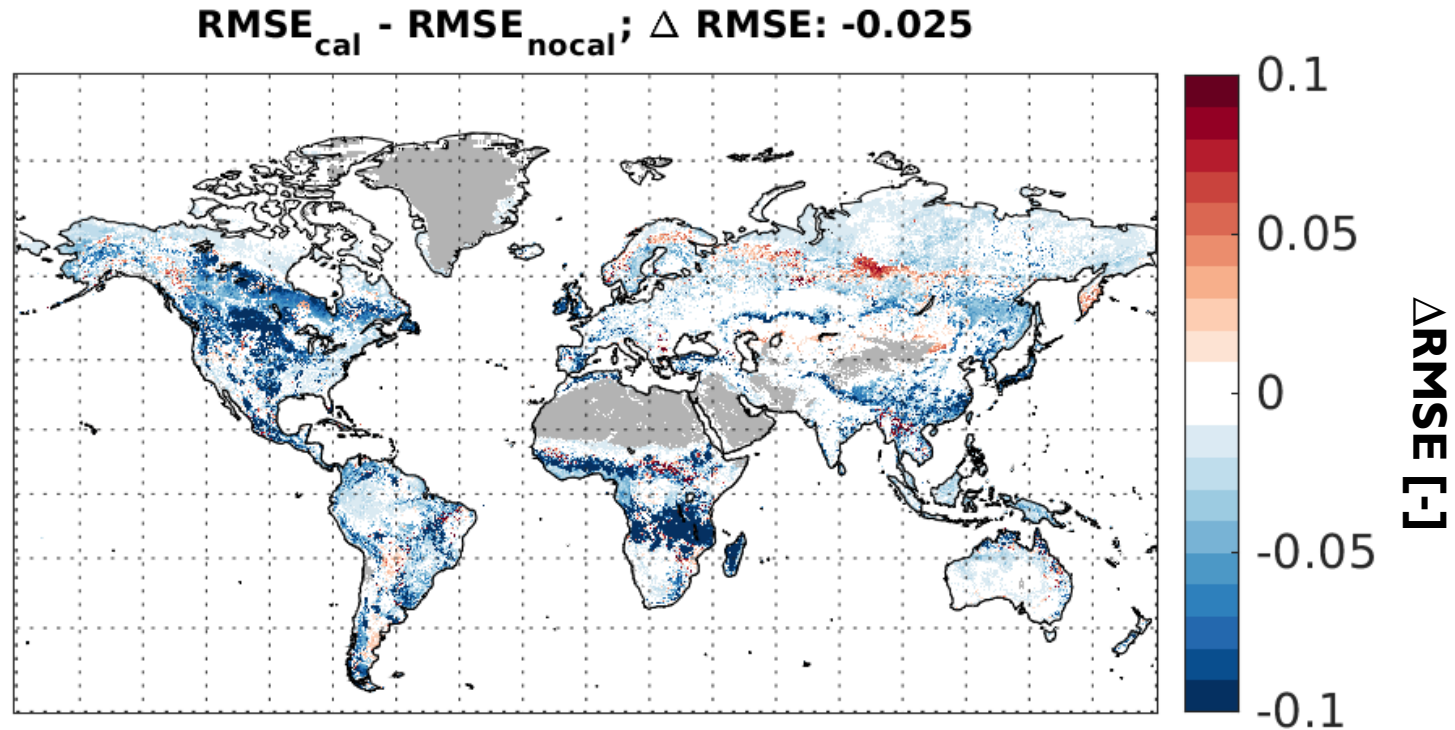
Methodology: Vegetation Parameter Estimation

Objective: Use MODIS FPAR observations to optimize Catchment-CN vegetation parameters.

- Calibration parameters:
 - Timing of phenological cycle (seasonal variability)
 - Photosynthetic efficiency (bias)
 - Carbon storage/allocation (interannual variability)
- Calibration approach:
 - Calibration period: 2003 – 2010
 - Cost function: FPAR RMSE.
 - Particle swarm (ensemble-based) optimization at selected calibration locations
 - Separate parameters for each Plant Functional Type (PFT)
 - Allow 3 parameter sets for each PFT to introduce intra-PFT variability

Results: Impact on modeled FPAR

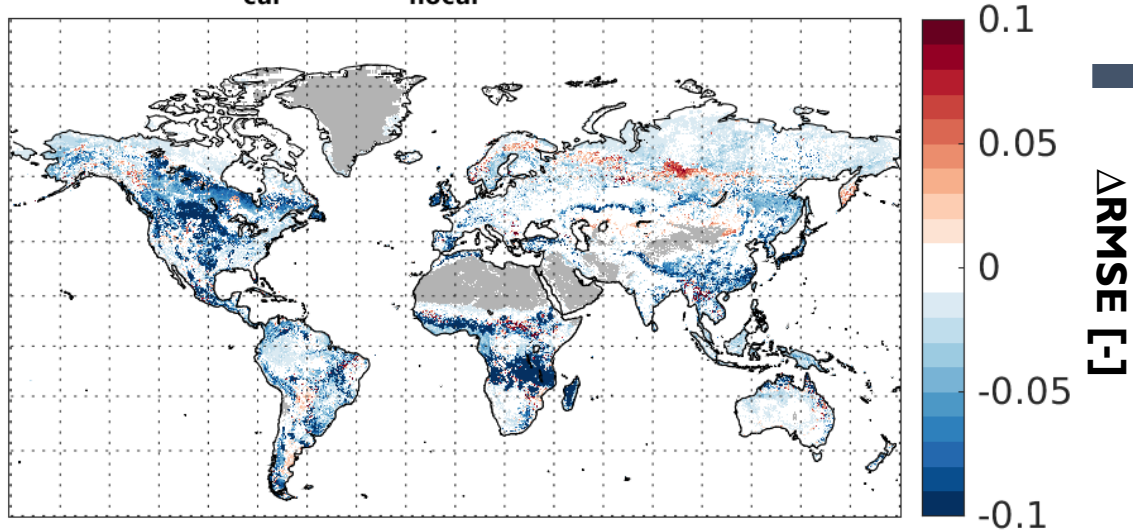
- Global model simulation with new vegetation parameters evaluated against MODIS FPAR



