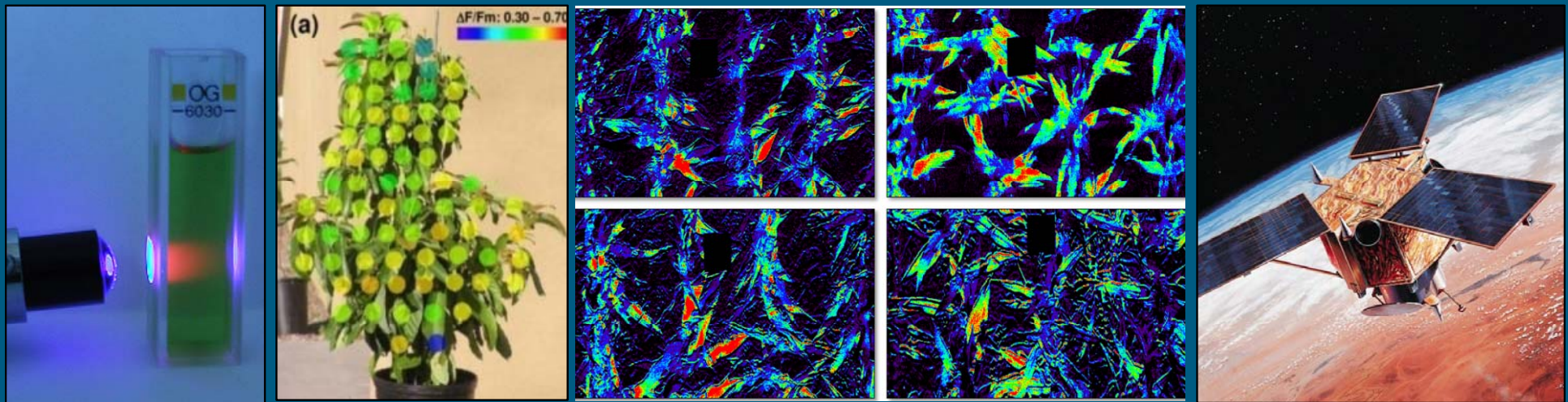


Hyperspectral imaging as a tool for plant phenotyping



Uwe Rascher • EPPN summer school

July 5th 2013



Forschungszentrum Jülich

Budget: 380 Mio. €

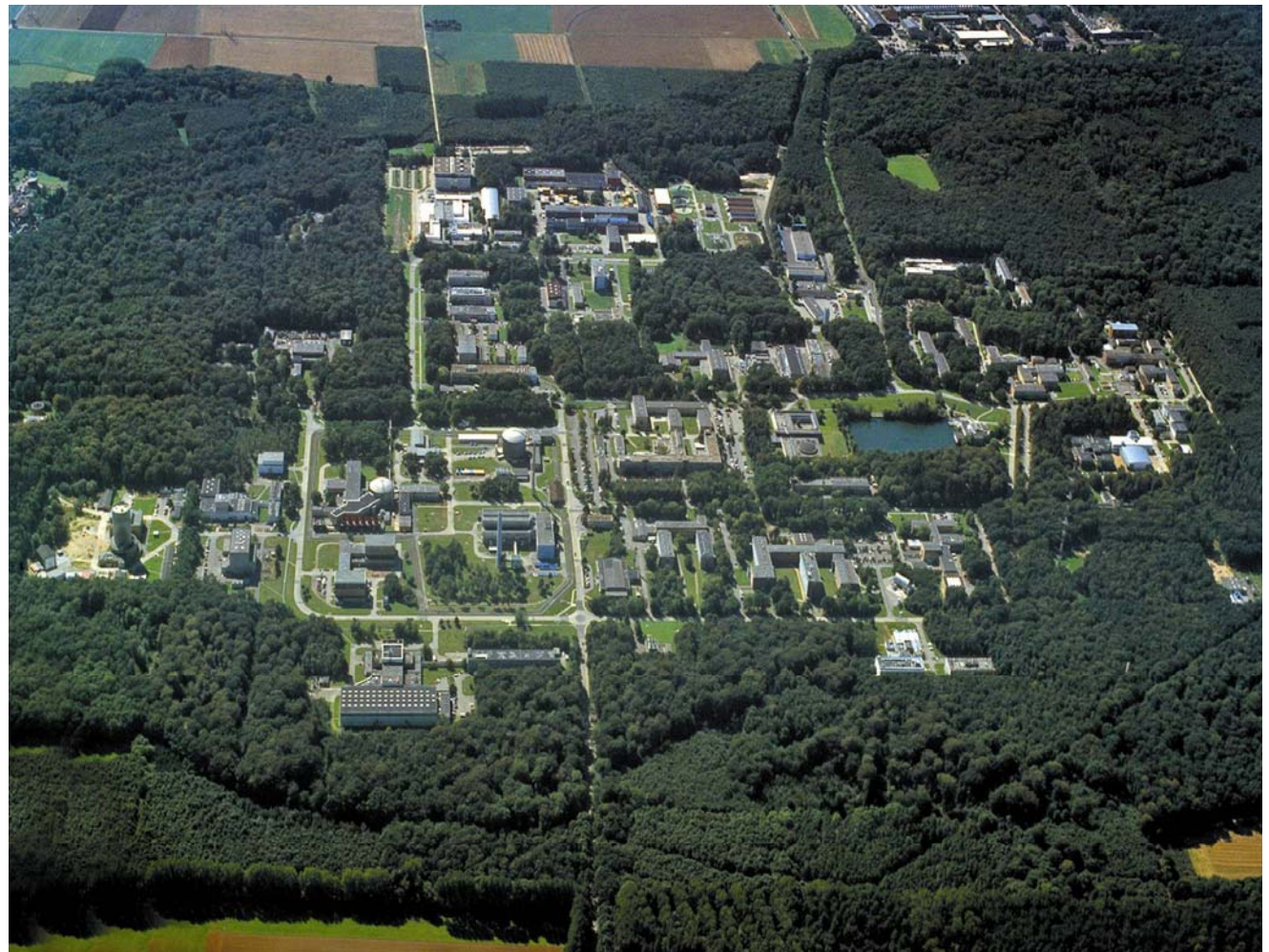
Third party funding: 95 Mio. € (16 Mio. Industry)

Employees: 4.300

Scientists: 1.500

**+ 900 guest
scientists per year**

8.500 patents



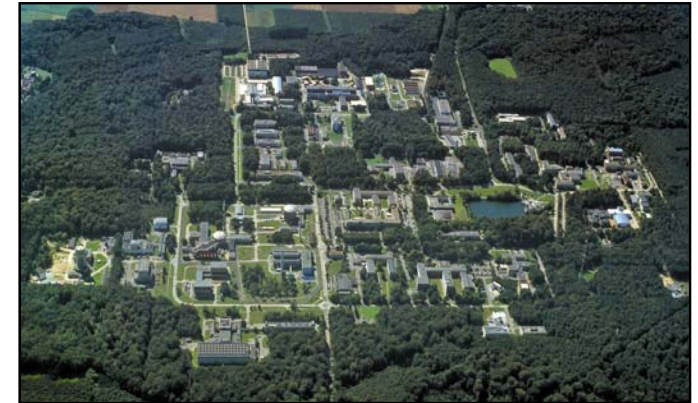
Forschungszentrum Jülich

IBG-2: Plant Sciences

www.fz-juelich.de/ibg/ibg-2

**140 Employees • 45 Scientists •
25 PhD students**

- Bioeconomy
- Plant Phenotyping
- Adaptation to Climate Change
- Sustainable Bioproduction
- From basic research to application



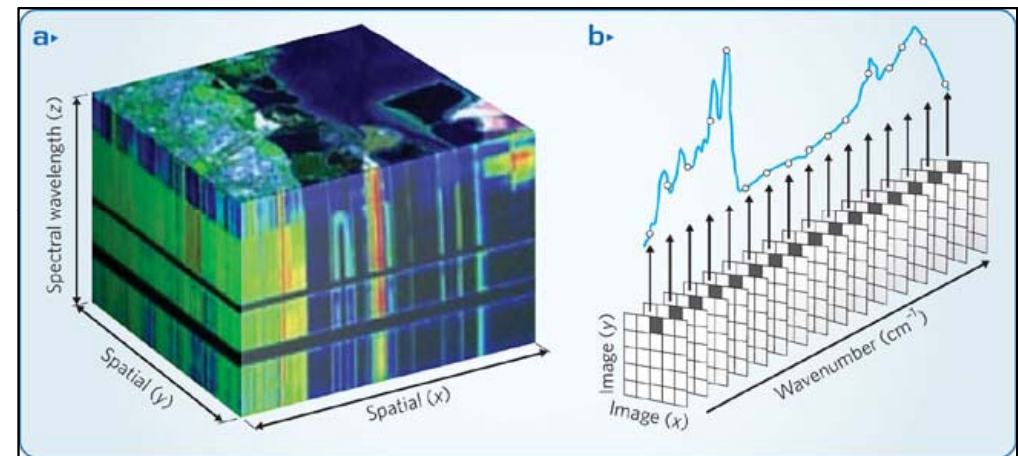
Outline: Hyperspectral Phenotyping

1) Some principles on light



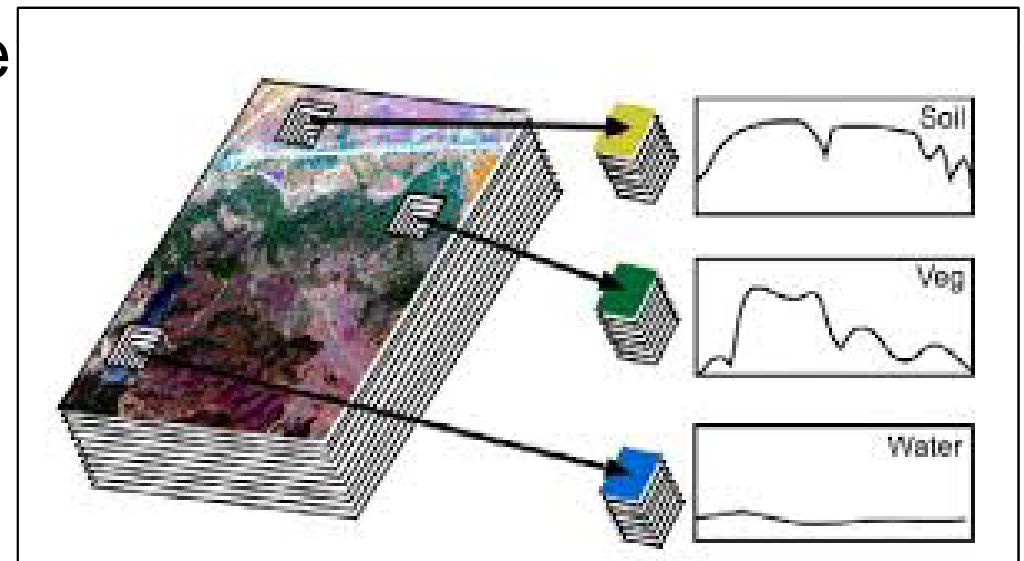
Outline: Hyperspectral Phenotyping

- 1) Some principles on light
- 2) 'Hyperspectral imaging' or 'Imaging Spectroscopy' of plants



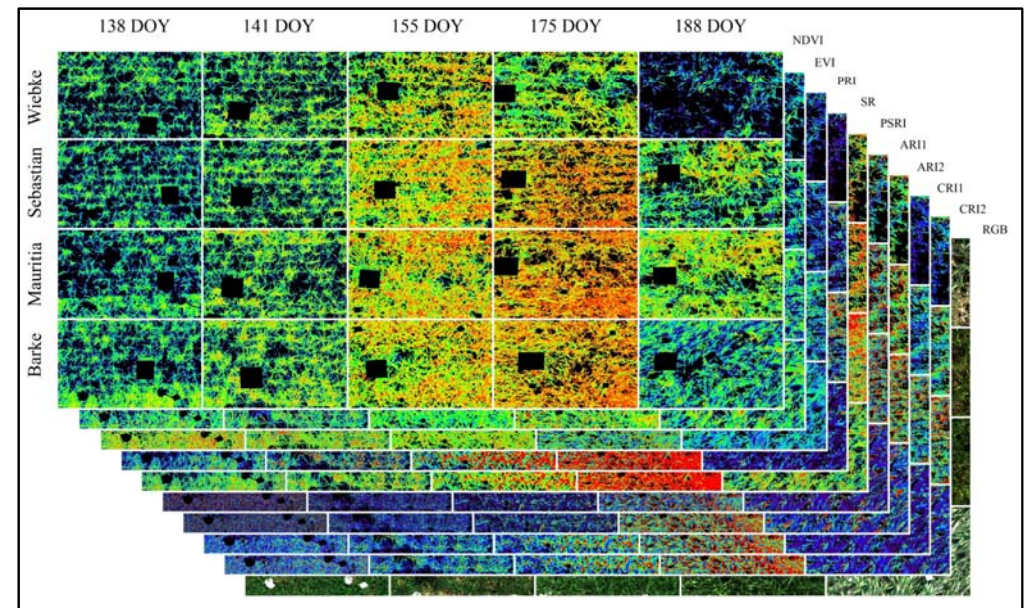
Outline: Hyperspectral Phenotyping

- 1) Some principles on light
- 2) 'Hyperspectral imaging' or 'Imaging Spectroscopy' of plants
- 3) How to extract quantitative data – vegetation indices and advanced methods



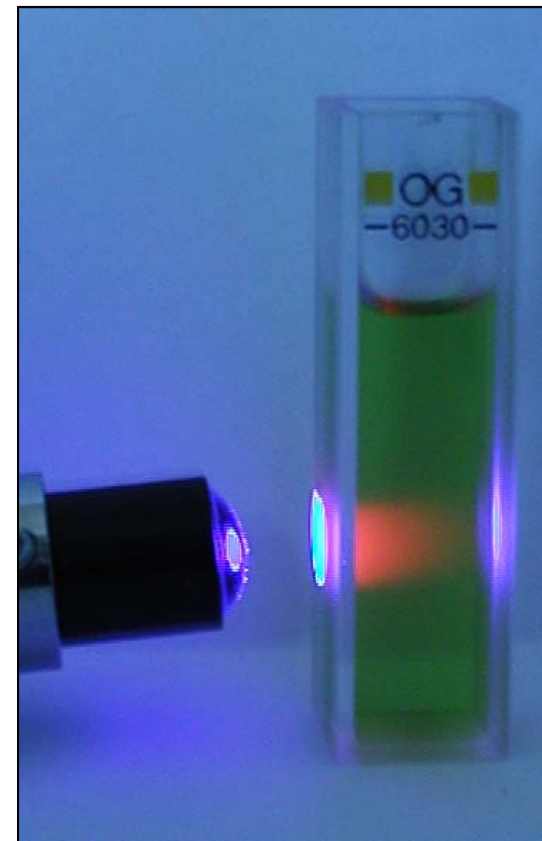
Outline: Hyperspectral Phenotyping

- 1) Some principles on light
- 2) 'Hyperspectral imaging' or 'Imaging Spectroscopy' of plants
- 3) How to extract quantitative data – vegetation indices and advanced methods
- 4) Examples from the real world



Outline: Hyperspectral Phenotyping

- 1) Some principles on light
- 2) 'Hyperspectral imaging' or 'Imaging Spectroscopy' of plants
- 3) How to extract quantitative data – vegetation indices and advanced methods
- 4) Examples from the real world
- 5) Linking hyperspectral with fluorescence



Some principles of light

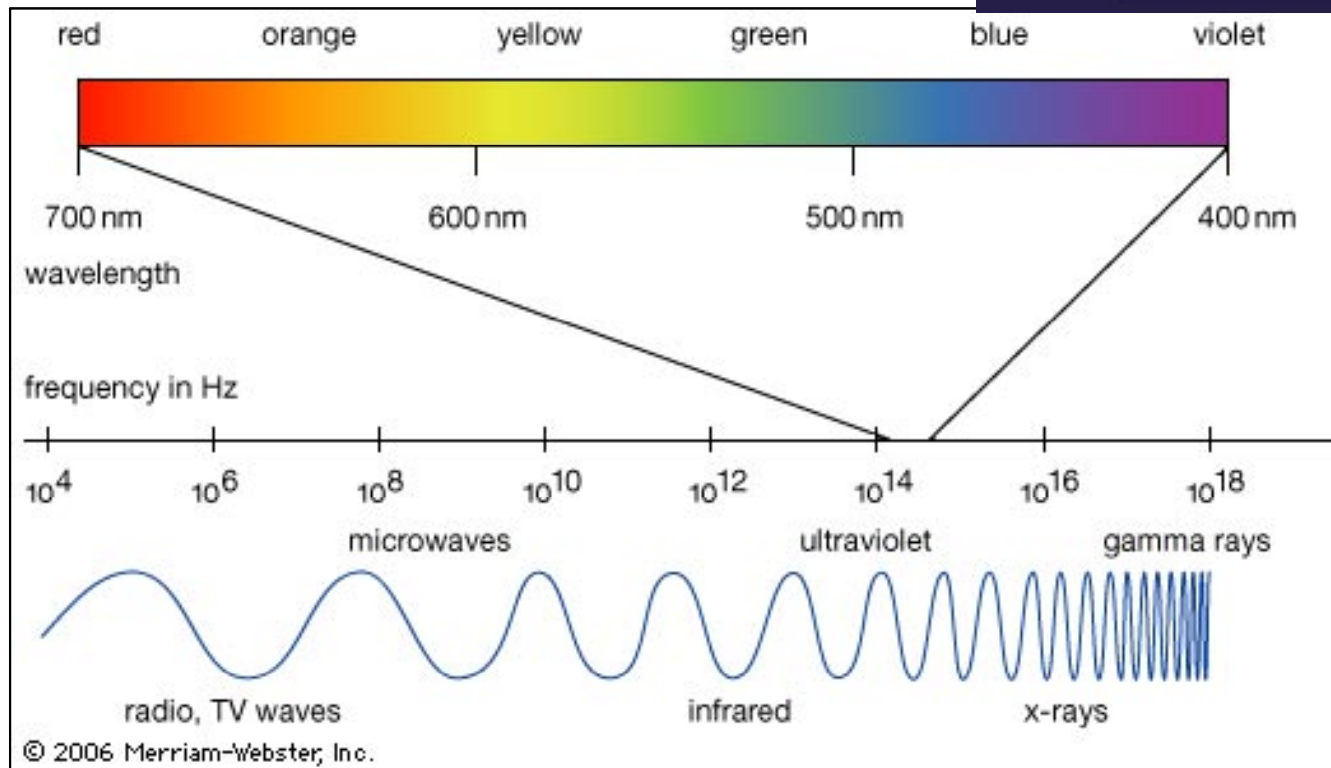
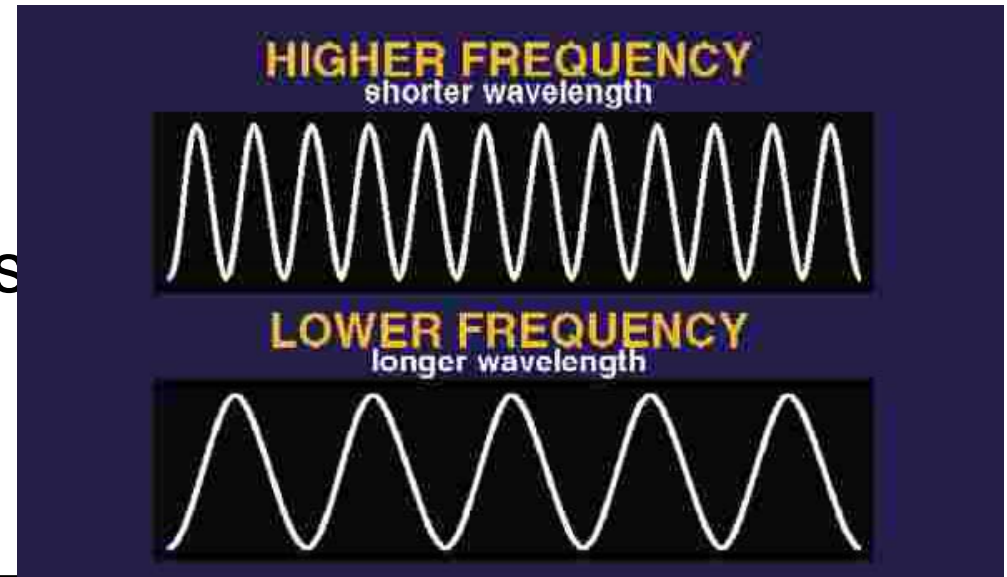
1. Wavelength vs. Frequency
2. Absorption by pigments

