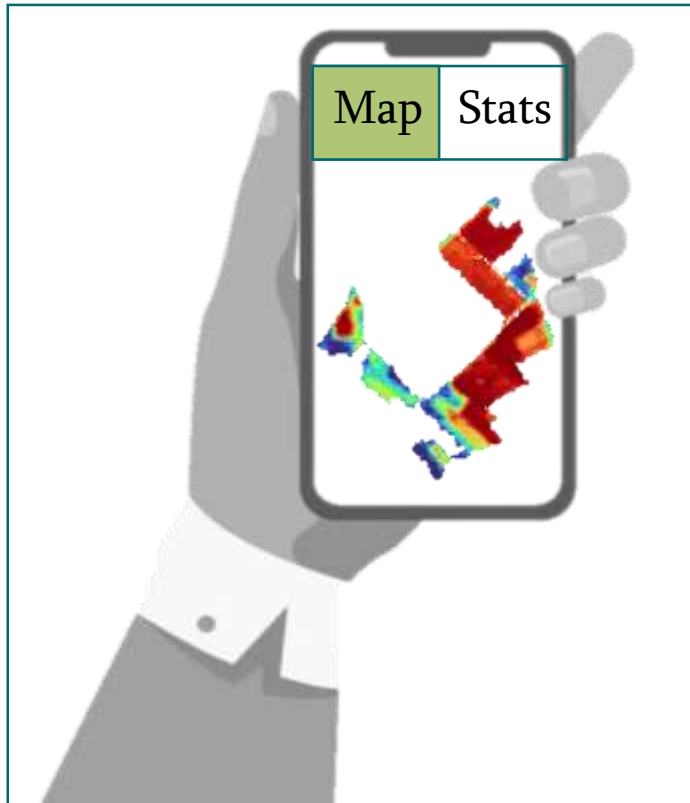


# Deployment of models predicting compressed sward height on Wallonia: quality and validity of the predictions

Nickmilder, C., Tedde, A., Dufrasne, I., Lessire, F., Tychon, B., Curnel, Y., Bindelle, J., Soyeurt, H.

The Objective:  
Decision support system  
to help manage feed wedge



Map	Stats
Parcel id:	123456
Mean available CSH:	XX mm
Theoretical biomass:	YY kg
Cattle load:	XX cows
Feed need:	XX kg/cow/day
Need for diet complement?	
YES	NO

