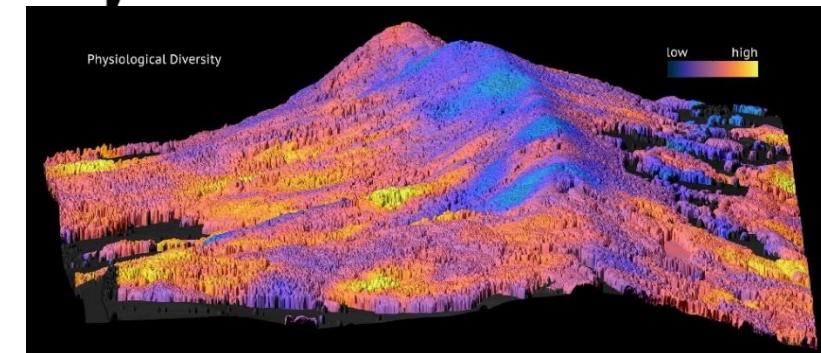


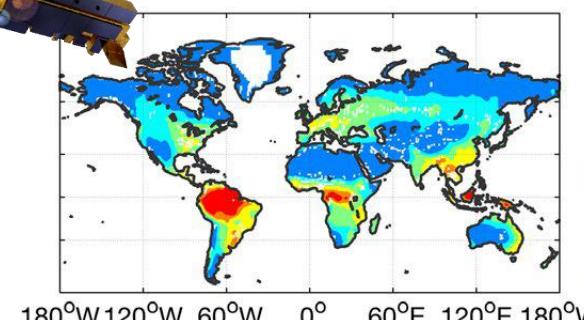


Disentangling the biological information and measurement uncertainties from field spectral reflectance of beech leaves

Fanny Petibon, Ewa A. Czyż, Giulia Ghielmetti, Andreas Hueni, Mathias Kneubühler, Michael E. Schaepman, Meredith C. Schuman

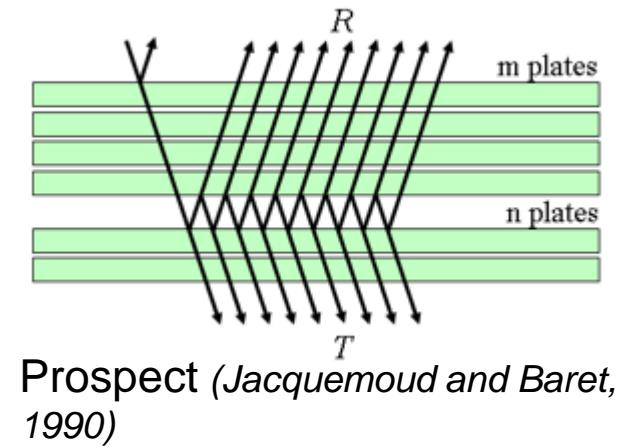


(Schneider et al., 2017)

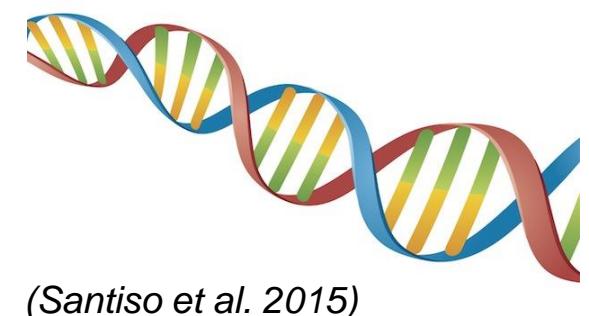


(Luo et al., 2019)

Calibration



Direct application

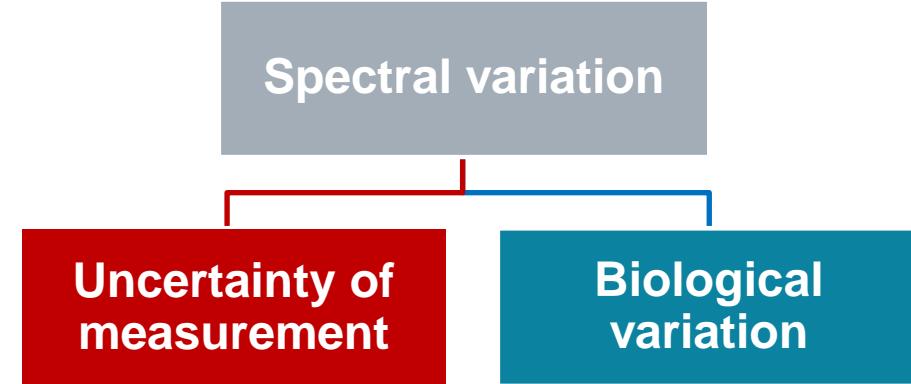
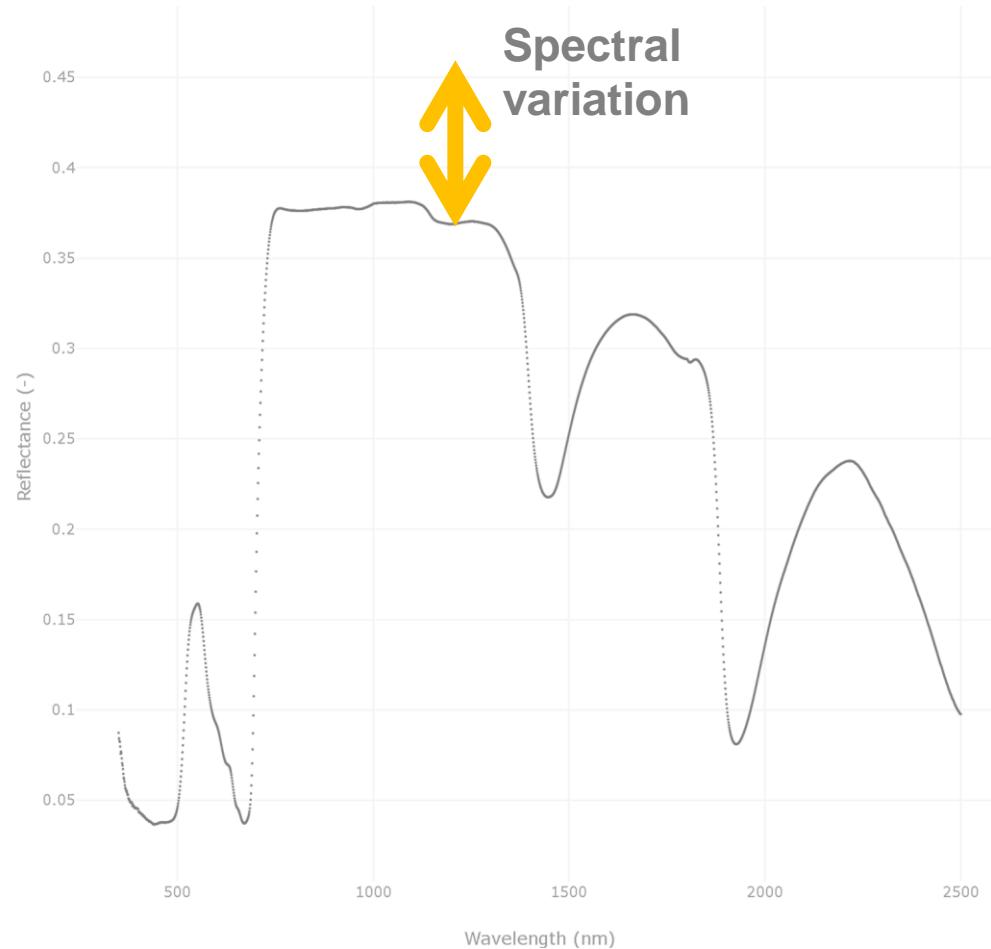


(Santiso et al. 2015)

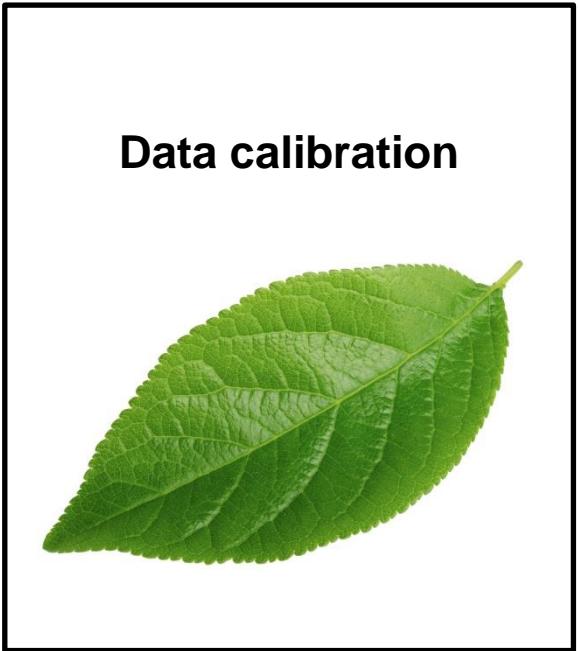
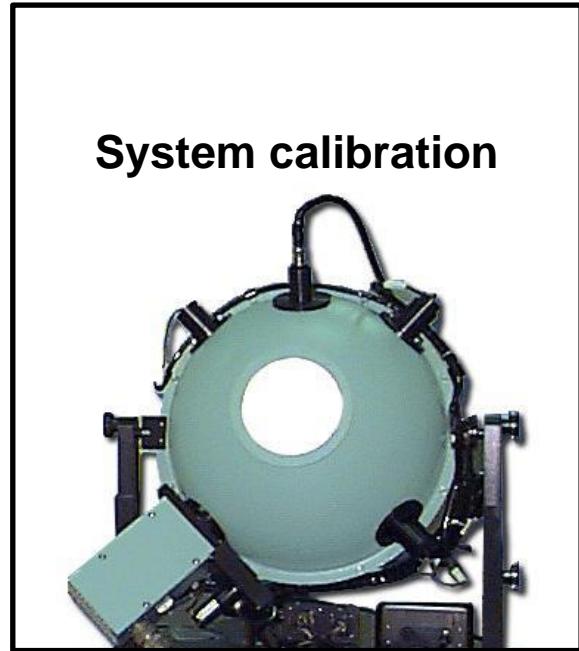
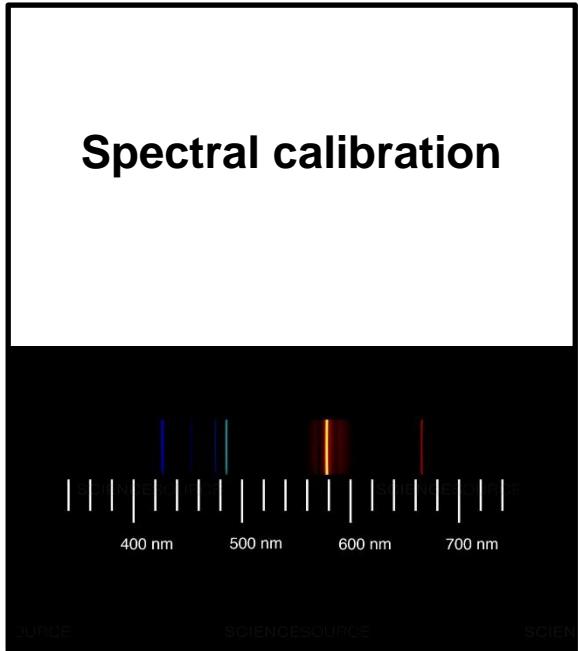


Spectral variation =

Biological variation + uncertainty of measurement



Spectral data calibration



Data calibration



Digital Number

Radiance

$Wm^{-2}sr^2nm^{-1}$

Reflectance

f(sensor,
light source,
surface material)

f(light source,
surface material)

f(surface material)



Uncertainty?

(Petibon et al., 2021)

Research questions

1. What are the **sources of uncertainty** in LOP measurements?
2. To which extent does **uncertainty** of measurement **contribute to the spectral variation?**
3. Do LOP measurements permit the **detection of biological variation** (e.g. species traits)?



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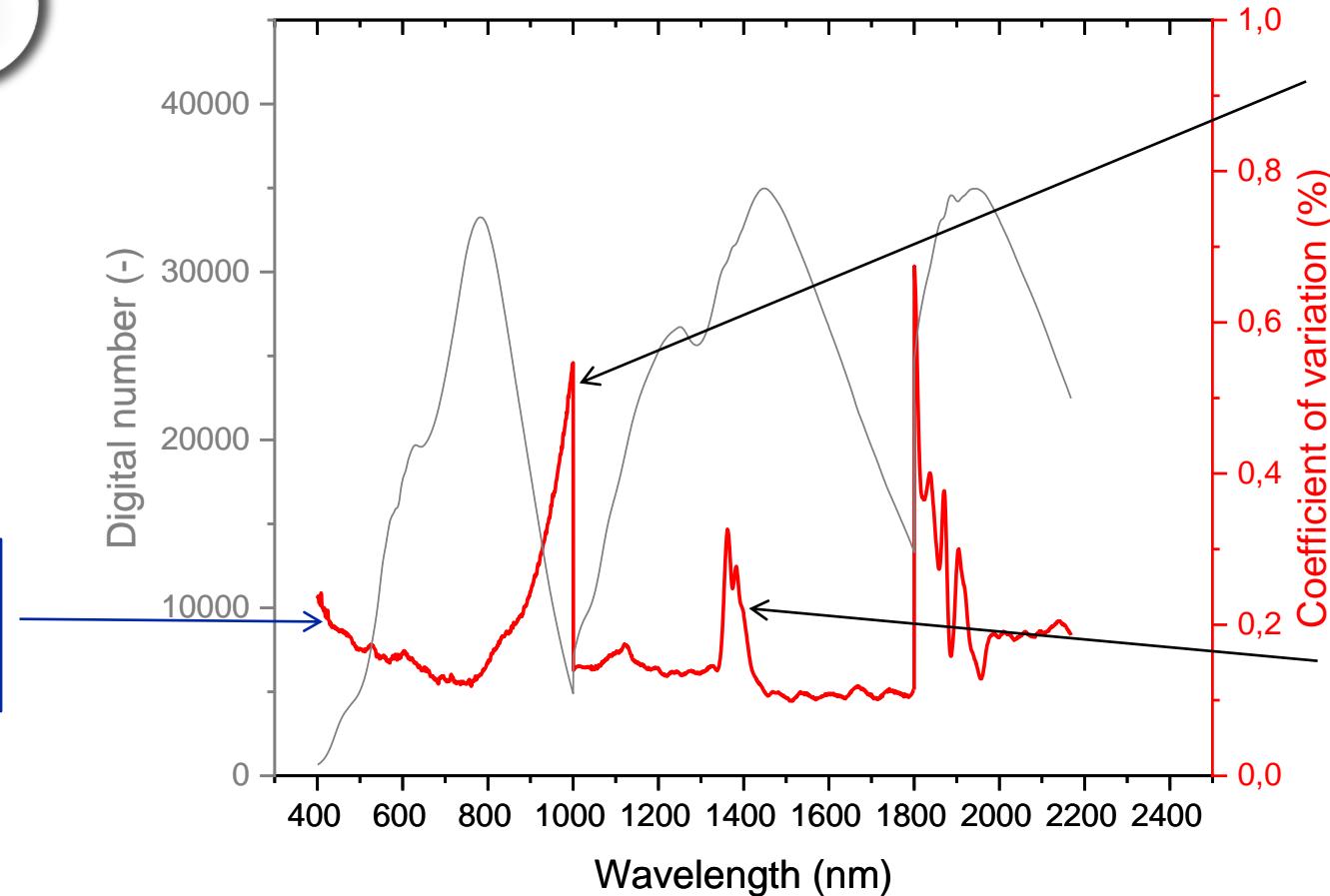
Department of Geography

