



Czech University  
of Life Sciences Prague

# A novel protocol for in-field monitoring of soil carbon stock, based on proximal sensors and soil spectral libraries – **ProbeField**

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Fenny van Egmond, Asa Gholizadeh, Eyal Ben Dor, Fabio Castaldi,  
Konrad Metzger, Frank Liebisch, Maria Fantappiè and whole ProbeField consortium***



**EJP SOIL**  
European Joint Programme



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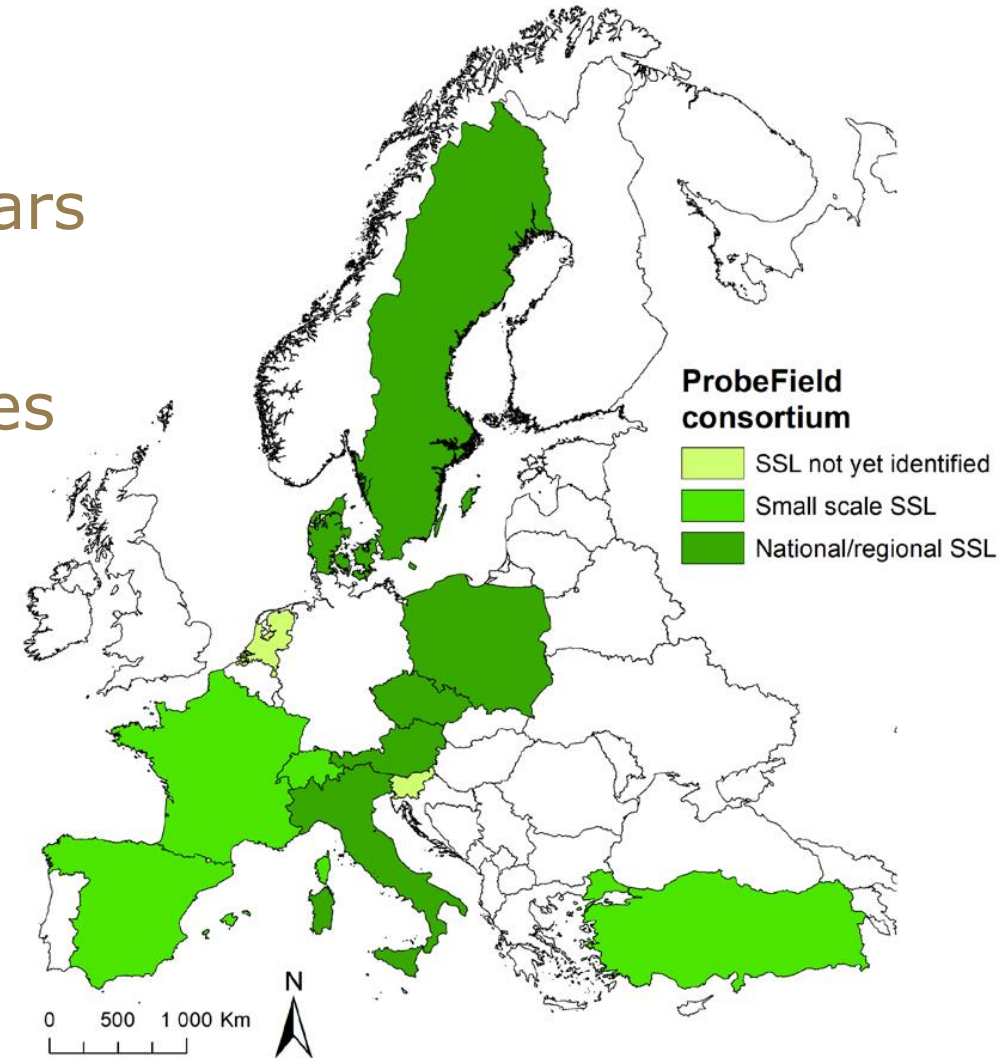


MINISTERSTVO ŠKOLSTVÍ,  
MLÁDEŽE A TĚLOVÝCHOVY

# ProbeField

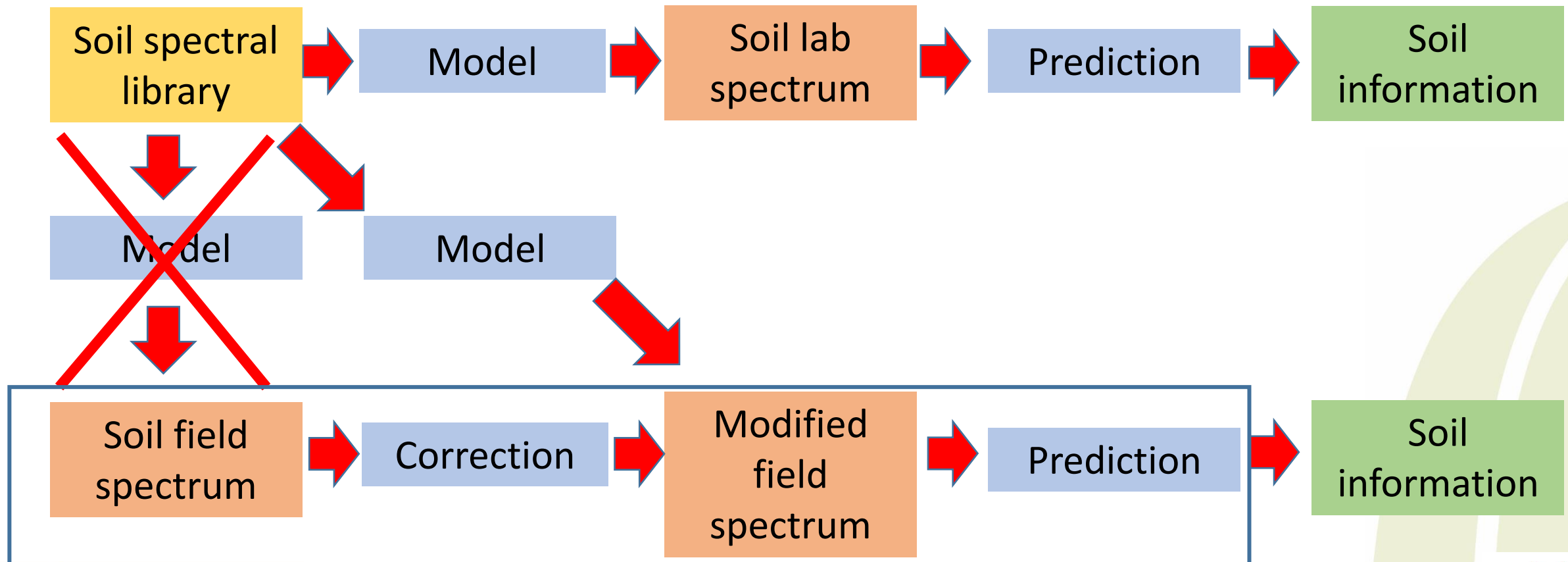
*A novel protocol for robust **in field monitoring** of carbon stock and soil quality properties based on **proximal sensors** and existing soil **spectral libraries***

- Start: November 1, 2021, duration: 3 years
- Coordinator: **Bo Stenberg**,  
Swedish University of Agricultural Sciences (SLU), Sweden
- Co-Leader: **Maria Knadel**,  
Aarhus University (AU), Denmark



# ProbeField background and motivation

Field spectra measurement:  
+ faster, cheaper, no or little disturbance  
- effect of moisture, texture, structure, solar radiation...



