

Spatial Tools in Water Resource Management

Nick van de Giesen

4. Introduction Remote Sensing





Lecture 4: Intro remote sensing

CT5401

- GIS: Lectures 1,2,3
- Remote Sensing: Lecture 4,5,6
- Theory
- Exercise



Lecture 4: Intro remote sensing

CT5401: Remote Sensing

- Lecture 4: Introduction & image classification
- Lecture 5: Thermal imagery (Wim Bastiaanssen)
- Lecture 6: Microwave (Susan Steele-Dunne)

- Some “overlap”
- Burkina Faso



Lecture 4: Intro remote sensing

Outline

- Overview satellites & applications
- Image analysis
- Image classification
- Exercise: Mapping small reservoirs



Lecture 4: Intro remote sensing

Remote Sensing

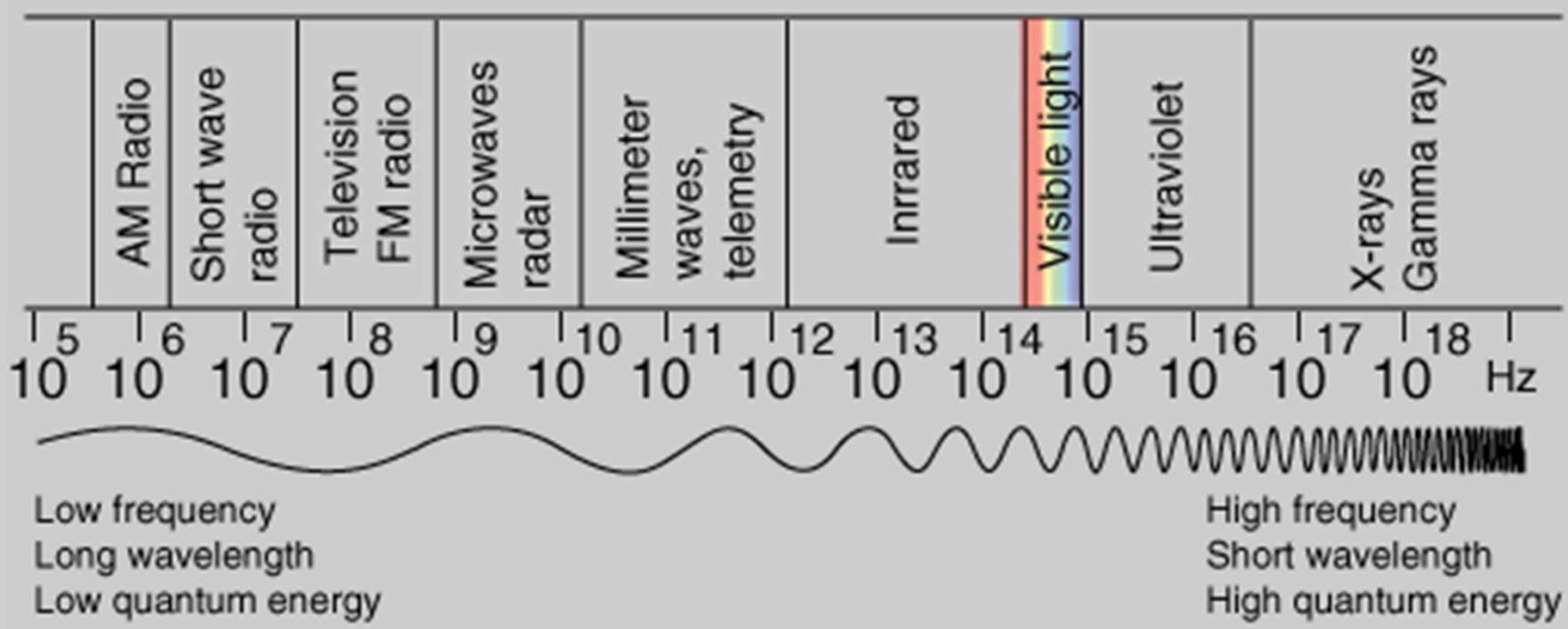
- Remote sensing (satellites)
 - Principles
 - Applications



Lecture 4: Intro remote sensing

Satellite principles

➤ Spectrum

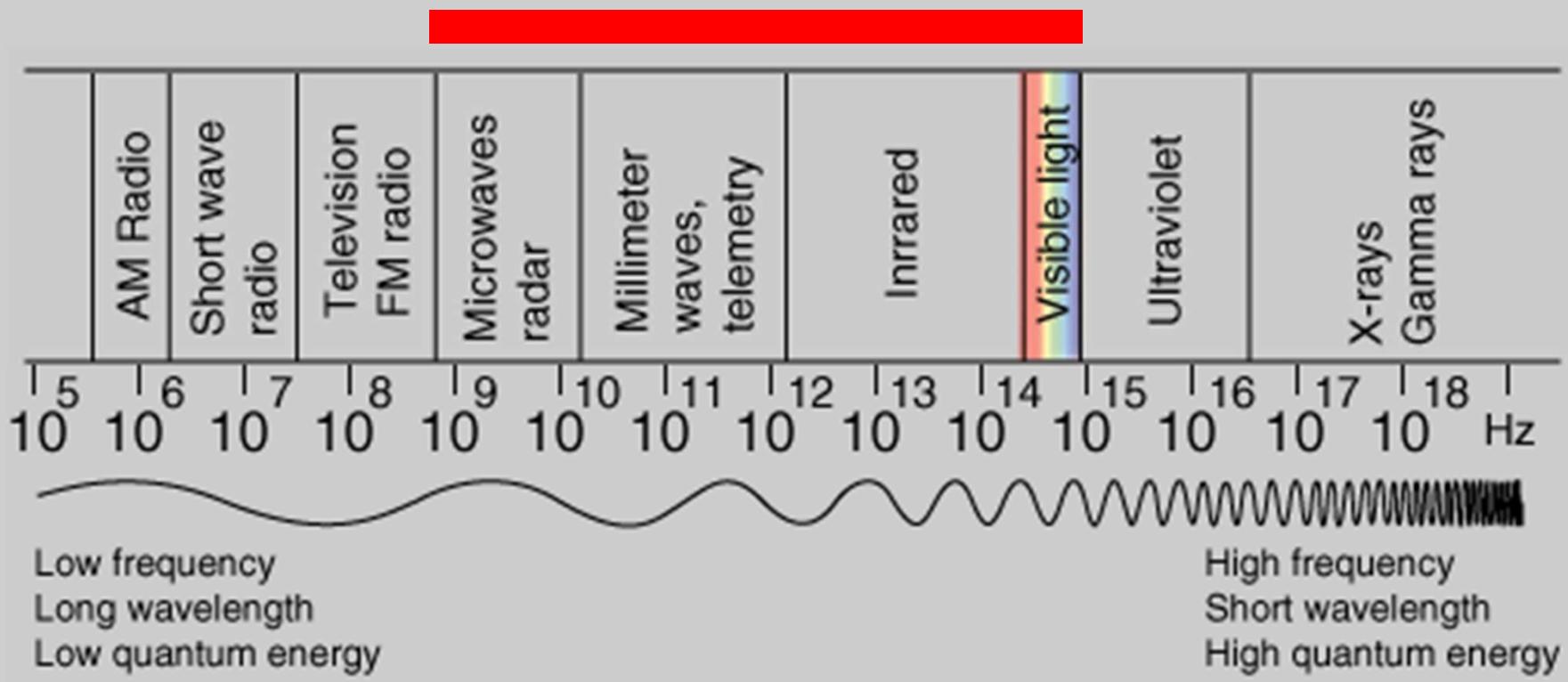




Lecture 4: Intro remote sensing

Satellite principles

➤ Spectrum

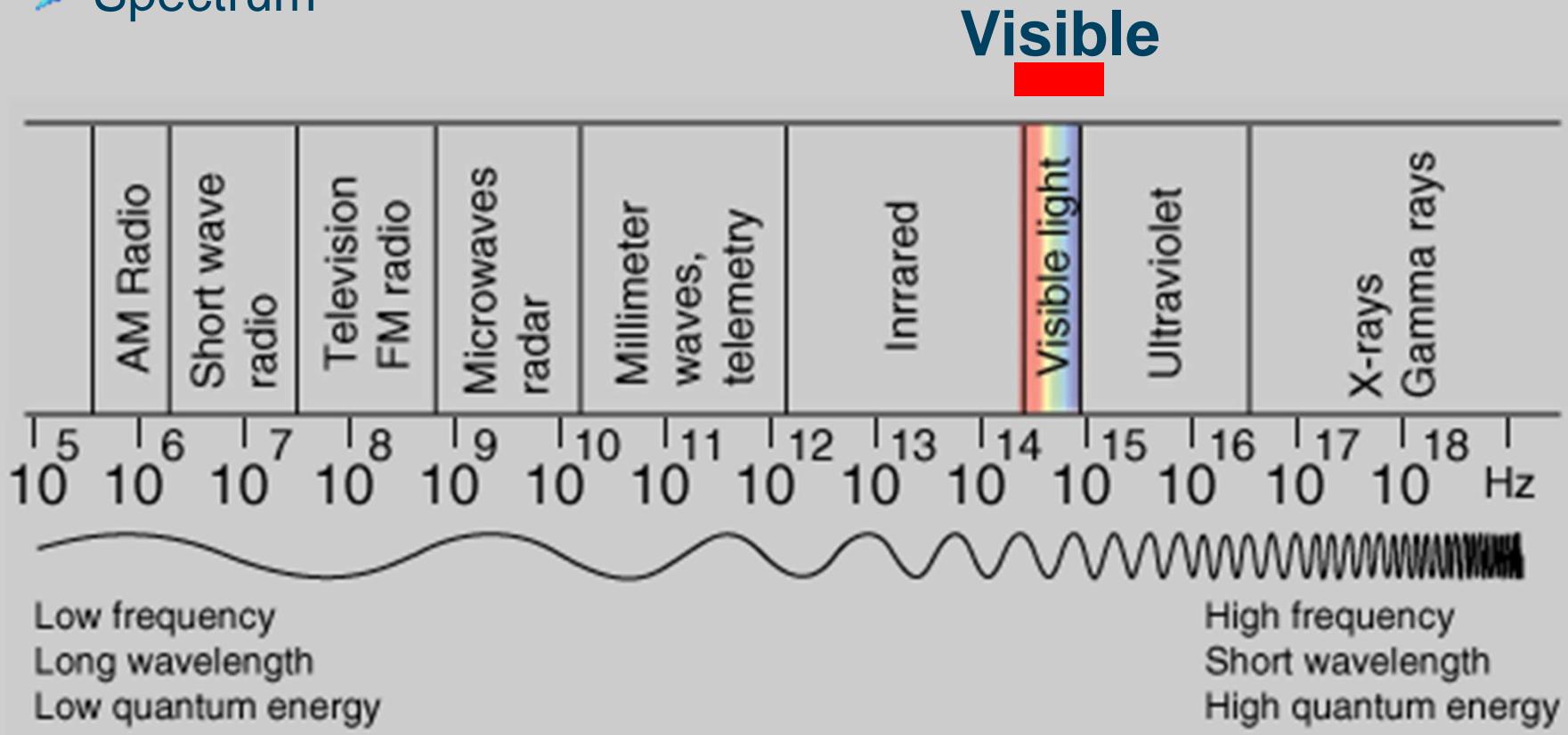




Lecture 4: Intro remote sensing

Satellite principles

➤ Spectrum

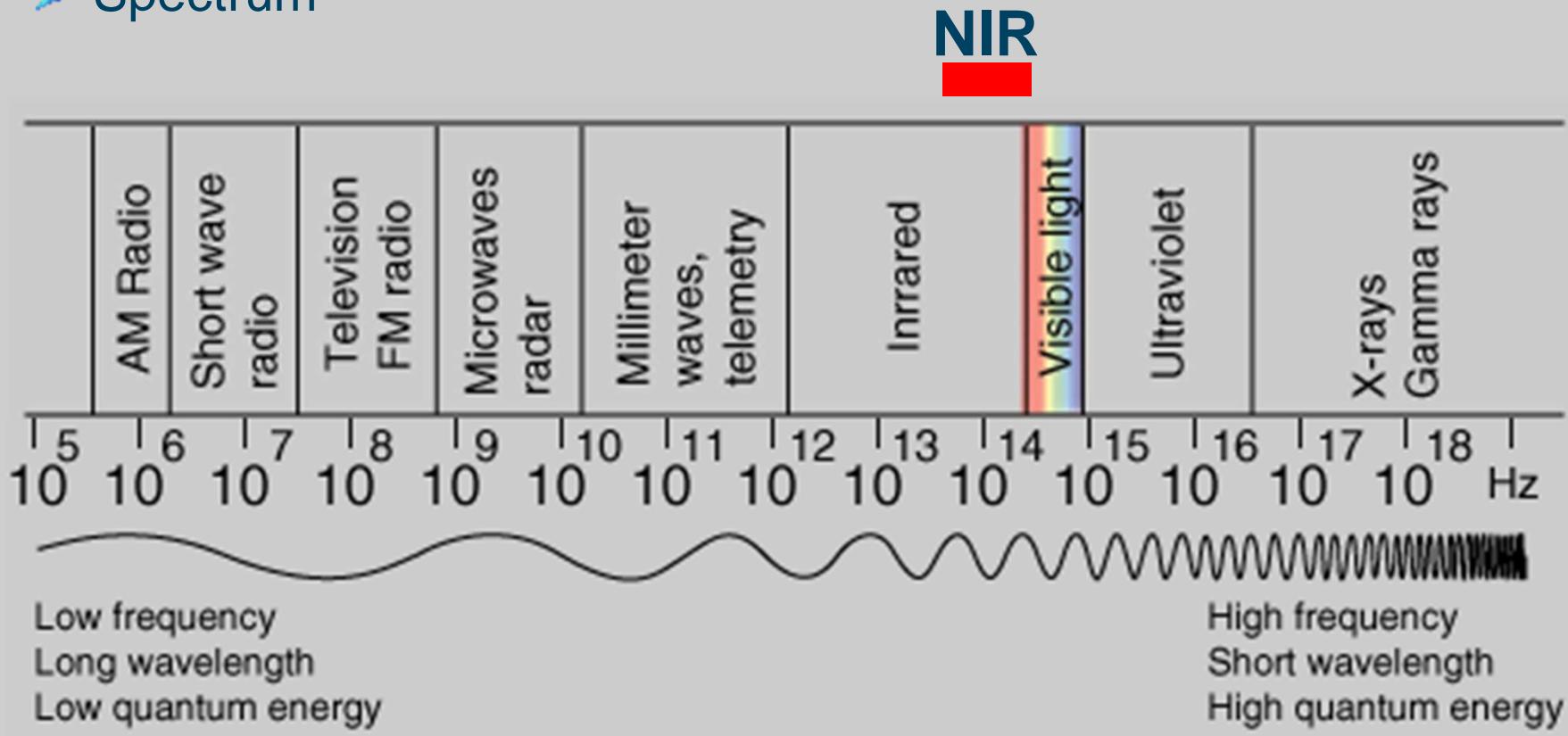




Lecture 4: Intro remote sensing

Satellite principles

➤ Spectrum

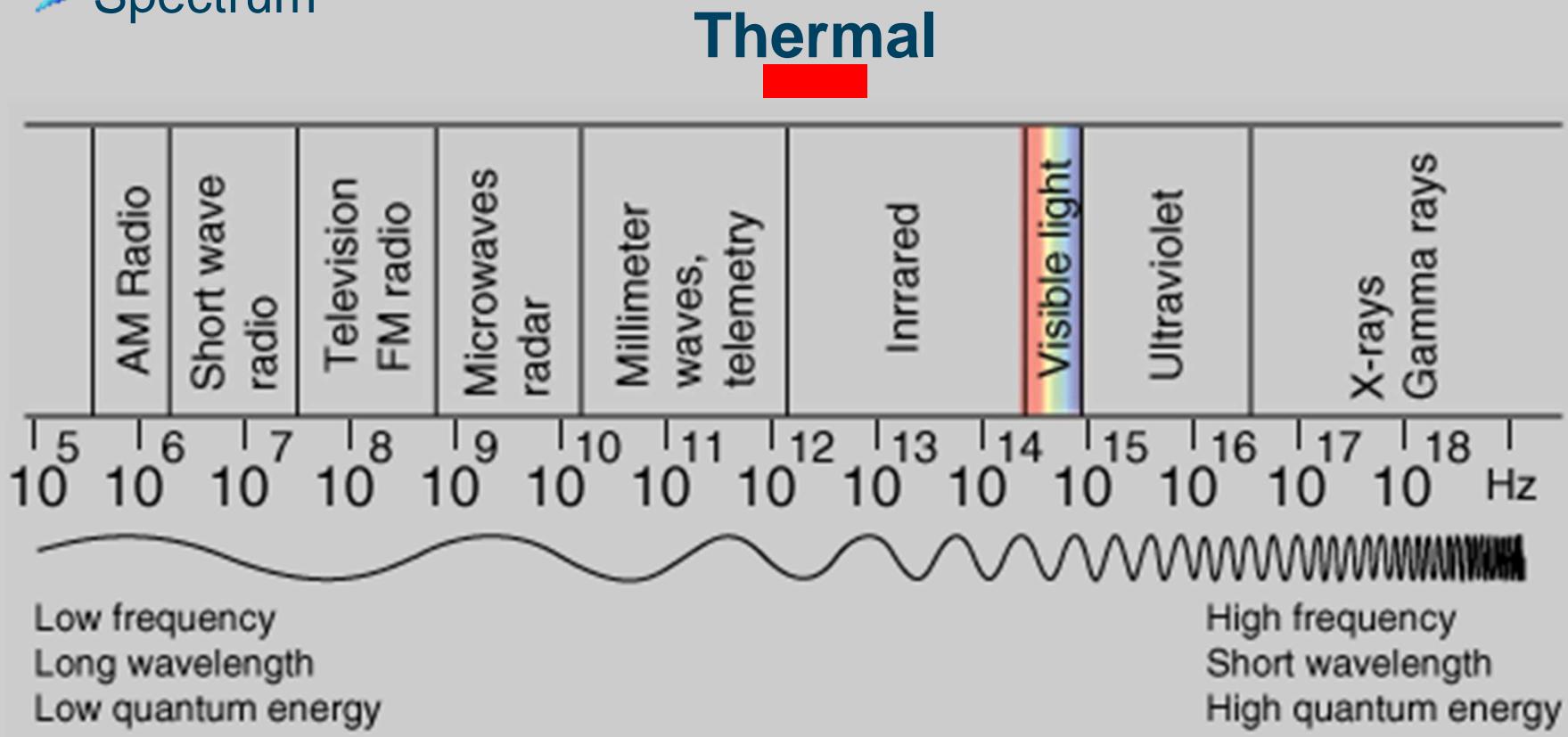




Lecture 4: Intro remote sensing

Satellite principles

➤ Spectrum

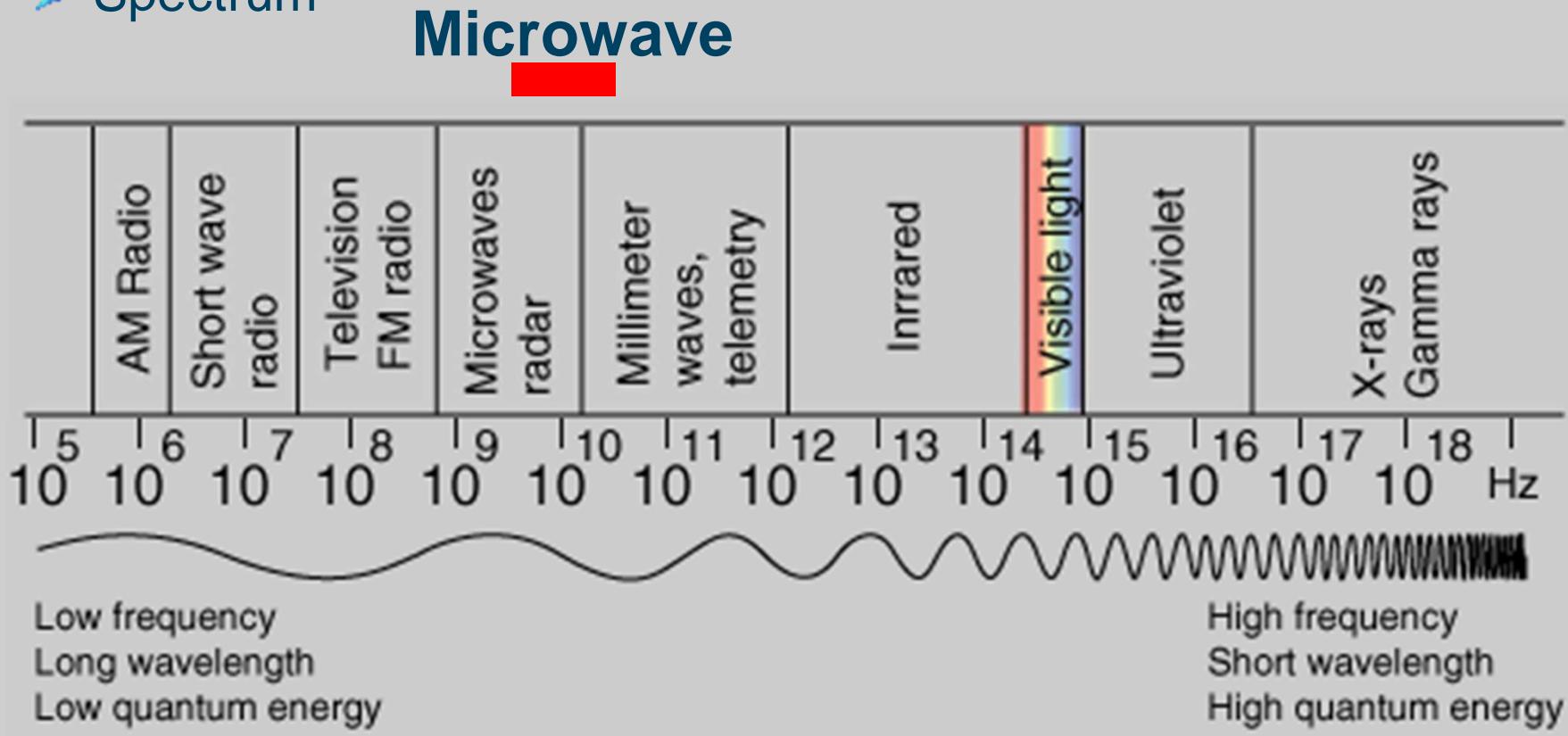




Lecture 4: Intro remote sensing

Satellite principles

➤ Spectrum





Lecture 4: Intro remote sensing

Satellite principles

- Visible/NIR
 - Easy interpret
 - Water
 - Vegetation



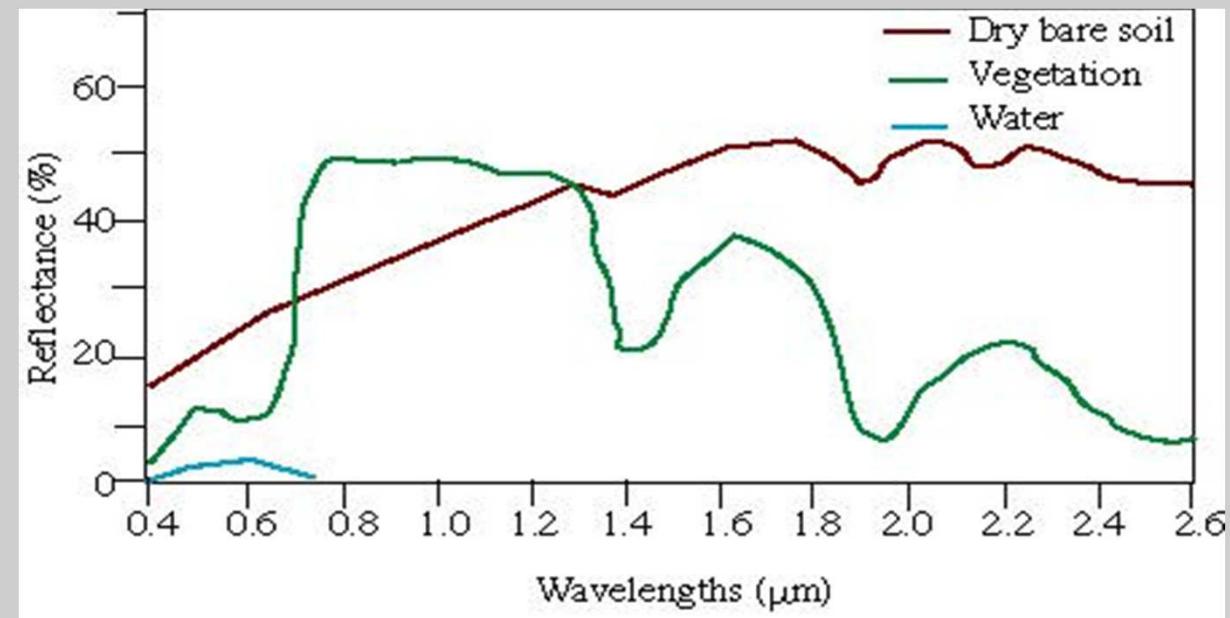
[2]



