

IMAGE DATA ANALYSIS (6CFU)

MODULE OF
REMOTE SENSING
(9 CFU)

A.Y. 2022/23
MASTER OF SCIENCE IN COMMUNICATION TECHNOLOGIES AND MULTIMEDIA
MASTER OF SCIENCE IN COMPUTER SCIENCE, LM INGEGNERIA INFORMATICA

PROF. ALBERTO SIGNORONI

SOURCES AND CHARACTERISTICS OF “REMOTELY SENSED” IMAGE DATA



Image Data Analysis course in the context of Remote Sensing... and BEYOND!

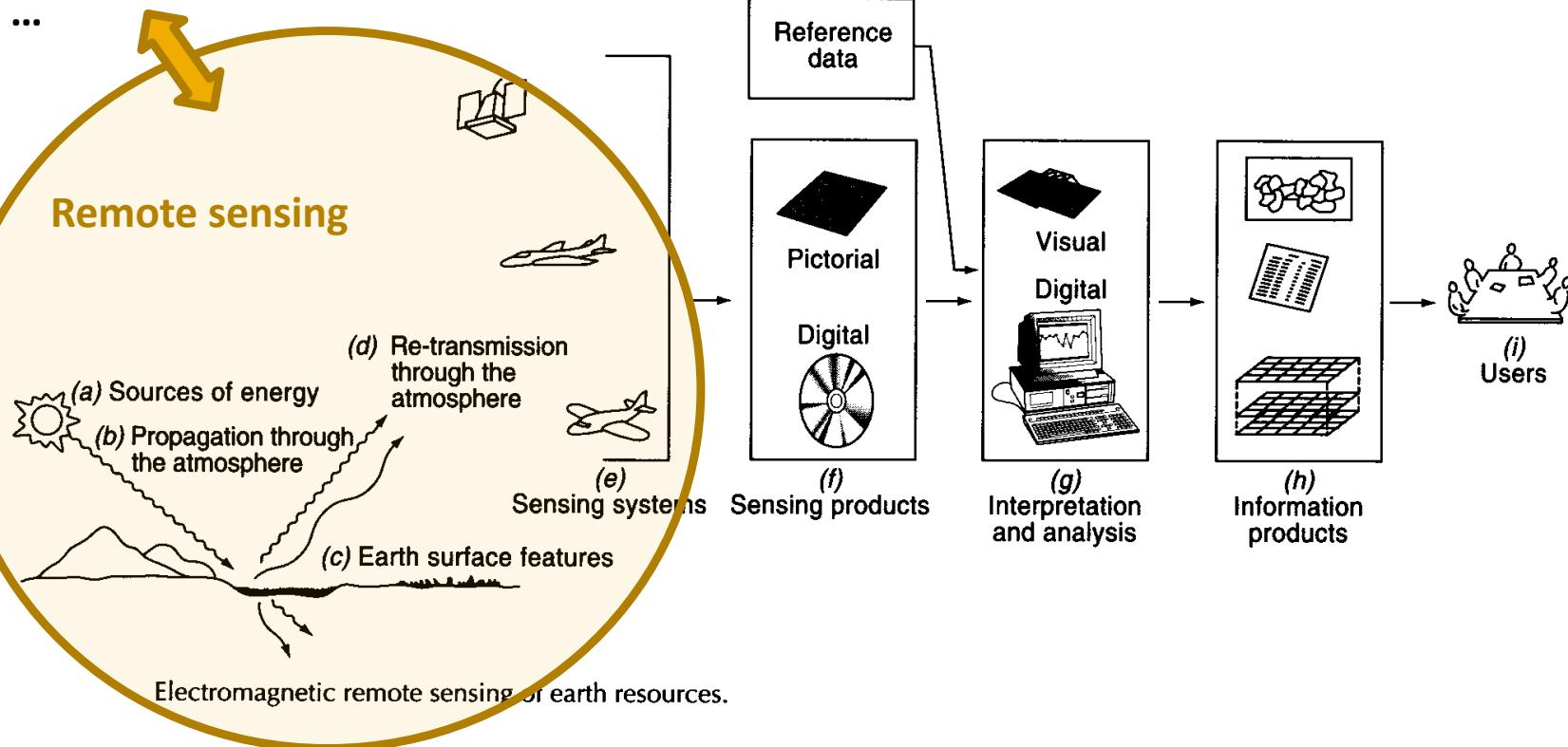
□ S1 IMAGE DATA ANALYSIS (6CFU)

□ S1 Remote Sensing Data Acquisition (prof. Daniele Modotto – 3CFU)

What is an image? Where it comes from? Which kind of information it carries?...

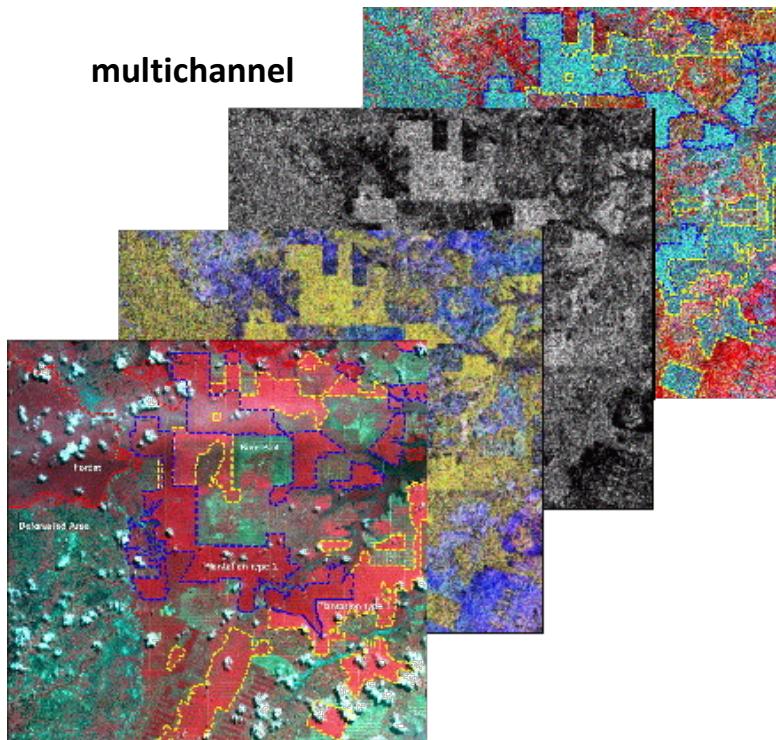
Medical Imaging Industrial Imaging

DATA ACQUISITION → DATA ANALYSIS

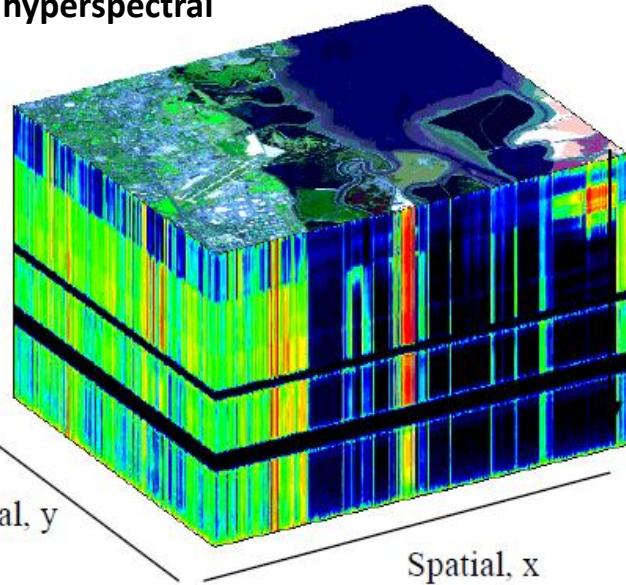


Remote Sensing Data (examples)

multichannel



hyperspectral



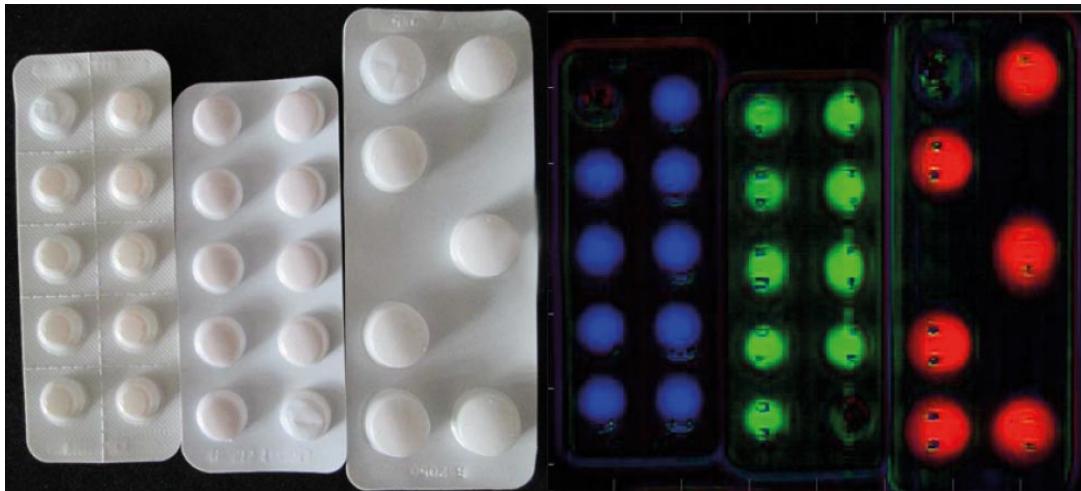
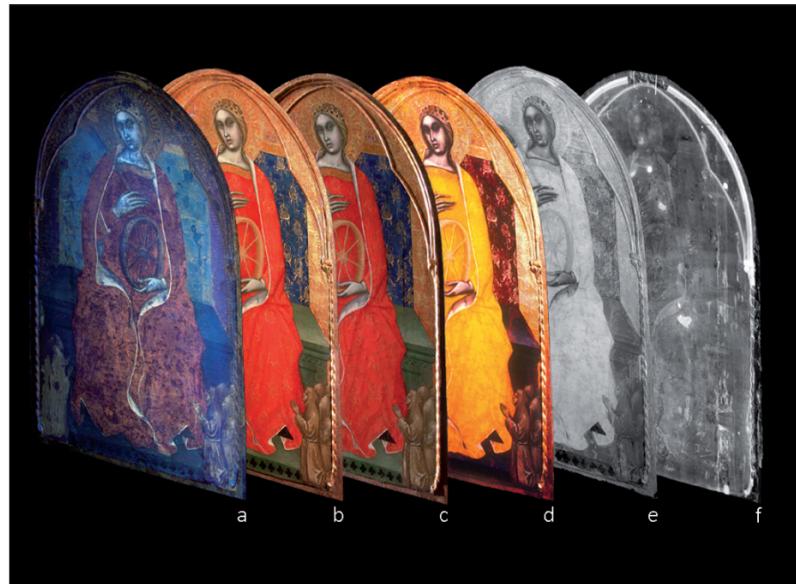
A 3D perspective view of a mountainous terrain. The terrain is rendered with green and brown colors, representing vegetation and rocky areas. A winding blue line, representing a river or path, cuts through the landscape. The terrain is highly detailed, showing various ridges, valleys, and slopes. In the bottom right corner, the text "3D geometric" is displayed in a bold, black, sans-serif font.

A 3D rendering of a dense cityscape, likely a digital model or a highly detailed architectural visualization. The scene is filled with numerous skyscrapers and buildings of varying heights, rendered in a palette of earthy tones like browns, grays, and greens. The buildings are densely packed, creating a complex urban environment. The perspective is from an elevated angle, looking down at the city. The lighting suggests a bright day, casting soft shadows that emphasize the three-dimensional nature of the structures.

Same kind of data in other Domains

- Biomedical
 - Industrial
 - Agrifood
 - Construction
 - Surveillance
 - Cultural heritage
 - ...

