



**EARTH &
ENVIRONMENTAL
SCIENCES**



Data-driven approach to represent multiple plant functional types across the wet and dry tropics with FATES

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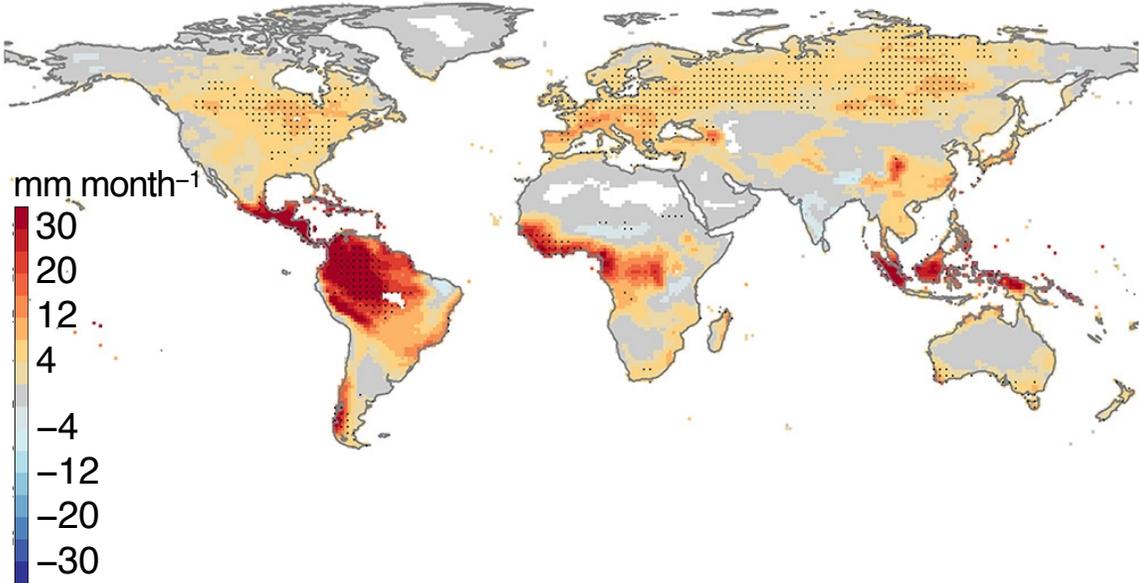
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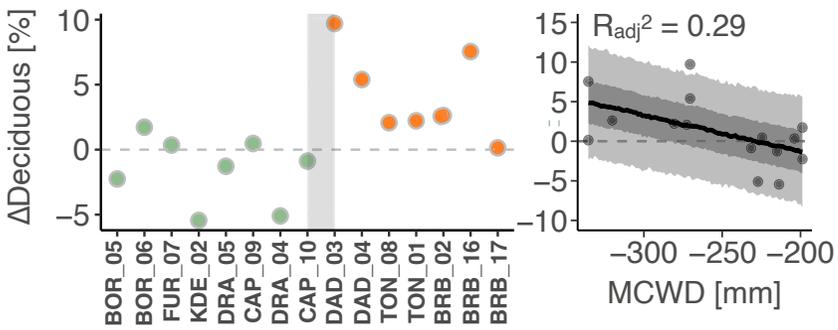
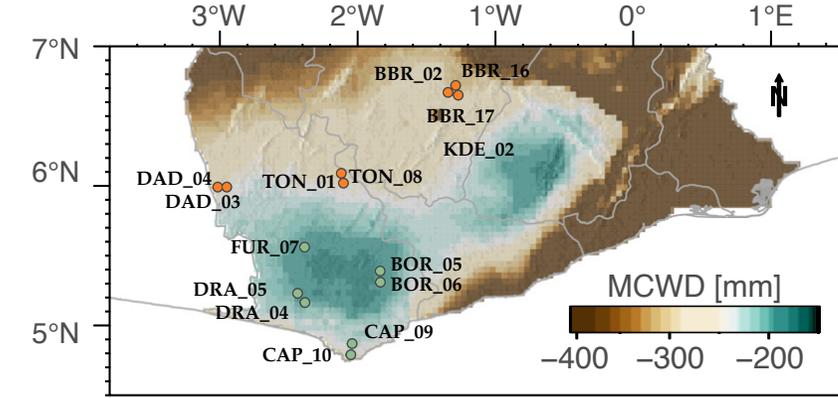
NGEE-Tropics

Introduction

Changes in drought intensity CMIP6 (2051–2100)



