

# Earth Engine or How we stopped worrying and start learning to love remote sensing



Earth Engine  
stopped working  
learning to



**Sven Verweij**  
Project Manager / Soil  
Data Scientist  
bij NMI Agro

**LOCALYSE.**  
PUT YOUR LOCATION DATA TO WORK

Now we  
and start  
note sensing

# Who are NMI?

## Applying agronomic research since 1934

- Located in Wageningen (NL)
- Independent group of researchers
- Well known experts in the field of soils and agriculture
- Providing knowledge as a service for farmers, advisors, policy makers, product managers and business analysts



Provincie Noord-Brabant



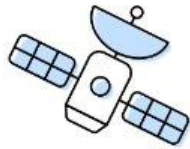
Rabobank



# nmi & GEE

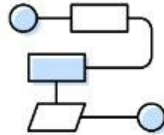
## Meet Earth Engine

Google Earth Engine combines a multi-petabyte catalog of satellite imagery and geospatial datasets with planetary-scale analysis capabilities. Scientists, researchers, and developers use Earth Engine to detect changes, map trends, and quantify differences on the Earth's surface. Earth Engine is now available for commercial use, and remains free for academic and research use.



Satellite Imagery

+



Your Algorithms

+



Real World Applications

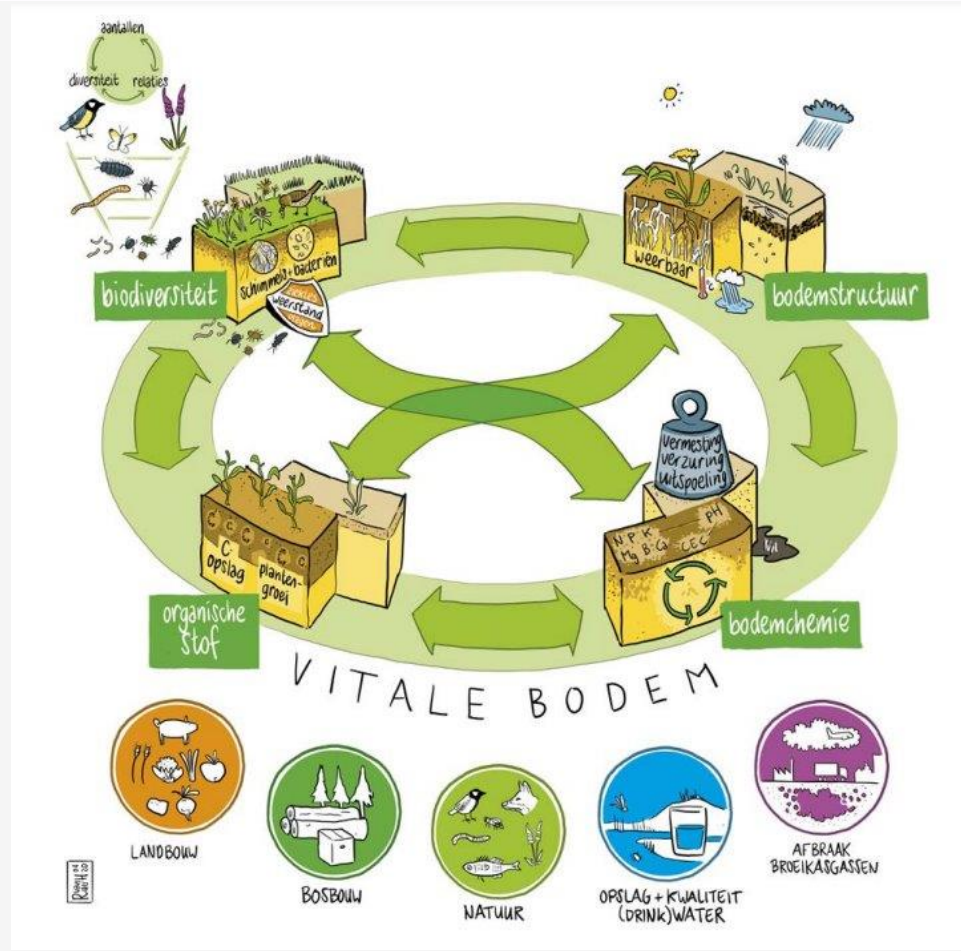


Sustainable  
Agriculture with  
healthy soils

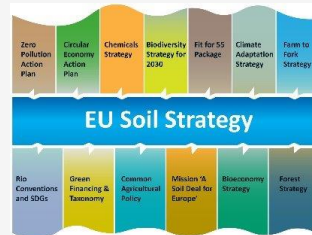
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# What is a healthy soil?

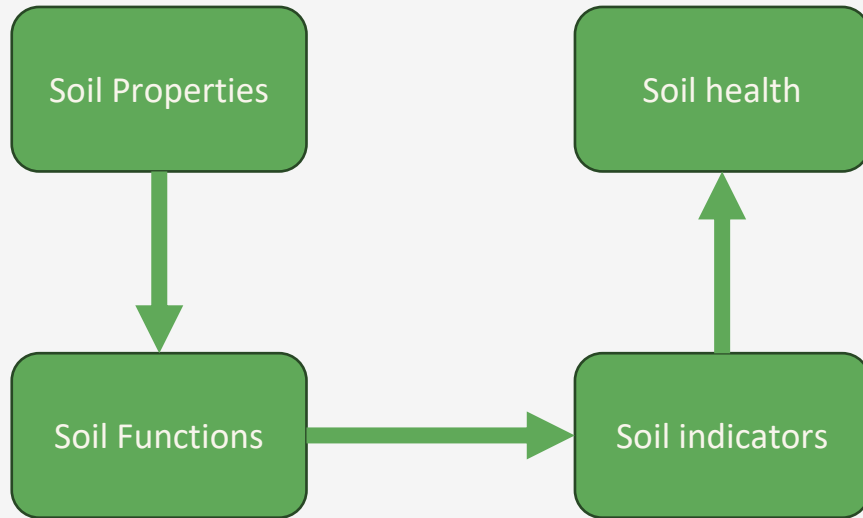
A healthy soil can provide various ecosystem services for which it is used and is resilient to external forces.



# Soil for Life



# How to assess soil health



# Soil properties

How to obtain the input data for soil health assessment?



