

# Proposition for a methodological Monitoring Reporting & Verification framework and prototype of operational processing chain for monitoring cropland C stock change at high resolution over large regions

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Contributions:

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INRAE: Taeken Wijmer, Ludovic Arnaud, Ainhua Ihasusta, Suzanne Reynders

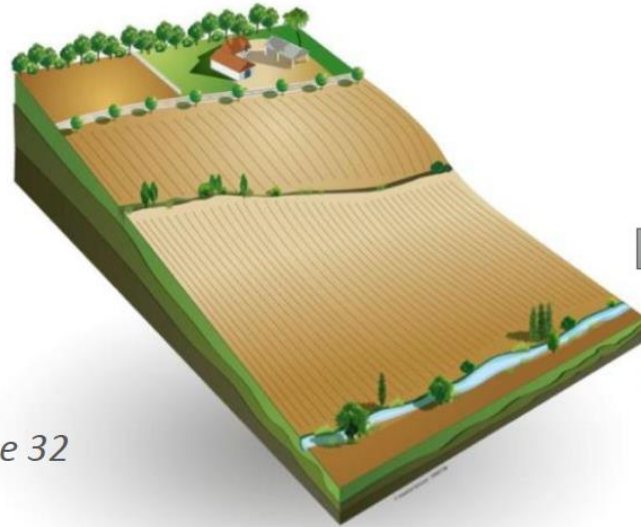
ISRIC: Gerard B.M. Heuvelink, Niels H. Batjes, Fenny van Egmond



# Context/societal challenges

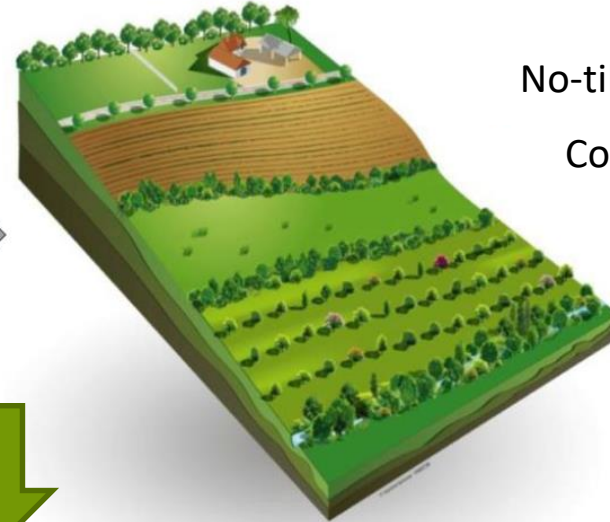
- Climate mitigation → remain below 1.5°C of temperature increase by 2100 (COP21, initiative 4 per 1000),
- Soil quality → more resilience to extreme climatic events, improved soil fertility...

## Conventional agriculture



Illustrations:  
*Arbre et Paysage 32*

## Agro-ecological practices



No-till, crop diversification

Cover crops

Agroforestry




C storage ?

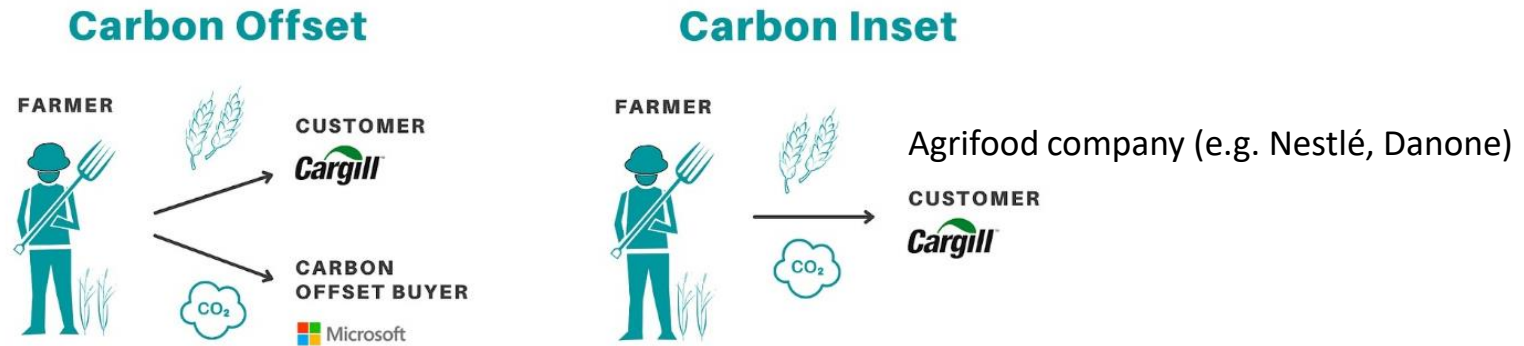
How to assess the impacts of those practices in terms of CO<sub>2</sub> emissions/soil organic carbon storage at the plot scale but over large areas?

➔ **Need for a new generation of tools providing an exhaustive/objective vision of the effect of management on SOC stock changes adapted to different contexts of application**

# Different context of MRV the SOC stock changes

MRV = Monitoring, Reporting and Verification

- National inventories; Nationally Determined Contributions (NDCs) under the Paris agreement,
- Common Agricultural Policy? but operational methods are still missing for the current one
- Carbon offset programs (voluntary Carbon market) mainly on forest up to now but emerging for cropland (e.g. ) , and recently insetting programs are developing also,

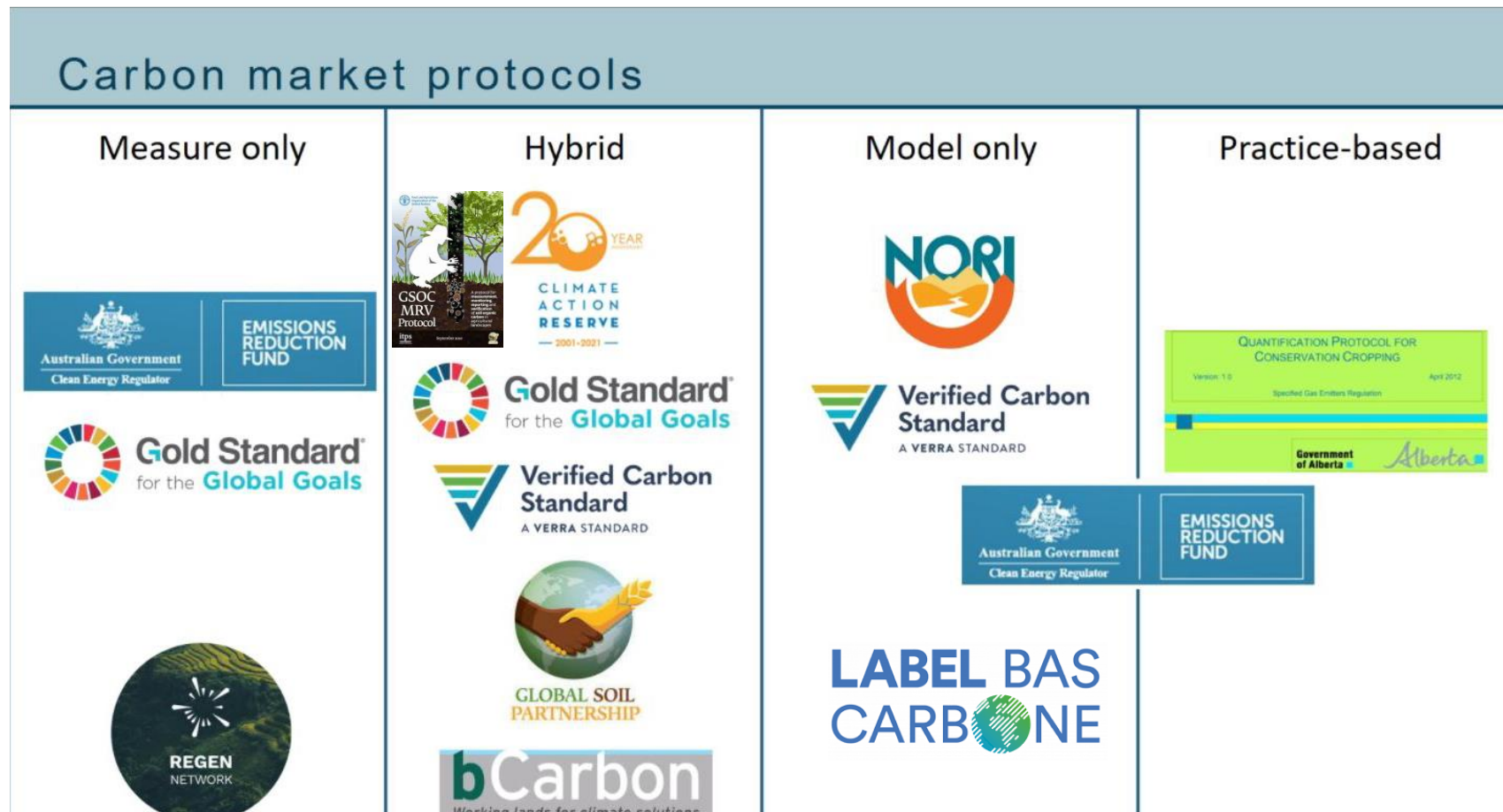


Each context of application has its specificities, requirements & rules



# A « jungle » of methods, guidelines, frameworks, certification standards for MRV of SOC stock changes

Demenois et al. (2021) Surviving the jungle of soil organic carbon certification standards: an analytic and critical review. Mitigation and Adaptation Strategies for Global Change 27, 1.