Ukkola et al. (2020) *GRL*
[10.1029/2020GL087820](https://doi.org/10.1029/2020GL087820)



Aguirre-Gutierrez et al. (2021) *Ecol. Lett.*
[10.1111/ele.13243](https://doi.org/10.1111/ele.13243)

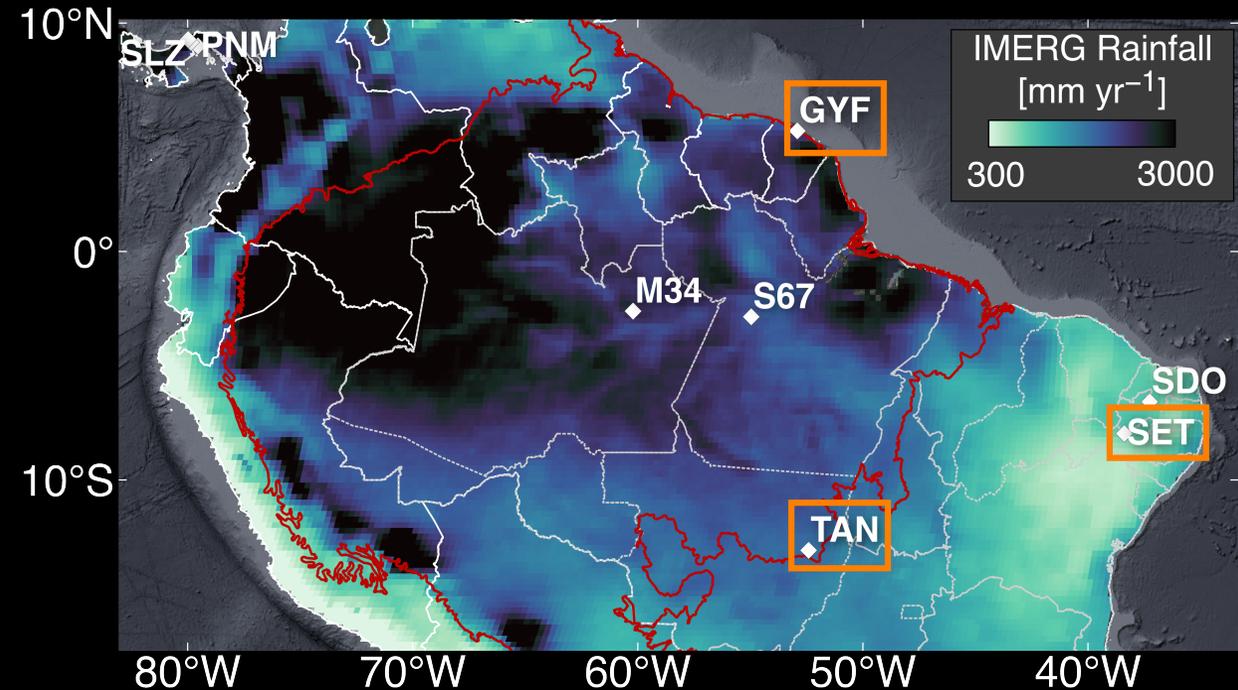
Warming and rainfall decrease → hydrological drying in tropical South America
 Ongoing drying → increase in drought deciduousness in seasonal tropical forests

Objectives and research questions

Implement drought-deciduous phenology in a cohort-based dynamic vegetation model (FATES)

Use multiple trait databases to define regional tropical plant functional types (PFTs) in FATES

Assess FATES coexistence of PFTs along a precipitation gradient in the Neotropics



Precipitation data from
[10.5067/GPM/IMERG/3B-MONTH/06](https://doi.org/10.5067/GPM/IMERG/3B-MONTH/06)