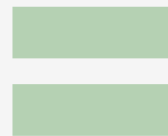
# Challenges with soil data



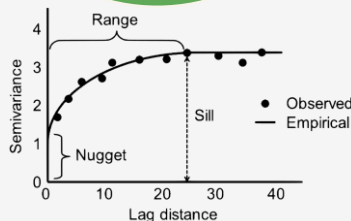
Sampling  
+ Analysis  
is  
expensive



Soils are  
heterogeneous  
in space (and  
sometimes in time  
too)





Lack of  
detailed  
soil data



# Leveraging remote sensing

- BodemSchat6
- Mapping 24 soil parameters for every agricultural field in NL
- Collected over 150 covariates per field
- Training based on NABA

- Next version:

 **Geoderma**  
Volume 443, March 2024, 116838 

**High-resolution digital soil mapping of amorphous iron- and aluminium-(hydr)oxides to guide sustainable phosphorus and carbon management**

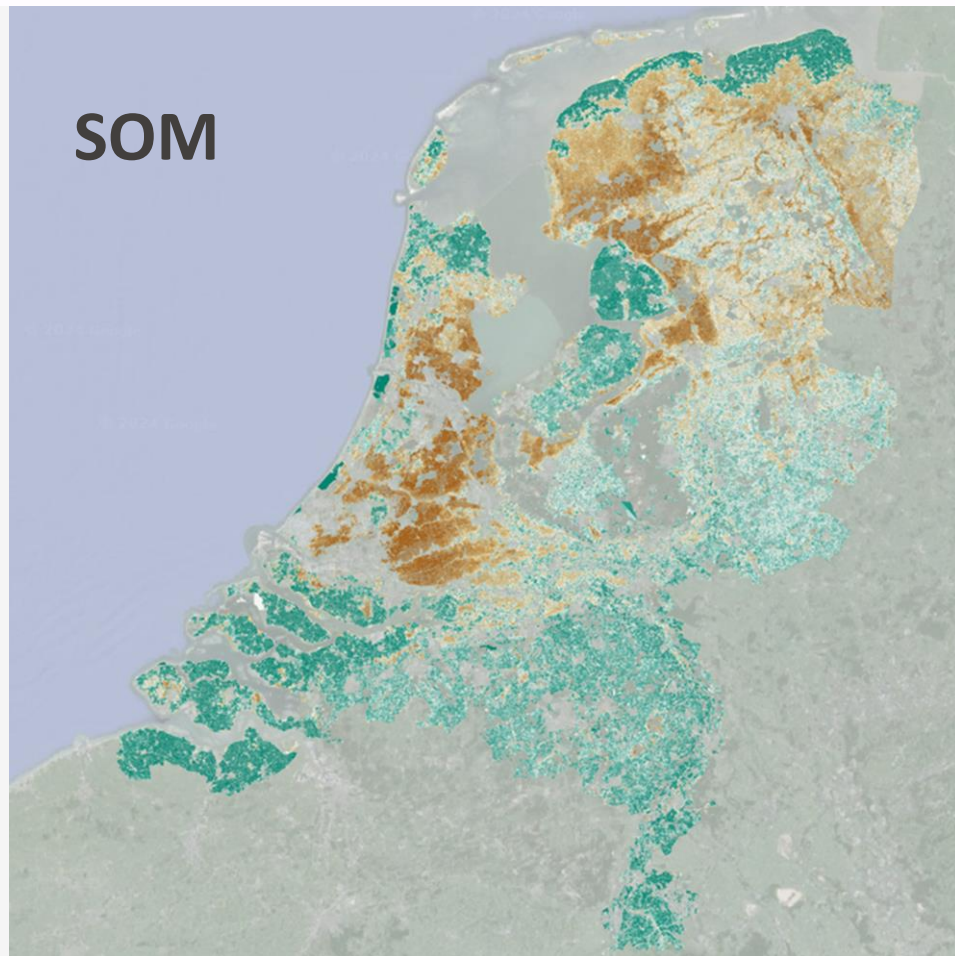
[Maarten van Doorn](#)<sup>a,b,1</sup>, [Anatal Helfenstein](#)<sup>c,d,2</sup>, [Gerard H. Ruij](#)<sup>a,b,3</sup>, [Gerard B.M. Heuvelink](#)<sup>c,e,4</sup>, [Dabjiv A.M.D. van Rottterdam-Los](#)<sup>e,5</sup>, [Sven E. Verweij](#)<sup>a,6</sup>, [Wim de Vries](#)<sup>b,7</sup>

