

# Role of modelling and data assimilation for constraining the terrestrial carbon cycle

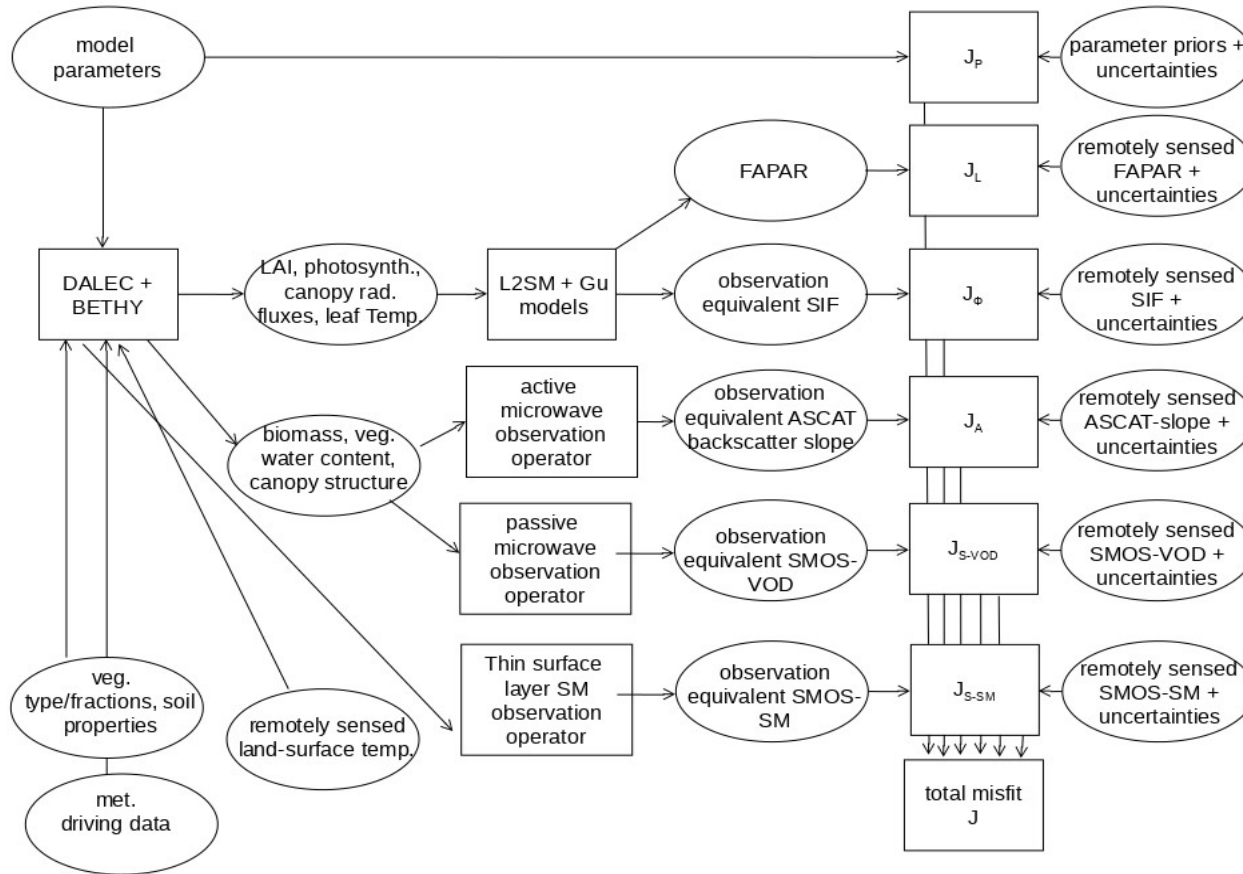
---

Thomas Kaminski, Wolfgang Knorr, Michael Voßbeck, Mathew Williams, Timothy Green, Luke Smallman, Marko Scholze, Tristan Quaife, Tuula Aalto, Tea Thum, Sönke Zaehle, Mike Schwank, Mika Aurela, Martin Barbier, Santiago Belda Palazón, Alexandre Bouvet, Emanuel Bueechi, Wouter Dorigo, Tarek S. El-Madany, Tiana Hammer, Marika Honkanen, Derek Houtz, Francois Jonard, Yann H. Kerr, Anna Kontu, Juha Lemmetyinen, Hannakaisa Lindqvist, Arnaud Mialon, Mirco Migliavacca, Leander Möisinger, Pablo Morcillo, Susan Steele-Dunne, Shaun Quegan, Peter Rayner, Pablo Reyez Muñoz, Nemesio Rodriguez Fernandez, Jochem Verrelst, Mariette Vreugdenhil, Matthias Drusch, and Dirk Schüttemeyer

