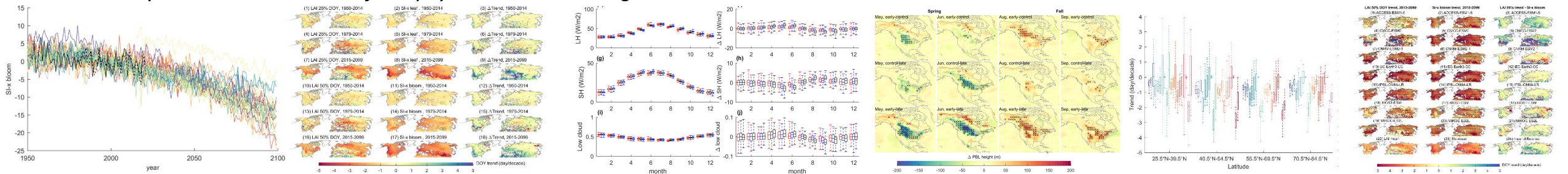




Characterizing leaf phenology of different vegetation types from local to hemispheric scale in the CLM

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Li, X., Carrillo, C. M., Ault, T. R., Richardson, A. D., Frohking, S. (In prep). Understanding leaf phenology of different vegetation types from local to hemispheric scale in the Community Land Model. *Journal of Geophysical Research: Biogeosciences*.



Phenology: why should we care?

1. Phenology: timing of biological events and forces that cause their variations



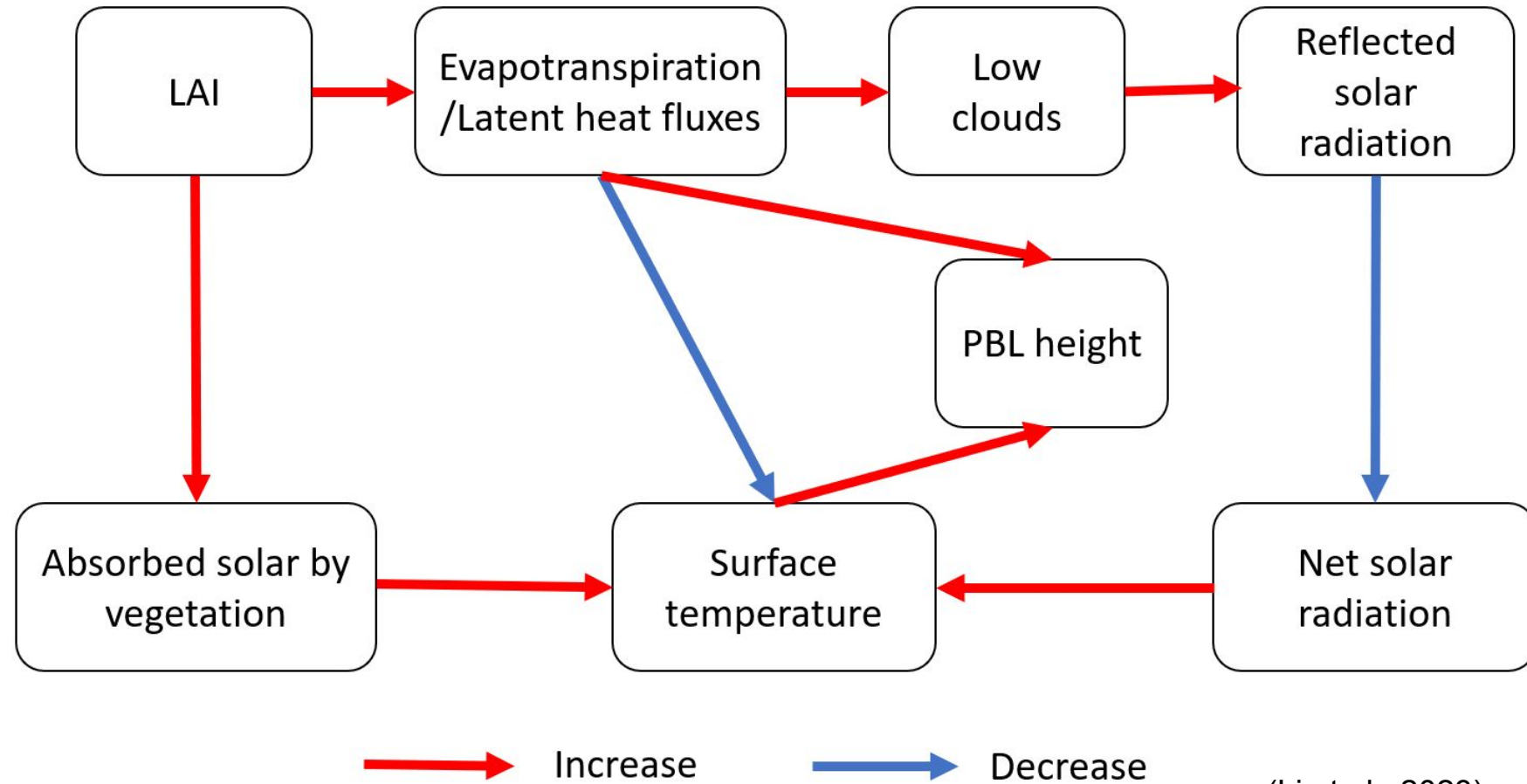
- One of the most visible and well-documented indicators of seasonal transitions;
- Indicator of climate change impacts on ecosystems;
- Timing matters: pollinators, migratory birds, human health and recreation.

Phenology: why should we care?

1. Phenology: indicator of climate change impacts on ecosystems.

2. Phenology regulates land-atmosphere interactions:

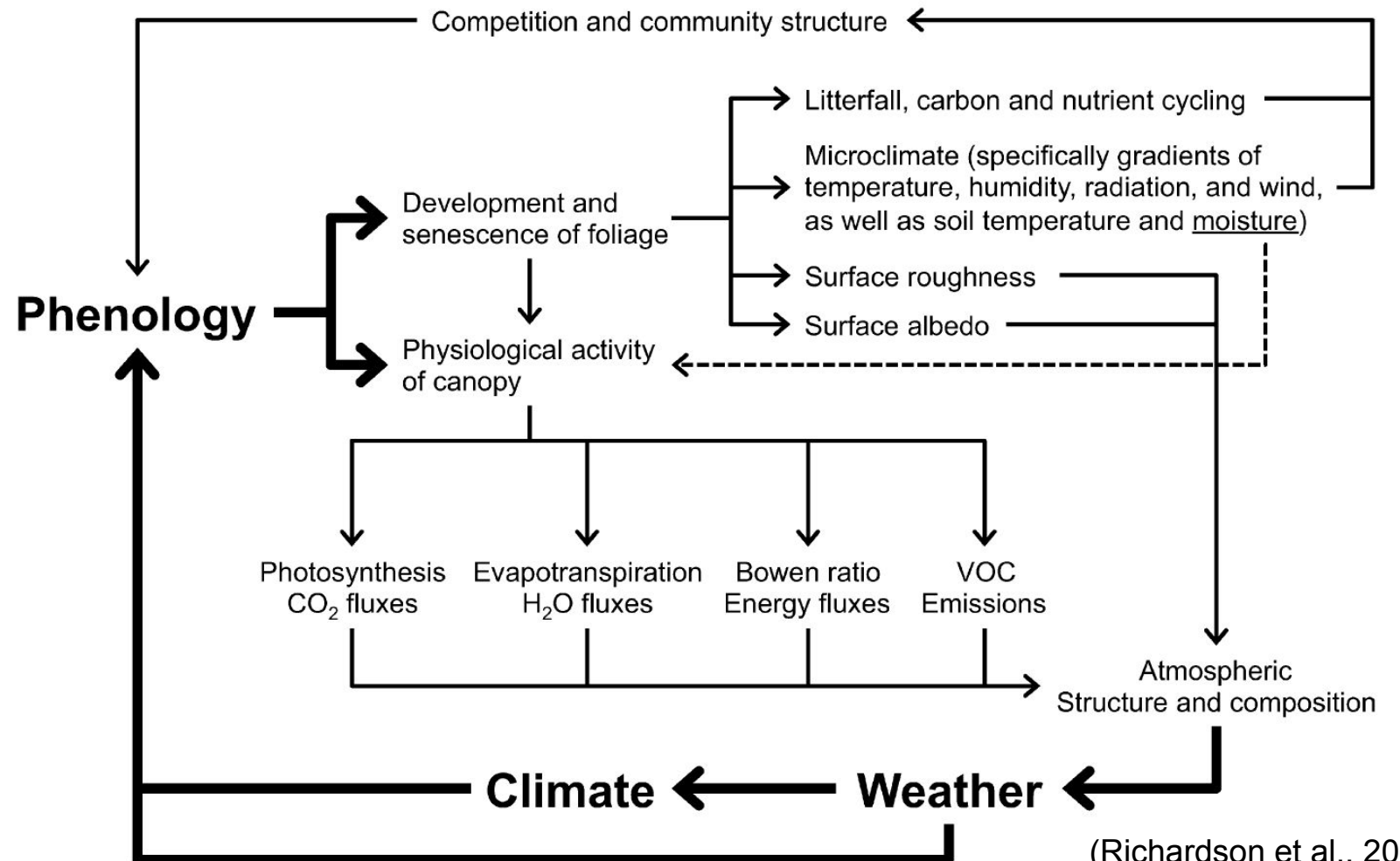
- Directly influences energy and water exchanges;
- Indirectly changes cloud cover and albedo.



