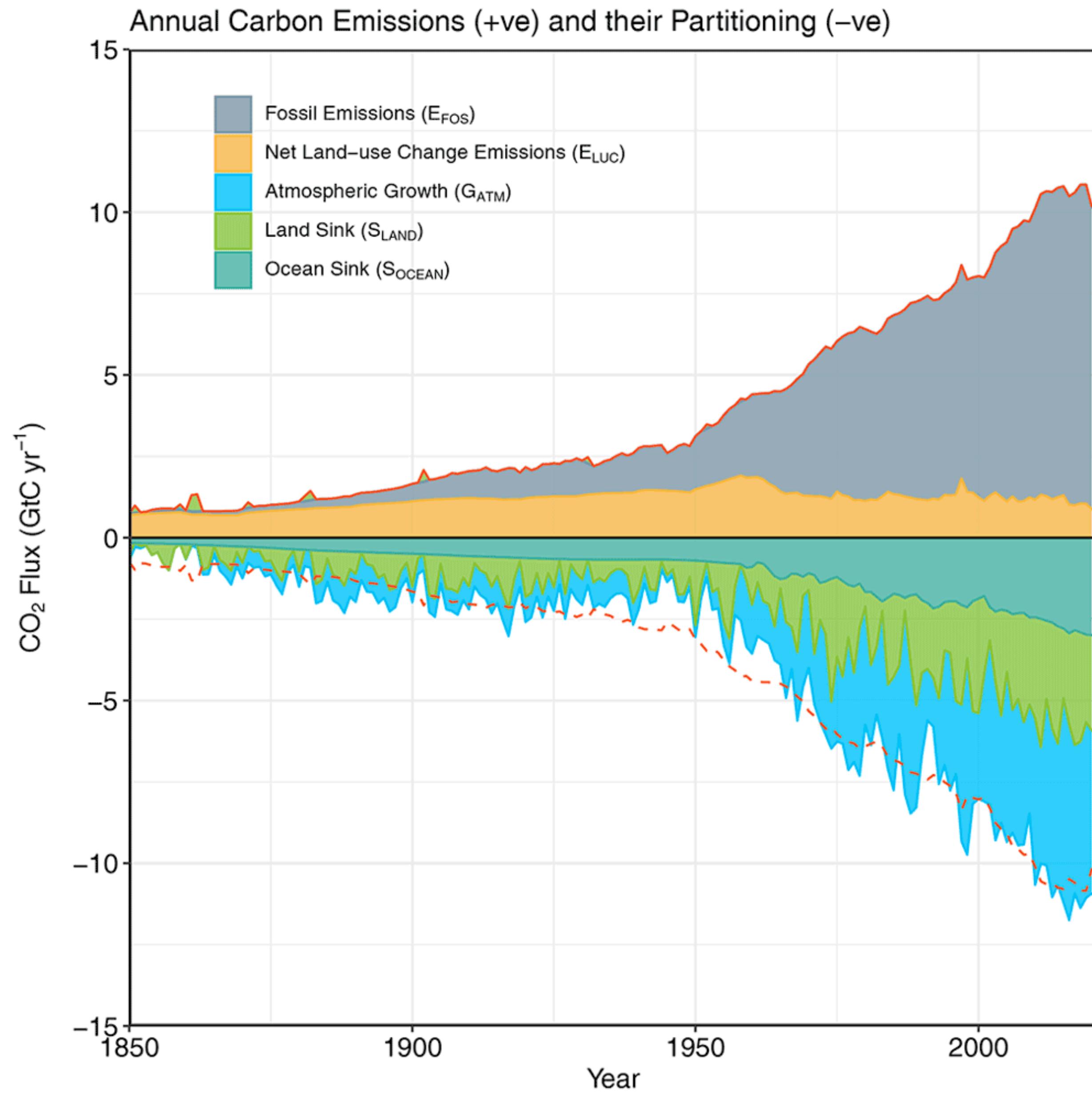


# Modeling global vegetation processes and hyperspectral canopy radiative transfer using CliMA Land

**Yujie Wang, Renato