

# **INTRODUCTION TO SATELLITE REMOTE SENSING**

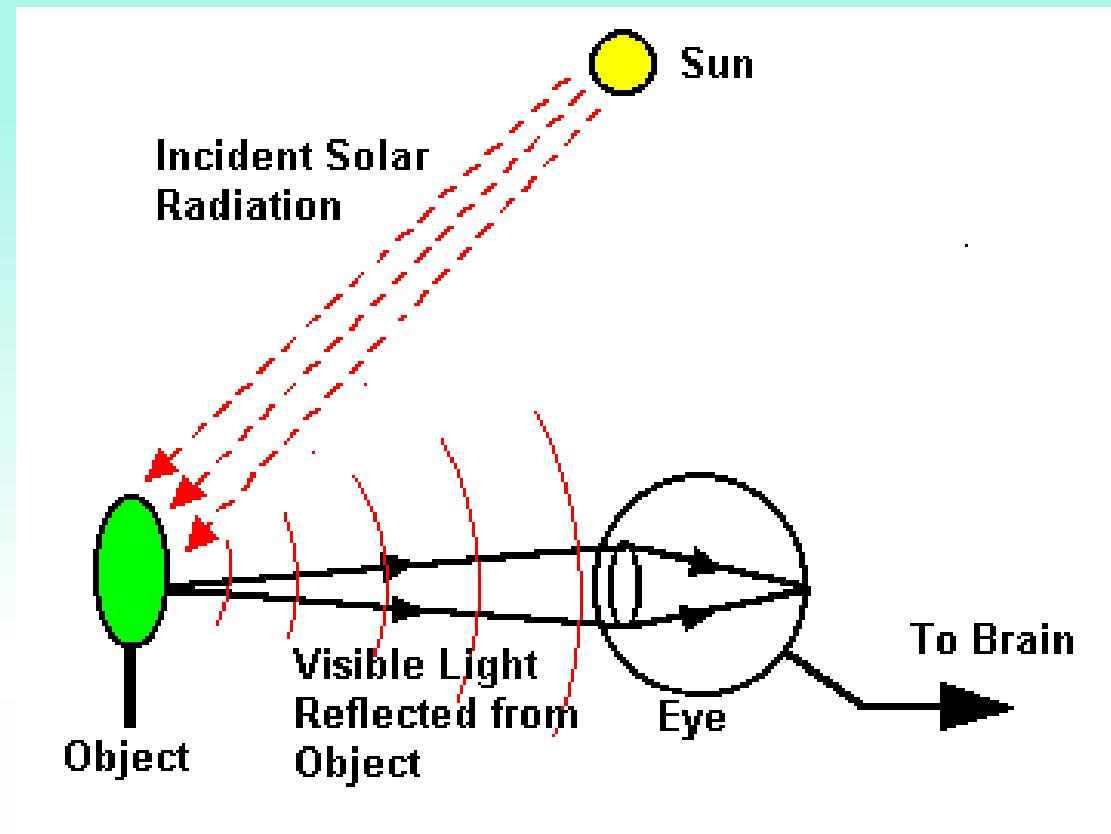
Liew Soo Chin

Principal Research Scientist / Head of Research (CRISP)  
Centre for Remote Imaging, Sensing and Processing  
National University of Singapore

# What is “Remote Sensing”?

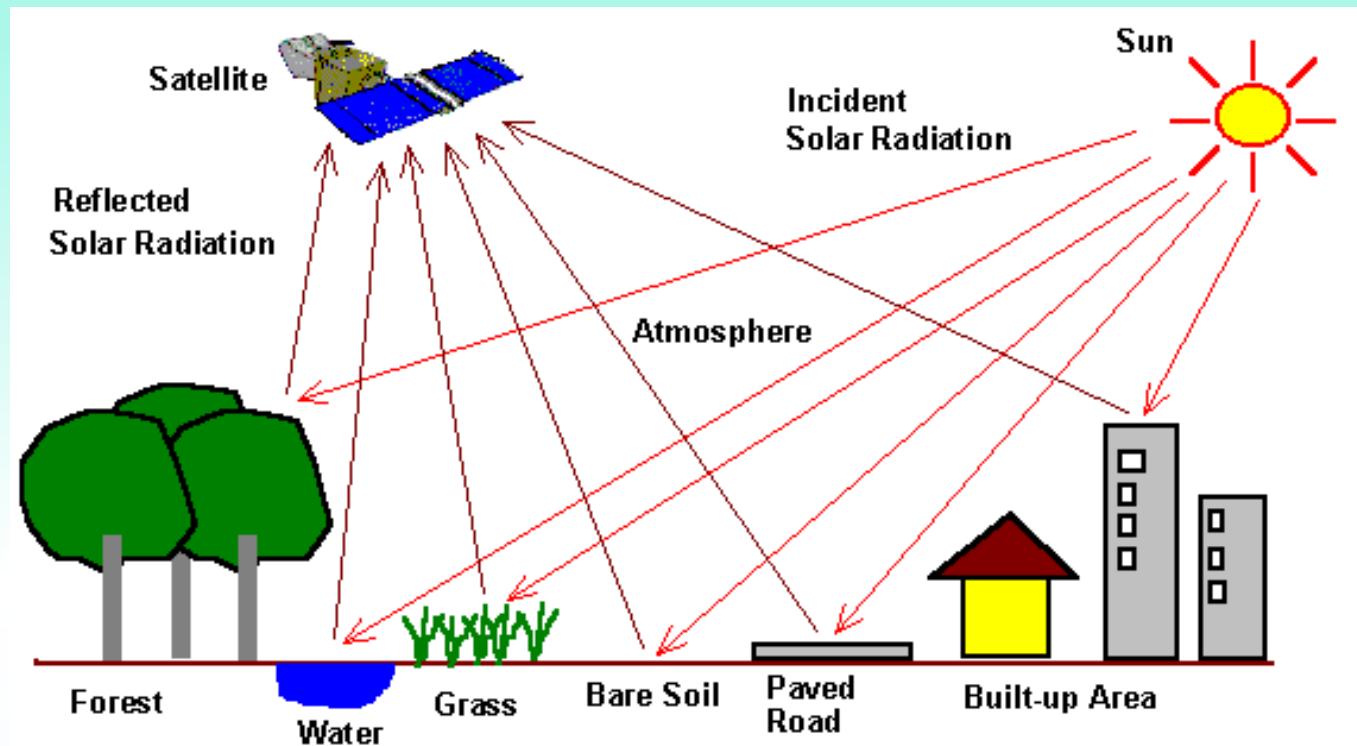
**Remote** (adj.) far away in space;  
**Sense** (verb) perceive by a sense or senses;  
(of a machine or similar device) detect.  
(Compact Oxford English Dictionary)

**Remote Sensing** = Sensing or detecting (by a human or a machine) some objects or events at far away locations.



# What is “Remote Sensing”?

In this Workshop, we are mainly concerned with **observation** of the **Earth's environment** (atmosphere, land and ocean) from **space**, using **sensors** carried by earth-**orbiting satellites**. (Note the highlighted keywords.)





## The Blue Marble

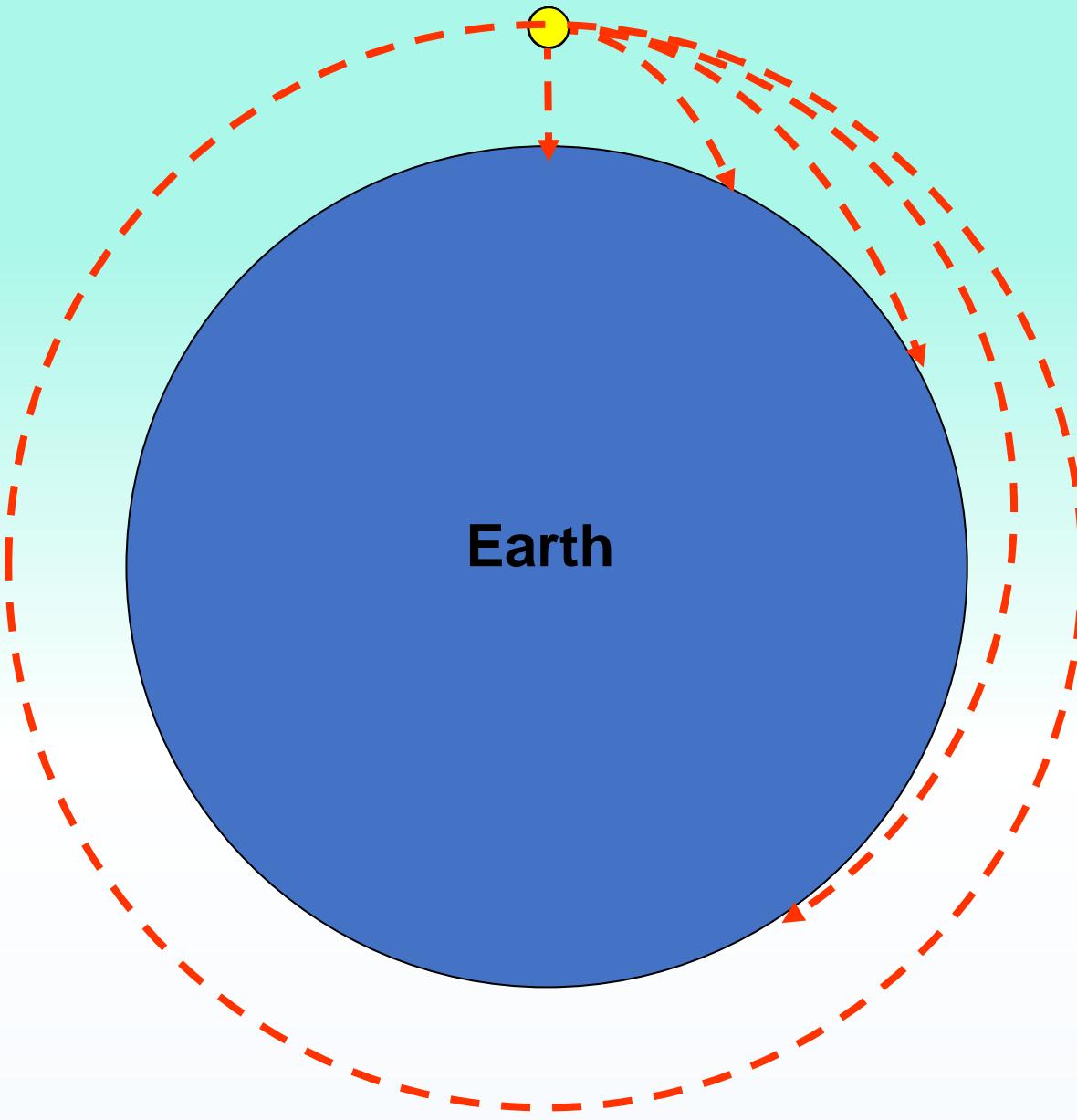
Photograph of the Earth taken from space, at about 29000 km from the Earth's surface

Apollo 17, on the way to the Moon  
1972-12-07  
10:39 UTC

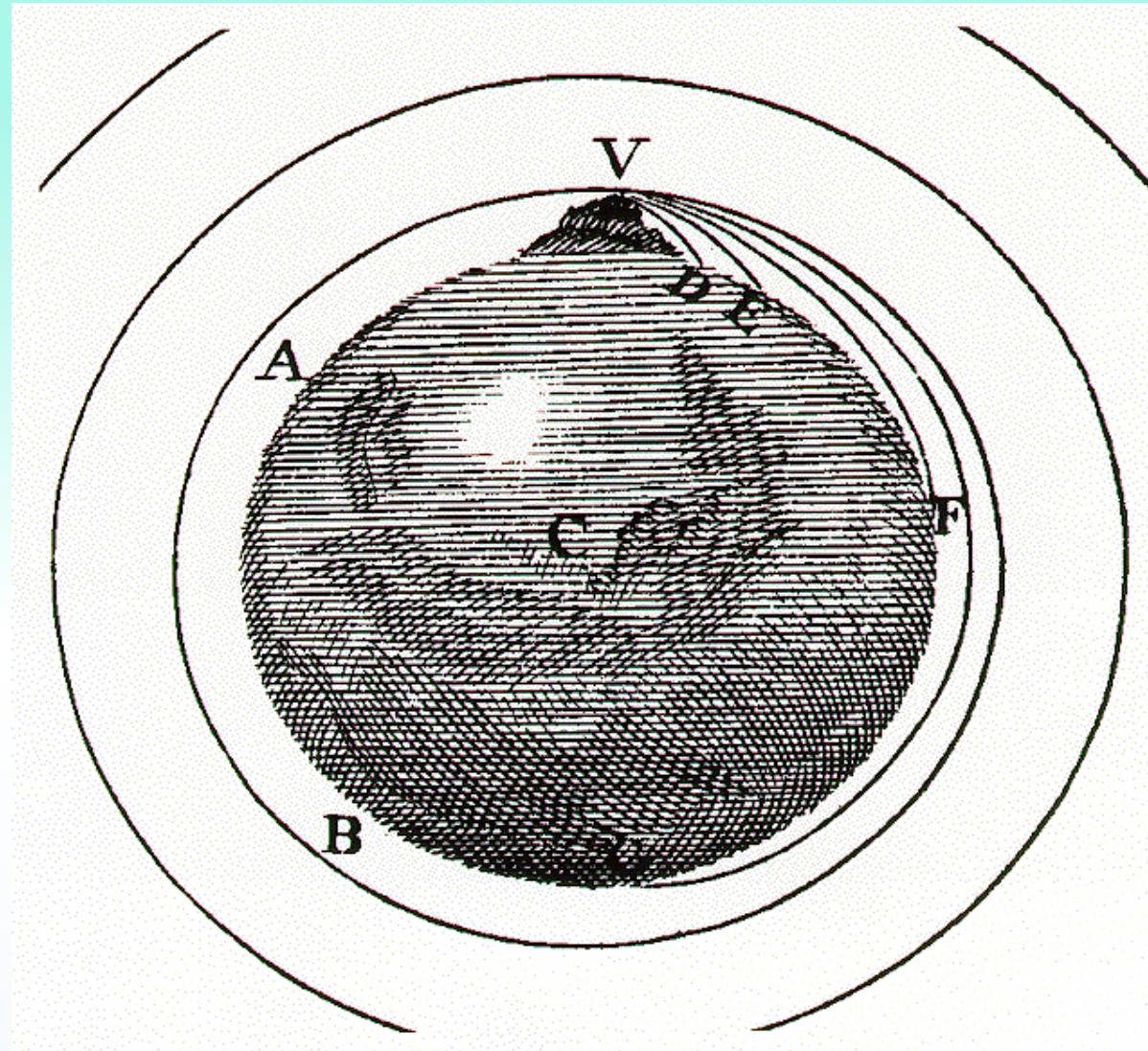
# **Some questions to ponder about?**

- What is a satellite?
- How do we sense / observe the Earth from space?
- What information can we gather from a satellite image?
- How do we utilize satellite images / data to improve life on Earth?

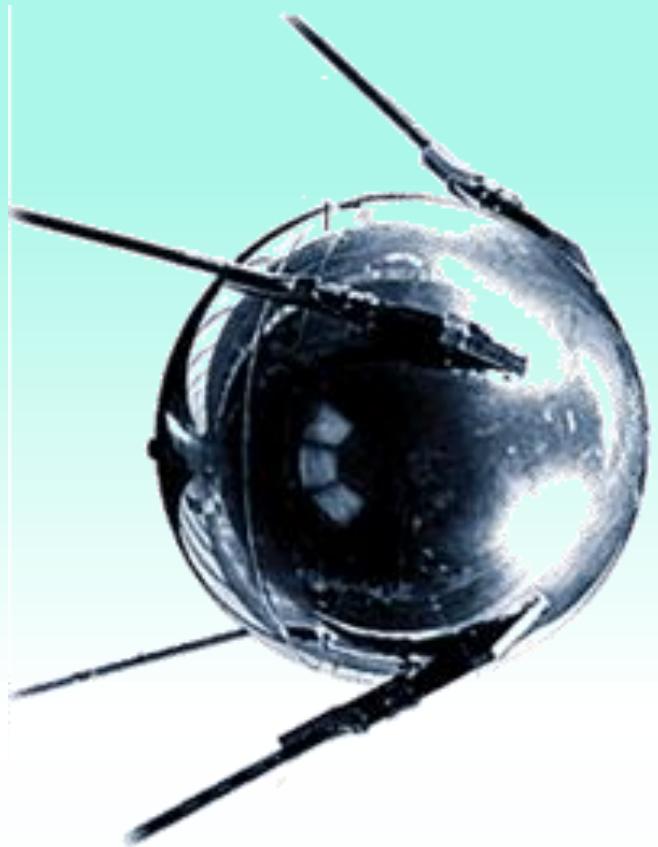
# **What is a satellite?**



An illustration from Issac Newton, *Philosophiæ Naturalis Principia Mathematica* (The Mathematical Principles of Natural Philosophy), 1687



# Sputnik 1 – The first artificial satellite

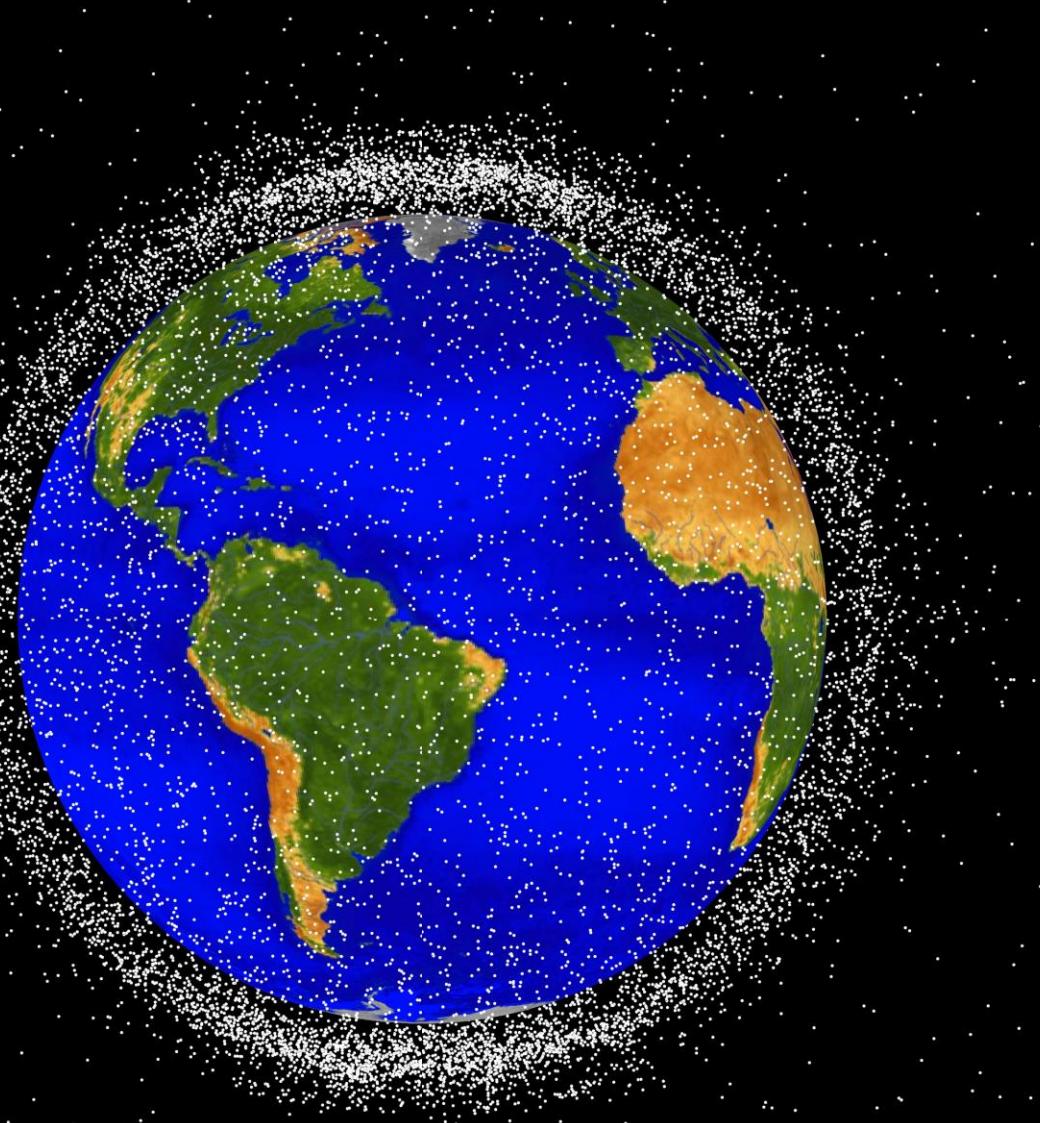


**Sputnik 1**  
**October 4, 1957**

- Launched 4 October 1957 by the Soviet Union, first artificial satellite of the Earth
- Size: 56 cm diameter
- Shape: Spherical
- Mass: 83.6 kg
- Orbit parameters:
  - Perigee (nearest distance from earth surface): 215 km
  - Apogee (furthest from earth surface): 939 km
  - Orbital inclination: 65.1 degrees
  - Orbital period: 96.2 minutes



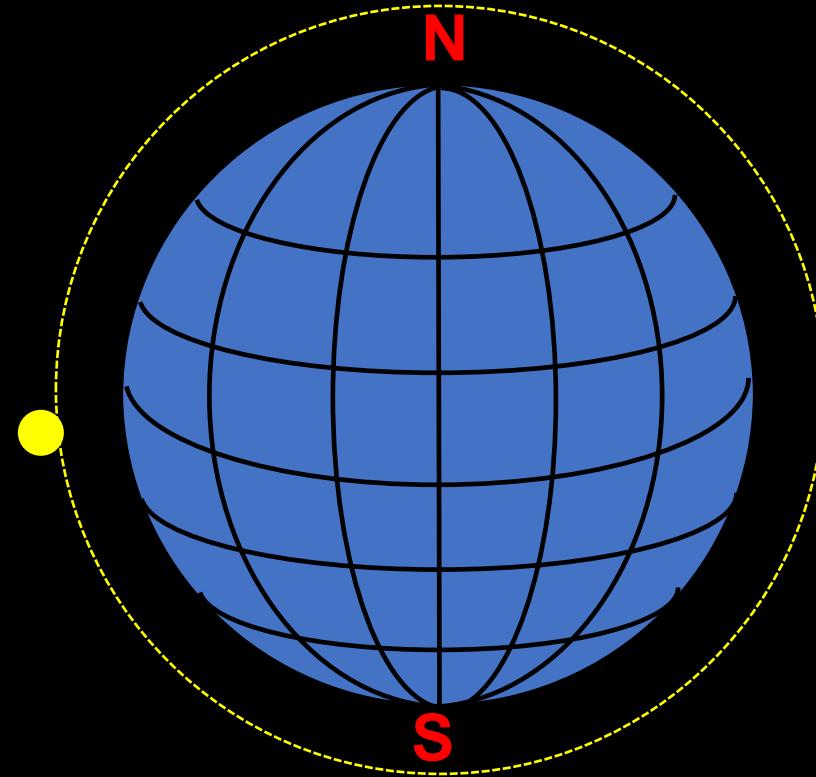
# There are now thousands of satellites orbiting the Earth



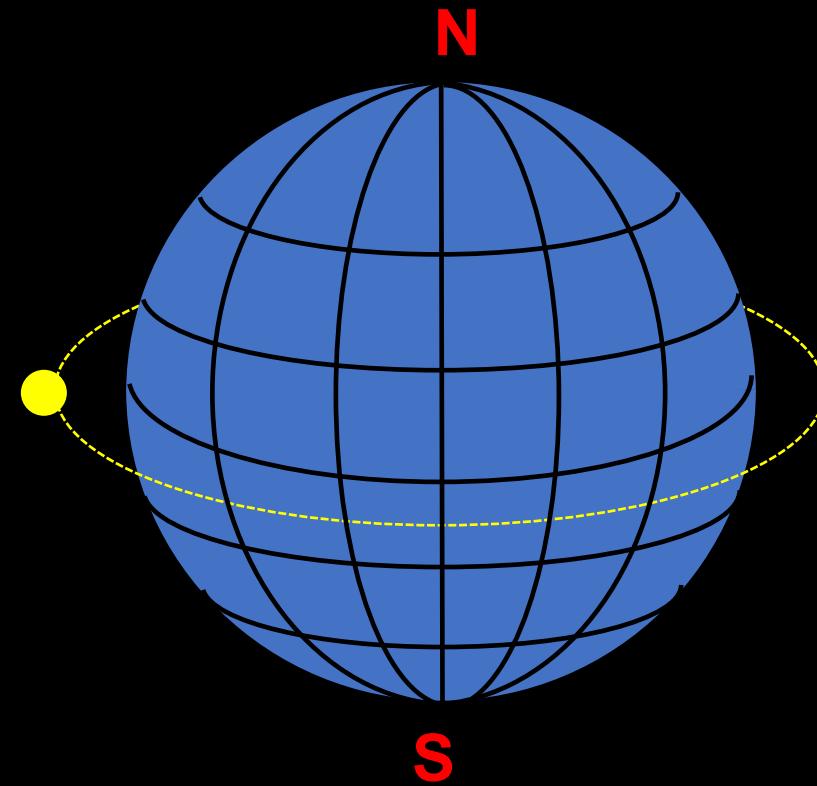
A computer-generated image of objects in low Earth orbit (below 2000 km) that are currently being tracked by NASA. Approximately 95% of the objects are orbital debris, i.e., not functional satellites.

Image Credit: NASA ODPO

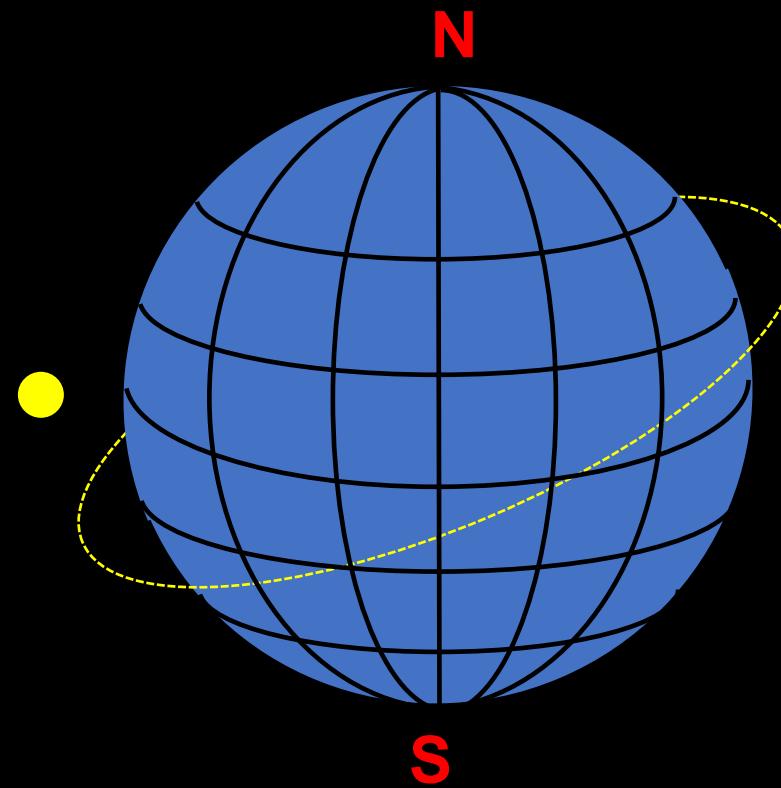
# Polar Orbit

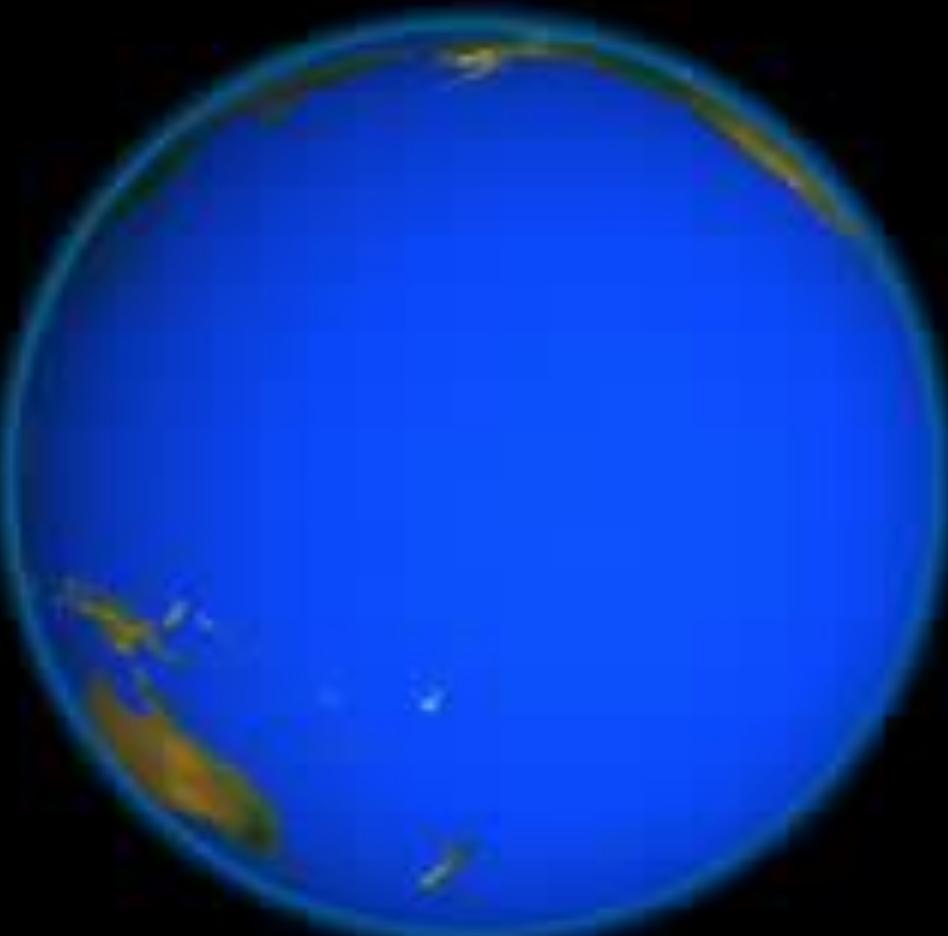


# Equatorial Orbit



# Inclined Orbit

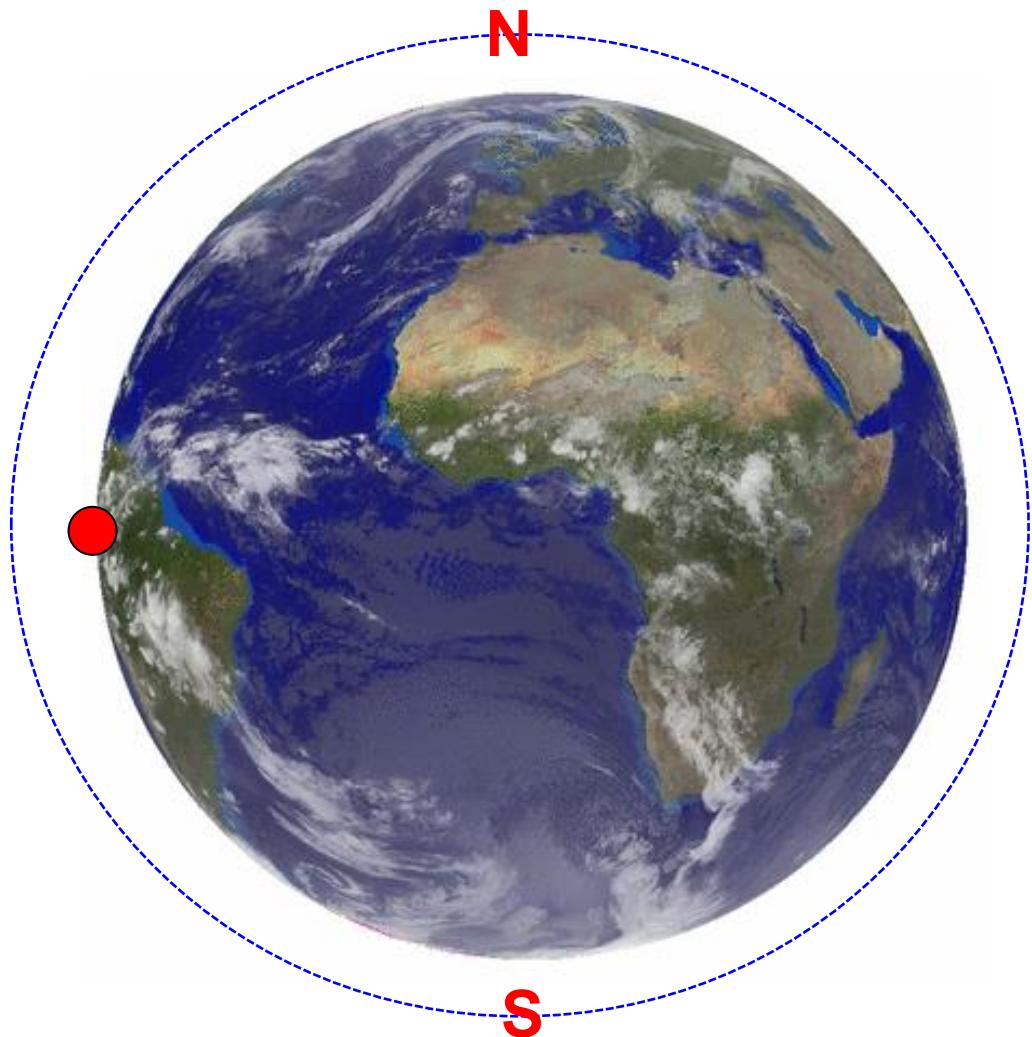




## Animation of a low-earth orbit satellite

SA

# Why doesn't a satellite fall down to Earth?

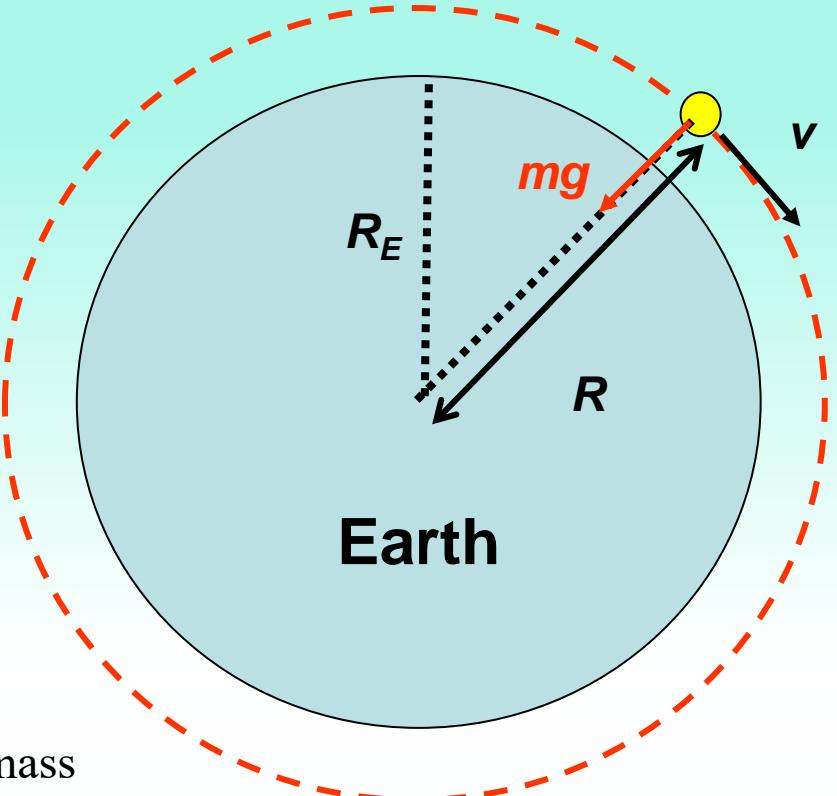


**It is falling !!!**

The satellite is moving forward at the same time as it is falling, and the earth is not flat.

If the satellite's speed is just right, it follows the curvature of the earth as it falls and never hits the earth surface.

# Why doesn't a satellite fall down to Earth?



$m$  = satellite's mass

$g$  = gravitational field strength

$R$  = satellite's distance from Earth's centre

$v$  = satellite's orbital speed

The gravitational attraction of the earth on the satellite provides the centripetal force required to keep the satellite in orbit.

$$\frac{mv^2}{R}$$

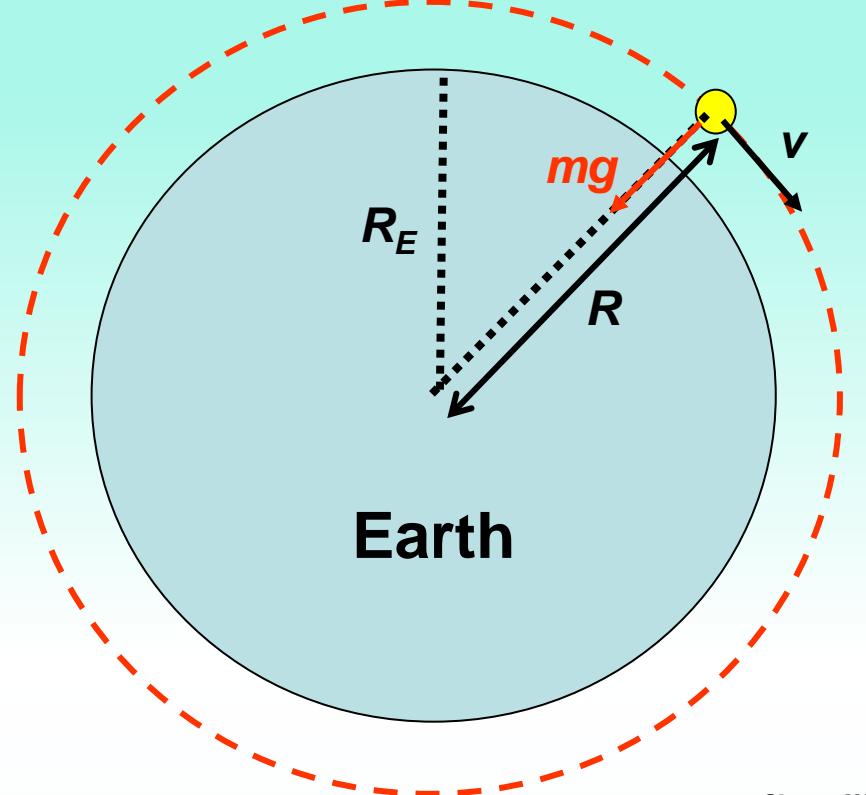
=

$$mg$$

Centripetal  
Force

Gravitational  
Attraction

# How fast does a satellite move in its orbit?



$$\cancel{mg} = \frac{\cancel{mv^2}}{R}$$

$$v = \sqrt{gR}$$

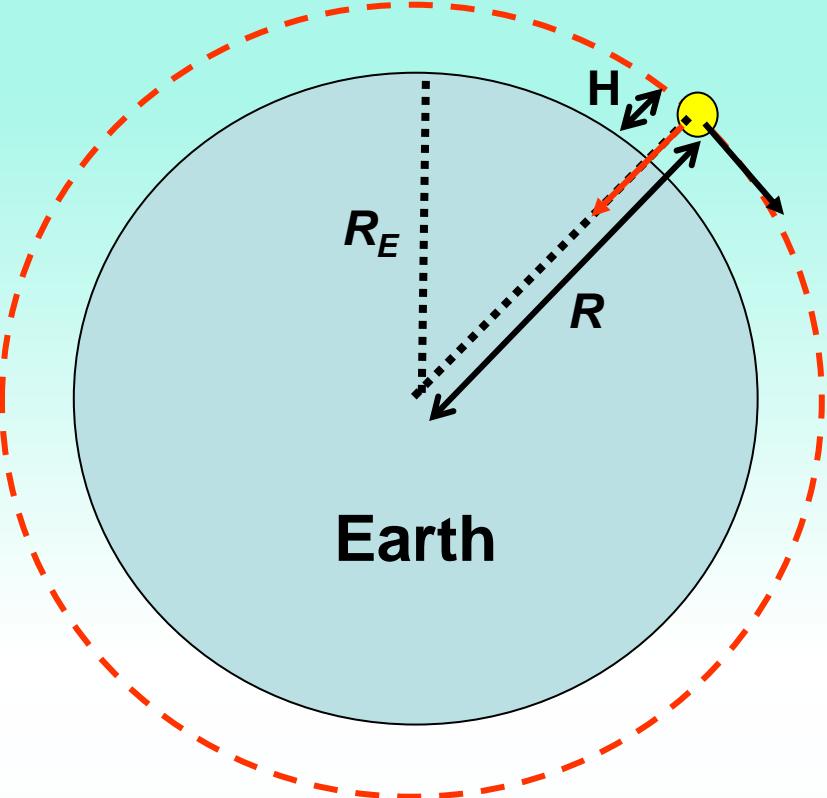
The gravitational strength  $g$  is inversely proportional to the square of the distance from the Earth's centre

$$g = g_0 \left( \frac{R_E}{R} \right)^2$$

$g$  = gravitational strength at satellite's orbit  
 $g_0$  = gravitational strength at earth's surface  
 $R$  = satellite's orbital radius  
 $R_E$  = Earth's radius

# How fast does a satellite move in its orbit?

$$v = \sqrt{gR}$$



The orbital speed is approximately 7.5 km per second for a low-earth-orbit (LEO) satellite

Eg. Near to earth's surface,

$$R = R_E = 6371 \text{ km}, g = 9.82 \text{ ms}^{-2}$$

$$v = 7910 \text{ m/s}$$

E.g. Satellite altitude,  $H = 750 \text{ km}$

$$R = R_E + H = 7121 \text{ km} = 7121000 \text{ m}$$

Earth's gravitational field strength at surface,

$$g_0 = 9.82 \text{ ms}^{-2}$$

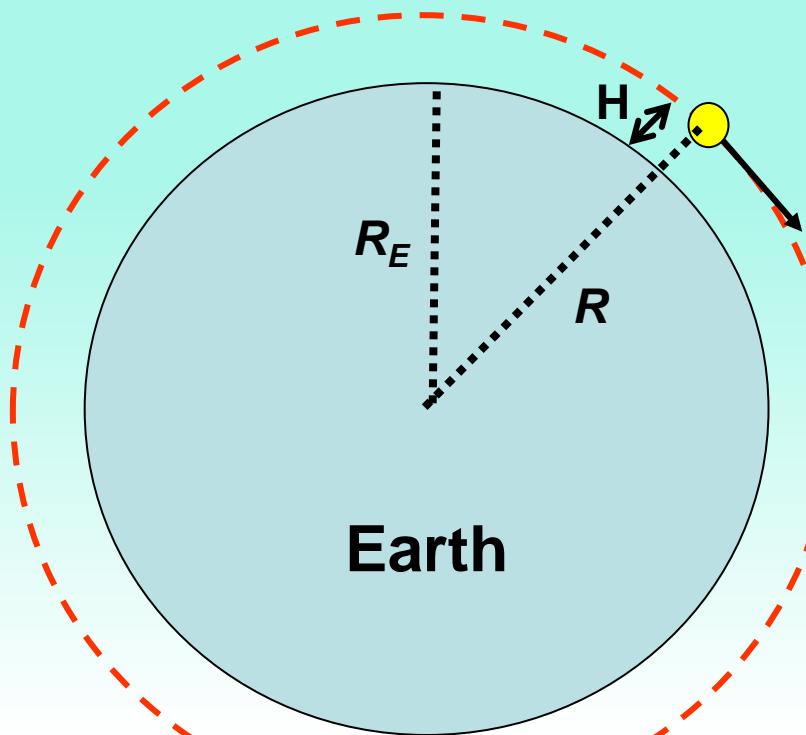
Gravitational field strength at orbit altitude,

$$g = g_0(R_E/R)^2 = 7.86 \text{ ms}^{-2}$$

Satellite orbital speed,

$$v = \sqrt{(7.86 \times 7121000)} = 7481 \text{ ms}^{-1}$$

# How long does it take for a satellite to travel round the Earth?



It takes about 100 min. for a low-earth-orbit satellite to complete one orbit around the earth.