4. Juli 2013

Some principles of light

Light consists of photons,
which properties are best
described by wave functions

Light is an electromagnetic
wave



$$c = \lambda \cdot f$$

c: light speed
(300 000 km/s)

λ : Wavelength (nm)

f: Frequency
(1/s or Hz)

Some principles of light: light from a plant's perspective

98% of the electromagnetic radiation on the surface of our earth is between 300 und 3000 nm

Ultraviolet radiation (UV)
[280 – 370 nm]

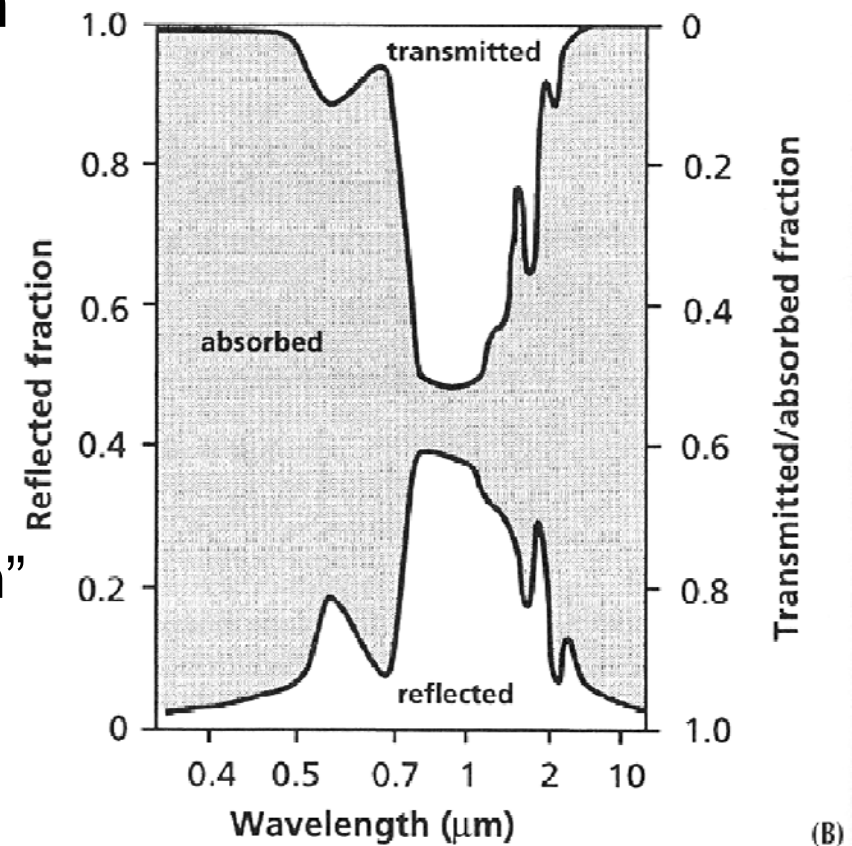
Photosynthetically active radiation
[370 – 700 nm]

- PAR: “Photosynthetic active radiation”
- PFD: “photone flux density”
- PPFD: “photosynthetic photone flux density”

Infrared radiation

- Near Infrared (near-IR, 700 – 3000 nm)
- Long wavelength IR (> 3000 nm)

Thermal radiation [8000 – 16000 nm or
8 – 16 μm]

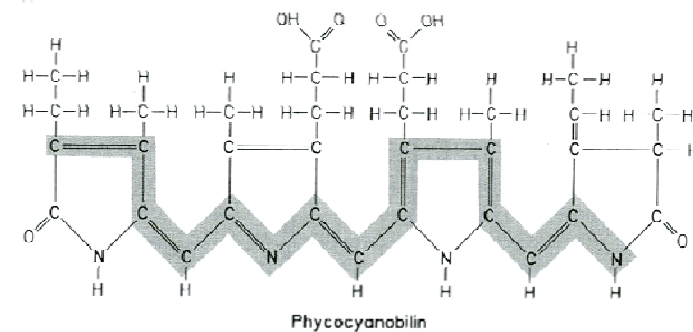
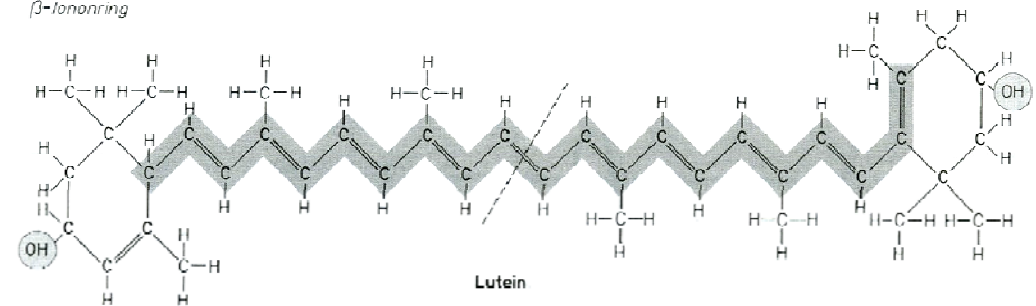
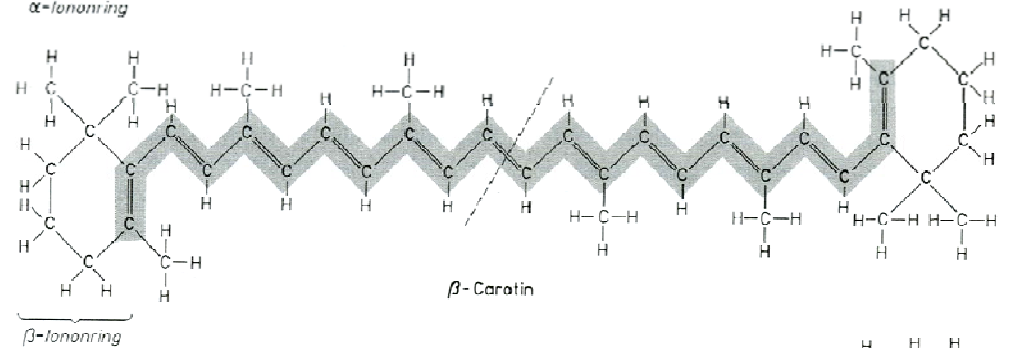
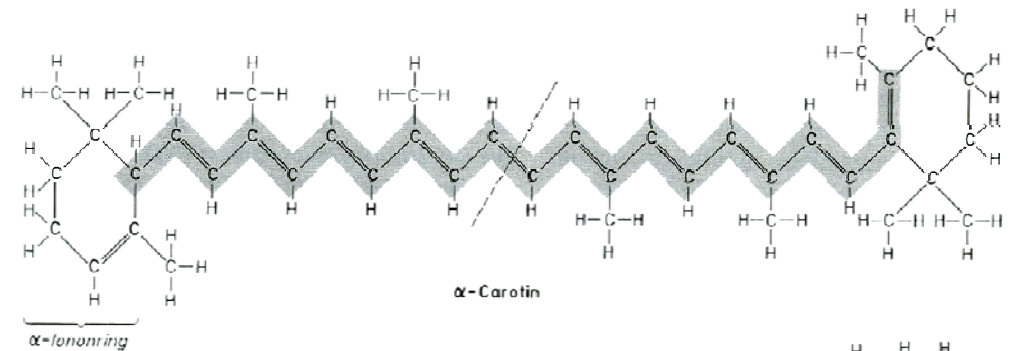
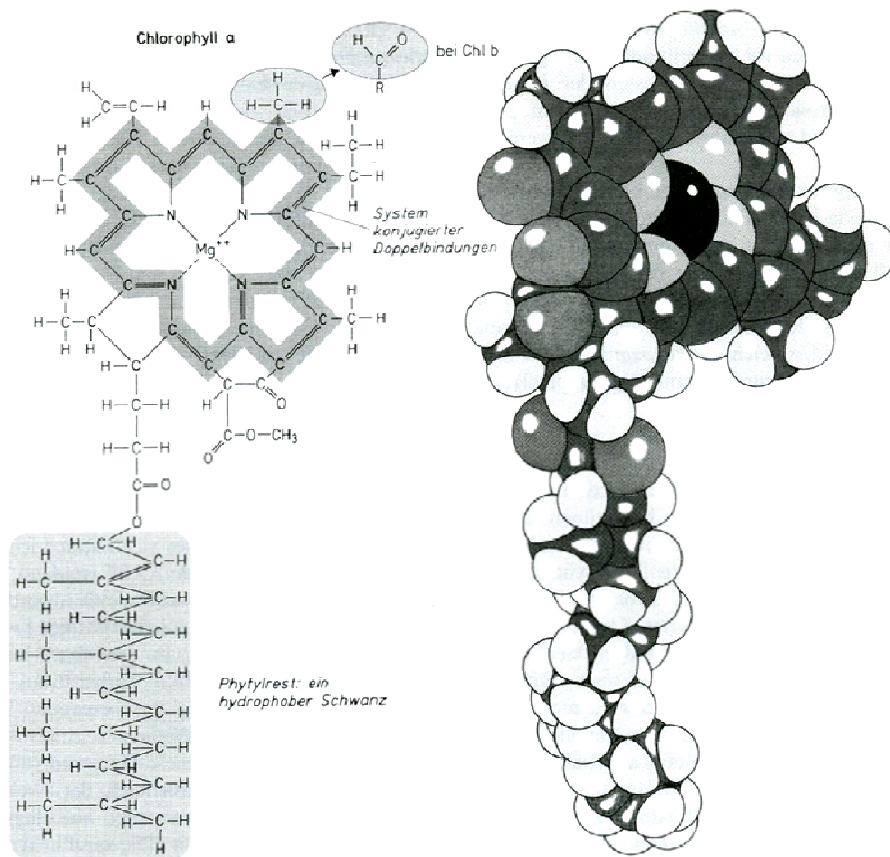


(B) Wavelength spectrum of absorbed, transmitted, and reflected irradiance (% of total) by a leaf (Gates 1965).
Copyright Ecological Society of America.

Some principles of light:

Light absorption by pigments

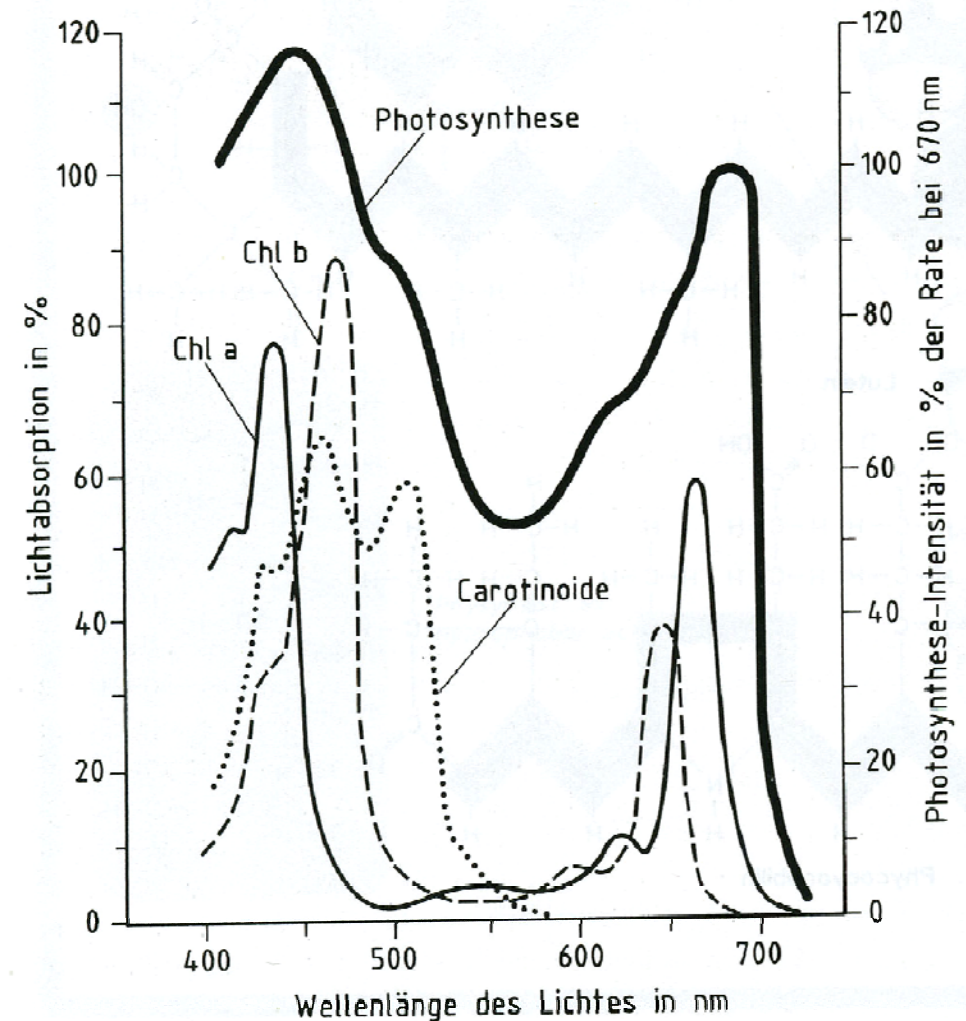
All pigment of the photo-synthetic apparatus have conjugated π -electron systems



Some principles of light:

Light absorption by pigments

- Plant photosynthetic pigments absorb light between 380 – 700 nm
- Each pigment has its characteristic spectral absorption features (spectral fingerprint)
- Absorption features are used in classical spectroscopy to quantify substances

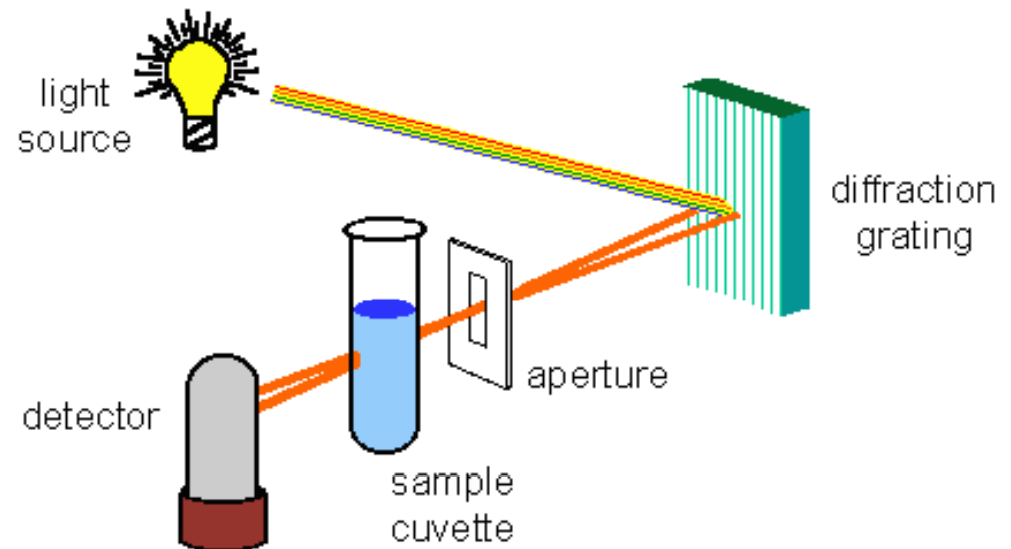


•Lüttge, Kluge, Bauer, Abb. 8-6

Some principles of light:

