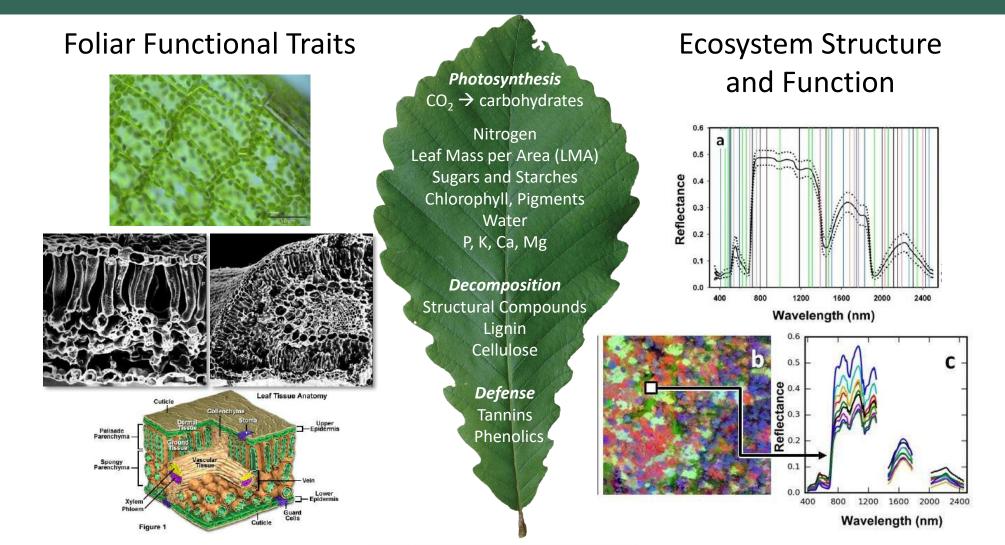
## VEGETATION FUNCTIONAL AMPLITUDES ALONG THE ELEVATION AND RAINFALL GRADIENTS IN INDIAN ECOSYSTEMS USING AVIRIS-NG

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Aditya Singh – University of Florida
Petya Campbell – UMBC / NASA Goddard
Collaborators in India
Collaborators at Caltech/Jet Propulsion Laboratory (Fabian Schneider, Ryan Pavlick)



80NSSC17K0677

### FOLIAR FUNCTIONAL TRAITS: GENERAL CONCEPTS

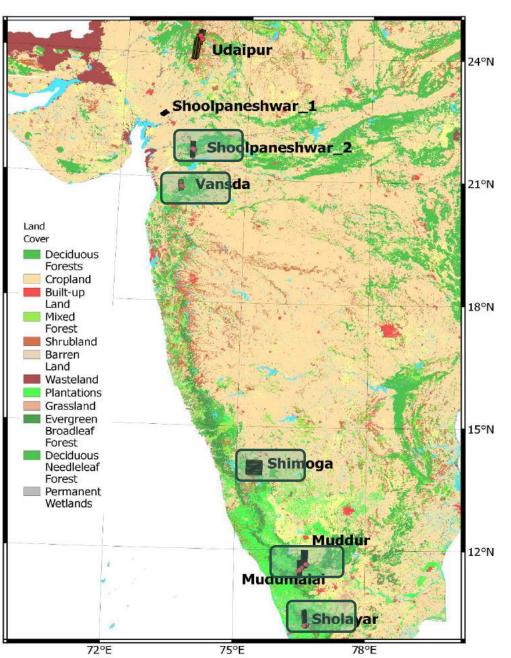


# OVERVIEW

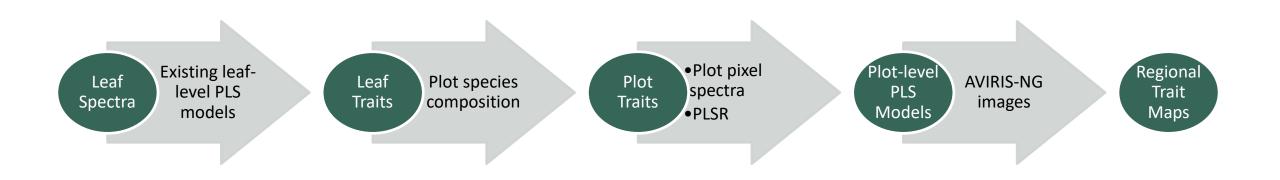
- Study area and data collection
- Mapping traits for the study area using AVIRIS-NG data
- Trait variation along the altitude gradient
- Trait variation along the rainfall gradient