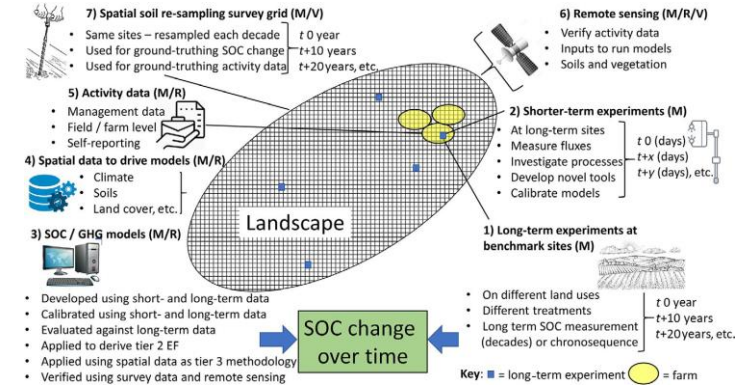
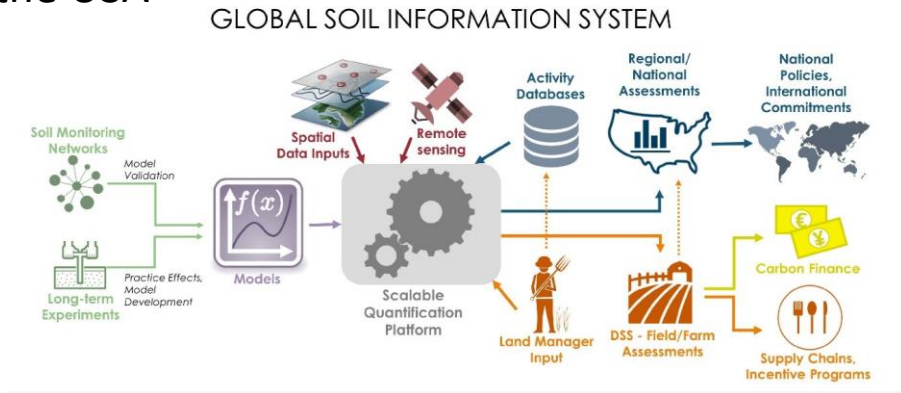


# Propositions of MRV frameworks for cropland

Paustian et al. (2019): NDC, C market in the USA

Conceptual

Smith et al. (2020)



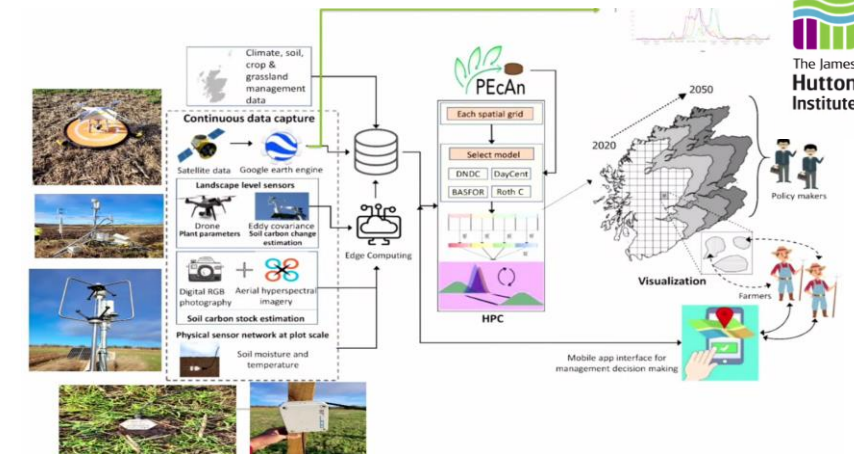
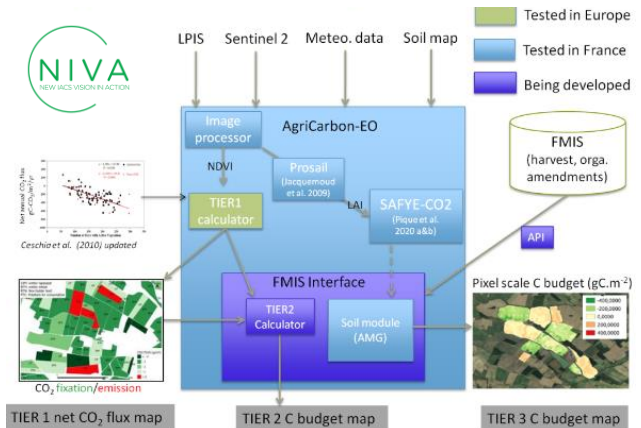
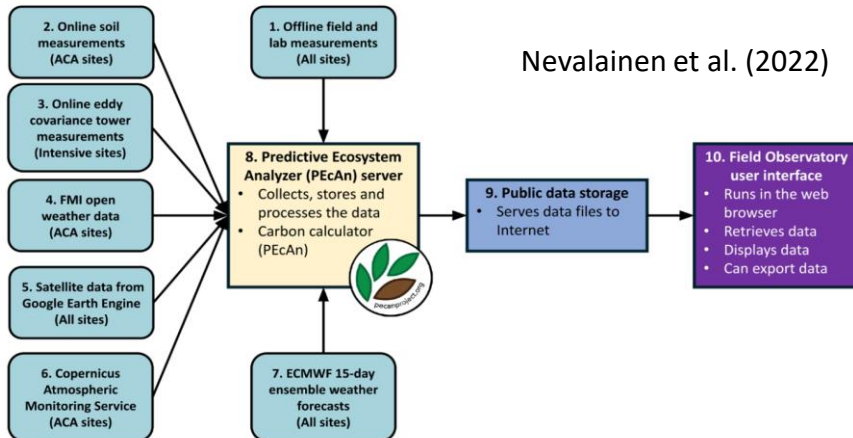
Operational

Field observatory network

Bockstaller et al. (2020) for CAP

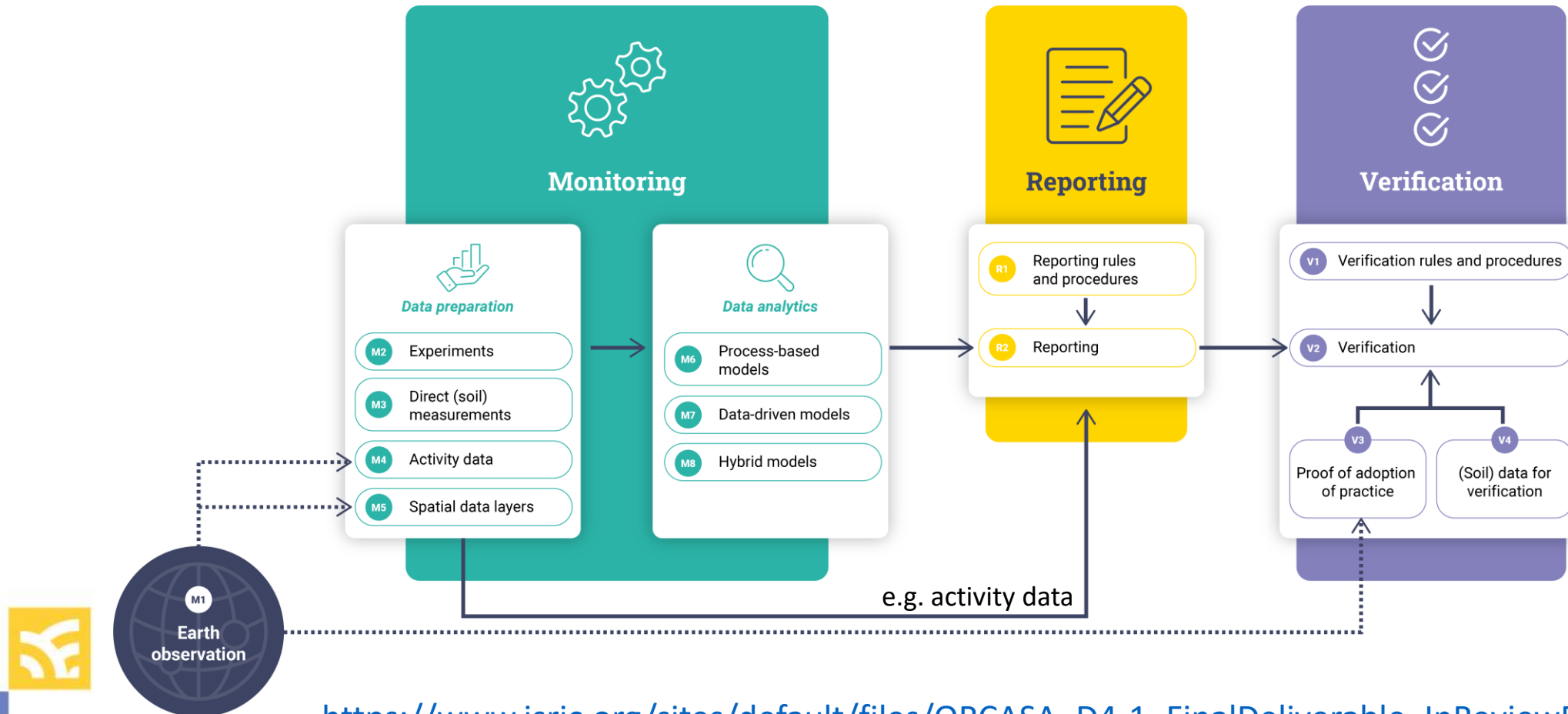
RETINA Project (UK): C market

Nevalainen et al. (2022)