Classical spectroscopy

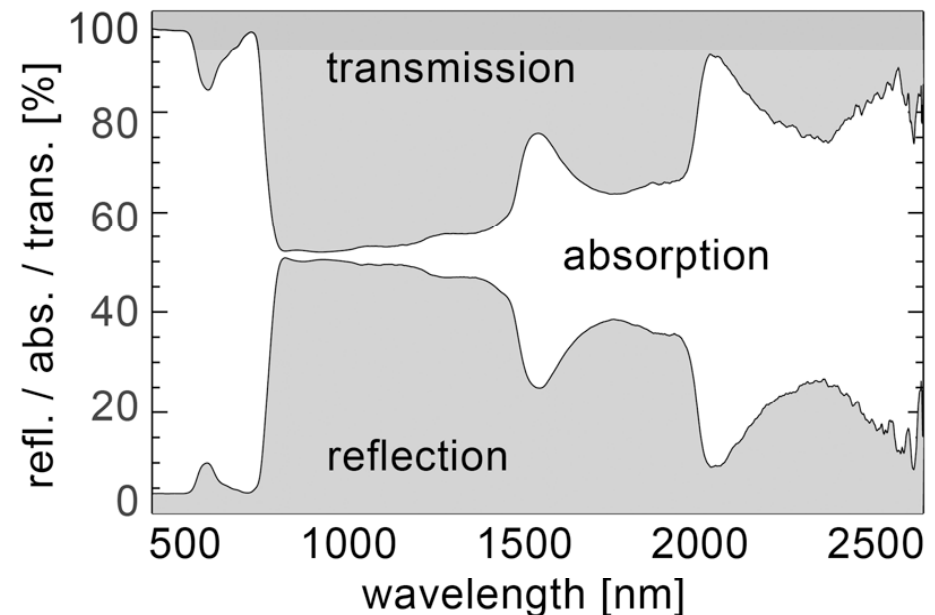
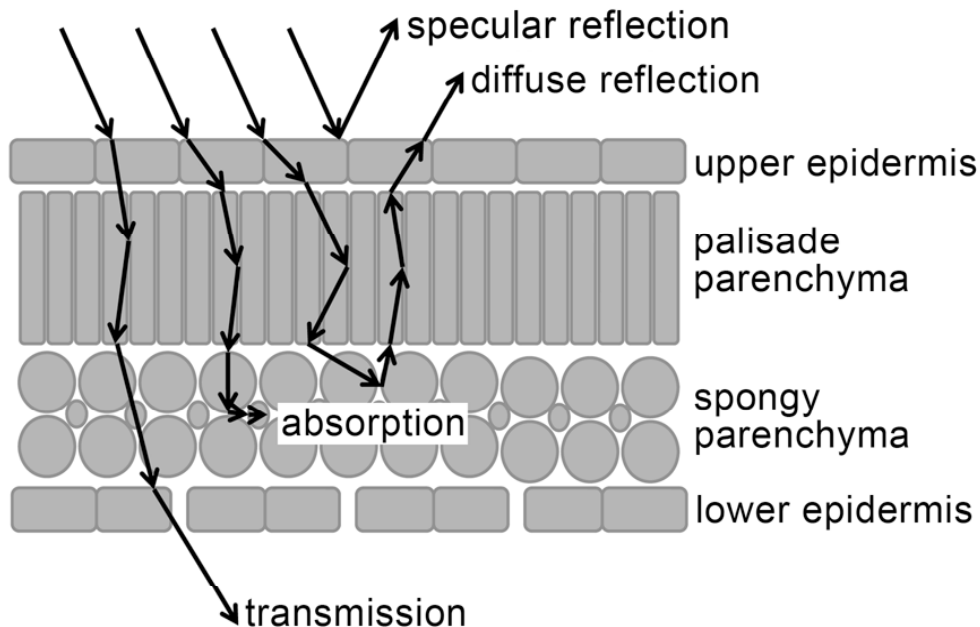
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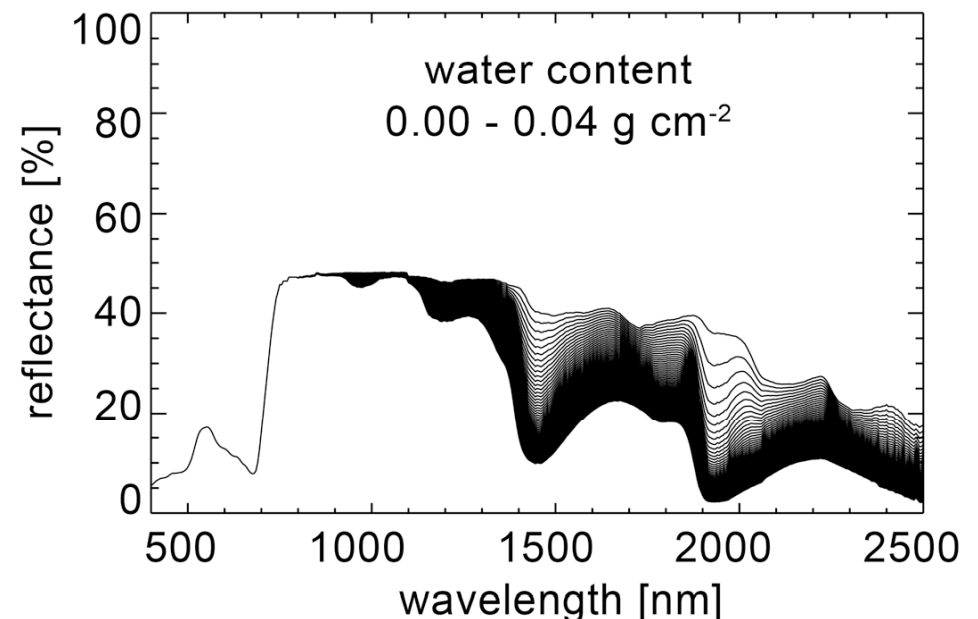
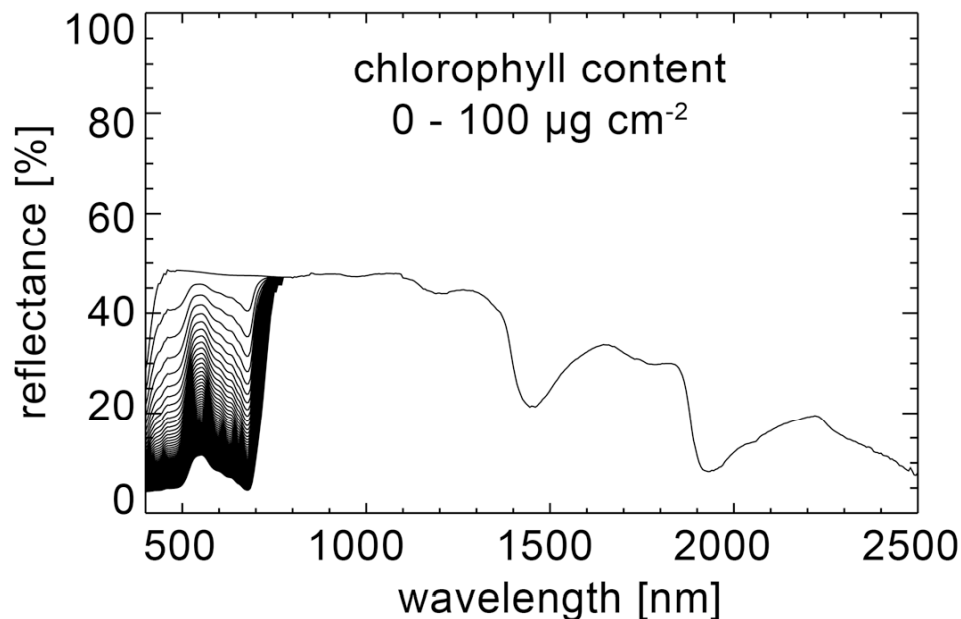
Imaging Spectroscopy

1. Reflection, Transmission, Absorption
2. Imaging Spectroscopy of leaves, plants and canopies
4. Juli 2013
3. [synonym: Hyperspectral Imaging]

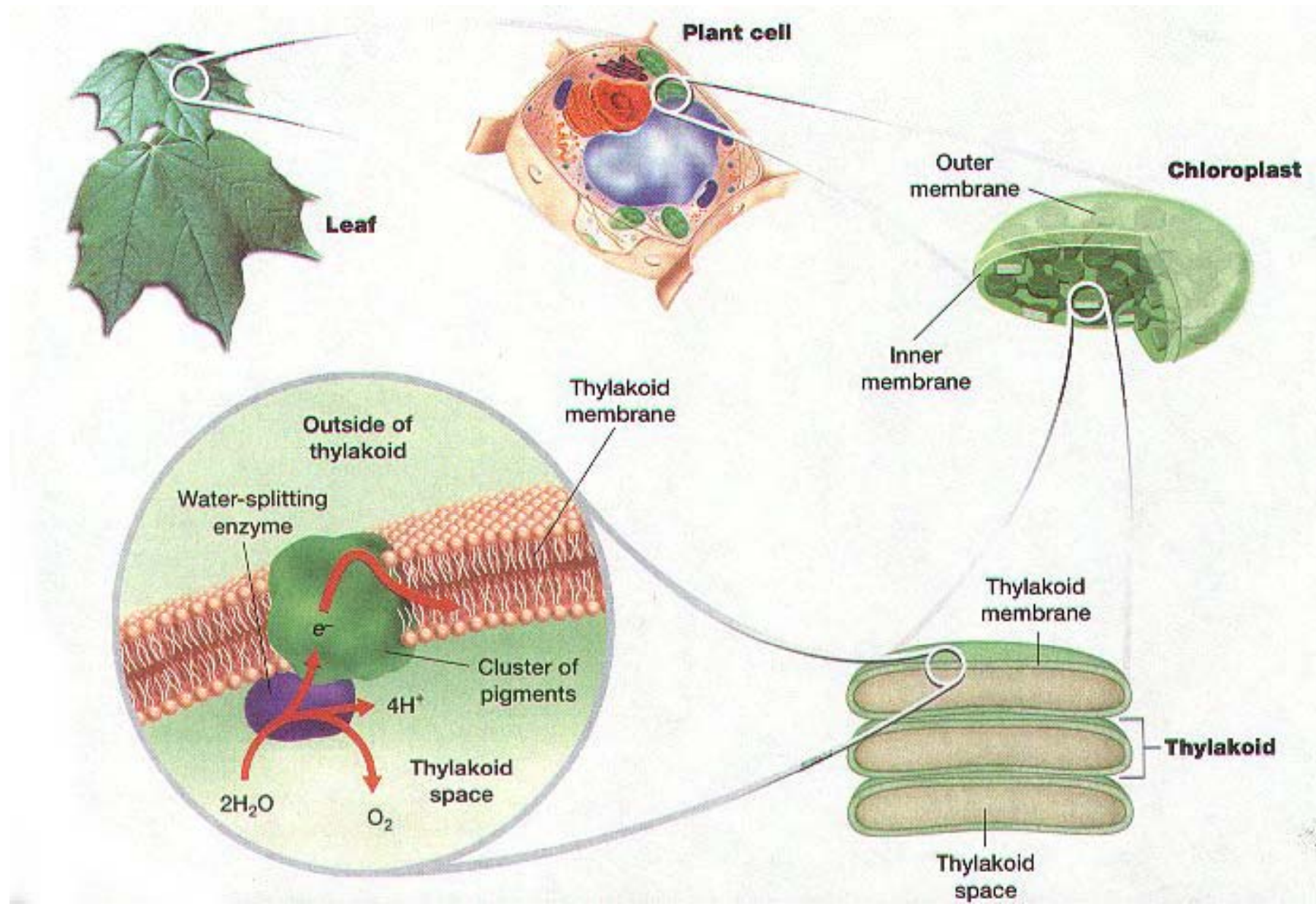
Absorption, transmission and reflection of photons is primarily determined by plant pigments and constituents

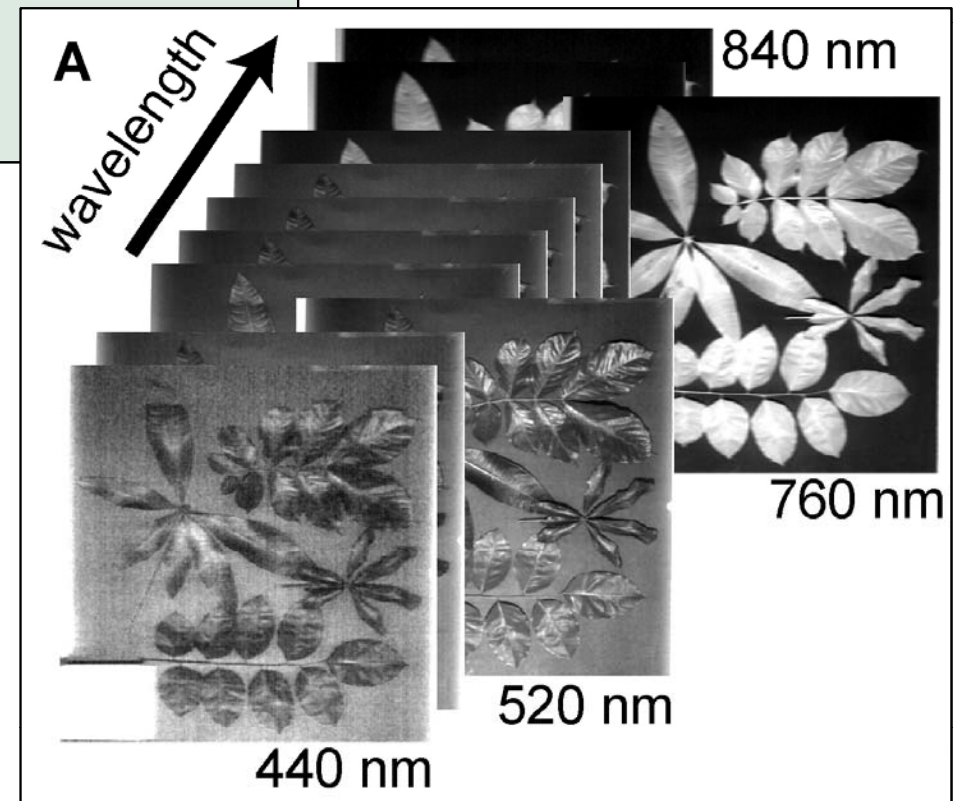
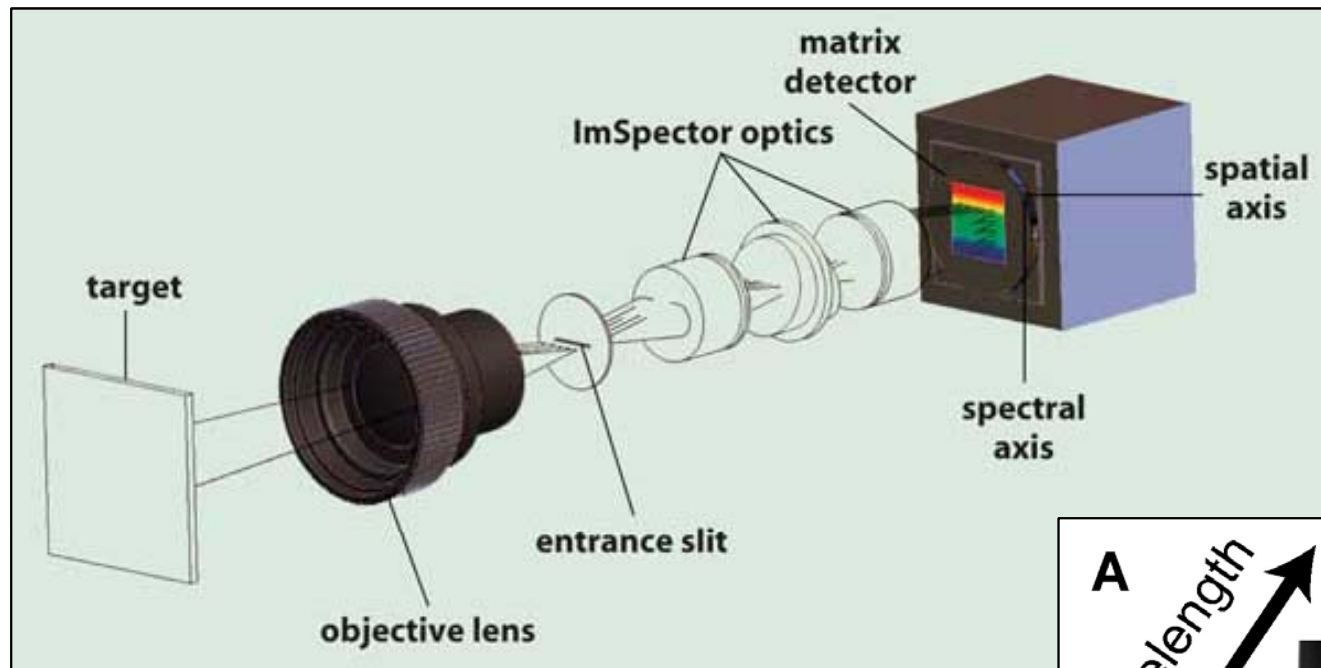