Data-driven PFT definition

Input data sets



Kattge et al. (2020) *GCB*
10.1111/gcb.14904



Mariano et al. (2021) *GEB*
10.1111/gcb.13381



dos Santos et al. (2021)
10.3334/ORNLDAAC/2007



Jucker et al. (2022) *GCB*
10.1111/gcb.16302



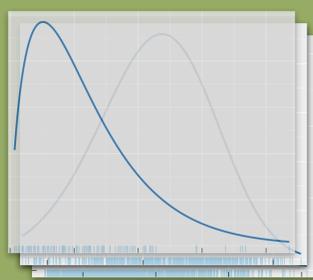
<https://ngt-data.lbl.gov/doi/>

and additional data from literature

PFT attribution

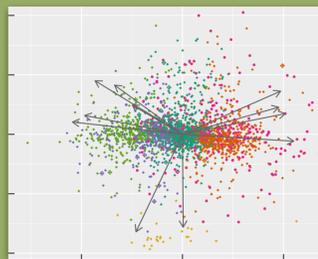
1

Normalize numeric traits based on best fitted distribution

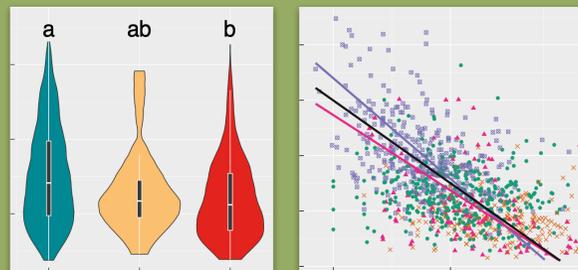


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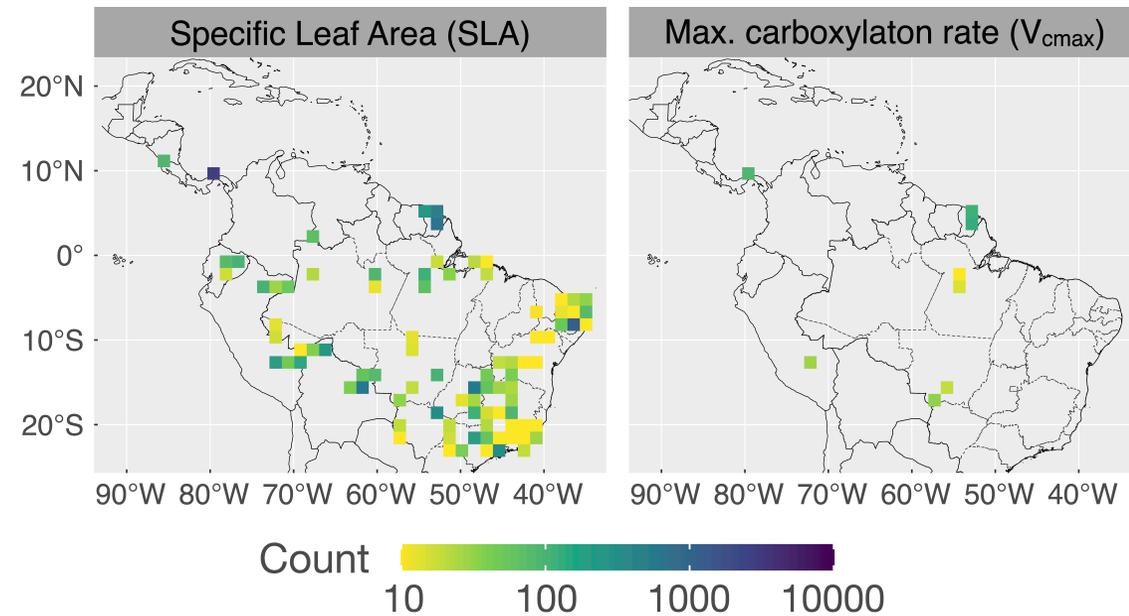
Obtain the optimal number of clusters (gap statistics)