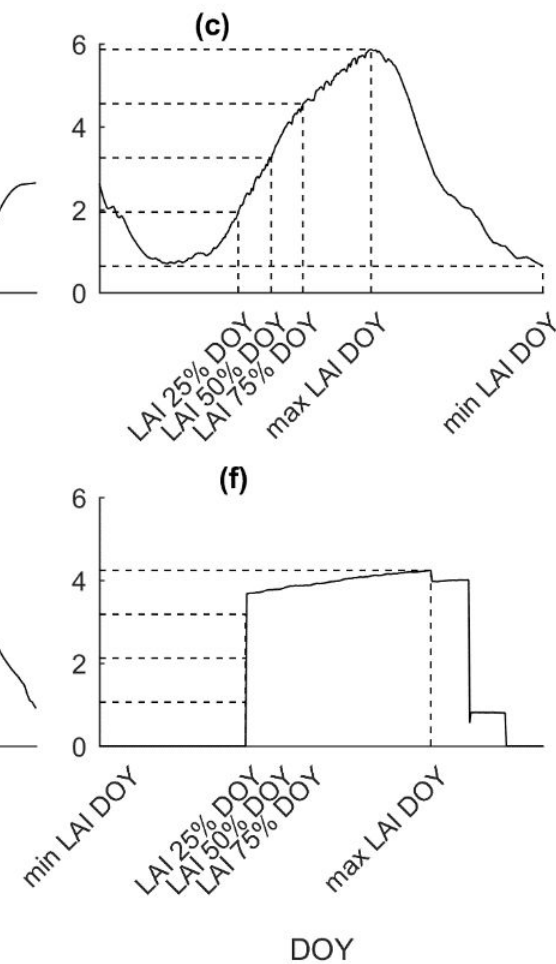
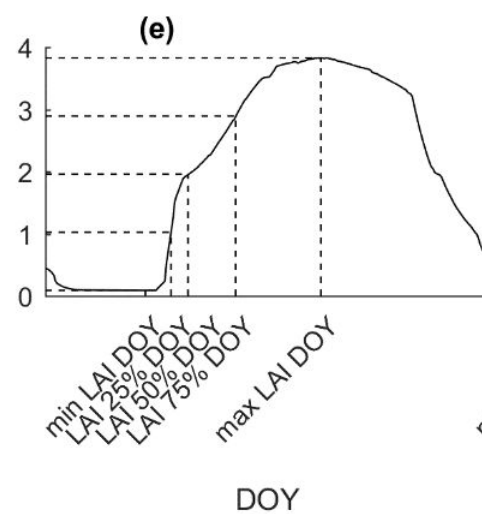
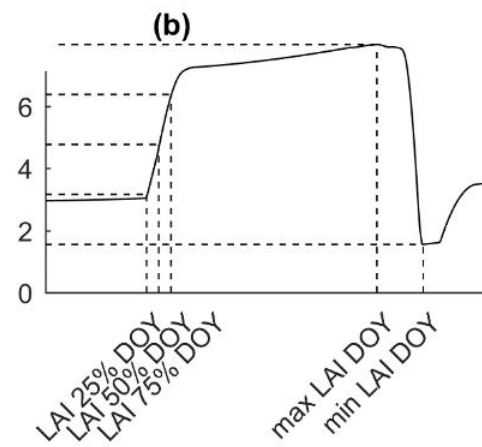
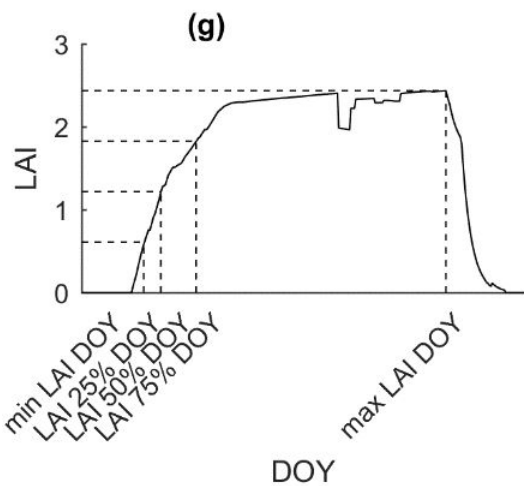
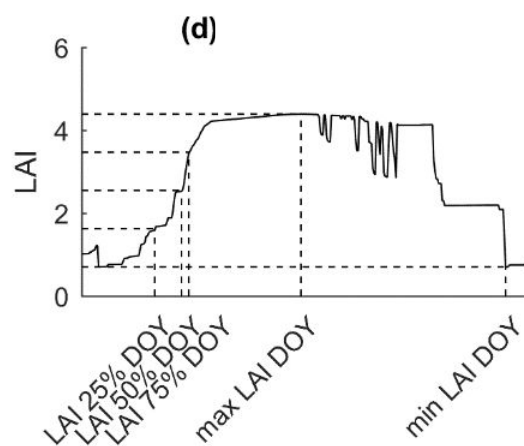
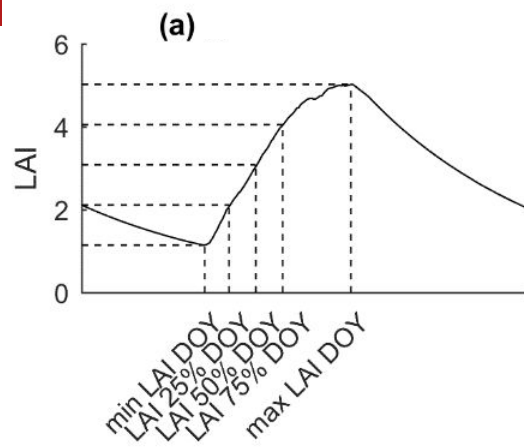
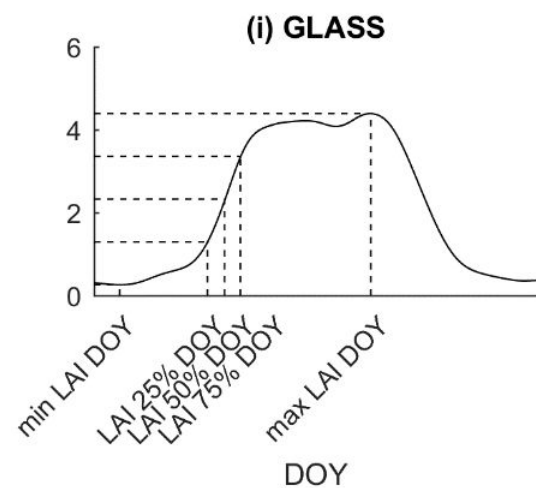
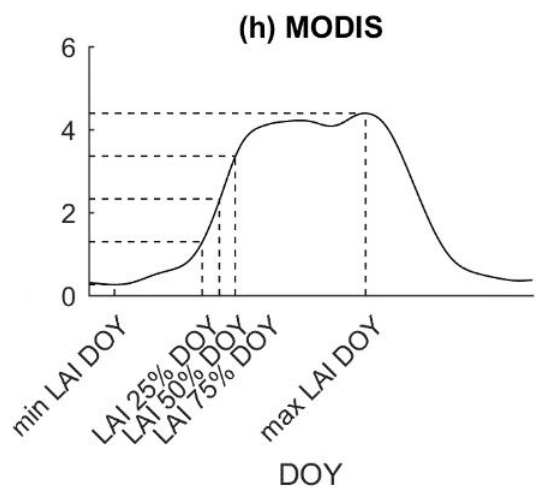
Phenology: why should we care?

1. Phenology: indicator of climate change impacts on ecosystems.
2. Phenology regulates land-atmosphere interactions.
3. Phenology influences primary production and the carbon cycle:

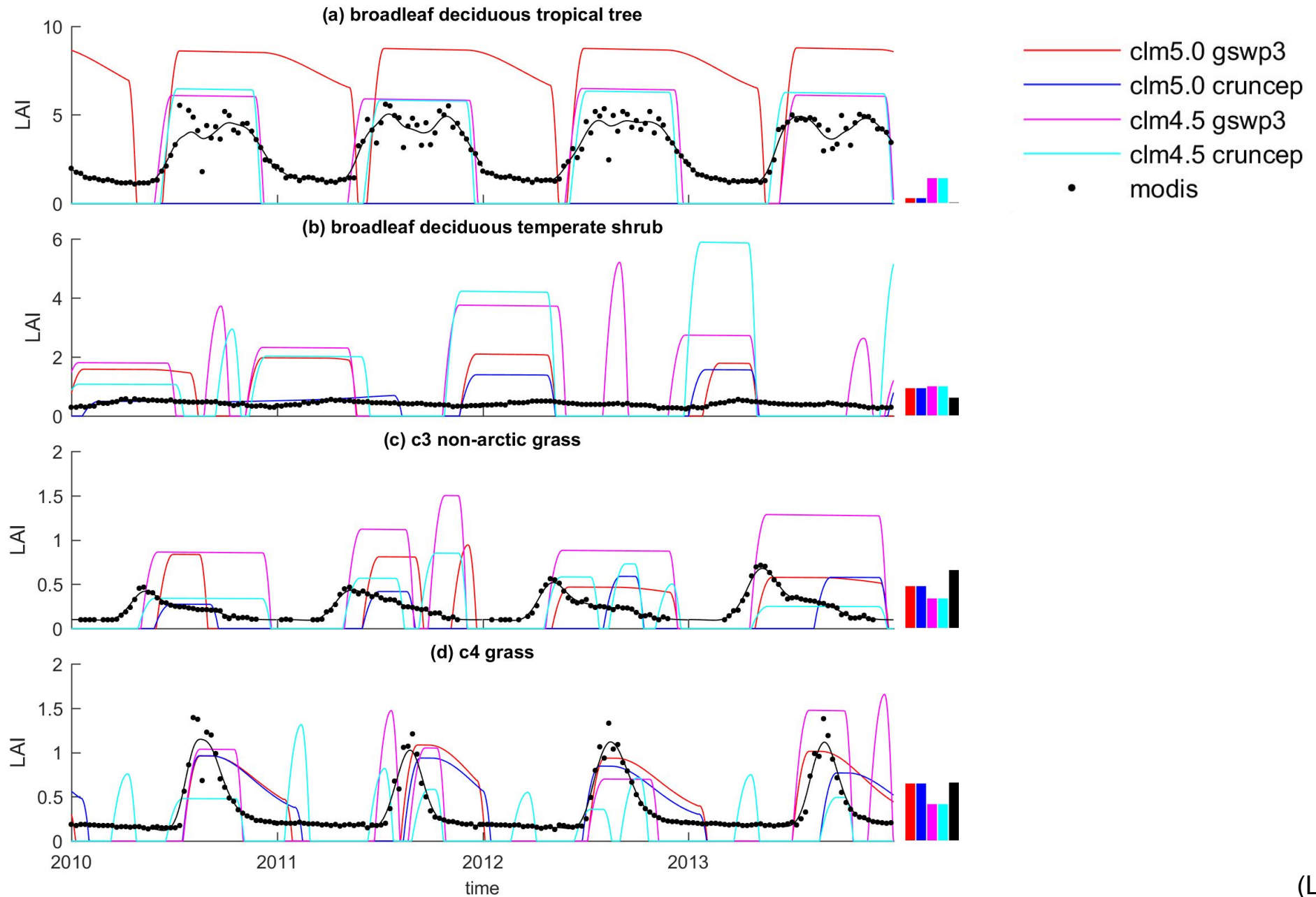
- Modulates growing season, leaf development, and primary production;
- Influences ecosystem structure and function.