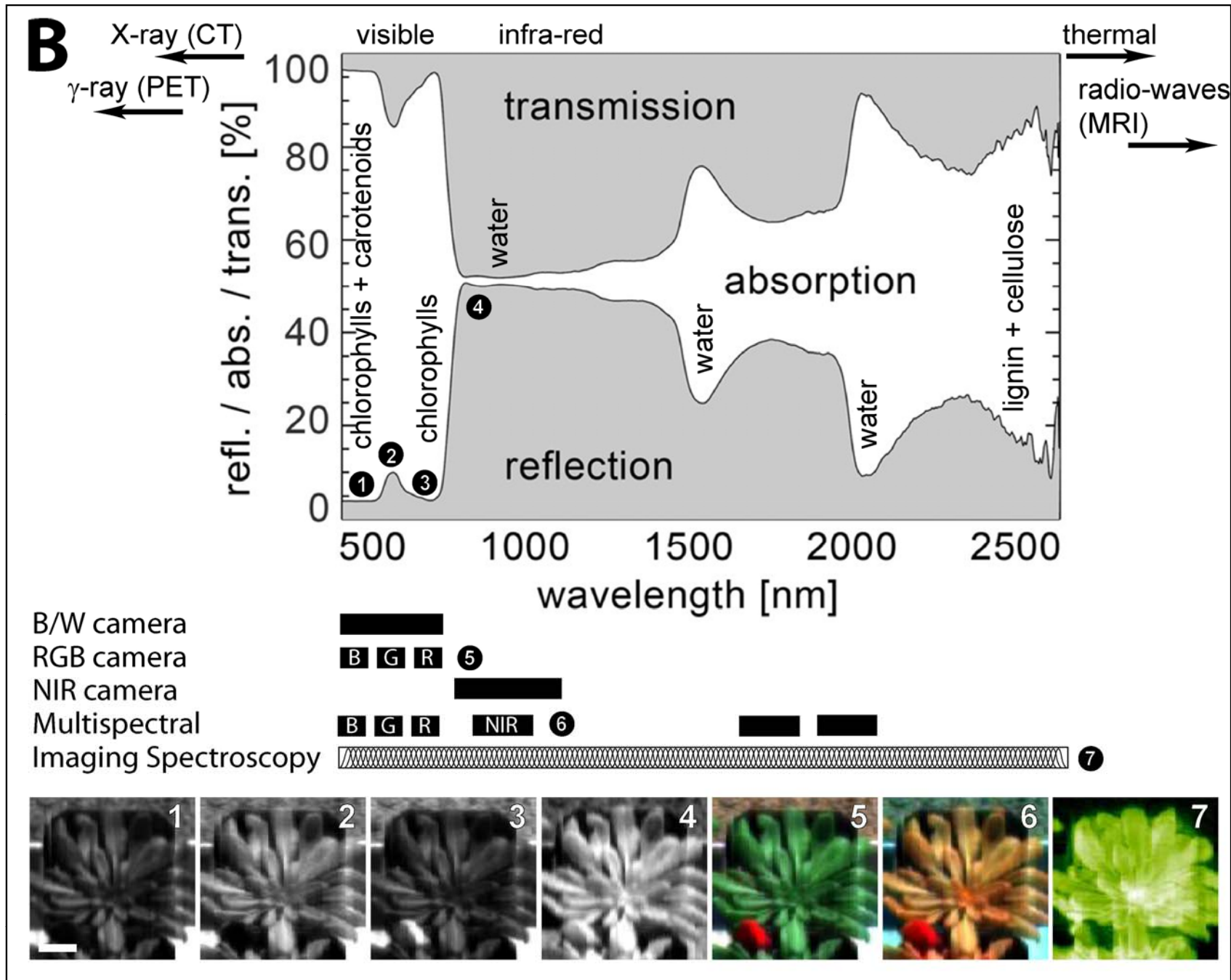
Chlorophyll, carotenoid, water and cellulose are the main parameters that determine reflectance of plant surfaces



Looking into the detailed structure of the photosynthetic machinerie



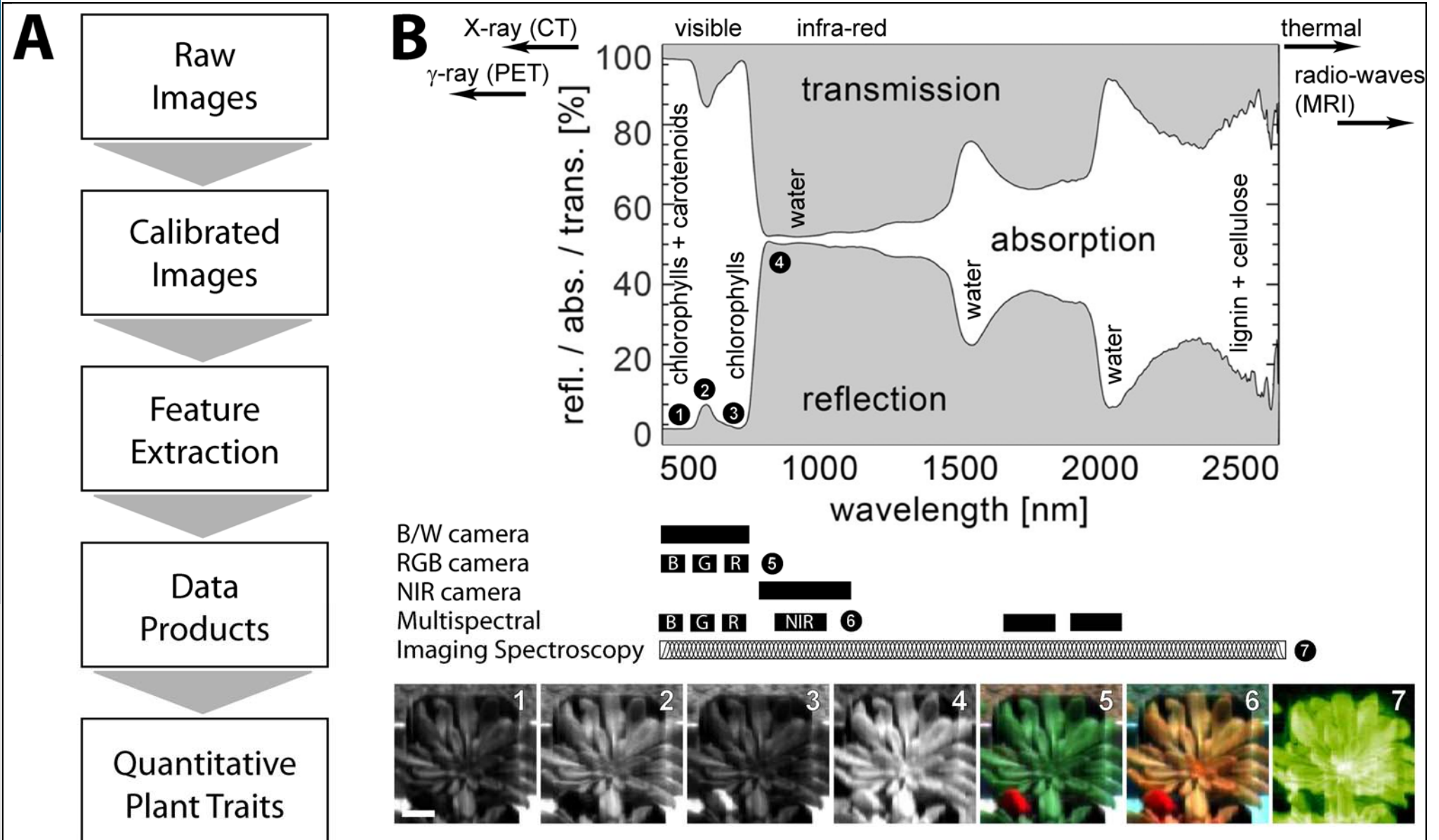




How to extract quantitative data

1. vegetation indices
2. advanced methods (support vector machines and spectral unmixing)

4. Juli 2013



Vegetation indices: a simple way to measure plant ecosystems

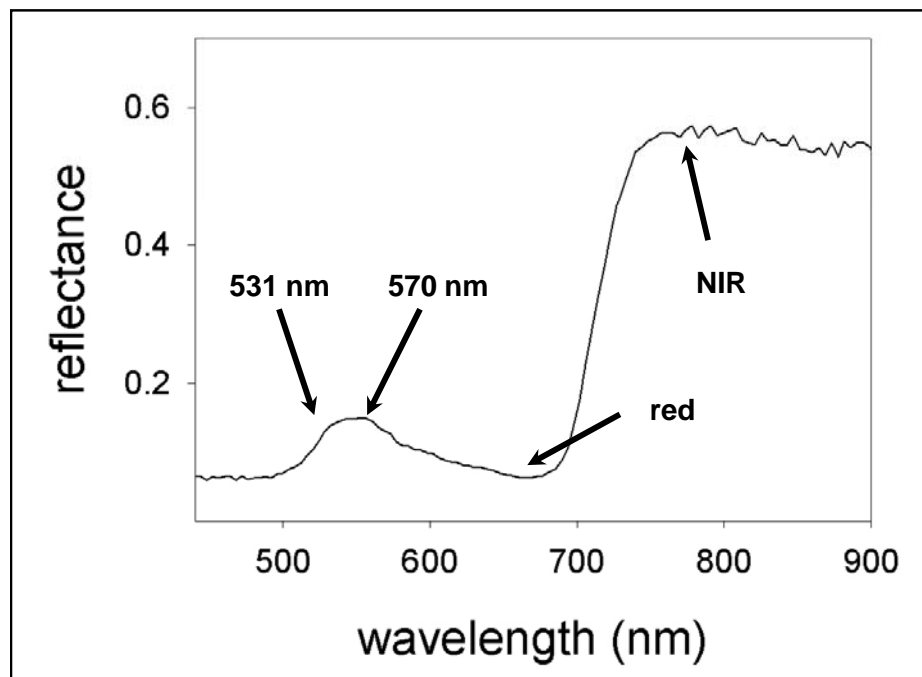
- SR (Simple ratio): correlation with chlorophyll content or leaf area index
- NDVI: correlation with chlorophyll content or leaf area index
- PRI (Photochemical Reflectance Index): correlation with photosynthetic efficiency

$$SR = \frac{R_{NIR}}{R_{red}}$$

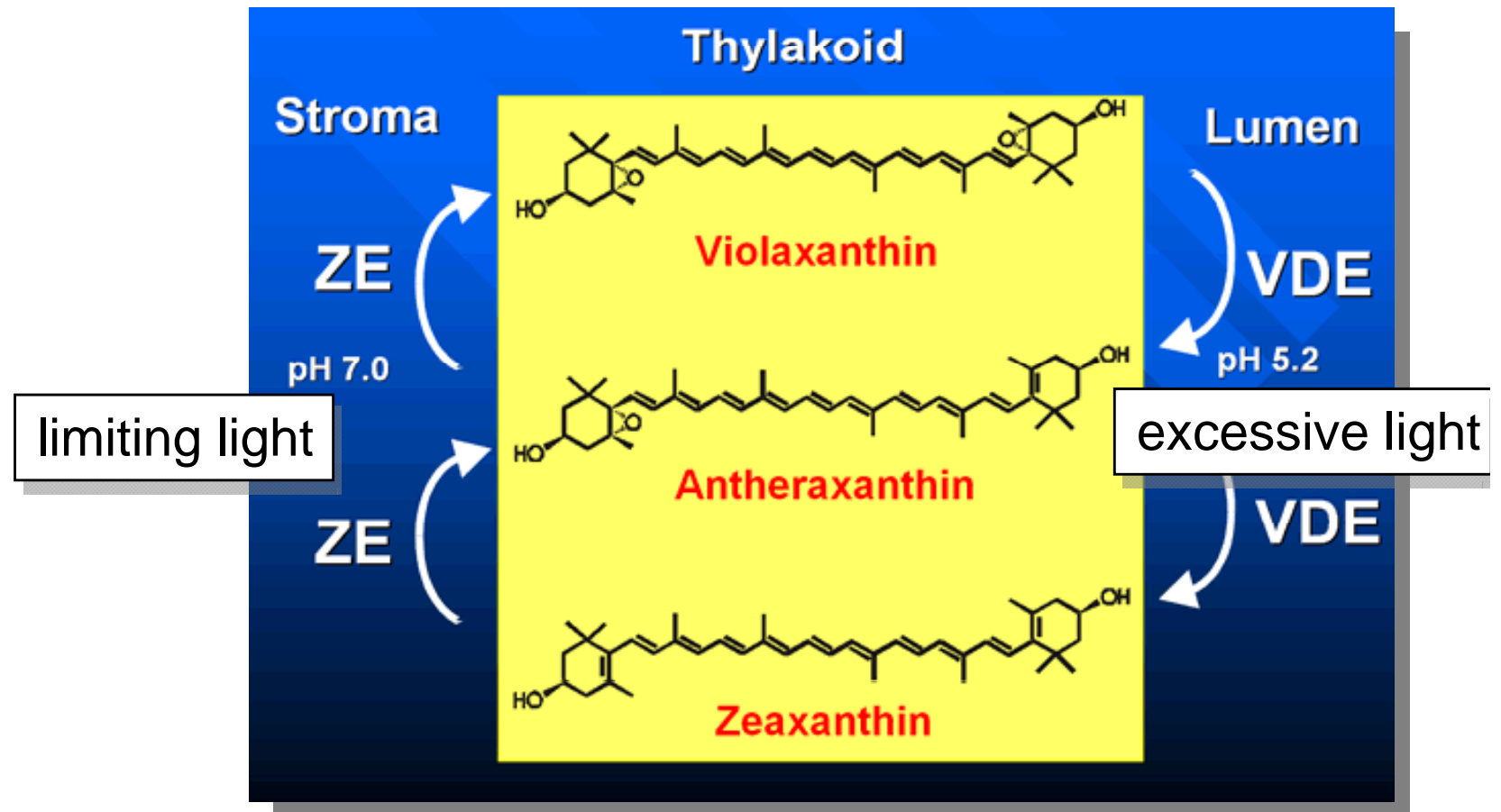
$$NDVI = \frac{R_{NIR} - R_{red}}{R_{NIR} + R_{red}}$$

$$NDVI = \frac{R_{780} - R_{670}}{R_{780} + R_{670}}$$

$$PRI = \frac{R_{570} - R_{531}}{R_{570} + R_{531}}$$

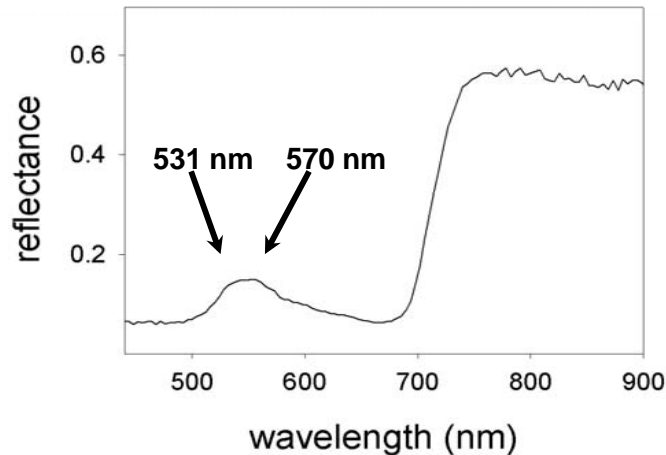


The Xanthophyll Zyklus a dynamic mechanism to protect from excess light

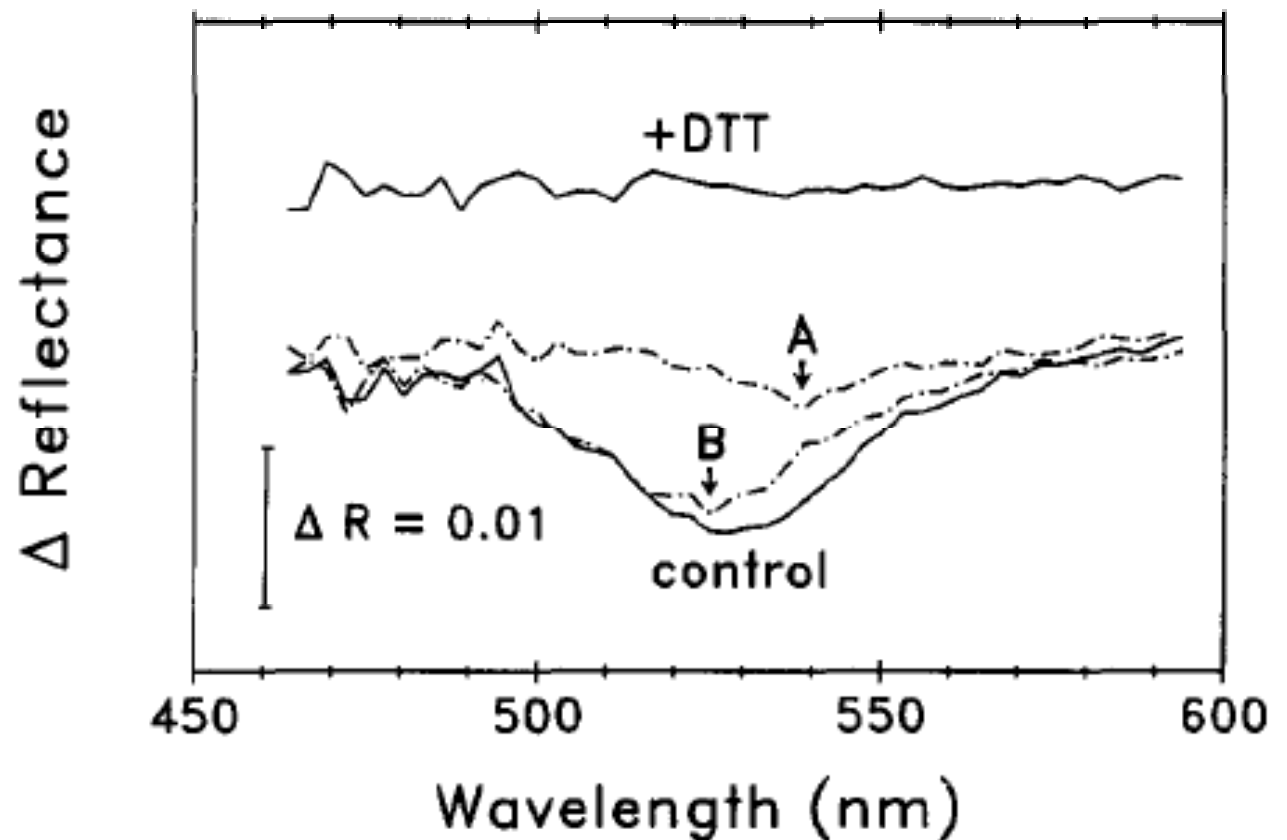


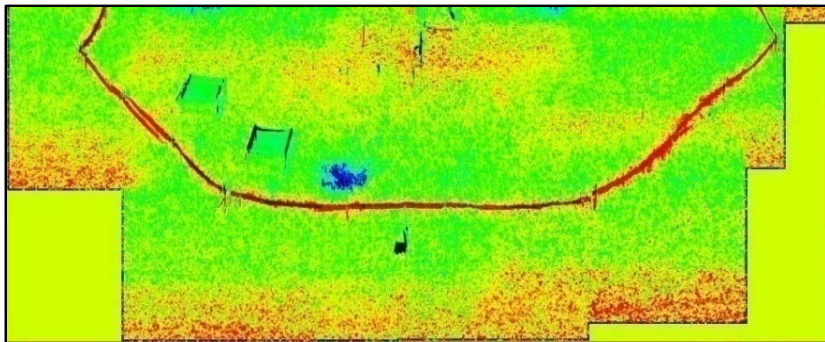
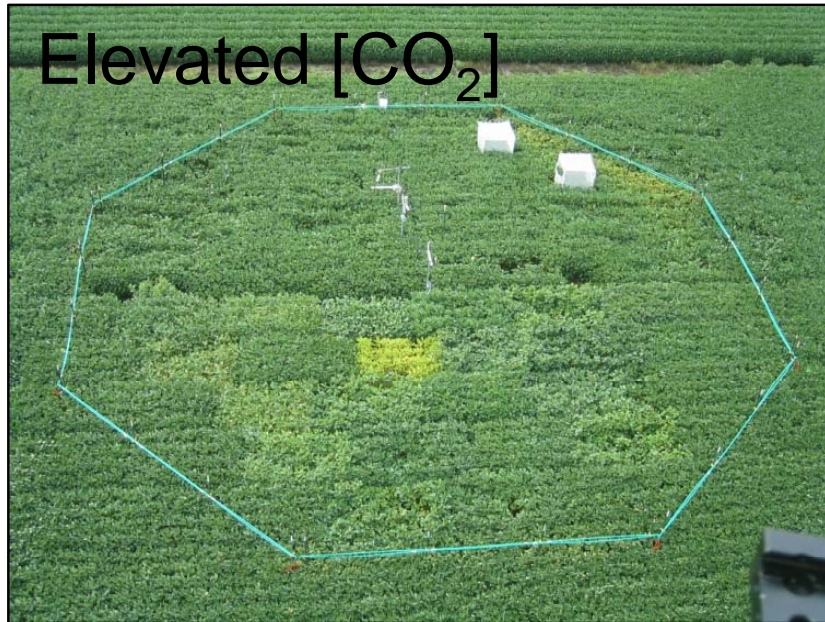
Dynamic changes in pigment composition that can be measured in the green spectral region

