

**NGEE-Tropics** 



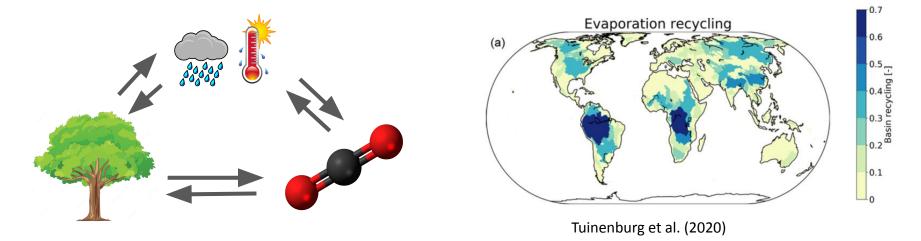
# Towards coexistence: data-driven FATES simulations across the Amazon

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#### **Motivation**

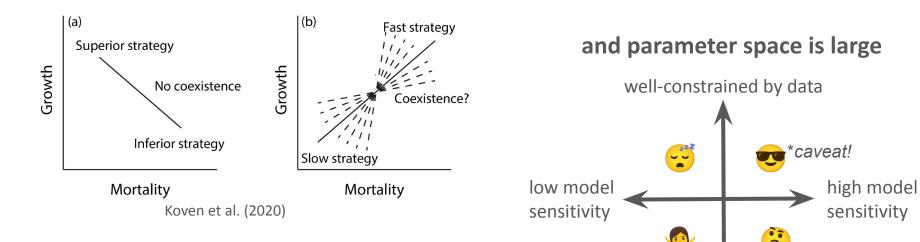
How will rising CO<sub>2</sub>, climate change, and land use affect climate-vegetation feedbacks and hydrology in the Amazon?



We need to calibrate and test FATES with offline regional-scale simulations before conducting coupled land-atmosphere simulations.

# Goal: realistic, continental-scale FATES simulations with multiple PFTs

#### Challenge: coexistence is tricky...



- Coexistence arises from interspecific trade-offs in life history strategy (e.g. Detto et al., 2021)
- Forest structure depends on balance of growth and mortality rates (e.g. Moore et al., 2020)

unconstrained by data

#### Our approach: data-based plant functional types (PFTs)

Use trait values from Marcos Longo's TRY+ cluster analysis (v 08.24.2023)

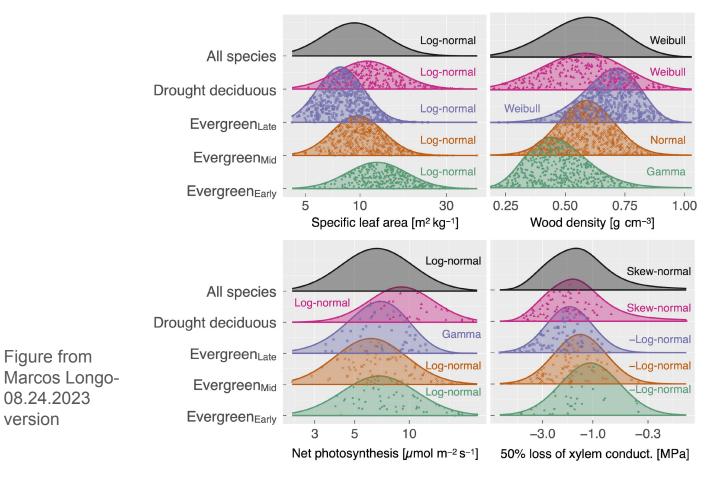
172,462 observations Current status of the data in the Neotropics 4655 species

Traits data available for more than 250 species*								
Crown Area	Diameter at Breast Height	Growth Form	Specific Leaf Area	Leaf N:P Ratio	Leaf Area (Single Blade)	Leaf Force (Puncture)	Photosynth. Pathway	Leaf Chlorophyll (Area-based)
Crown Diameter	Height	Plant Woodiness	Leaf Width	Leaf Density	Leaf Nitrogen (Mass-based)	Leaf Toughness (Puncture)	Net Photosyn. Rate (Mass-based)	Net Photosyn Rate (Area-based)
Bark Thickness	Crown Depth	Bark Density	Leaf Thickness	Leaf Carbon (Mass-based)	Leaf Dry Matter Content	Leaf Nitrogen (Area-based)	Xylem $P_{_{50}}$	R <sub>Dmax</sub> :V <sub>Cmax</sub> Ratio
Seed Biomass	Seed Dispersal Syndrome	Wood Density	Leaf Width	Leaf Phosphorus (Mass-based)	Leaf C:P Ratio	Leaf Carbon (Area-based)	Leaf turgor loss point	Leaf Phenology
Biome	Climate	Plant Functional Type	Nitrogen Fixer	Mycorrhiza Association	Leaf C:N Ratio	Leaf Phosphorus (Area-based)	Saturated Wood Water Content	Wood Hydraulic Conductivity