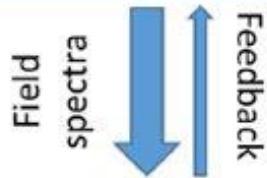
# ProbeField

## WP1 – Project coordination

- Meetings and symposia
- Coordination with other EJP initiatives
- Communication and dissemination
- Steering group
- Data management

## WP2 – Methodology for in field spectral soil sampling

- Literature review
- Inventory of available datasets and SSL's
- Optimal instrument and sample presentation
- Optimizing sample surface and or subsampling
- identify effects of agricultural systems



## WP3 – Spectral preprocessing, model calibration and transfer for reduced effects of in-field conditions

- Literature review
- Optimal pre-processing
- SSL's based calibration models for field

Best field  
Vis-NIR  
procedure

## WP4 – Providing basis for selection of methods for point and 3d field estimation of soil properties

- Performance based on single techniques
- Accuracy improvement by statistical and mathematical methods and combined prediction
- Combined use of VIS-NIR, other proximal sensors and covariates
- Best methods to integrate data sources to develop three dimensional maps

Best  
proximal  
soil  
sensing  
procedure

Synthesis (Protocol for best practice)

WPS



## T2.4 Optimizing sample surface tests

Manipulation of soil surface experiments:

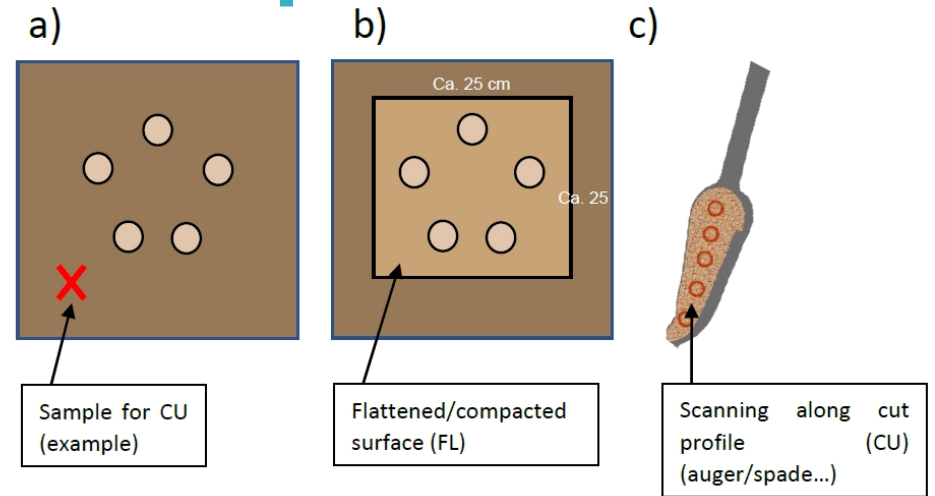
- Field protocol document developed
- Experimental campaigns in Italy, Denmark and Switzerland



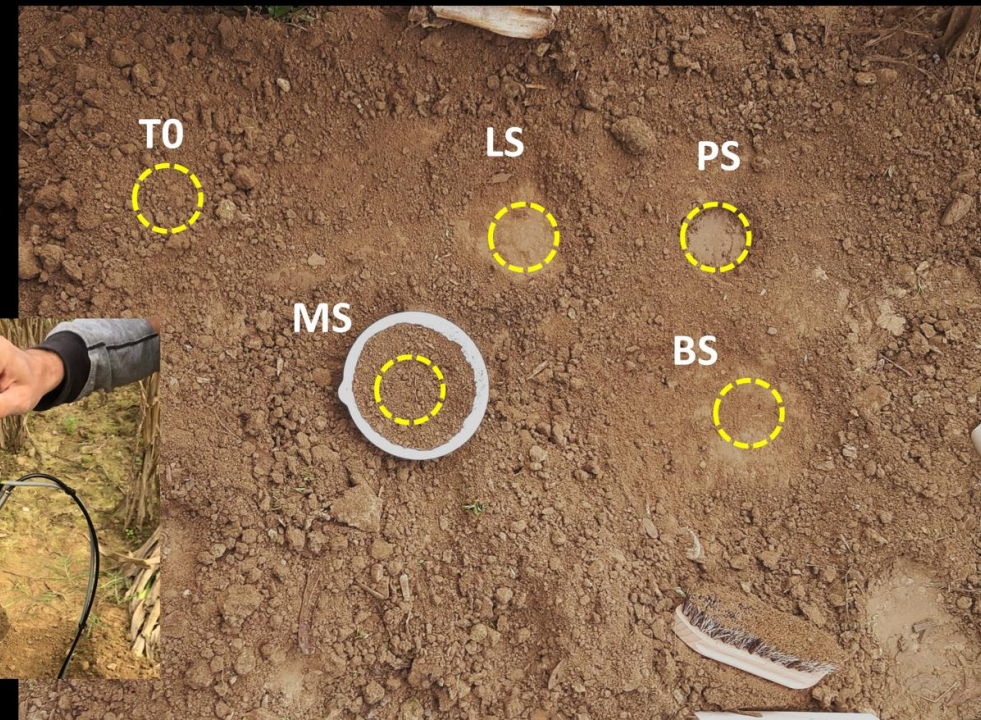
## T2.4 Optimizing sample surface tests - protocol

Soil surface pre-treatments:

1. **T0** – NO (least possible) treatment
2. **FL** – flattened/compacted
3. **CU** Cut – along core/spade surface
4. **MX** Mixed – field moist
5. **DU** Air dry - unsieved
6. **DS** Air dry – sieved <2 mm
7. **DL** Soil Spectral Library (national, regional SSL) protocol procedure

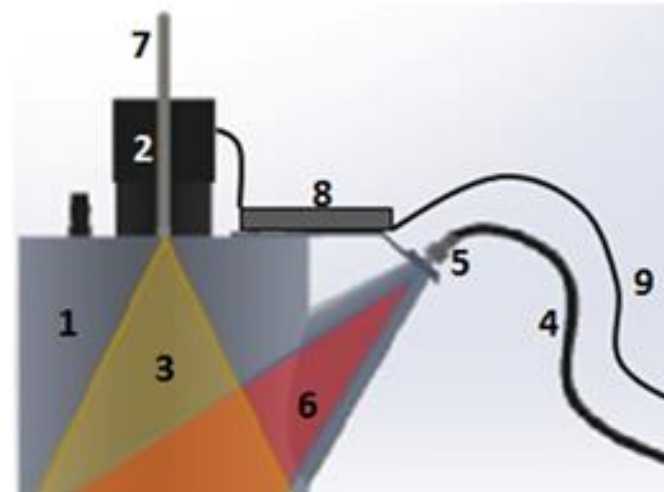


T0: no treatment  
LS: levelled surface  
PS: pressed surface  
BS: brushed surface  
MS: mixed soil  
CA: soil auger sample (15 cm)