E.g. for the previous example,

$$H = 750 \text{ km}$$

$$R = 7121 \text{ km}$$

$$v = 7481 \text{ ms}^{-2}$$

$$\begin{aligned}\text{Circumference of the orbit} &= 2\pi R \\ &= 44743 \text{ km} = 44743000 \text{ m}\end{aligned}$$

Orbital Period = time required to complete one orbit

$$T = 2\pi R / v = 5980 \text{ s} = 99 \text{ min } 40 \text{ s}$$

# Speed comparison



Automobile  $200 \text{ km/h} = 55 \text{ m/s}$



Jet plane  $900 \text{ km/h} = 250 \text{ m/s}$



Bullet  $3000 \text{ km/h} = 833 \text{ m/s}$

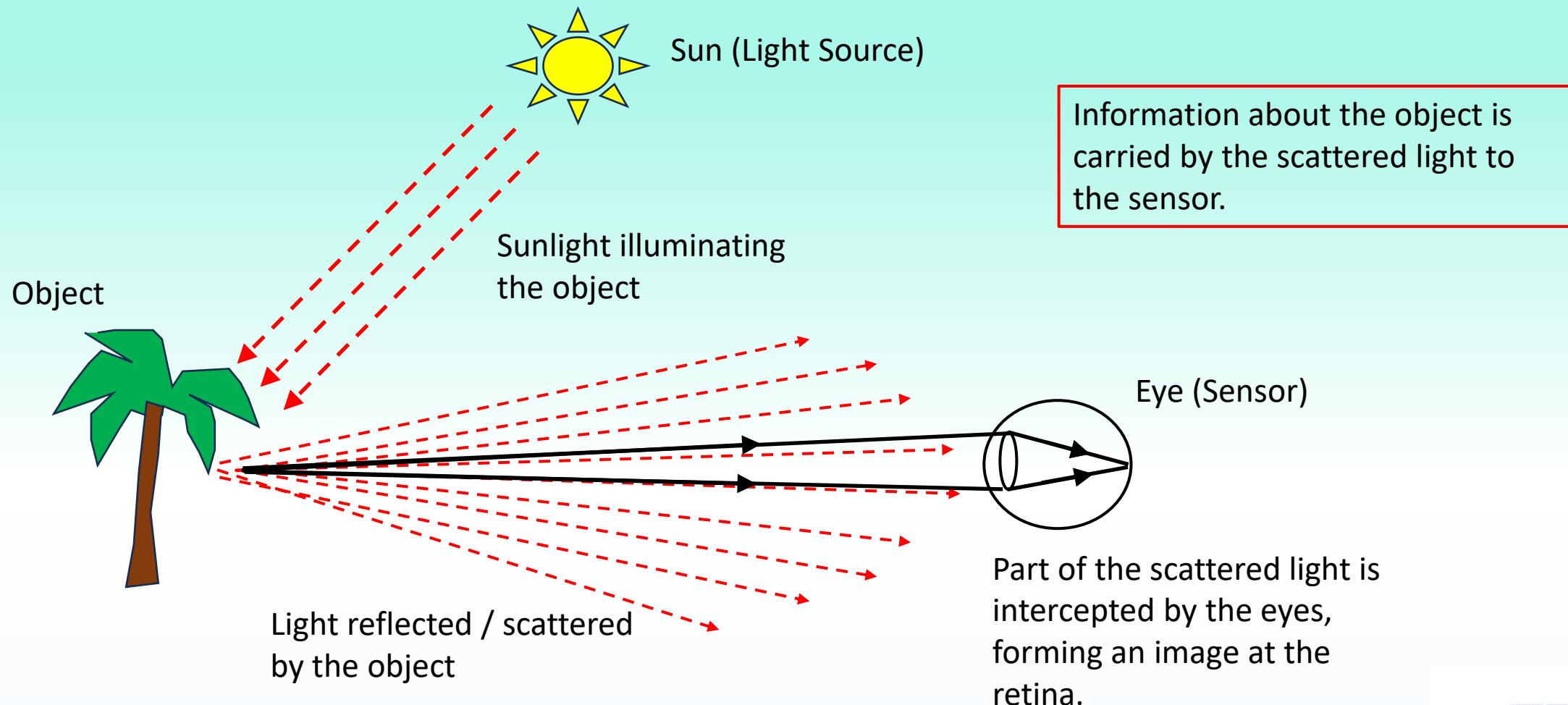


LEO Satellite  $27000 \text{ km/h} = 7500 \text{ m/s}$

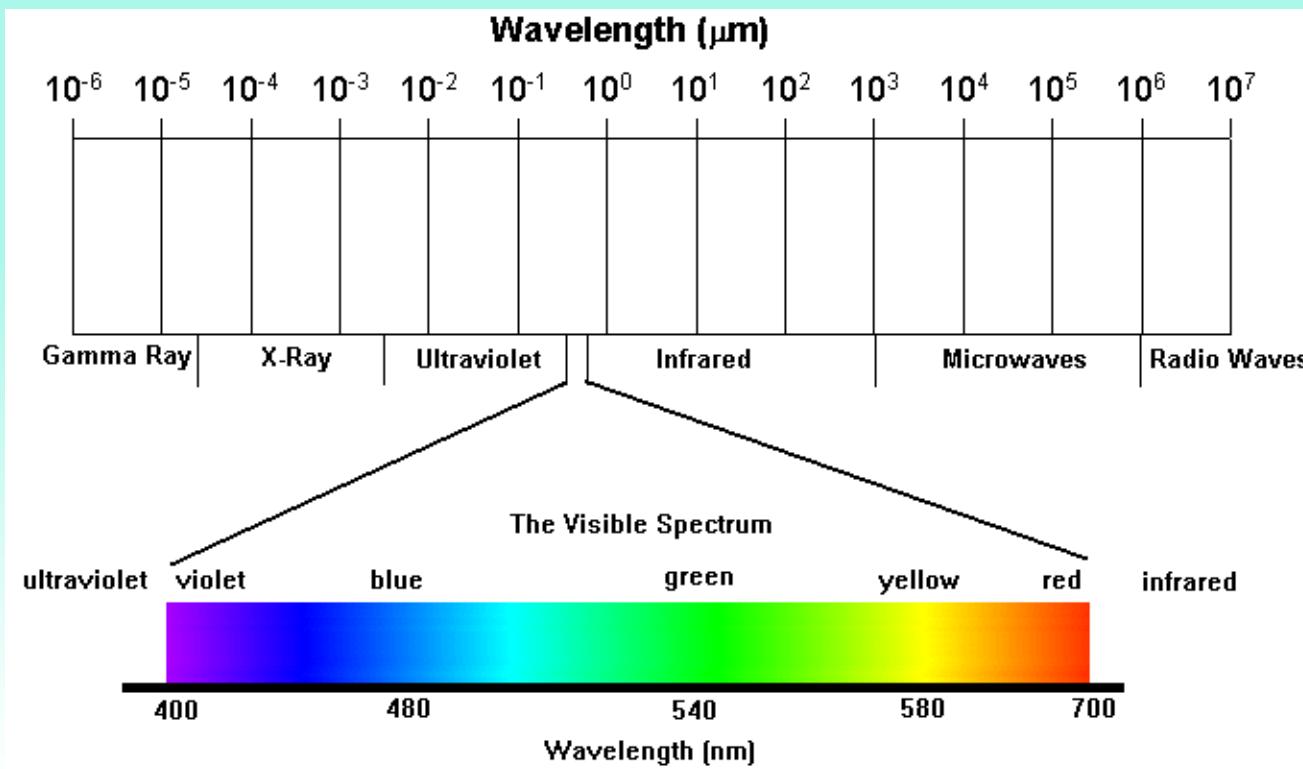
Speed of sound  
in air  $\approx 340 \text{ m/s}$

**How do we sense / observe the  
Earth from space?**

# Example: Our visual system



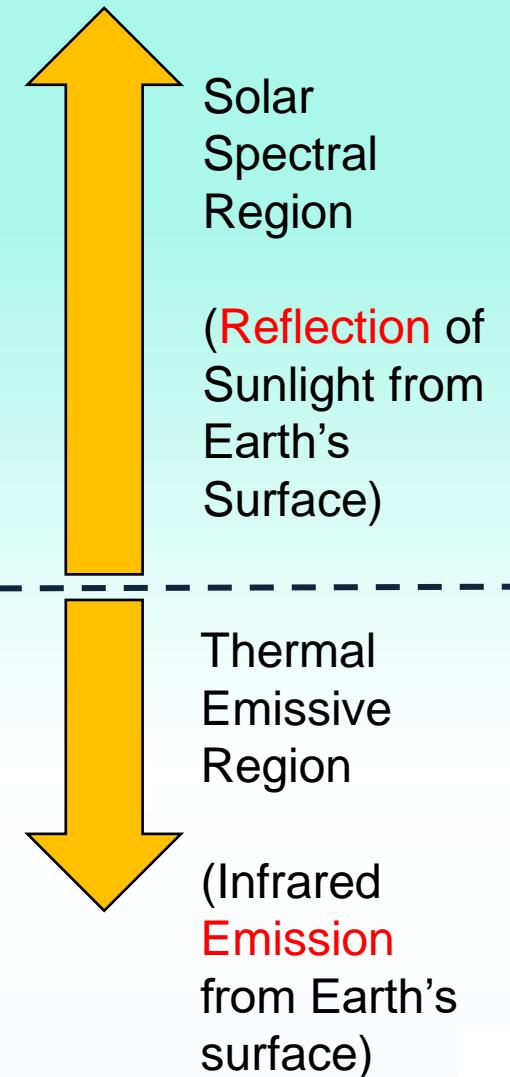
# Electromagnetic Spectrum



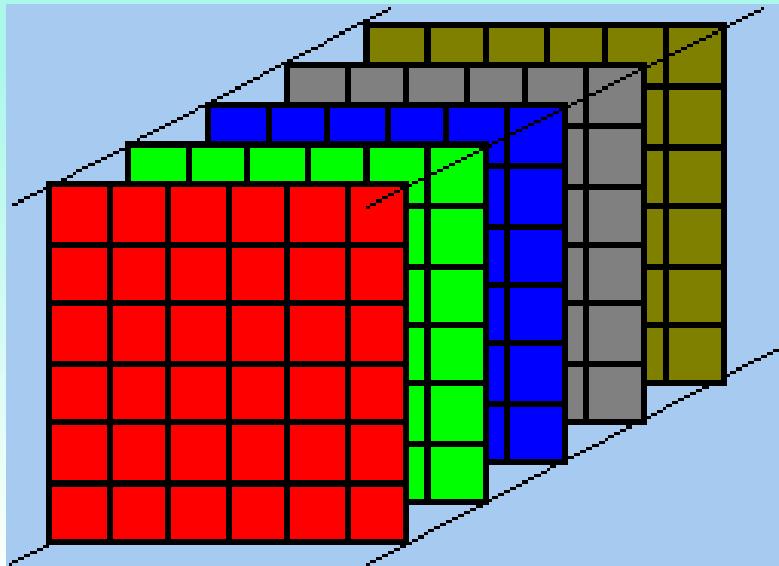
The electromagnetic spectrum can be divided into several wavelength (frequency) regions, among which only a narrow band from about 400 to 700 nm is visible to the human eyes. Note that there is no sharp boundary between these regions. The boundaries shown in the above figures are approximate and there are overlaps between the adjacent regions.

# Visible and Infrared Bands

- **Visible Light:** 400 nm to 700 nm
    - **Blue:** 400 – 500 nm
    - **Green:** 500 – 600 nm
    - **Red:** 600 – 700 nm
  - **Infrared:** 0.7 to 300  $\mu\text{m}$ 
    - **Near Infrared (NIR):** 0.7 to 1.5  $\mu\text{m}$ .
    - **Short-Wave Infrared (SWIR):** 1.5 to 3  $\mu\text{m}$ .
- 
- **Mid-Wave Infrared (MWIR):** 3 to 8  $\mu\text{m}$ .
  - **Long Wave Infrared (LWIR):** 8 to 15  $\mu\text{m}$ .
  - **Far Infrared (FIR):** longer than 15  $\mu\text{m}$ .



# Multispectral Image

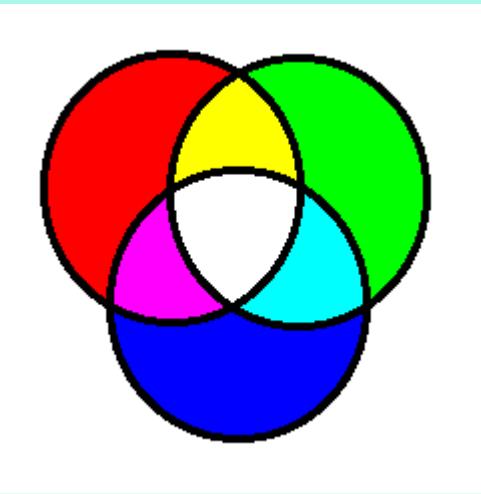


A multispectral image consists of a few image layers stacked together. Each layer represents an image acquired at a particular spectral band.

For example, a digital camera acquire images in three visible bands: Red, Green and Blue (RGB). In this case, each pixel of a picture has three intensity values corresponding to the three bands.

Satellite sensors usually acquire images in many more bands, beyond the visible to the NIR, SWIR and also thermal IR bands.

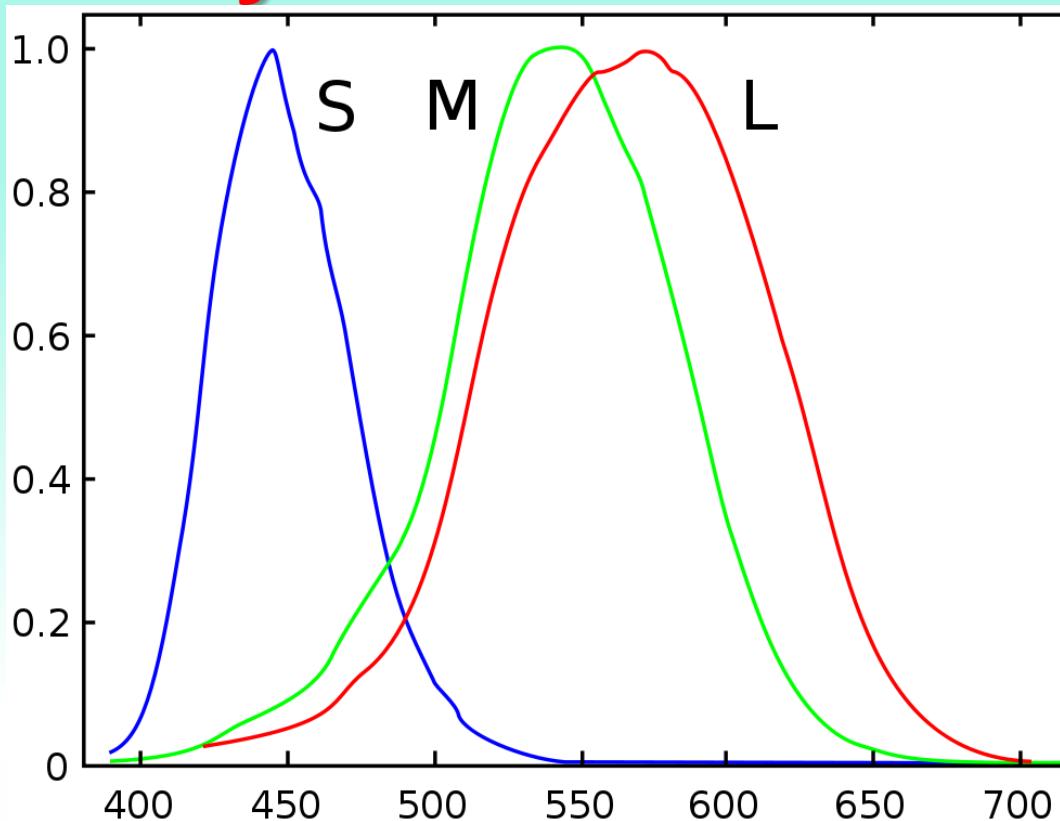
# RGB Display Colour Space



- Our eyes have three types of colour sensors (known as the “cones”) and one type of intensity sensor (the “rods”). The cones are sensitive to three spectral regions (Red, Green, Blue).
- Three primary colours (RGB) are sufficient to generate most of the perceivable colours.

**A colour display system consists of 3 display channels: R, G and B; each channel displays its respective colour component.**

# Color sensitivity of cone cells



Normalized typical human cone cell responses (S, M, and L or ‘blue’, ‘green’ and ‘red’ types) to monochromatic spectral stimuli  
Source: Wikipedia (Color)

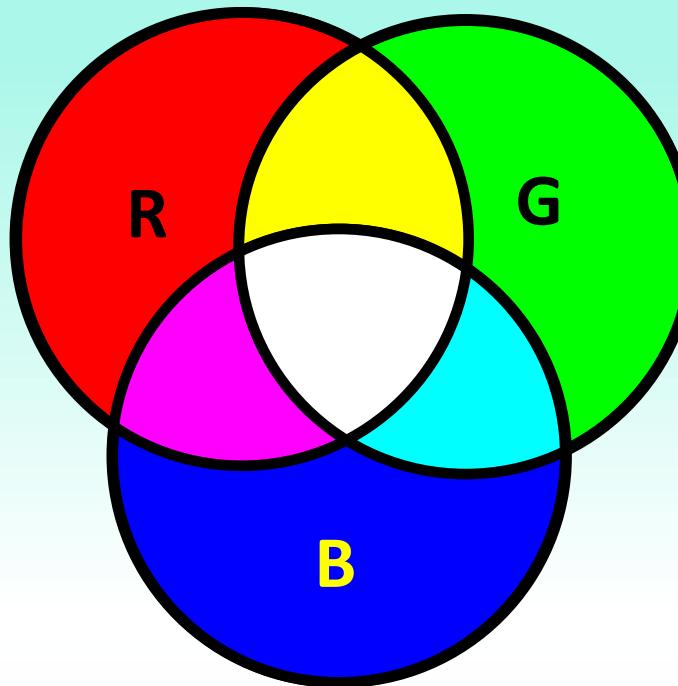
# Additive Color Space (RGB)

## Primary Colors

Red

Green

Blue



White, Grey ( $R + G + B$ )

## Secondary Colors

Yellow ( $R + G$ )

Cyan ( $G + B$ )

Magenta ( $B + R$ )

# Colour Image



# Colour Image – Red Component



# Colour Image – Green Component



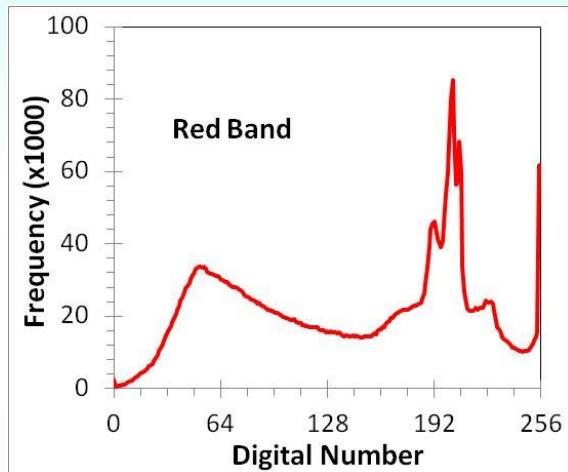
## Colour Image – Blue Component



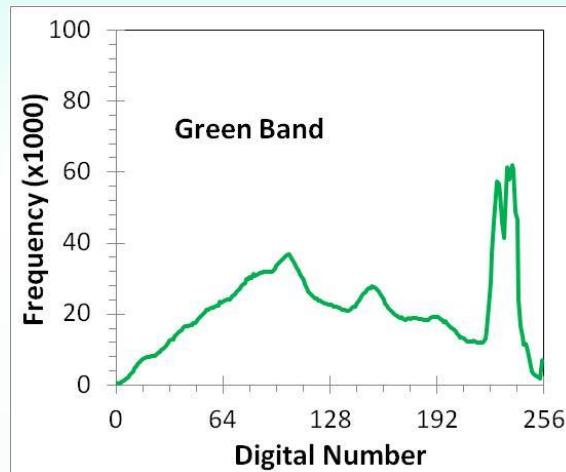
# R, G, B components



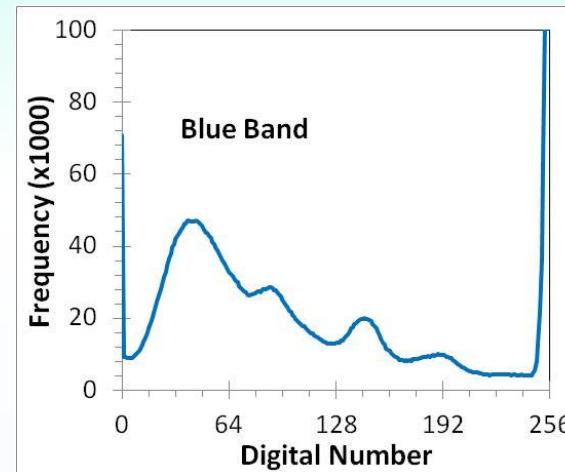
Red Band



Green Band



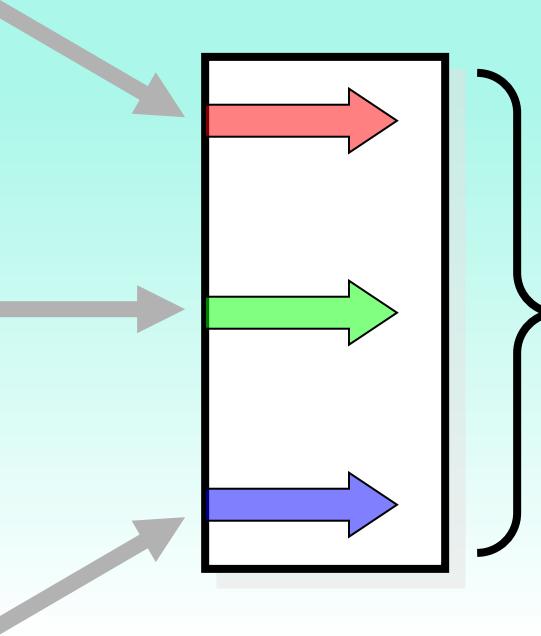
Blue Band



# True Colour Display



Input Image Channels



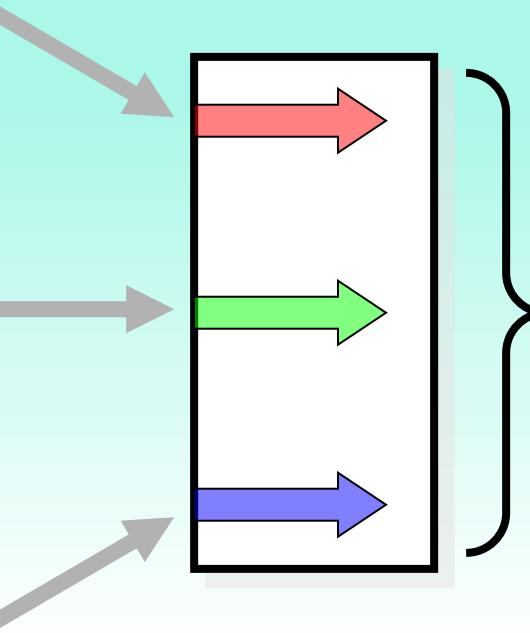
Colour Display Output

But you don't need to always follow  
the conventional colour display scheme!

# False Colour Display



Input Image Channels



Display Channels

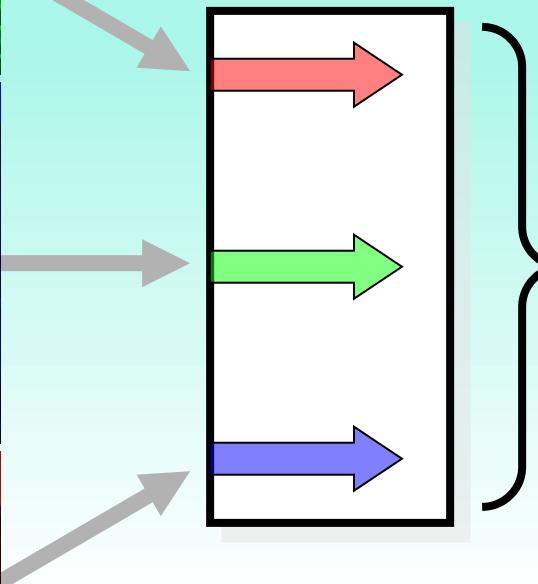


Colour Display Output



Input Image Channels

# Another False Colour Display

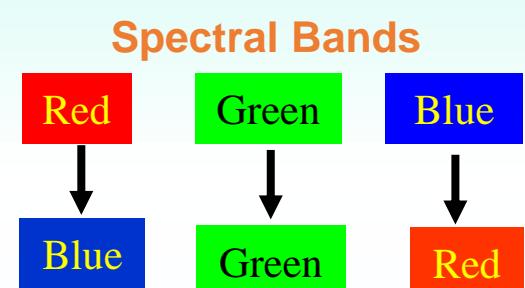
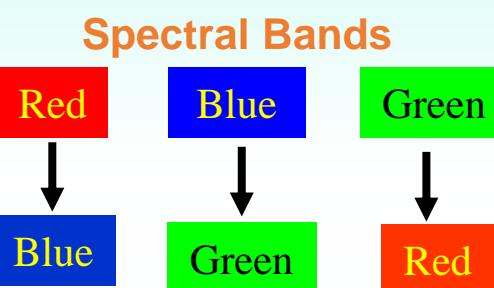
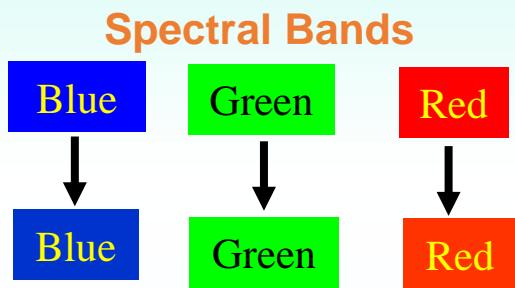


Display Channels



Colour Display Output

# Different Colour Display Schemes



Display Channels

Display Channels

Display Channels

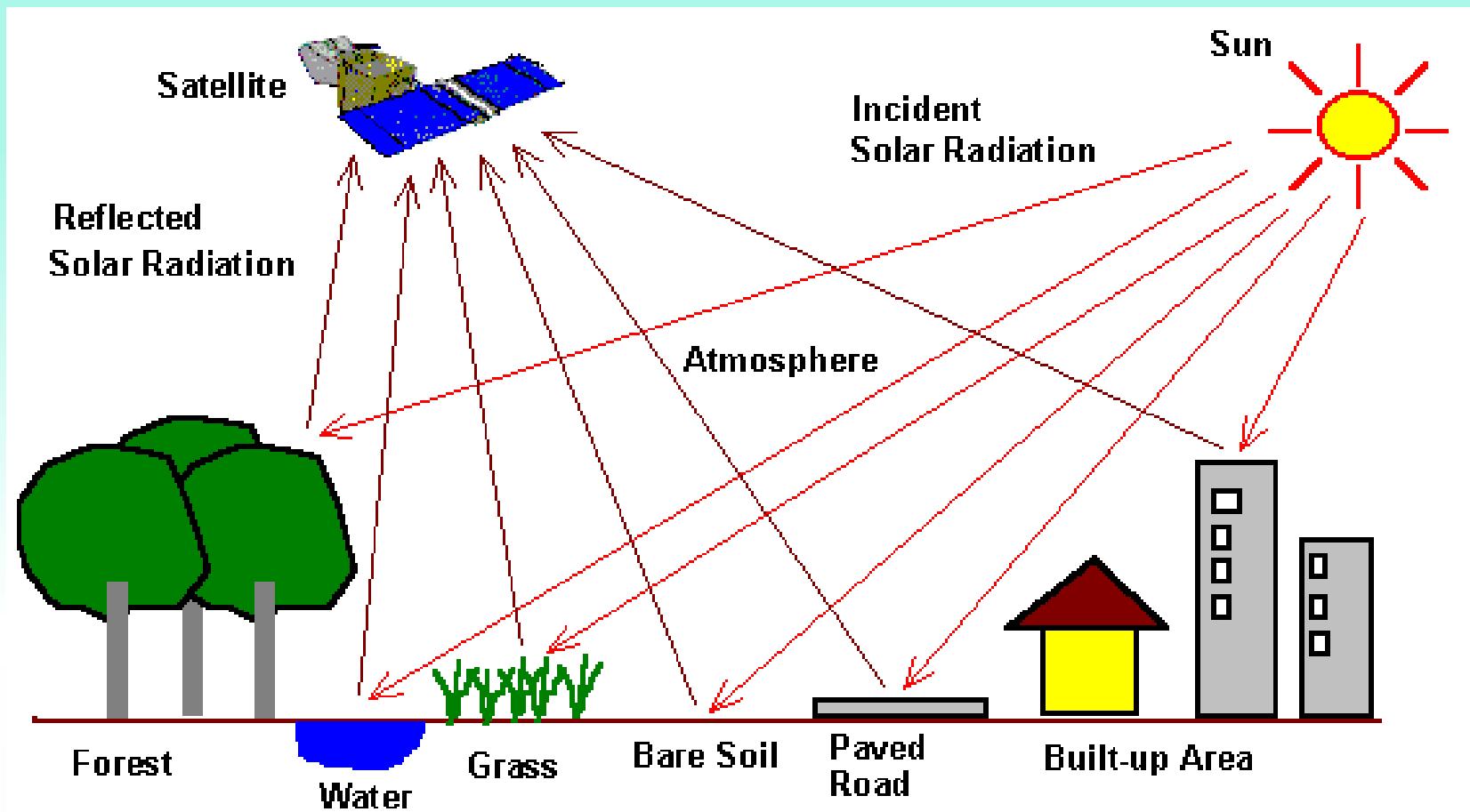
**What information can we get  
from satellite images?**

# **Three main types of remote sensing systems**

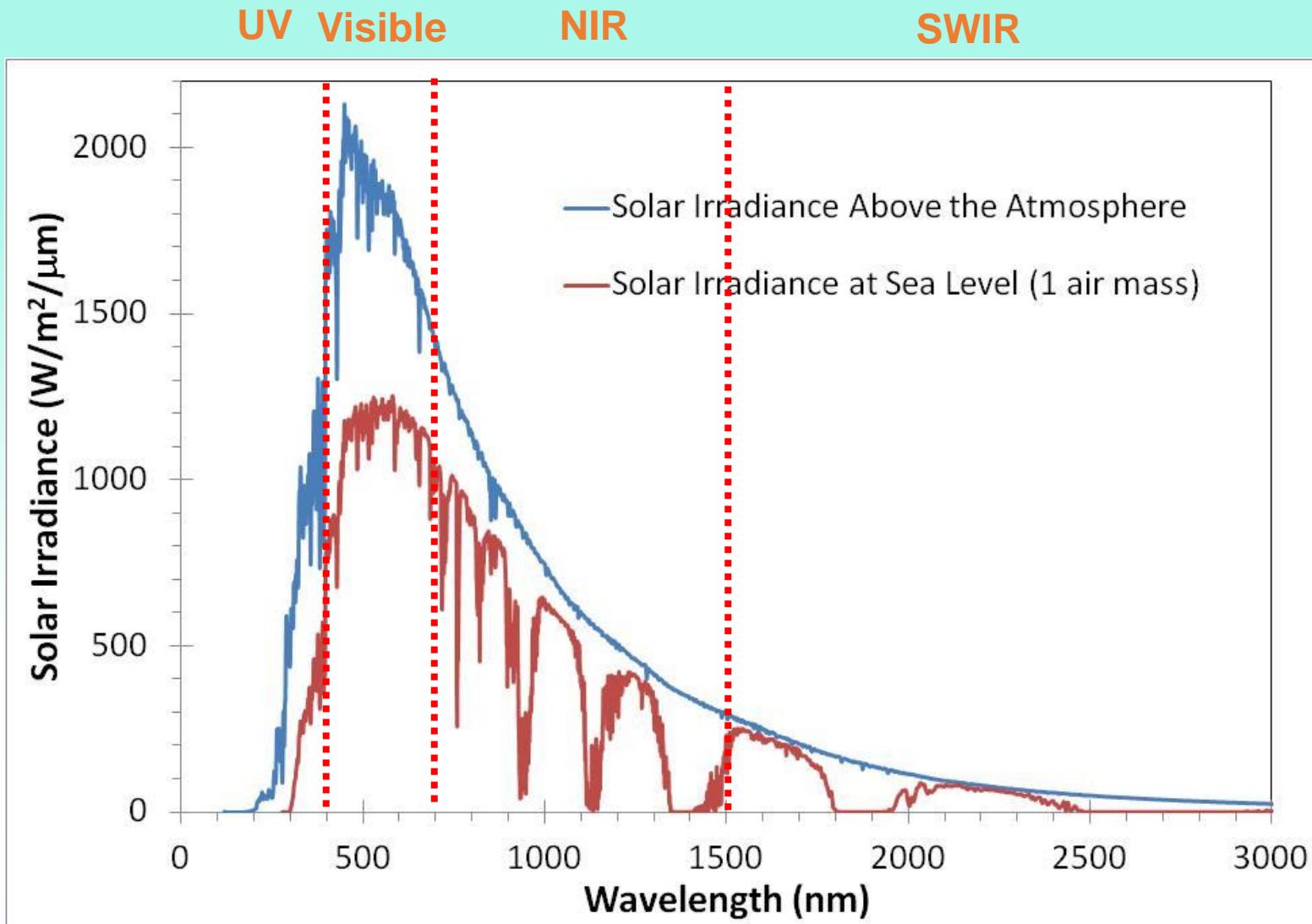
- Optical Remote Sensing
  - Reflection of sun light from earth's land and ocean surfaces and the atmosphere
  - Visible light – Near Infrared – Shortwave Infrared
- Thermal Remote Sensing
  - Emission of thermal infrared by warm objects
- Microwave Remote Sensing
  - Passive microwave emission
  - Active radar

There are also other types of remote sensing systems, using specialized sensors for specific applications.