1. What are the sources of uncertainty in LOP measurements?

The **uncertainty of measurement** depends on the characteristics of **optical sensor** and **experimental conditions**



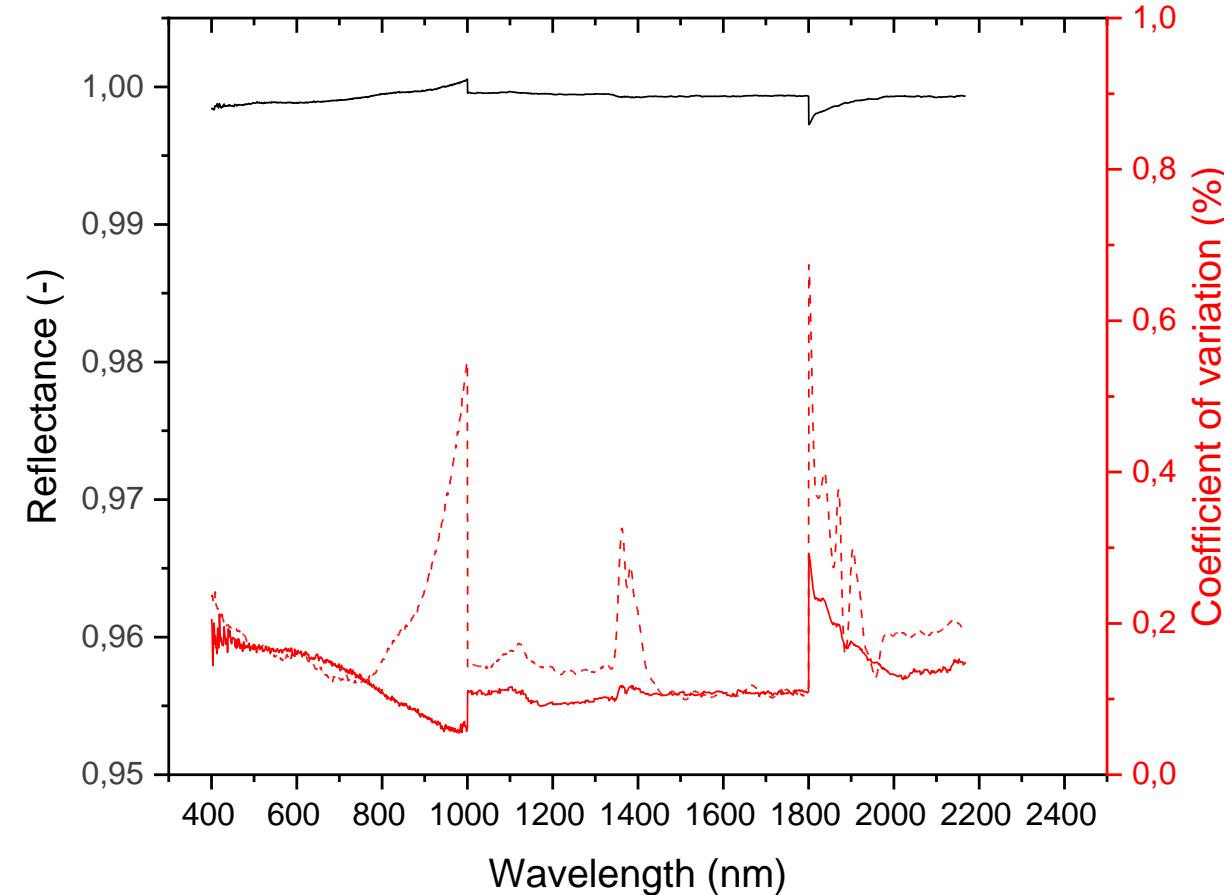
Detector sensitivity



Detector response
to temperature

atmospheric
moisture

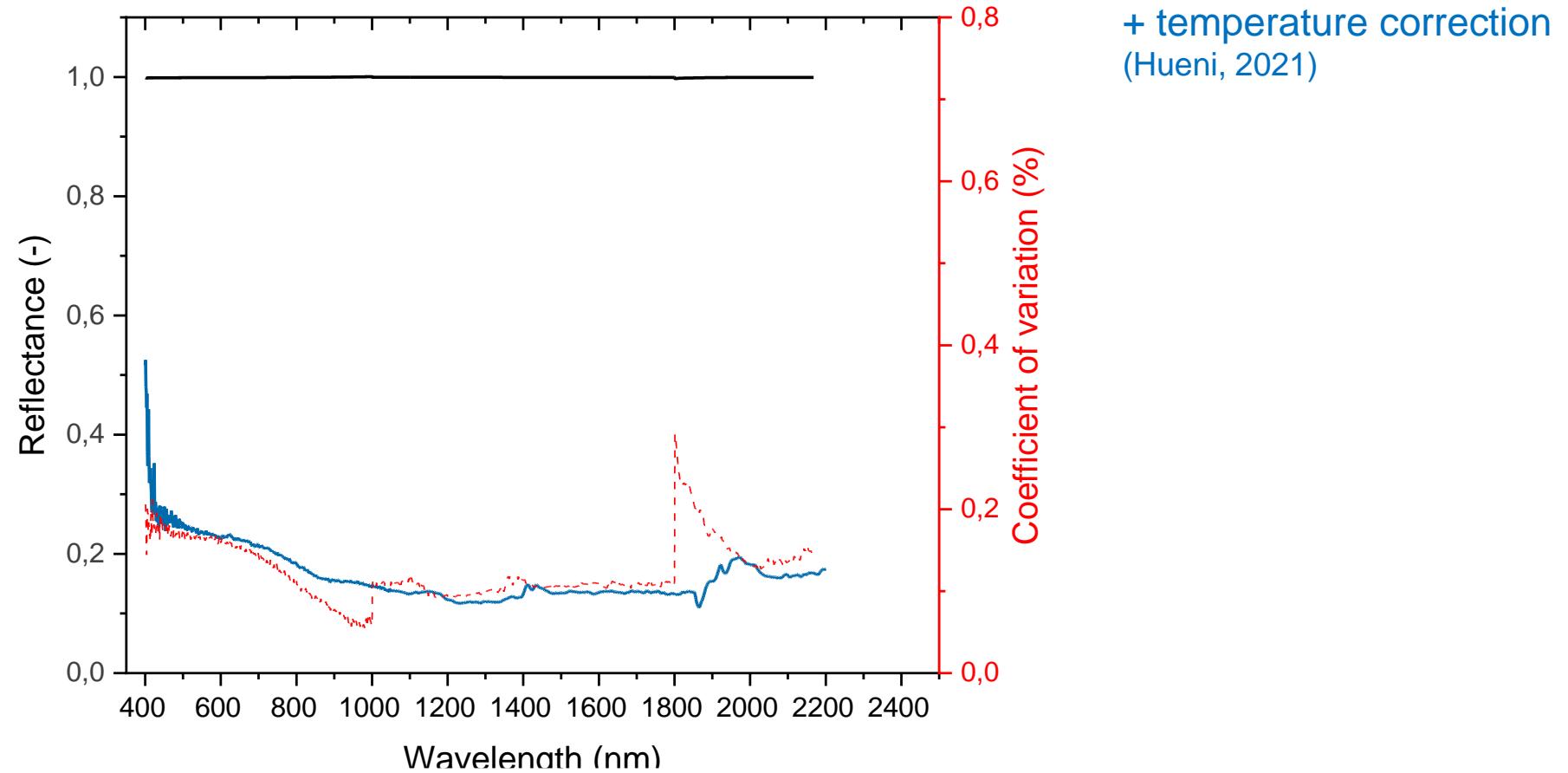
The **uncertainty of measurement** depends on the characteristics of **optical sensor** and **experimental conditions**



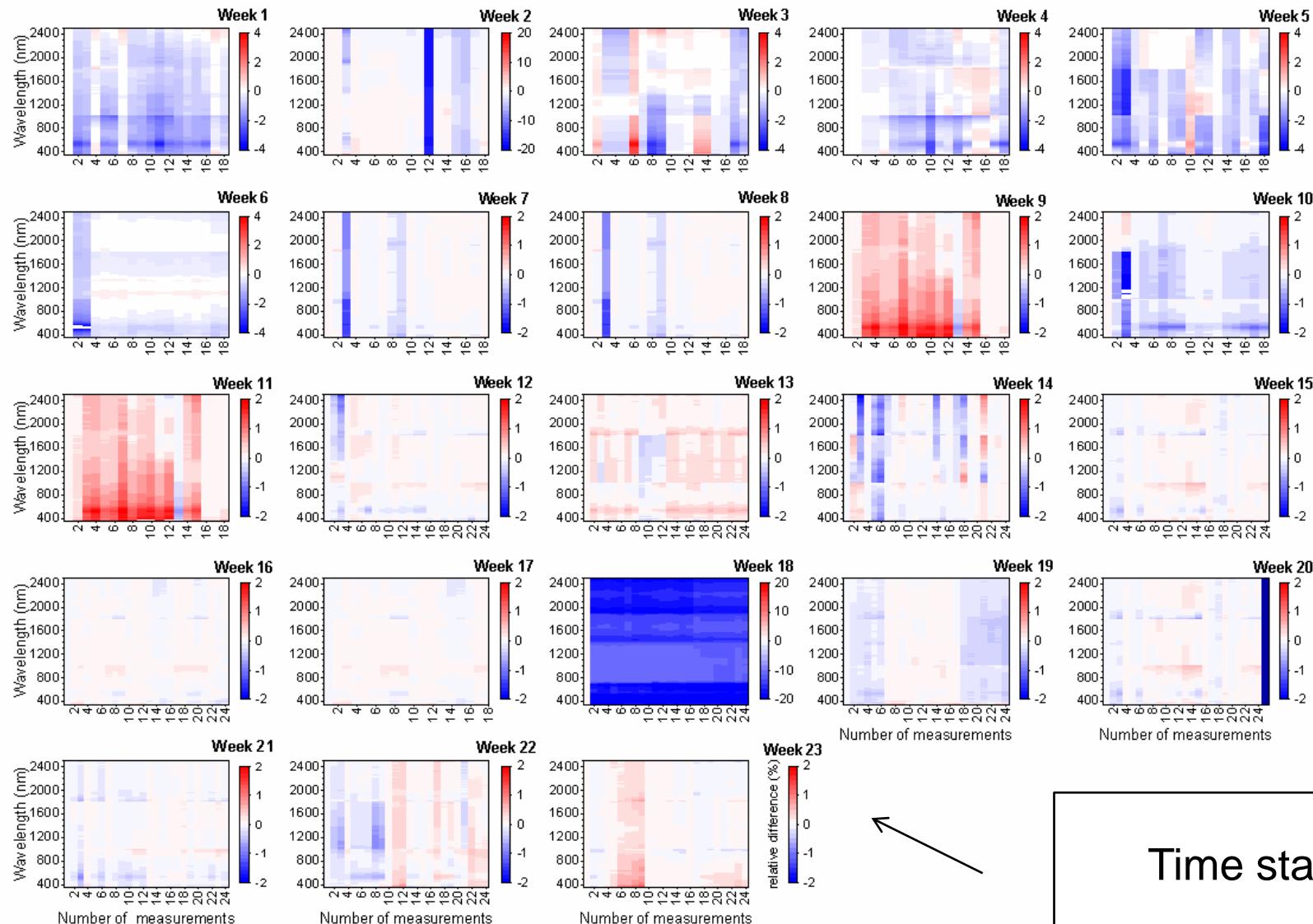
White reference
Coefficient of variation

— Reflectance
- - - DN
— Reflectance

The **uncertainty of measurement** depends on
the characteristics of **optical sensor** and **experimental conditions**



The **uncertainty of measurement** depends on the characteristics of **optical sensor** and **experimental conditions**



Time stability



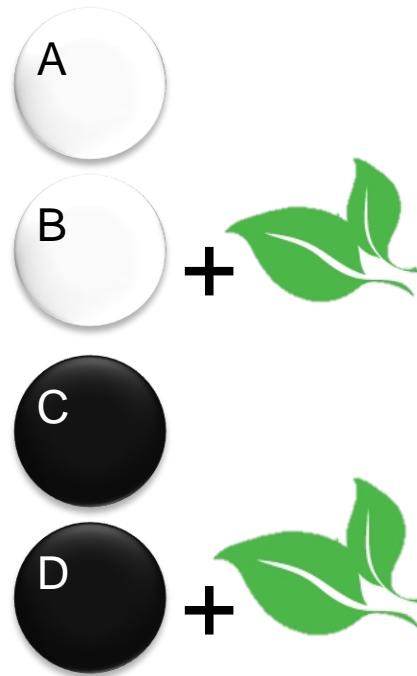
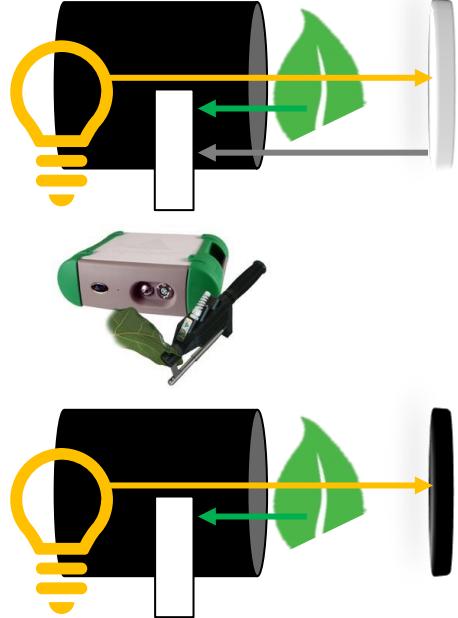
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1. Estimating the measurement uncertainty

Method

Uncertainty of measurement was estimated by **uncertainty budget**



Reflectance (eq.1)

$$R = \frac{A * D - C * B}{A - C}$$

Absolute uncertainty: Law of propagation (eq.3)

$$U_{R,abs}^2 = \sum_{i=1}^n \left(\frac{\partial R}{\partial x_i} \right)^2 * U_{x_i}^2, \text{ with } U_{x_i} = \frac{STD_{x_i}}{\sqrt{N}}$$