## 4<sup>th</sup> Carbon From Space Meeting

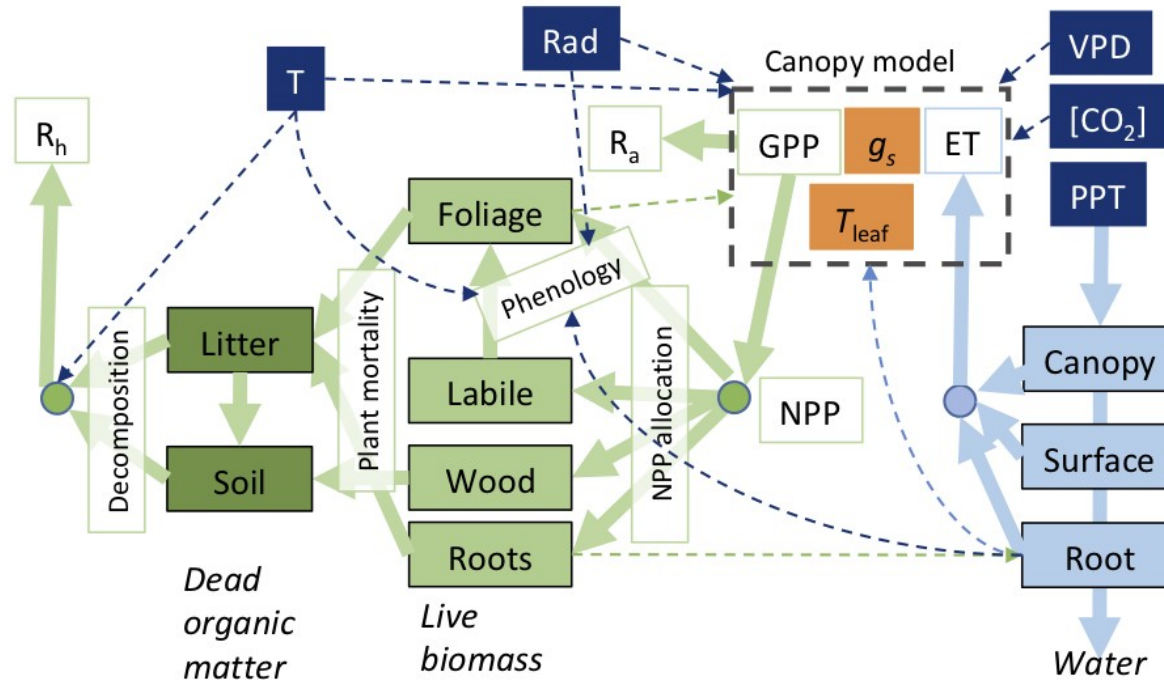


# Observation operators and data assimilation (on the swath)

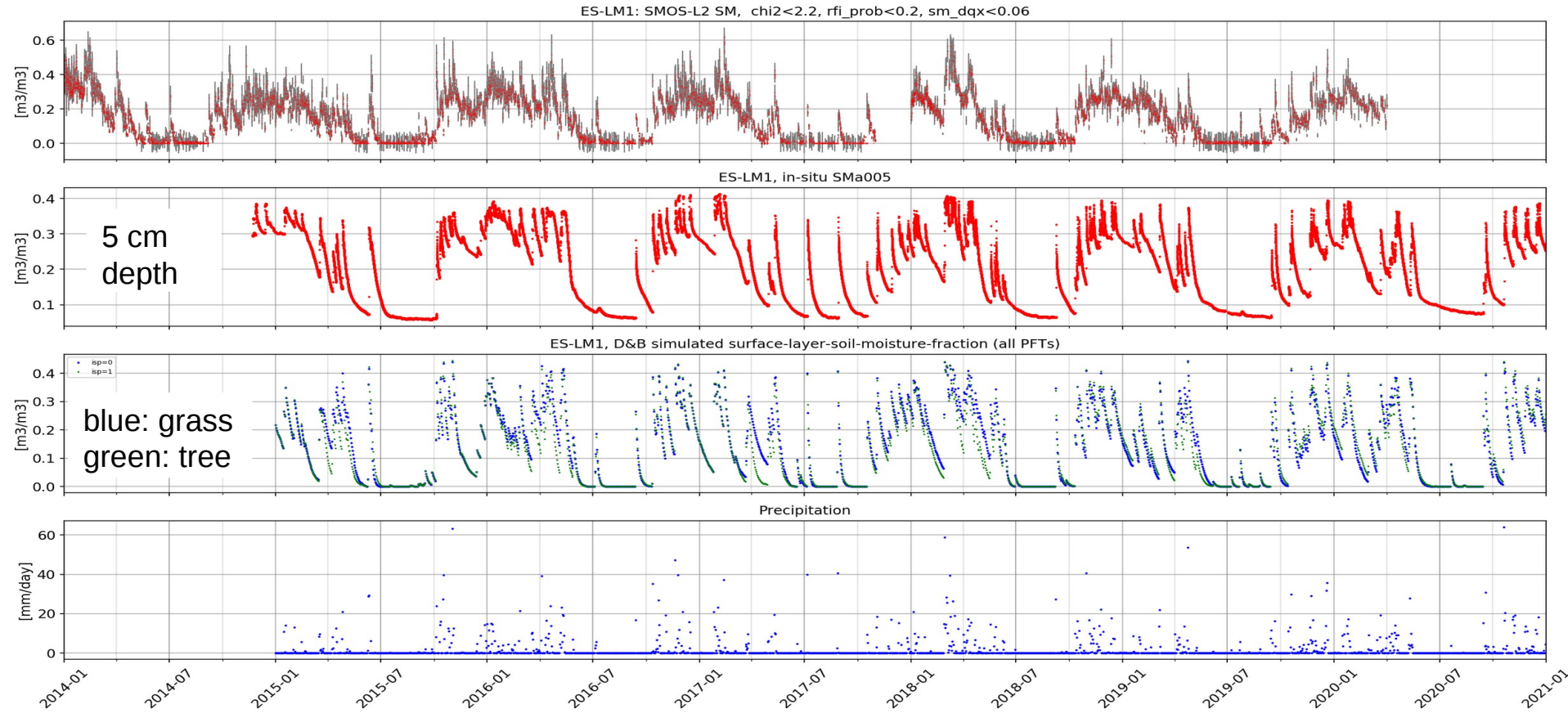