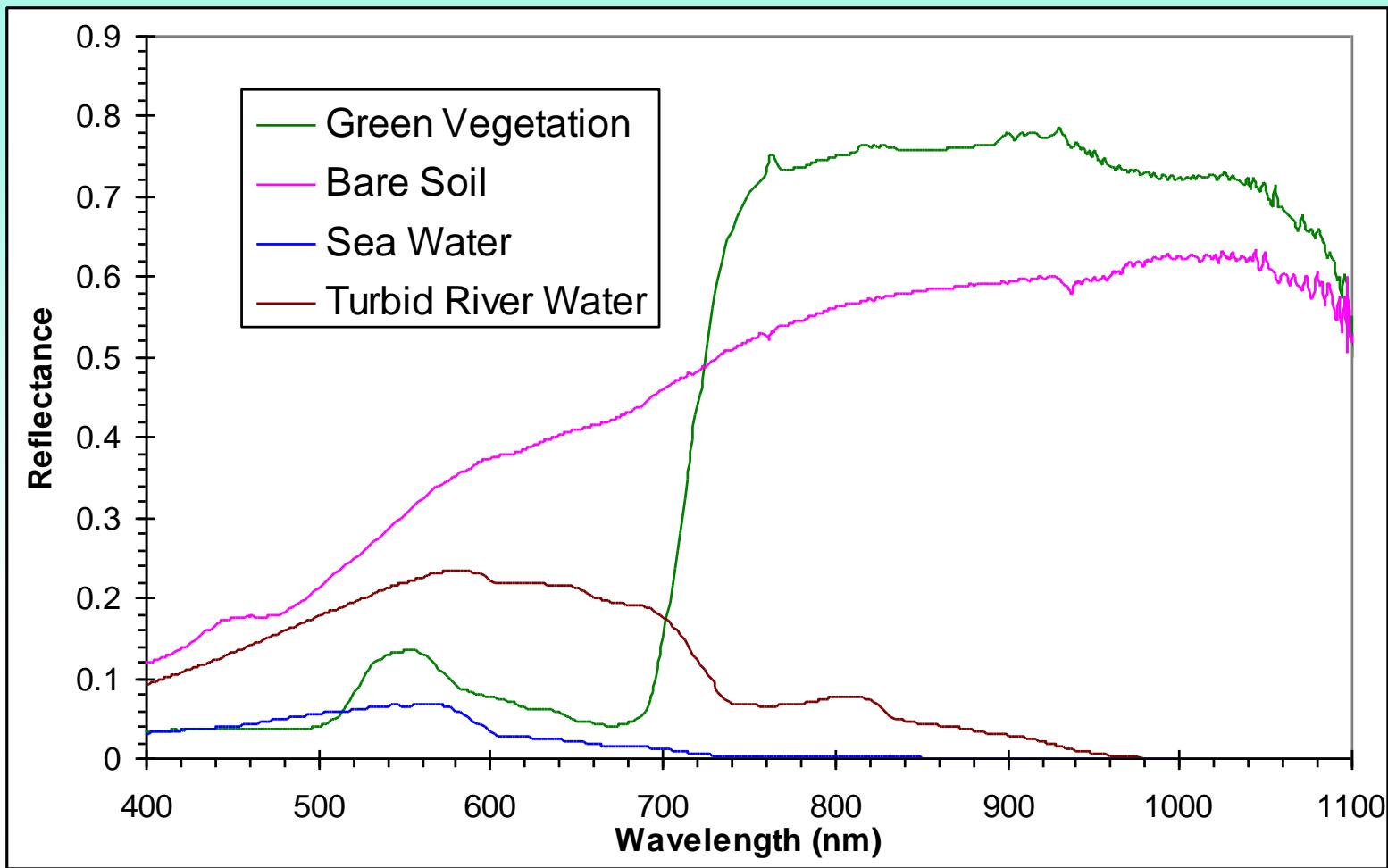
# Optical Remote Sensing



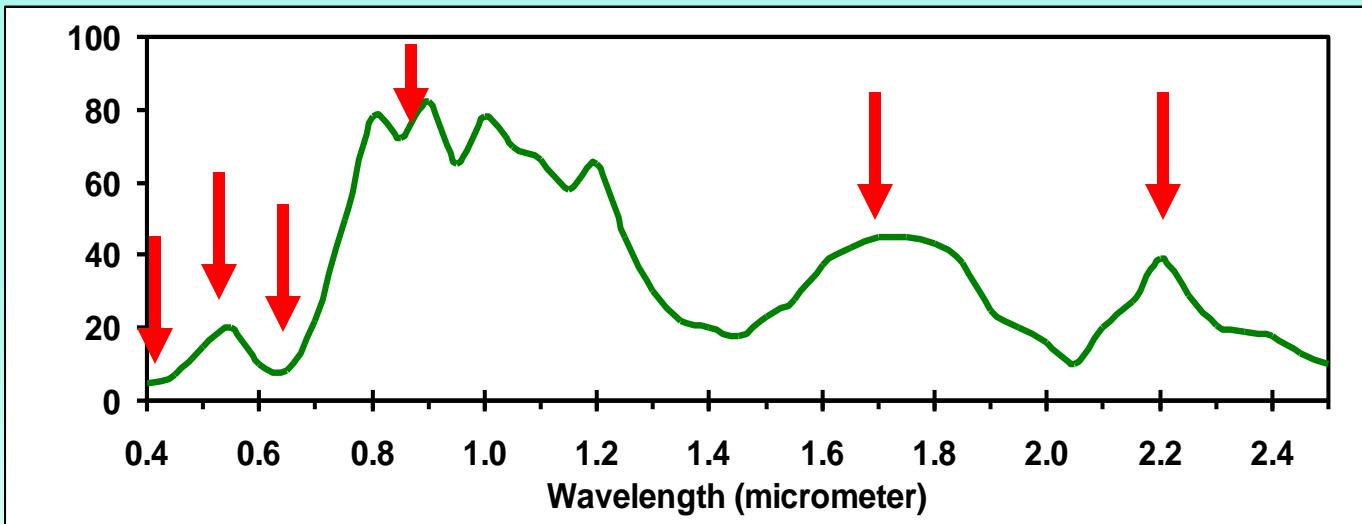
# Solar Spectrum



# Typical reflectance signatures of some land cover types



# Vegetation Spectral Response



- Blue - Strong absorption by chlorophyll
- Green - Max. reflectance in visible band  
Relatively insensitive to chlorophyll
- Red - Second absorption peak of chlorophyll
- NIR - Strong reflectance due to cellular structure
- SWIR - Sensitive to water content



Landsat 4

Band 1  
(Blue)

Grey Scale  
Display



Landsat 4

Band 2  
(Green)

Grey Scale  
Display



Landsat 4

Band 3  
(Red)

Grey Scale  
Display



Landsat 4

Band 4  
(NIR)

Grey Scale  
Display



Landsat 4

Band 5  
(SWIR  
 $1.6 \mu\text{m}$ )

Grey Scale  
Display



Landsat 4

Band 7  
(SWIR  
 $2.2 \mu\text{m}$ )

Grey Scale  
Display



Landsat 4

True Color  
Image

R → Red  
G → Green  
B → Blue



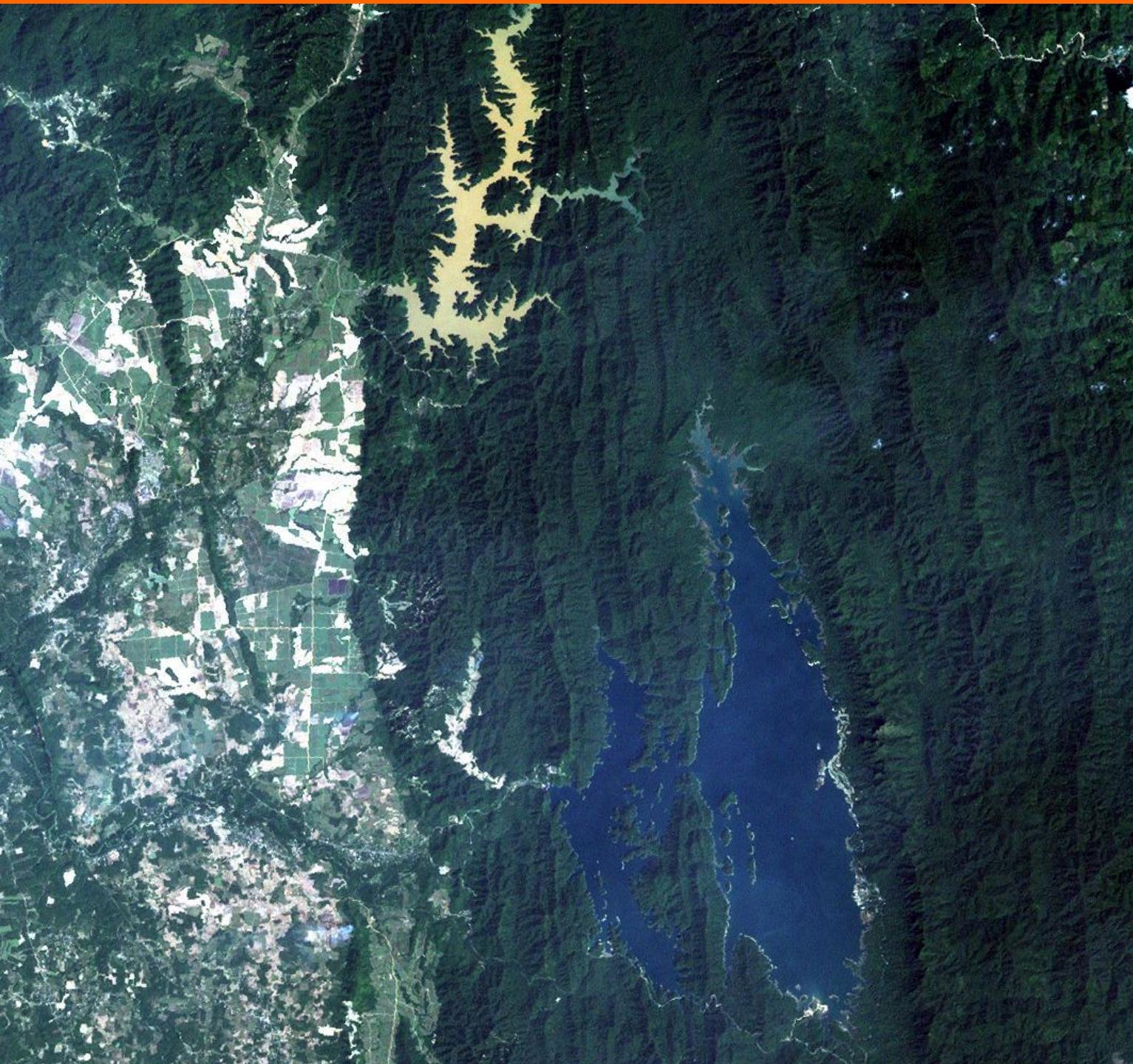
Landsat 4  
False Color  
Image  
R → NIR  
G → Red  
B → Green



Landsat 4

False Color  
Image

R → SWIR  
G → NIR  
B → Red

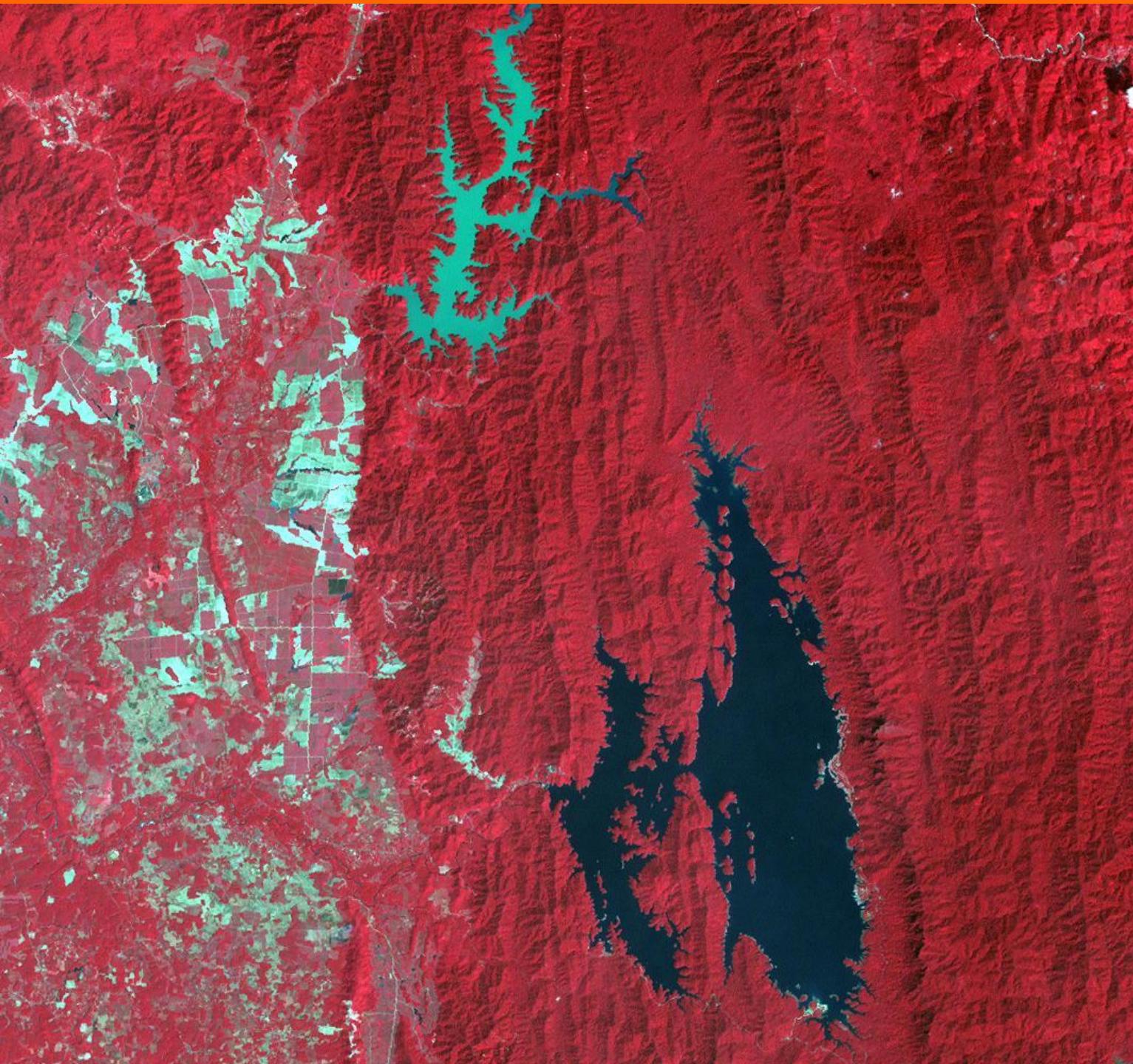


Landsat 7

2002-01-17  
Pedu Lake

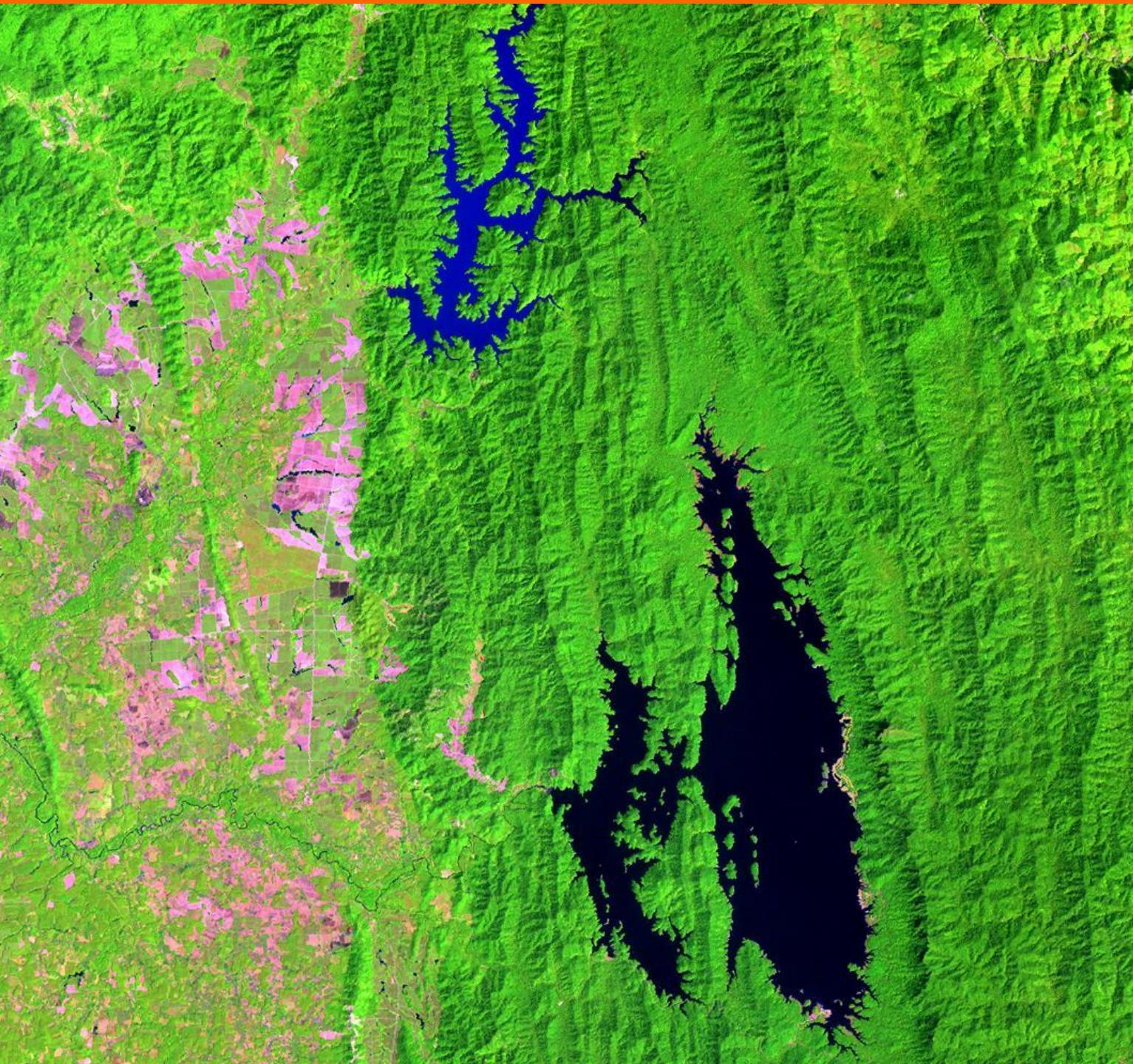
True Color  
Image

R → Red  
G → Green  
B → Blue



Landsat 7  
2002-01-17  
Pedu Lake  
  
False Color  
Image

R → NIR  
G → Red  
B → Green



Landsat 7  
2002-01-17  
Pedu Lake  
False Color  
Image

R → SWIR  
G → NIR  
B → Red

Ikonos Image of fire near Kuala Lumpur,  
17 Feb 2002, True colour Image



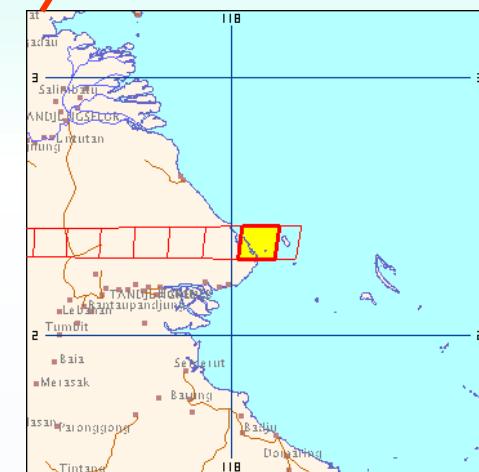
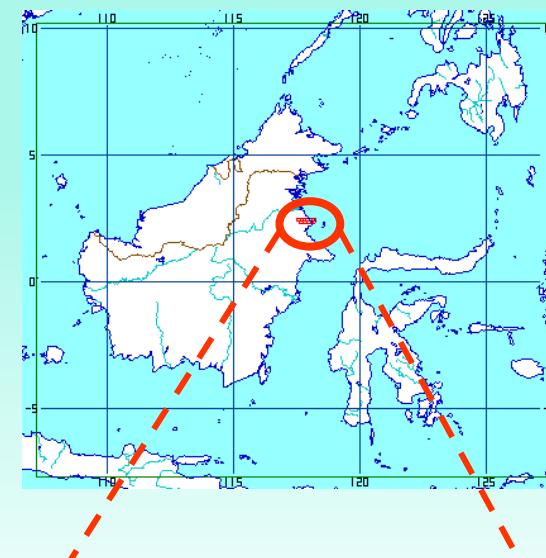
Ikonos Image of fire near Kuala Lumpur, 17  
Feb 2002, False colour image  
(RGB = bands 432)



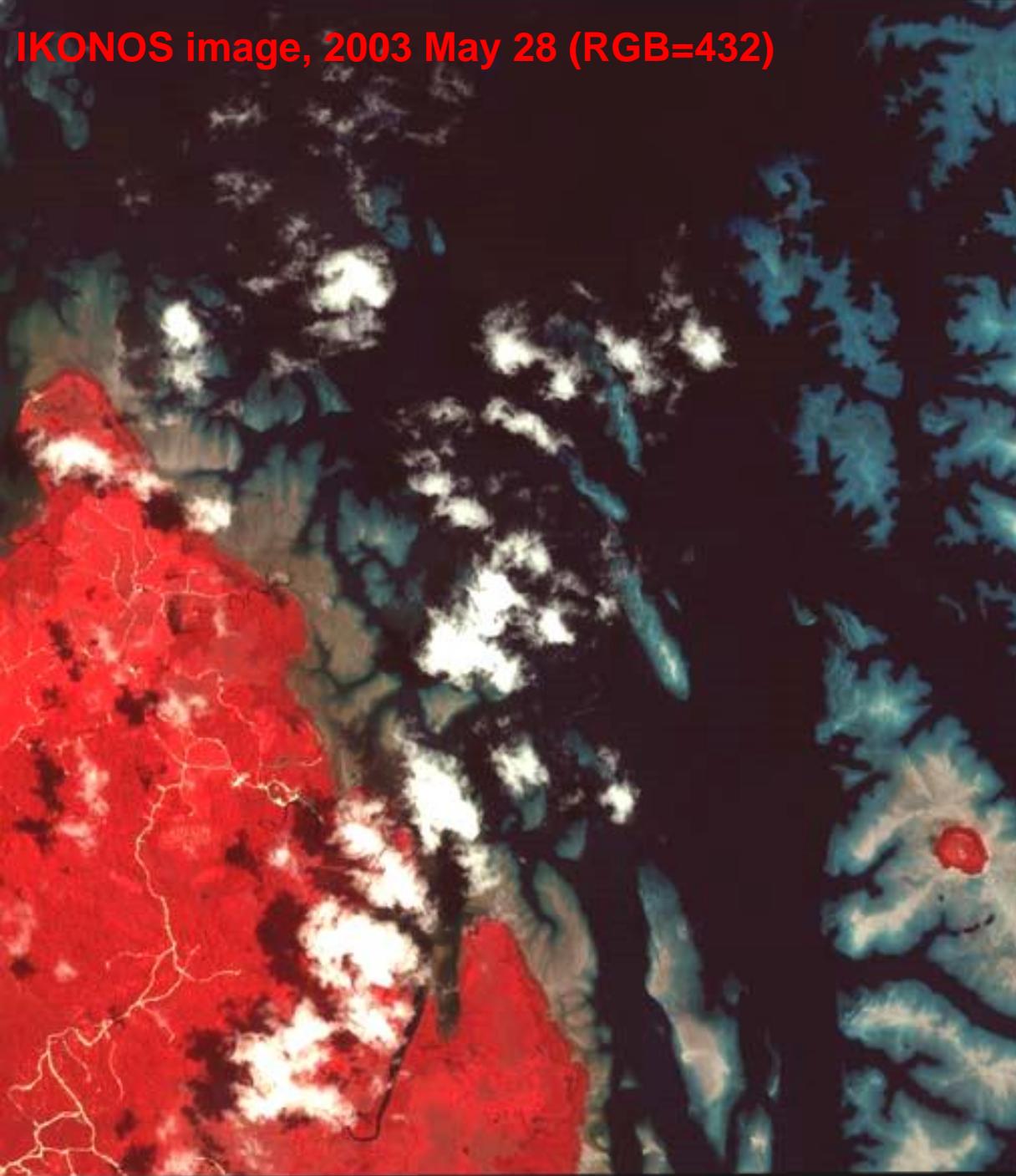
**IKONOS image, 2003 May 28 (RGB=321)**



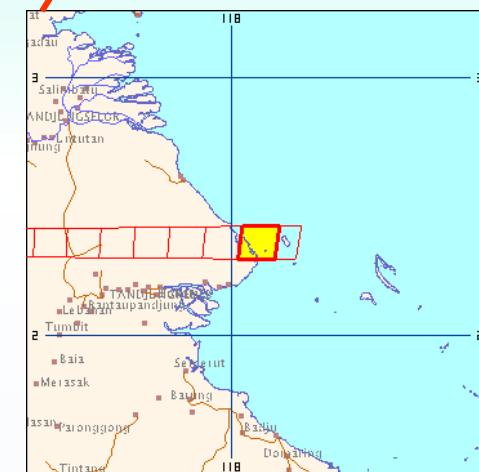
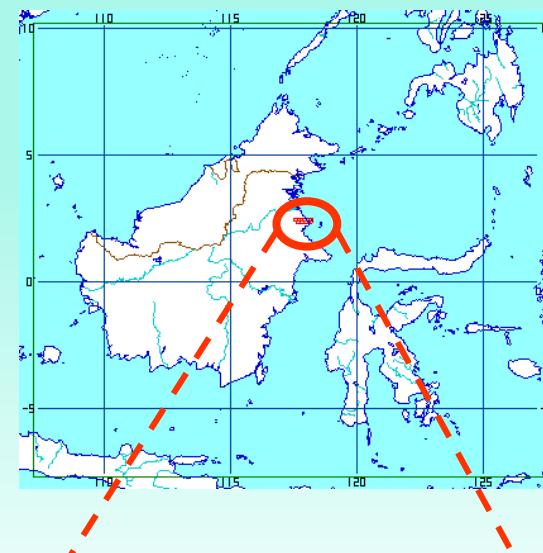
Which areas are under water? which areas are exposed above water?



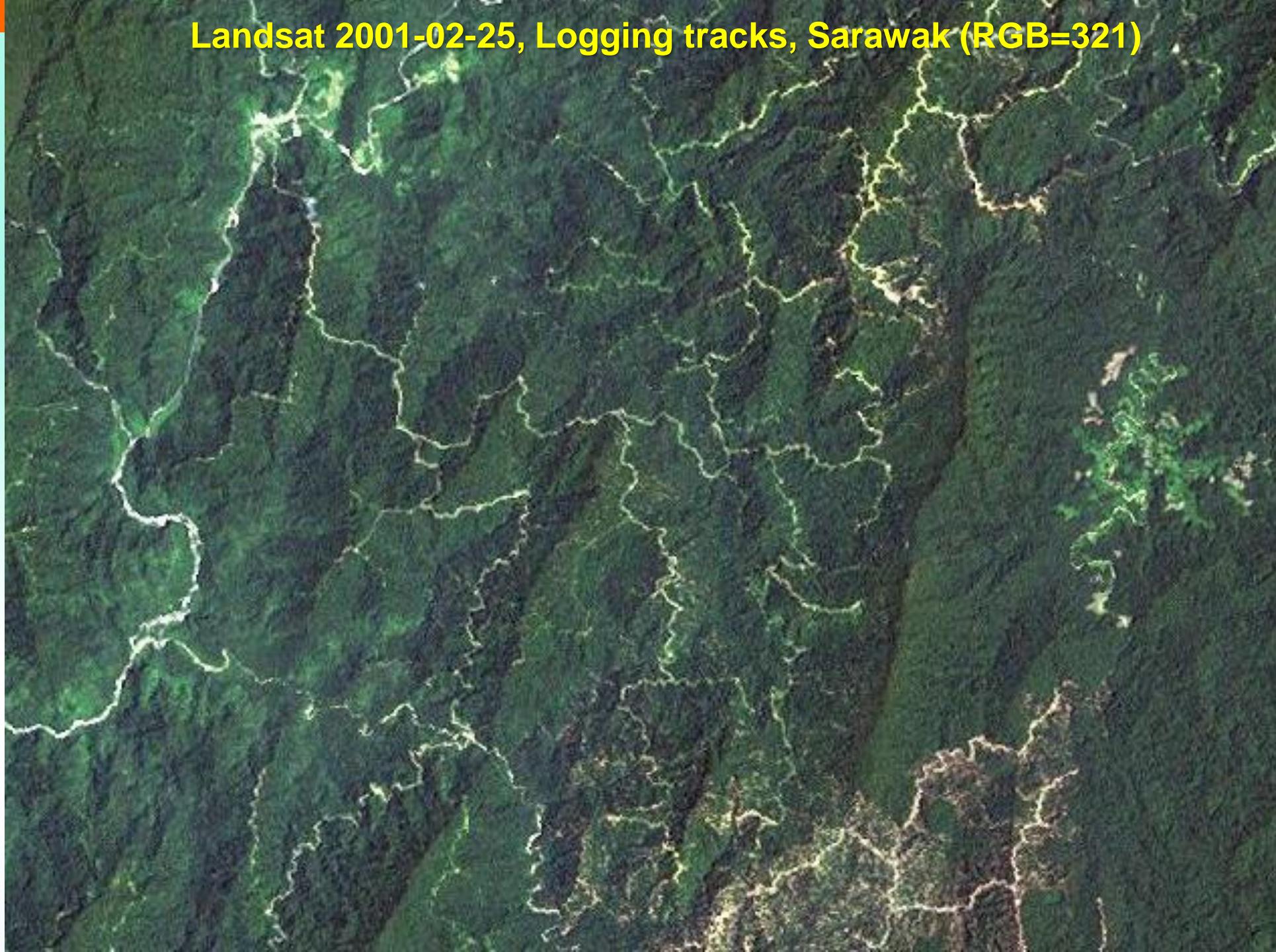
IKONOS image, 2003 May 28 (RGB=432)



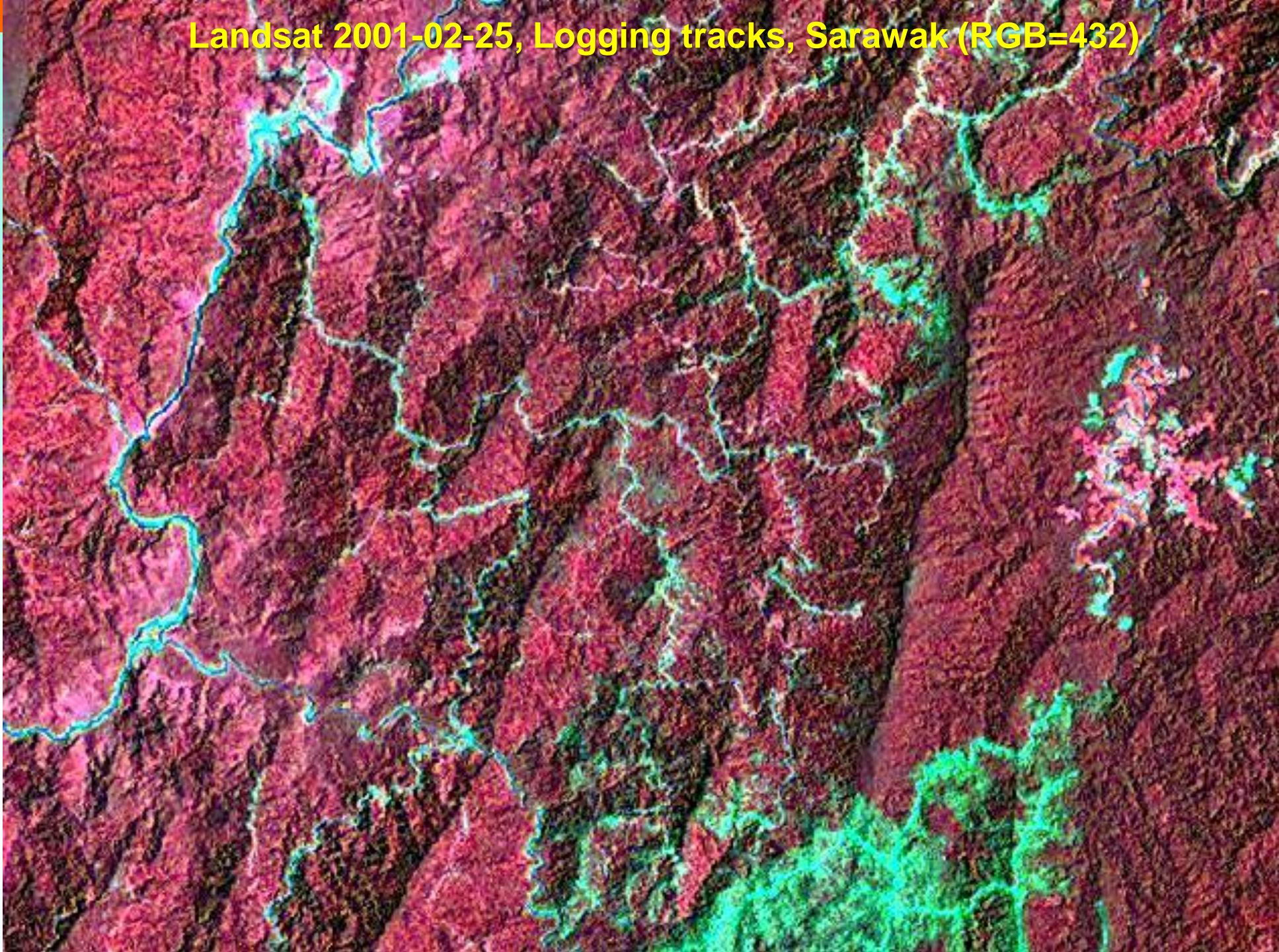
Which areas are under water? which areas are exposed above water?



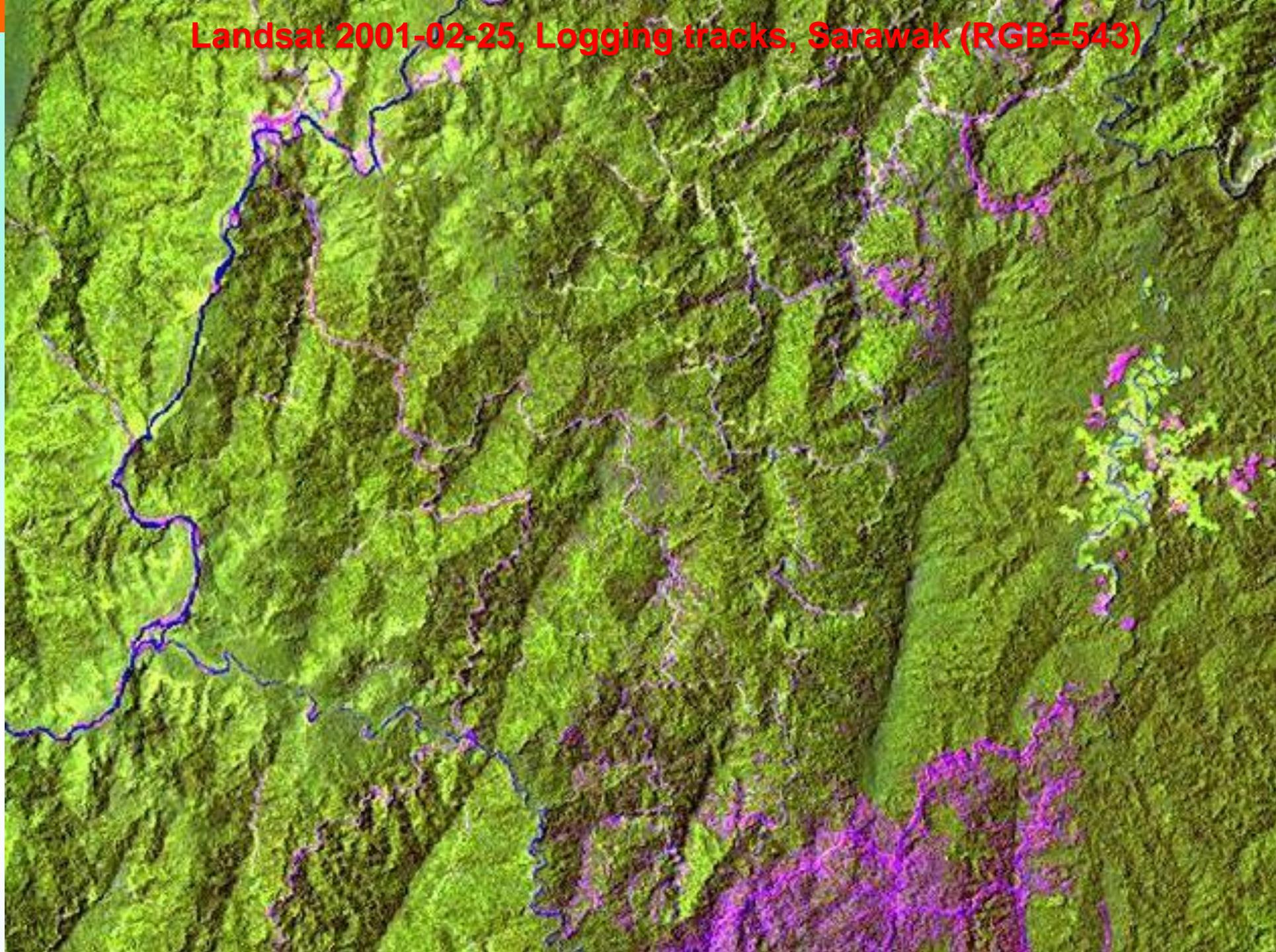
Landsat 2001-02-25, Logging tracks, Sarawak (RGB=321)



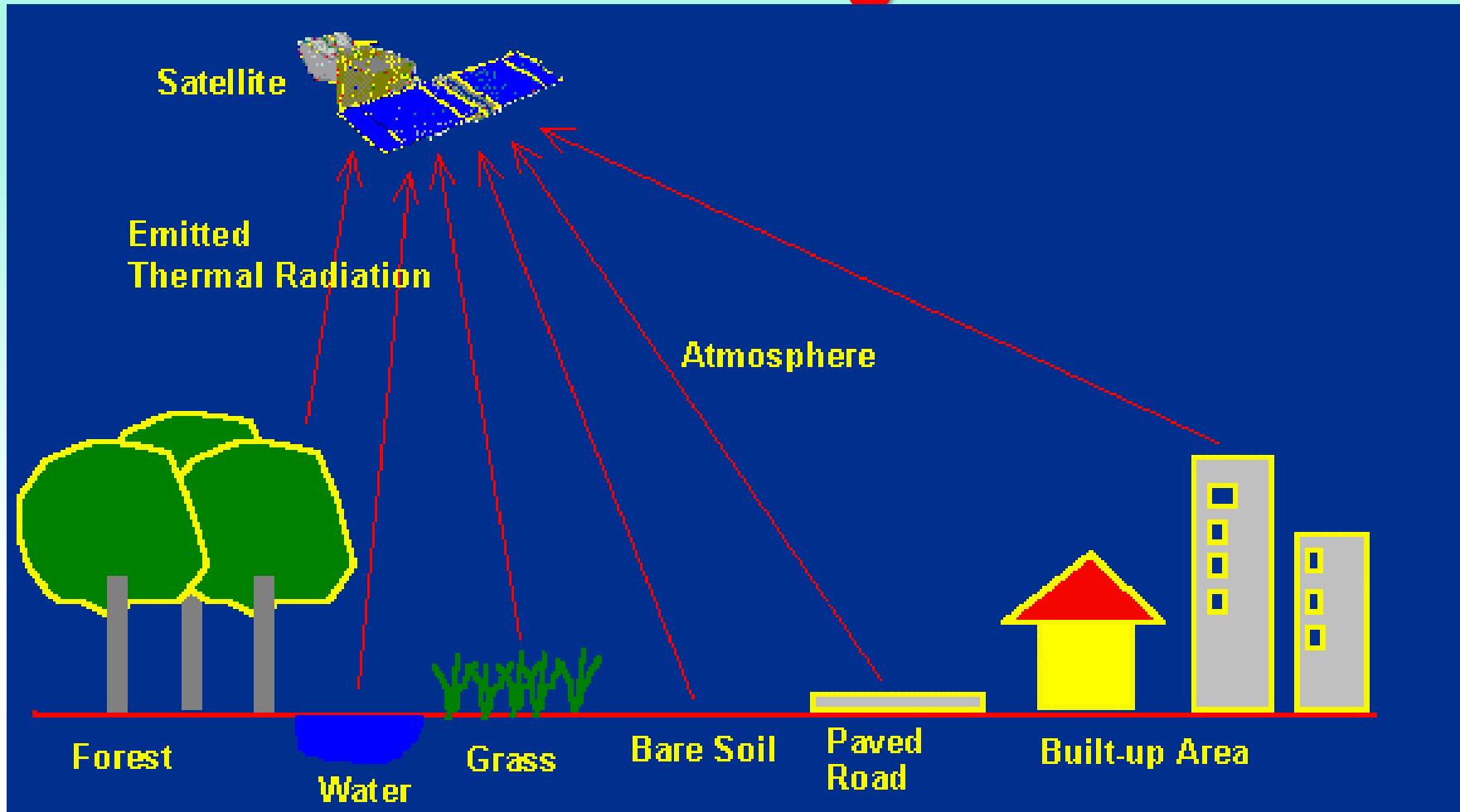
Landsat 2001-02-25, Logging tracks, Sarawak (RGB=432)



Landsat 2001-02-25, Logging tracks, Sarawak (RGB=543)