Lecture 4: Intro remote sensing

Satellite principles

- Visible/NIR
- Vegetation
- NDVI



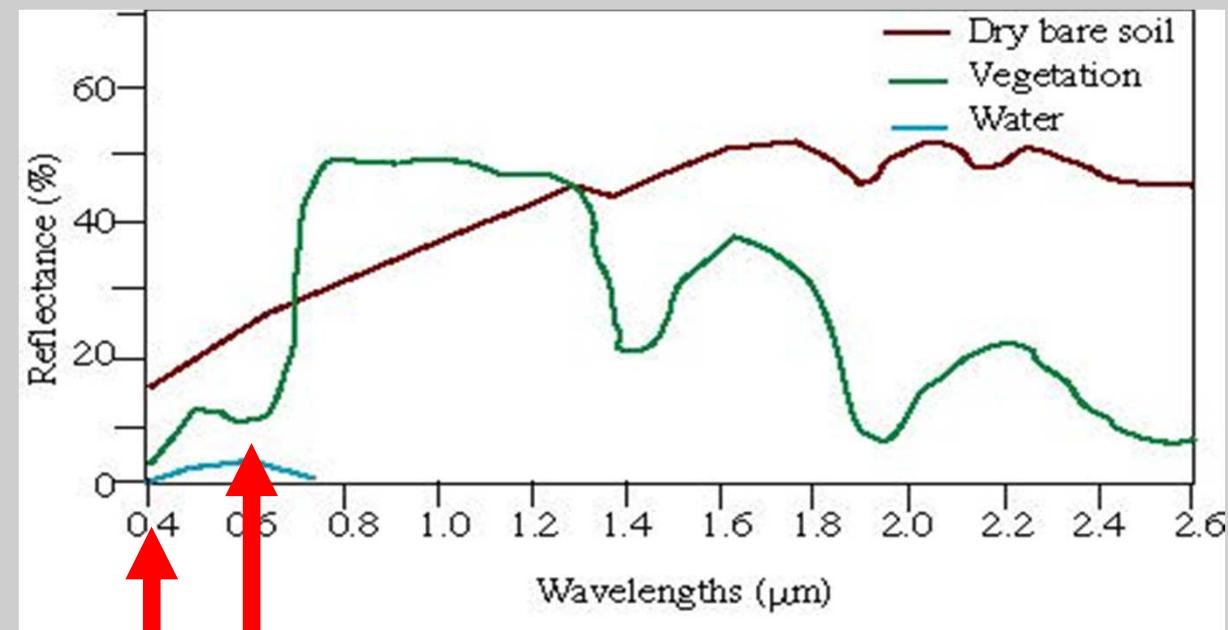
[3]



Lecture 4: Intro remote sensing

Satellite principles

- Visible/NIR
- Vegetation
- NDVI



Red
Blue

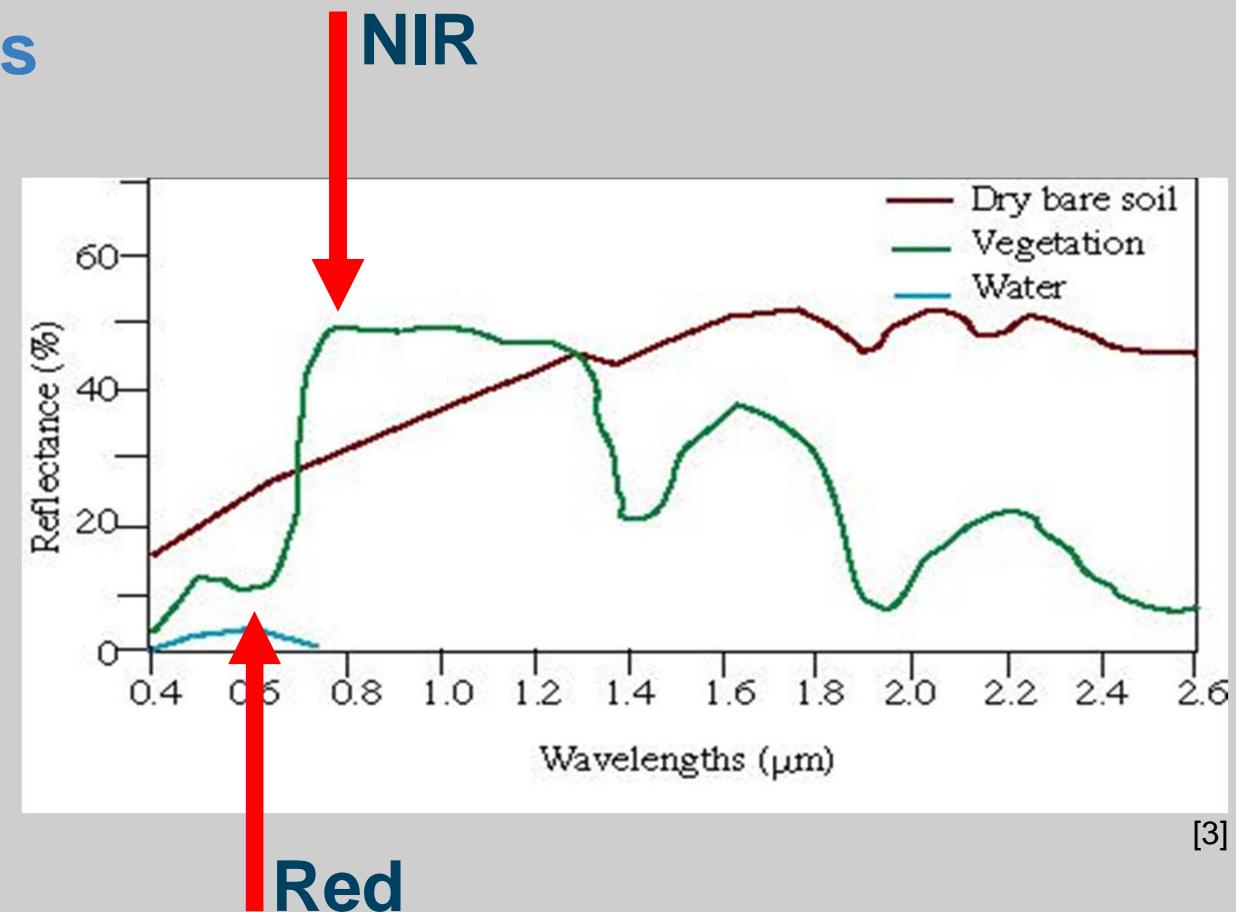
[3]



Lecture 4: Intro remote sensing

Satellite principles

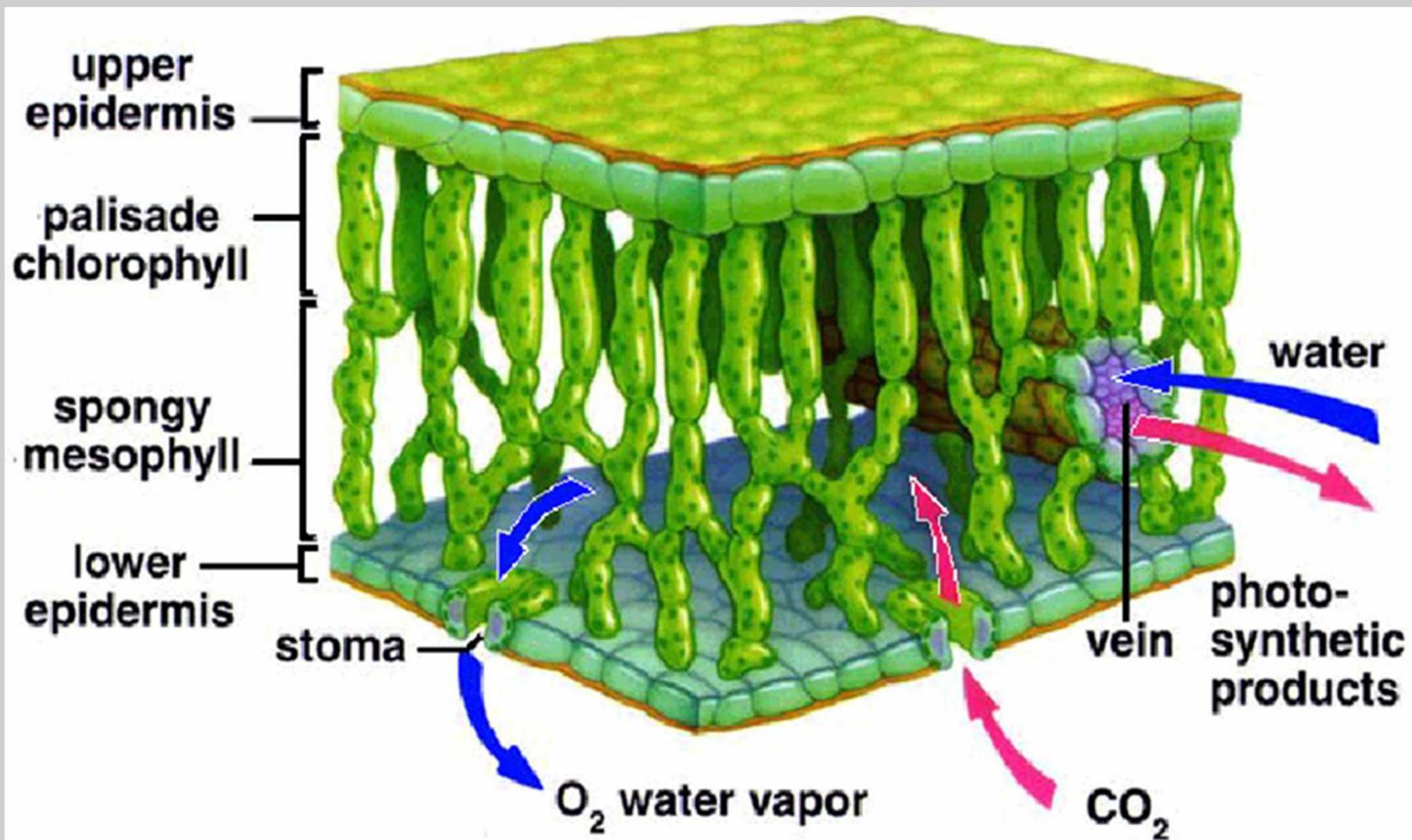
- Visible/NIR
- Vegetation
- NDVI



$$\text{NDVI} = (\text{NIR}-\text{Red}) / (\text{NIR}+\text{Red})$$



Lecture 4: Intro remote sensing



[4]

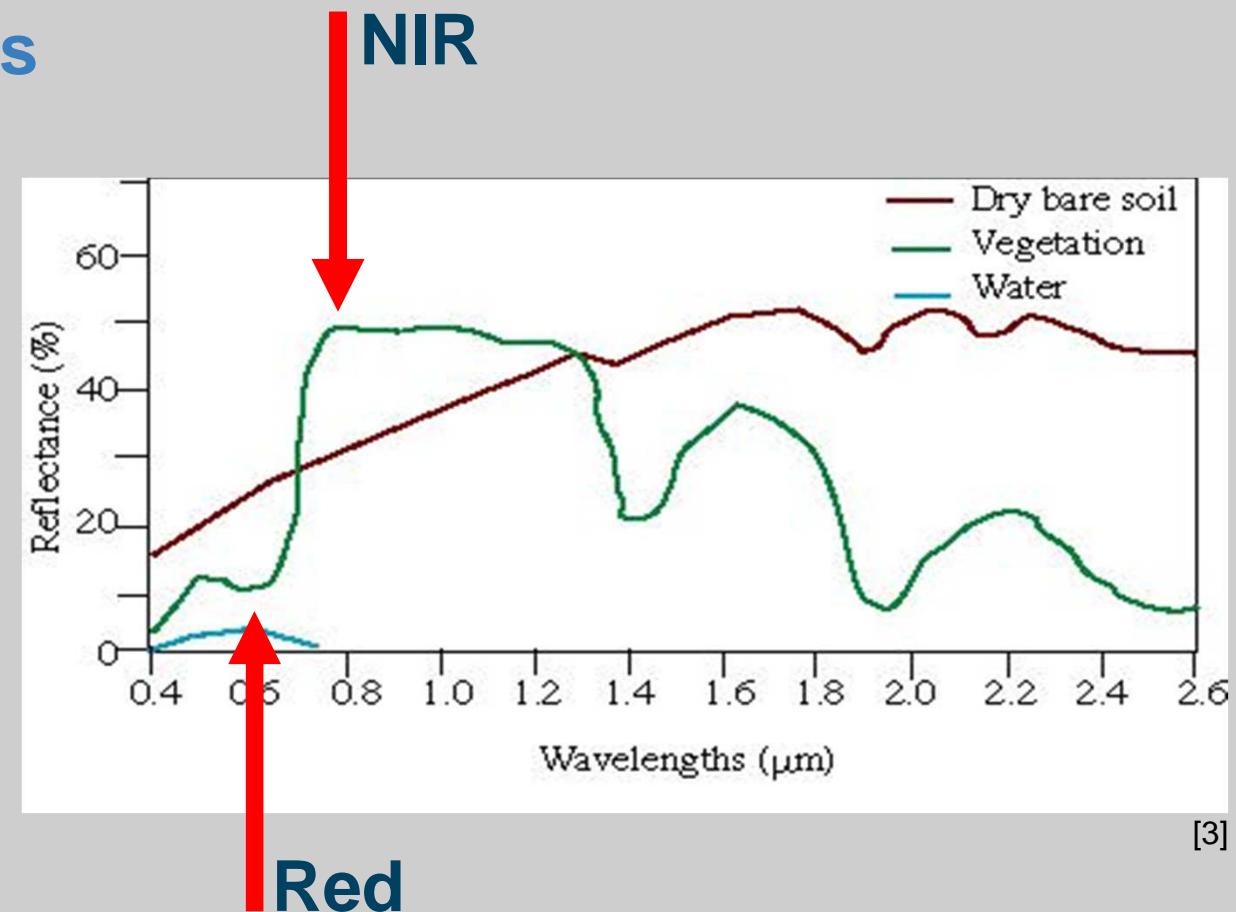
$$\text{NDVI} = (\text{NIR-Red}) / (\text{NIR+Red})$$



Lecture 4: Intro remote sensing

Satellite principles

- Visible/NIR
- Vegetation
- NDVI



[3]

$$\text{NDVI} = (\text{NIR} - \text{Red}) / (\text{NIR} + \text{Red})$$



Lecture 4: Intro remote sensing

Satellite principles

- Visible/NIR
 - Vegetation
 - NDVI



[5]

$$\text{NDVI} = (\text{NIR}-\text{Red}) / (\text{NIR}+\text{Red})$$



Lecture 4: Intro remote sensing

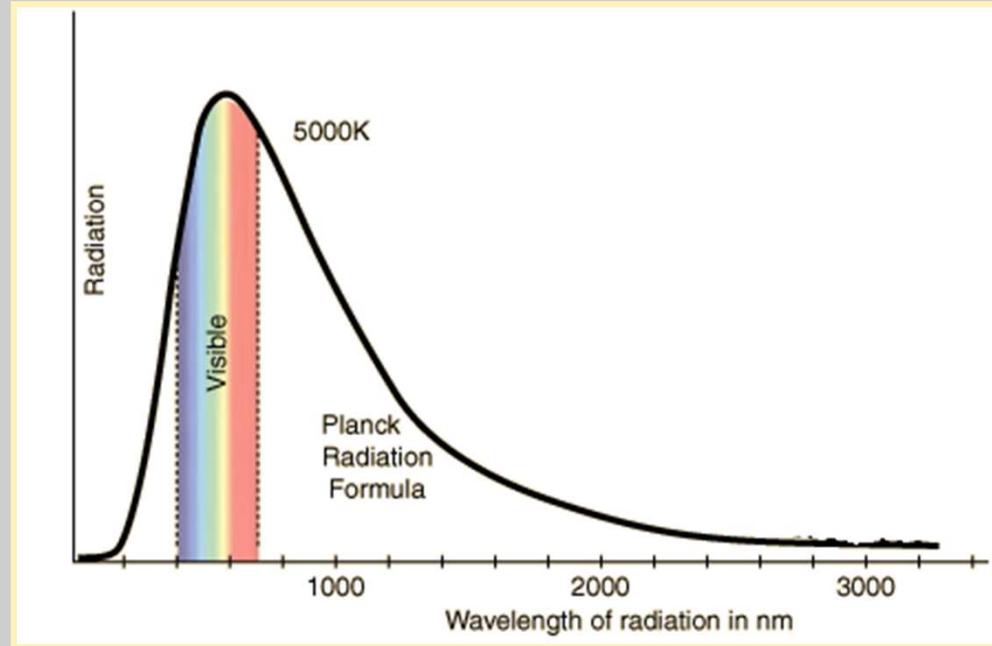
Satellite principles

➤ Thermal IR

$$S_\lambda = \frac{8\pi hc}{\lambda^5} \frac{1}{e^{hc/\lambda kT} - 1}$$

$$\lambda_{peak} = \frac{0.0029}{T}$$

$$P = \epsilon \sigma T^4$$



[6]

Planck

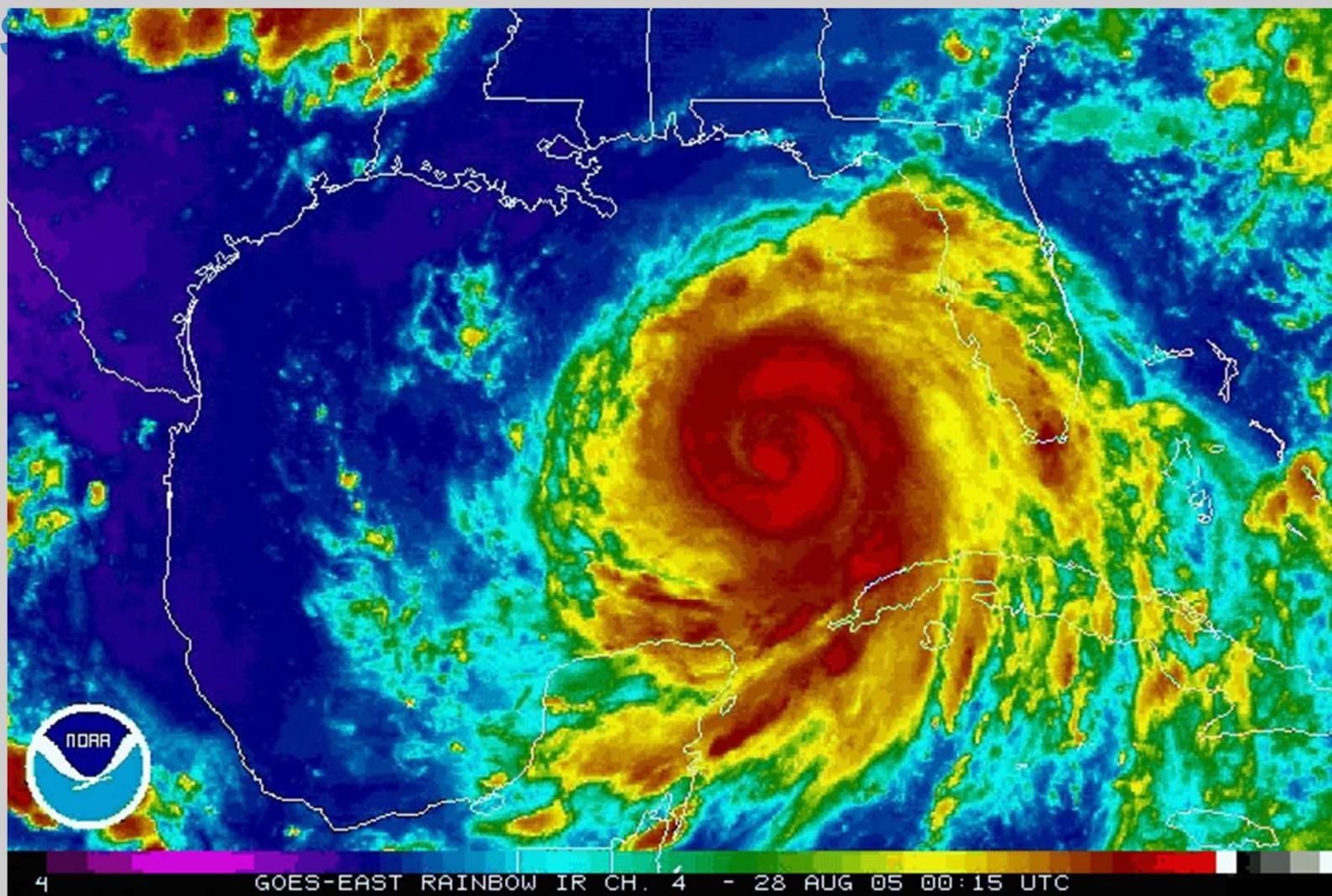
Wien

sun: 480 nm, earth: 10 μm

Stefan-Boltzmann



Lecture 4: Intro remote sensing

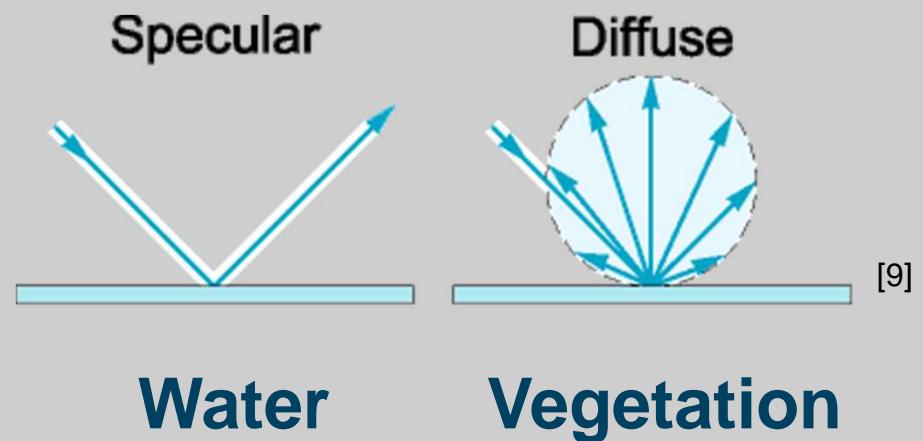
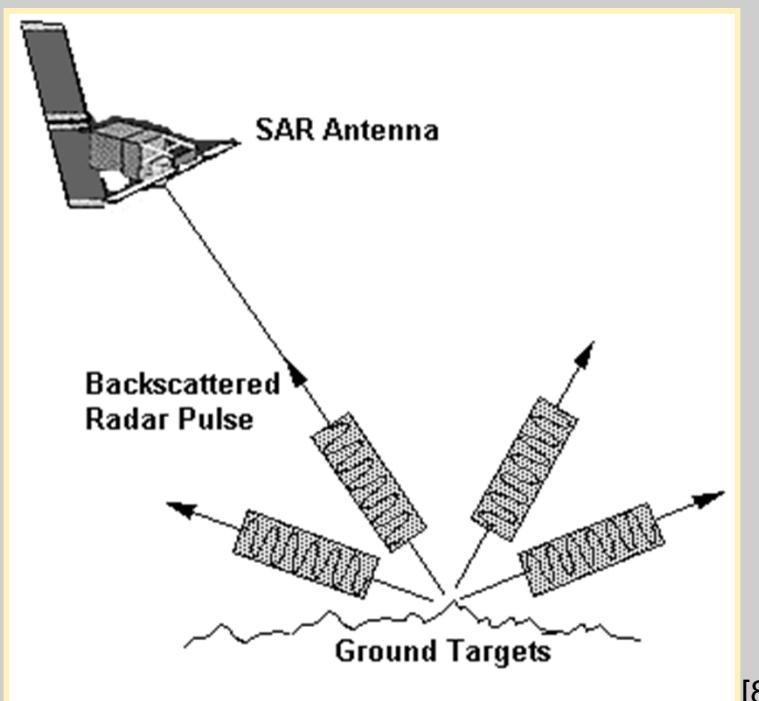




Lecture 4: Intro remote sensing

Satellite principles

➤ Radar





Lecture 4: Intro remote sensing

Satellite principles

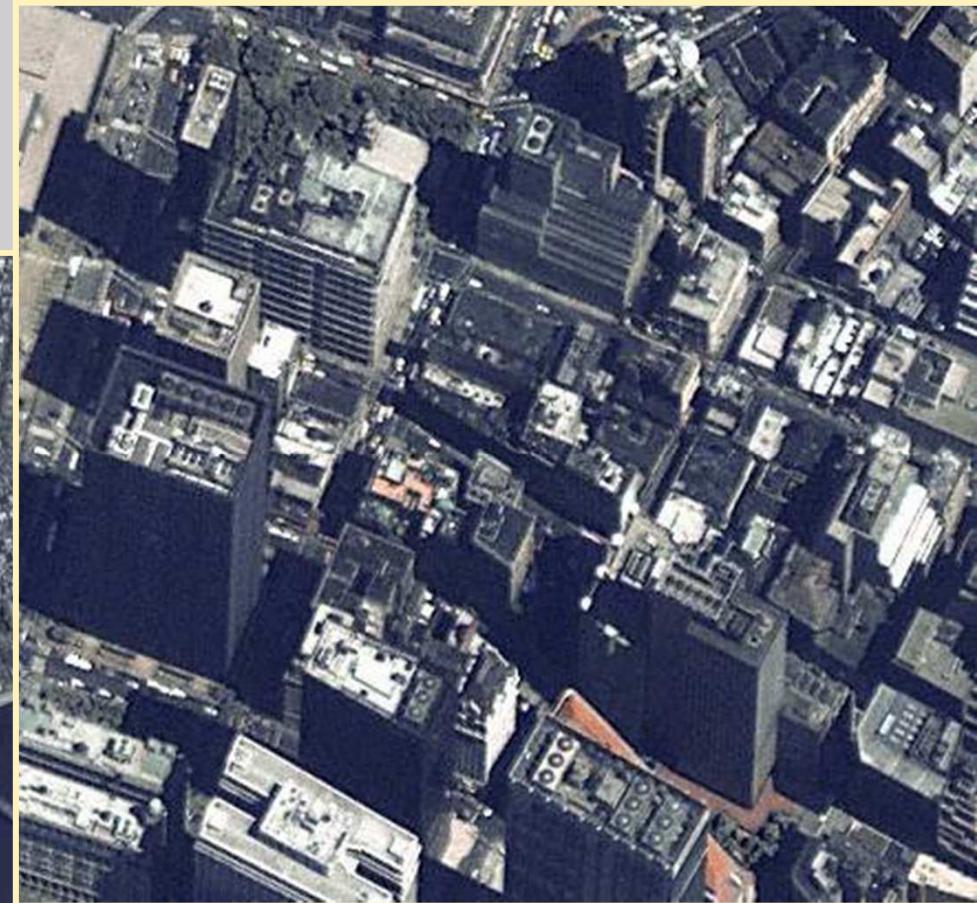
- Radar & microwave
 - EM waves “see” $> \lambda/4$
 - Passive: like TIR (but no clouds)
 - Active: Radio Detection And Ranging
 - L-band 22 cm (soil moisture)
 - C-band 7 cm (vegetation)
 - X-band 2.5 cm (rain)