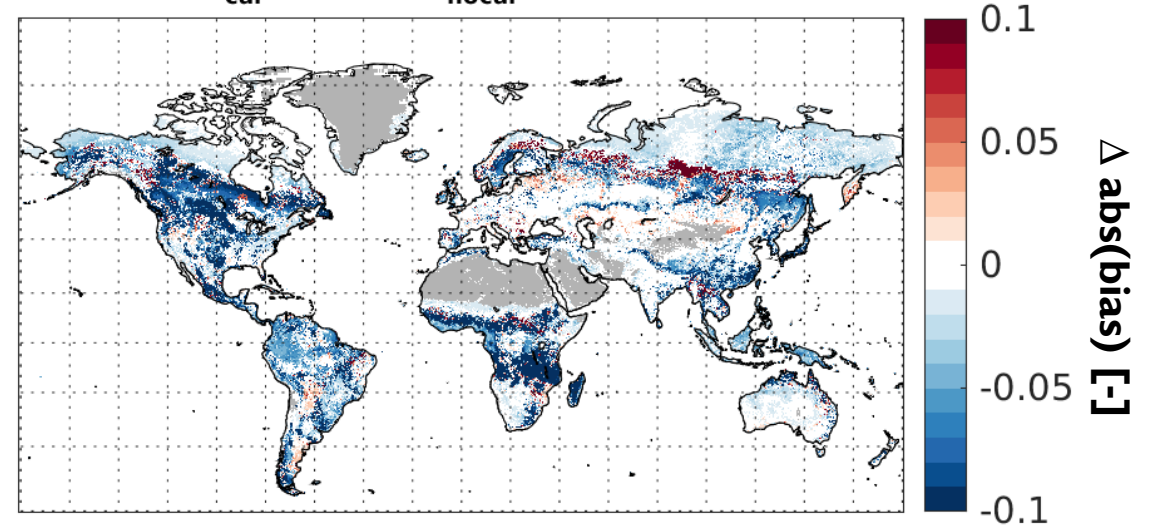
Conclusion 1: Parameter estimation consistently reduces model RMSE with respect to MODIS FPAR