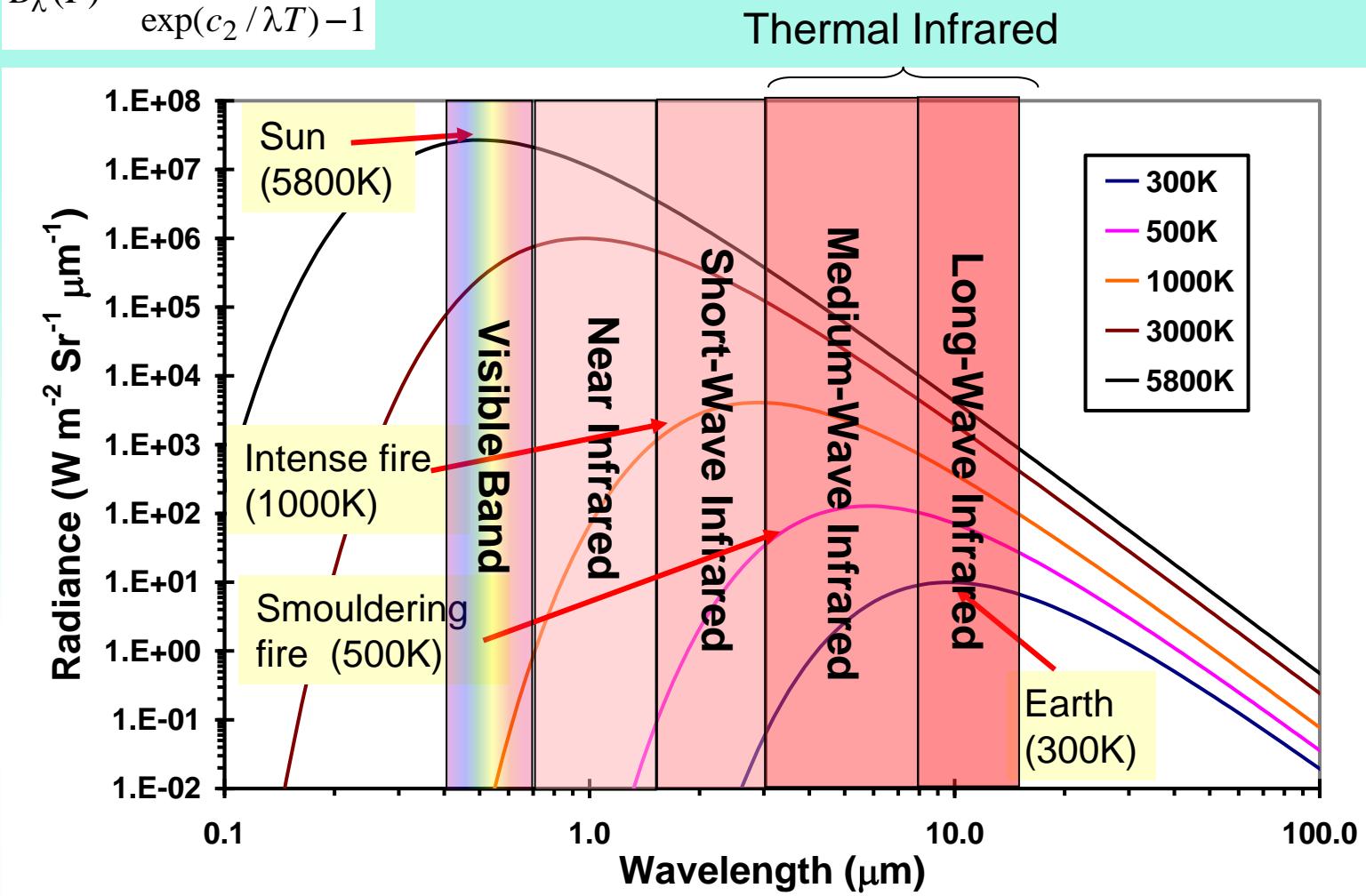


# Infrared Remote Sensing



# Thermal Emission

$$B_{\lambda}(T) = \frac{c_1 / \lambda^5}{\exp(c_2 / \lambda T) - 1}$$



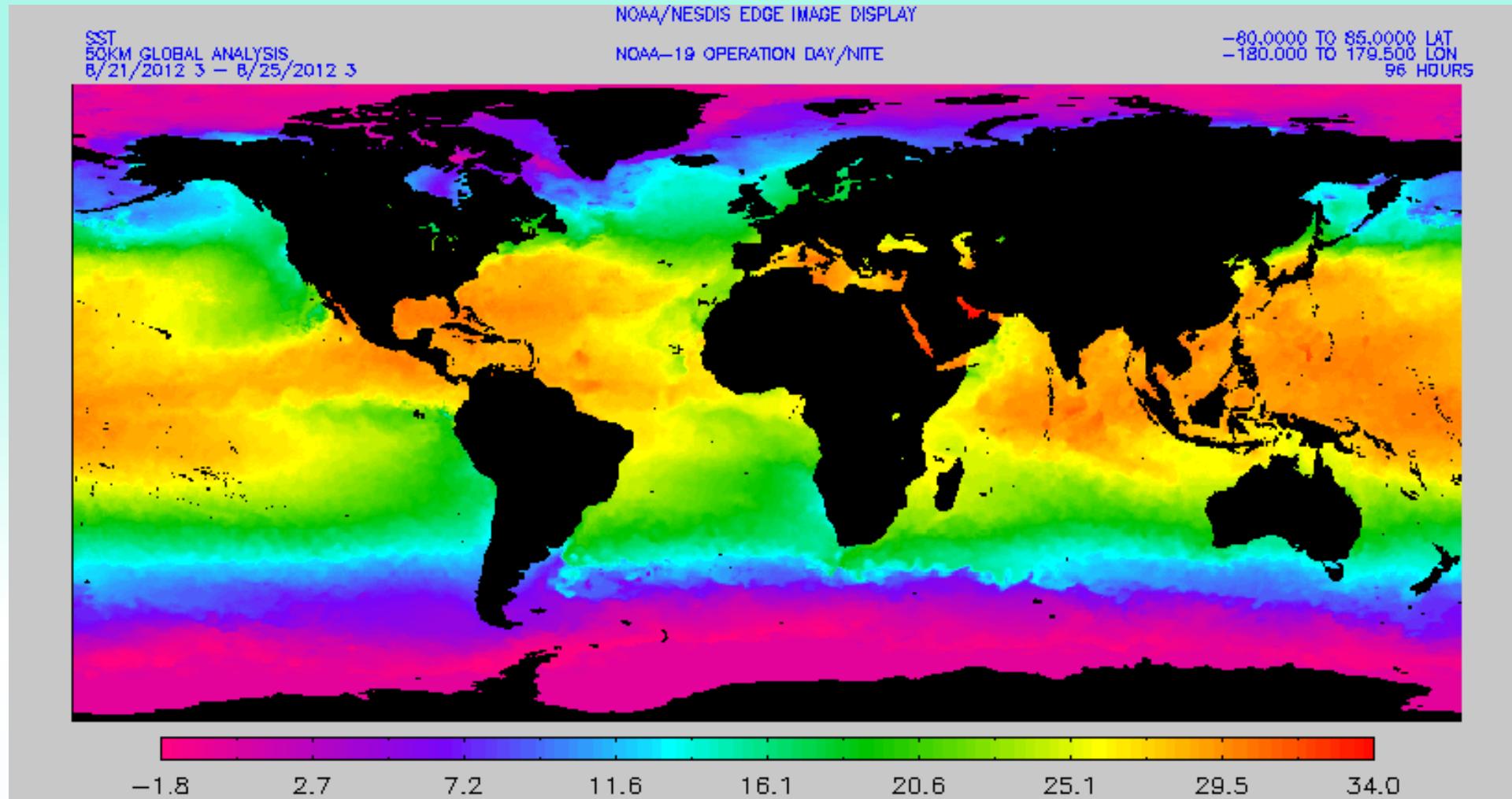


**MODIS**

**Fire hot spots  
and smoke  
plumes - Riau,  
Sumatra**

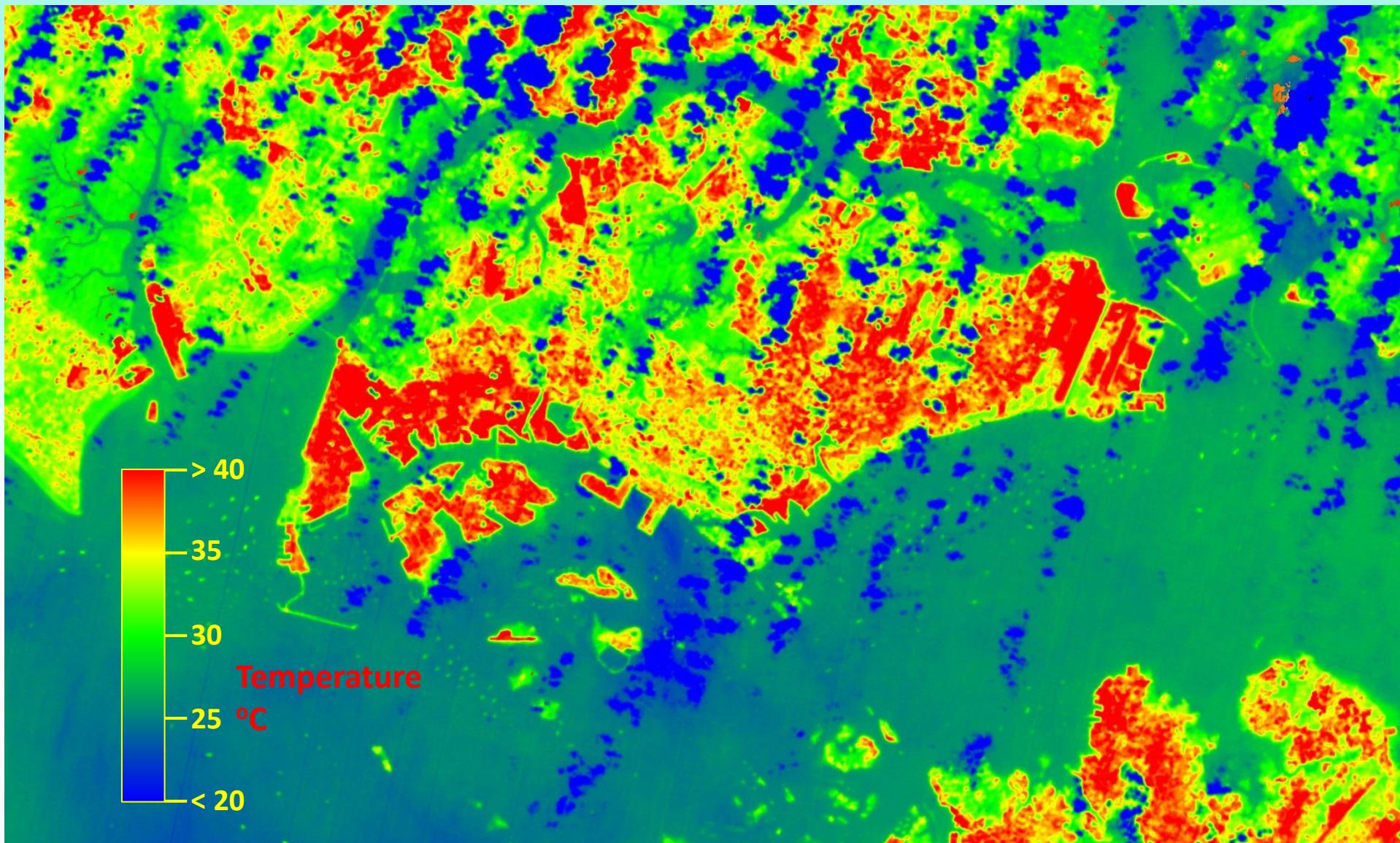
**25 June 2005  
03:55 UTC**

# Global Sea Surface Temperature



21 to 25 August 2012 (96 hours composite image) – NOAA National Climate Data Center

# Landsat 8 – Singapore (2014-02-22) Surface Temperature



# Landsat 8 – Singapore True Colour Image



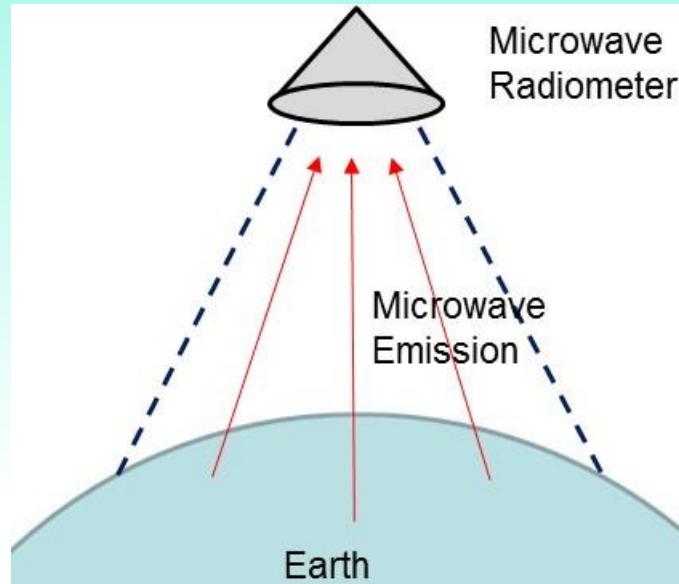
2014-02-22  
RGB true colour

# Some Applications of Thermal IR Remote Sensing

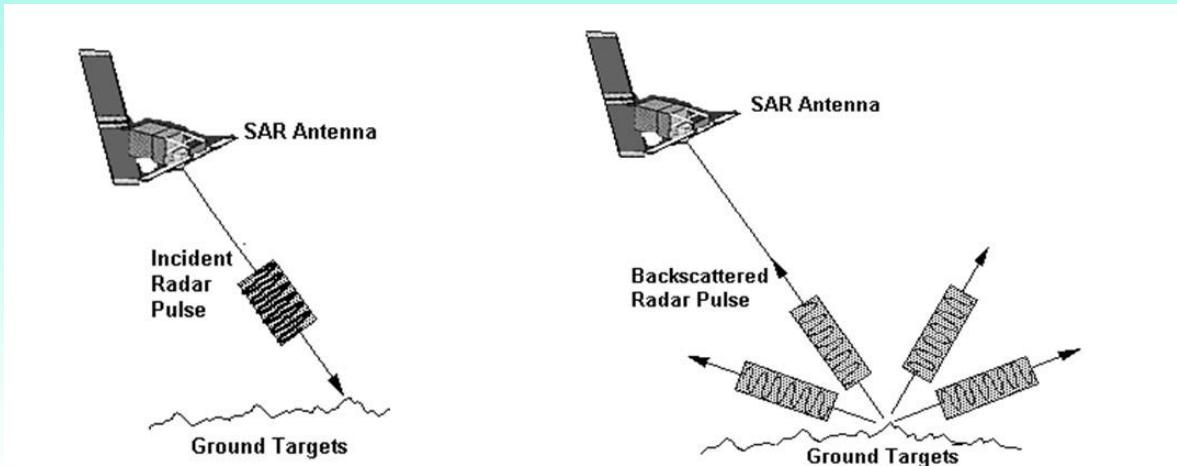
- Sea surface temperature
  - Global warming, El-Nino, La-Nina
- Atmospheric water vapour measurement and mapping
- Forest fires monitoring
- Volcanic activities
- Urban heat island effects

# Microwaves Remote Sensing

Passive



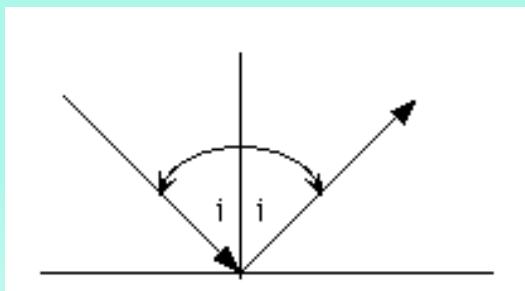
Active



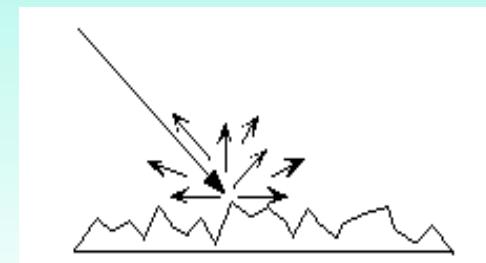
A radar pulse is transmitted from the antenna to the ground

The radar pulse is scattered by the ground targets back to the antenna.

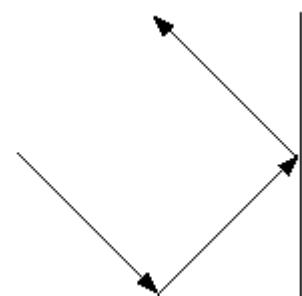
# Microwave scattering



A smooth surface acts like a mirror for the incident radar pulse. Most of the incident radar energy is reflected away according to the law of specular reflection. Very little energy is scattered back to the radar sensor. The surface appears dark.

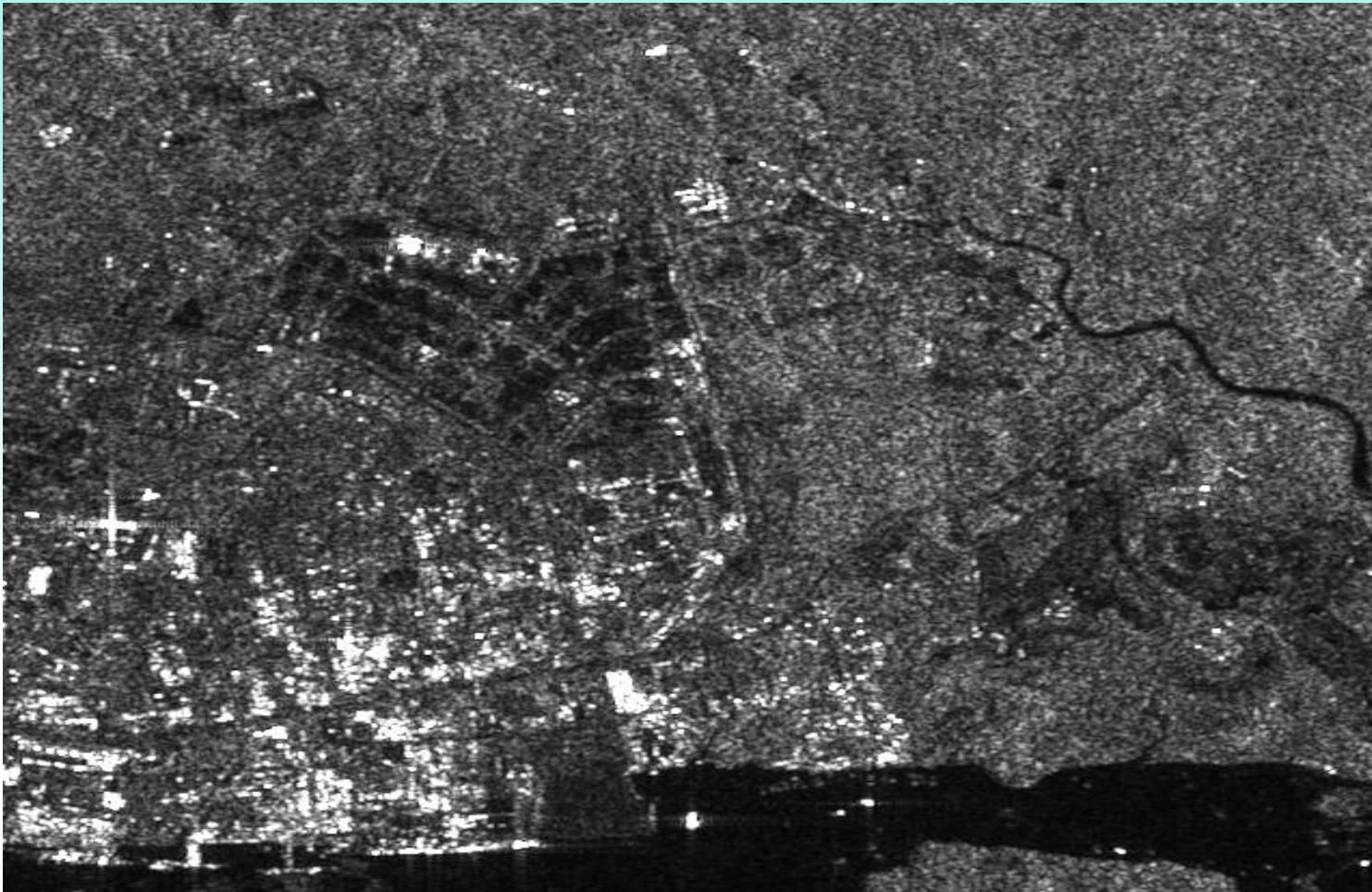


A rough surface reflects the incident radar pulse in all directions. Part of the radar energy is scattered back to the radar sensor. The surface appears bright.

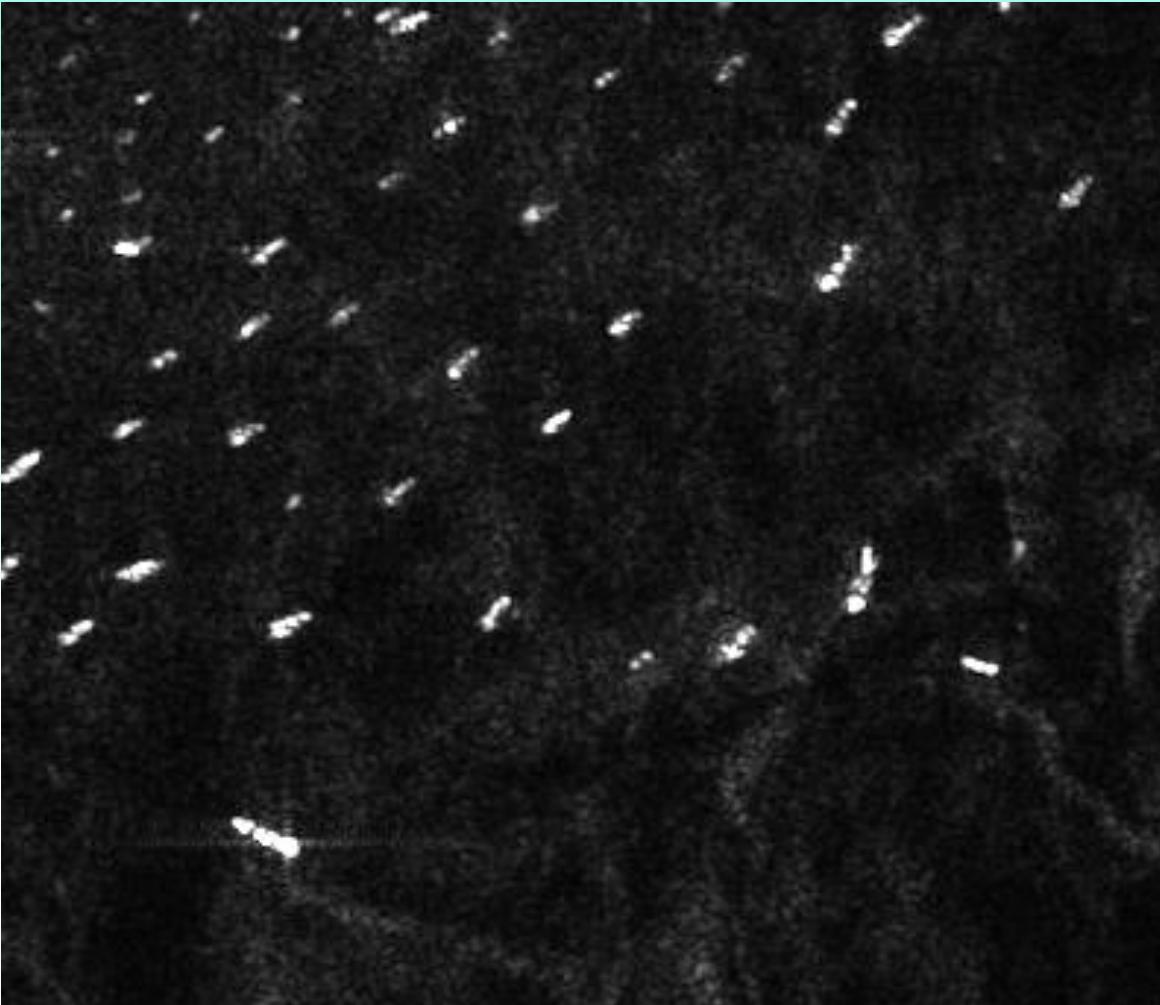


Corner Reflection: When two smooth surfaces form a right angle facing the radar beam, the beam bounces twice off the surfaces and most of the radar energy is reflected back to the radar sensor. The reflector appears very bright.

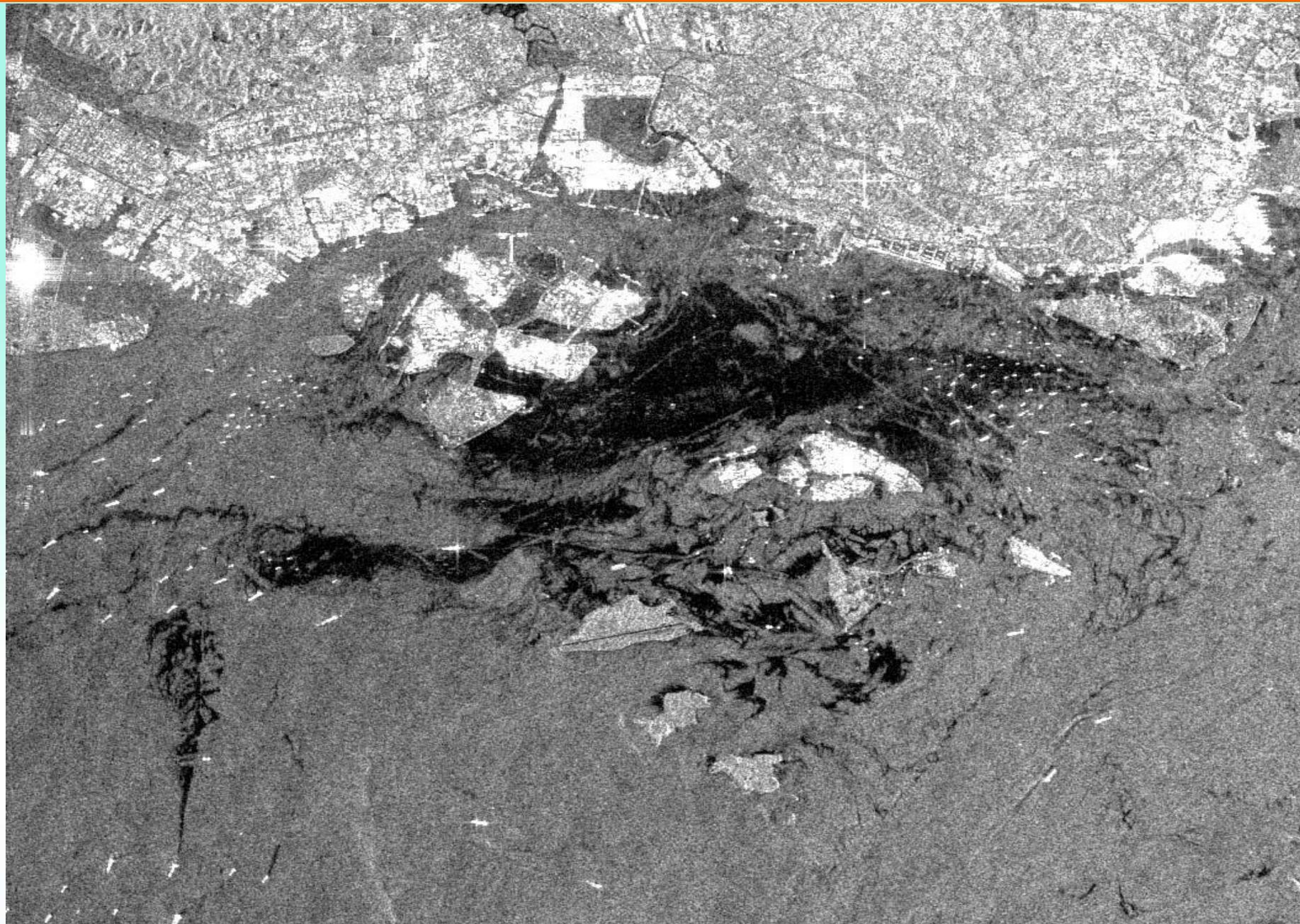
# A typical SAR scene



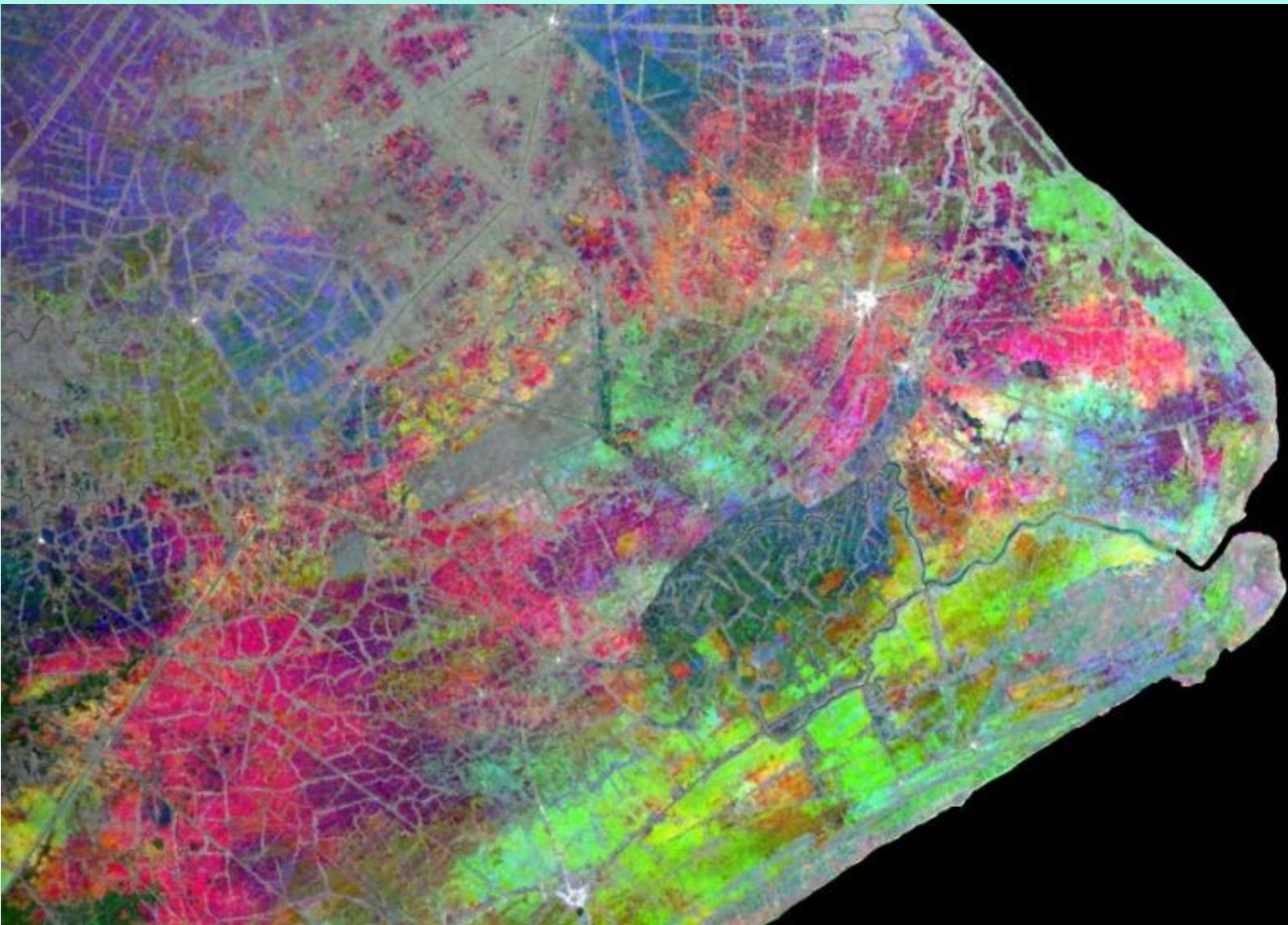
# Ships in a SAR image



Ships appear as bright targets against a dark background in this SAR image.



**Oil spill from Tanker Song San off west coast of Singapore in August 1996.**



Multitemporal composite SAR image of Mekong Delta, Vietnam

# Mapping Rice Crops in Mekong Delta Using ERS Multitemporal Synthetic Aperture Radar Data

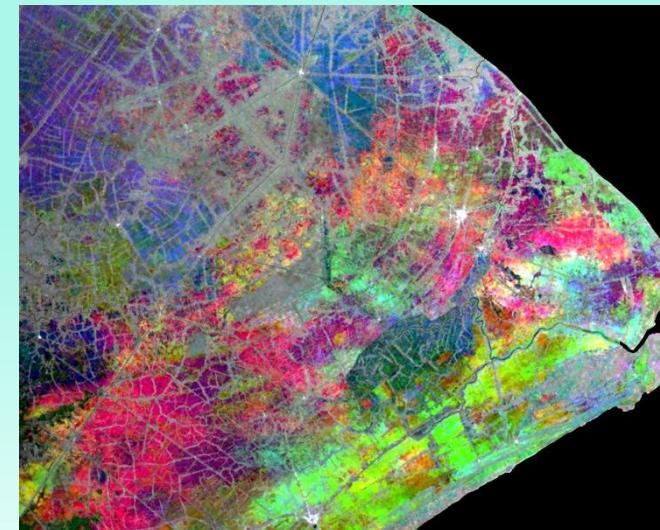
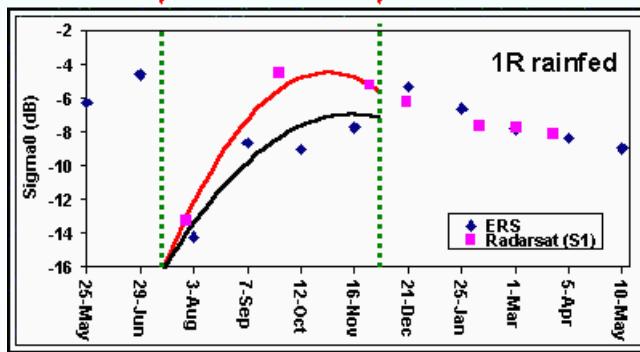


A pilot project in collaboration with International Rice Research Institute (IRRI) and University of Cantho, Vietnam



Planting      Harvesting

M Crop      Fallow Land



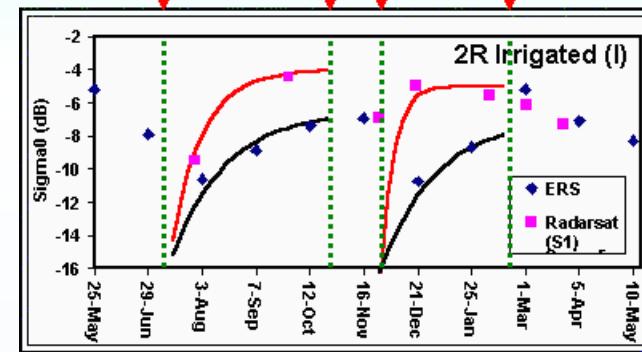
Harvesting      Harvesting

Planting

HT Crop

Planting

DX Crop

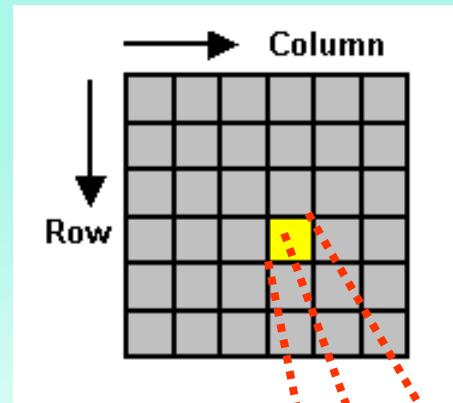


S. C. Liew, S. P. Kam, T. P. Tuong, P. Chen, V. Q. Minh, and H. Lim (1998), Application of multitemporal ERS-2 synthetic aperture radar in delineating rice cropping systems in the Mekong River Delta, Vietnam. *IEEE Trans. Geoscience and Remote Sensing*, 36(5) 1412-1420.

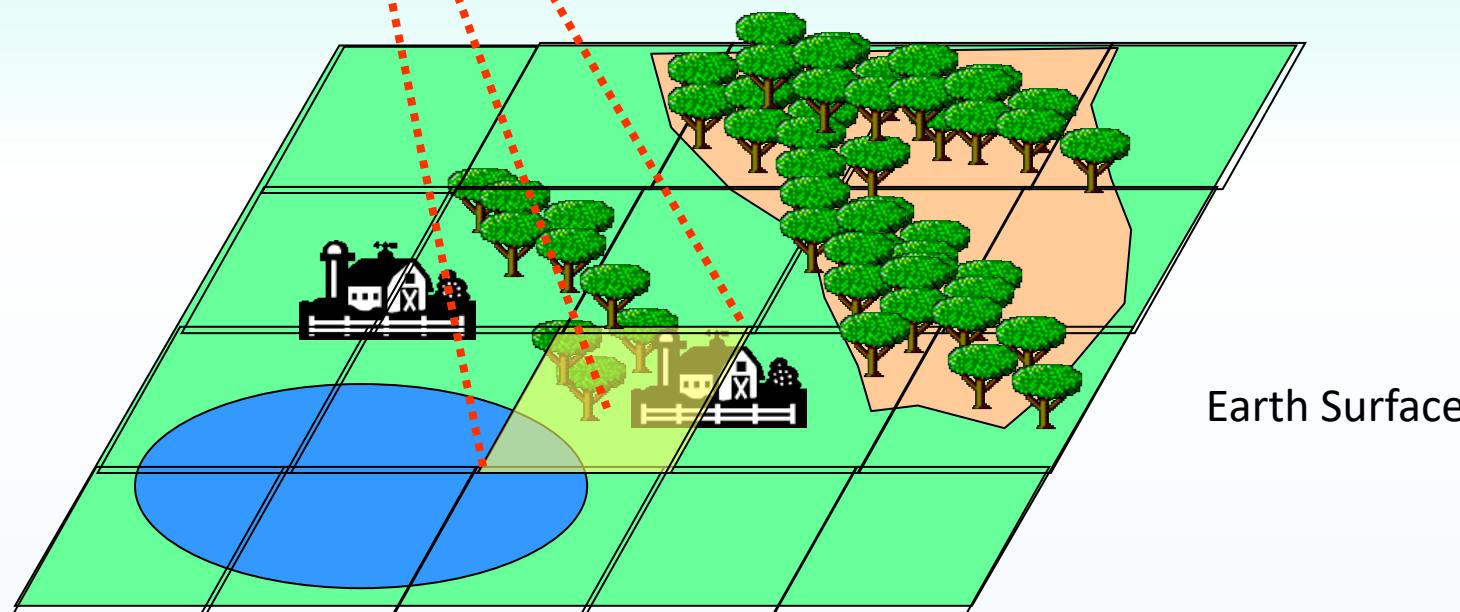
# **Some Characteristics of Digital Images**

# Digital Image

Digital Image

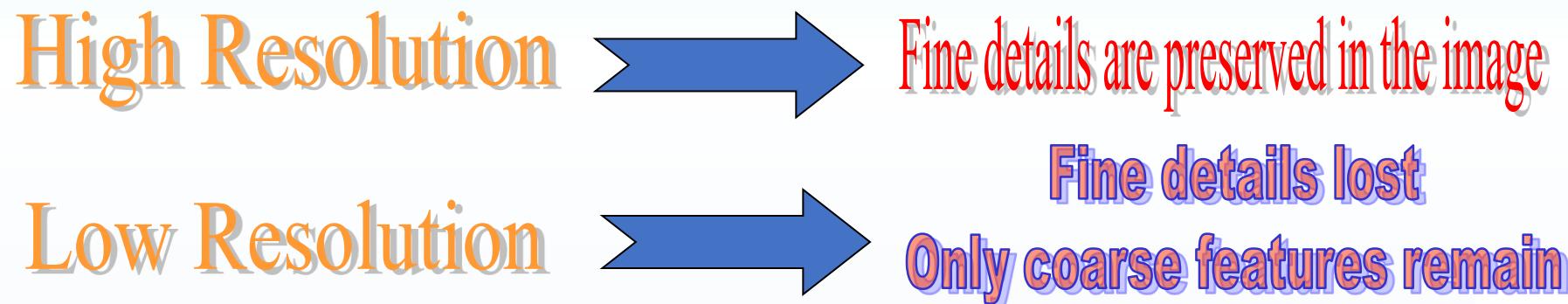


A digital image is a two-dimensional array of pixels (picture elements). Each pixel has an **intensity** value (represented by a **digital number**) and a **location** address (referenced by its **row and column** numbers).



# Spatial resolution

- The **spatial resolution** of an imaging system refers to the quality of the system in its ability to **resolve fine details**.
- An ideal imaging system should reproduce faithfully all the details of the objects.
- However, due to imperfection of the system and influences of the environment, some details are lost, resulting in “blurring” of the images.



## An Example: Digitizing a picture at different pixel size

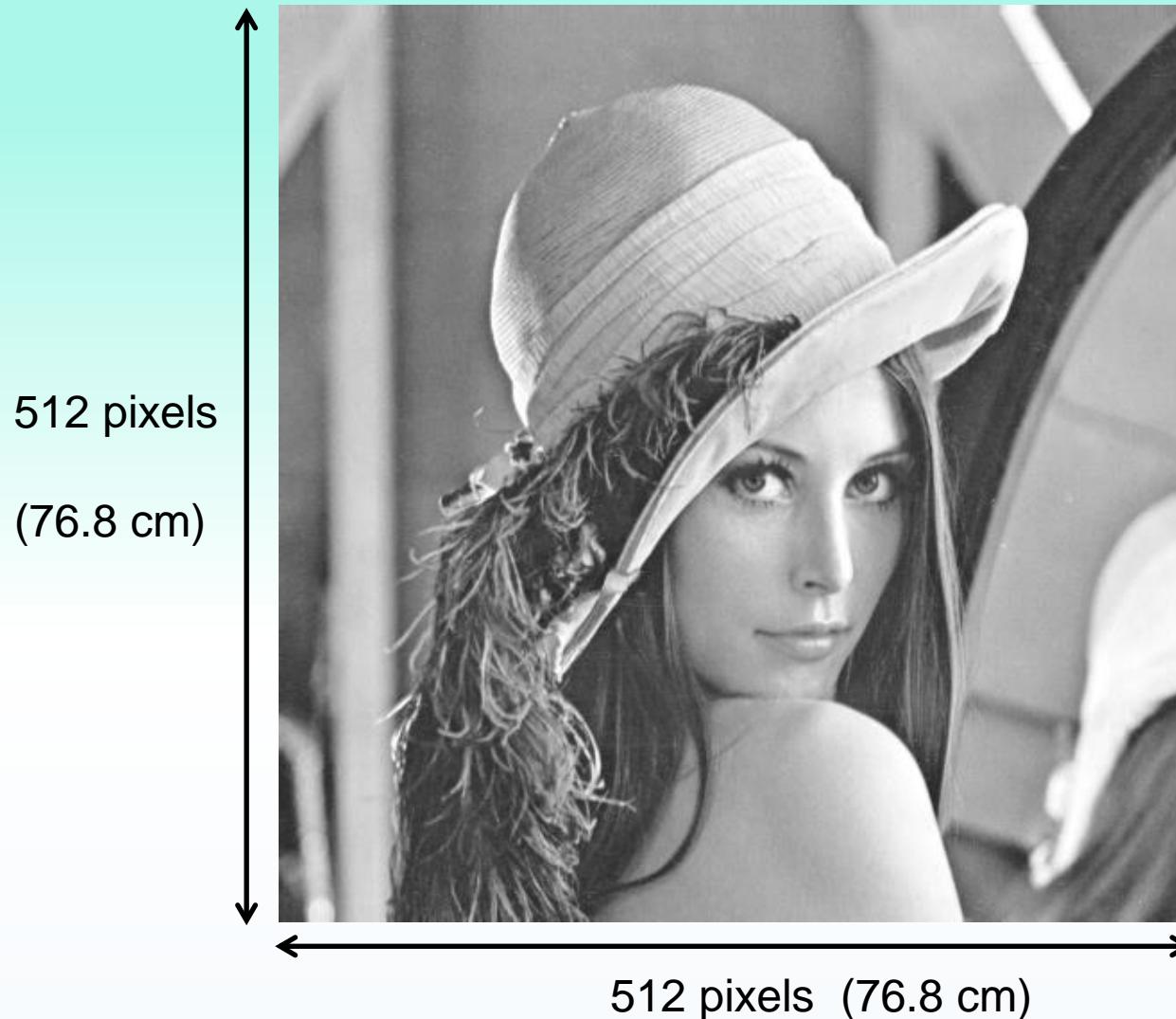


Image dimensions:  
512 x 512 pixels

Pixel width W is about  
1.5 mm at the object  
plane.