Relative uncertainty (eq.2)

$$U_{R,rel} = 100 * \frac{U_{R,abs}}{R_{MEAN}} (\%)$$

Spectral variation was approximated by the **coefficient of variation**

$$CV = 100 * \frac{R_{STD}}{R_{MEAN}} (\%) \quad (eq.3)$$

Biological variation was approximated by (eq. 4) $BV = CV - U_{R,rel}$

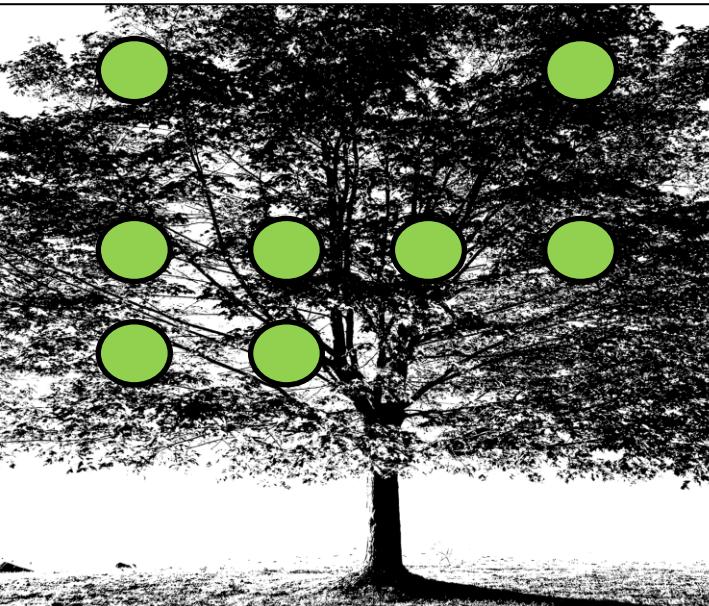
Datasets



DATASET 1: Standard materials

- Sources of uncertainty

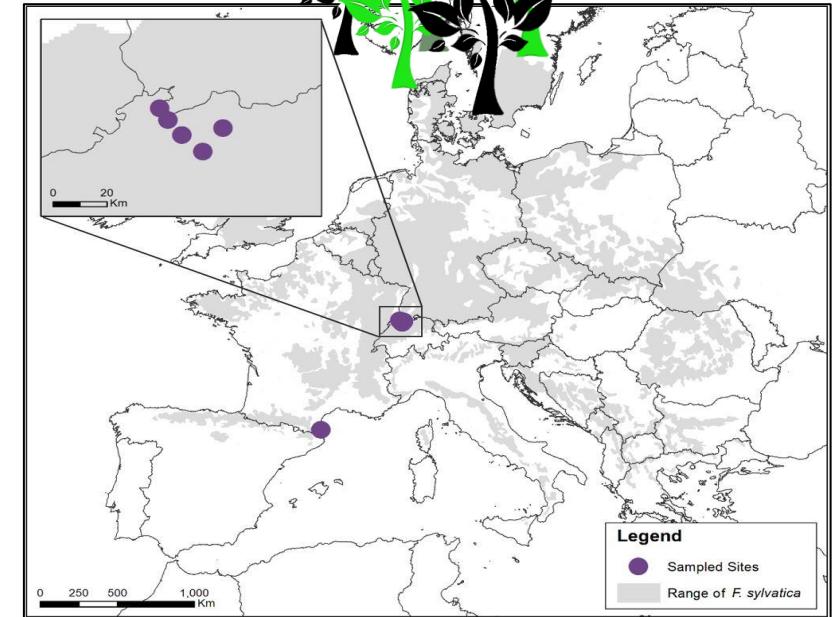
4 materials with diverse optical properties



DATASET 2: *Fagus sylvatica* individual

- Variation within an individual

28 sampling weeks

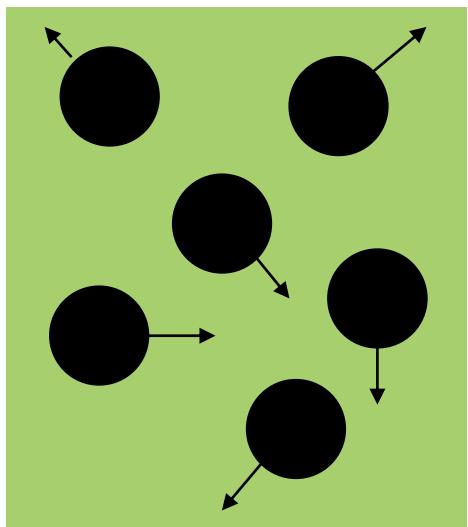


DATASET 3: *Fagus sylvatica* forest

- Variation between individuals

6 forest sites

Measurement protocol

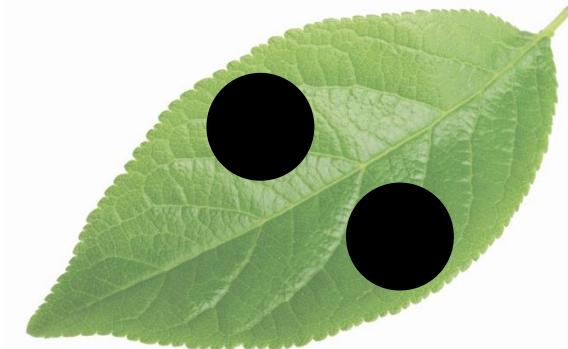


Uncertainty 1
 $n = 1$ measurement

→ 10 readings
→ 30 scans

Uncertainty 2
 $n = 6$ measurements

Non-biological variation = 0



Uncertainty 1
 $n = 1$ measurement

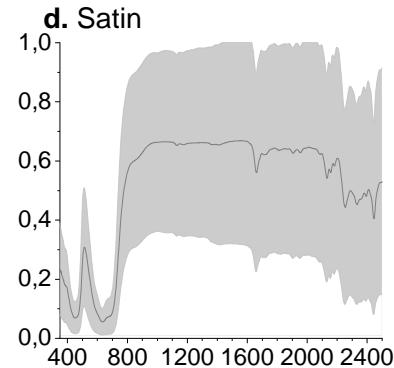
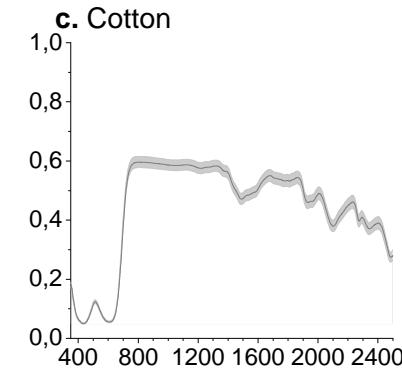
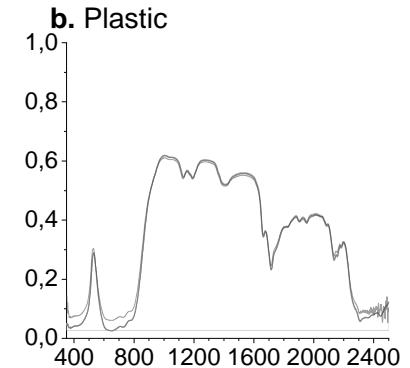
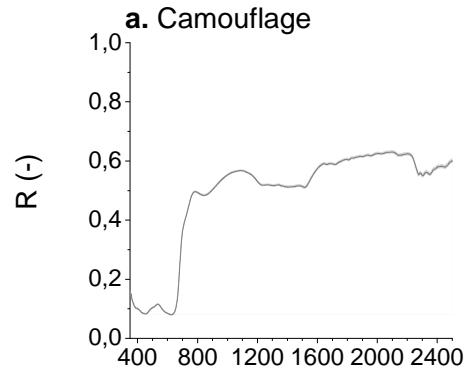
→ 10 readings
→ 30 scans



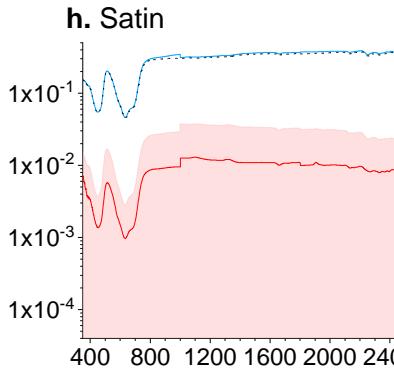
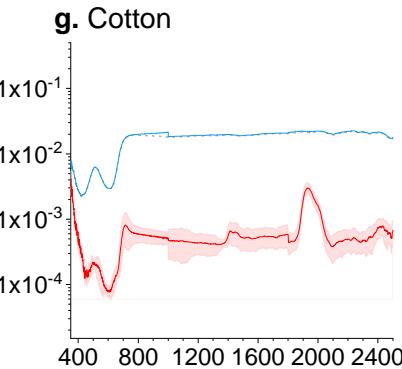
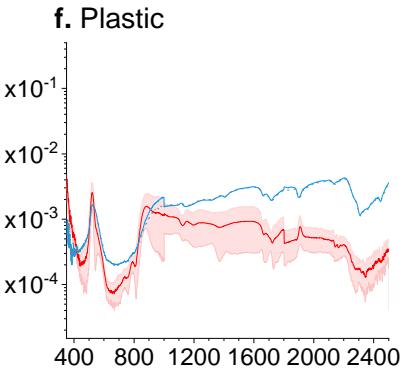
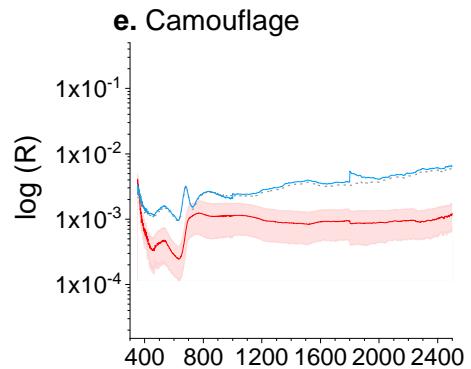
The
uncertainty
depends on the
optical
properties of
the target.



Material reflectance - Leaf clip & Integrating sphere



Absolute uncertainty - Leaf clip



Single measurements



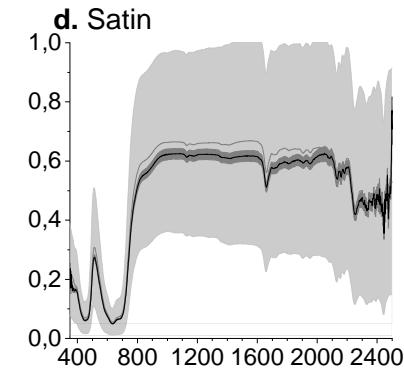
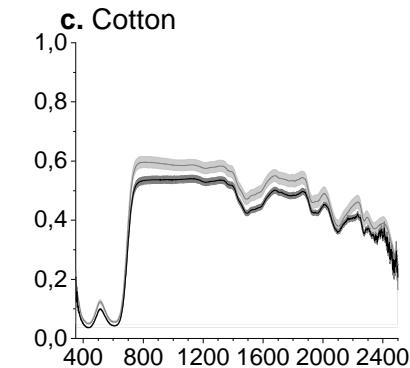
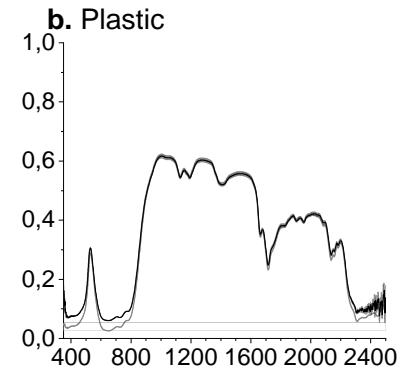
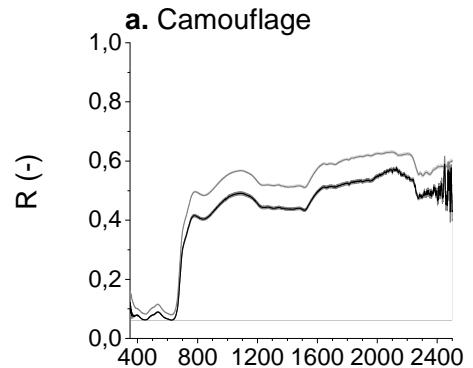
Repeated measurements (n=6)



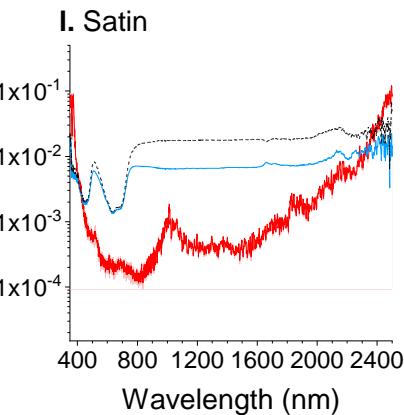
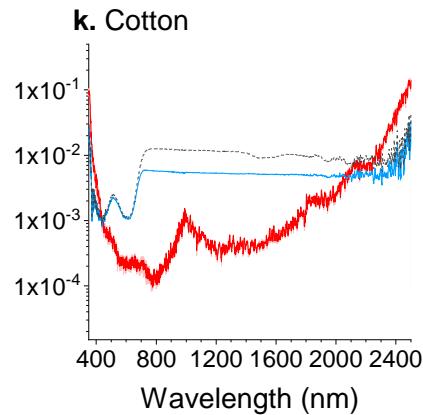
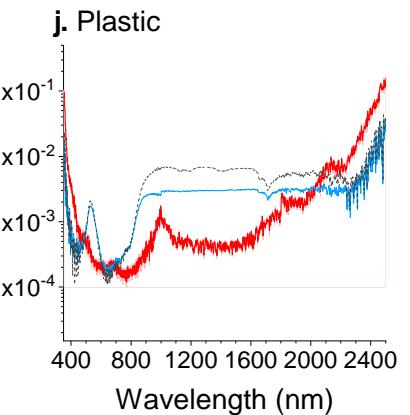
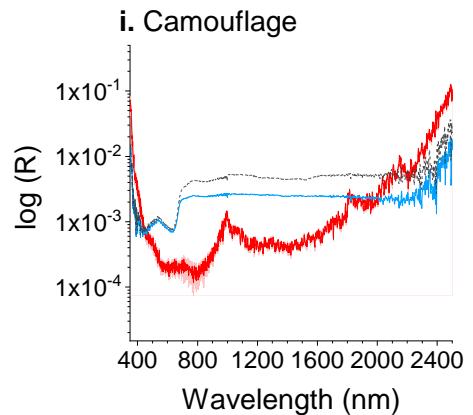
The
uncertainty
depends on the
sampling
probes.