slide from Marcos Longo

\*This excludes non-canopy observations for traits with high photo-plasticity

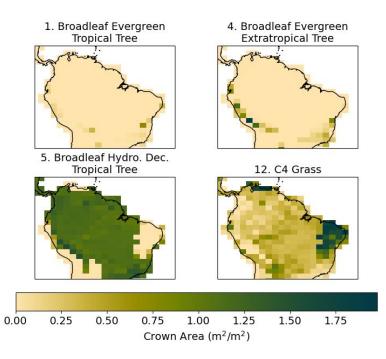
#### Marcos's cluster analysis identified 4 tropical tree PFTs



version

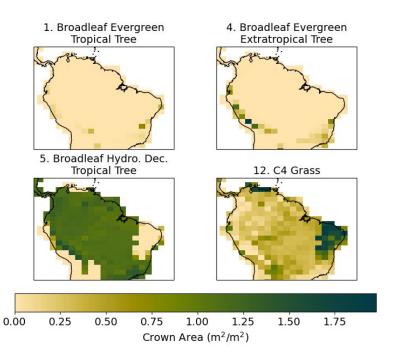
## **Results from initial simulations with competition**

July 2023 - FATES default api25.5.0

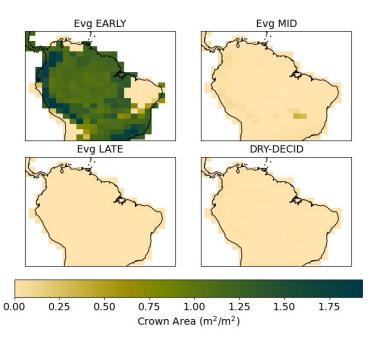


## Initial results from simulations with competition

July 2023 - FATES default api25.5.0

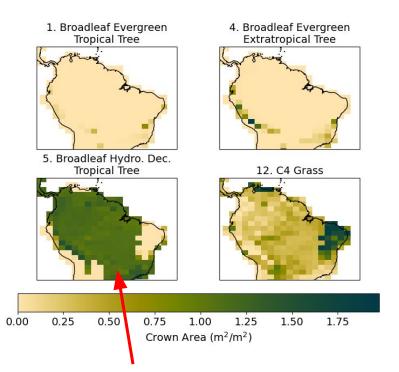


Sep 2023 - initial run with Marcos's TRY+ cluster analysis medoid species

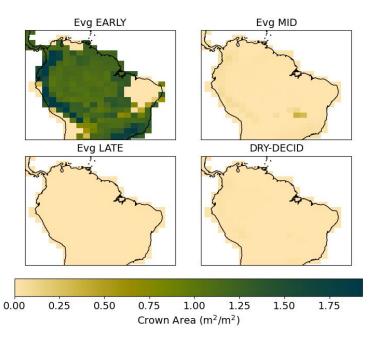


## Initial results from simulations with competition

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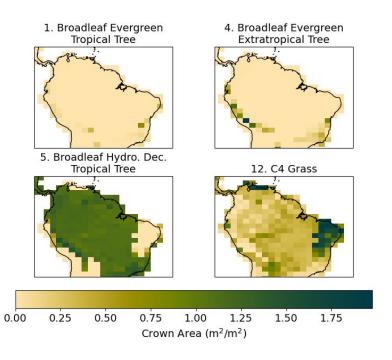
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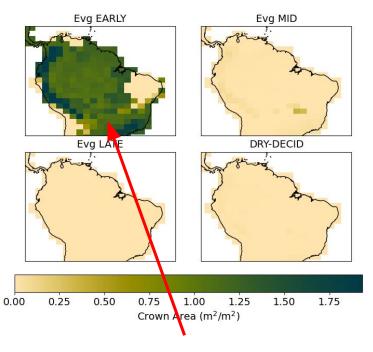
#### Because of high SLA

