



# Advanced Optical Imaging

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ESA–MOST China Dragon 4 Cooperation

**2019 ADVANCED INTERNATIONAL TRAINING COURSE IN LAND REMOTE SENSING**

中欧科技合作“龙计划”第四期 **2019**年陆地遥感高级培训班

18 to 23 November 2019 | Chongqing University, P.R. China



培训时间: 2019年11月18日-23日 主办方: 重庆大学

C. Cartalis, 2017, Optical remote sensing, Dragon 4 advanced land remote sensing course, Kunming.





X. Ding, 2015, Hyperspectral Imaging, Dragon 4 advanced land remote sensing course, Tianjing.

Y.L. Desnos, 2015, ESA EO programmes, Dragon 4 advanced land remote sensing course, Tianjing.

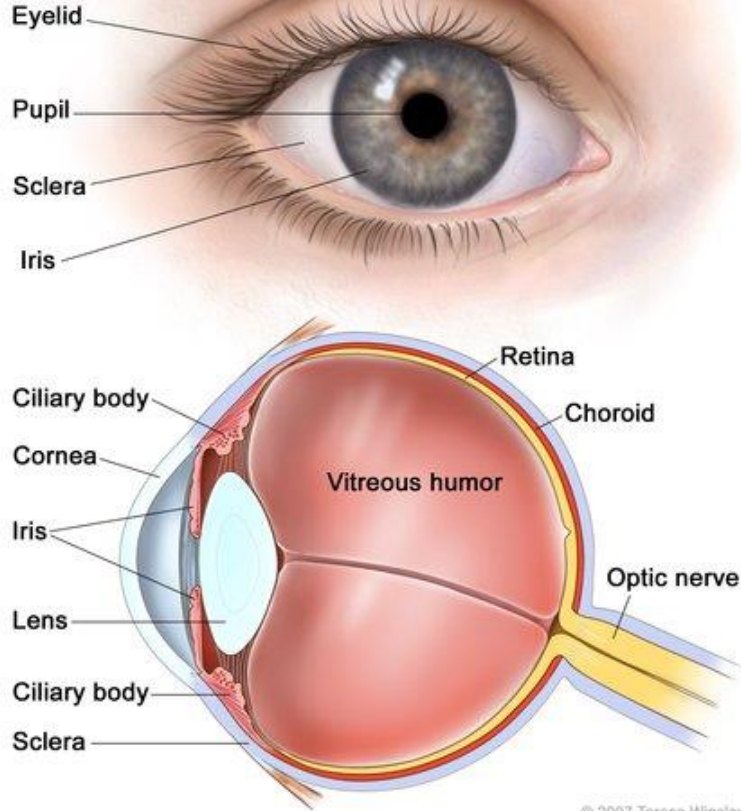
Q. Liu, 2015, Advanced Optical High Resolution Imaging and Quantitative Inversion, Dragon 4 advanced land remote sensing course, Tianjing.

W. Verhoef, 2012, Multi-angular observations, EUFAR/EUROSPEC REFLEX advanced training course, Albacete.

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-  **1** Brief Introduction
-  **2** Optical Imaging Principle
-  **3** Radiative Transfer Models
-  **4** Examples of Optical Imaging and Applications





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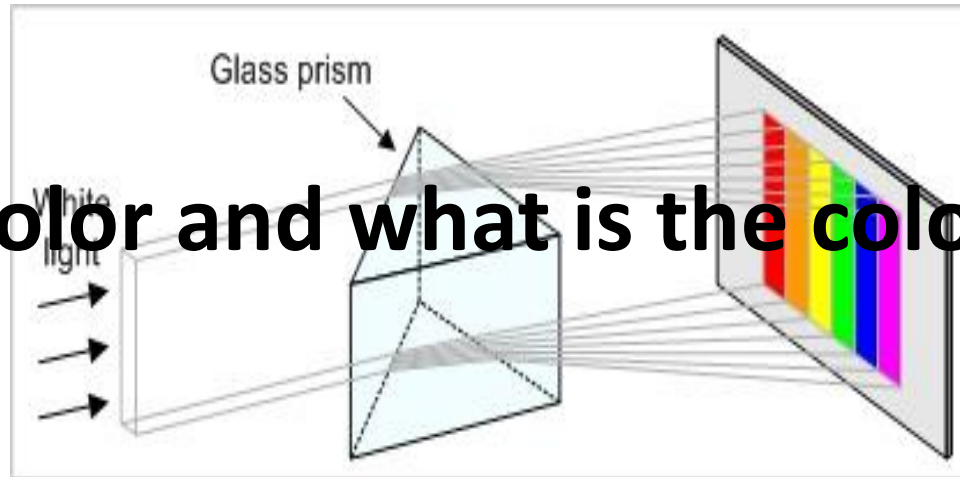
**We receive more than 80% information from the outside world by seeing (vision)!**  
 (to see is to receive lights in our eyes - (light rays entering the eye are transformed by the retina into electrical signals that are transmitted to the brain via the optic nerve – **light rays reflected or emitted from objects representing their properties (such as color, luminosity, shape, and size)**)

## What is imaging (seeing)?





We receive more than 80% information from the outside world by seeing (vision)!

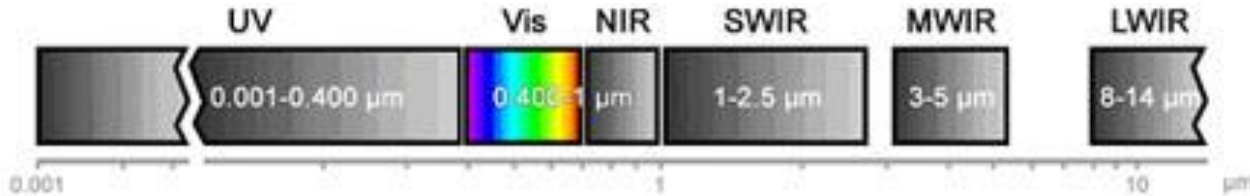


## What is color and what is the color of light?

Isaac Newton reflected sunlight through a glass prism and discovered the "color spectral separation" and the white light is actually made of many colors in 1666.

## Color is the visible manifestation of light's wavelength

(Optical imaging usually refers to Vis/NIR/SWIR frequency range)



		Atmospheric window not considered	Atmospheric window considered
UV	Ultraviolet	10~390nm	10~390nm
<b>VIS</b>	<b>Visible band</b>	<b>0.39~0.75μm</b>	<b>0.39~0.75μm</b>
<b>NIR</b>	<b>Near infrared</b>	<b>0.75~1.1μm</b>	<b>0.75~1.1μm</b>
<b>SWIR</b>	<b>Short wavelength infrared</b>	<b>1.1~3.0 μm</b>	<b>1.1~2.5 μm</b>
MWIR	Medium wavelength infrared	3.0~6.0 μm	3.0~5.0 μm
LWIR	Long wavelength infrared	6.0~25.0 μm	8.0~14.0 μm

# Classification of optical remote sensing



**Broadband**



**Multi-spectral**



**Hyperspectral**



**Ultraspectral**

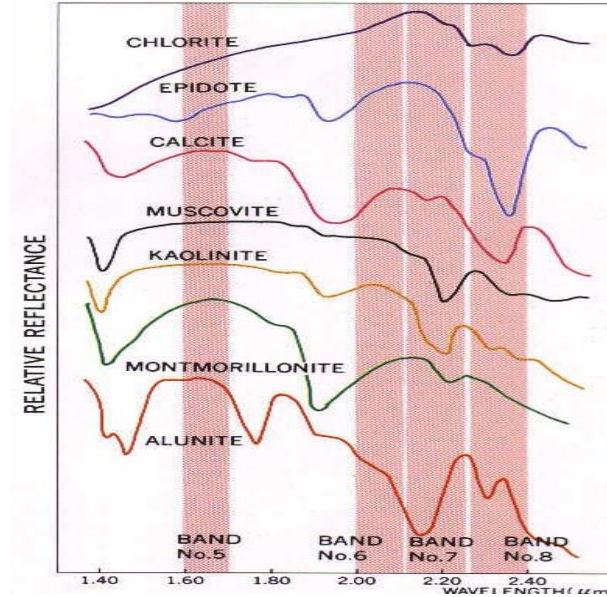






**Single band (Black and White) image**  
**Only geometric image without spectral information**

# Conventional Spectral Measurement



## Relative Reflectance

Only measure object's spectral information - without imaging

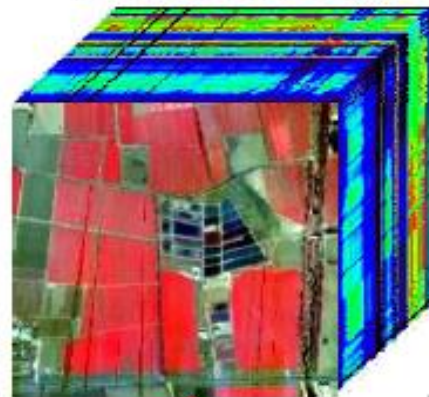
# Development path of optical remote sensing

全色 Panchromatic

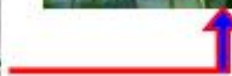
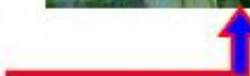
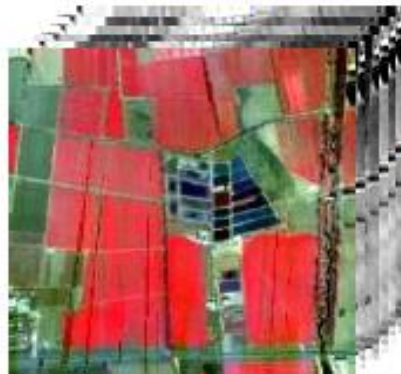


Continuous  
improvement of spectral  
resolution

高光谱 Hyperspectral



彩色 color photography





## Terminology of radiant energy

Energy from  
the Earth Atmosphere

over time is

**Flux**

which strikes the detector area

**Irradiance**

at a given wavelength interval

**Monochromatic  
Irradiance**

over a solid angle on the Earth

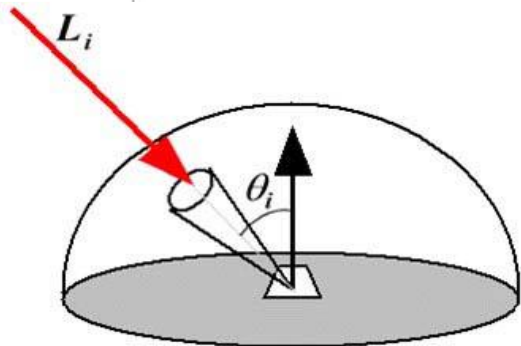
**Radiance observed by  
satellite radiometer**