Lecture 4: Intro remote sensing

Remote sensing

➤ IKONOS / QuickBird



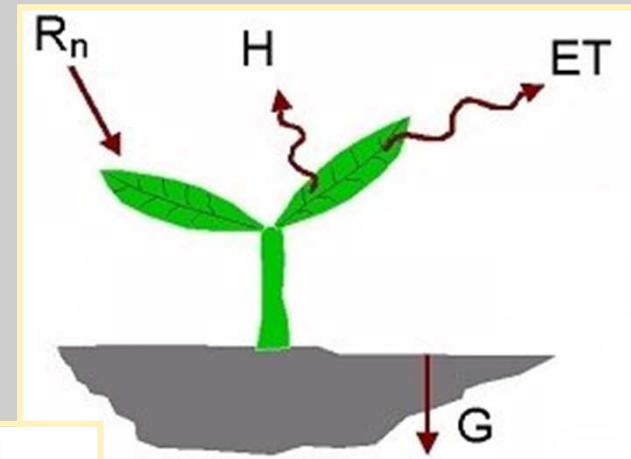
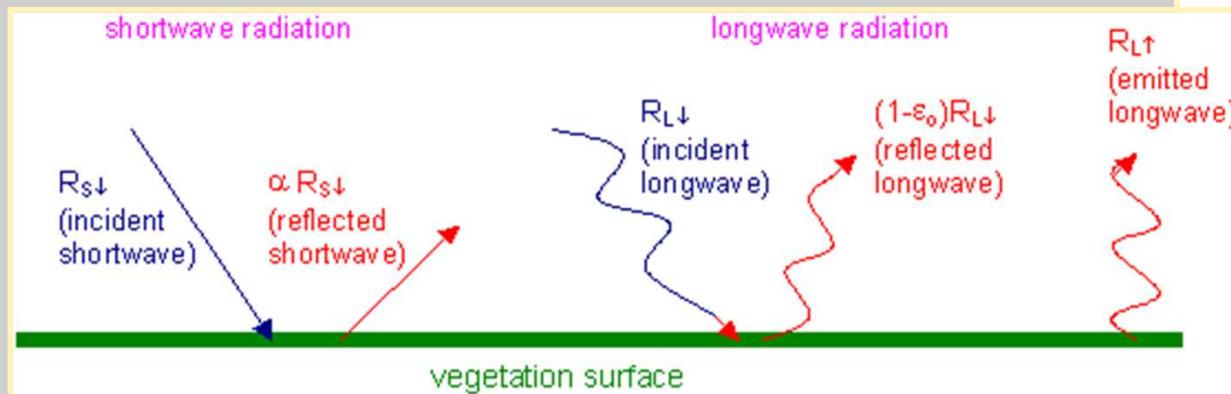
[10]



Lecture 4: Intro remote sensing

Remote sensing

➤ Evaporation: SEBAL



[11]

Surface Energy Balance:

$$(1 - \alpha) \cdot R_{S\downarrow} + \varepsilon_0 \cdot R_{L\downarrow} - \varepsilon_0 \sigma T^4 = H + ET + G$$

Dry & wet



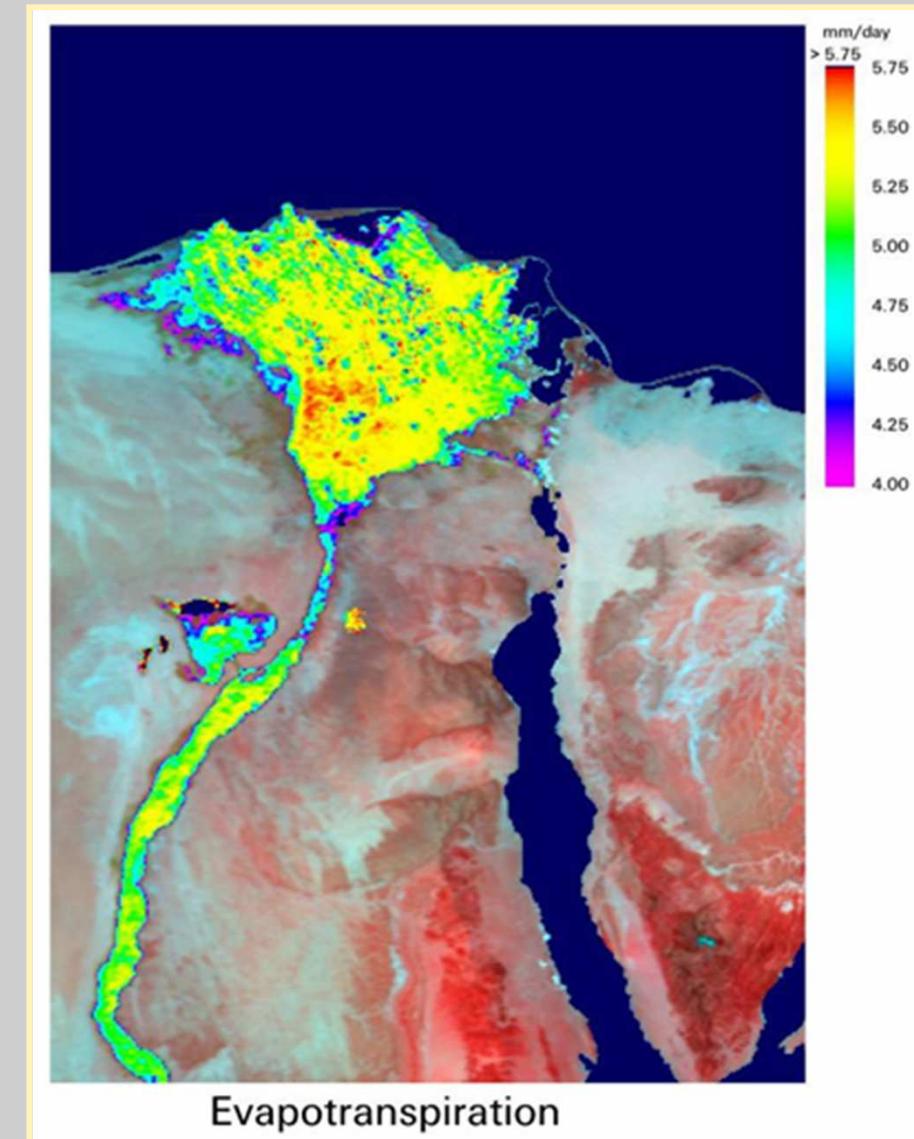
Lecture 4: Intro remote sensing

Remote sensing

➤ Evaporation: SEBAL

Next week:

Wim
Bastiaanssen

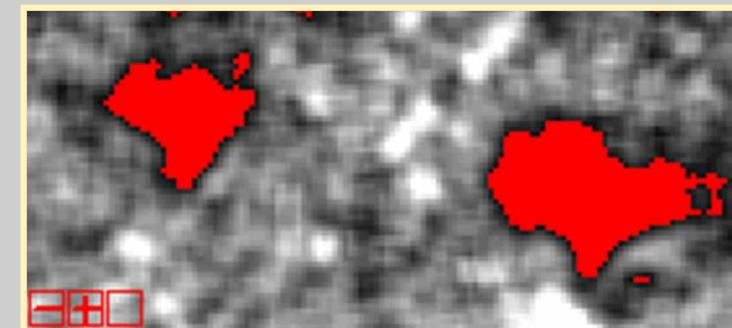
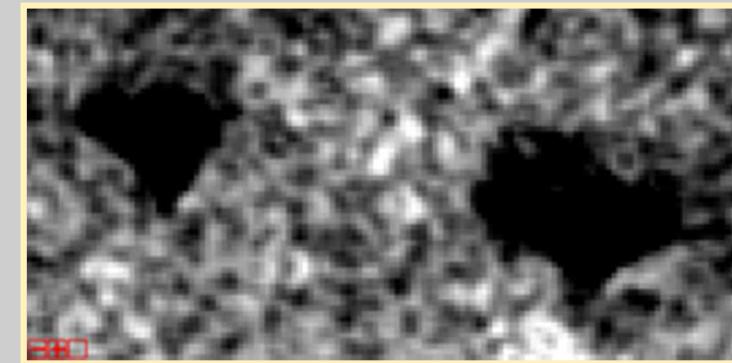
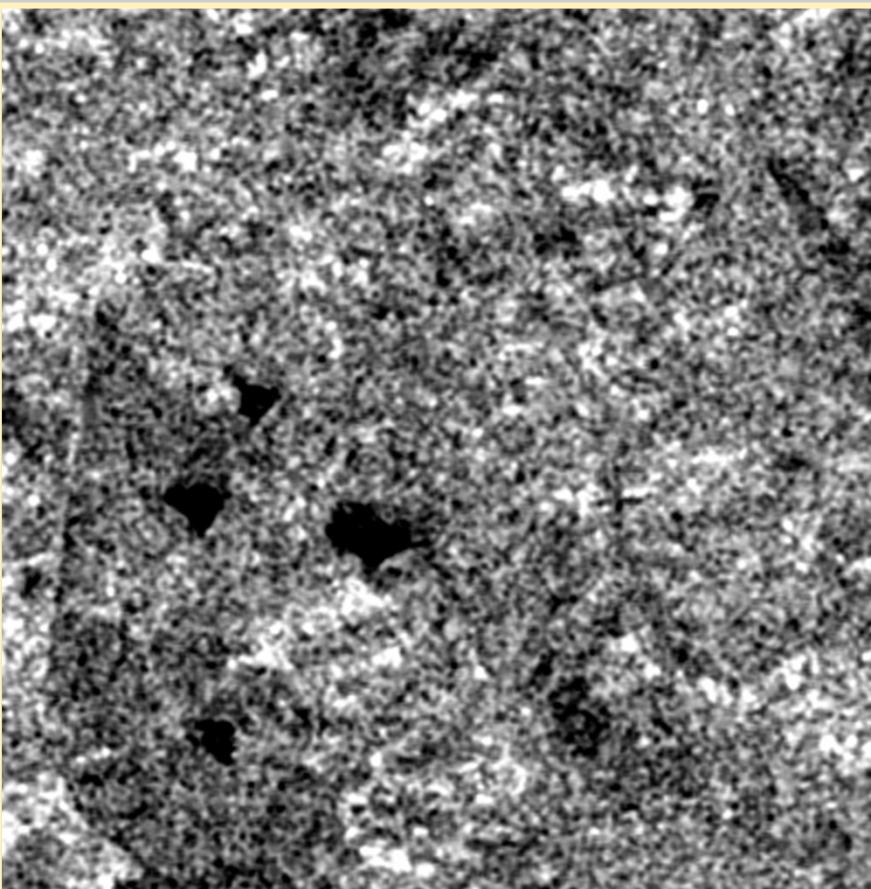




Lecture 4: Intro remote sensing

Remote sensing

- Radar: Storage & flooding



[12]



Lecture 4: Intro remote sensing

Remote sensing

- Radar: Scatterometer => Soil moisture
 - ERS
 - Envisat
 - METOP



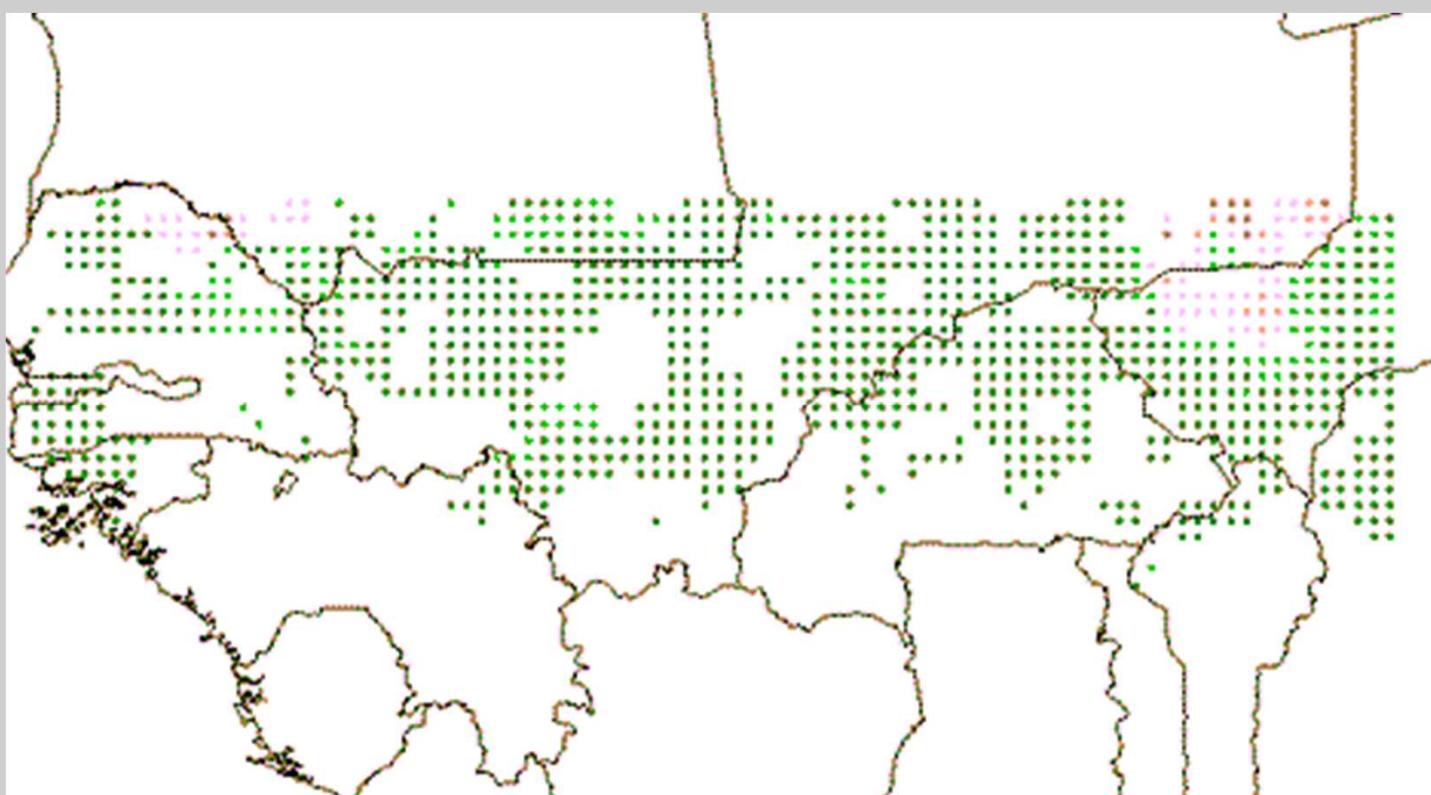
[13]



Lecture 4: Intro remote sensing

Remote sensing

- Radar: Scatterometer => Soil moisture
 - ERS
 - Envisat
 - METOP



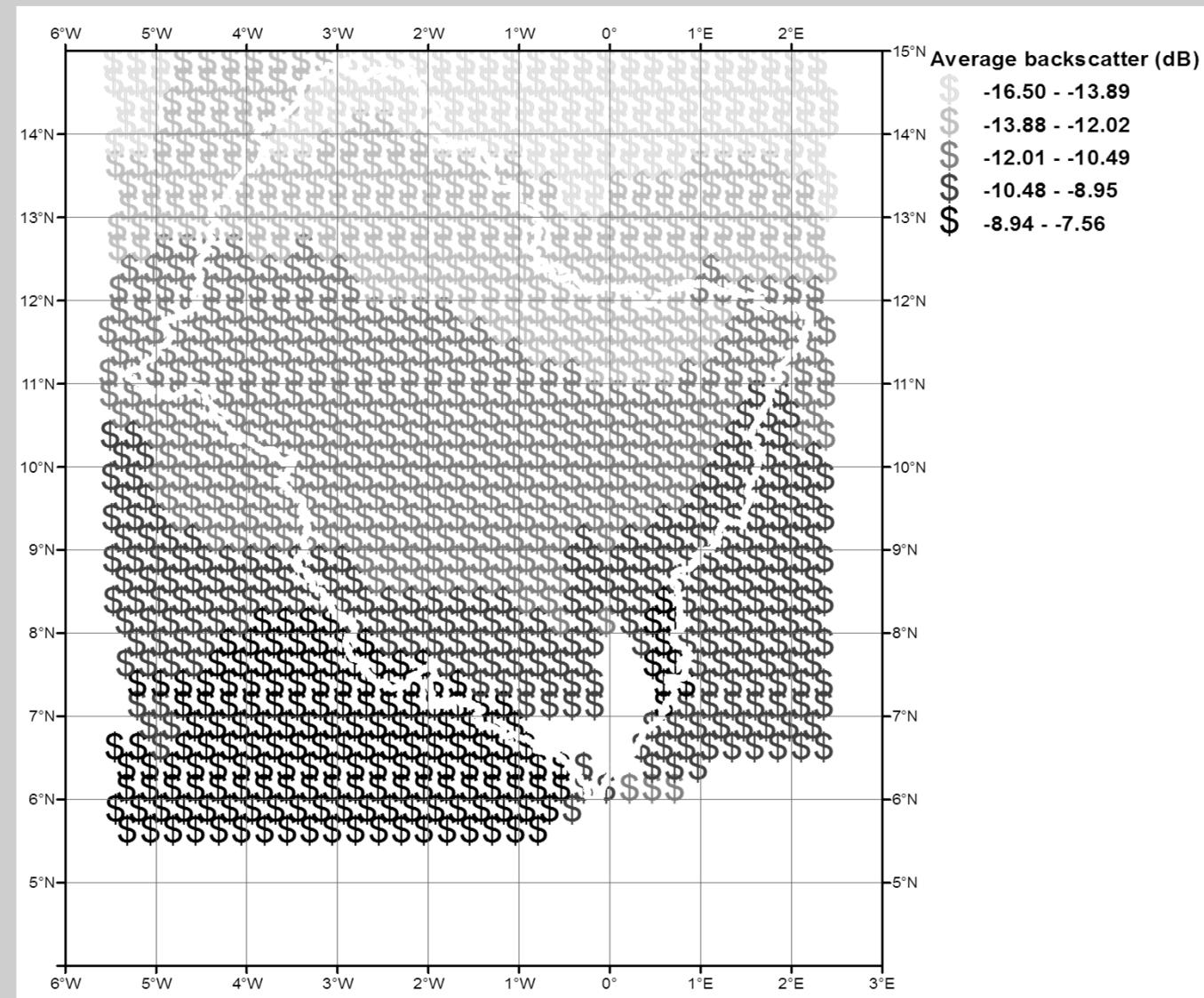


Lecture 4: Intro remote sensing

Remote sensing

➤ Radar: Scatterometer => Soil moisture

➤ ERS



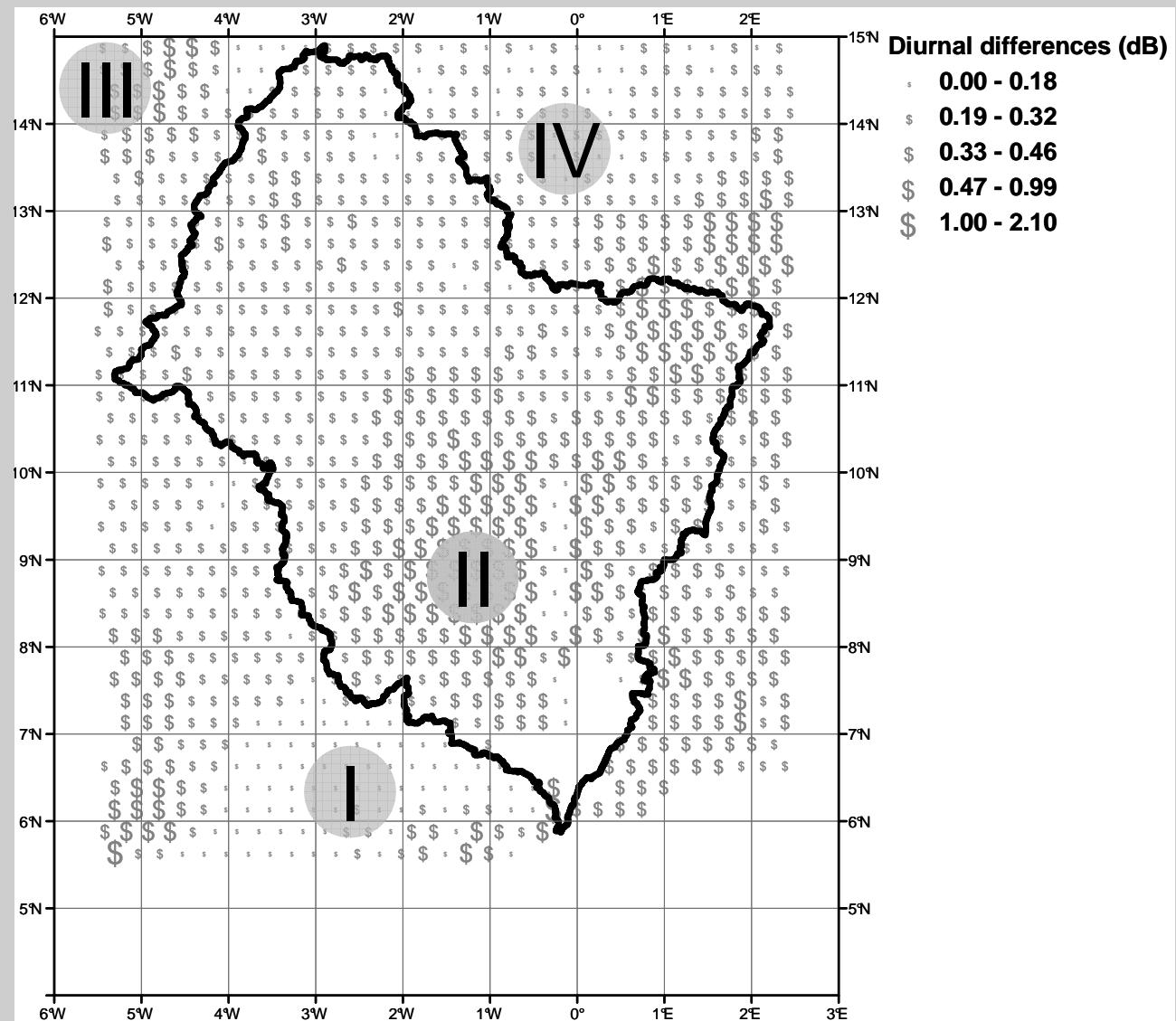


Lecture 4: Intro remote sensing

Remote sensing

➤ Radar: Scatterometer => Soil moisture

➤ ERS





Lecture 4: Intro remote sensing

Remote sensing

- Radar: Scatterometer => Soil moisture
- ERS

$$\sigma_0 = f(\text{geometry, dielectric properties})$$

- geometry \neq diurnal
- dielectric properties change
- water & trees



Lecture 4: Intro remote sensing

Remote sensing

- Radar: Scatterometer => Soil moisture
- ERS

TREE WEIGHING!





Lecture 4: Intro remote sensing

Remote sensing

- SMOS
- Passive L-Band
- Low resolution (40 km)
- Accuracy?

SMOS



<http://eopi.esa.int/esa/esa?e=XDqDwZWQdQmevffkIxJO2joY6jTAXK6xrEBcwkAvOBPjkKBePQifttoAPLY7Zn67UoTR1eKCPiNEoJcwF99TrmaixHyGlzTCTgmPIPCIRaMJqxZ9RMYqPGTPmHyKycmb22IL0zAVMxsjyyCkmOME1jZC6YU4wmKXchu86F9ECVMAZF73Z4veIJMXkvWiug6OCEqjxBPJGVI26gy43TYQmu5K9K5DbGskeoQreQ9y886HsztZmgvTXsvvvLtM9ZodaN2GzRaD0>



Lecture 4: Intro remote sensing

Remote sensing

- Future: SMOS & METOP!
- Combined use:
Vegetation & soil

(MSc thesis???)



