

The impact of lianas on radiative transfer and albedo of tropical forests

A modelling study



Félicien Meunier*, Alexey Shiklomanov, Michael Dietze, Marco Visser and Hans Verbeeck

EGU, 05/04/2020

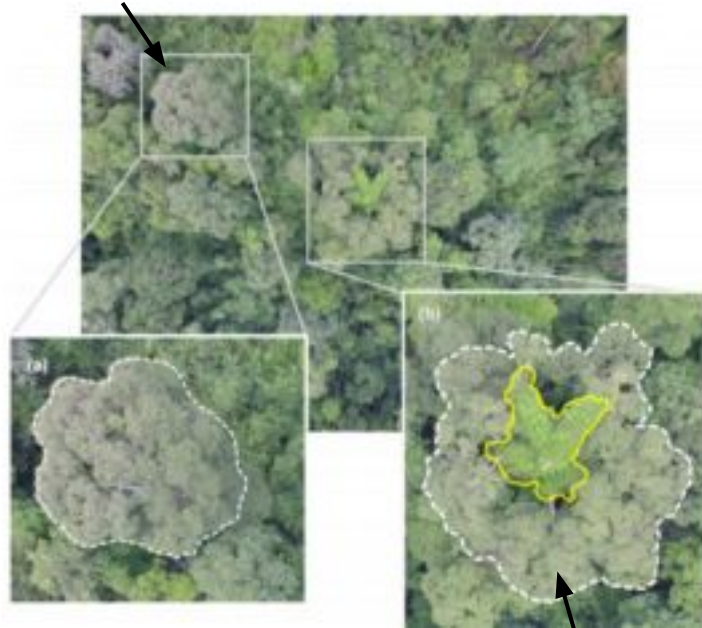


In a nutshell

* Felicien.Meunier@ugent.be

Lianas are visible from space!

Liana-free canopy



Liana-infested tree

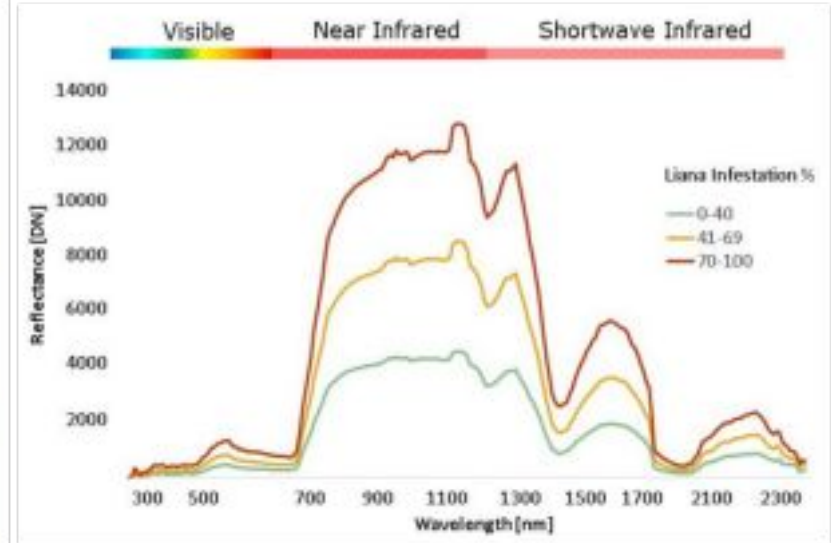
Lianas are visible from space →

← Forest spectrum is impacted by lianas

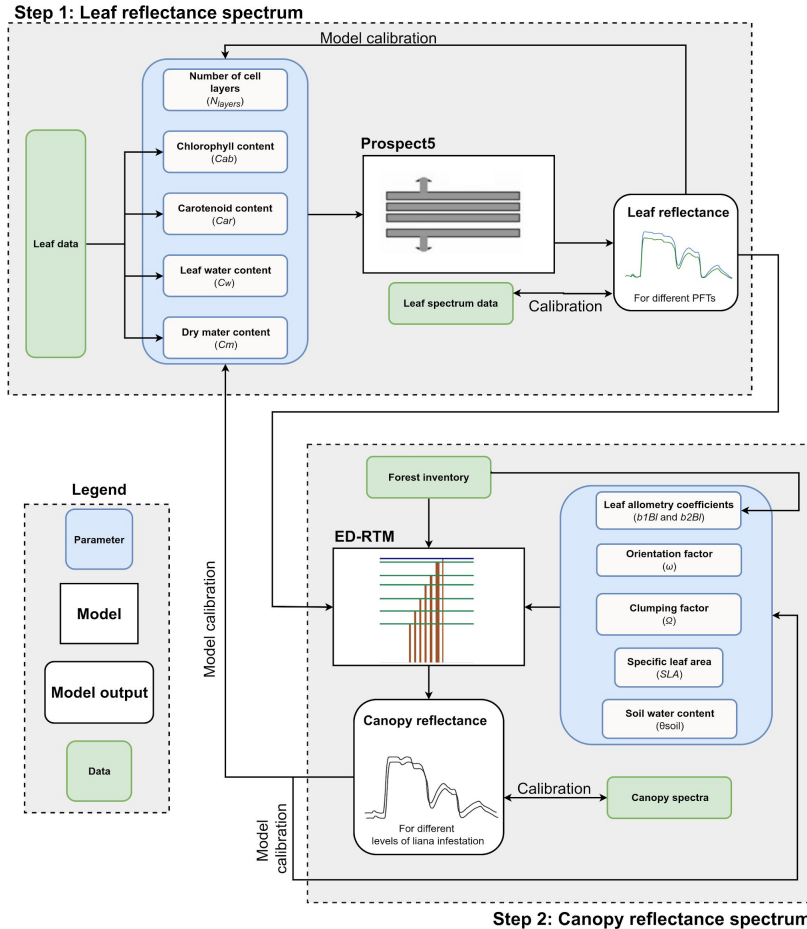
Liana-free canopy



Liana-infested tree



The study



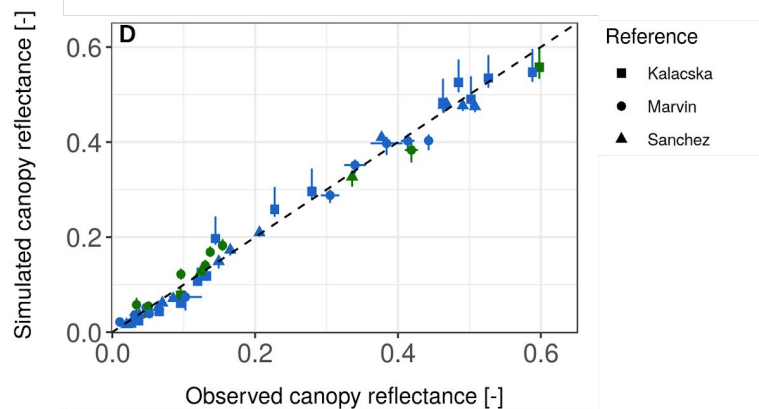
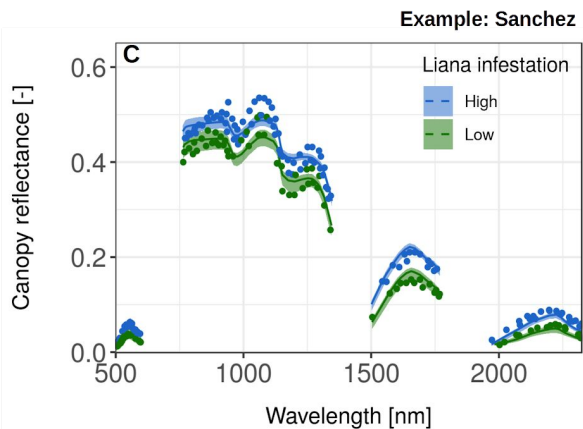
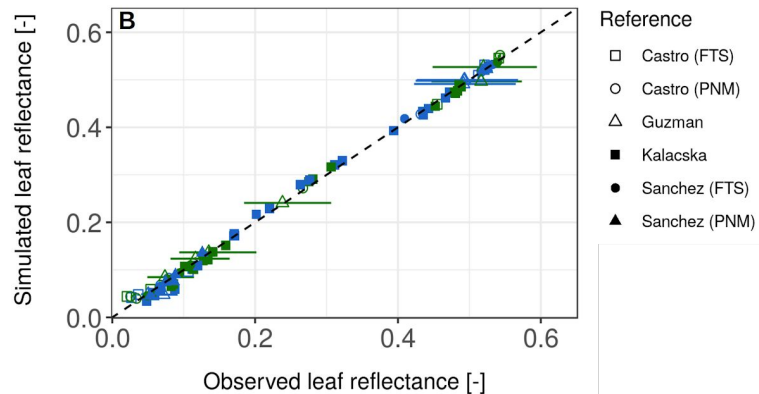
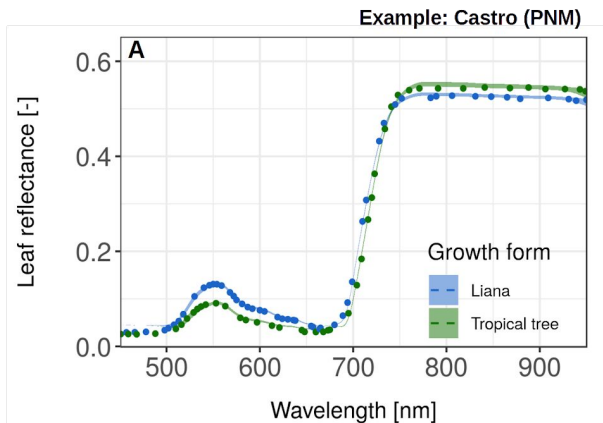
We used process-based models of the leaf (PROSPECT) and the canopy (ED-RTM) coupled to a bayesian parameter assimilation technique to reproduce forest canopy spectra as affected by lianas and derive the canopy changes due to liana-infestation.