## STUDY AREA

Site	PFT	Flight Date	NO. of Field Plots	Sampling Date
Udaipur	DBF/MIX	20160202 20160203	П	20180128
Shoolpaneshwar_1	CROP	20160208	N/A	N/A
Shoolpaneshwar_2	DBF/MIX	20160208	34	20180122
Vansda	DBF/CROP	20160209	17	20180119 20180120
Shimoga	EBF/DBF/CROP	20160101 20160102	N/A	N/A
Muddur	DBF	20160110	2	20180131
Mudumalai	EBF/DBF	20160105	4	20180201 20180202
Sholayar	EBF/DBF	20160107	23	20180203 20180204

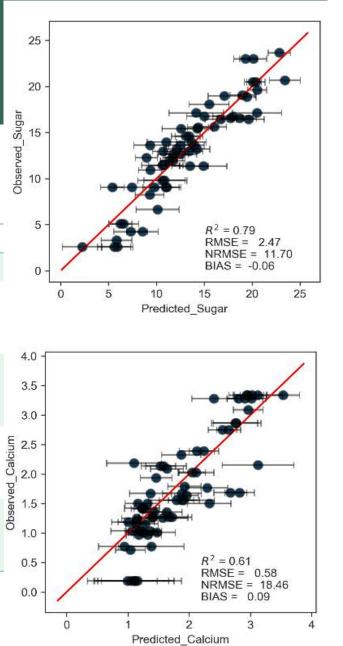


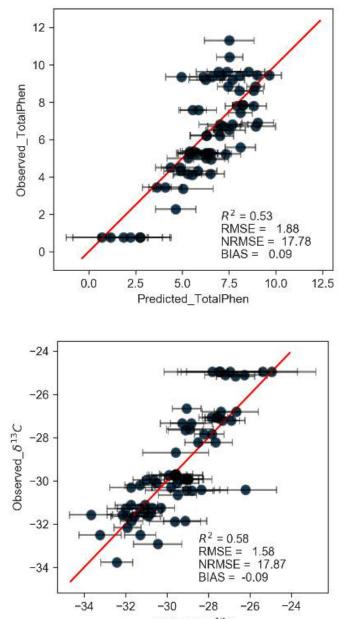
## MAPPING TRAITS FOR THE STUDY AREA



### MODEL PERFORMANCE

Trait	Calibration		Validation	
	R <sup>2</sup>	RMSE	R <sup>2</sup>	RMSE
Sugars	0.9	1.65	0.67	3.09
(%dw)	(0.026)	(0.19)	(0.082)	(0.44)
Total phenolics (%dw)	0.58 (0.061)	1.54 (0.125)	0.51 (0.13)	2.12 (0.33)
Calcium	0.78	0.39	0.5	0.71
(%dw)	(0.047)	(0.04)	(0.11)	(0.11)
δ <sup>13</sup> C	0.76	1.09	0.48	1.9
(‰)	(0.06)	(0.135)	(0.14)	(0.3)

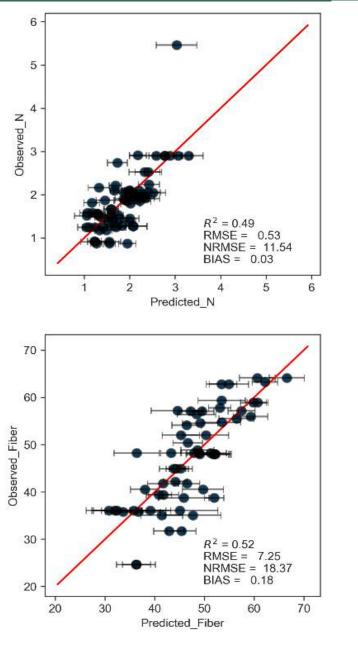


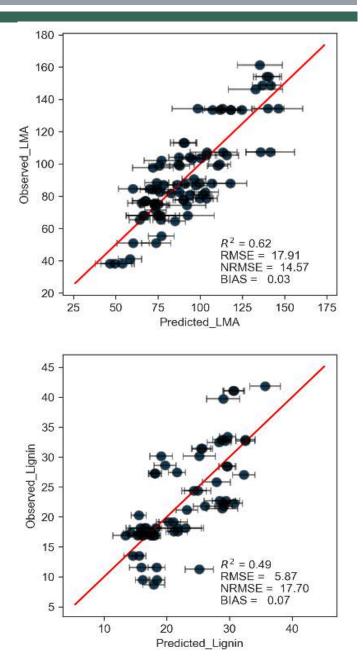


Predicted\_ $\delta^{13}C$ 

#### MODEL PERFORMANCE

Trait	Calibration		Validation	
	R <sup>2</sup>	RMSE	R <sup>2</sup>	RMSE
N	0.54	0.47	0.50	0.56
(%dw)	(0.052)	(0.10)	(0.08)	(0.10)
LMA	0.75	14.43	0.52	20.62
(g/m²)	(0.042)	(1.07)	(0.072)	(2.09)
Fiber	0.66	5.58	0.43	8.45
(%dw)	(0.064)	(0.55)	(0.08)	(0.99)
Lignin	0.54	5.61	0.45	6.05
(%dw)	(0.06)	(0.41)	(0.07)	(0.53)



