



# Airborne Imaging Spectroscopy Workshop



## **HYPERPEACH**

Modeling biochemical processes in  
orchards at leaf- and canopy-level using  
hyperspectral data

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10 October 2006



# Overview

## Objectives

## Methodology

Plot preparation

Field and airborne campaigns

Generation of vegetation indices

$C_{ab}$  retrieval

## Results

Vegetation indices

General results (biochemical)

$C_{ab}$  retrieval

## Conclusions



## Objectives

Monitoring crop status via hyperspectral remote sensing

Are we able to detect iron stress in orchards via hyperspectral remote sensing?

Generate novel & robust indices

Test classical vegetation indices and generate novel, robust indices enabling effective detection and quantification of iron deficiency in the peach orchard (leaf, canopy & airborne level)

- Band reduction techniques
- Standardized difference vegetation indices (SDVI)

Chlorophyll a+b retrieval

Can we quantitatively estimate chlorophyll concentration from hyperspectral remote sensing?



## Methodology

- Research plot in Zaragoza (Spain)
- Orchard: 205 peach (*Prunus persica* L.) trees



- Stress:
  - Iron Chlorosis induced in rows 1 and 2 (48 trees)
  - Iron chelate treatments (Sequestrene): 0, 60, 90, 120 g/tree



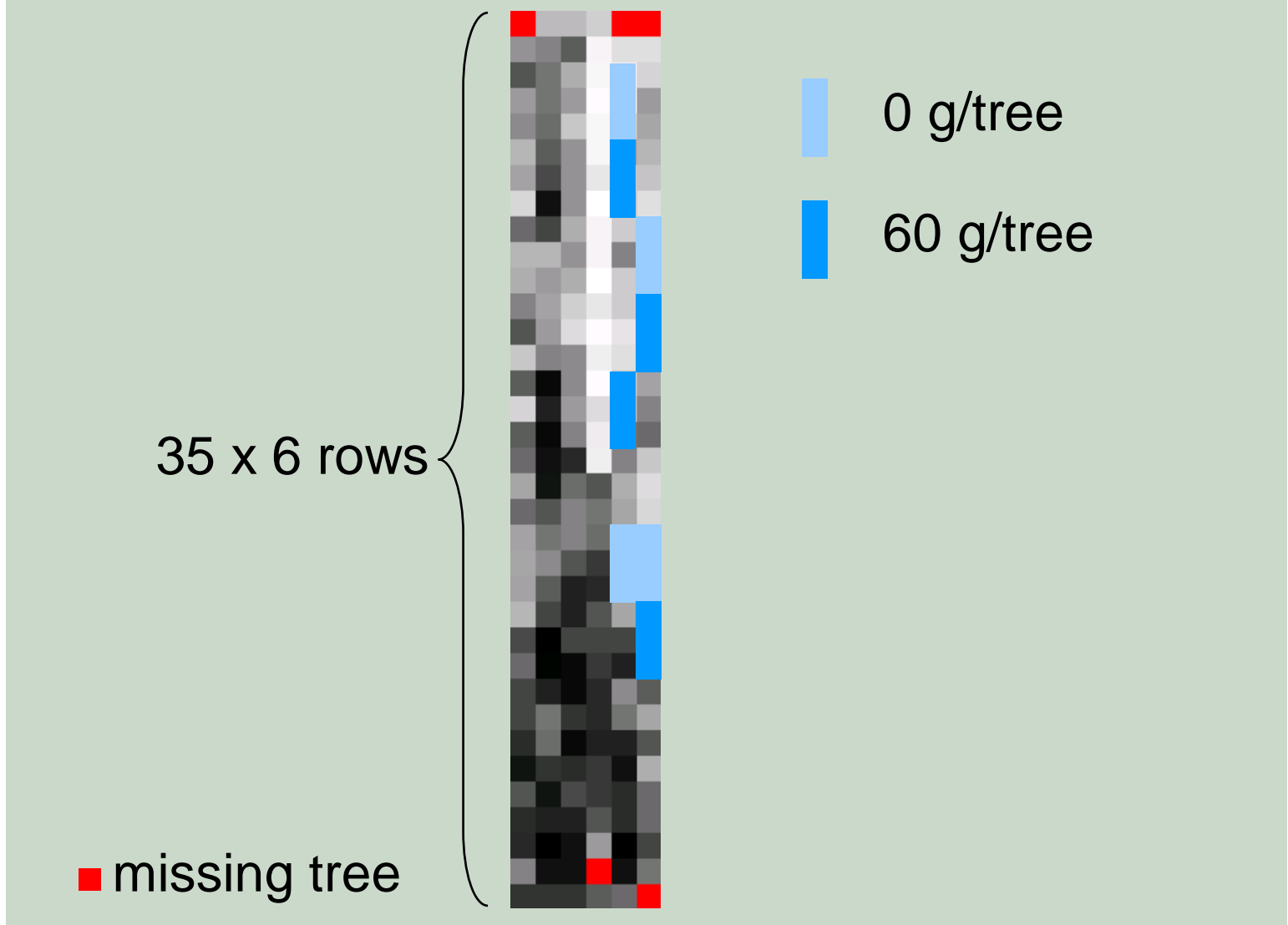
## Methodology



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Methodology

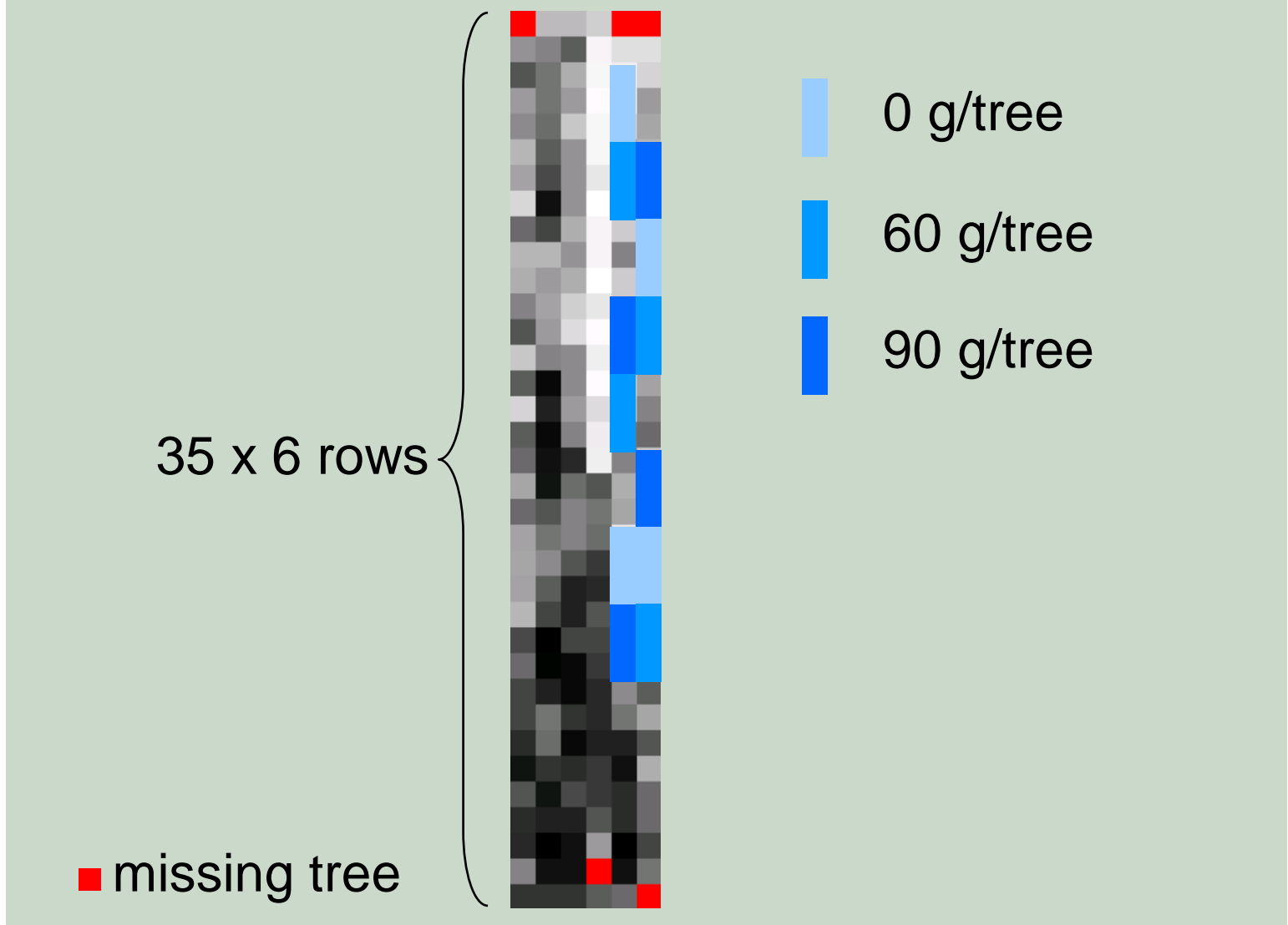


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Methodology

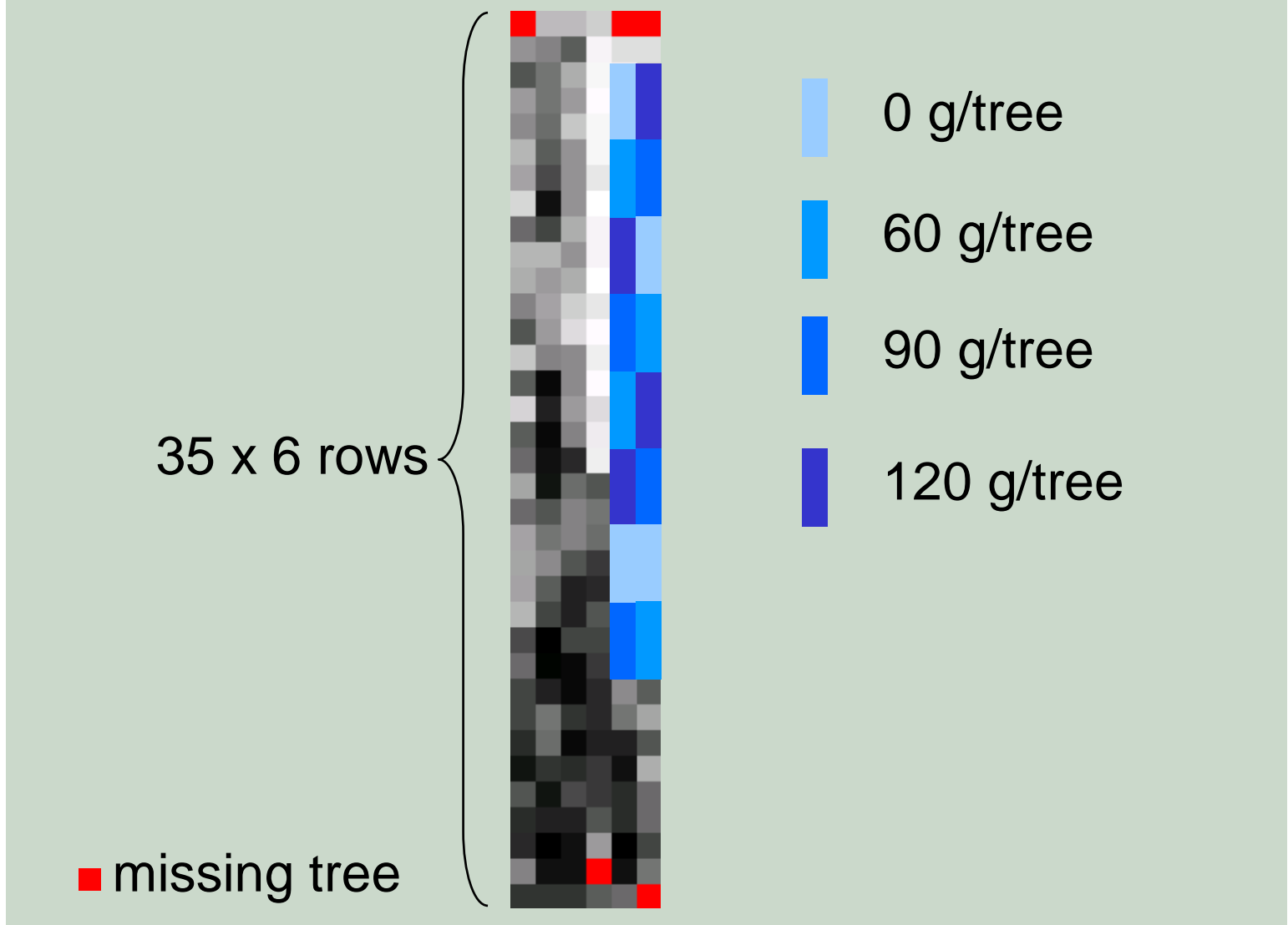
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Methodology

