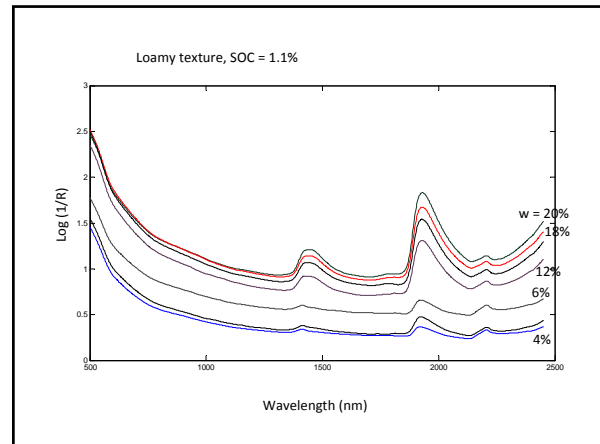
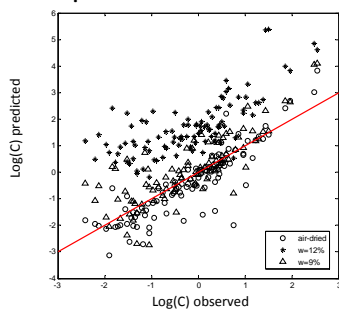


## Removing the effect of moisture from NIR-DRS for prediction of soil carbon content

Alex. B. McBratney, Budiman Minasny,  
Veronique Bellon-Maurel,  
Jean-Michel Roger, Alexia Gobrecht,  
Laure Ferrand, Samuel Joalland



## Prediction of SOC from PLS calibrated on spectra of air-dried soil



## EPO (empirical parameter orthogonalisation)

- $S$  is the  $m$ -dimensional (no wavelengths) space of the measured spectra.
- $S = C + G + R$
- $C$ : chemical spectral responses independent of  $G$ ;
- $G$ : spectra caused by external parameter effect, independent from  $C$ ;
- $R$  = independent residual

## EPO

In matrix form, the spectra can be written as:

$$\mathbf{X} = \mathbf{X}\mathbf{P} + \mathbf{X}\mathbf{Q} + \mathbf{R} \quad [n \text{ obs by } m \text{ wavelengths}]$$

$\mathbf{P}$  is the projection of the useful part of the spectra:  $\mathbf{X}^* = \mathbf{X}\mathbf{P}$  [ $\mathbf{P}$  is  $m$  by  $m$ ]

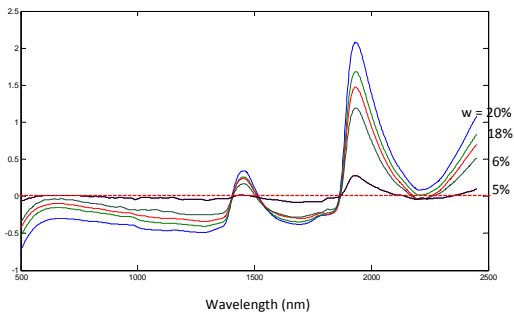
$\mathbf{Q}$  is the projection of the not useful part (influenced by moisture) of the spectra:  $\mathbf{X}^* = \mathbf{X}\mathbf{Q}$

$\mathbf{R}$  is the residual

## EPO

- To obtain  $\mathbf{X}^* = \mathbf{X}(\mathbf{P})$
- $\mathbf{P} = \mathbf{I} - \mathbf{Q}$  ( $m$  by  $m$  symmetric matrix)
- $\mathbf{Q}$  can be estimated from a matrix of difference spectra  $\mathbf{D}$  ( $n$  by  $m$ )
- $\mathbf{D} = \mathbf{X}_{\text{dry}} - \mathbf{X}_{\text{moist}}$
- $\mathbf{Q} = \mathbf{G}\mathbf{G}^T$  ( $\mathbf{G}$  is  $n$  by  $m$ )
- $\mathbf{G}$  is estimated by the  $c$  Principal Components of  $\mathbf{D}$