To do so, we first compiled all existing data of liana leaf spectrum and all published spectra of canopy with contrasted levels of liana infestation. We calibrated liana (and co-occurring tree) leaf traits to reproduce their respective leaf spectra and feed that information into the canopy model.

These models can now serve to predict the impact of liana on light transmission in dense canopies, on the Energy budget of infested tropical forests and more generally on their functioning.

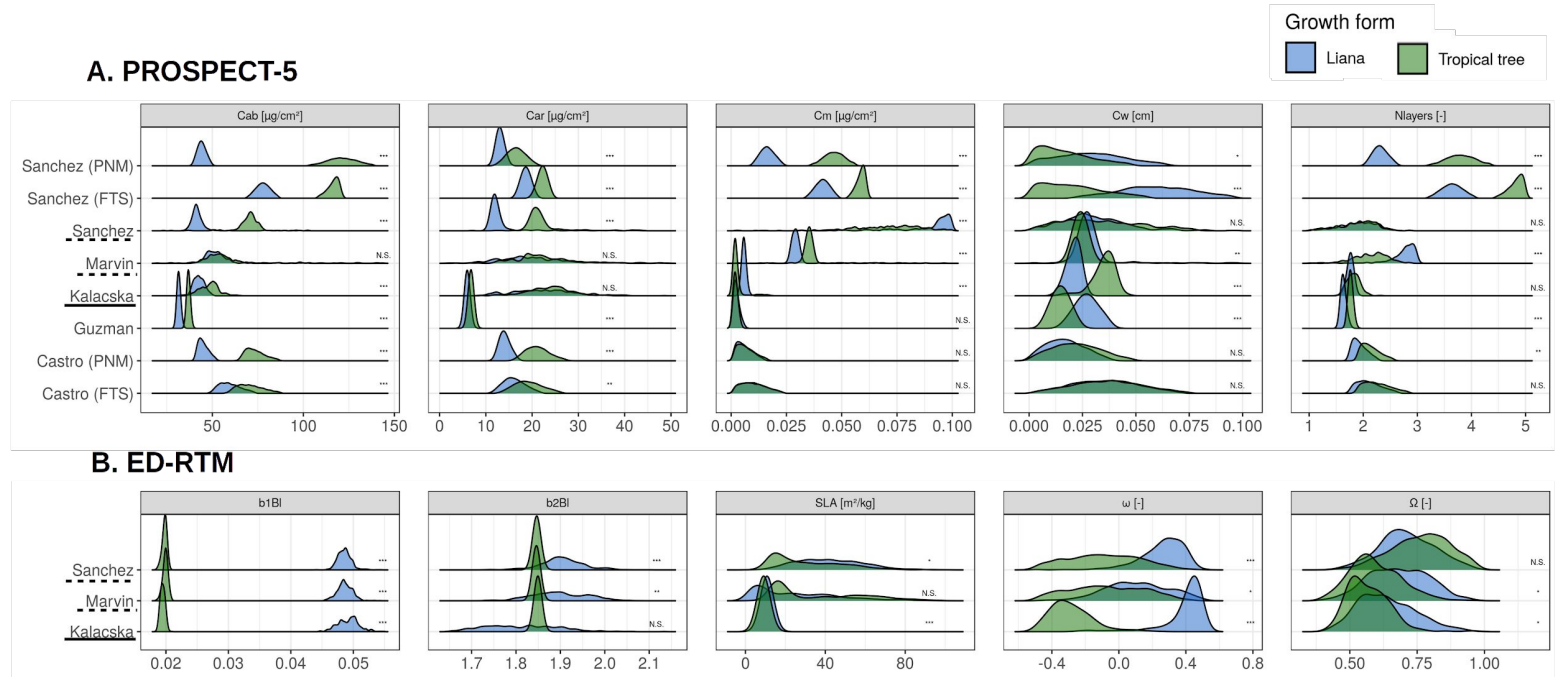
Results (calibration)

Leaf spectrum



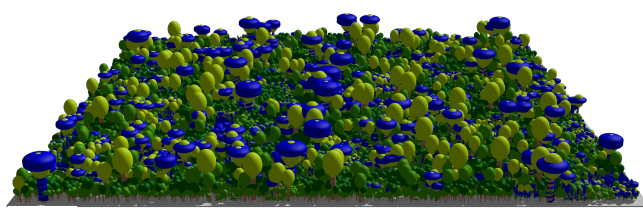
Canopy spectrum

Results (traits)

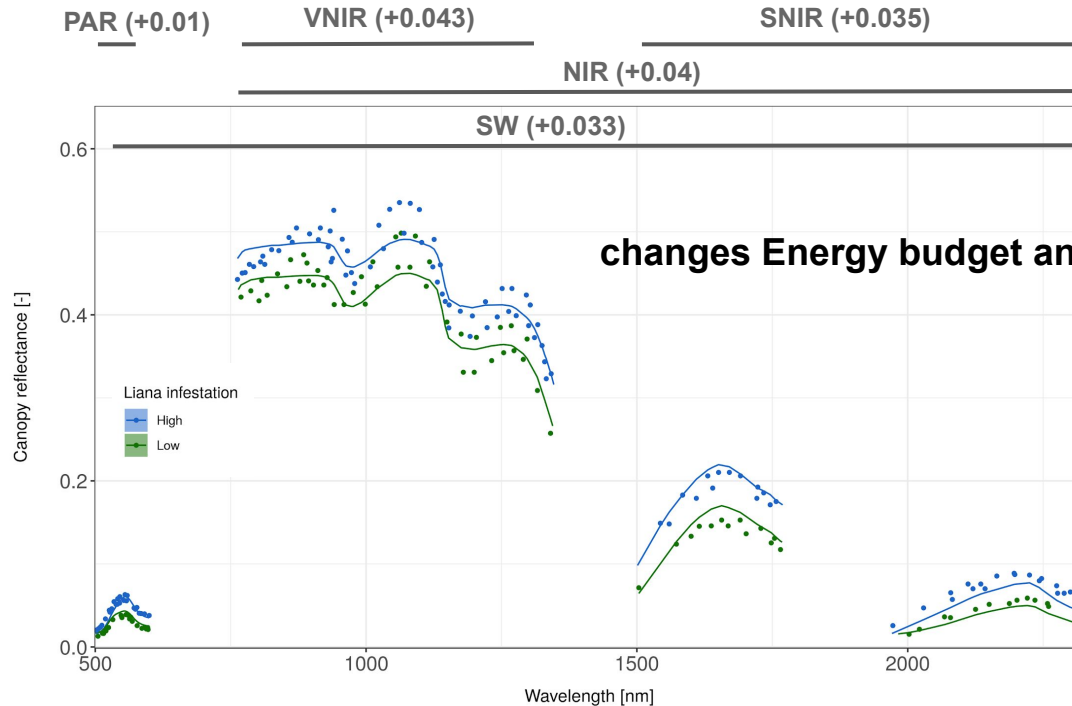
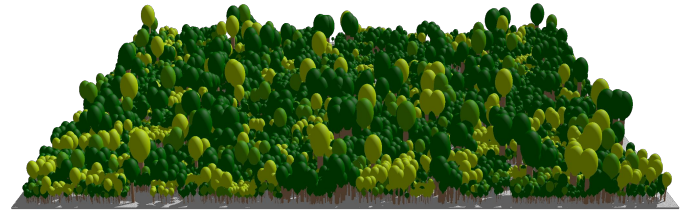


- Liana leaves differ from tree leaves by many aspects (pigment content is lower, leaves are “cheaper” and contain more water)
- Liana infest more in leaves than trees, liana canopies are more clumped, and their leaves are more horizontal.

Example of application



VS



changes Energy budget and hence forest dynamics:

Ecosystem GPP: -15%
Ecosystem NPP: -12%
Ecosystem WUE: -10%
Evapotranspiration: $\approx 0\%$

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Extended

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Lianas in Neotropical forests

Increased abundance

 Nature, 2002


Increasing dominance of large lianas in Amazonian forests

Oliver L. Phillips*, Rodolfo Vásquez Martínez†, Luzmila Arroyo‡\$, Timothy R. Baker*, Timothy Killeen‡\$||, Simon L. Lewis*¶, Yadvinder Malhi¶, Abel Monteagudo Mendoza†#, David Neill☆**, Percy Núñez Vargas#, Miguel Alexiades††, Carlos Cerón‡‡, Anthony Di Fiore\$\$, Terry Erwin|||, Anthony Jardim\$, Walter Palacios☆, Mario Saldias\$ & Barbara Vinceti¶


Photo credits:TEG

Lianas in Neotropical forests

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Lianas have specific leaf traits

 Ecology letters, 2012

ECOLOGY LETTERS

Ecology Letters, (2012) 15: 1001–1007

doi: 10.1111/j.1461-0248.2012.01821.x

LETTER

**Contrasting leaf chemical traits in tropical lianas and trees:
implications for future forest composition**


Photo credits:TEG

Lianas in Neotropical forests


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 Nature, 2002

Lianas have specific leaf traits

 Ecology letters, 2012

No DVGMs include lianas

 PNAS, 2016

 LETTER

The importance of including lianas in global vegetation models

Hans Verbeeck^{a,1} and Elizabeth Kearsley^a


Photo credits:TEG

Lianas in Neotropical forests

Increased abundance

 Nature, 2002

Lianas have specific leaf traits

 Ecology letters, 2012

No DVGMS include lianas (expect us)