# Community land surface model: D&B model

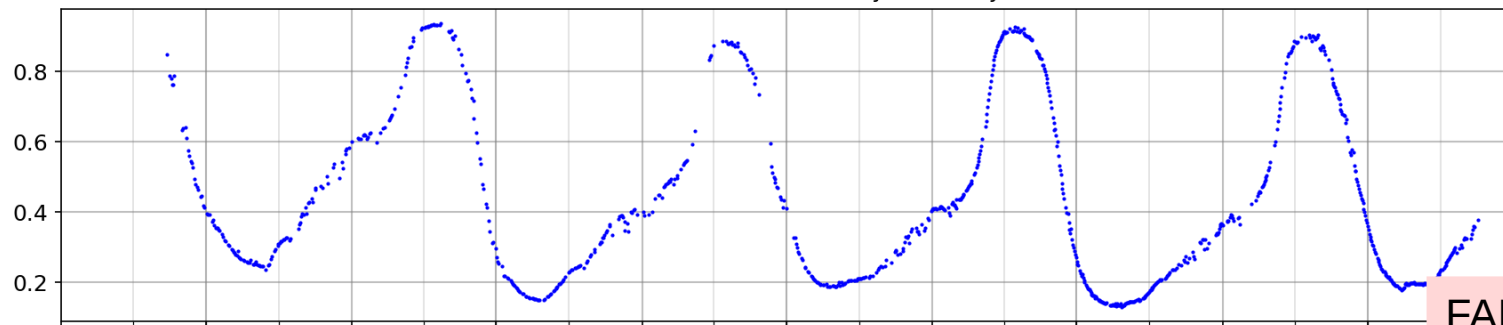
Based on a coupling of DALEC and BETHY



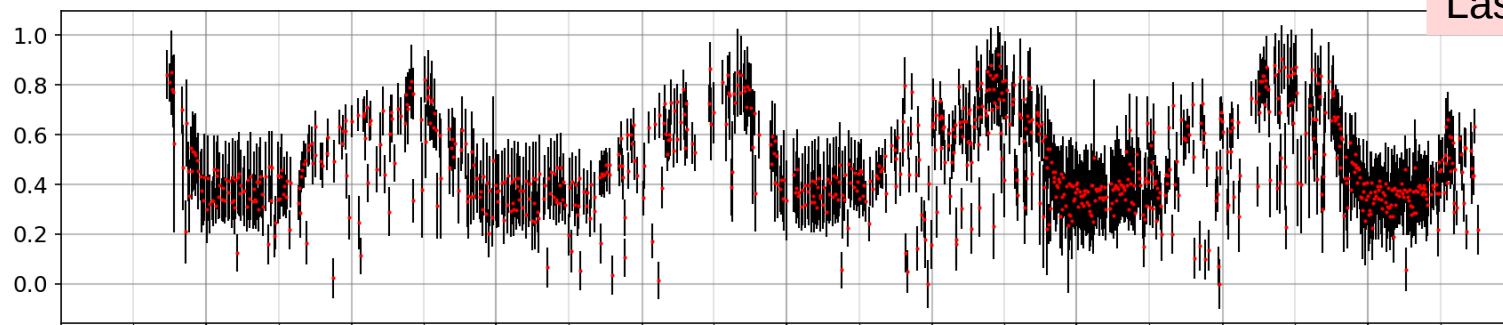
# Observation Operator for surface layer soil moisture Las Majadas