Material reflectance - Leaf clip & Integrating sphere



Absolute uncertainty - Integrating sphere



Single
measurements

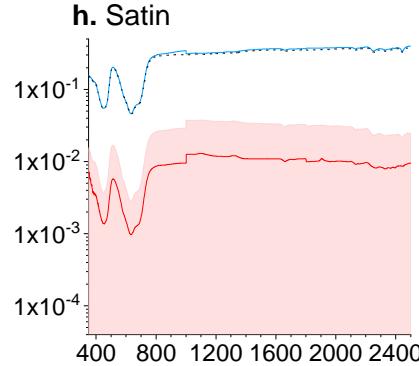
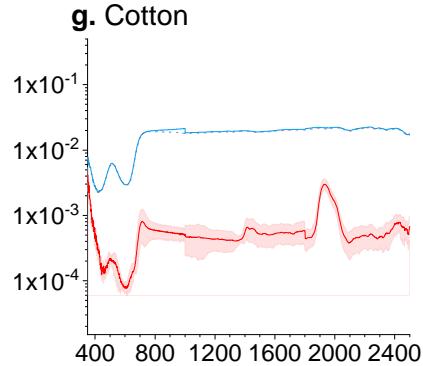
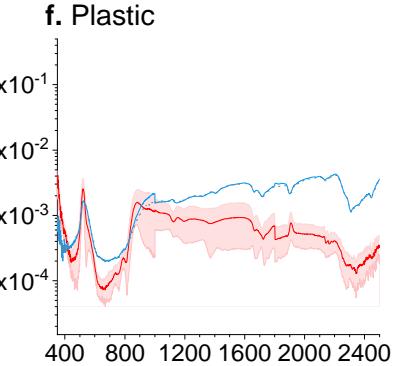
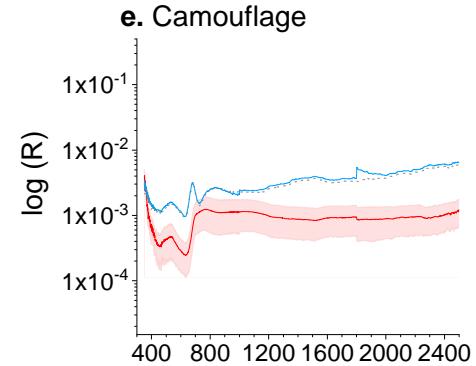


Repeated
measurements (n=6)

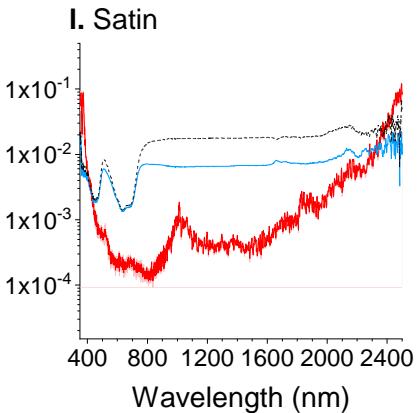
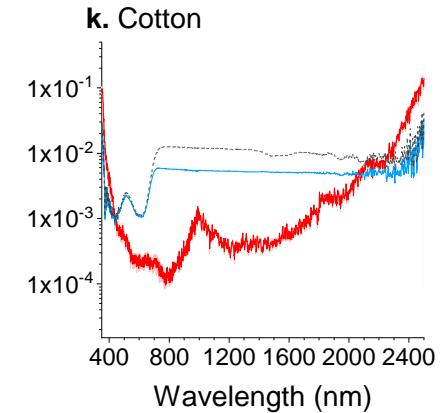
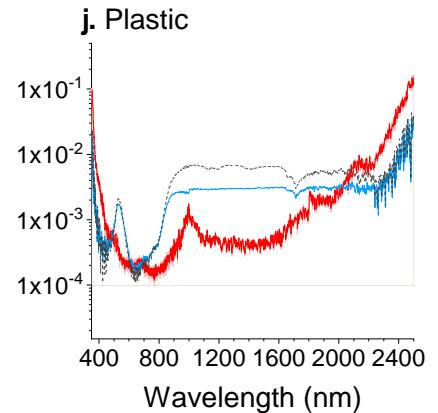
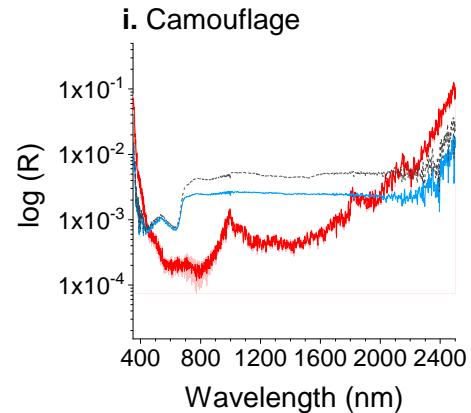




Absolute uncertainty - Leaf clip



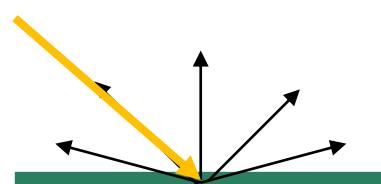
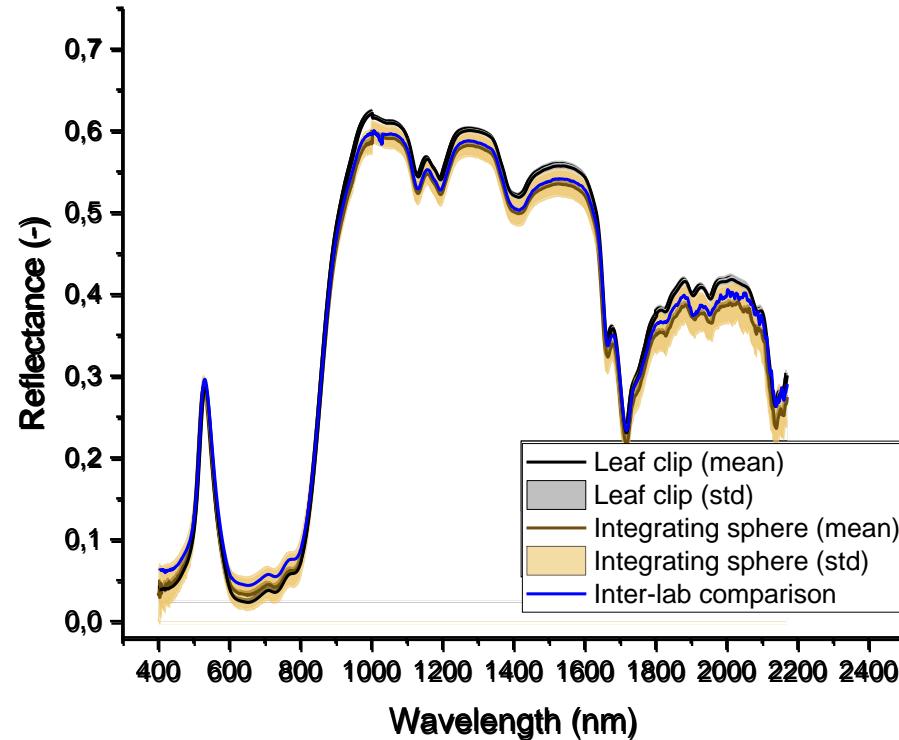
Absolute uncertainty - Integrating sphere



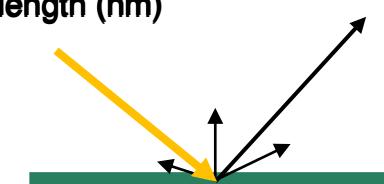
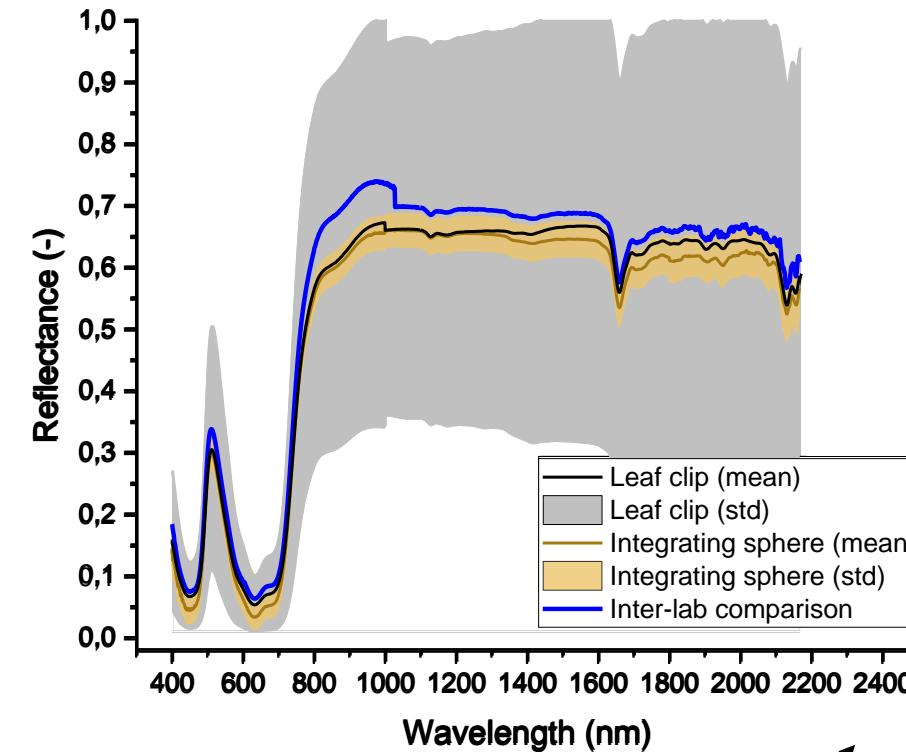
Single measurements

Repeated measurements (n=6)

The **uncertainty** is specific to one spectroradiometer and measurement protocol.