Braghieri, ..., Anthony Bloom, and Christian Frankenberg**

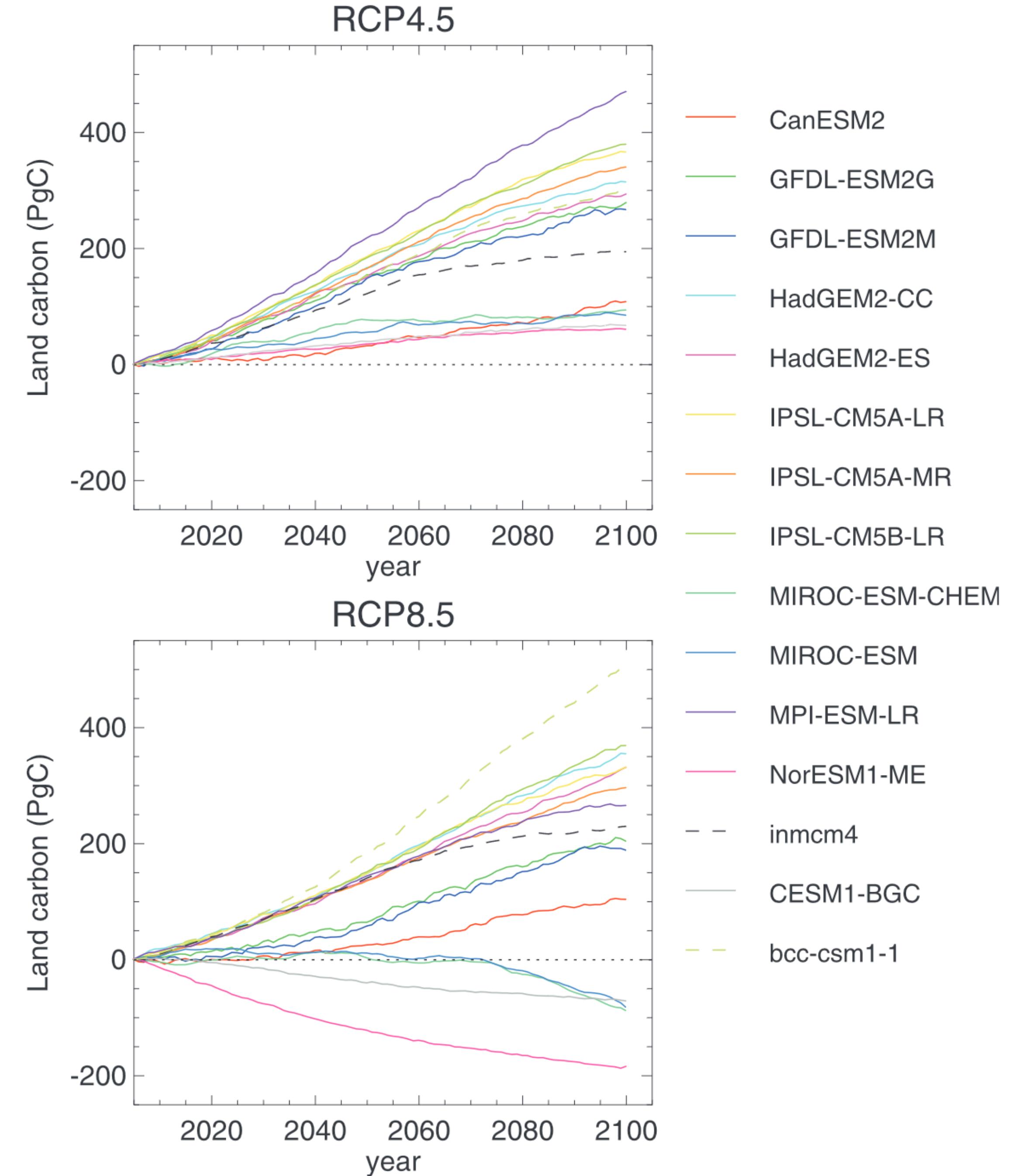


**Land takes up  
25% of emitted  
CO<sub>2</sub>, but we do  
not know how  