Leaf phenology differ in different land surface models

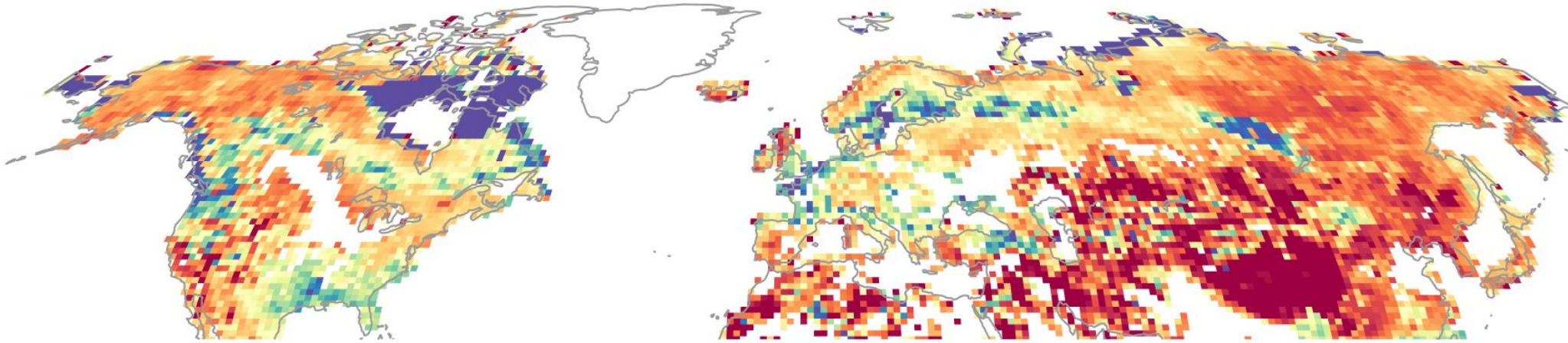


Delayed spring onset and longer peak growing season

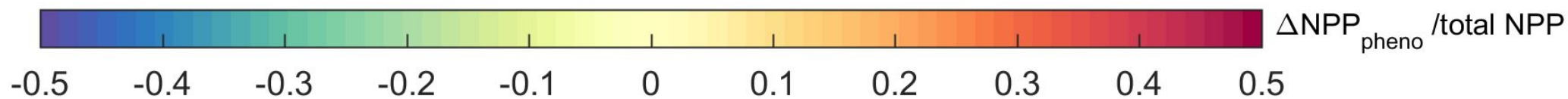
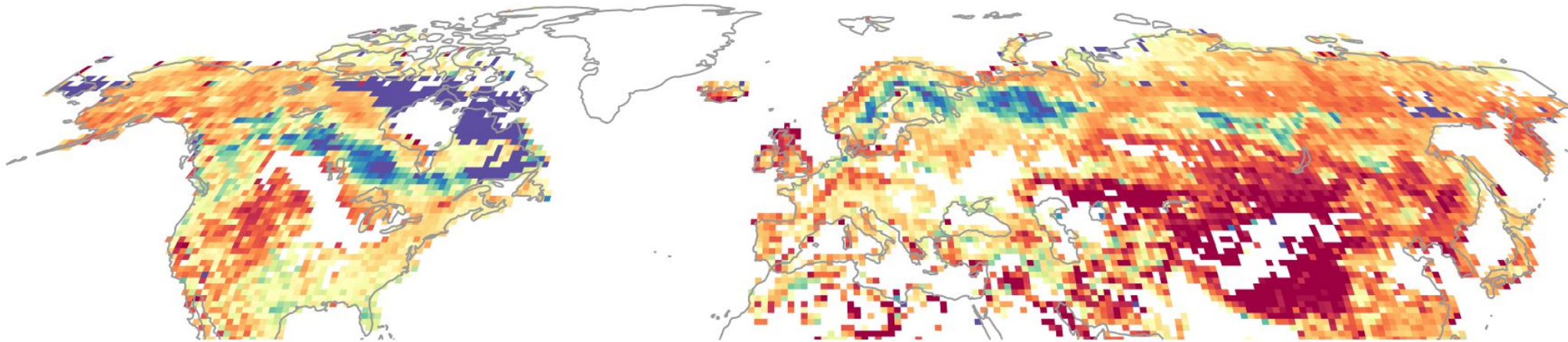


Phenology discrepancies can result in large NPP biases

(a) CLM5

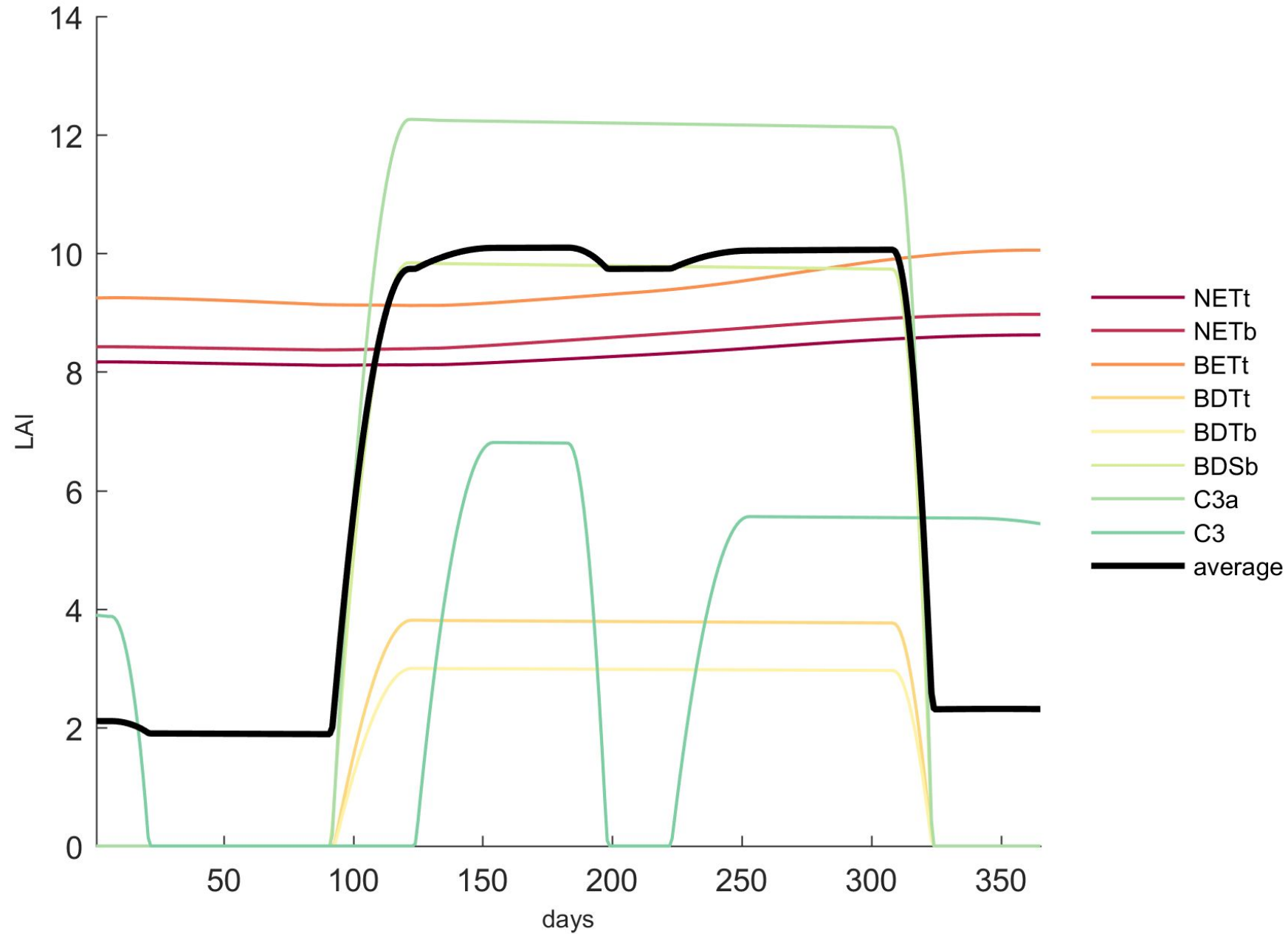


(b) CLM4.5



Fraction of total annual net primary production that is produced during the difference between MODIS peak growing season as indicated by LAI75% threshold and that of (a) CLM5.0, and (b) CLM4.5, averaged between 2003-2014. (Li et al., 2022)

Leaf phenology differ for different PFTs



Research questions

- Across PFTs, how well can CLM simulate LAI variability estimated from MODIS and how does the CLM-MODIS agreement change with PFT and location?
- How sensitive is simulated plant phenology to environmental factors such as soil temperature and soil moisture?
- How may these disagreements influence how CLM simulates the carbon cycle?