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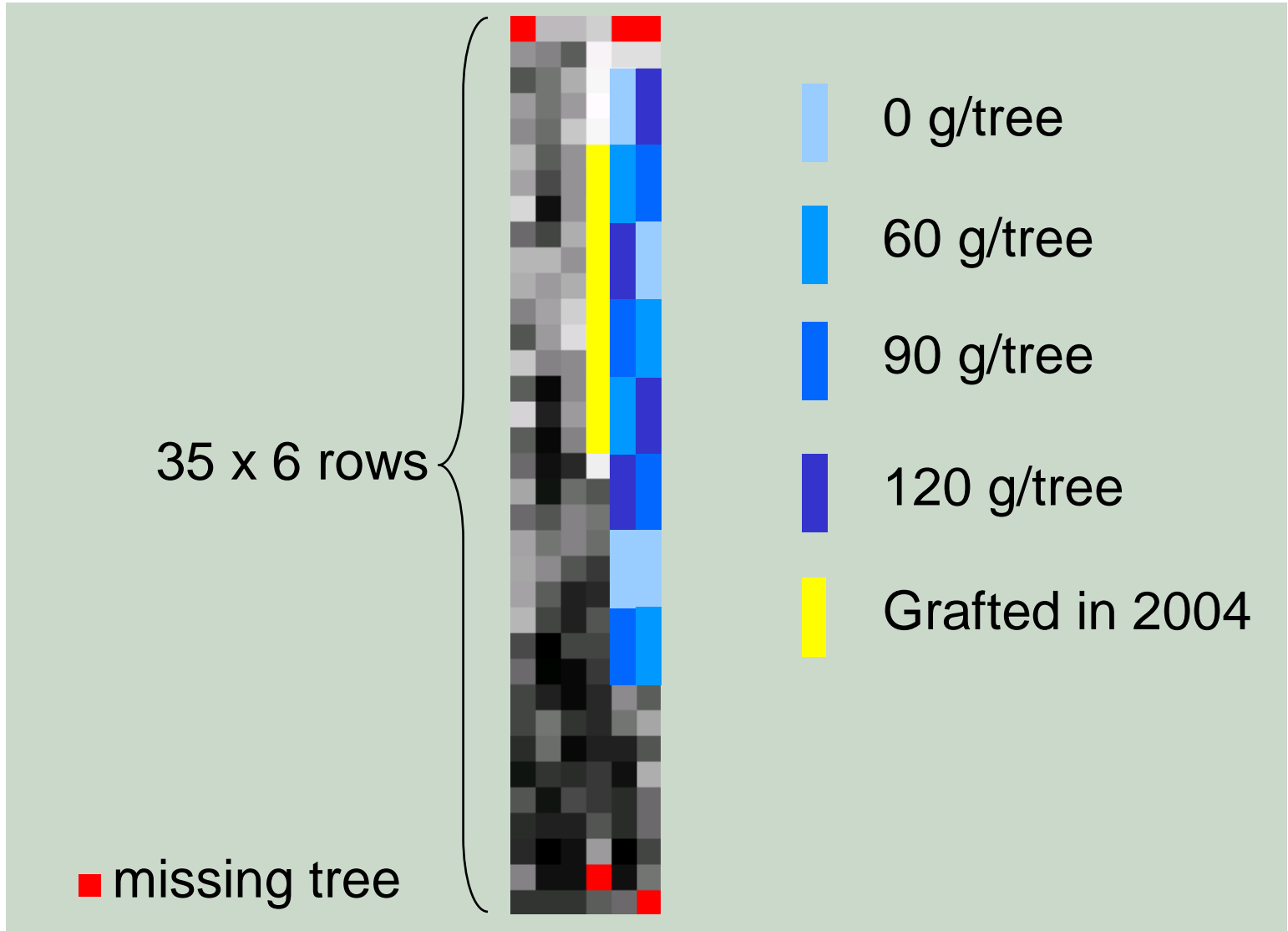