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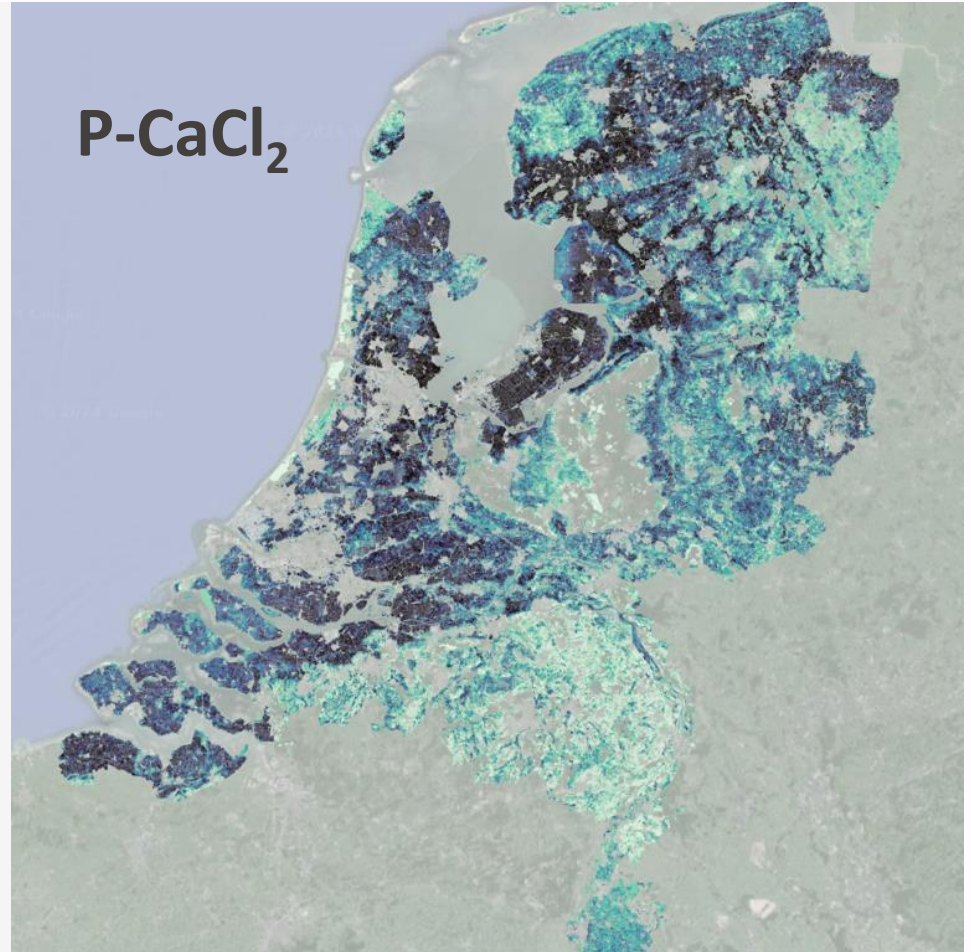
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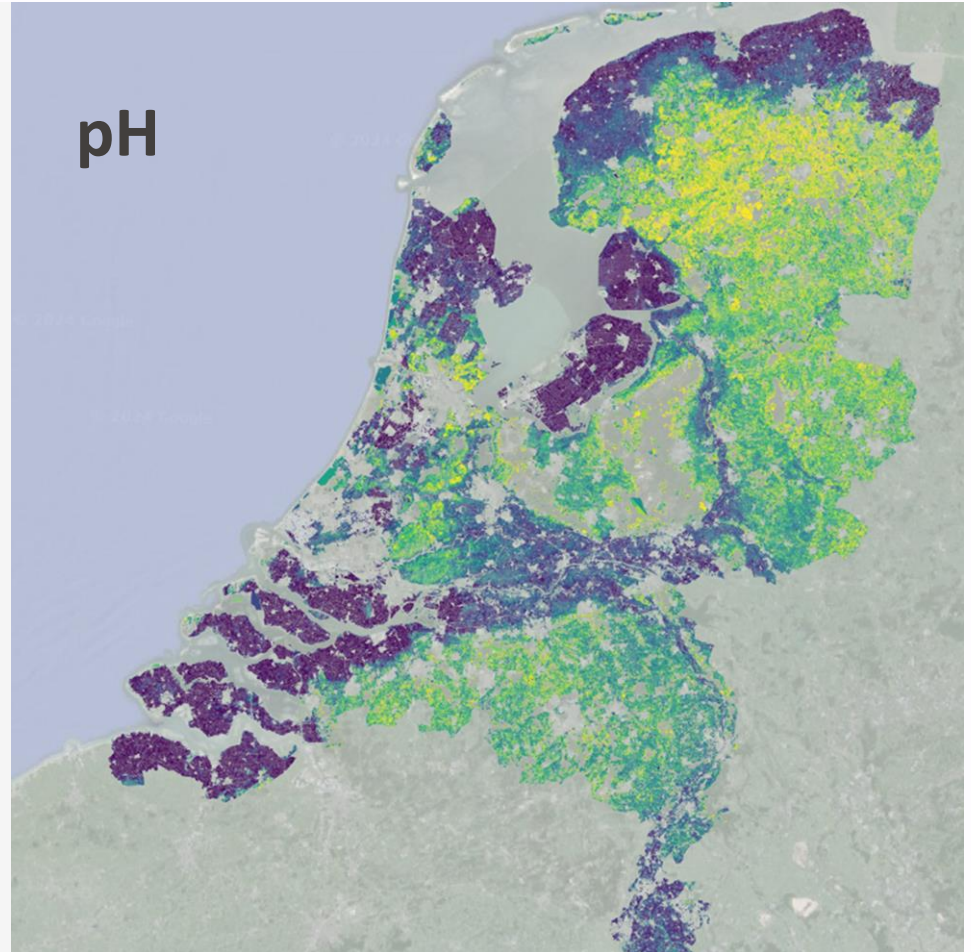
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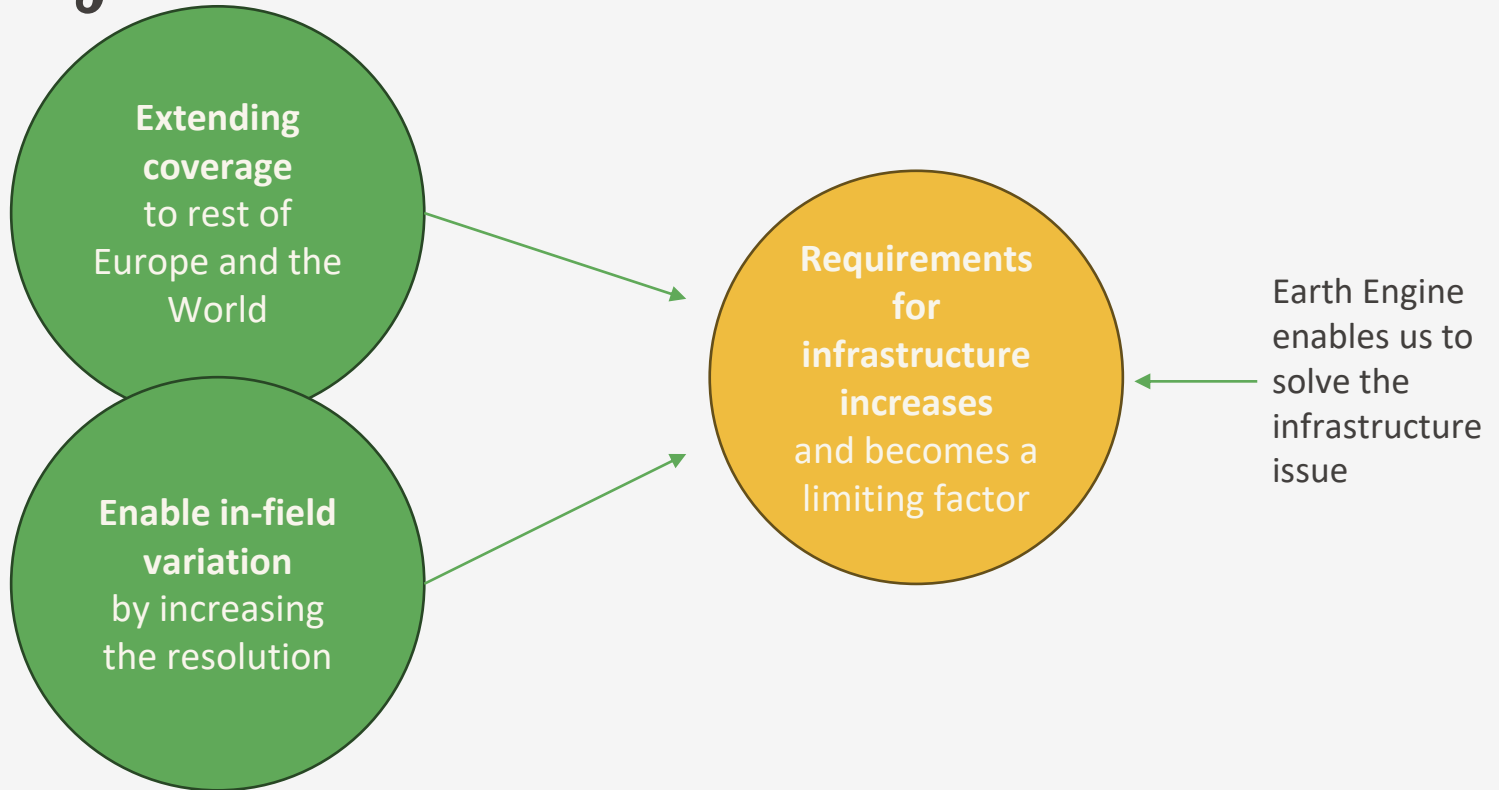
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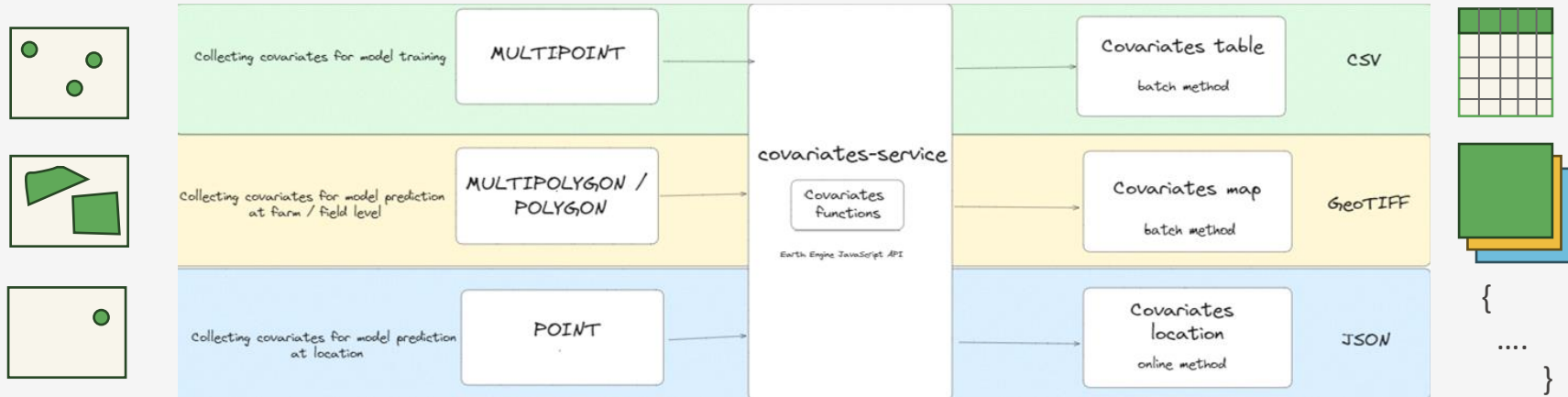