is described by

**The Planck function**

can be inverted to

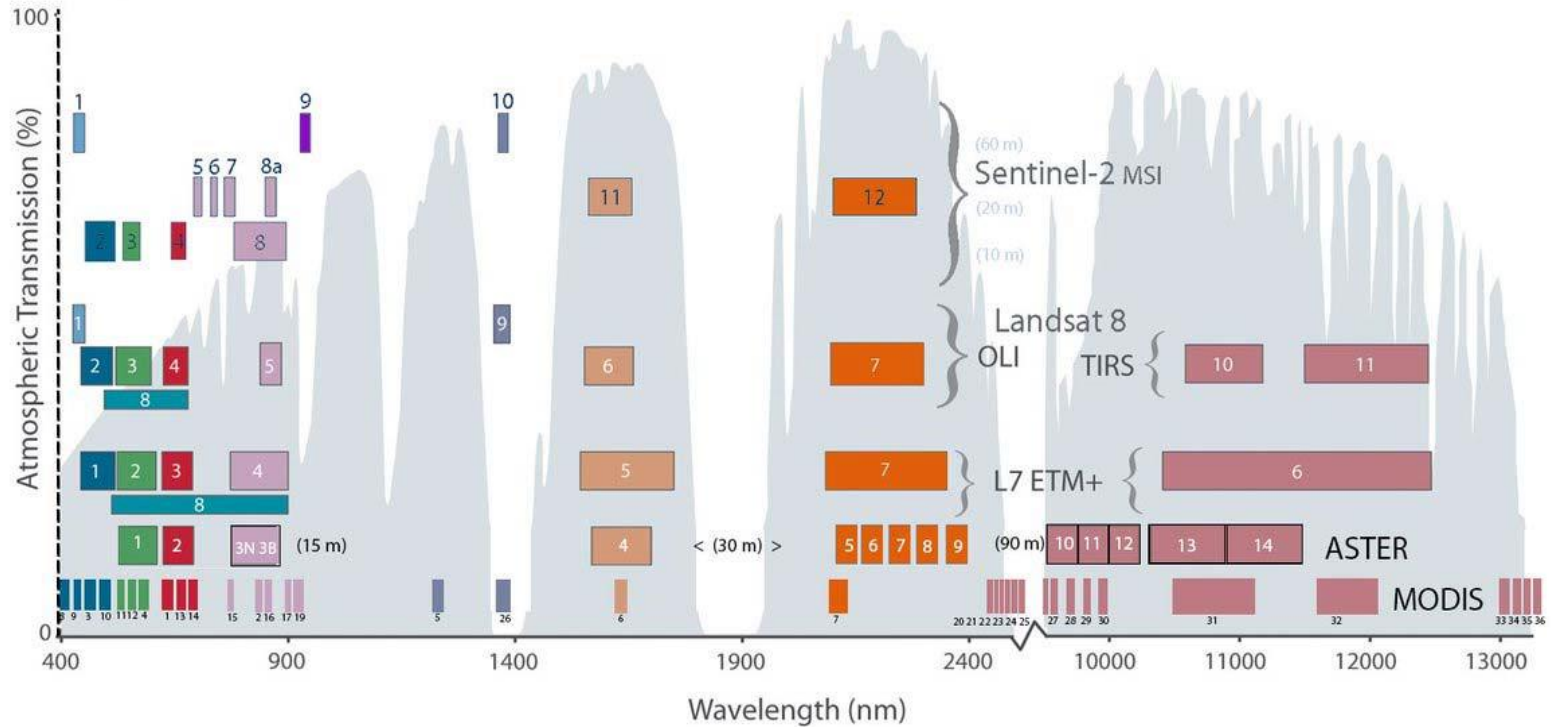
**Brightness temperature**



# Spectral bands (wavelength) of some sensors



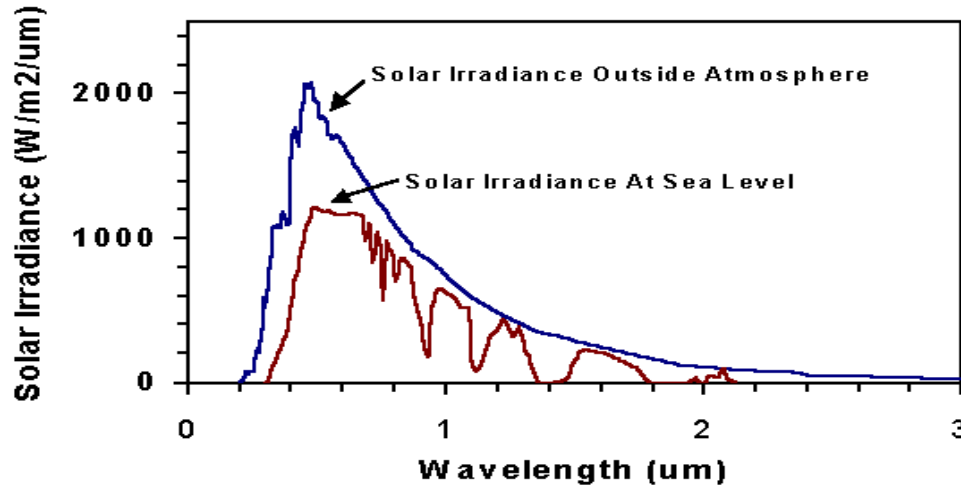
Comparison of Landsat 7 and 8 bands with Sentinel-2



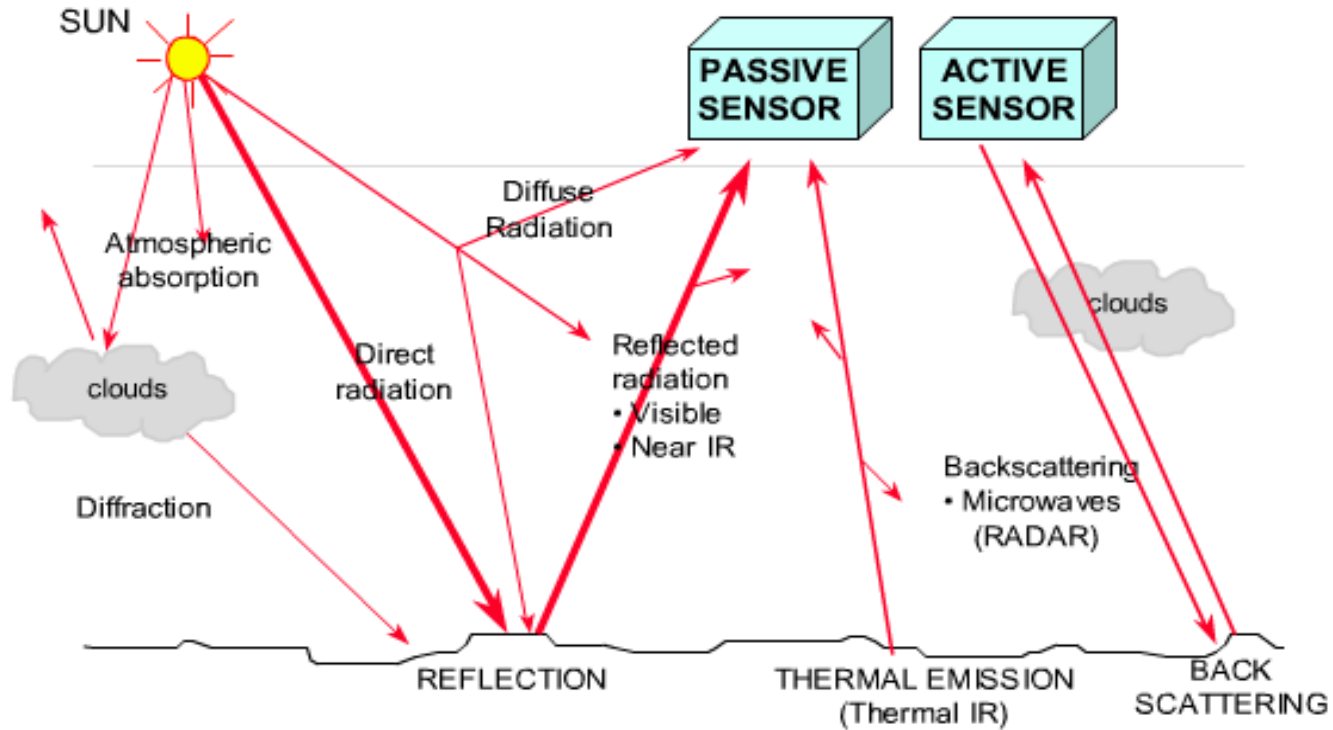
## Solar Irradiation

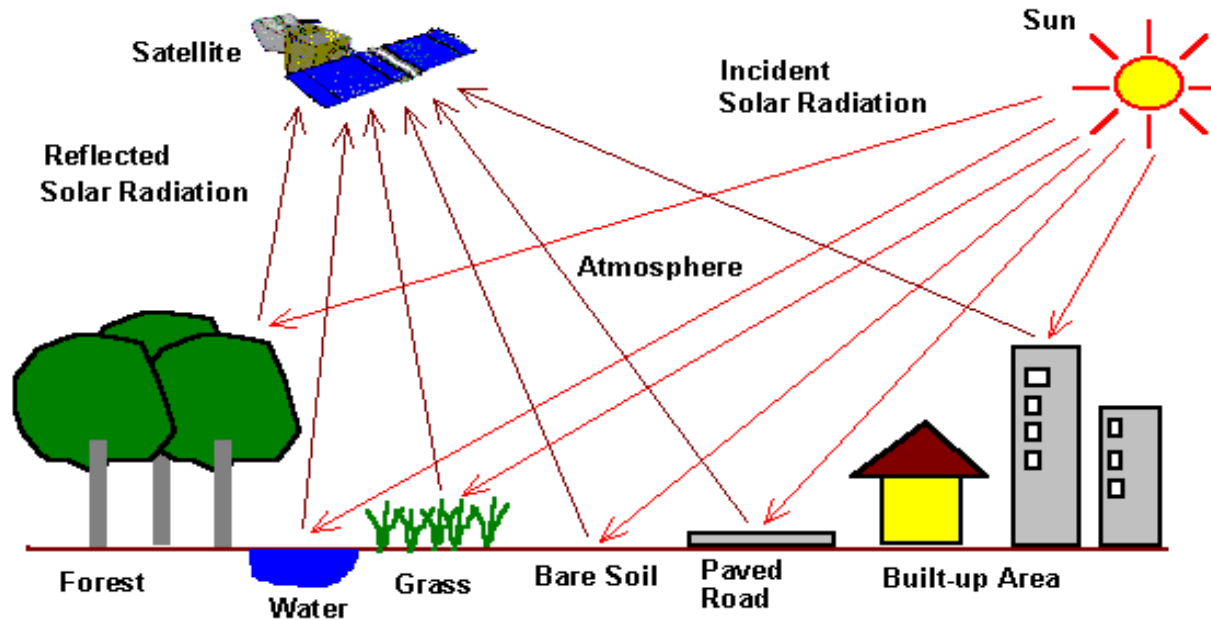
Optical remote sensing utilizes the solar illumination. The solar irradiation spectrum above the atmosphere can be modeled by a black body radiation spectrum having a source temperature of 5900 K.

After passing through the atmosphere, the solar irradiation spectrum at the ground is modulated by the **atmospheric absorption windows**. Significant energy remains only within the wavelength range from about 0.25 to 3  $\mu\text{m}$ .









Optical remote sensing makes use of visible, near infrared and short-wave infrared sensors to form images of the earth's surface by detecting the solar radiation reflected from targets on the ground.

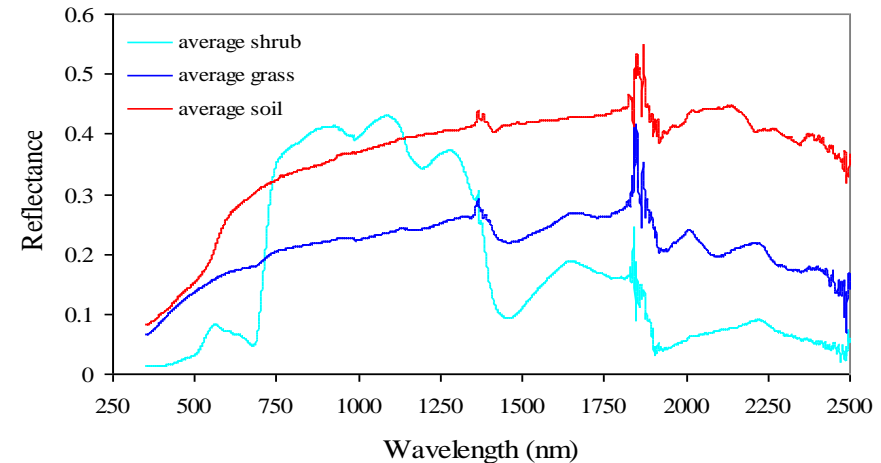
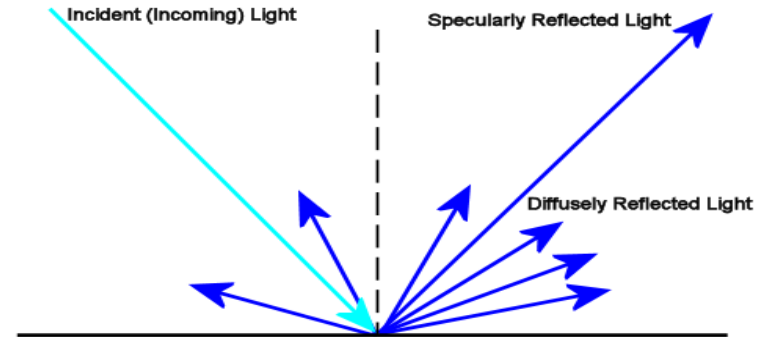
# Spectral reflectivity and albedo



**Spectral reflectivity** is the percentage of radiation reflected by the object in a wavelength or spectral bands

**Albedo** is ratio of the amount of radiation reflected by a surface to the amount of incident radiation on the surface.