# ORCaSa's propositions for an harmonized MRV framework

*Schematic representation of the components/building blocks and information flow for a generic MRV framework following several workshops with stakeholders and the analysis of existing MRV guidelines/methodologies*



# Challenges of methods for CO<sub>2</sub> removal

Technology	Afforestation and reforestation	Soil carbon sequestration	Biochar	Bioenergy with carbon capture & storage	Direct air carbon capture and storage	Enhanced weathering	Peatland and coastal wetland restoration	Blue carbon management	Ocean alkalinity enhancement	Ocean fertilization
Capture mechanism	Land-based biological	Land-based biological	Land-based biological	Land-based biological	Chemical	Geochemical	Land-based biological	Ocean-based biological	Geochemical	Ocean-based biological
Feasibility/readiness	●	●	●	●	●	●	●	●	●	●
Scalability	●	●	●	●	●	●	●	●	●	●
Ease of MRV*	●	●	●	●	●	●	●	●	●	●
Potential consequences	●	●	●	●	●	●	●	●	●	●
Public perception	●	●	●	●	●	●	●	●	●	●
Cost (US\$/tCO <sub>2</sub> )	< 100	< 100	100–500	100–500	> 800	100–500	< 100	< 100	Too early to quantify	
Storage medium	Buildings, vegetation, soils and sediments		Geological reservoirs		Minerals	Vegetation, soils and sediments		Minerals	Marine sediments	

Sources: UNEP - Emissions Gap Report (2023), Adapted from Geden et al. (2022) and Pisciotta, Davids and Wilcox (2022).

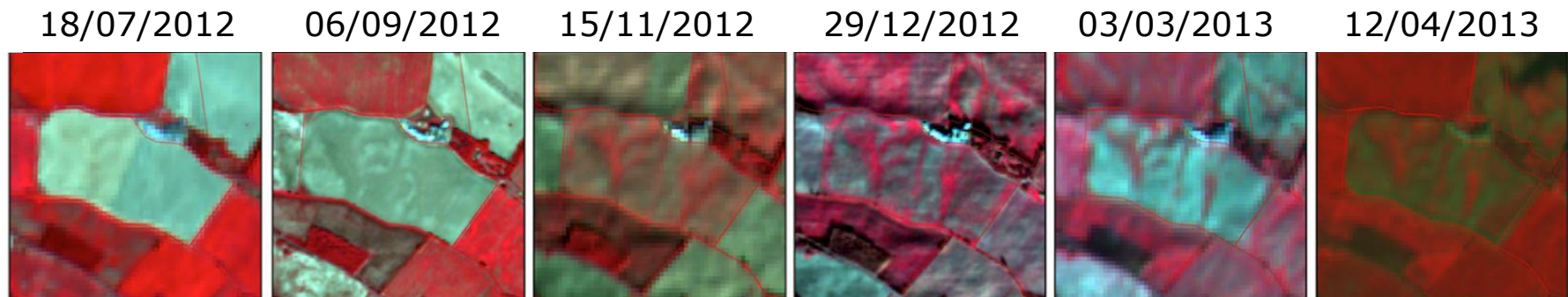
**One of the main challenge for promoting C storage in the agricultural soils is about Monitoring** → need for scalable, multi-context, automatized, cheep, reliable, transparent methods for monitoring SOC stock changes in agricultural soils,

## Following as much as possible CIRCASA's recommendations (see Deliverable 3.1):

- Modular & transparent approach with uncertainty assessment on SOC stocks,
- Several soil models instead of one → allowing ensemble approach,
- Assessment of the different components of the C budget in the development/verification process,
- Relying on strong data infrastructures following the FAIR principles: e.g. Copernicus, ICOS...
- High resolution, relying on remote sensing (e.g. Sentinel 2) to quantify biomass production & restitution to the soil,
- ...



Data  
SPOT4/5



Cover crop in red/pink, bare soil in blue/gree



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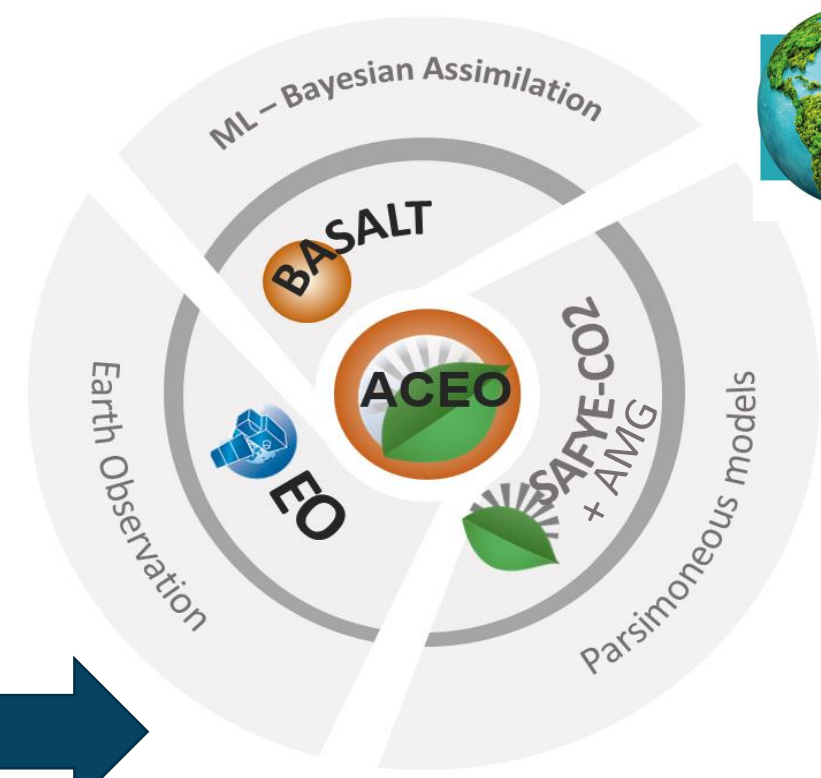


**An compliant with the Carbon sequestration certification framework under development in Europe**



# Limits of current methods for monitoring soil carbon

25-75 samples /ha !!!



## AgriCarbon-EO

A hybrid method combining parsimonious process based modelling, remote sensing data assimilation and Machin Learning + In-situ data for cal/val

➔ Strong focus on assessing the effect of biomass input to the soil on SOC stock changes

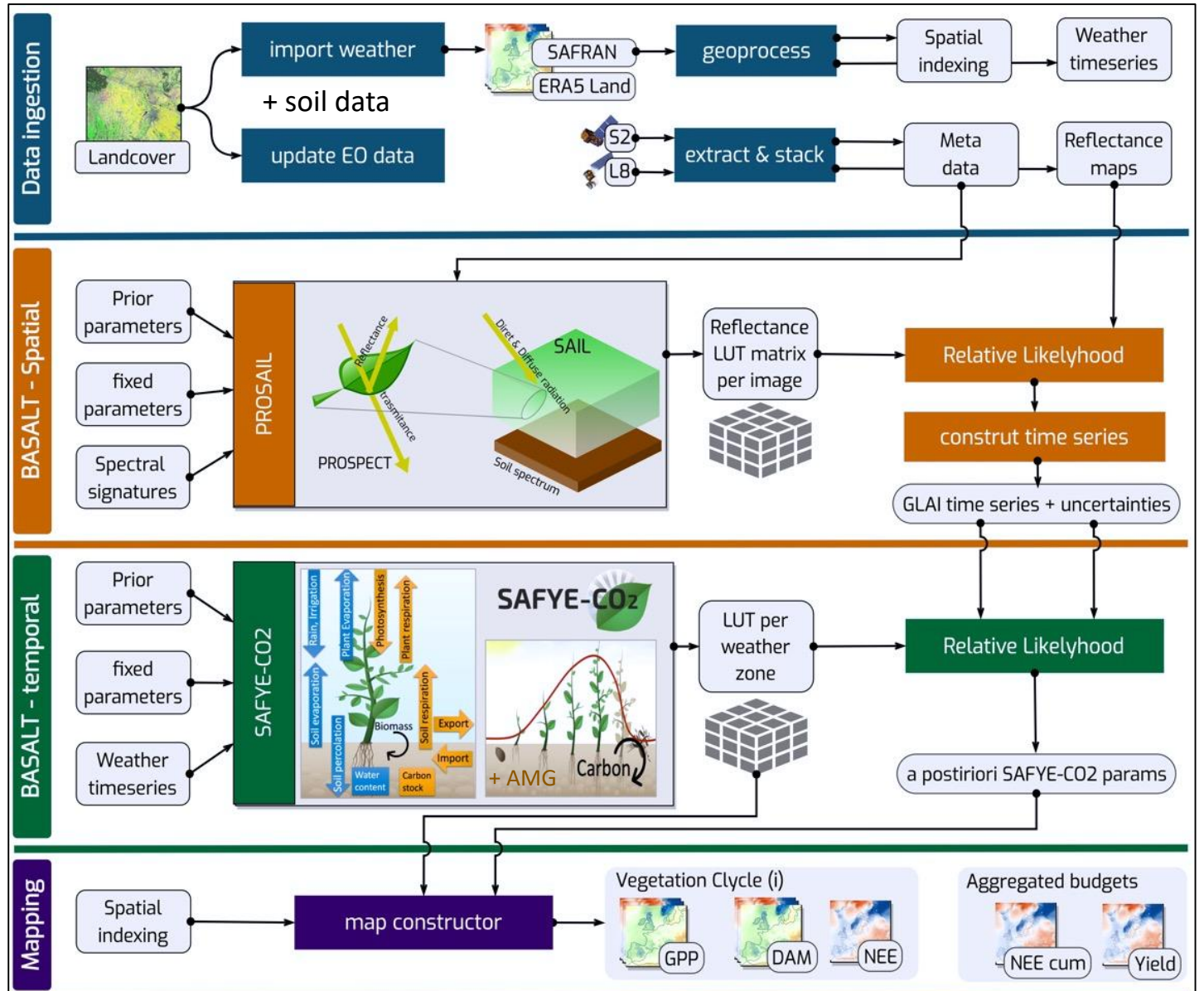
A pre-operational multi-context end-to-end processing chain.