The Photochemical Reflectance Index (PRI) correlate with photosynthetic efficiency (on the leaf level)



$$PRI = \frac{R_{570} - R_{531}}{R_{570} + R_{531}}$$



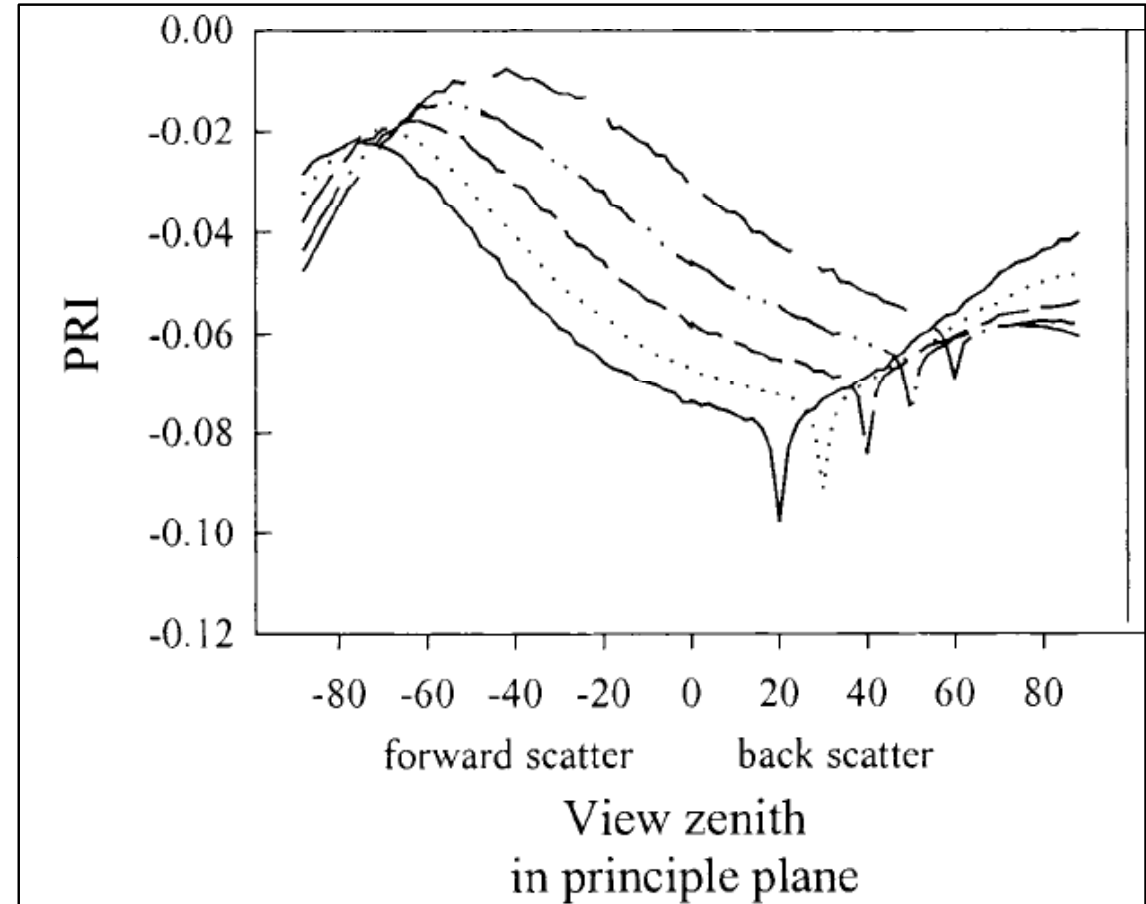


PRI



-0.026

0.082



Barton & North (2001) *Remote Sensing of Environment* 78, 264-273

Please think and don't use vegetation indices naively

Rascher and Pieruschka (2008) *Precision Agriculture*, 9, 355-366

There is a large number of vegetation indices

EVI: Enhanced Vegetation Index (similar to NDVI including blue reflectance)

Red Edge Indices (quantify the slope of red absorption)

NDNI: Normalized Difference Nitrogen Index (Nitrogen absorption at 1510 nm)

NDLI: Normalized Difference Lignin Index (Lignin absorption at 1754 nm)

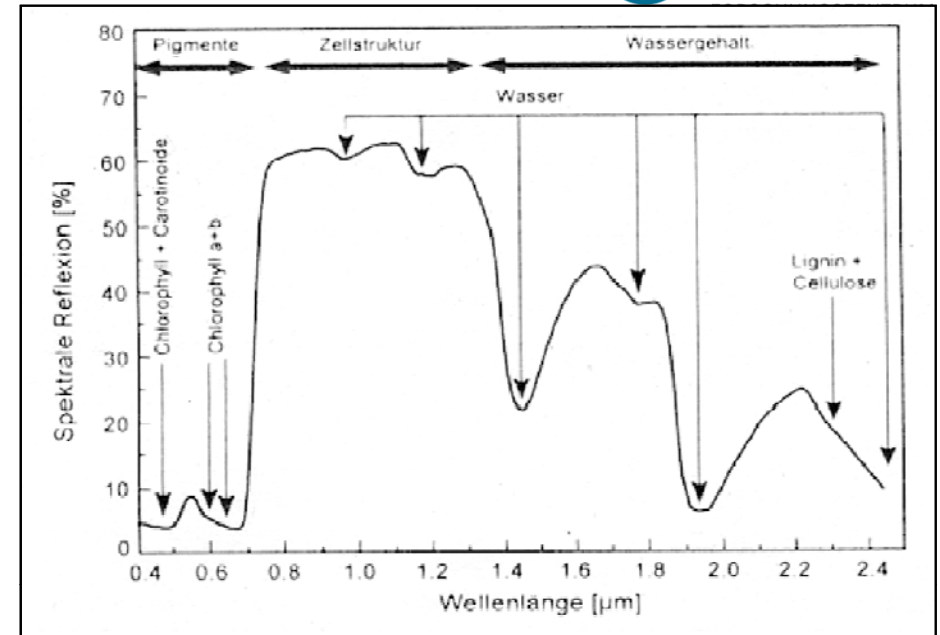
CAI: Cellulose Absorption Index (cellulose absorption at 2000 – 2200 nm)

PSRI: Plant Senescence Index (correlates with senescence and fruit ripening)

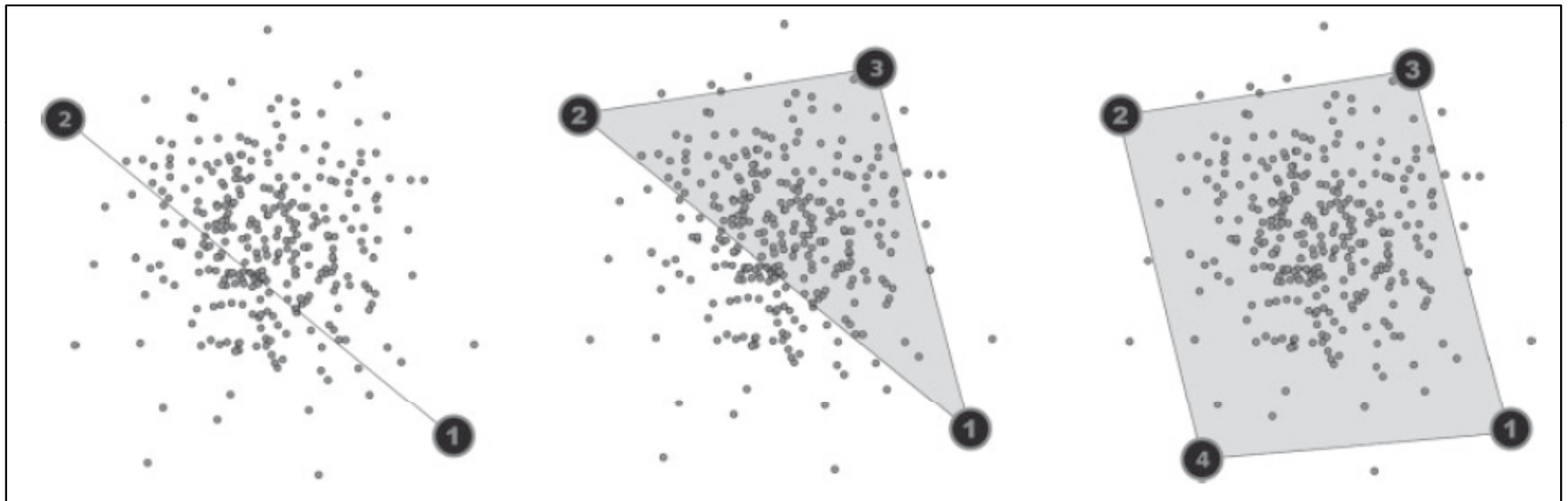
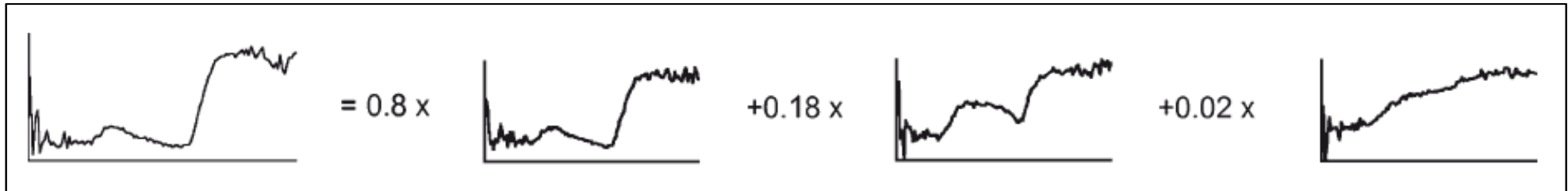
CRI1 / CRI2: Carotenoid Reflectance Index (yellow spectral region, correlates with carotenoid / chlorophyll ratio)

ARI1 / ARI2: Anthocyanin Reflectance Index (yellow and red spectral region, correlates with anthocyanin / chlorophyll ratio)

NDWI: Normalized Difference Water Index (canopy water content)

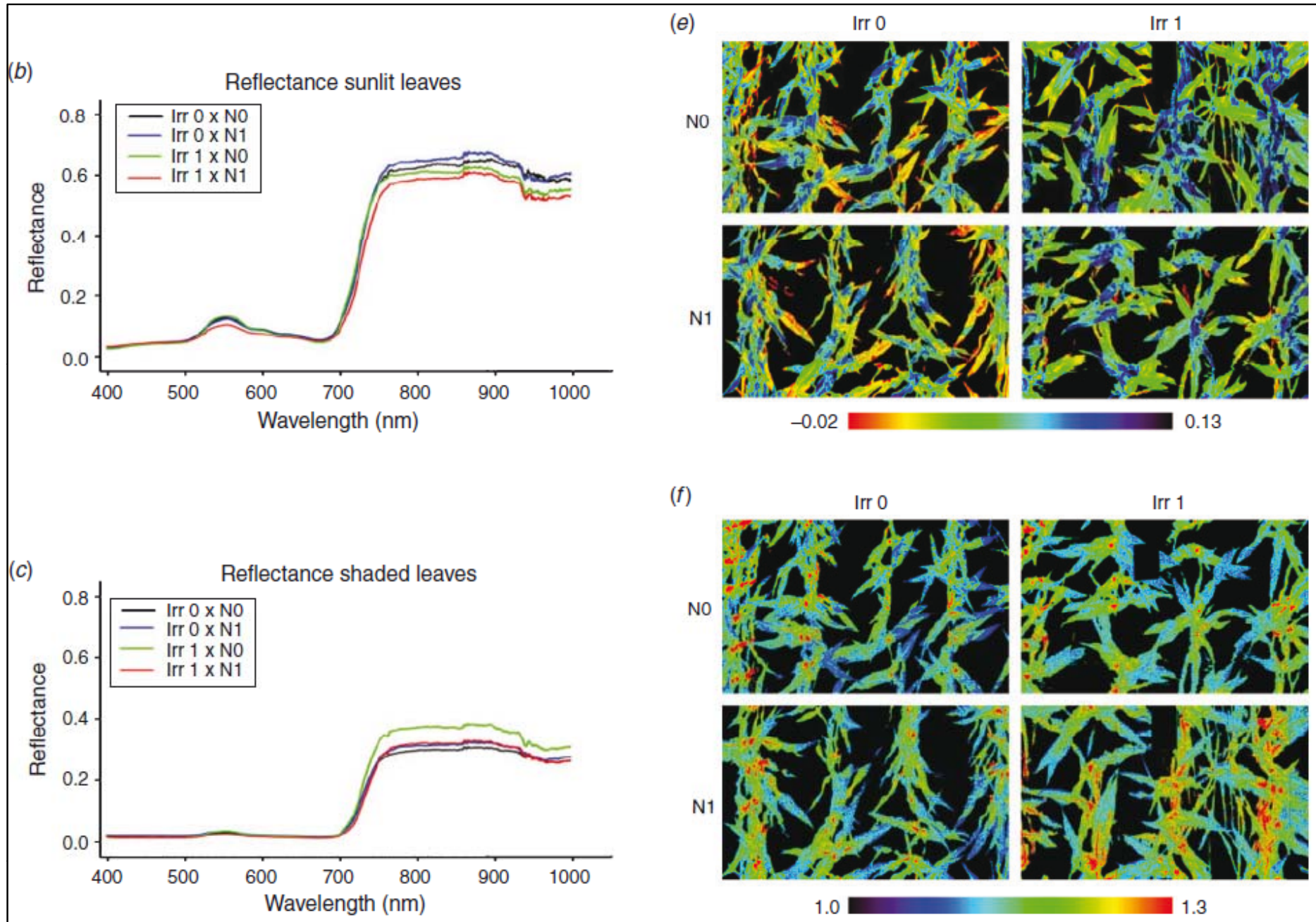


Beyond Indices: Taking the full spectrum into account

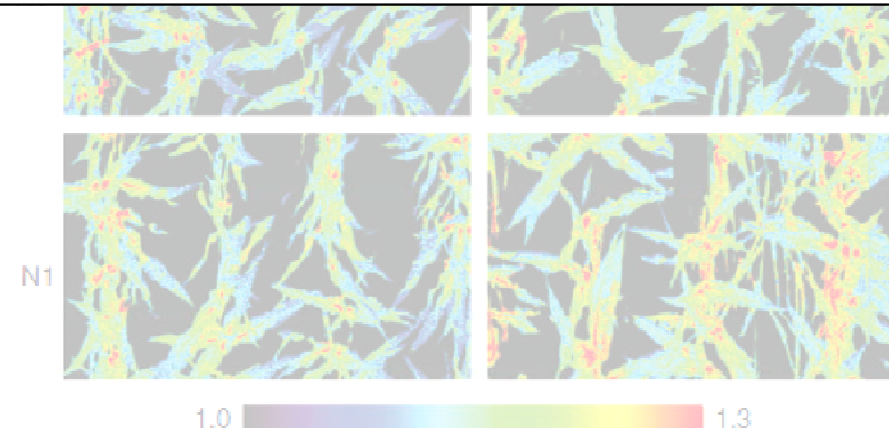
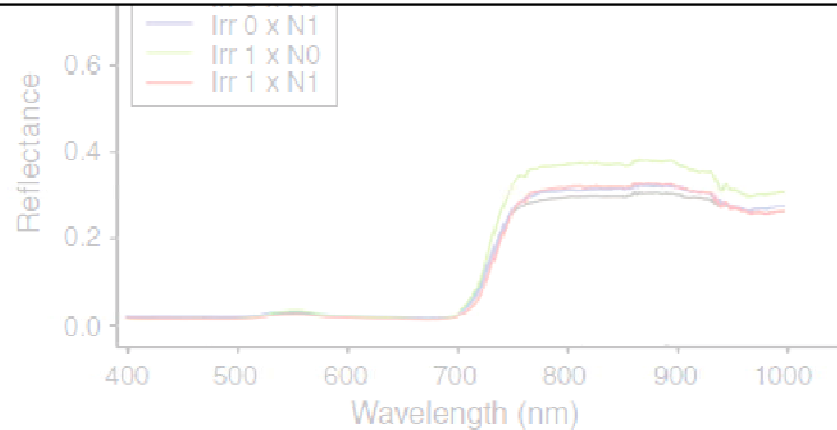
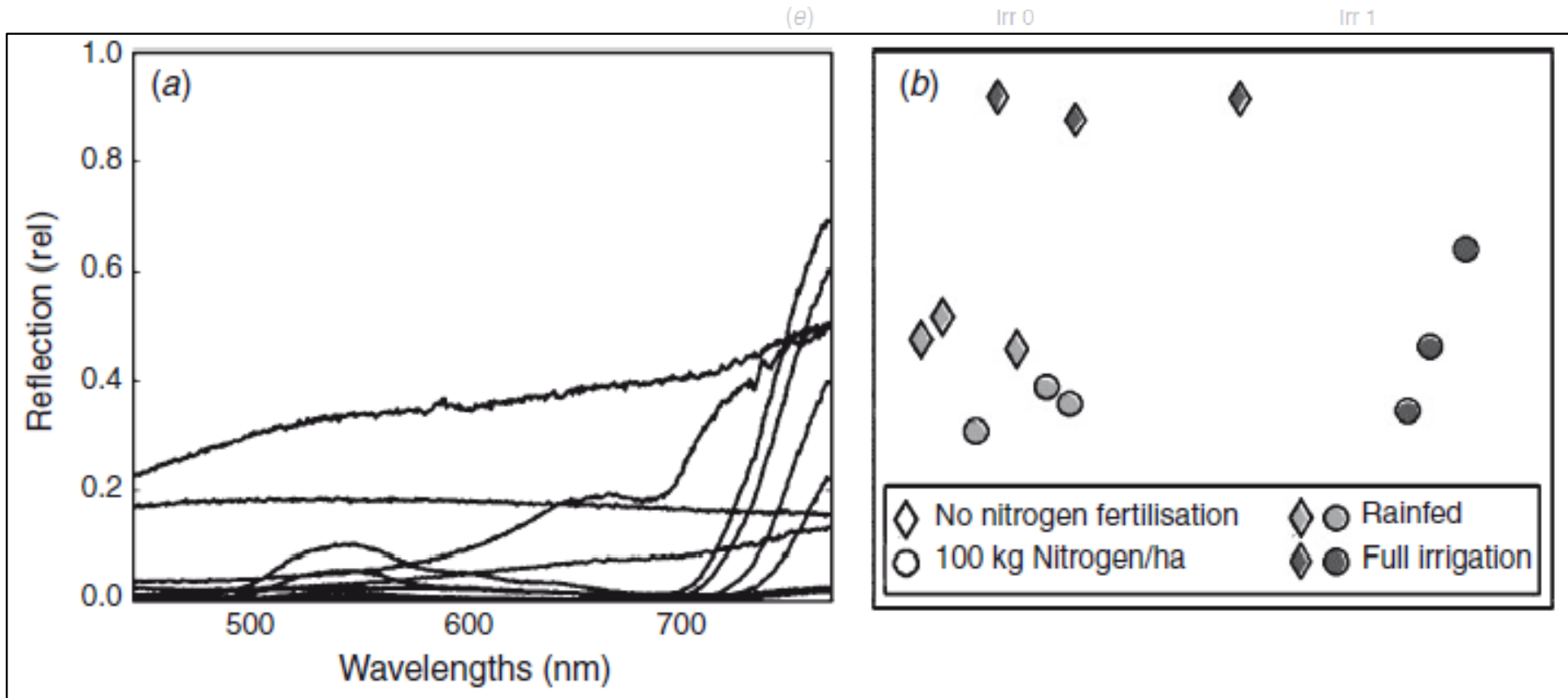