Received: 7 September 2018 | Revised: 2 July 2019 | Accepted: 4 July 2019

DOI: 10.1111/gcb.14769

PRIMARY RESEARCH ARTICLE

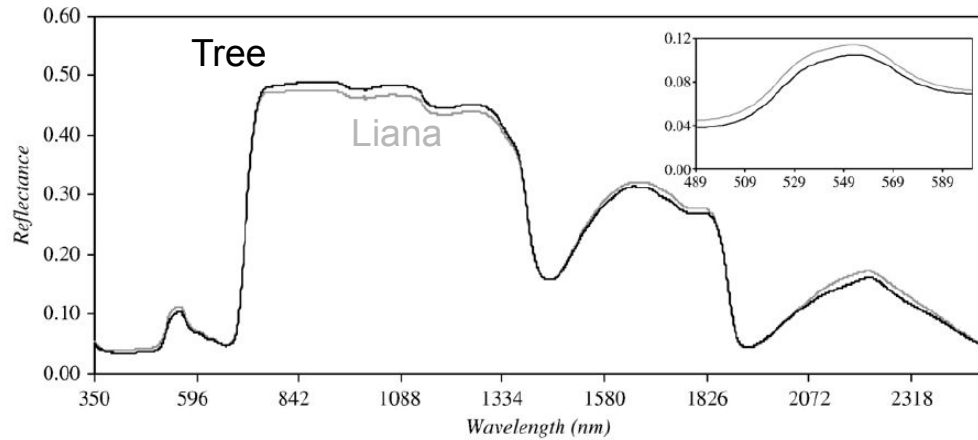
Global Change Biology WILEY

Modeling the impact of liana infestation on the demography and carbon cycle of tropical forests

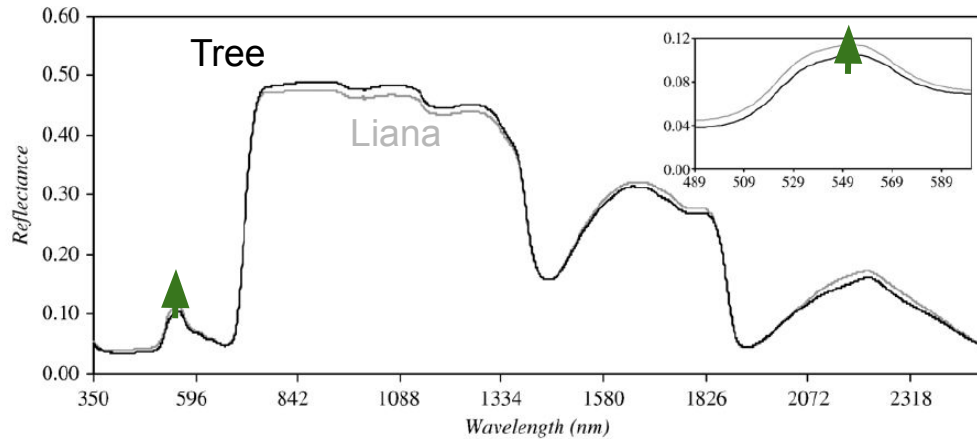
Manfredo di Porcia e Brugnara¹  | Félicien Meunier^{1,2}  | Marcos Longo^{3,4}  |
Sruthi M. Krishna Moorthy¹  | Hannes De Deurwaerder¹  | Stefan A. Schnitzer^{5,6}  |
Damien Bonal⁷  | Boris Faybishenko⁸  | Hans Verbeeck¹ 

Photo credits:TEG

The concept

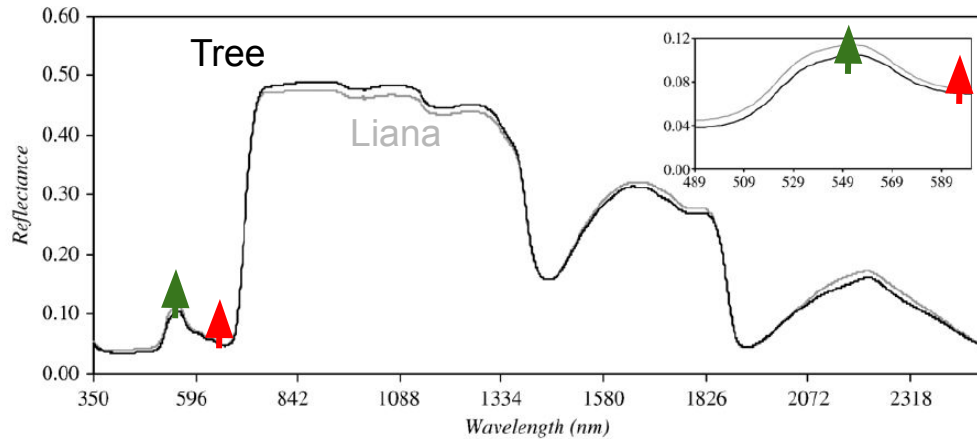


The concept



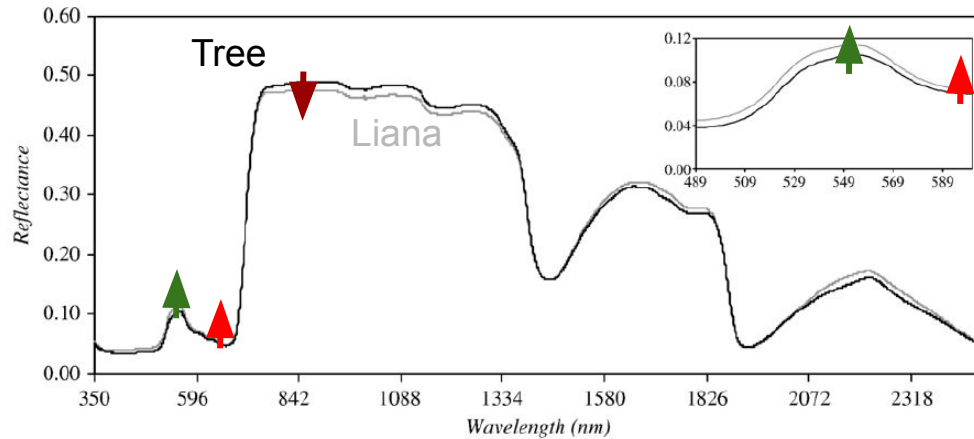
Spectral Region	Mechanisms Controlling Reflectance	Relevance to Liana-Tree Discrimination		
		Leaf-level	Canopy-level	Physiology
Visible	Chlorophyll and carotenoid concentrations ^a	Higher reflectance of lianas in green peak important ^{c,d,e}	Higher reflectance of lianas found with increasing abundance ^{b,e}	Lianas contain lower pigment levels ^{b,c,d} (but see refs. f & g)

The concept



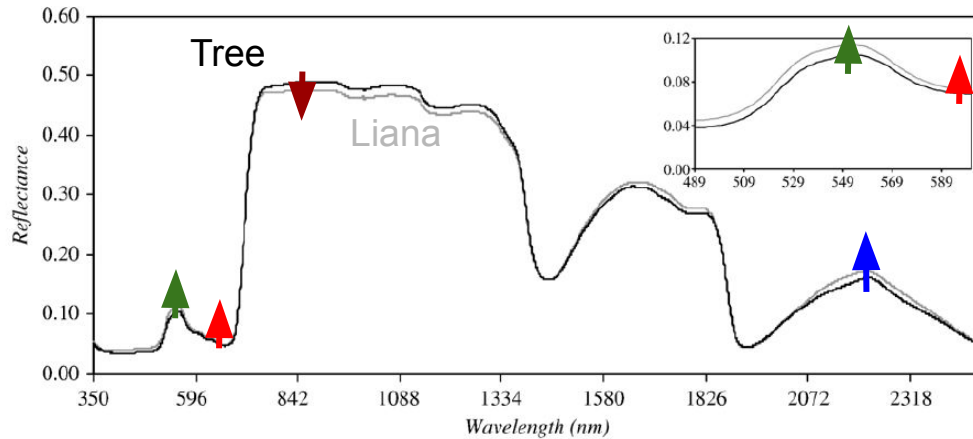
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The concept