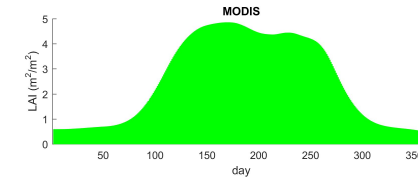
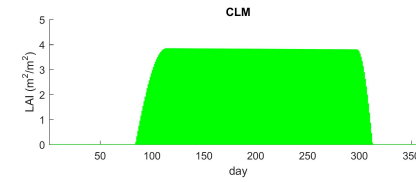
□ Data and method

- CLM4.5 and CLM5.0 with GSWP3 historical forcing dataset
- LAI from MODIS TERRA MOD15A2H.v006 and land cover type from MCD12Q1

□ Data and method

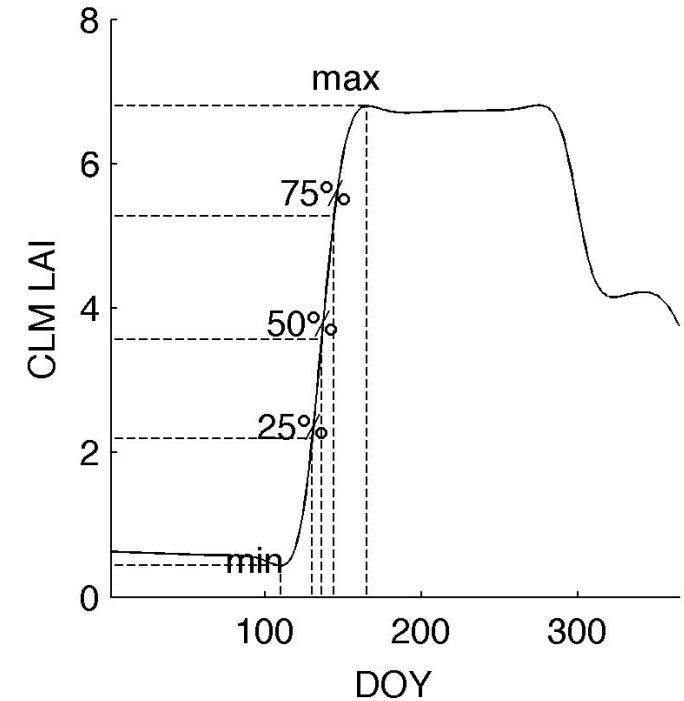
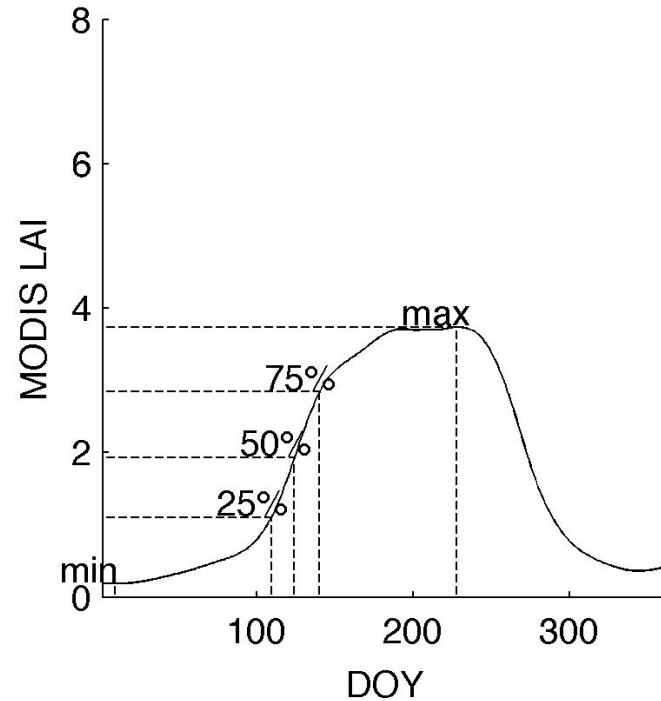
• LAI ratio

$$\log(LAI\ ratio) = \log\left(\frac{\overline{LAI_{CLM}}}{\overline{LAI_{MODIS}}}\right)$$



• LAI threshold-based DOYs

- Annual dynamical range = max LAI – min LAI
- 50% thresholds



□ Data and method

- Seasonal ratio

$RMSE_{normLAI}$:

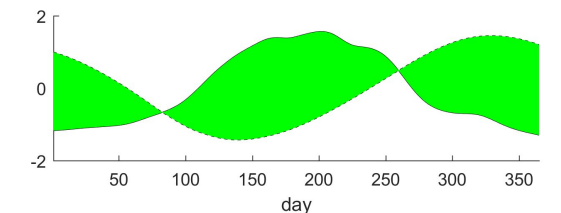
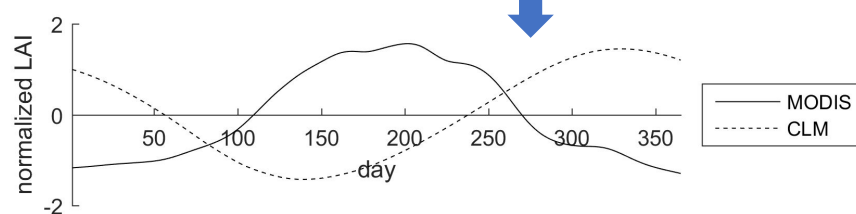
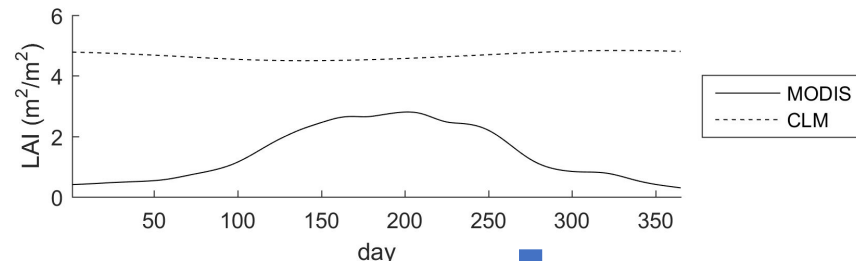
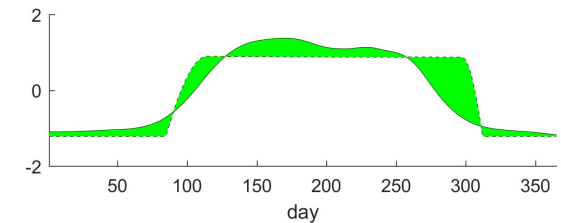
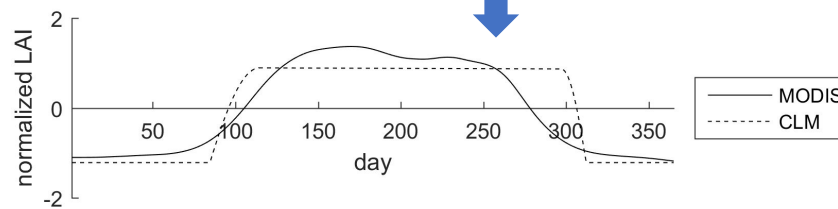
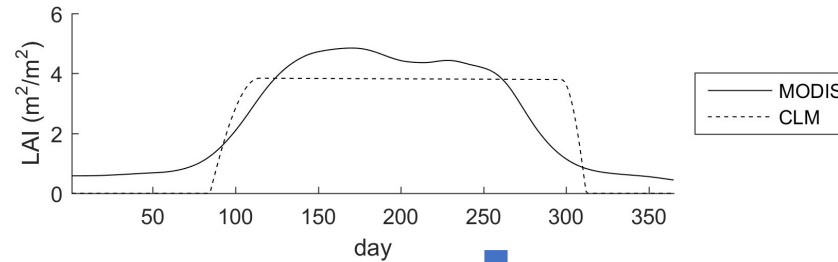
root mean square error

(RMSE) between

normalized CLM LAIs

and MODIS LAIs

$$RMSE_{normLAI} = \sqrt{2 \cdot \text{mean} \left[\left(\frac{LAI_{CLM} - \overline{LAI_{CLM}}}{\sigma(LAI_{CLM})} - \frac{LAI_{MODIS} - \overline{LAI_{MODIS}}}{\sigma(LAI_{MODIS})} \right)^2 \right]}$$

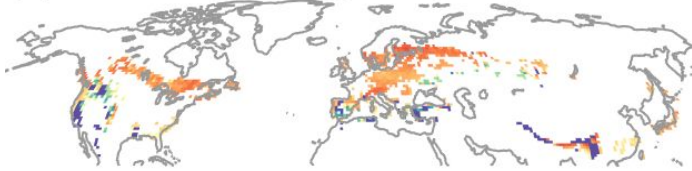


□ Data and method

- Peak growing season: days when LAI > 75% LAI annual dynamical range for each PFT.
- Phenology induced GPP differences $\Delta\text{GPP}_{\text{pheno}}$: GPP simulated by each PFT in CLM during the difference window between CLM and MODIS peak growing season □ differences due to phenology disagreements.