# Challenges with upscaling

# Challenges



# How we use Google Earth Engine



# Example: Carbon

How do we accurately and cost-effective monitor carbon stock at farm level?



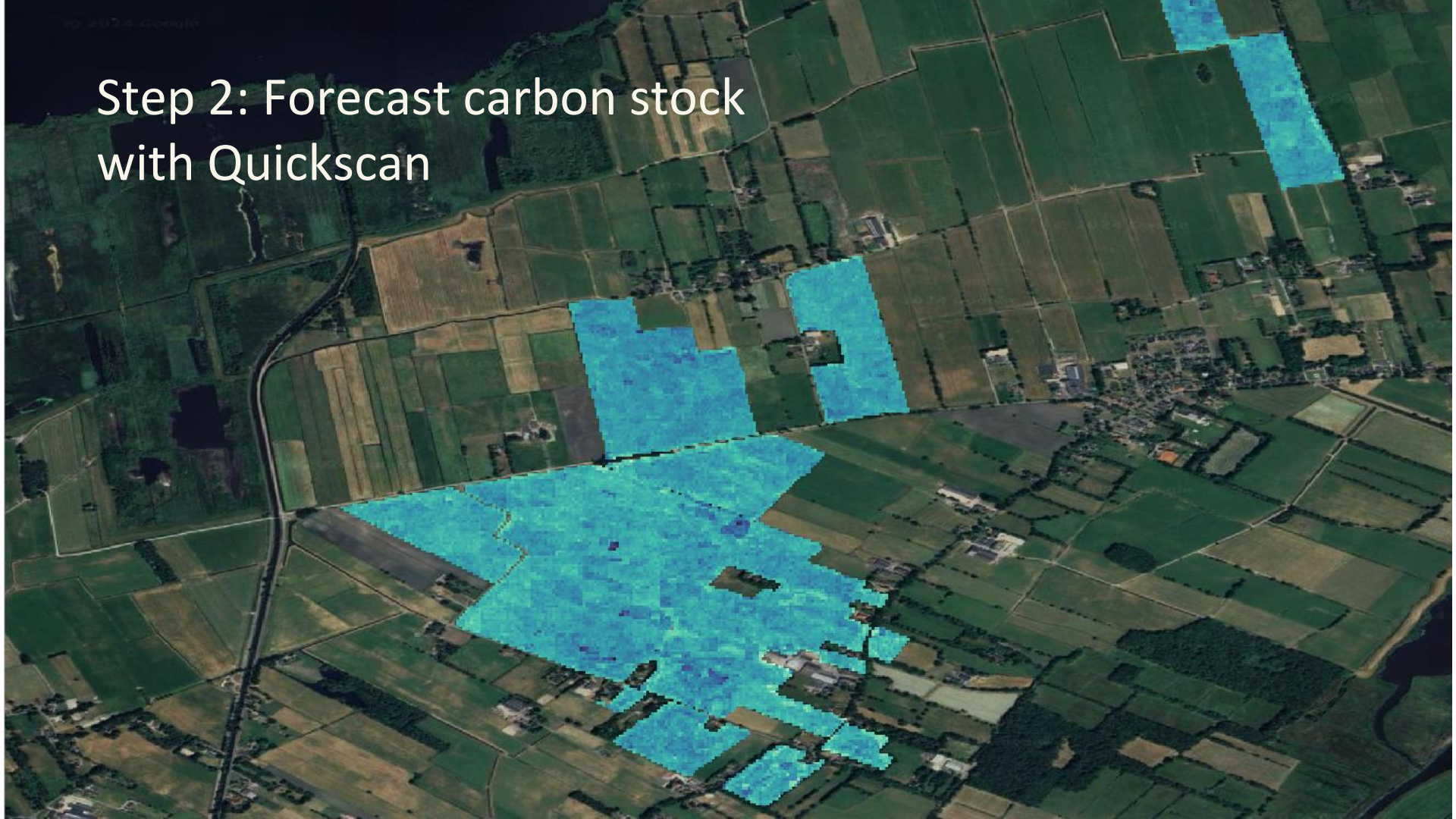
# Why do we want to know carbon content of soil?