‘Endmember unmixing’ with the help of ‘support vector machines’ allows to quantify each spectrum in respect to predefined cases.

Beyond Indices: Taking the full spectrum into account



Beyond Indices: Taking the full spectrum into account

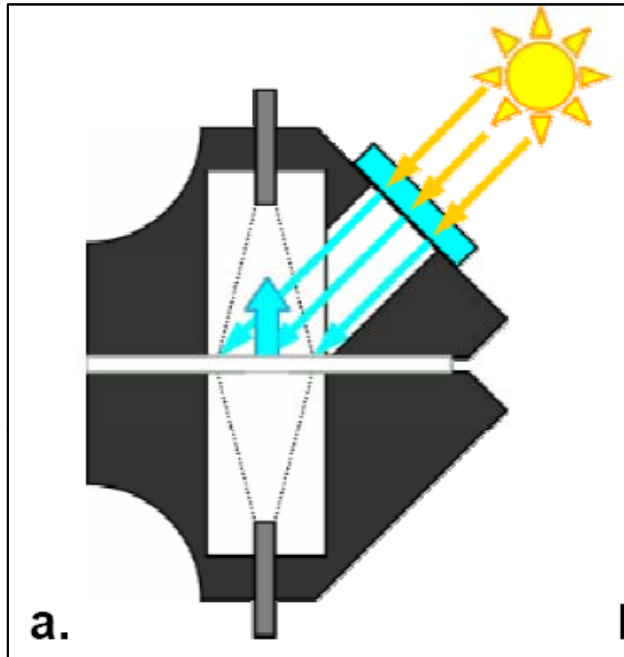


Some examples from the real life

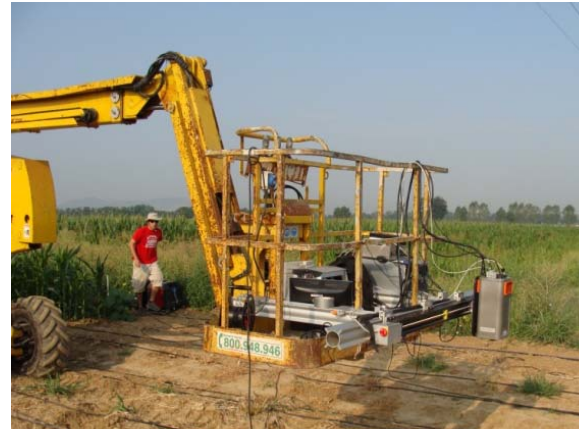
1. Leaf level – clip on
2. Leaf level: high precision measurements
3. Canopy level

4. Juli 2013

Leaf clip-on: simultaneous recording of reflectance, transmittance and absorbance



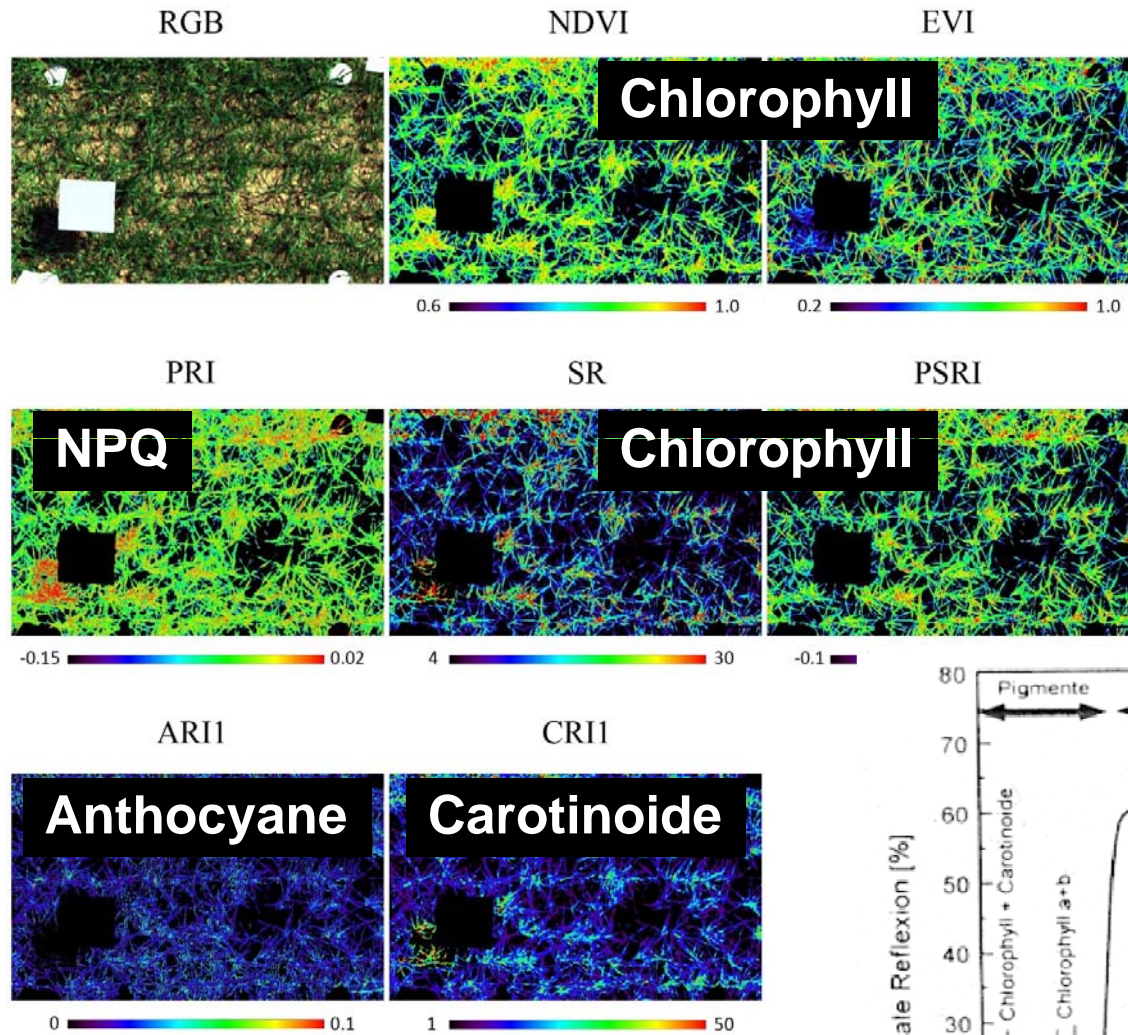
Imaging Spectroscopy on the canopy level



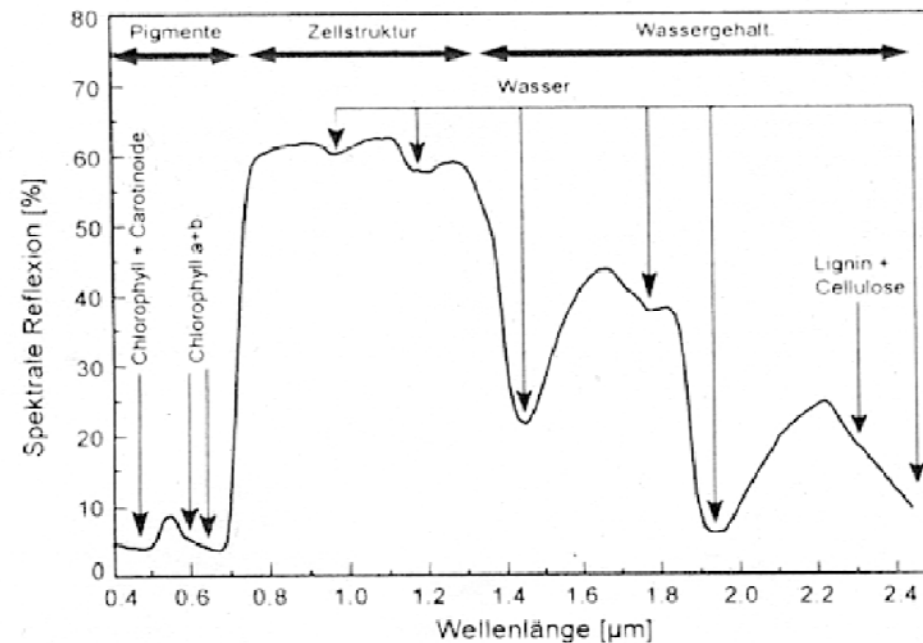
Corn, wheat, barley
and sugar beet
4-7 meters distance
1.5 x 2.7 meter plots



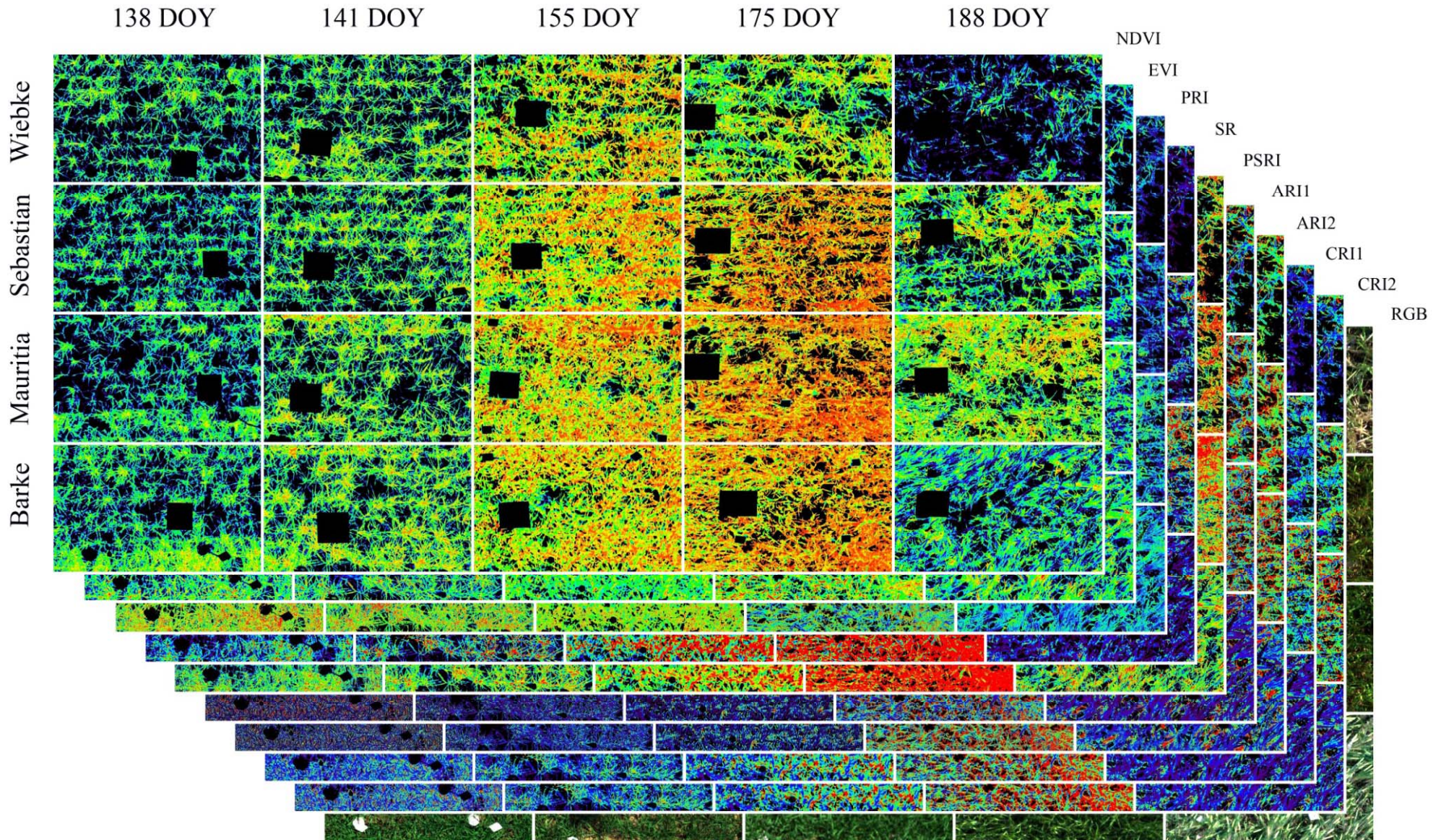
Imaging Spectroscopy on the canopy level



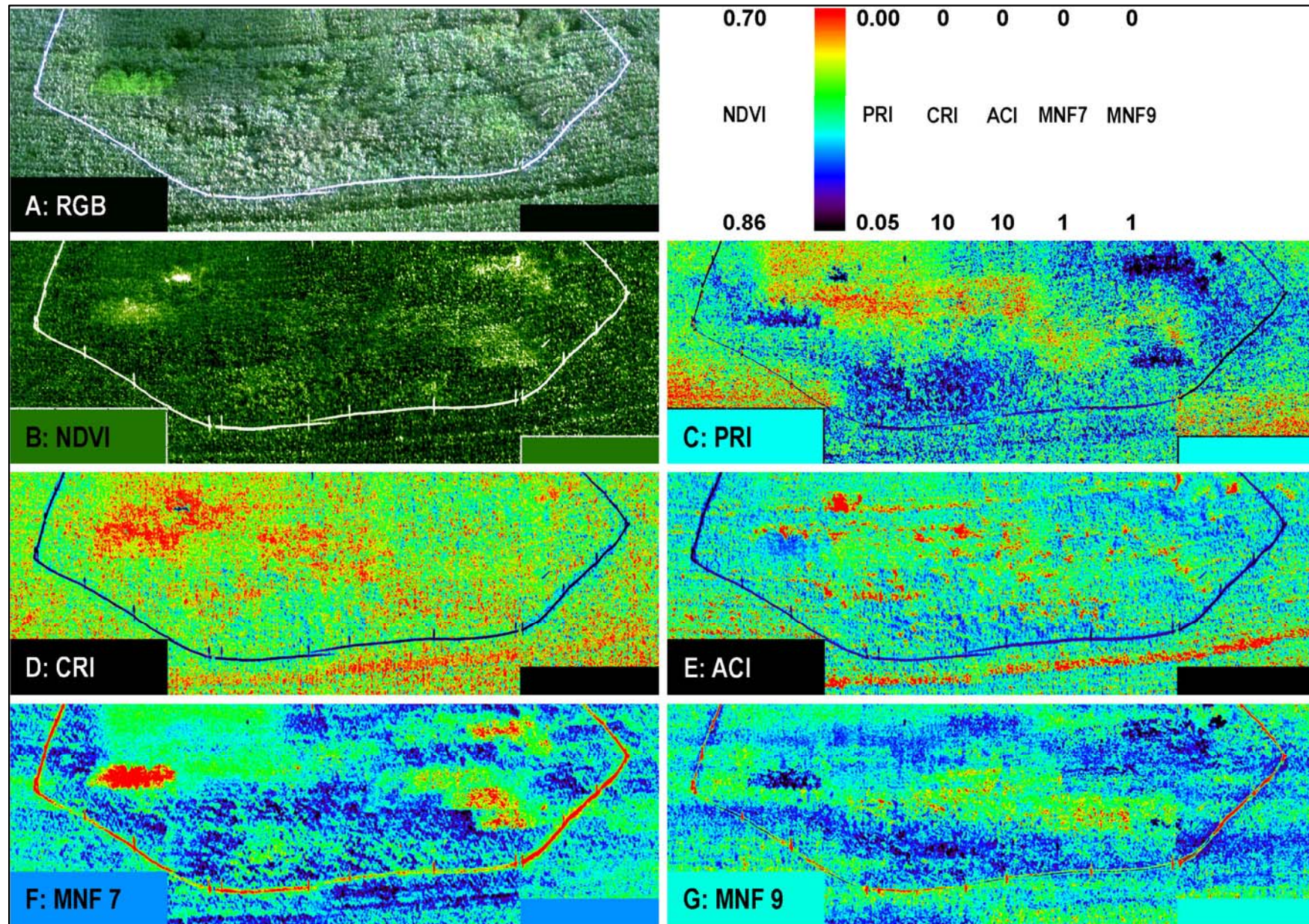
Wellenlängen-
spezifische Trennung
von Struktur- und
Funktionsparametern