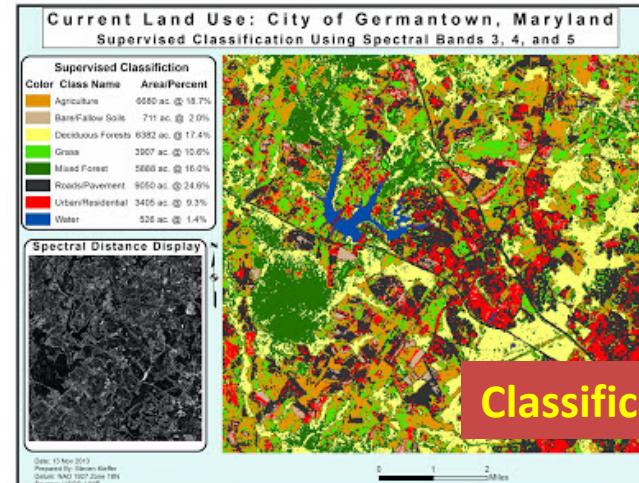
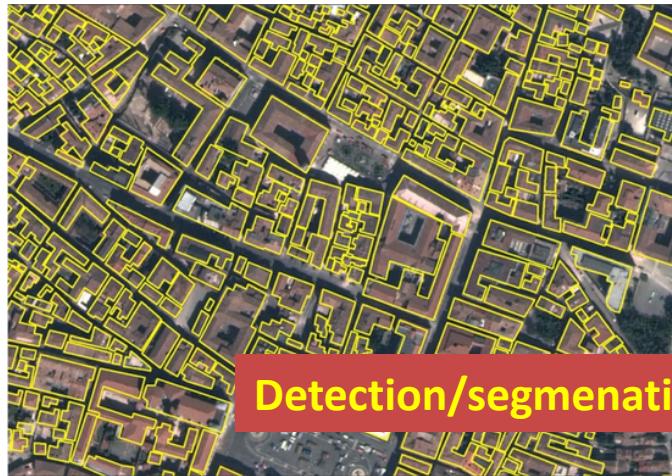
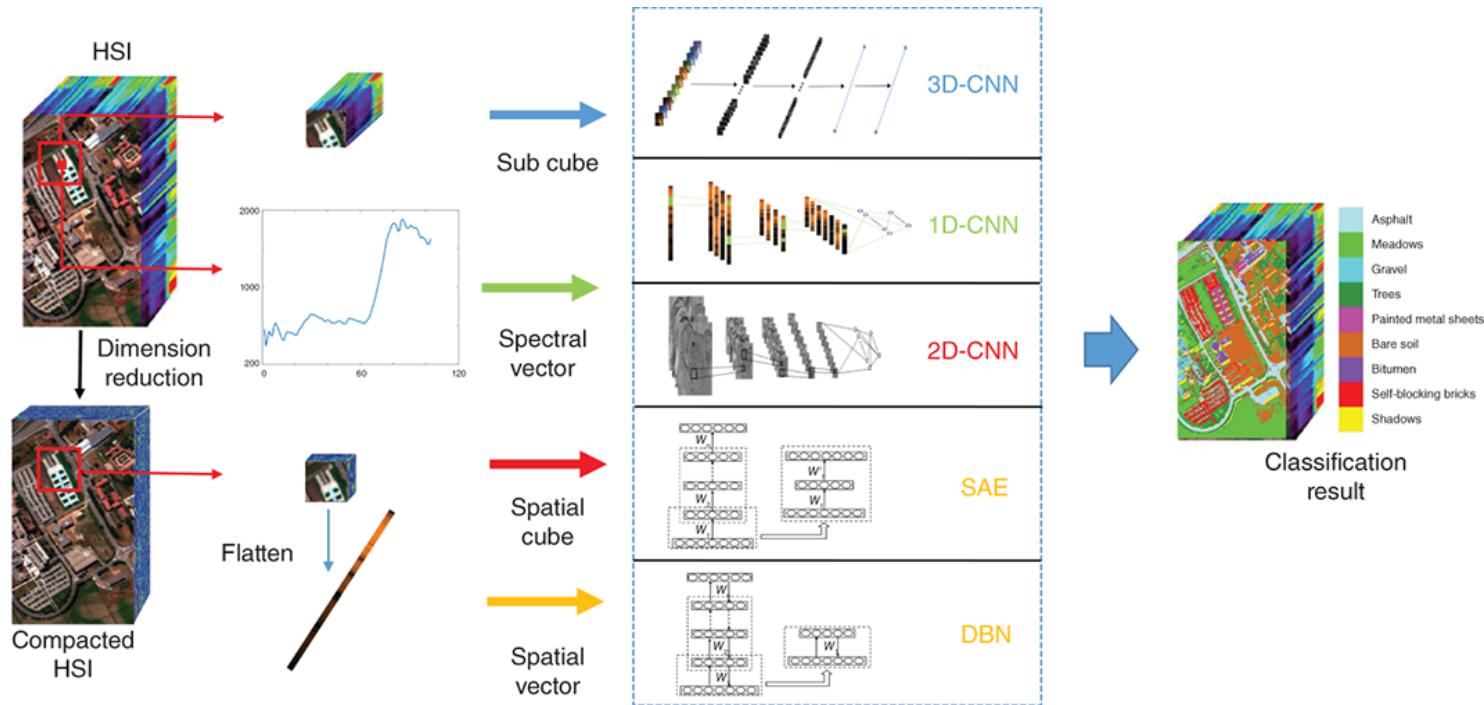
Other domain Image Data (examples)



**Same kind of data
in other Domains**

- Biomedical
- Industrial
- Agrifood
- Construction
- Surveillance
- Cultural heritage
- ...

Machine/Deep Learning for multidimensional image data analysis tasks



Some selected works from our research group

□ Hyperspectral imaging

- [Acquisition Spatial–Spectral Evidence of Glare Influence on Hyperspectral Acquisitions](#)
- [Analysis with machine learning Hyperspectral image analysis for rapid and accurate discrimination of bacterial infections: A benchmark study](#)
- [Analysis with deep learning](#)
 - [Deep learning meets hyperspectral image analysis: a multidisciplinary review](#)

□ Deep learning for 3D data processing

- [Object reconstruction](#)
 - [Cross-domain assessment of deep learning-based alignment solutions for real-time 3D reconstruction](#)

□ Deep learning for biomedical image analysis

- [Microbiology](#)
 - [Hemolysis Detection on Cultured Blood Agar Plates by Convolutional Neural Networks](#)
 - [Combining the use of CNN classification and strength-driven compression for the robust identification of bacterial species on hyperspectral culture plate images](#)
- [Neuroimaging](#)
 - [CEREBRUM: a fast and fully-volumetric Convolutional Encoder-decodeR for weakly-supervised sEgmentation of BRain strUctures from out-of-the-scanner MRI](#)
 - [Transfer learning of deep neural network representations for fMRI decoding](#)
- [COVID-19](#)
 - [End-to-end learning for semiquantitative rating of COVID-19 severity on Chest X-rays](#)
 - [Assessing Trustworthy AI in times of COVID-19. Deep Learning for predicting a multi-regional score conveying the degree of lung compromise in COVID-19 patients](#)
 - <https://brixia.github.io>



Course info

□ Schedule IDA 2022-23

- **Monday** **14 - 17** Blab2
- **Thursday** **11 - 13** B2.9



□ Course material

- On Google drive. Please fill this form: <https://forms.gle/ptnKgkRAeZxLtkif9>

□ Exams

- **Image Data Analysis (6CFU)** Written exam + LAB-related assignment(s) (1/3+1/3)
- RS Data Acquisition (3CFU) Written exam (1/3)

□ Laboratory teaching assistant

- **Dr. Mattia Savardi**
 - *mattia.savardi@unibs.it*

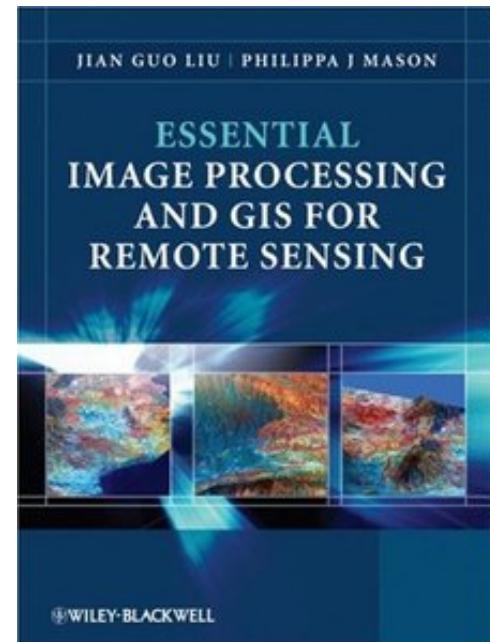
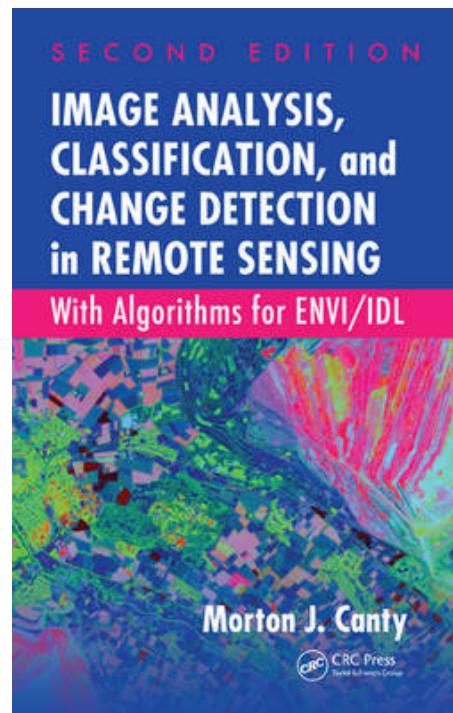
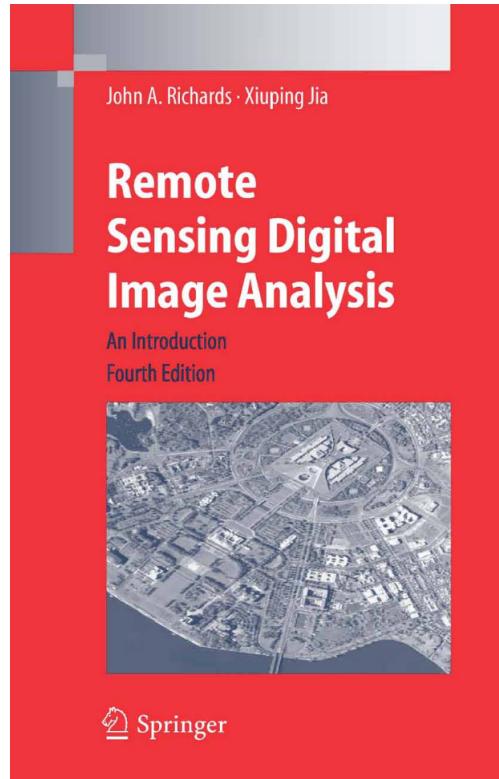


□ Consulting hours

- Before, during and after classes is the best time to discuss
- or, for any other needs write an email to arrange a meeting
 - *alberto.signoroni@unibs.it*

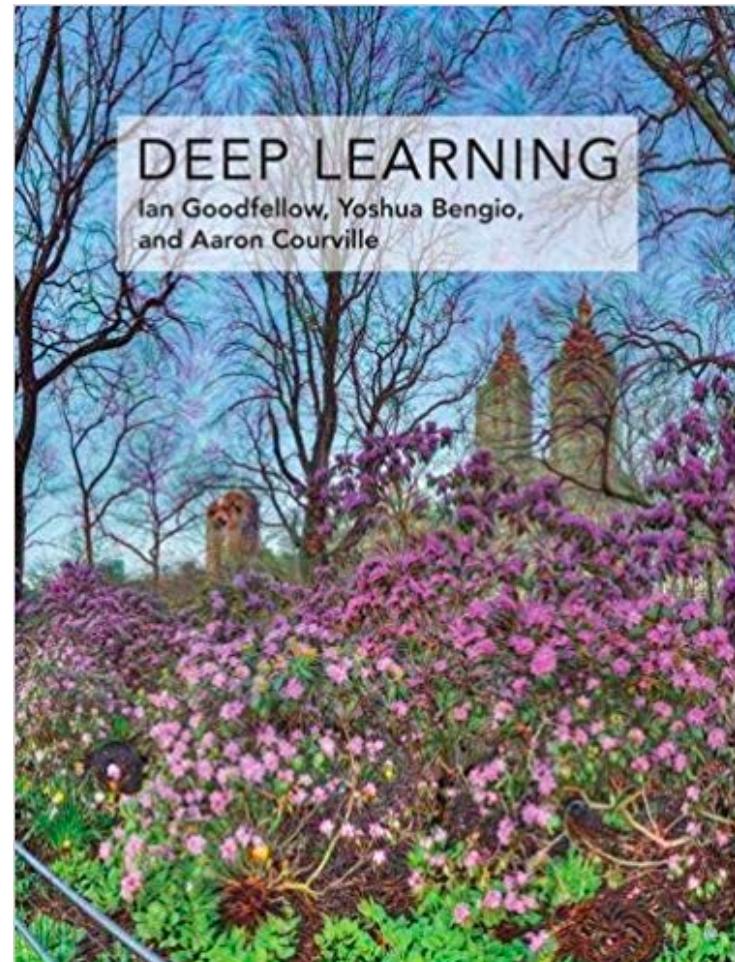
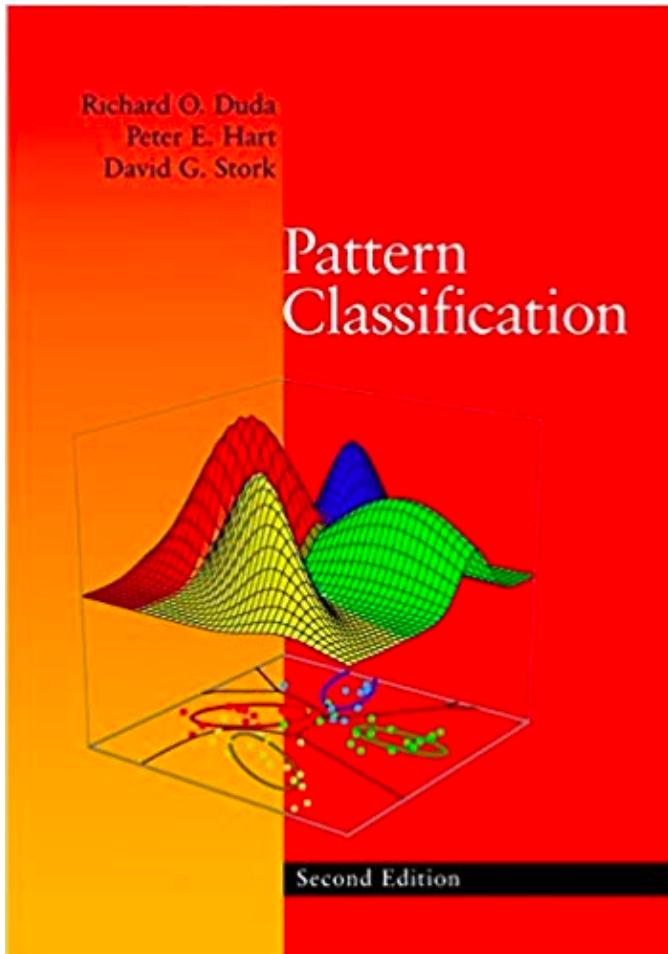
Suggested readings