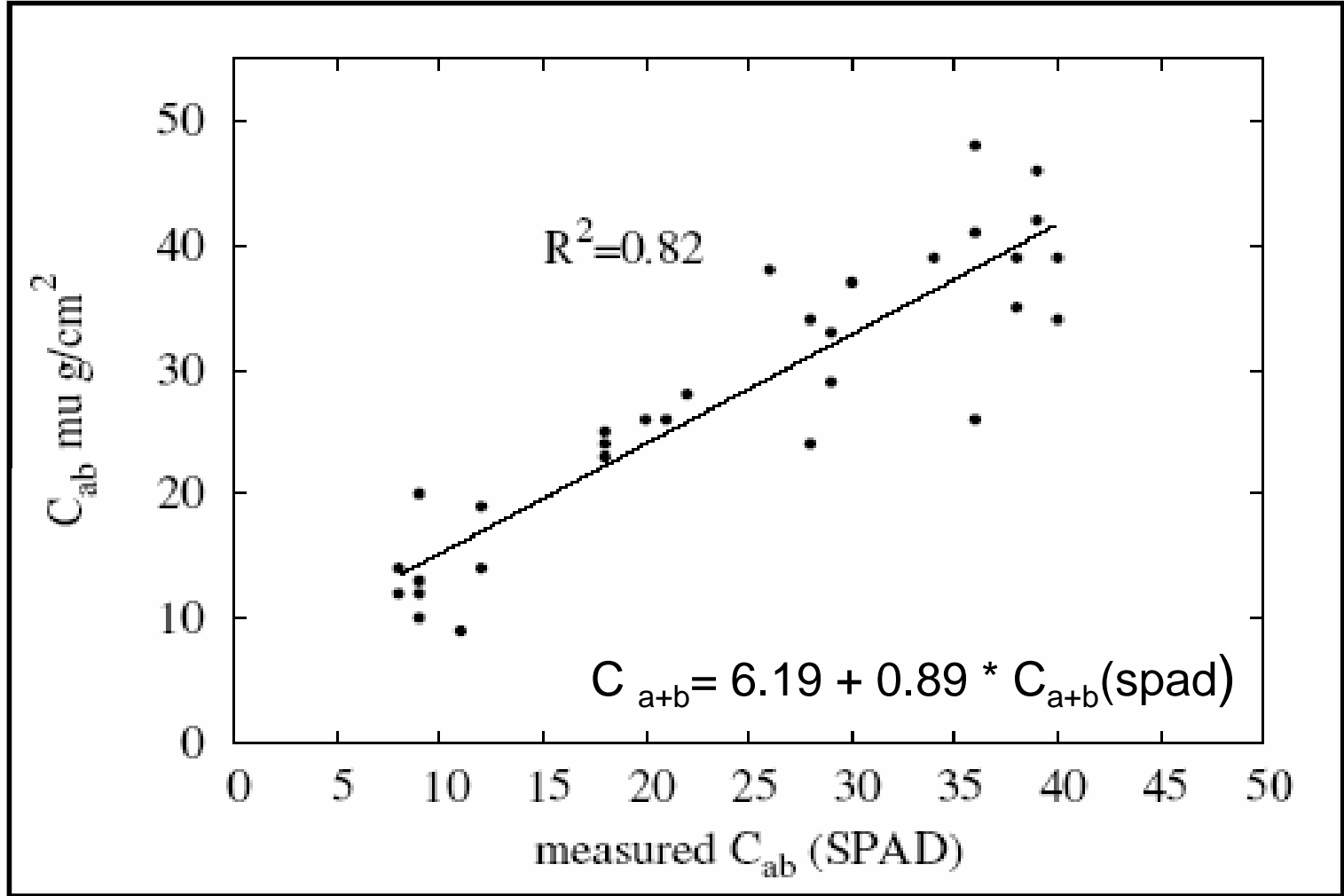
Methodology

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Methodology





Methodology

Canopy level

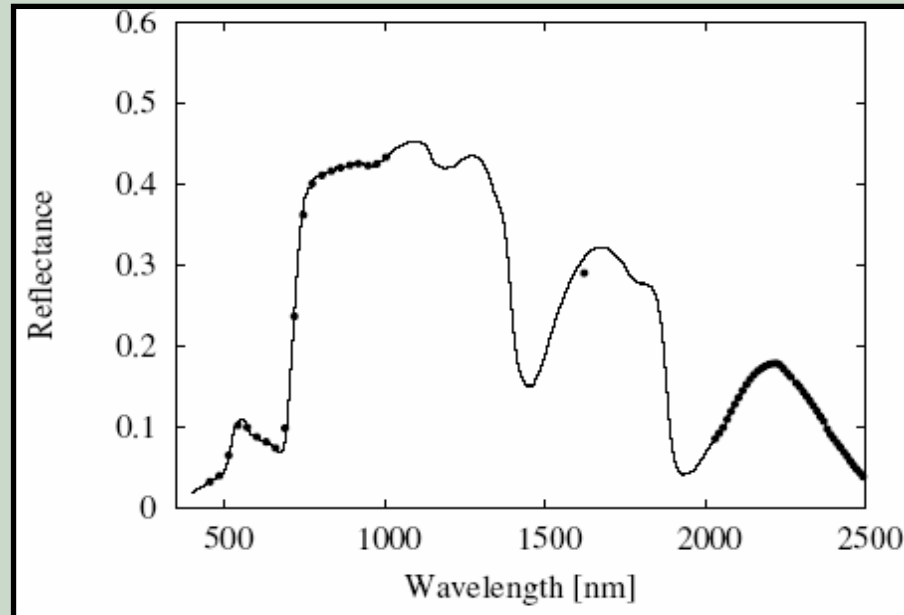
- Canopy reflectance of 72 trees (ASD 25°FOV)
- LAI measurements (LAI-2000)





## Methodology

SensyTech AHS Hyperspectral sensor (INTA, Spain)



### Spectral bands:

VIS+NIR 430 - 1030 nm: 20 bands ( $\Delta\lambda = 30$  nm)

SWIR 1 (1550 - 1750 nm): 1 band ( $\Delta\lambda = 200$  nm)

SWIR 2 (1994 - 2540 nm): 42 bands ( $\Delta\lambda = 13$  nm)



Methodology



Spatial resolution: 2.5m

Crown diameter: 2.5m



Methodology



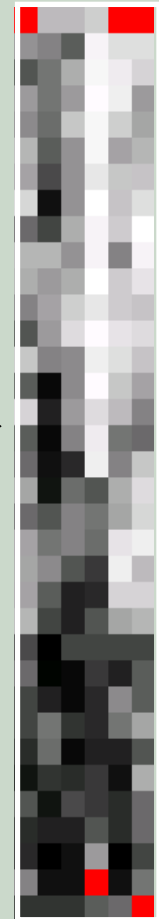
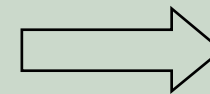
672 pixels  
(16/5 pixels/tree)

5x5  
Subsampling  
(nearest  
neighbor)



16800 pixels  
(80 pixels/tree)

Median  
value



210 pixels  
(1 pixel/tree)



## Methodology

<i>Problem</i>	High dimensionality of the hyperspectral dataset ("oversampled" dataset: 350-2500 nm)
<i>Solution</i>	Index development to reduce complexity and easily distinguish between treatments

### This research

Identification of hyperspectral indices to detect differences between reflectance spectra of healthy and iron deficient trees (leaf, canopy and airborne level)



## Methodology

Radiative transfer model

Model inversion (PROSPECT + ACRM)