much nature  
can help in the  
future**

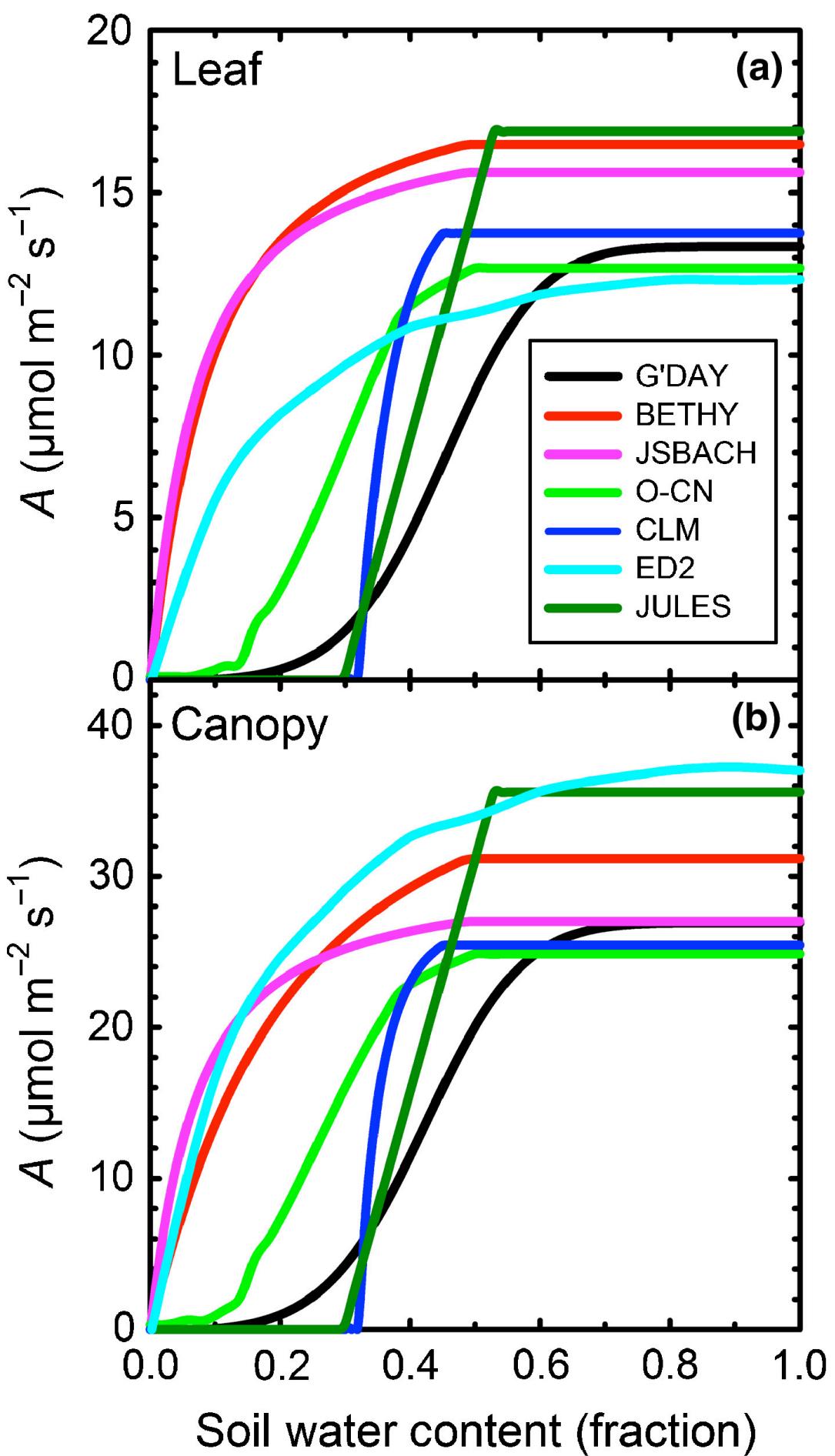
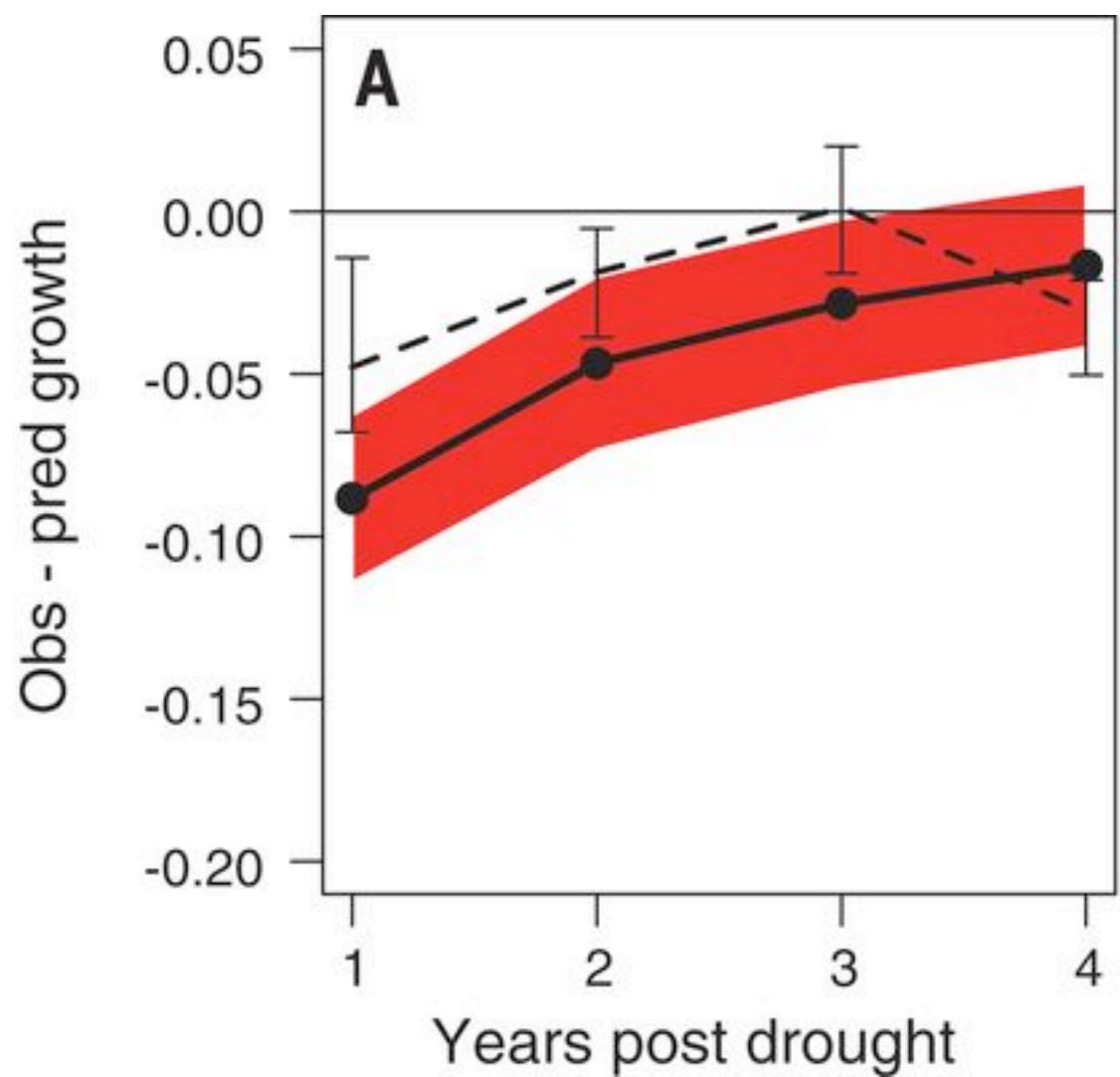
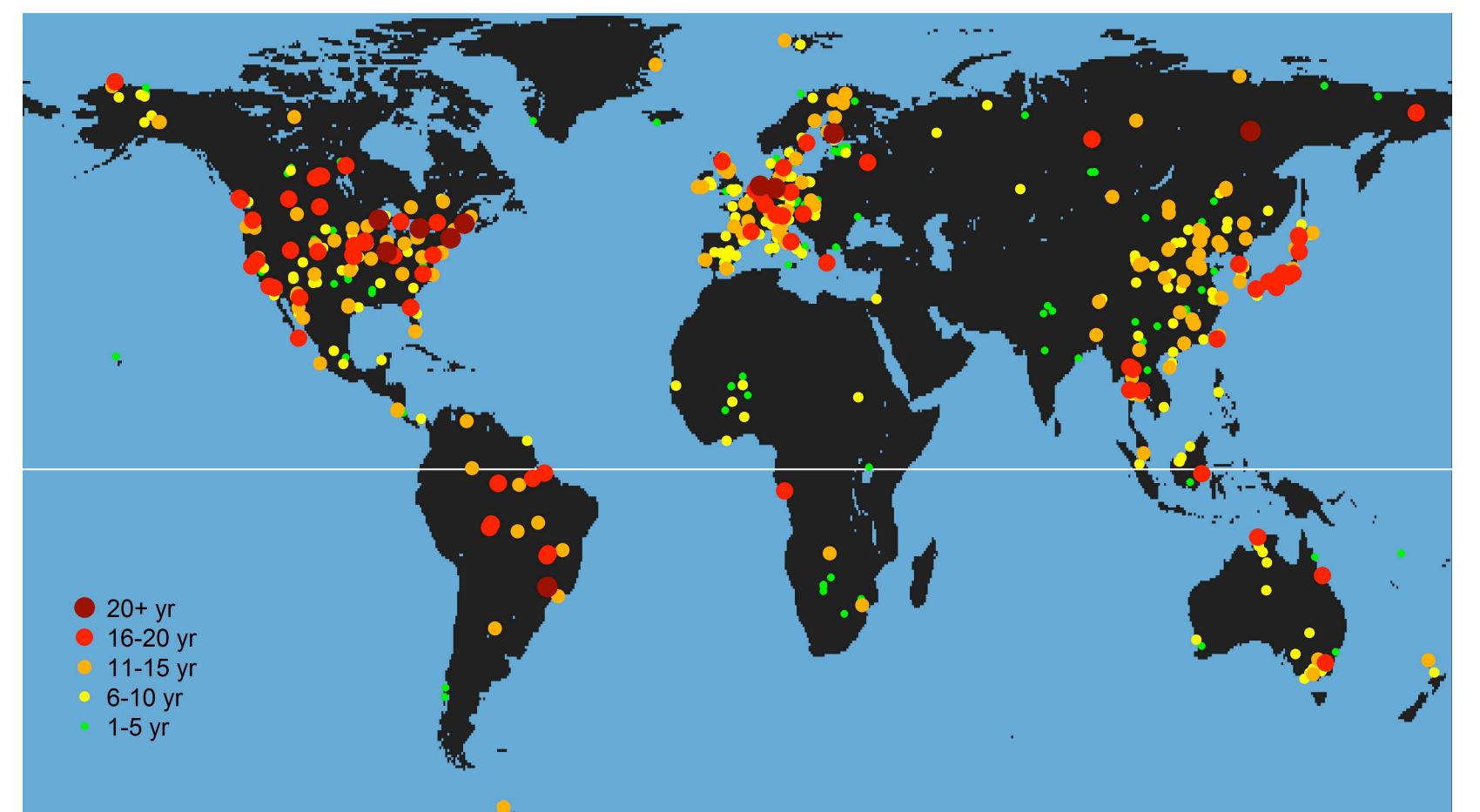