## Digitization at increasing pixel width



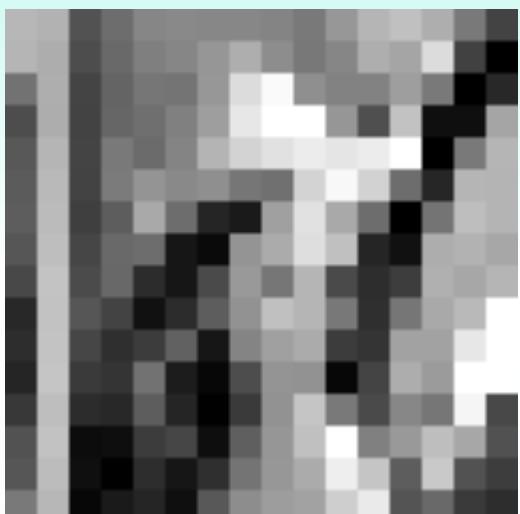
128 x 128 pixels (W=0.6 cm)



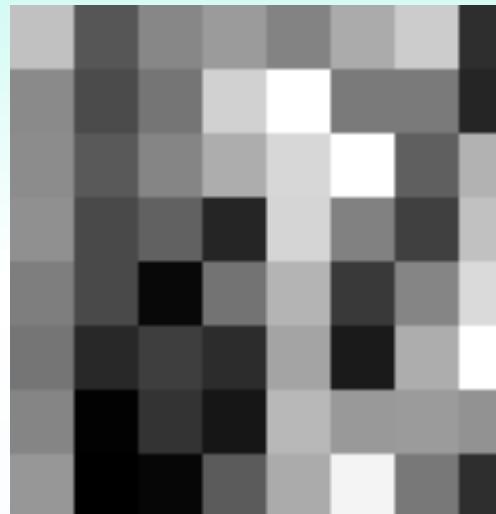
64 x 64 pixels (W=1.2 cm)



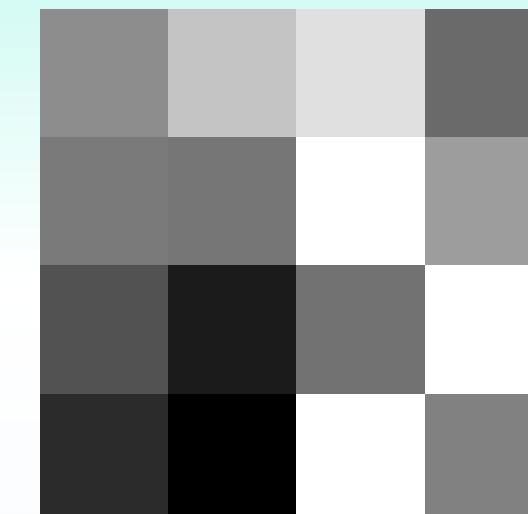
32 x 32 pixels (W=2.4 cm)



16 x 16 pixels (W=4.8 cm)

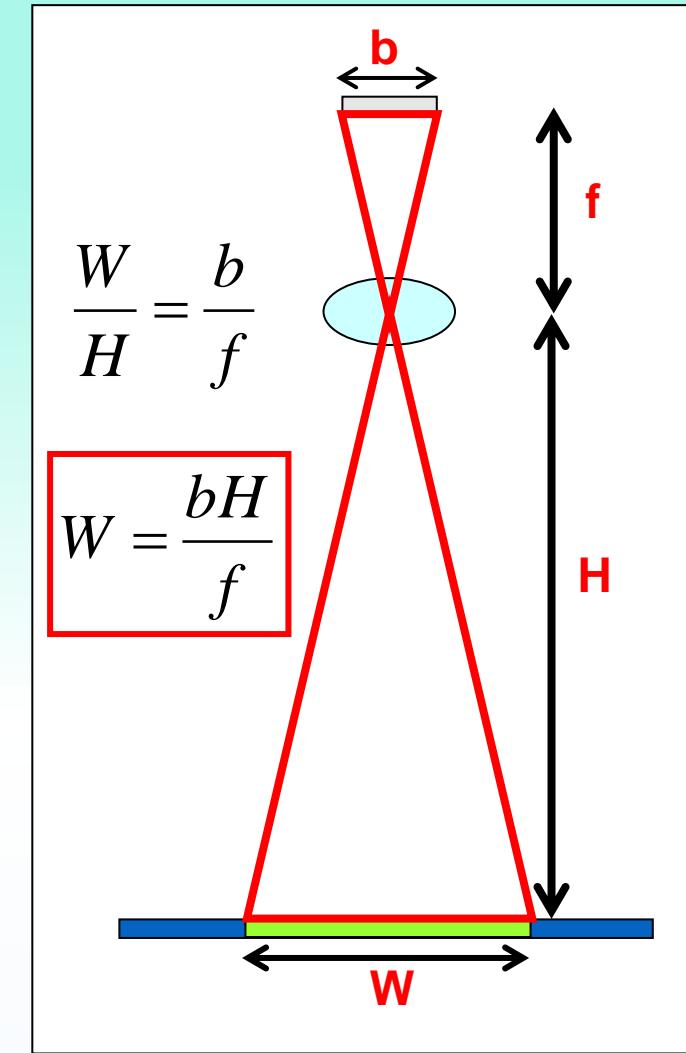
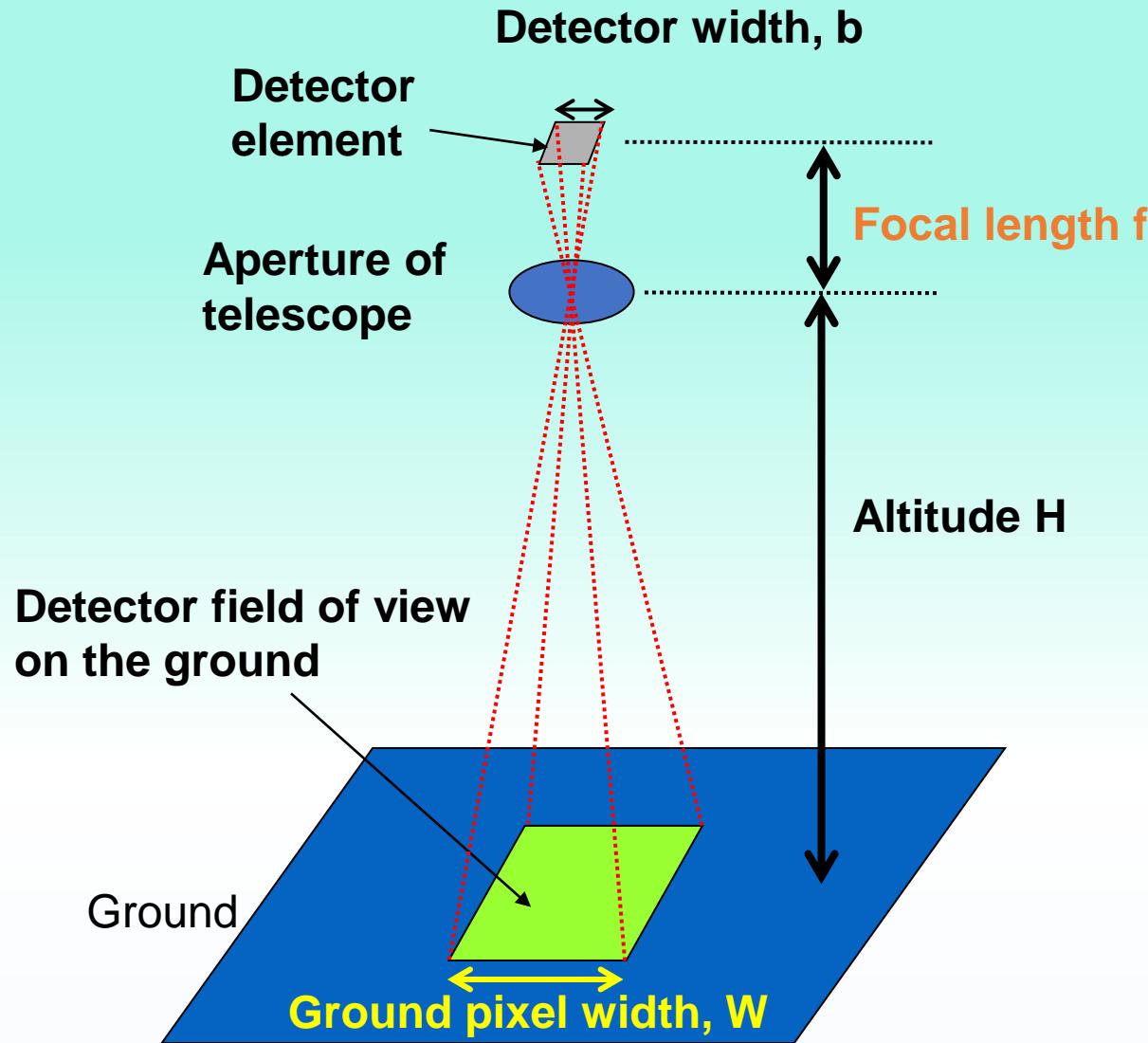


8 x 8 pixels (W=9.6 cm)



4 x 4 pixels (W=19.2 cm)

# Resolution due to Sampling



# Ground Pixel Width

Example: Consider the following specifications of a satellite imaging system. What is the ground pixel width?

Telescope diameter,  $D = 0.7 \text{ m}$

Focal length,  $f = 10 \text{ m}$

Detector size,  $b = 12 \mu\text{m} = 1.2 \times 10^{-5} \text{ m}$

Altitude,  $H = 681 \text{ km} = 6.81 \times 10^5 \text{ m}$

The ground pixel width is

$$W = Hb/f$$

$$\begin{aligned} &= (6.81 \times 10^5 \text{ m}) \times (1.2 \times 10^{-5} \text{ m}) / (10 \text{ m}) \\ &= 0.82 \text{ m} \end{aligned}$$

**INSIGHT**  
**Greening Singapore's power sector** | B4-6


**The Big Story •**  
Slump in S'pore's key exports continues to ease | A3



**Life •** Bars raise spirits with striking decor | C1&2

# THE STRAITS TIMES

New approaches to trade policy take time, says PM Lee as US pact stalls

He anticipates more progress in 2024 after Asia-Pacific economic hits roadblock

BhagyaShree Garekar

SAN FRANCISCO - Trade is critical but trade policy is tough, Prime Minister Lee Hsien Loong said after United States President Joe Biden's speech on Friday, adding that the US president had hit a roadblock in the Asia-Pacific hit a roadblock on trade.

"Trade is the lifeblood of the global economy. And the trade pillar is an integral part of the IPEF agreement," he told reporters after the Indo-Pacific Economic Framework for Prosperity was launched.

"We are developing new and creative approaches to trade policy. It is not easy to do so, because we have to carefully work through sensitive areas, and to choose the best model in each area," he added.

Announced by Mr Biden in May 2022, the IPEF is the cornerstone of US economic engagement in a region where major nations converge. China is the top trading nation. It consists of four pillars: trade, supply chain, clean energy and anti-corruption measures.

Meeting the sides of the annual IPEF meeting, Economic Cooperation (Apec) leaders' summit on Nov 16, IPEF leaders announced the launch of the first half of 2024.

In his speech, PM Lee anticipated more progress in meetings to be held in 2025.



In his speech in San Francisco on Friday, Prime Minister Lee Hsien Loong said the Indo-Pacific Economic Framework for Prosperity should continue to be open, inclusive and flexible, including new members.

PHOTO: AFP

He announced that they had informally concluded agreements on clean energy and anti-corruption measures.

"We look forward to further progress in the negotiations as well as in tangible cooperation next year."

“

**PRIME MINISTER LEE HSIEH LOONG**  
on the Indo-Pacific Economic Framework for Prosperity

“

ANTICIPATING PROGRESS  
We look forward to further progress in the negotiations as well as in tangible cooperation next year.

Demand for skills in digital and care sectors set to grow

Elisha Tushara  
Correspondent

Demand for skills in the digital and care sectors is expected to increase in the next two years, an annual report released on Nov 17 shows.

For the second year, the demand for the Future Economy report highlighted 24 top job skills that are in high demand. Last year, a demand, based on prediction modeling, unique to an annual future demand.

These include career economy skills such as data analysis and communication, as well as digital economy skills such as qualitative analysis and problem solving. These skills were also highlighted for being highly transferable across sectors, including the green sector, industry 4.0 skills, which refer to using automation and robots solution to improve processes in manufacturing, were also featured in this year's report.

Such designs, ranging from process engineering, design to technical writing, are in high demand. Skills to interpret complex information, are expected to be increasing de-

mand over the next two years.

This is the third edition of the report published by SkillsFuture Singapore (SSG), which tracks data between 2002 and 2022.

For the first time, the demand for the Future Economy report highlighted 24 top job skills that are in high demand. Last year, a demand, based on prediction modeling, unique to an annual future demand.

She said that individuals will need to continuously upskill to meet the skills journey to achieve long-term success.

She added that mid-career transitioners will become more common as they move into different job sectors.

To support mid-career transitioners in the sectors with good hiring opportunities, SSG has been working with the industry to develop and roll out the number of SkillsFuture Career Transition Programmes.

She added that to date, there are about 180 courses addressing the

care, digital and green economies as they continue to be key growth areas.

Although skills in the green economy are not yet the most popular, the forecasting analysis shows their growth has been consistent in the past two years.

Green skills such as carbon footprint reduction, energy efficiency and reduce the amount of greenhouse gases emitted, will be increasingly in demand after 2025, experts said.

With the implementation of climate-related policies for sectors used from 2025 onwards, the demand for skills in the green sector will increase.

The report also shows that given

CONTINUED ON PAGE A2



Highlights of the Skills Demand for the Future Economy report on display at the Skills Expo and Convention Centre. The report highlights 24 top job skills that are expected to grow. PHOTO: LAUWNE ZAOBO

care, digital and green sectors. Together with the report, SSG has made available online, for the first time, a skills index that rates the top 100 individuals to gain personal development job insights.

Ms Lee Sze Yeng, managing partner at KPMG in Singapore, said that with the rapid pace of technological change, individuals will need to constantly update their knowledge and skills to be prepared for the future.

By acquiring the right skills, individuals can support the development of the green economy, projected to experience growth, such as sustainable finance and urban planning, among others, she added.

Meanwhile, Singapore's ageing population has led to an increase in demand for care services, said the report. This includes demand for social support services and mental wellness initiatives at organisations.

The report also shows that given

CONTINUED ON PAGE A2



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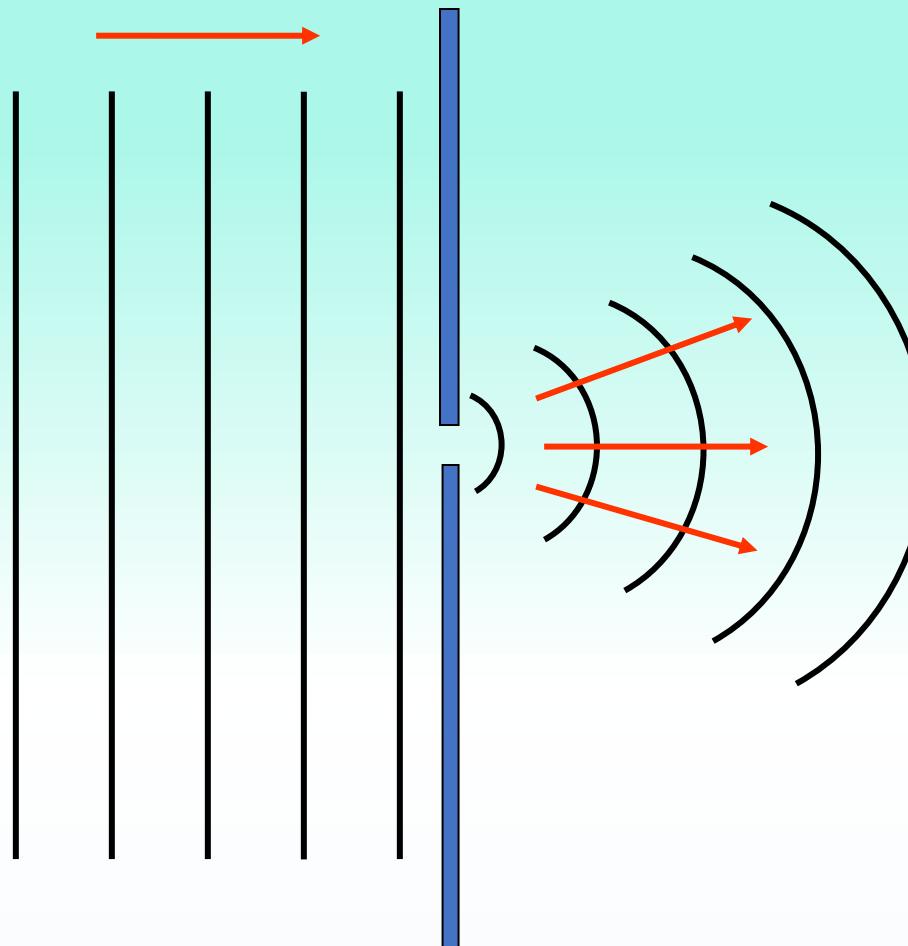
# Can you read this from space?

Is it possible to recognize a human face from an image taken by a satellite from space?

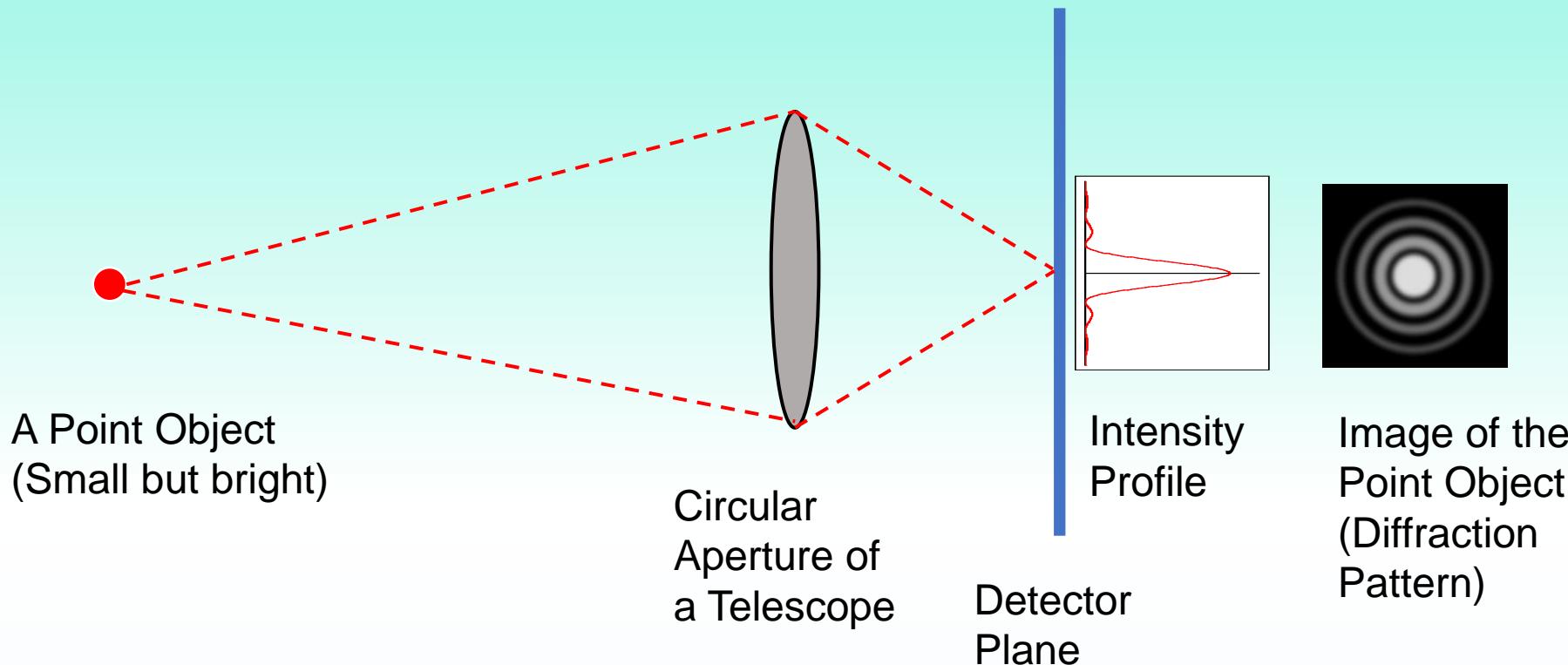
It is rumored that a spy satellite can read the headlines of a newspaper or car license plates. Is this possible?

**CRISP**  
National University of Singapore

# Diffraction of Light



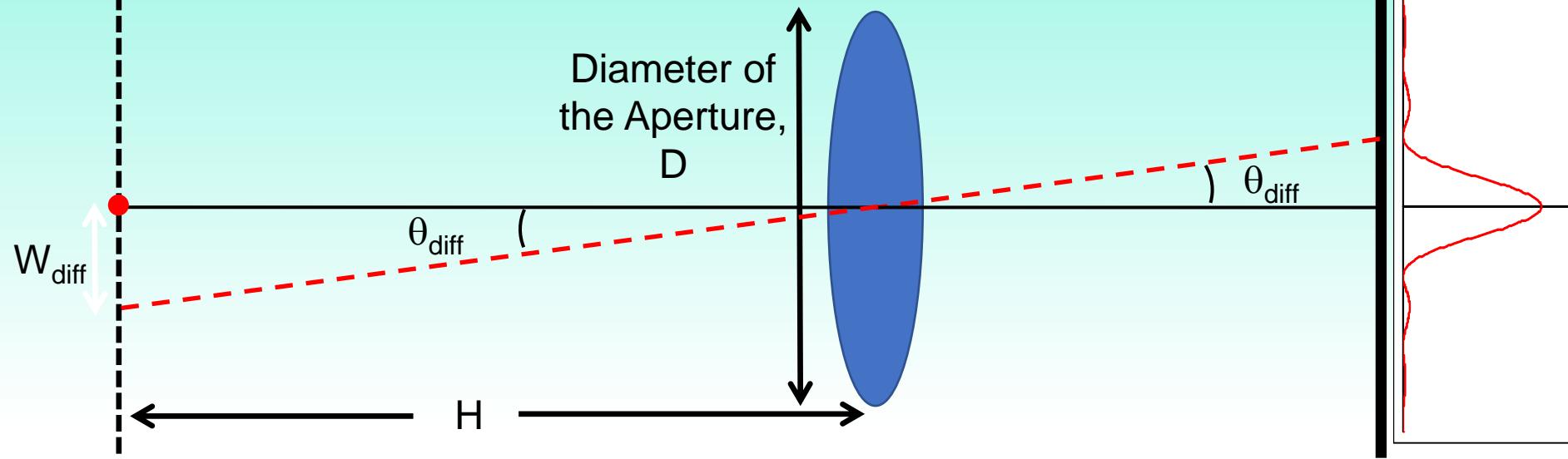
# Diffraction pattern



# Resolution due to Diffraction

Ground Resolution due to Diffraction

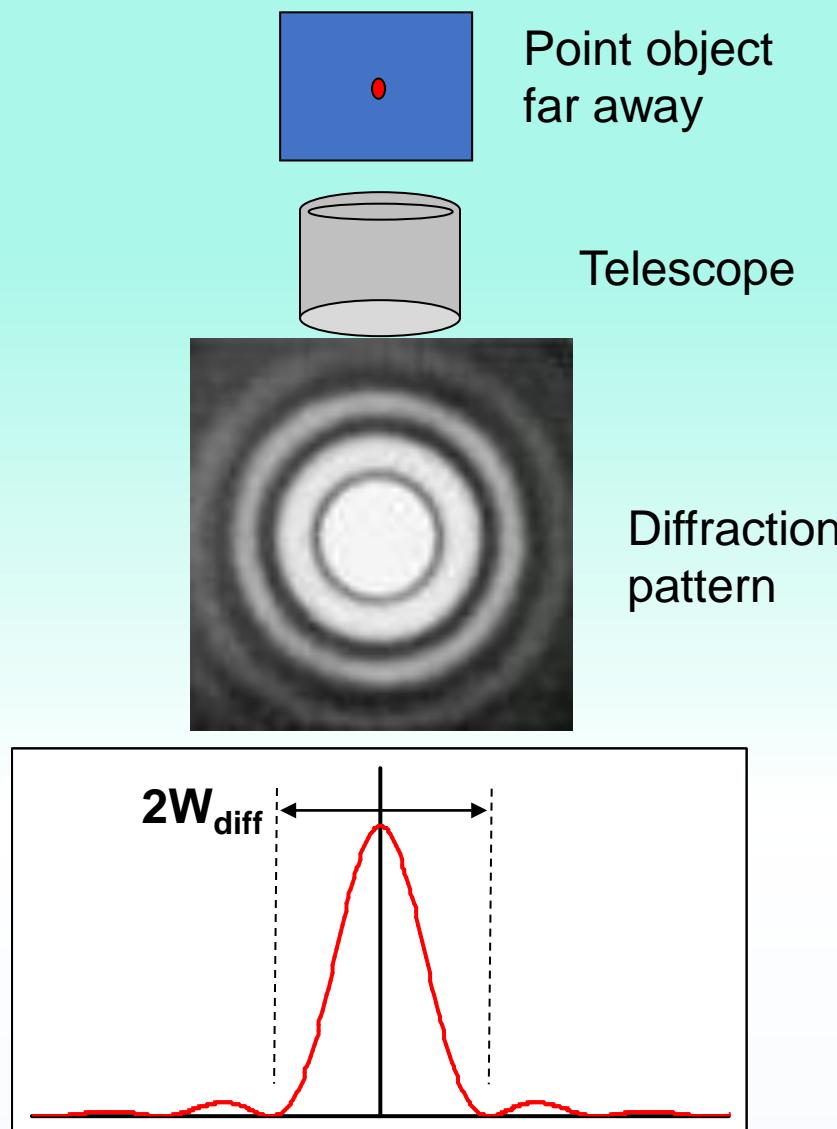
$$W_{diff} = H\theta_{diff} = \frac{1.22\lambda H}{D}$$



$$\text{Diffraction Angle } \theta_{diff} \approx \frac{1.22\lambda}{D}$$

**H = Distance of the aperture from the object**

# Diffraction Limit of Resolution



The diffraction limit arises from the wave nature of light.

For a telescope with a circular aperture, the ground resolution width due to diffraction is given by the equation

$$W_{\text{diffraction}} = \frac{1.22\lambda H}{D}$$

$\lambda$  is the wavelength of light

H is the altitude of the telescope,

D is the diameter of the telescope aperture.

# Diffraction Limit of Resolution

Example: Consider the following specifications of a satellite imaging system. What is the resolution limit imposed by light diffraction?

Telescope diameter,  $D = 0.7 \text{ m}$

Altitude,  $H = 681 \text{ km} = 6.81 \times 10^5 \text{ m}$

Wavelength  $\lambda = 500 \text{ nm} = 5 \times 10^{-7} \text{ m}$

The diffraction limited resolution is

$$W_{\text{diff}} = 1.22\lambda H/D$$

$$= 1.22 \times (5 \times 10^{-7} \text{ m}) \times (6.81 \times 10^5 \text{ m}) / 0.7 \text{ m}$$

$$= 0.59 \text{ m}$$

## What is the best resolution achievable for a space-borne camera?

$$W_{\text{diffraction}} = \frac{1.22\lambda H}{D}$$

We need a short wavelength, a large aperture and a low altitude.

Assuming,  $\lambda = 500 \text{ nm}$ ,  $H = 250 \text{ km}$  (this is really low for a satellite), and  $D = 1 \text{ m}$ , then

$$\begin{aligned} W_{\text{diffraction}} &= \frac{1.22 \times (5 \times 10^{-7} \text{ m}) \times (2.5 \times 10^5 \text{ m})}{1 \text{ m}} \\ &= 0.1525 \text{ m} = 15.25 \text{ cm} \end{aligned}$$

The diffraction limit can be pushed further by using a larger telescope aperture and flying the satellite at a lower altitude. E.g. if  $D = 2 \text{ m}$  and  $H = 100 \text{ km}$ , then  $W_{\text{diffraction}} = 3 \text{ cm}$ .

## Is this resolution sufficient for face recognition?

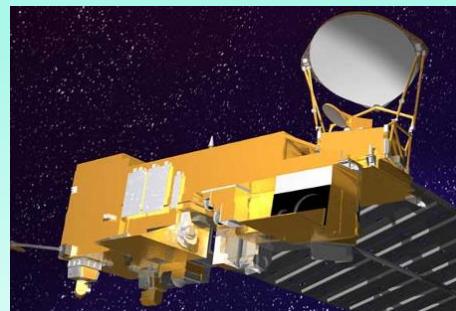
# **Various types of remote sensing satellites according to their functions**

# Meteorological / Environmental Satellites

TERRA



AQUA



Suomi-NPP



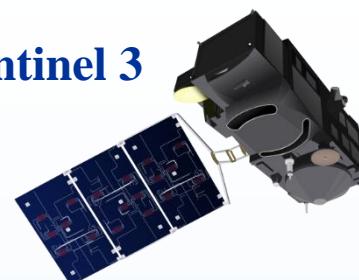
Moderate Resolution Imaging Spectrometer (MODIS)  
Wide coverage (over 2000 km) but low resolution  
(250 m to 1 km)  
36 spectral bands; For observation of land,  
atmosphere and ocean

NOAA-20



Also carries VIIRS, similar  
to Suomi-NPP

Sentinel 3



21 bands Ocean and Land Color  
Instrument (OCLI) - Visible-NIR  
(300 m resolution)  
Sea and Land Surface Temperature  
Radiometer (SLSTR) – Vis-SWIR  
(500 m), MIR-TIR (1 km)

# Spectral Bands of MODIS (Reflective)

Primary Use	Band No.	Wavelength (nm)	Resolution (km)
<b>Land/Cloud/Aerosols Boundaries</b>	1	620 – 670 (Red)	0.25
	2	841 – 876 (NIR)	0.25
<b>Land/Cloud/Aerosols Properties</b>	3	459 – 479 (Blue)	0.5
	4	545 – 565 (Green)	0.5
	5	1230 – 1250 (SWIR)	0.5
	6	1628 – 1652 (SWIR)	0.5
	7	2105 – 2155 (SWIR)	0.5
	8	405 - 420	1
	9	438 - 448	1
<b>Ocean Color/ Phytoplankton/ Biogeochemistry</b>	10	483 - 493	1
	11	526 - 536	1
	12	546 - 556	1
	13	662 - 672	1
	14	673 - 683	1
	15	743 - 753	1
	16	862 - 877	1
	17	890 - 920	1
	18	931 - 941	1
<b>Atmospheric Water Vapor</b>	19	915 - 965	1

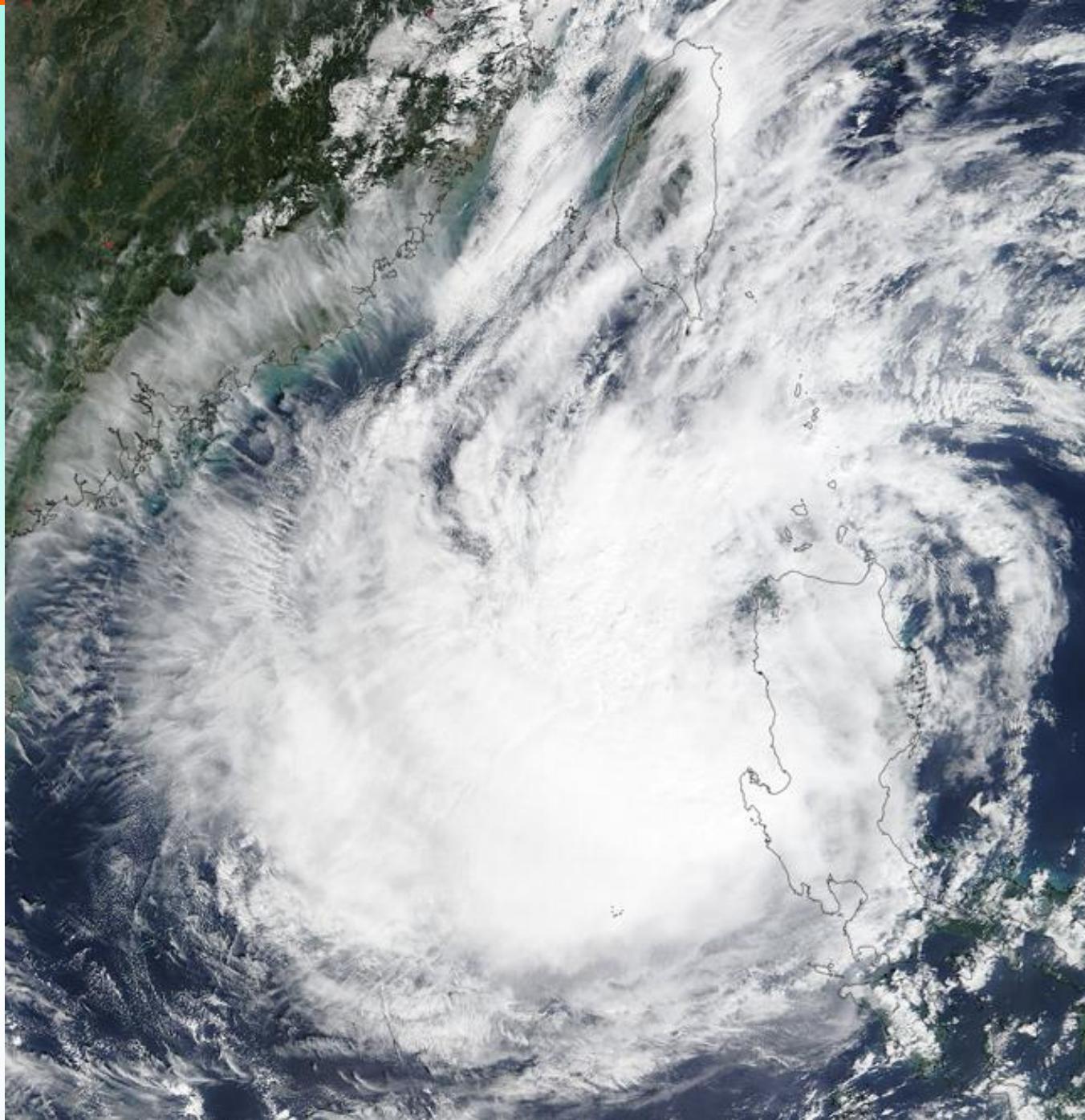
# Spectral Bands of MODIS (Emissive)

Primary Use	Band	Wavelength ( $\mu\text{m}$ )	Resolution (km)
Surface/Cloud Temperature	20	3.660 - 3.840	1
	21	3.929 - 3.989	1
	22	3.929 - 3.989	1
	23	4.020 - 4.080	1
Atmospheric Temperature	24	4.433 - 4.498	1
	25	4.482 - 4.549	1
Cirrus Clouds Water Vapor	26 (Reflective)	1.360 - 1.390 (SWIR)	1
	27	6.535 - 6.895	1
	28	7.175 - 7.475	1
Cloud Properties	29	8.400 - 8.700	1
Ozone	30	9.580 - 9.880	1
Surface/Cloud Temperature	31	10.780 - 11.280	1
	32	11.770 - 12.270	1
Cloud Top Altitude	33	13.185 - 13.485	1
	34	13.485 - 13.785	1
	35	13.785 - 14.085	1
	36	14.085 - 14.385	1

# Typhoon Talim over East China Sea - Terra MODIS

2017-09-14 02:15UT



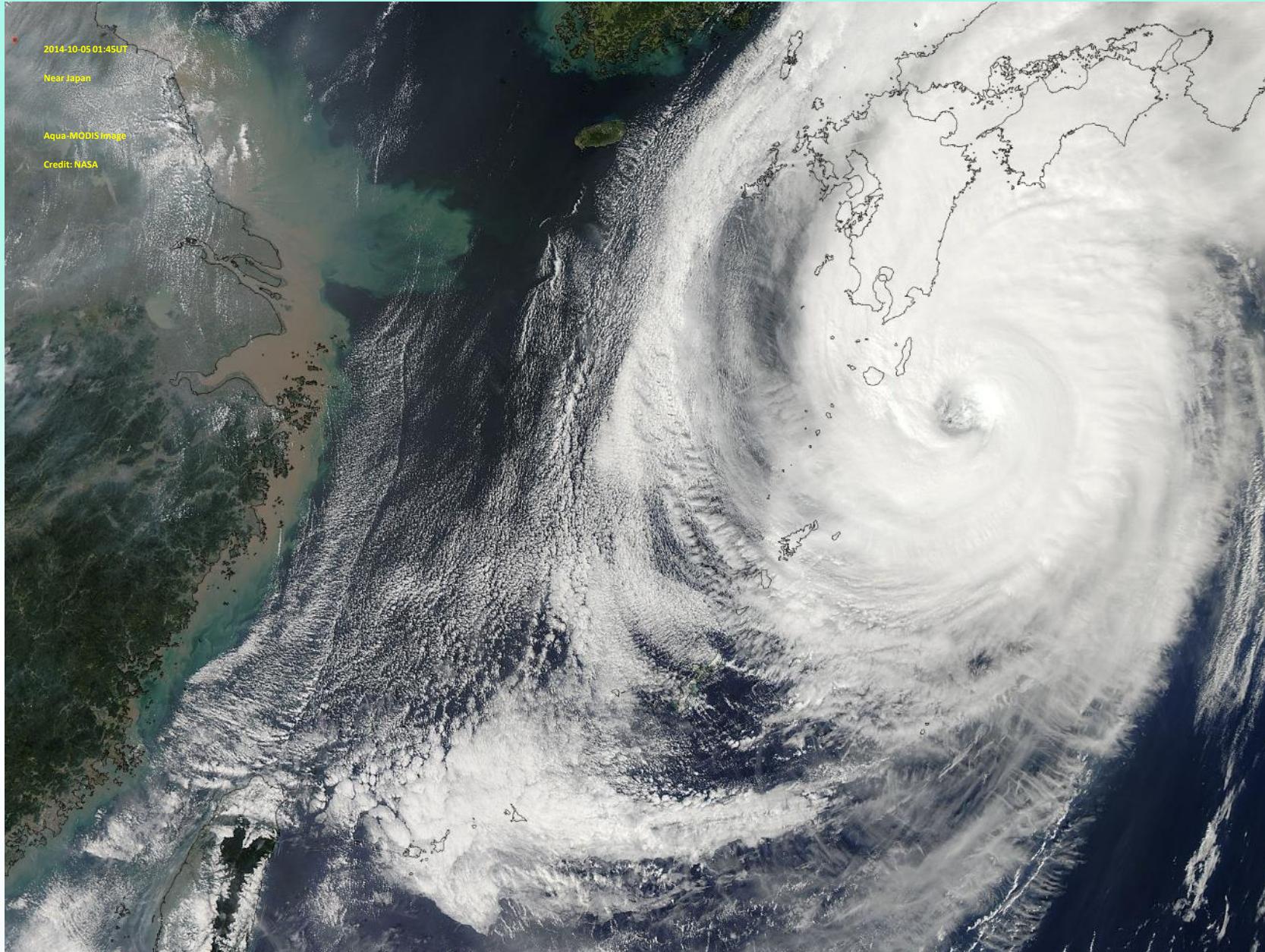


**Typhoon  
Koppu over  
the  
Philippines**

**Terra-MODIS  
2015-10-19  
03:05 UT**

**Credit: NASA**

# Super Typhoon Phanfone



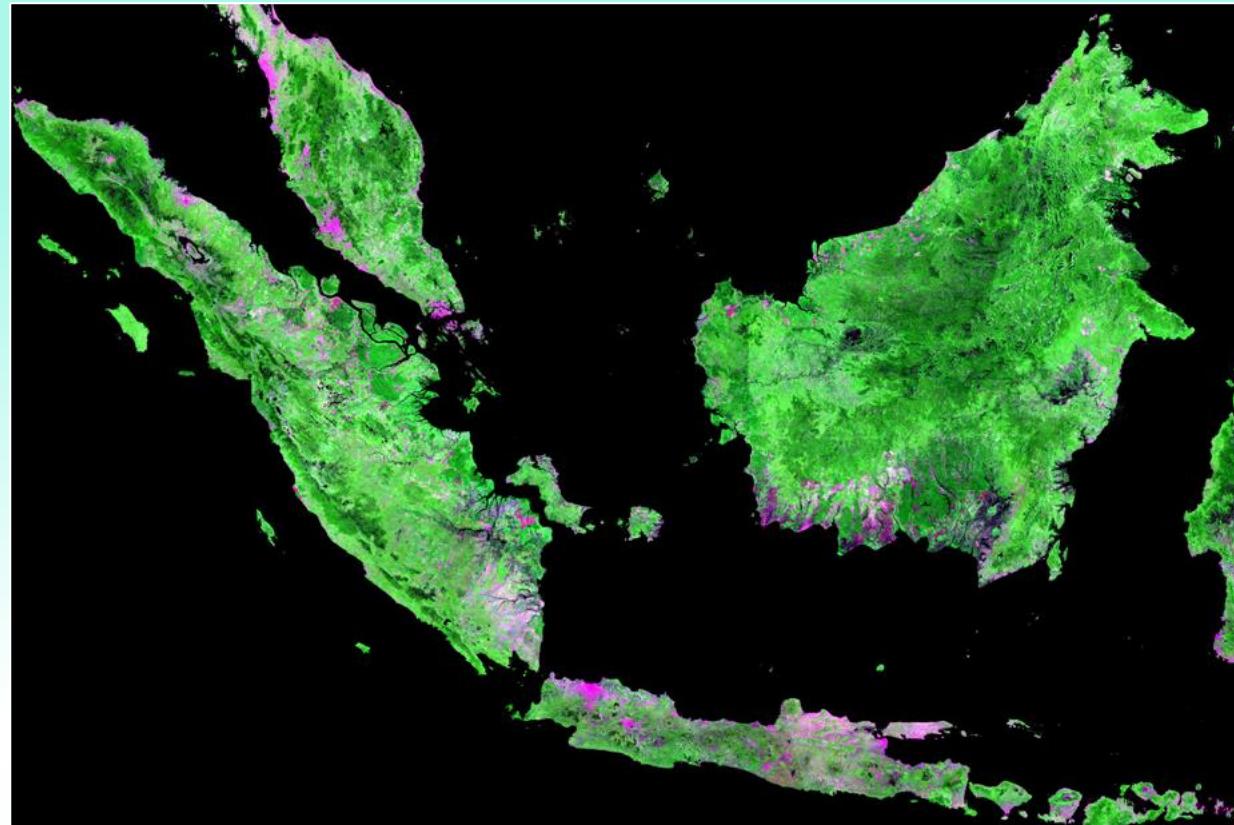


**MODIS**

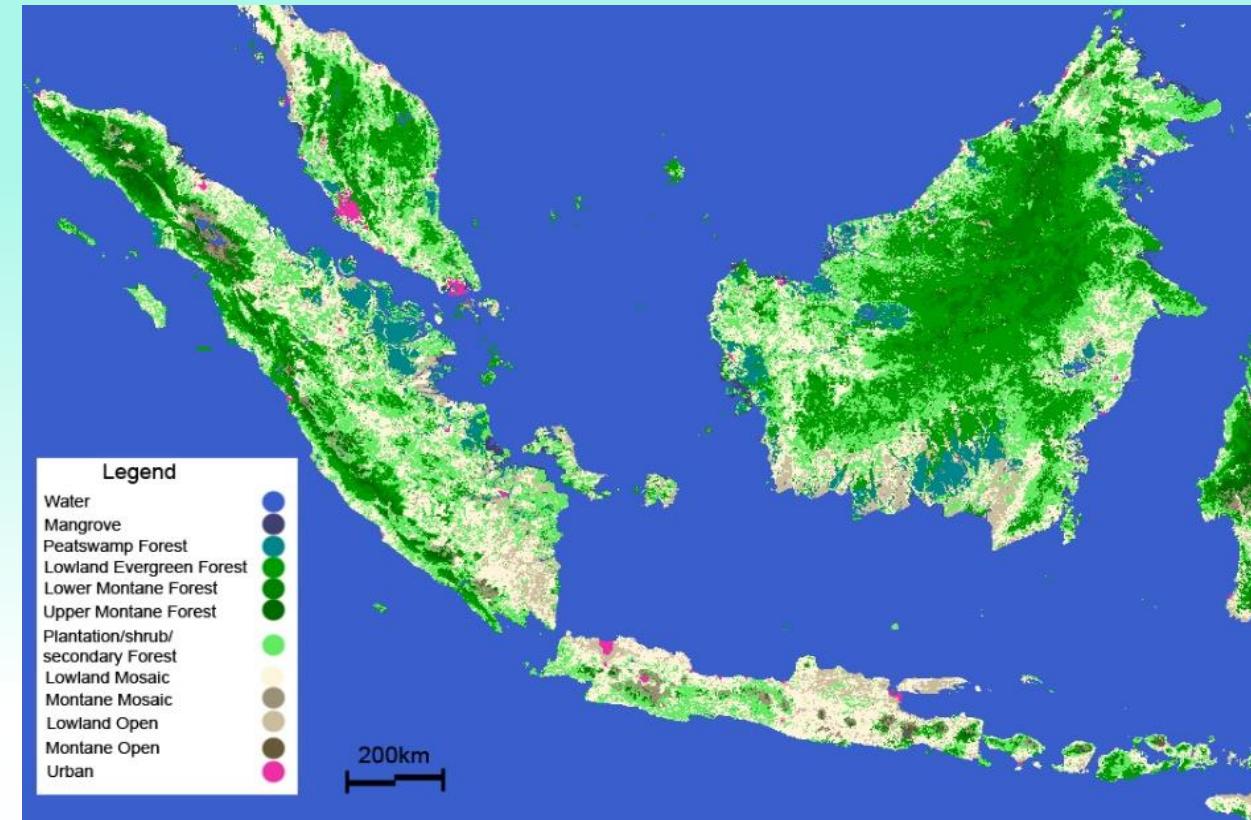
**Fire hot spots  
and smoke  
plumes - Riau,  
Sumatra**

