

# living planet symposium BONN 23-27 May 2022

**TAKING THE PULSE OF OUR PLANET FROM SPACE** 

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Using Sentinel-2 data time series for the mapping of land use typologies during fallow periods over France

> CESBIO 📈 KERMAP cnes

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24/05/2022 - Bonn

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# **OBJECTIVES (1/2)**



# Monitoring land-use typologies during fallow periods.

### An environmental issue

- To improve <u>soil fertility</u> by minimizing runoff and soil erosion.
- To increase soil organic matter (SOM)
- To mitigate global warming via an increase of surface albedo

# ✓ A political issue

- Global warming recommendations outlined in the Sixth IPCC
- European and French Nitrates Directive

# ✓ A scientific issue

- Identifying winter land-use typologies for cropland over large areas
- Analyzing reliable and exhaustive field data sets

# **OBJECTIVES (2/2)**



# Land-use typologies during fallow periods are complex

# => A large diversity of scenarios (floristic composition, bare soil, straw, litter, mulch, etc)

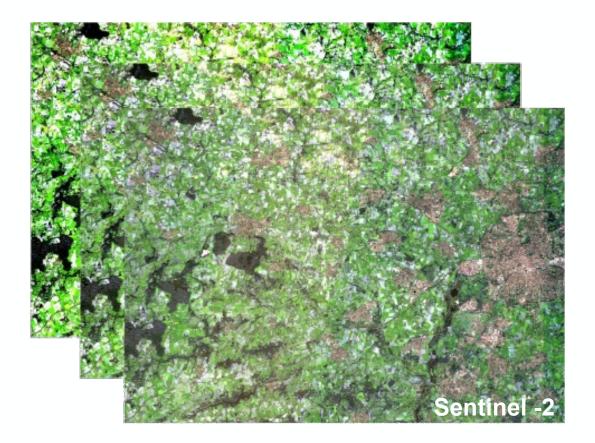






# The use of Sentinel-2 time-series is meaningful in this context

Characteristics : spectral information, monthly synthesis, wintertime coverage

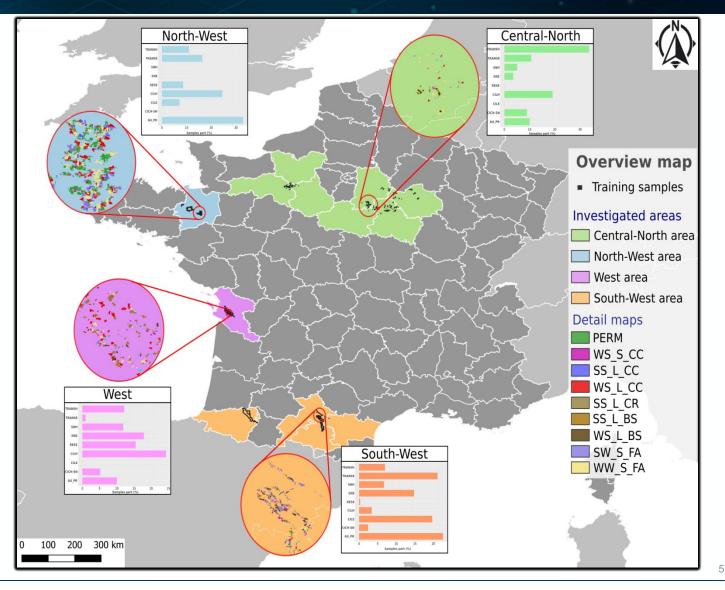


# **STUDY AREA & DATA**



# **Four Areas**

- Central North
  - 11,600km<sup>2</sup> (samples area)
  - 445 fields samples
- North West
  - 2,130km<sup>2</sup> (samples area)
  - 1 368 fields samples
- ✓ West
  - 285km<sup>2</sup> (samples area)
  - 306 fields samples
- South West
  - I 600 km<sup>2</sup> (samples areas)
  - 1 841 fields samples