**Climate models  
differ in their  
projections of  
land carbon  
sink strength,  
even in the  
directions**



- 1. Lack physiological representations**
- 2. Contrasting model parameterization**
- 3. Limited data to calibrate the model**





# Challenges

## 1. Schemes

**Improve model representation of soil-plant-air continuum**

## 2. Setups

**Advance model parameters configuration**

## 3. Calibration

**Use more data to calibrate the models**



# A next generation model—CliMA Land Bridging vegetation processes with remote sensing

## 1. Schemes

Improve model representation of soil-plant-air continuum

## 2. Setups

Advance model parameters configuration

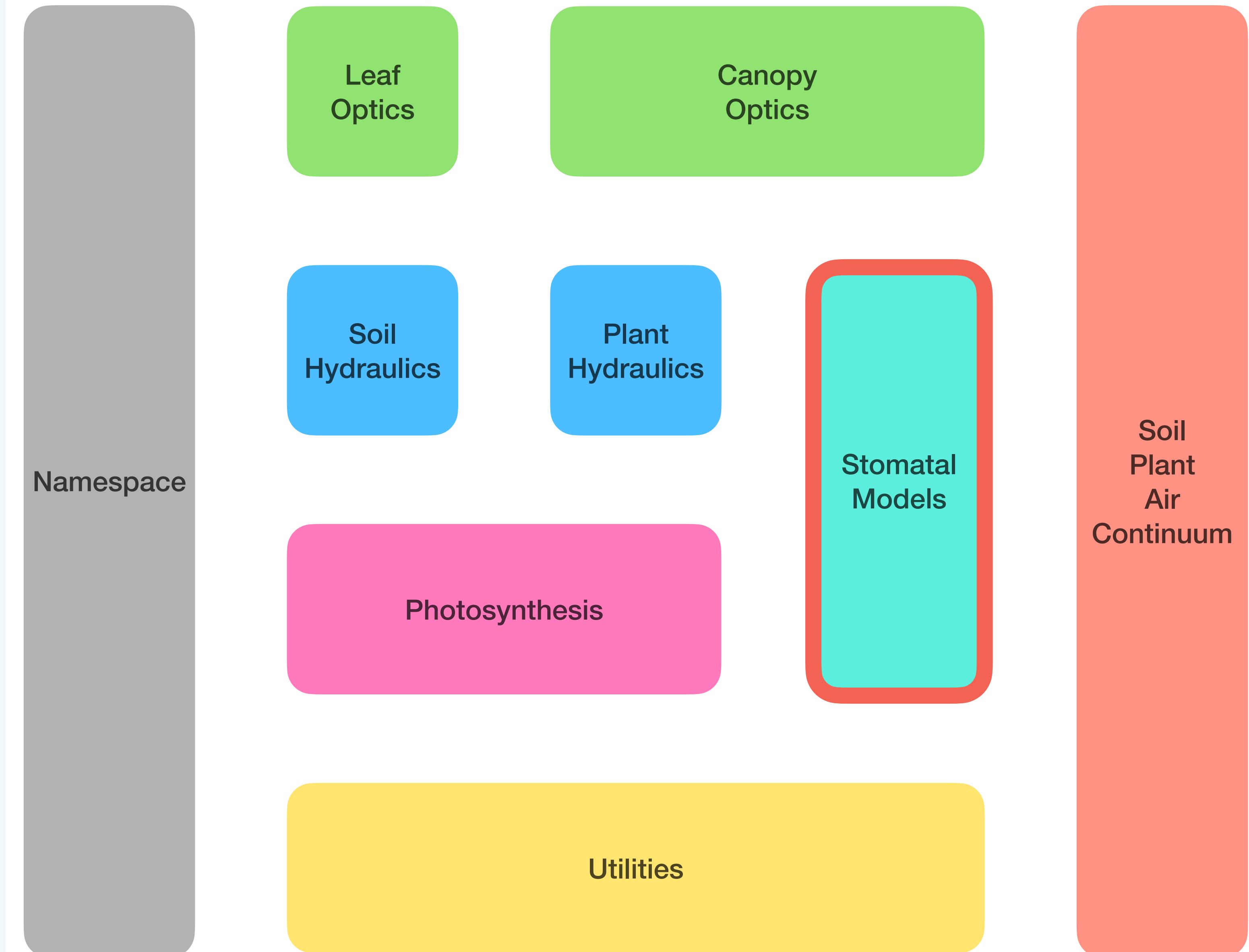
## 3. Calibration

Use more data to calibrate the models



## 1. Modularity

**Each module  
can be used as  
a **standalone**  
package**



## 2. User friendly

**Convenient functions to begin with**

**GUI on the way for teaching purpose**

```
spac = MonoMLTreeSPAC{Float64}();
initialize!(spac);
update!(spac; cab = 40, car = 6);
soil_plant_air_continuum!(spac, 120.0);

@show TROPOMI_SIF740(spac.CANOPY);
@show MODIS_NIRv(spac.CANOPY);
@show OC02_SIF759(spac.CANOPY);
```