**25 June 2005  
03:55 UTC**

# Regional Land Cover Mapping

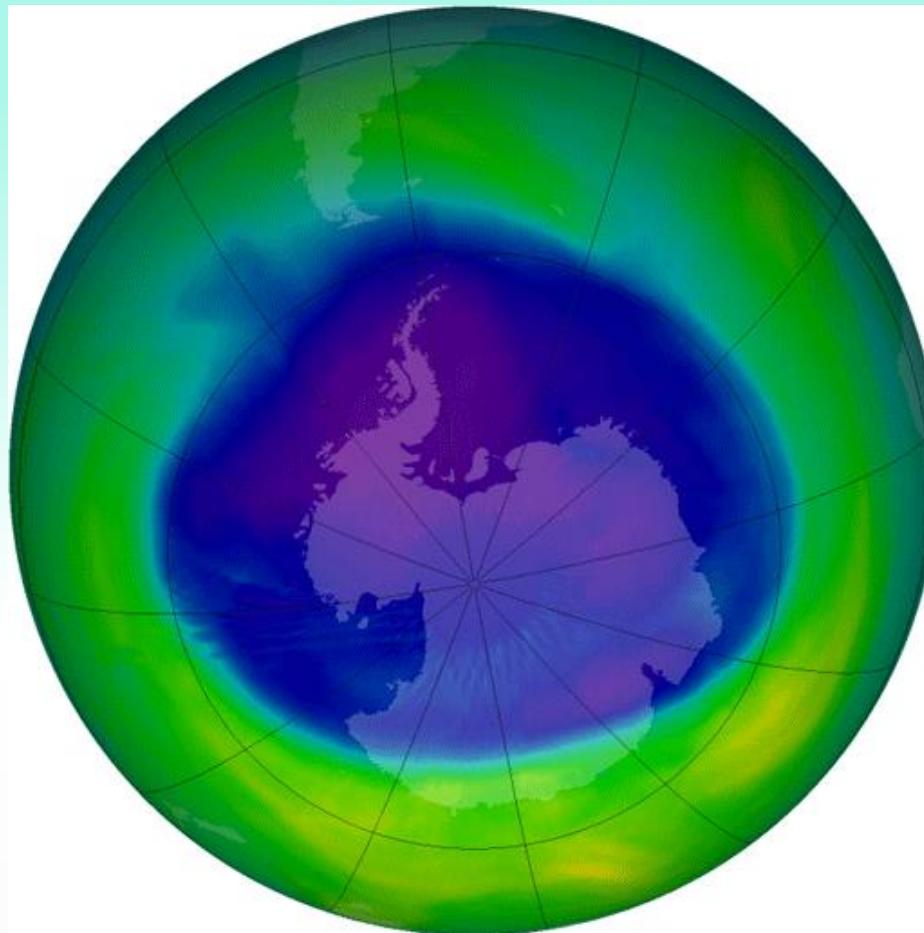


MODIS 500 m resolution cloud-free mosaic (2005)

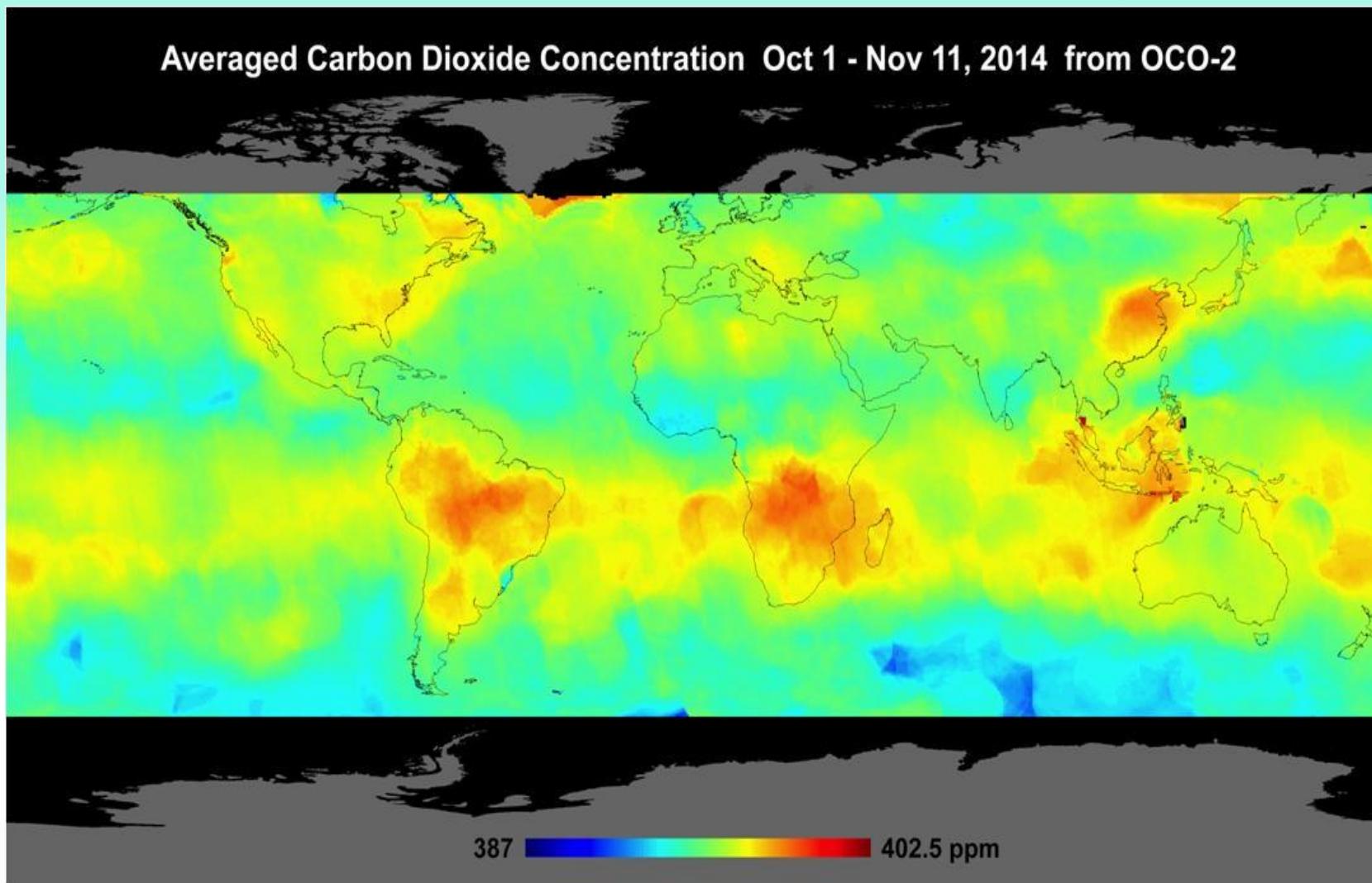


Land cover classification map derived from the MODIS images

# AURA – OMI (Ozone Monitoring Instrument) map of ozone hole over antartica

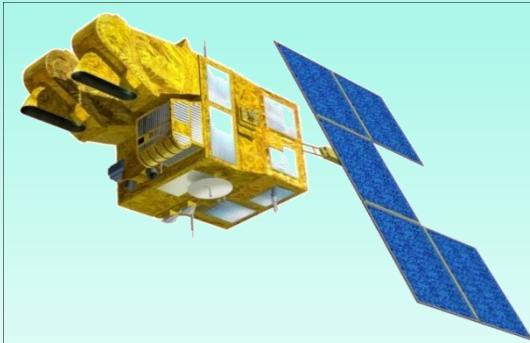


# Global distribution of CO<sub>2</sub> concentration measured by the OCO-2 satellite



# Earth resource satellites

**SPOT-5, 6, 7**



**Landsat-8, 9**



**Sentinel 2A,B**



**Moderate to high resolution (a few m to ~ 100 m)  
few spectral bands, usually broad bandwidth;  
Swath from tens of km to ~100 km**

**CBERS-4**

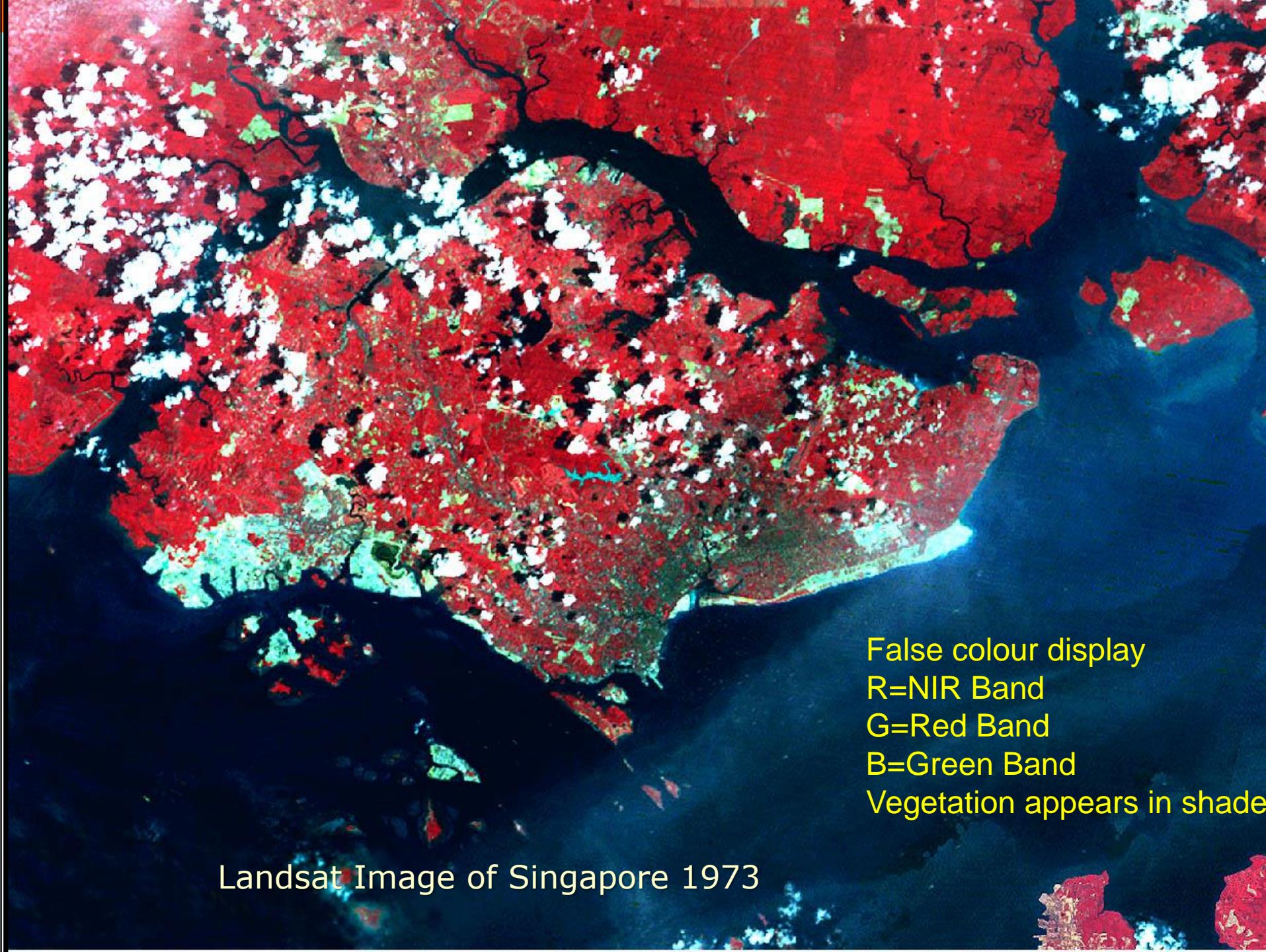


## Spectral Bands of Sentinel-2A MSI

Band number	Spatial Sample Distance (m)	Central wavelength (nm)	Bandwidth (nm)
1	60	443	20
2	10	490	65
3	10	560	35
4	10	665	30
5	20	705	15
6	20	740	15
7	20	783	20
8	10	842	115
8A	20	865	20
9	60	945	20
10	60	1 375	30
11	20	1 610	90
12	20	2 190	180

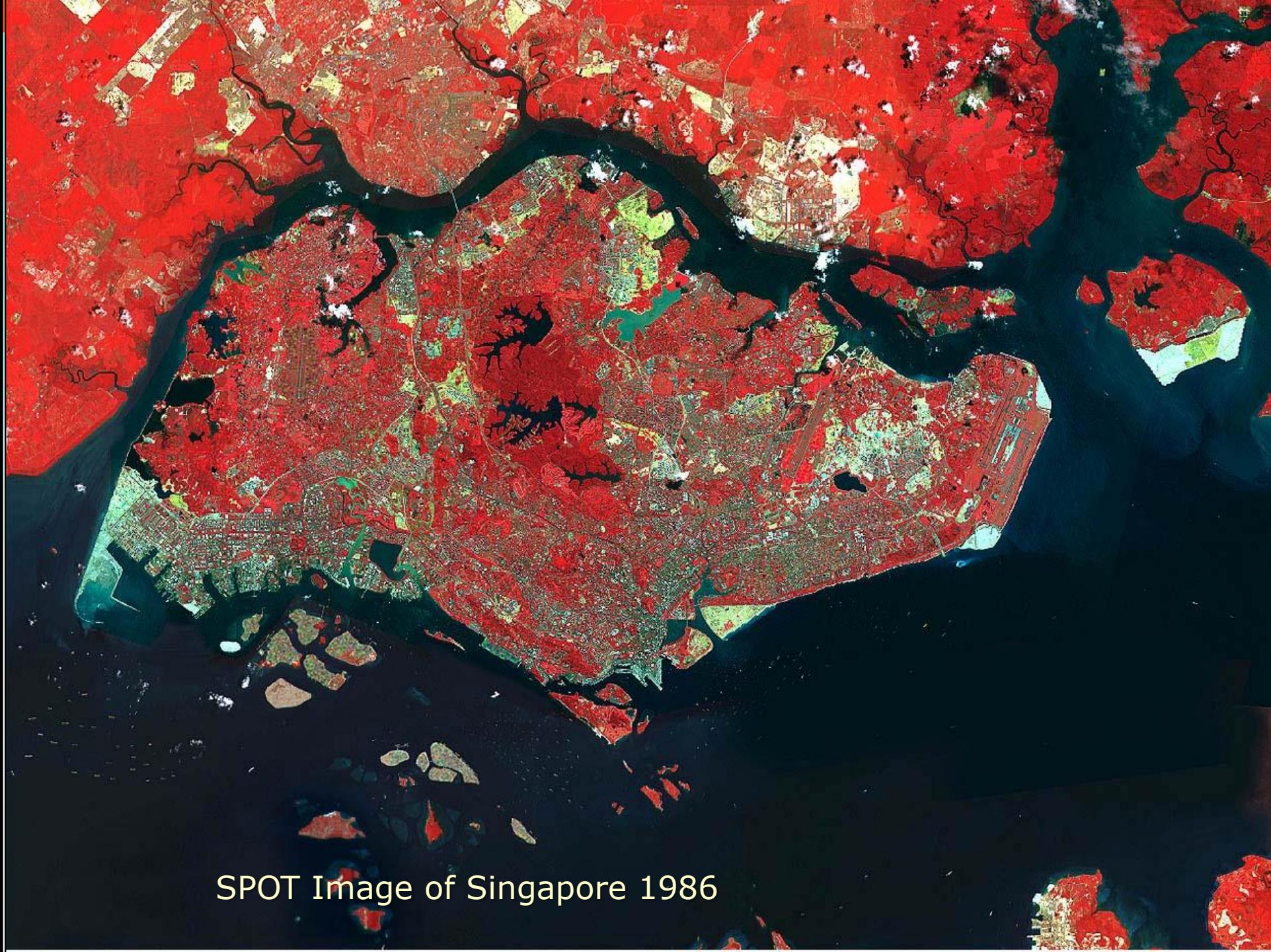
## Spectral Bands of SPOT-5 Satellite

Band No.	Wavelength ( $\mu\text{m}$ )	Resolution
1	0.50 - 0.59 (Green)	10 m
2	0.61 - 0.68 (Red)	10 m
3	0.79 - 0.89 (NIR)	10 m
4	1.53 - 1.75 (SWIR)	20 m
--	Panchromatic	5 m and 2.5 m

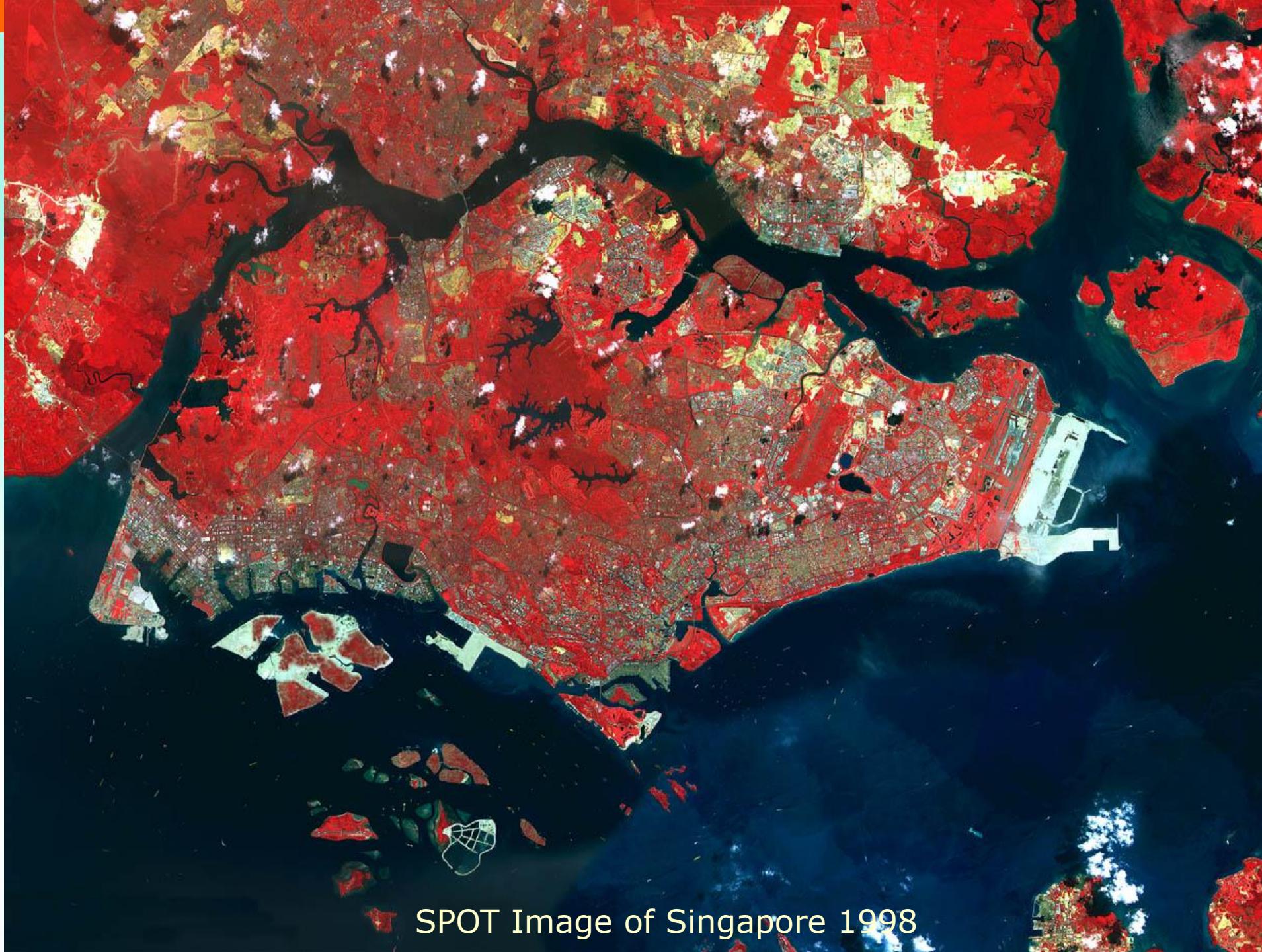


Landsat Image of Singapore 1973

False colour display  
R=NIR Band  
G=Red Band  
B=Green Band  
Vegetation appears in shades of red



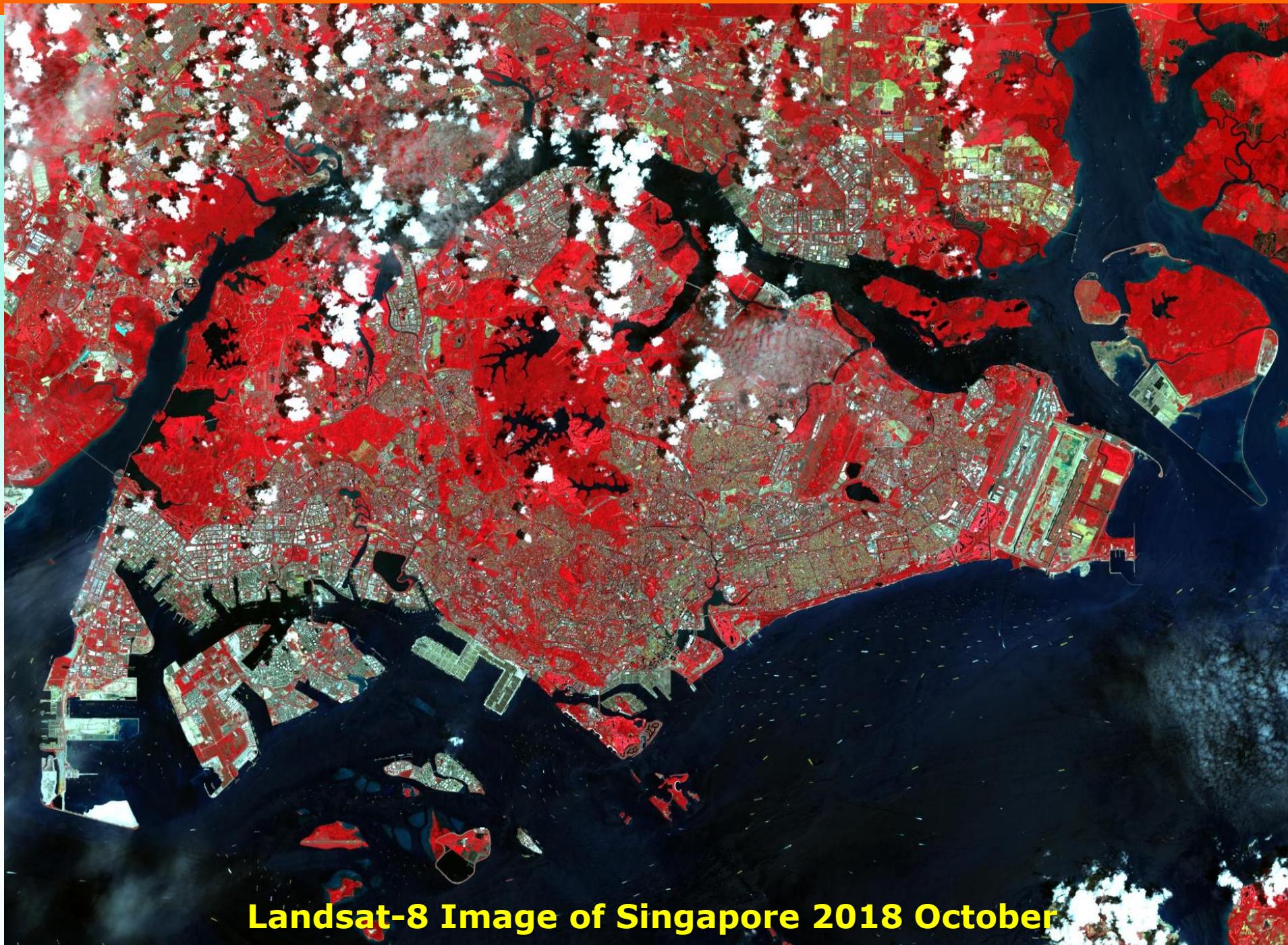
SPOT Image of Singapore 1986



SPOT Image of Singapore 1998

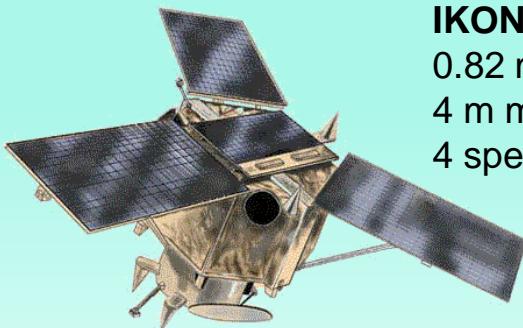


**SPOT Image of Singapore 2006**



Landsat-8 Image of Singapore 2018 October

# Sub-meter spatial resolution satellites



**IKONOS**

0.82 m panchromatic  
4 m multispectral  
4 spectral bands



**GeoEye-1**

0.41 m panchromatic  
1.65 m multispectral  
4 spectral bands



**WorldView-1**

0.50 m panchromatic



**WorldView-3**

0.31 m panchromatic  
1.24 m multispectral VNIR (8 bands)  
3.7 m SWIR (8 bands)  
30 m CAVIS (12 bands)



**WorldView-2**

0.46 m panchromatic  
1.84 m multispectral  
8 spectral bands

## Spectral Bands of IKONOS

Band No.	Wavelength ( $\mu\text{m}$ )	Resolution
1	0.40 - 0.52 (Blue)	4 m
2	0.52 - 0.60 (Green)	4 m
3	0.63 - 0.69 (Red)	4 m
4	0.76 - 0.90 (NIR)	4 m
--	Panchromatic	1 m

# WorldView-2 Spectral Bands

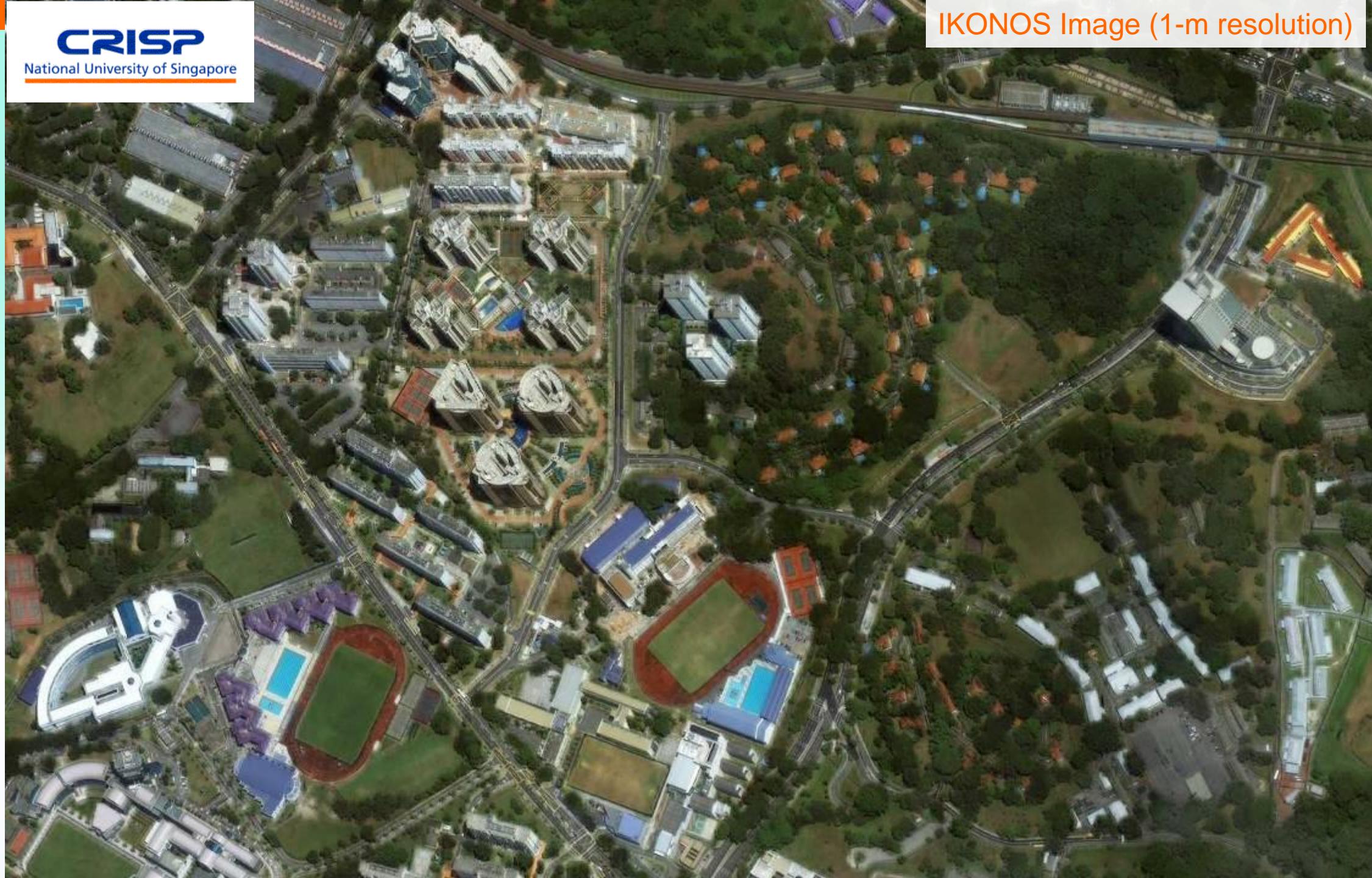
- B1 “Coastal” (0.40-0.45)
- B2 Blue (0.45 - 0.51)
- B3 Green (0.51 - 0.58)
- B4 Yellow (0.585 – 0.625)
- B5 Red (0.63 – 0.69)
- B6 “Red edge” (0.705 – 0.805)
- B7 NIR1 (0.77 – 0.895)
- B8 NIR2 (0.86 – 1.04)
- Panchromatic

Resolution:

1.84 m multispectral,  
0.46 m panchromatic



GeoEye-1, 0.5-m resolution, 26<sup>th</sup> Jun 2009  
National University of Singapore



IKONOS, 1-m resolution  
Esplanade, Singapore



# 3D Features Extraction and Visualization



RISIP

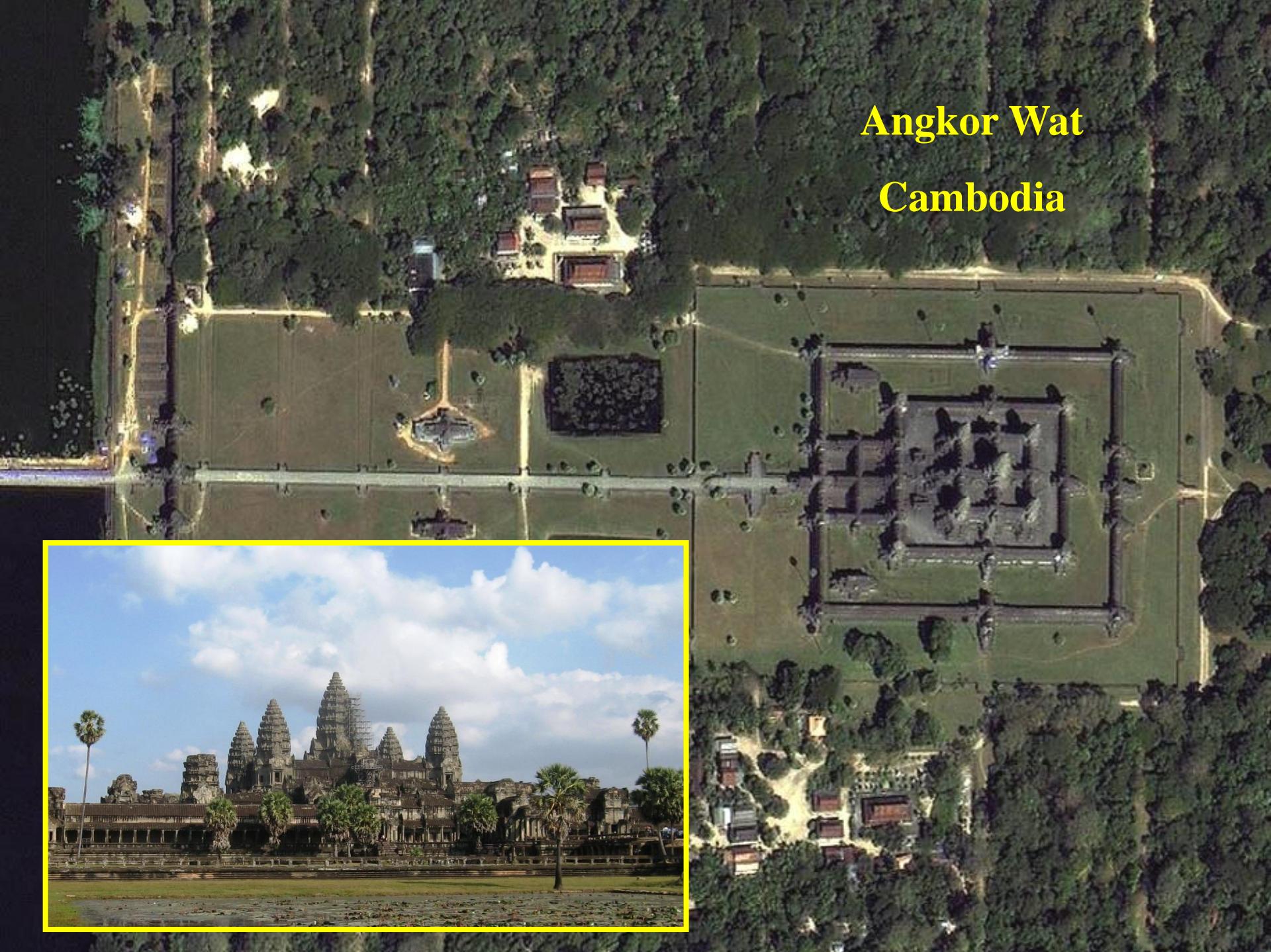
National University of Singapore



Ikonos (1 m resolution) Image of Beijing, 22 October 1999



**Angkor Wat**  
**Cambodia**

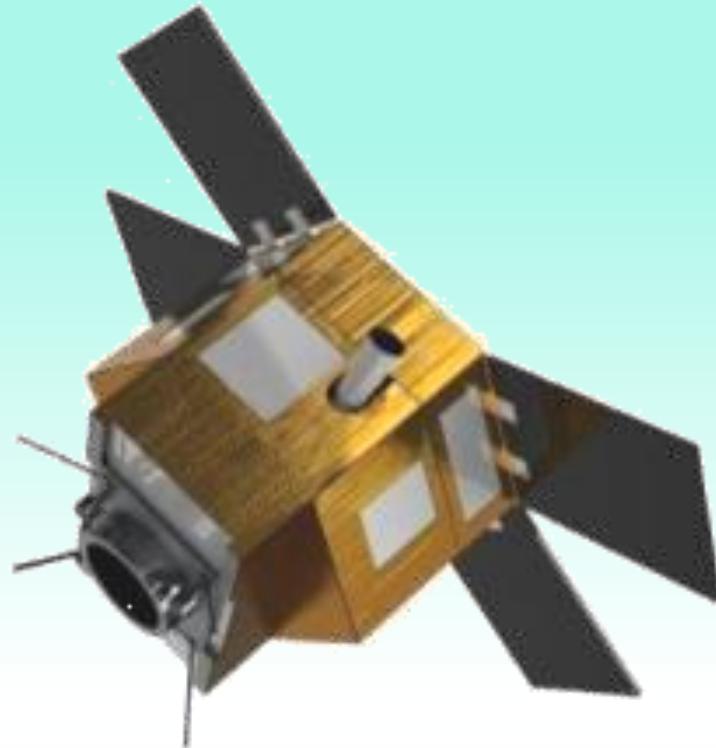


## ***TeLEOS-1***

- Launch Date: 16 December 2015
- Designed Life: 5 years
- Orbit: Near Equatorial Orbit ( $10^{\circ}$  to  $15^{\circ}$  Inclination)
- Orbital height: 550km
- Mass: About 400kg

### Imaging & Collection Specifications

- Resolution: 1m nominal at nadir
- Swath width: 12km
- Dynamic Range: 10bits per pixel
- Slew Rate: 2.5 deg/sec



### Image Reception and Processing System (Ground Station)

- In-house development of CRISP

# TeLEOS-1 Image Sentosa Island, Singapore 13 Apr 2016



Sentosa 13 Apr 2016

**RISIP**  
University of Singapore



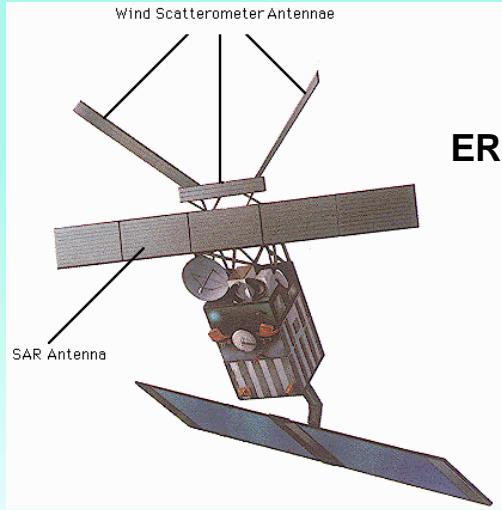
**TeLEOS-1 image**

**Singapore  
Sports Hub**

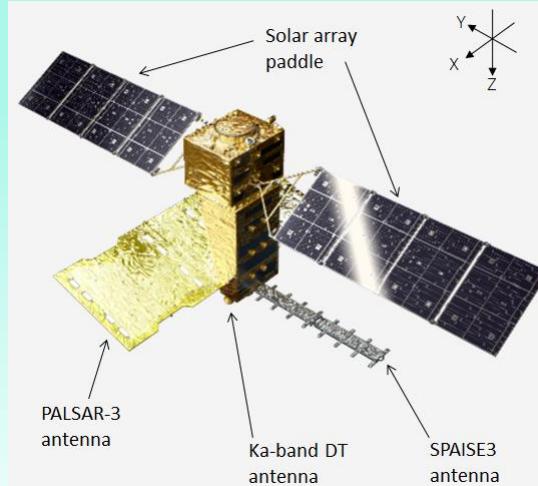
**23 Jan. 2016**

TeLEOS-1 © ST Electronics 2016  
All Rights Reserved

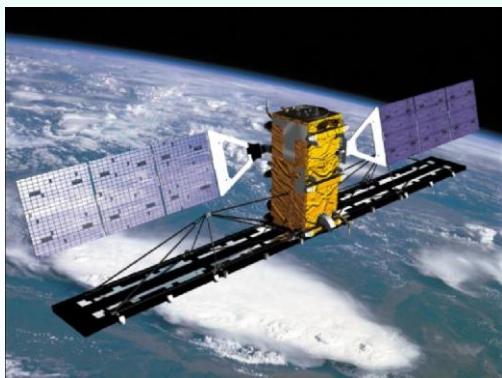
# Synthetic Aperture Radar (SAR) Satellites