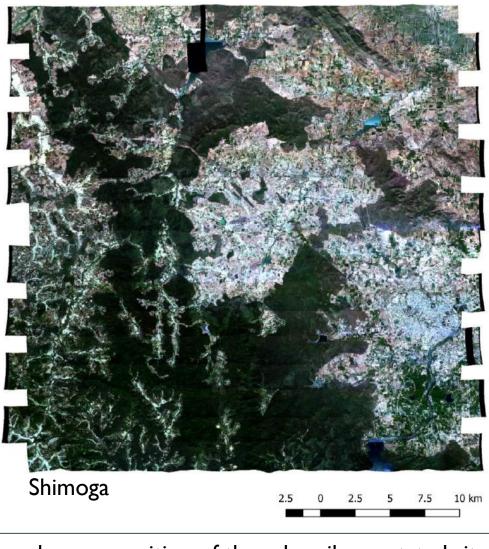




Sholayar



Mudumalai

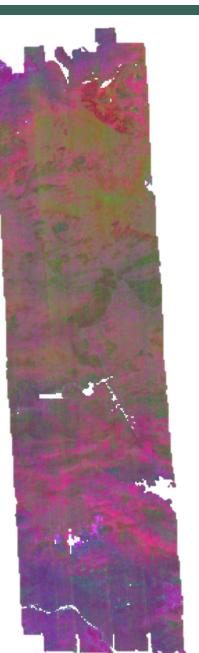


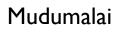
True color composition of three heavily vegetated sites