Results: Impact on modeled FPAR

$RMSE_{cal} - RMSE_{nocal}; \Delta RMSE: -0.025$

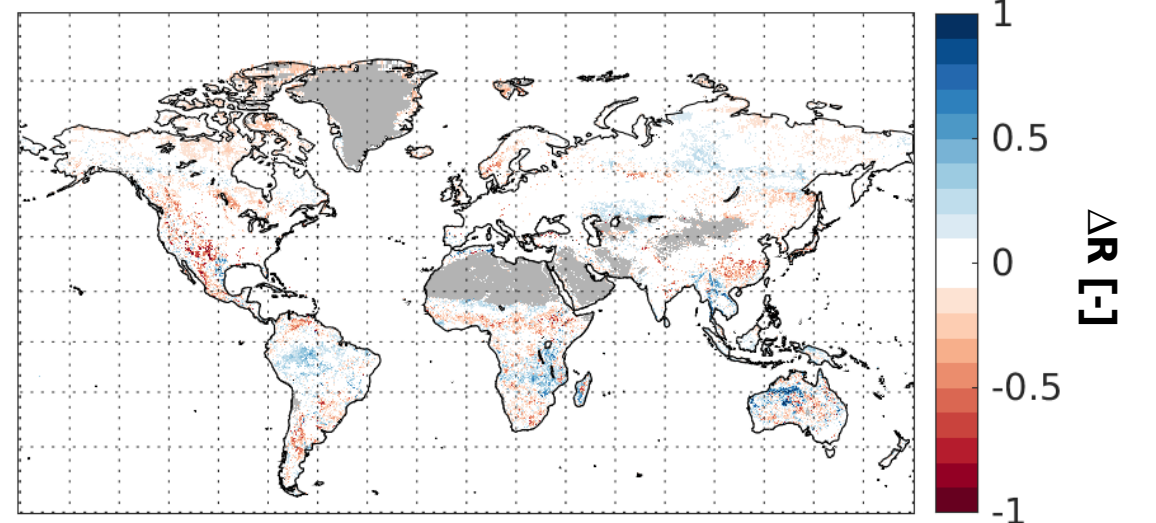


$abs(bias)_{cal} - abs(bias)_{nocal}; \Delta abs(bias): -0.035$



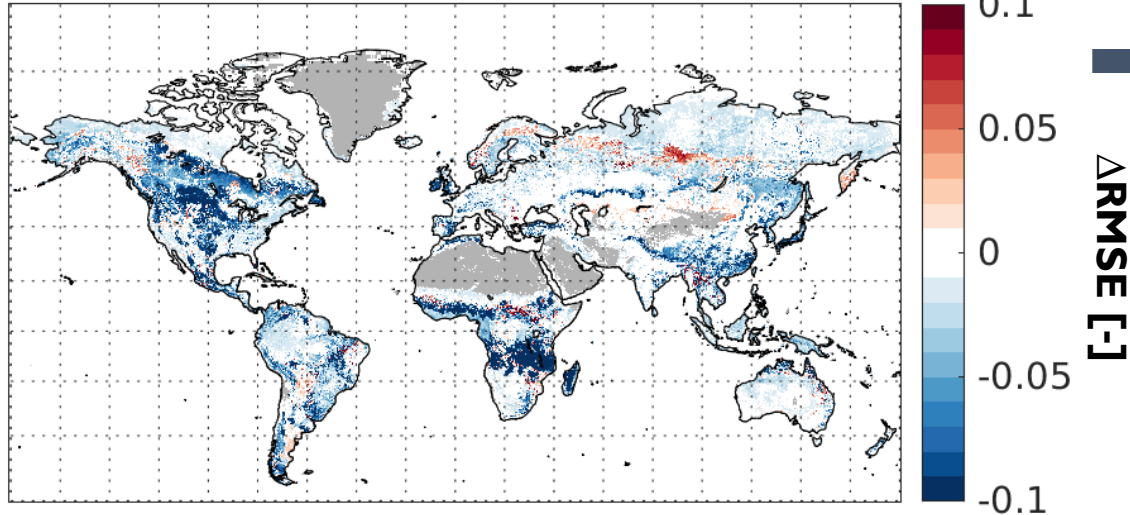
- Reduction in RMSE is driven by bias reduction
- Dominance of bias in model error skews calibration towards efficiency parameters