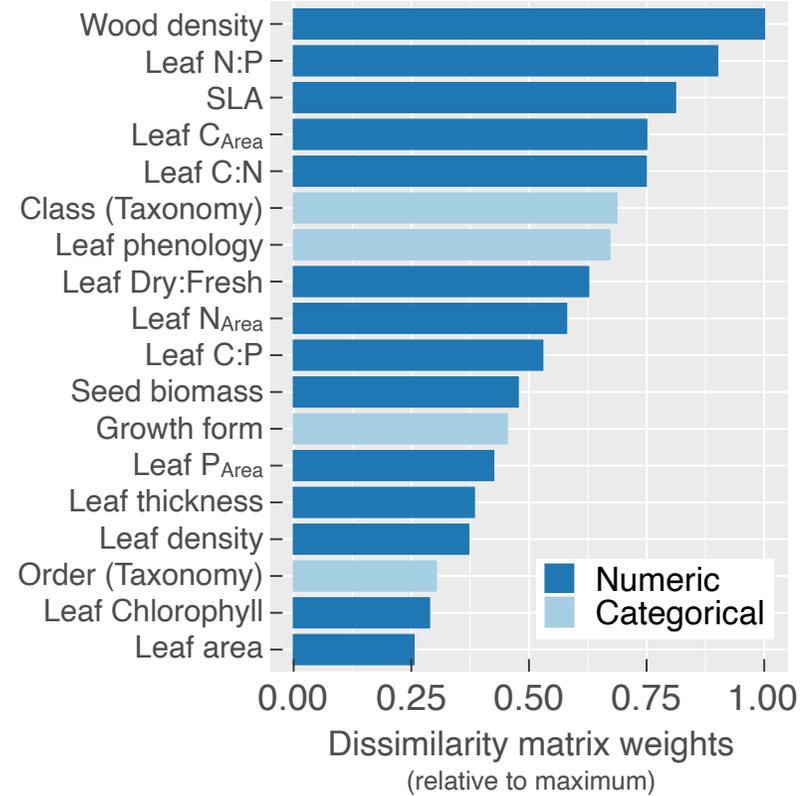
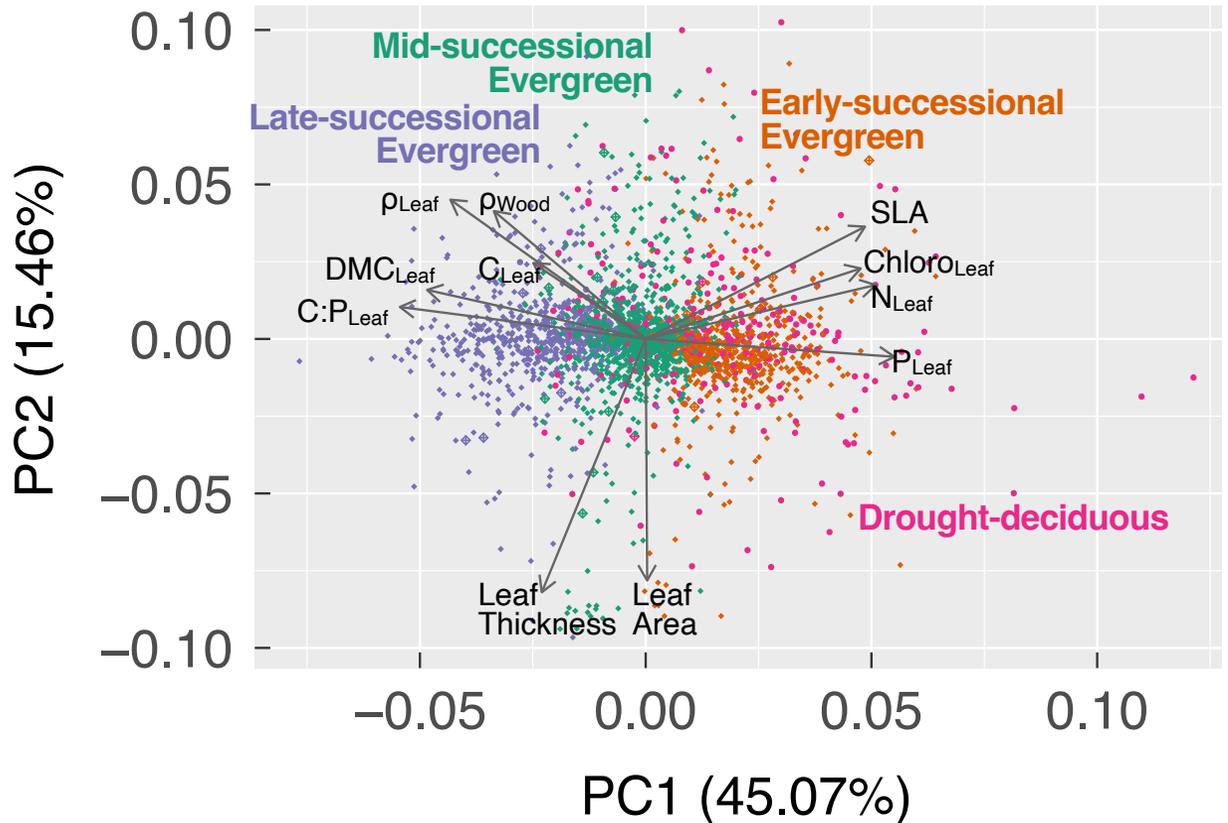
3 Obtain trait distributions and trait tradeoffs globally and for each cluster



- **144,150** observations in Neotropics
- **4130** species
- **68** traits (**24** traits for > 500 species)