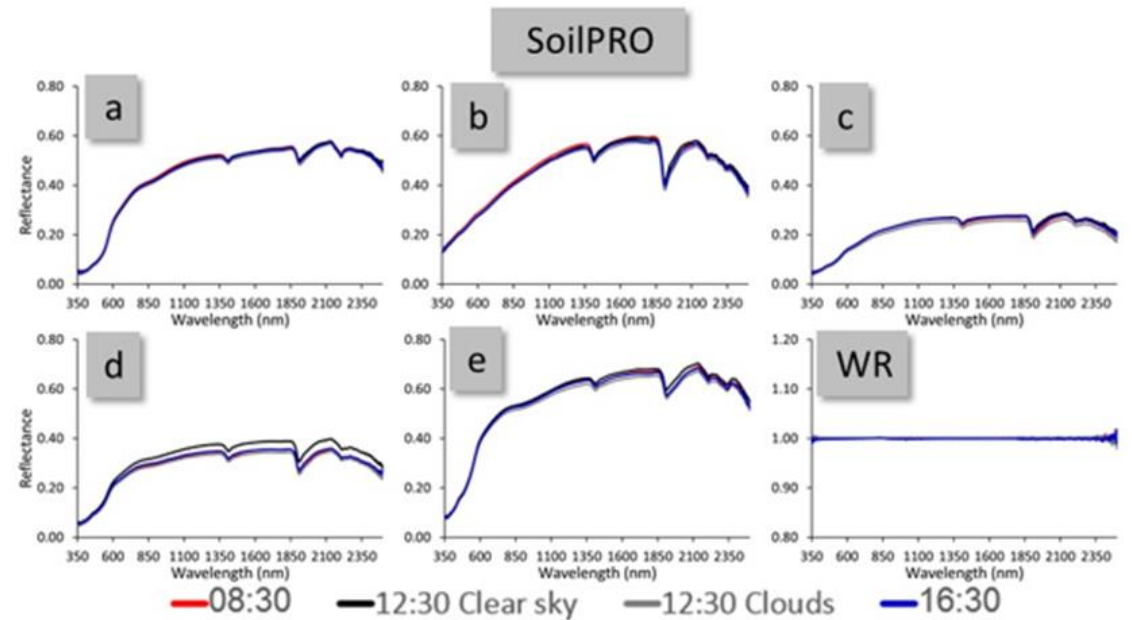
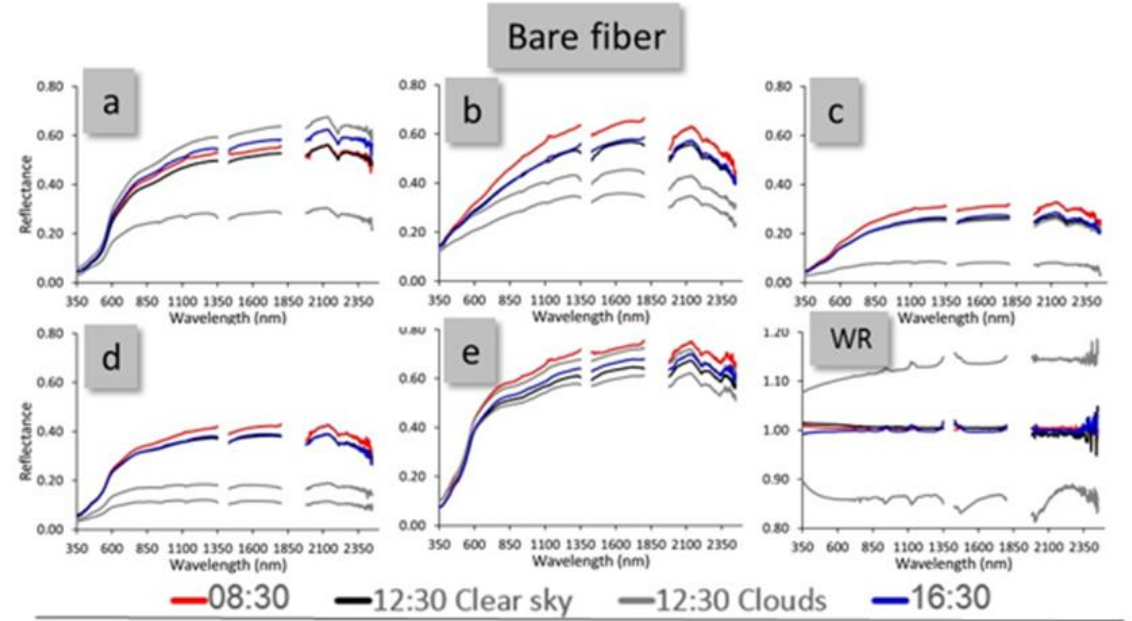
# SoilPRO instrument

- Invented by Eyal Ben Dor et al. (Tel Aviv University, Israel)
- US patent
- Testing
  - „Field spectra of laboratory quality“
- Advantages:
  - Larger sensed area
  - No surface disturbance
  - No external light effect
  - Stable measurement



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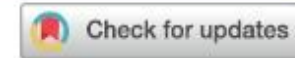


# WP3 Spectral preprocessing

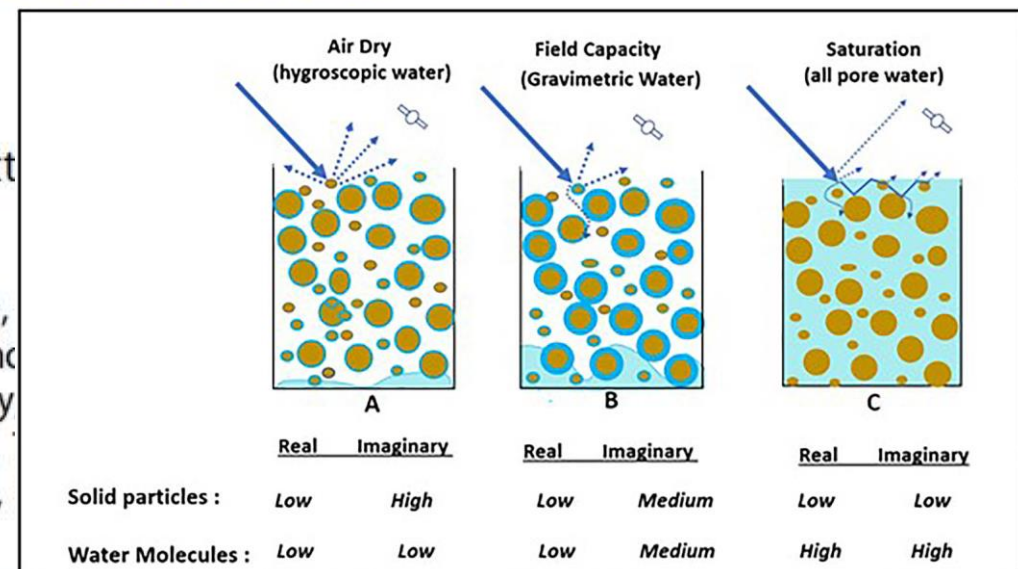
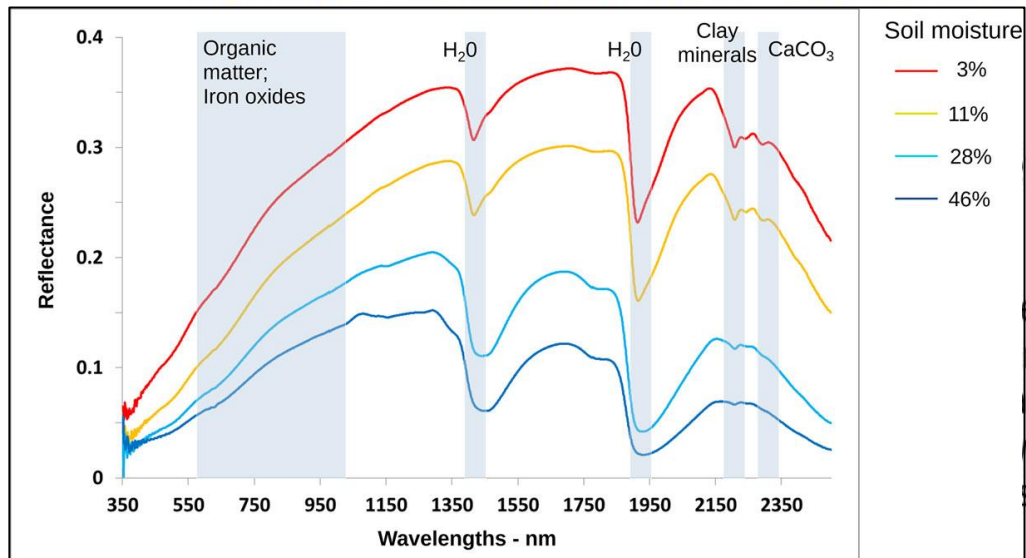
## T3.1 Literature review