D&B simulated Fraction of Absorbed Photosynthetically Active Radiation

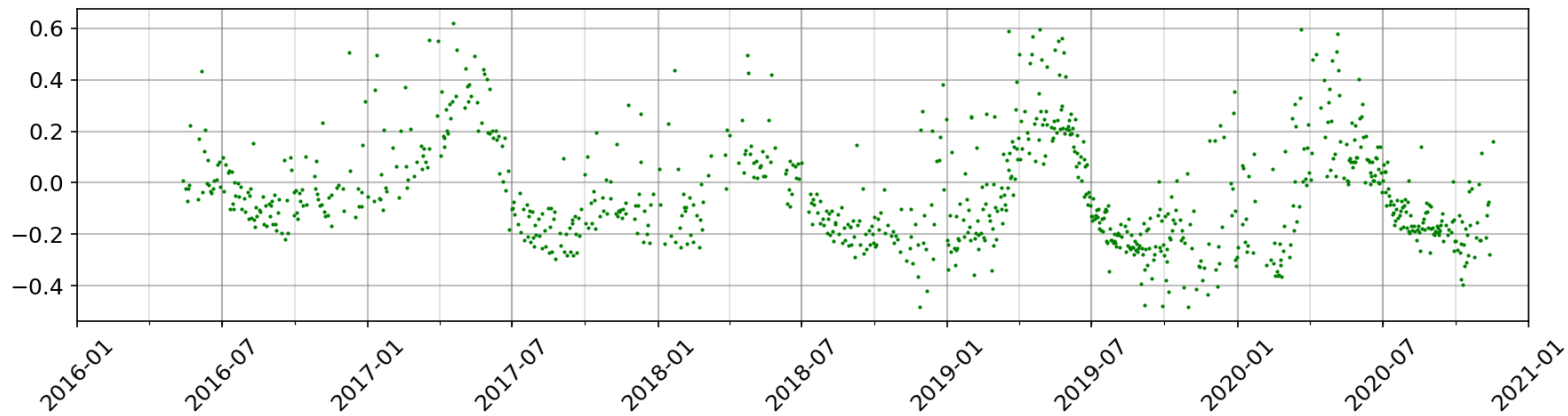


S3 FAPAR



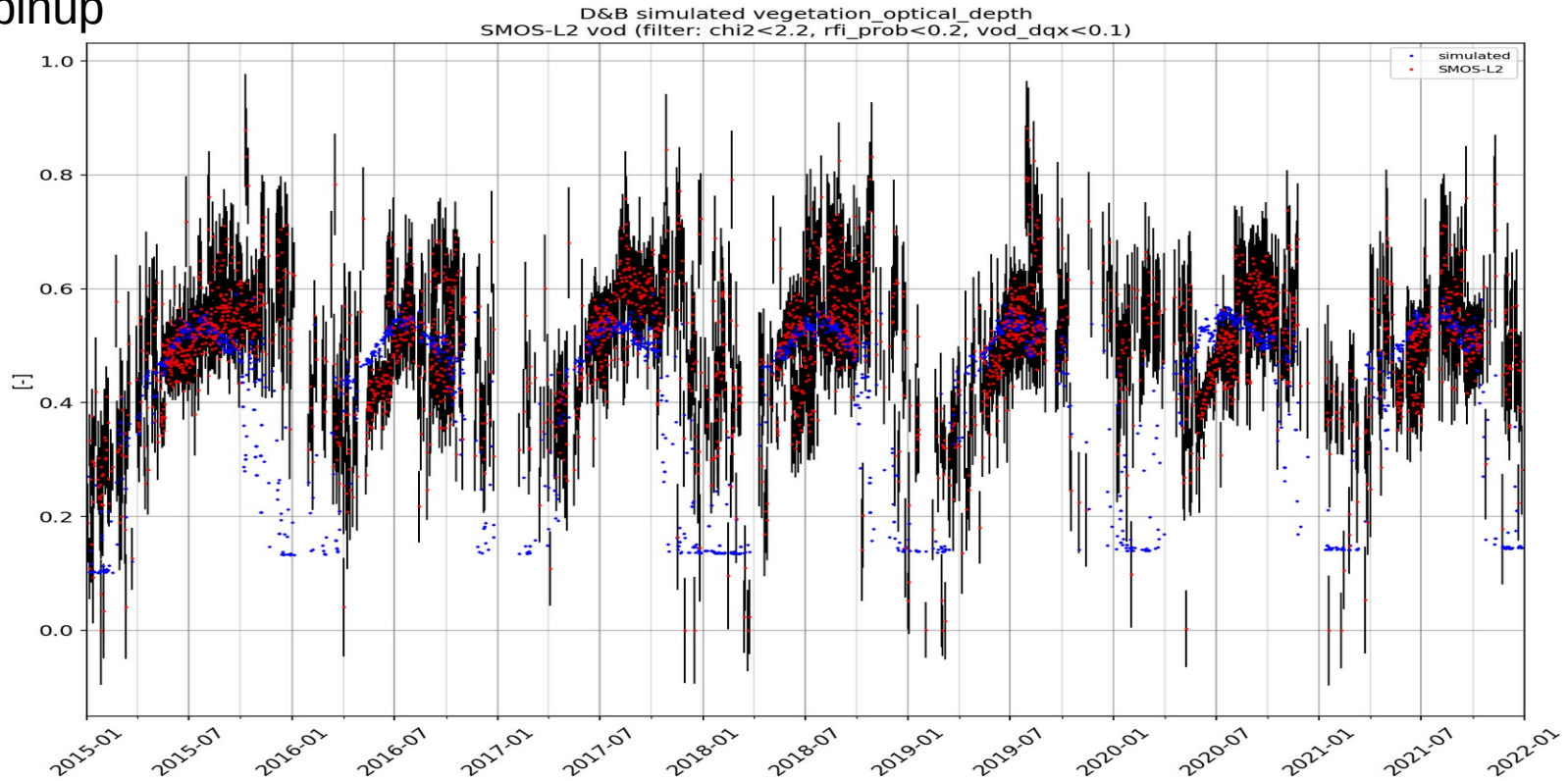
FAPAR at  
Las Majadas

D&B - observed



# Observation Operator for L-VOD, calibrated Sodankylä

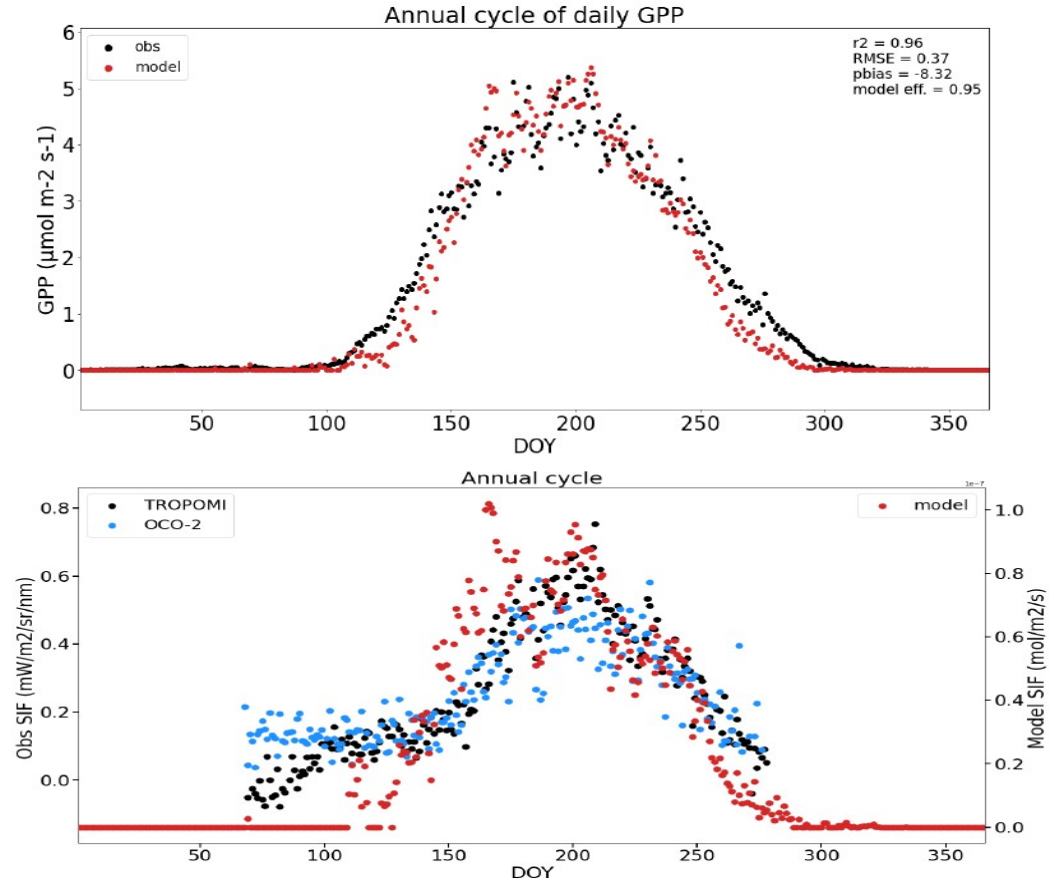
2 y spinup



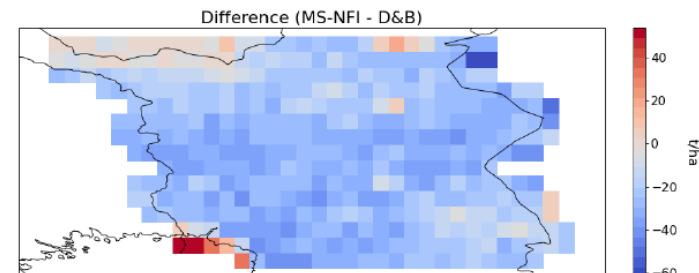