$R_{cal} - R_{nocal}; \Delta R: -0.0075$

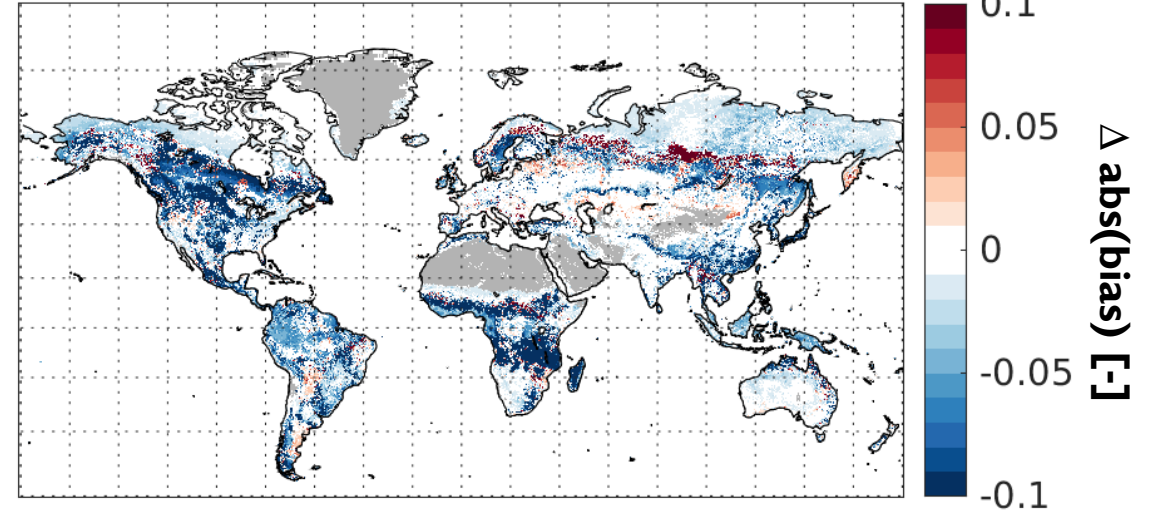


Results: Impact on modeled FPAR

$RMSE_{cal} - RMSE_{nocal}; \Delta RMSE: -0.025$

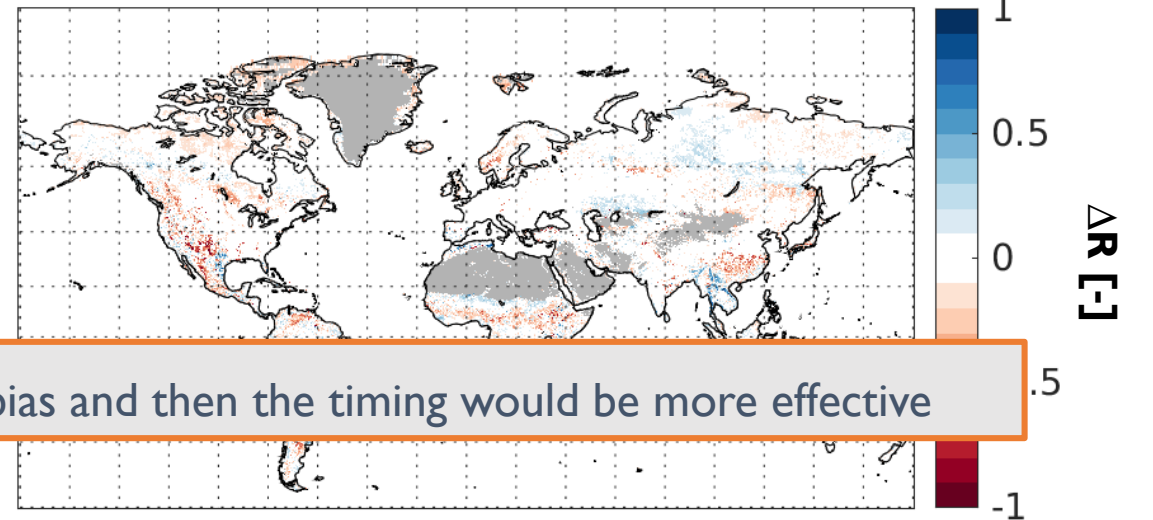


$abs(bias)_{cal} - abs(bias)_{nocal}; \Delta abs(bias): -0.035$



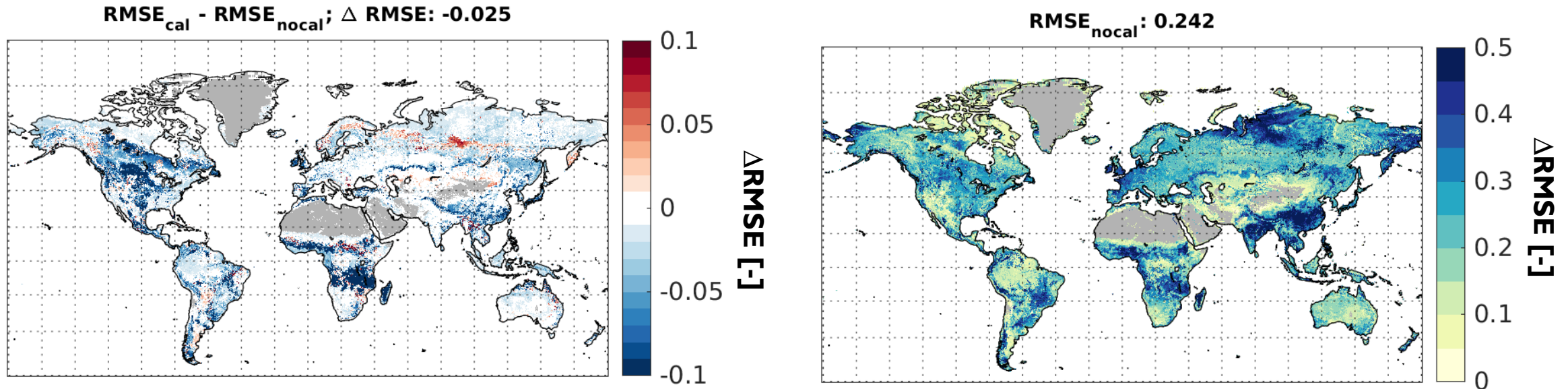
- Reduction in RMSE is driven by bias reduction
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$R_{cal} - R_{nocal}; \Delta R: -0.0075$



Conclusion 2: Two-stage calibration to address first the bias and then the timing would be more effective

Results: Impact on modeled FPAR



- Calibration is effective, but skill changes are small relative to total error

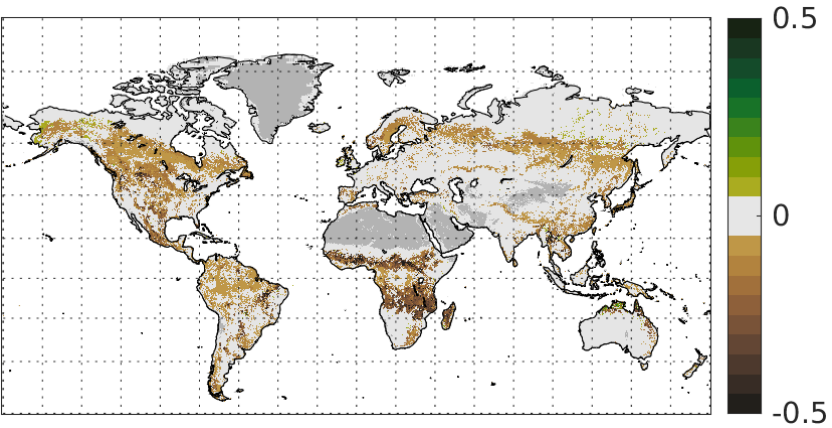
Conclusion 3: Parameter estimation can only reduce a part of the total model error, model structure changes are needed to address remaining error

- Processes to include: plant hydraulics or anthropogenic processes

Results: Impact on Ecohydrology

Calibrated Catchment-CN minus uncalibrated Catchment-CN

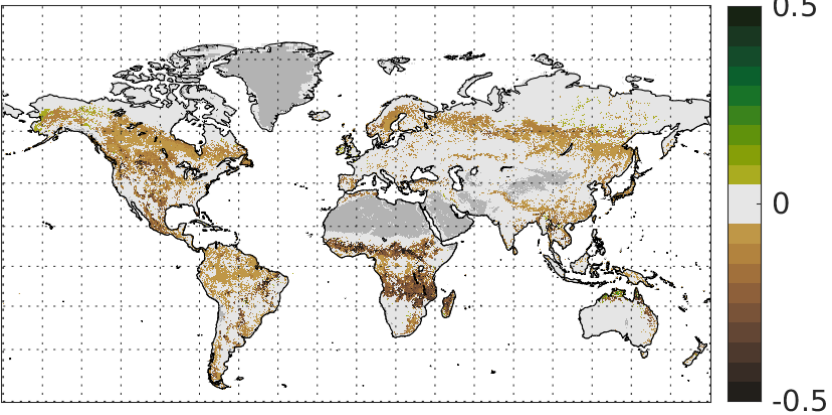
FPAR [-]



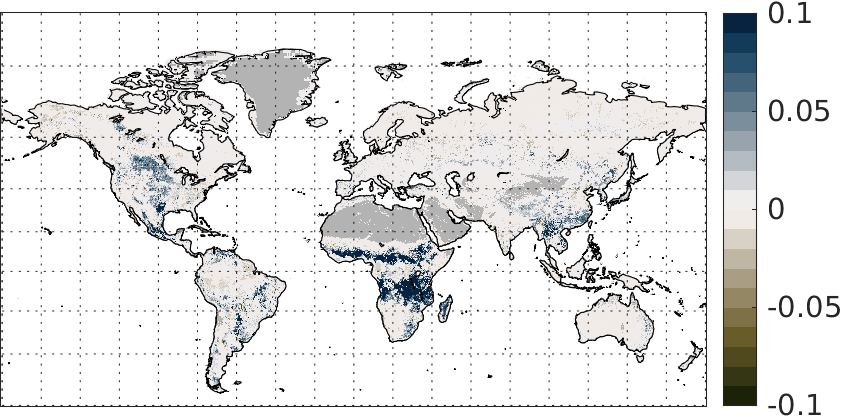
Results: Impact on Ecohydrology

Calibrated Catchment-CN minus uncalibrated Catchment-CN

FPAR [-]