## Initial results from simulations with competition

July 2023 - FATES default api25.5.0



Sep 2023 - initial run with Marcos's TRY+ cluster analysis medoid species



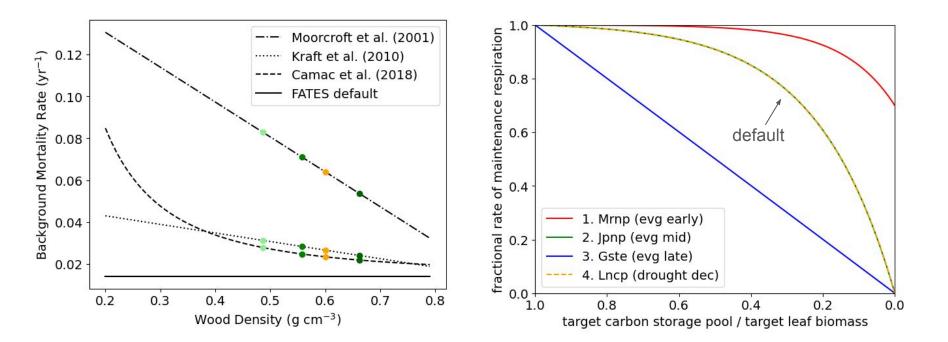
#### Living fast but not dying young

#### **Our process to increase PFT coexistence**

In offline continental-scale simulations driven by GSWP3 climatology (Van den Hurk et al., 2016):

- 1. Adjust values of parameters related to mortality and carbon balance
- 2. Assess results in **no-competition** mode relative to our ecological expectations (Buotte et al., 2021): e.g. early successional trees should not survive in the understory, late successional should
- 3. Iterate 1-2 until ecological expectations met in no-comp mode, then turn competition back on 🤞

### **PFT-dependent mortality and carbon balance**



Denser wood: less vulnerable to embolism, pathogens, breakage

Conservative strategy of late successionals

# **Summary of parameter changes**

- Use N and P stoichiometric ratios for leaves, SLA, and wood density for the medoid species from Marcos's TRY+ cluster analysis
- Background mortality: negative linear function of wood density from Kraft et al. (2010)
- Leaf lifespan increases with wood density, values from Moorcroft et al. (2001).
  Fine root lifespan = leaf lifespan
- Carbon storage cushion increases with wood density for evergreen PFTs (loosely inspired by Signori-Müller et al., 2021)
- Realistic hydraulic failure soil moisture thresholds (P. Thornton) that decrease with increasing wood density
- Edit function that reduces maintenance respiration when target carbon storage pool < target leaf biomass so that late successional PFT is very conservative while early successional PFT respires away.
- Maximum C-starve mortality rate raised for early and lowered for late.
- Allometry parameters from Jessica Needham's analysis using BAAD (Falster et al., 2015) and Tallo (Jucker et al., 2022) databases

- < fates\_stoich\_nitr = 0.033, 0.033, 0.033, 0.04,
- > fates\_stoich\_nitr = 0.05055671, 0.04261242, 0.03589802, 0.04548516,
- < fates\_stoich\_phos = 0.0033, 0.0033, 0.0033, 0.004,
- > fates\_stoich\_phos = 0.00219874, 0.00162196, 0.00123329, 0.00176053,
- < fates\_alloc\_storage\_cushion = 1.2, 1.2, 1.2, 2.4;
- > fates\_alloc\_storage\_cushion = 1, 1.8, 2.7, 2.4;
- < fates\_leaf\_slatop = 0.012, 0.012, 0.012, 0.03;
- > fates\_leaf\_slatop = 0.014384, 0.011989, 0.009148, 0.013033 ;
- < fates\_maintresp\_reduction\_curvature = 0.01, 0.01, 0.01, 0.01; ---> fates\_maintresp\_reduction\_curvature = 0.001, 0.01, 0.09, 0.01
- < fates\_maintresp\_reduction\_intercept = 1, 1, 1, 1;
- > fates\_maintresp\_reduction\_intercept = 0.3, 1, 1, 1;