### 3. Freedom

#### Various model schemes to choose from

Namespace  
Free combinations

#### Leaf Optics

Broadband  
Hyper-spectral

#### Canopy Optics

Broadband / hyper-spectral  
Single to multiple layers

#### Soil Hydraulics

Van Genuchten  
Brooks Corey

#### Plant Hydraulics

Multiple VC forms  
Custom structure  
SS or NSS

#### Stomatal Models

(Empirical)  
Ball Berry  
Leuning  
Medlyn  
Gentine

(Optimality)  
Wolf-Anderegg  
Pacala  
Sperry  
Eller  
Wang

Soil  
Plant  
Air  
Continuum

Namespace  
Free combinations

#### Photosynthesis

Classic C3 model  
Classic C4 model  
New Cytochrome C3 model

Single elements  
Complex SPAC

#### Utilities

Shared constants  
Solvers  
IO Tools



## 4. Database

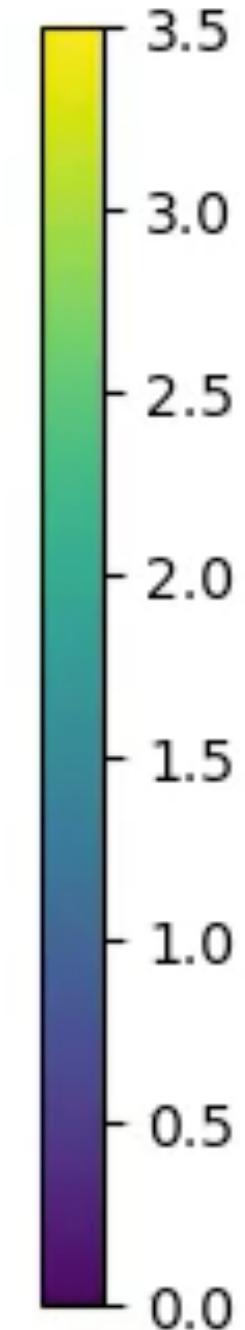
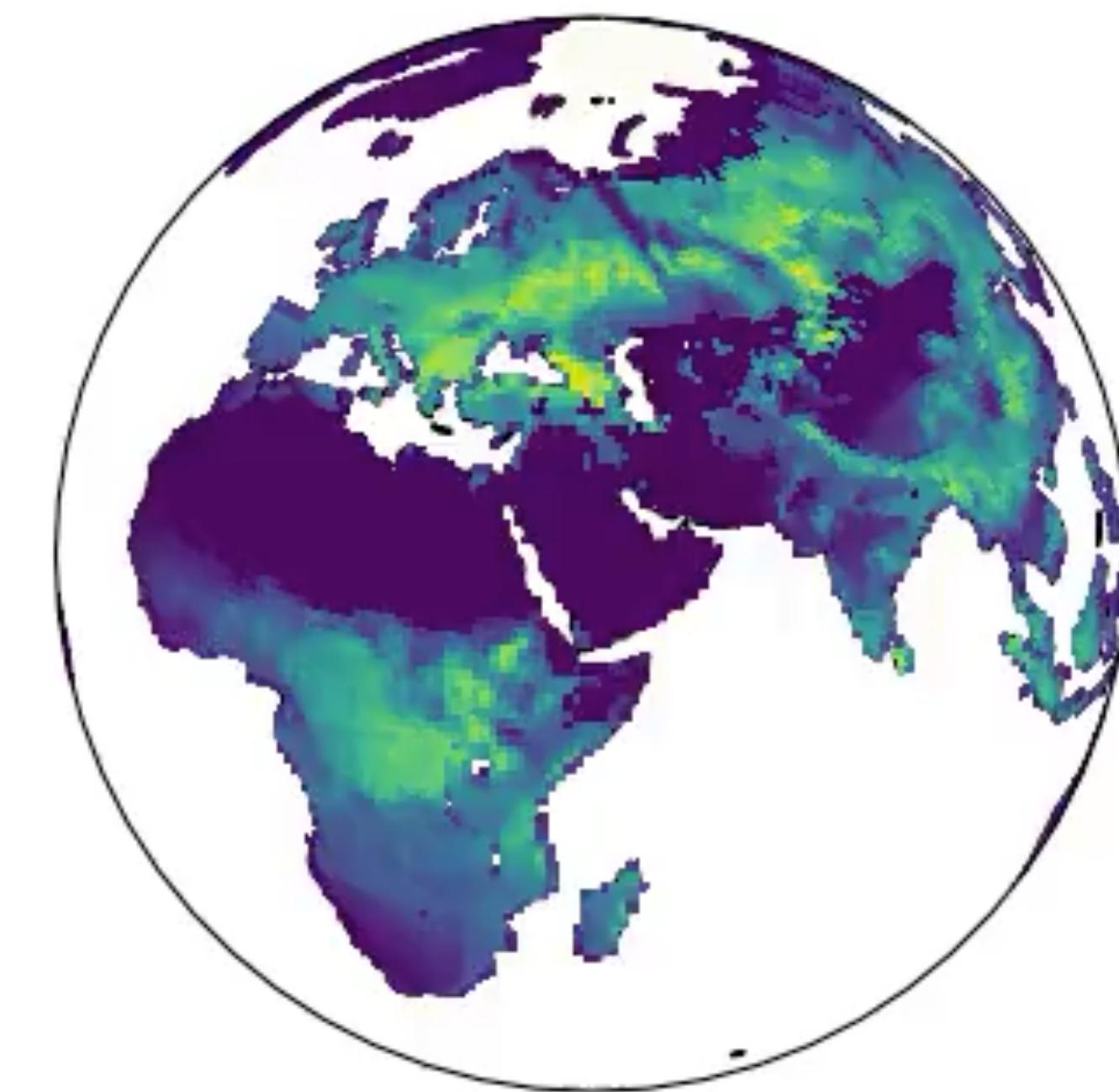
**TAG is the only thing you need to know**

```
using GriddingMachine.Collector: query_collection;
file_path = query_collection("VCMAX_2X_1Y_V1");

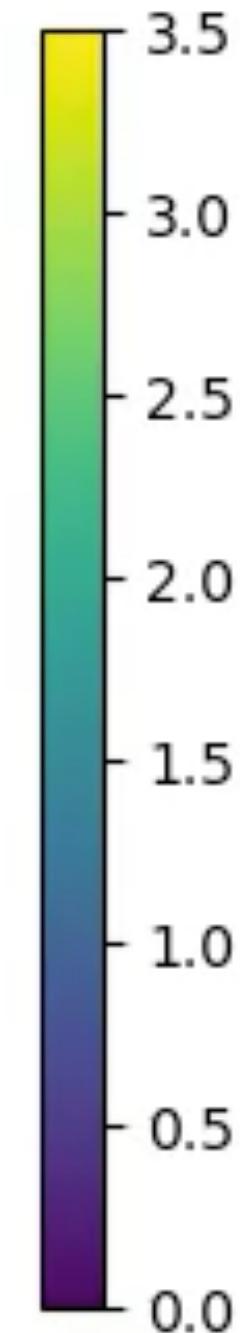
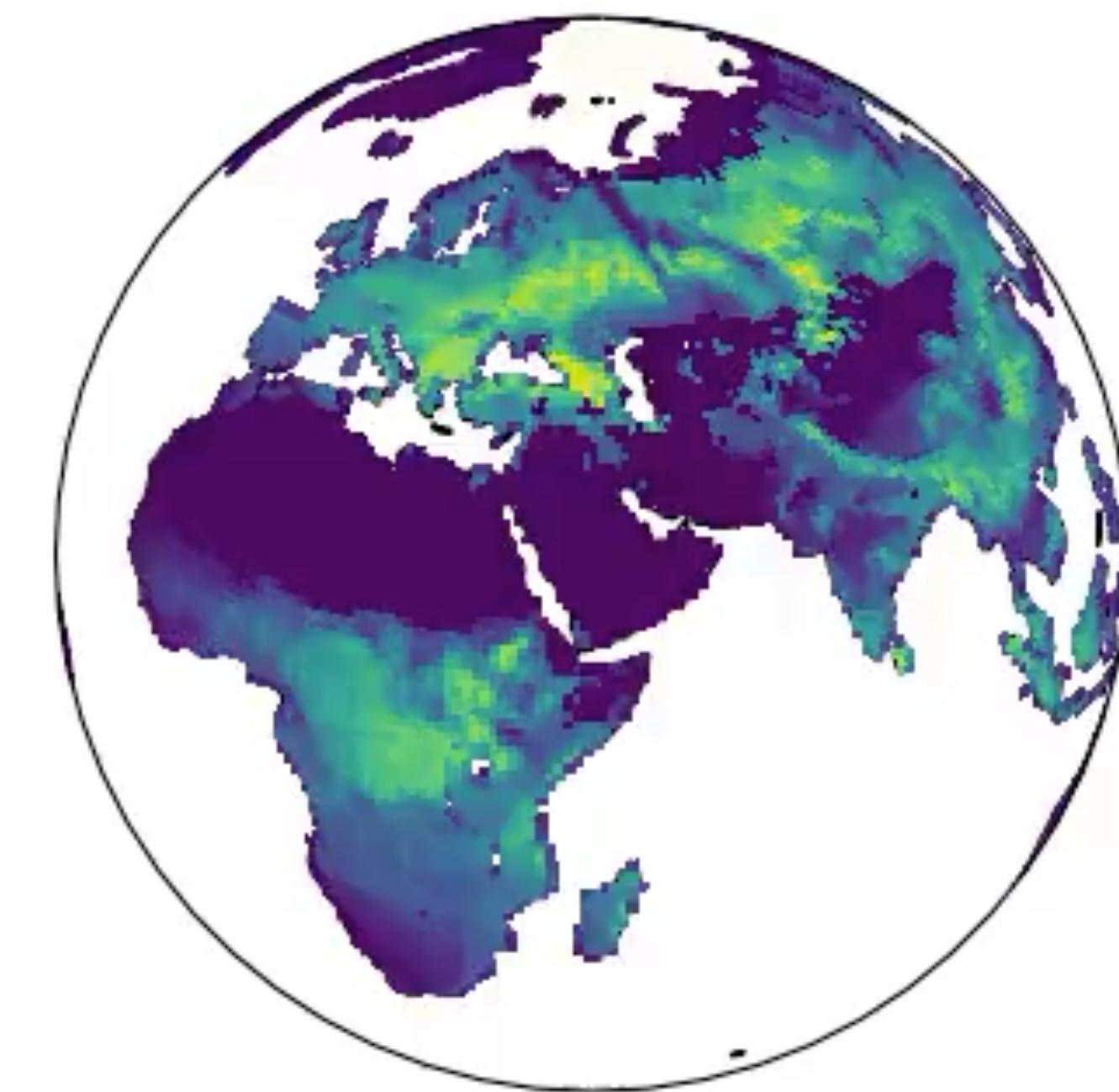
using GriddingMachine.Requestor: request_LUT;
dat,std = request_LUT("LAI_MODIS_20x_1M_2020_V1", 28.6, -81.2);
```

Dataset type	LABEL	EXTRALABEL	IX	JT	YEAR	VK	Reference	Change logs
Gross primary productivity	GPP	MPI_RS	2X	1M, 8D	2001-2019	V1	Tramontana et al. (2016)	4,9
	GPP	VPM	5X, 12X	8D	2000-2019	V2	Zhang et al. (2017)	1,4
Leaf area index	LAI	MODIS	2X, 10X, 20X	1M, 8D	2000-2020	V1	Yuan et al. (2011)	1,4,9
Latent heat flux	LE	MPI_RS	2X	1M, 8D	2001-2015	V1	Jung et al. (2019)	4,9
Solar induced chlorophyll	SIF	TROPOMI_683, TROPOMI_683DC	1X, 2X, 4X,	1M, 8D	2018-2020	V2	Köhler et al. (2020)	1,8