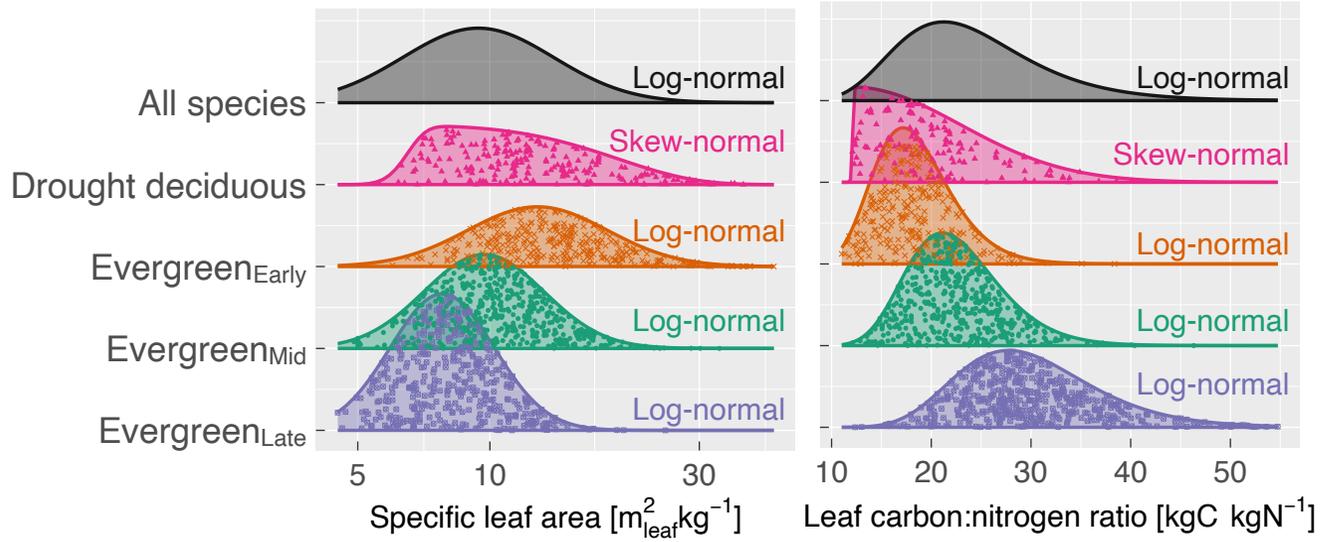


Trait-based PFT definitions

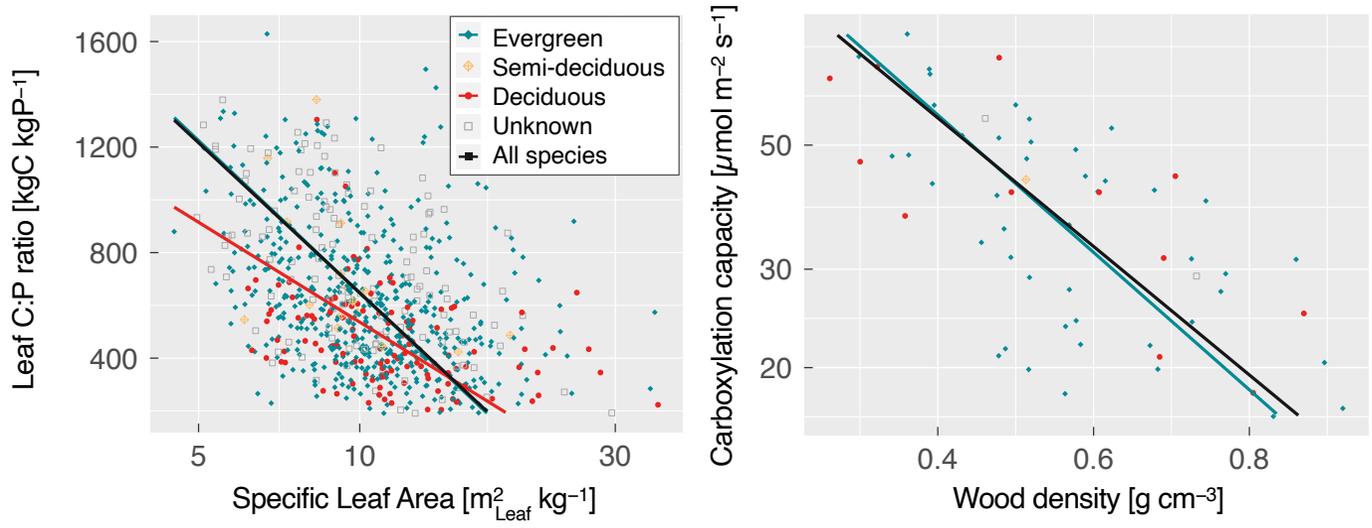


- Optimal number of clusters (k=4) based on gap statistics
- Evergreen clusters associated to acquisition-survivorship trade-offs; single deciduous cluster
- Few semi-deciduous measurements (mostly grouped with evergreens)