□ Remote Sensing Image Analysis domain



Suggested readings

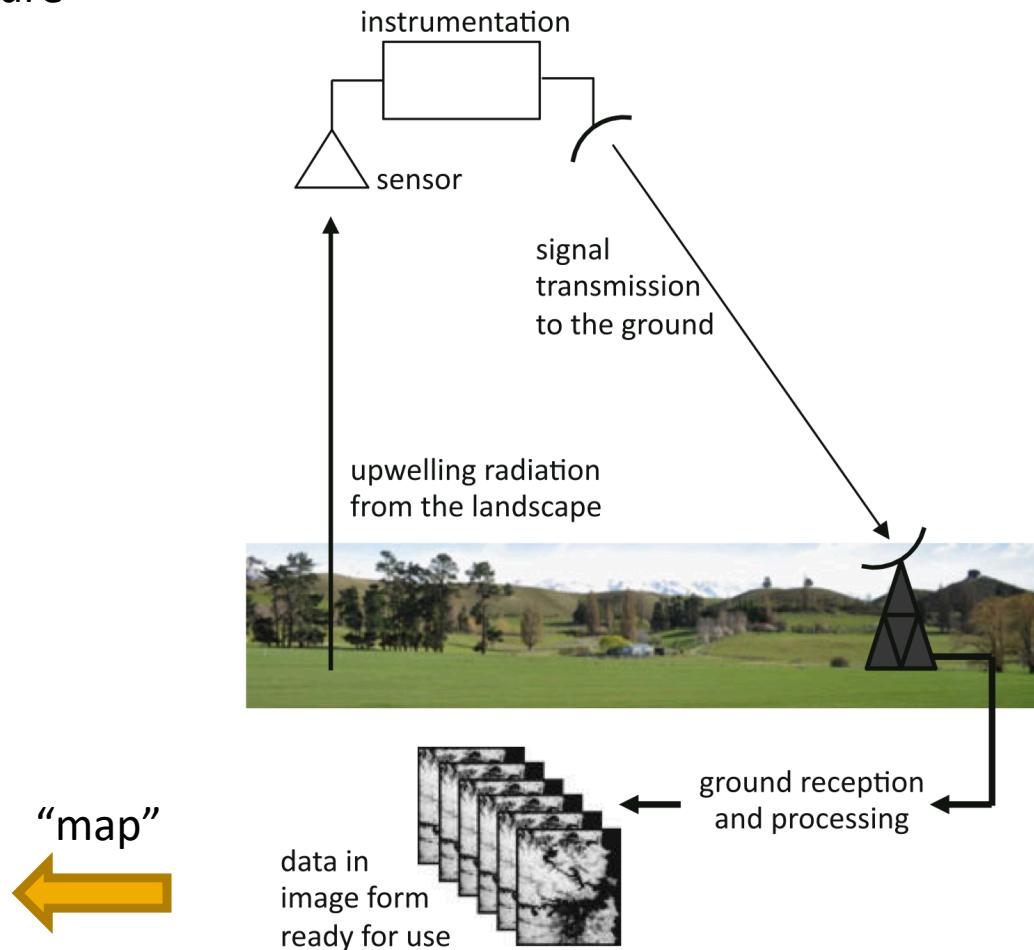
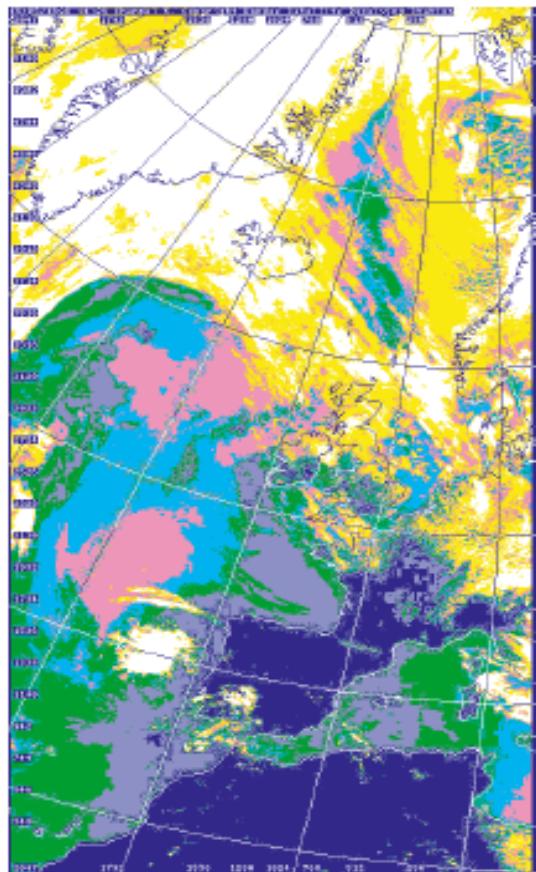
- Pattern Recognition (machine learning) and Deep Learning



INTRODUCTION TO DATA SOURCES IN REMOTE SENSING

Introduction to Data Sources

- In **remote sensing** *energy emanating from the earth's surface is measured* using a sensor mounted on an aircraft or spacecraft platform.
- That measurement is *used to construct an image of the landscape* beneath the platform, as depicted in Figure



Characteristics of Digital Image Data

□ The energy

- can be **reflected sunlight** so that the image recorded is, in many ways, similar to the view we would have of the earth's surface from an airplane, although the *wavelengths* used in remote sensing are often outside the range of human vision;
- can be from the **earth itself acting as a radiator** because of its own *temperature*;
- can be **scattered from the earth** as the result of some **illumination by an artificial energy source** such as a *laser or radar carried on the platform*.

□ The overall system is a complex one

involving the scattering or emission of energy from the earth's surface, followed by *transmission* through the **atmosphere** to instruments mounted on the remote sensing platform, *transmission* or carriage of data back to the earth's surface after which it is then processed into **image products** ready for application by the user (photointerpreter)

□ Acquired images and data are directly available in **digital** format

- with a direct need to develop solutions for a (semi)automated analysis of their informative features and/or (un)supervised understanding of their content/meaning.

Remote Sensing data products and processing

Image maps
(direct visual interpretation)



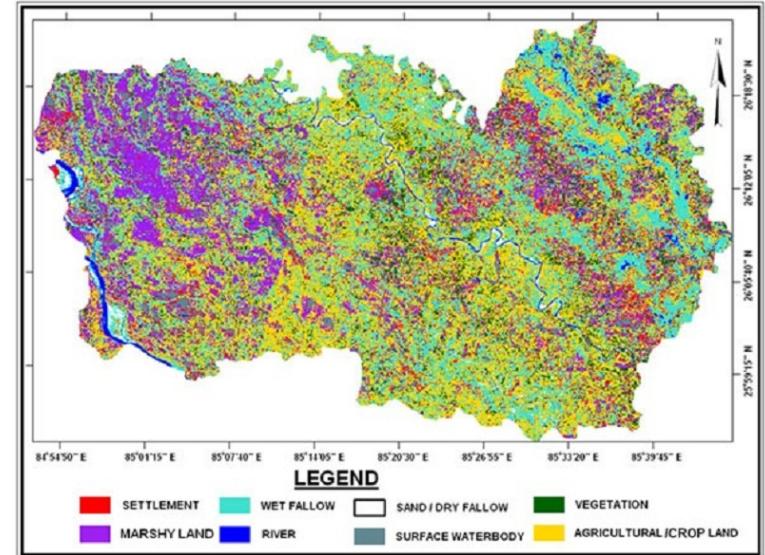
Ratio/interval scale (parametric maps)



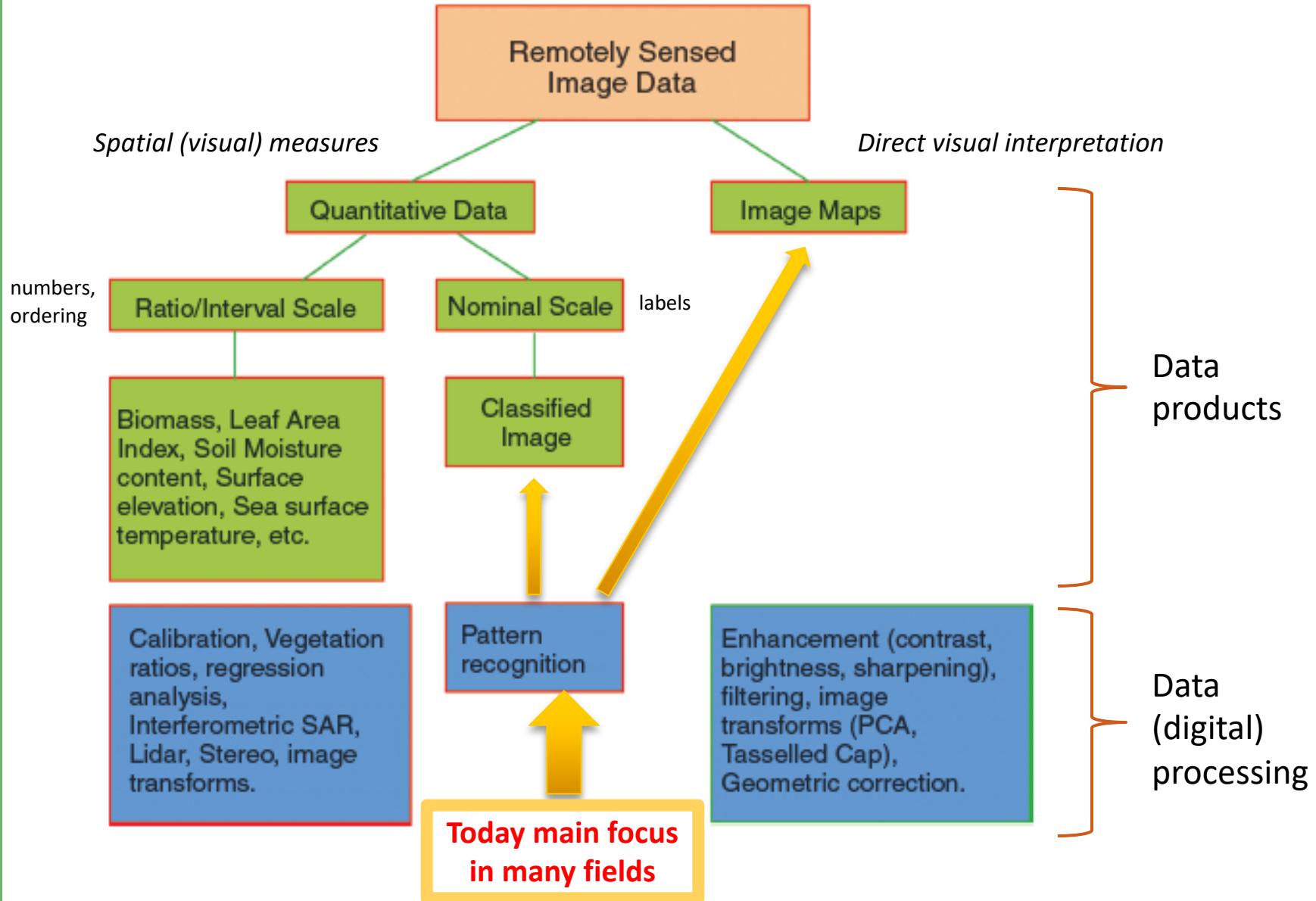
Normalized Difference Vegetation Index (NDVI) Scale Used



Nominal scale (labels, thematic maps)

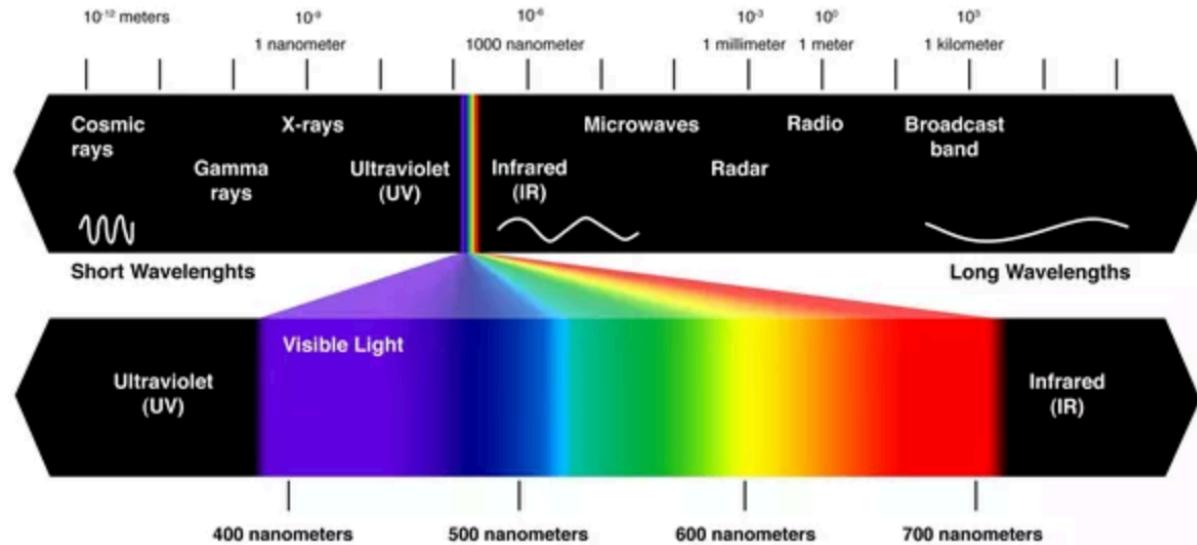


Remote Sensing data products and processing



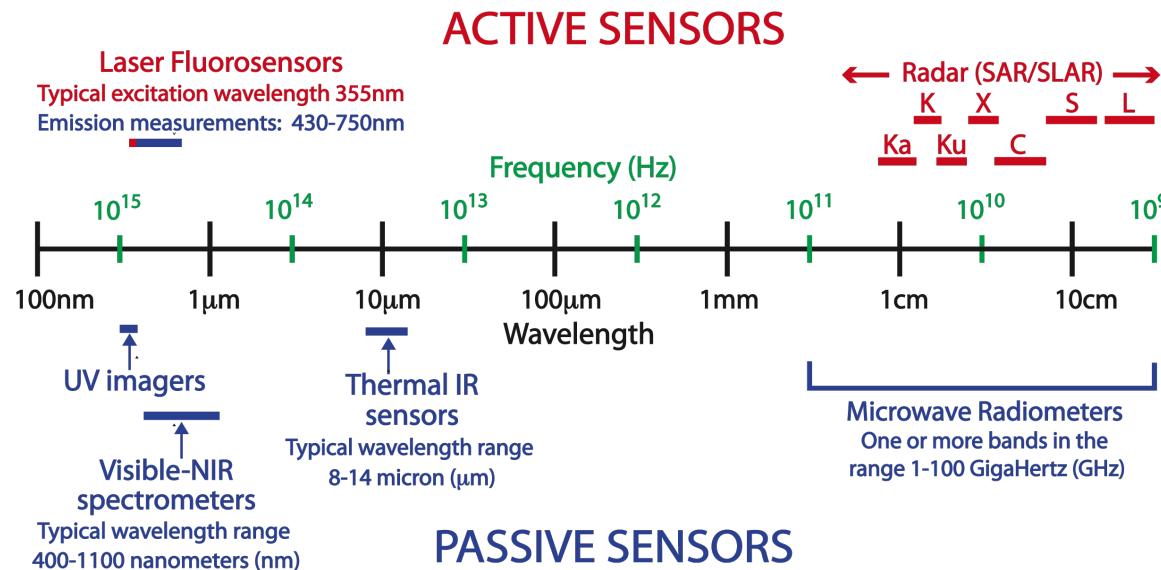
Wavelengths of interest, active and passive systems

- The most significant characteristic of the image data in a remote sensing system is the **wavelength**, or range of wavelengths, used in the acquisition process.
 - If reflected solar radiation is measured, images can, in principle, be recorded in the *ultraviolet, visible and near-to-middle infrared range* of wavelengths.
 - Because of significant atmospheric absorption, *ultraviolet measurements are not made*.
 - Most common, so-called **optical**, remote sensing systems *record data from the visible through to the near and mid infrared range*.
 - The energy emitted by the earth itself (dominant in the so-called *thermal infrared wavelength range*) can also be *resolved into different wavelengths* that help up understand the properties of the earth surface region being imaged.