Geoscientific Model Development **Wijmer et al. (2024)**

AgriCarbon-EO: v1.0.1: Large Scale and High Resolution Simulation of Carbon Fluxes by Assimilation of Sentinel-2 and Landsat-8 Reflectances using a Bayesian approach

Taeken Wijmer, Ahmad Al Bitar, Ludovic Arnaud, Rémy Fieuzal, and Eric Ceschia

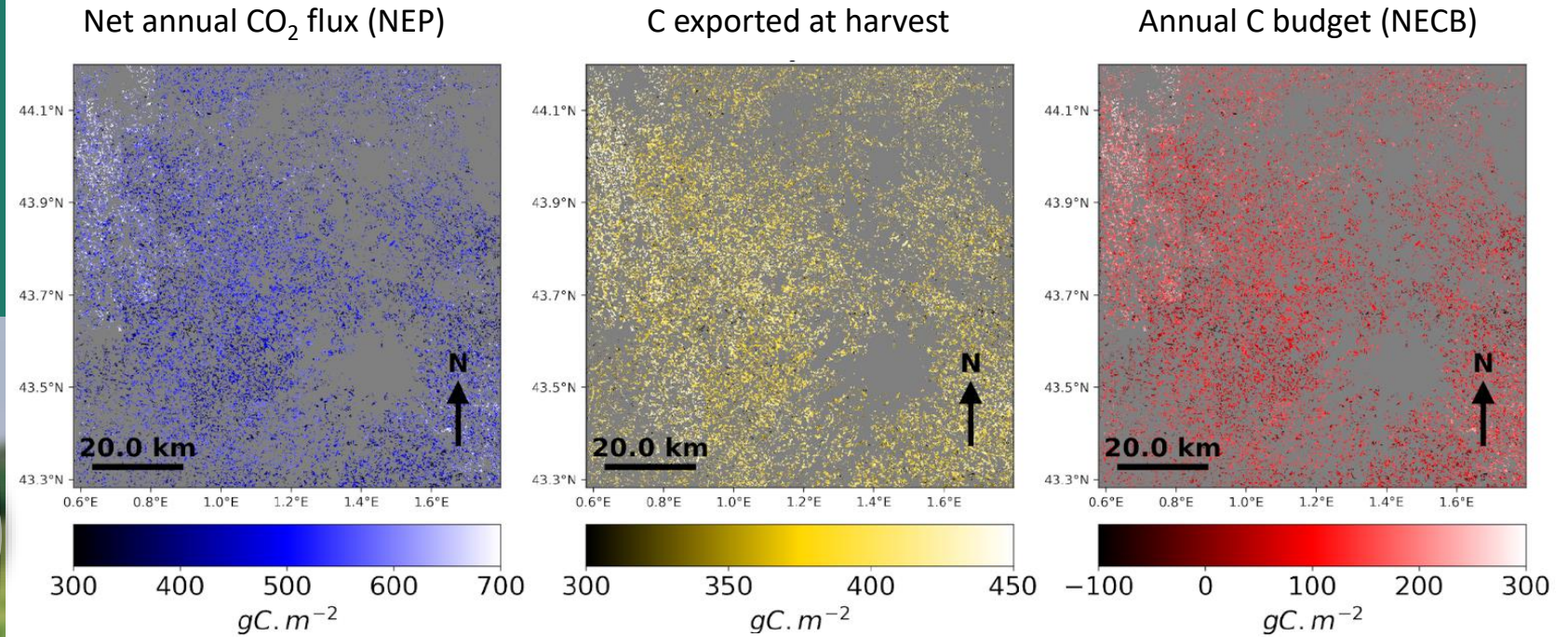
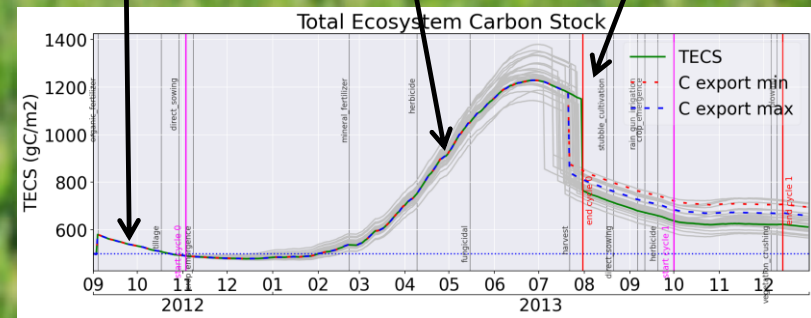
Agri sector:



# Straw cereals near Toulouse in 2019: scenario with straw restitution and no organic amendment

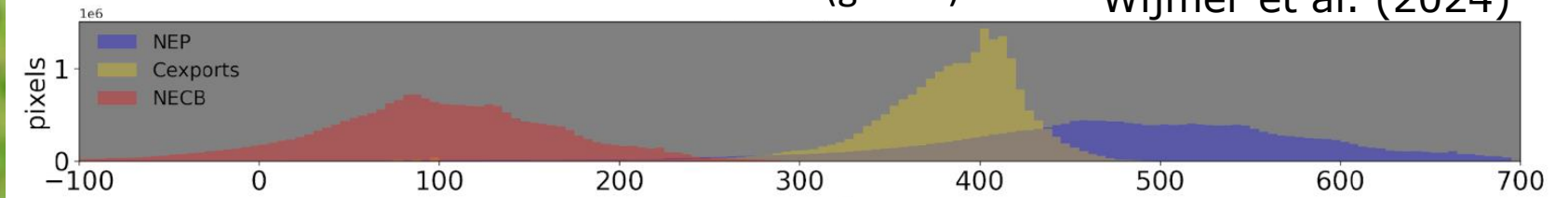
## Annual carbon budget components

$$\Delta\text{SOCstock} = \text{Net CO}_2 \text{ flux} + C_{\text{import}} - C_{\text{export}}$$

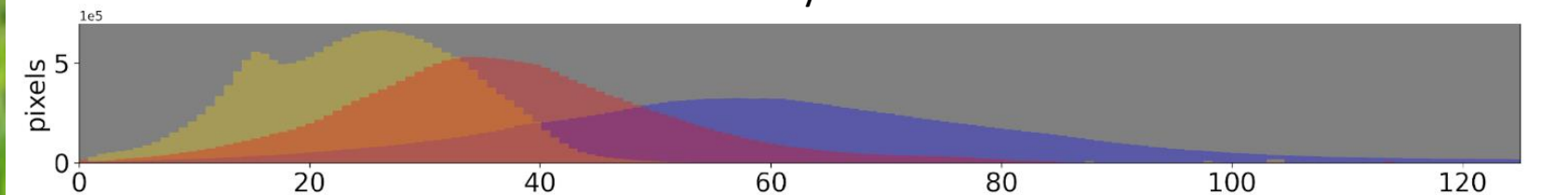


Mean value (gC.m<sup>-2</sup>)

Wijmer et al. (2024)