Isotropic



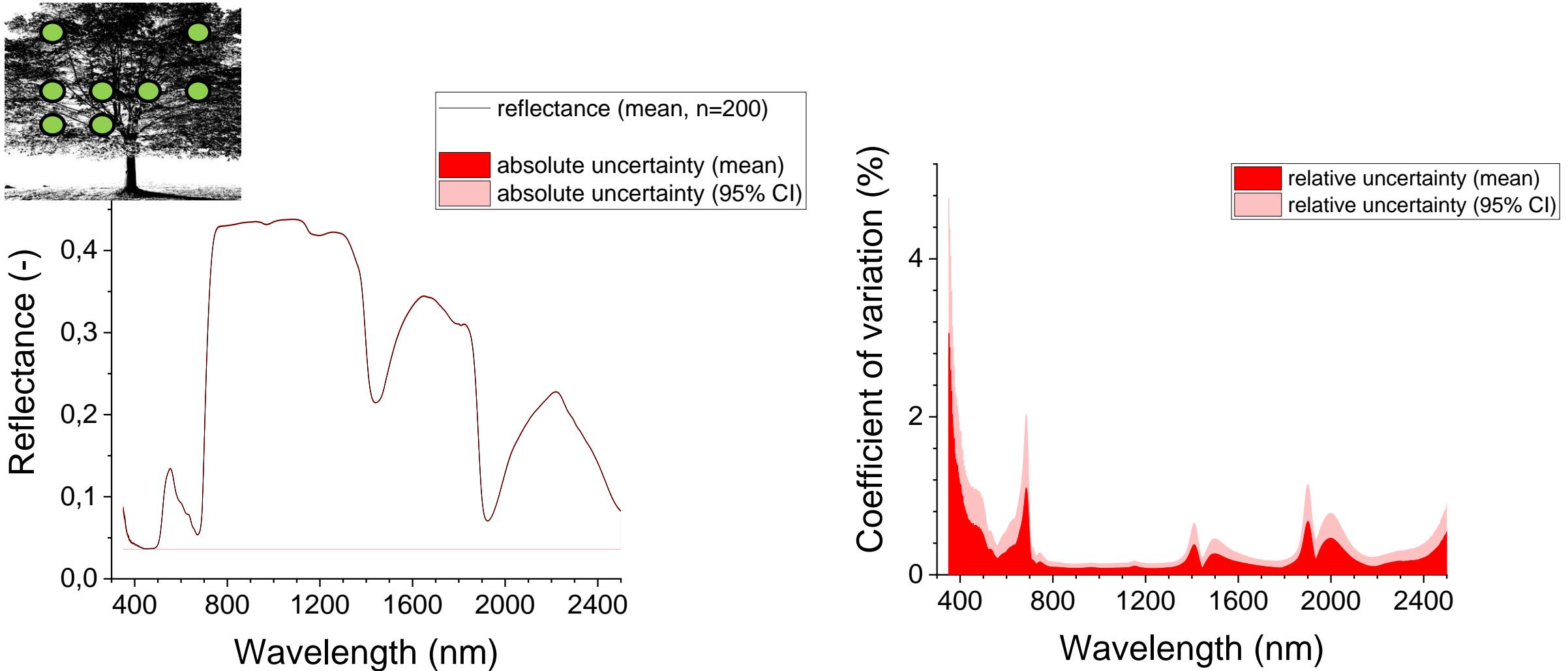
Anisotropic

n=15
laboratories

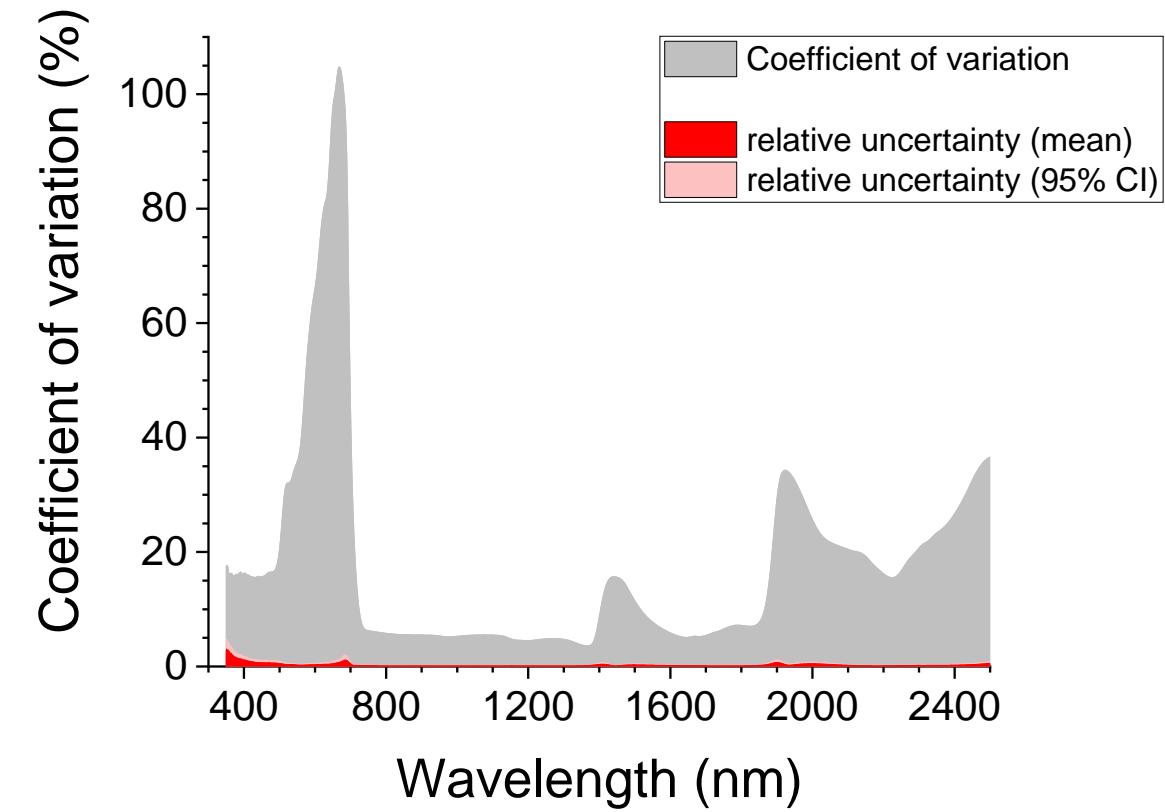
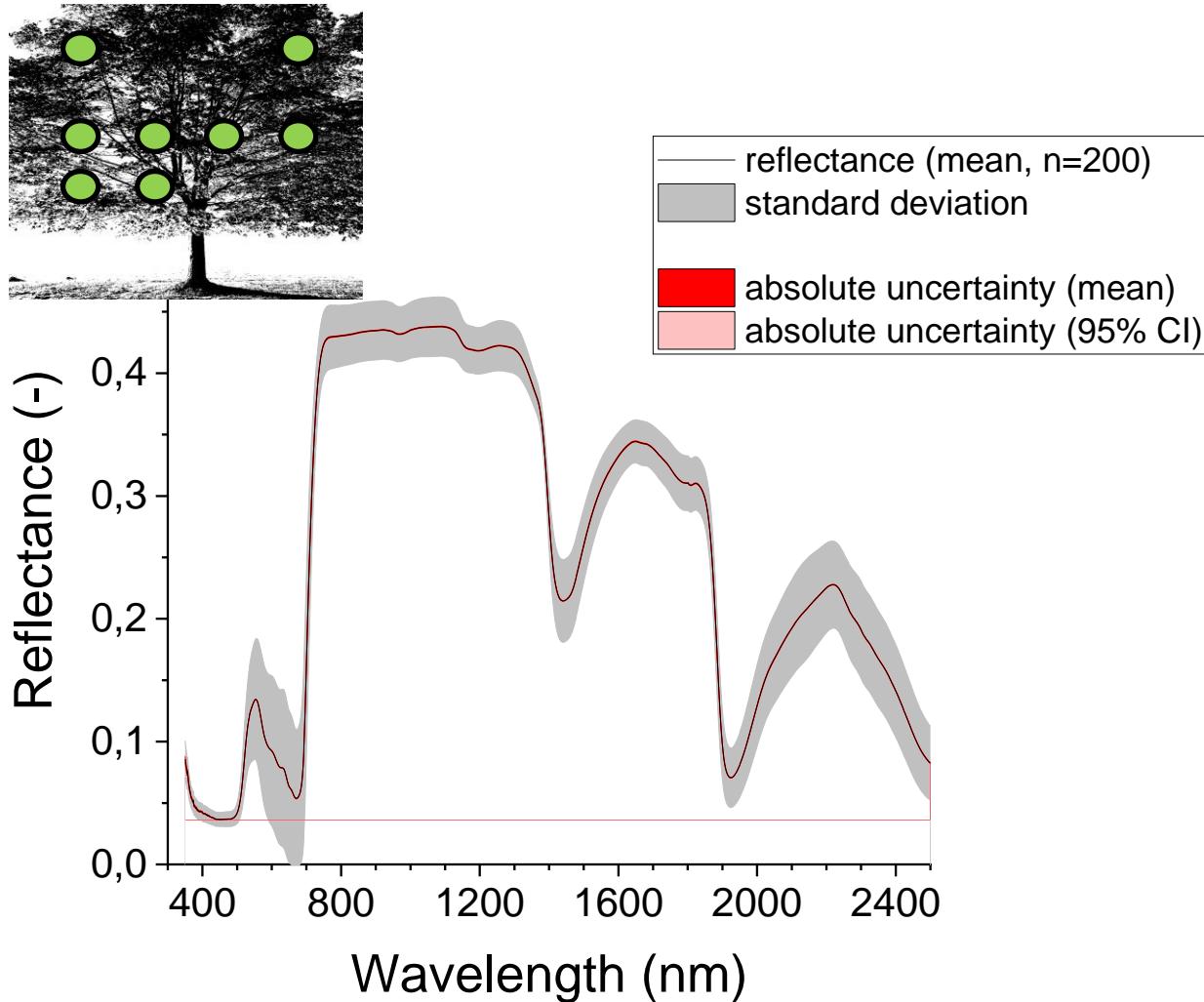


2. To which extent does uncertainty of measurement contribute to the spectral variation?

The **uncertainty** associated with LOP represents **0.3 - 4 %** of reflectance



The **uncertainty** associated with **LOP** represents **2 - 25 %** of spectral variation



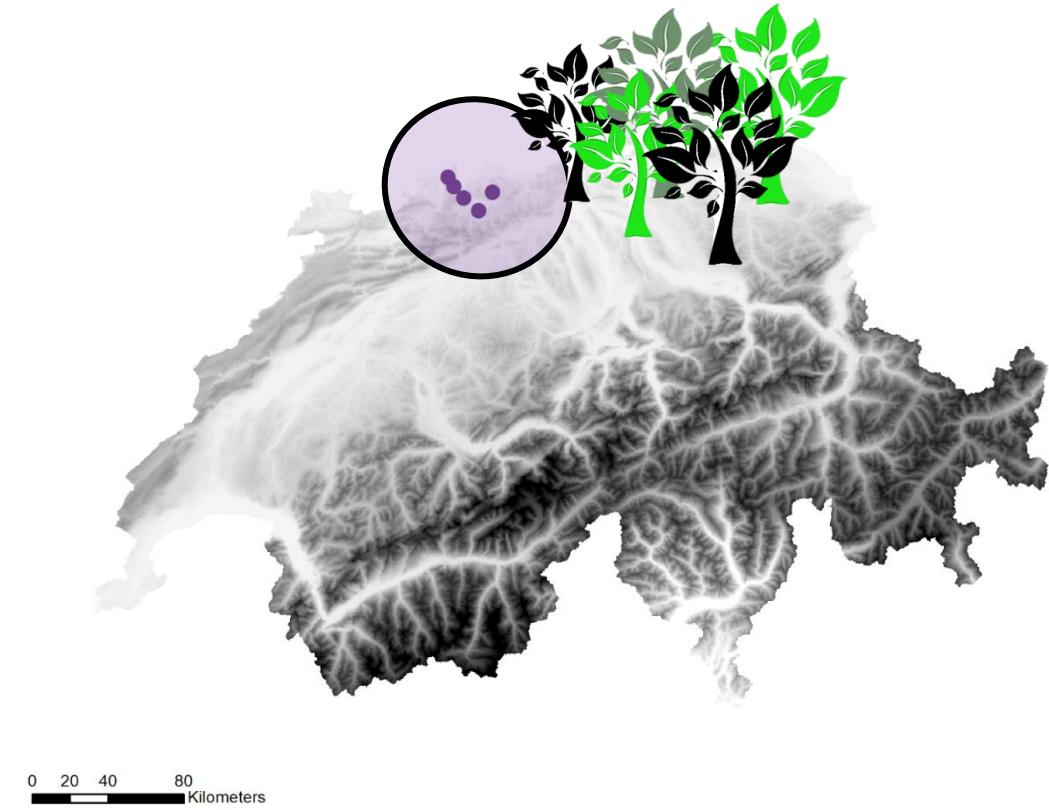
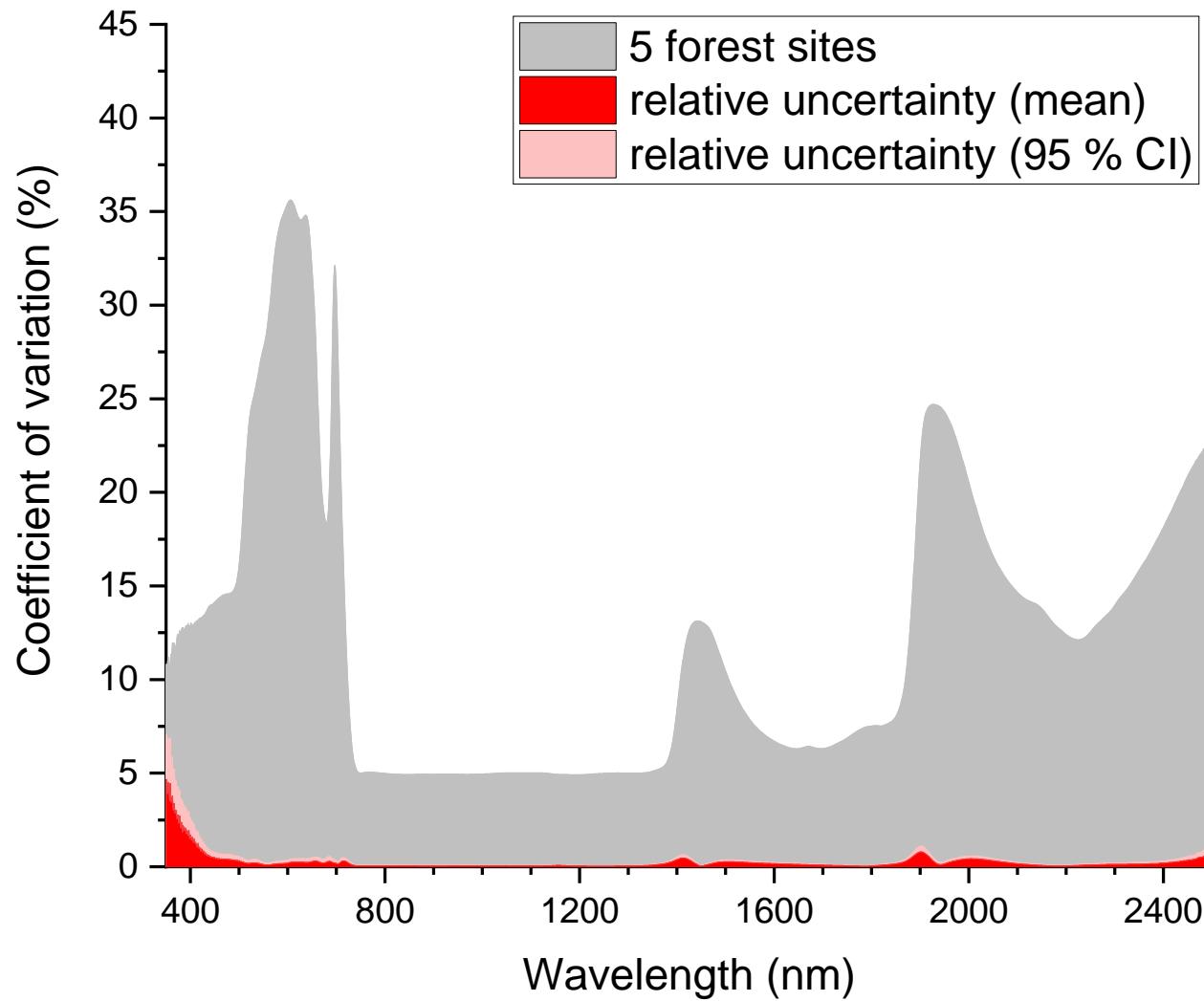