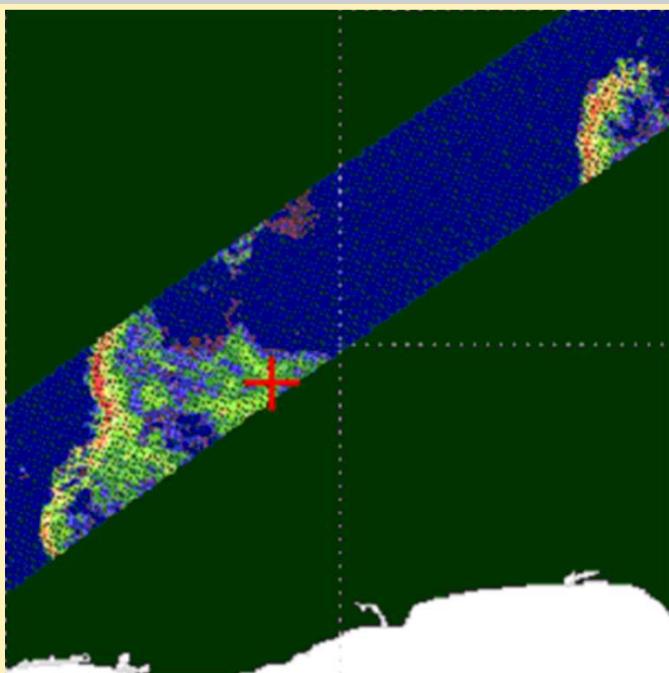
SMOS



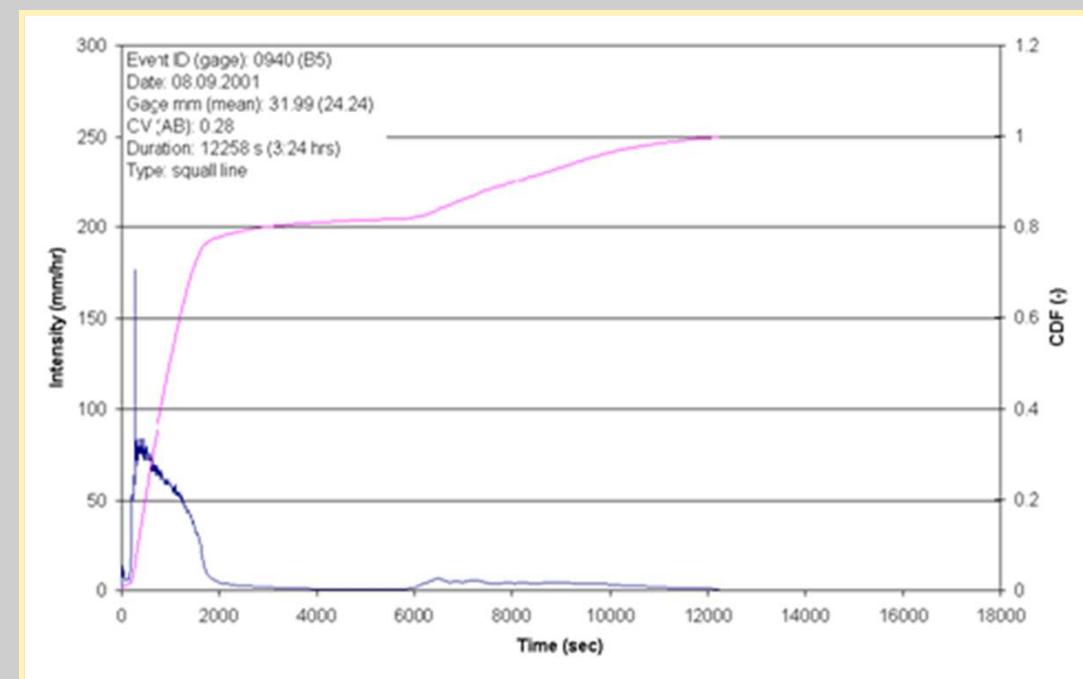
Lecture 4: Intro remote sensing

Remote sensing

- Radar: Rainfall



TRMM



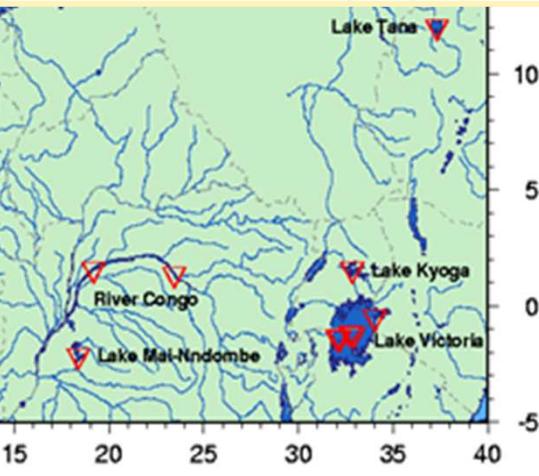
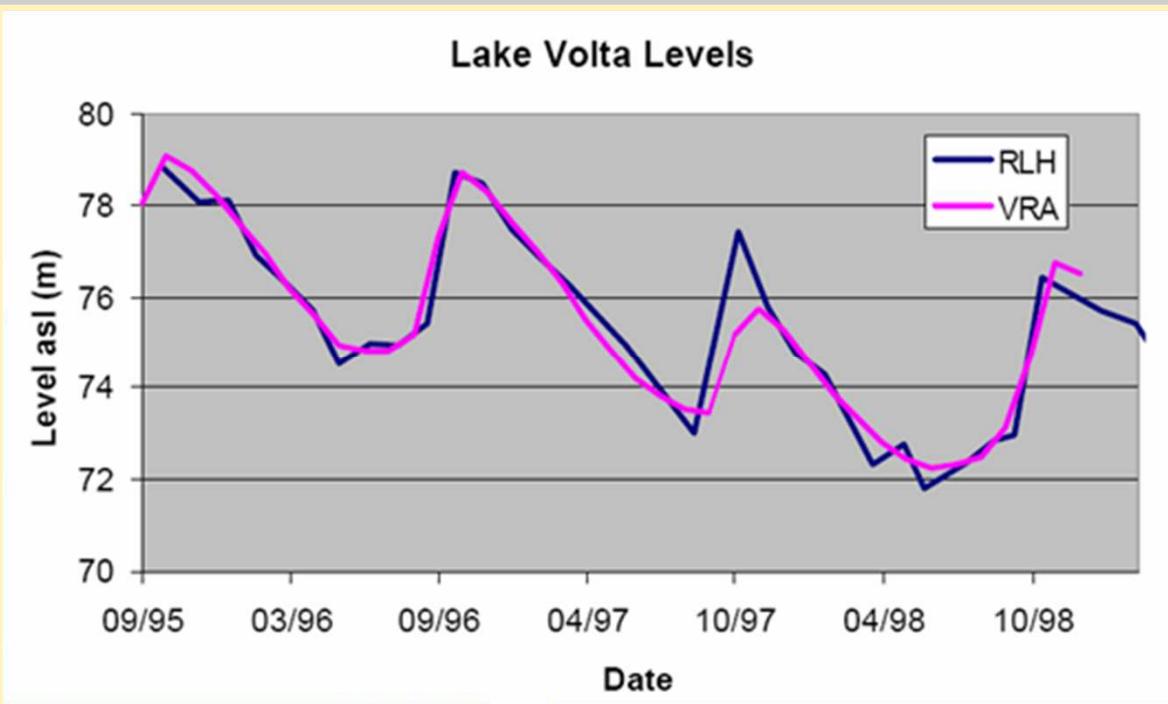
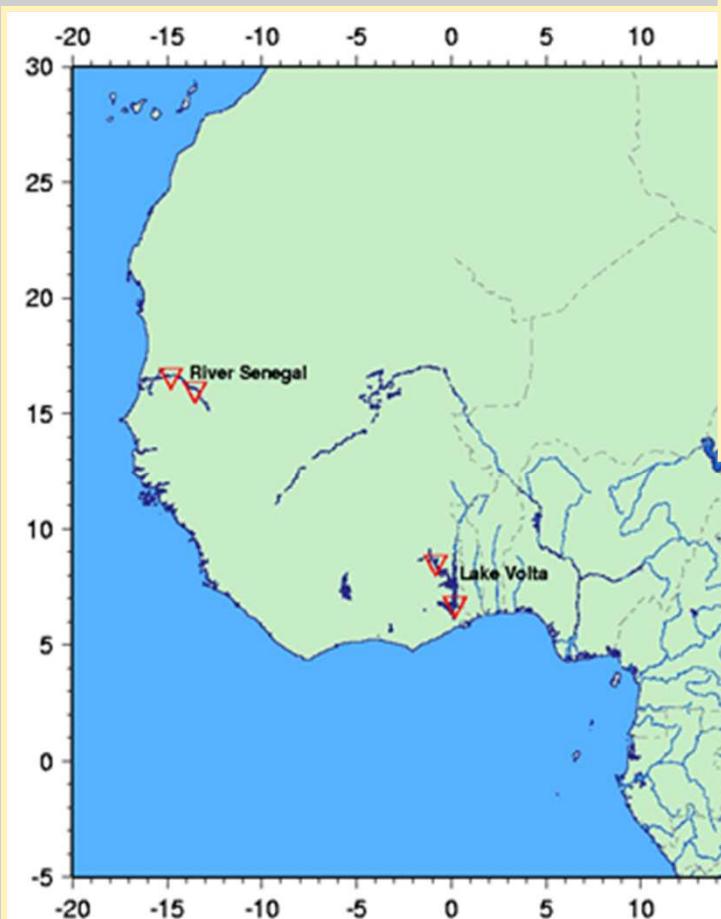
Ground



Lecture 4: Intro remote sensing

Remote sensing

- Radar: Altimetry
- Lidar: Altimetry ICE



earth.esa.int/riverandlake



Lecture 4: Intro remote sensing

Remote sensing

➤ Radar: Interferometry

Ramon Hanssen





Lecture 4: Intro remote sensing

Remote sensing

- Radar: Storage & flooding

New research:

ALOS: L-band radar



Biesbos

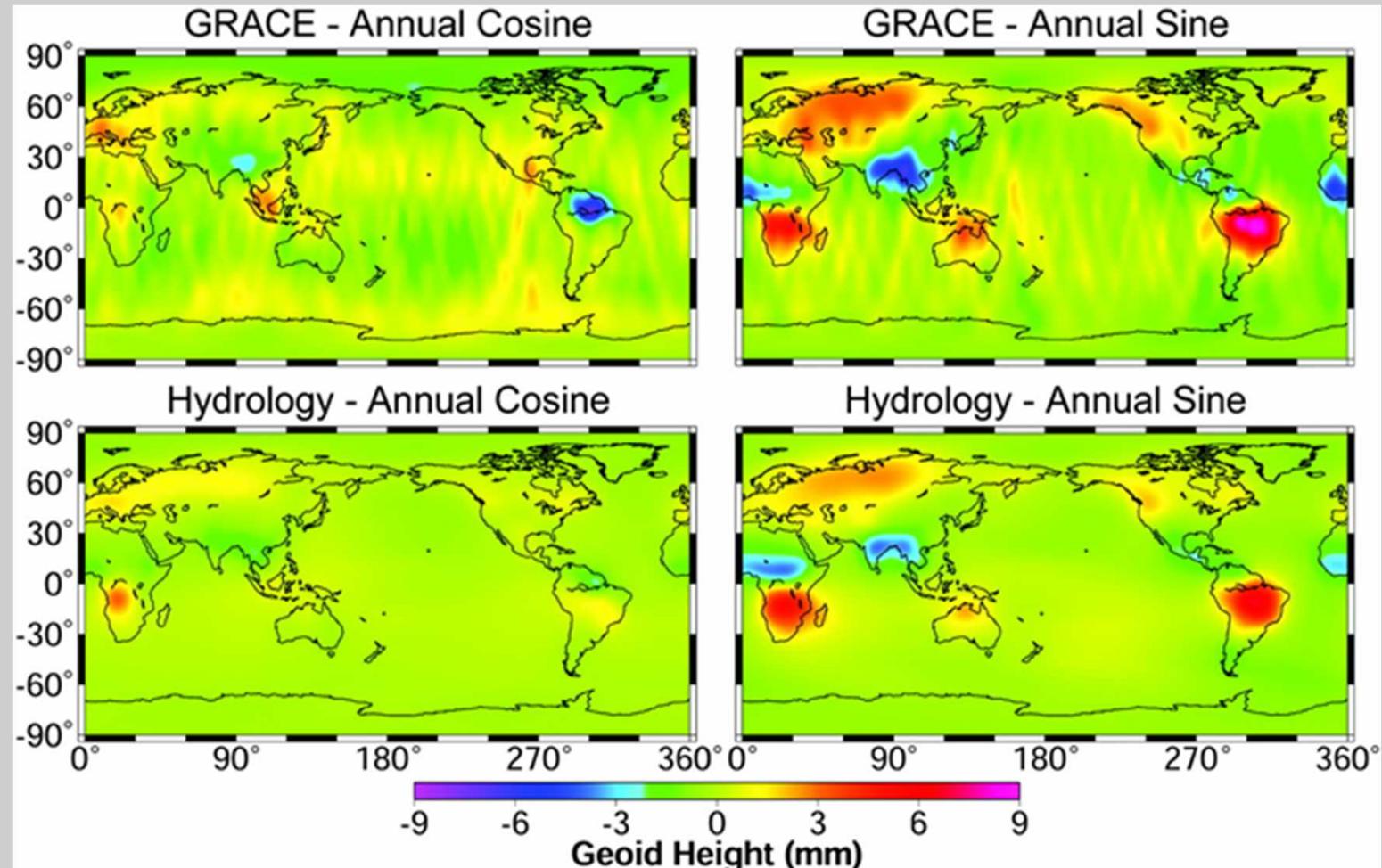
Casamance



Lecture 4: Intro remote sensing

Remote sensing

➤ Gravity: GRACE

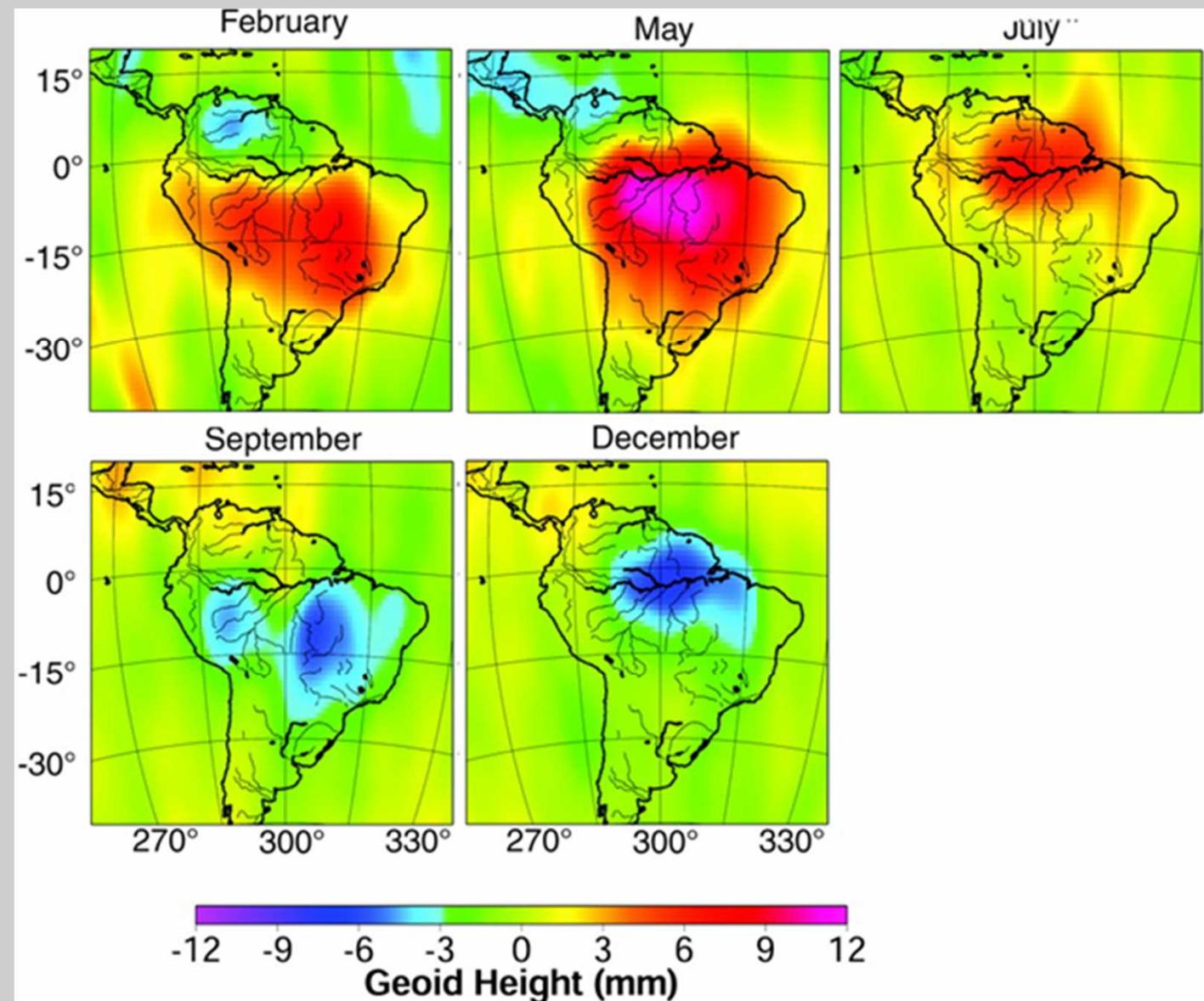




Lecture 4: Intro remote sensing

Remote sensing

➤ Gravity:
GRACE





Lecture 4: Intro remote sensing

Overview satellites

Variable	Satellite	Principle	Resol.	Qual.
Rain	MeteoSat, NOAA, ...	Cloud Tem	2km+	Med
	TRMM	Rain radar	4km	Good
Evaporation	Landsat, ASTER, MODIS, ...	SEBAL, ..	30m-1km	Med
Soil moisture	ERS, ENVISAT	C-Band	1 km+	Poor
	Landsat, ASTER, MODIS, ...	Thermal inertia	30m-1km	Poor
	TRMM	Passive multi	45km	Good
	SMOS	Passive L-band	50 km	???
	METOP	Scatterometer C	25 km	Good
Storage	Optical, radar	Reflection H ₂ O	30m	High
Level	TOPEX-POSEIDON, ENVISAT	Radar altimetry	NA	High
Groundwater	GRACE	Gravity	400km	High



Lecture 4: Intro remote sensing

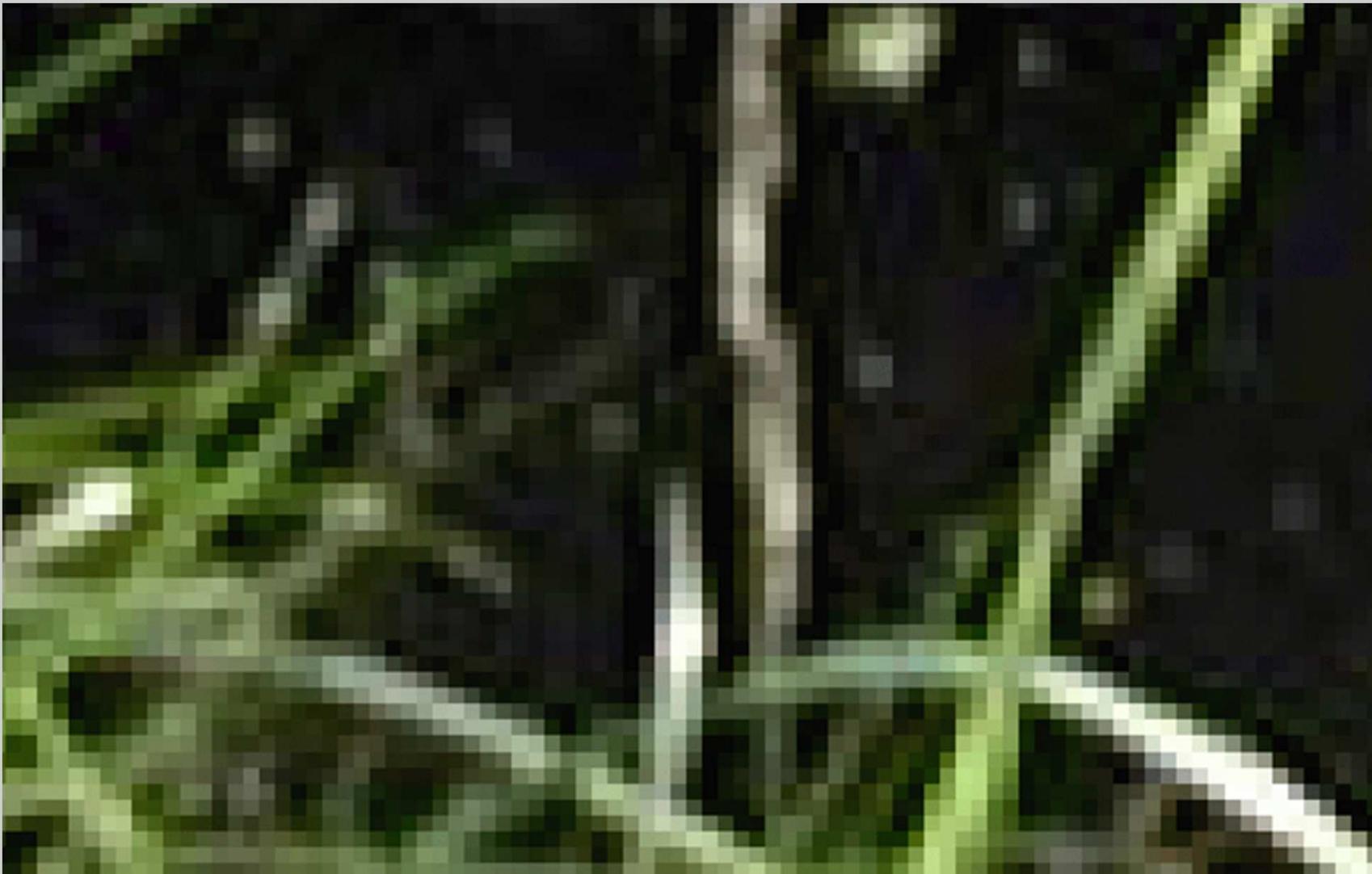
Image analysis





Lecture 4: Intro remote sensing

Image analysis





Lecture 4: Intro remote sensing

Image analysis

Image => Matrix

Row => Horizontal line

Column => Vertical line

Entry => Picture element (pixel)



Lecture 4: Intro remote sensing

Image analysis

➤ Pre-processing:

- Georeferencing
- Atmospheric correction
- Image enhancement

➤ Processing

- NDVI
- Surface temperature
- Classification



Lecture 4: Intro remote sensing

Image analysis

Color

Pixel => Number (DN), greyscale

Vietnam TM Band 3



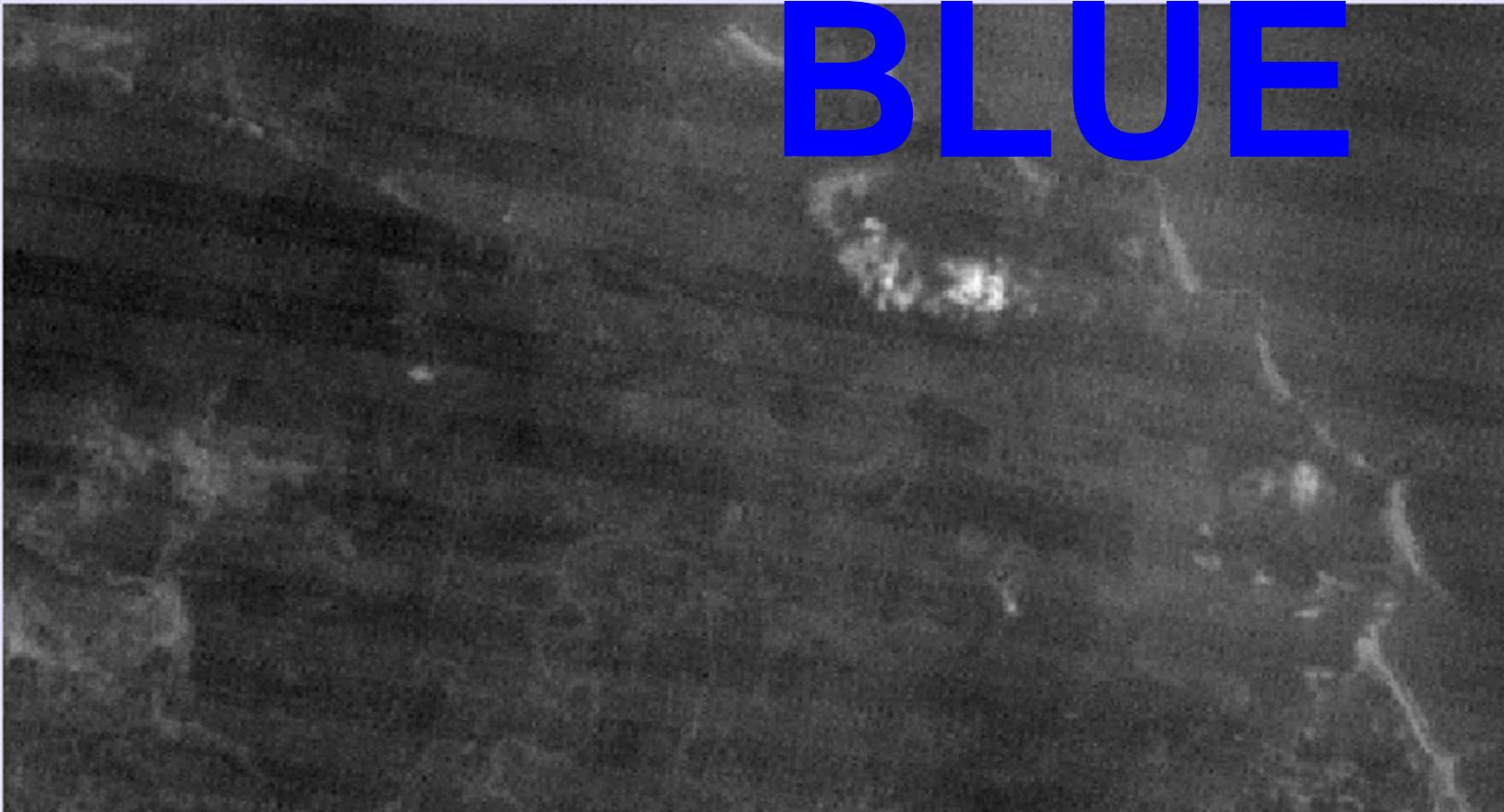


Lecture 4: Intro remote sensing

Image analysis

Vietnam TM Band 1

BLUE



[20]