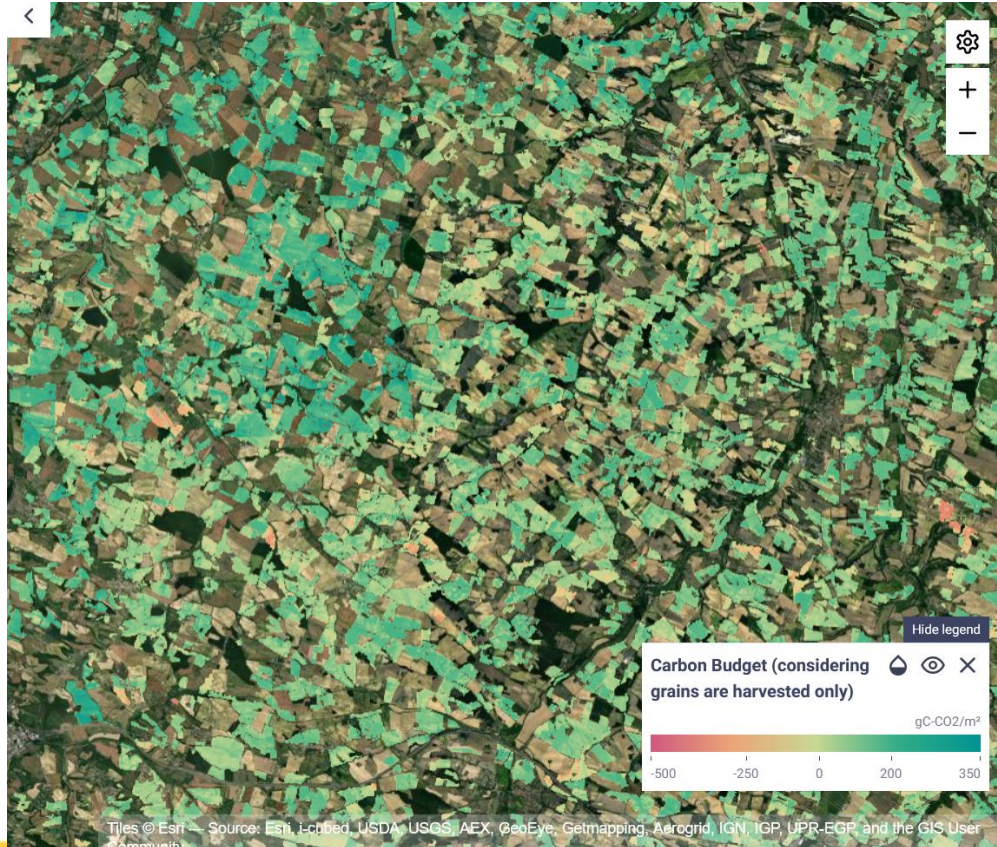


Uncertainty estimates

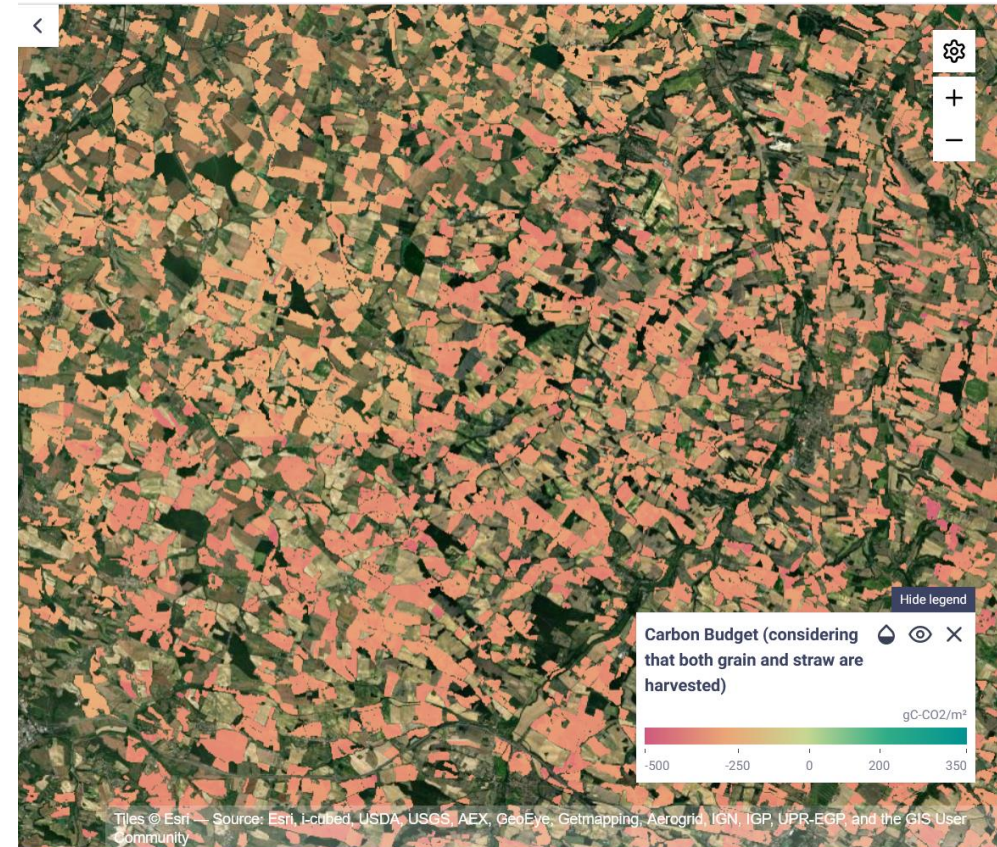


# Effect of straw management on the annual SOC stock changes for straw cereals

**Scenario 1: only grains are harvested and no organic amendment applied**



**Scenario 2: grains + straw are harvested and no organic amendment applied**



More results at <https://www.impact4soil.com/>

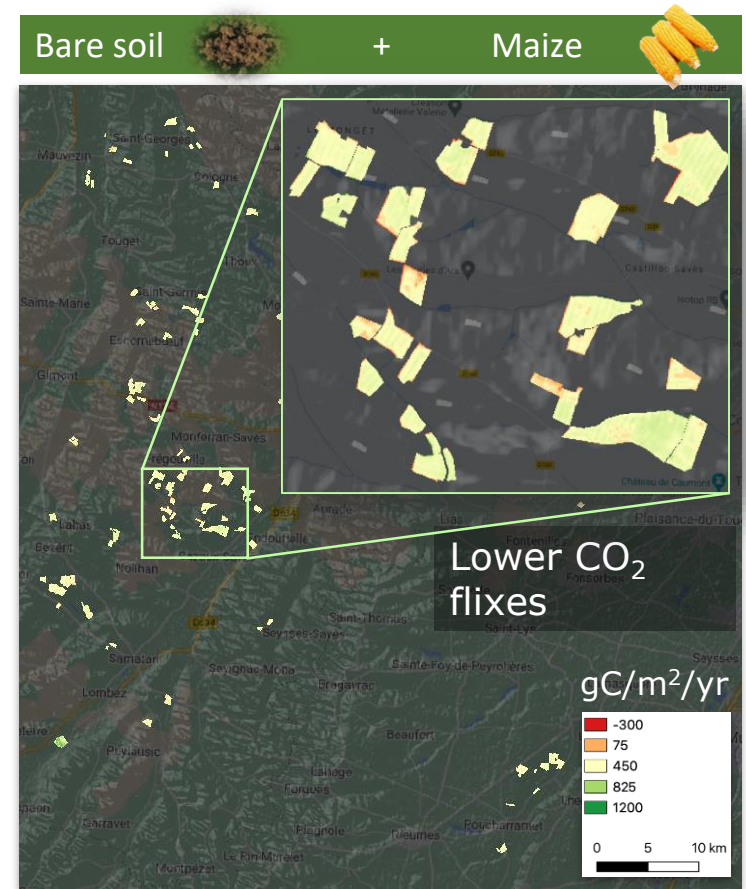
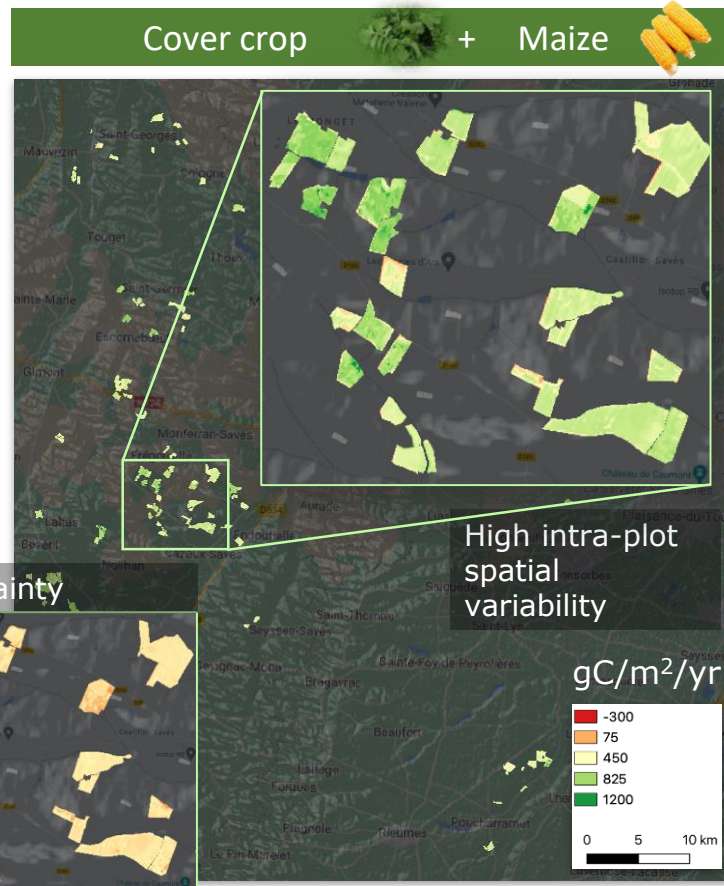
Realisation A. Al Bitar