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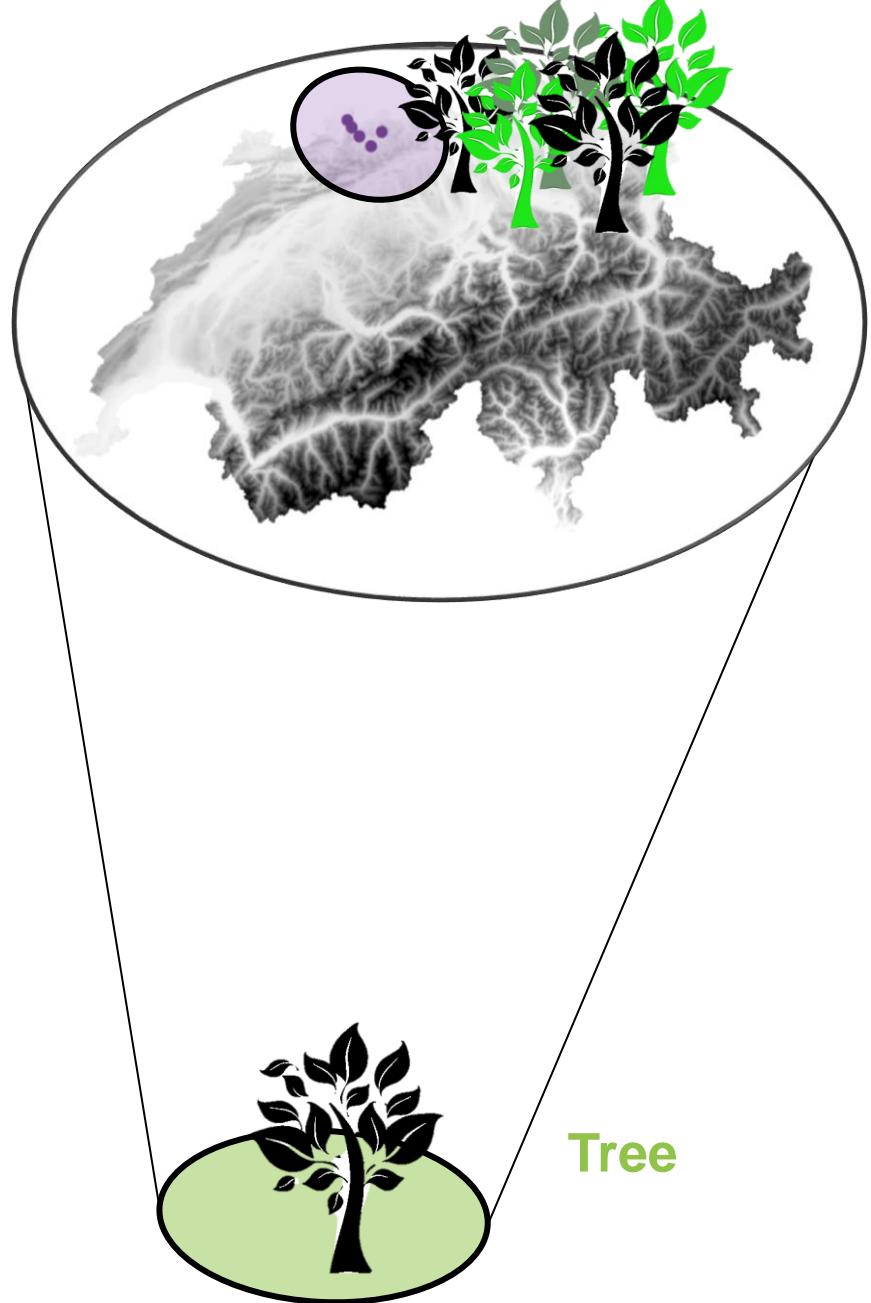
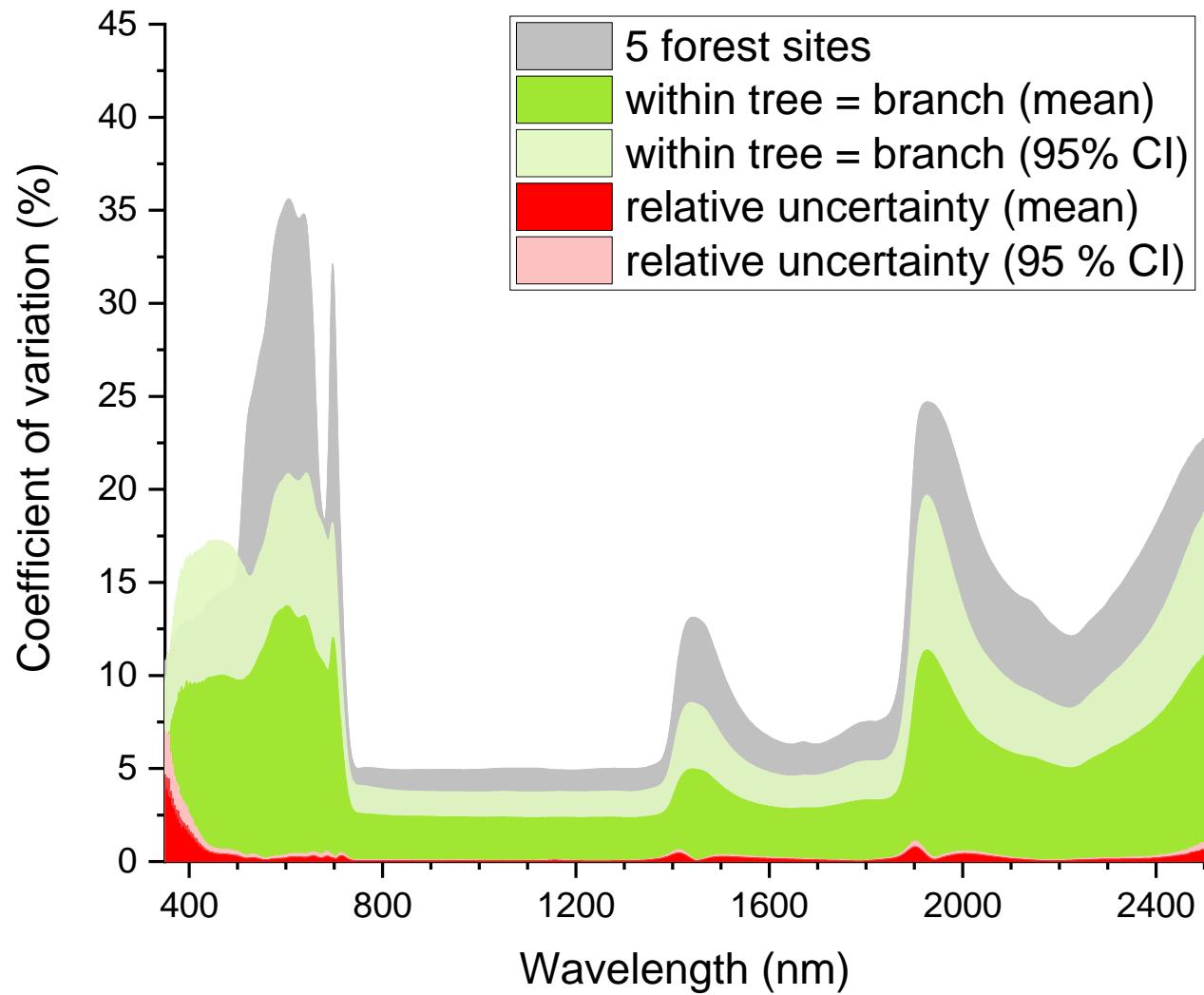
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3. Do LOP measurements permit the detection of biological variation?

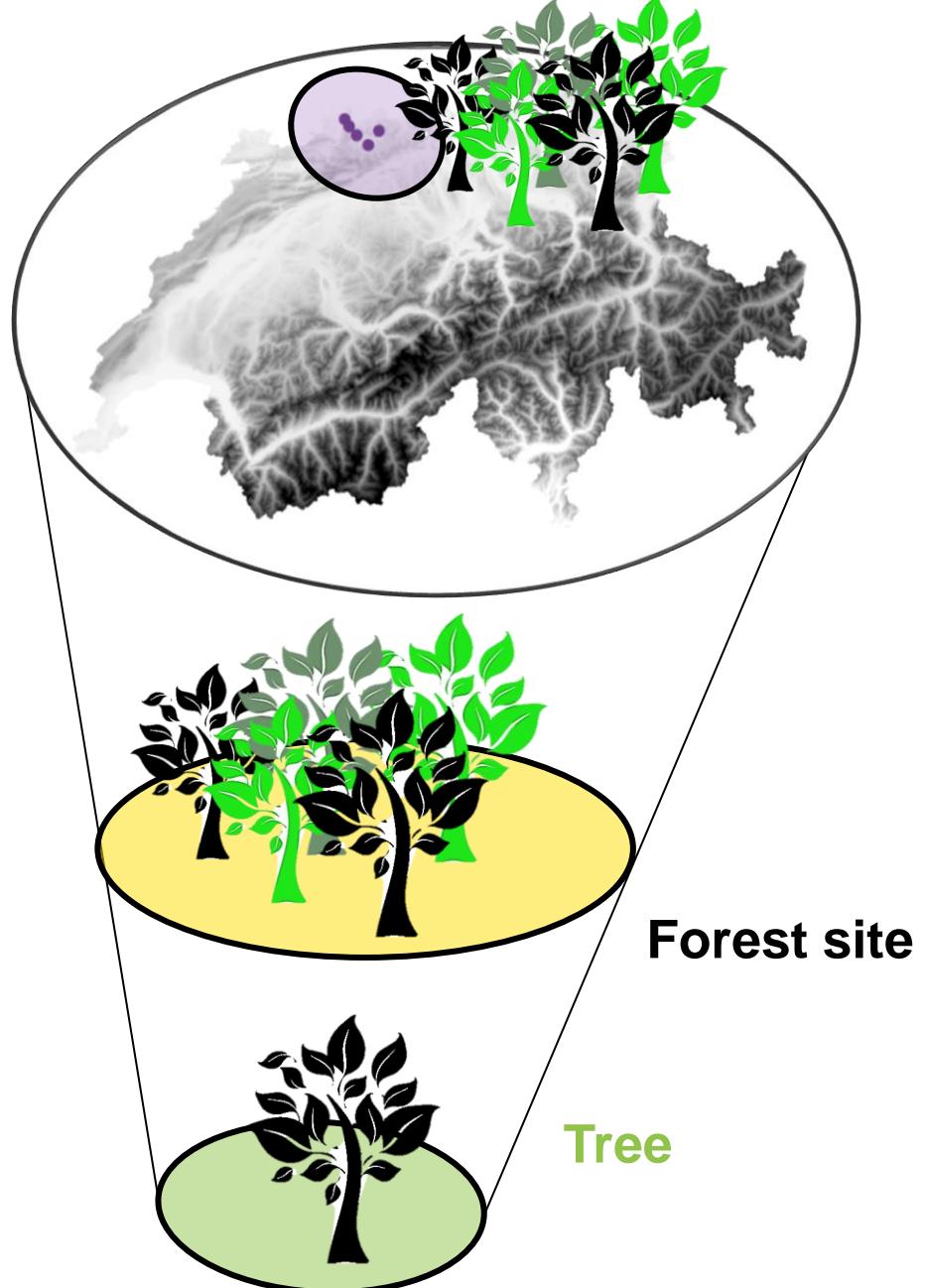
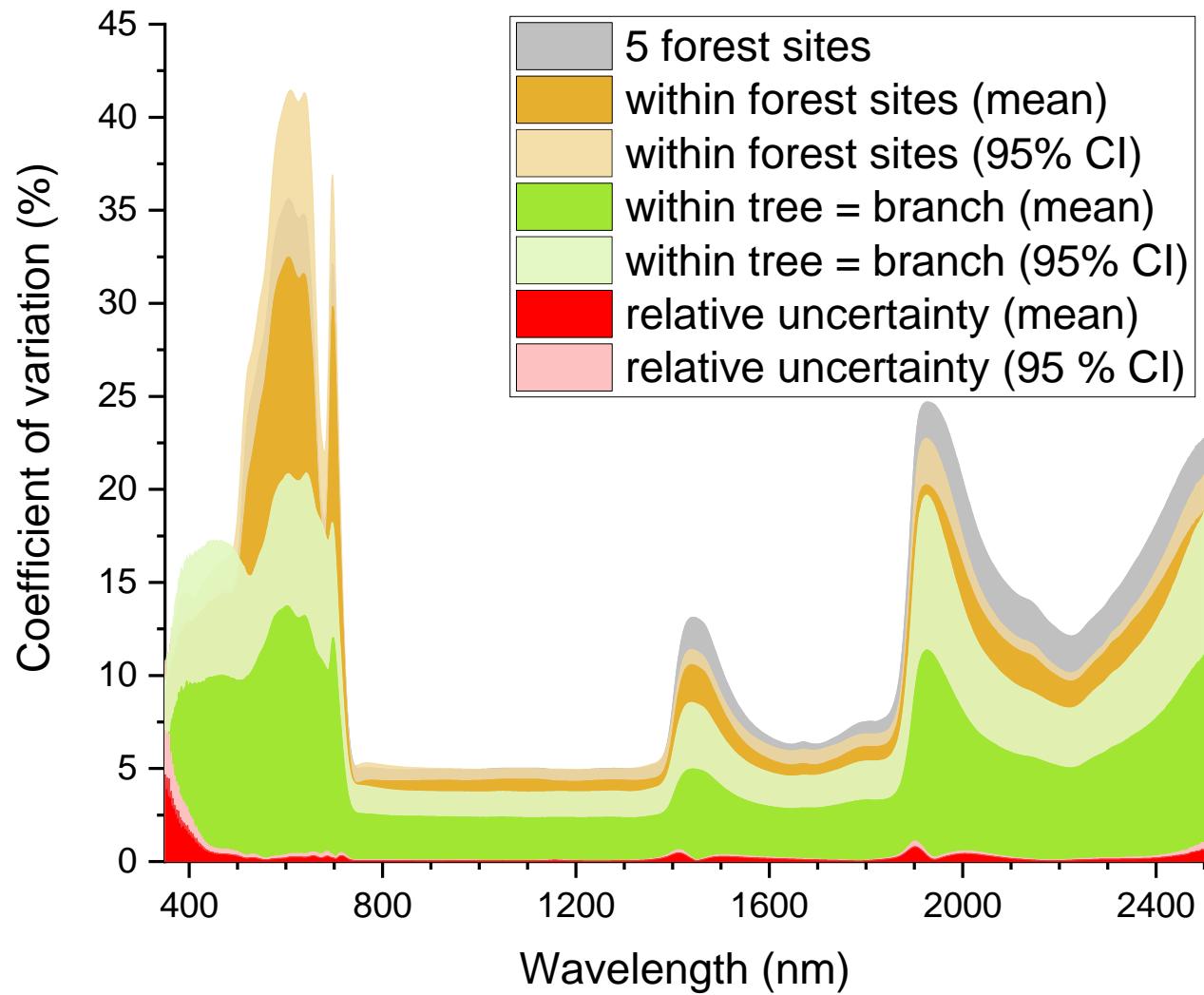
The **biological variation** in Swiss forest sites