Lecture 4: Intro remote sensing

Image analysis

Vietnam TM Band 1

Vietnam TM Band 2

GREEN



Lecture 4: Intro remote sensing

Image analysis

Vietnam TM Band 1

Vietnam TM Band 2

Vietnam TM Band 3

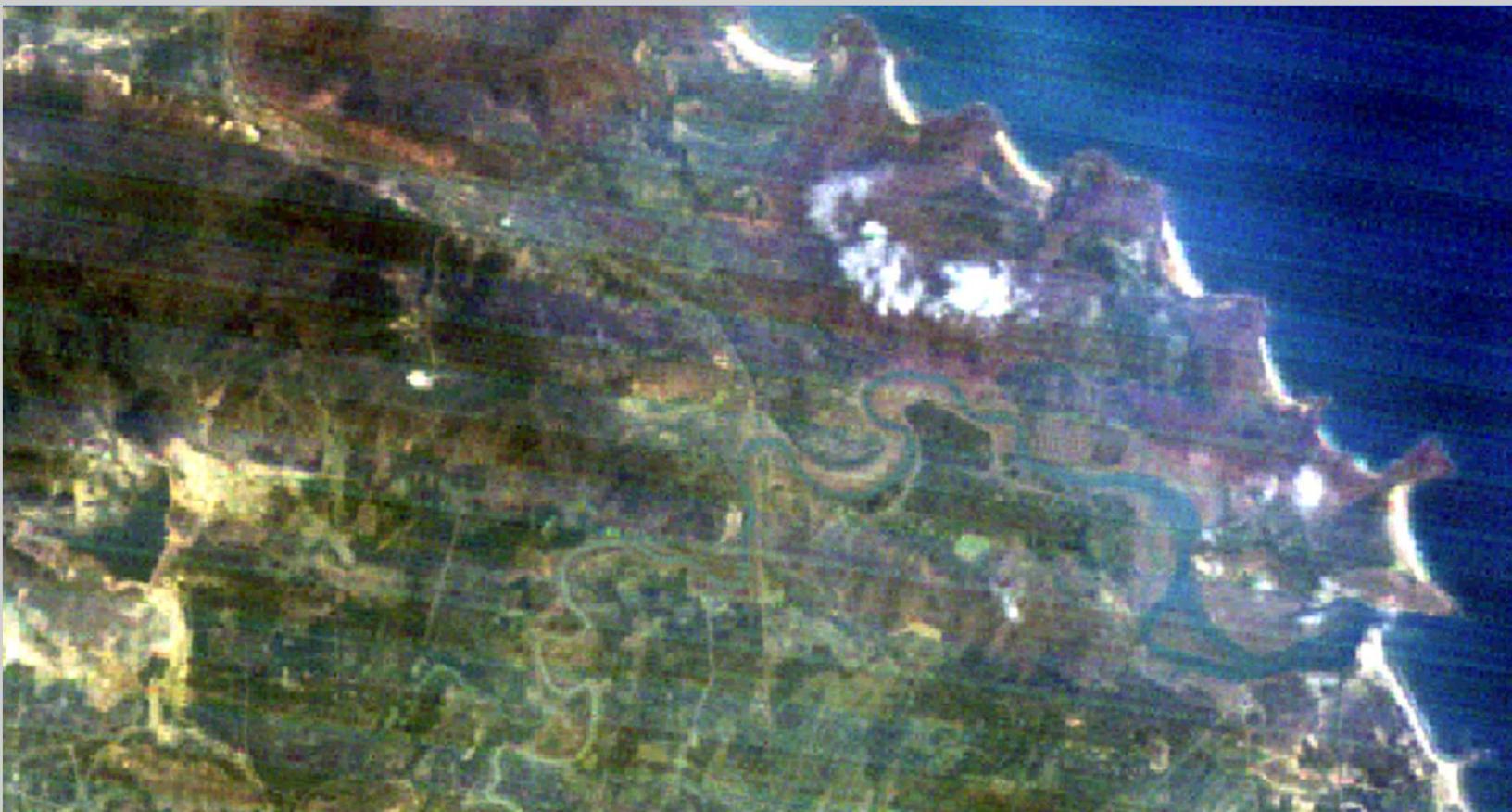
RED



Lecture 4: Intro remote sensing

Image analysis

Color



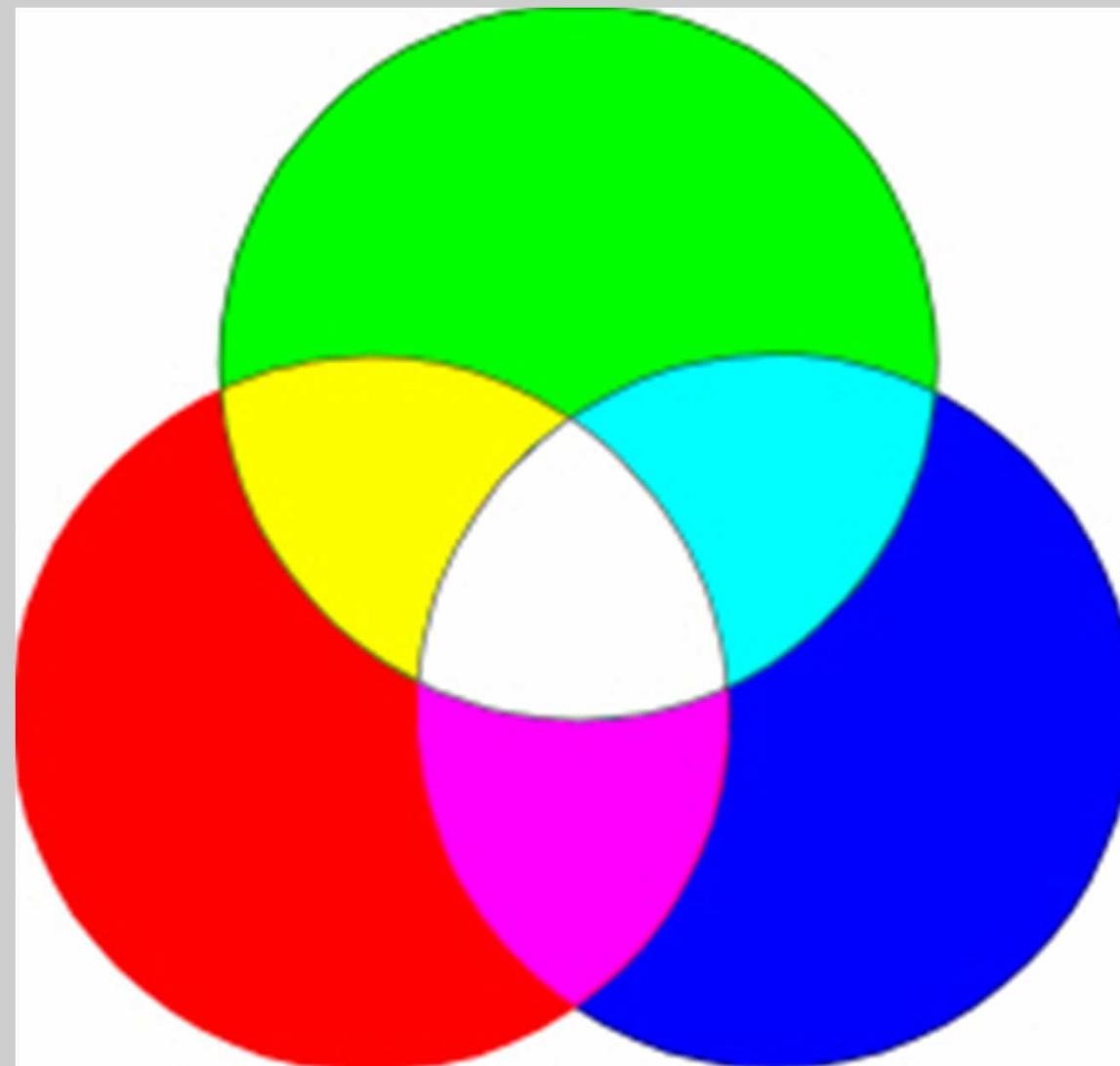
[22]



Lecture 4: Intro remote sensing

Image analysis

Color



[23]



Lecture 4: Intro remote sensing

Image analysis

Color

Green => Blue, Red => Green, NIR => Red





Lecture 4: Intro remote sensing

Image analysis

Landsat 7 (ETM+) bands (wavelengths in micrometers)

Band 1	0.45-0.52	Blue-Green
Band 2	0.53-0.61	Green (often mapped to Blue)
Band 3	0.63-0.69	Red (often mapped to Green)
Band 4	0.75-0.90	Near IR (often mapped to Red)
Band 5	1.55-1.75	Mid-IR
Band 6	10.4-12.5	Thermal IR
Band 7	2.09-2.35	Short Wave IR
Band 8	0.52-0.90	Panchromatic



Lecture 4: Intro remote sensing

Image analysis

Operators

Multiply, add, subtract, ...

If ..., then ... (Boolean)

Convolution / filters

Almost like matrix math (pixel by pixel)



Lecture 4: Intro remote sensing

Image analysis

Operators

Vietnam TM Band 3



Red

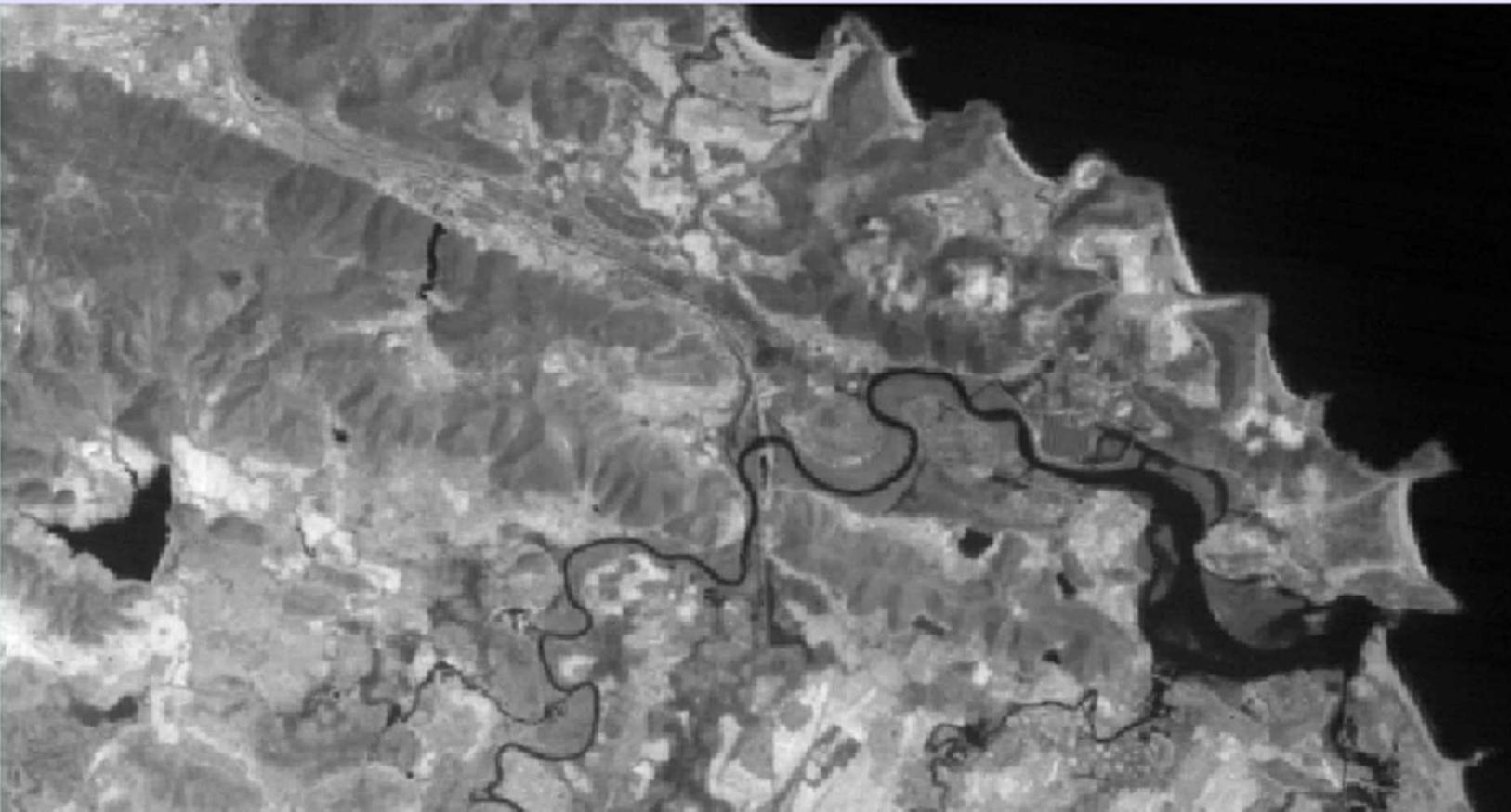


Lecture 4: Intro remote sensing

Image analysis

Operators

Vietnam TM Band 4



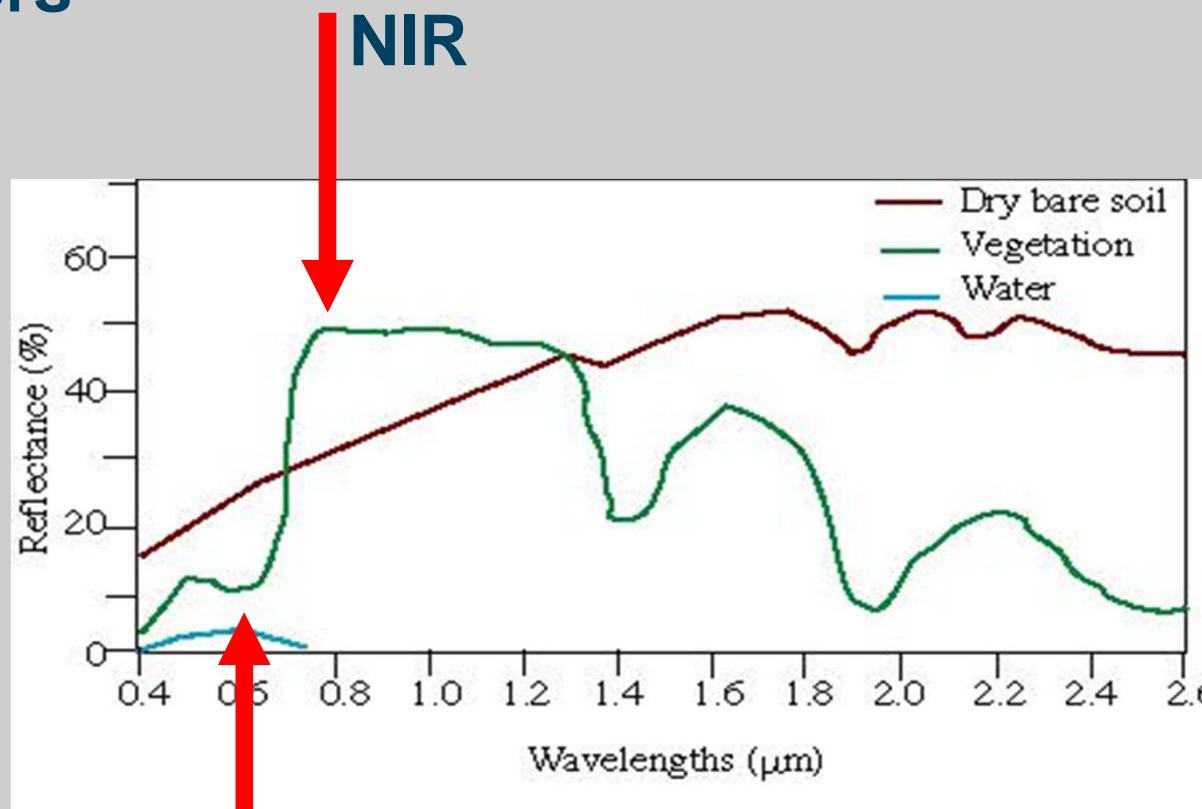
Near Infrared (NIR)



Lecture 4: Intro remote sensing

Image analysis

Operators



[3]

Red

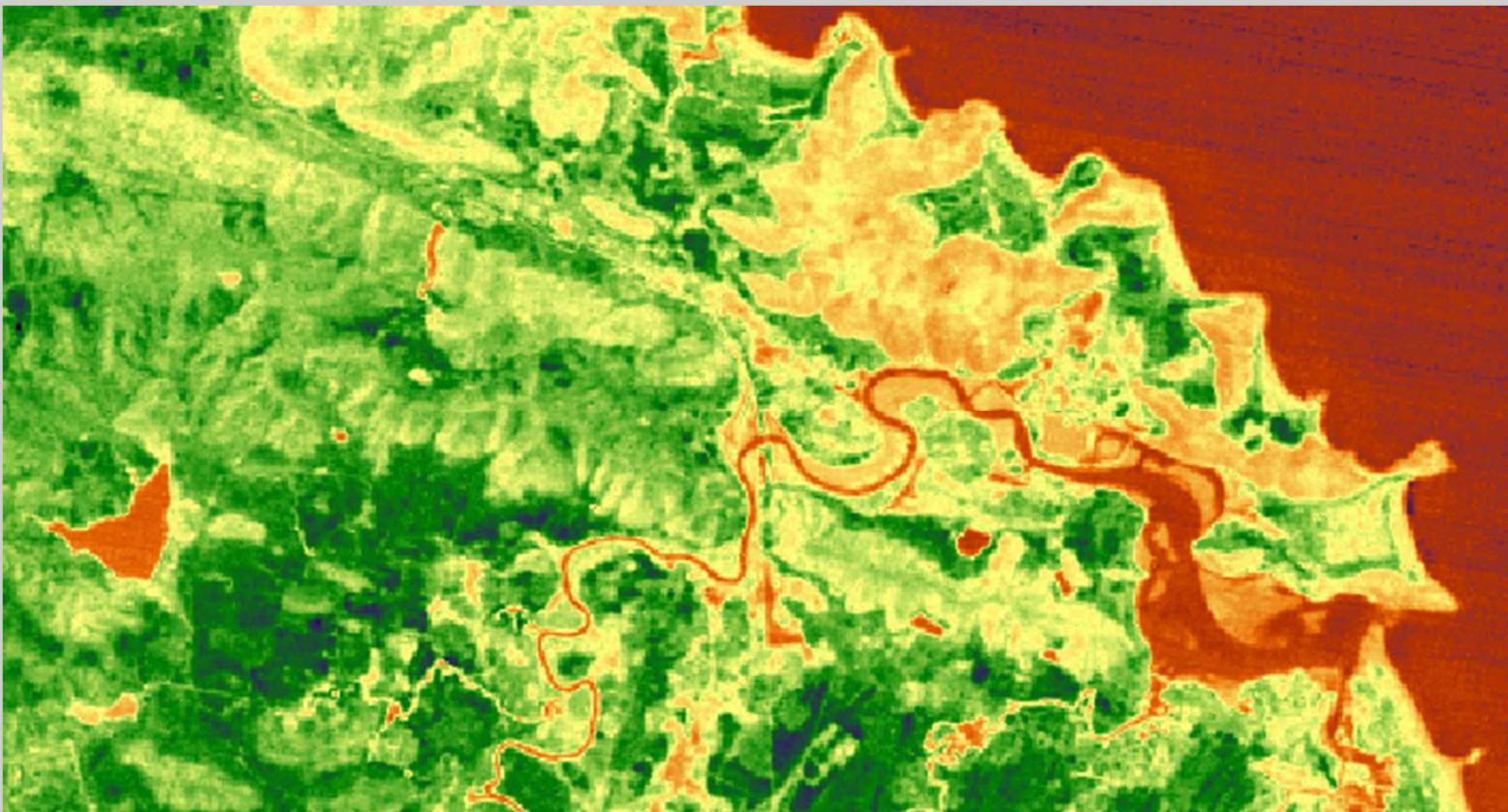
$$\text{NDVI} = (\text{NIR} - \text{Red}) / (\text{NIR} + \text{Red})$$



Lecture 4: Intro remote sensing

Image analysis

Operators



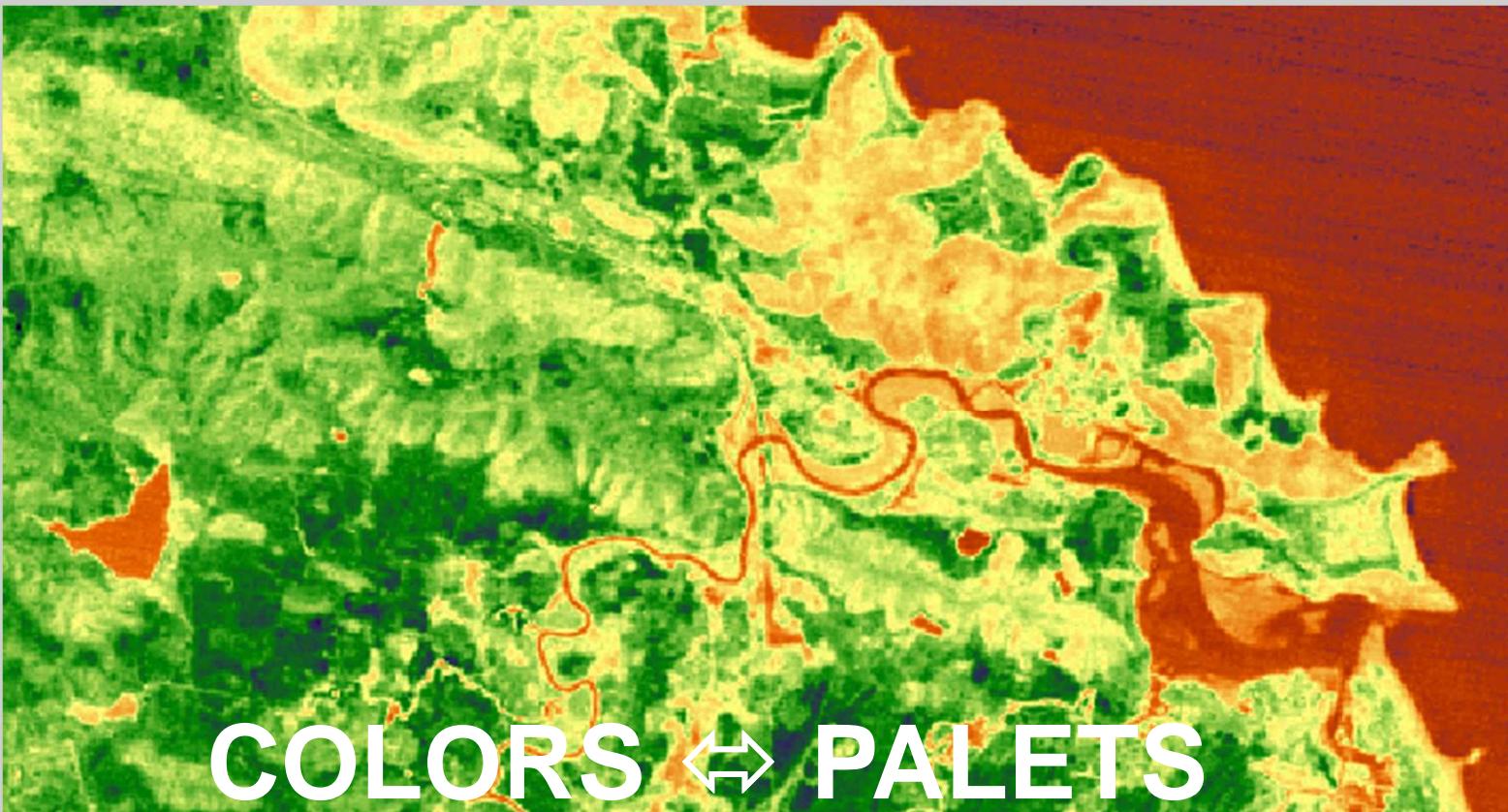
$$\text{NDVI} = (\text{NIR}-\text{Red}) / (\text{NIR}+\text{Red})$$