**Aim:** To identify existing techniques to remove moisture effects from soil spectra

APPLIED SPECTROSCOPY REVIEWS  
<https://doi.org/10.1080/05704928.2022.2128365>

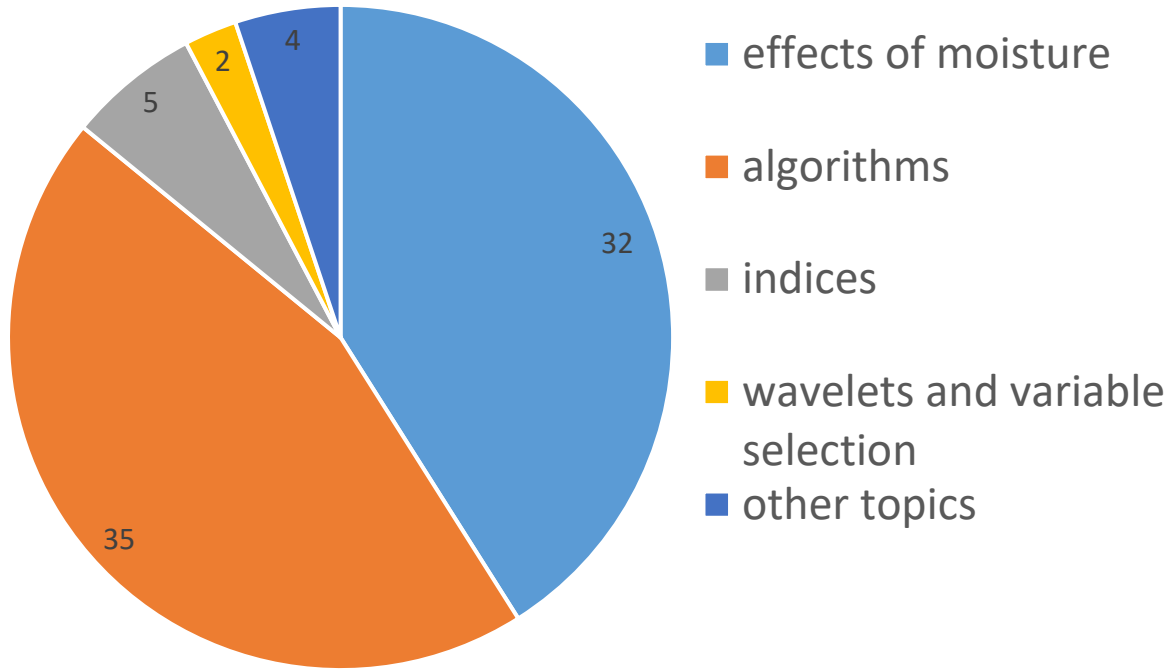


## Mathematical techniques to remove moisture effects from visible–near-infrared–shortwave-infrared soil

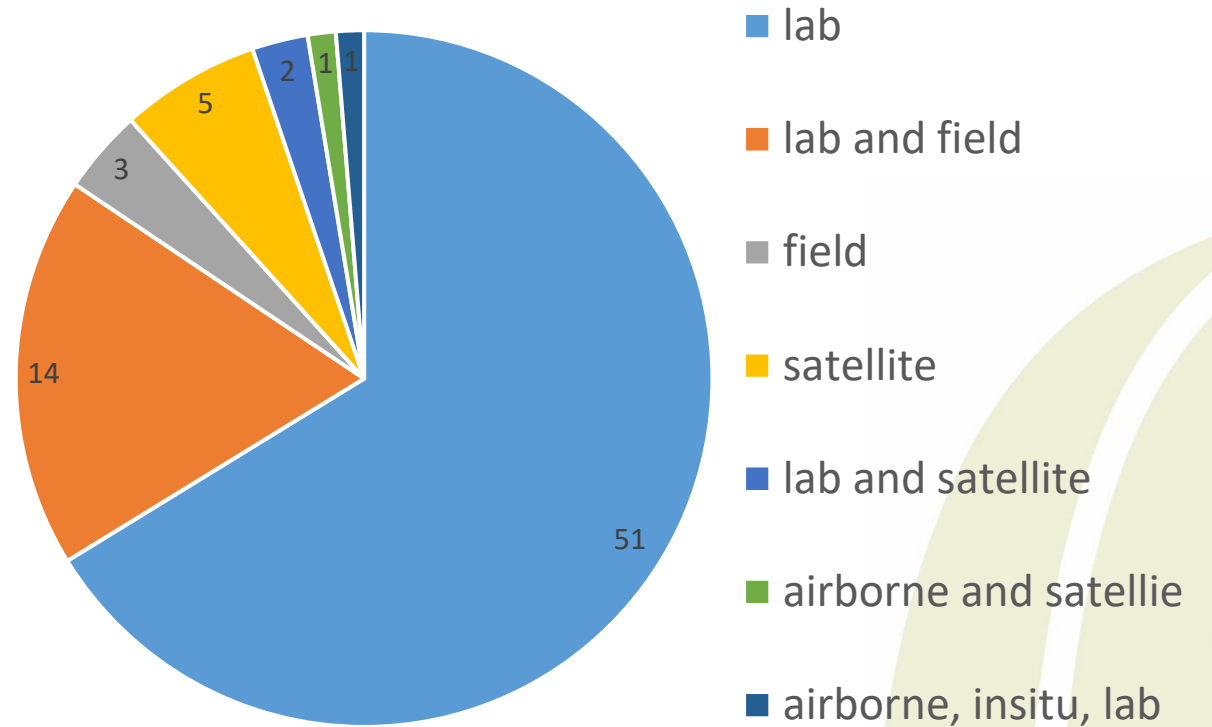


