

The stakes and challenges related to monitoring soil carbon stock changes: a focus on arable land

Eric Ceschia (INRAE/CESBIO)

With contributions from Ahmad Al Bitar, Taeken Wijmer, Ainhoa Ihasusta, Ludovic Arnaud, Rémy Fieuzal, Jean François Dejoux

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Increasing Soil Organic Carbon stocks, a climate and food security issue



Increasing SOC stocks in soils by 0.4% (or 4 per 1000) per year would offset global annual CO₂ emissions but it would also increase soil fertility and crop resilience to climatic extremes \rightarrow but where and how ?



National expertise : Stocker du carbone dans les sols français. Quel potentiel et à quel coût ? (Pellerin et al. 2019) → national statistics on practices (AGRESTE), STICS agronomic model with run over 1km grids, considering only the main crop rotations in a given grid + several scenarii (see Launay et al 2021b).



Examples of cover crops



- Additional C storage potential of 5.78 Mt C/year in the 0-30 cm soil layer (approximately 8.6 Mt C/year if we consider no cover crops at all in the reference scenario)
- It represents an annual increase of:
 - → +5,2 (to +8,3 %) of SOC stocks for the arable lands → 62 % of this effect comes from the cover crops
 - ➤ +0,9 % for the grasslands

Reality is more complex

Level of adoption of Carbon farming practices ? Where ? → No information at plot/farm scale



How to assess the impacts of those practices in terms of CO₂ emissions/soil organic carbon (SOC) stock changes 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,
- Carbon offset programs (Voluntary Carbon market) mainly on forest up to now but growing fast for cropland (e.g. LABEL BAS CARBONE), and recently insetting programs are developing too,



Common Agricultural Policy? → operational methods are still missing

Each context of application has its specificities, requirements & rules

Some of the methods/protocols used for the VCM



• Measure & re-measure of soil SOC content/bulk density -> VCM, NDCs





Large scale implementation for the VCM would require a large number of samples for measure and re-measure \rightarrow very expensive, high uncertainty, risk of unrepresentative sampling (can be reduced by mapping soil properties \rightarrow stratified sampling), depth issue... \rightarrow new methods (NIRS, gamma ray) may solve some of those issues



Measure & re-measure of soil SOC content/bulk density → VCM, NDCs



Statistical models spatialising in situ soil data using related patterns (e.g. Szatmári et al. 2021) and digital soil mapping (e.g. Heuvelink et al., 2020) → NDCs, global products



SoilGrids 2.0

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- TIER 1 & 2: estimated standard values for Specific Land Management measures (activity X leads to increase/decrease in SOC) → only for NDCs,

1.5 3 6 9 12



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Monitoring of SOC is an ecosystem issue !!! → C budget approach

Yet the methodology to be implemented will depend on the context, availability/accuracy of data, cost/accuracy issues

The challenges of monitoring SOC stock changes

Need for scalable, multi-context (NDC, CAP, VCM, insetting), automatized, cheep, reliable, transparent method



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

The challenges of monitoring SOC stock changes

Need for scalable, multi-context (NDC, CAP, VCM, insetting), automatized, cheep, reliable, transparent method

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 (flux towers)...
- High resolution, relying on remote sensing (e.g. Sentinel 2) to quantify biomass production & restitution to the soil,

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An compliant with the EU Carbon Removals and Carbon Farming Regulation in terms of baselines, assessment at plot scale, practices accounted for, uncertainty assessment... → QU.A.L.ITY criteria

MRV frameworks for cropland SOC stock changes



Prototypes of Scalable Quantification plateforms







Modular and harmonized MRV framework for cropland SOC stock changes: focusing on the Monitoring component



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Soil centered approaches for SOC monitoring



LABEL BAS

AMG soil model (Clivot et al 2019)

Soil centered approaches for SOC monitoring



Spatial variability in above ground biomass, yield and C inputs

CROPS

Intra and inter plot spatial variability in straw cereal ABG biomass in France (2019)





Daily estimates



Wijmer et al (2024)

Spatial variability in wheat yield in France (2019)





Both are wheat !!!!



Harvest index (Yield/aboveground biomass) varies from 0.3 to 0.6 for wheat (Dai et al 2016 : https://doi.org/10.1016/j.bio mbioe.2015.12.023)

not an accurate approach to estimate ABG biomass and crop C input to the soil based on farmer's yield data !!!