Trait distribution and trade-offs across clusters



- Trait distribution across clusters:
 - Clear separation across evergreens
 - Drought-deciduous: similarities with early- or mid-evergreens



- Trait trade-offs:
 - Distinct relationships between evergreen and deciduous
 - Similar across evergreen groups
 - Lack of data limited most trade-offs to global (or no trade-off at all)

Drought-deciduous implementation in FATES

Water stress function:

$$\langle \psi_{\text{PFT}} \rangle (t) = \frac{1}{10} \sum_{t'=t-9}^t \left[- \exp \left(\frac{\sum_{z=2}^{Z_{\text{PFT}}} \{ \ln [-\psi_z(t')] \rho_{\text{PFT}_z} \Delta z \}}{\sum_{z=2}^{Z_{\text{PFT}}} \{ \rho_{\text{PFT}_z} \Delta z \}} \right) \right]$$

Running time-average

Average within rooting zone

Root abundance

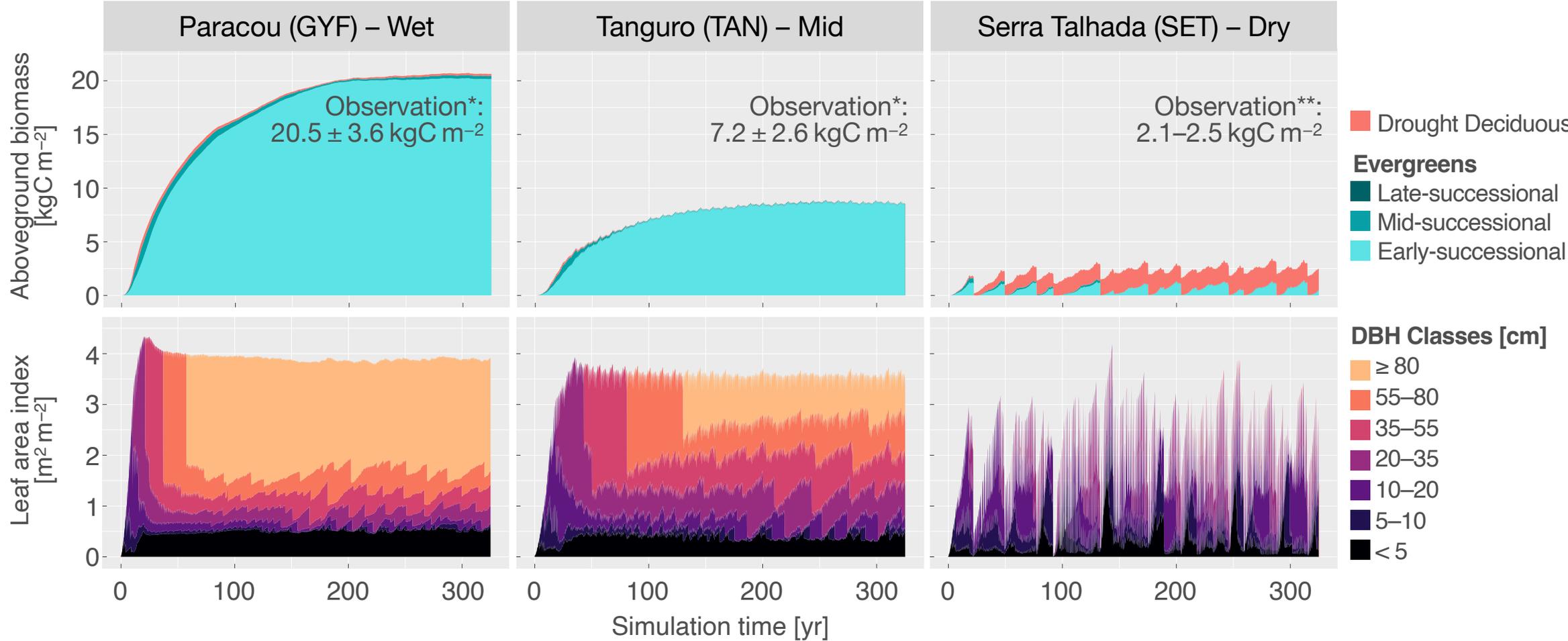
Soil layer thickness

Drought deciduous phases	
Leaf abscission	$\langle \psi \rangle \leq \psi_{\text{crit}}$ (no recent flushing) or Leaf age \geq Leaf longevity
Leaf flushing	$\langle \psi \rangle > \psi_{\text{crit}}$ (no recent abscission) or Last flushing > 13 months ago