# T3.1 Literature review summary

## Topic

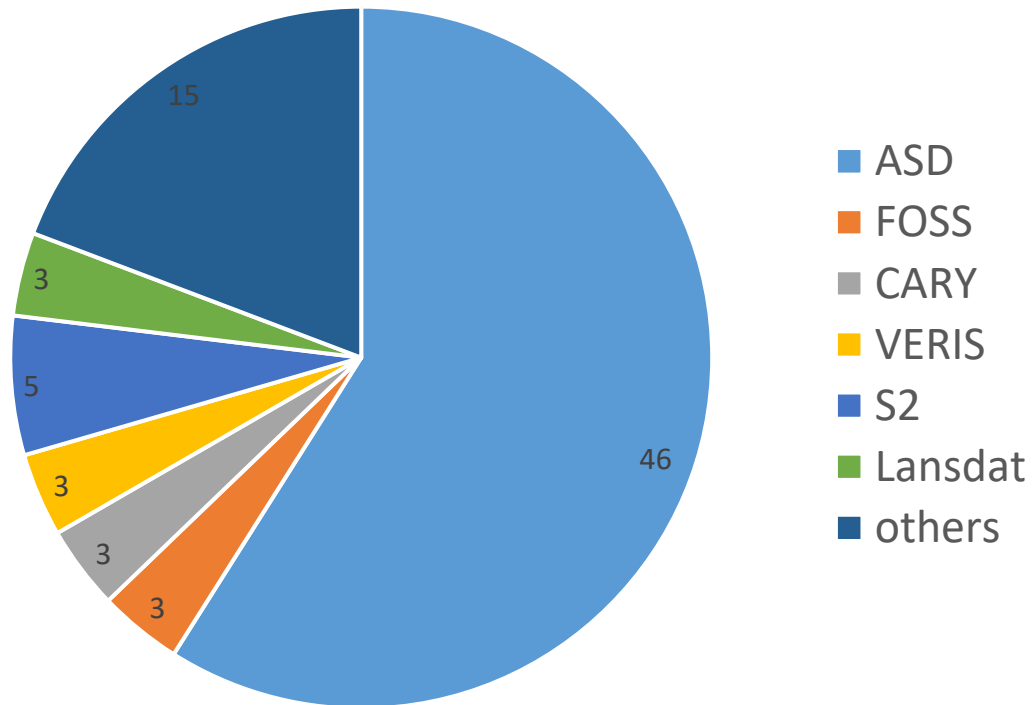


## Platforms



## T3.1 Literature review summary

### Spectrometers



**Spectral range:** 90% using 350-2500nm

### Scale:

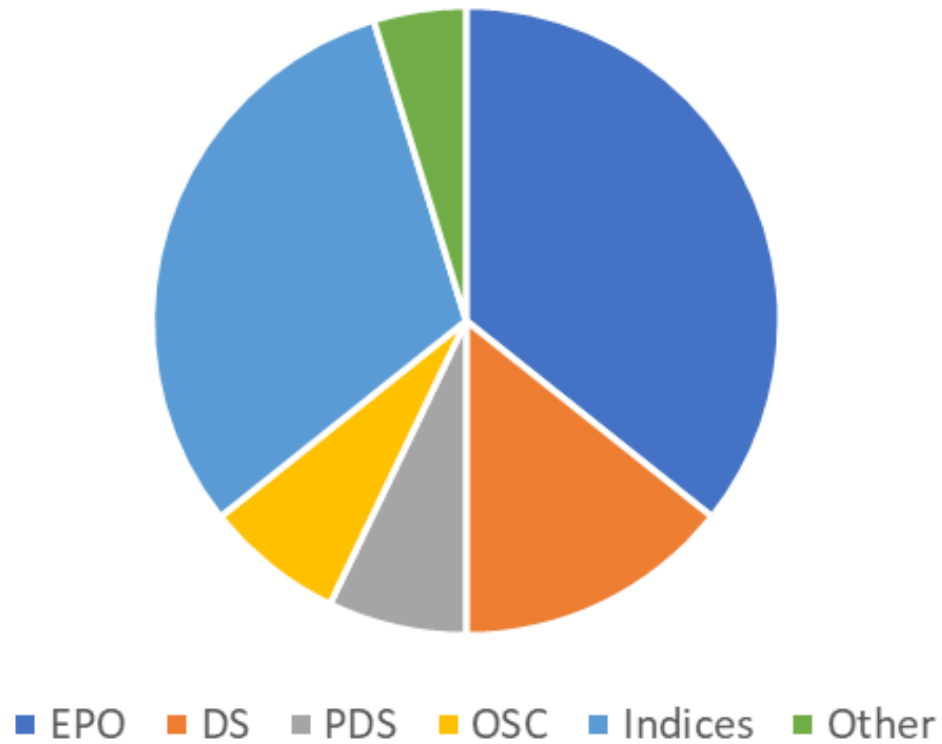
- 32 local/field + 9 regional,
- 27 regional,
- 3 national,
- 1 European

### Origin:

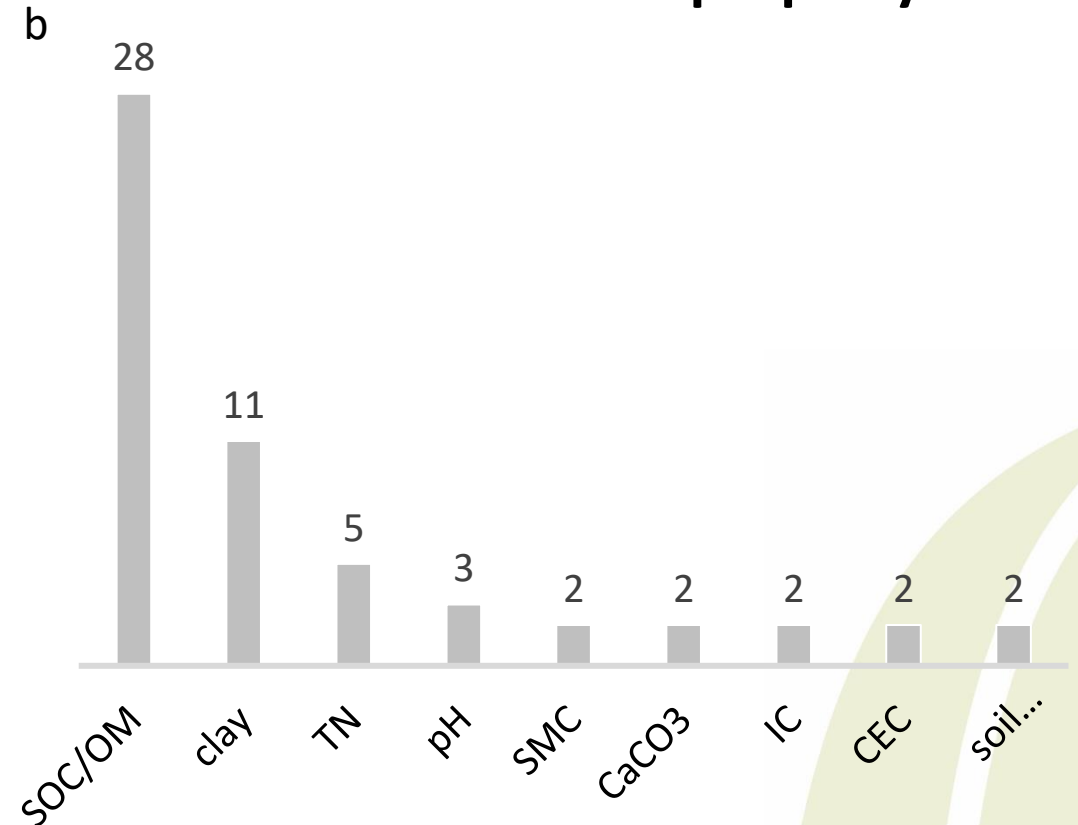
17 USA, 14 China, 5 France, 5 Brazil, rest <5