Lecture 4: Intro remote sensing

Image analysis

Operators



$$\text{NDVI} = (\text{NIR}-\text{Red}) / (\text{NIR}+\text{Red})$$

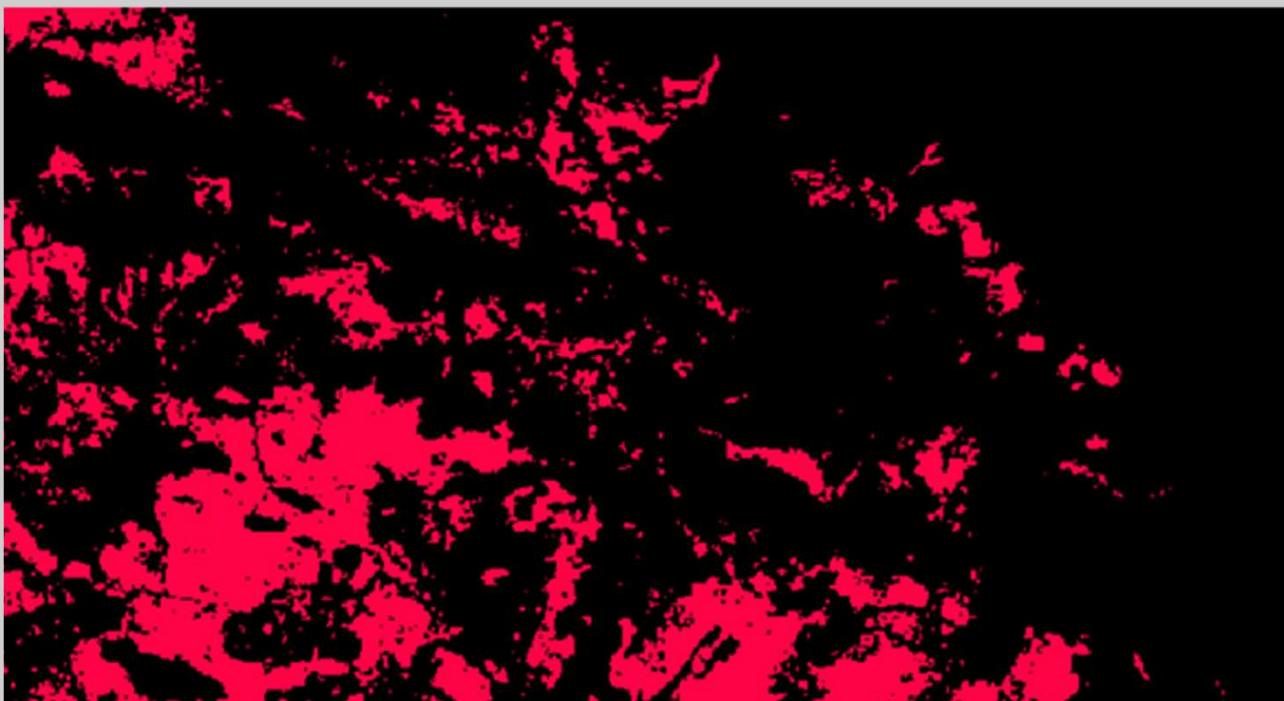


Lecture 4: Intro remote sensing

Image analysis

Operators

Density slicing => classification



$NDVI > 0.15 \Rightarrow$ Forest (red)

$NDVI < 0.15 \Rightarrow$ Other (black)

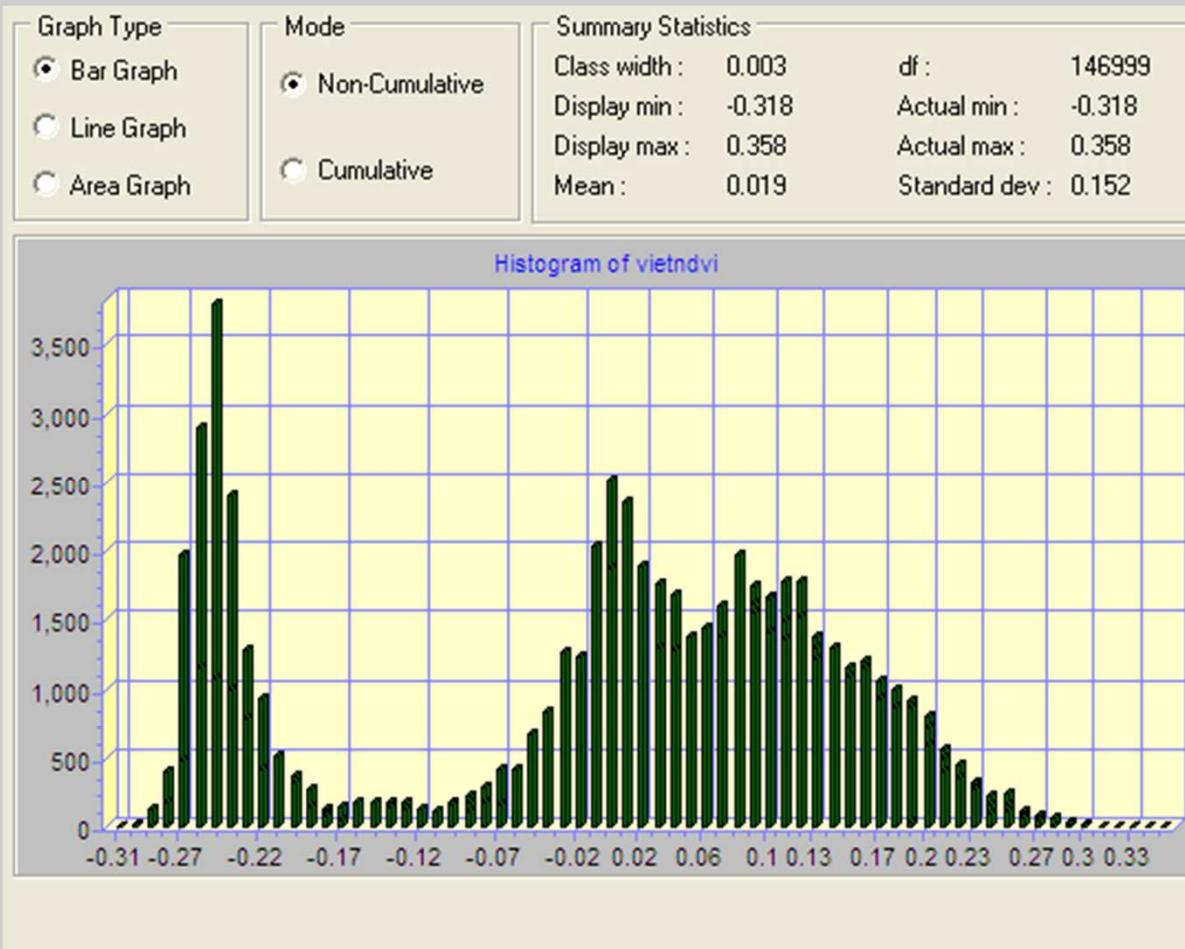


Lecture 4: Intro remote sensing

Image analysis

Classification

Histogram



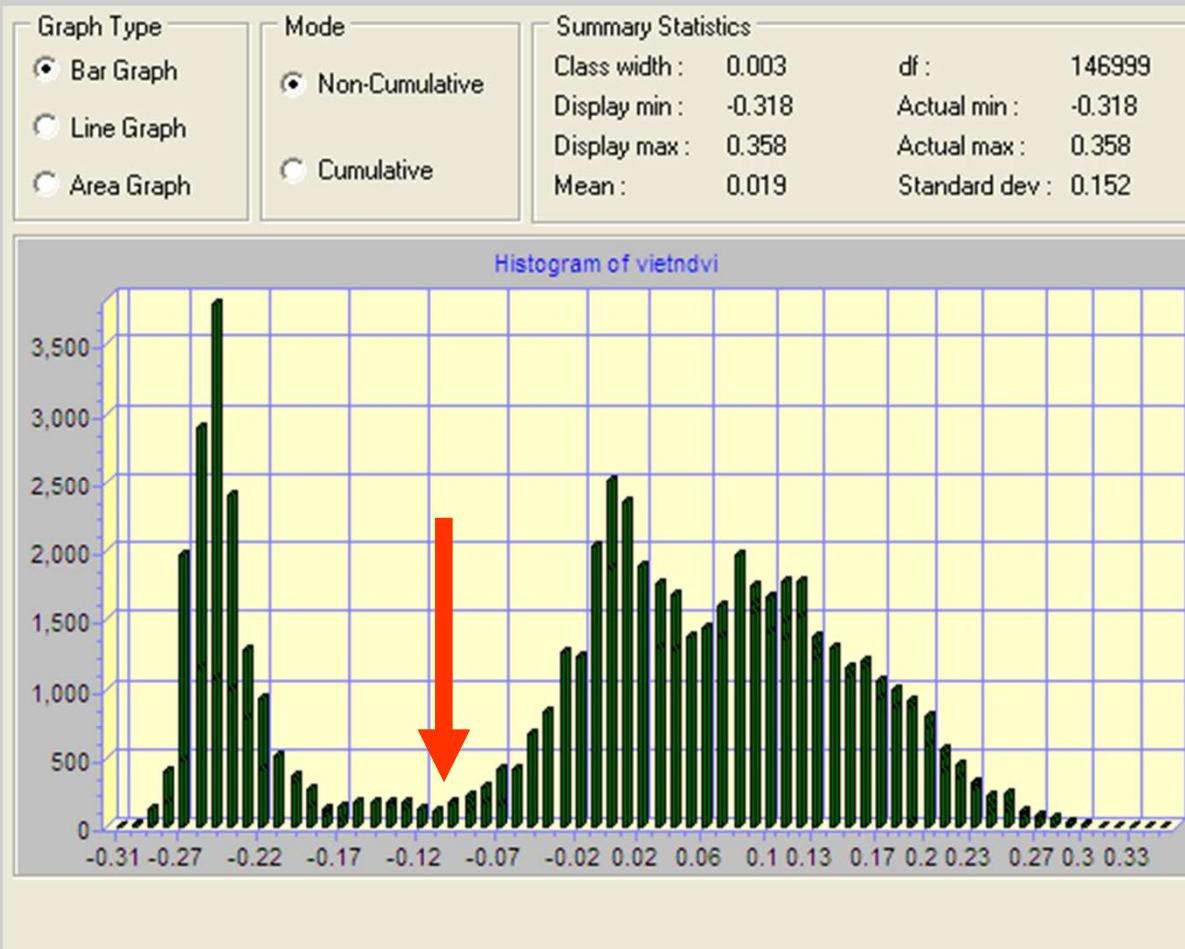


Lecture 4: Intro remote sensing

Image analysis

Classification

Histogram



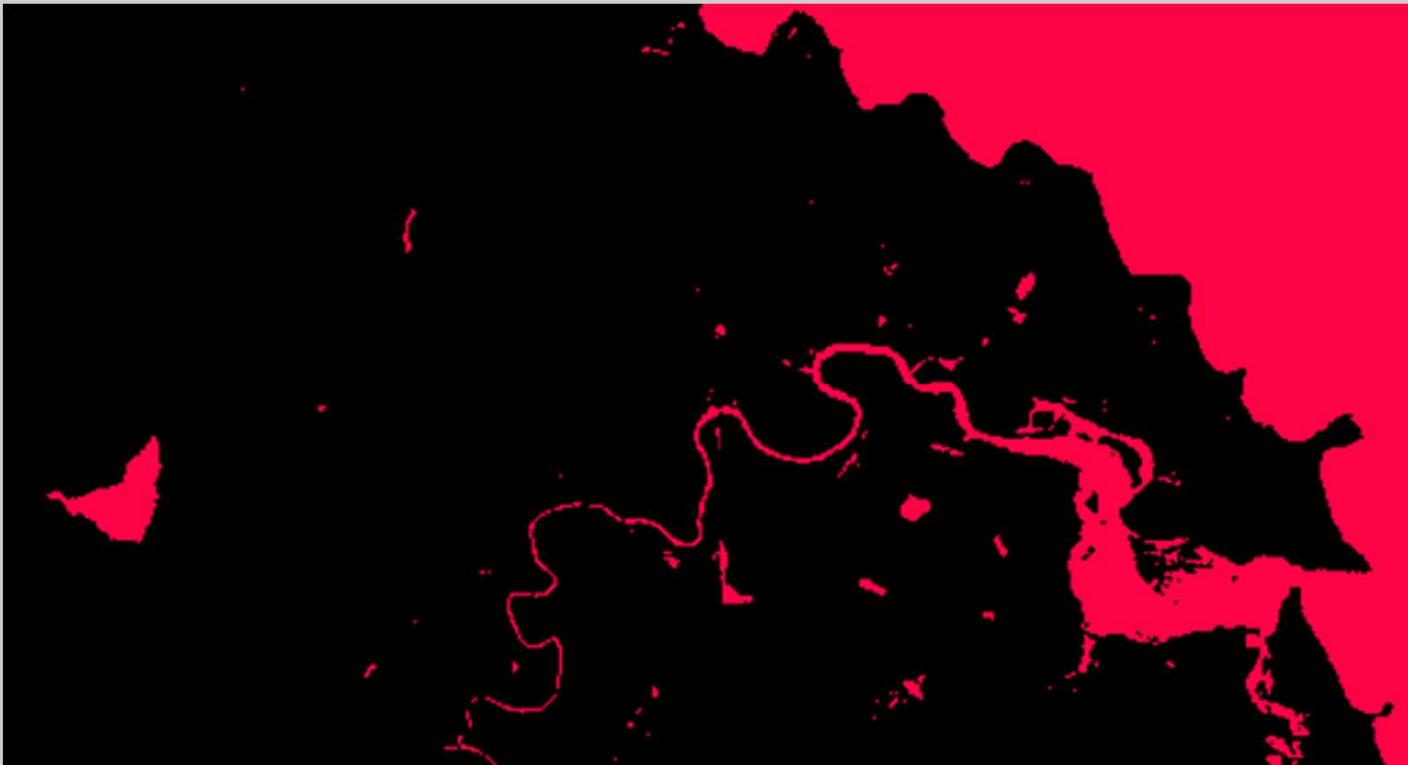


Lecture 4: Intro remote sensing

Image analysis

Classification

Histogram



$\text{NDVI} < -0.15 \Rightarrow \text{Water (red)}$

$\text{NDVI} > -0.15 \Rightarrow \text{Other (black)}$



Lecture 4: Intro remote sensing

Image analysis

Classification

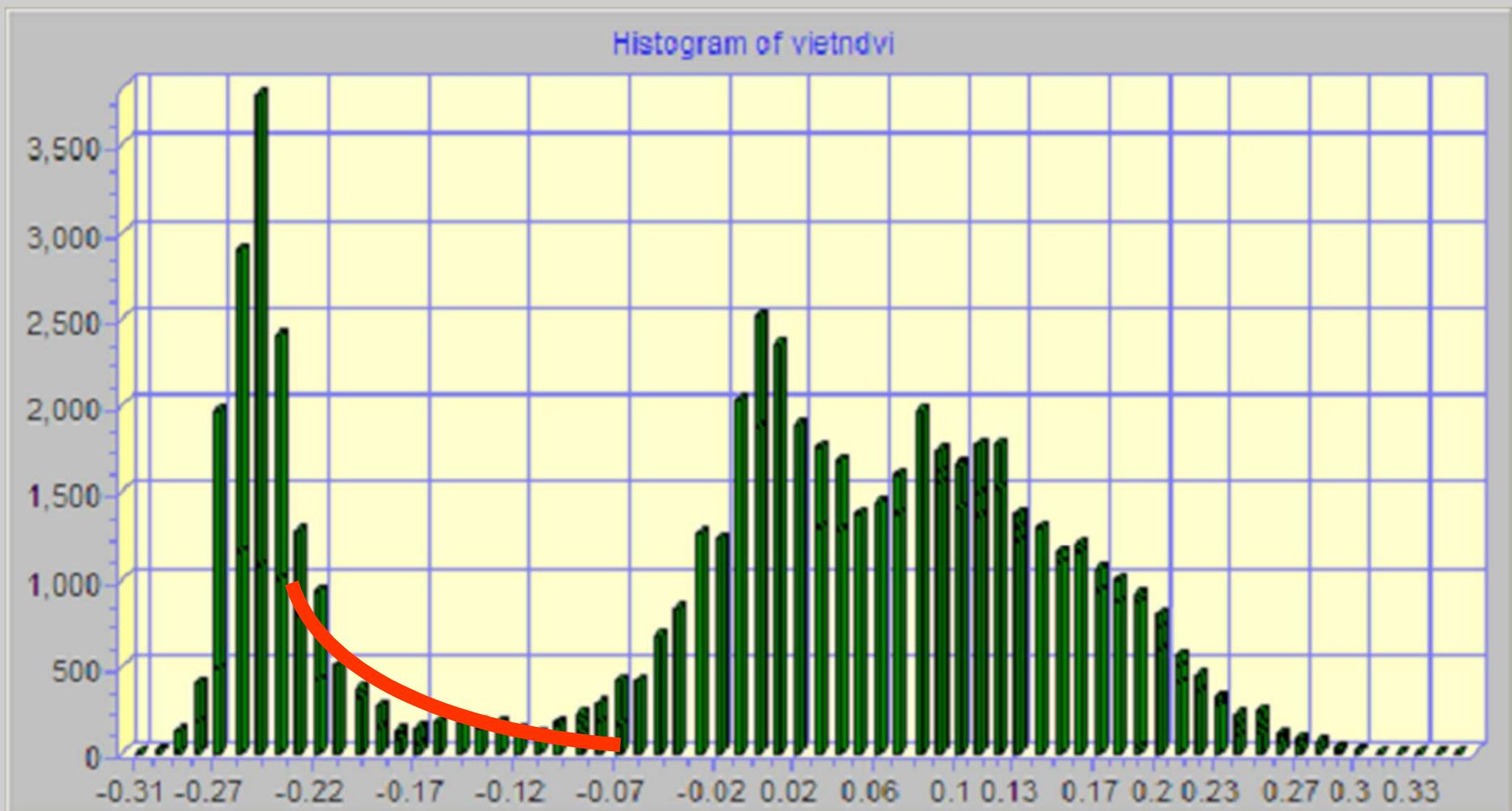
- Automatic (cluster analysis)
- Supervised
 - Parallelepiped
 - Minimum distance
 - Maximum Likelihood



Lecture 4: Intro remote sensing

Image analysis

Classification / Maximum Likelihood

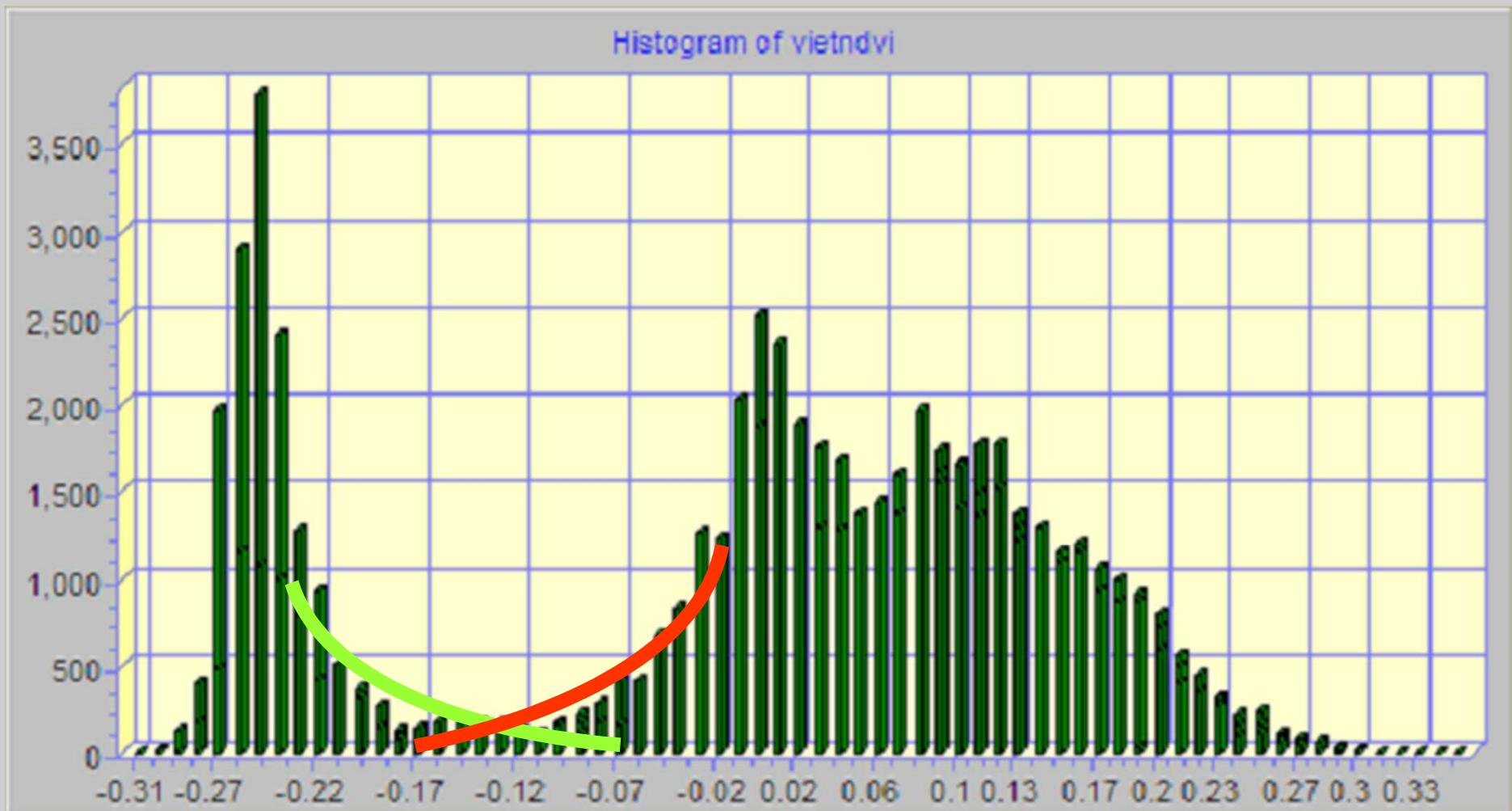




Lecture 4: Intro remote sensing

Image analysis

Classification / Maximum Likelihood





Lecture 4: Intro remote sensing

Image analysis

Classification / Maximum Likelihood

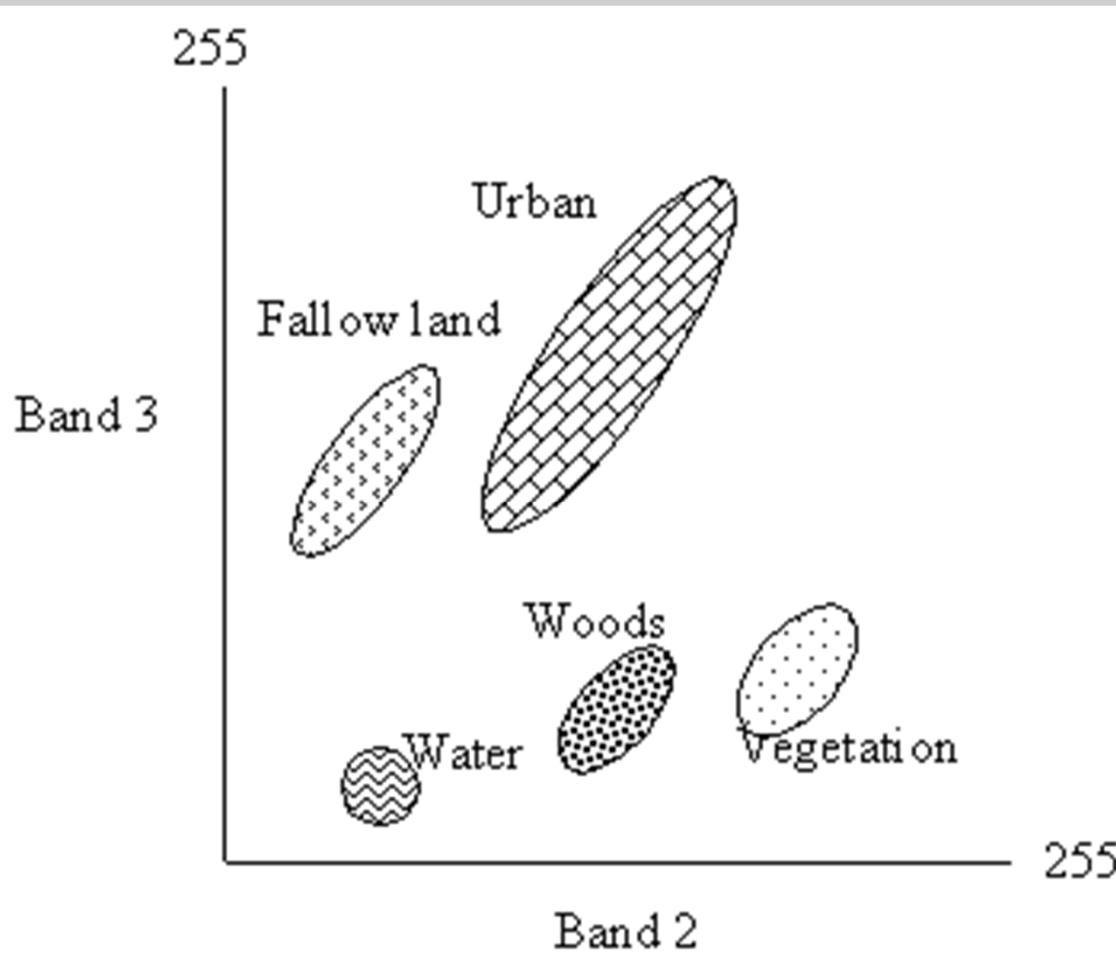
- Multi-band analysis
- Assume normal distribution
- Use training sets => avg, sd, cov
- Determine likelihoods per class (take max)
- Some pixels may remain undetermined