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The concept



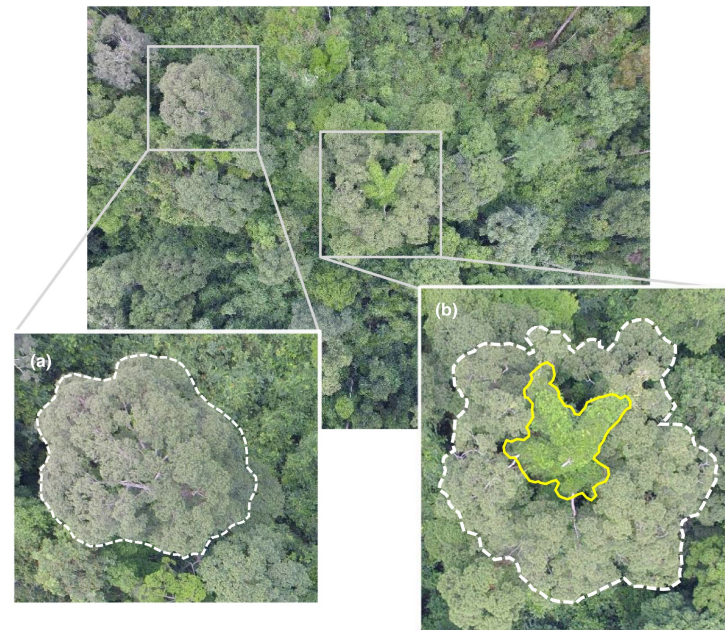
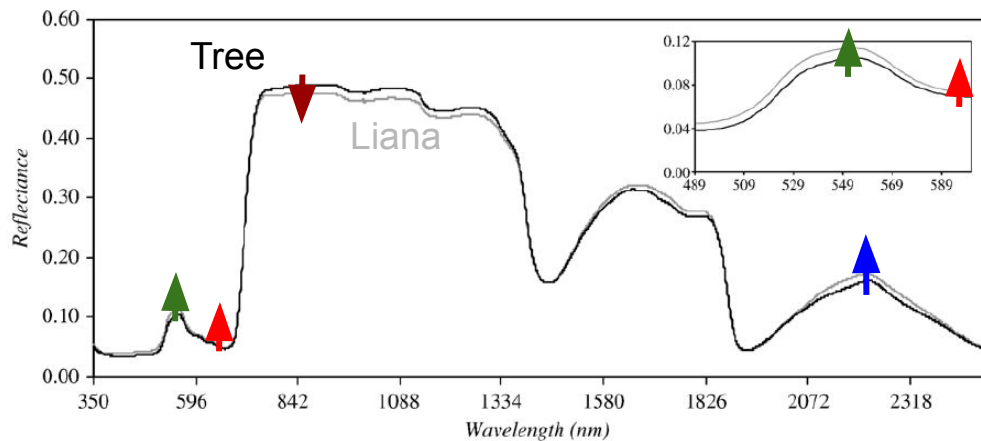
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<u>Shortwave Infrared</u>	Leaf water content, cellulose ^a	Most important region for discrimination ^{a,f}	By far the most important region for discrimination ^a	Leaf water content higher in lianas ^{a,f,g}

The concept

Leaf-level

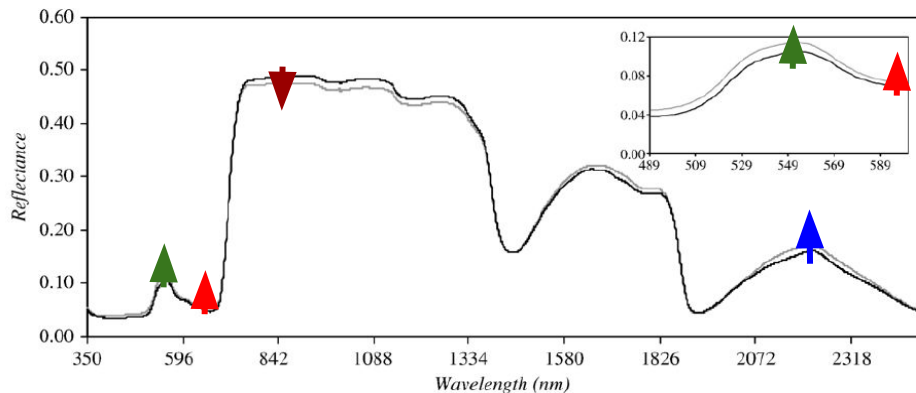


Canopy-level

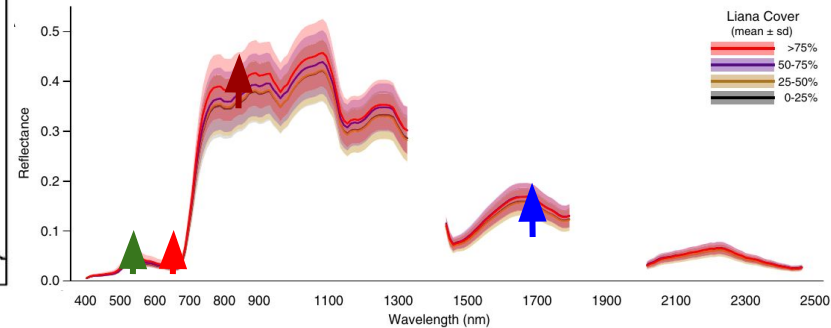


The concept

Leaf-level



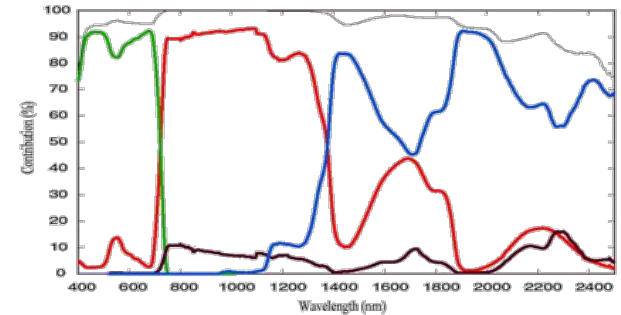
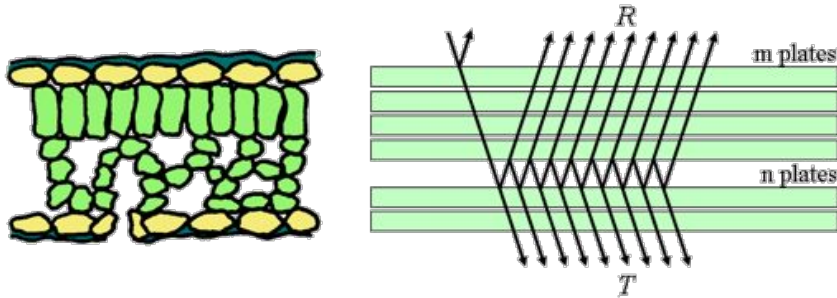
Canopy-level



Canopy effects
(leaf angle, leaves distribution etc.)

The PROSPECT model

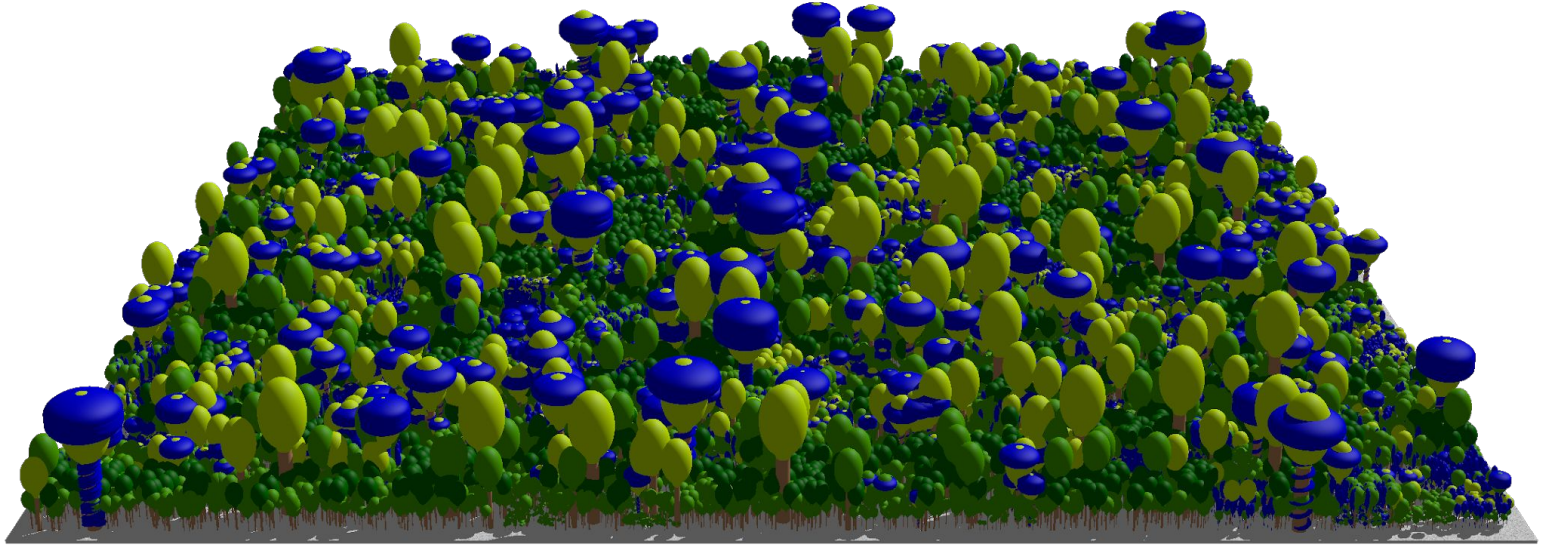
(to model the leaf-level differences between lianas and trees)



- PROSPECT is a leaf optical model that simulates directional-hemispherical reflectance and transmittance of various green monocotyledon and dicotyledon species, over the solar spectrum from 400 nm to 2500 nm
- 5 biophysical parameters (N_{layers} , C_{ab} , C_{ar} , C_{m} and C_{w}) that respectively represent the number of stacked layers, the leaf chlorophyll and carotenoid content, the leaf dry matter and its water content.