Surface Soil Moisture [$\text{m}^3 \text{m}^{-3}$]

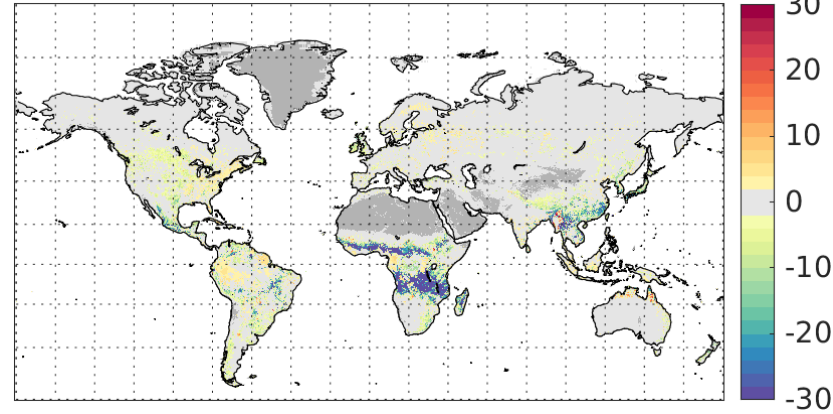
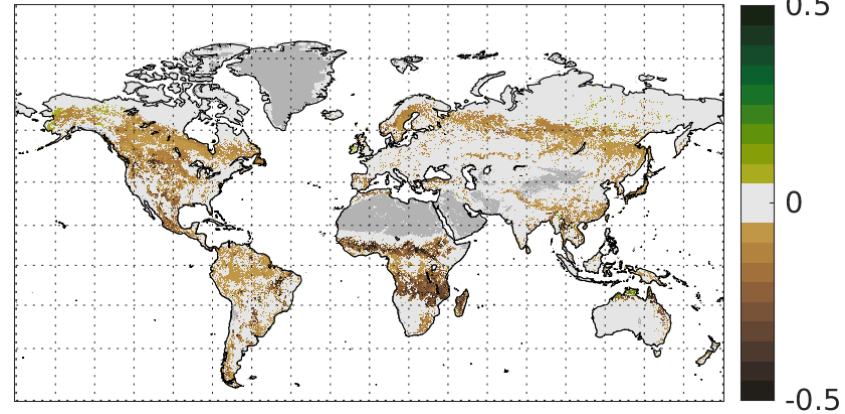


Results: Impact on Ecohydrology

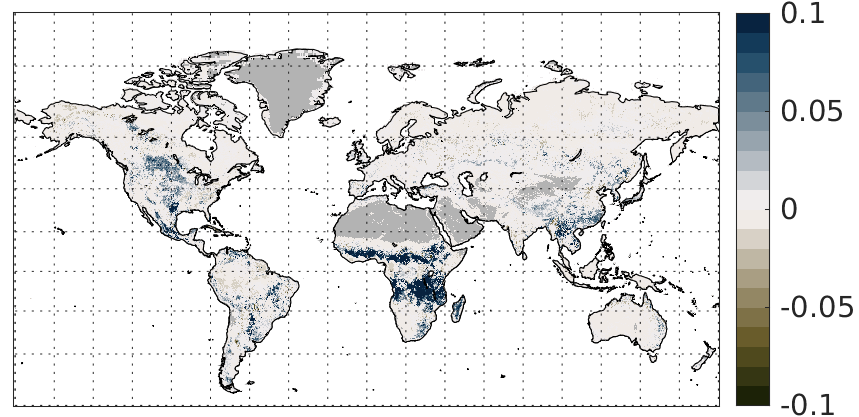
Calibrated Catchment-CN minus uncalibrated Catchment-CN

FPAR [-]

Latent Heat Flux [W m^{-2}]



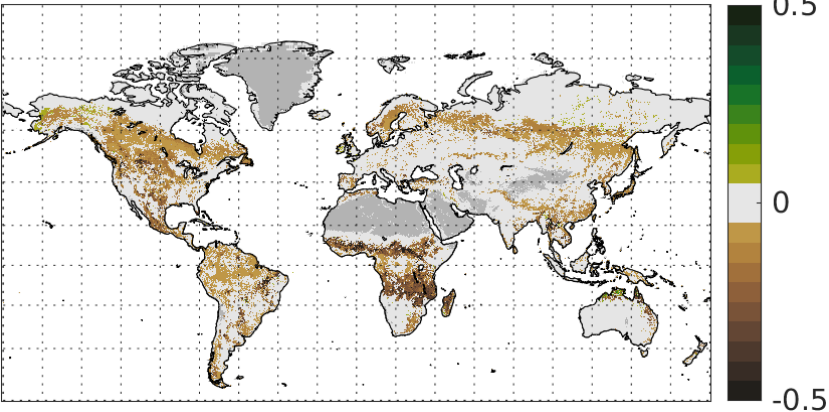
Surface Soil Moisture [$\text{m}^3 \text{m}^{-3}$]



