

# RETRIEVAL OF LEAF AREA INDEX FROM REMOTE SENSING DATA

## PART IV: (PHYSICAL APPROACH- USE OF RADIATIVE TRANSFER MODELS)

TMT Bangladesh

Roshanak Darvishzadeh

February 2022



# CONTENT

---

- Introduction
- Physical approach
- Radiative transfer models
- PROSPECT
- SAIL
- PROSAIL



# INTRODUCTION- SPECTRAL SIGNATURES

---

- Spectral signatures of vegetation covers are used to study vegetation type, species type, health, growth, different stress, productivity and many other characteristics.
- At leaf level → leaf traits
- At canopy level → plant traits, undesired effects, ( e.g. soil reflectance, sun and view geometry) and combined interaction effects





# PHYSICAL APPROACH

---

- Link between plant traits, external factors and the combined interactions effects → physical/deductive models
- Estimating vegetation parameters involves using radiative transfer models (RTM).
- RTMs offer an explicit connection between a number of plant traits and the spectral reflectance.
- At canopy level RTMs explain the transfer and interaction of radiation inside the canopy based on physical laws. The spectral variation described as a function of canopy, leaf and soil background characteristics.





# RT MODELLING

---

- Support the interpretation of RS data
  - ✓ Compute the RS signal as the function of important biochemical and biophysical variables
  - ✓ Provide understanding of the signal sensitivity to environmental parameters
- Assist in feasibility studies
  - ✓ Compensate for data gaps
  - ✓ Assist in experimental studies
- Robust parameter retrieval through inversion e.g. LAI



# RADIATIVE TRANSFER MODEL (RTM) FOR VEGETATION

---

- Leaf level → leaf biochemical and structural properties
- Canopy level → leaf, canopy, soil, sun and sensor geometry (canopy architecture, leaf scattering, soil scattering)
- 1D radiative transfer models → vegetation canopy is presumed to be a turbid medium with randomly distributed canopy elements
- 3D RTMs → applicable to horizontally heterogeneous or discontinuous canopies





# RADIATIVE TRANSFER MODEL

---

- Depending on ecosystem and parameter of interest, models from different levels are combined (leaf optical model with canopy reflectance model)
- Computationally demanding and need knowledge of a number of leaf and canopy variables.





# RT CANOPY MODEL

---

- Require descriptions of:
  - canopy architecture
  - (Vertical leaf area density (LAI), the leaf normal orientation distribution, leaf dimensions (infinitesimal scatters) affects canopy scattering in retroreflection direction, leaf thickness effects on reflectance /transmittance
  - Leaf scattering properties
  - (Leaf surface, internal structure, leaf biochemistry; leaf size increase leaf area for constant number of leaves result in increasing LAI, leaf thickness: decrease transmittance (increase reflectance)
  - soil scattering: moisture content, type/texture, surface roughness.
  - Observation Geometry





# EXAMPLES OF LEAF AND CANOPY MODELS

---

- **Leaf models e.g.**

- PROSPECT (*Leaf Optical Properties Spectra*), Jacquemoud and Baret (1990)
- LIBERTY (*Leaf Incorporating Biochemistry Exhibiting Reflectance and Transmittance Yields*), Dawson et al. (1998)

- **Canopy models e.g.**

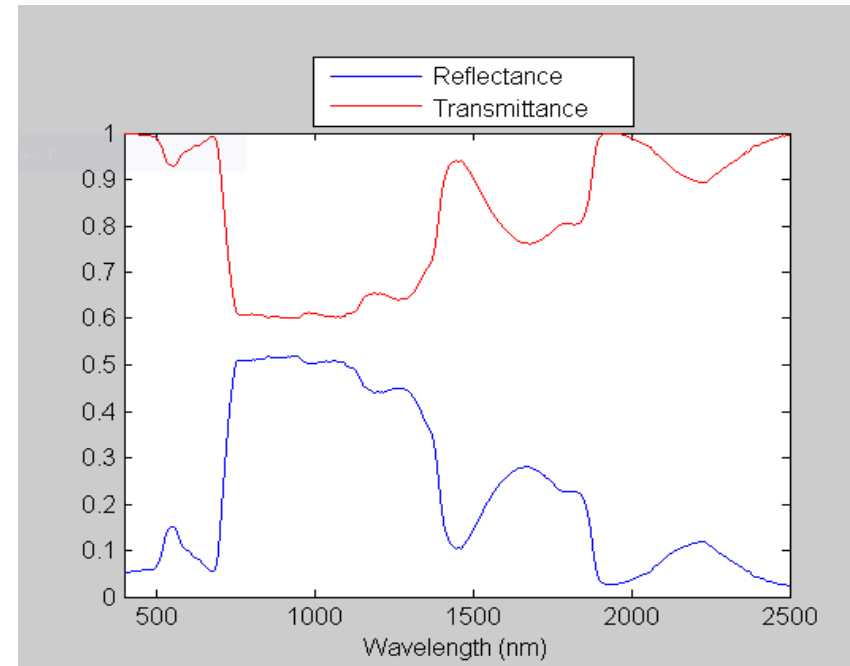
- SAIL (Scattering by Arbitrary Inclined Leaves) Verhoef (1984)
- INFORM
- DART