Amplitude and seasonal cycle of annual LAI

(a) needleleaf evergreen temperate tree



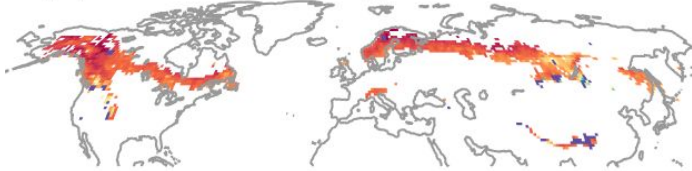
(f) broadleaf deciduous tropical tree



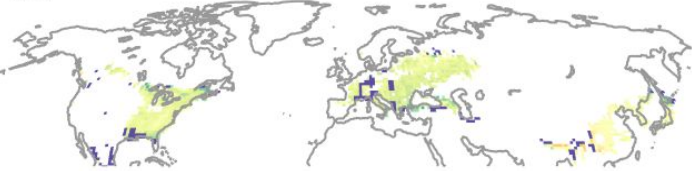
(k) broadleaf deciduous boreal shrub



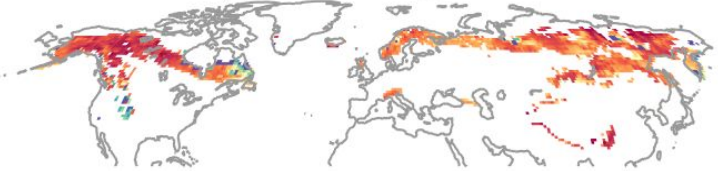
(b) needleleaf evergreen boreal tree



(g) broadleaf deciduous temperate tree



(l) c3 arctic grass



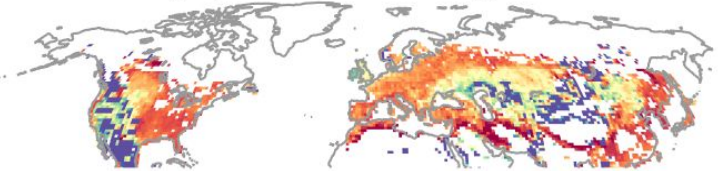
(c) needleleaf deciduous boreal tree



(h) broadleaf deciduous boreal tree



(m) c3 non-arctic grass



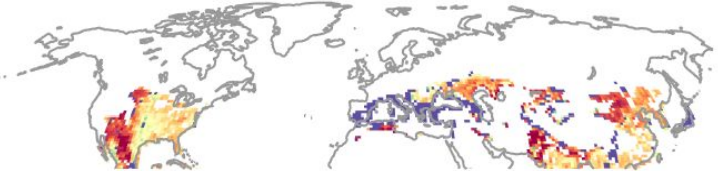
(d) broadleaf evergreen tropical tree



(i) broadleaf evergreen shrub



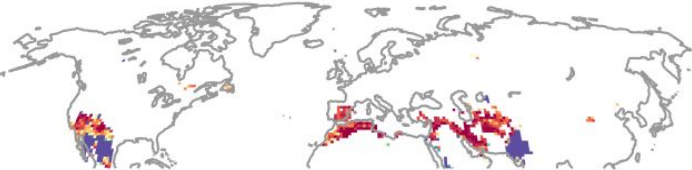
(n) c4 grass



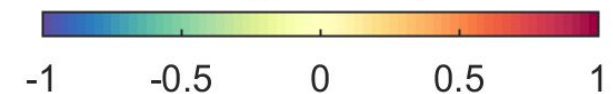
(e) broadleaf evergreen temperate tree



(j) broadleaf deciduous temperate shrub

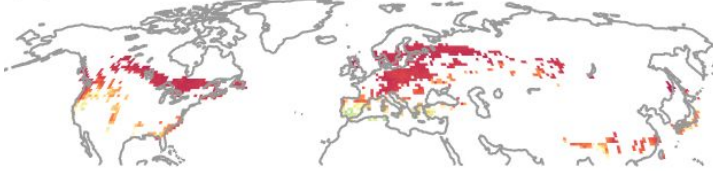


log(LAI ratio)