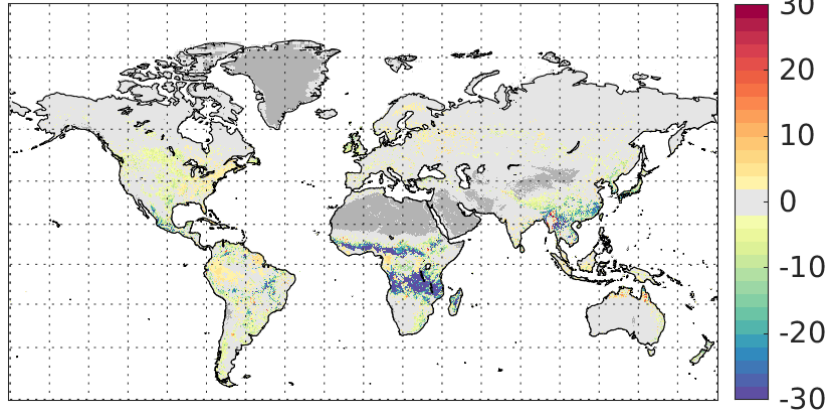
Results: Impact on Ecohydrology

Calibrated Catchment-CN minus uncalibrated Catchment-CN

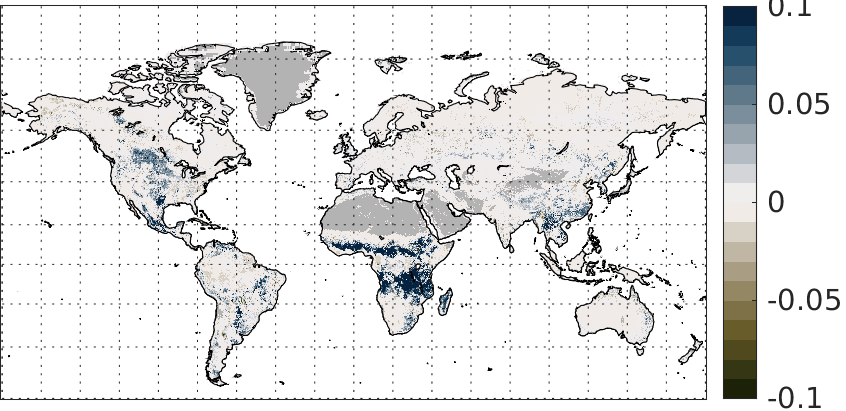
FPAR [-]



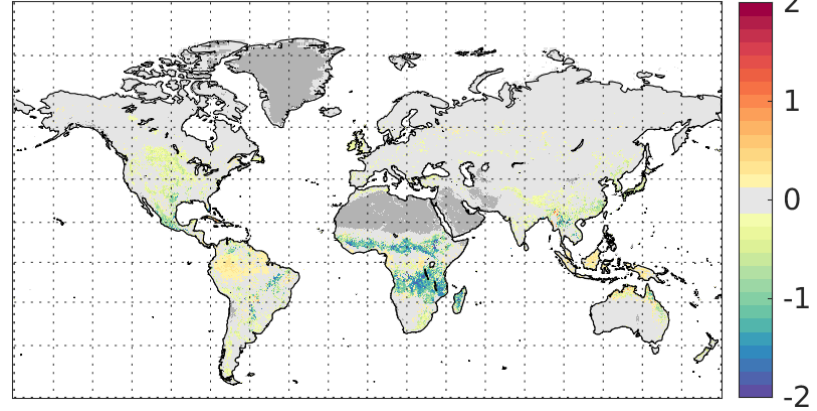
Latent Heat Flux [W m^{-2}]



Surface Soil Moisture [$\text{m}^3 \text{m}^{-3}$]



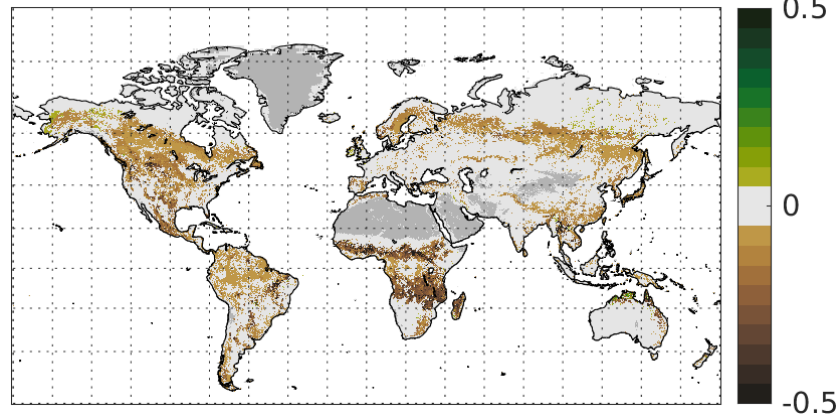
Transpiration [mm d^{-1}]