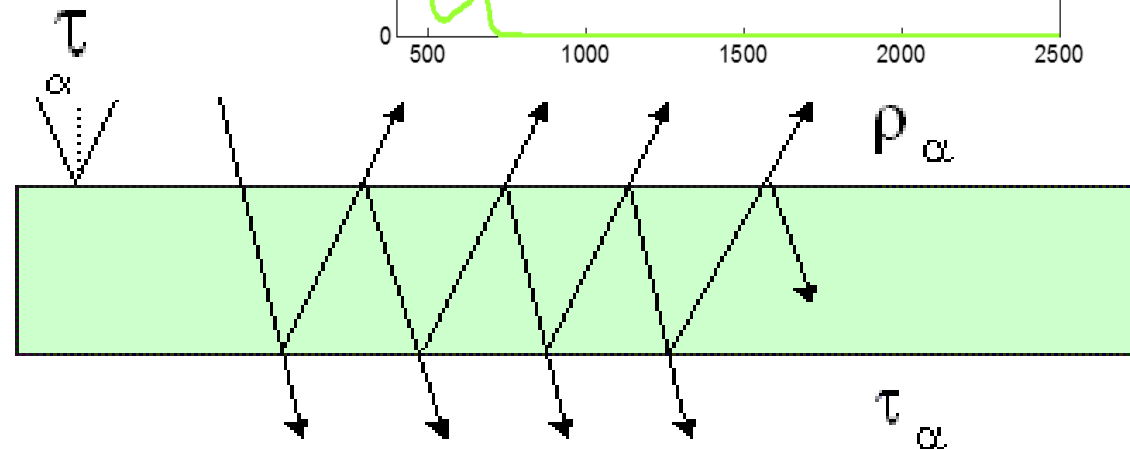
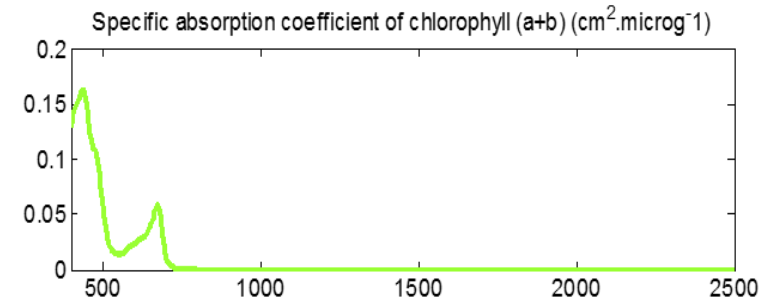
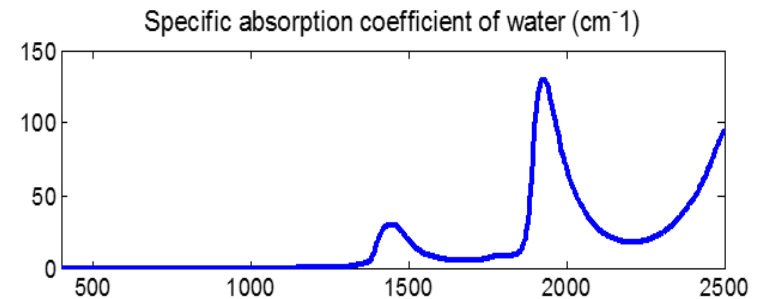
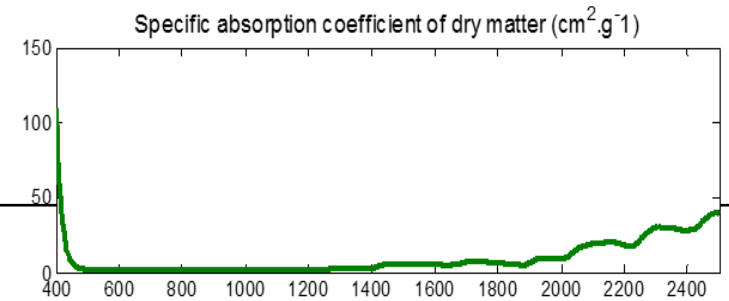
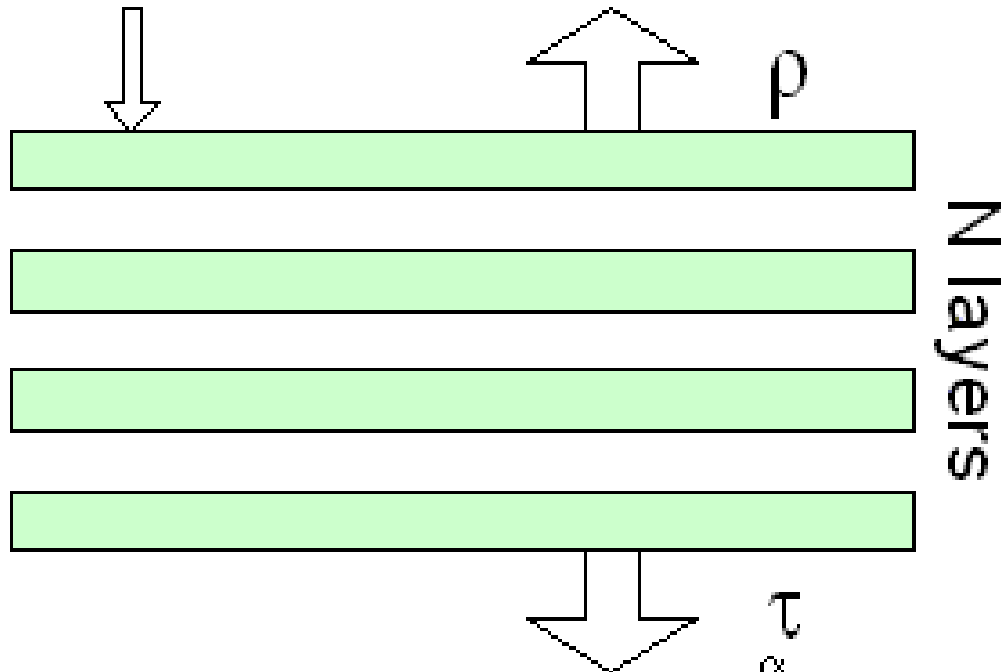
# PROSPECT MODEL