Increase complexity level:

Leaf level (*in situ* measurements)

Canopy level (*in situ* measurements)

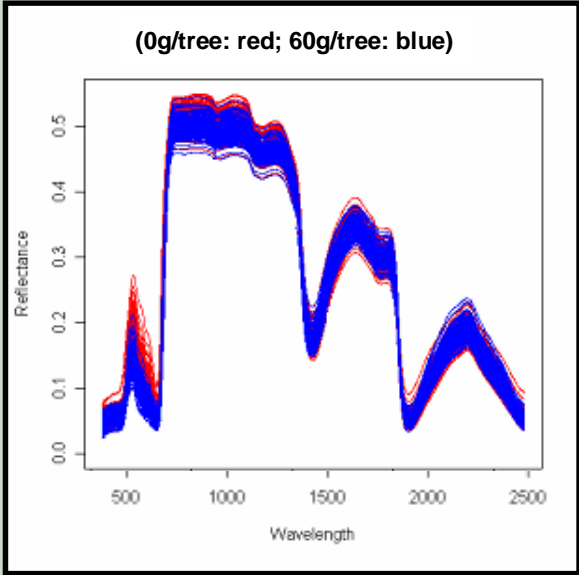
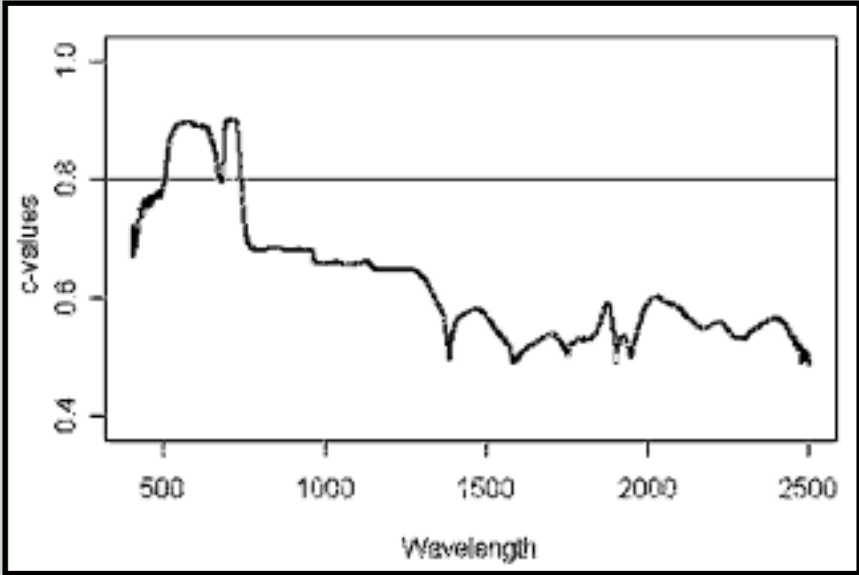
Airborne level (atmospherically corrected)