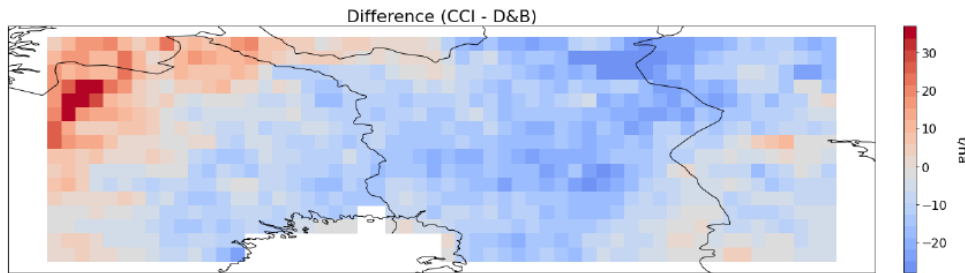
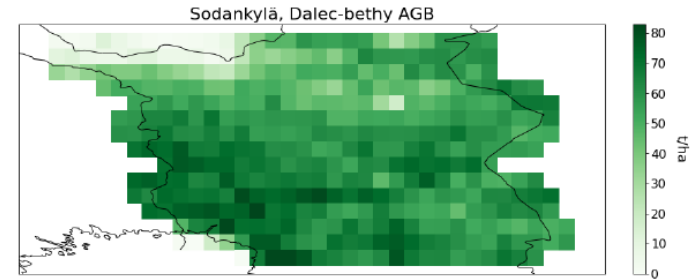
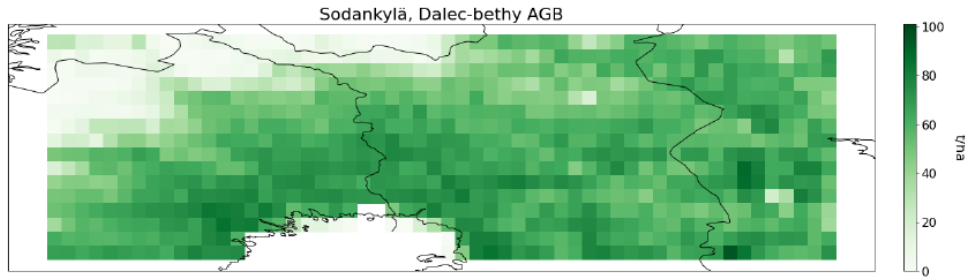
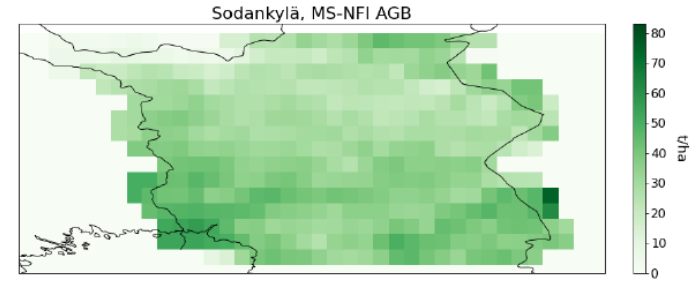
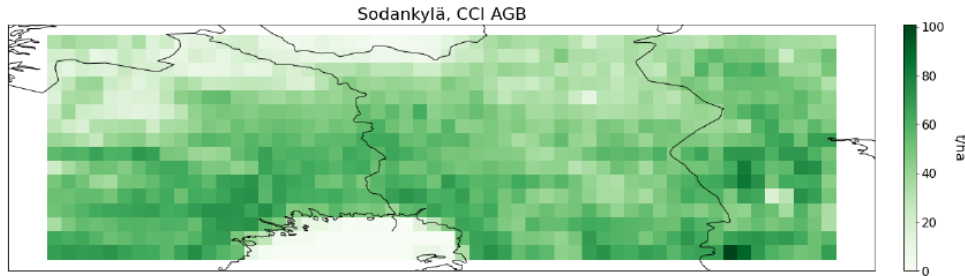
$$VOD_{\lambda}(t) = g_{\lambda}(T) * f_{\lambda}(B_w, h_s, B_l, h_f) = g_{\lambda}(T) * (a_0 + a_1 B_w + a_2 h_s + a_3 B_l + a_4 h_f),$$