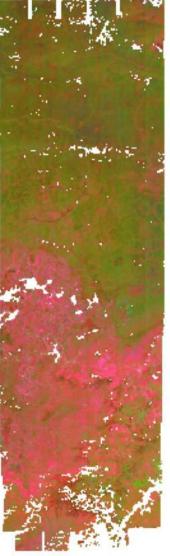


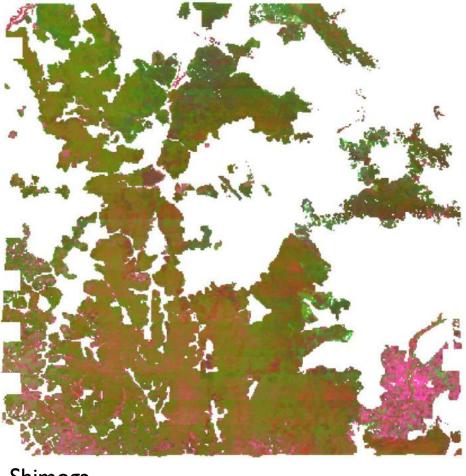
Z%

Lignin







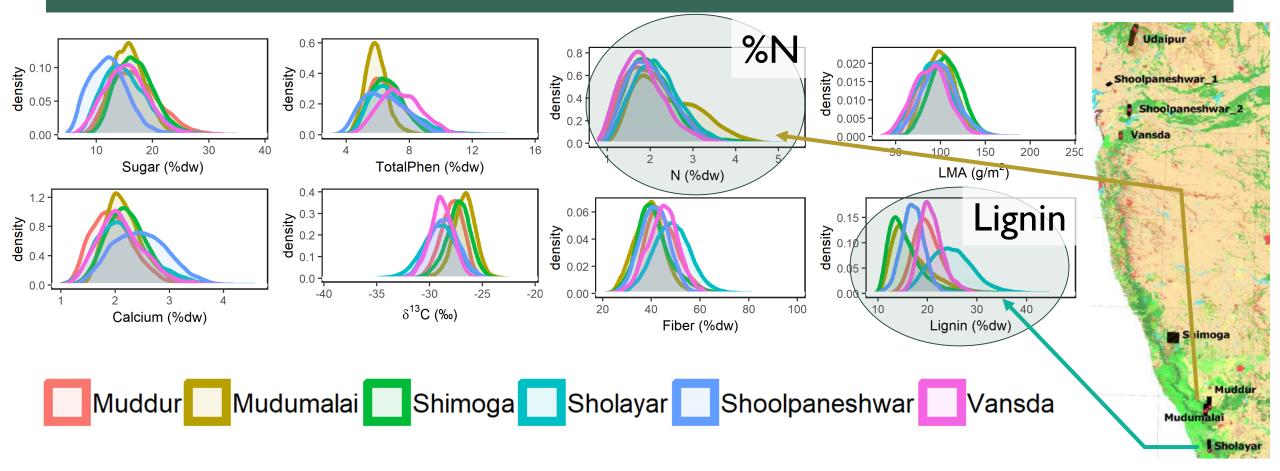


Shimoga

2.5 0 2.5 5 7.5 10 km

Trait composition with following ranges: LMA: 30~200 ; N: 0~4; Lignin: 10~45

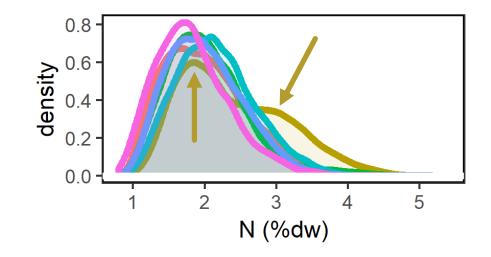
#### TRAIT DISTRIBUTION FOR DIFFERENT SITES