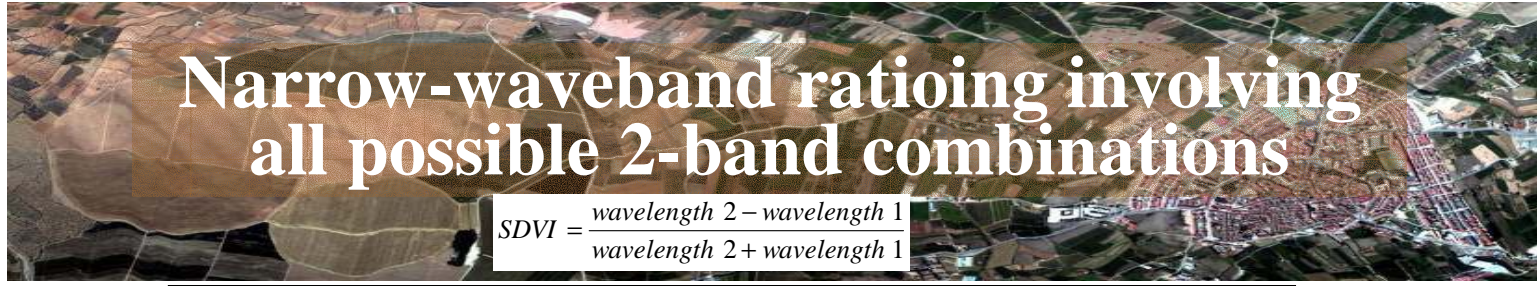


Results VI

Band selection using logistic regression



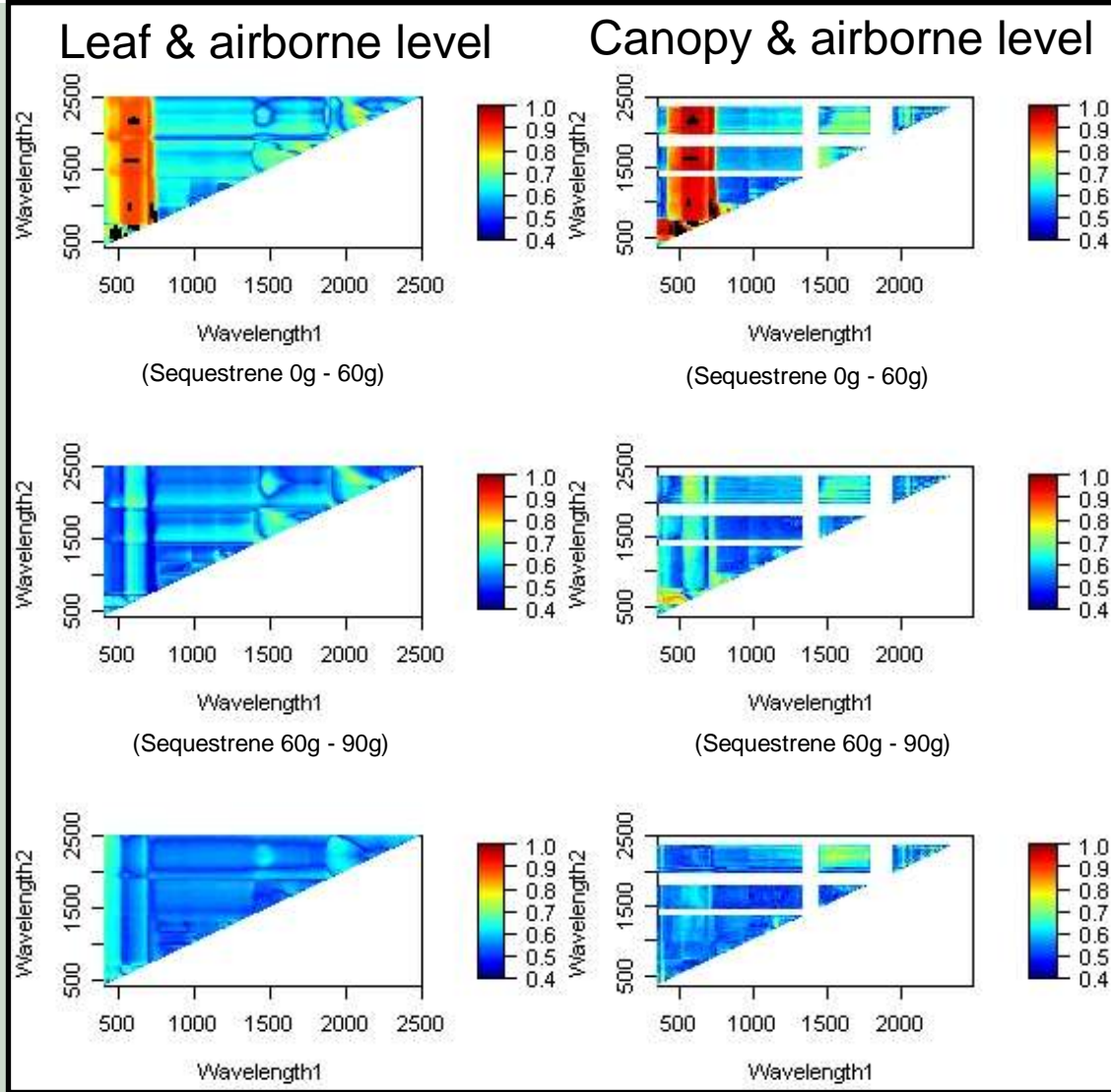
Sequestrene application 0g/tree ↔ 60g/tree



# Narrow-waveband ratioing involving all possible 2-band combinations

$$SDVI = \frac{\text{wavelength 2} - \text{wavelength 1}}{\text{wavelength 2} + \text{wavelength 1}}$$

Results SDVI

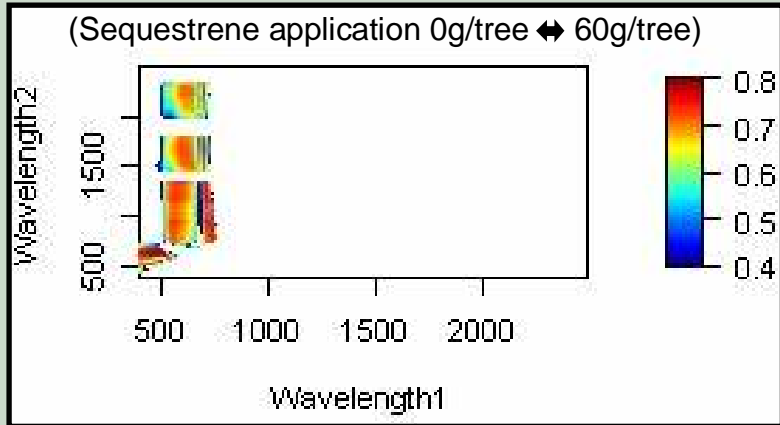




## Selected SDVI ~ Chl

### Results SDVI

Linear relation SDVI and Chl



Most discriminative SDVI closely related to chlorophyll concentration



## Some General Results

### Fluorescence

Linear and positive relationship between Fs and leaf chlorophyll concentration found

### Biochemical parameters

Fe-deficient leaves:

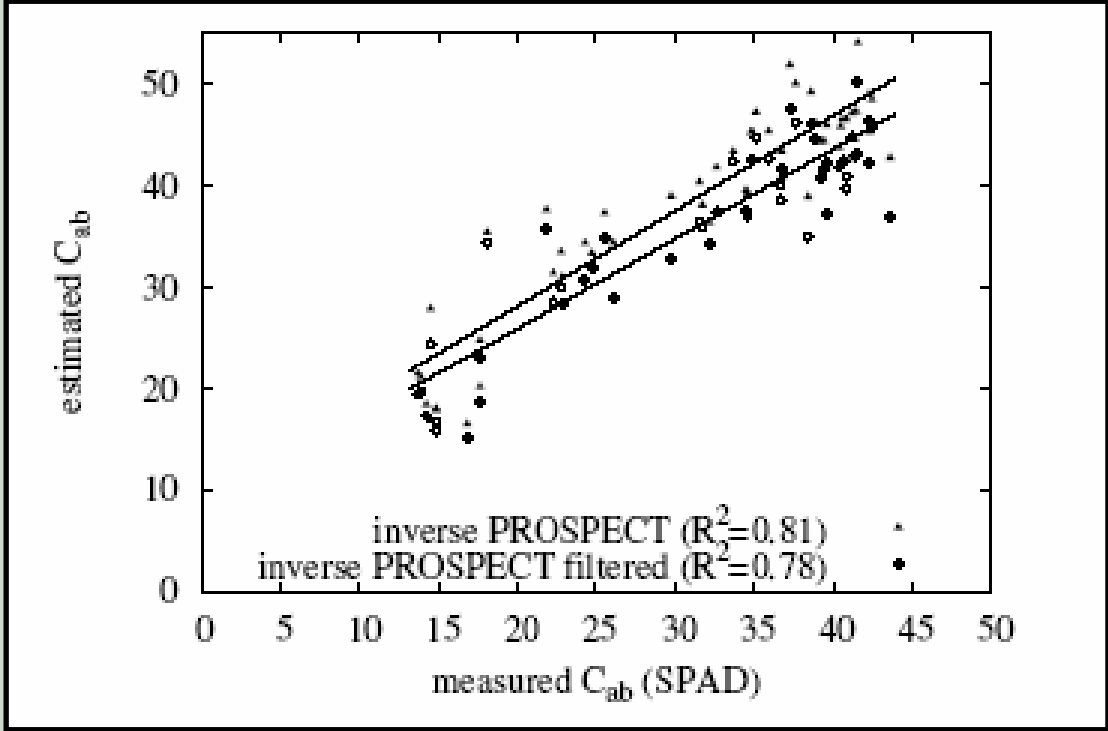
- dry mass per leaf area unit ↘
- relative water content ↗
- [chlorophylls] & [carotenoids] ↘