$a_0 - a_4$  global

# GPP and SIF at Sodankylä



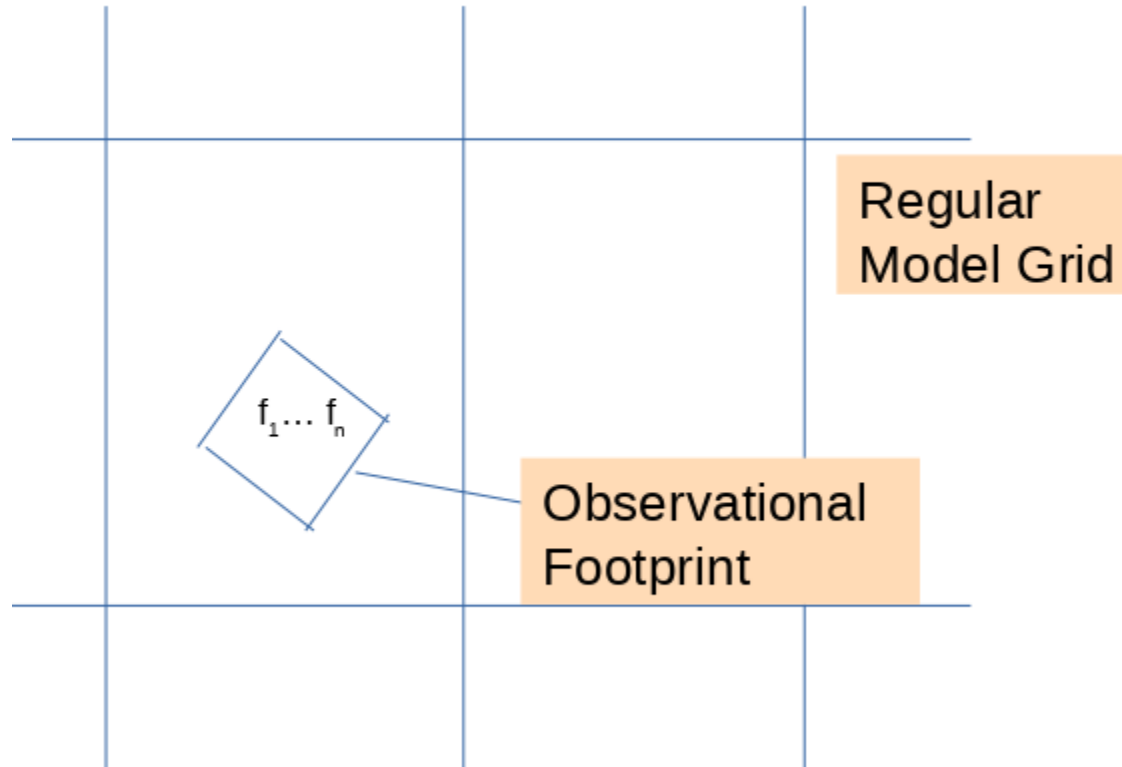
# AGB over Finnish region against CCI and NFI





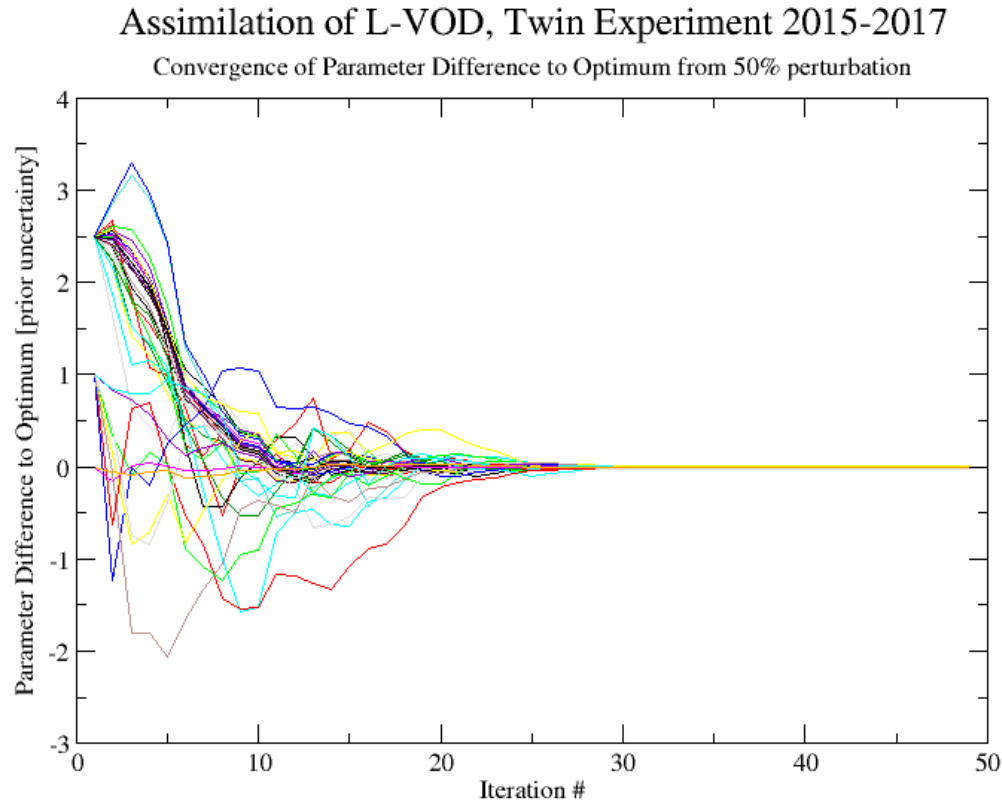
# Simulation on footprint/target area based on PFT fractions $f_i$