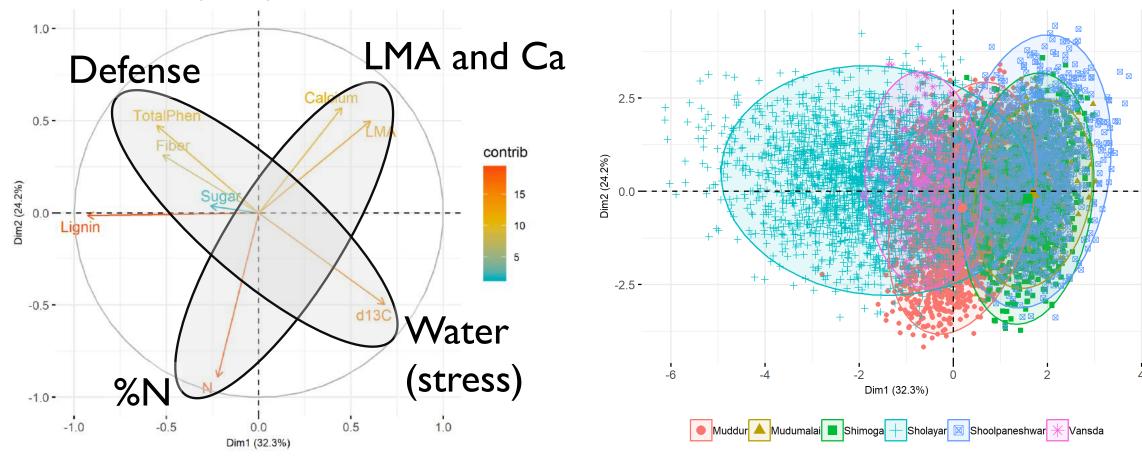
## Mudumalai

High %nitrogen in tea plantation

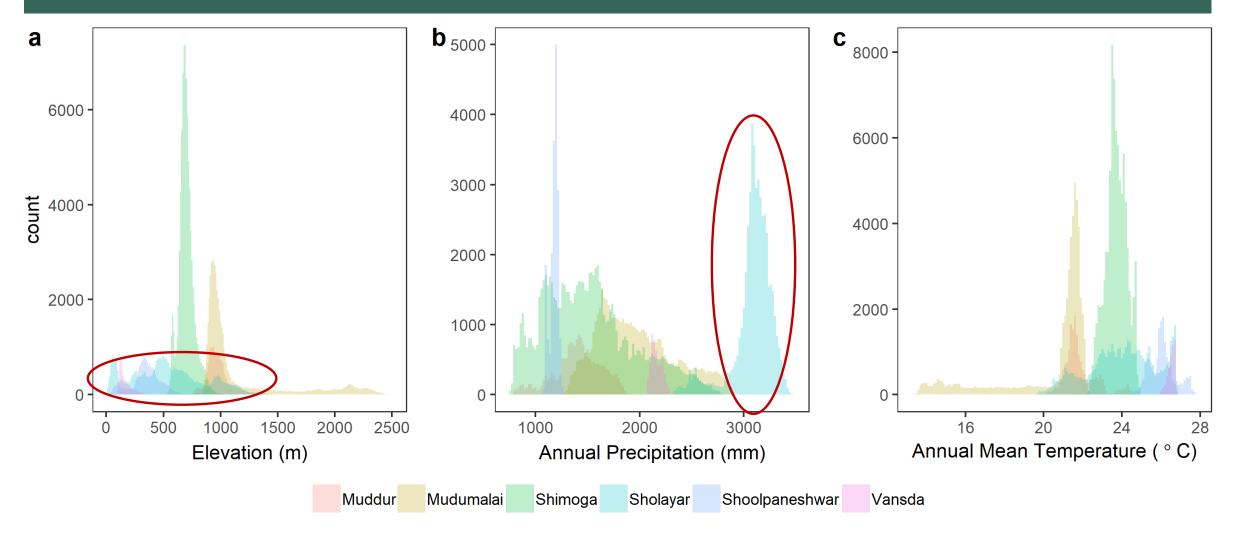


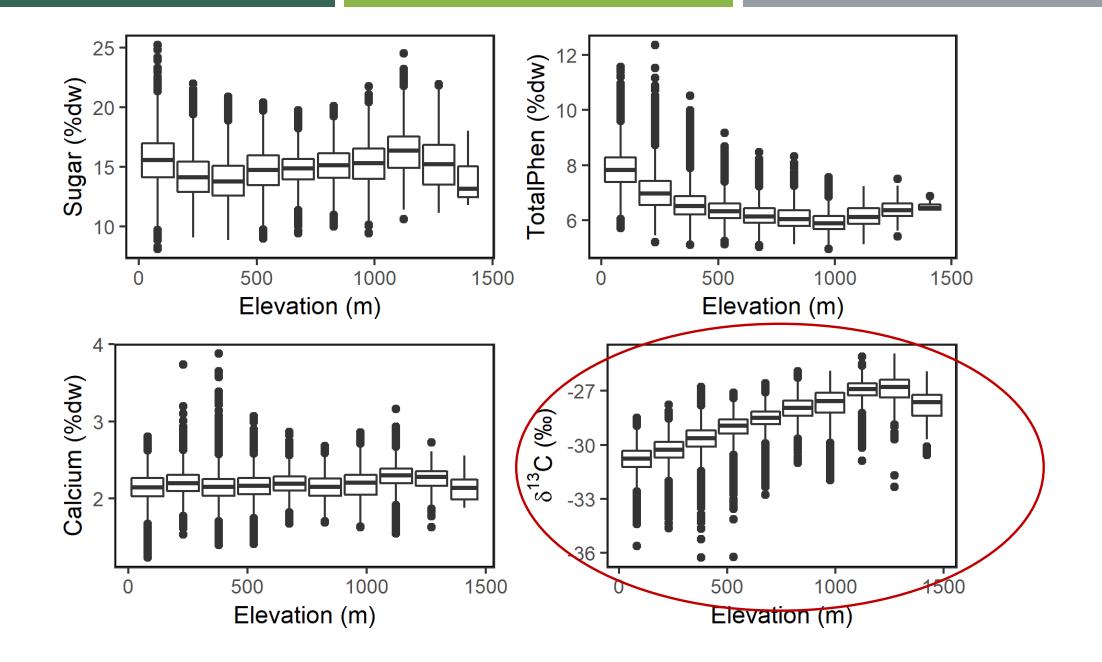
## TRAIT SPACE: RELATIONSHIPS AMONG TRAITS