### Peach yield

Lower peach yield in trees that did not receive iron, compared to those treated with different amounts of iron



## Results Cab retrieval





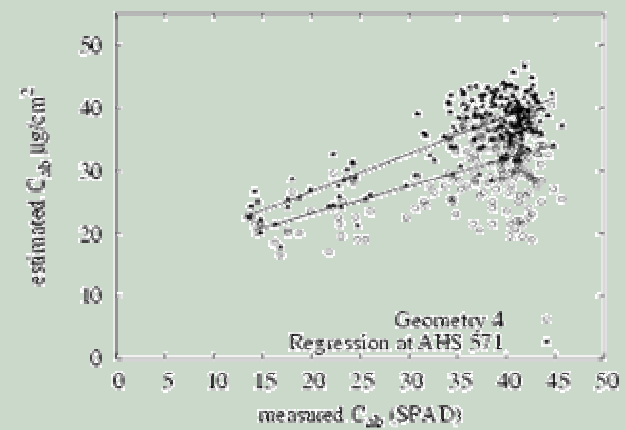
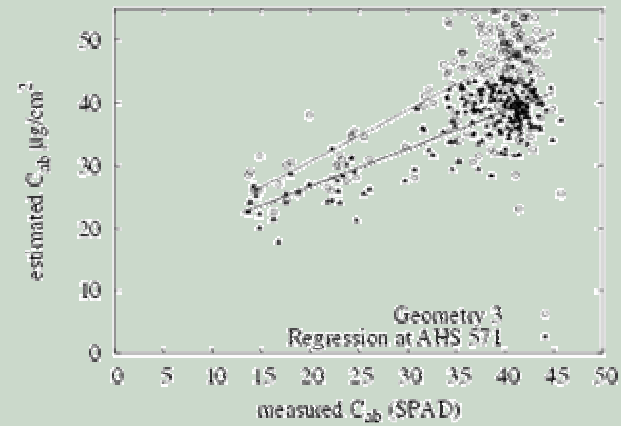
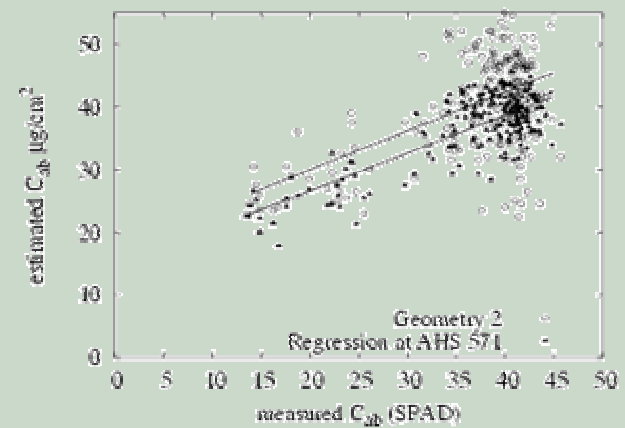
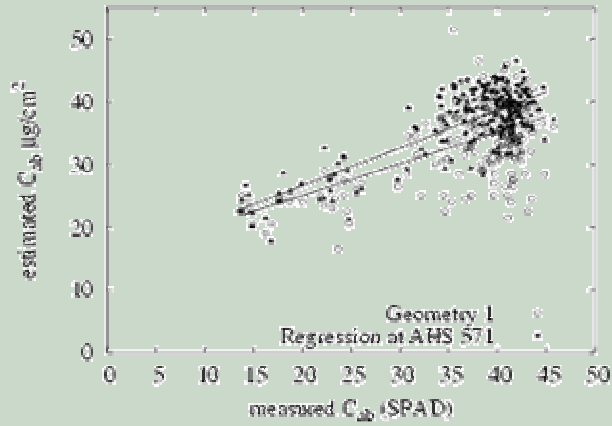
## Results Cab retrieval

### Proposed methodology:

- Inversion of PROSPECT+ACRM
- Improvements for inversion proposed:
  - Adapted simulated annealing [Ingber, 1993]
  - Filtering of modeled spectra according to AHS sensor
  - Multi-angular information