- Carbon is related to various soil processes:
  - Soil fertility
  - Water retention
  - Workability
  - Disease preventions
- Soils are major sinks of carbon
  - Relevant for Corporate Sustainability Reporting Directive (CSDR) and for Science Based Targets initiative (SBTI)
  - Insetting & Offsetting

Step 1: Select fields



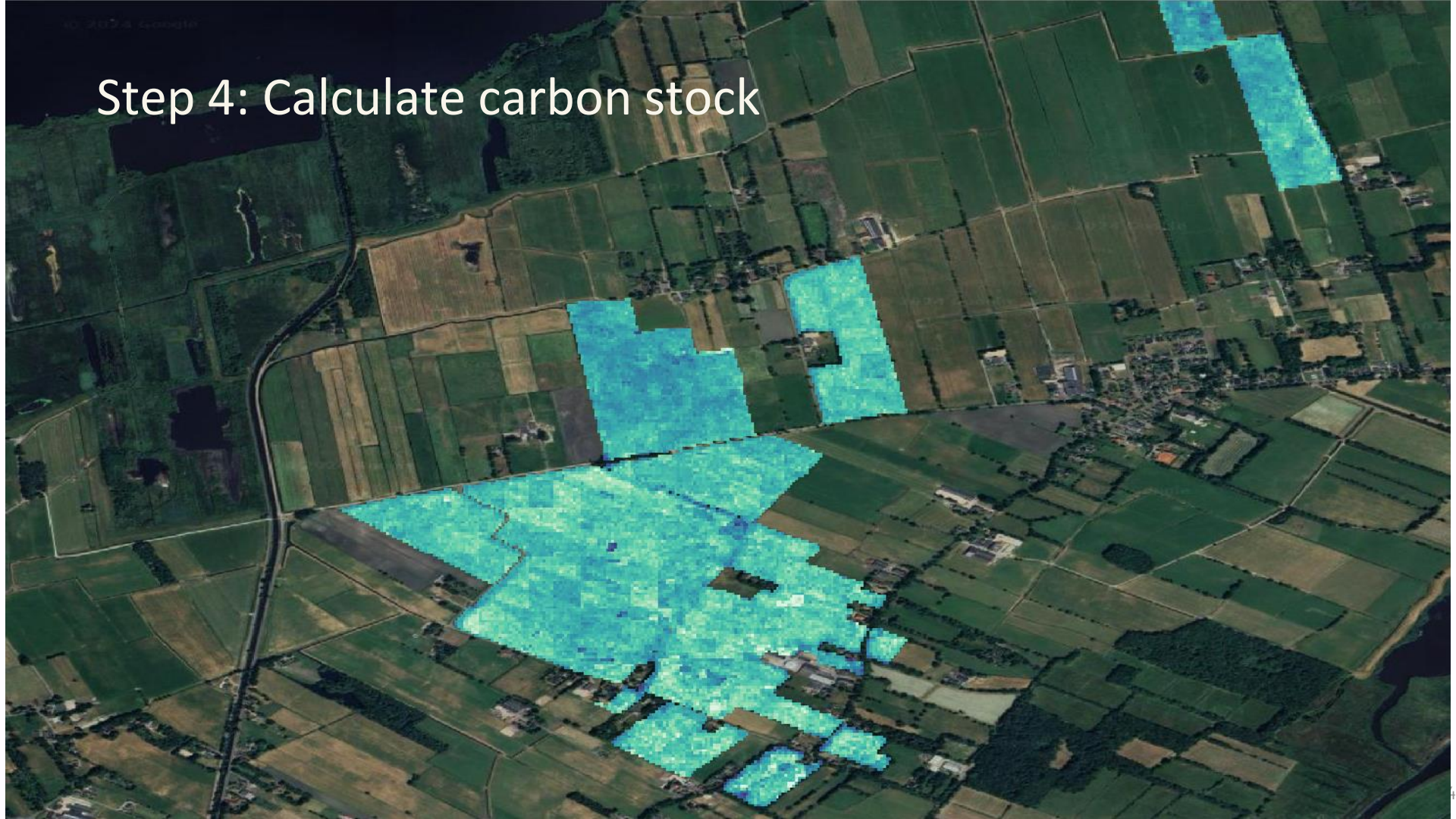
## Step 2: Forecast carbon stock with Quicksan



### Step 3: Create sampling design



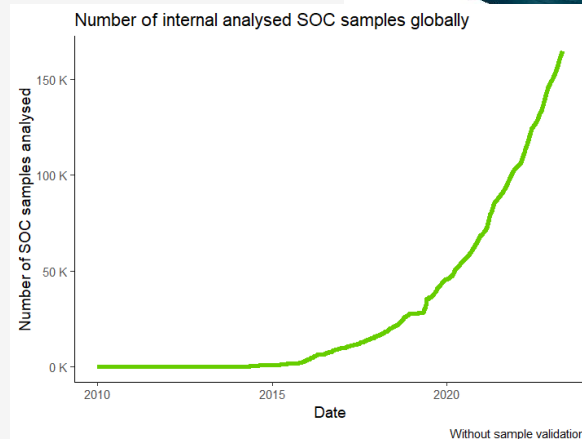
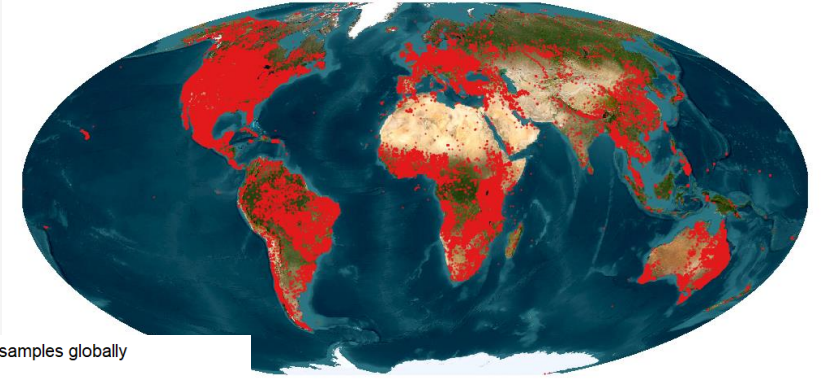
# Step 4: Calculate carbon stock



# Step 1: Initial carbon stock assessment

## Predict SOC stocks with global model

- Model based >250,000 sites from open datasets and 123,668 in-house validated analyses
- Covariates o.a. Sentinel I, II MERIT and WorldCover (no SoilGrids)
- Global predictions at 10m resolution
- Model for SOC and bulk density
- Trained with XGBoost using Bayesian optimization for hyperparameter tuning
- Resolution is often not fine enough to capture variation at farm level: 10m resolution instead of 250m



# Step 2: Going beyond bird's-eye view

What?

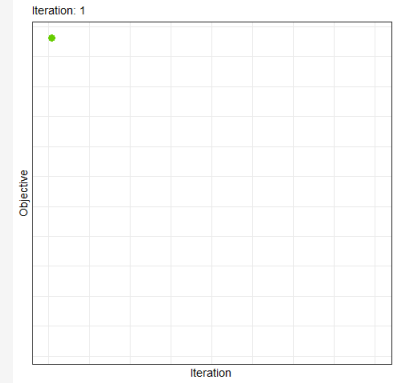
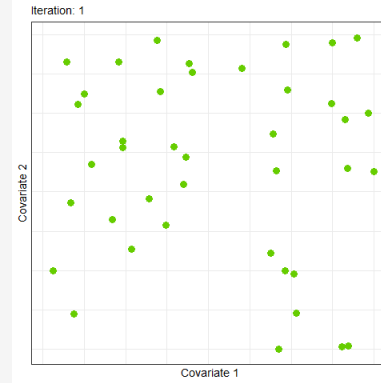
Ensure reliable carbon stock estimate & Minimize number of samples required

How?