### Difference spectra (with air-dried)

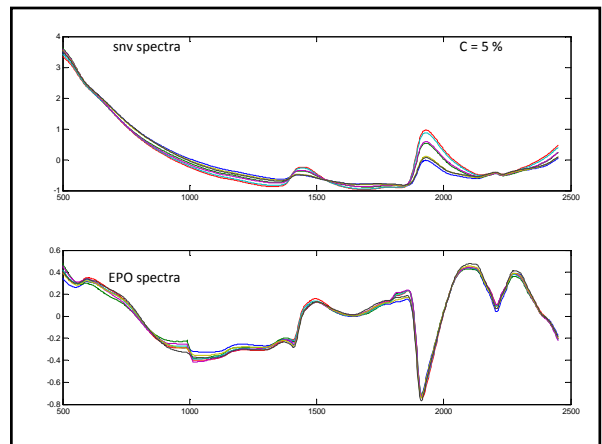
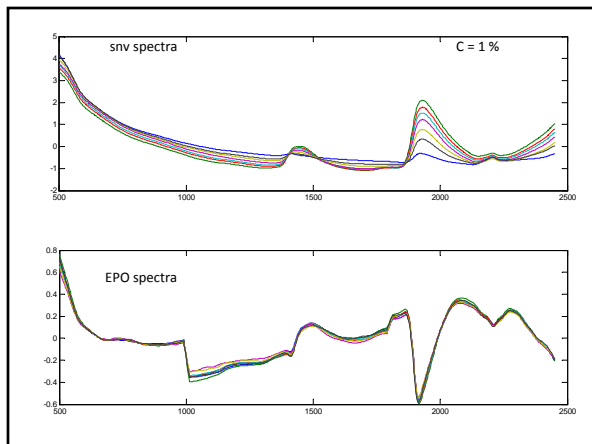
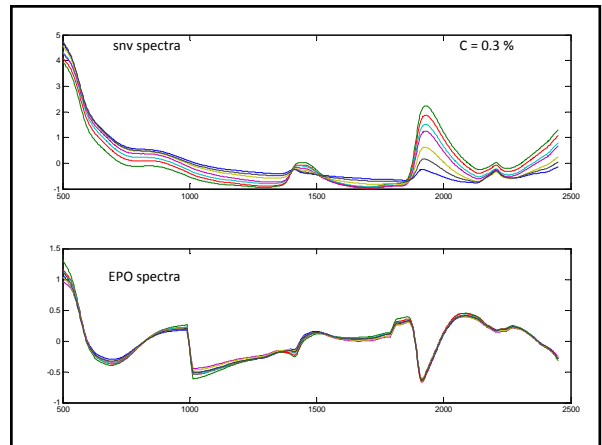
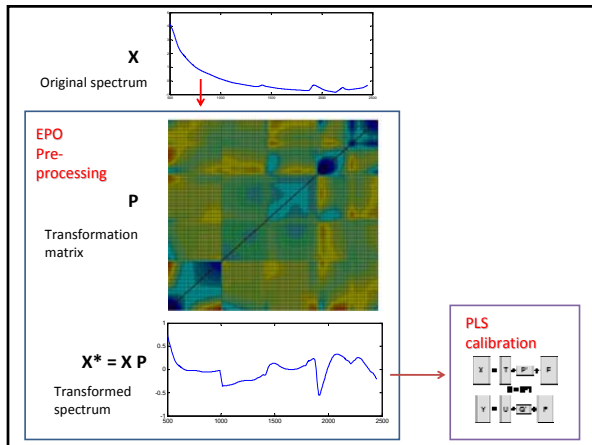


### Calibration strategy

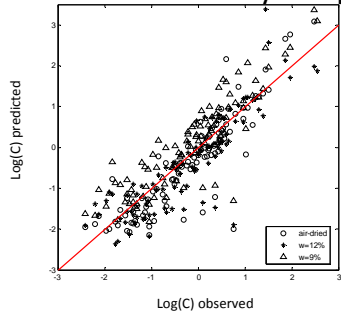
**EPO Development Dataset**  
 Contain spectra of soil under various field conditions (varying moisture) and  
 Spectra at standard moisture condition (air-dried)  
 $n = 60-100$   
 SPECTRA -> EPO Spectra

**Validation dataset**  
 Contain measured SOC and spectra of soil under various moisture conditions  
 SPECTRA -> EPO -> APPLY PLS  
 $n \sim 20-100$

**Model calibration Dataset**  
 Contain measured SOC and spectra of soil under standard moisture condition (e.g at air-dried)  
 SPECTRA -> EPO -> DEVELOP e.g. PLS  
 $n > 200$

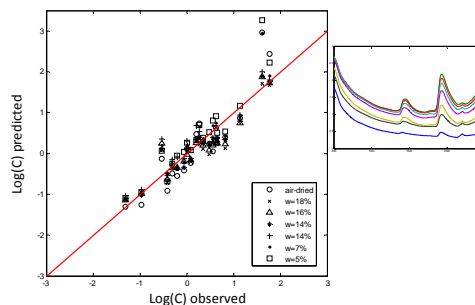


### Perform PLS on transformed spectra PLS calibrated on dry samples



EPO development data, 100 samples

### Prediction on independent samples (20 samples, each with 7 different moisture content)



## Conclusions

- This first experiment shows a practicable and robust method to predict soil organic carbon independent of (field) moisture content.
- Pre-processing the data with the EPO method allows removal of the moisture effect, to a large degree, which improves the quality of the prediction model.
- We propose 3 independent datasets for the field NIR calibration procedure:
  - The calibration dataset
  - The EPO development dataset
  - The validation dataset
- We need to further investigate the effect of the EPO spectral transformation on the prediction of other soil properties.

- Budiman Minasny, Alex. B. McBratney, Veronique Bellon-Maurel, Jean-Michel Roger, Alexia Gobrecht, Laure Ferrand, Samuel Joalland. **Removing the effect of soil moisture from NIR diffuse reflectance spectra for the prediction of soil carbon.** *Geoderma* (Submitted)

## Acknowledgment

- This work is part of project INCA (in-field estimation carbon) funded by Le Ministère de l'Écologie, du Développement durable, des Transports et du Logement through its GESSOL (Gestion Durable des Sols) program.