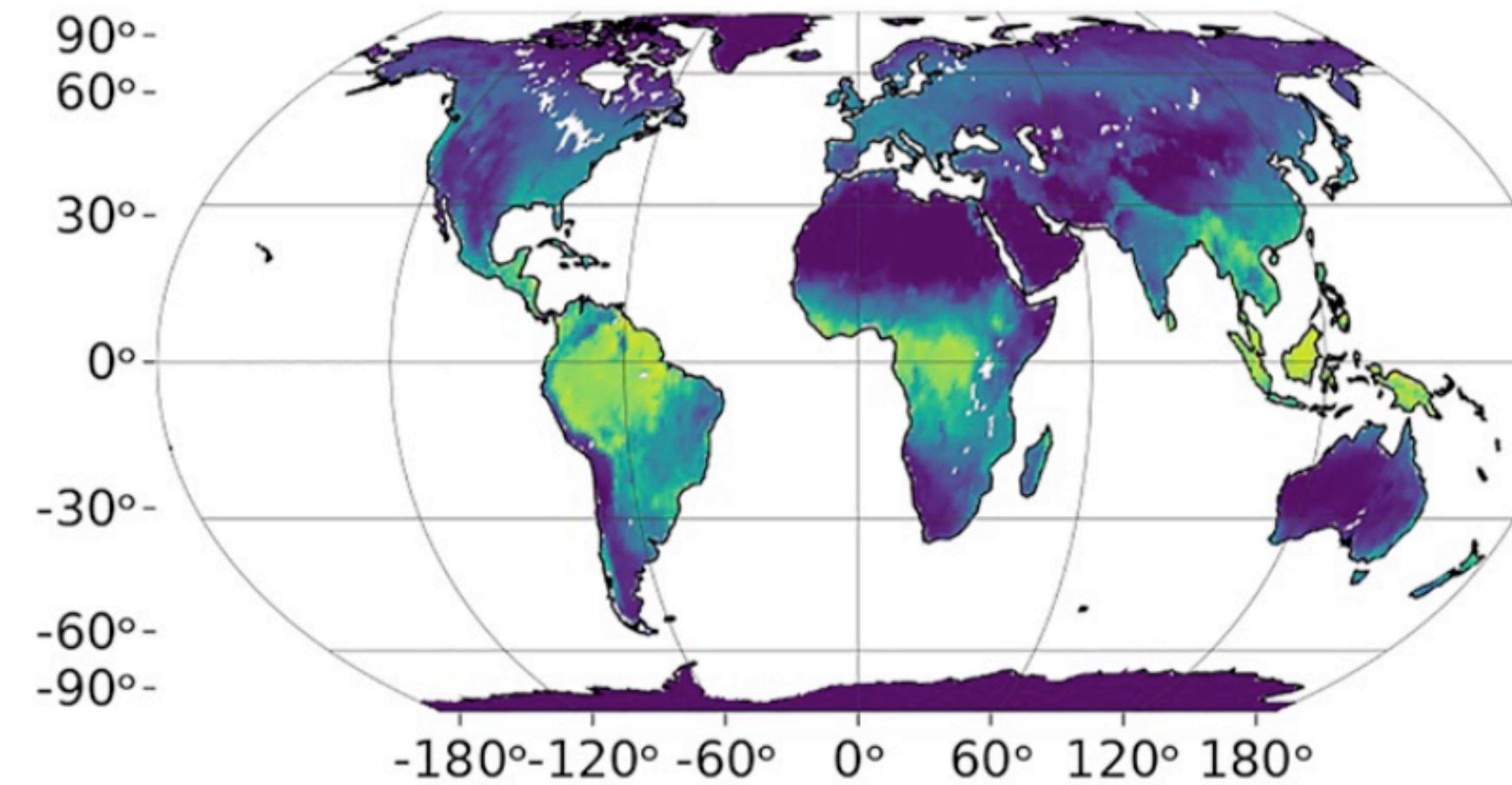
**Global simulations of  
canopy optical  
properties that can be  
seen from space**



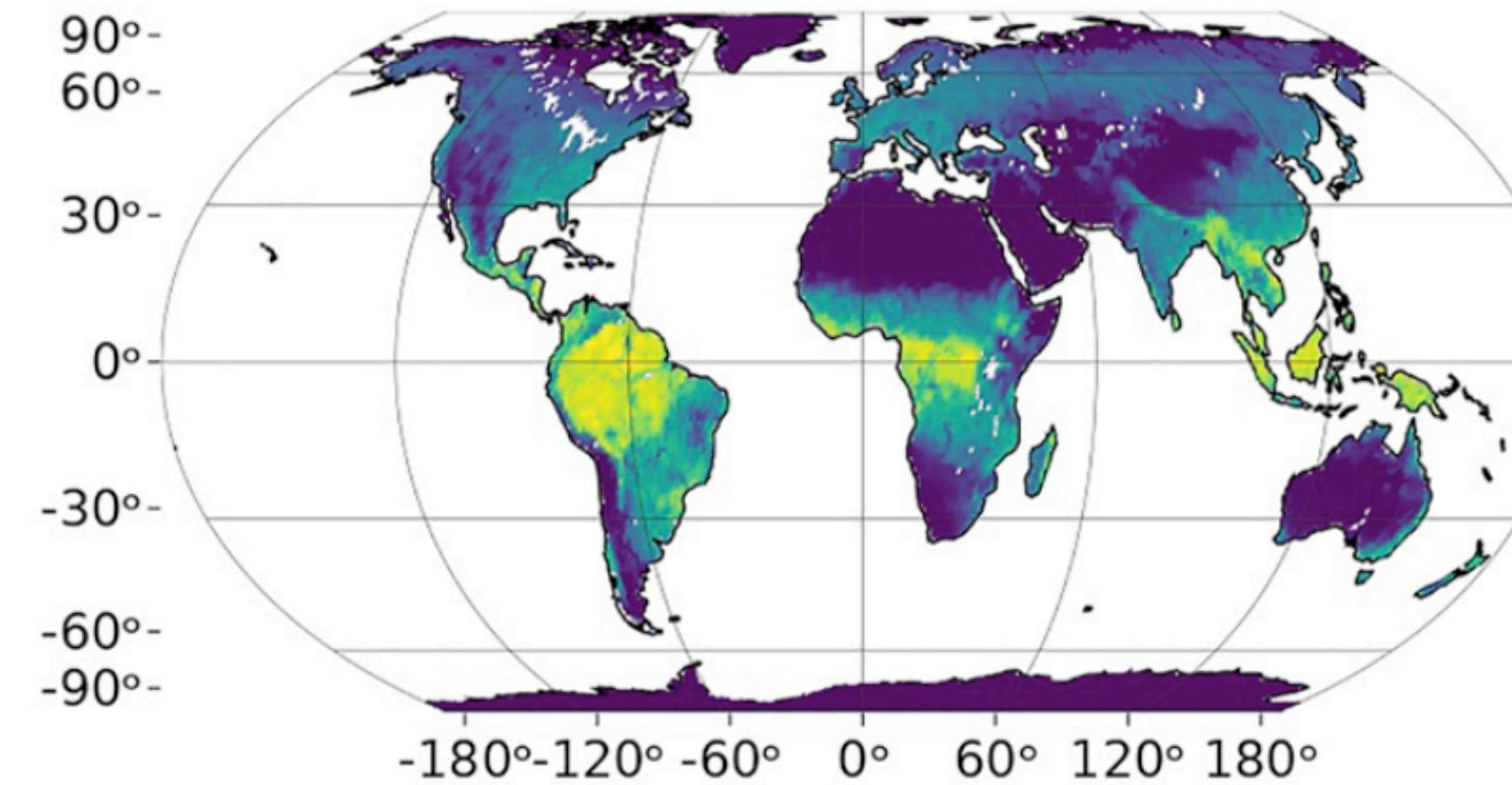
**Global simulations of  
canopy optical  
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seen from space**