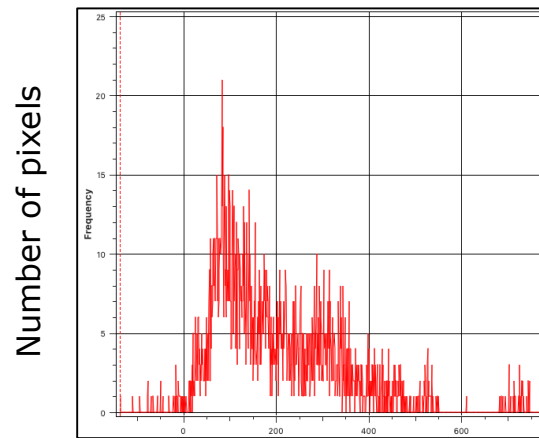
Over the double simulation exercise

## Reality

## Neglecting the cover crop



Distribution of the differences between the 2 simulations



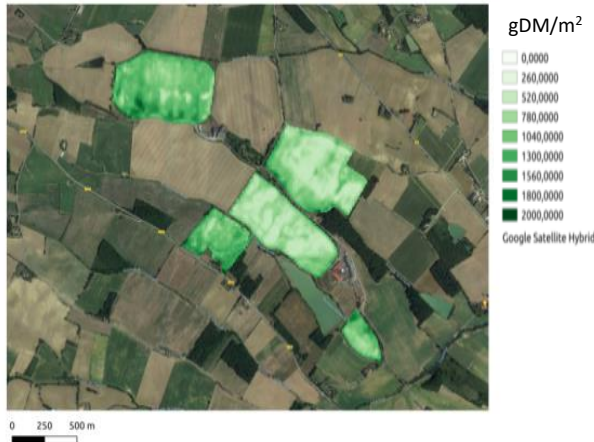
Difference between simulations

On average 200gC of Dry Mass/ha/yr or approx 0,3 t C/ha stored/yr thanks to the cover crops

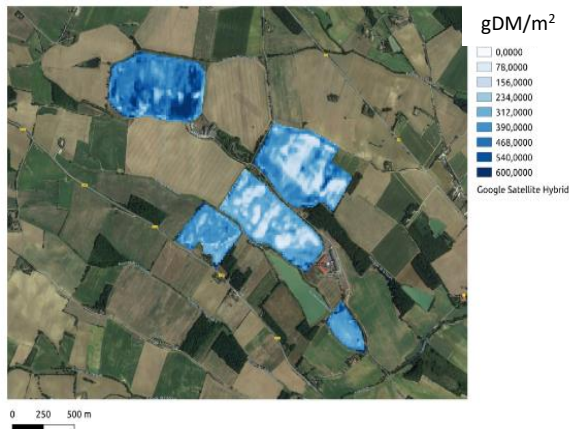
# High resolution C budget maps with ACEO

**Naturellement popcorn project (insetting)** → farmers can receive a premium from the **natais** company depending on the amount of C they store in the soil thanks to cover crops biomass inputs

Crop biomass + Uncertainties



Cover crop biomass + Uncertainties



Realisation  
T. Wijmer



+ farmers data and the AMG soil model



10m resolution maps make it possible:

- to define an optimal soil sampling plan (high precision/low cost) for validation of delta SOC stocks at plot/farm level
- to detect faster SOC stock changes by sampling areas with contrasted dynamics

First C budget map at 10m resolution in 2019, for rotation cover crop/corn/wheat (Villeneuve farm, Bézéril, France)



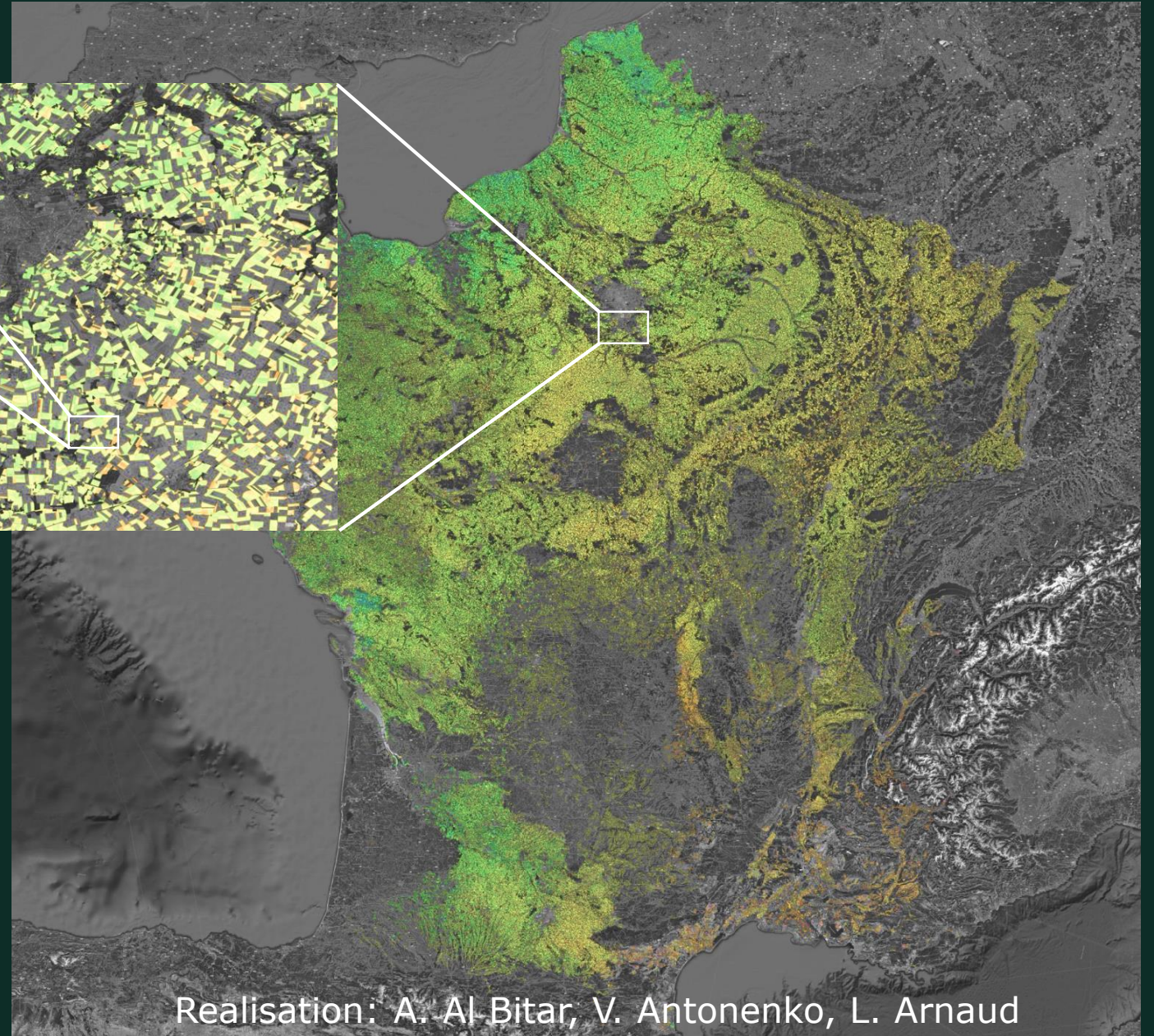
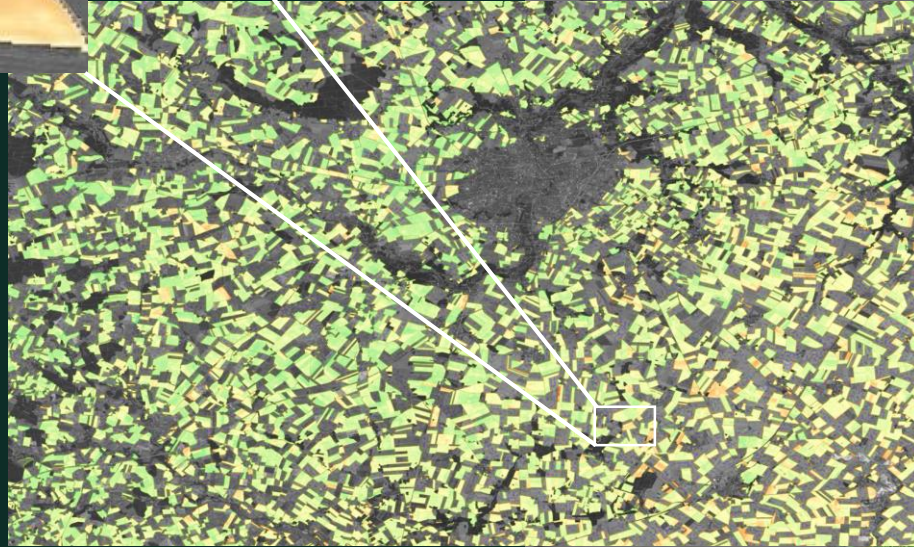
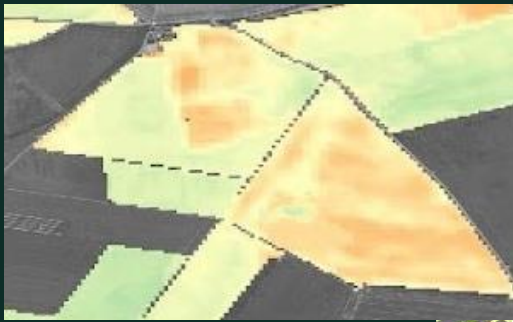
C storage by the soil