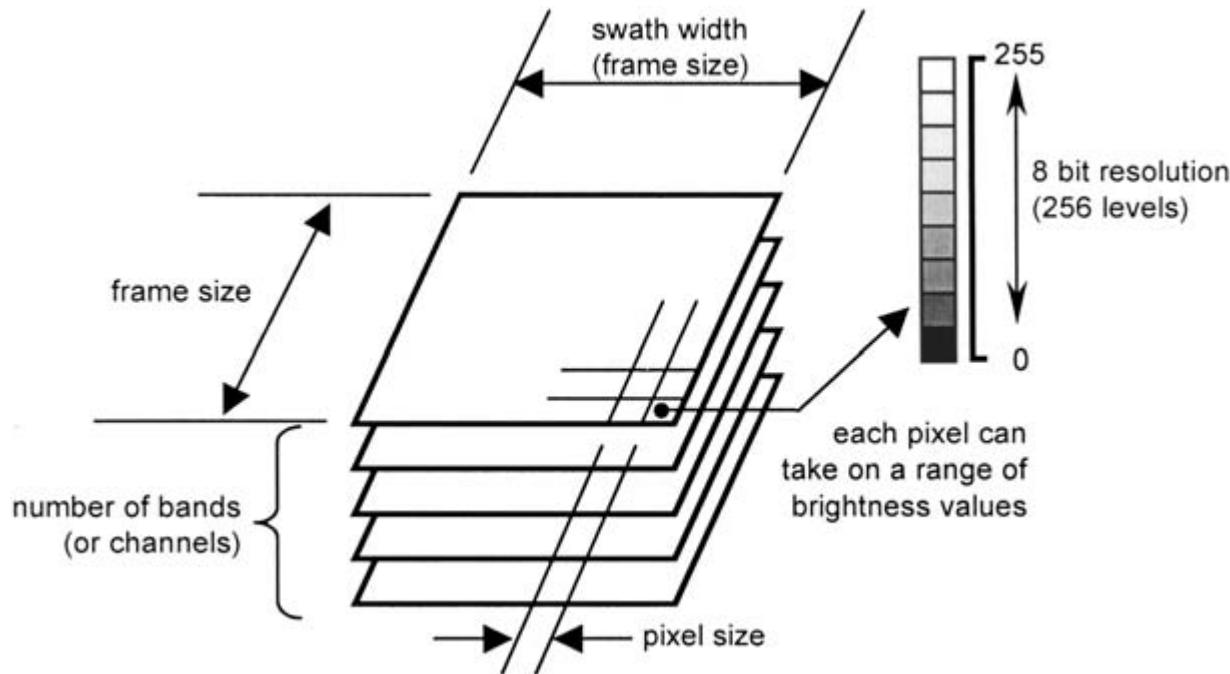
Wavelengths of interest, active and passive systems

- The **visible** and **infrared** range of wavelengths represents only part of the story in remote sensing. We can also image the earth in the **microwave range**, typical of the wavelengths used in mobile phone, television, FM and radar technologies.
- The earth does emit its own level of microwave radiation, but this is generally too small to be measured for most remote sensing mapping purposes. Instead, *energy can be radiated from a platform onto the earth's surface*. It is by measuring the energy scattered back to the platform that image data is recorded. Such a system is referred to as **active** since the energy source is provided by the platform.
- By comparison, remote sensing measurements that depend upon an energy source such as the sun or the earth itself are called **passive**.



Technical characteristics of digital image data

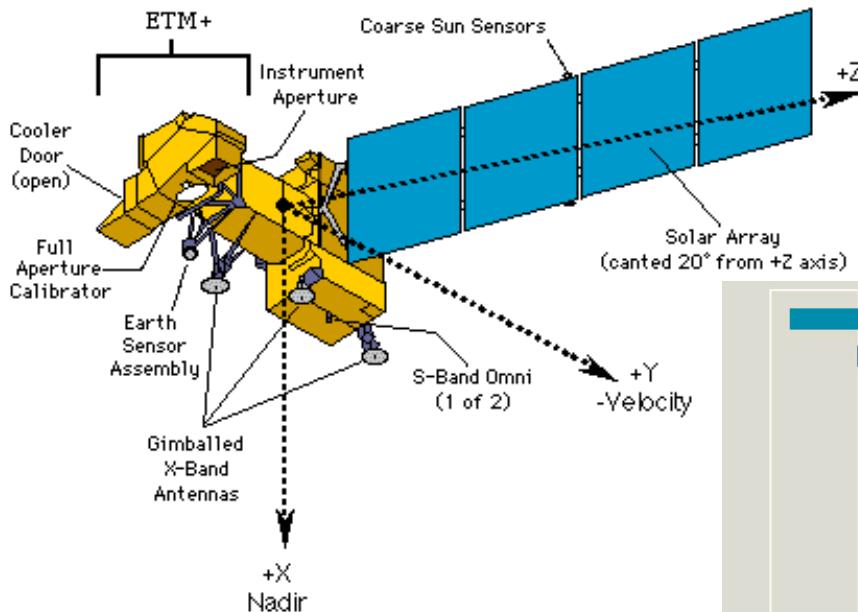
- From a data handling and analysis point of view the properties of image data of significance are the number and location of the spectral measurements (called **spectral bands** or channels) provided by a particular sensor, the *spatial resolution* as described by the pixel size, and the *radiometric resolution*, as illustrated in Figure



- Together, the frame size of an image, in equivalent ground kilometres (which is determined by the size of the recorded image swath), the number of spectral bands, the radiometric resolution and the spatial resolution expressed in equivalent ground metres, determine the data volume generated by a particular sensor. That establishes the amount of data to be processed.

Example: Landsat 7 datasets (1999 – still operative)

- Consider for example the [Landsat Enhanced Thematic Mapper Plus \(ETM+\)](#) instrument.
 - It has seven wavebands with 8 bit radiometric resolution, six of which have 30 m spatial resolution and one of which has a spatial resolution of 60 m (the thermal band, for which the wavelength is so long that a larger aperture is required to collect sufficient signal energy to maintain the radiometric resolution).
 - A **multispectral image** frame of 170 km (NS) × 183 km (EW) therefore contains 8.6 million pixels in the thermal band and 34.6 million pixels in each of the other six bands. At 8 bits per pixel a complete seven band image is composed of 1.74 Gbits (about 217 MBytes).



Example: Landsat 5 images (1984-2013)

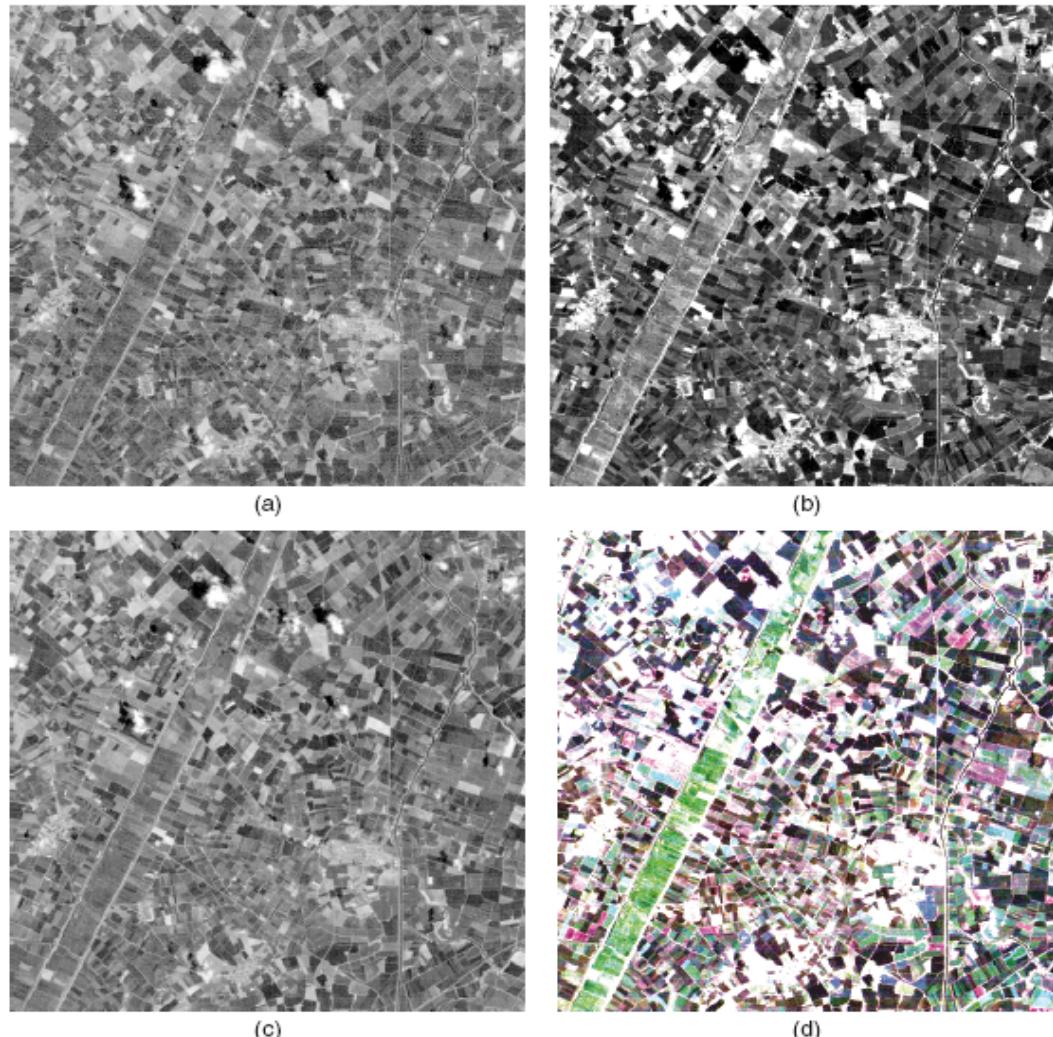


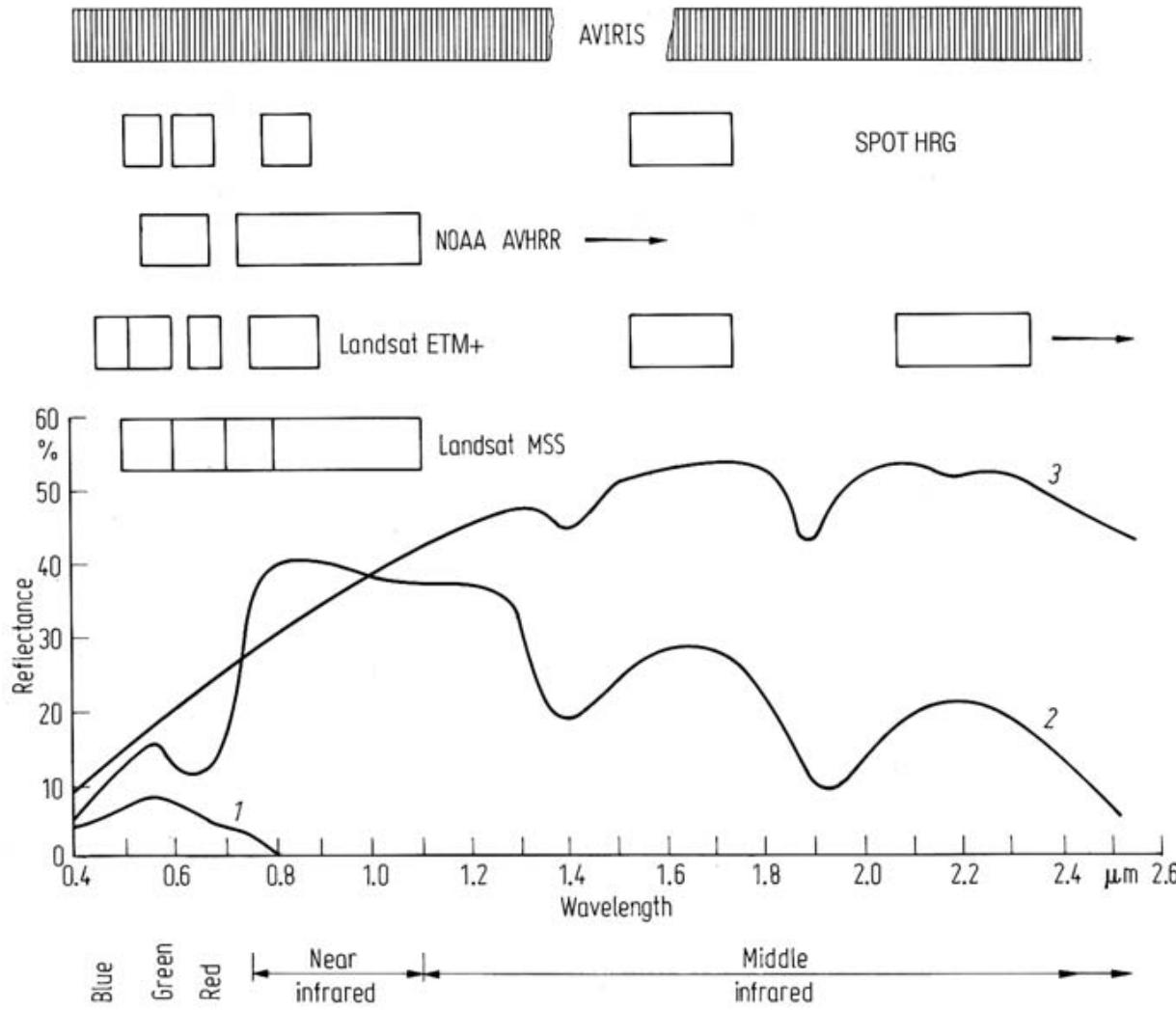
FIGURE Images collected in (a) band 1 (blue–green), (b) band 2 (green) and (c) band 3 (red) wavebands of the optical spectrum by the Thematic Mapper sensor carried by the Landsat-5 satellite. Image (d) shows the three images (a–c) superimposed with band 1 shown in blue, band 2 in green and band 3 in red. This is called a natural colour composite image. The area shown is near the town of Littleport in Cambridgeshire, eastern England. The diagonal green strip is an area of fertile land close to a river. Original data © ESA 1994; Distributed by Eurimage.