*Albedo is reflectance integrated over the upper hemisphere (and over the optical wavelengths).*



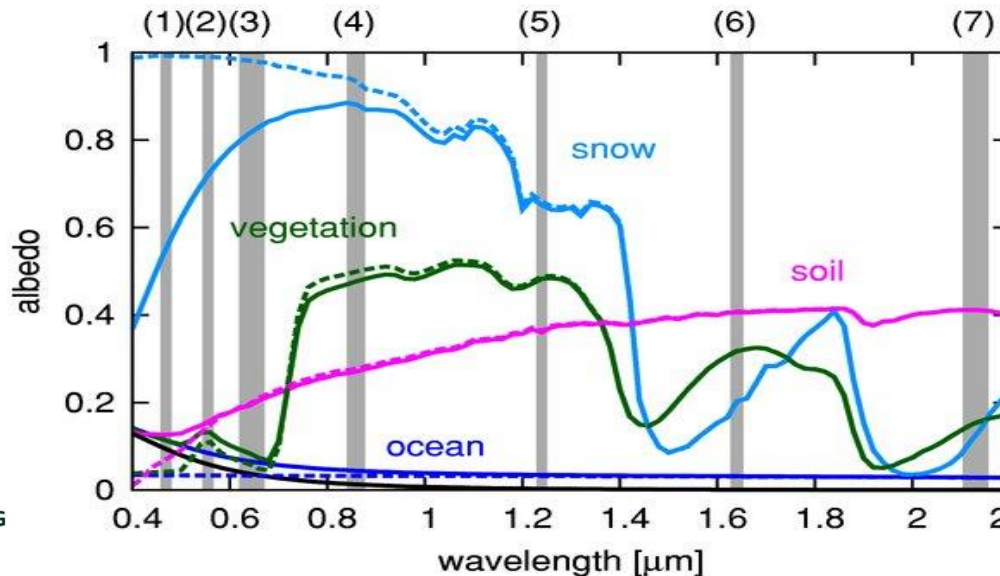


# Reflectance spectrum

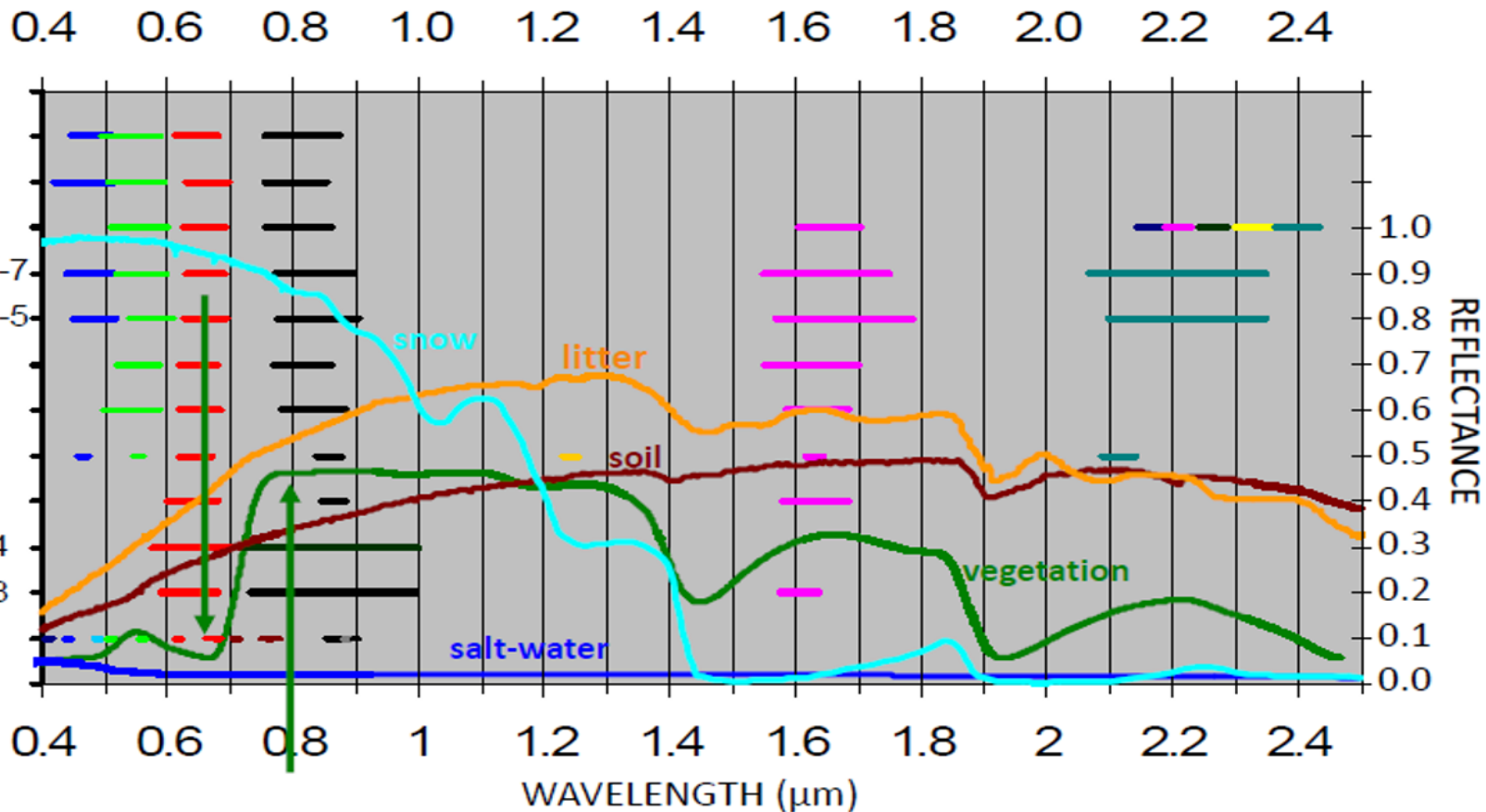


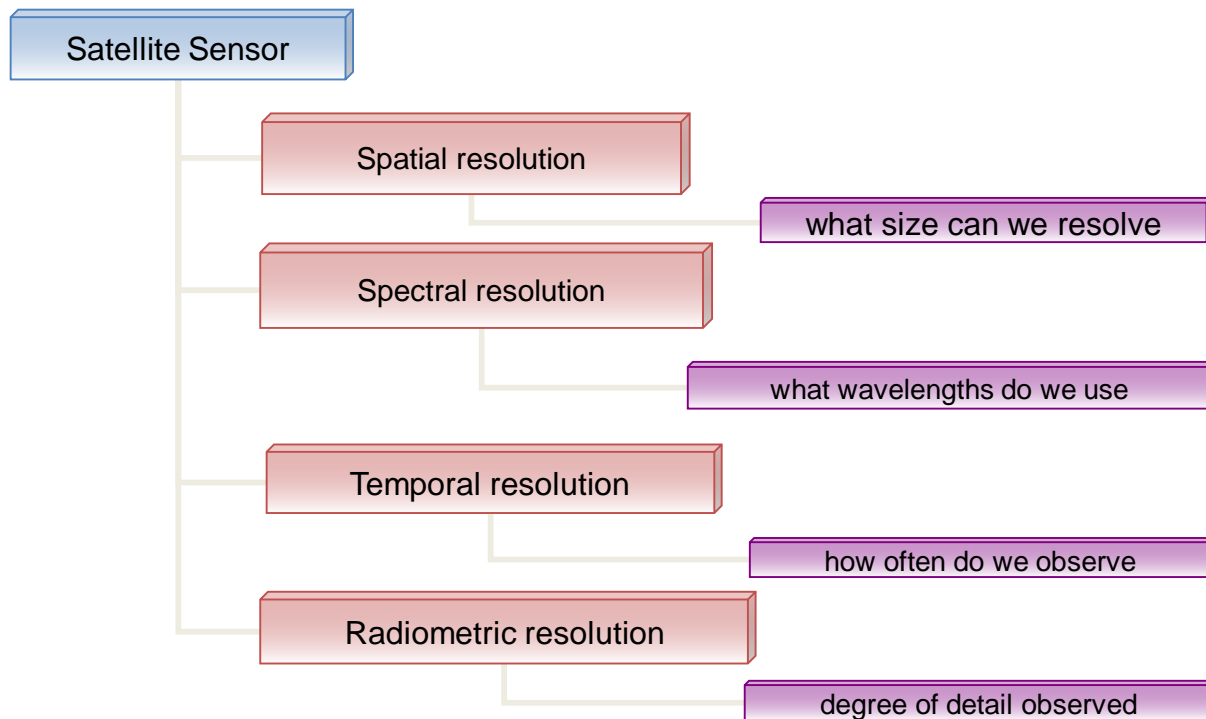
Different materials reflect and absorb differently at different wavelengths.

The reflectance spectrum of a material serves as a unique signature for the material. In principle, a material can be identified from its spectral reflectance signature if the sensing system has sufficient **spectral resolution** to distinguish its spectrum from those of other materials.

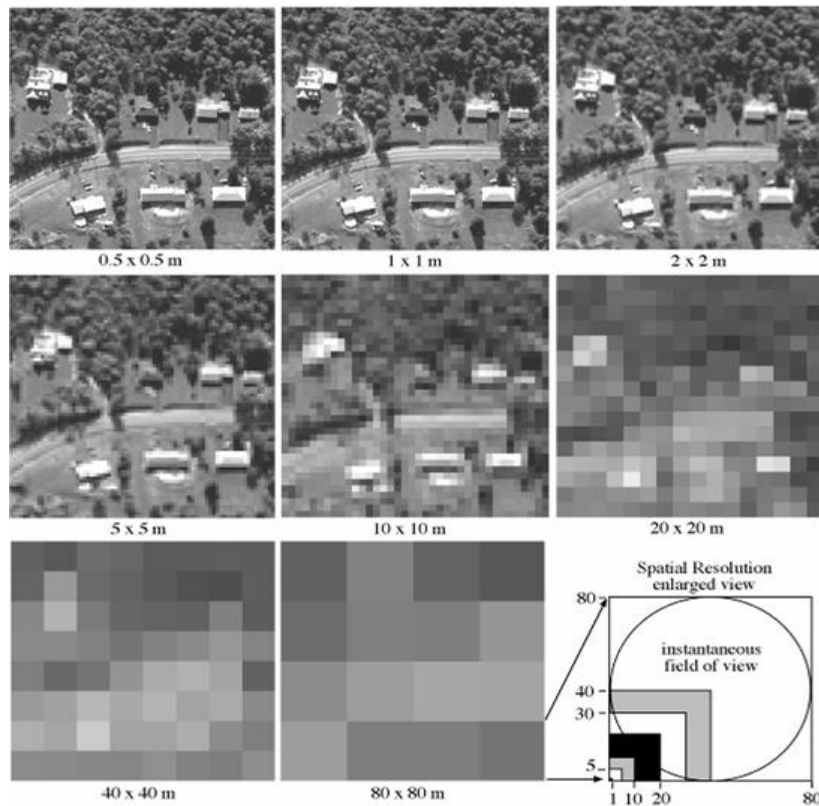


# Some available optical sensors



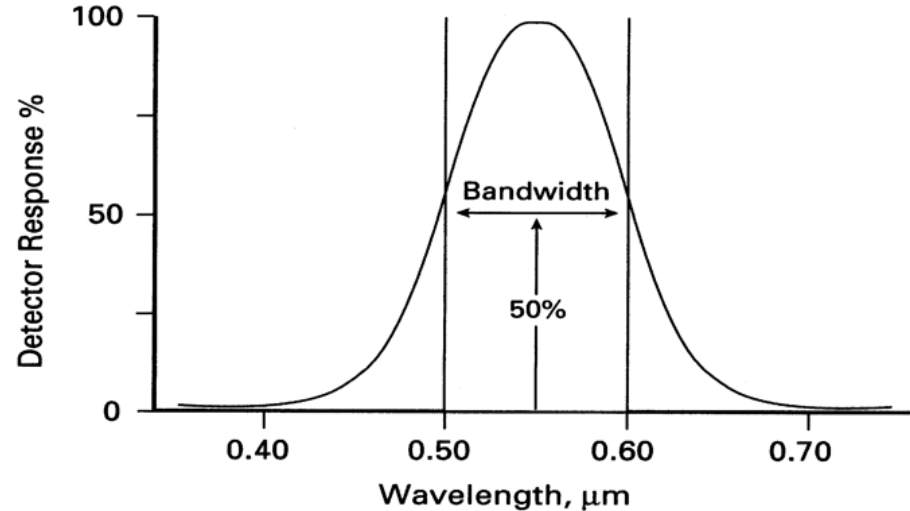


# Different Spatial Resolution





**Full width at half maximum (FWHM)** is used to express detector function, given by the difference between the two extreme values of the independent variable at which the dependent variable is equal to **half** of its **maximum** value.