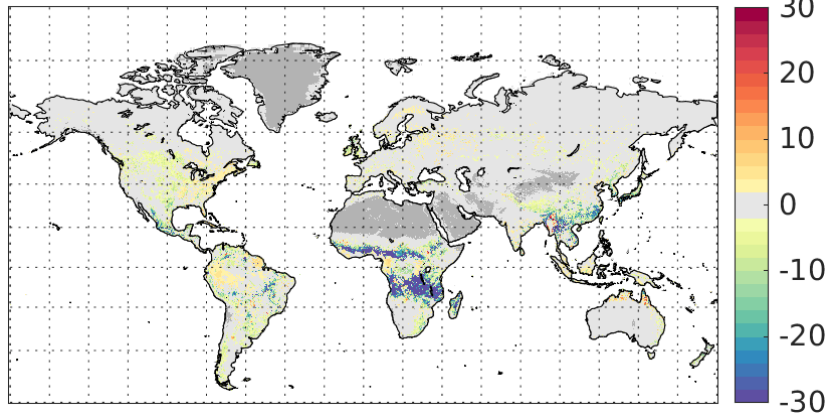
Results: Impact on Ecohydrology

Calibrated Catchment-CN minus uncalibrated Catchment-CN

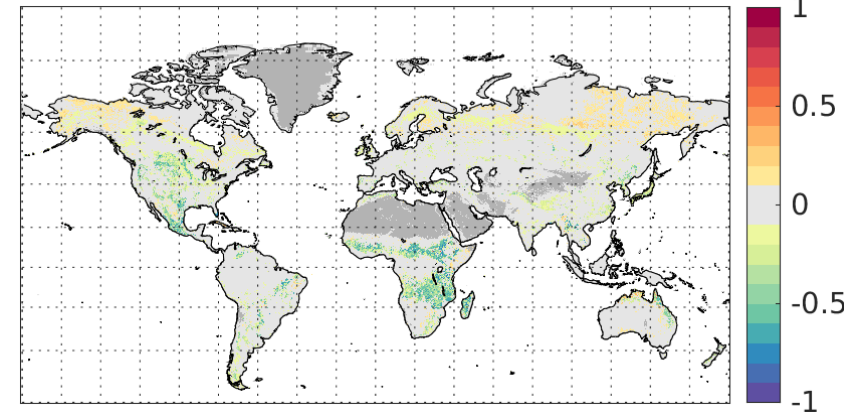
FPAR [-]



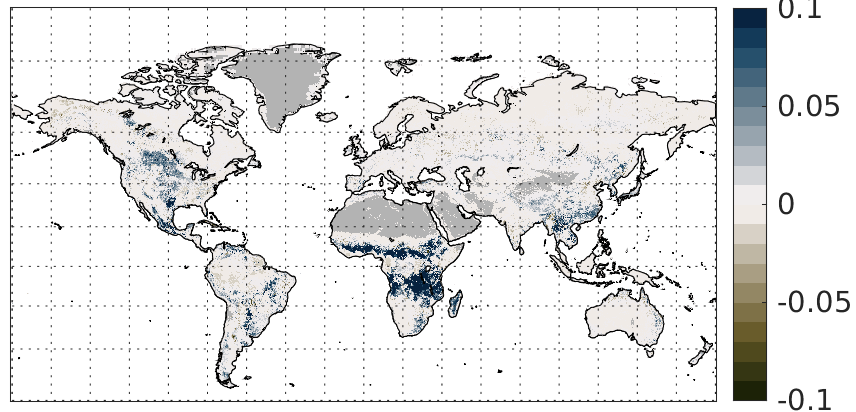
Latent Heat Flux [W m^{-2}]



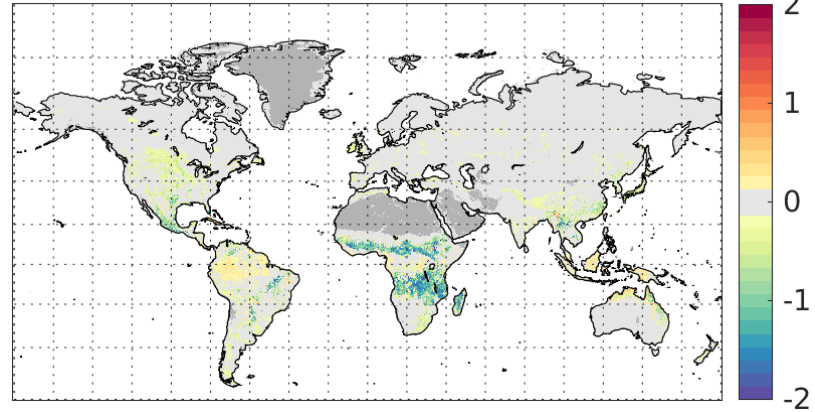
Transpiration/Evapotranspiration [-]



Surface Soil Moisture [$\text{m}^3 \text{m}^{-3}$]



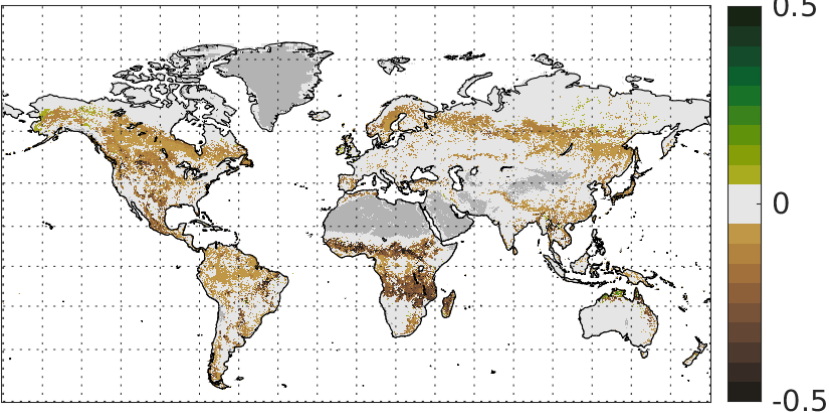
Transpiration [mm d^{-1}]