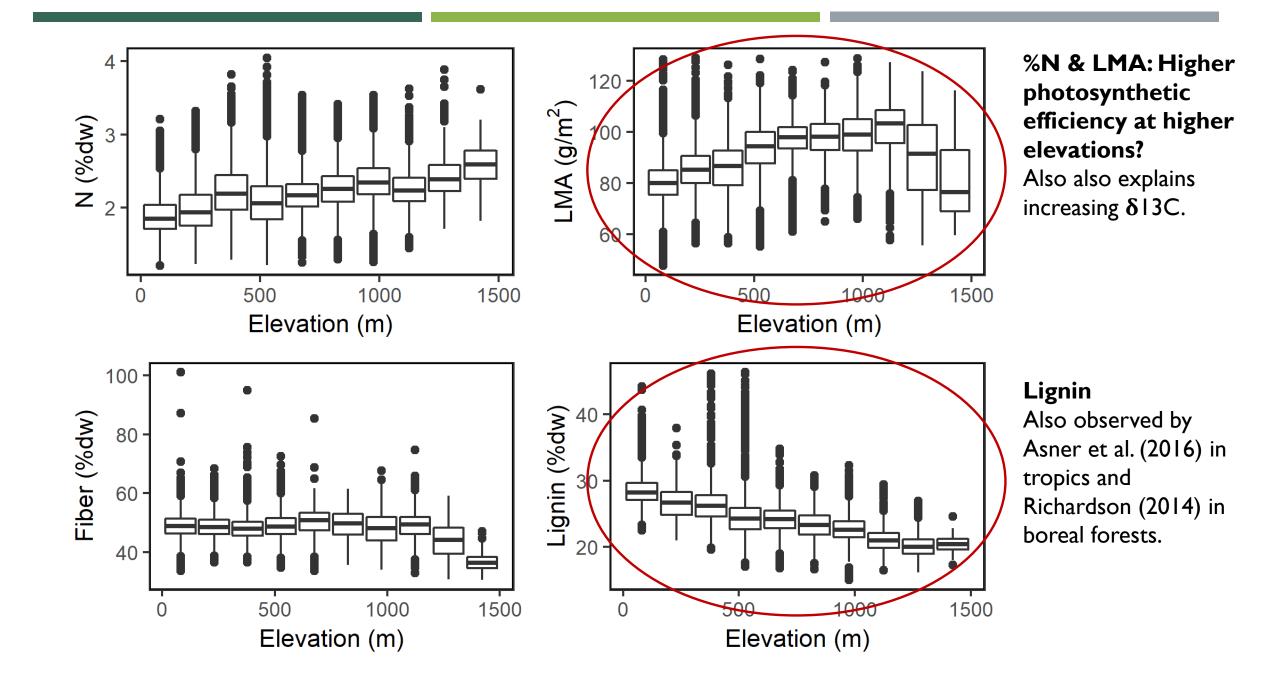
Tradeoffs related to photosynthesis and construction