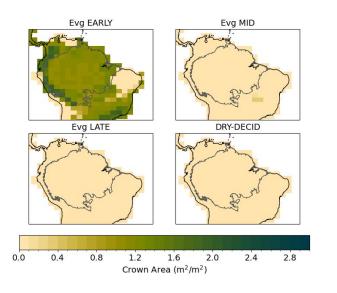
< fates\_mort\_bmort = 0.014, 0.014, 0.014, 0.014;

- > fates\_mort\_bmort = 0.031274, 0.028322, 0.024058, 0.0266 ;
- < fates\_mort\_hf\_sm\_threshold = 1e-06, 1e-06, 1e-06, 1e-06 ;
- > fates\_mort\_hf\_sm\_threshold = 0.4, 0.3, 0.2, 0.3 ;
- < fates\_mort\_scalar\_cstarvation = 0.6, 0.6, 0.6, 0.6;
- > fates\_mort\_scalar\_cstarvation = 0.9, 0.6, 0.1,0.6;
- < fates\_turnover\_fnrt = 1, 1, 1, 1;
- > fates\_turnover\_fnrt = 1.0, 2.0, 3.0, 1.0;
- < fates\_wood\_density = 0.7, 0.7, 0.7, 0.7;
- > fates\_wood\_density = 0.486, 0.558, 0.662, 0.6 ;
- < fates\_turnover\_leaf = 1.5, 1.5, 1.5, 1;
- > fates\_turnover\_leaf = 1.0, 2.0, 3.0, 1.0;