Prevent sampling at similar locations  
Try to create a distribution that represents reality

With?

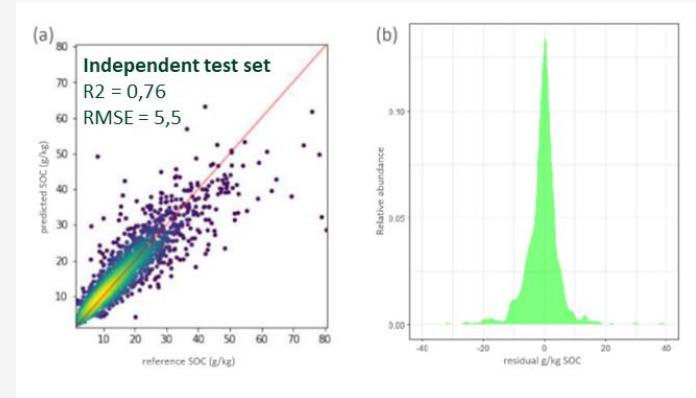
Conditioned Latin Hypercube sampling with Global Model prediction as input



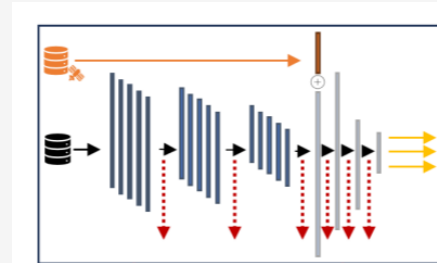
# Step 3: Measure the soil

## Obtain the residuals from global model

- Use NIR scanner to reduce analysis costs and thus enables to take more measurements
- Measure each sampling location individually (no mixture sampling) to reduce random device error
- HH AgroCares gives reliable and unbiased estimates of SOC and BD



Note: used for C stocks on farm level. No point comparison

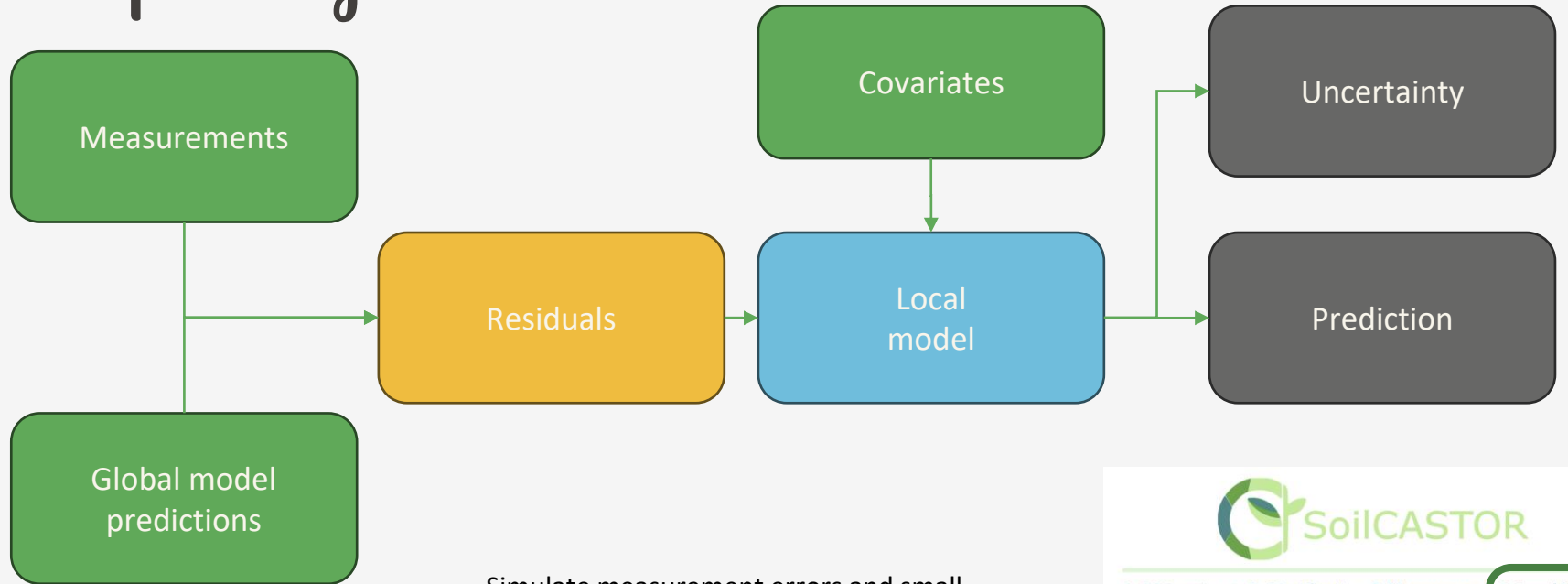


Kok et al. (in press)





# Step 4: Go local



Simulate measurement errors and small sampling design adaptations to calculate confidence interval on farm C stocks



1: SOC estimate 2: Stratification 3: Measurement 4: Local Model

Satellite data



Sentinel 1, II,  
n>250,000

Stratification



cLHS  
optimized

Fieldwork



Stocks ton C/ha



per farm

# Proven technology



Grants4Tech 2022

Home > Agronomy for Sustainable Development > Article

## Enabling soil carbon farming: presentation of a robust, affordable, and scalable method for soil carbon stock assessment

Research Article | [Open access](#) | Published: 08 February 2023

Volume 43, article number 22, (2023) | [Cite this article](#)

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Tessa Sophia van der Voort ✉, Sven Verweij, Yuki Fujita & Gerard H. Ros ✉

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Aligned with VMD0042



Aligned with SBTi

The winning solution should be:

- Accurate
- Scalable
- Reliable
- Cost-effective
- Fast

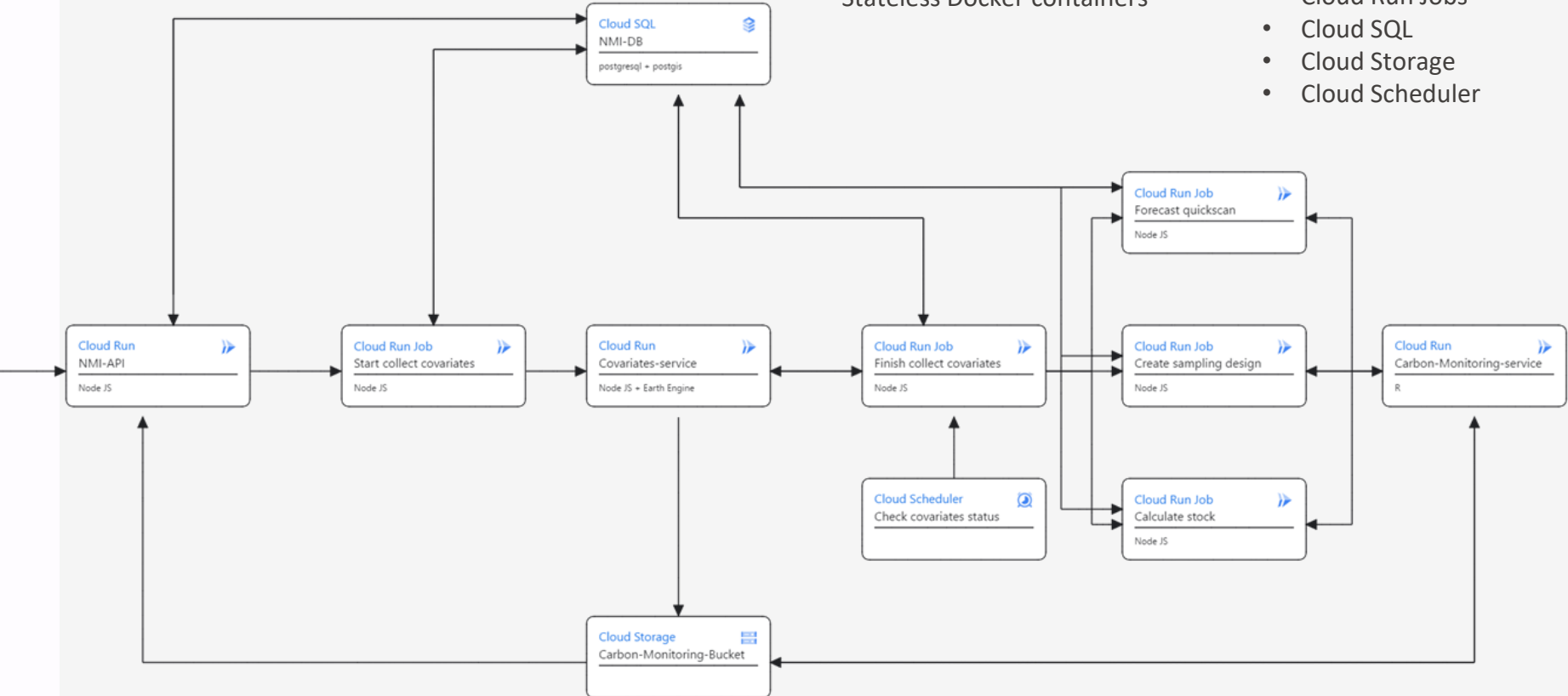


# Behind the scenes

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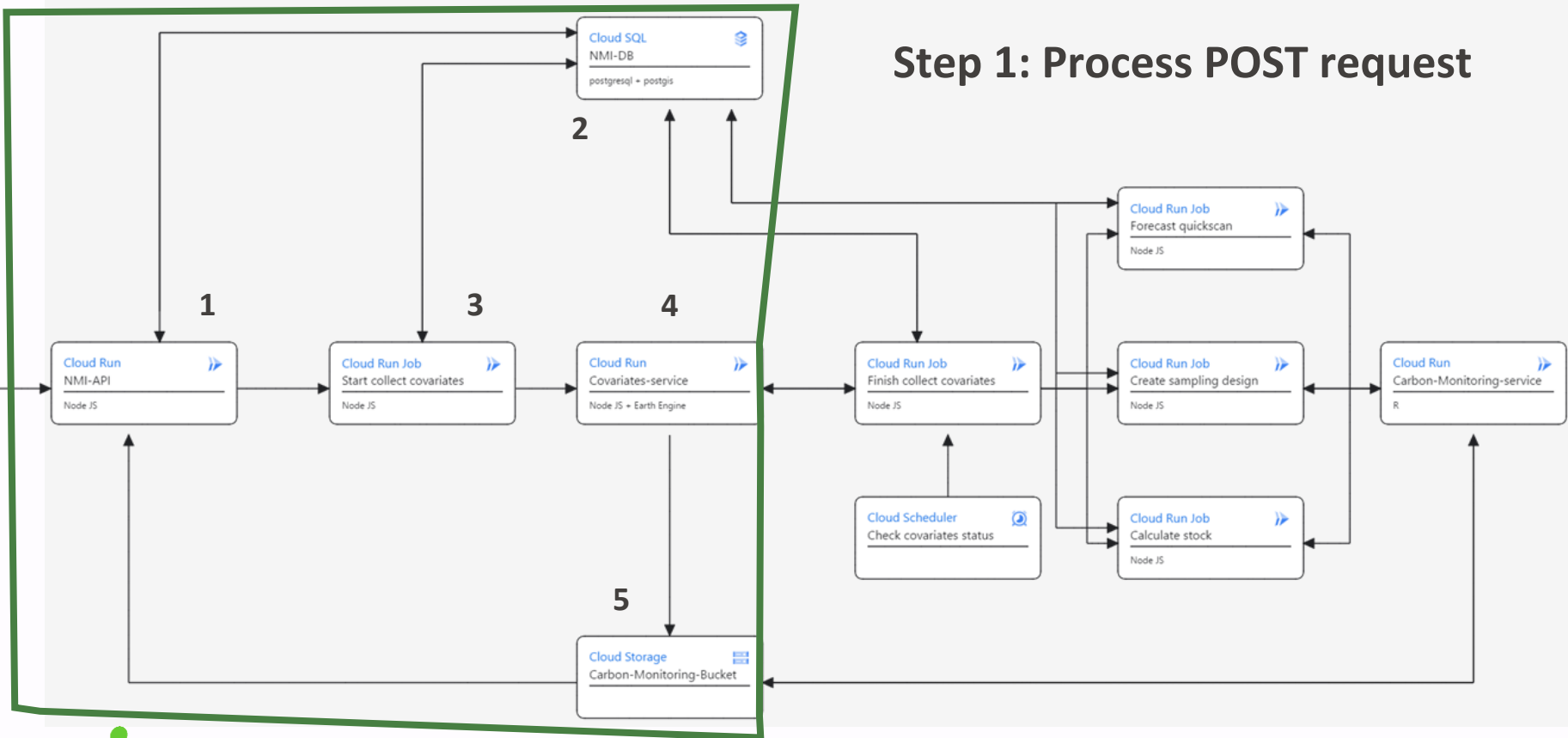
- Accessible via NMI API (REST)
- Stateless Docker containers

- Runs fully on Google Cloud:
  - Cloud Run Services
  - Cloud Run Jobs
  - Cloud SQL
  - Cloud Storage
  - Cloud Scheduler