Imaging Spectroscopy on the canopy level: seasonal and cultivar differences



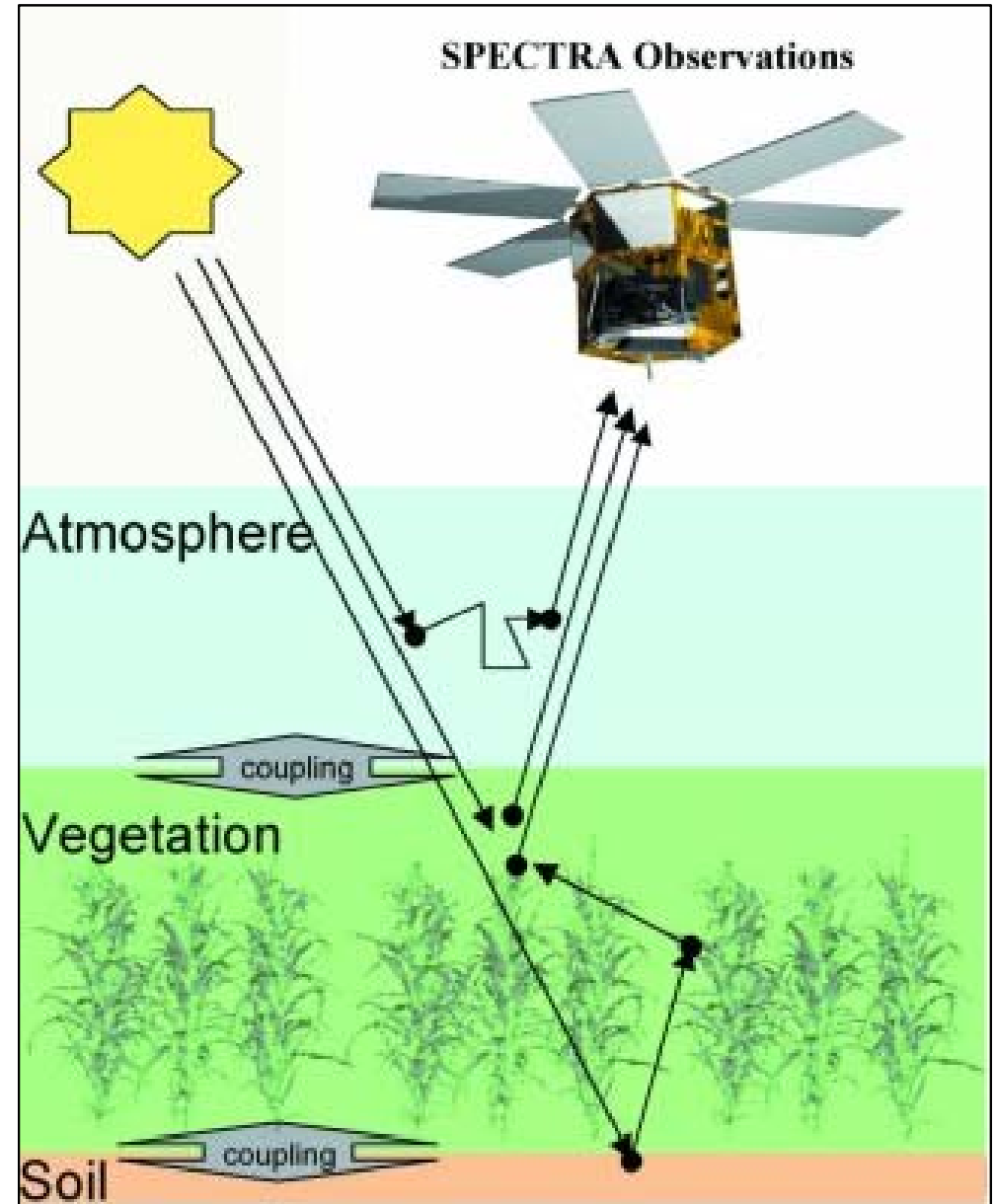
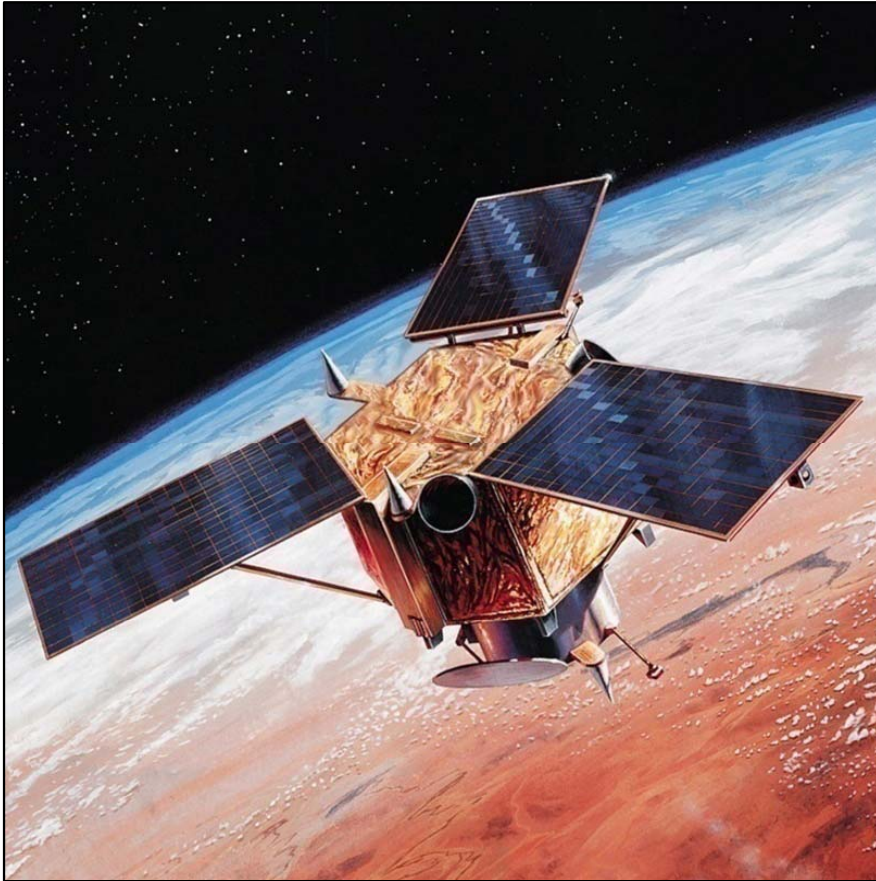
Imaging Spectroscopy on the canopy level: Influence of cultivars and elevated CO₂



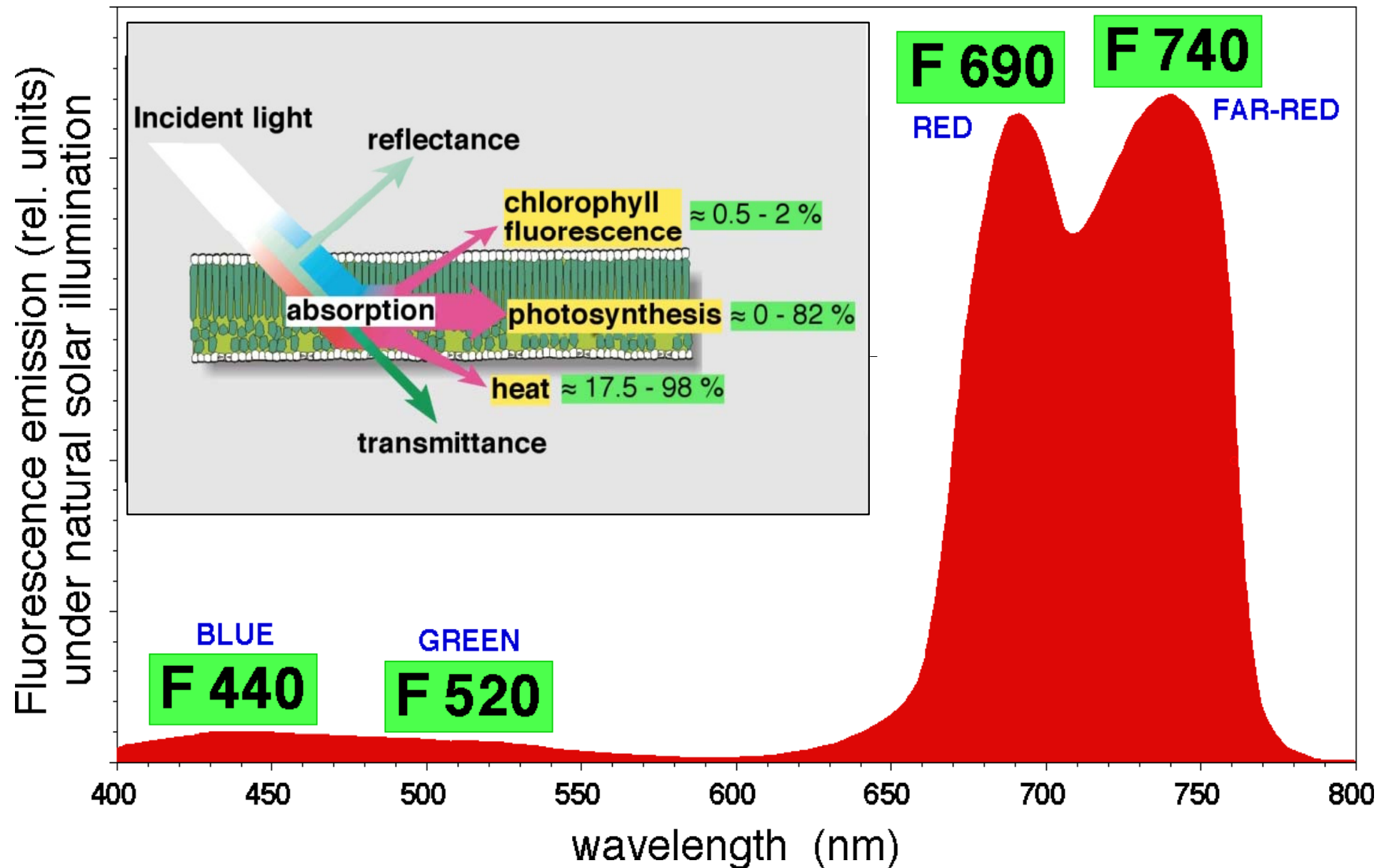
Linking spectroscopy with fluorescence

1. 4. Juli 2013 Concept of sun-induced fluorescence

Mapping photosynthesis from space: hyperspectral reflectance - fluorescence



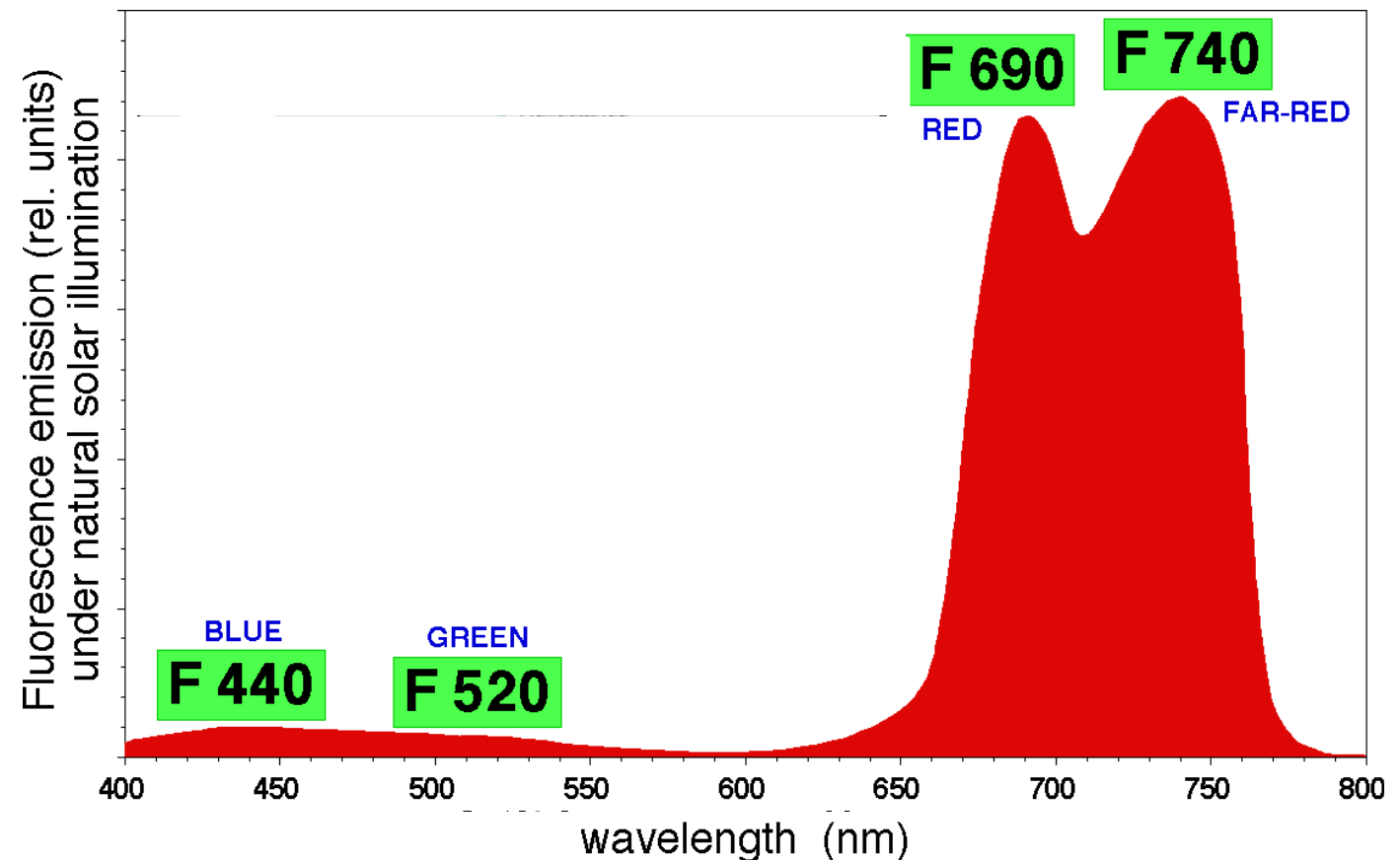
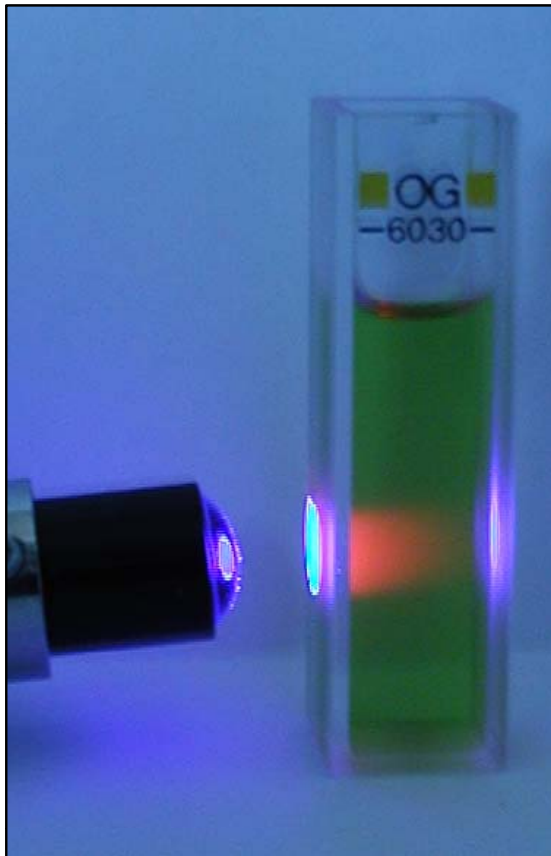
Chlorophyll Fluorescence (1)



courtesy of C. Buschmann

Chlorophyll Fluorescence (2)