PROSPECT (Jacquemoud & Baret 1990) simulates the reflectance and transmittance of a single leaf based on (the following) **input parameters** and their **absorption coefficients**

- Leaf Chlorophyll a+b concentration
- Leaf water concentration
- Leaf dry matter concentration
- Leaf structure parameter



# PROSPECT MODEL



# PROSPECT model

$$[R_{mod}(\lambda), T_{mod}(\lambda)] = \text{PROSPECT}(N, k(\lambda), n(\lambda)) \quad (1)$$

leaf structure parameter  $N$

Absorption coefficient of one elementary layer  $k(\lambda)$ .

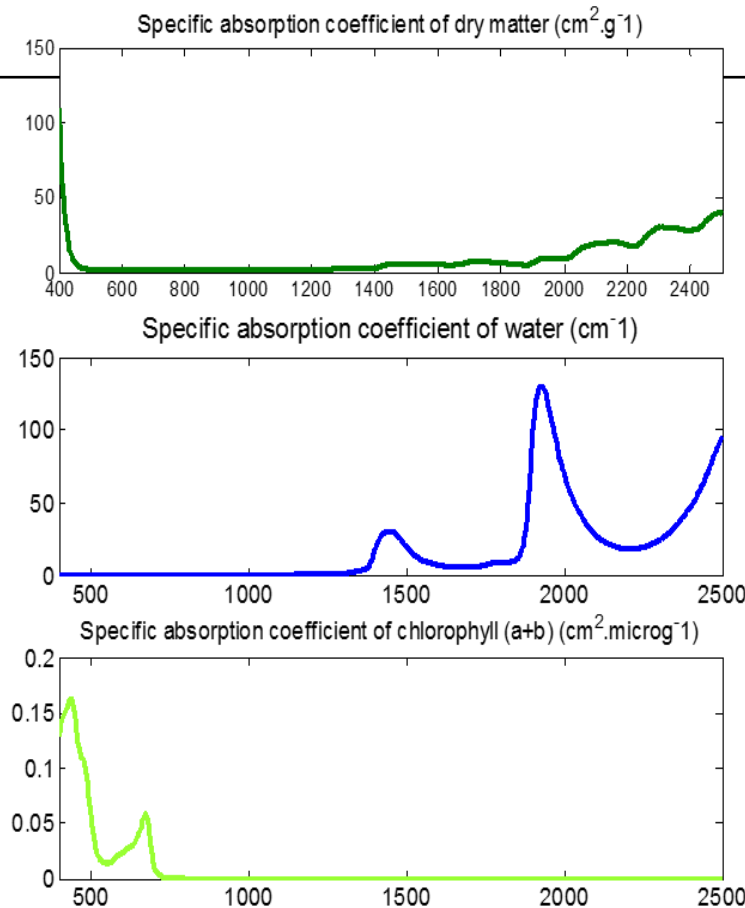
Refractive index  $n(\lambda)$ .