Lecture 4: Intro remote sensing

Image analysis

Classification / Maximum Likelihood

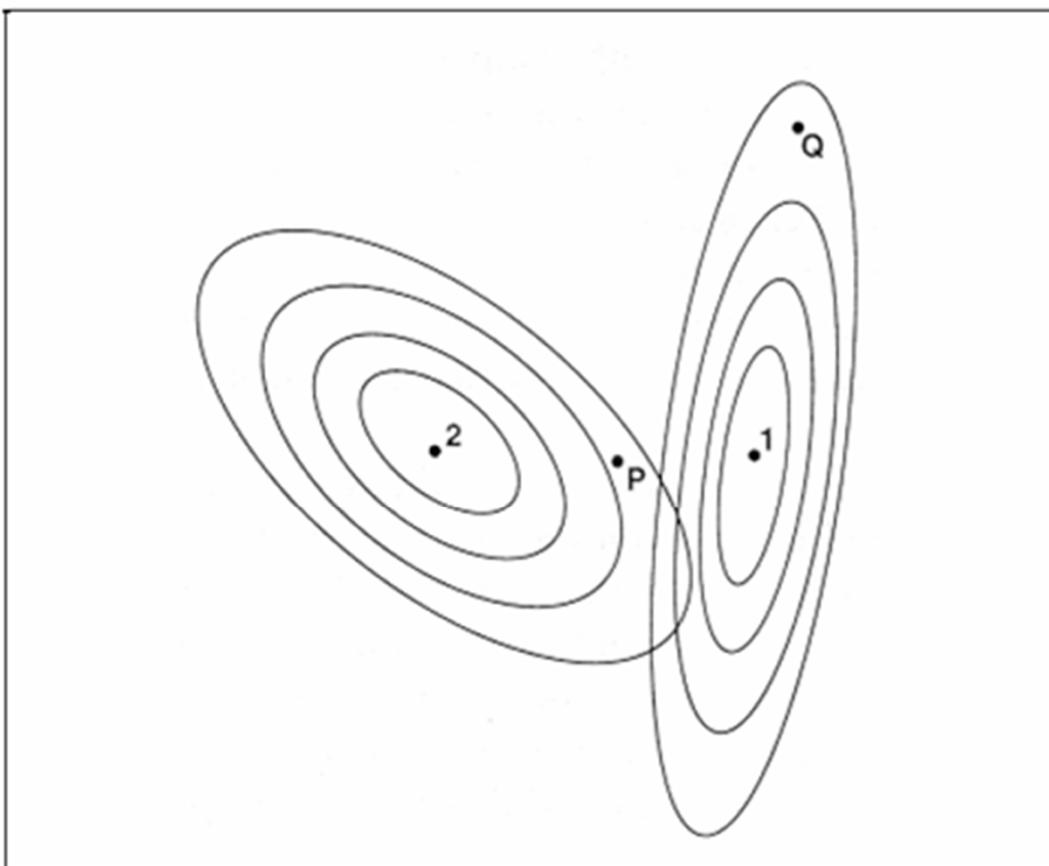




Lecture 4: Intro remote sensing

Image analysis

Classification / Maximum Likelihood



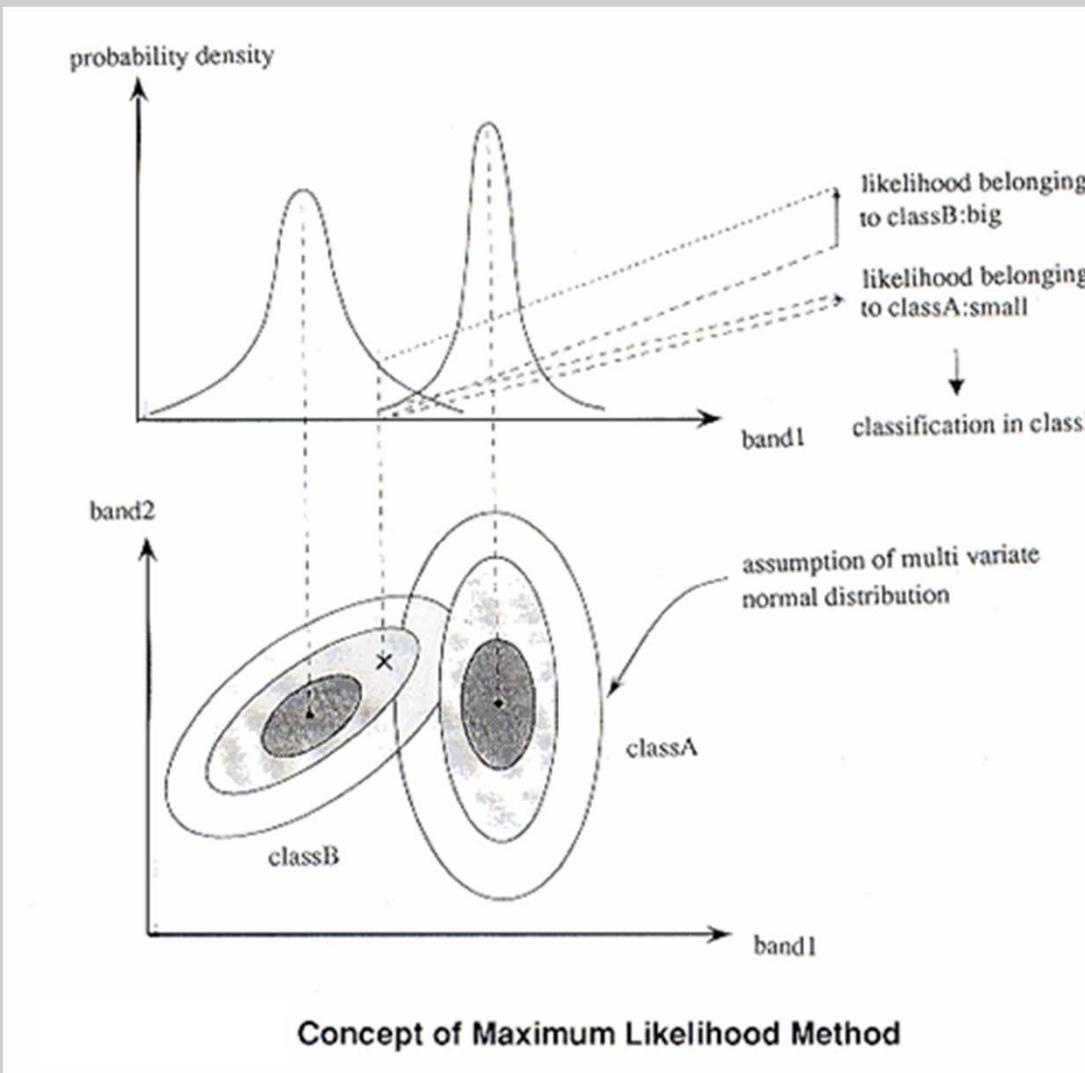
Equi-probability contours as used in
Maximum Likelihood classification



Lecture 4: Intro remote sensing

Image analysis

Classification / Maximum Likelihood





Lecture 4: Intro remote sensing

Image analysis

Classification / Maximum Likelihood

Steps

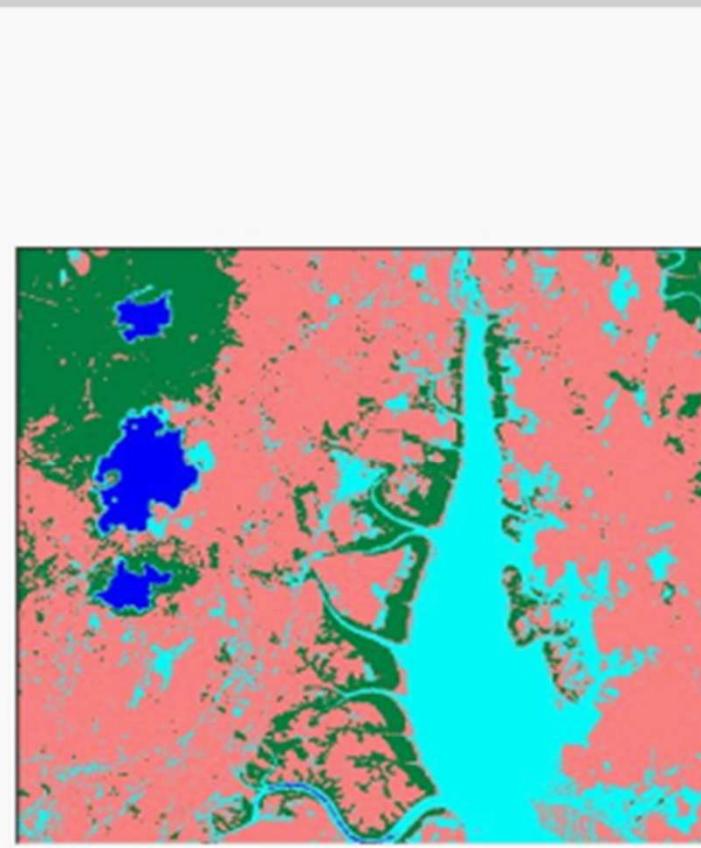
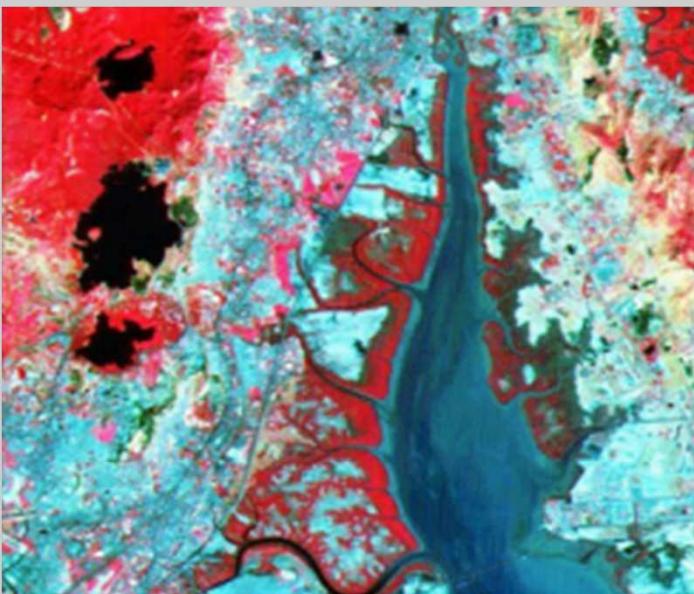
- 1. Select test sets**
- 2. Determine statistics**
- 3. Classify complete image**



Lecture 4: Intro remote sensing

Image analysis

Classification / Maximum Likelihood



[28]

Typical result



Lecture 4: Intro remote sensing

Exercise

Mapping small reservoirs in Burkina Faso

- Assignment on Blackboard (Lecture3)
- Read assignment
- Make assignment



Lecture 4: Intro remote sensing

Exercise

Mapping small reservoirs in Burkina Faso

Why:



www.smallreservoirs.org



Lecture 4: Intro remote sensing

Exercise

Mapping small reservoirs in Burkina Faso

Why:



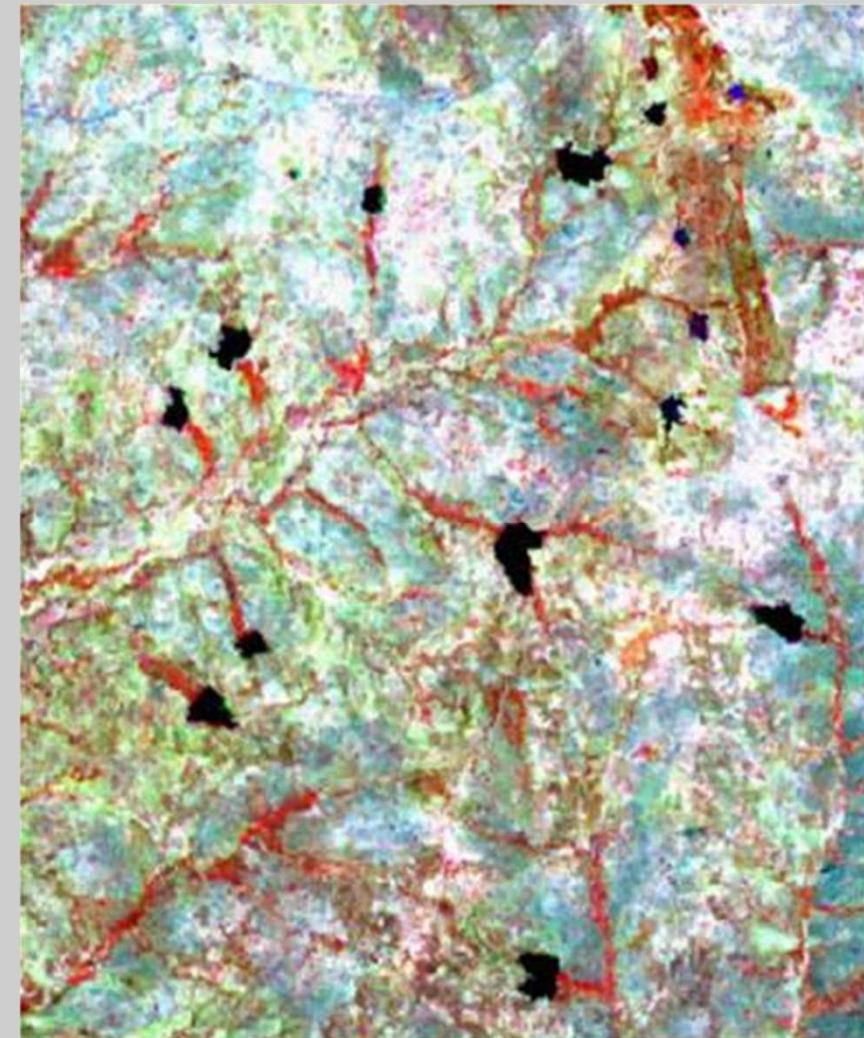
Jens Liebe



Lecture 4: Intro remote sensing

Exercise

Mapping small reservoirs in Burkina Faso



Many shapes...



Lecture 4: Intro remote sensing

Exercise

Mapping small reservoirs in Burkina Faso



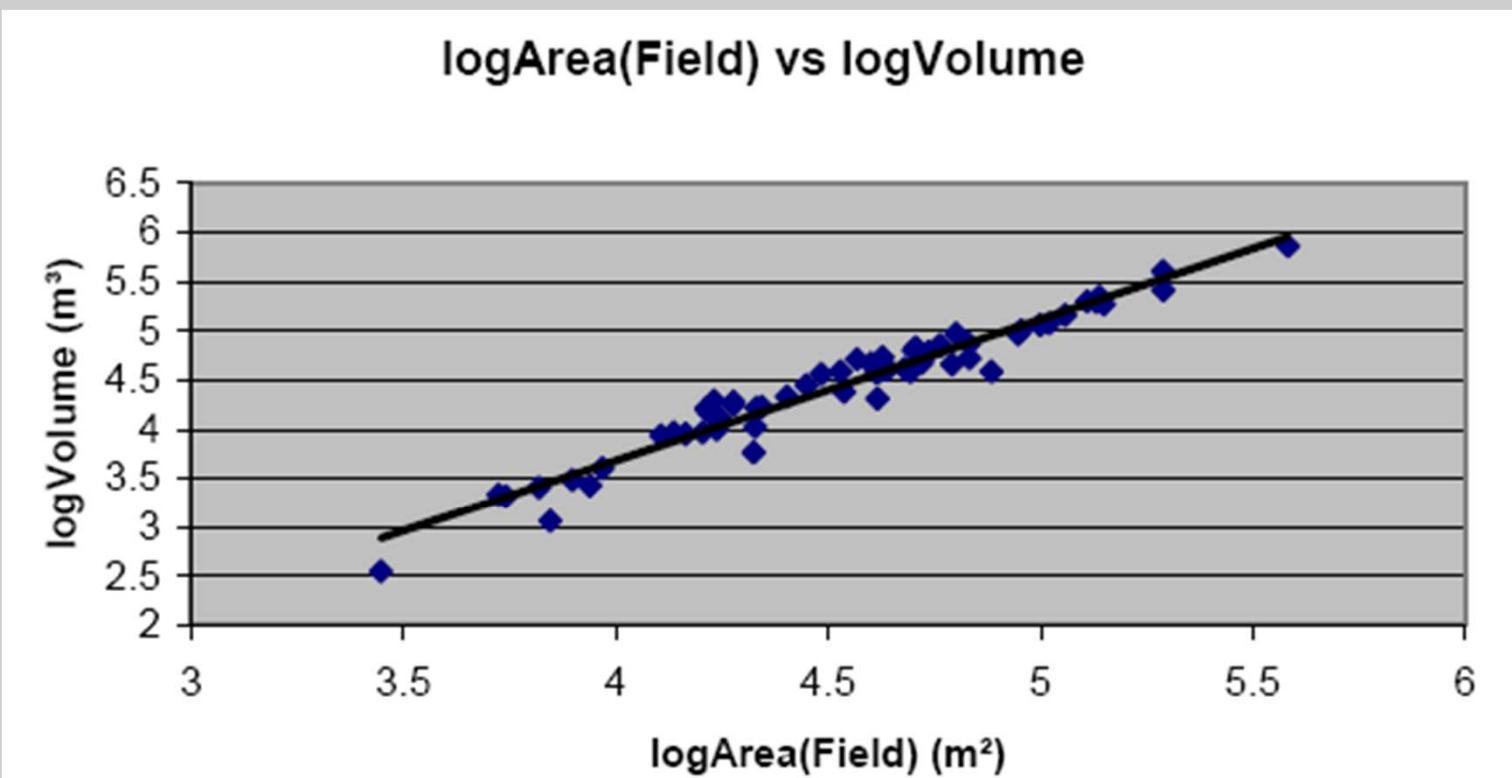


Lecture 4: Intro remote sensing

Exercise

Mapping small reservoirs in Burkina Faso

Many shapes... one equation!



$$\text{Volume} = 0.00857 * \text{Area}^{1.4367} [\text{m}^3]$$



Lecture 4: Intro remote sensing

Exercise

Mapping small reservoirs in Burkina Faso

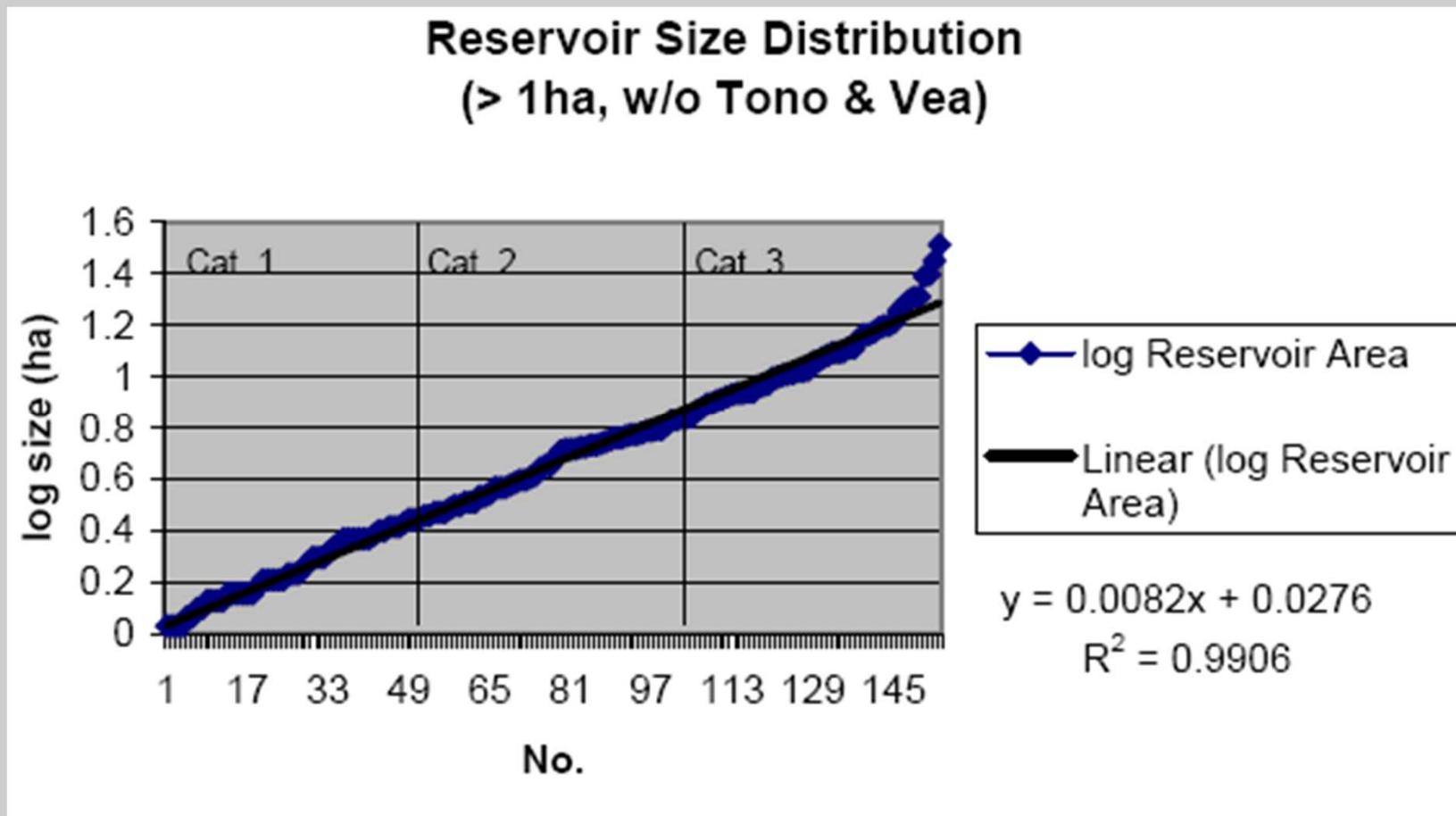
Remote sensing (Landsat, radar) => Volume!



Lecture 4: Intro remote sensing

Exercise

Mapping small reservoirs in Burkina Faso





Lecture 4: Intro remote sensing

Exercise

How to map open water?

- Color composite
- Test areas (many!)
- Maximum Likelihood
- Contiguity
- Hand check...



Lecture 4: Intro remote sensing

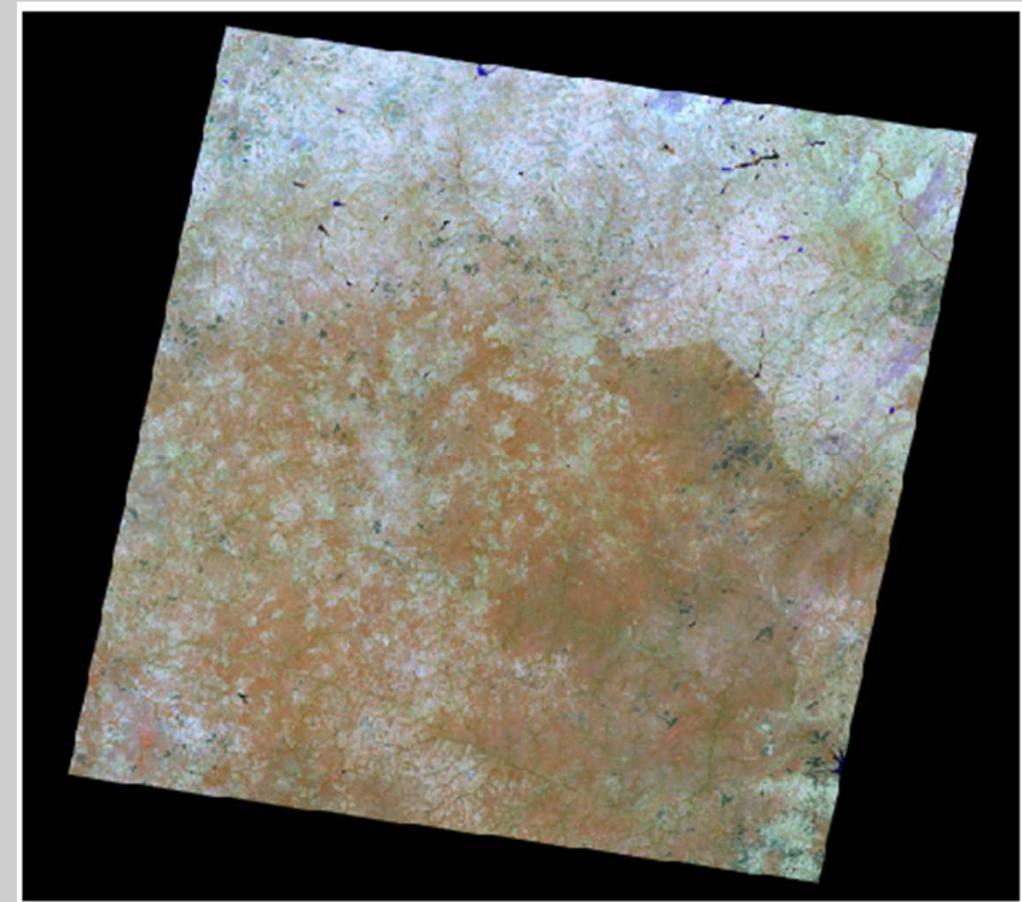
Exercise

How to map open water?

Color composite

- Band 4 => Blue
- Band 5 => Green
- Band 3 => Red

(Windows)





Lecture 4: Intro remote sensing

Exercise

How to map open water?