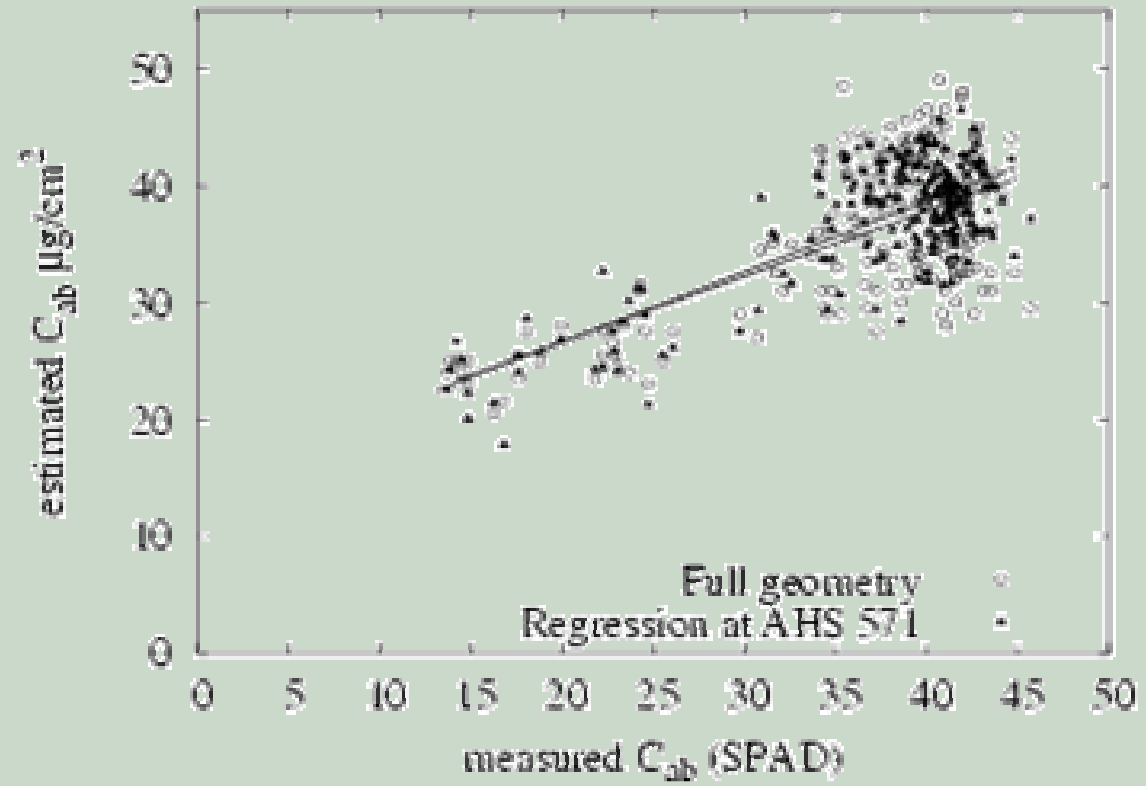
Results Cab retrieval





Results using all observations

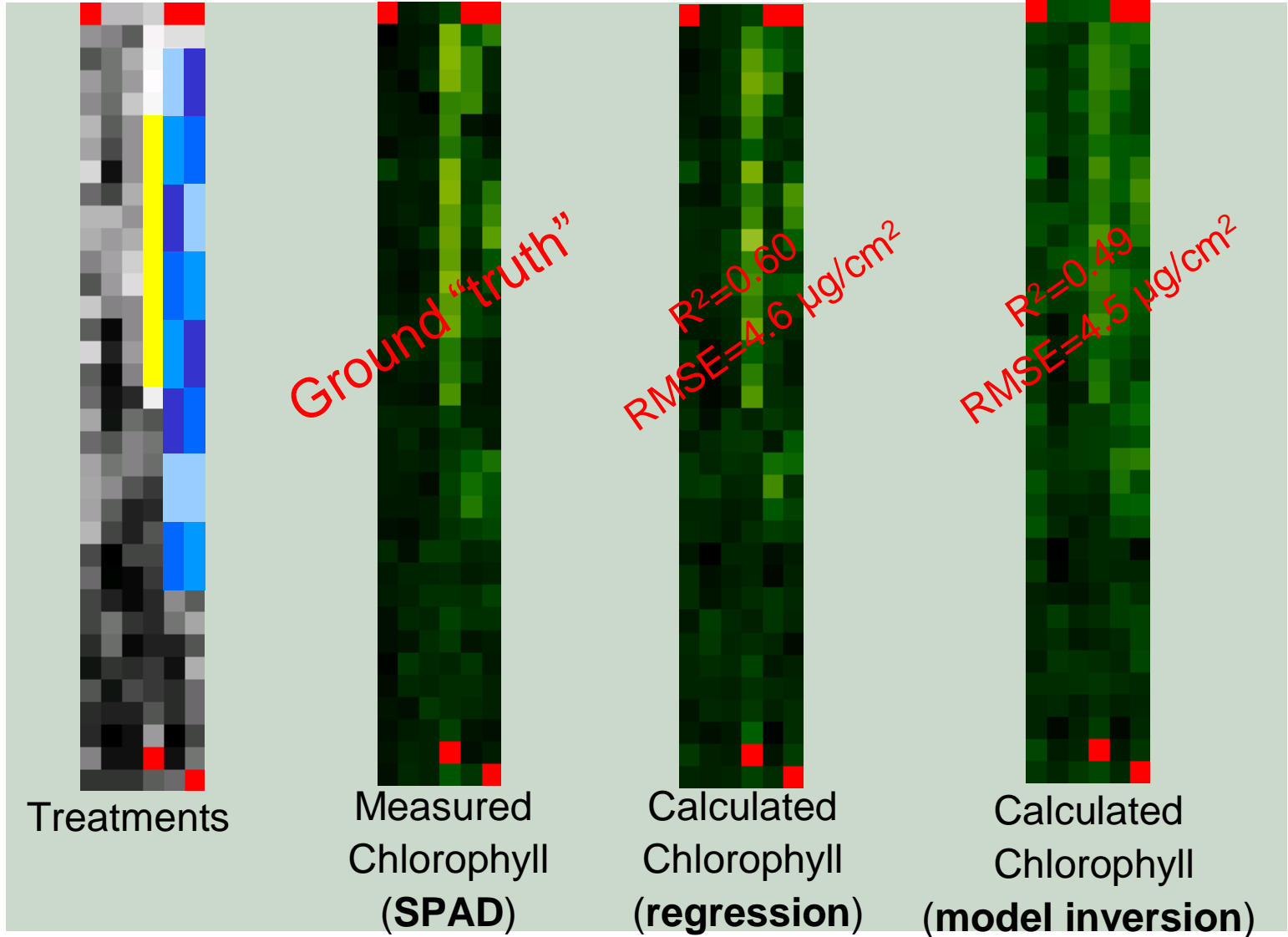
Results Cab retrieval







Results Cab retrieval





## Conclusions

Stress (chlorosis) can be detected on tree and canopy levels

Leaf:  $R^2=0.95$  (regression),  $R^2=0.81$  (inversion)

Canopy:  $R^2=0.60$  (regression),  $R^2=0.49$  (inversion)

Resolution requirements

Spectral requirement: medium (AHS specifications adequate)

Spatial requirement: high (tree-size correspondence)

Approach

Model inversion < regression (training critical)

Standard inversion < Adapted simulated annealing + filtering

Vegetation indices

Vegetation indices were developed and high correlations were found between iron stress and chlorophyll content



# Acknowledgements



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