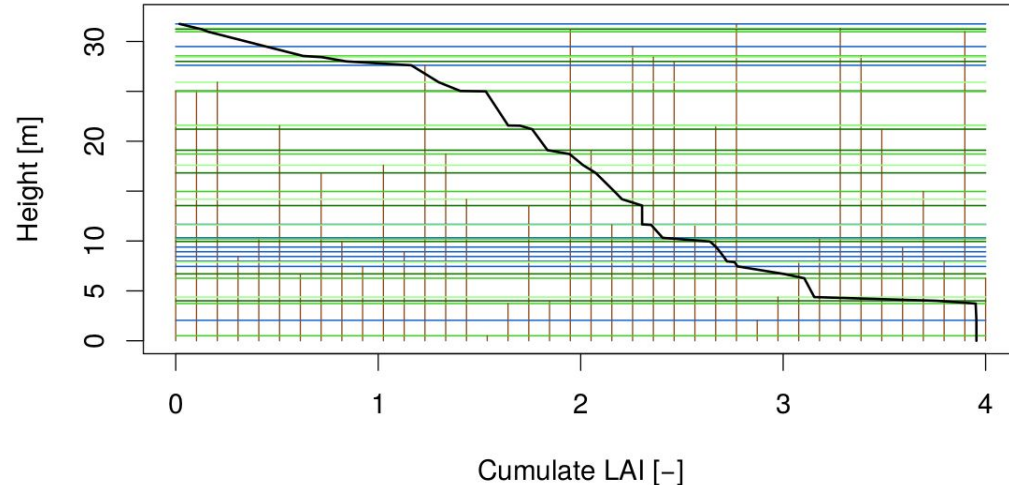
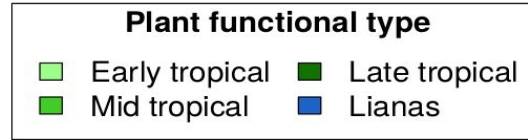
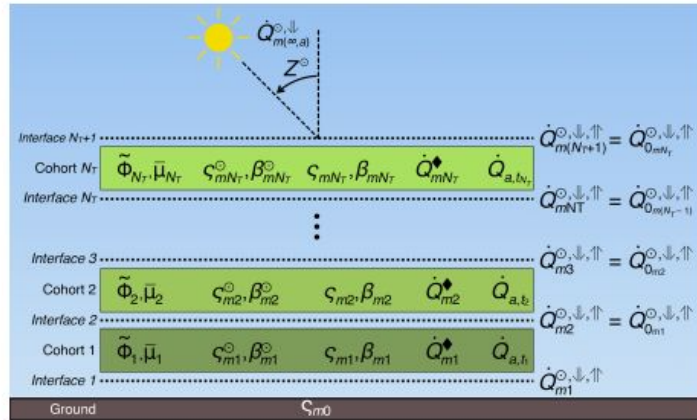
The Ecosystem Demography model

(to model the canopy-level differences between lianas and trees)



- ED is a cohort-based model, the state structure of which is a nested hierarchy of geographical grid cells (polygons and sites), landscape age classes (patches) and cohorts of trees of different sizes and PFTs
- Contains a RTM module (Energy budget). Three broad bands: Visible (photosynthesis), NIR and TIR
- Only DGVM that includes lianas

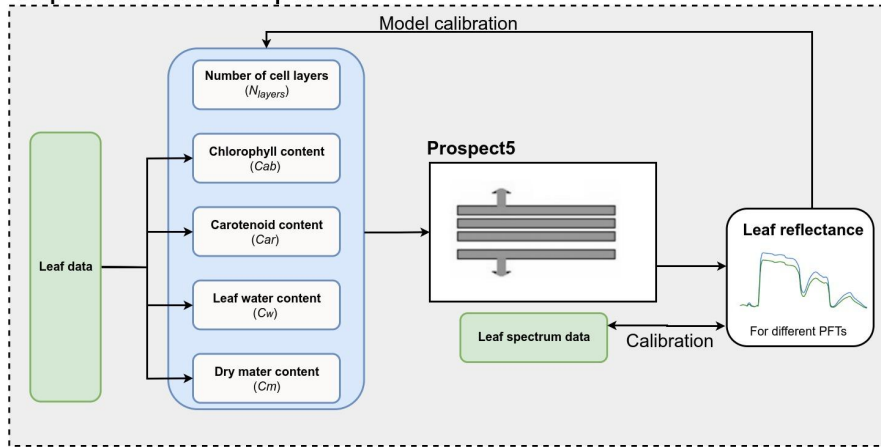
The RTM of the Ecosystem Demography model (ED-RTM)



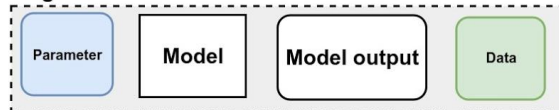
- Multilayer version of a two-stream model applied to the full solar spectrum
- 5 extra-parameters about leaf vertical distribution, clumping factor, leaf orientation etc.
- Extra-information required (date, location, inventory)
- Available at fine spectral resolution (1nm)

The workflow (step 1)

Step 1: Leaf reflectance spectrum

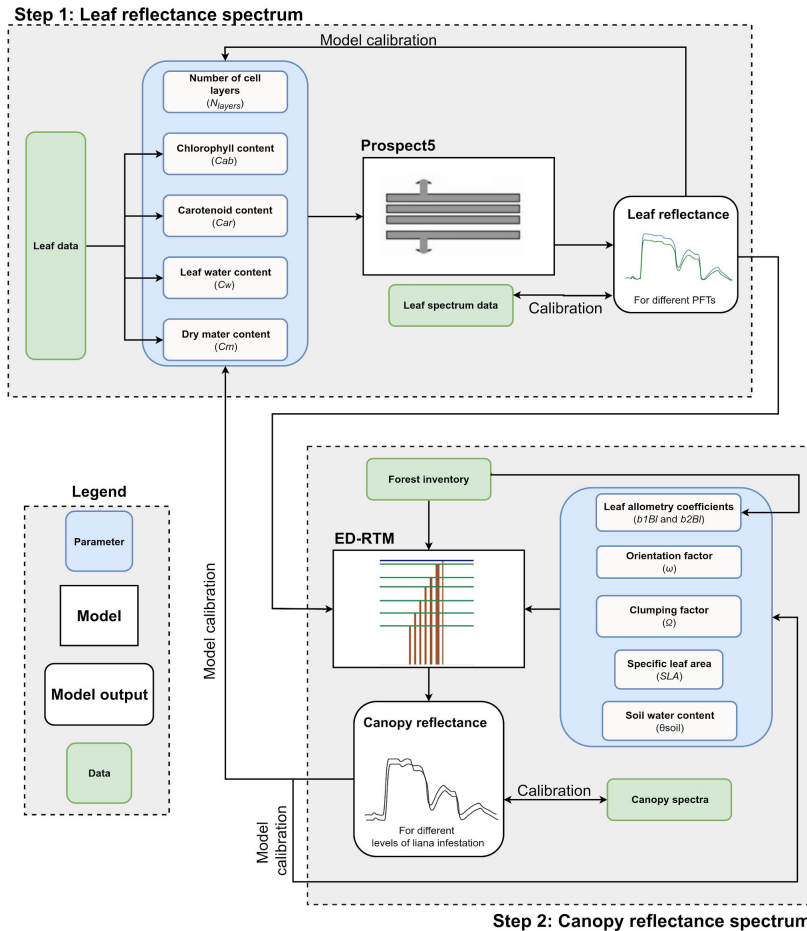


Legend



- Liana and tree leaf reflectance spectra available
- Bayesian calibration for each single study/site
- Growth-form comparison
(Leaf biochemical and structural traits)
- Uncertainty analysis of the posterior distributions

The workflow (steps 1 and 2)



- Canopy spectra available for multiple liana-infestation levels
- Sequential two-steps process
→ Leaf posterior distributions are used as priors
- Bayesian calibration for each single study/site
- Growth-form comparison
(Leaf AND canopy traits)
- Uncertainty analysis of the posterior distributions

Data collection (meta-analysis)

- Only a few key studies
- Raw data almost never available!
→ manual digitization
- Uncertainties almost never reported
- Only a few sites (mainly Panama)

Reference	Study site(s)	Short name	Leaf reflectance spectrum range (nm)	Canopy reflectance spectrum range (nm)	Data source	Date of collection
Castro-Esau et al. (2003)	FTS, Panama	Castro (FTS)	450-950	-	Digitized	2013/03 (dry season)
	PNM, Panama	Castro (PNM)				
Guzmán et al. (2018)	SRNP, Costa Rica	Guzmán	450-950	-	Original	2017/05-07 (wet season)
Sanchez et al. (2009)	FTS, Panama	Sanchez (FTS)	450-950	-	Digitized	2004/08 (wet season)
	PNM, Panama	Sanchez (PNM)				
Kalacska et al. (2007)	PNM, Panama	Kalacska	400-2500	450-2250	Digitized	2004/12 (dry season)
Marvin et al. (2016)	Gigante, Panama	Marvin	-	400-2500	Digitized	2012/02 (dry season)
Sanchez et al. (2006)	PNM, Panama	Sanchez	-	400-2400	Digitized	2012/07 (wet season)

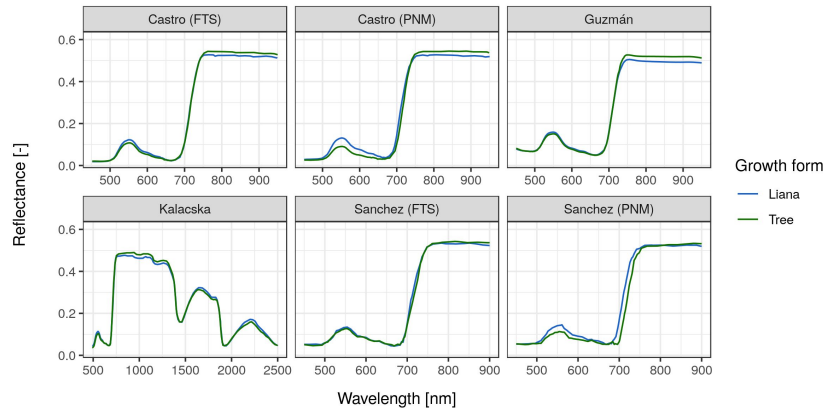
Data collection (meta-analysis)