Spectral resolution, or bandwidth, of a detector,  $FWHM = 0.10 \mu m$

# RADIOMETRIC RESOLUTION



2-bit range  
0 → 4

6-bit range  
0 → 63

8-bit range  
0 → 255

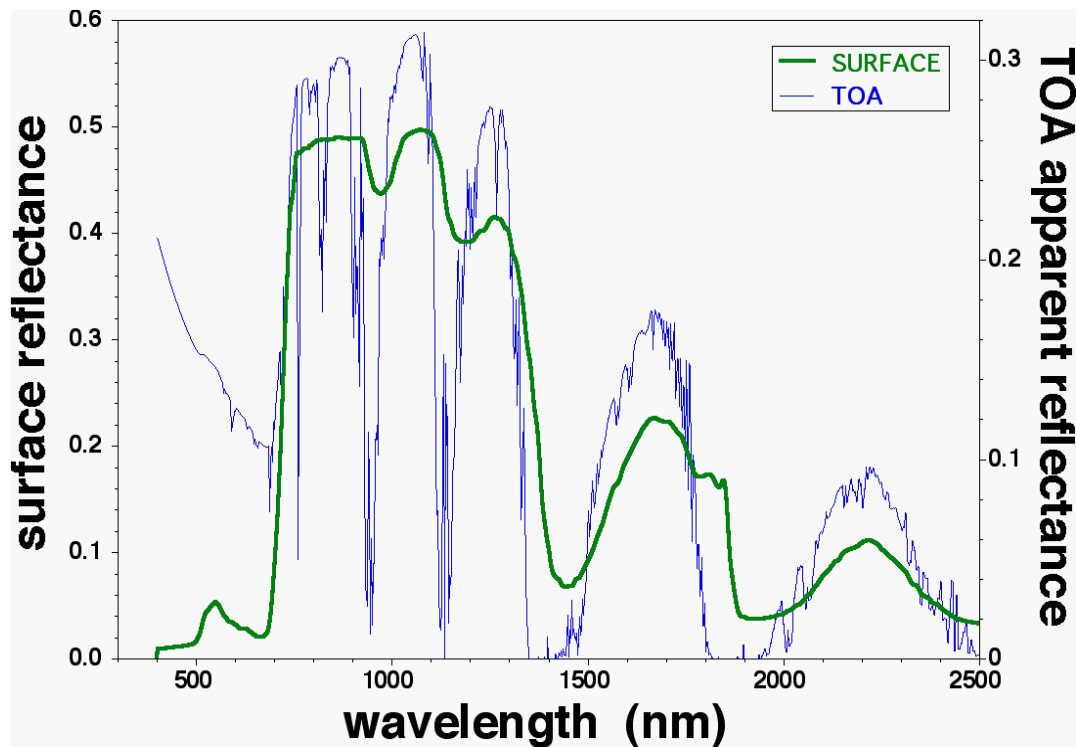
10-bit range  
0 → 1023





# FROM SATELLITE IMAGE TO IMAGE INFORMATION







From the sun to the Earth and then to the sensor, electromagnetic energy passes through the atmosphere twice.

Absorption reduces the intensity with a haziness effect. Scattering redirects EM energy in the atmosphere causing an adjacency effect where neighboring pixels are shared.

These two processes affect the quality of an image and are reasons for atmospheric correction.

**Atmospheric correction** removes the scattering and absorption effects from the atmosphere to obtain the surface reflectance (surface properties).

# Atmospheric Correction Steps



*Convert DNs to radiance based on the rescaling factors provided in the metadata file*

DN (raw value from the sensor)

At-sensor radiance

*Requires additional information: Earth-sun distance, solar zenith angle, exoatmospheric irradiance, often found in metadata*

Top of the Atmosphere (TOA)

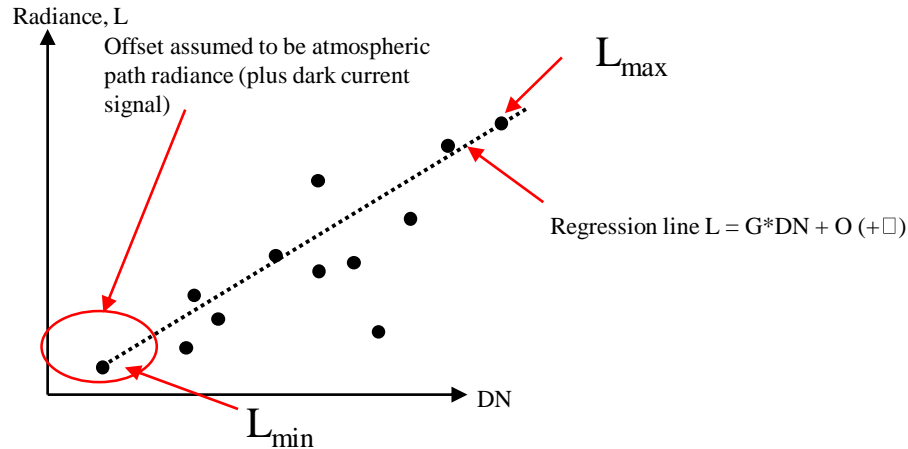
*Requires knowledge of atmospheric conditions and aerosol properties at the time the image was acquired*

Surface Reflectance



# Simple methods

- e.g. empirical line correction (ELC) method
- Use target of “known”, low and high reflectance targets in one channel e.g. dense dark vegetation & snow
- Assuming linear detector response, radiance  $L = \text{gain} * \text{DN} + \text{offset}$
- e.g.  $L = \text{DN}(L_{\max} - L_{\min})/255 + L_{\min}$



# Atmospheric Correction



$$L_{tot} = \frac{\rho ET}{\pi} + L_p$$

$$\rho = \frac{(L_{tot} - L_p) \cdot \pi}{ET}$$

$L_{tot}$  = radiance measured  
by the sensor

$\rho$  = reflectance of the target

$E$  = irradiance on the target

$T$  = transmissivity  
of the atmosphere

$L_p$  = path radiance (radiance  
due to the atmosphere)





## Atmospheric RTMs

simulate the radiative transfer interactions of light scattering and absorption in the atmosphere.

Used for the atmospheric correction of airborne/satellite data and allow retrieving atmospheric composition.

Some RTMs:

- MODTRAN (MODerate resolution atmospheric TRANsmission)
- 6S (Second Simulation of the Satellite Signal in the Solar Spectrum)
- OPAC (Optical Properties of Aerosols and Clouds)

<https://artmtoolbox.com/radiative-transfer-models.html>

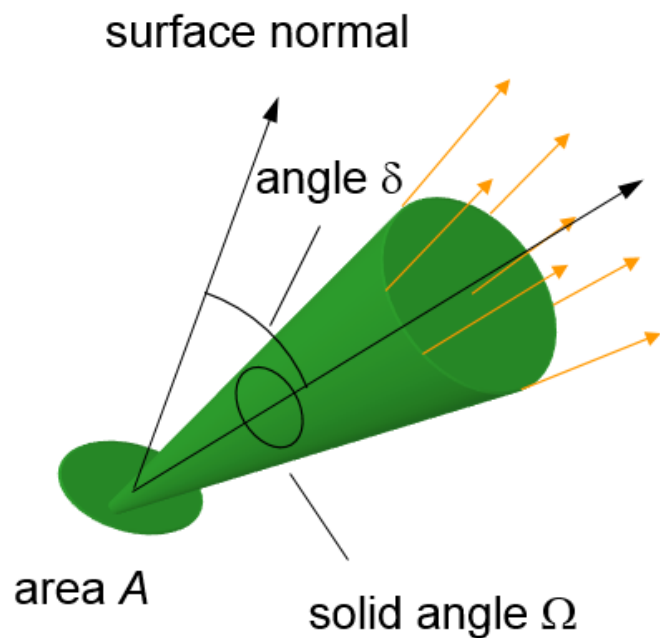


# Land radiative transfer modeling



- Some radiative transfer basics
- 4-stream modelling
- Particular models: SAIL, SLC, 4SAIL, SCOPE

# Flux from a surface in a given direction



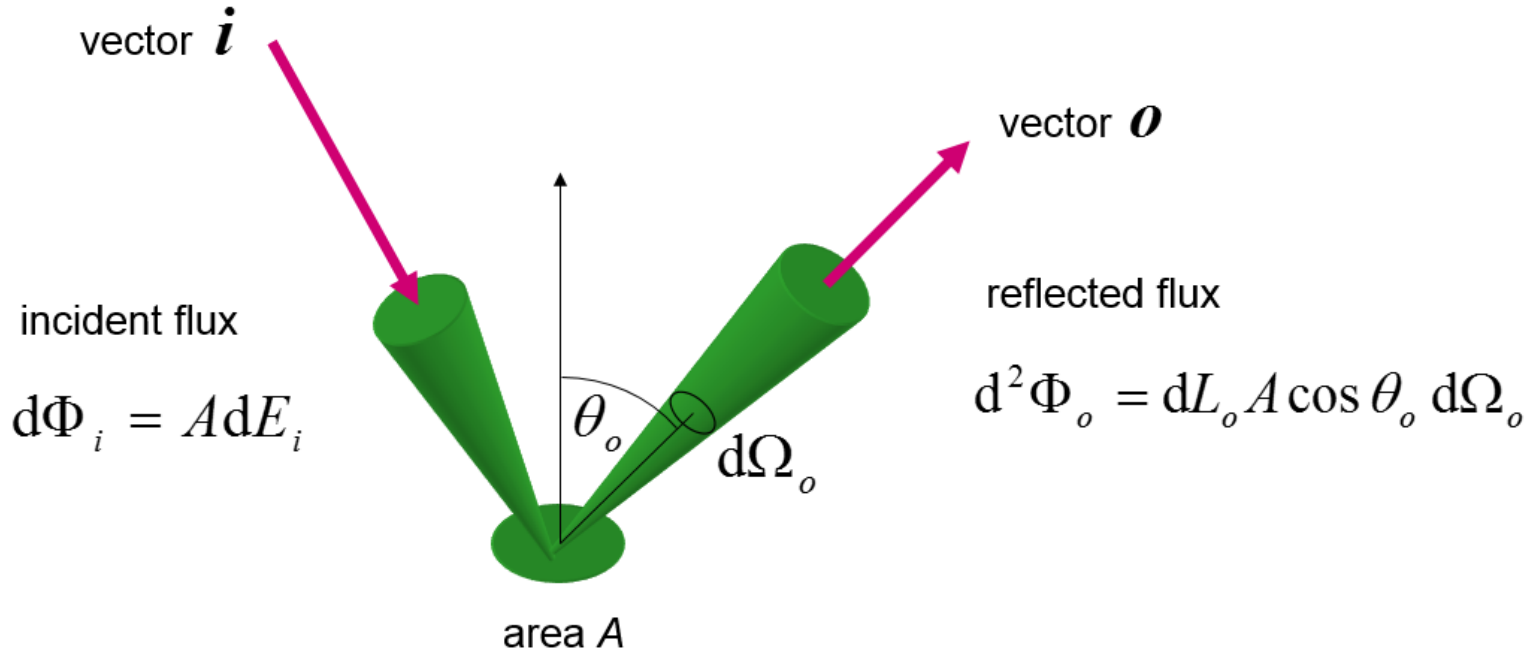
Radiance = flux per unit projected area and per unit solid angle

$$L = \frac{\Phi}{A \cos \delta \Omega}, \text{ unit} = \text{W} / \text{m}^2 \text{sr}, \text{ differential form}$$

$$L = \frac{d^2\Phi}{dA \cos \delta d\Omega}$$

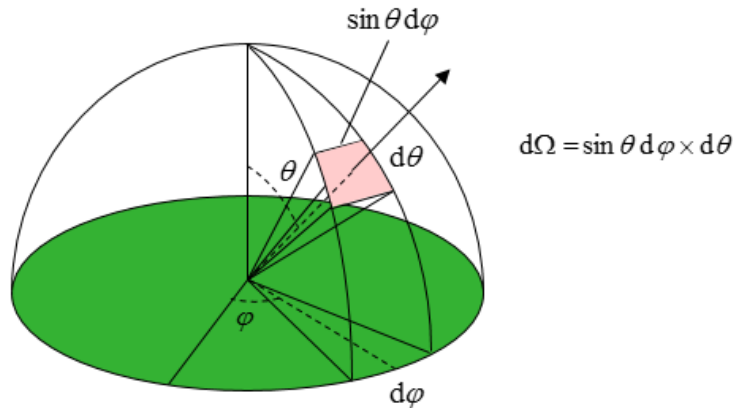


# Bi-directional reflection



Bi-directional reflectance distribution function BRDF, from  $dL_o = \rho' dE_i$   
Unit of BRDF ( $\rho'$ ) =  $\text{sr}^{-1}$

# Hemispherical integral



$$\int_{2\pi} \cos \theta d\Omega = \int_0^{2\pi} \int_0^{\pi/2} \cos \theta \sin \theta d\theta d\varphi = 2\pi \int_0^{\pi/2} \cos \theta \sin \theta d\theta = 2\pi \times \frac{1}{2} \sin^2 \theta \Big|_0^{\pi/2} = \pi$$

Irradiance from a uniform sky ( $L_{\text{sky}} = \text{constant}$ ):  $E_i = \pi L_{\text{sky}}$

# Perfect (white) Lambertian reflector:

- radiance is constant (independent of viewing angle);  
this implies a constant BRDF ( $\rho'$ )
- total (hemispherical) reflected flux = incident flux

Total reflected flux for Lambertian surface:

$$d\Phi_o = \int_{2\pi} \rho' dE_i A \cos \theta_o d\Omega_o = \pi \rho' d\Phi_i$$

so this implies that  $\rho' = \pi^{-1}$  for perfect Lambertian surface

By convention, we write  $\mu = \cos \theta$  ,  $\mu_o = \cos \theta_o$  , etc.