C losses by the soil



# Scaling-up

Capturing intra-field to national scale spatial variability



Dry above ground biomass at  
harvest for winter wheat fields  
in 2019

10m resolution  
0.6 billion pixels  
Daily estimates

In less than 1 day on the



supercomputer

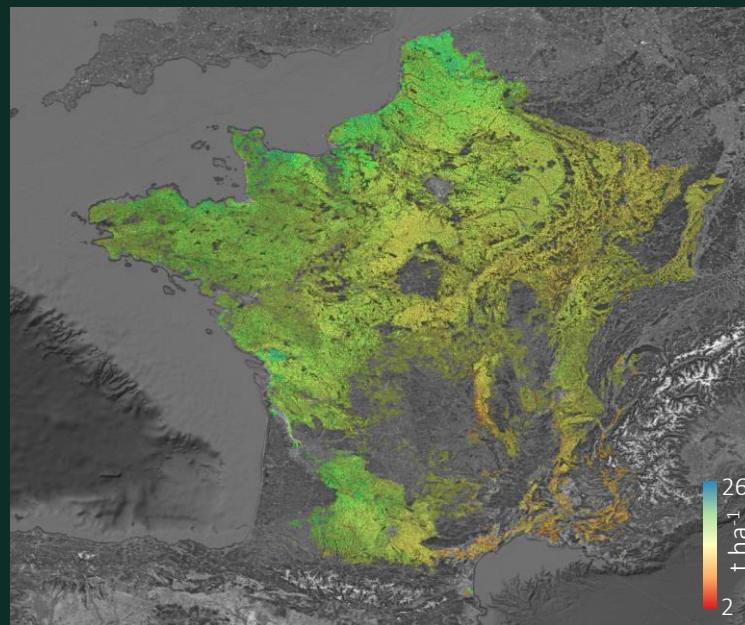
Realisation: A. Al Bitar, V. Antonenko, L. Arnaud



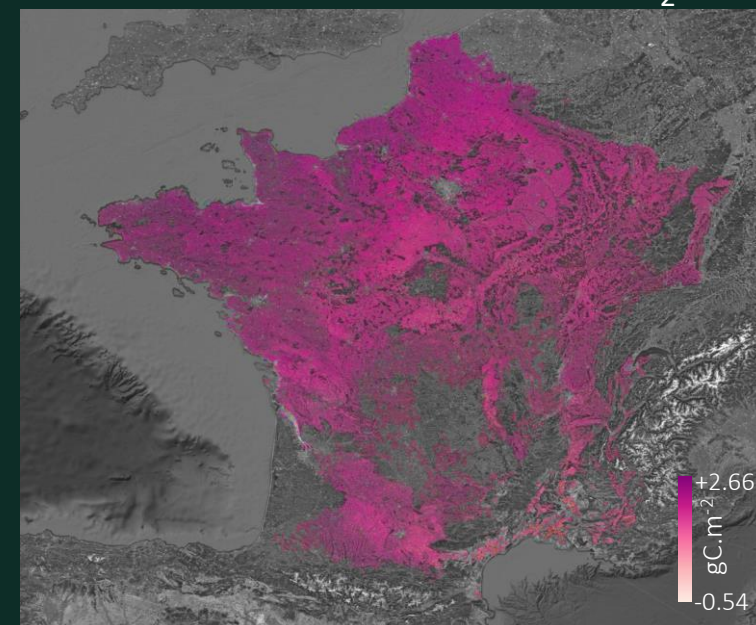
# Coherent-set Of agri-environmental variables



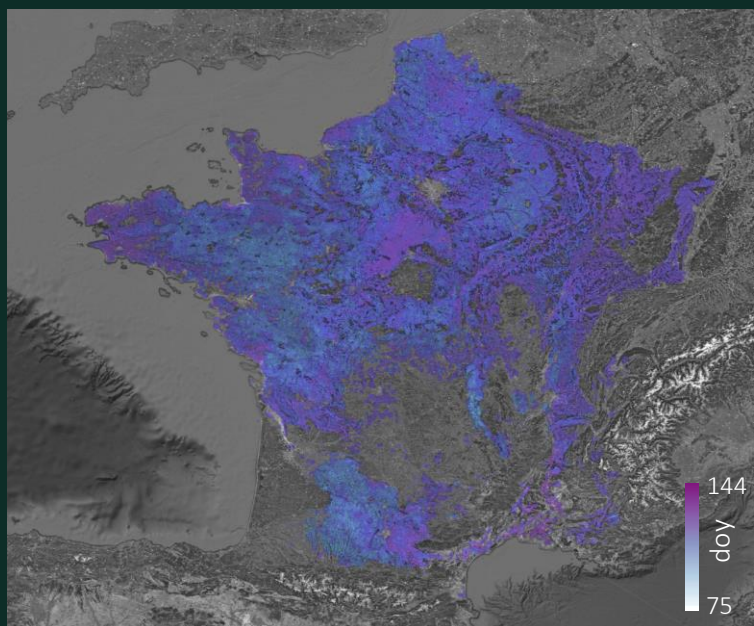
Dry Above ground biomass



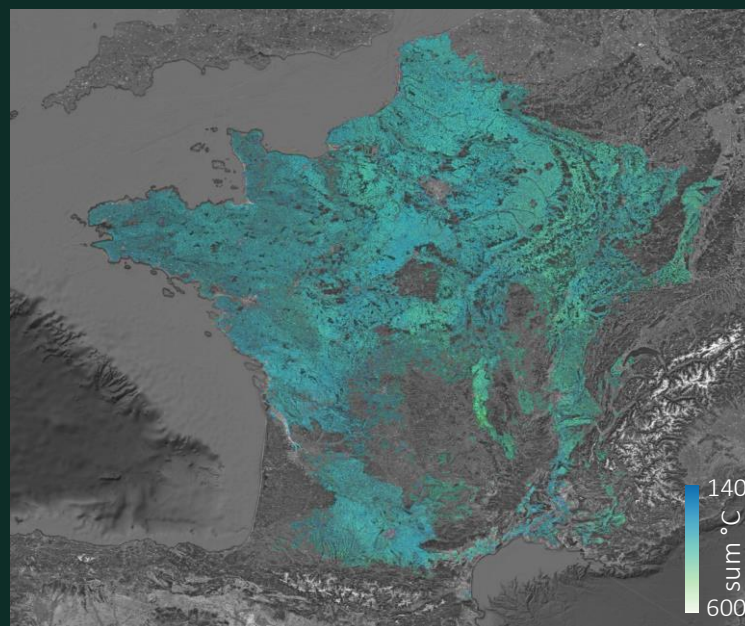
Net annual CO<sub>2</sub> flux



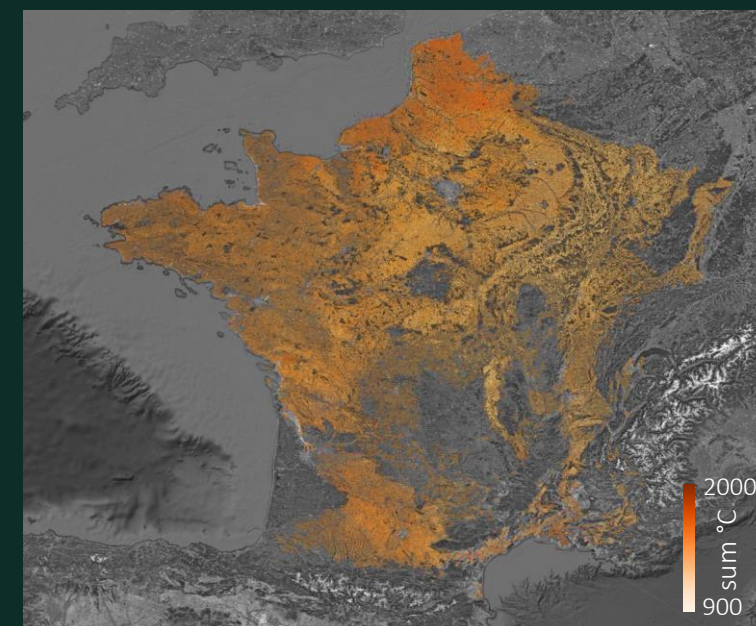
Realisation: A. Al Bitar, V. Antonenko, L. Arnaud