Amplitude and seasonal cycle of annual LAI

(a) needleleaf evergreen temperate tree



(f) broadleaf deciduous tropical tree



(k) broadleaf deciduous boreal shrub



(b) needleleaf evergreen boreal tree



(g) broadleaf deciduous temperate tree



(l) c3 arctic grass



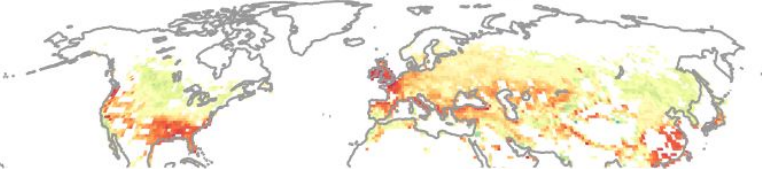
(c) needleleaf deciduous boreal tree



(h) broadleaf deciduous boreal tree



(m) c3 non-arctic grass



(d) broadleaf evergreen tropical tree



(i) broadleaf evergreen shrub



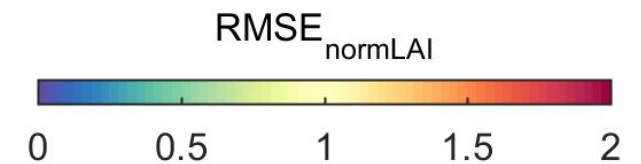
(n) c4 grass



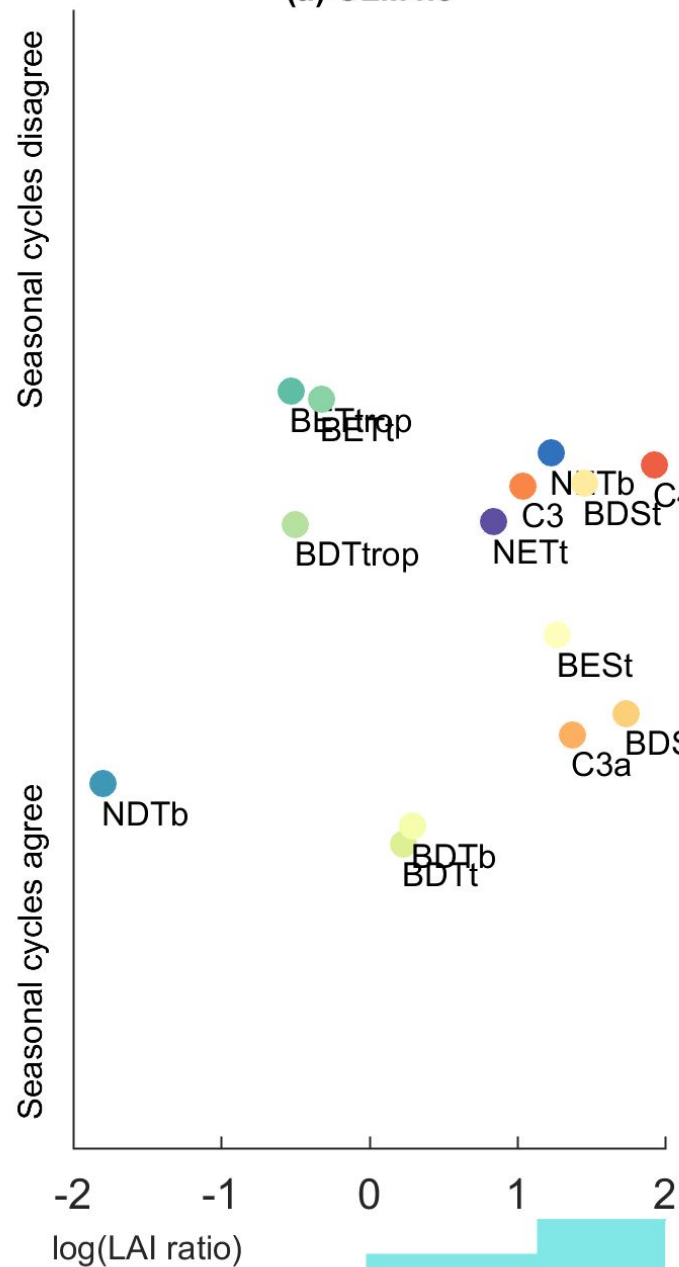
(e) broadleaf evergreen temperate tree



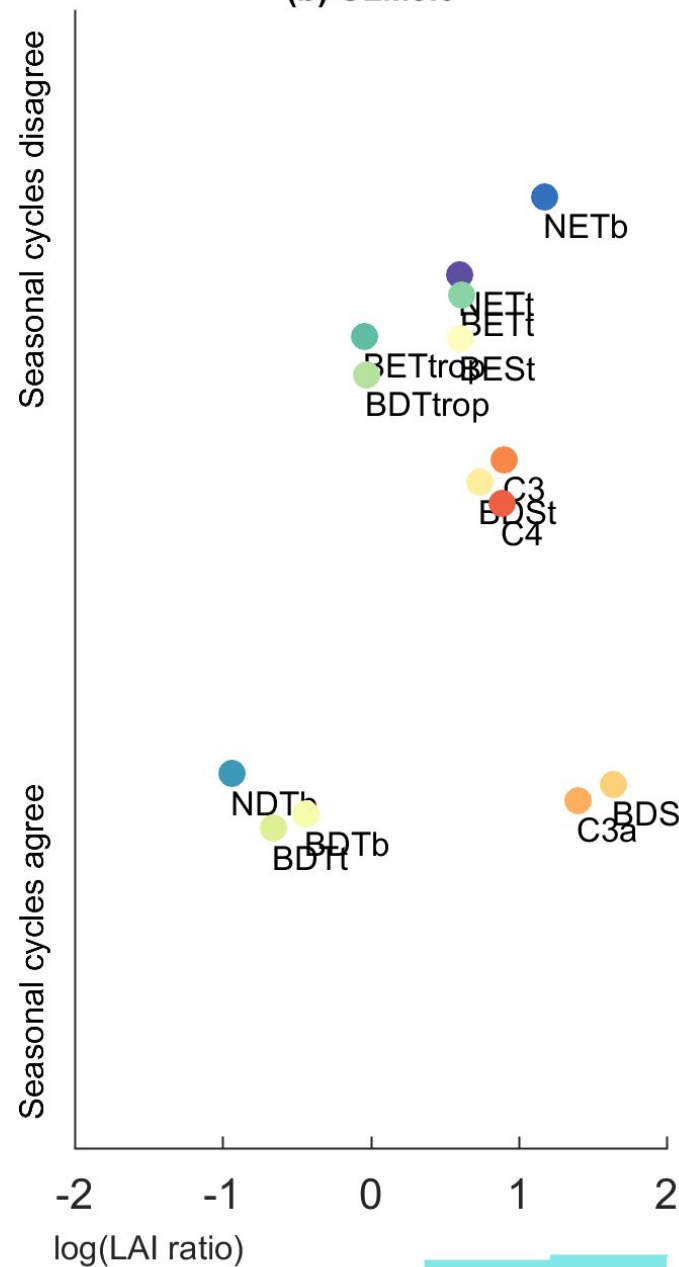
(j) broadleaf deciduous temperate shrub



(a) CLM4.5

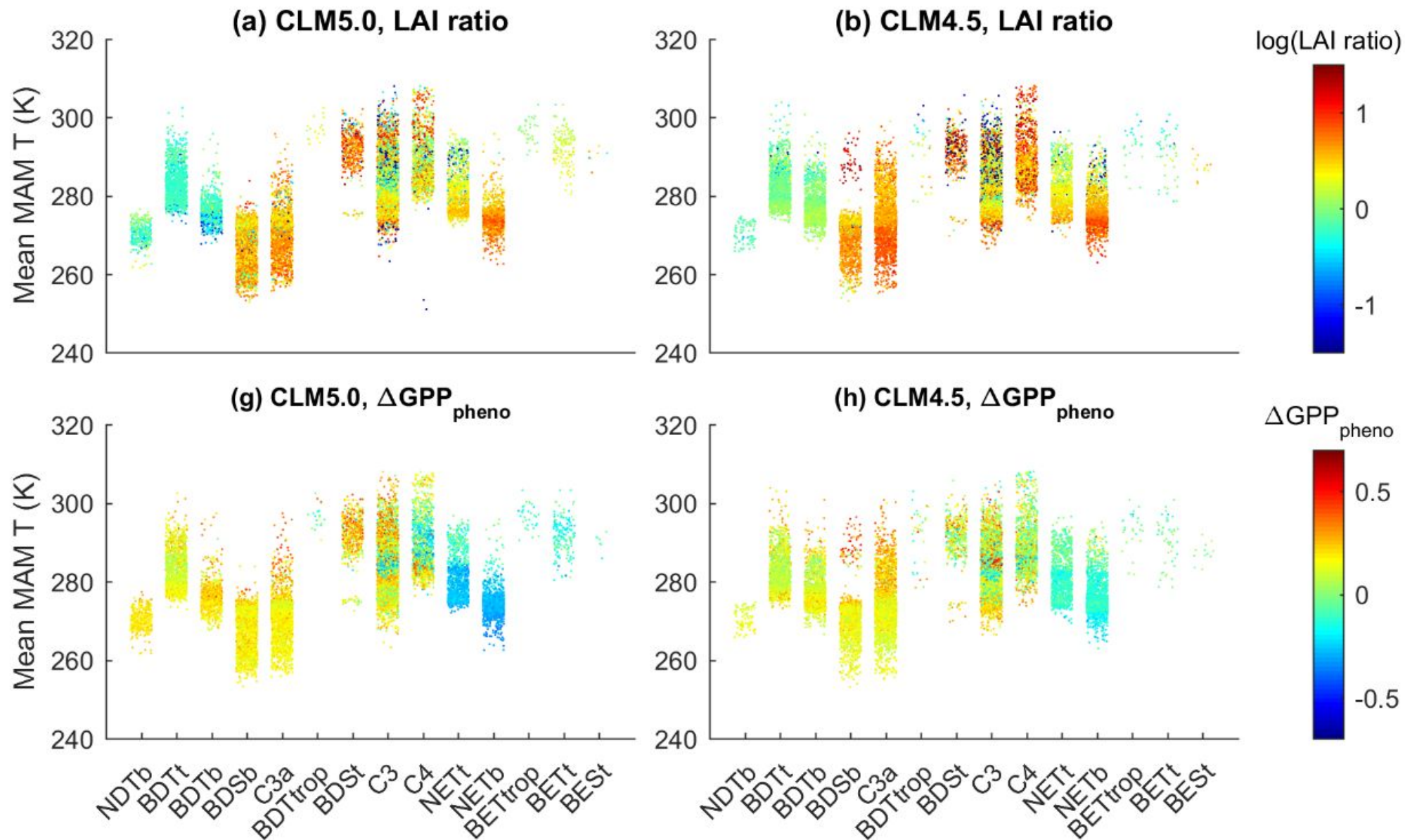


(b) CLM5.0

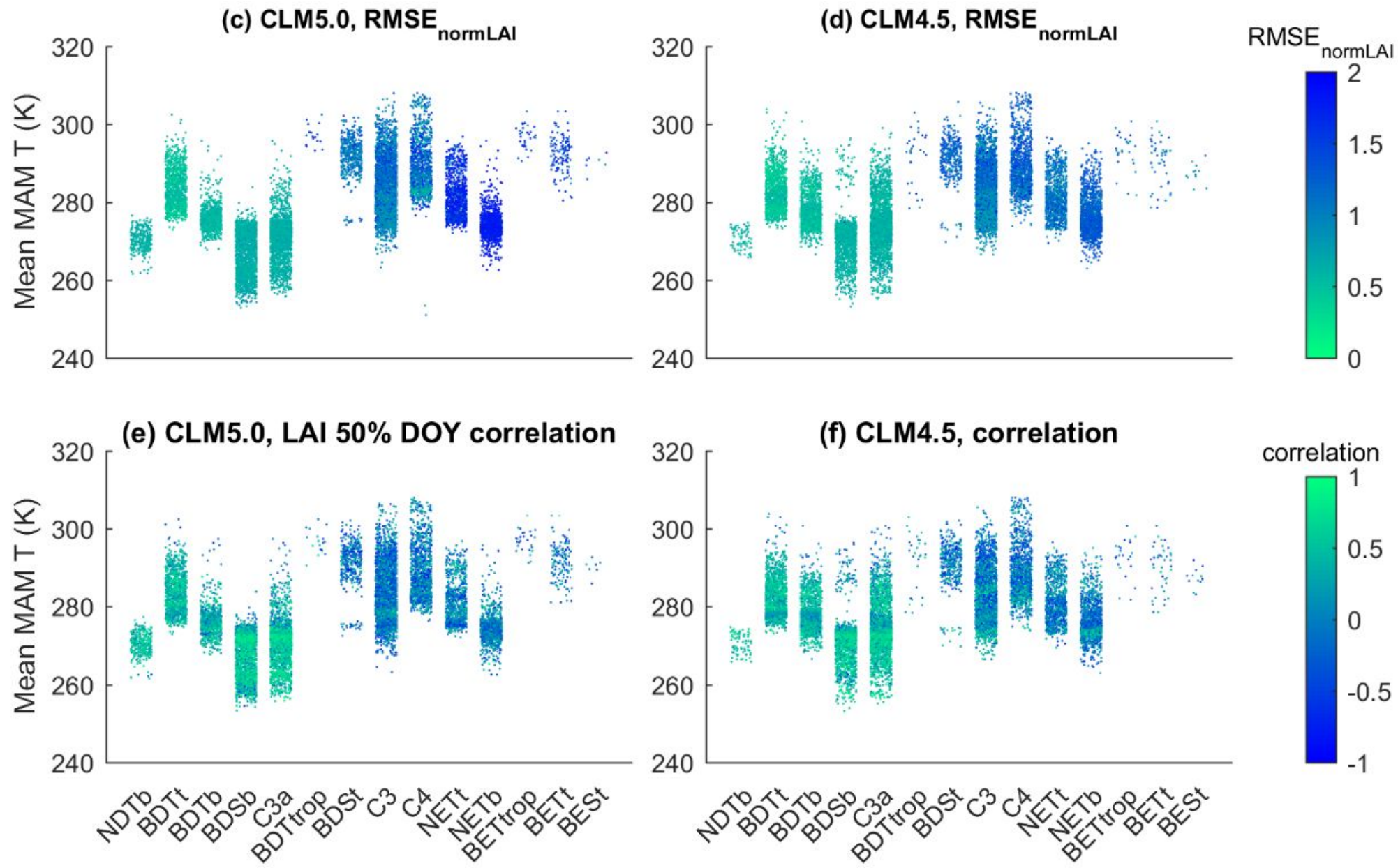


- needleleaf evergreen temperate tree
- needleleaf evergreen boreal tree
- needleleaf deciduous boreal tree
- broadleaf evergreen tropical tree
- broadleaf evergreen temperate tree
- broadleaf deciduous tropical tree
- broadleaf deciduous temperate tree
- broadleaf deciduous boreal tree
- broadleaf evergreen shrub
- broadleaf deciduous temperate shrub
- broadleaf deciduous boreal shrub
- c3 arctic grass
- c3 non-arctic grass
- c4 grass

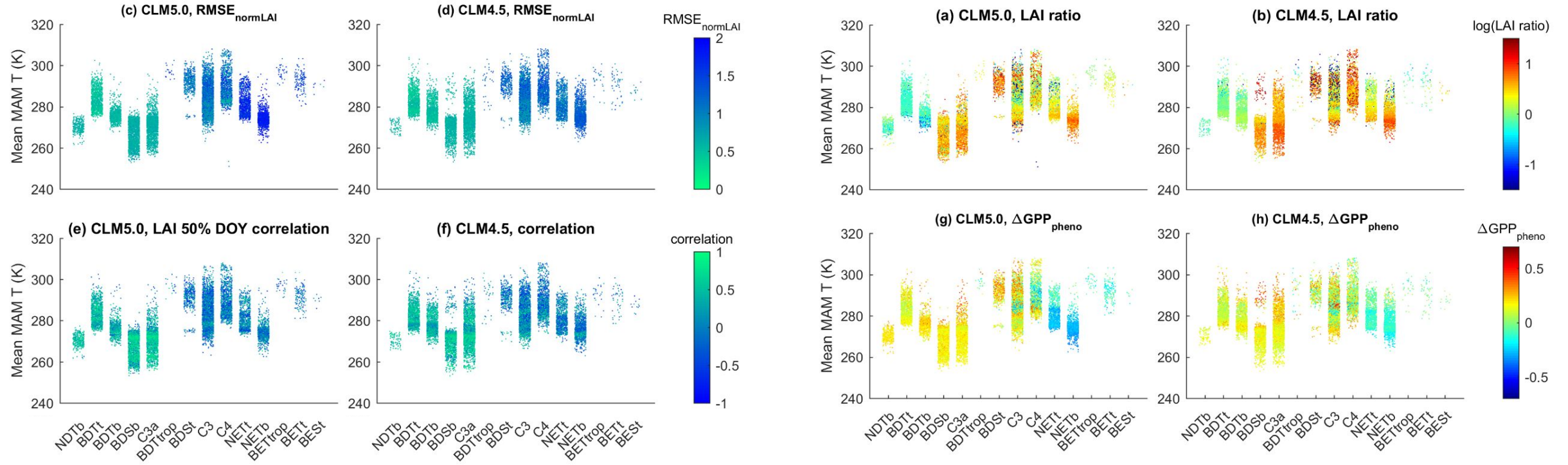
Influences of PFT and spring temperature