Spectral Ranges Commonly Used in Remote Sensing

- In principle, remote sensing systems could measure energy emanating from the earth's surface in any sensible range of wavelengths.
 - However technological considerations, the selective opacity of the earth's atmosphere, scattering from atmospheric particulates and the significance of the data provided *exclude certain wavelengths*.
 - The major ranges utilized for earth resources sensing are **between about 0.4 and 12 µm** (the **visible/infrared range**) and between about 30 to 300 mm (the microwave range).
 - At microwave wavelengths it is often more common to use frequency rather than wavelength to describe ranges of importance. Thus the **microwave range** of 30 to 300 mm corresponds to **frequencies between 1 GHz and 10 GHz**.
 - For atmospheric remote sensing, frequencies in the range 20 GHz to 60 GHz are encountered.
- **The significance of these different ranges lies in the interaction mechanism between the electromagnetic radiation and the materials being examined.**
 - In the **visible/infrared range** the energy measured by a sensor depends upon properties such as the *pigmentation, moisture content and cellular structure of vegetation, the mineral and moisture contents of soils and the level of sedimentation of water*.
 - At the thermal end of the infrared range it is *heat capacity and other thermal properties of the surface and near subsurface* that control the strength of radiation detected.
 - In the **microwave range**, using active imaging systems based upon radar techniques, the *roughness of the cover type being detected and its electrical properties*, expressed in terms of complex permittivity (which in turn is strongly influenced by moisture content) determine the magnitude of the reflected signal.
 - In the **range 20 to 60 GHz**, *atmospheric oxygen and water vapor* have a strong effect on transmission and thus can be inferred by measurements in that range.
- **In other fields we can use other wavelengths (e.g. X-rays) for other goals (e.g. tissue density measures)**

Spectral Ranges Commonly Used in Remote Sensing

- **Spectral reflectance** characteristics of *common earth surface materials* in the visible and near-to-mid infrared range. **1 water, 2 vegetation, 3 soil**. The positions of *spectral bands for common remote sensing instruments* are indicated (they are designed for specific purposes).



Spectral Ranges Commonly Used in Remote Sensing

- Spectral reflectance characteristics of common earth surface materials
 - **Water** reflects about 10% or less in the blue-green range, a smaller percentage in the red and certainly no energy in the infrared range. Should the water contain suspended sediments or should a clear water body be shallow enough to allow reflection from the bottom then an increase in apparent water reflection will occur, including a small but significant amount of energy in the near infrared range. This is a result of reflection from the suspension or bottom material.
 - **Soils** have a reflectance that increases approximately monotonically with wavelength, however with dips centred at about 1.4 μm , 1.9 μm and 2.7 μm owing to moisture content. These water absorption bands are almost unnoticeable in very dry soils and sands. In addition, clay soils also have hydroxyl absorption bands at 1.4 μm and 2.2 μm .
 - The **vegetation** curve is considerably more complex than the other two. In the middle infrared range it is dominated by the water absorption bands at 1.4 μm , 1.9 μm and 2.7 μm . The plateau between about 0.7 μm and 1.3 μm is dominated by *plant cell structure* while in the visible range of wavelengths it is *plant pigmentation* that is the major determinant. The curve sketched in Figure is for healthy green vegetation. This has chlorophyll absorption bands in the blue and red regions leaving only green reflection of any significance. This is why we see chlorophyll pigmented plants as green.

Spectral Ranges Commonly Used in Remote Sensing

Remarks

- The purpose of acquiring remote sensing image data is to be able to identify and assess, by some means, surface materials and their spatial properties. Inspection of the Figure of spectral reflectance reveals that **cover type identification should be possible if the sensor gathers data at several wavelengths.**
- For example, if for each pixel, measurements of reflection at $0.65\text{ }\mu\text{m}$ and $1.0\text{ }\mu\text{m}$ were available (i.e. we had a two band imaging system) then it should be a relatively easy matter to discriminate between the three fundamental cover types based on the relative values in the two bands. For example, vegetation would be bright at $1.0\text{ }\mu\text{m}$ and very dark at $0.65\mu\text{m}$ whereas soil would be bright in both ranges. Water on the other hand would be black at $1.0\text{ }\mu\text{m}$ and dull at $0.65\text{ }\mu\text{m}$.
- Clearly if more than two measurement wavelengths were used more precise discrimination should be possible, even with cover types spectrally similar to each other.
- Consequently remote sensing imaging systems are designed with wavebands that take several samples of the spectral reflectance curves.
 - For each pixel the set of samples can be analysed, either by *photointerpretation*, or by the *automated techniques* that we will see, to provide a **label** that associates the pixel with a particular earth surface material.

Spectral Ranges Commonly Used in Remote Sensing

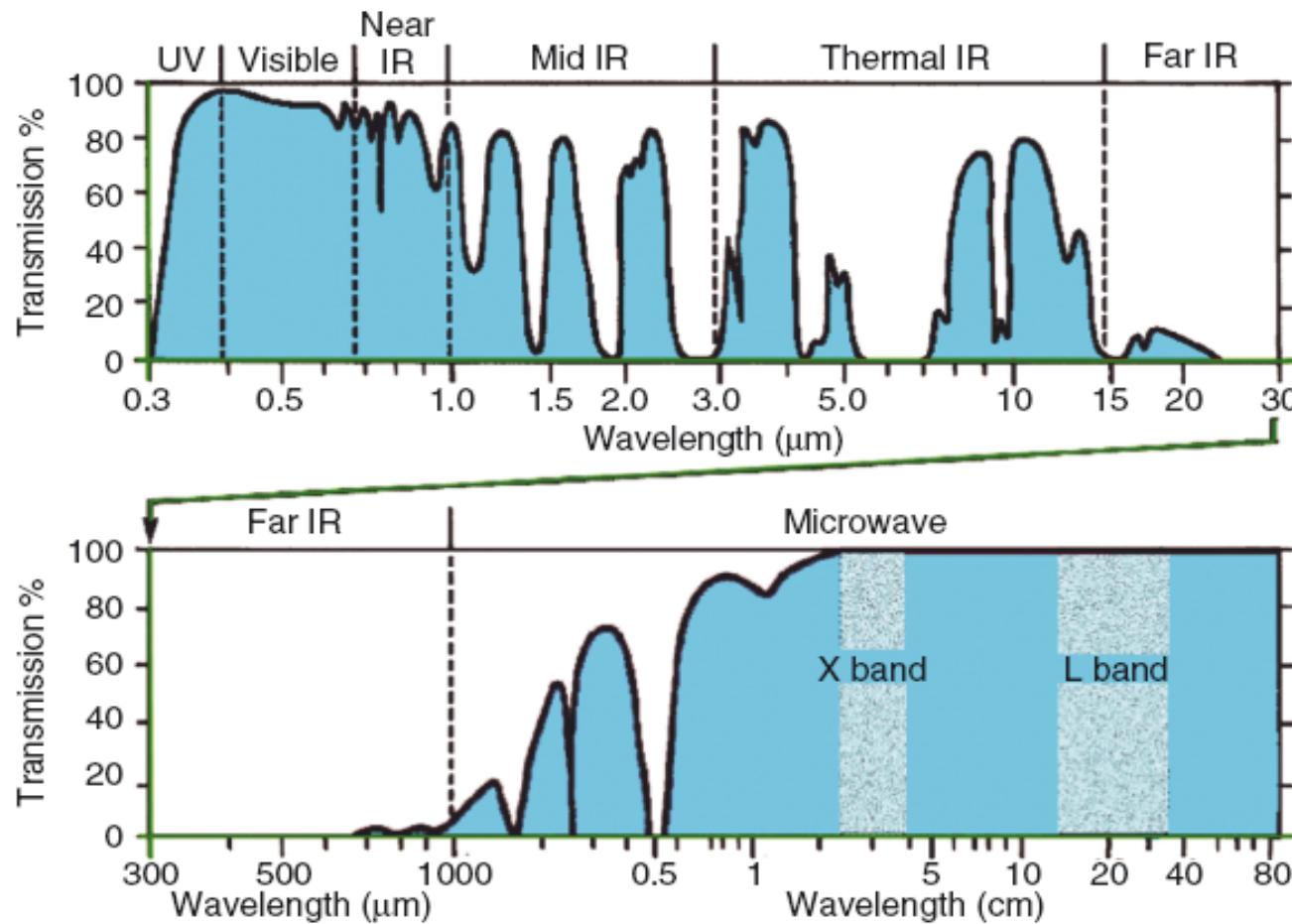
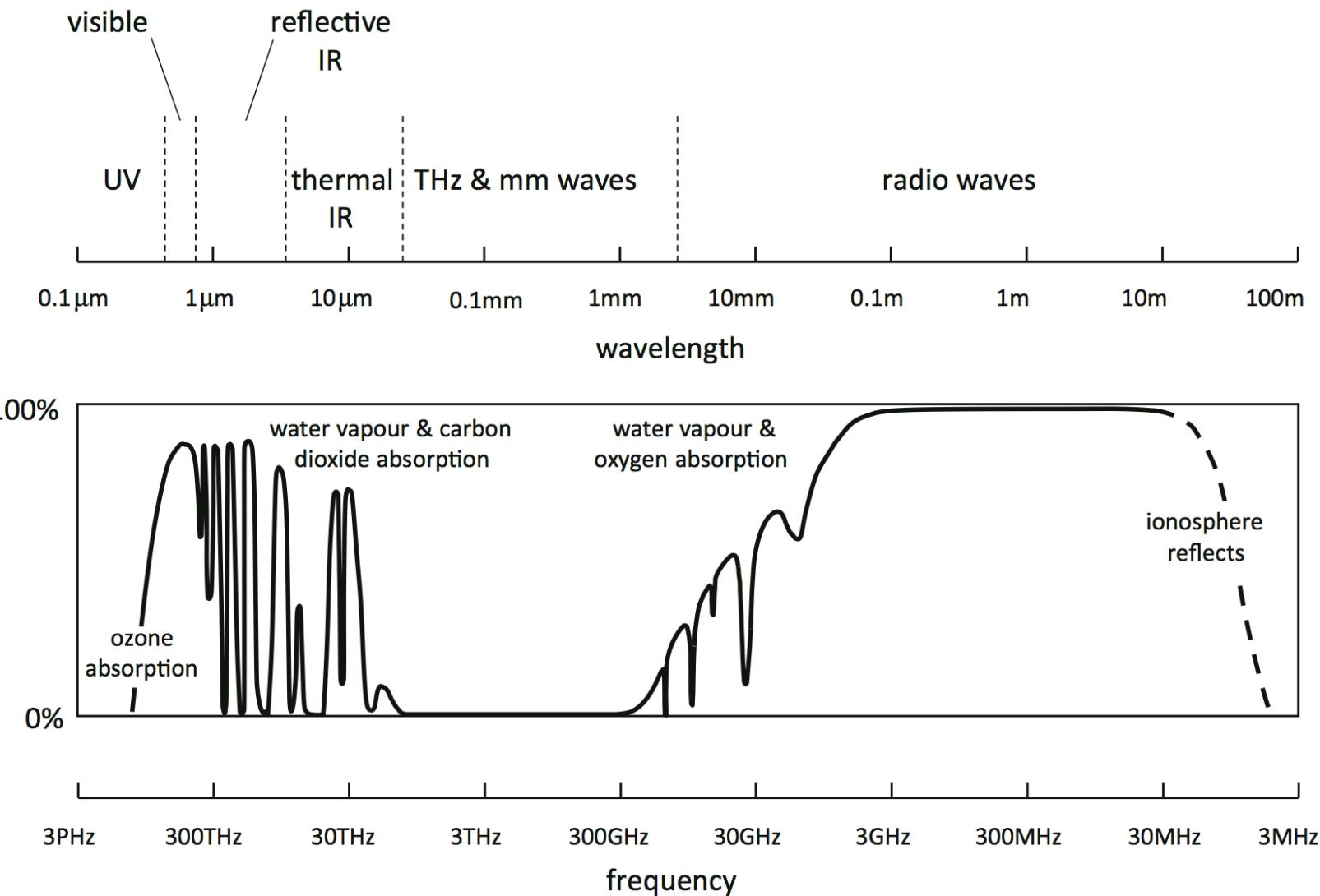


FIGURE The electromagnetic spectrum showing the range of wavelengths between $0.3 \mu\text{m}$ and 80 cm . The vertical dashed lines show the boundaries of wavebands such as ultraviolet (UV) and near-infrared (near IR). The shaded areas between 2 and 35 cm wavelength indicate two microwave wavebands (X band and L band) that are used by imaging radars. The curve shows atmospheric transmission. Areas of the electromagnetic spectrum with a high transmittance are known as atmospheric windows. Areas of low transmittance are opaque and cannot be used to remotely sense the Earth's surface. Reprinted from AFH Goetz and LC Rowanm 1981, *Geologic Remote Sensing, Science*, **221**, 781–791, Figure 1.