# Special cases of directional reflectance factors

---

1. Bi-directional reflectance factor (BRF) = directional reflectance factor for specular (solar) incidence, symbol  $r_{so}$
2. Hemispherical-directional reflectance factor (HDRF) = directional reflectance for diffuse incident flux, symbol  $r_{do}$

Relations with BRDF:

$$r_{so}(\mathbf{s}, \mathbf{o}) = \pi \rho'(\mathbf{s}, \mathbf{o}) \quad r_{do}(\mathbf{o}) = \int_{2\pi} \rho'(\mathbf{i}, \mathbf{o}) \mu_i d\Omega_i$$

# Special cases of hemispherical reflectance factors

---

1. Directional-hemispherical reflectance factor (DHRF) = hemispherical reflectance for specular (solar) incidence, sometimes called “black sky albedo”, symbol  $r_{sd}$
2. Bi-hemispherical reflectance factor (BHRF) = hemispherical reflectance for diffuse incident flux, sometimes called “white sky albedo”, symbol  $r_{dd}$

Relations with BRDF:

$$r_{sd}(\mathbf{s}) = \int_{2\pi} \rho'(\mathbf{s}, \mathbf{o}) \mu_o d\Omega_o \quad r_{dd} = \pi^{-1} \int_{2\pi} \int_{2\pi} \rho'(\mathbf{i}, \mathbf{o}) \mu_i d\Omega_i \mu_o d\Omega_o$$



# Four-stream approximations of surface reflectance



- assume that fluxes are either specular or perfectly diffuse (uniform by hemisphere)

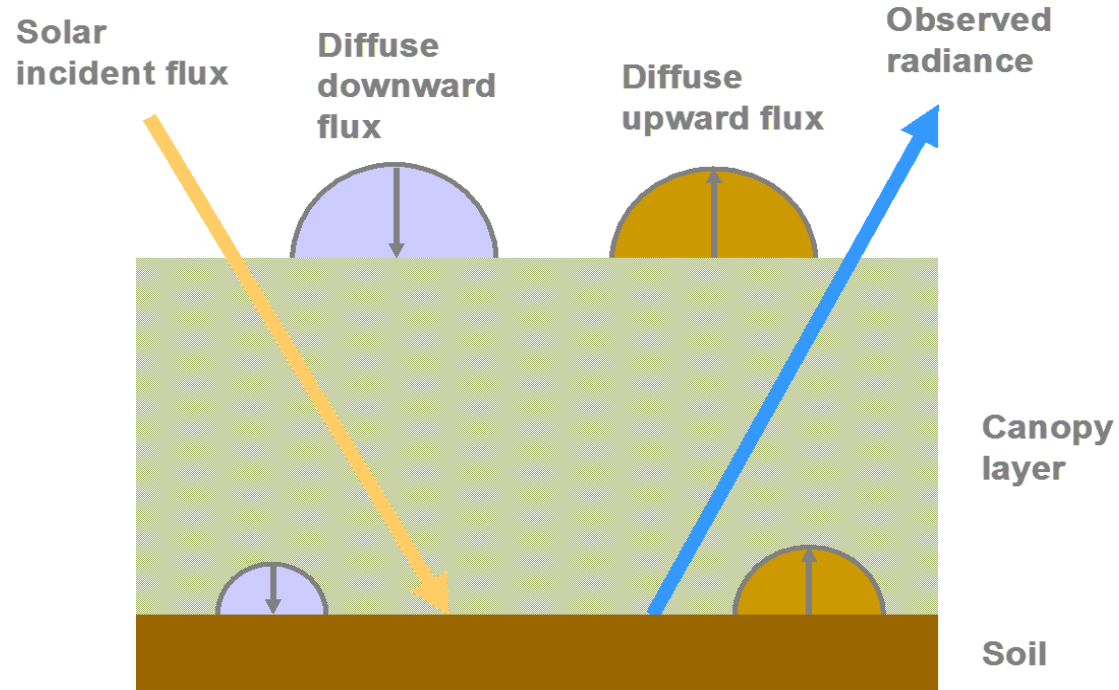
$$r_o = \frac{r_{so} E_{\text{sun}} + r_{do} E_{\text{sky}}}{E_{\text{sun}} + E_{\text{sky}}} \quad \text{directional reflectance factor DRF}$$

$$r_d = \frac{r_{sd} E_{\text{sun}} + r_{dd} E_{\text{sky}}}{E_{\text{sun}} + E_{\text{sky}}} \quad \text{hemispherical reflectance factor HRF (spectral albedo)}$$

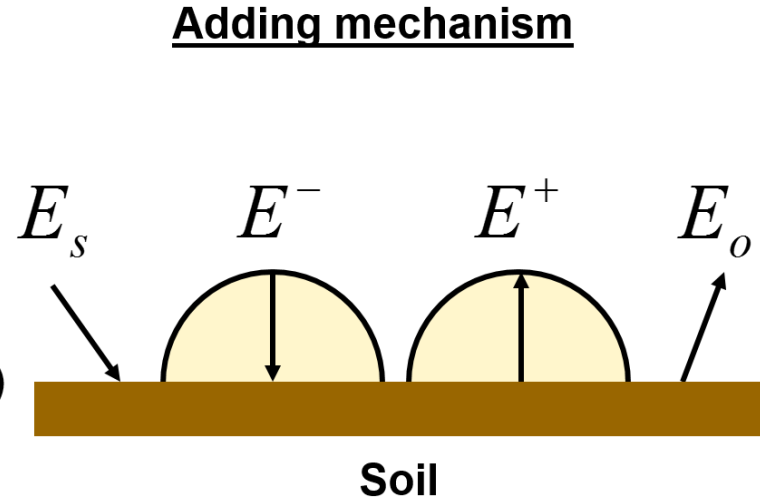
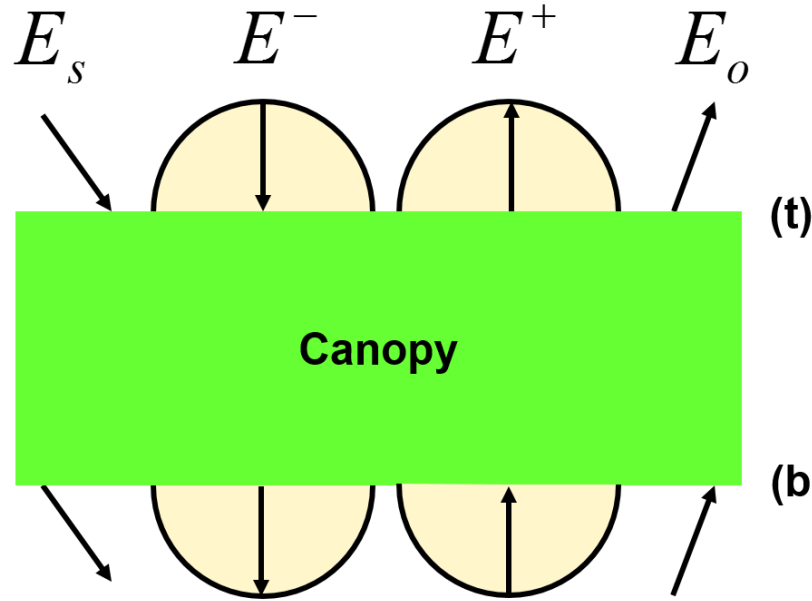
- scattering from arbitrarily inclined leaves
- canopy reflectance model (1981)
- refinement of Suits model (H and V leaves)
- solved by boundary condition method
- parameters  $\rho, \tau, r_s, LAI, LIDF, \theta_s, \theta_o, \psi, f_{sky}$

Verhoef, W. (1984). Light scattering by leaf layers with application to canopy reflectance modeling: The SAIL model. *Remote sensing of environment*, 16(2), 125-141.

# 4-STREAM RADIATIVE TRANSFER



# Adding canopy and soil



$$E_s(b) = \tau_{ss} E_s(t)$$

$$E^-(b) = \tau_{sd} E_s(t) + \tau_{dd} E^-(t) + \rho_{dd} E^+(b)$$

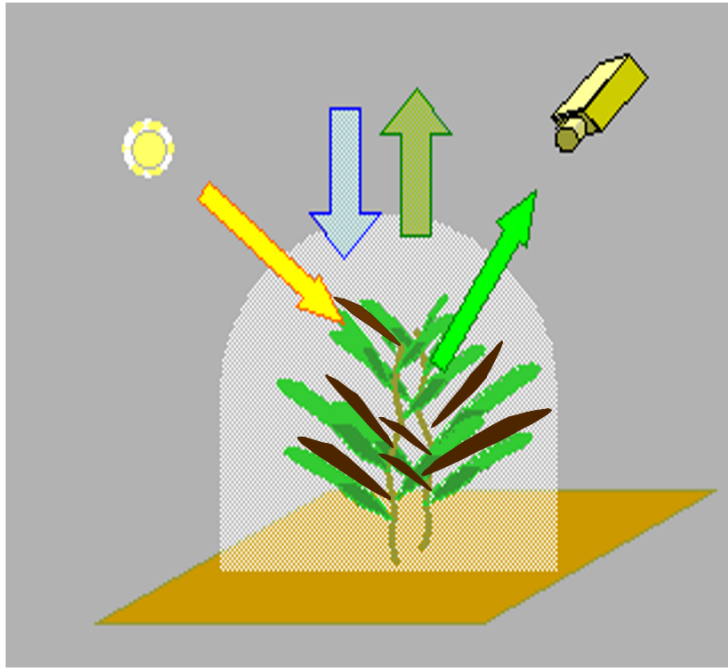
$$E^+(t) = \rho_{sd} E_s(t) + \rho_{dd} E^-(t) + \tau_{dd} E^+(b)$$

$$E_o(t) = \rho_{so} E_s(t) + \rho_{do} E^-(t) + \tau_{do} E^+(b) + \tau_{oo} E_o(b)$$

$$E^+(b) = r_{sd} E_s(b) + r_{dd} E^-(b)$$

$$E_o(b) = r_{so} E_s(b) + r_{do} E^-(b)$$

# SOIL-LEAF-CANOPY MODEL (SLC)



Dry soil reflectance spectrum  
Soil moisture SM  
Soil BRDF Parameters (  $b$ ,  $c$ ,  $B_0$ ,  $h$  )

Chlorophyll Cab  
Water Cw  
Dry matter Cdm  
Senescent material Cs  
Mesophyll structure N