---



# Adjoint Based variational optimisation

## Example: VOD – identical twin experiment



# Summary D&B Model

---

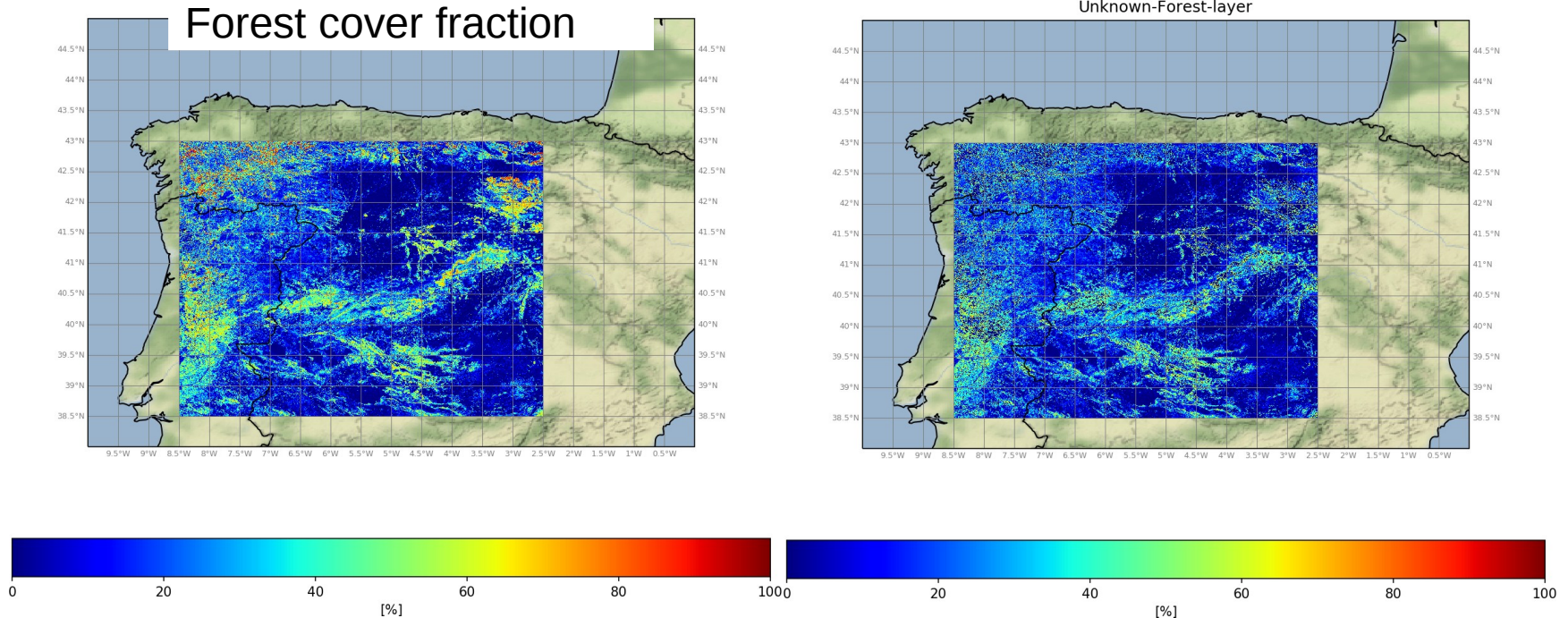
DALEC & BETHY model:

- developed for simulation and assimilation of EO and field data
- to provide an integrated perspective on terrestrial carbon and water cycles
- includes observation operators “on the swath” to exploit information from a diverse array of observations
- **includes tangent and adjoint codes** for efficient data assimilation (system needs to be applicable at high spatial resolution)
- **to be released to public domain as community model** for use by larger group beyond the LCC team

Working in the LCC team, which combines experts in field work, remote sensing, modelling, and data assimilation is **CHALLENGING, FRUITFUL**, and **FUN**, much more than working isolated within the respective communities

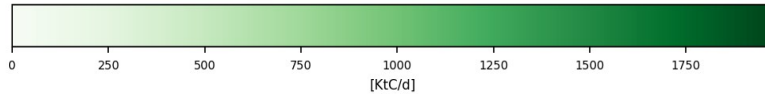
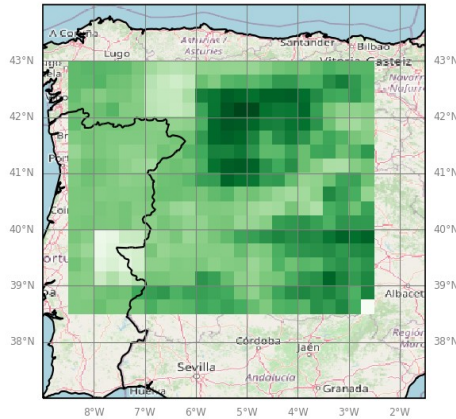
# Analysis of Copernicus Land Cover

In Majadas, most forest is identified as 'unknown'

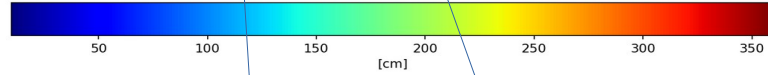
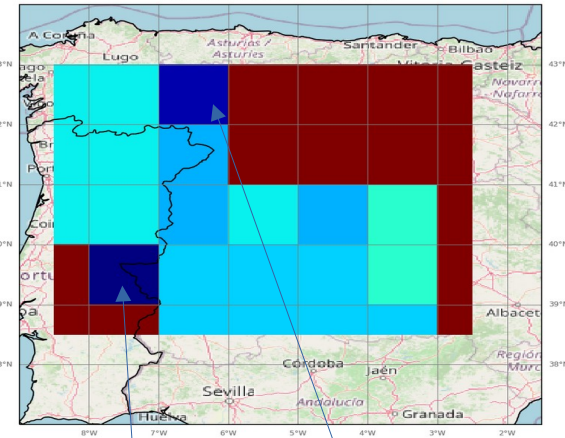


# Soil depth and GPP per PFT

D&B simulated annual-gpp (2018)



9.000W:1.500Wx37.000N:44.000N: soil profile depth [cm]  
min/mean/max = 1.0000E+01/2.0291E+02/3.6000E+02



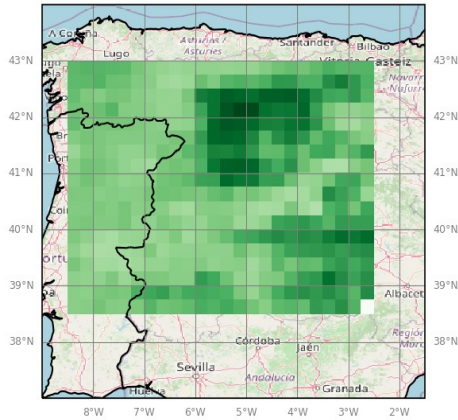
10 cm

25 cm

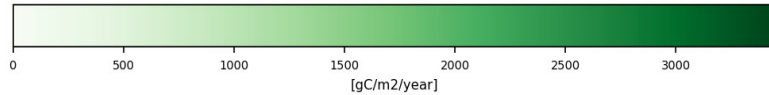
# Soil depth and GPP per PFT

---

D&B simulated annual-gpp (2018)