Spatial variability in aboveground biomass, yield and C inputs

CROPS

Intra and inter plot spatial variability in straw cereal ABG biomass in France (2019)



COVER CROPS

Variability in fava bean cover crop biomass at the Nataïs producer network in 2019



Field workers were asked to collect $2m^2$ of biomass samples that they considered to be representative of the plot (source: Agrod'OC)

- Strong inter & intra plot spatial variability of biomass inputs to the soil not currently accounted for by most MRV approaches
- EO based approach are needed to better account for those effects !!!

Spatial variability in wheat yield in France (2019)





Soil centered approaches for SOC monitoring



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Most crops & carbon farming practices

You can do MRV with only a soil model



Cropping systems of the farm (not plot level)



Cost varies if initial soil sampling done or not (not mandatory) and if automatised access to activity data through FMIS



Uncertainty assessment

(simple approach...)

Scalability



••

Accuracy (because of the spatial variability in biomass and soil properties data used as input for the soil model)



No verification with measure-remeasure

Modular and harmonized MRV framework for cropland SOC stock changes: focusing on the Monitoring component



Ecosystem modelling approach for SOC monitoring



A lot of parameters and input data needed (activity data...), issue concerning spatial variability of soil properties, no accounting for damages caused by pest/ deseases...lack of representation of biomass spatial variabity and of soil processes → consequences for verification (where to sample? How many? Cost !!!)

Ecosystem modelling approaches for SOC monitoring





Good expertise in agronomical modelling needed



Most crops & carbon farming practices



Cost varies if initial soil sampling needed and access to activity data through FMIS



Uncertainty assessment



Scalability (many parameters and activity data...)



Lack of objective assessment of crop development (no accounting for pest, cropping accident



Accuracy depends on access or not to local soil data and to accuracy of activity data



Verification requires many samples

Modular and harmonized MRV framework for cropland SOC stock changes: focusing on the Monitoring component



Ecosystem modelling approach with EO assimilation for SOC monitoring



- Good expertise in agronomical modelling needed
- Most crops & carbon farming practices
- •
- Cost varies if initial soil sampling needed and access to activity data through FMIS



Uncertainty assessment

Scalability (many parameters, activity data...)



Better assessment of crop development

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Accuracy depends on access or not to 1) local soil data, 2) accuracy of activity data and 3) access to operational EO observations

Limits of current methods for monitoring soil carbon

Models

ML-Bayesian Assimilation SALT CIRCASA CO Earth Observation Parsition Parsition **ClieN**Farm https://www.cesbio.cnrs.fr/agricarboneo/agricarbon-eo/ AI **AgriCarbon-EO** A hybrid method combining **ORCaSa** parcimonious process based ecosystem model, remote sensing data assimilation and Machin Learning + In-situ data for MARVIC cal/val Strong focus on assessing the effect of biomass input to the soil on SOC stock 🕼 💽 🖉 changes

Biomass

The AgriCarbon-EO processing chain

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

Geos<mark>cientific</mark> 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





The SAFYE-CO2 model



Started 10 years ago

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.

Automatic detection of cover crops, spontaneous regrowth /weeds and their impact on CO_2 fluxes/SOC \rightarrow only possible with remote sensing



Pique et al (2020c) https://doi.org/10.3390/ecas2020-08141

ctivity data provided by the farmer

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







CESBIO

Coherent-set of agrienvironmental variables -> scalable = applicable for NDC, CAP, VCM, insetting

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





Dry Above ground biomass

Net annual CO₂ flux





Maturation phase

1400

Senescent phase



Effect of cover crops on the net annual CO₂ fluxes



Naturellement popcorn project → 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 (insetting)



Over the double simulation exercice

Realisation A. Al Bitar

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

Neglecting the cover crop





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



Simulation exercices near Toulouse (France) in 2019

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

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



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



Diagnostic approach with realistic/objective assessment of biomass input to the soil but possible to test scenarii



Soil Organic C Stock Changes over 5 years with ACEO V2.0 integrating AMG for the VCM

Villeneuve farm (wheat/maize rotation)

Simulating crop rotations with straw cereal, maize, sunflower & cover crops considering no organic amendment and straw retention



T. Wijmer PhD (2024) using LUCAS maps for soil properties and initialisation frac SOCa=0.4 (Delahaie et al., 2023)



Analyses of \triangle SOC per crop rotations (gC/m2)



T. Wijmer PhD (2024)







Analyses of \triangle SOC per crop rotations (gC/m2)



T. Wijmer PhD (2024)



ACEO offers the possibility to produce plot specific baselines (e.g. for the insetting) and standardised (i.e. regional) baselines for the calculation of ΔSOC stocks in the context of VCM (compliant with CRCF methodology)

High resolution C budget maps with ACEO and verification strategy

Crop biomass + Uncertainties

Realisation T. Wijmer





Cover crop biomass + Uncertainties





10m resolution maps make it possible:

+ farmers data and the

AMG soil model

- to define an optimal cost/accuracy soil sampling scheme for verification 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



Hybrid ecosystem modelling approach dedicated to upscalling



https://www.cesbio.cnrs.fr/agricarboneo/

Access to reliable management data on straw management and organic amendments is currently the strongest limitation with this approach (except in Spain, Netherlands?) → use of API to access FMIS is not enough, management data must be verified first (agricultural advisor)



Not user friendly & good skills in programming



Main crops & some cover crops



Pixel level → best for validation/verification



Cost depends on activity data collection method and soil sampling scheme for initialisation/ verification



Scalability (except long cloudy periods → radar satellite data)



Uncertainty assessment



Accuracy depends on access or not to local soil data, on accuracy of activity data (but less problematic than with classical crop models).



Same tool whatever the context of application + baselines production (generic or specific) → compliant with the CRCF

Decision tree to choose the Monitoring approach best suited

Even if ACEO is a very promising approach it won't be applicable in all contexts (e.g. very small plots, agroforesteries, crop species not simulated...) → need a decision tree to choose the best approach depending on the local context



Final version made available by ORCASA at the end of the year (Ihasusta et al. in prep)

Conclusions

- As pointed out by CIRCASA/ORCaSa → need to develop new monitoring methods and a consistent framework for MRV of SOC stock changes for different context of application (NDC, VCM insetting, CAP),
- Based on this observation and after analysing the pro & cons of current modelling approaches for monitoring SOC stock changes → development of AgriCarbon-EO, an innovative hybrid monitoring approach assimilating remote sensing data in a crop model dedicated to upscaling:
 - enabling dynamic and more objective/realistic monitoring of the impact of biomass restitution to the soil on the SOC stock changes
 - automated, large scale, high resolution, allowing uncertainty analysis at low cost adapted to different contexts of MRV and compliant with common standards like VERRA, Label Bas Carbone and the CRCF

 e.g. able to produce both specific and standardised baselines
 - Yet improvements are needed: to ensure the operationality of ACEO even in cloudy conditions (radar satellite data), simulate more crop/cover crop species, coupling other soil models to SAFYE-CO2 (e.g. for ensemble approaches),
- Also it is not a one fit for all solution and some challenges remain whatever the modelling approach:
 - Reduce uncertainty on soil properties, initial SOC stocks and fraction of stable SOC (e.g. Rock-Eval®)
 - Access to reliable activity data, especially for large scale applications (e.g. CAP)

Thanks for your attention!!



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

Contact : eric.ceschia@inrae.fr and ahmad.albitar@gmx.com

Validation exercises for the C budget components



More crops to come but no validation against ΔSOC stock changes yet because data with measures and re-measures since Sentinel 2 data were launched are not missing

Remote sensing + ML to estimate cover crop biomass spatial variability and C inputs





Green curves are AgriCarbon-EO simulations (see next slides), dots are observations

do Nascimento Bendini et al. (2014)



Example of ESU protocol See T2.3 !!!



Good performance with ML but:

- little year to year transposability → requires multi-year training dataset
- Good estimates at the date of acquisition but what happens if 2-3 weeks of clouds ? (cover crop biomass can double every week in spring !!!) → need to combine this approach with crop modelling to interpolate/extrapolate biomass estimates

What is the C budget of an agricultural plot? And how to quantify it?

• The C budget represents a carbon gain or loss of a soil, mainly in the form of organic matter, between two dates (crop year, rotation, etc.)



Measure - remeasure of soil organic C stocks



D'après EDF.ORG/SOILCARBON

Requires a large number of samples between 2 dates → very expensive, high uncertainty, risk of unrepresentative sampling (can be reduced by mapping soil properties → stratified sampling)



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C budget approach = accounting for inputs & outputs of C More dynamic approach but quantification of all fluxes (vertical/lateral) of C between the parcel and its environment (by measurements or via modelling) → see Smith et al 2010

A carbon budget approach to estimate SOC stocks changes



Soils, a large carbon reservoir but with great disparities



in Giga tonne

- Carbon is present in soils in large quantities as more or less decomposed organic matter (e.g. leaf and root debris, humus, organo-mineral associations)
- But strong spatial variability of stocks partly related to human activities

Spatial variability of soil organic carbon (SOC) stocks on the 0-30 cm layer in the world



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Spatial variability of soil organic carbon (SOC) stocks on the 0-30 cm layer in Europe



Soil C content Peatland >>> grassland > forest >> cropland

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Effect of land use changes on SOC stocks (Deng et al. 2016)

10 20





Inventory approach

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Exemples of cover crops