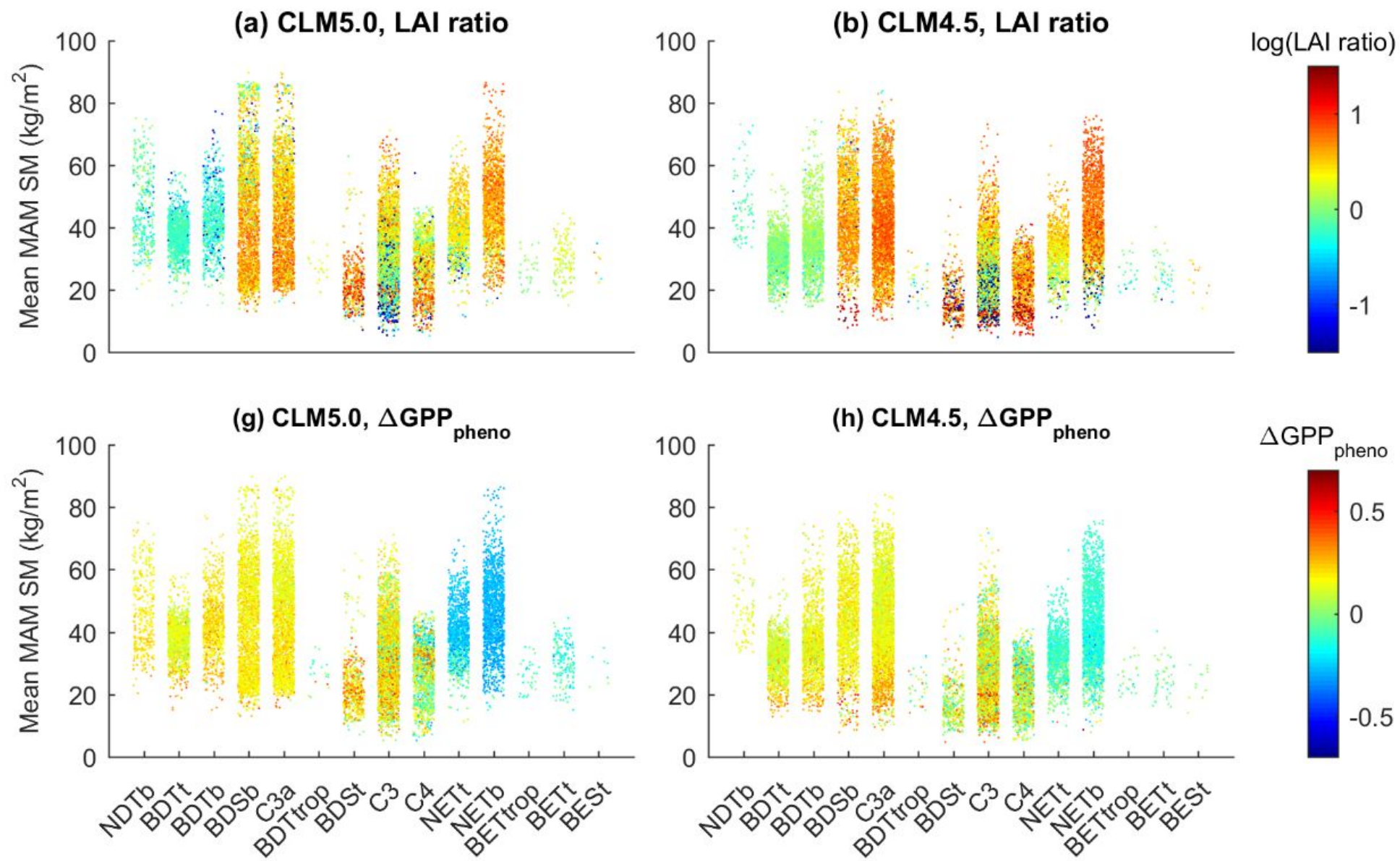
Influences of PFT and spring temperature



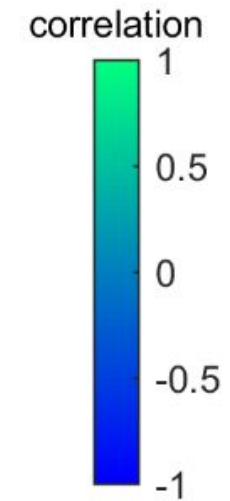
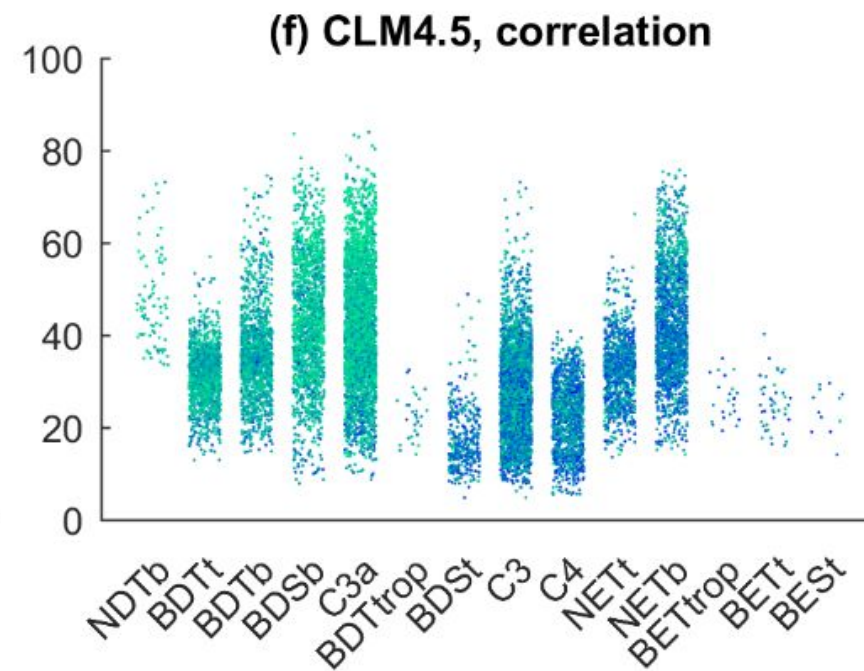
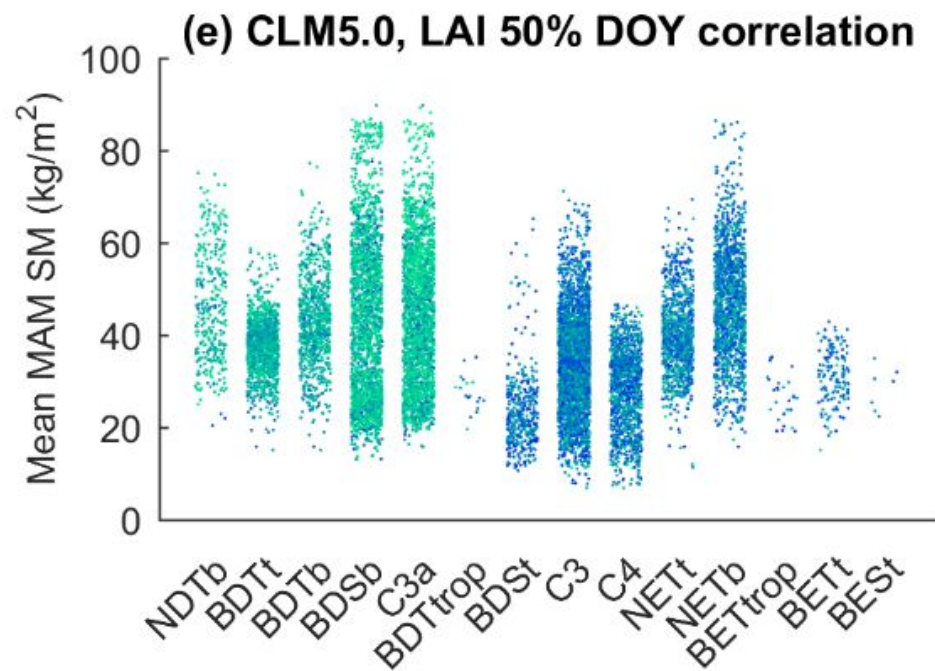
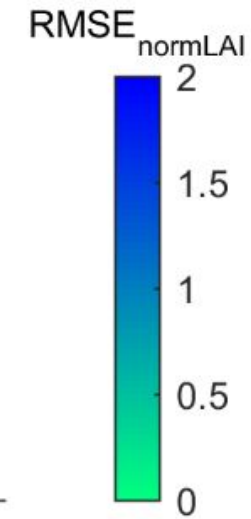
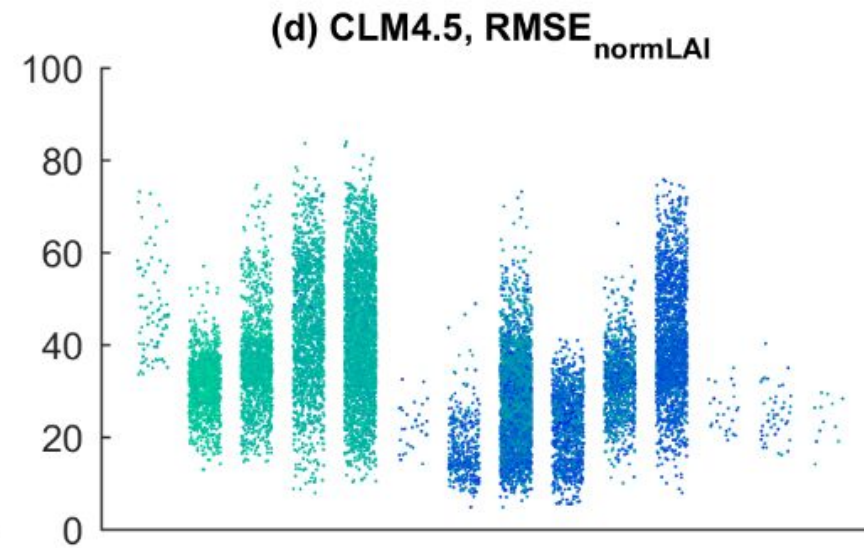
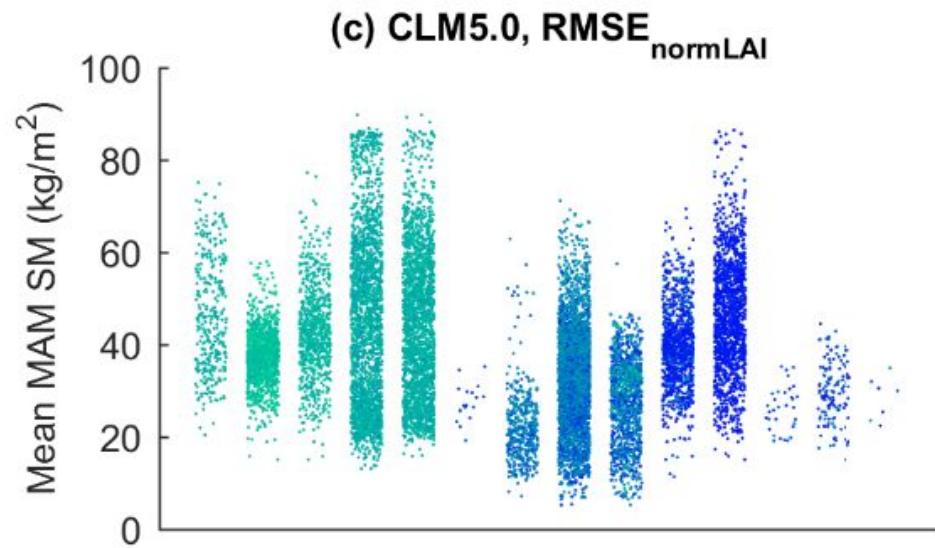
Influences of PFT and spring temperature