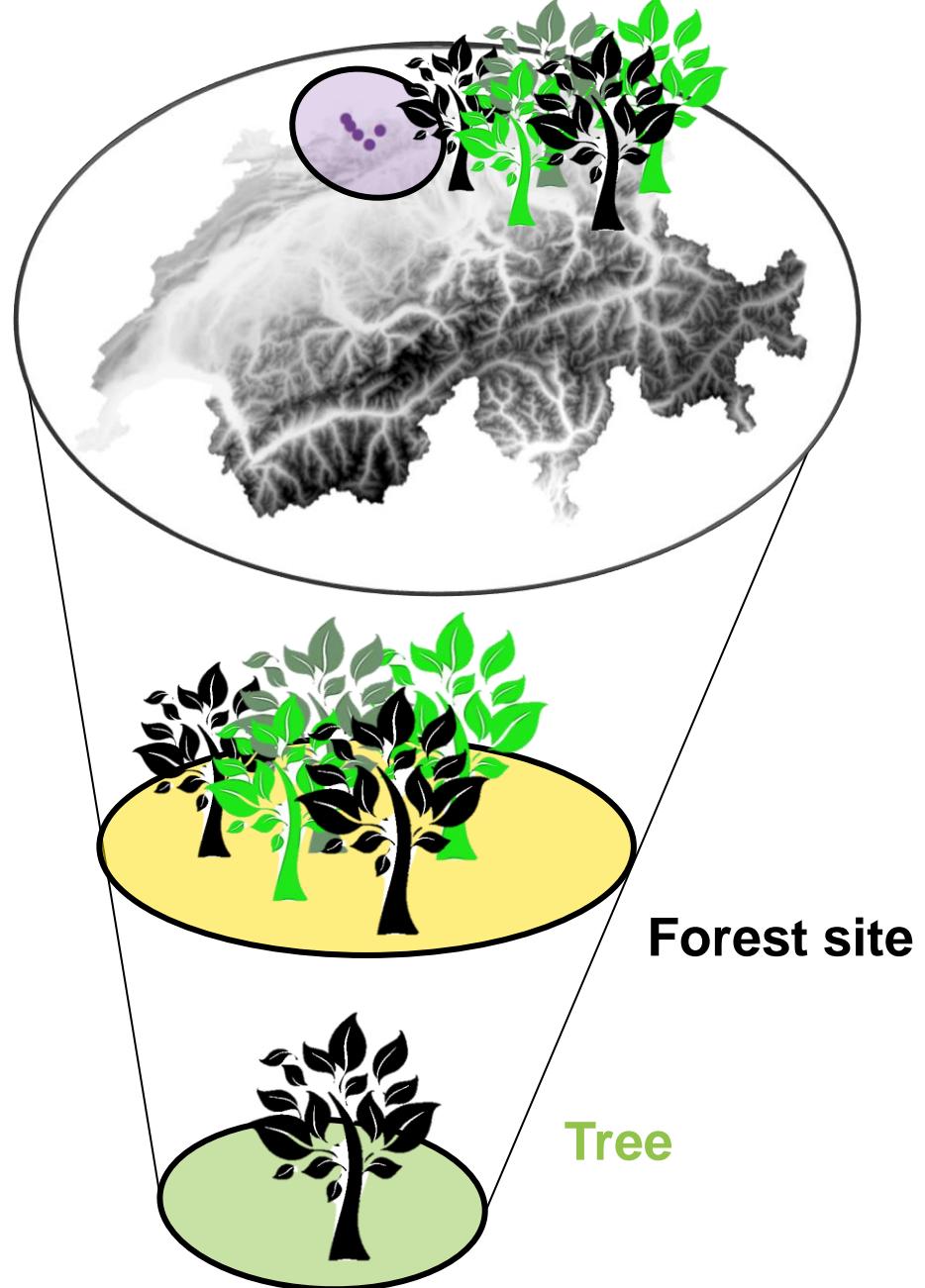
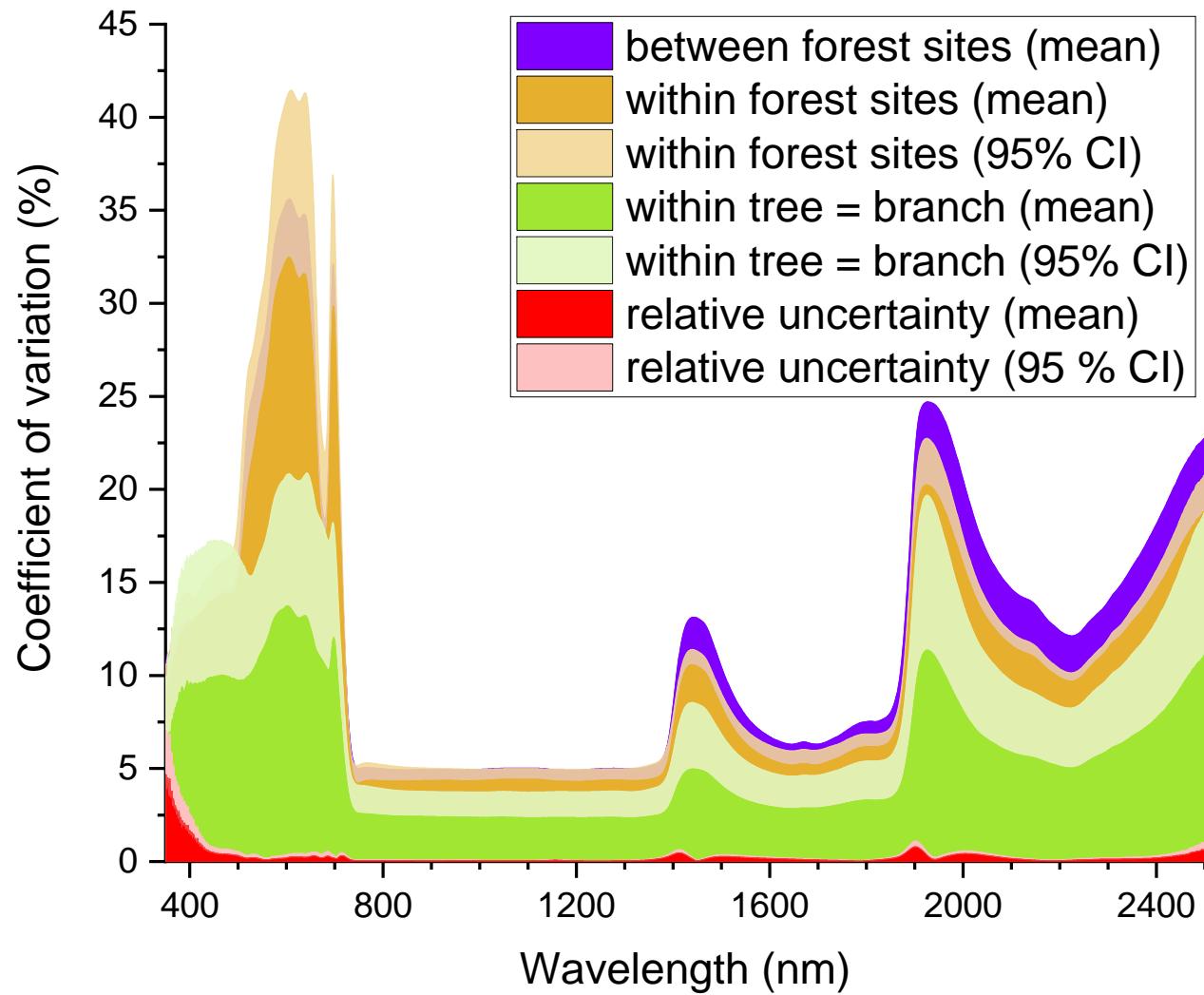
The **biological variation** in Swiss forest



The **biological variation** in Swiss forest



The **biological variation** in Swiss forest





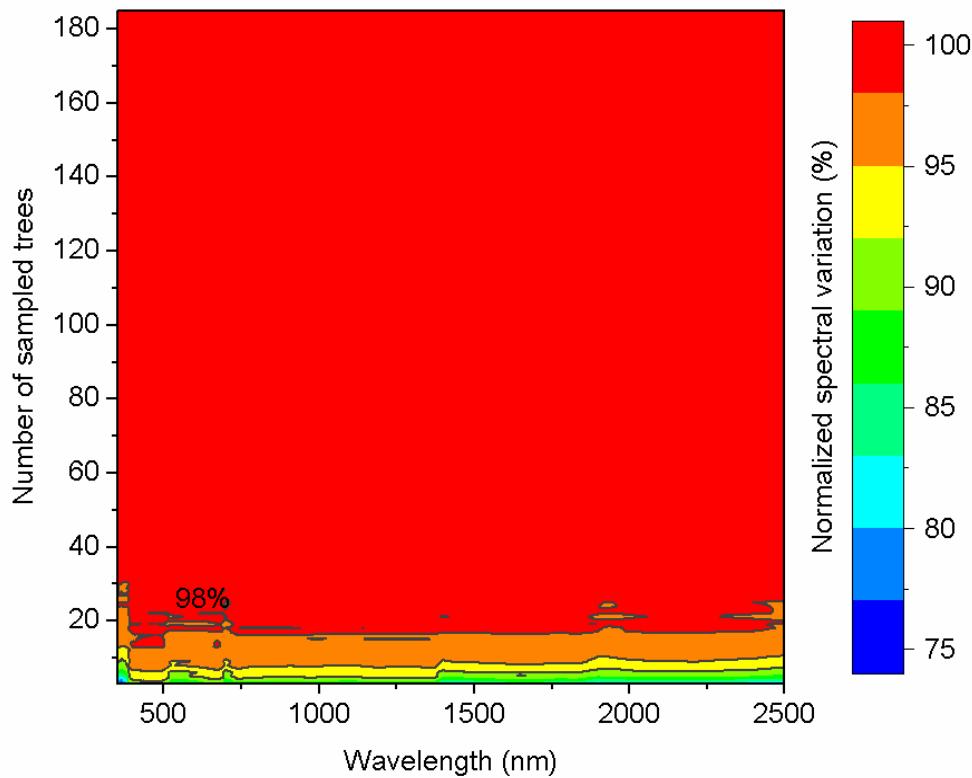
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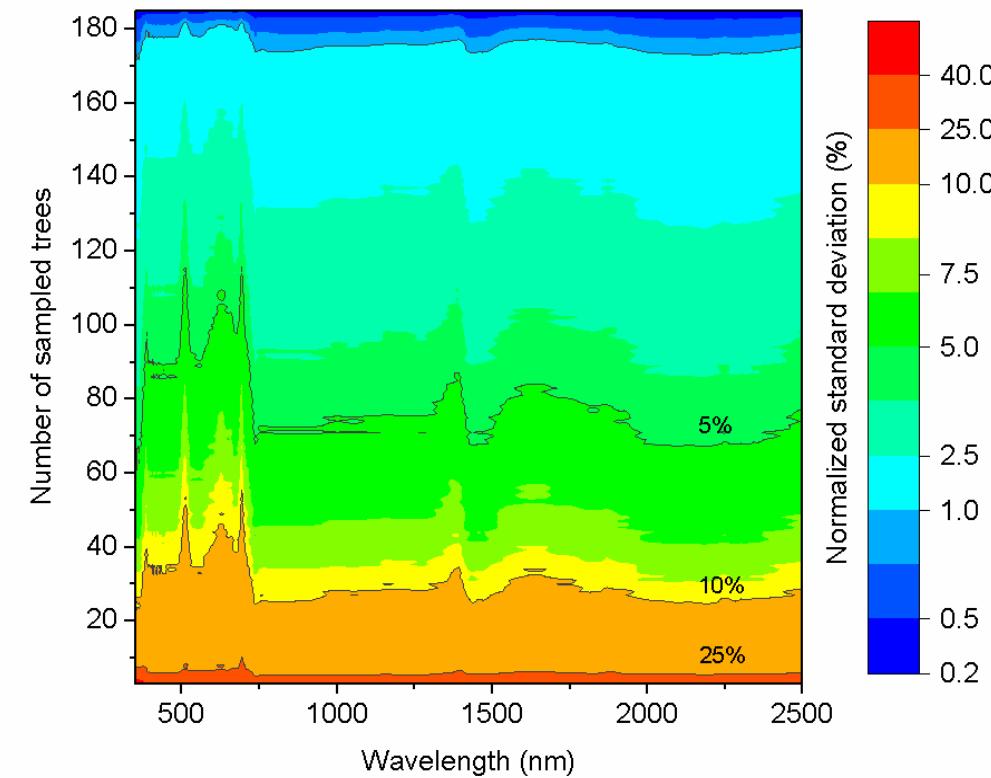
4. Standardized sampling and uncertainties

Sample size matters

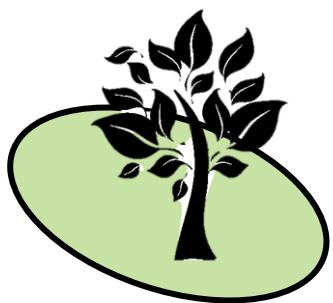
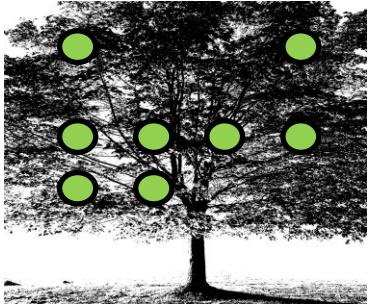
a. Normalized mean spectral variation