Hemispherical reflectance  $R_{mod}(\lambda)$  and transmittance  $T_{mod}(\lambda)$

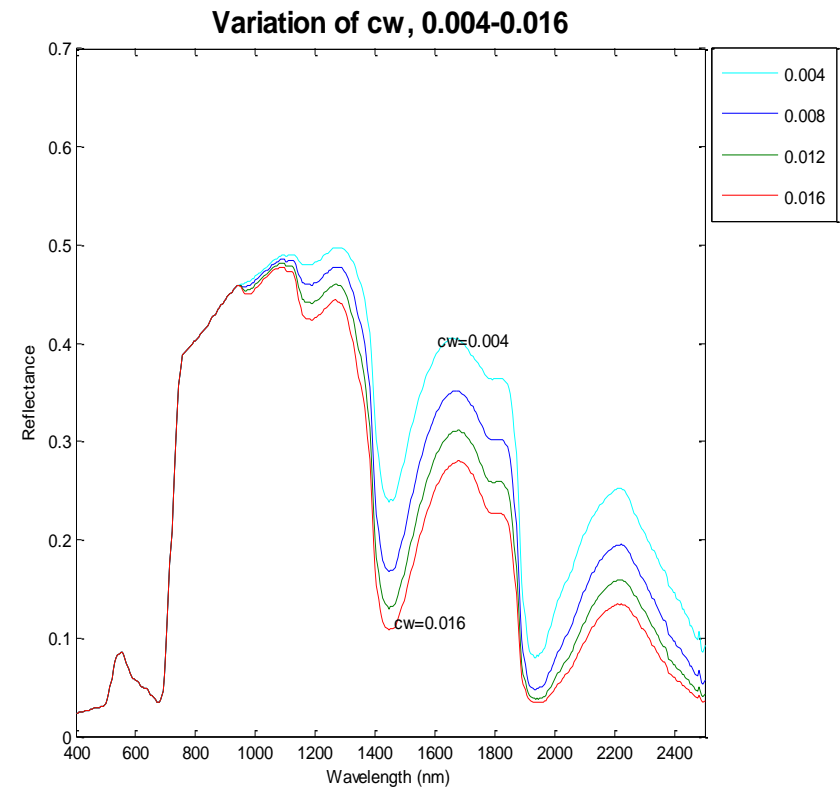
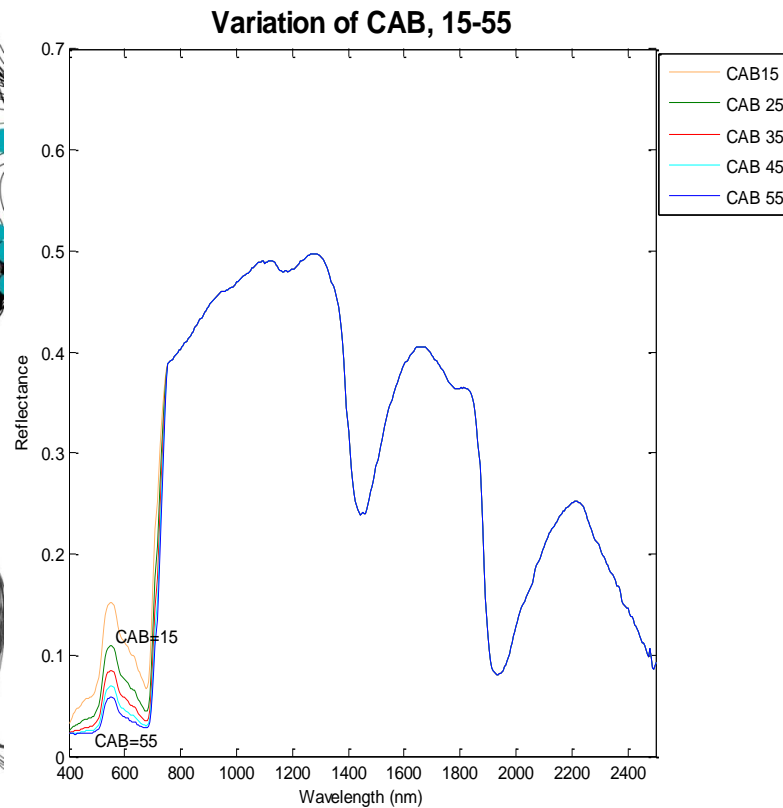
$$k(\lambda) = \sum_i k_i(\lambda) \times \frac{C_i}{N} \quad (2)$$

**linearly mixed by the** concentration of leaf absorbers  $C_i$   
and their corresponding specific absorption coefficients  $k_i(\lambda)$

$$[R_{mod}(\lambda), T_{mod}(\lambda)] = \text{PROSPECT}(N, \text{Chl}, \text{LMA}, \text{EW}) \quad (3)$$