# T3.1 42 papers on techniques to remove moisture - summary

## Applied mathematical techniques



## Considered soil property



EPO = external parameter orthogonalization, DS = direct standardization, OSC = orthogonal signal correction, PDS = piecewise direct standardization

# WP 4 Providing basis for selection of methods for point and 3d field estimation of soil properties

## Aims:

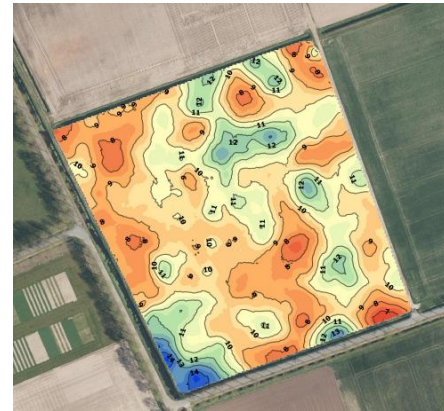
- Evaluation of costs and accuracy for using single and multiple proximal soil sensing techniques for estimation of soil properties
- Compositional analysis of soil properties
- 3D mapping of soil properties based on proximal soil sensing

### Soil properties:

SOC, soil inorganic C  
Clay, sand, silt  
Water content  
EC  
Coarse fragments  
Bulk Density  
Soil depth/ comp. layer

### Sensing:

Near infrared  
Gamma-ray  
EMI  
GPR



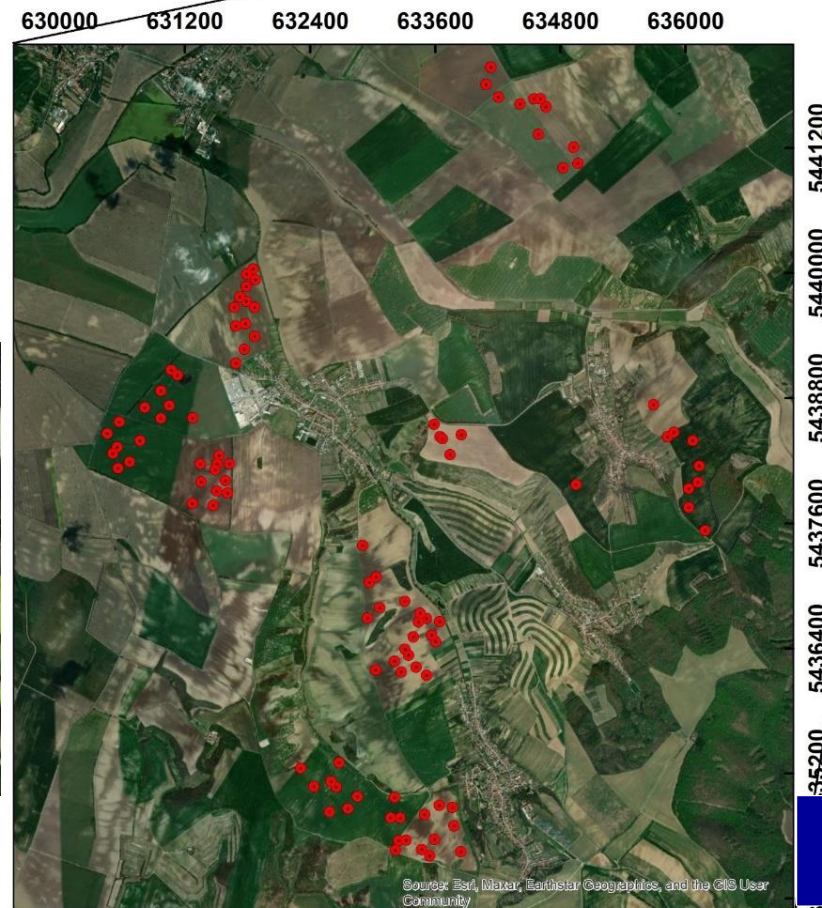
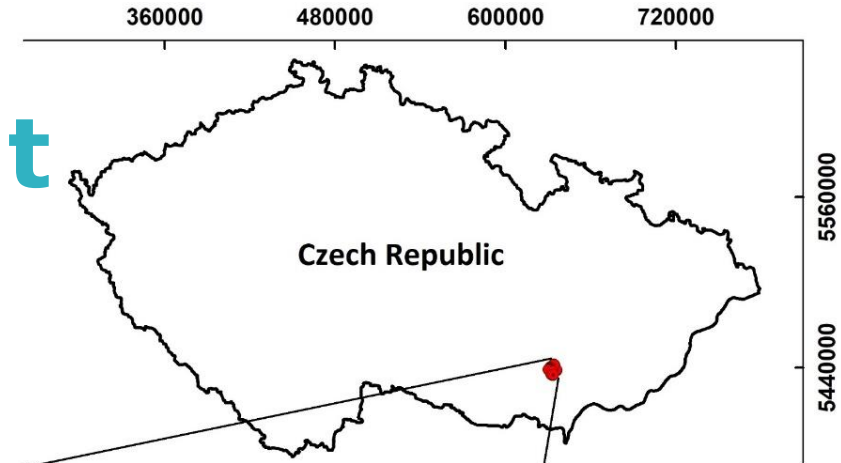
### Methods:

Literature survey  
Company survey  
Field analyses

Read by	DOI	Authors	Title	Year	Relevant (yes/no)	3d map (yes/no)	3d sensors (yes/no)	Sensor	Manufacturing company	Measurement type (lab, in-situ, UVA, satellite)
Melis	<a href="https://doi.org/10.1016/j.geoderma.2021.114981">https://doi.org/10.1016/j.geoderma.2021.114981</a>	Moura-Bueno et al	Environmental covariates improve the spectral predictions of organic carbon in subtropical soils in southern Brazil	2021	yes	no	no	FieldSpec 3 spectroradiometer	(Analytical Spectral Devices, Boulder, USA)	lab
Roberto	<a href="https://doi.org/10.1016/j.geoderma.2019.113900">https://doi.org/10.1016/j.geoderma.2019.113900</a>	Hutengs et al	In situ and laboratory soil spectroscopy with portable visible-to-near-infrared and mid-infrared instruments for the assessment of organic carbon in soil	2019	yes	no	no	high-performance handheld MIR spectrometers, and Vis-Nir spectrometer	Agilent Handheld FTIR series (Agilent Technologies, Santa Clara, USA), that cover the 4000-650 cm <sup>-1</sup> and ASD FieldSpec	in-situ and lab

# ProbeField – Czech experiment

- Otnice (mostly Chernozem)
- Field vs. laboratory measurement of VisNIR spectra (106 sampling sites)
- Effect of moisture, texture....
- Soil spectral library exploitation
- SoilPRO instrument