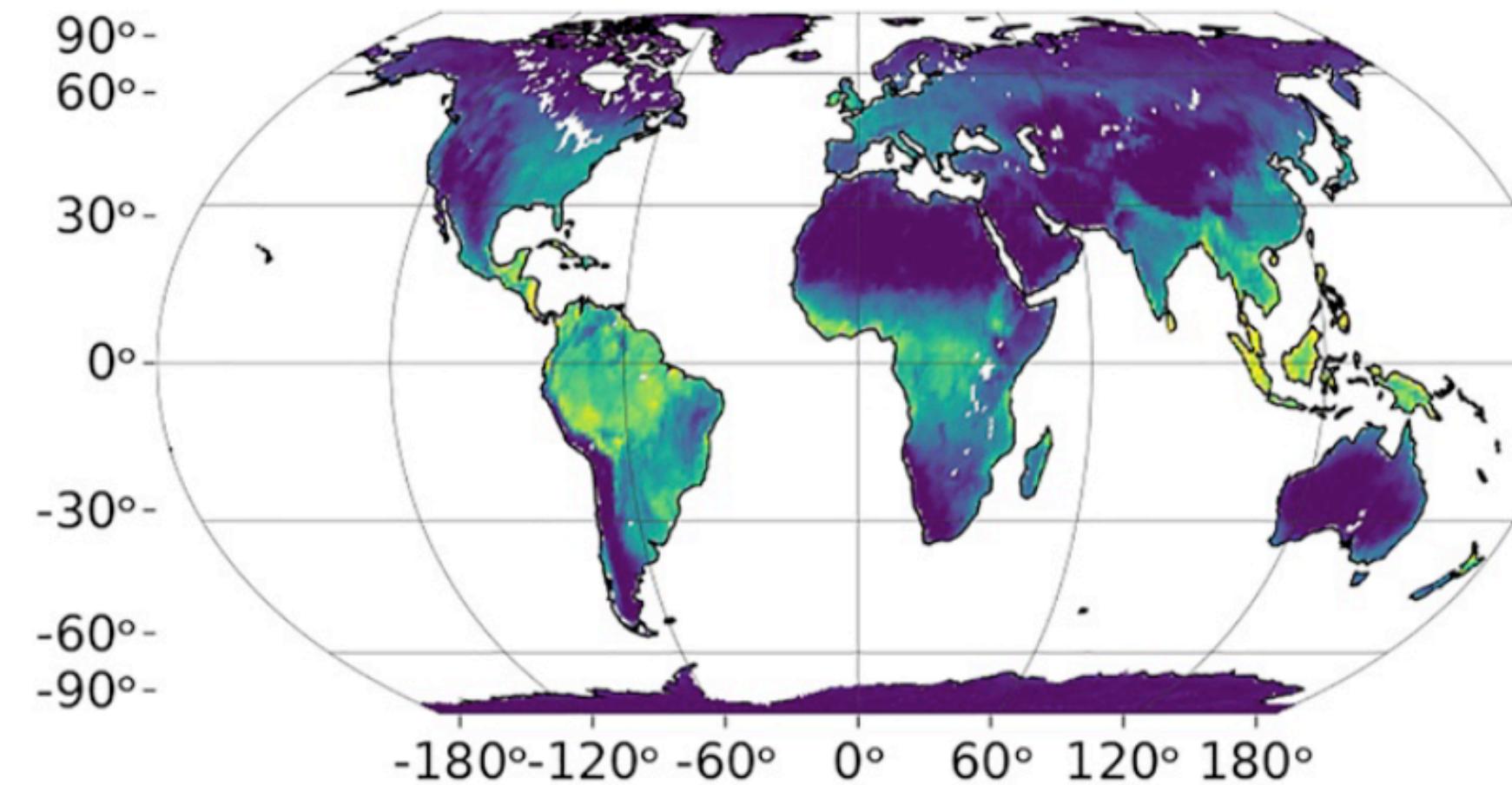
CliMA Land SIF @ 740 nm



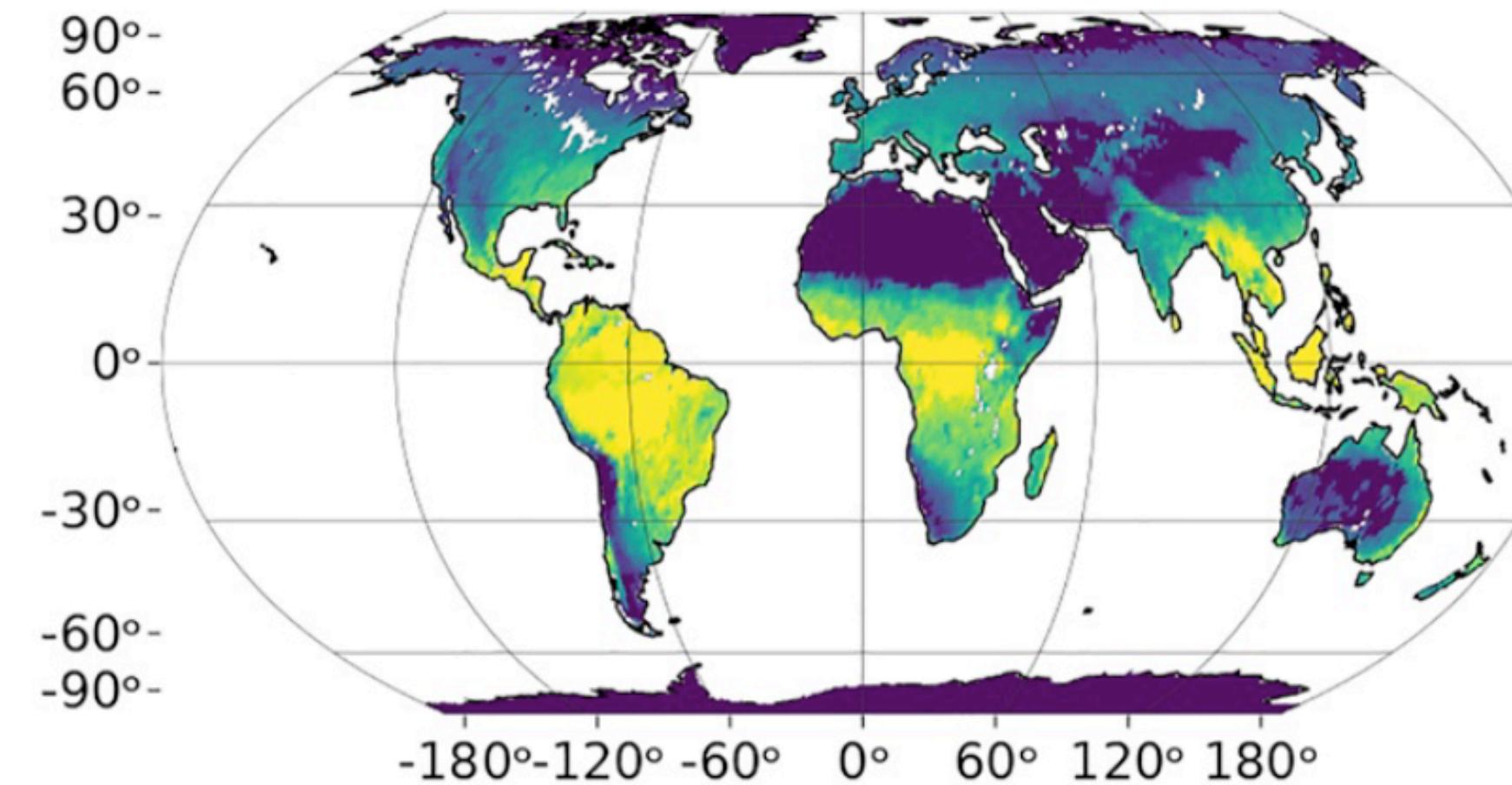
8  
6  
4  
2  
0  
MPI RS GPP  
( $\mu\text{mol CO}_2 \text{ m}^{-2} \text{ s}^{-1}$ )



15  
10  
5  
0  
CliMA GPP  
( $\mu\text{mol CO}_2 \text{ m}^{-2} \text{ s}^{-1}$ )