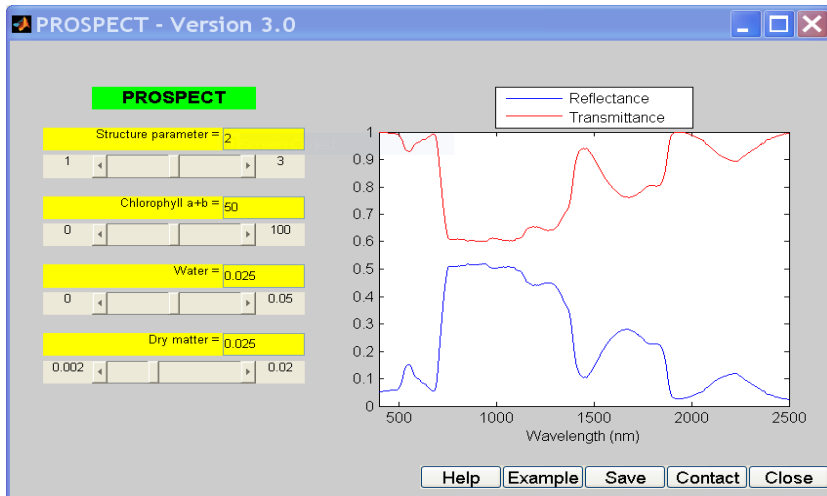


# SENSITIVITY ANALYSIS OF PROSPECT

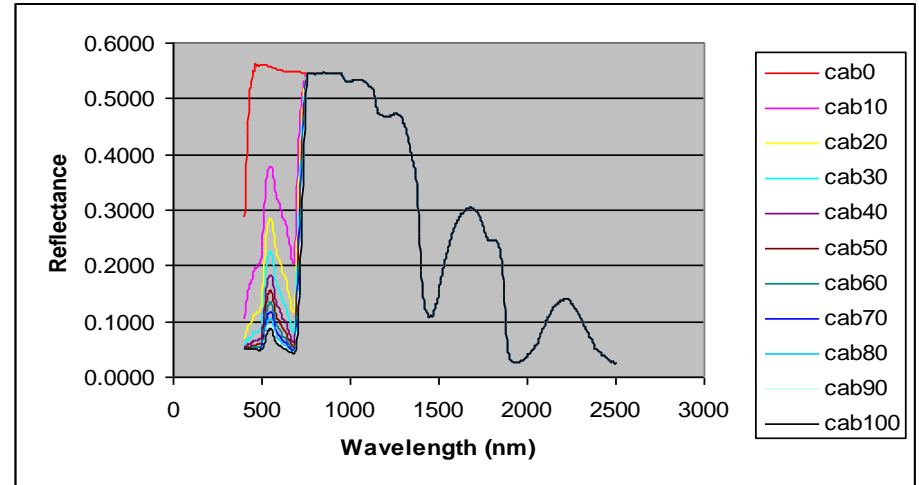


# PROSPECT model in Forward mode

## PROSPECT GUI in Matlab



## Modeling results



# SAIL MODEL

---

- Scattering by arbitrary inclined leaves (Verhoef 1984, 1985)
- Models energy-canopy interaction in 3 streams (downward direct flux, downward and upward diffuse flux)
- 1-D turbid medium model
- Canopy represented by small absorbing and scattering elements
  - distributed randomly
  - with known angular distribution
  - with known optical properties
- Canopy structural parameters, diffuse skylight, sun and sensor zenith and azimuth angles, soil reflectance
- Canopy is non lambertain surface, therefore canopy reflectance depend on the angle which is illuminated and viewed.





# SAIL MODEL

Parameter	Abbreviation in model	Unit
Leaf area index	LAI	$\text{m}^2 \text{ m}^{-2}$
Mean leaf inclination angle	ALA	Deg
Sun zenith angle	ts	Deg
Sensor viewing angle	to	Deg
Azimuth angle	phi	Deg
Fraction of diffuse incoming solar radiation	skyl	No dimension
Hot spot size parameter	hot	$\text{m m}^{-1}$
Soil brightness parameter	scale	No dimension