Leaf-level



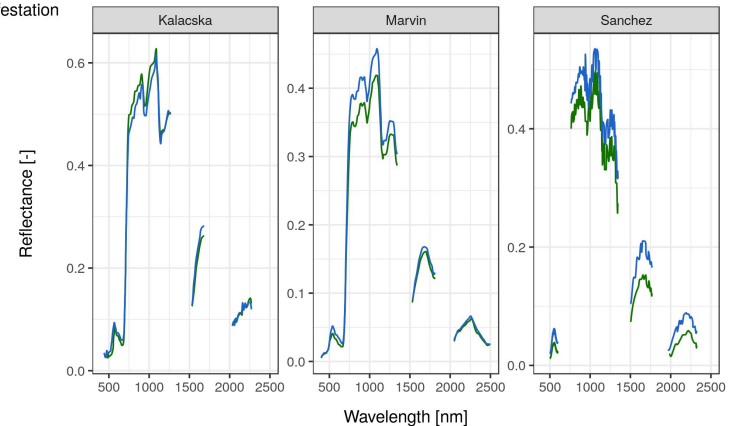
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Canopy level



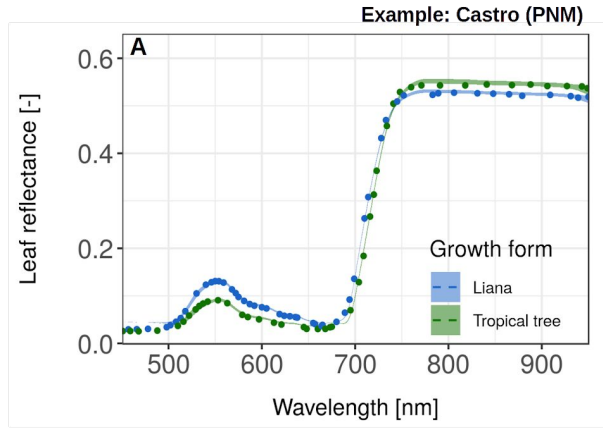
Liana infestation

— low
— high



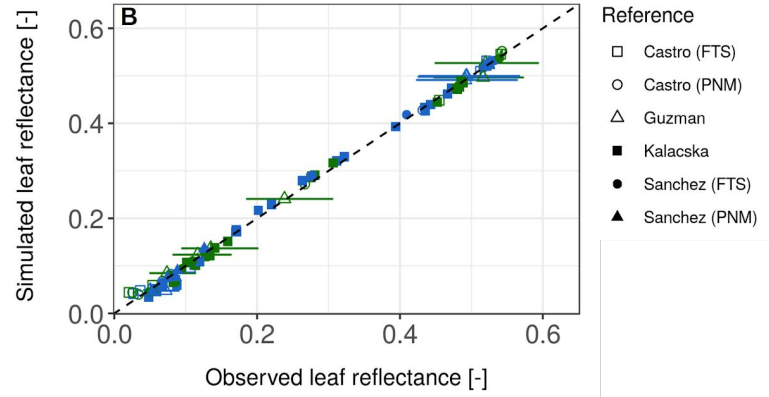
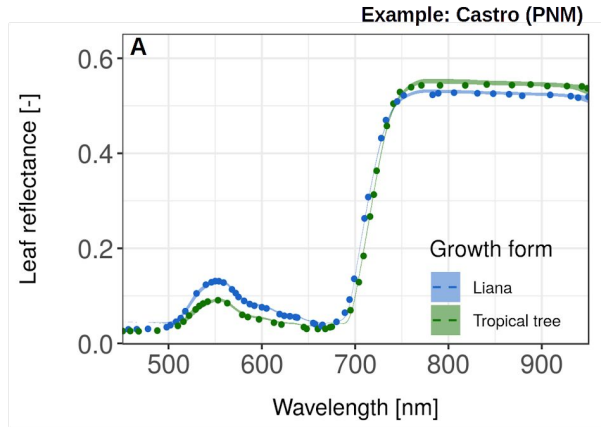
Results (Model calibration)

Leaf spectrum



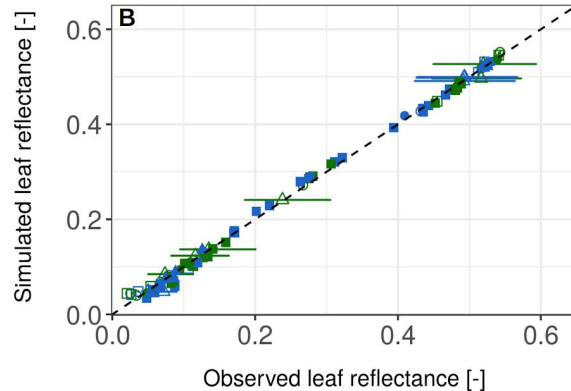
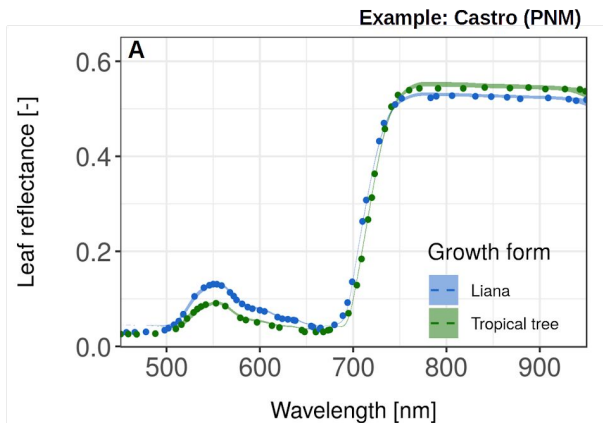
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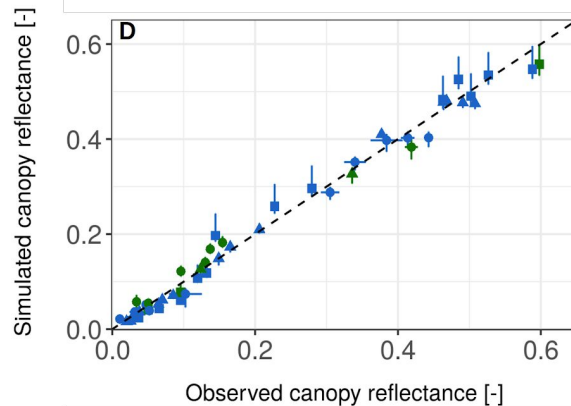
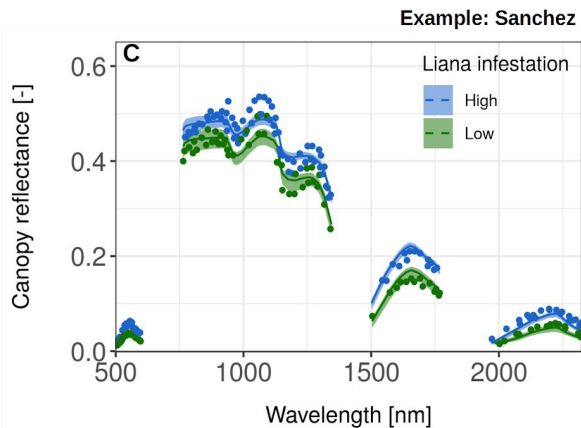
Results (Model calibration)

Leaf spectrum



Reference

- Castro (FTS)
- Castro (PNM)
- △ Guzman
- Kalacska
- Sanchez (FTS)
- ▲ Sanchez (PNM)



Reference

- Kalacska
- Marvin
- ▲ Sanchez

Canopy spectrum

Results (Model calibration)

			Visible (VIS)		Infrared (NIR)	
			RMSE	Bias	RMSE	Bias
Leaf	Model vs data	Tree	0.0123	-0.00569	0.00571	-0.00035
		Liana	0.0091	-0.00134	0.00522	0.00127
	Data vs Data	Tree - Liana	0.0137	-0.00818	0.0132	0.00514
	Model vs Model		0.0167	-0.01040	0.0131	0.00387
	<hr/>					
Canopy	Model vs data	Liana-free stands	0.0120	0.00225	0.0198	0.00144
		Liana-rich stands	0.0119	-0.00348	0.0209	-0.00067
	Data vs Data	Liana-free - Liana-rich	0.0143	-0.00111	0.0268	-0.0167
	Model vs Model		0.0120	-0.00388	0.0240	-0.0158
	<hr/>					

$$RMSE = \sqrt{\frac{\sum_{i=1}^n \sum_{\lambda=1}^{m_i} (x_{i,\lambda} - \hat{x}_{i,\lambda})^2}{N}}$$

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Model calibration
performance

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Sim. errors < Obs. signal?