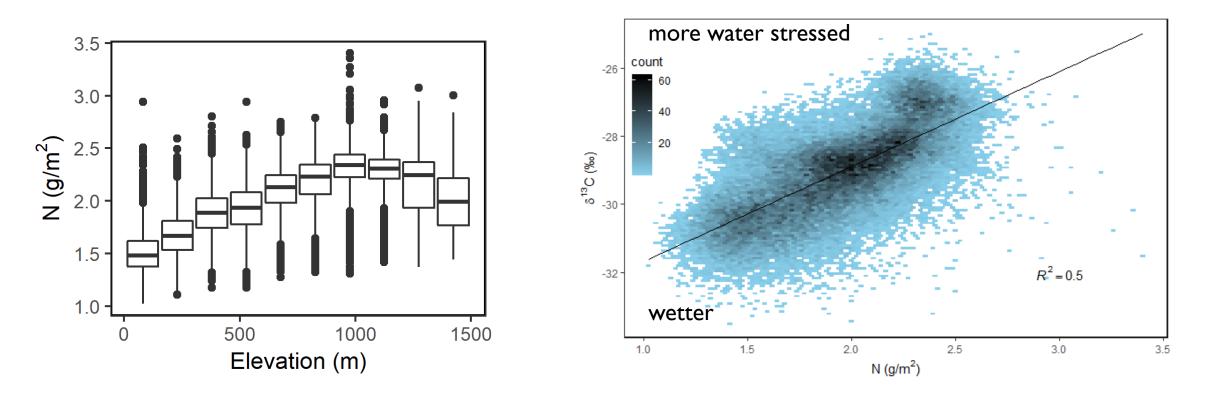


### THE ALTITUDINAL TRENDS OF TRAITS: SHOLAYAR EXAMPLE (LARGE ELEVATION RANGE)







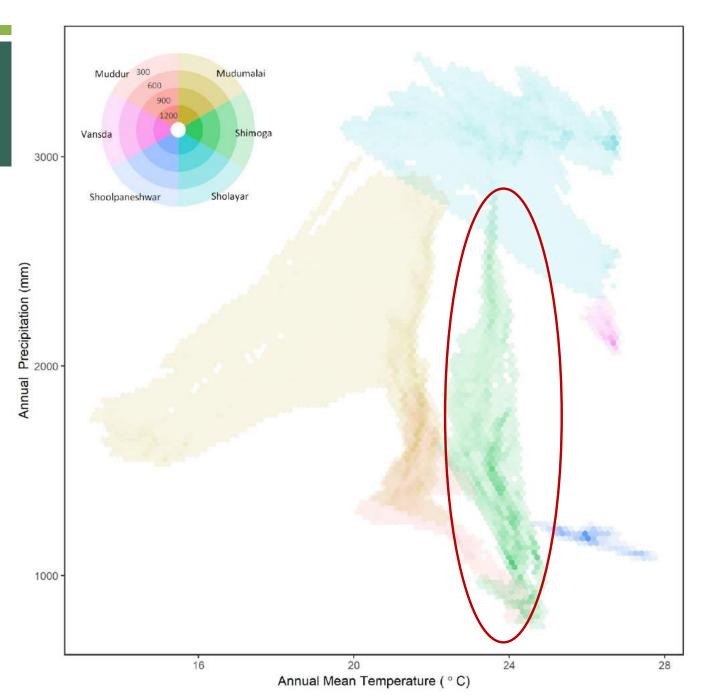


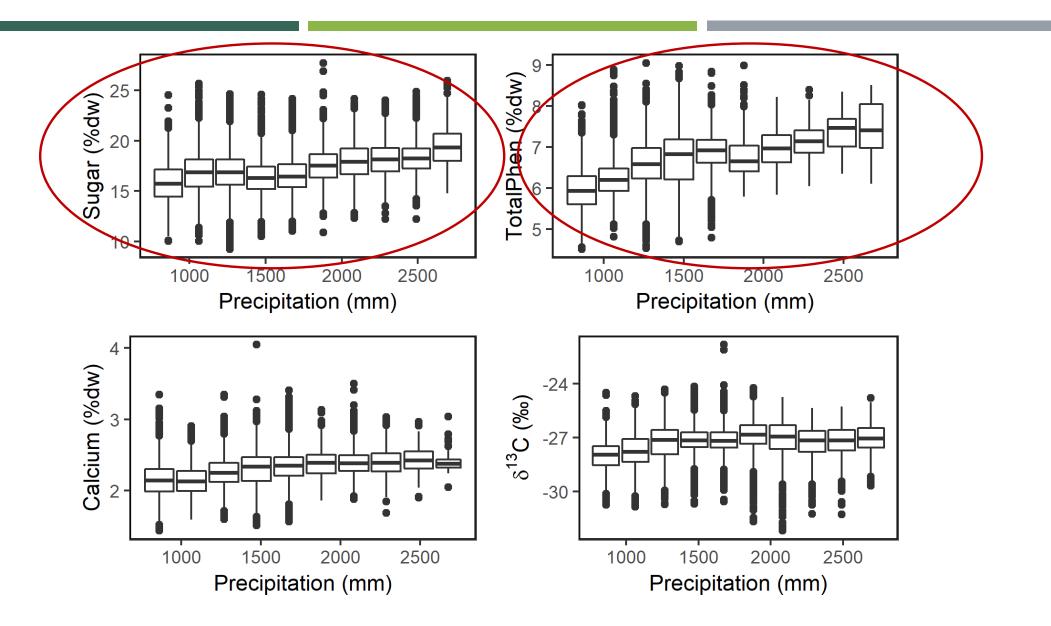
- $\delta^{13}C$  is an indicator of water status.
- Potentially more useful than water content or EWT.
- Isotopic fractionation associated with differential diffusivities of <sup>13</sup>CO<sub>2</sub> versus <sup>12</sup>CO<sub>2</sub> in the air and stomata (higher WUE).

### PRECIPITATION GRADIENT: SHIMOGA

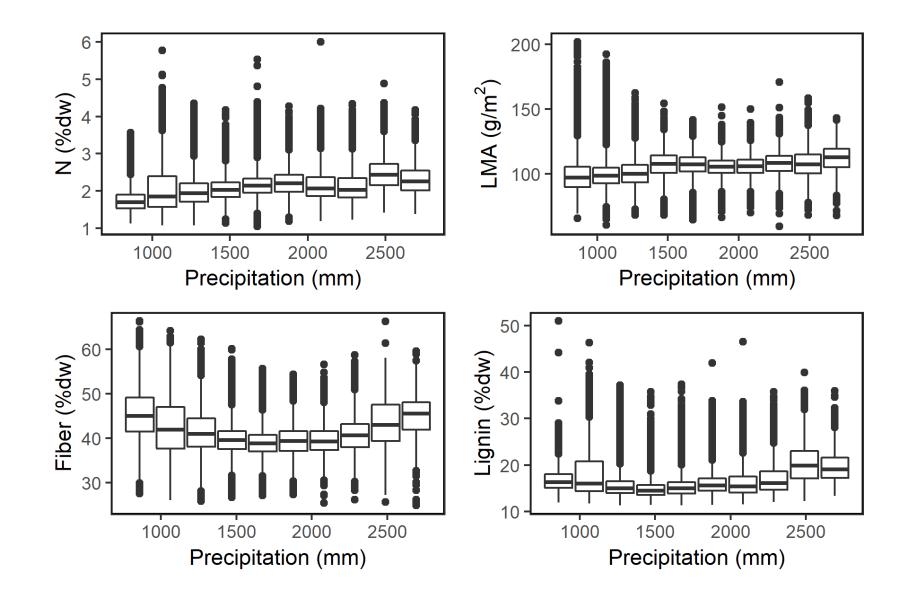


T-P space for 6 sites based on 100m resolution climate data. Shades of color indicate number of pixels for a given T-P combination.