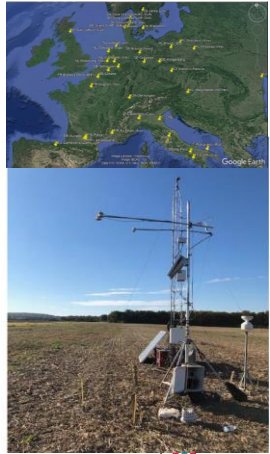
Day of emergence



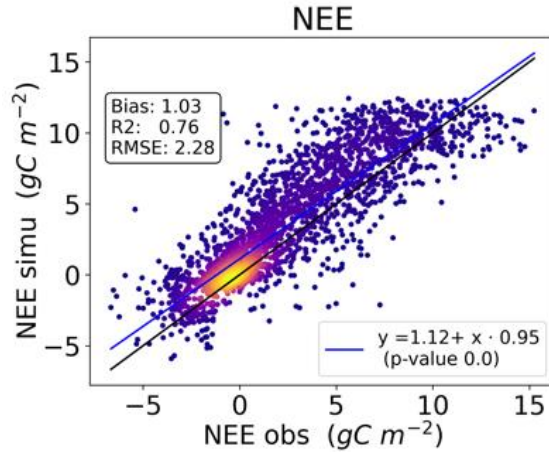
Maturation phase



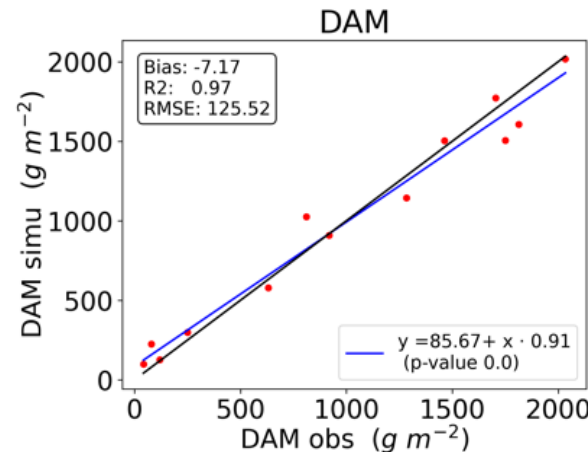
Senescent phase



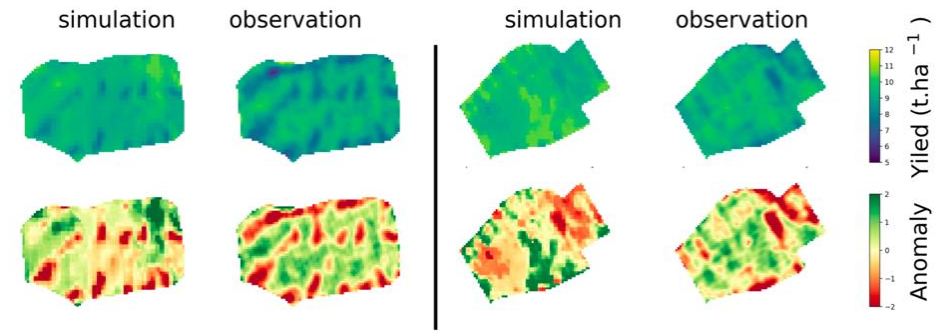
**ICOS**  
Integrated Carbon Observation System



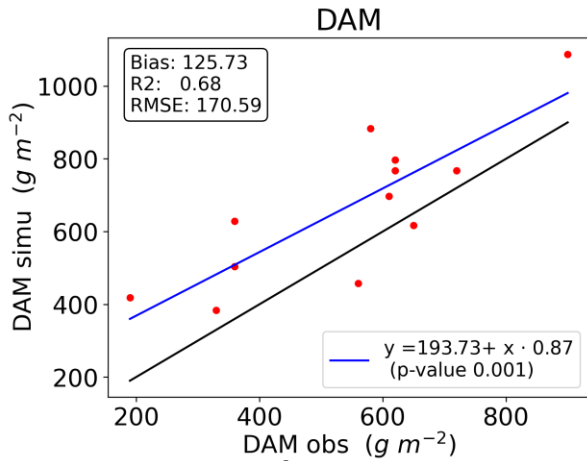
**Net CO<sub>2</sub> flux for wheat in Europe at ICOS sites**



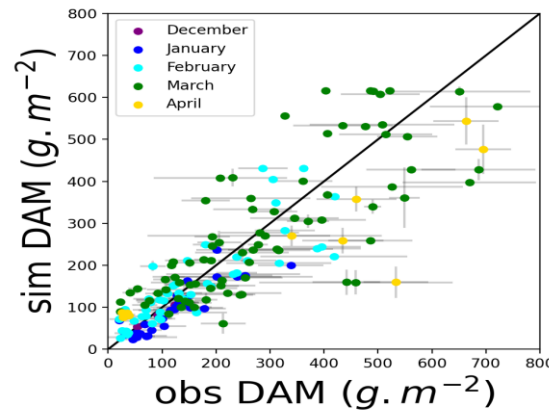
**Biomass for wheat in Europe at ICOS sites**



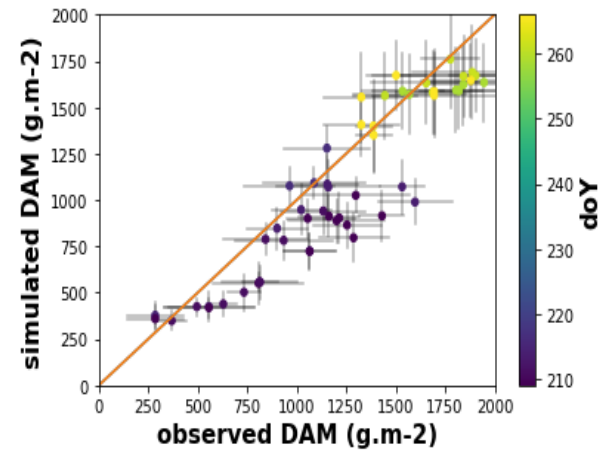
**Winter wheat yield maps**



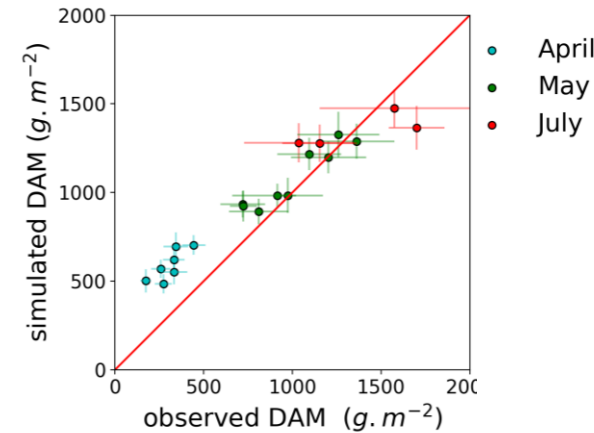
**Mixed cover crops in France**



**Cover crops (Fava bean) in France**



**Biomass for Maize in France**



**Biomass for Wheat in France**

More crops coming and no validation against soil measurements of SOC stock changes yet because data with measures and re-measures since Sentinel 2 data were launched are missing

# Limits and perspectives for ACEO

- Diagnostic approach only although some scenarii can be tested (e.g. straws management, effect of cover crops) and good transposability to other pedoclimatic regions
- Limited to a few crops and cover crops → progressive acquisition of new in-situ datasets for CAL/VAL in Europe (ICOS sites, collab with companies & cooperatives)



ICOS flux tower network

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- So far few soil models/formalisms have been tested in ACEO → test the coupling to new models (e.g. RothC) in different context of applications (PhD A. Ihasusta)
- Use of optical remote sensing data only can be limiting for operational applications (long cloudy periods) → combining optical satellite data with radar satellite data (Sentinel-1) will allow to overcome this issue (PhD A. Géraud in collab with Netcarbon)
- Access to reliable management data on straw management and organic amendments is currently a strong limitation → use of API to access FMIS is not enough, management data must be verified first (agricultural advisor)
- Quality, accessibility and spatial resolution of the soil data/products (e.g. initial SOC stock, texture) → use high resolution remote sensing data for digital soil mapping (collab with E. Vaudour) will partly solve this issue

# Conclusions



- As pointed out by CIRCASA/ORCaSa → need to develop a consistent framework for MRV of SOC stock changes and methods to assess the components of the C budget (+ uncertainties) accounting for the spatial variability of biomass production/restitution and of soil properties.

Based on this observation:

- We proposed and harmonised MRV framework for SOC stock changes assessment,
- Development of an innovative hybrid Monitoring approach enabling dynamic and objective monitoring of the impact of biomass restitution to the soil on the SOC stock changes → AgriCarbon-EO,
- Automated, large scale, high resolution, allowing uncertainty analysis at low cost **but the lack of access to 1) reliable farm management data and 2) better spatialized soil properties products limits the systematic implementation of ACEO for the main crops,**
- Adapted to different contexts of MRV (insetting, offsetting, CAP, NDCs) with the ambition of becoming a key component of the MRV service of the Soil Carbon IRC.

# Thanks for your attention!!

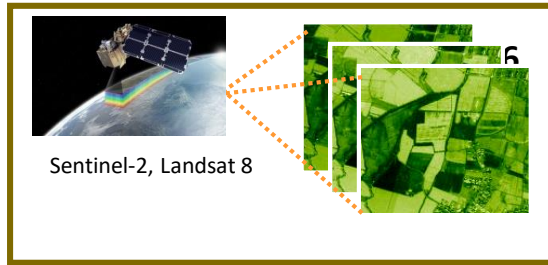


More about our work: <https://www.cesbio.cnrs.fr/agricarboneo/>

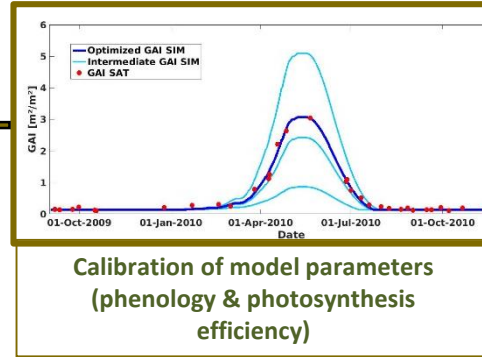
Contact : [eric.ceschia@inrae.fr](mailto:eric.ceschia@inrae.fr) and [ahmad.albitar@gmx.com](mailto:ahmad.albitar@gmx.com)

# The SAFYE-CO2 model

Started 10 years ago



Dynamic mapping of leaf area index



Calibration of model parameters (phenology & photosynthesis efficiency)

**Objective** : To force the crop model (SAFYE-CO2) to reproduce at plot level the dynamics and development intensity of the crop/cover crops as seen by satellite → more precise and objective biomass estimates, implicit consideration of stress (N, water, etc.) and of some practices,

**Accounting for soil processes:** At first, a very simple modelling approach for simulating soil respiration was chosen (empirical function of T°C and SWC) because high uncertainty in soil properties of soil products (GSM, SoilGrids) for upscaling → more recently coupling with the soil C models (e.g. AMG) activated when accurate soil data available