Leaf Area Index LAI  
LIDF leaf slope parameter  $a$   
LIDF bimodality parameter  $b$   
Hot spot parameter hot  
Fraction brown leaf area  $fB$   
Layer dissociation factor D  
Crown coverage Cv  
Tree shape factor zeta

soil

green  
leaves  
brown

canopy

## Fluxes considered

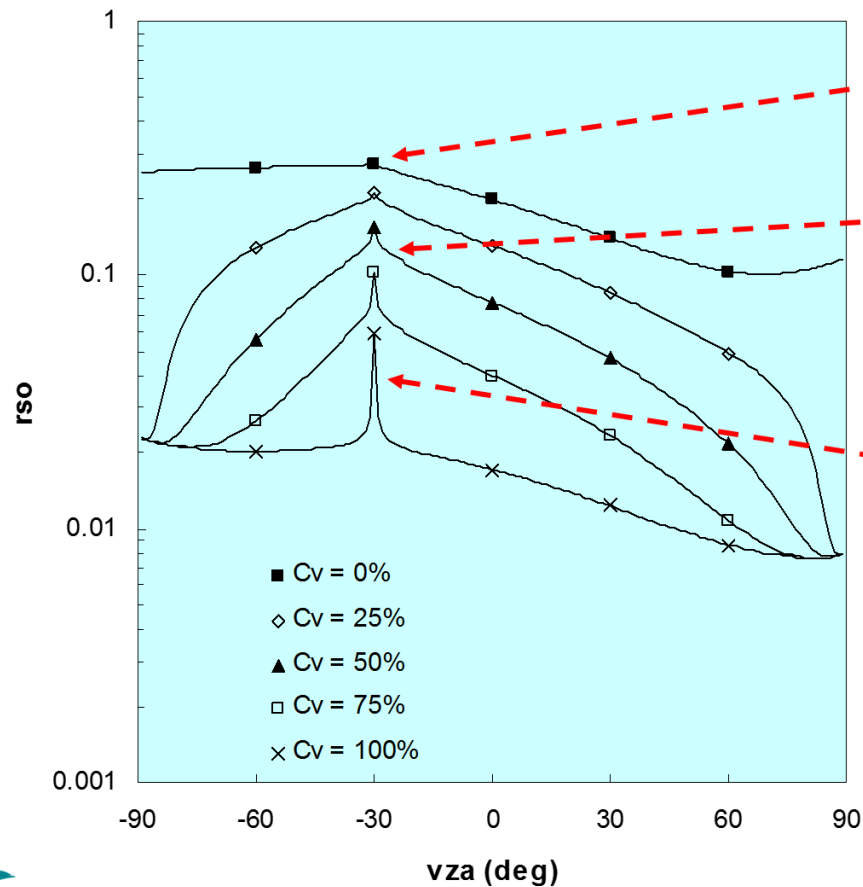
1. Direct solar flux
2. Diffuse downward flux
3. Diffuse upward flux
4. Direct observed flux (radiance)

Solar zenith angle  $sza$   
Viewing zenith angle  $vza$   
Relative azimuth angle  $raa$

sun-observer  
geometry



# BRDFs in the principal plane simulated with SLC (3 hot spots)



Hot spot of bare soil (Hapke model)

Hot spot of tree crowns

Hot spot of foliage

Cv = vertical crown cover %  
Crown LAI = 4

- Modernized version of SAIL
- Speed-optimized
- Numerically robust
- Single homogeneous layer of leaves
- Supports thermal infrared applications
- Directional emissivity and brightness temperature
- Differentiation of leaves and soil in the sun and the shade

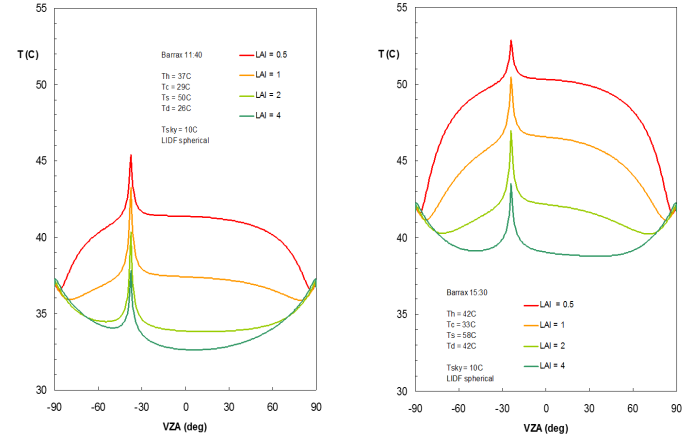
Verhoef, W., Jia, L., Xiao, Q., & Su, Z. (2007). Unified optical-thermal four-stream radiative transfer theory for homogeneous vegetation canopies. *IEEE Transactions on Geoscience and Remote Sensing*, 45(6), 1808-1822.

# 4SAIL MODEL

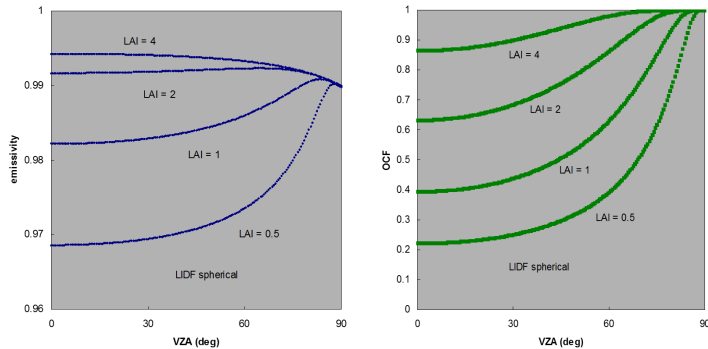
- Modernized version of SAIL
- Speed-optimized
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- Single homogeneous layer of leaves
- Supports thermal infrared applications
- Directional emissivity and brightness temperature
- Differentiation of leaves and soil in the sun and the shade



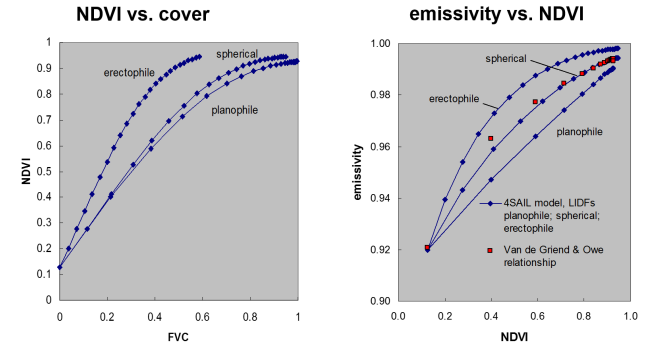
## SIMULATED BRIGHTNESS TEMPERATURE ANGULAR PROFILES IN THE PRINCIPAL PLANE



## DIRECTIONAL EMISSIVITY AND OBSERVED COVER FRACTION (OCF) VS. VIEWING ZENITH ANGLE



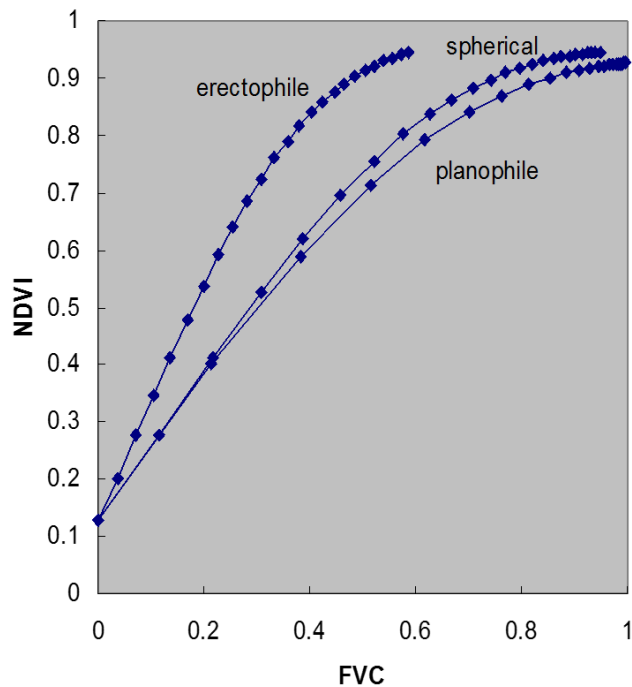
## RELATIONS WITH NDVI



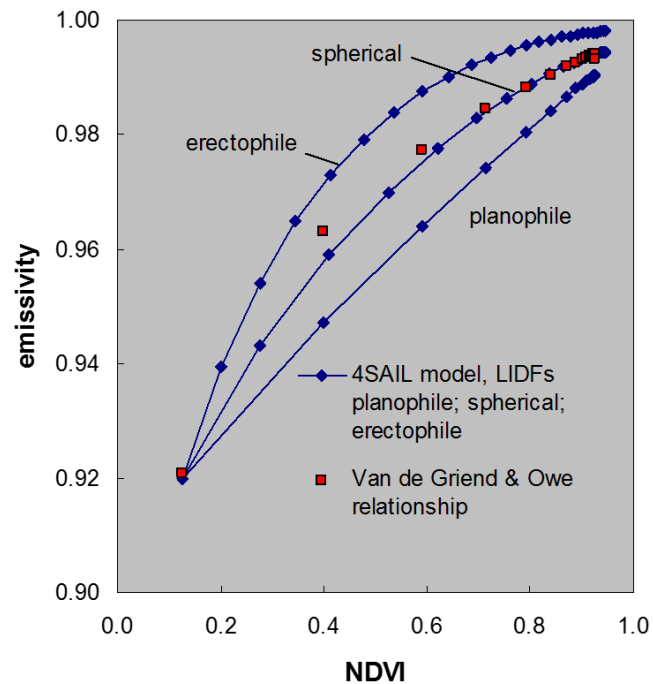
# RELATIONS WITH NDVI



## NDVI vs. cover



## emissivity vs. NDVI

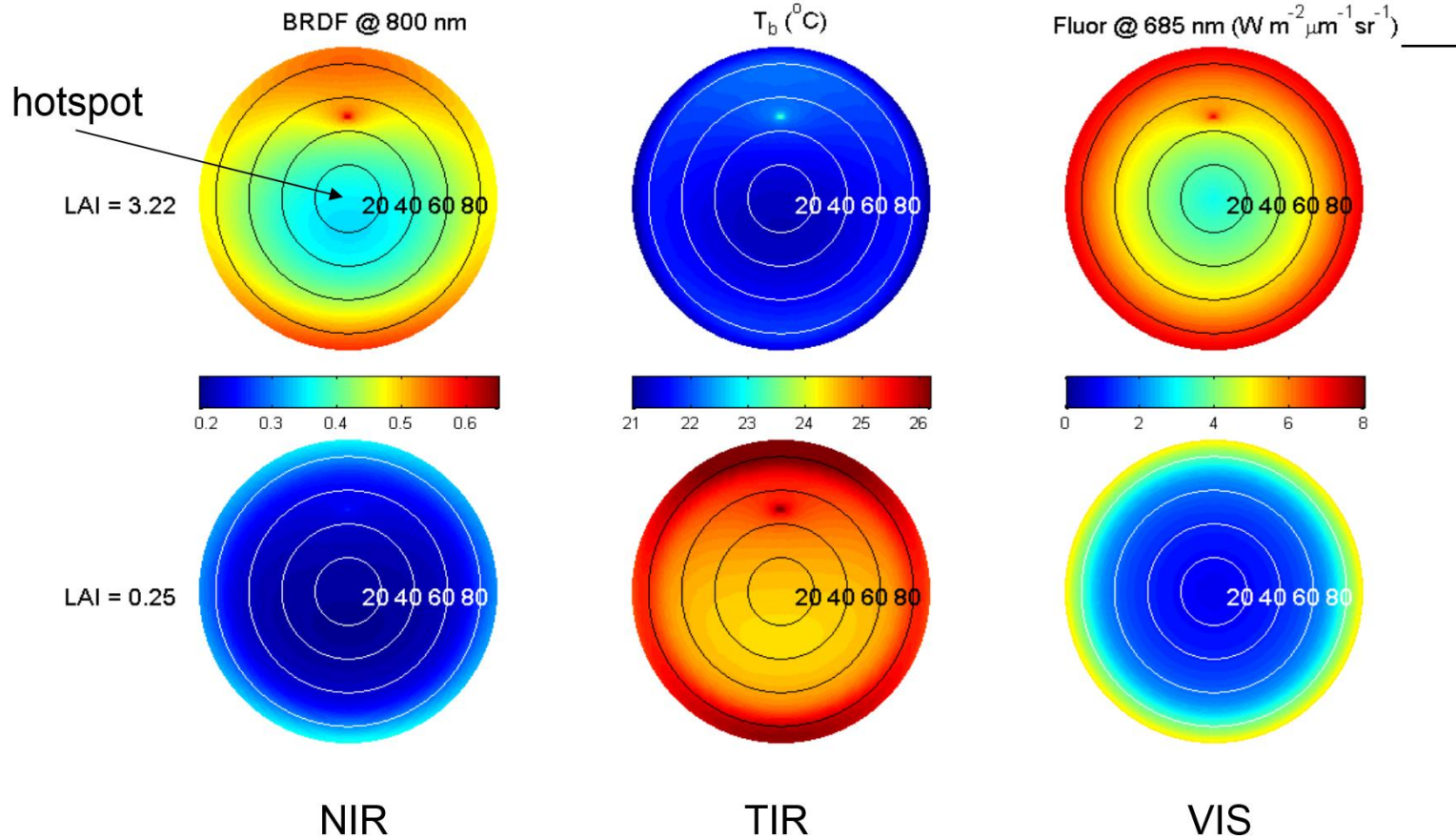


- Soil-Canopy spectral Observations, Photosynthesis and Energy balance model
- Numerical model uses the energy balance at leaf level as a function of its orientation and depth
- Output: leaf temperatures, fluorescence, photosynthesis, and directional observed radiances
- Available in Matlab code

Tol, C., Verhoef, W., Timmermans, J., Verhoef, A., & Su, Z. (2009). An integrated model of soil-canopy spectral radiances, photosynthesis, fluorescence, temperature and energy balance. *Biogeosciences*, 6(12), 3109-3129.