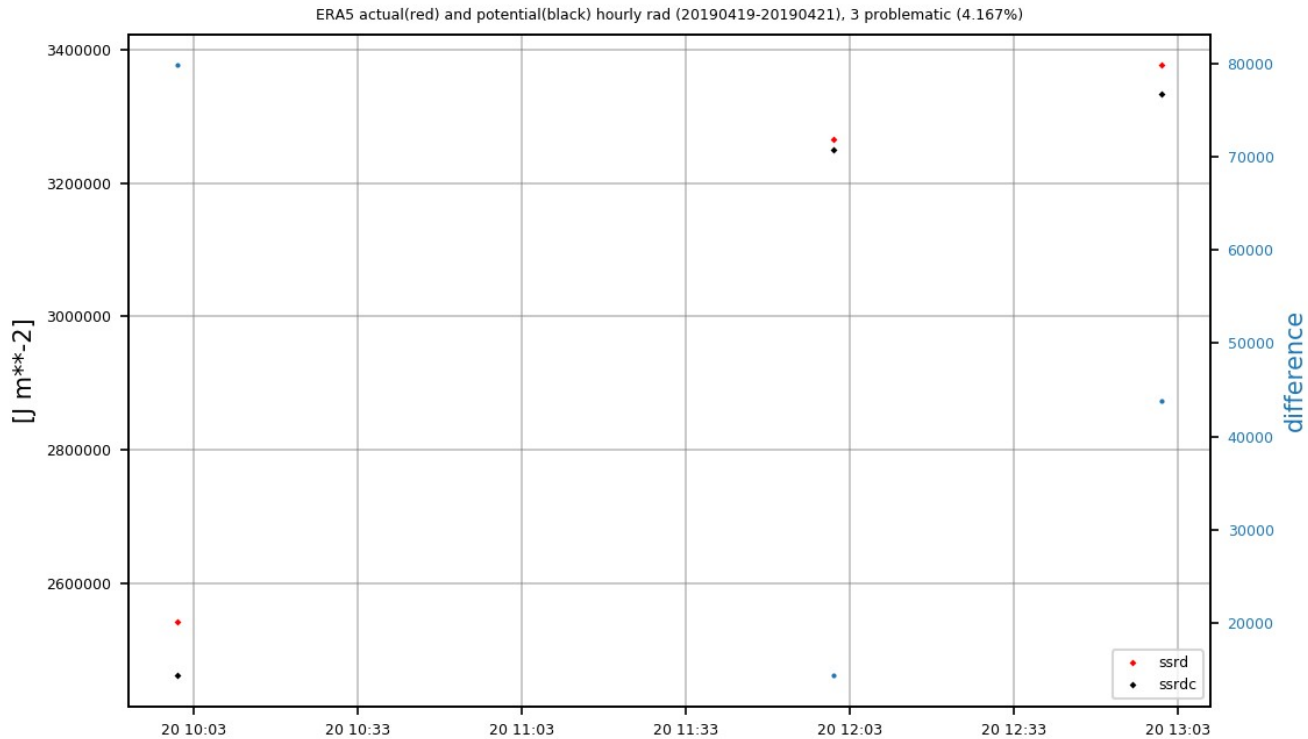


With soil depth  
floor of 115 cm



# Radiation from ERA5

## Actual exceeds potential solar incoming radiation



# Points for Discussion

---

- Quality of input/driving data is relevant, examples:
  - soil depth
  - landcover map to simulate footprints
  - radiation input relevant
- Field data are essential for model development
- Interdisciplinary project concept is useful



# Land Surface Carbon Constellation Study

[Project](#)[Partners](#)[Publications](#)[Links](#)[Internal](#)[Contact](#)

## Project Description

The carbon cycle is central to the Earth system, being inextricably coupled with climate, the water cycle, nutrient cycles and the processes on land and in the oceans. In the natural system the balance among carbon in the atmosphere, the land and the ocean is regulated through various natural reservoirs. In addition to these natural components, there are the flux contributions to the atmosphere from human activities, namely, fossil fuel burning, cement production, and a range of land management practices.

Understanding the patterns of exchanges of carbon between the atmosphere and the land and the underlying processes associated to them such as CO<sub>2</sub> fertilization, changes in climate, and changes to natural disturbance regimes, are critical to improving knowledge of the carbon cycle, its direct and indirect impacts on society. Identifying approaches to mitigate and adapt for the consequences of the anthropogenic disturbance of the carbon cycle is hampered by the uncertain uptake of atmospheric carbon by the terrestrial biosphere, and the response of this uptake to climate change itself.

To achieve such understanding and reduce these uncertainties requires an integrated approach to the carbon cycle which exploits both observations (satellite and in situ) and modelling.

The main objective of the Land surface Carbon Constellation (LCC) project is to demonstrate the synergistic exploitation of satellite observations from active and passive microwave sensors together with optical data for an improved understanding of the terrestrial carbon and water cycles. This will be achieved by:

- adapting a numerical land surface model for its application in a data assimilation framework,
- acquisition and analysis of campaign data sets at Sodankylä (Finland) and Majadas de Tieta (Spain) supporting the development of the model and the data assimilation scheme on the local scale.

The LCC Study started in October 2020 and contributes to ESA's [Carbon Science Cluster](#), focussing on its land component.

More Information:

<https://lcc.inversion-lab.com/>

Copyright © 2020 The Inversion Lab - all rights reserved.



Delft University of Technology