Objective

Problem

Solution

Trust

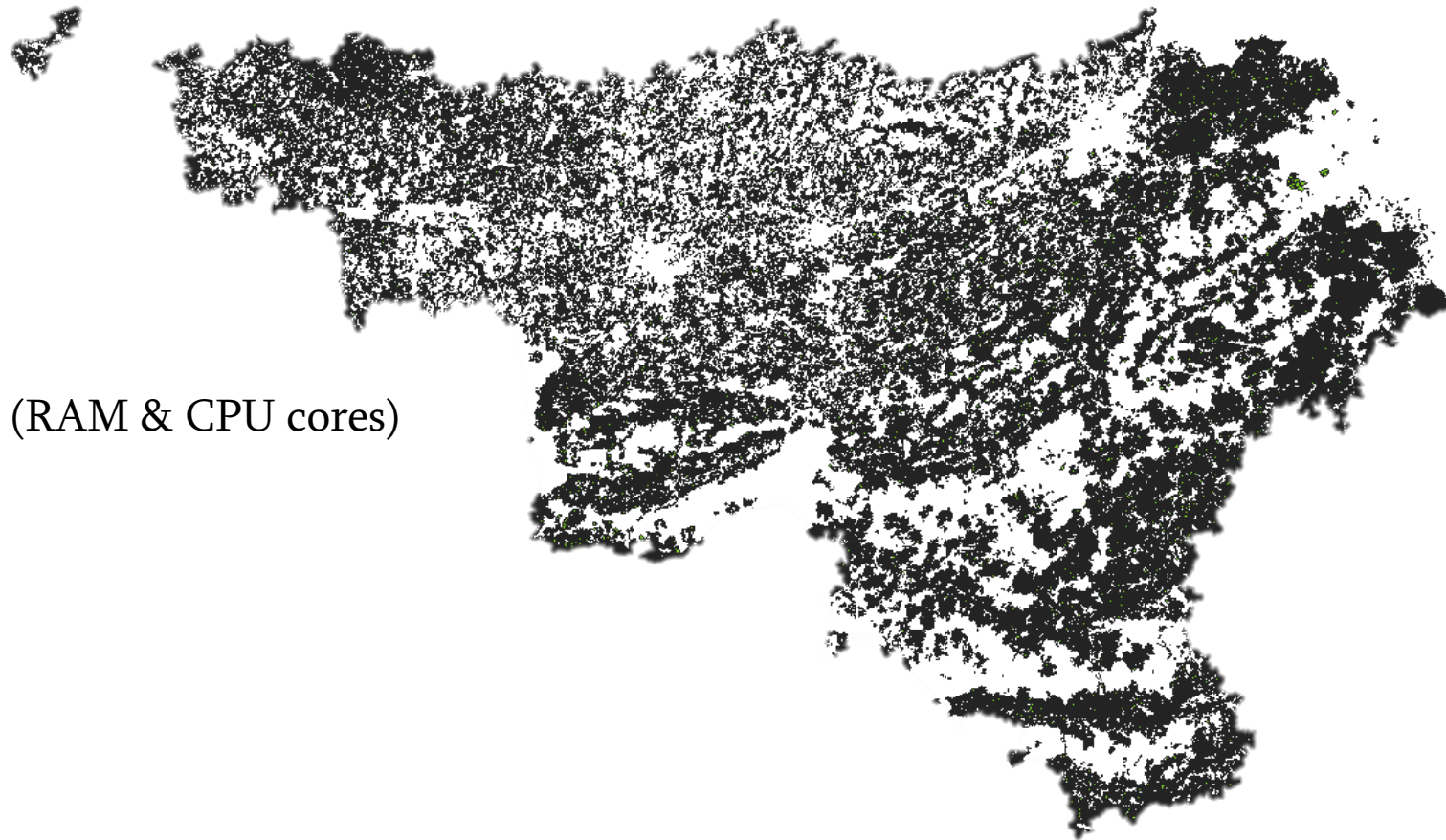
Study

The Problem:

# How to provide consumers with predictions?

## Local computing approach

- Number of pastures (in 2018): 194,657
- Spatial repartition: all over Wallonia
- Size of the original data
  - Sentinel-1: 7Gb
  - Sentinel-2: 2Gb
- Need for compute resources (RAM & CPU cores)