Test areas

- **Sediment**
- **Clear water**
- **Non-water!**
- **Shades & burn scars**





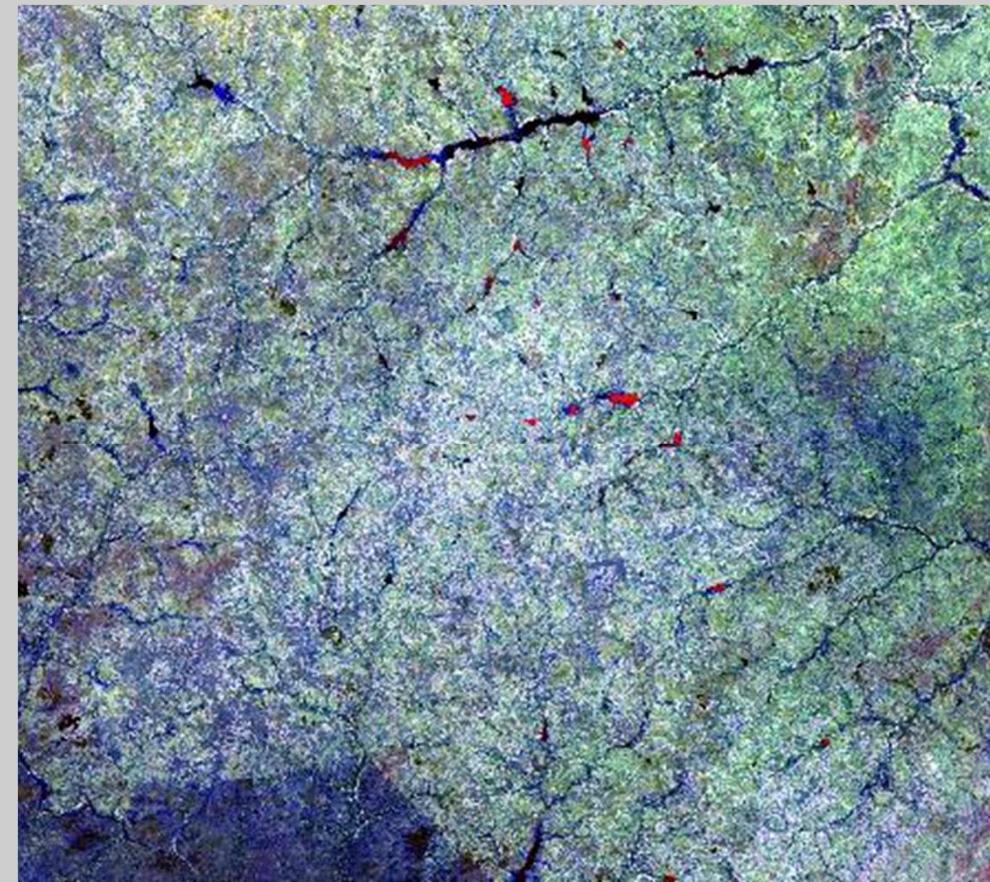
Lecture 4: Intro remote sensing

Exercise

How to map open water?

Test areas

- Use database





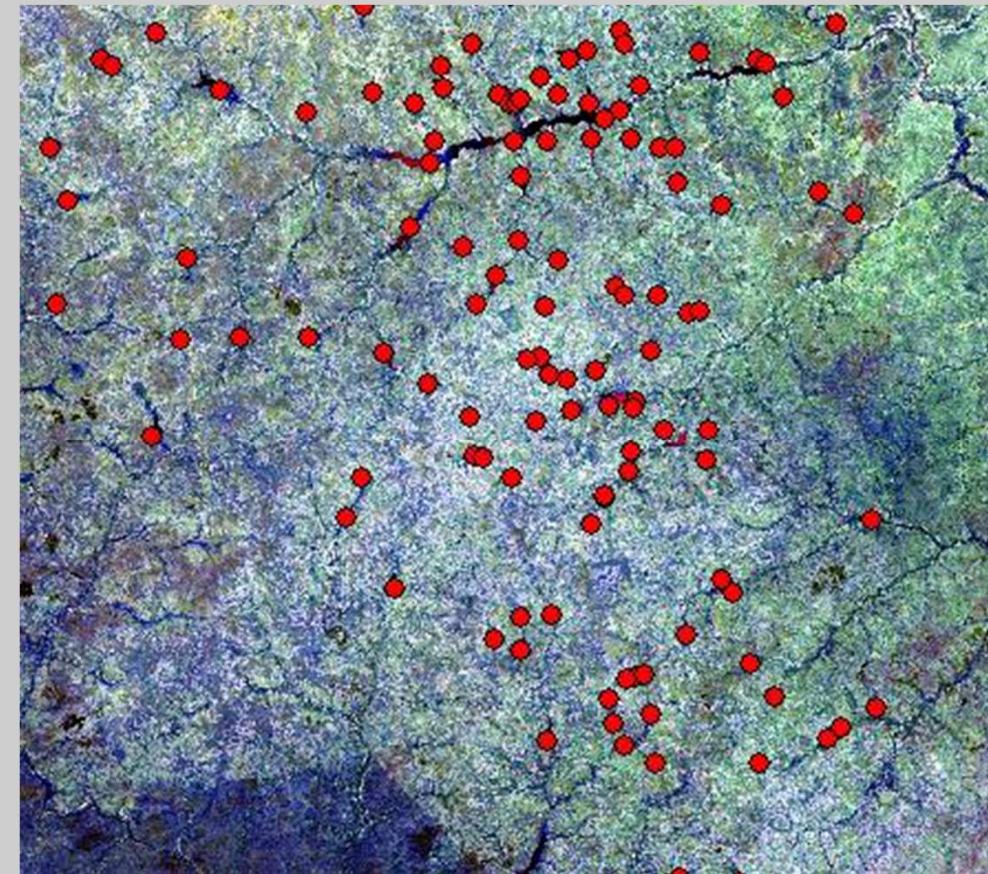
Lecture 4: Intro remote sensing

Exercise

How to map open water?

Test areas

- Use database





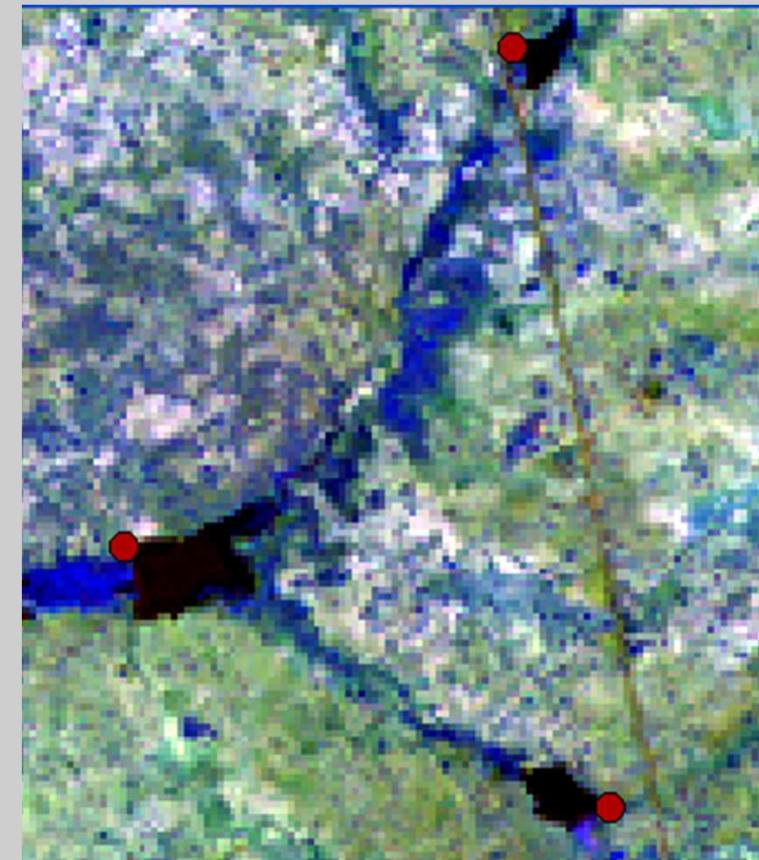
Lecture 4: Intro remote sensing

Exercise

How to map open water?

Test areas

- Use database
- Zoom in



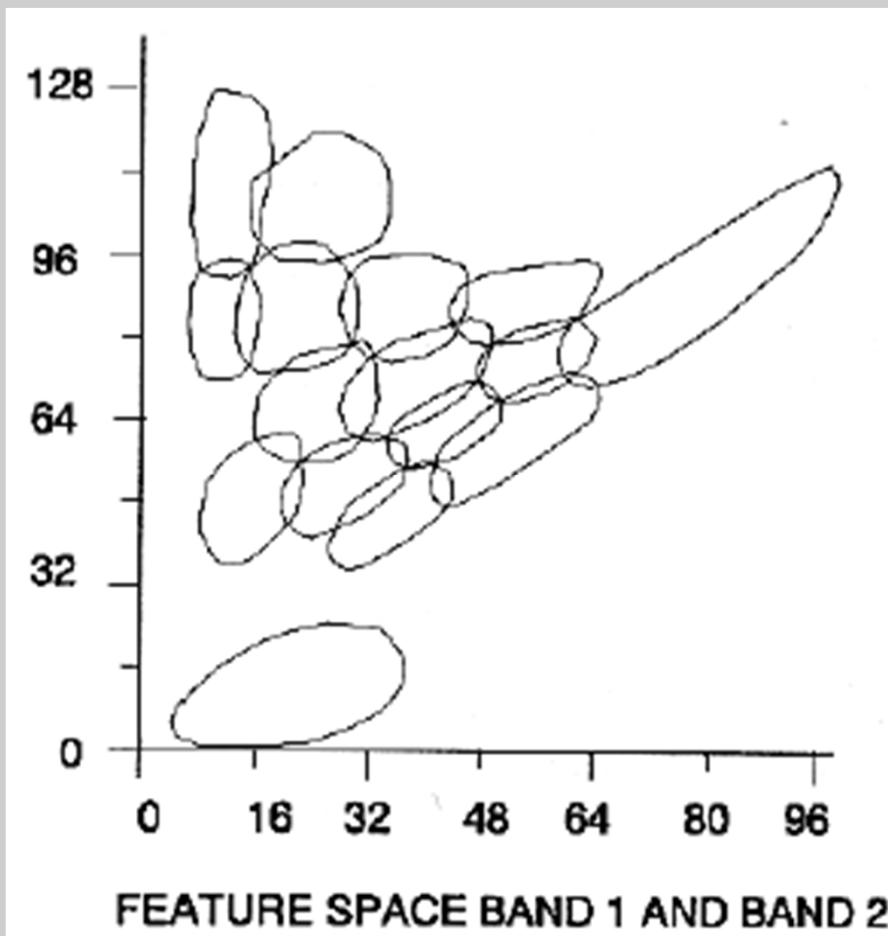


Lecture 4: Intro remote sensing

Exercise

How to map open water?

Test areas: MANY different ones!



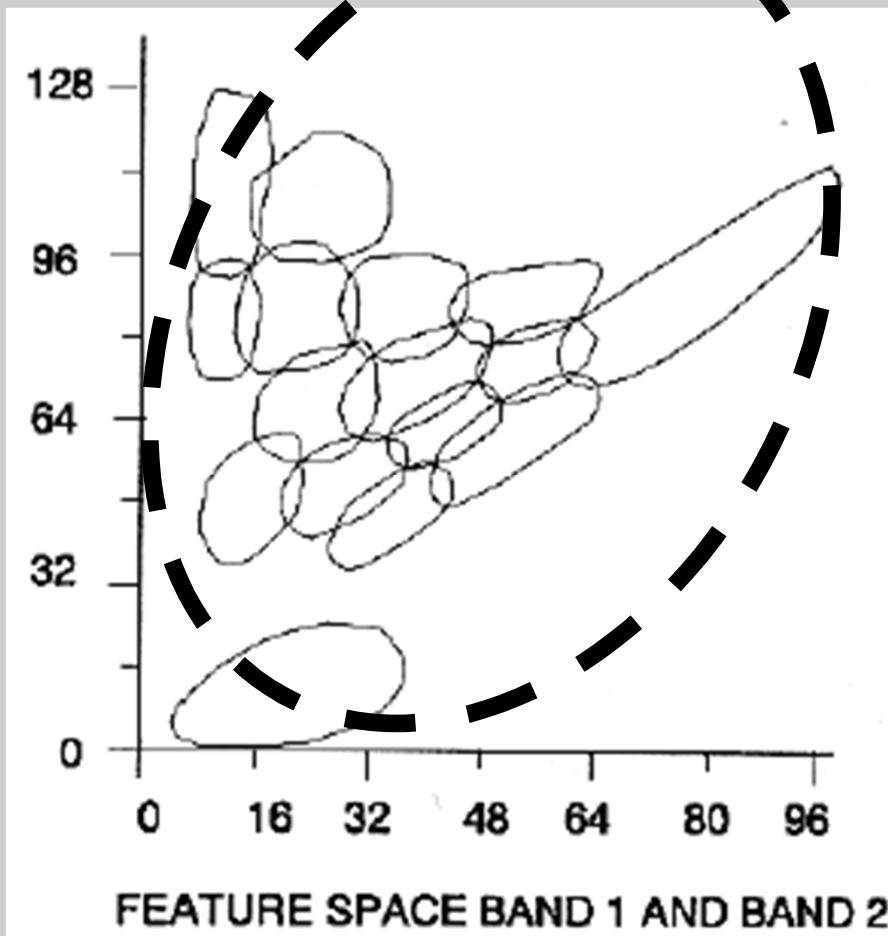


Lecture 4: Intro remote sensing

Exercise

How to map open water?

Test areas: MANY different one! (Gaussian)



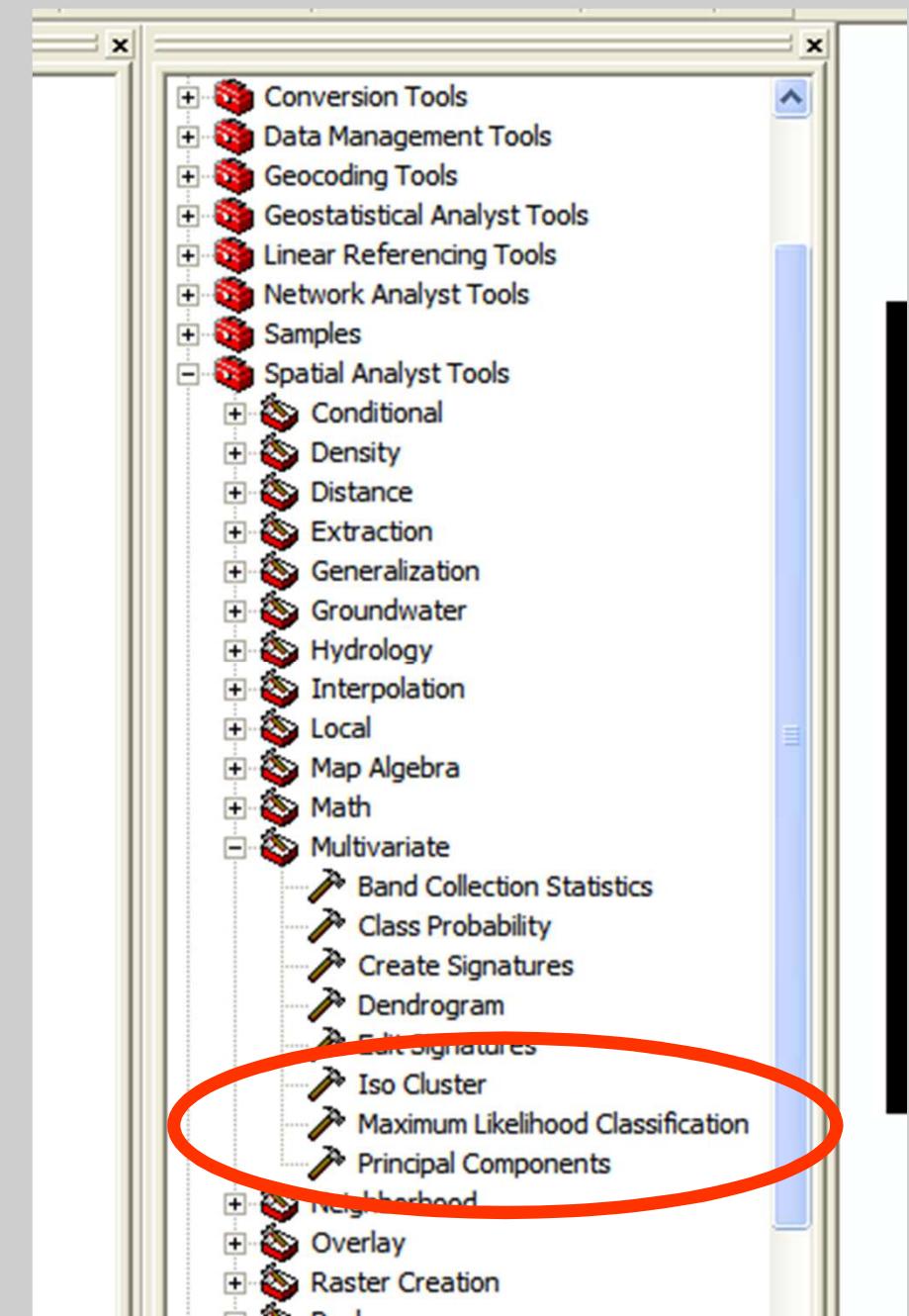


Lecture 4: Intro remote sensing

Exercise

How to map open water?

Use test areas
for maximum likelihood...





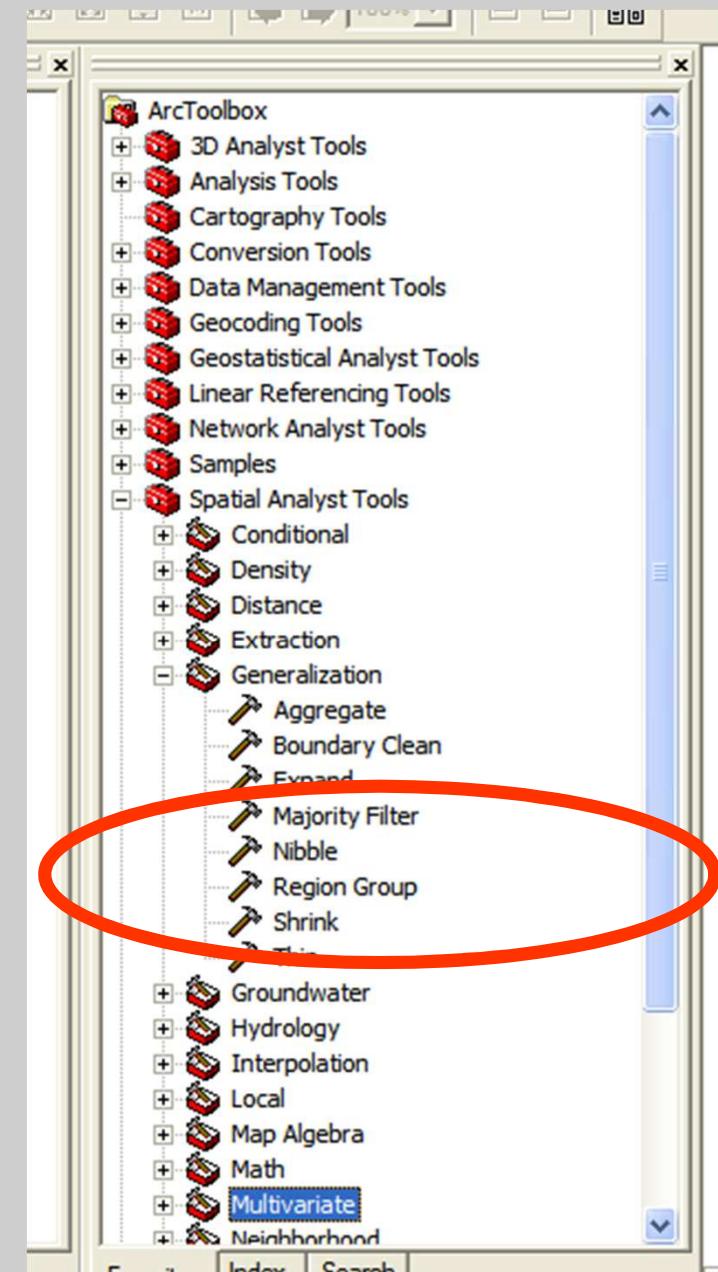
Lecture 4: Intro remote sensing

Exercise

How to map open water?

Small reservoirs:

- **Contiguous set of “water” pixels**
- **Find contiguous sets (discard rest)**
- **“Region Groups”**





Lecture 4: Intro remote sensing

Exercise

How to map open water?

Small reservoirs, sometimes:

- Single (noisy) pixels
- Rivers
- Reservoirs “cut” in two
- (Burn scars / dark objects)



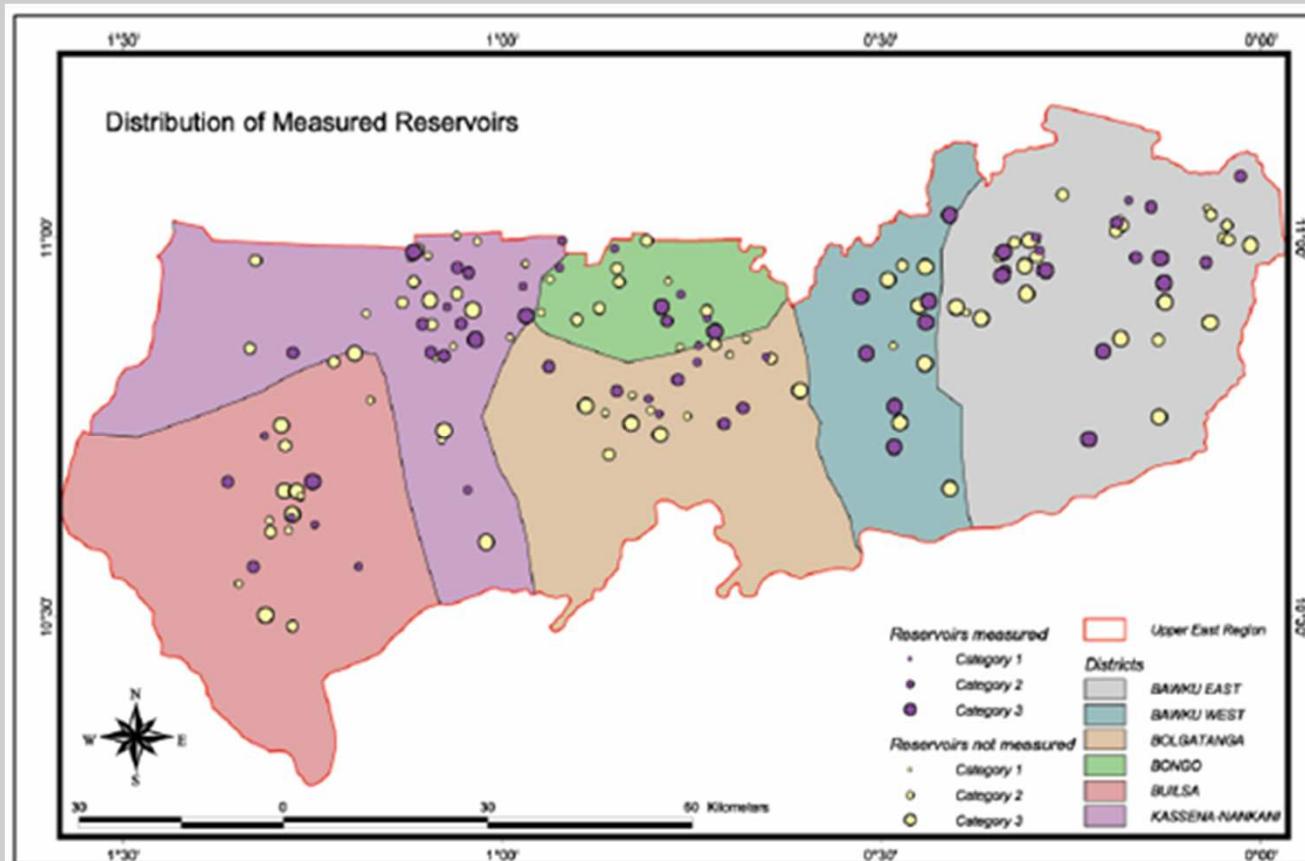
**Hand
check!**



Lecture 4: Intro remote sensing

Exercise

How to map open water?



FINAL PRODUCT... (table)

Sources images

- [1] The Electromagnetic Spectrum, source: HyperPhysics Georgia State University, image courtesy of C.R. Nave
- [2] Near Infrared Satellite image, source: unknown
- [3] Spectral reflectance, source: University of Calgary
- [4] Photosynthesis, source: unknown
- [5] Africa, source: unknown
- [6] Visible spectrum from Planck's formula, source: HyperPhysics
- [7] Radar image of hurricane Katrina, source: ncdc.noaa.gov
- [8] Synthetic Aperture Radar (SAR), source: CRISP, Singapore
- [9] Reflections from a surface, source: Light Measurement Handbook, Alex Ryer
- [10] Images from the IKONOS Quickbird satellite, source: Satellite Imaging Corporation
- [11] Evaporation, source: WaterWatch
- [12] Radar images, source: unknown
- [13] MetOp satellite, source: ESA
- [14] Crop performance, source: Drymon.biz
- [15] Average backscatter of soil moisture, source: unknown
- [16] Diurnal differences of soil moisture, source: unknown
- [17] Casamance, source: unknown
- [18] Images from the GRACE satellite, source: NASA & DLR
- [19] Satellite image of Vietnam with TM band 3, source: unknown
- [20] Satellite image of Vietnam with TM band 1, source: unknown
- [21] Satellite image of Vietnam with TM band 2, source: unknown
- [22] Satellite image of Vietnam in color, source: unknown
- [23] Additive color, source: unknown
- [24] Satellite image of Vietnam with Near Infrared, source: unknown
- [25] Maximum Likelihood Supervised Classified procedure, source: Eastman, 2001
- [26] Equi-probability contours, source: unknown
- [27] Maximum likelihood method, source: Remote Sensing Notes, JARS 1999
- [28] Image Classification using Maximum likelihood classification technique, source: bhugolgis.com