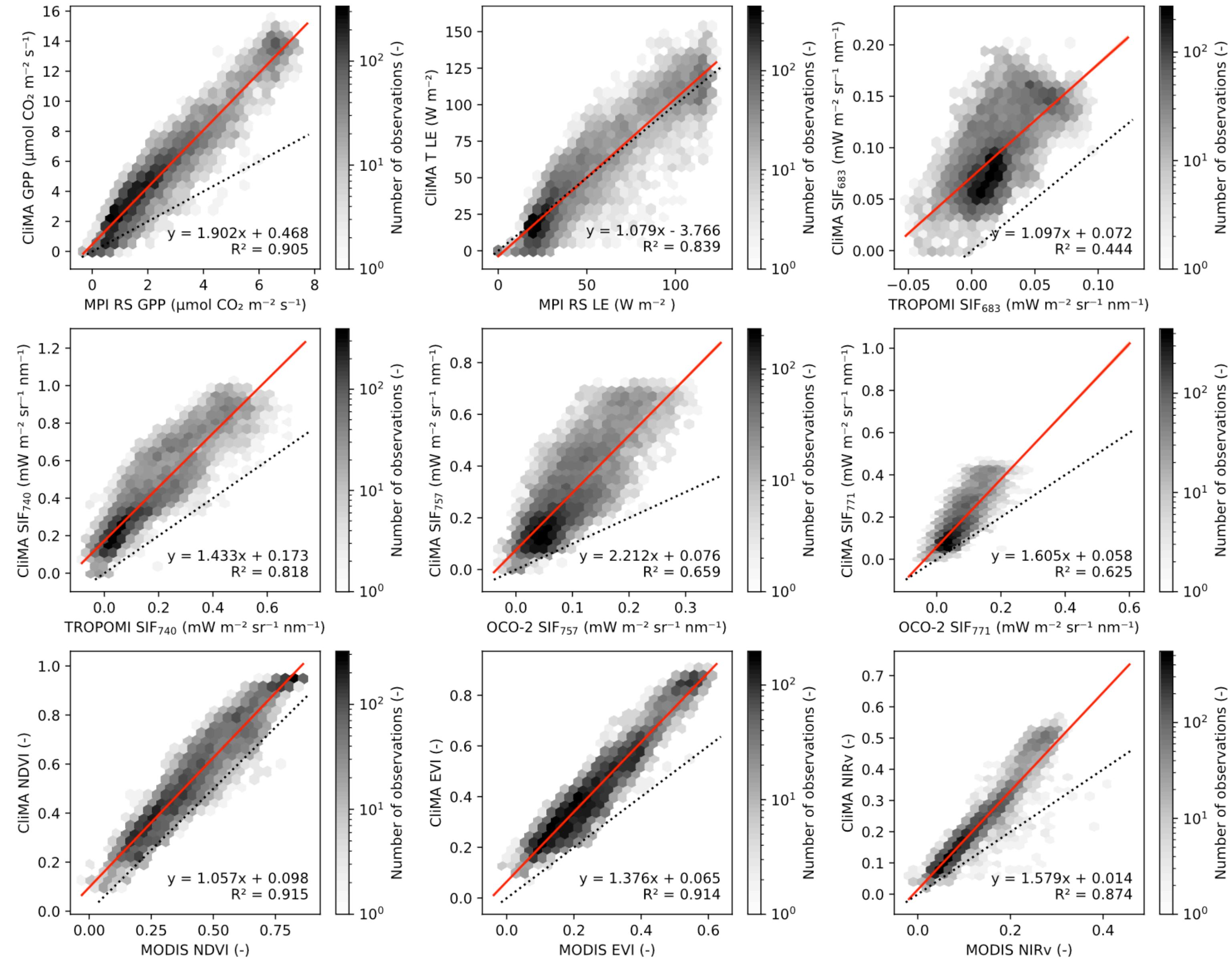


0.6  
0.5  
0.4  
0.3  
0.2  
0.1  
0.0  
TROPOMI SIF<sub>740</sub>  
( $\text{mW m}^{-2} \text{ sr}^{-1} \text{ nm}^{-1}$ )

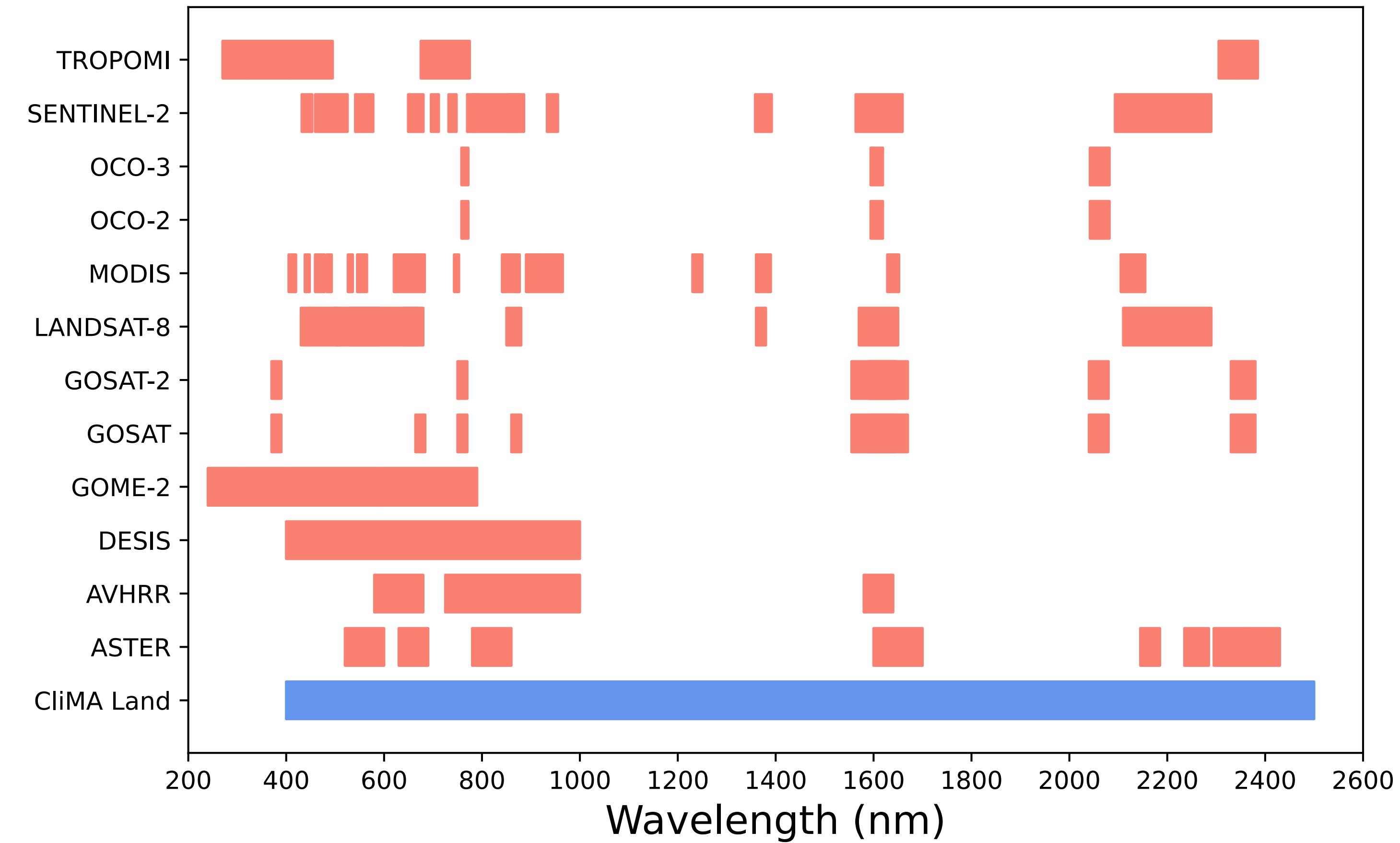


0.8  
0.6  
0.4  
0.2  
0.0  
CliMA SIF<sub>740</sub>  
( $\text{mW m}^{-2} \text{ sr}^{-1} \text{ nm}^{-1}$ )

# CiMA Land performs well for simulated quantities without any calibrations



**Remote Sensing**  
**CliMA Land is**  
**capable of running**  
**hyper-spectral**  
**radiative transfer,**  
**allowing for using**  
**remote sensing**  
**data directly**



# Acknowledgments

**Caltech:**

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