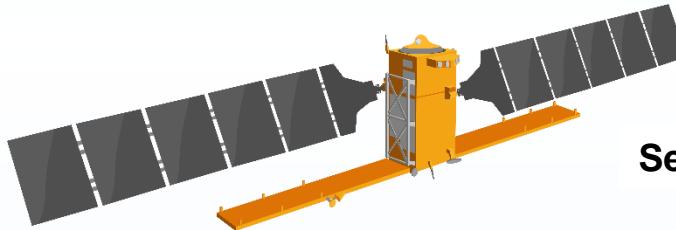
ERS-1,2



ALSO-4

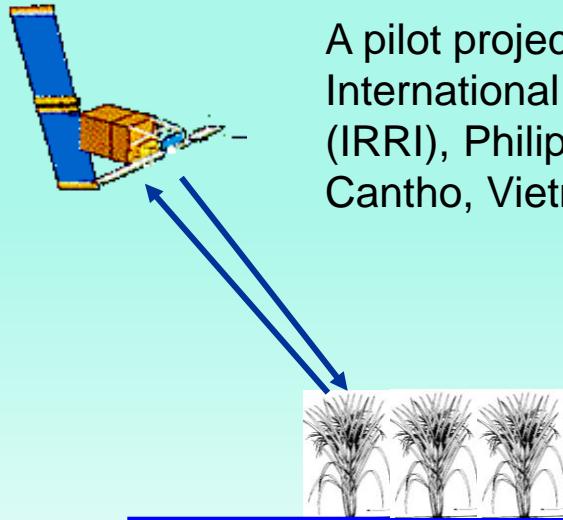


RADARSAT-1,2

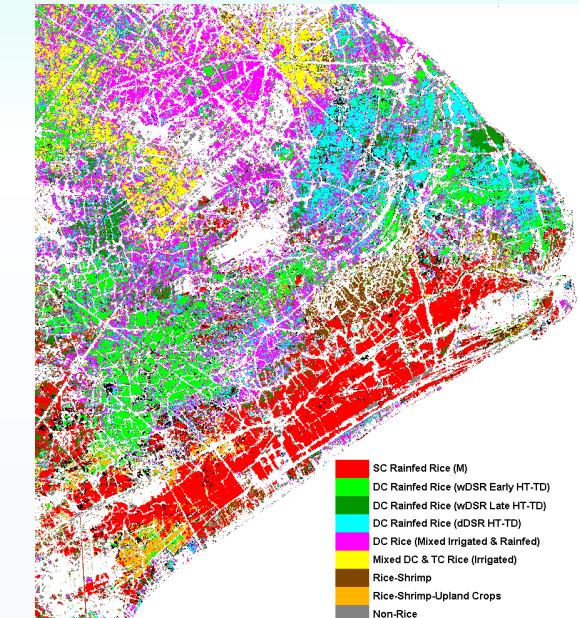
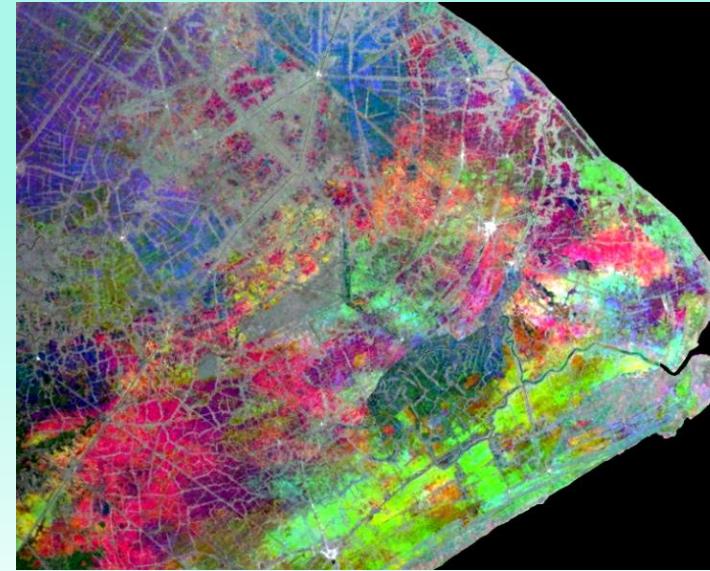
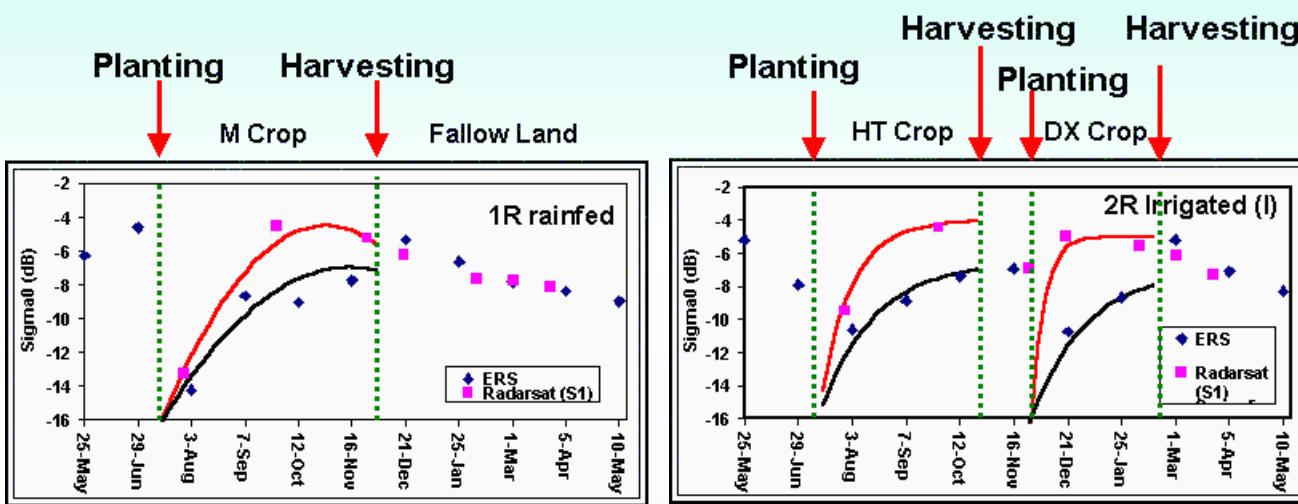


Sentinel-1

# Mapping Rice Cropping Systems in Mekong Delta Using Multitemporal Synthetic Aperture Radar Data

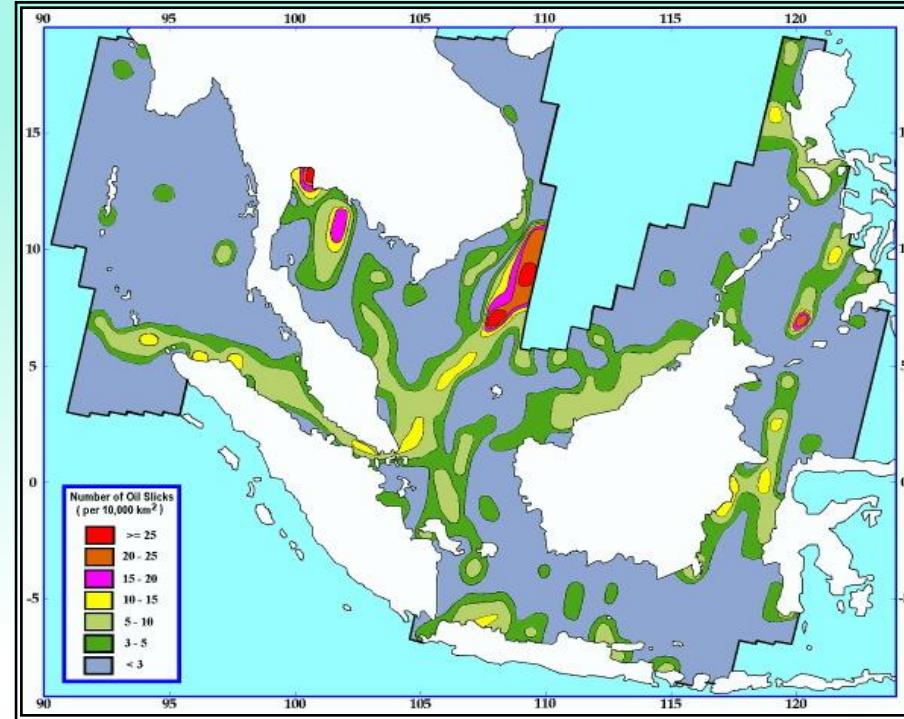
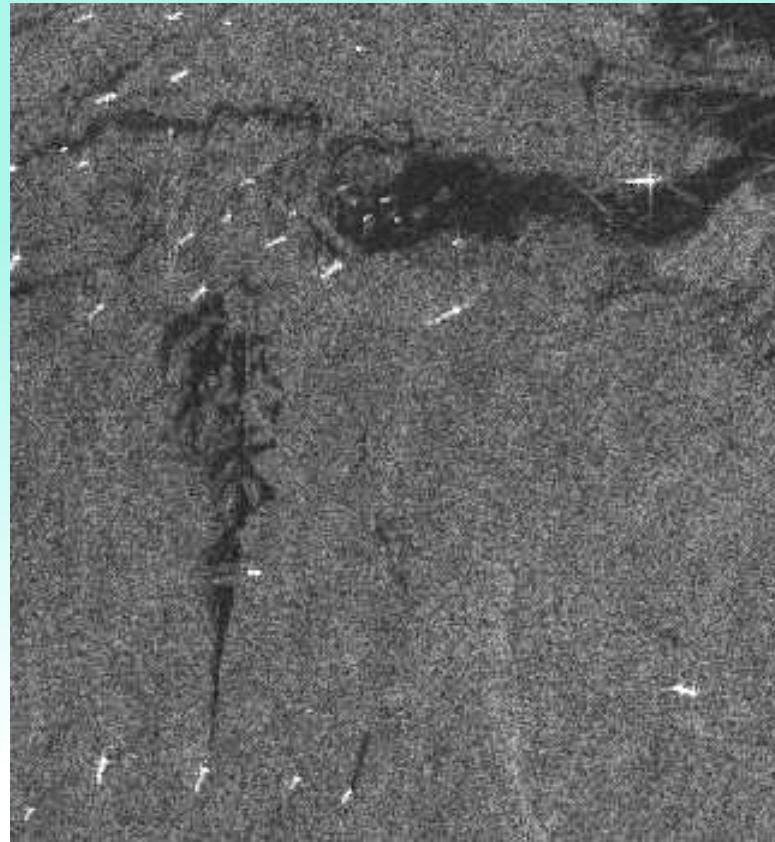


A pilot project in collaboration with International Rice Research Institute (IRRI), Philippines and University of Cantho, Vietnam



S. C. Liew, S. P. Kam, T. P. Tuong, P. Chen, V. Q. Minh, and H. Lim (1998), Application of multitemporal ERS-2 synthetic aperture radar in delineating rice cropping systems in the Mekong River Delta, Vietnam. *IEEE Trans. Geoscience and Remote Sensing*, 36(5) 1412-1420.

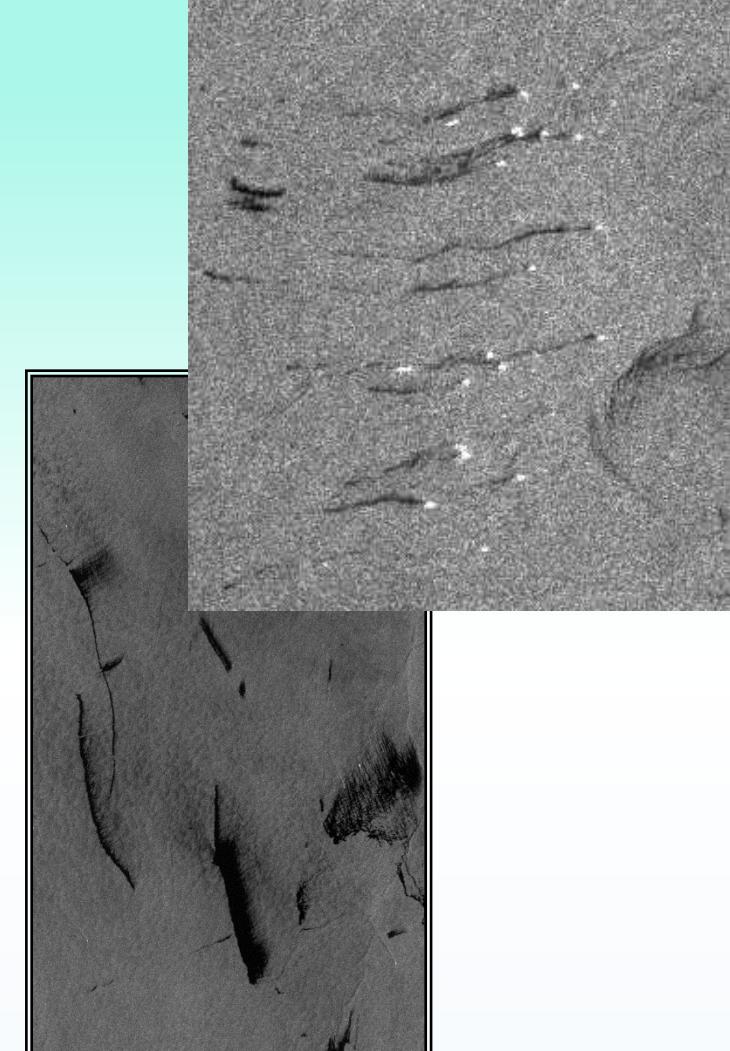
# Ocean Oil Spills



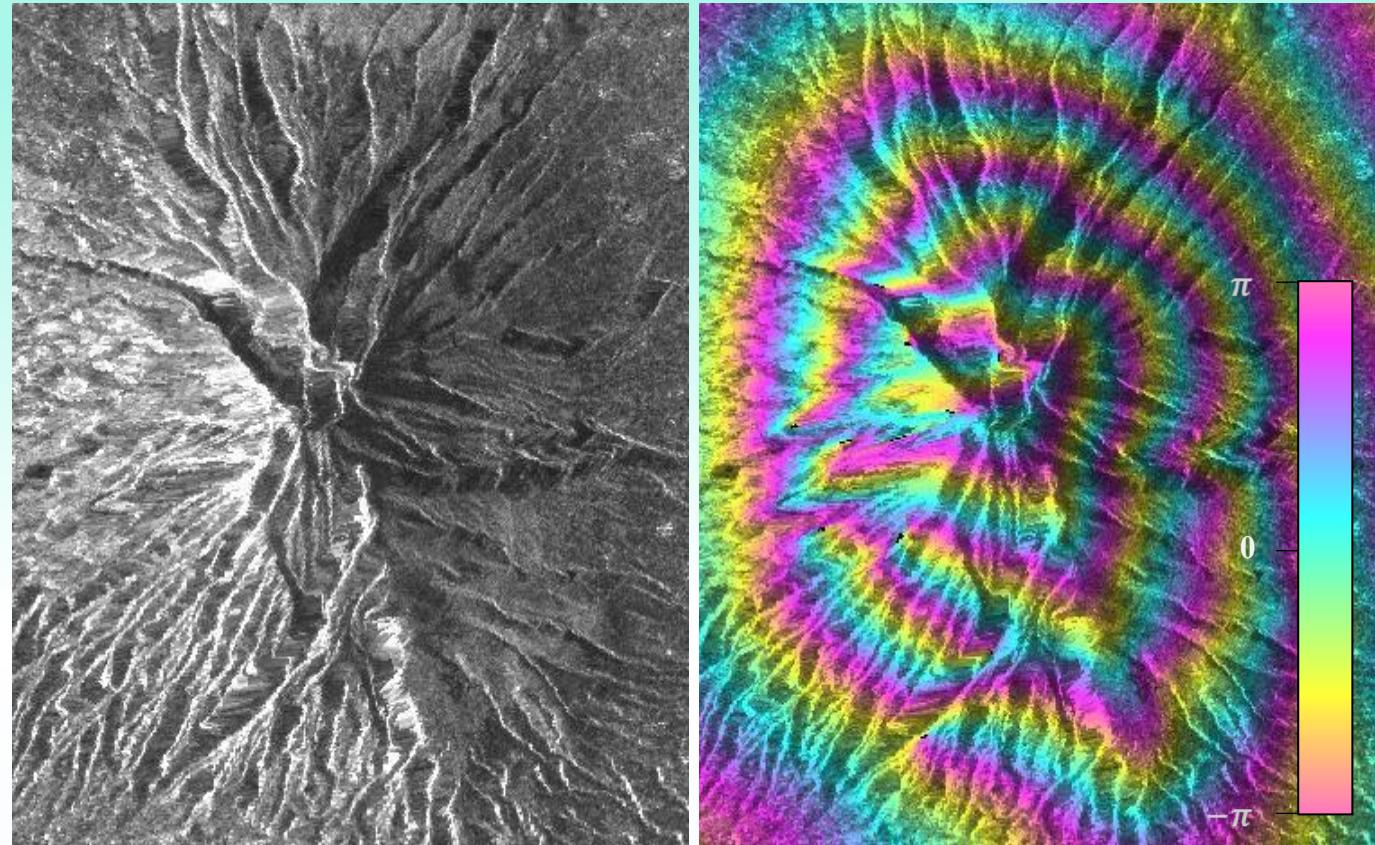
□ Aug 1996: An ERS SAR image clearly identified a ship discharging a plume of oil 5-km long.

□ With the ERS image and other evidence, the culprits were convicted in court and fined a total of S\$ 1.25 million.

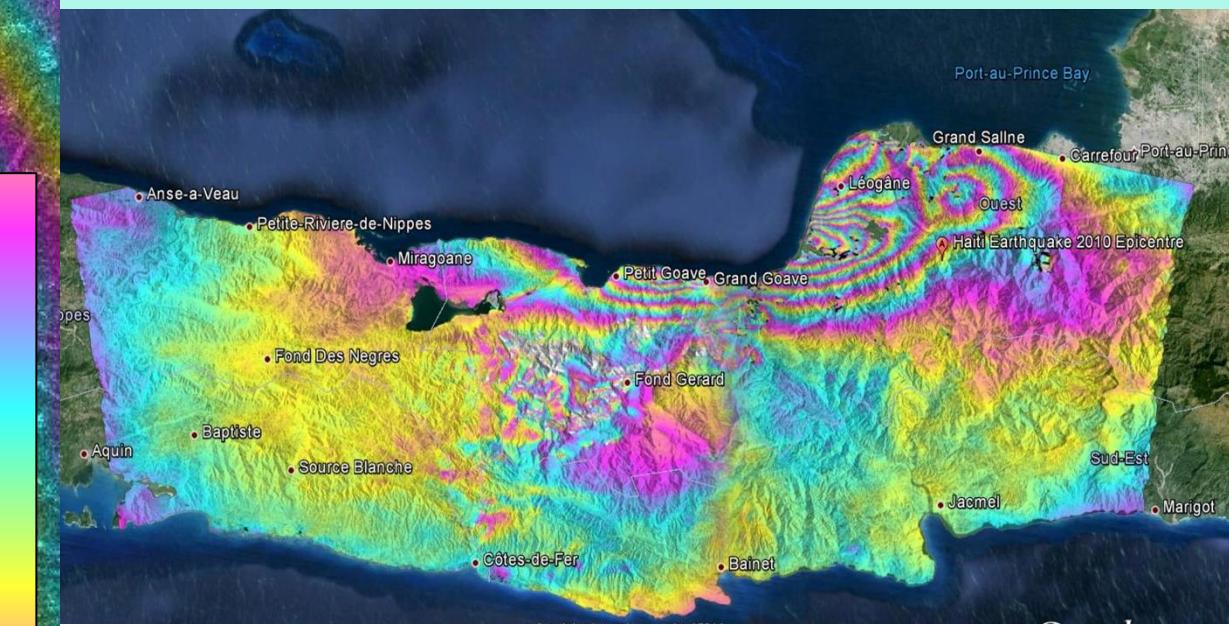
Frequency of Oil Spills from Ships estimated with more than 5000 scenes of ERS SAR images



# Interferometric SAR



Mt Merapi ALOS-1 Palsar Intensity Image (left), InSAR interferogram (right)



ALOS-1 DInSAR of Haiti Earthquake 2010.  
Fringe interval = 24cm

# Polarimetric Synthetic Aperture Radar

ALOS-2 PALSAR-2

Polarimetric Intensity Image



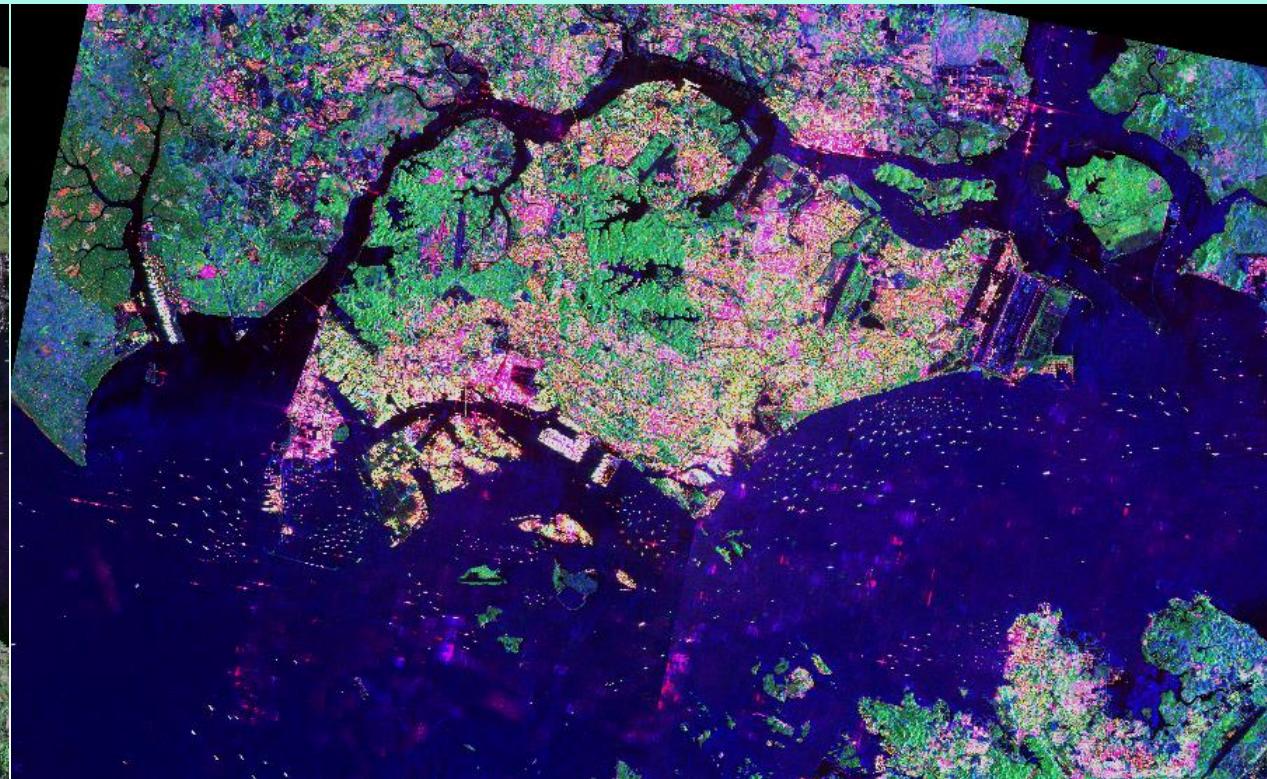
Red = HH

Green = HV

Blue = VV

ALOS-2 PALSAR-2

Polarimetric Scattering Decomposition Image



Red = Even Bounce

Green = Volume Scattering

Blue = Odd Bounce

# Image Interpretation

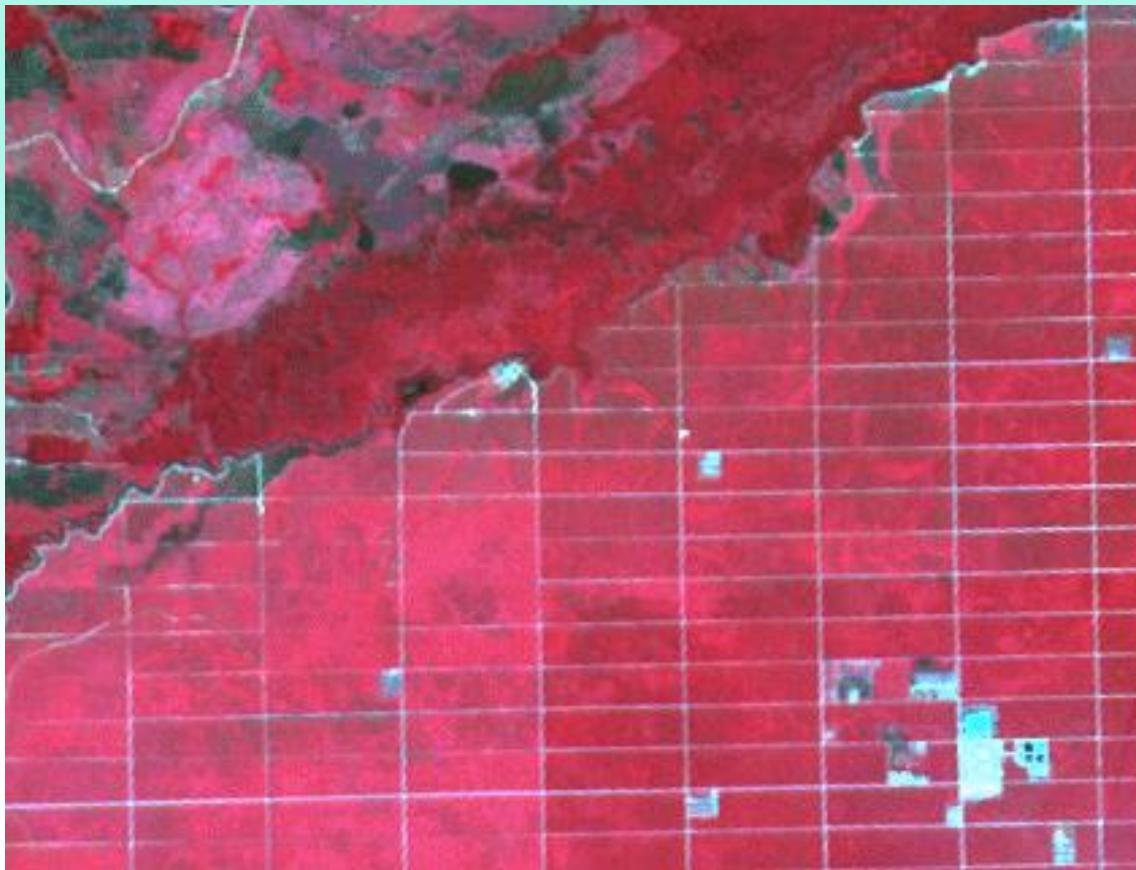
- Radiometric and Spectral Information
  - Brightness and colours
- Spatial and Geometric Information
  - Shape, size and location
- Textural Information
  - heterogeneity, directionality, “patterns”
- Contextual Information
  - Human activities, physical environment, natural phenomena, extreme events, disasters

Use any other information you can gather to help in interpretation.

“Ground Truth” information is always useful.

Domain knowledge is important! The more knowledge you have, the more information you can derive from the image.

# Geometric Pattern



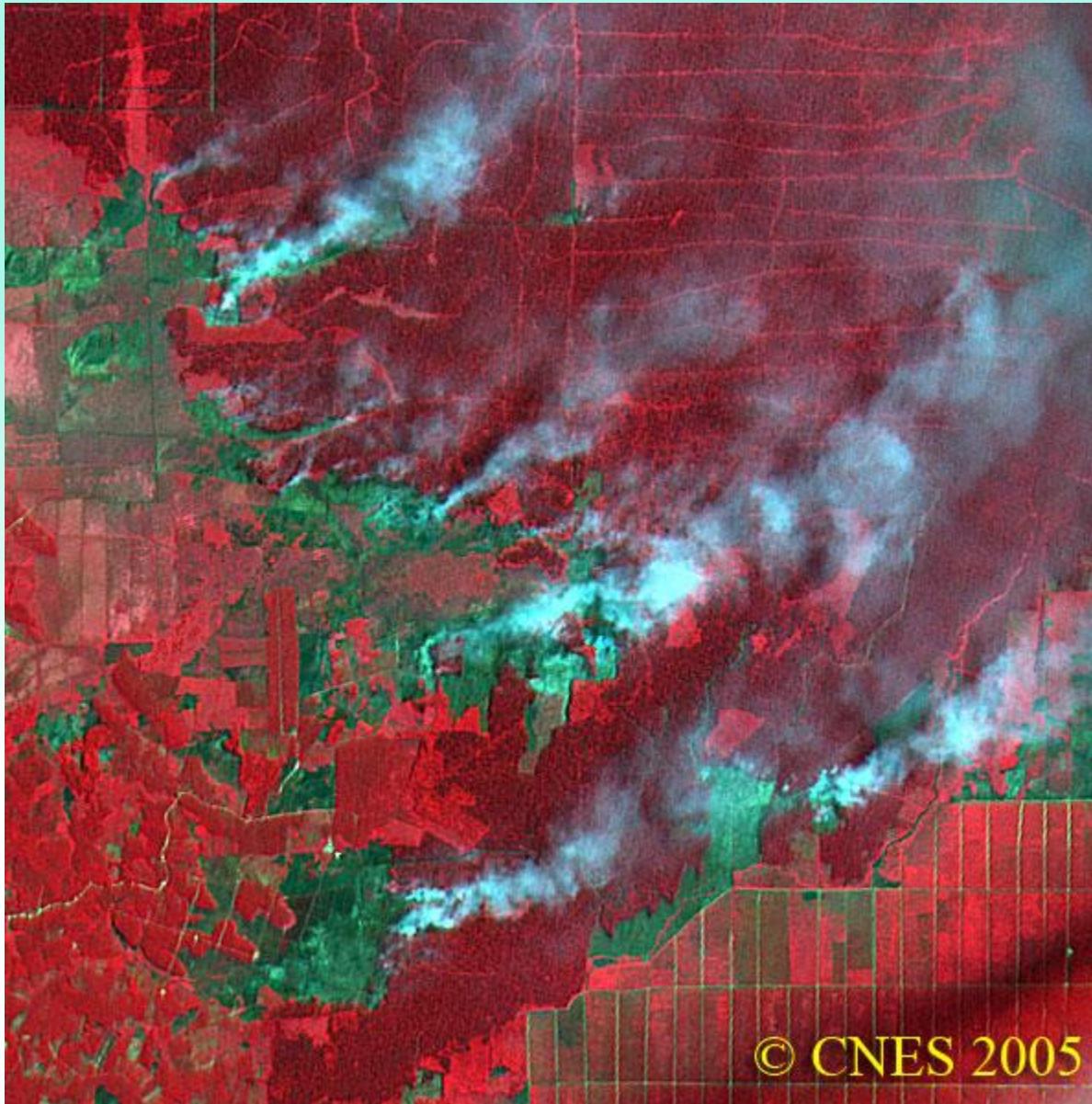
SPOT false colour image, RGB=321

# Texture

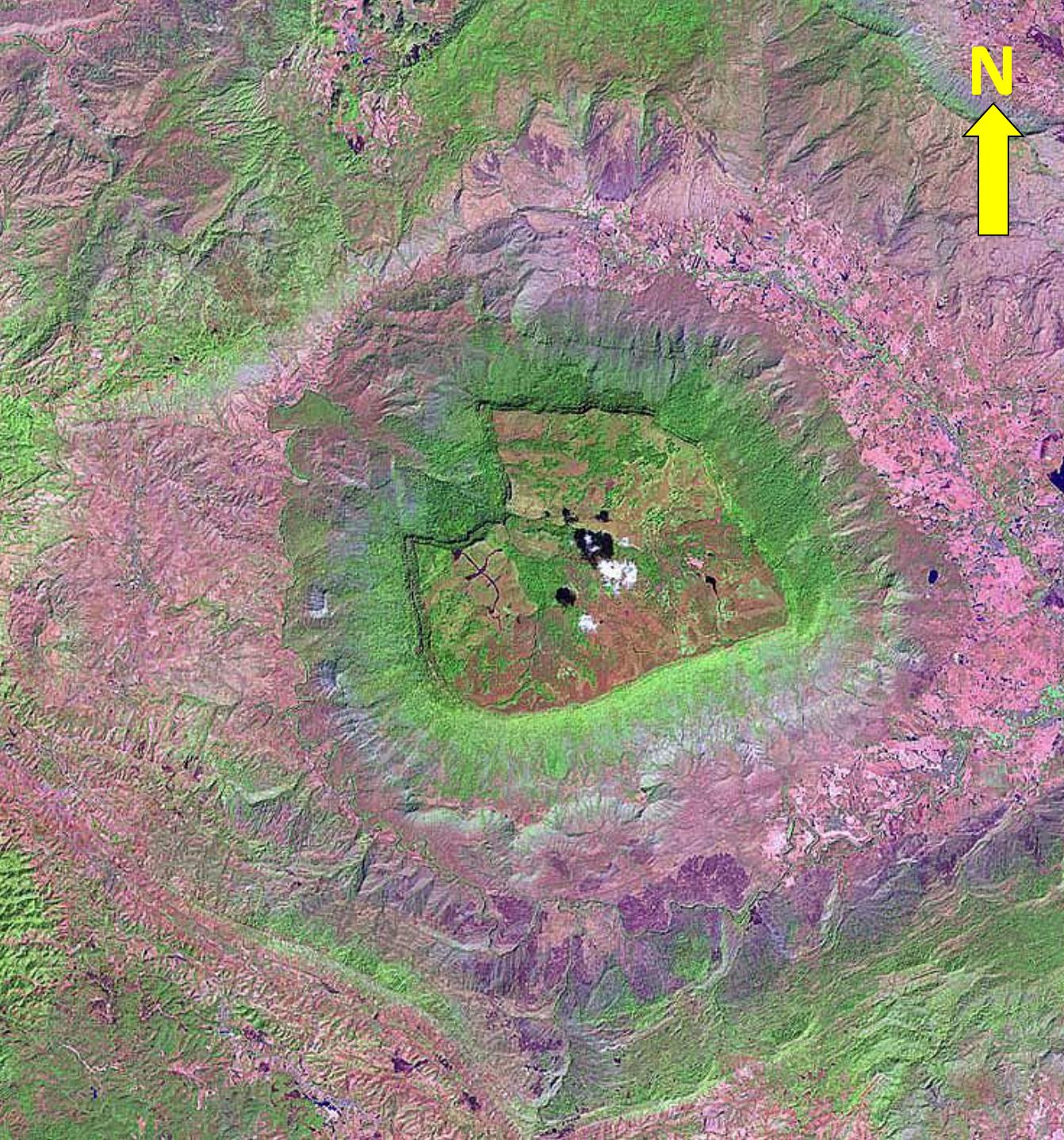


IKONOS  
True colour  
image

## Contextual Information



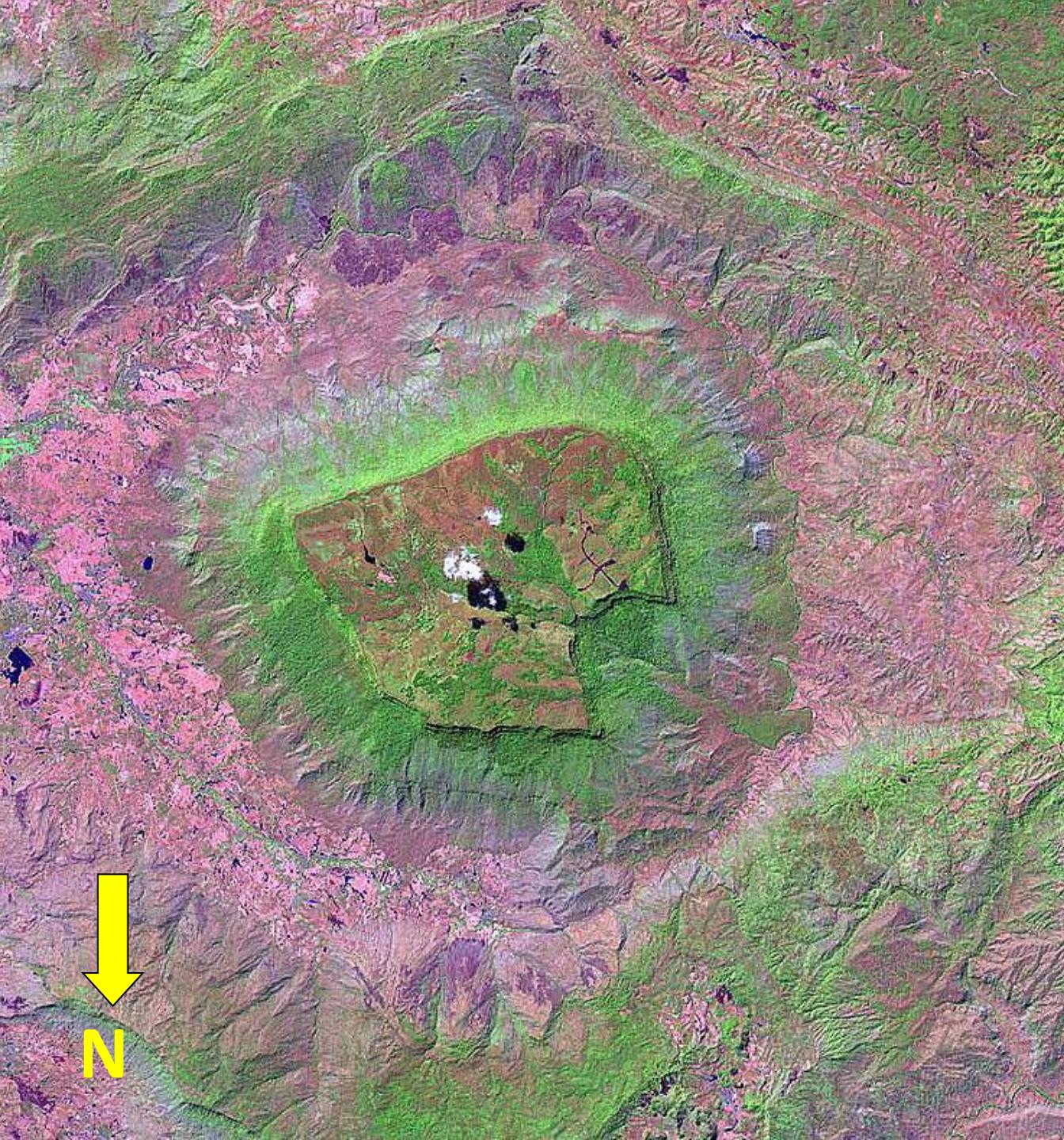
SPOT  
false colour  
image,  
RGB=321



Illumination effect.  
Sometimes our eyes  
play tricks on us.

North is up.

Is the heart-shaped  
structure higher or  
lower than the  
surrounding?



Illumination effect.  
Sometimes our eyes  
play tricks on us.