Additional features:

- Phenological phase controls on carbon allocation
- Option for fine-root deciduousness
- Option for semi-deciduous phenology

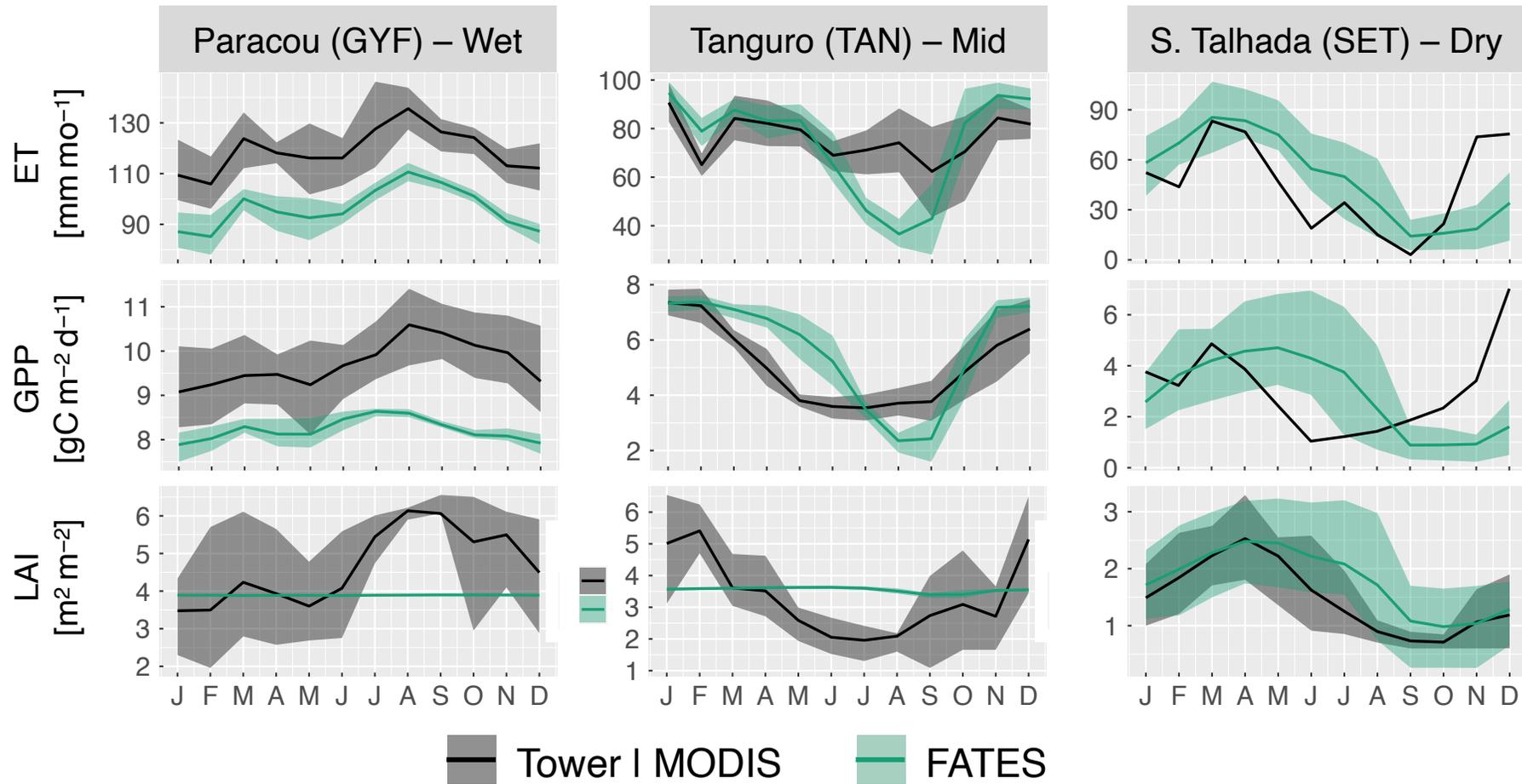
Long-term dynamics of biomass and LAI across rainfall gradient



*Estimate from plots, using allometry from Chave et al. (2014) *GCB*
[10.1111/gcb.12629](https://doi.org/10.1111/gcb.12629)