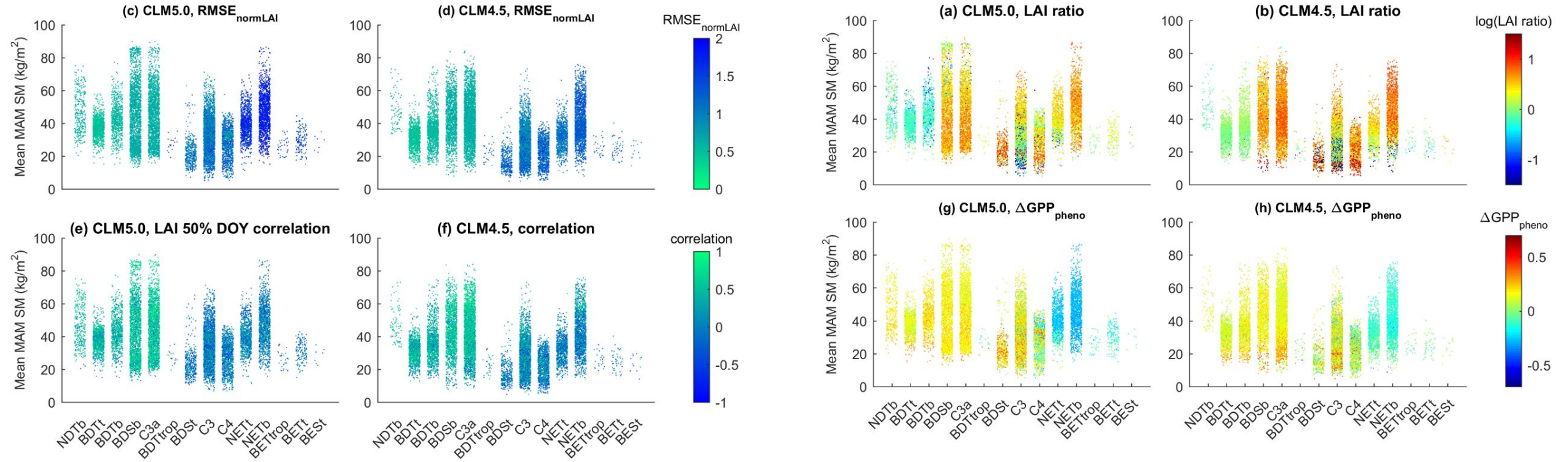
Influences of PFT and soil moisture



Influences of PFT and soil moisture



Influences of PFT and soil moisture



GPP differences due to phenology disagreements (CLM5)

(b) needleleaf evergreen temperate tree



(g) broadleaf deciduous tropical tree



(l) broadleaf deciduous boreal shrub



(c) needleleaf evergreen boreal tree



(h) broadleaf deciduous temperate tree



(m) c3 arctic grass



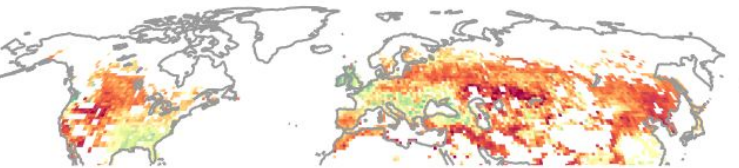
(d) needleleaf deciduous boreal tree



(i) broadleaf deciduous boreal tree



(n) c3 non-arctic grass



(e) broadleaf evergreen tropical tree



(j) broadleaf evergreen shrub



(o) c4 grass



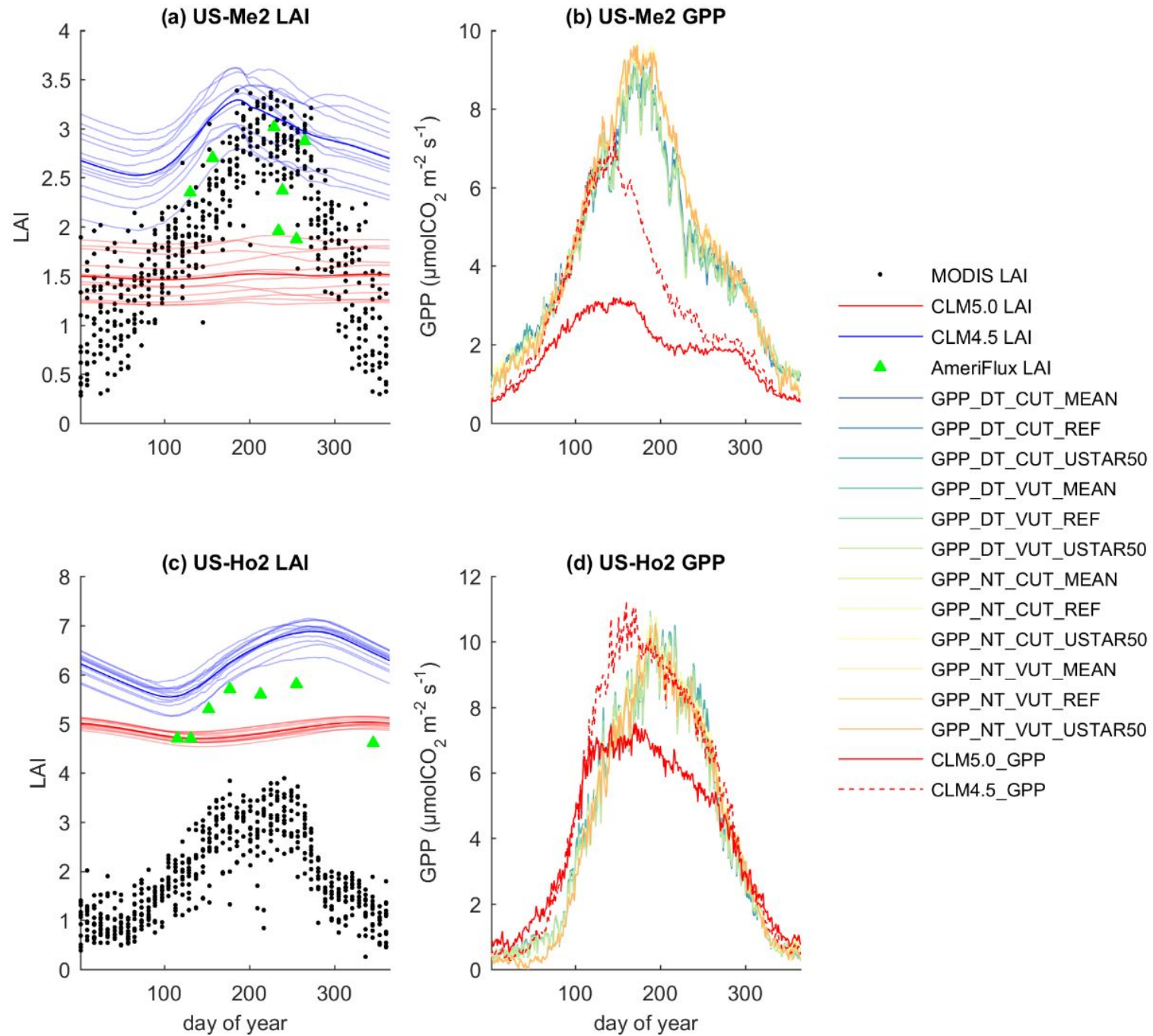
(f) broadleaf evergreen temperate tree



(k) broadleaf deciduous temperate shrub

 $\Delta\text{GPP}/\text{total GPP}$ 

Comparison at flux tower sites



Evaluating CLM phenology from local to hemispheric scale

Conclusions

- Best agreement: seasonal deciduous PFTs & deciduous broadleaf trees;
- LAI amplitudes are sensitive to environmental factors while LAI seasonal cycle is mostly determined by the phenology scheme.
- CLM displays large cross-PFT variation in LAI values, seasonal amplitude, and seasonal cycle.
- Environmental factors influence simulated phenology by determining the PFT and by influencing LAI amplitudes.
- Smaller biases in GPP than LAI, but LAI discrepancies result in GPP biases.



Thank you!

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References:

- Li, X., Carrillo, C. M., Ault, T. R., Richardson, A. D., Frolking, S. (In prep). Understanding leaf phenology of different vegetation types from local to hemispheric scale in the Community Land Model. *Journal of Geophysical Research: Biogeosciences*.
- Li, X., Melaas, E., Carrillo, C. M., Ault, T., Richardson, A. D., Lawrence, P., ... & Young, A. M. (2022). A comparison of land surface phenology in the Northern Hemisphere derived from satellite remote sensing and the Community Land Model. *Journal of Hydrometeorology*, 23 (6)
- Li, X., Ault, T. R., Richardson, A. D., Carrillo, C. M., Lawrence, D.M., Lombardozzi, D., Frolking, S., Herrera, D. A., & Moon, M. (2023). Impacts of shifting phenology on boundary layer dynamics in North America in the CESM. *Agricultural and Forest Meteorology*. 10.1016/j.agrformet.2022.109286
- Li, X., Ault, T. R., Evans, C. P., Lehner, F., Carrillo, C. M., Donnelly, A.C., Gallinat, A.S., Crimmins, T., Schwartz, M.D. (Under review). Greater uncertainty in projected spring onset variability in the Northern Hemisphere. *Geophysical Research Letters*. Revised and resubmitted.
- Richardson, A. D., Keenan, T. F., Migliavacca, M., Ryu, Y., Sonnentag, O., & Toomey, M. (2013). Climate change, phenology, and phenological control of vegetation feedbacks to the climate system. *Agricultural and Forest Meteorology*, 169, 156–173.

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