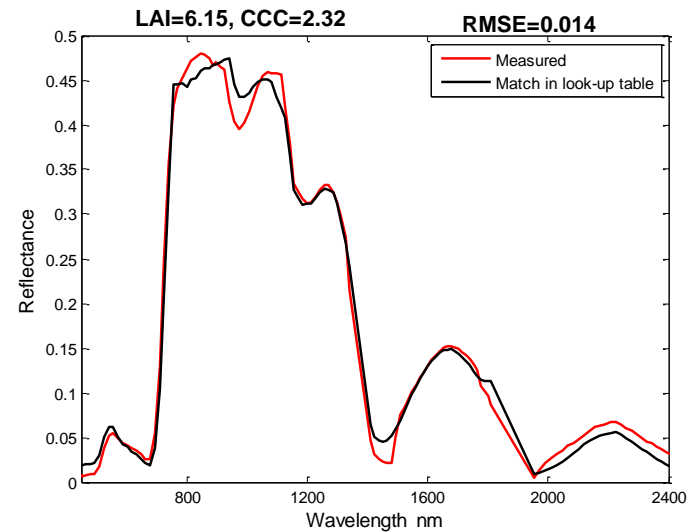
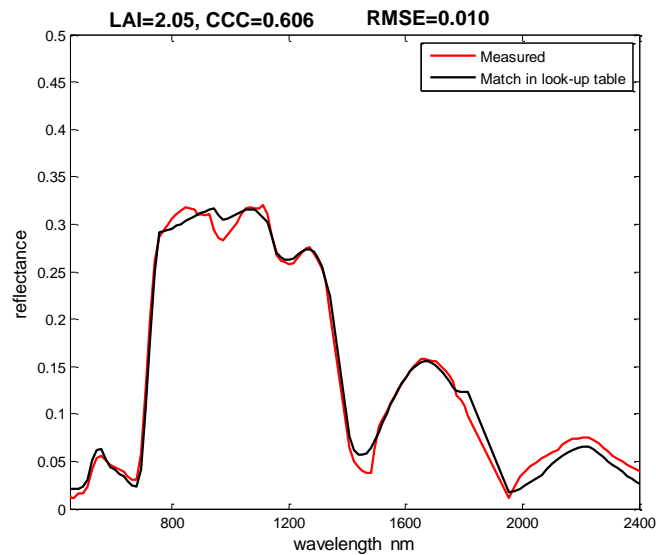
# PROSAIL

---

- Combination of :
  - SAILH canopy reflectance model (Verhoef, 1984; Verhoef, 1985; Kuusk, 1991)
  - PROSPECT leaf optical properties model (Jacquemoud and Baret, 1990)
- Relatively simple and need only a limited number of input parameters
- Reasonable computation time

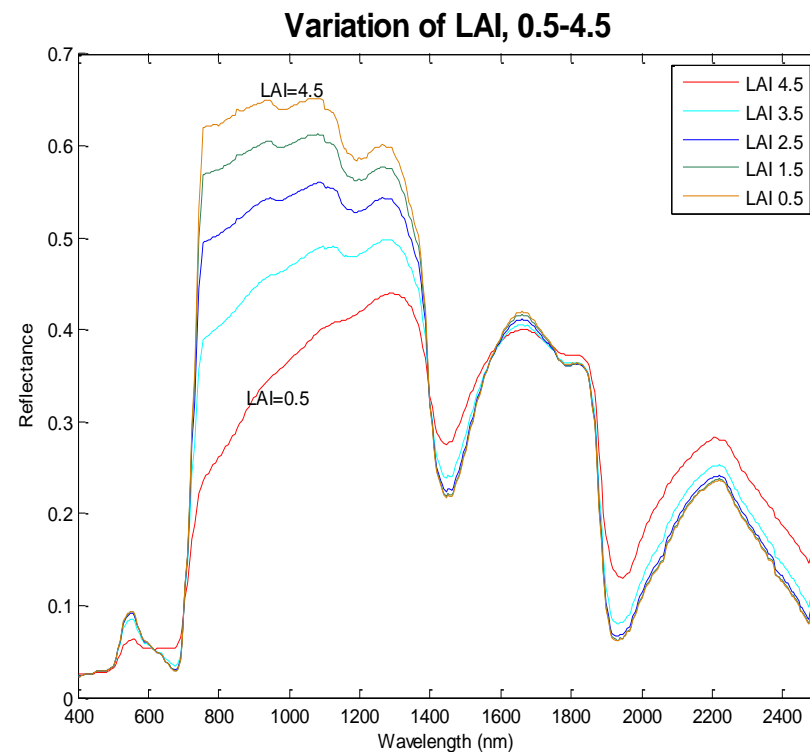
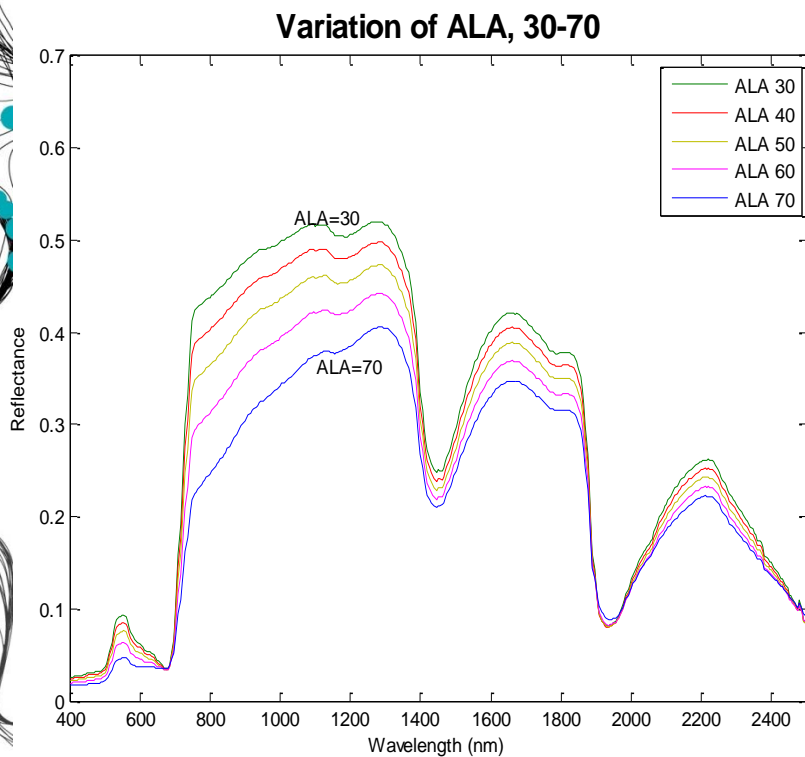