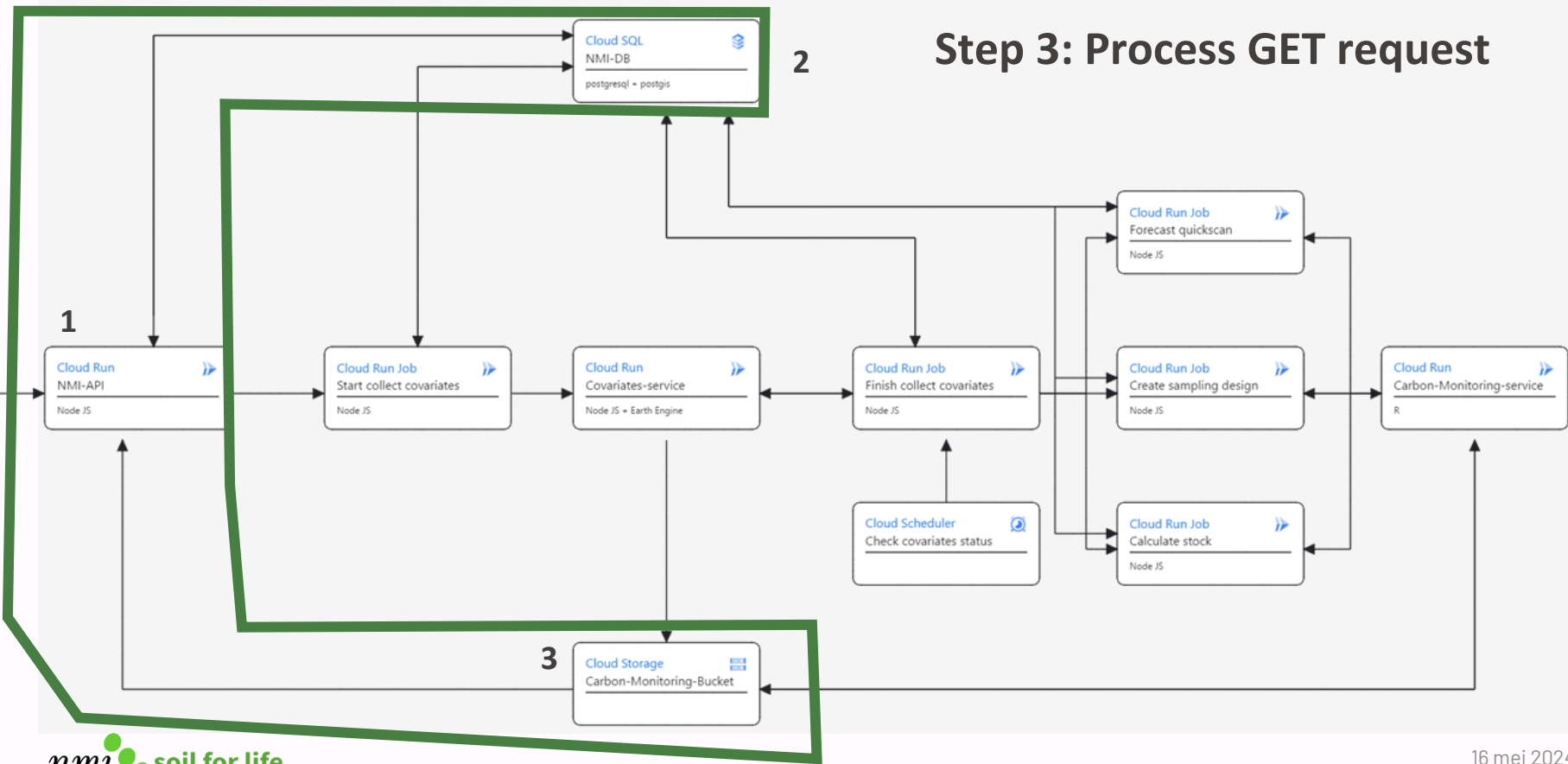
# Behind the scenes

## Step 1: Process POST request





# Behind the scenes



# Our experience and outlook



# Our experience with Earth Engine

## Achieved

- Global mapping of Carbon at 10m resolution
- Faster development of new covariates and models
- Reliable product with limited time spent on maintaining infrastructure

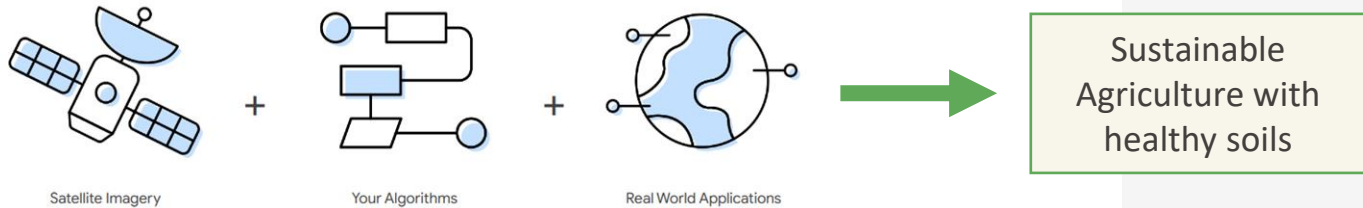
## Current development

- Mapping for other elements:
  - Nitrogen (N)
  - Phosphorus (P)
  - Potassium (K)
- Extending advices to other ecosystem services

## Challenges

- Difficult to estimate cloud consumption
- Takes some time to learn
- Misses sometimes full integration with Google Cloud

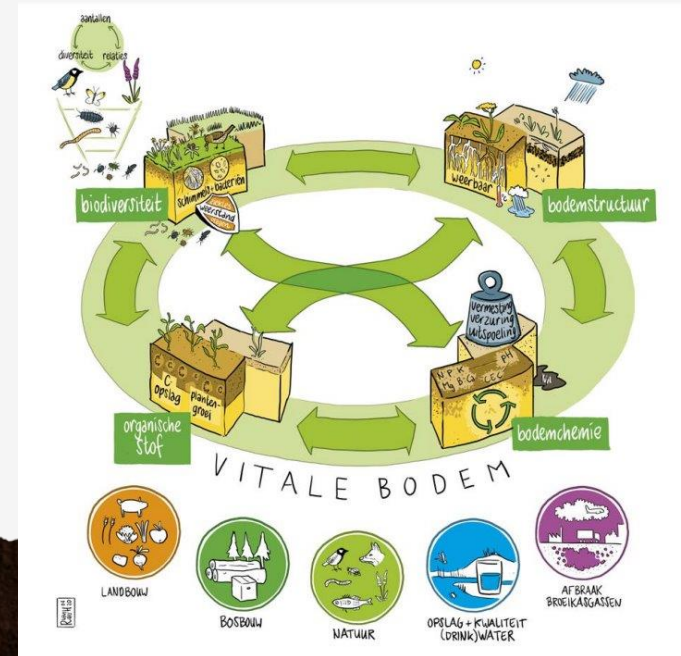
# Our experience with Earth Engine



Earth Engine provides us the tools to advice farmers, policy makers and analysts on the transition to a sustainable agriculture with healthy soil

# Thanks for your attention!

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- ✓ [github.com/SvenVw](https://github.com/SvenVw)
- ✓ [researchgate.net/profile/Sven-Verweij](https://www.researchgate.net/profile/Sven-Verweij)



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