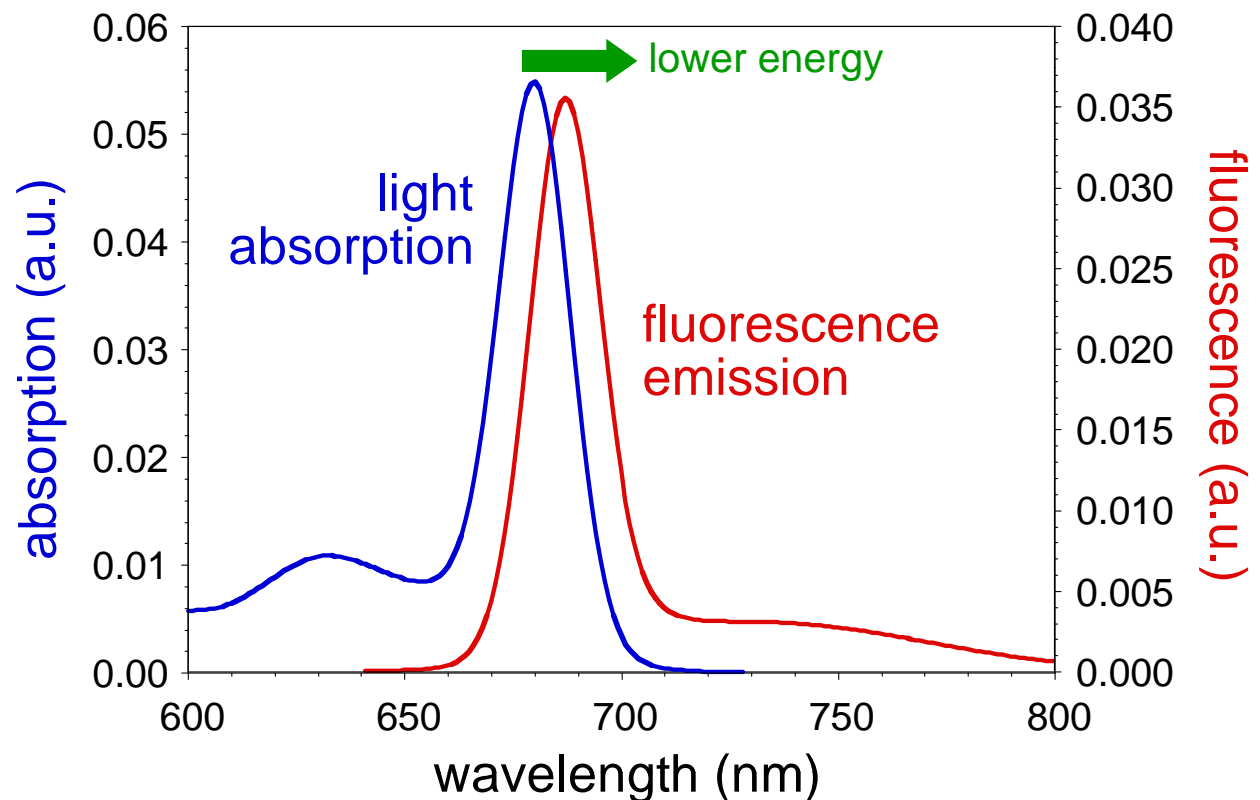
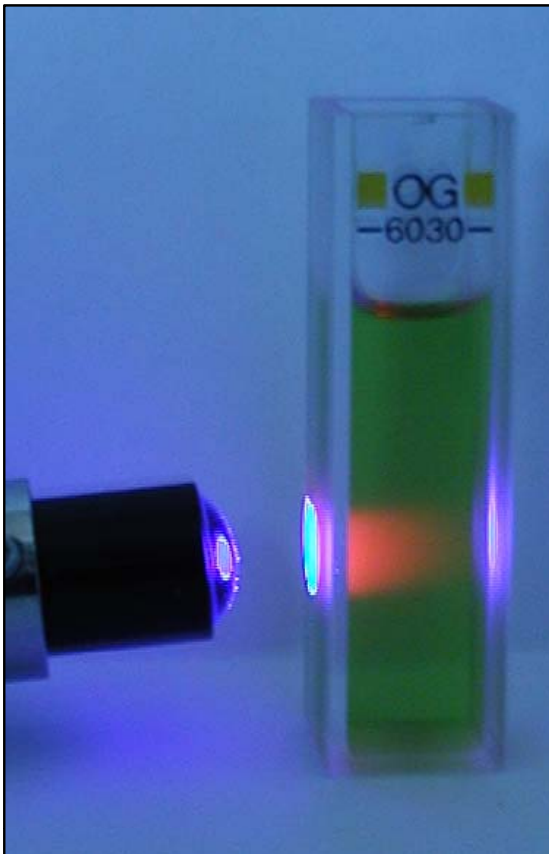
- Chlorophyll fluorescence is emitted from the core of the photosynthetic machinery and is directly correlated to efficiency of photosynthesis



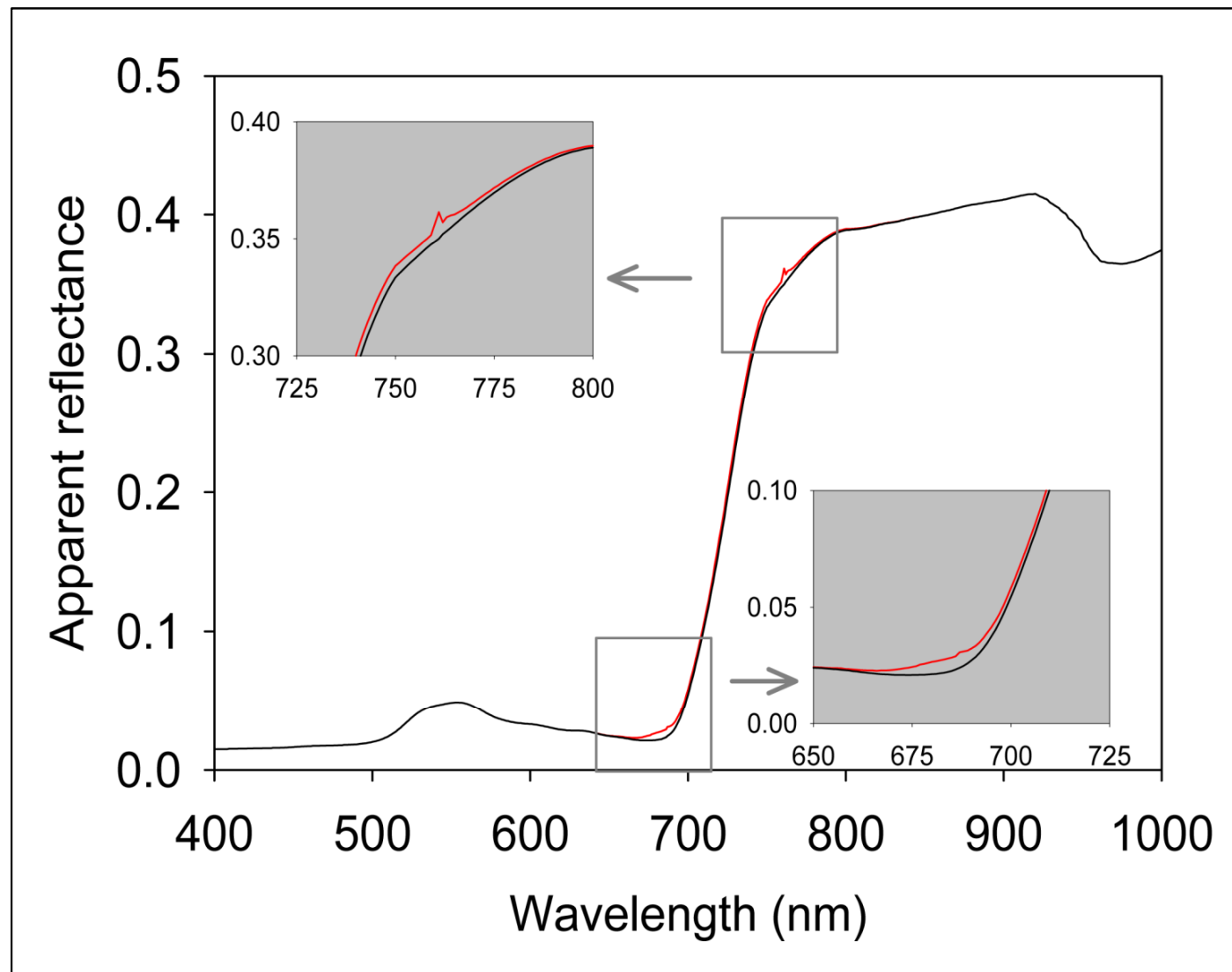
courtesy of L. Nedbal

Chlorophyll Fluorescence (3)

- Chlorophyll fluorescence is emitted from the core of the photosynthetic machinery and is directly correlated to efficiency of photosynthesis
- The fluorescence signal is shifted to longer wavelengths

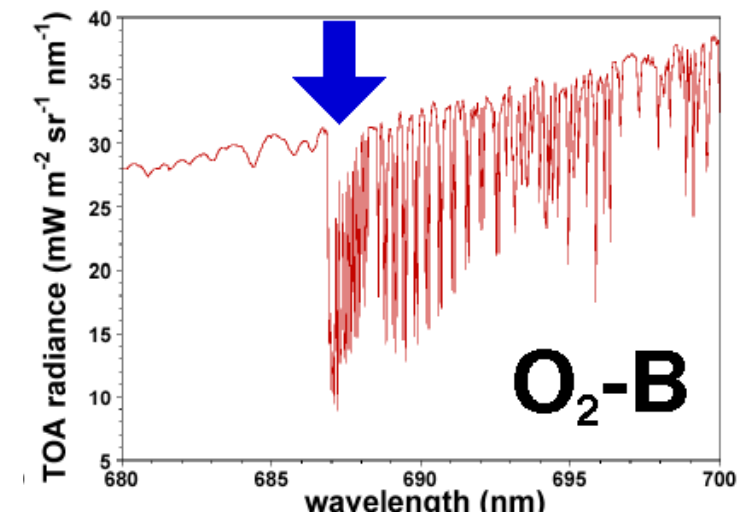
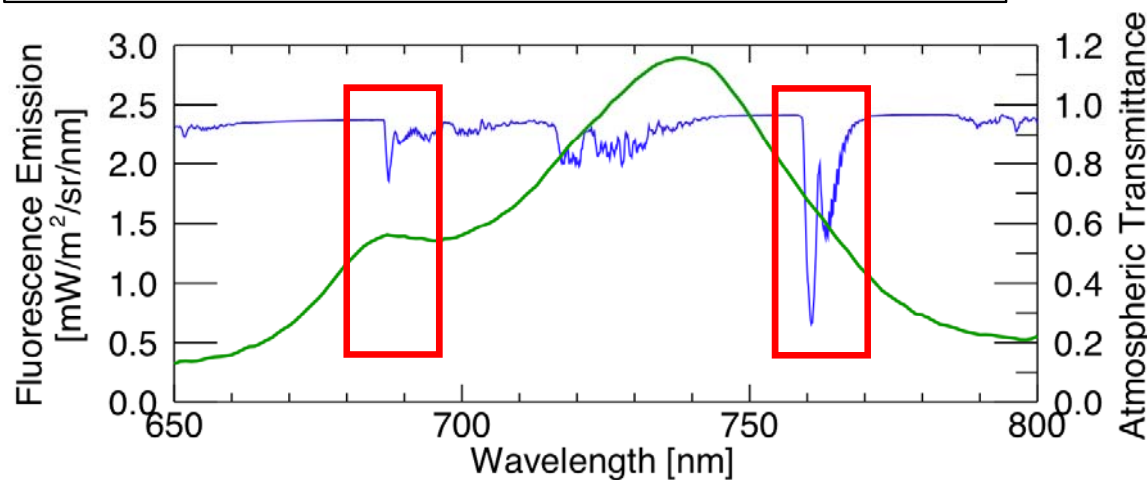
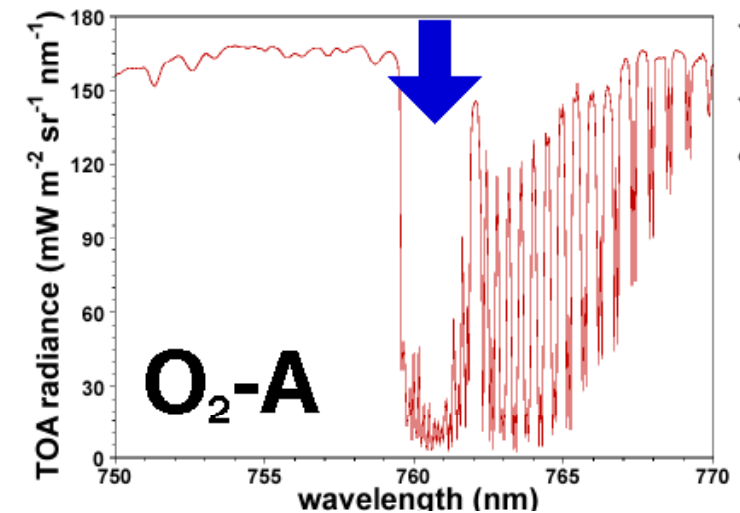
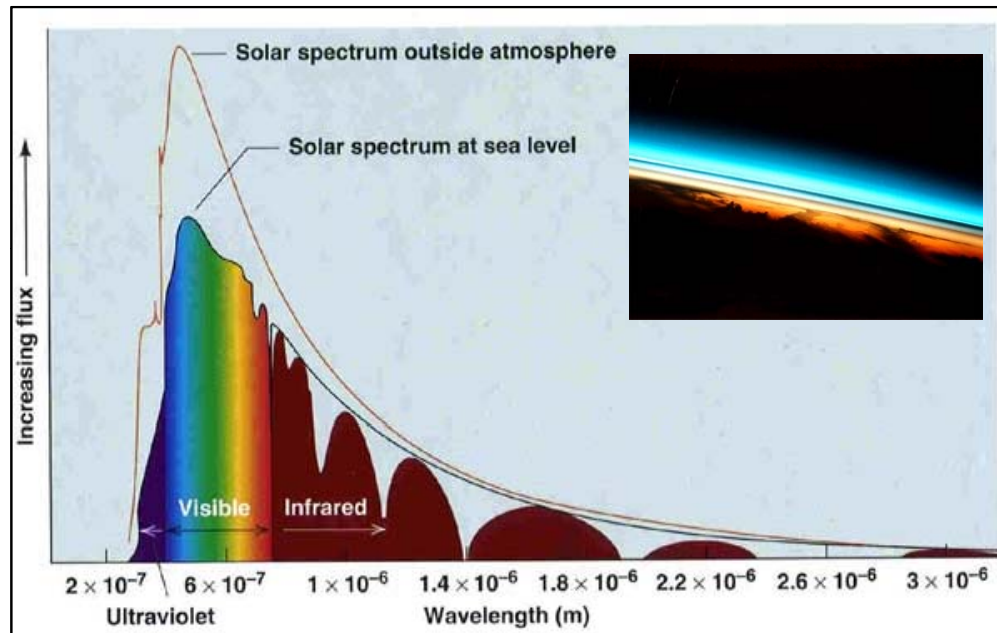


- However, the fluorescence signal adds only a small contribution to the reflected light and thus cannot not be measured with classic spectroscopy



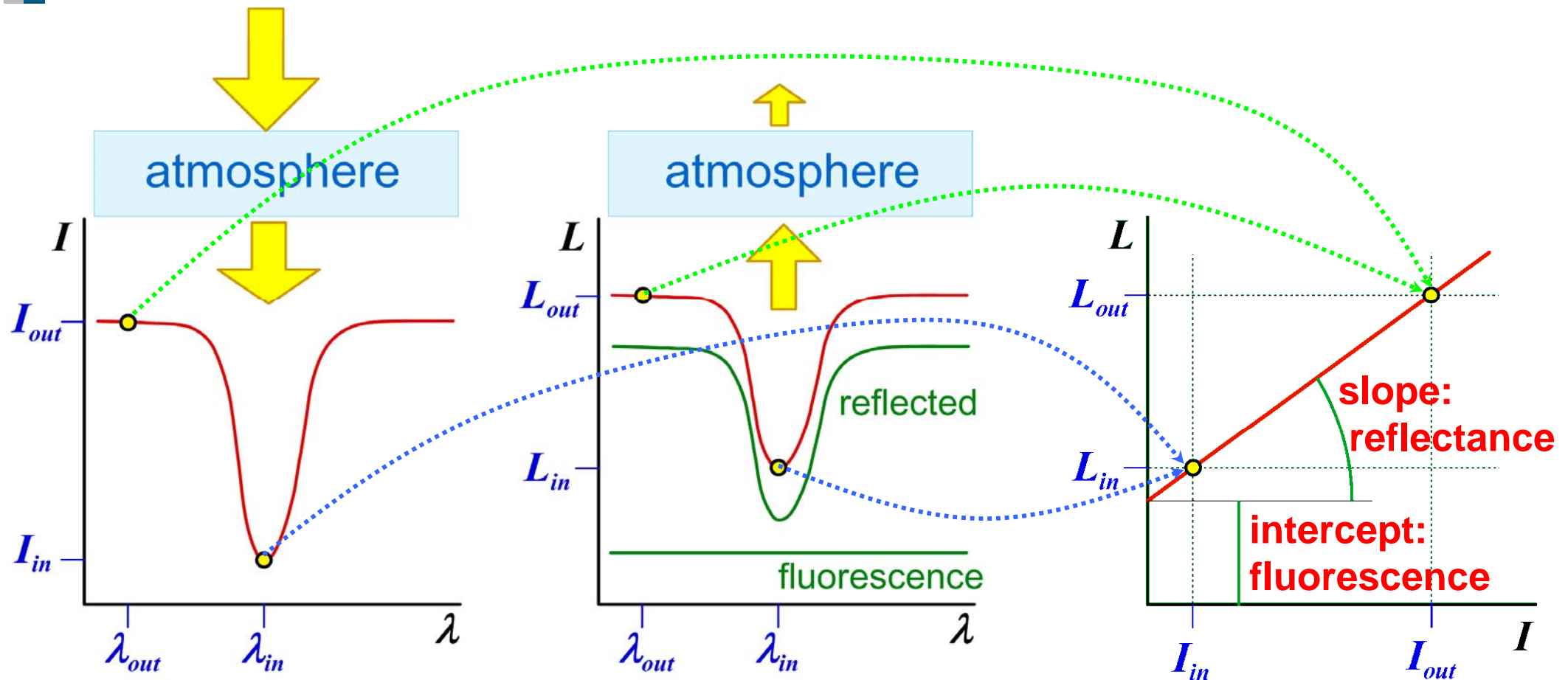
Fluorescence retrieval concept (1)

- Solar and earth atmosphere is a spectrally selective filter
- Two oxygen absorption bands (O_2 -A and O_2 -B) are at the right spectral region for fluorescence retrieval



Fluorescence retrieval concept (2)

- Fluorescence can be retrieved in the relative dark atmospheric absorption bands according to the Fraunhofer Line Depth (FLD) method.



Vielen Dank an:



Ecosystems
Dynamics



Ulrich Schurr

Vicky Temperton

Nicolai Jablonowski

Anke Schickling

Mark Müller-Linow

Marcus Jansen

Roland Pieruschka

Bernd Biskup

Christine Plückers

Francisco Pinto

Sergej Bergsträsser

André Mörsch

Andreas Burkhardt

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Marlene Müller

André Erler

Anne Henneken

Lena Meck

Christian Selig

Hendrik Albrecht

und viele andere



Lutz Plümer

Erich-Christian Oerke

Björn Waske

Günter Menz

Frank Ewert

Clemens Simmer

Jens Leon

Heiner Goldbach

Georg Noga

Mauricio Hunsche

Vielen Dank an:



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Centre de Recherche Public
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Patrick Hostert
Sebastian van der
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Han Dolman
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Luis Alonso



Bundesministerium
für Bildung
und Forschung



Michele Meroni
Roberto Colombo

Joe Berry



Lada Nedbal