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# **STUDY AREA & DATA**



# Land-use typologies (LUT)

Crop rotation	LUT	Concerned land-use	Temporality
Winter-Winter	WW_S_FA	Bare soil, regrowths	~ 1 to 3 months
Winter-Spring	WS_S_CC	Cover crop, Catch crop	~ 8 to 9 months
	WS_L_CC	Catch crop, Green manure	~ 8 to 9 months
	WS_L_BS	Bare soil or crop residues	~ 8 to 9 months
Spring-Spring	SS_L_CC	Cover crop, Catch crop	~ 5 to 6 months
	SS_L_CR	Crop residues	~ 5 to 6 months
	SS_L_BS	Bare soil	~ 5 to 6 months
Spring-Winter	SW_S_FA	Bare soil	~ 1 month
Permanent	PERM	Grassland, orchard	12 months

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6





# **Processing Sentinel-2 time series**

- ✓ Download Sentinel-2 Level 3A Products (Monthly synthesis Theia hub)
- ✓ Analysis of quality assessment and mask application
- ✓ Calculation of Vegetation Indices (NDVI, NDWI)

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# METHODOLOGY



# **Classification process**

- ✓ Cropland winter land-use typologies classification
  - Random Forest (RF)
  - Support Vector Machine (SVM)
  - K-Nearest Neighbor (K-NN)
  - Multiple Layer Perceptron (MLP)

## Evaluation of classification algorithms

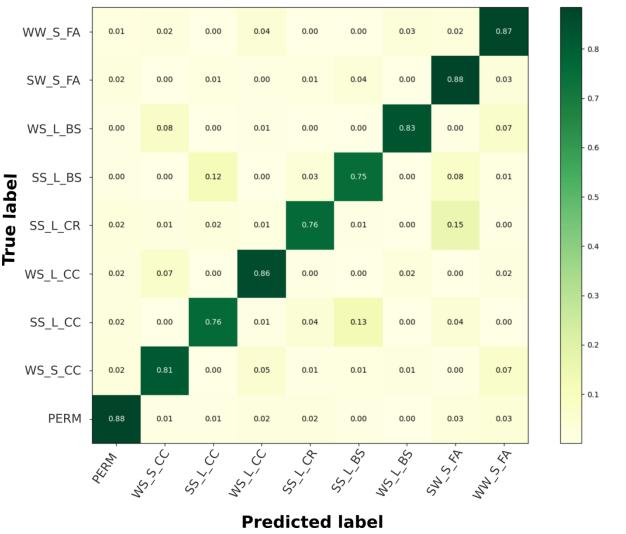
- 80% of fields for the training and 20% of fields for the validation
- Based on these selected plots, all pixels were used to perform classification
- Classification accuracy (FI-Score and Kappa index)
- ✓ Extension to the whole France.



**Classification results** 



### Best classification accuracy is obtained $\checkmark$ with Random Forest True label Sentinel-2 Algorithms Kappa F1-score % RF 0.82 85 SVM 0.81 83 KNN 0.78 81 MLP 0.79 82



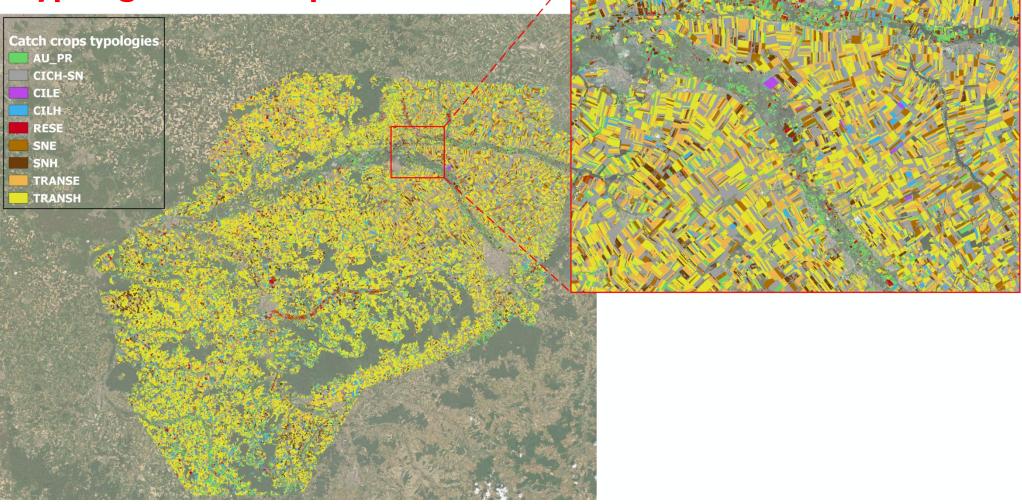
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10