Spectral Ranges Commonly Used in Remote Sensing

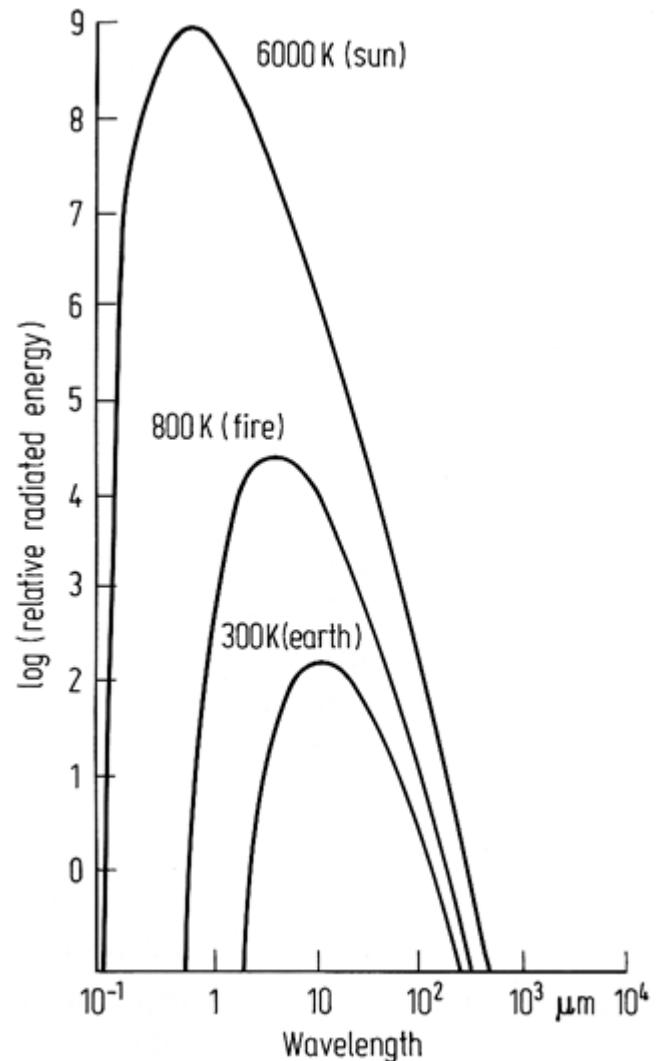


FIGURE

The electromagnetic spectrum and the transmittance of the earth's atmosphere

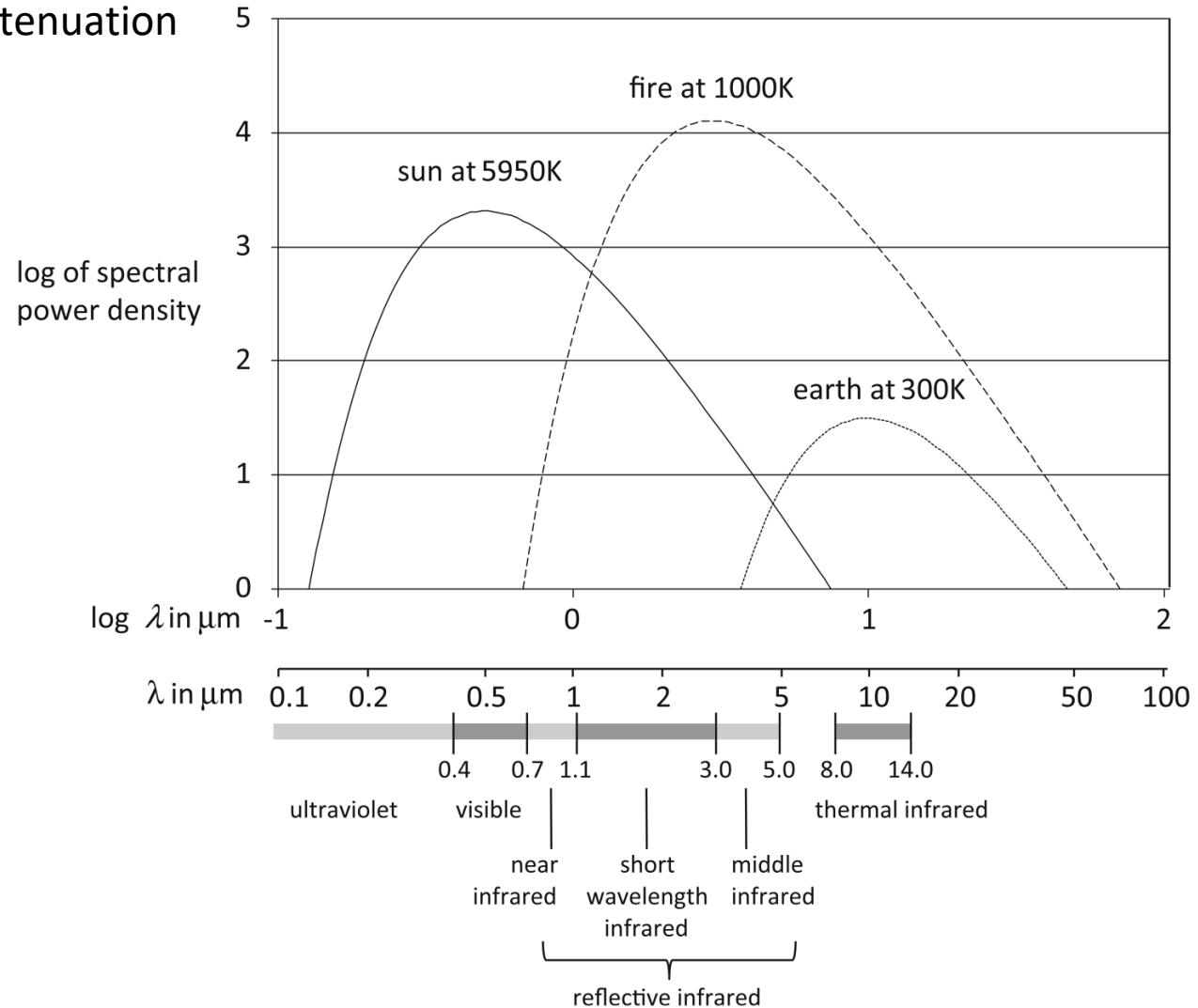
Radiation energy from different hot bodies

- Figure shows the relative amount of **energy radiated** from perfect black bodies of different temperatures.
 - The **sun** at **6000K** radiates maximally in the **visible and near infrared** regime but by comparison generates *little radiation in the range around 10 μm*. The figure does not take any account of how the level of solar radiation is dispersed through the *inverse square law* process in its travel from the sun to the earth. Consequently if it is desired to compare that curve to others corresponding to black bodies on the earth's surface then it should be appropriately reduced (see next slide).
 - The **earth**, at a temperature of about **300 K** has its maximum emission **around 10 to 12 μm**. Thus a *sensor with sensitivity in this range will measure the amount of heat being radiated from the earth itself*.
 - **Hot bodies** on the earth's surface, such as bushfires, at around **800 K**, have a maximum emission in the range of about **3 to 5 μm**. Consequently to map fires, a sensor operating in that range would be used.
 - *Real objects do not behave as perfect black body radiators but rather emit energy at a lower level than that shown in Figure. The degree to which an object radiates by comparison to a black body is referred to as its emittance.*
 - *Thermal remote sensing is sensitive therefore to a combination of an object's temperature and emittance, the last being wavelength dependent.*



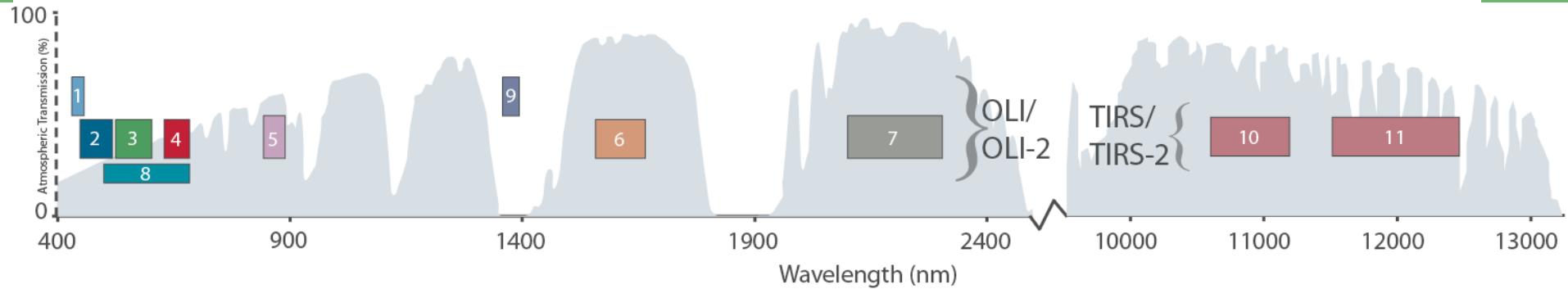
Radiation energy from different hot bodies (contd)

- Figure shows the relative amount of **energy radiated** from perfect black bodies measured on the earth of different temperatures compensated by sun-to – earth distance attenuation

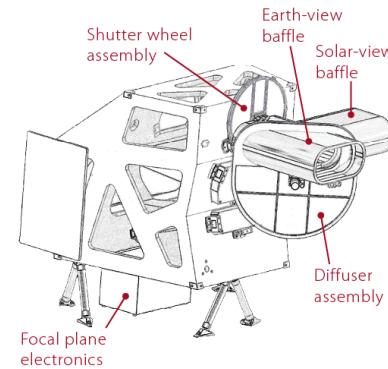


Example: OLI and TIRS sensors on Landsat 8 (2013-now) and 9 (from 2021)

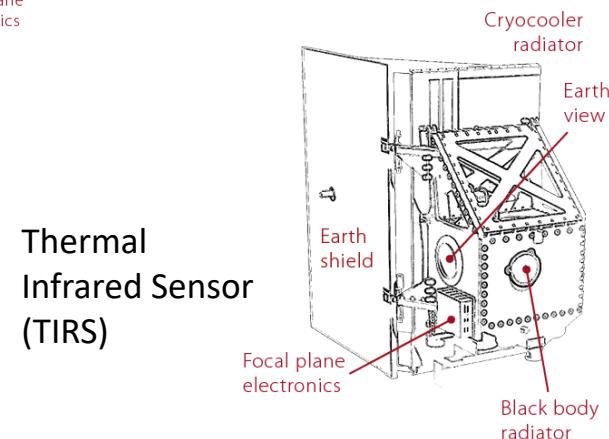
<https://landsat.gsfc.nasa.gov/>



#	Band	Minimum Lower Band Edge (nm)	Maximum Upper Band Edge (nm)	Center Wavelength (nm)	Maximum Spatial Resolution At Nadir (m)
1	Coastal / Aerosol	433	453	443	30
2	Blue	450	515	482	30
3	Green	525	600	562	30
4	Red	630	680	655	30
5	NIR	845	885	865	30
6	SWIR 1	1560	1660	1610	30
7	SWIR 2	2100	2300	2200	30
8	Panchromatic	500	680	590	15
9	Cirrus	1360	1390	1375	30
10	Thermal	10300	11300	10800	100
11	Thermal	11500	12500	12000	100



Operational Land Imager (OLI)



Thermal Infrared Sensor (TIRS)

Electromagnetic radiation scattering

- **Microwave remote sensing** image data is gathered by measuring the strength of energy scattered back to the satellite or aircraft in response to energy transmitted.
 - The degree of reflection is characterized by the **scattering coefficient** for the surface material being imaged. This is a **function of the electrical complex permittivity of the material and the roughness of the surface** in comparison to the wavelength of the radiation used.
- 1. **Smooth surfaces** act as so-called specular reflectors (i.e. mirror-like) in that the direction of scattering is predominantly away from the incident direction as shown in Figure (a). Consequently they appear *dark to black in image data*.
- 2. **Rough surfaces** act as diffuse reflectors; they scatter the incident energy in all directions as depicted in Figure (b), including back towards the remote sensing platform. As a result they appear *light in image data*.
- 3. A third type of surface scattering mechanism is often encountered in microwave image data, particularly associated with **manufactured features** such as buildings. This is a corner reflector effect, as seen in Figure (c), resulting from the right angle formed between a vertical structure such as a fence, building or ship and a horizontal plane such as the surface of the earth or sea. This gives a *very bright response*.
- 4. Media, such as vegetation canopies and sea ice, exhibit so-called **volume scattering** behavior, in that backscattered energy emerges from many, hard to define sites within the volume, as depicted in Figure (d). This leads to a *light tonal appearance in radar imagery*.

Electromagnetic radiation scattering (contd)

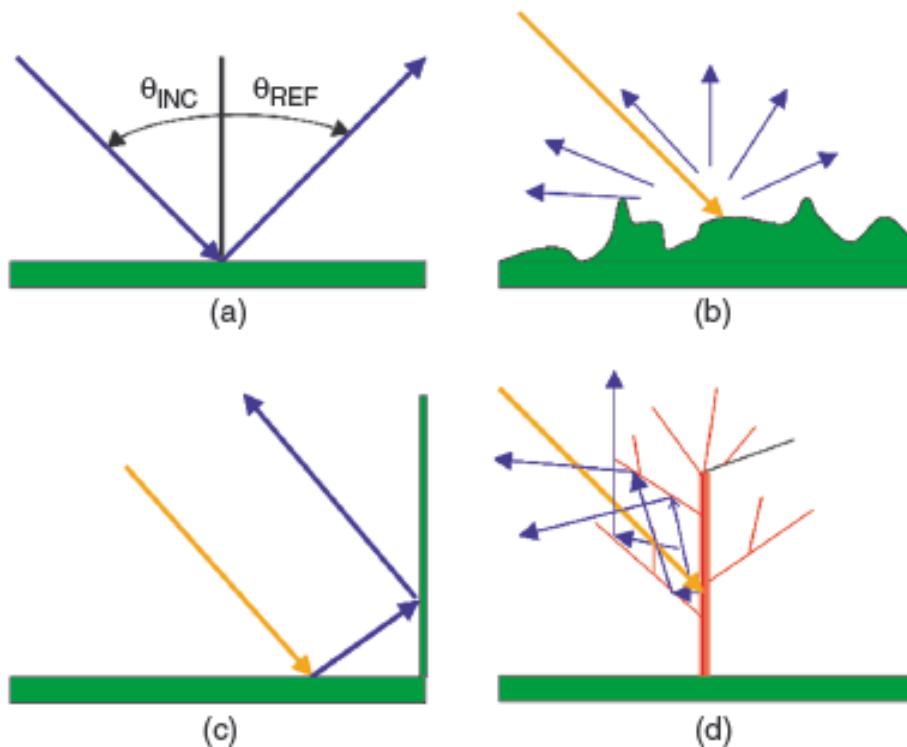


FIGURE Types of scattering of electromagnetic radiation. (a) Specular, in which incident radiation is reflected in the forward direction, (b) Lambertian, in which incident radiation is equally scattered in all upward directions, (c) corner reflector, which acts like a vertical mirror, especially at microwave wavelengths and (d) volume scattering, in which (in this example) branches and leaves produce single-bounce (primary) and multiple-bounce (secondary) scattering.