# Hemispheric directional plots from SCOPE model



## Radiative transfer modeling

**SCOPE** - Simulation model for radiative transfer, photosynthesis and energy fluxes in vegetation and soil

<https://github.com/Christiaanvandertol/SCOPE>

**Automated Radiative Transfer Models Operator (ARTMO)**

Graphic User Interface (GUI)

<https://artmtoolbox.com/>

**2SeaColor** - Two-stream remote sensing model for water quality mapping:

<https://github.com/suhybsalama/2SeaColor>



# Optical imaging and applications



- **Agriculture:** Gathering crop statistics and yield assessments
- **Urban:** Planning city-wide infrastructure improvements
- **Forests:** Checking de- or re-forested areas for treaty purposes
- **Biodiversity:** Understanding the habitats where wildlife exist
- **Health:** Tracking conditions associated disease spread
- **Water:** Evaluating water body extents for flood assessments
- **Disaster:** Making damage maps following major earthquakes
- **Cryosphere:** Mapping snow fields and glacier melting



# Sentinel-2 in a nutshell



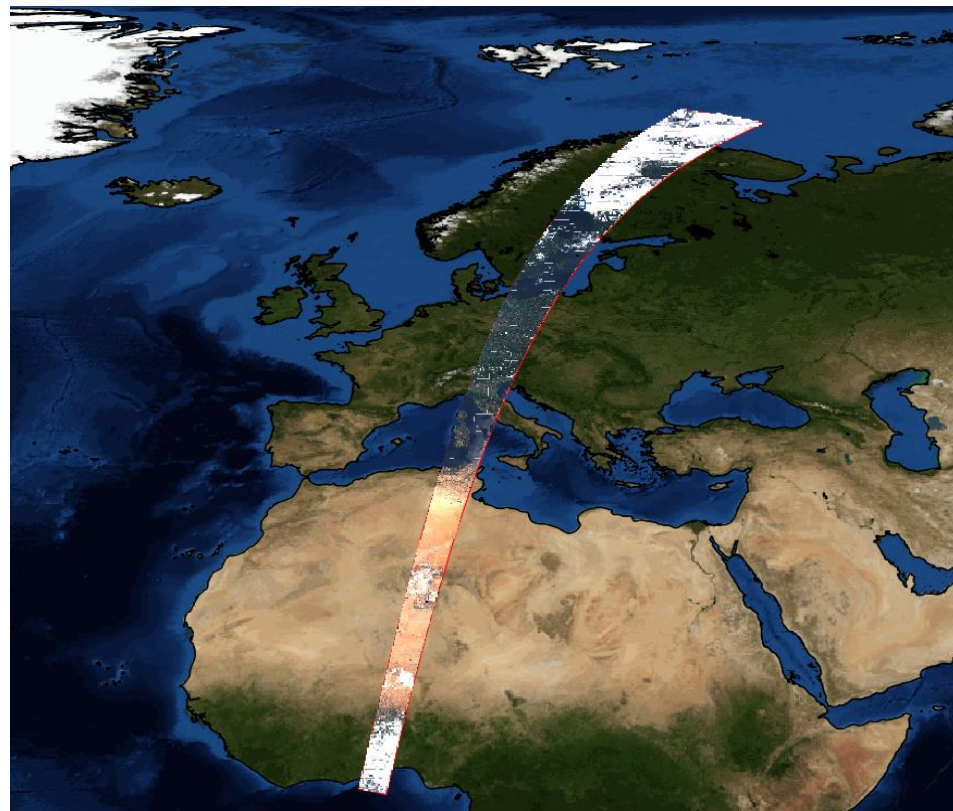
13 VIS/NIR/SWIR spectral bands: 3 bands in the red edge tailored to vegetation monitoring

Spatial resolution: 10m / 20m (60 m for atmosphere calibration)

Swath: 290 km

2 spacecraft on same orbit, 180° apart: 5 days revisit at equator

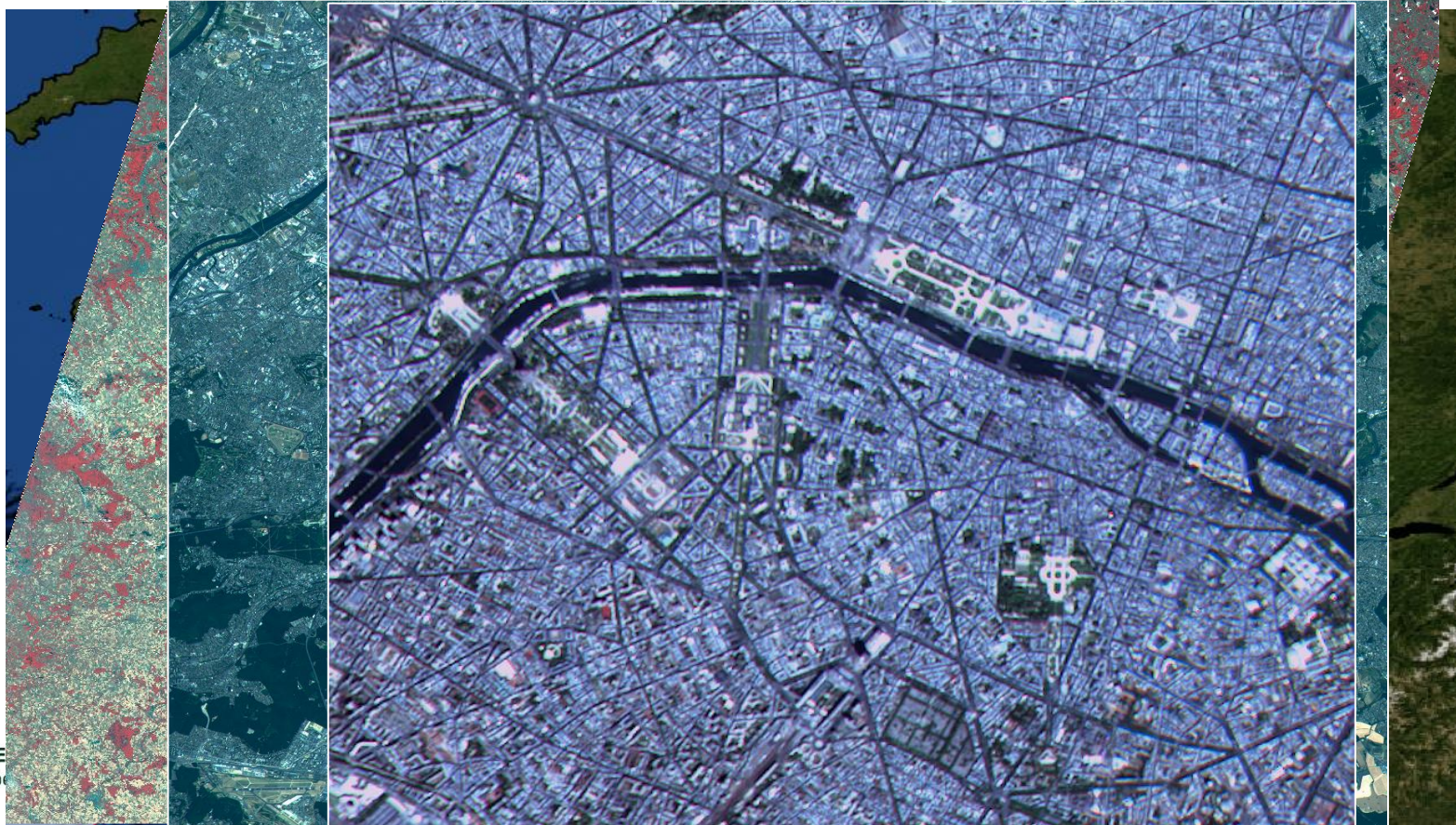
Systematic coverage between 84°N and 56°S



SENSING



Paris!



2019 ADVANCE  
18-23 November

遥感高级培训班  
主办方：重庆大学



# Sentinel 2

Copenhagen (Denmark) - Natural Colour (10m)



*"Very easy to download and install"*

# Sentinel 2

Nador (Morocco) - False Colour (10m)



*"just start using it and I like it"*



# Sentinel 2

Pavia (Italy) - 'Red Edge' False Colour (20m)



*"Thank you for the great tools!"*



# Irrigation and fires in Tabuk, Saudi Arabia



# Urban Infrastructure and Motion in Venice/Italy



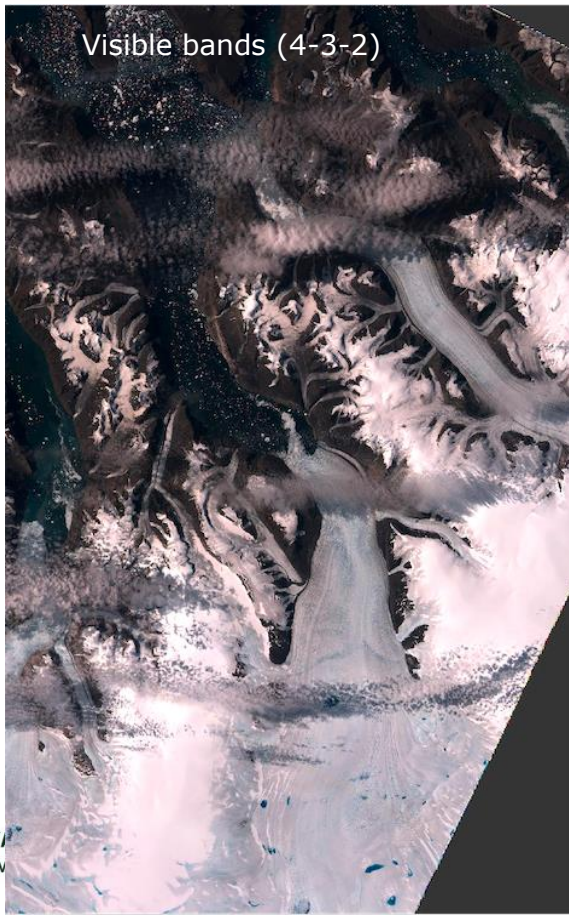


# Greenland: Disko Bay

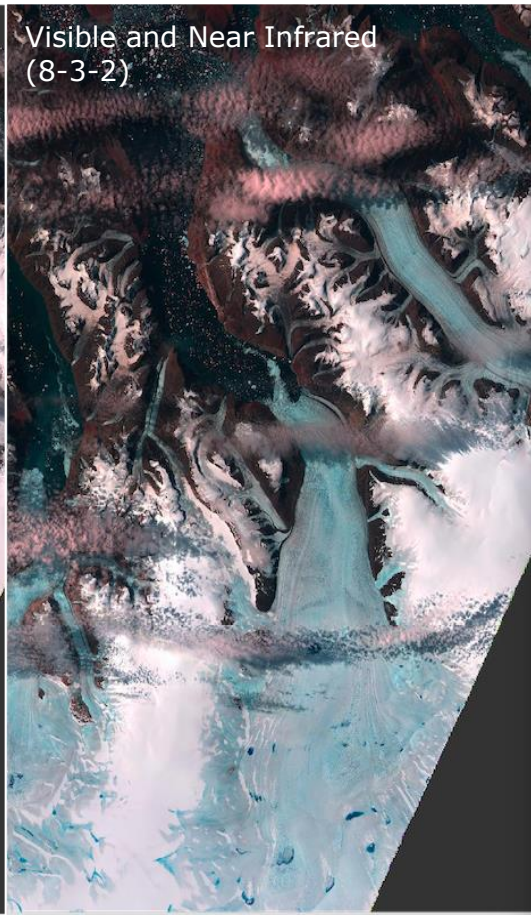
13 Spectral bands make the difference



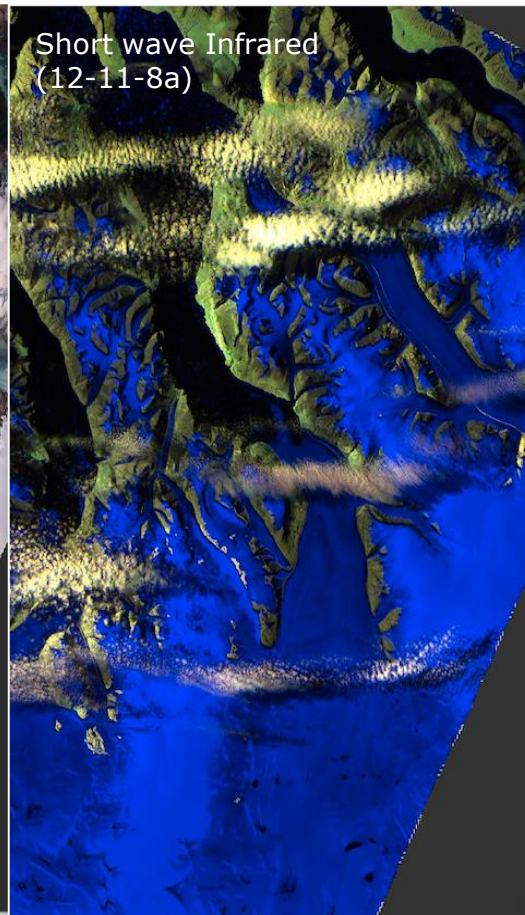
Visible bands (4-3-2)