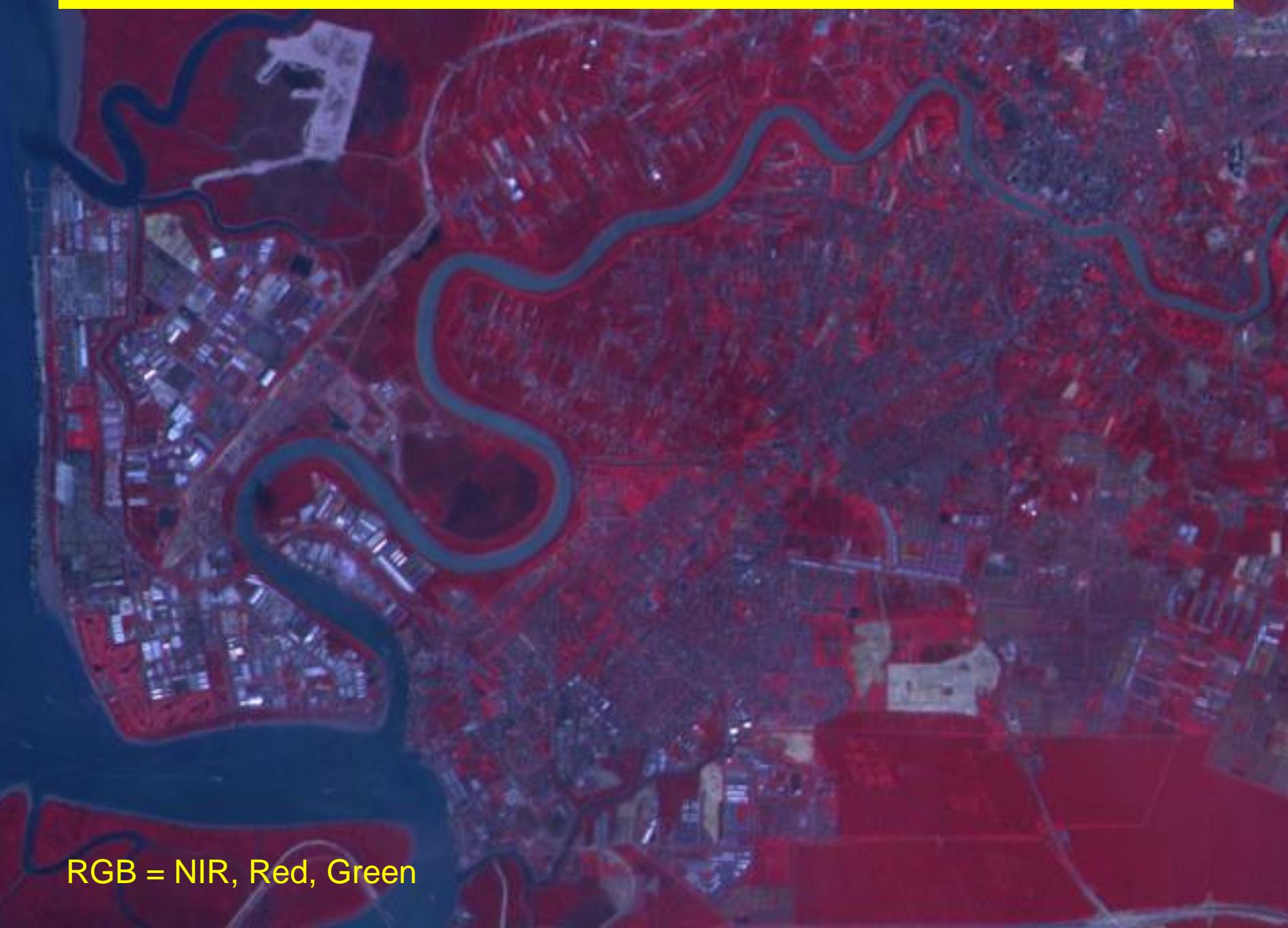
Rotate the image 180  
degrees.  
Now, North is down.

Is the heart-shaped  
structure higher or  
lower than the  
surrounding?

# **Some techniques in image processing and extracting information from satellite images**

- Radiometric enhancement
  - Contrast stretching
- Algebraic operations
  - Band ratioing, vegetation index, moisture index, chlorophyll indices, etc.
- Classification
- Modeling
  - Physics-based models
  - Statistical models
  - Machine learning models

## Example: Before contrast enhancement



RGB = NIR, Red, Green

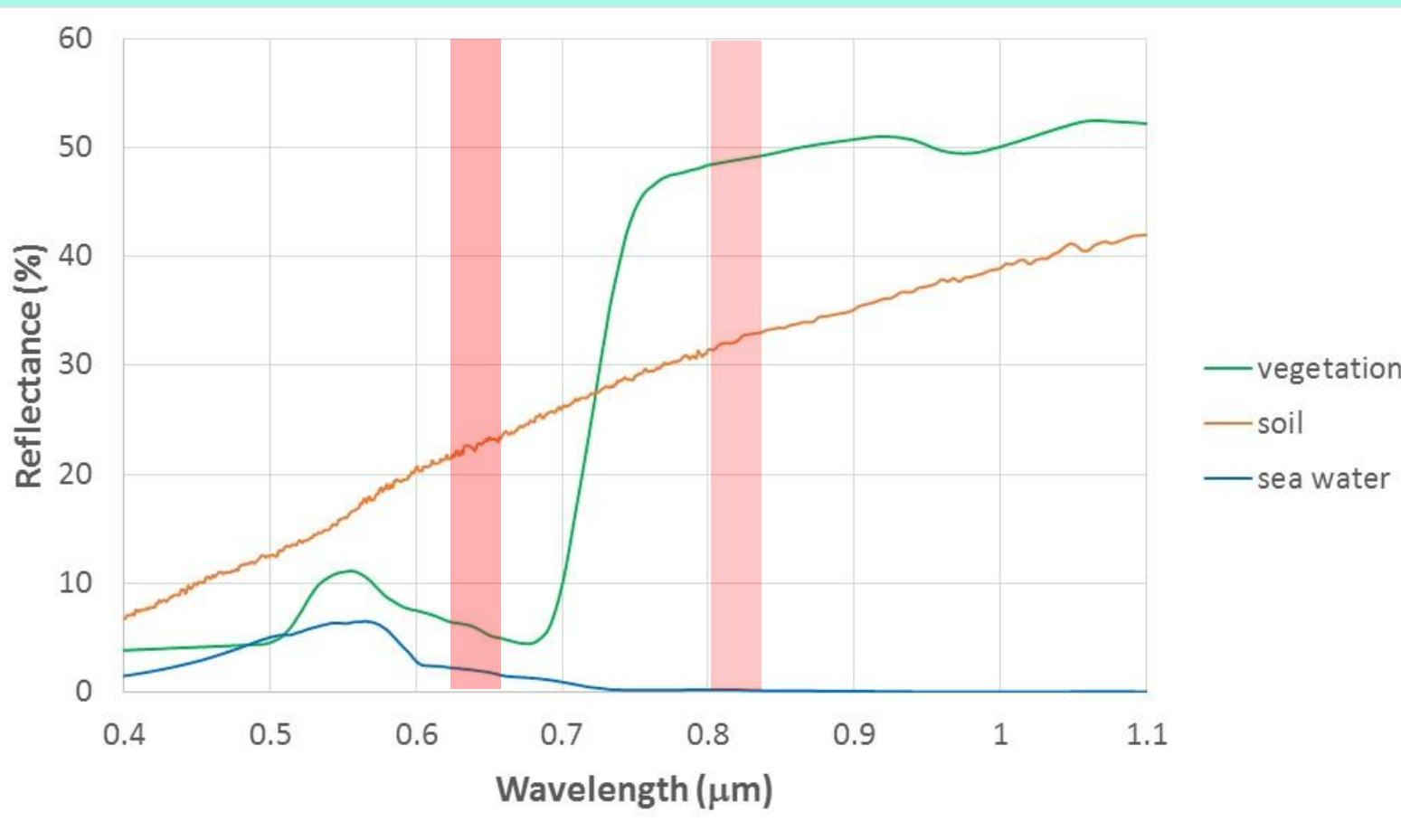
**After contrast enhancement**



# Vegetation Index

Red Band

NIR Band



Ratio Vegetation Index

$$RVI = R_{NIR}/R_{Red}$$

Normalized Difference  
Vegetation Index

$$NDVI = (R_{NIR} - R_{red})/(R_{NIR} + R_{red})$$



Satellite image

RGB = NIR, Red, Green

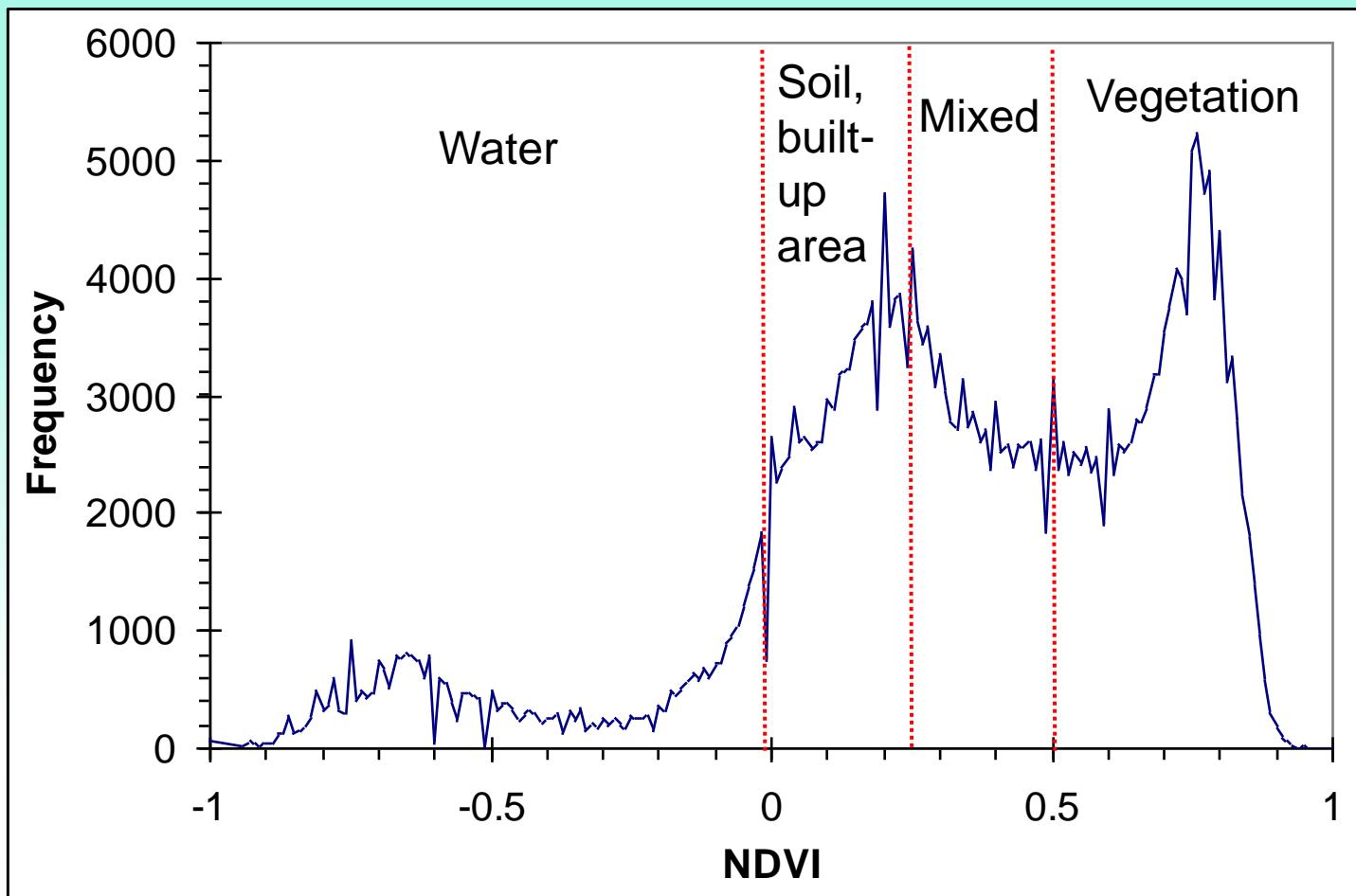
**CRISP**

National University of Singapore

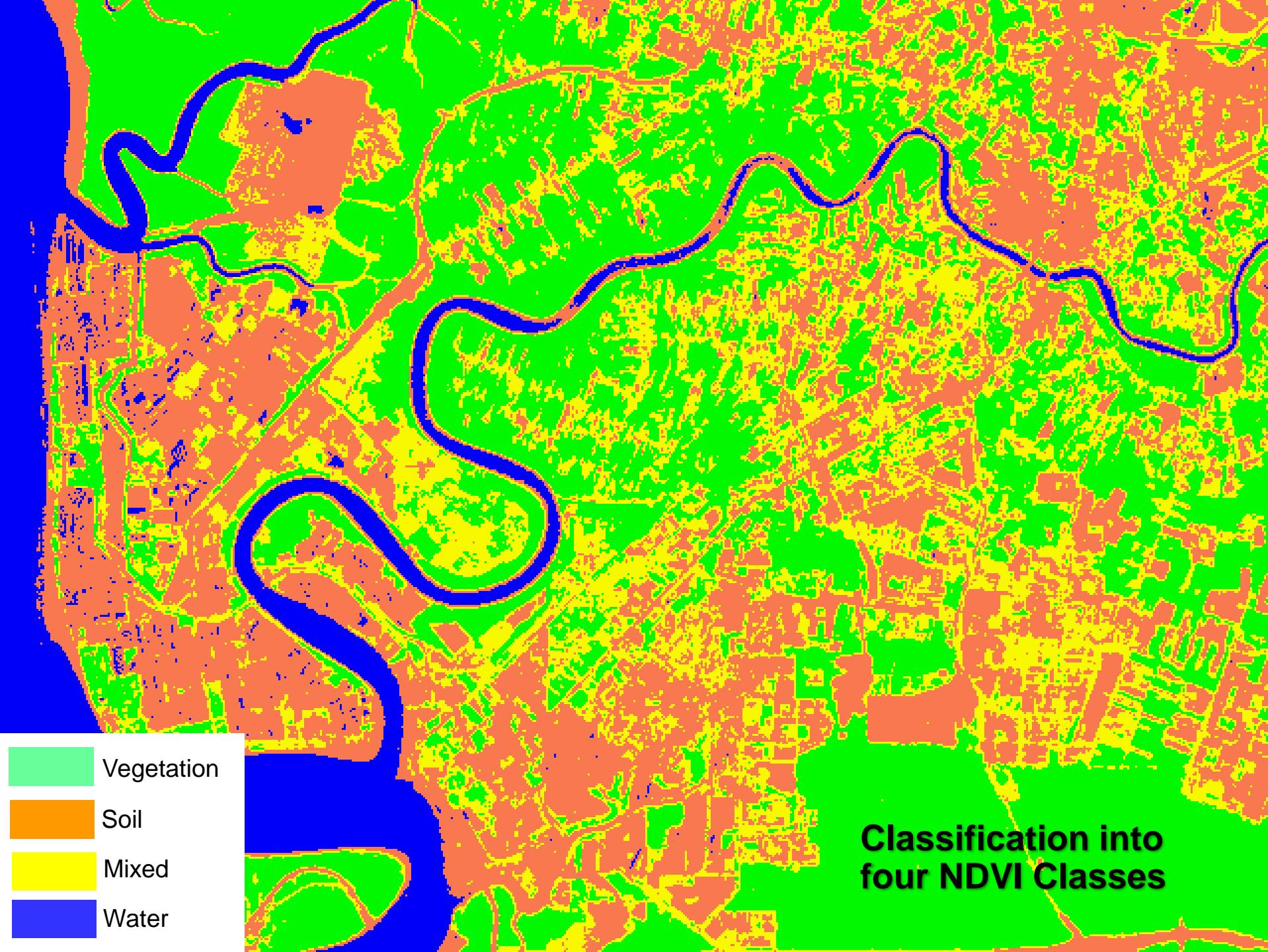


NDVI

# NDVI Histogram



NDVI can be used for classification into broad land cover classes



**Classification into  
four NDVI Classes**

# Mapping Mangrove Area



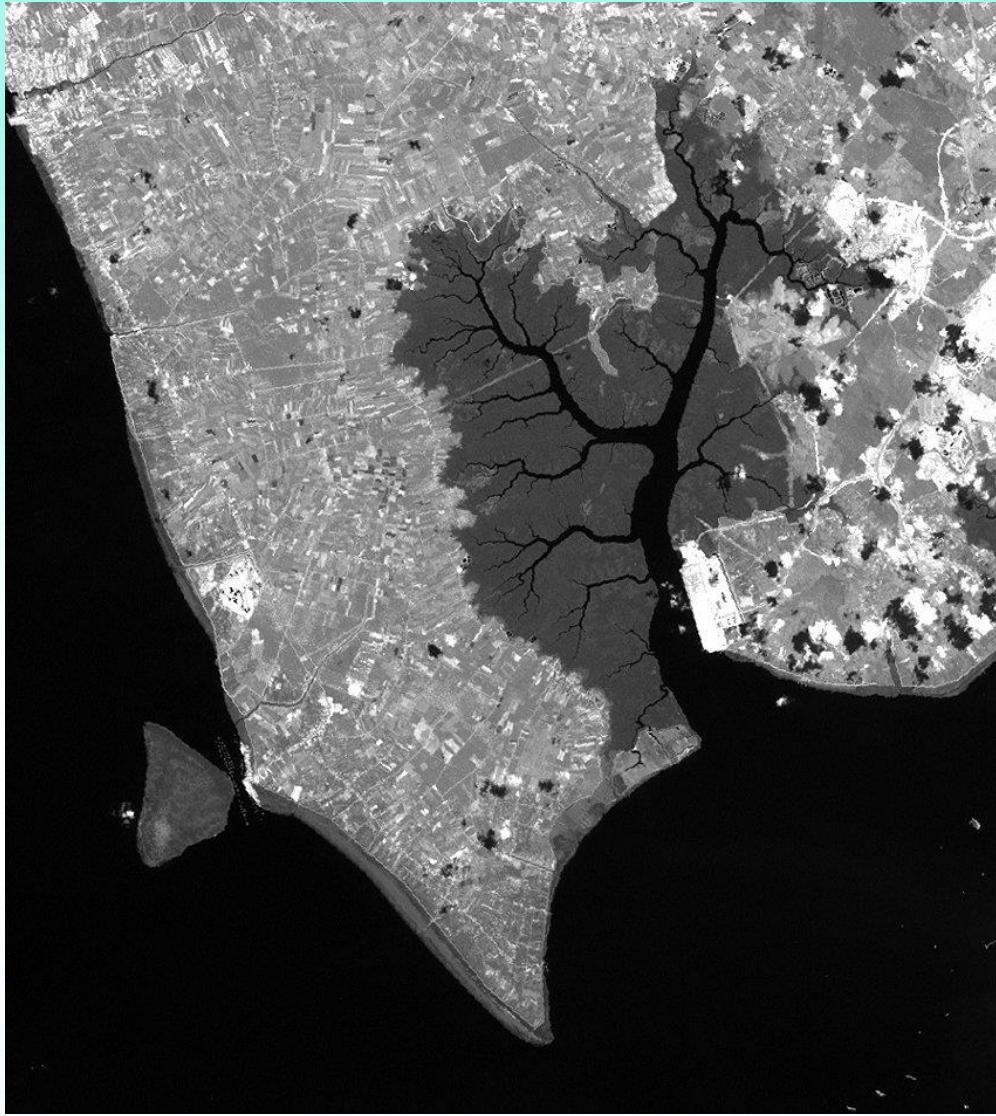
Landsat 7 ETM+ Image  
(RGB=543)

# Mapping Mangrove Area



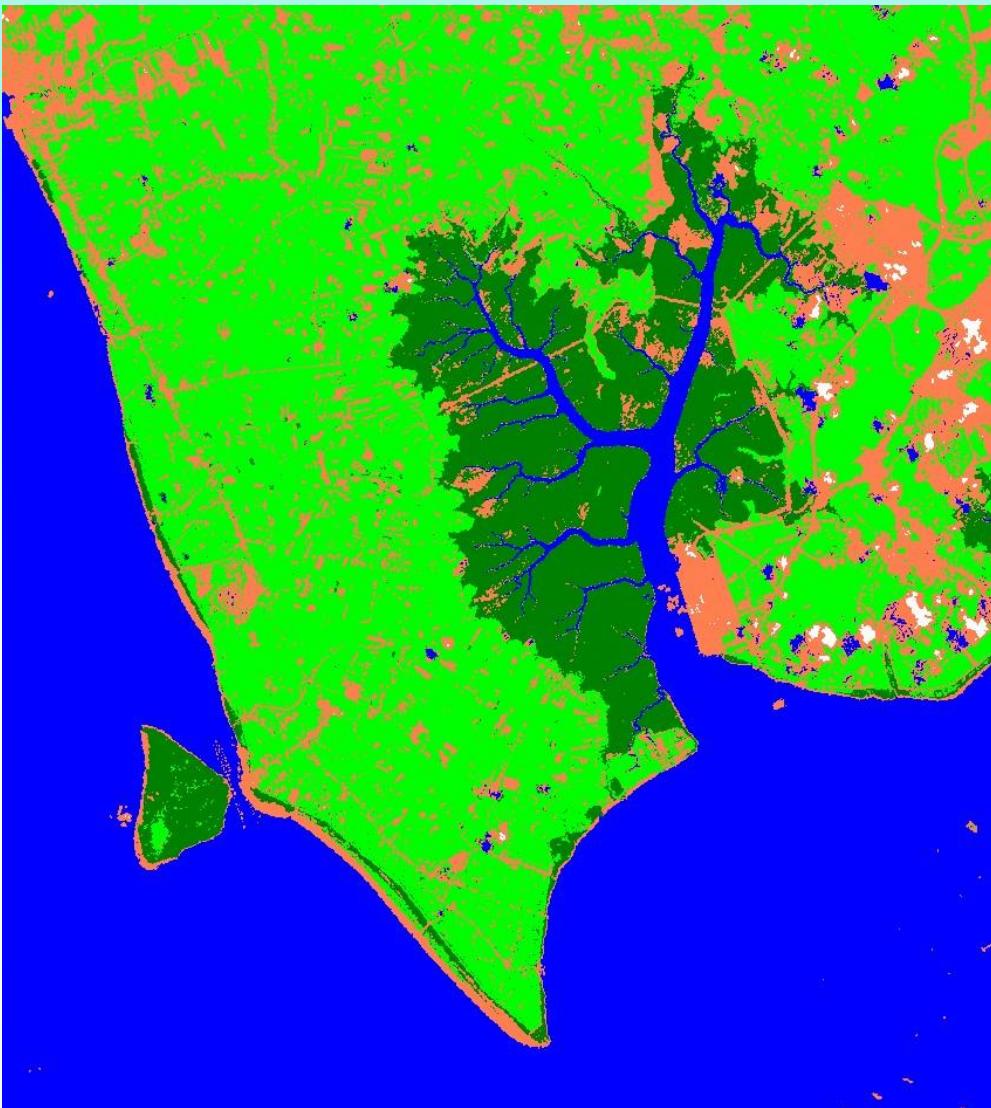
Landsat 7 ETM+ Image  
(NDVI)

# Mapping Mangrove Area



Landsat 7 ETM+ Image  
(Band 5 SWIR)

# Mapping Mangrove Area

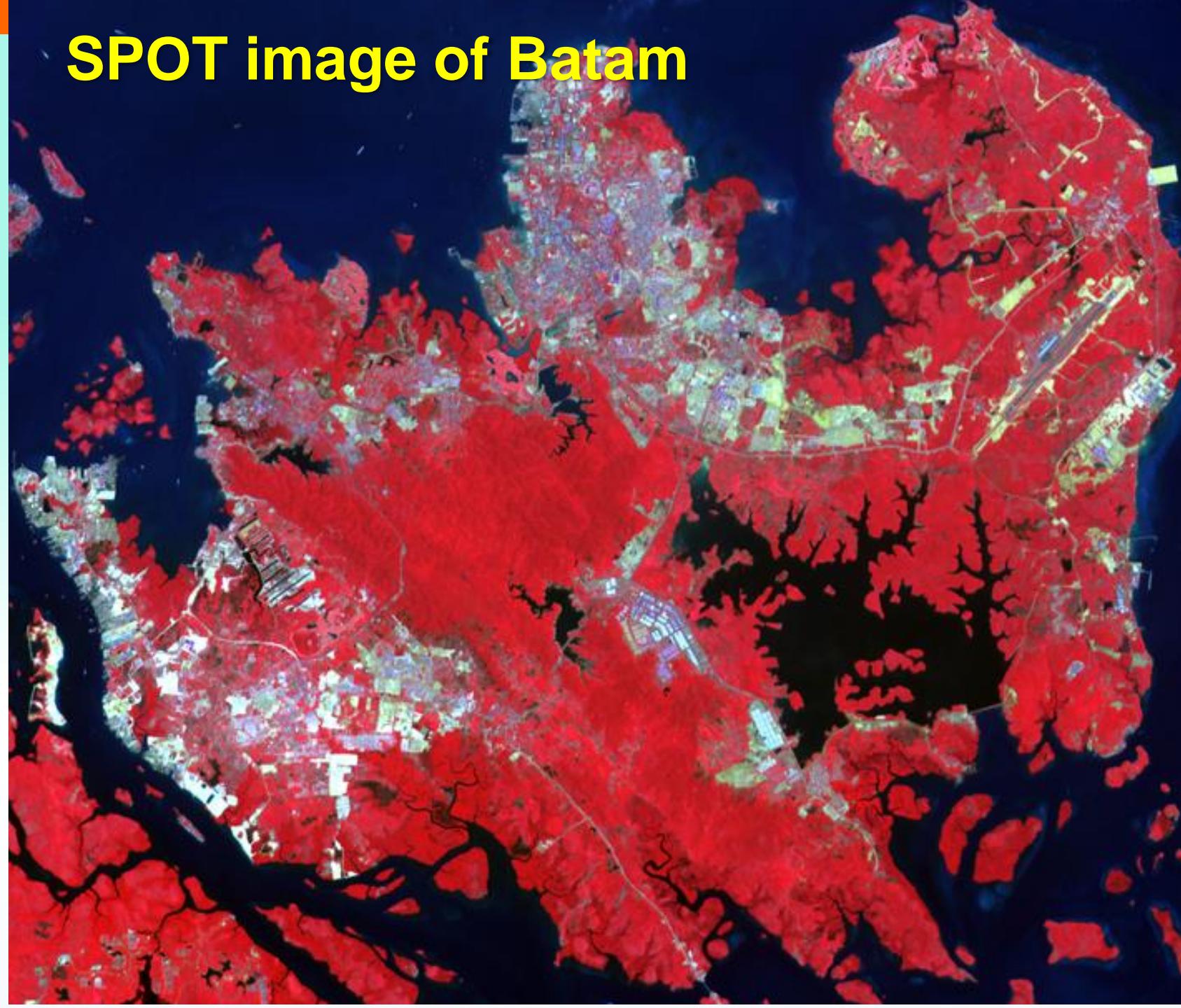


Mangrove Map derived from Landsat 7 ETM+ Image

- █ Water
- █ Non-vegetation
- █ Mangrove
- █ Non-mangrove vegetation

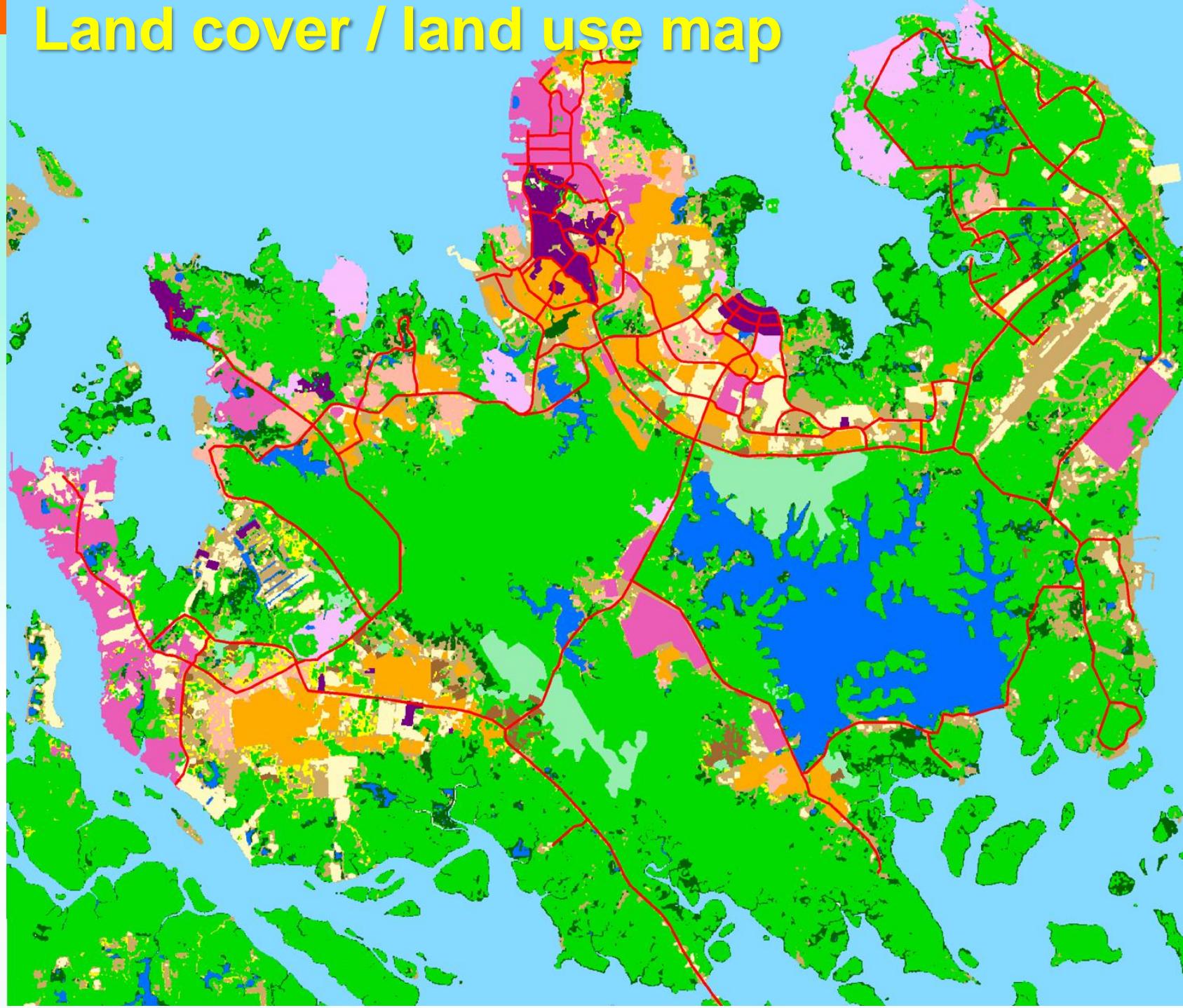
Mangrove Area delineated by thresholding on NDVI to select vegetation (green areas) and then on Band 5 (SWIR) to select moist vegetation (Dark green areas).

# SPOT image of Batam



Land cover /  
Land Use  
Classification

# Land cover / land use map



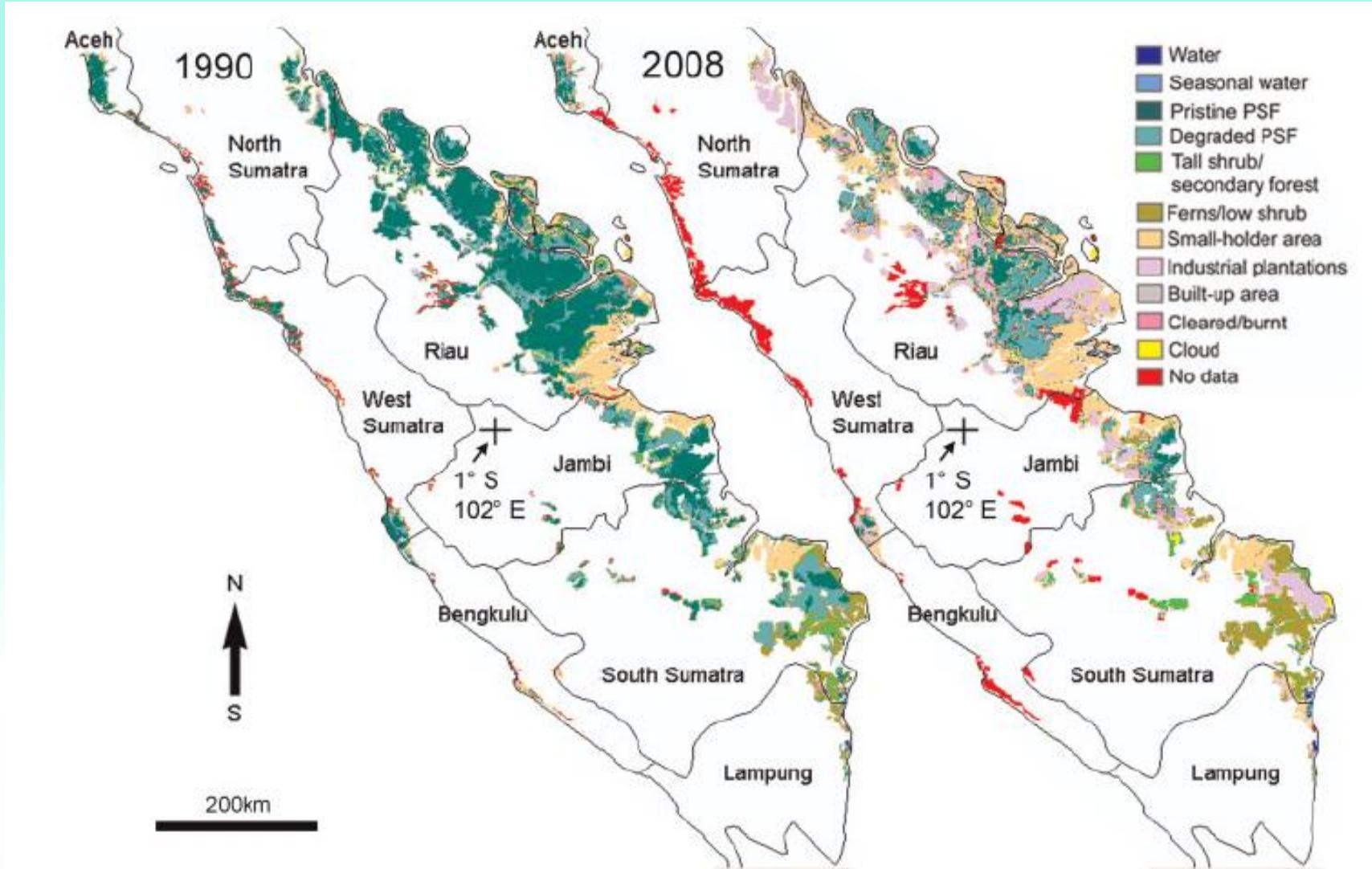
## Classification

Semi-automatic clustering followed by manual assignment of class labels, manual delineation of major roads

### Legend

Commercial
Recreational
Industrial Estate
Open Land
Low Intensity Residential
High Intensity Residential
Villages
Farm Land
Forest
Grass / Shrubland
Forested Wetland
Built-Up Land
Inland Water
Sea
Road

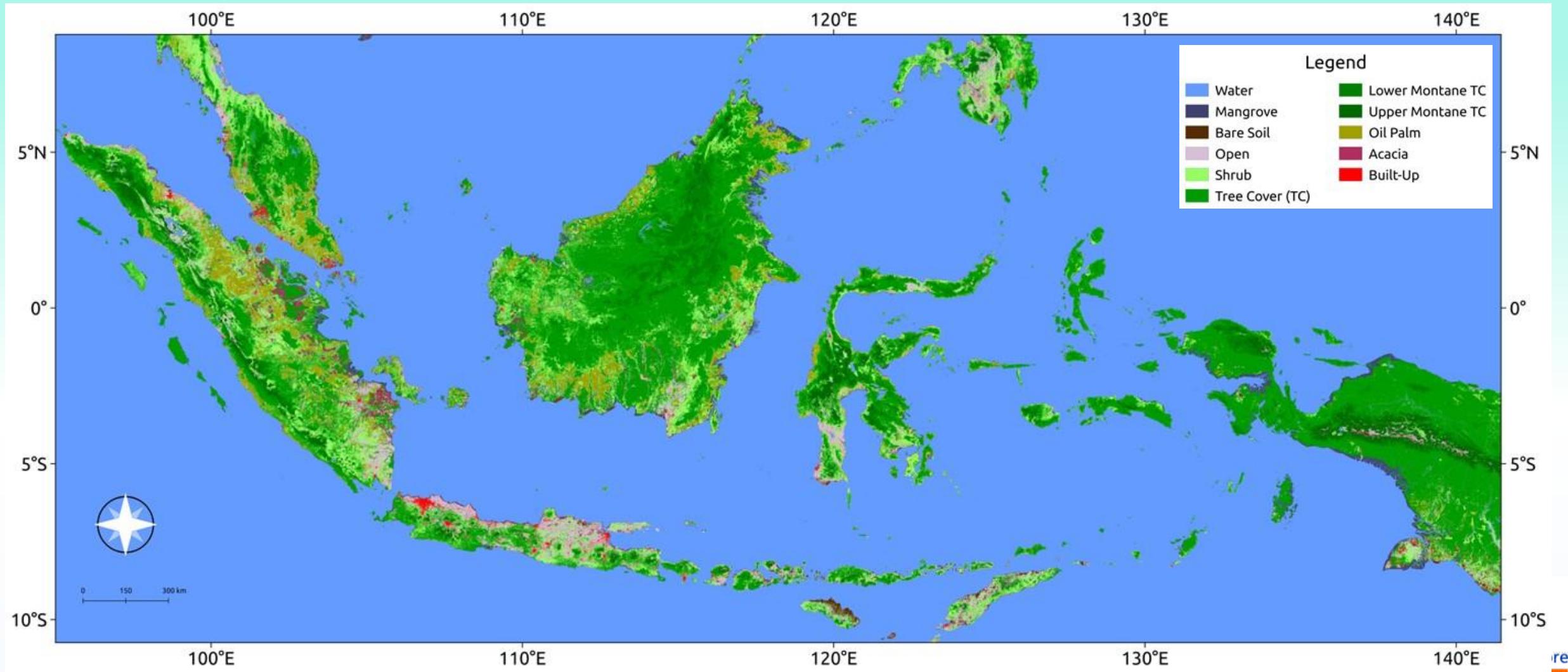
## Land cover change in peatlands of Sumatra 1990 – 2008



From: Miettinen and Liew, Land degradation & development 21: 285–296 (2010)

# Southeast Asia Land Cover map 2020 (30m resolution)

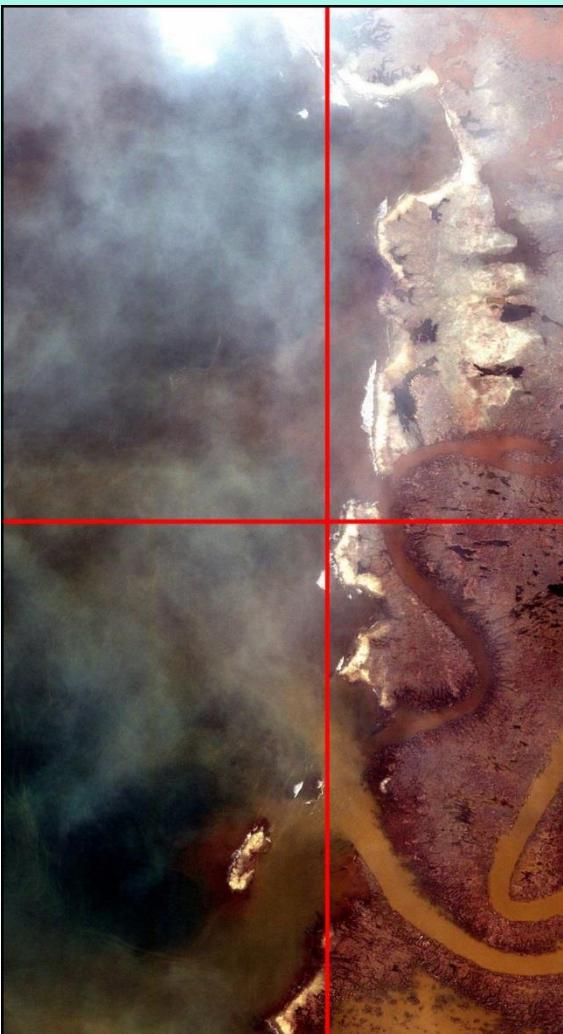
## Automatic Classification by Machine Learning



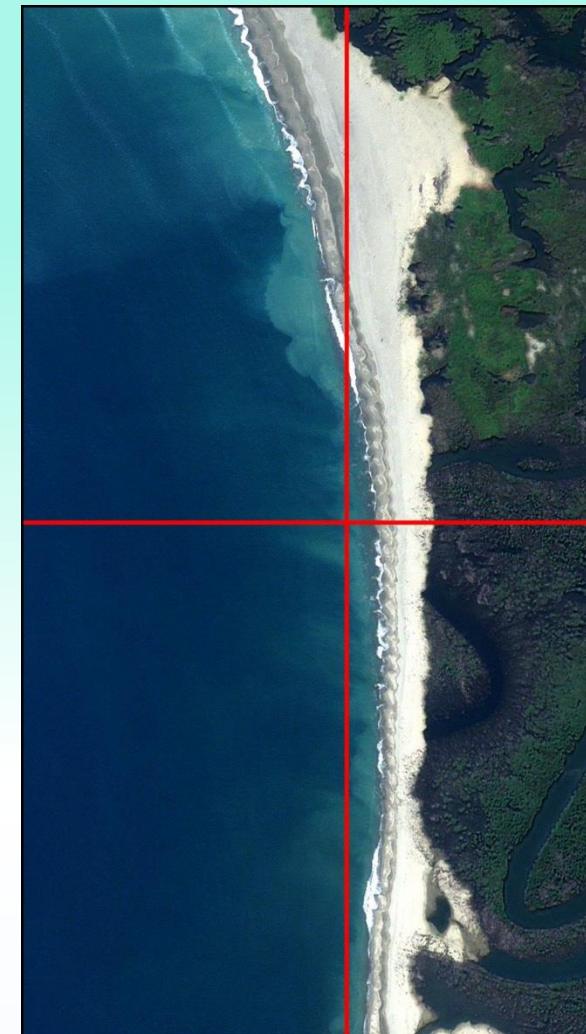
## Change Detection: Aceh Coast – Recovery after the 2004 Indian Ocean Tsunami



Pre-tsunami



Tsunami



13 months Post-tsunami

# **End of Lecture 1**

## **Thank you**