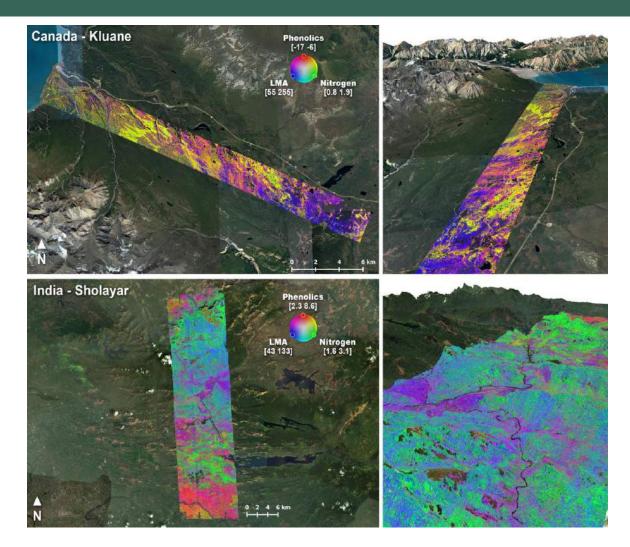




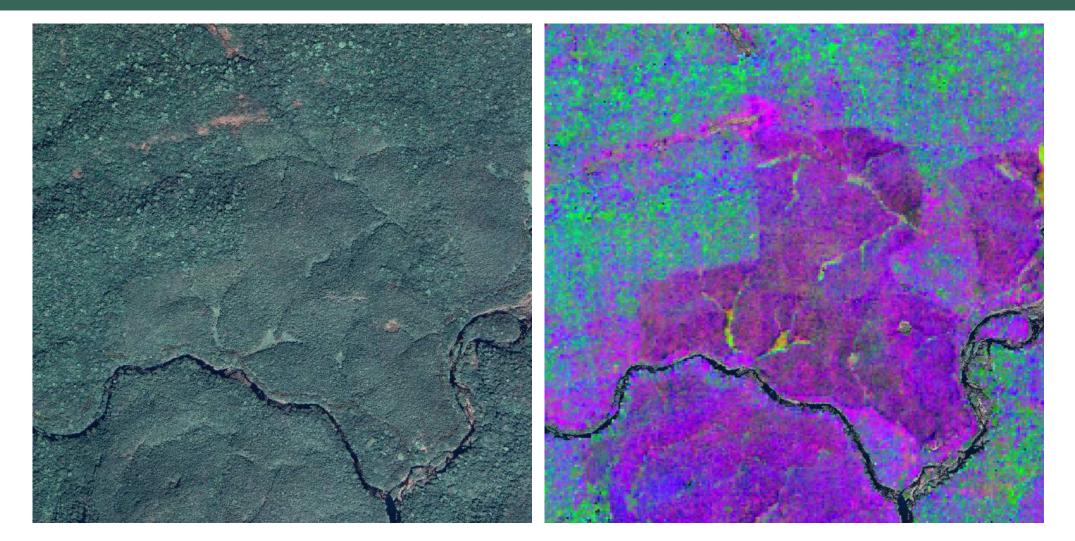
Sugar and phenolics production increase with precipitation: less water stressed plants can allocate more resources to phenolics (defense) and possibly carbohydrates.



### EXTENSION TO FUNCTIONAL DIVERSITY WITH F. SCHNEIDER & D. SCHIMEL



### EXTENSION TO FUNCTIONAL DIVERSITY WHAT DOES IT MEAN IN HUMAN-DOMINATED LANDSCAPES?



# CONCLUSION

- Imaging spectroscopy is an effective tool in trait mapping, especially for areas hard to access.
- PCA of the trait space containing eight traits reveals two major axes: one represents the photosynthetic production and another the allocation of photosynthetic products.
- Combining with other datasets (e.g., DEM and climate data), trait maps can be used to analyze the environmental drivers of trait variance, which will help us understand and predict how traits may vary under dynamic climate scenarios in future.