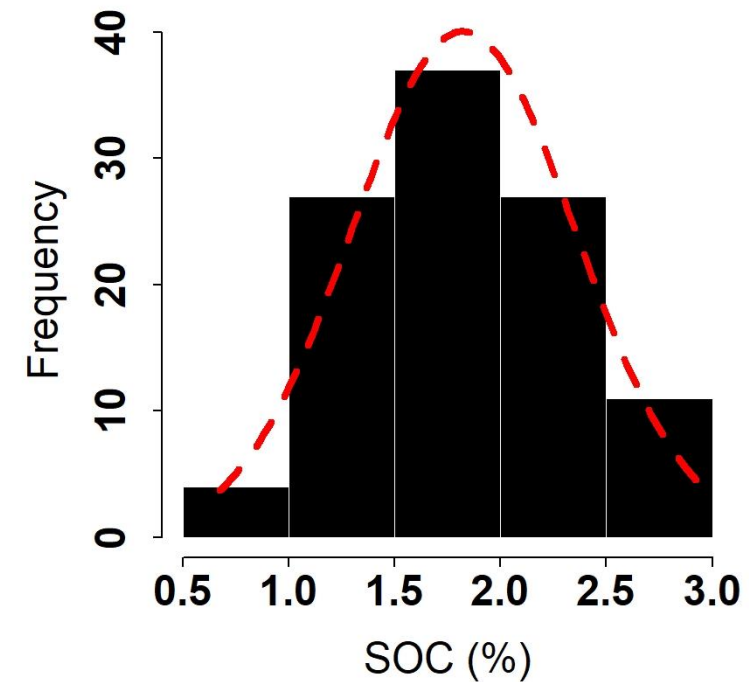


# Soil organic carbon content statistics

## SOC statistics

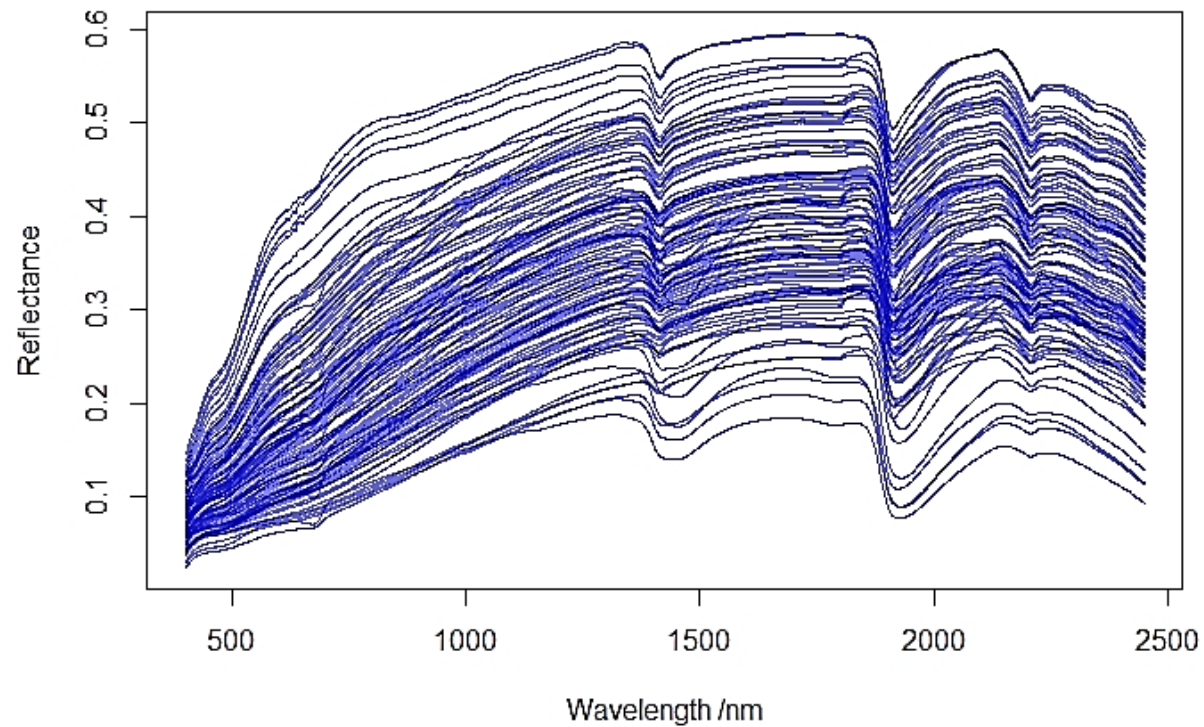
<b>Minimum</b>	<b>0.67</b>
<b>Maximum</b>	<b>2.96</b>
<b>Mean</b>	<b>1.82</b>
<b>Standard deviation</b>	<b>0.53</b>
<b>Range</b>	<b>2.29</b>
<b>Skewness</b>	<b>0.16</b>
<b>Kurtosis</b>	<b>-0.61</b>
<b>Coefficient of variation</b>	<b>0.29</b>