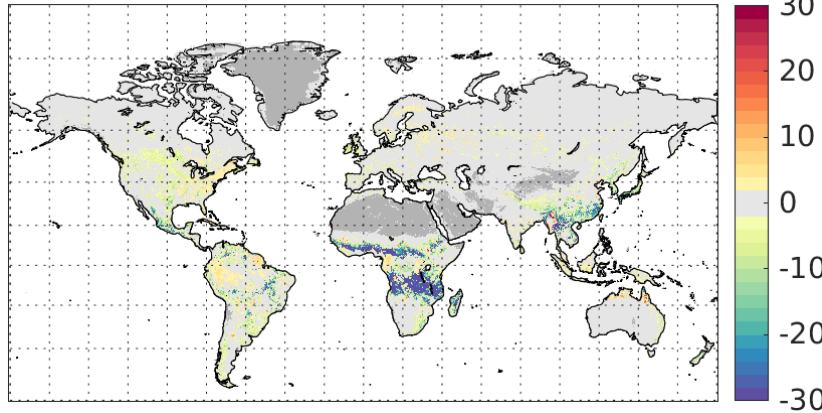
Results: Impact on Ecohydrology

Calibrated Catchment-CN minus uncalibrated Catchment-CN

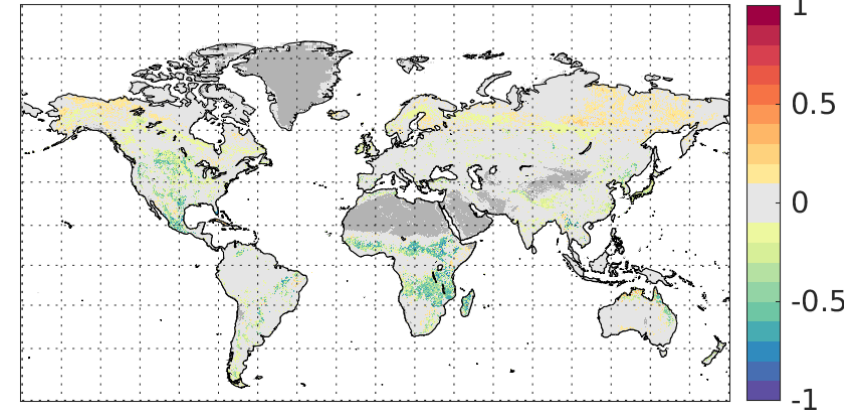
FPAR [-]



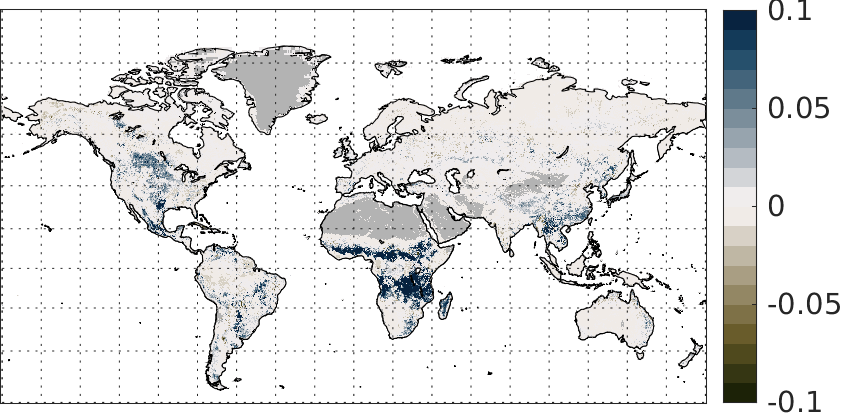
Latent Heat Flux [W m^{-2}]



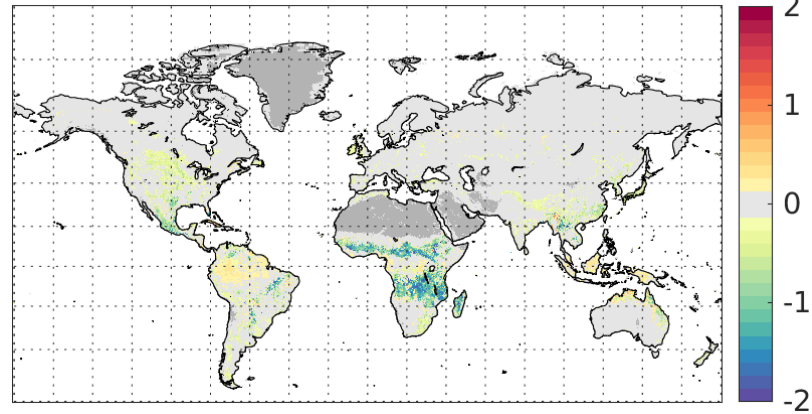
Transpiration/Evapotranspiration [-]



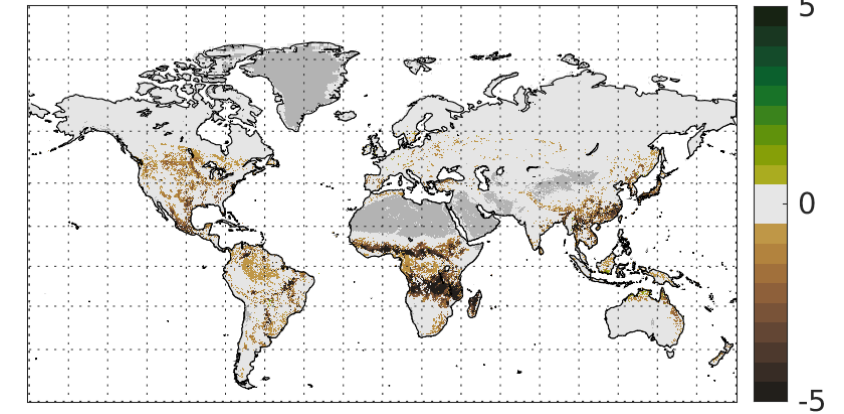
Surface Soil Moisture [$\text{m}^3 \text{m}^{-3}$]



Transpiration [mm d^{-1}]



Gross Primary Productivity [$\text{gC m}^{-2} \text{d}^{-1}$]





Conclusions and Outlook

Conclusions:

- Parameter calibration is a feasible approach to consistently reduce error between modeled and observed vegetation activity
- Depending on error characteristics, a targeted two-stage calibration may be more effective
- Parameter estimation reduces some of the model error, but structural model changes are required to fully capture observed vegetation variability
- Changes in vegetation activity lead to expected impacts on ecohydrology

Outlook:

- Implement vegetation data assimilation to better constrain vegetation dynamics
- Evaluate ecohydrology impacts against independent observations
- Investigate how change in vegetation activity and surface fluxes propagate through Earth System (impact on atmosphere)
- Implement structural model changes to reduce remaining model error



Extra Slides