# MEASURED & BEST MODELLLED SPECTRUM



(Darvishzadeh, et al. 2011, ISPRS)

# SENSITIVITY ANALYSIS OF PROSAIL





# SUMMARY

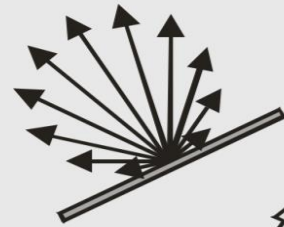
---

- RTMs explain the transfer and interaction of radiation inside leaf/canopy based on physical laws.
- The RTMs are sometimes combined to model a complex situation
- Complex models are more realistic, but they have many input variables and are therefore hard to be utilized
- Simple models may be less realistic but easier to use due to limited number of input parameters
- To use these models to estimate vegetation variables they need to be inverted.

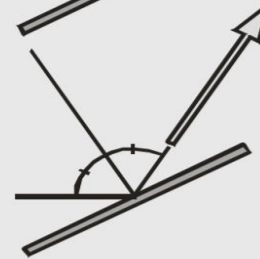


# TYPES OF REFLECTIONS

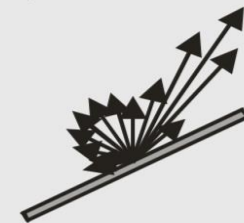
diffuse  
reflection



mirror  
reflection



mixed  
reflection

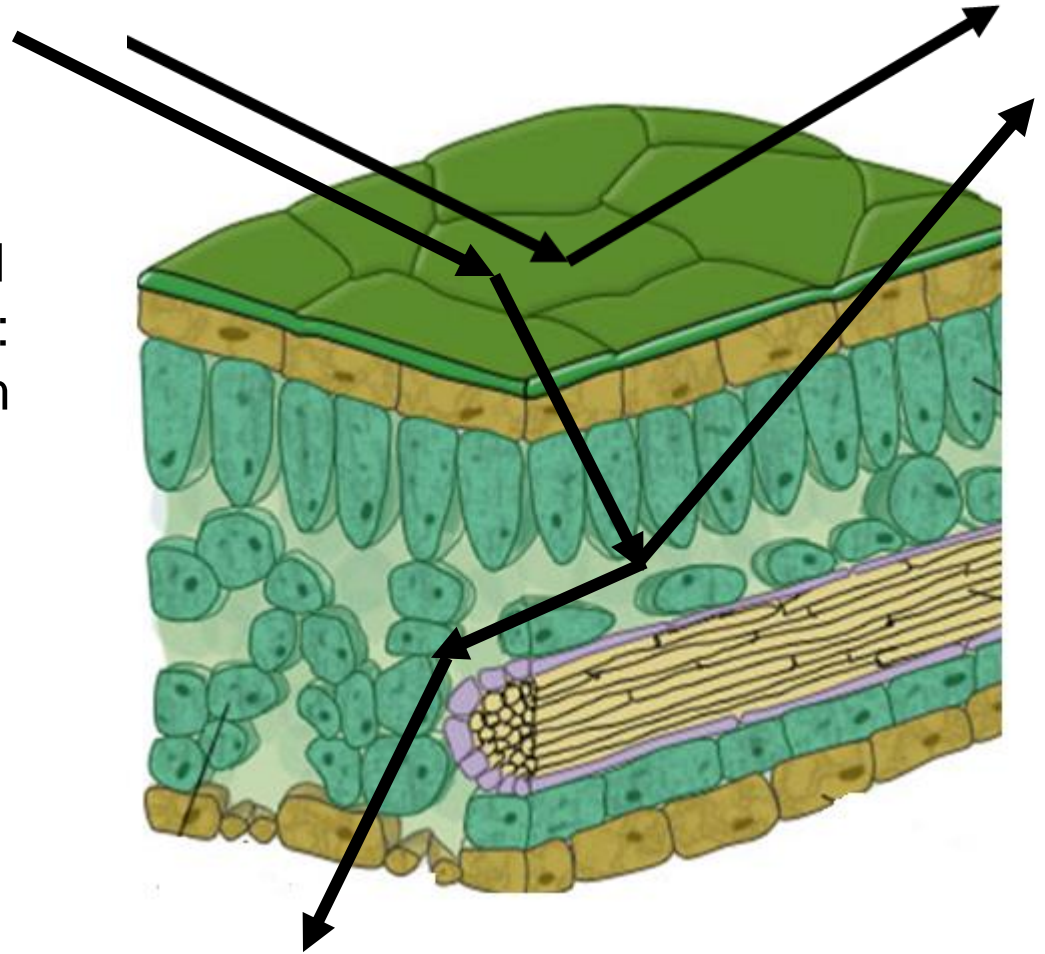


retroreflection