□ In interpreting image data acquired in the microwave region of the electromagnetic spectrum it is important to recognise that the four reflection mechanisms of Figure are present and that *the tonal differences are also modulated by 1) wavelength and 2) surface complex permittivity variations (e.g. due to moisture).*

□ By comparison, imaging in the visible/infrared range in which the sun is the energy source, results almost always from diffuse reflection, *allowing the interpreter to concentrate on tonal variations resulting from factors such as those described, in association with spectral reflectance curves.*

Electromagnetic radiation scattering (contd)

		Typical wavelength (cm)	Frequency (GHz)
P	66.7	0.45	
L	23.5	1.28	
S	12.6	2.38	
C	5.7	5.3	
X	3.1	9.7	
Ku	2.16	13.9	

Wavelength in metres and frequency in megahertz are related by the expression $f(\text{MHz}) = 300/\lambda(m)$

TABLE Typical radio wavelengths and corresponding frequencies used in radar remote sensing, based on actual missions; only the lower end of the K band is currently used

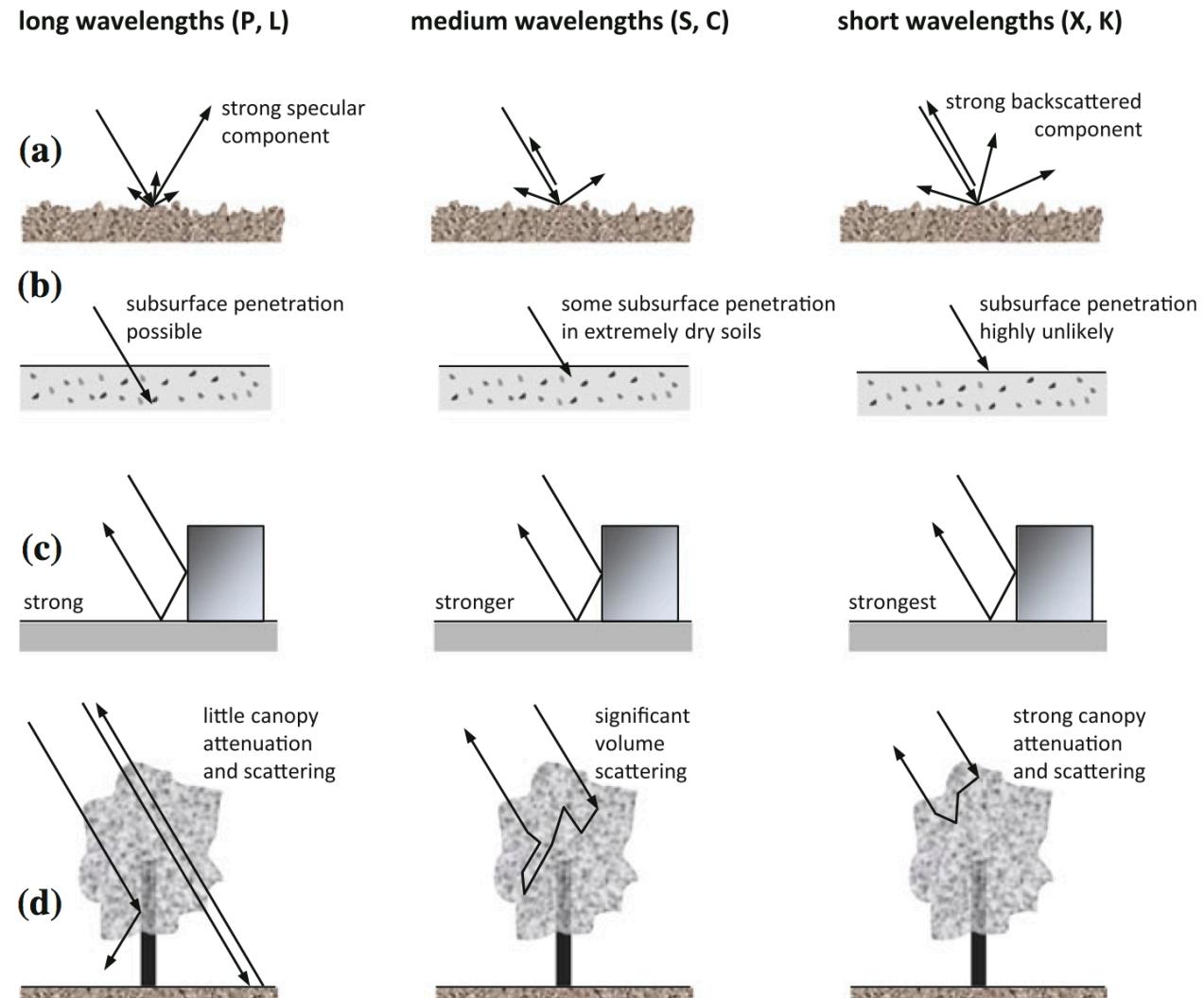


FIGURE Common radar scattering mechanisms as a function of the wavelength of the irradiating energy **a** surface, **b** sub-surface, **c** corner reflector, and **d** volume scattering

REMOTE SENSING PLATFORMS

Different kind of platforms and applications

- Imaging in remote sensing can be carried out from both **satellite** and **aircraft** platforms. In many ways their sensors have *similar characteristics although differences in their altitude and stability can lead to very different image properties.*
- There are essentially two broad classes of satellite program:
 1. those satellites that sit at **geostationary** altitudes (35.786 km) above the earth's surface and which are generally associated with weather and climate studies,
 2. and those which orbit much closer to the earth's surface (**low earth orbits, LEO** with altitudes between about 150 and 2000 km) that are generally used for earth surface and oceanographic observations (e.g. Landsat altitudes are 705 km).
- Usually, the LEO satellites are in a **sun-synchronous** orbit, in that their orbital plane precesses around the earth at the same rate that the sun appears to move across the earth's surface (see figure in the next slide). **In this manner the satellite acquires data at about the same local time on each orbit.**
 - LEO satellites can also be used for meteorological studies.

Sun-synchronous low earth orbits

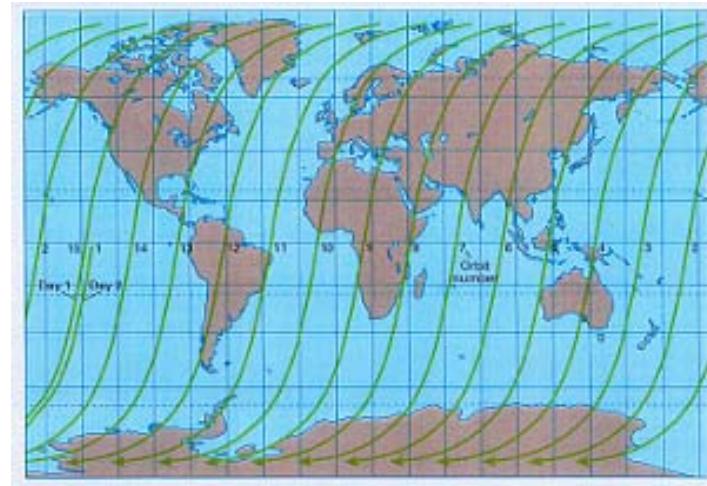
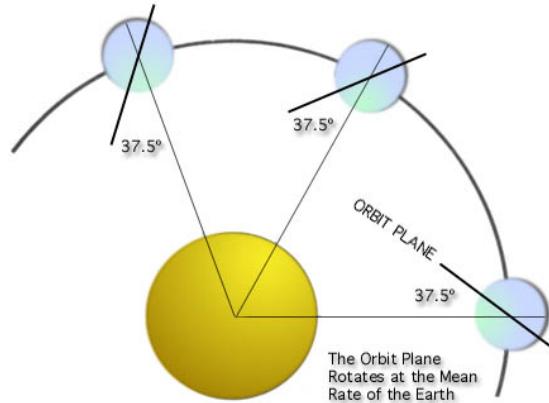
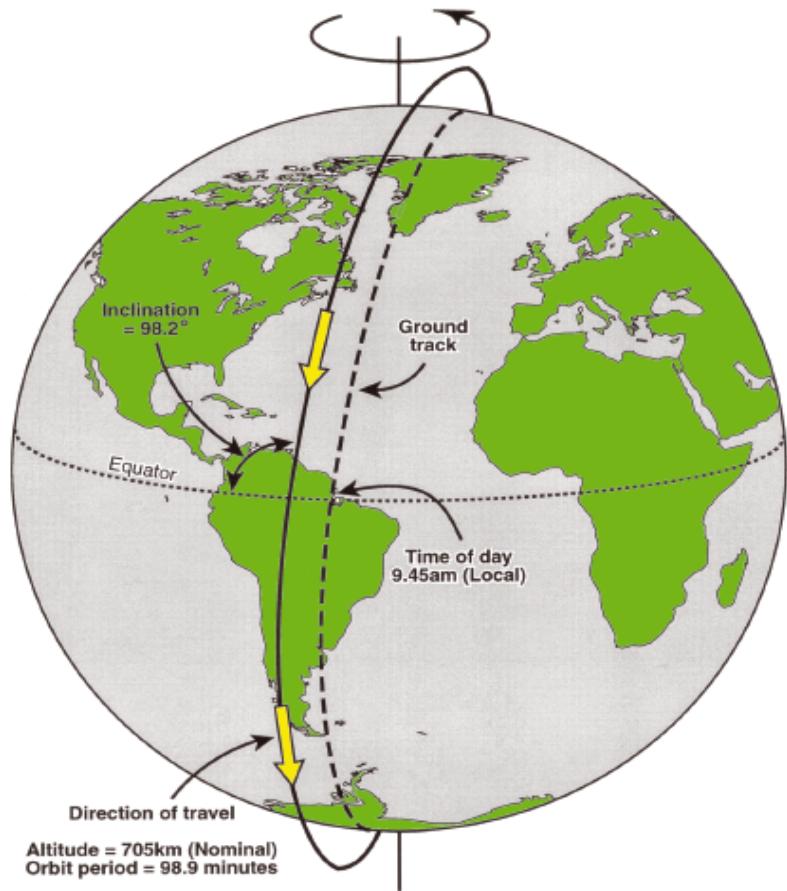


FIGURE Example of a Sun-synchronous orbit. This is the Landsat-4, -5 and -7 orbit, which has an equatorial crossing time of 09.45 (local Sun time) in the descending node. The satellite travels southwards over the illuminated side of the Earth. The Earth rotates through 24.7° during a full satellite orbit. The satellite completes just over 14.5 orbits in a 24-hour period. The Earth is imaged between 82°N and S latitude over a 16-day period. Landsat-7 orbit is similar. Landsat-7 travels about 15 minutes ahead of Terra, which is in the same orbit, so that sensors onboard Terra view the Earth under almost the same conditions as does the Landsat-7 ETM+. Based on Figure 5.1, Landsat 7 Science Data Users Handbook, NASA Goddard Spaceflight Center, Greenbelt, Maryland. http://landsathandbook.gsfc.nasa.gov/handbook/handbook_htmls/chapter5/chapter5.html (accessed 4 January 2009).

Different kind of platforms and applications

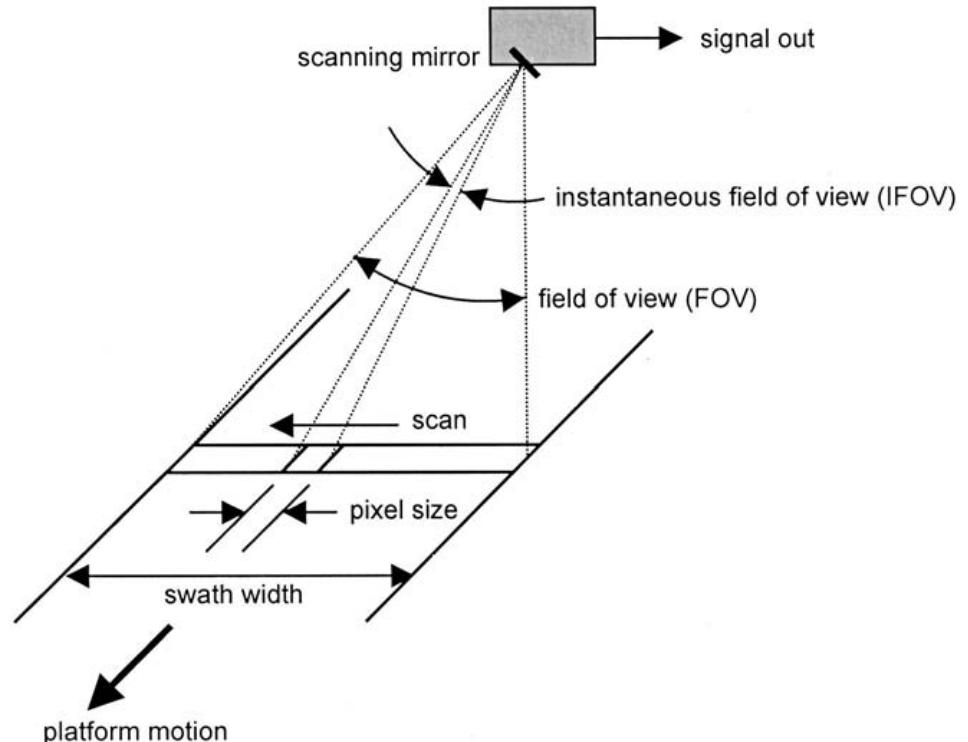
- Notwithstanding the differences in altitude, the **wavebands** used for the geostationary and the low earth orbiting satellites, and for weather and earth observation satellites, are *very comparable*.
- *The major distinction* in the image data they provide generally lies in the **spatial resolutions** available.
 - data acquired for earth resources purposes generally has pixel sizes of *less than 100 m*,
 - that used for meteorological purposes (both at geostationary and lower altitudes) has a much coarser pixel, often of the *order of 1 km*.
- For a technical deepening on satellite missions see
 - The course of Remote Sensing Data Acquisition
 - Appendix A (on textbook, 4° edition only)
 - NASA, Terra Landsat and other satellite mission websites
 - <https://terra.nasa.gov>
 - <https://landsat.gsfc.nasa.gov>
 - <https://landsat.usgs.gov>
 - ...

Near REAL TIME OBSERVATIONS !