## SOC histogram

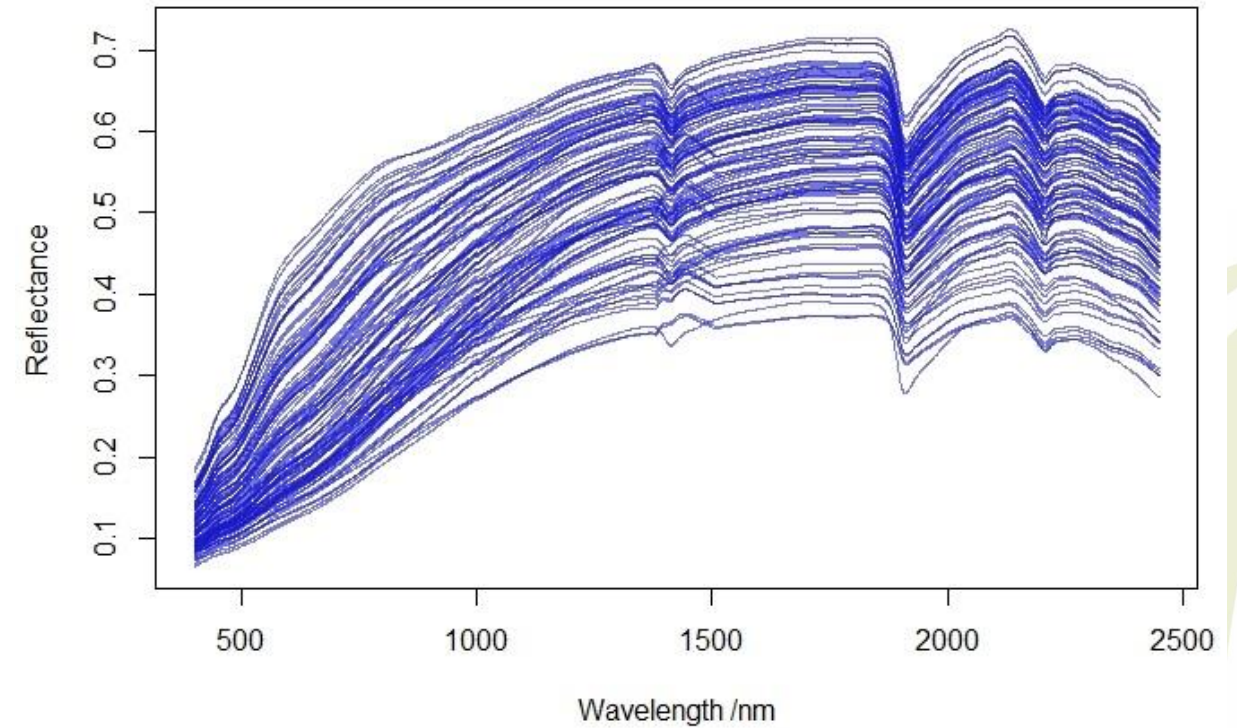


# Sample reflectance spectra (ASD FieldSpec 3, Contact Probe)

## Field spectra



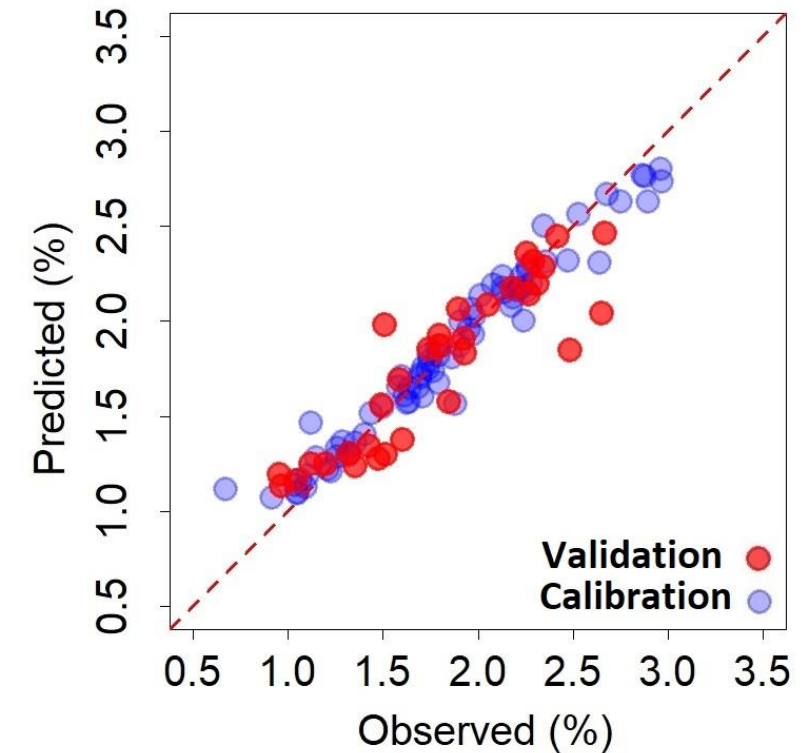
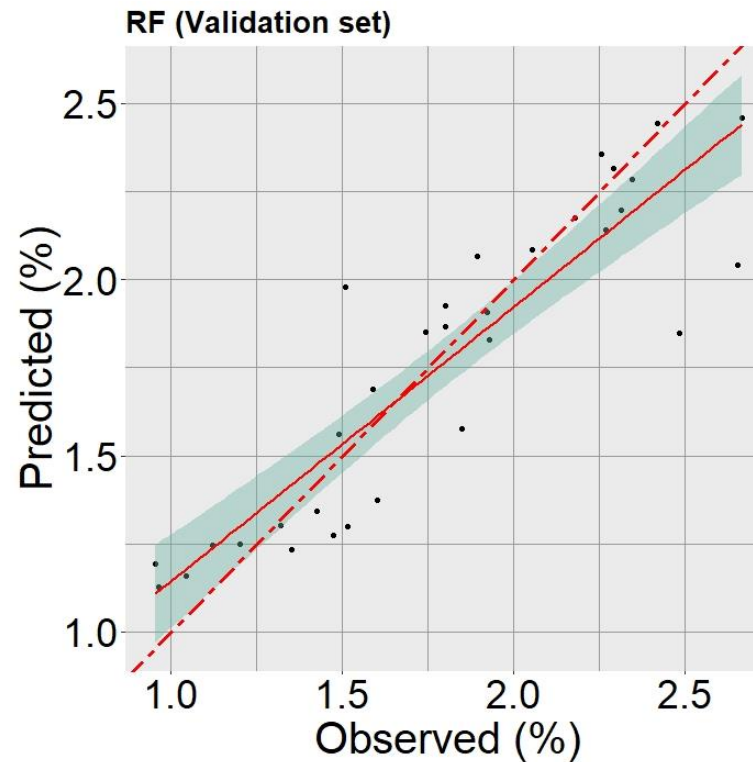
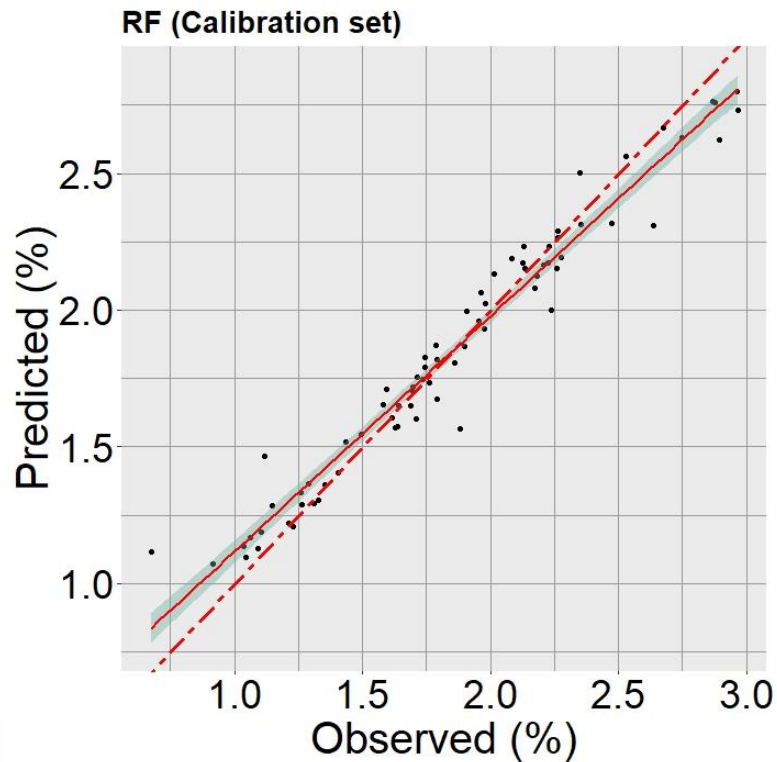
## Laboratory spectra





# Modeling results (RF – field spectra)

Method	Dataset	ME	RMSE	R <sup>2</sup>	LCCC	RPD	RPIQ
RF	Calibration	0	0.12	0.95	0.97	4.47	6.63
	Validation	-0.03	0.22	0.80	0.89	2.27	3.65



## Modeling results in brief (Validation set)

Algorithm	Lab spectra	Field spectra
PLSR	$R^2 = 0.80$ , RMSE = 0.22	$R^2 = 0.75$ , RMSE = 0.24
RF	$R^2 = 0.88$ , RMSE = 0.17	$R^2 = 0.80$ , RMSE = 0.22
SVR	$R^2 = 0.74$ , RMSE = 0.29	$R^2 = 0.73$ , RMSE = 0.25



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**Thanks to all contributors  
Thank you for your attention**



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