*Note: fates\_leaf\_vcmax25top* = *50, 50, 50, 58* 

#### Turning competition back on...

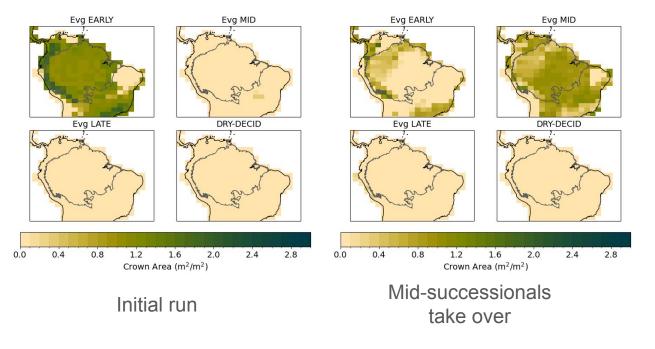
#### Sep 2023



Initial run

#### Turning competition back on...

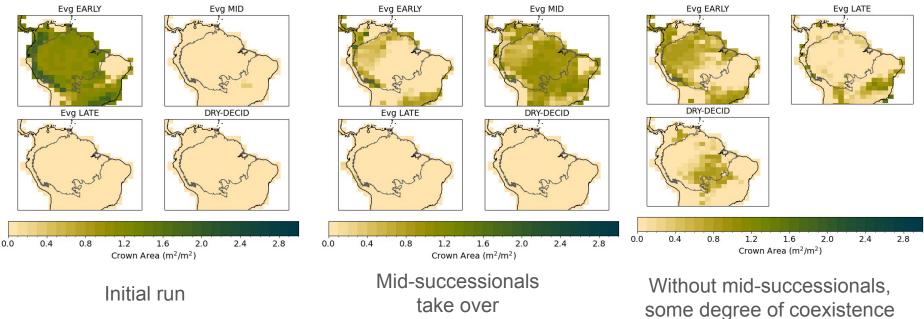
Sep 2023



#### Nov 2023

#### **Turning competition back on...**

Sep 2023



#### Nov 2023

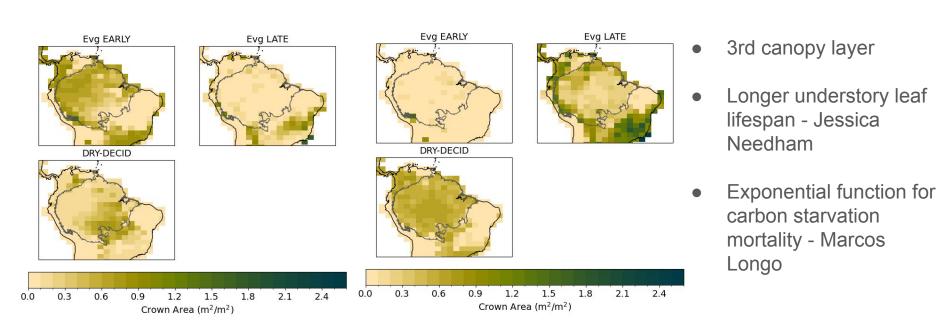
take over

between remaining PFTs

#### Recent code developments help late successional PFT

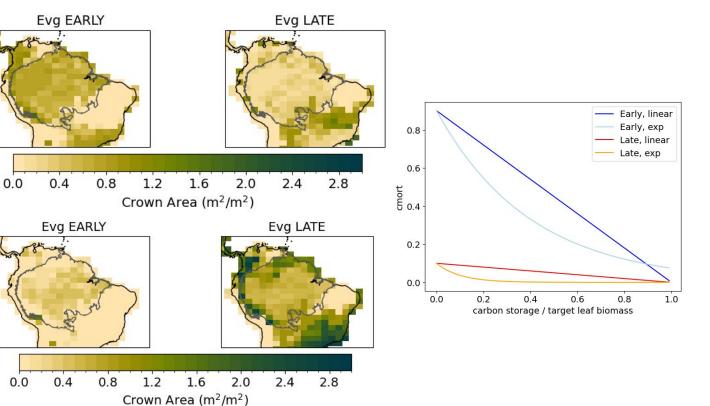
Jan 2024

Nov 2023



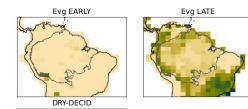
# High sensitivity to variations in C-starve mortality function



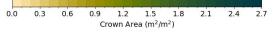


Exponential cmort Early e-folding param = 0.4

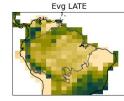
# In progress: PFT-specific height allometry





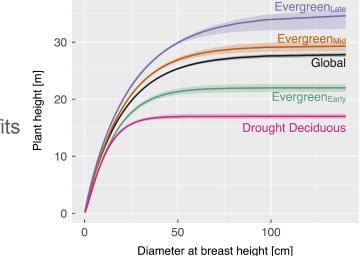


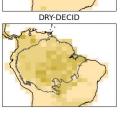




2.7

← Using Marcos's allometry fits for height (08.24.2023)

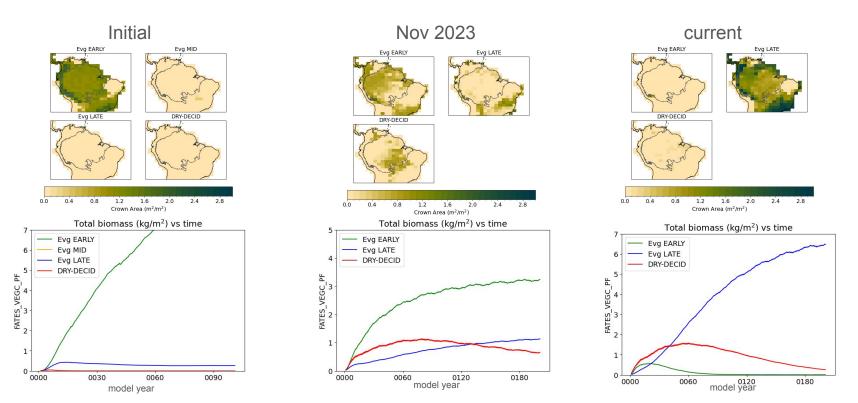




0.0 0.3 0.6 0.9 1.2 1.5 1.8 2.1 2.4 Crown Area (m<sup>2</sup>/m<sup>2</sup>)

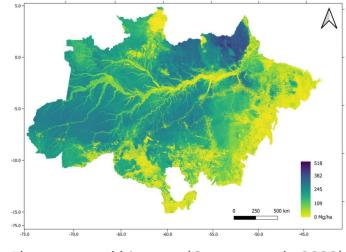
#### **Summary**

Our FATES simulations with competition show progress from early-successional dominance to late-successional dominance via parameter adjustments to reflect trade-offs in PFTs' life history strategies



## **Next steps**

- Benchmarking
  - Census data: growth and mortality rates
  - ILAMB
  - Remote sensing data, e.g. Ometto et al. (2023)
- FATES-Hydro (in progress) and SPITFIRE
- Expand exploration of parameter space with single site PPEs Marcos Longo
- Can NN ML surrogate models predict coexistence from traits, growth and mortality rates at year N?
  - Build on Li et al. (2023)



Above ground biomass (Ometto et al., 2023)

#### Acknowledgement

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#### Collaborators

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