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Model ability to reproduce differences

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$$RMSE = \sqrt{\frac{\sum_{i=1}^n \sum_{\lambda=1}^{m_i} (x_{i,\lambda} - \hat{x}_{i,\lambda})^2}{N}}$$

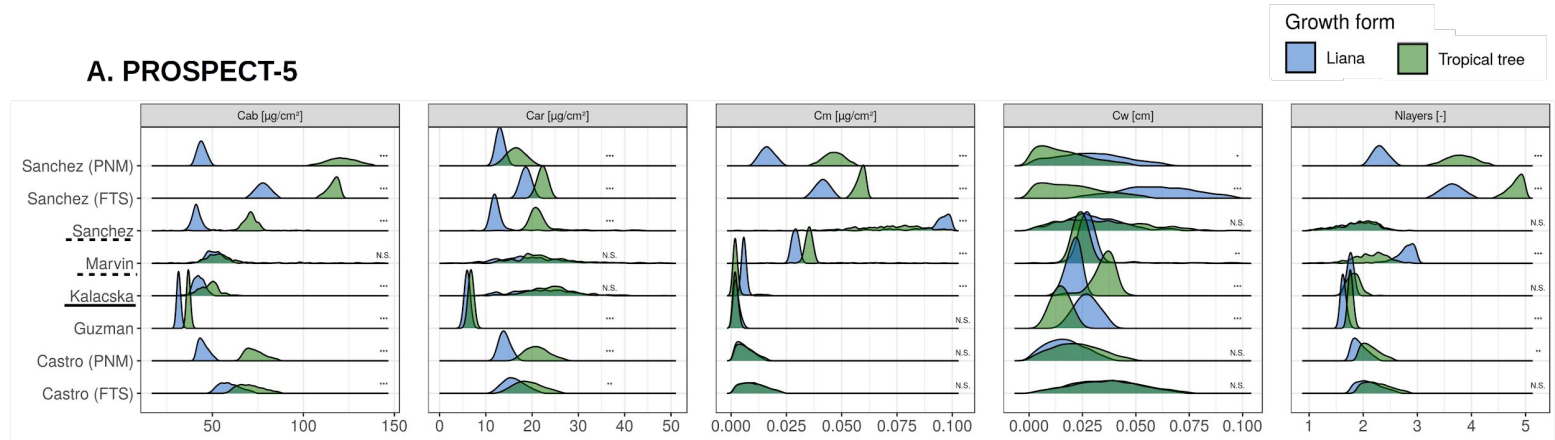
$$Bias = \frac{\sum_{i=1}^n \sum_{\lambda=1}^{m_i} (x_{i,\lambda} - \hat{x}_{i,\lambda})}{N}$$

Results (Model calibration)

			Visible (VIS)		Infrared (NIR)		
			RMSE	Bias	RMSE	Bias	
Leaf	Model vs data	Tree	0.0123	-0.00569	0.00571	-0.00035	Model calibration performance
		Liana	0.0091	-0.00134	0.00522	0.00127	
	Data vs Data	Tree - Liana	0.0137	-0.00818	0.0132	0.00514	Sim. errors < Obs. signal?
	Model vs Model		0.0167	-0.01040	0.0131	0.00387	
Canopy	Model vs data	Liana-free stands	0.0120	0.00225	0.0198	0.00144	Model ability to reproduce differences
		Liana-rich stands	0.0119	-0.00348	0.0209	-0.00067	
	Data vs Data	Liana-free - Liana-rich	0.0143	-0.00111	0.0268	-0.0167	
	Model vs Model		0.0120	-0.00388	0.0240	-0.0158	

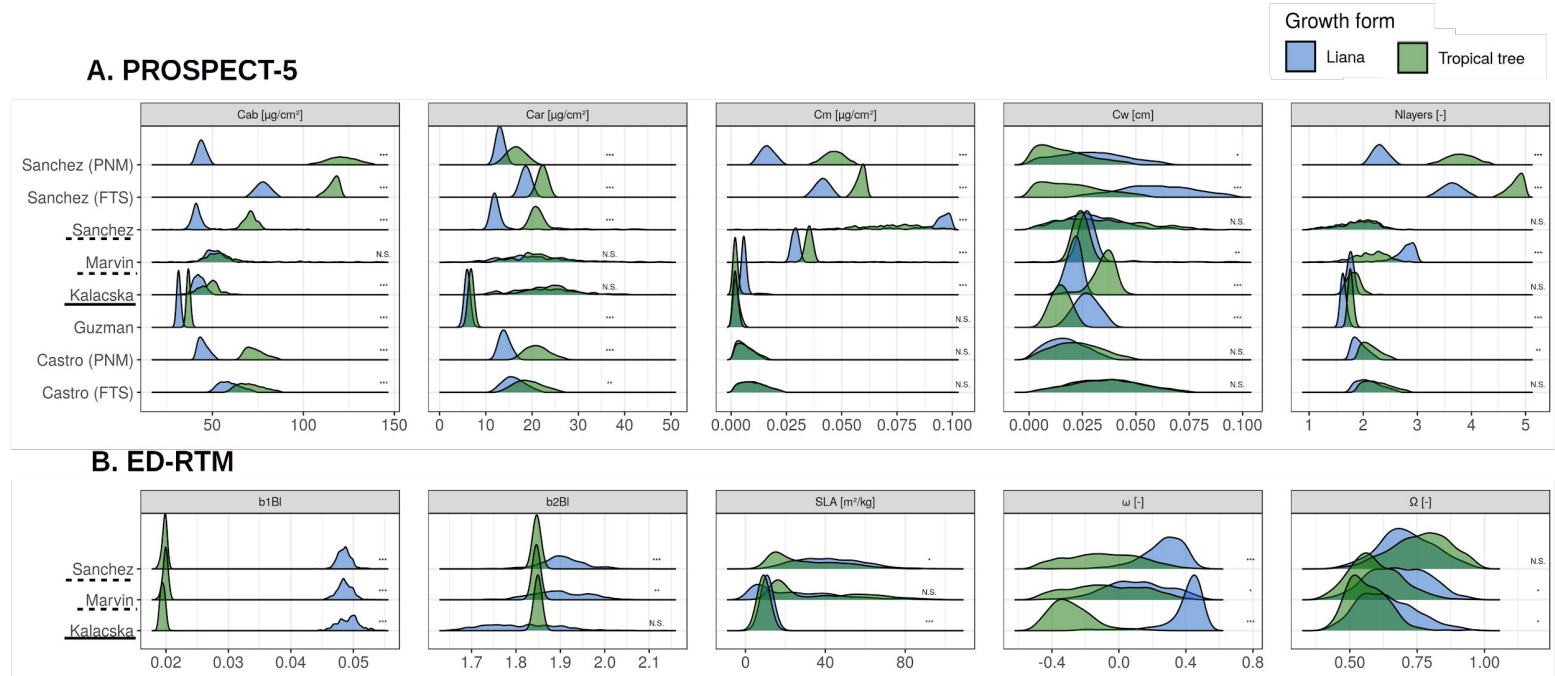
- Small biases, small RMSE in both the VIS and the NIR at leaf and canopy levels
- Simulation errors almost always smaller than observed signals
- Similar magnitude and direction of the differences at leaf and canopy levels

Results (traits)



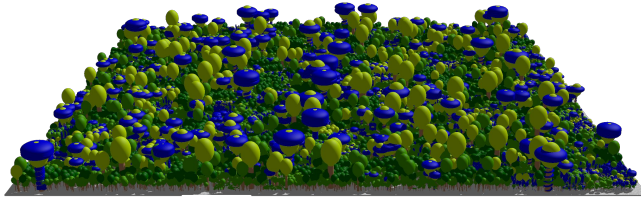
- Pigment content (Cab = Chlorophyll, Car = carotenoid) systematically lower in liana leaves
- Lianas have often “cheaper” leaves (thinner: Nlayers << and low dry matter content Cm)
- Lianas have also often larger water content (Cw)

Results (traits)

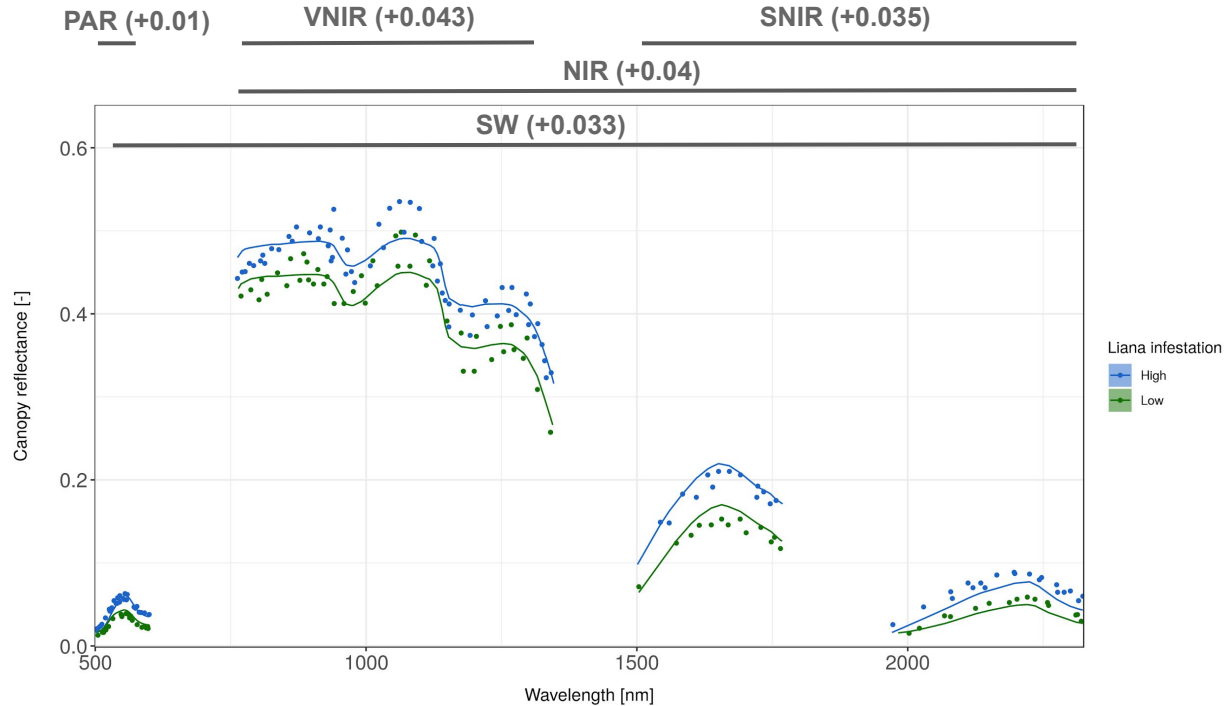
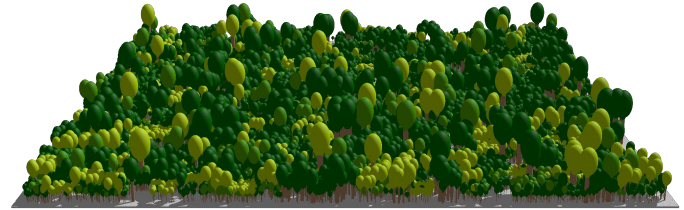