Visible and Near Infrared  
(8-3-2)



Short wave Infrared  
(12-11-8a)





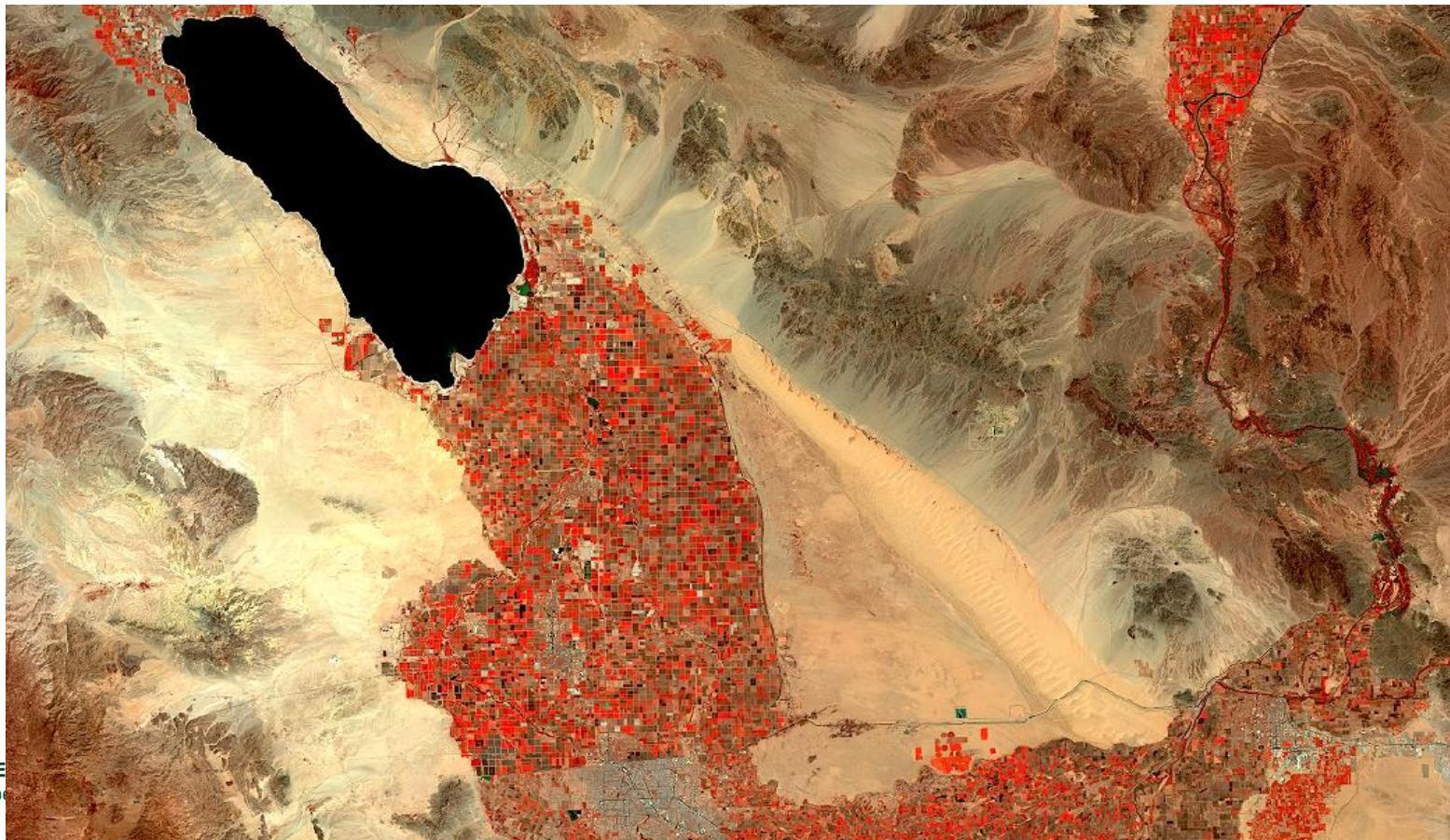
# Sentinel-2 Western Greenland glaciers

CC



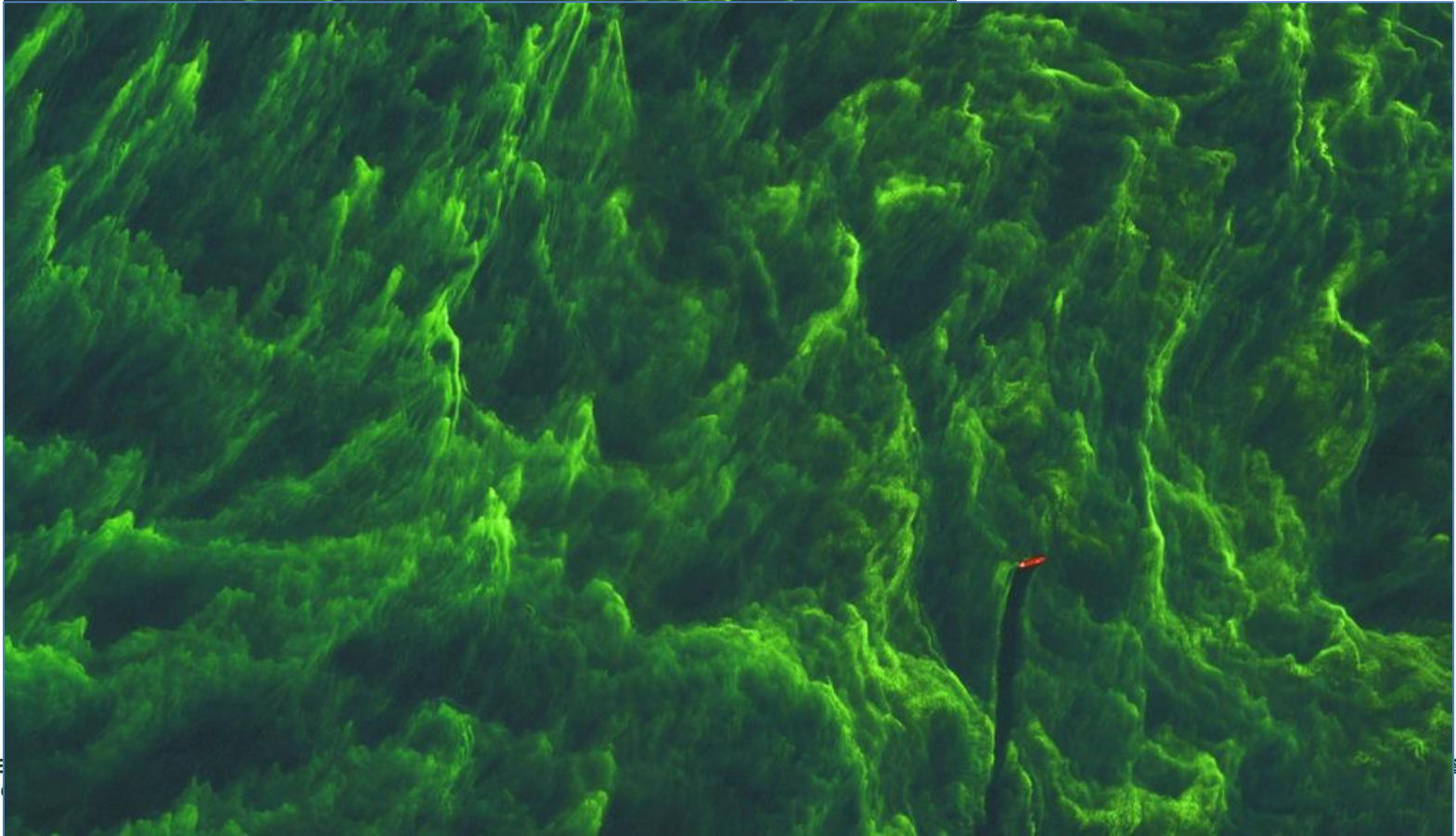


# Baja California: dry land vs irrigated land (NIR-VIS), land discharge (red-edge) along a border





**Stunning details:** fronts and filaments of ocean biogeochemistry slashed open by shiptracks, wind blown structures...



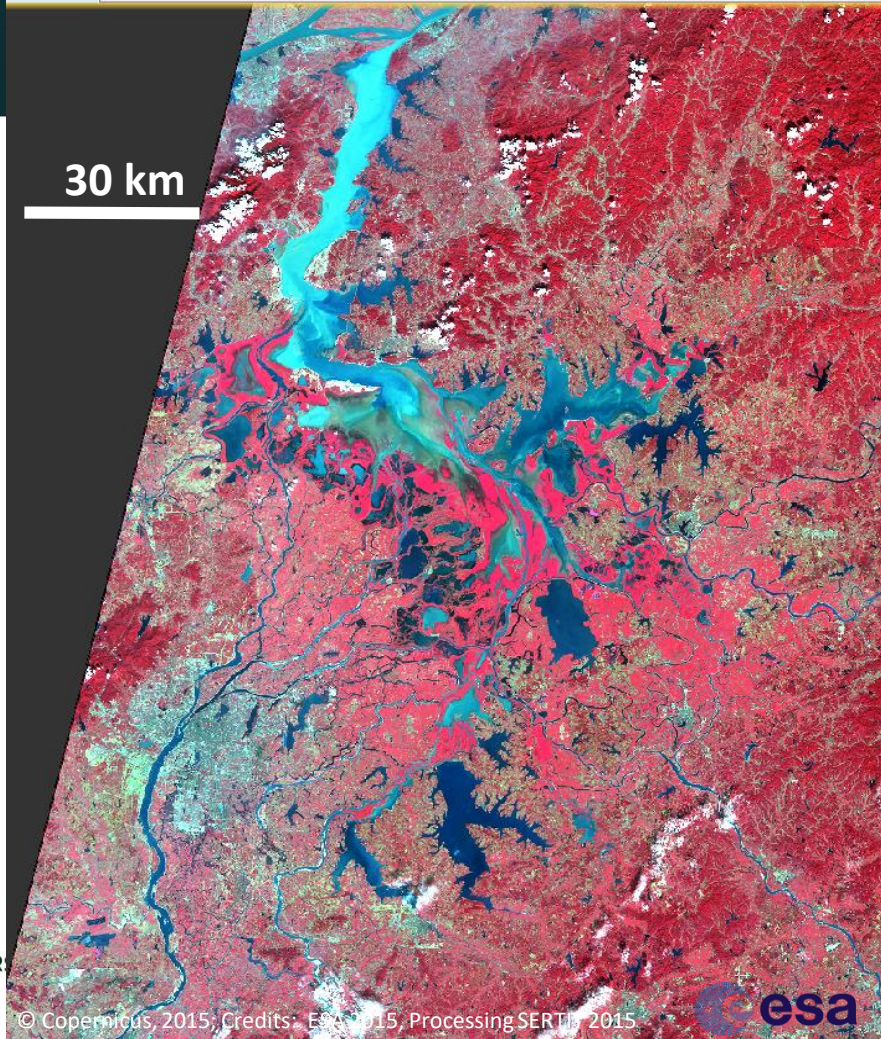
sa

Sentinel2

2015-10-20

10 m

30 km





sa

Sentinel2

2015-10-20

10 m

15 km



遥感高级培训班  
主办方：重庆大学

2019 ADVANCE  
18-23 November

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15 km

Sentinel2

2015-10-20

10 m

Thank you for your attention