Objective

Problem

Solution

Trust

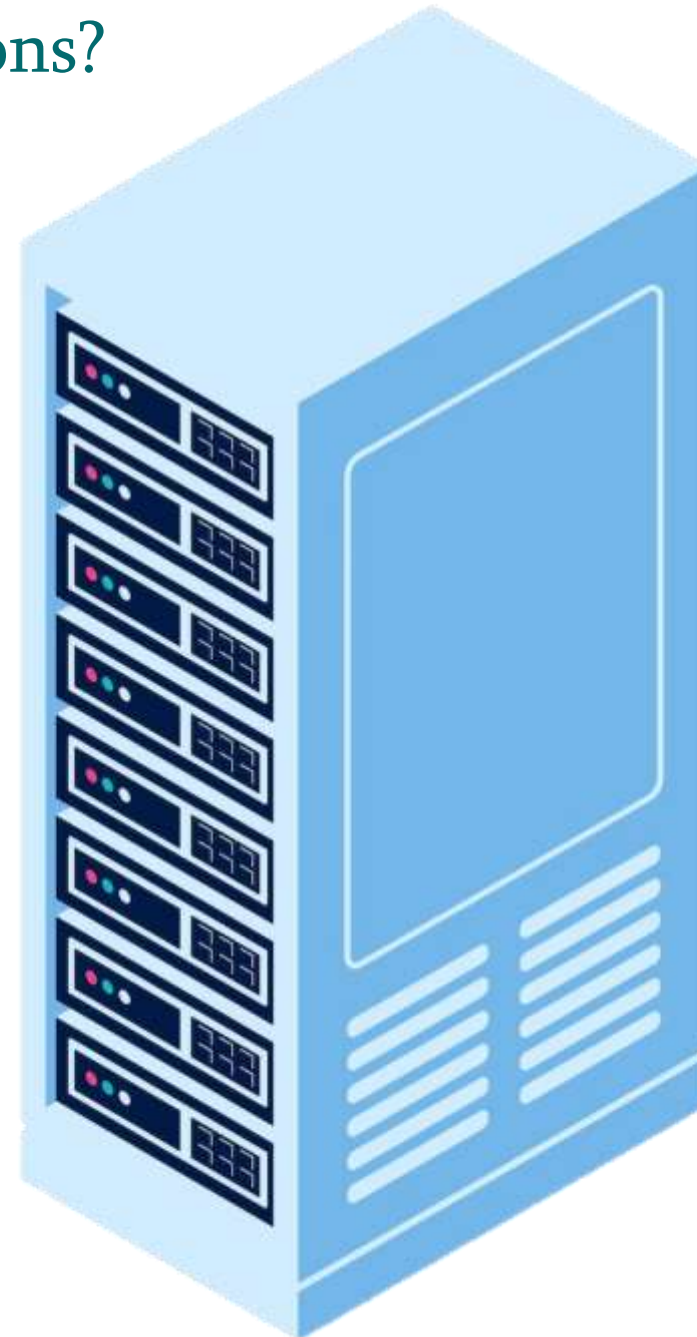
Study

The Solution:

# How to provide consumers with predictions?

## Central computing approach

- Compute needs for Wallonia
  - 250 Gb RAM
  - >16cores
  - Runtime: up to 5,5 hours
- Real time? Impossible
  - Near real-time: prediction at once in the night
- Transmission
  - predicted CSH
  - (other features)



Objective

Problem

Solution

Trust

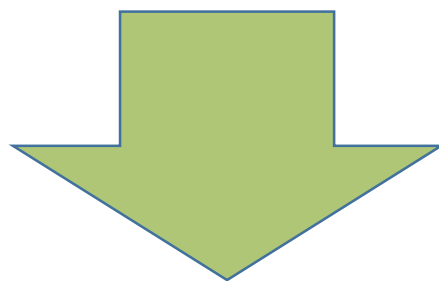
Study

The Solution:

# Can you trust the predictions?

## ➤ Classical validation:

- External dataset
- Study of metrics translating the error
- Study predictions VS original values



# Your cattle rely on it...

## ➤ “Unsupervised validation”

- Range of predictions
- Statistical descriptors
- Stability/variation of the values
- Spatial consistency

Objective

Problem

Solution

Trust

Study

The Study:

# Unsupervised validation through the study of the population of predictions

➤ Descriptive « population » parameters (year 2021)

Criterion	Observed value	Note
N obs	537,601,345	w/o non-finite values & w/ extreme values

Objective

Problem

Solution

Trust

Study

The Study:

# Unsupervised validation through the study of the population of predictions

➤ Descriptive « population » parameters (year 2021)

Criterion	Observed value	Note
N obs	537,601,345	w/o non-finite values & w/ extreme values
Range	[-13,022,872; 4,771,522]	N obs $\notin$ [0;250] mm < 2% (both sides)

Objective

Problem

Solution

Trust

Study

The Study:

# Unsupervised validation through the study of the population of predictions

➤ Descriptive « population » parameters (year 2021)

Criterion	Observed value	Note
N obs	537,601,345	w/o non-finite values & w/ extreme values
Range	[-13,022,872; 4,771,522]	N obs $\notin$ [0;250] mm < 2% (both sides)
Global parcel cv	From -185,700 to 290,400%	w/o extreme values: from 0 to 86%

Objective

Problem

Solution

Trust

Study



The Study:

# Unsupervised validation through the study of the population of predictions

➤ Descriptive « population » parameters (year 2021)

Criterion	Observed value	Note
N obs	537,601,345	w/o non-finite values & w/ extreme values
Range	[-13,022,872; 4,771,522]	N obs $\notin$ [0;250] mm < 2% (both sides)
Global parcel cv	From -185,700 to 290,400%	w/o extreme values: from 0 to 86%
cv / date*parcel	From 0 to 986%	w/o extreme values: from 0 to 303%

Objective

Problem

Solution

Trust

Study

The Study:

# Unsupervised validation through the study of the population of predictions

➤ Descriptive « population » parameters (year 2021)

Criterion	Observed value	Note
N obs	537,601,345	w/o non-finite values & w/ extreme values
Range	[-13,022,872; 4,771,522]	N obs $\notin$ [0;250] mm < 2% (both sides)
Global parcel cv	From -185,700 to 290,400%	w/o extreme values: from 0 to 86%
cv / date*parcel	From 0 to 986%	w/o extreme values: from 0 to 303%
Frequency	From 1/month to > 10/month	Major constraint: clouds