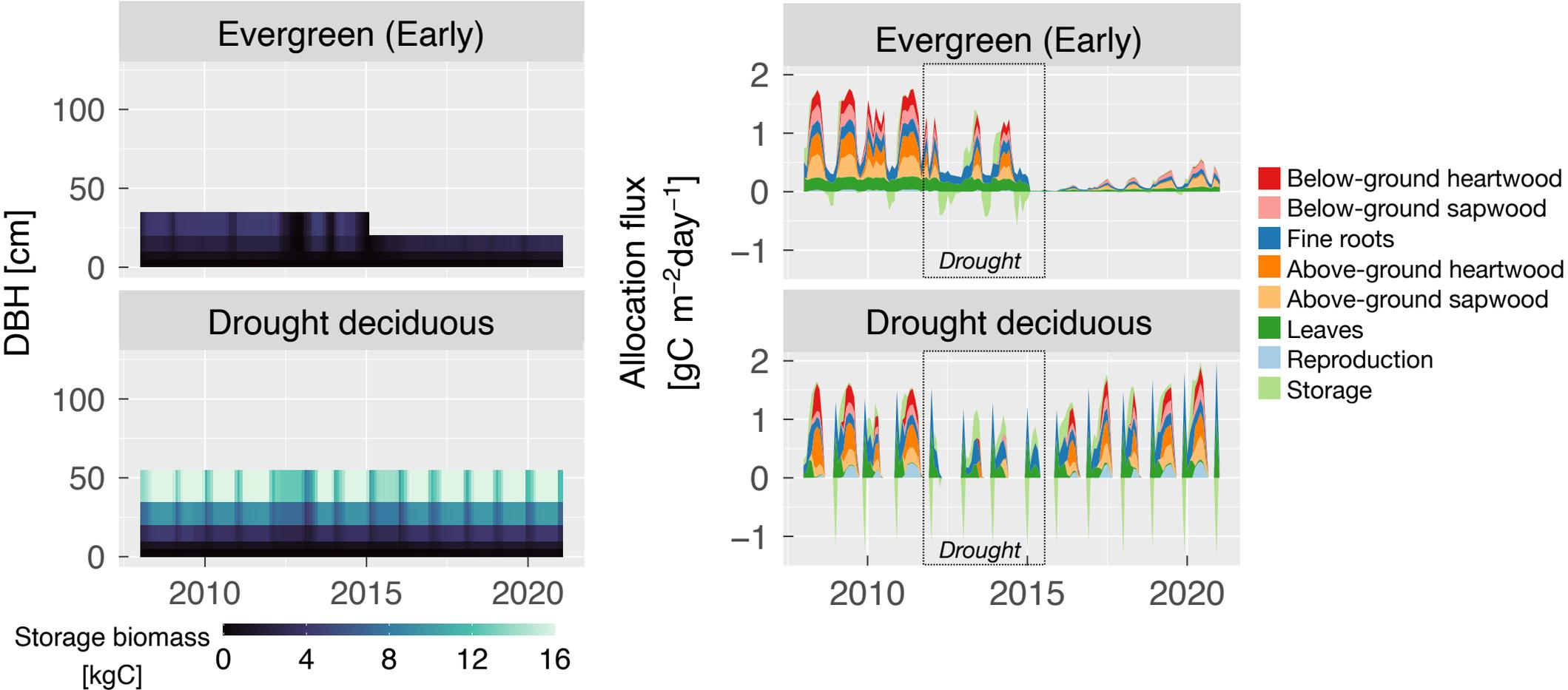
**Castanho et al. (2020) *An. Acad. Bras. Ciênc.*
[10.1590/0001-3765202020190282](https://doi.org/10.1590/0001-3765202020190282)

How well does FATES represent fluxes and phenology?



- Wet site: GPP and ET are biased low, but reasonable seasonal cycle
- TAN and SET: delayed dry-season drop → evergreen overestimation + water stress underestimation

Carbon allocation strategy – Serra Talhada



- Deciduous allocation allow higher survivorship during the 2012–2015 drought
- Evergreen fast recovery between drought allows maintaining population

Conclusions

- Seasonal carbon allocation strategies are critical for survivorship of drought deciduous trees
- Trait databases can be useful for defining PFTs, however distributions and trade-offs are limited by low sampling of many traits
- Next steps
 - Multi-site and multi-process model optimization based on trait distributions and trade-offs
 - Study impacts of climate change on leaf phenology dominance in the tropics.