# Land-use typologies class map

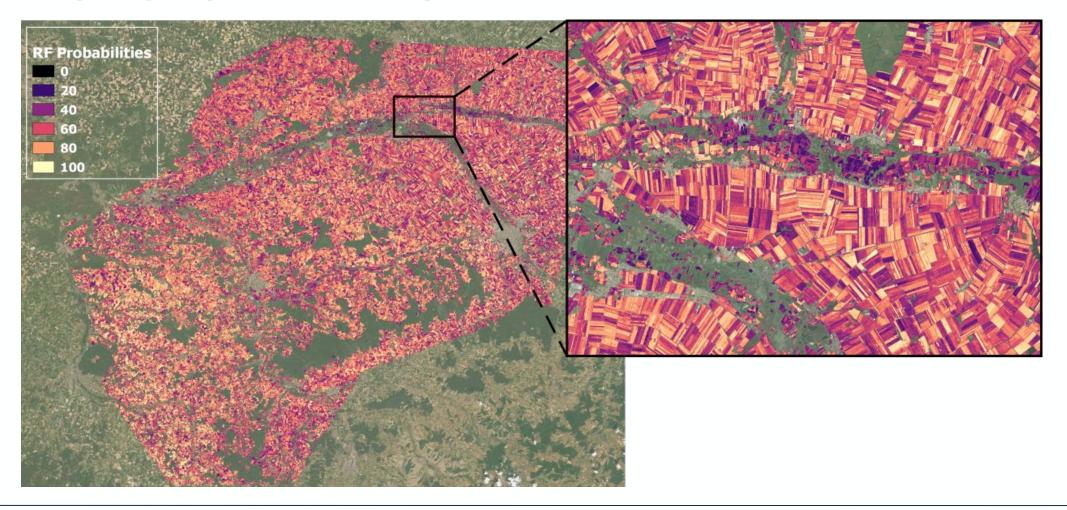






11

# Land-use typologies probability map

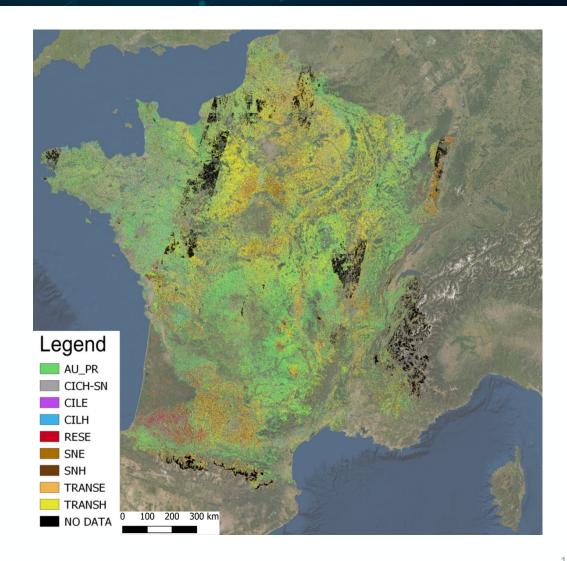


# RESULTS



# **Global land-use typologies map**

- ✓ Annual crops 61,5 % of the areas :
  - ✓ 54 % in winter crops
  - 26 % in cover crops during fallow period
  - 20 % in bare soil or crop reisdues
- Permanent crops 33,5 % of the areas
- ✓ No data 5 % of the areas



# **CONCLUSION - PERSPECTIVES**



 Sentinel-2 monthly synthesis time-series are useful for mapping winter land-use typologies of cropland over large areas

# Best results are obtained with RF algorithm

- F1-score 85%
- Kappa index of 0.82
- This is the first map describing the status of cropland during the winter fallow period for whole France

No-data, misclassification errors and artifacts in several areas (~5%)

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# **THANK YOU !**

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