- Liana individual invest more in leaves (b1BI and b2BI = leaf allometric coefficients) than same size trees
- Liana canopy more clumped (Ω = clumping factor) and have more horizontal leaves (ω)

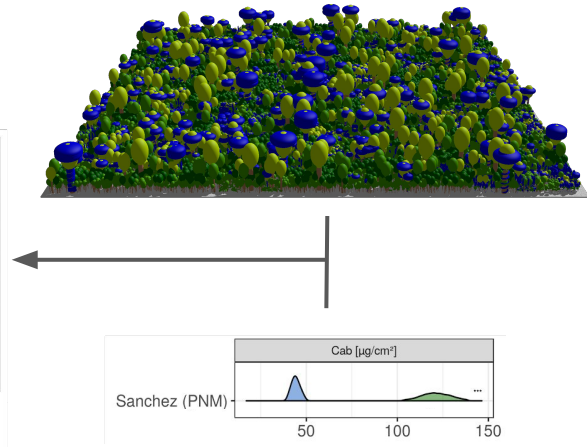
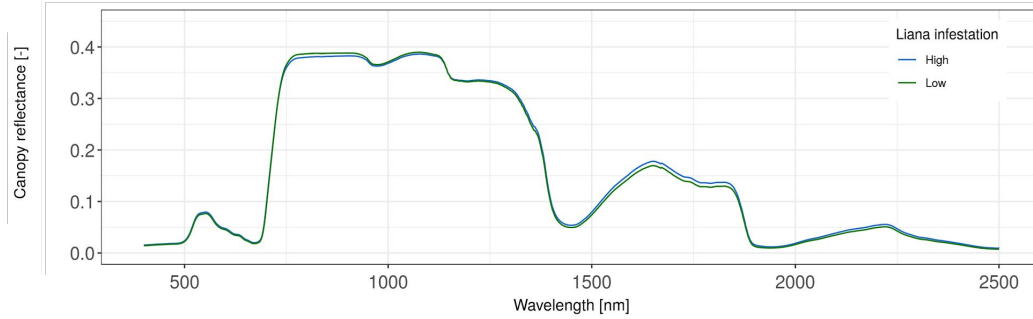
Application (albedo)



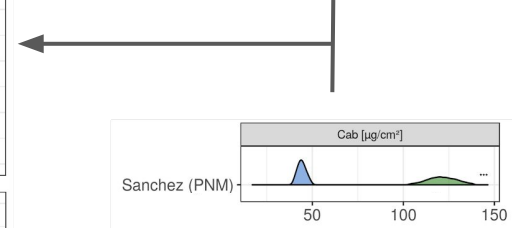
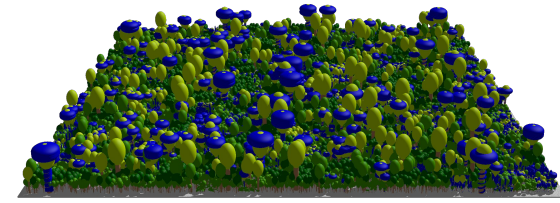
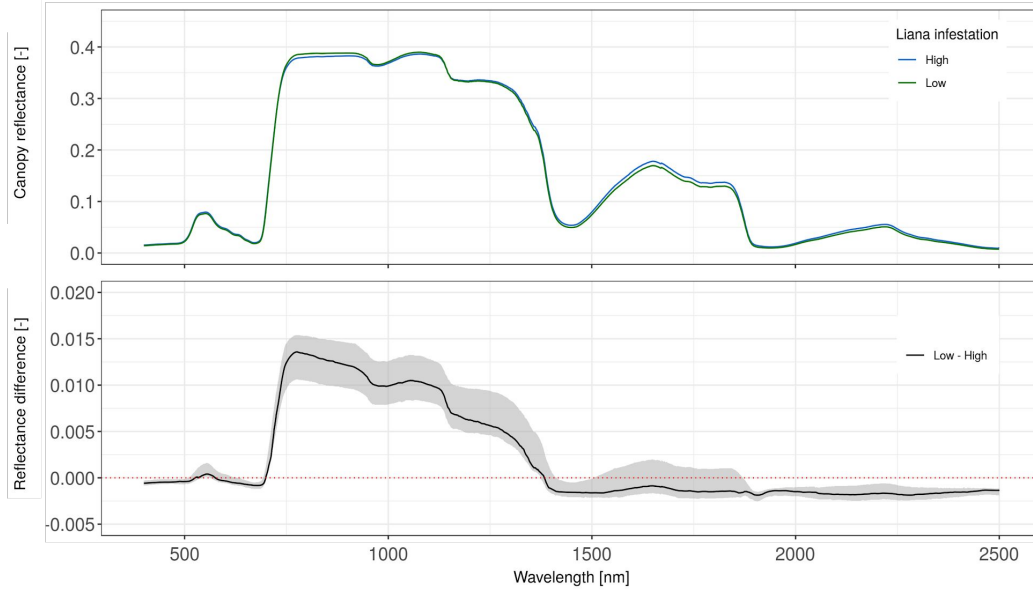
VS



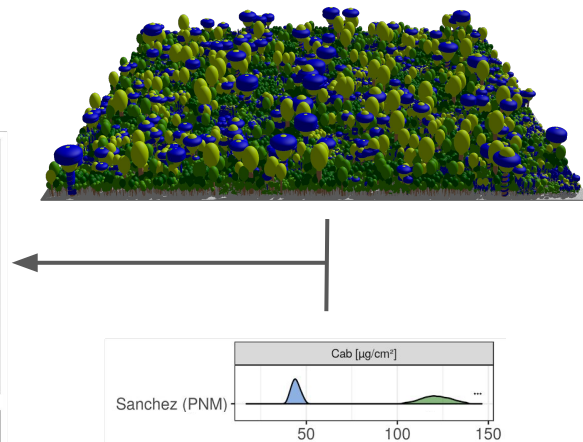
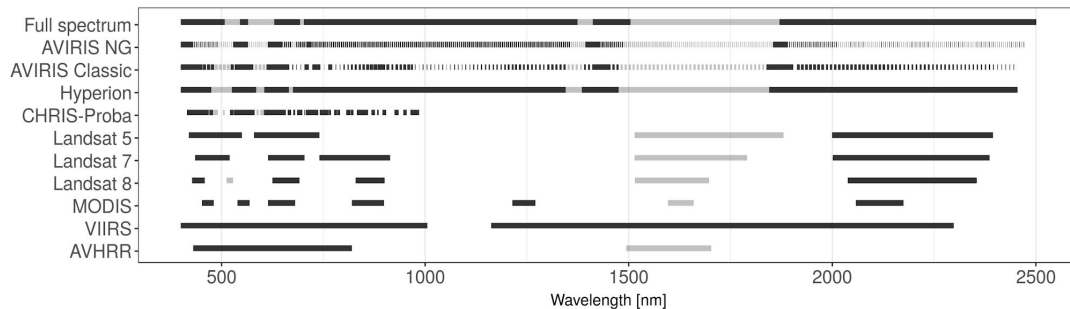
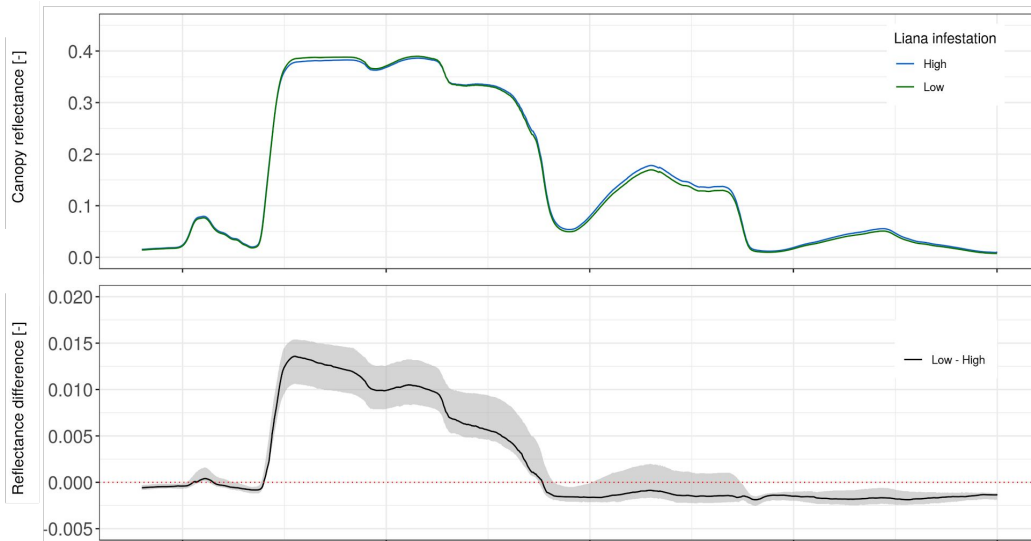
Application (remote sensing)



Application (remote sensing)



Application (remote sensing)



Conclusion

Meta-analysis of tropical
(liana) optical parameters

Implemented in process-based
leaf and canopy models

Models and data indicate
biochemical and structural traits
differences between L and T

Applications for RS and impact
on global energy budget



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