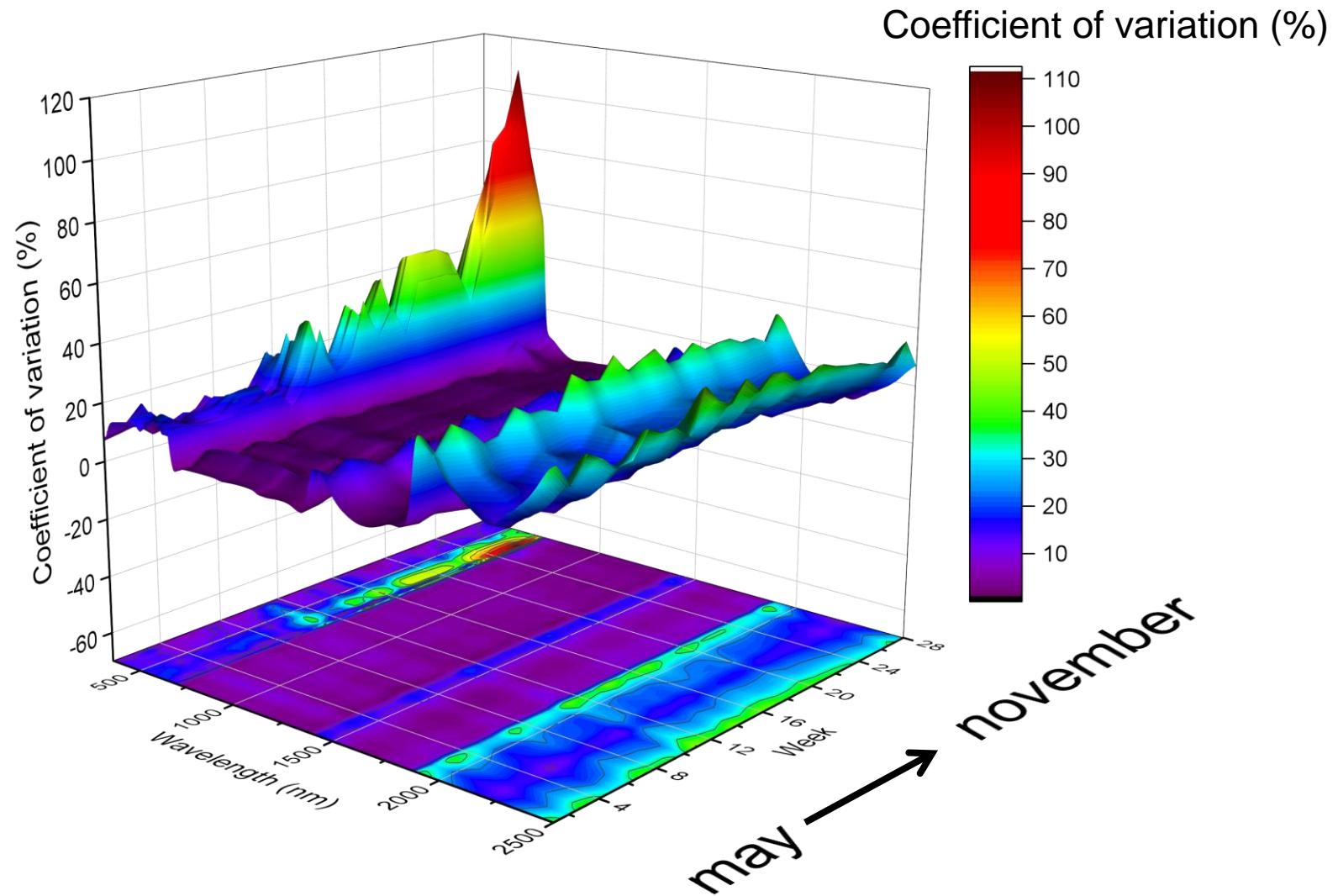
b. Normalized standard deviation



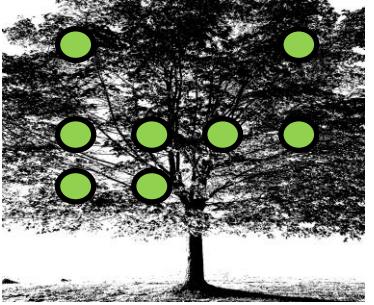
Temporal scale matters



Tree

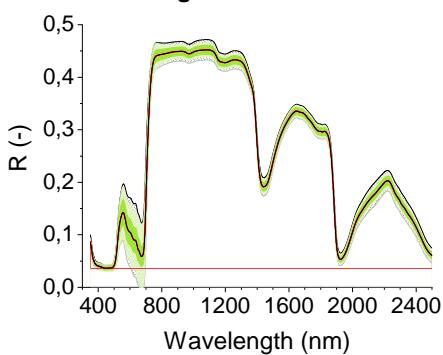


Measurement unit matters

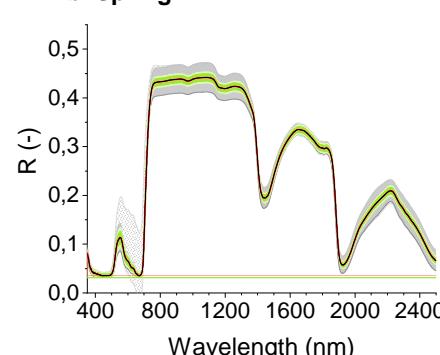


Spectral variation

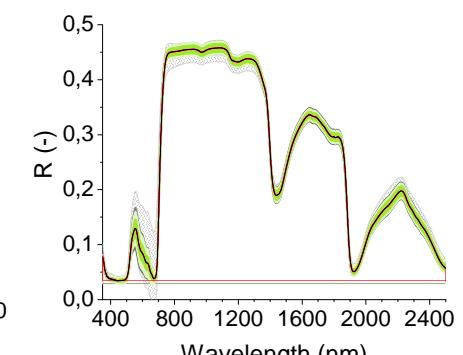
a. Growing season



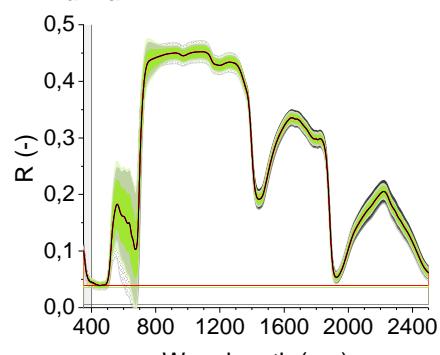
b. Spring



c. Summer



d. Fall



Absolute uncertainty:

Mean Standard deviation

Standard deviation

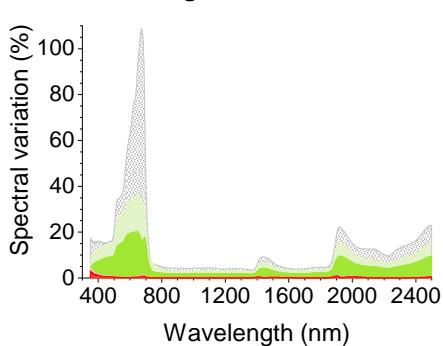
of sun-exposed leaves within a tree during:
Growing season Spring

of sun-exposed leaves within a branch:
Mean Standard deviation

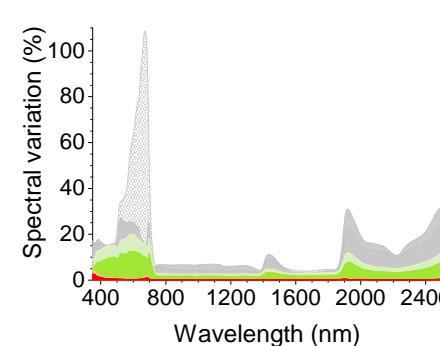
Summer Fall

Relative spectral variation

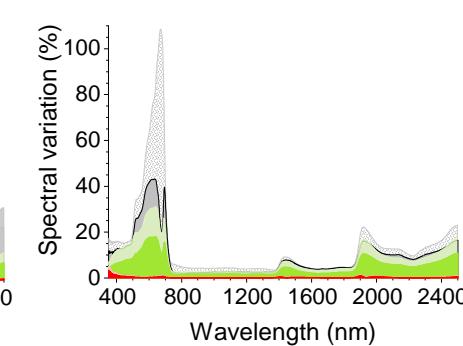
e. Growing season



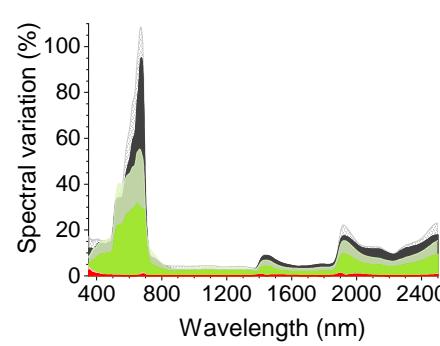
f. Spring



g. Summer



h. Fall



Tree



Branch

Relative uncertainty:

Mean Standard deviation

Coefficient of variation

of sun-exposed leaves within a tree during:
Growing season Spring

of sun-exposed leaves within a branch:
Mean Standard deviation

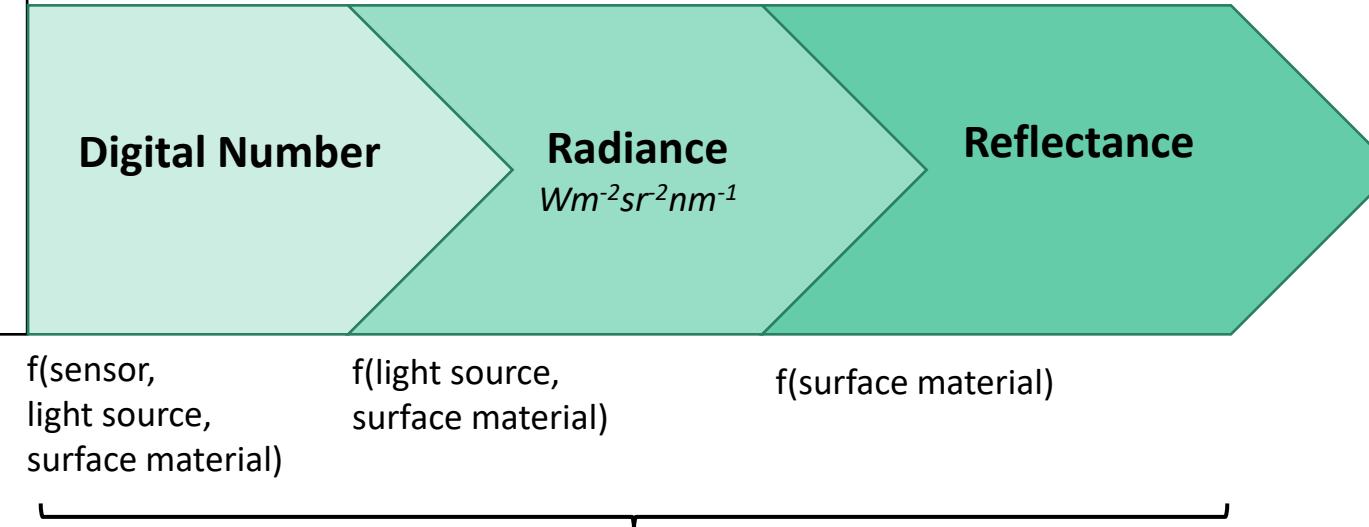


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Take-home message

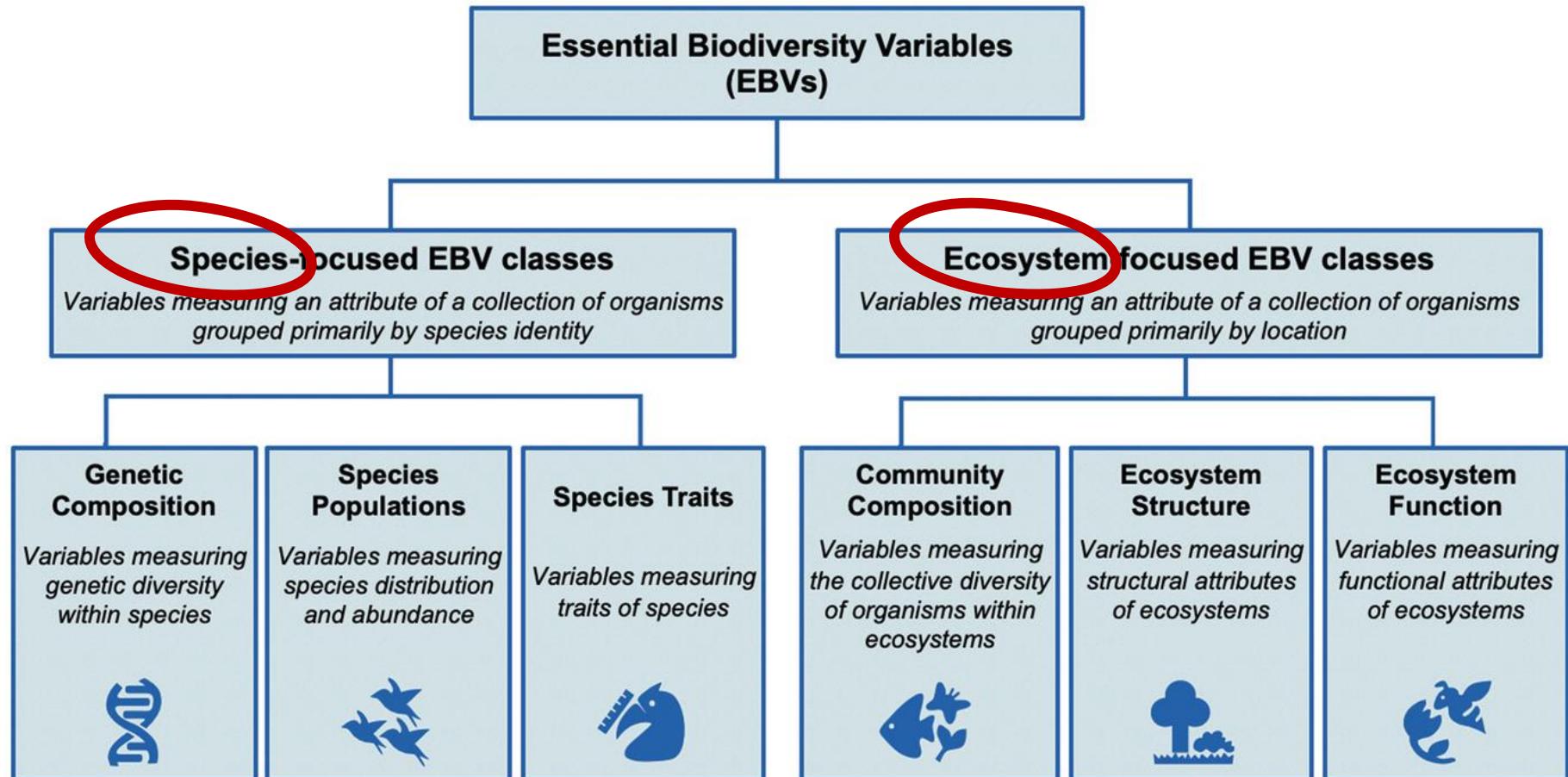
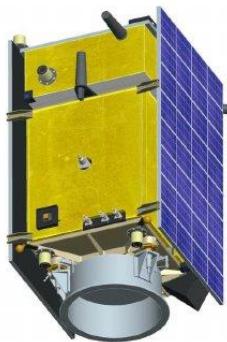
OUTLOOK: Data calibration



**Sensitive to
species trait
variation**

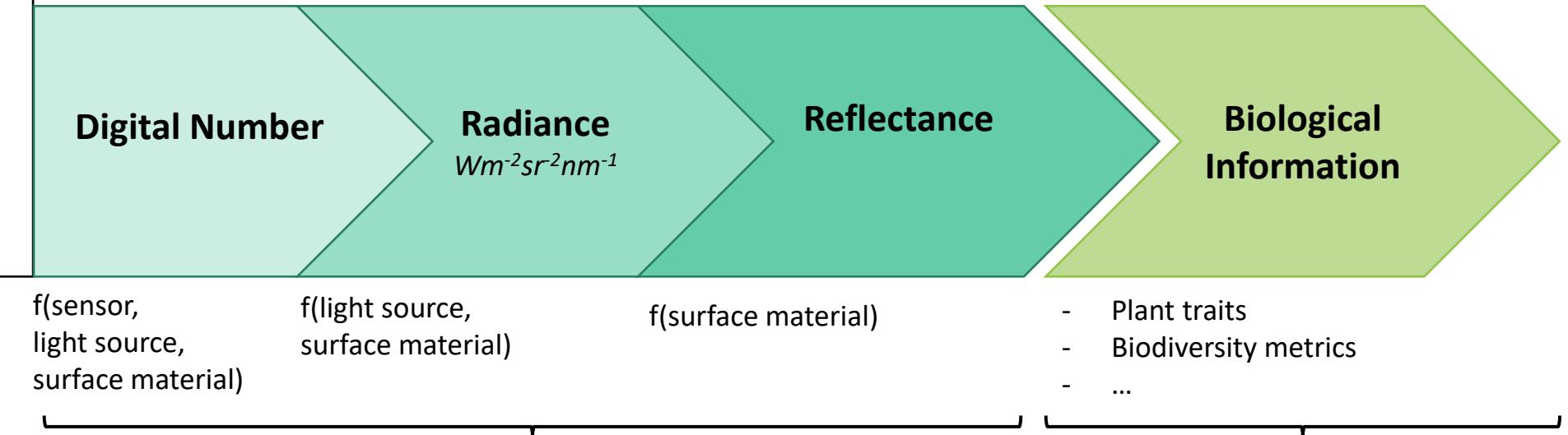
**Estimated
measurement
uncertainty**

OUTLOOK: Data calibration



Current SRS-EBV			
Future SRS-EBV			

OUTLOOK: Data calibration



Sensitive to
species trait
variation

Estimated
measurement
uncertainty

$$\text{[Green Box]} = \text{[Green Box]} + \text{[Red Box]}$$



Uncertainty?



University of
Zurich^{UZH}

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New Results

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Variation in reflectance spectroscopy of European beech leaves captures phenology and biological hierarchies despite measurement uncertainties

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 Michael E. Schaepman,  Meredith C. Schuman

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Michael W.I. Schmidt, Lucienne de Witte

Any question?
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Take-home message

- **Measurement uncertainty** is specific to *ASD-Sampling probe-Target*
 - 0.0001 – 0.01 reflectance unit [0-1]
 - 0.3 – 4% leaf reflectance
- **Leaf Optical Properties (LOP)** permit the detection of diverse scales of biological variation
- Take into account the **variation over biological, spatial and temporal scales** when designing a research project.