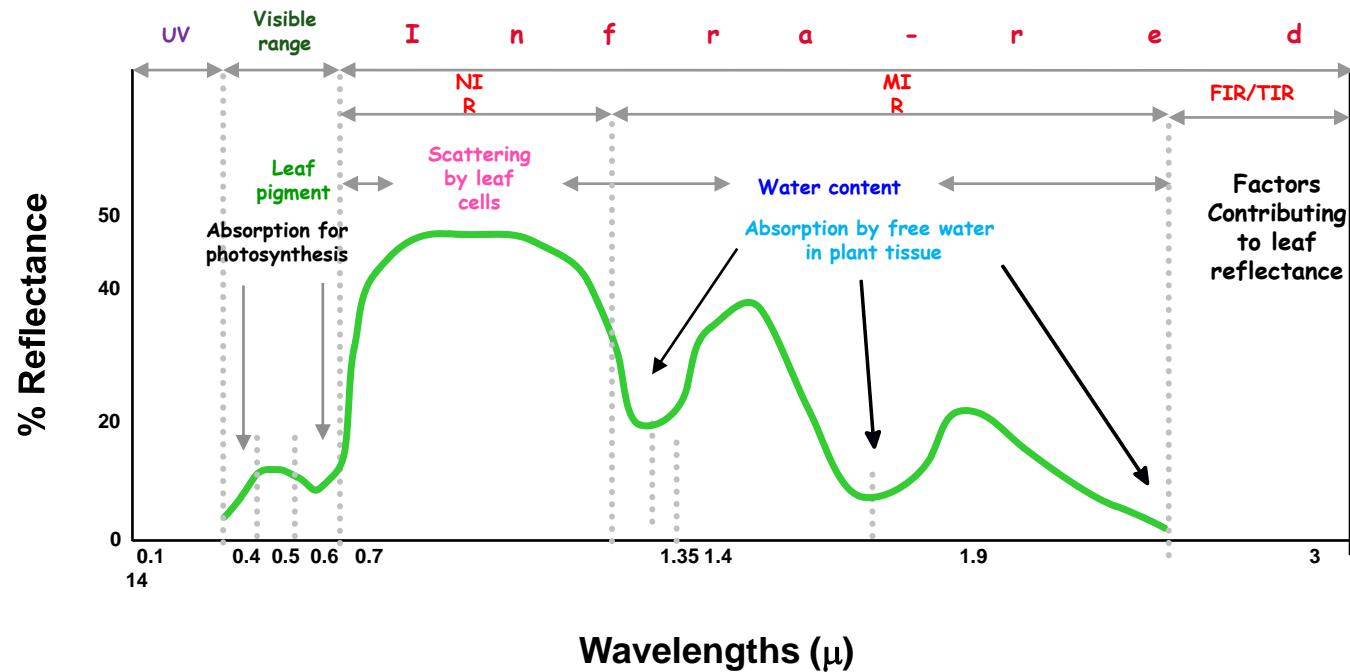
# SCATTERING PROPERTIES OF LEAVES

- Specular from surface  
smooth (waxy) surface:  
strong peak
- hairs, spines: more diffused
- Variation of refractive index:  
1.5@400 nm; 1.3@2500nm
- Complex structure  
(thickness)
  - more scattering
  - lower transmittance
  - more diffuse



Diffused from scattering at  
internal air-cell wall interfaces

# Spectral reflectance of healthy, green vegetation



# Refractive index/ Index of refraction

- Measure of bending of a ray of light when passing from one medium to another one.
- Refractive index (n) is described as ratio of the sine of the angle of incidence to the sine of the angle of refraction.

$$n = \sin i / \sin r$$

- Is also equal to the velocity of light (c) at a wavelength in empty space (vacuum) divided by its velocity (v) in a substance

$$n = c/v$$