Objective

Problem

Solution

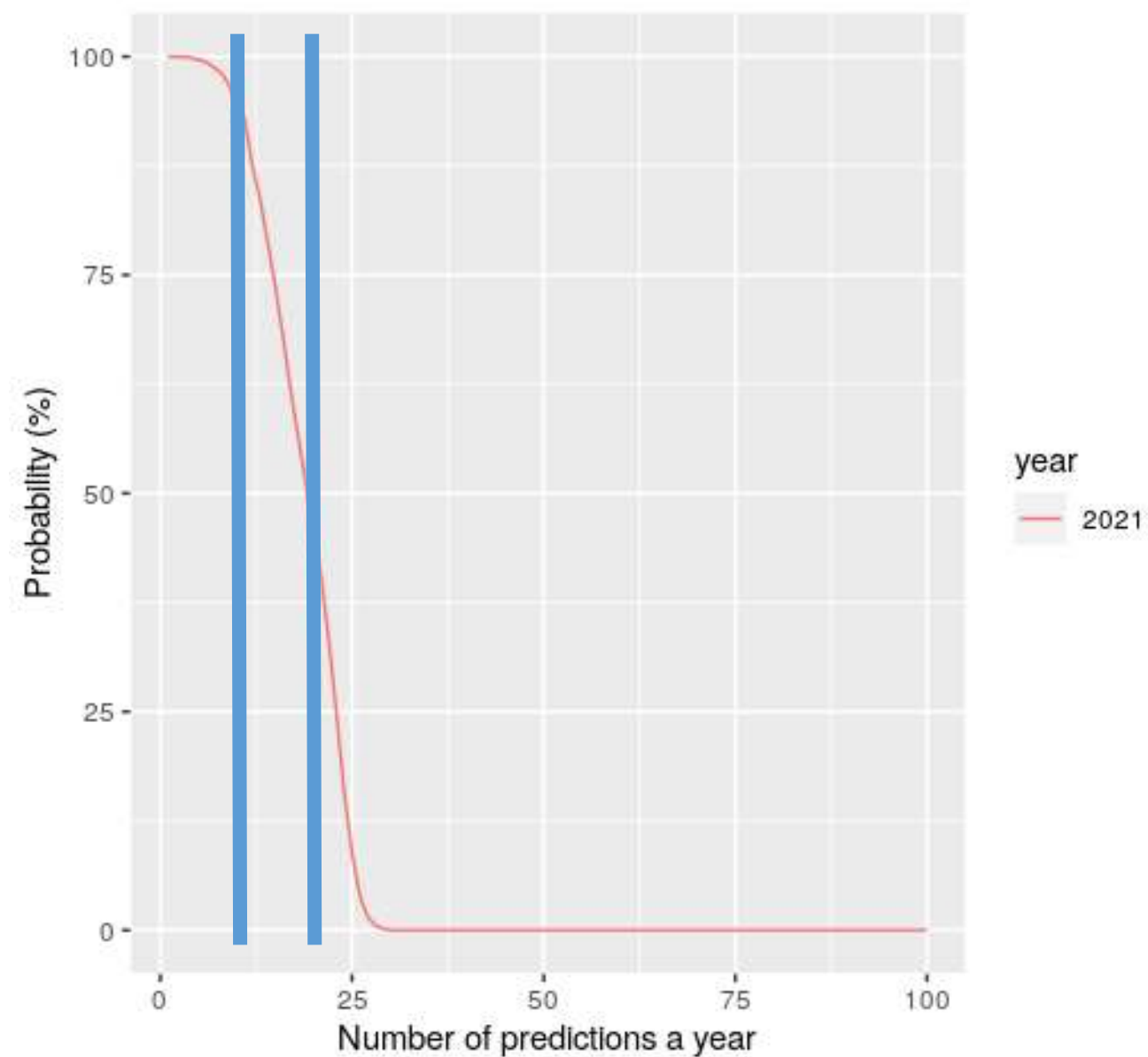
Trust

Study

The Study:

# Unsupervised validation through the study of the population of predictions

- Descriptive « population » parameters
  - Focus on the frequency



Objective

Problem

Solution

Trust

Study

The Study:

# Unsupervised validation through the study of the population of predictions

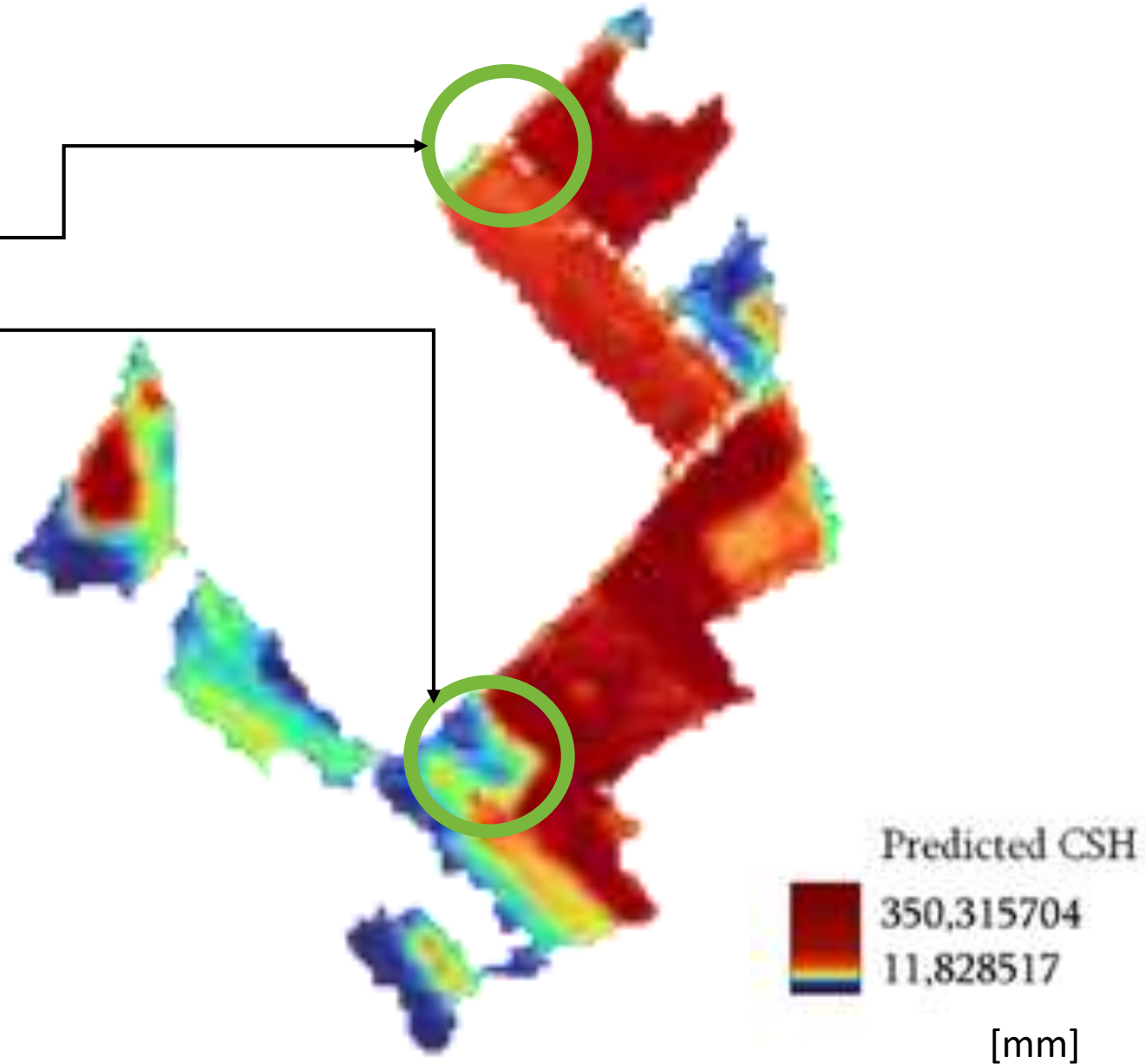
➤ Spatial continuity

- Gaps/holes?

- Changes

➤ Spatial meaning

- Is a parcel one parcel?



Objective

Problem

Solution

Trust

Study

# It worked...

... if you try it at home, be cautious to:

- The amount of compute power needed
- The range and repartition of the predicted values
- The availability frequency
- The spatial quality of the predictions

Take home message

# Thank you for your attention

## Questions?

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Thanks to our partners



Thanks to the wallon  
Region for funding the  
ROAD-STEP project

Avec le soutien de  
la



**Wallonie**



# Development of Machine Learning Models to Predict Compressed Sward Height in Walloon Pastures Based on Sentinel-1, Sentinel-2 and Meteorological Data Using Multiple Data Transformations

by  Charles Nickmilder <sup>1,\*</sup> ,  Anthony Tedde <sup>1</sup> ,  Isabelle Dufrasne <sup>2,3</sup> ,  Françoise Lessire <sup>3</sup>  
 Bernard Tychon <sup>4</sup> ,  Yannick Curnel <sup>5</sup> ,  Jérôme Bindelle <sup>1</sup>  and  Hélène Soyeurt <sup>1</sup>  

Accuracy

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