<https://earthnow.usgs.gov/observer/>

Satellite and aircraft imaging technologies

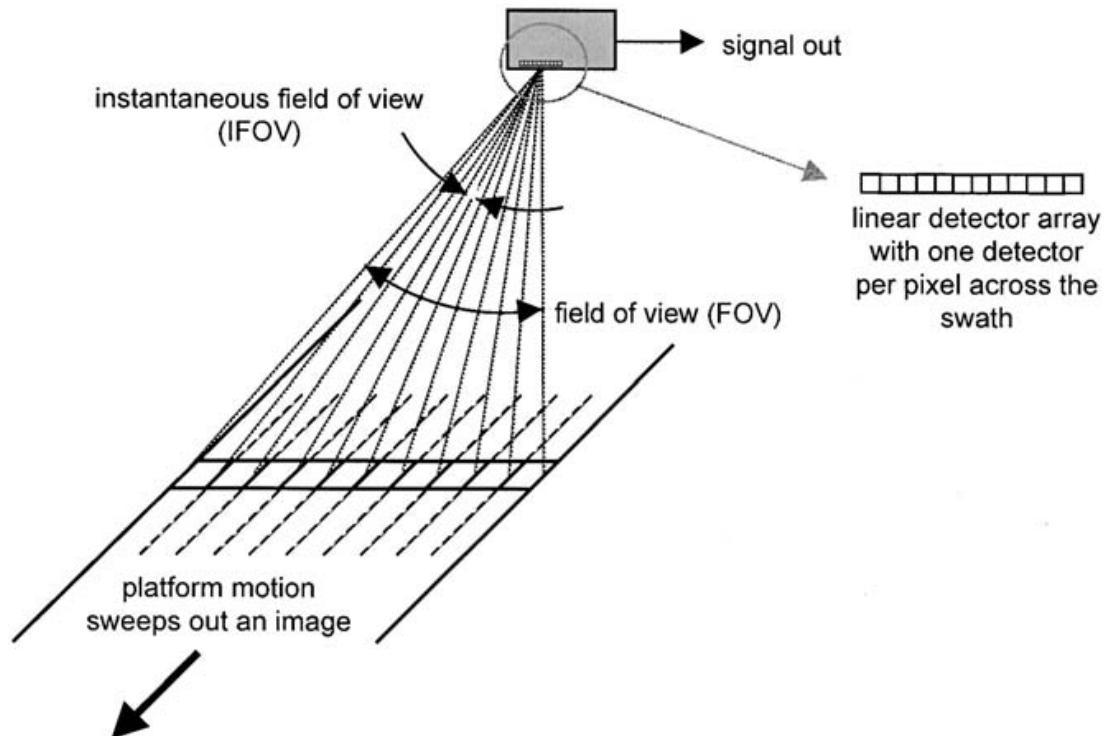
- The imaging technologies utilised in satellite programs have ranged from traditional cameras to mechanical scanners that record images of the earth's surface by moving the instantaneous field of view of the instrument across the earth's surface to record the upwelling energy.
 - Some weather satellites scan the earth's surface using the *spin of the satellite itself* while the sensor's pointing direction is varied (at a slower rate) along the axis of the satellite. The image data is then recorded in a raster-scan fashion not unlike that used for the production of television pictures.
- A more common image recording mechanism, used in the Landsat program, has been to carry a ***mechanical scanner that records at right angles to the direction of the satellite motion to produce raster-scans of data***. The forward motion of the vehicle then allows an image strip to be built up from the raster-scans. That process is depicted in Figure.



Satellite and aircraft imaging technologies

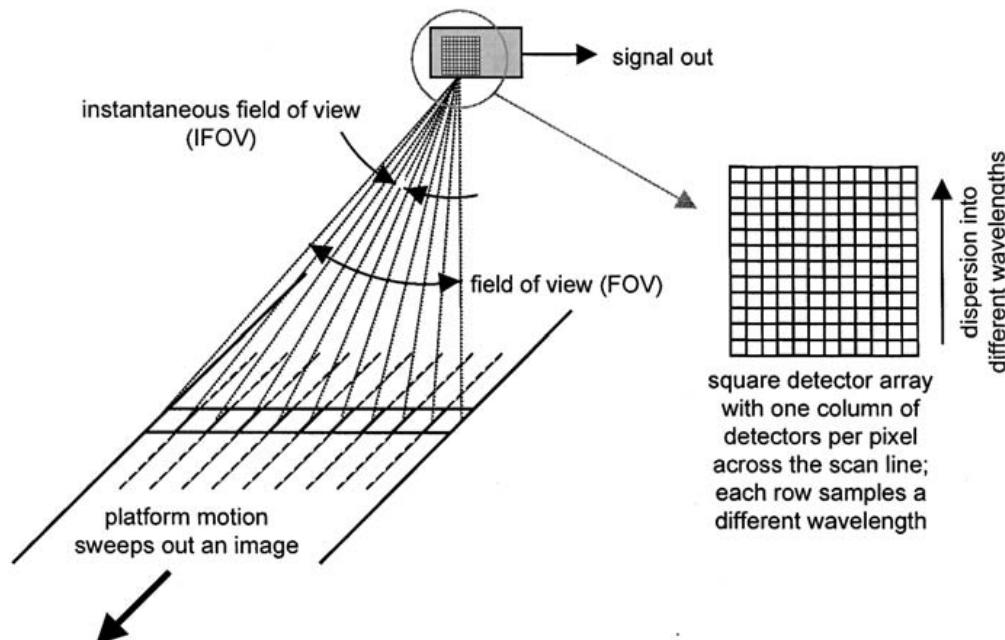
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- More recent technology utilizes a “push-broom” mechanism in which a ***linear imaging array with sufficient detectors is carried on the satellite, normal to the satellite’s motion***, such that each pixel can be recorded individually.
 - The forward motion of the satellite then allows subsequent pixels to be recorded along the satellite travel direction in the manner shown in Figure.
 - As might be expected, the time over which *the energy emanating from the earth’s surface per pixel is larger* with push broom scanning than for the mechanical scanners, generally ***allowing finer spatial resolutions to be achieved***.

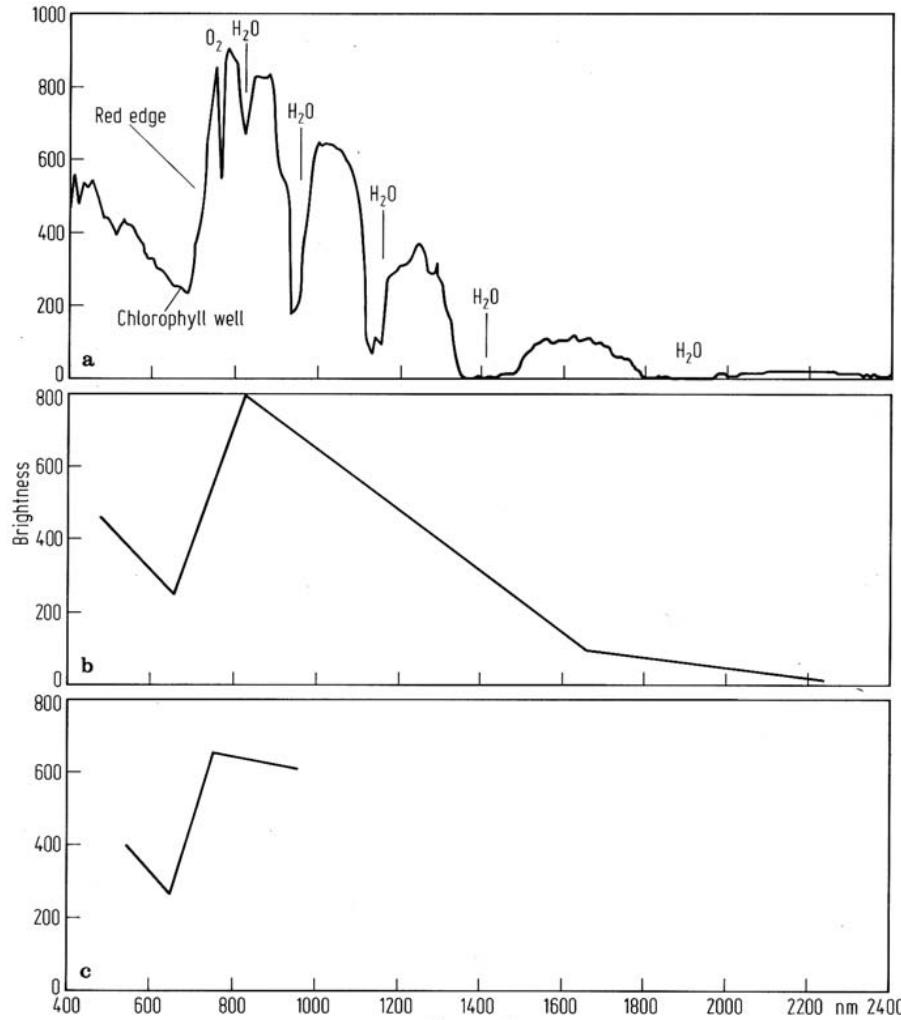


Satellite and aircraft imaging technologies

- Aircraft scanners operate with essentially the same principles as those found on satellites.
 - Both mechanical scanners (often utilising rotating mirrors) and CCD arrays are commonly employed.
 - An interesting development employ **rectangular detector arrays** which, in principle, could be used to capture a two-dimensional image underneath the satellite. They are normally **used, however, to record pixels in the across track direction**, as with push broom scanners, **with the other dimension employed to record many spectral channels of data simultaneously**, as depicted in Figure.
 - Often *as many as 200 or so channels are recorded* in this manner so that a very good rendition of the spectra can be obtained. As a result the devices are often referred to as imaging spectrometers and the data described as **hyperspectral**, as against multispectral when of the order of 10 wavebands are recorded (es. *AVIRIS instrument*).



Spectral resolution: conventional vs spectrometric imaging

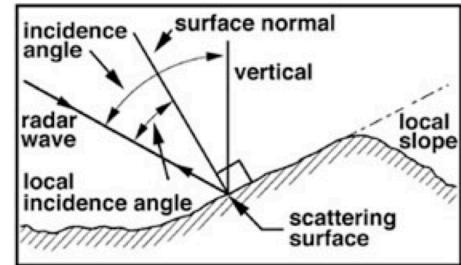
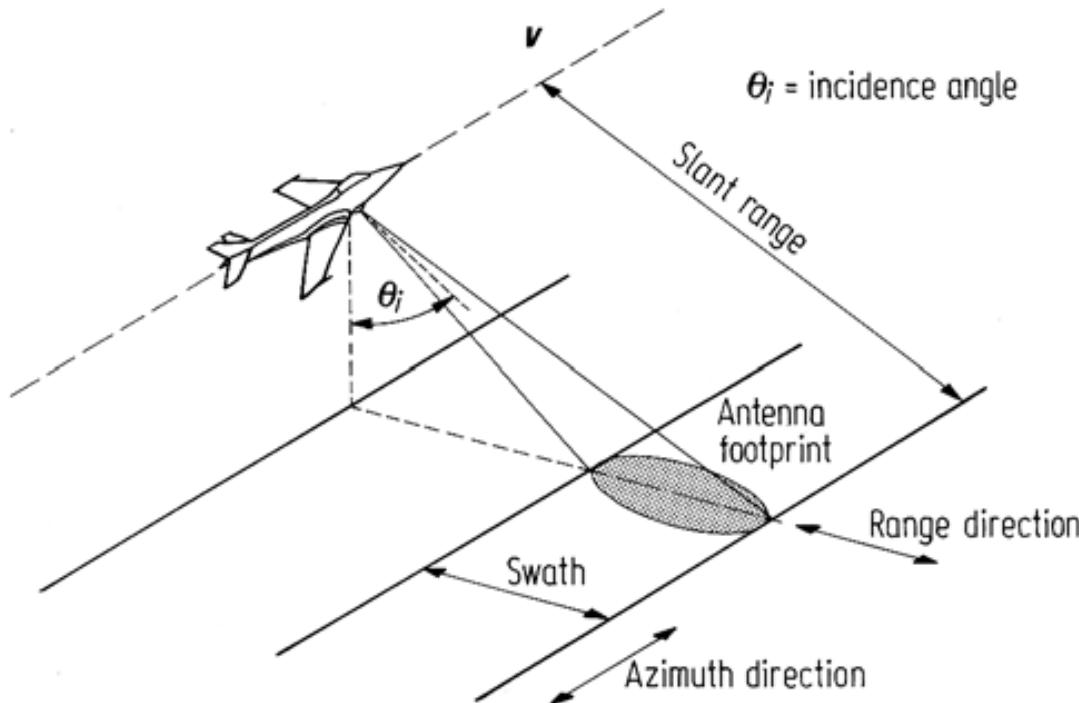


- Vegetation spectrum recorded by AVIRIS at 10 nm spectral sampling (a), along with equivalent Thematic Mapper TM (b) and Multispectral Scanner MSS (c) spectra. In (a) the fine absorption features resulting from atmospheric constituents are shown, along with features normally associated with vegetation spectra.

IMAGE DATA SOURCES IN THE MICROWAVE REGION

Side Looking Airborne Radar (SLAR)

- Remote sensing image data in the microwave range of wavelengths is generally gathered using the technique of **side-looking radar**, as illustrated in Figure.



- When used with aircraft platforms it is more commonly called **SLAR** (side looking airborne radar), a technique that requires some modification when used from spacecraft altitudes, as discussed in the following.

Side Looking Airborne Radar (SLAR)

- In SLAR a pulse of electrical energy at the microwave frequency (or wavelength) of interest is radiated to the side of the aircraft at an incidence angle of ϑ_i .
 - By the same principle as radars used for air navigation and shipping, *some of this transmitted energy is scattered from the ground and returned to the receiver on the aircraft.*
 - The time delay between transmission and reflection identifies the *slant distance to the "target" from the aircraft*, while the *strength of the return* contains information on the so-called scattering coefficient of the target region of the earth's surface.
 - The actual received signal from a single transmitted pulse consists of a continuum of reflections from the complete region of ground actually illuminated by the radar antenna. In Figure this can be identified as the **range beamwidth of the antenna**. This is chosen at design to give a relation between swath width and altitude, and *tends to be rather broad*.
 - By comparison the **along-track, or so-called azimuth, beamwidth is chosen as small as possible** so that the reflections from a single transmitted pulse can be regarded as having come from a *narrow strip of terrain* broadside to the aircraft.
 - **The forward velocity** of the aircraft is then arranged so that the next transmitted pulse illuminates the next strip of terrain along the swath. In this manner the azimuth beamwidth of the antenna defines the **spatial resolution in the azimuth direction**
 - **The time resolution** possible between echos from two adjacent targets in the range direction defines the **spatial resolution in the slant direction**.

Side Looking Airborne Radar (SLAR)

- From an image product viewpoint the *slant range resolution* is not of interest. Rather it is the *projection of this onto the horizontal plane as ground range resolution* that is of value to the user.
- *The ground range resolution is better at larger incidence angles* and thus on the far side of the swath; it can be shown that the ground range size of a resolution element (pixel) is given by

$$r_g = c\tau/(2 \sin \vartheta_i)$$

where τ is the length of the transmitted pulse and c is the velocity of light. (*)

- Often simple pulses are not used. Chirped waveforms are used instead with some associated signal processing (data acquisition course).
- The *azimuth size of a resolution element* is related to the length (or aperture) of the transmitting antenna in the azimuth direction, l , the wavelength λ and the range R_0 between the aircraft and the target, and is given by

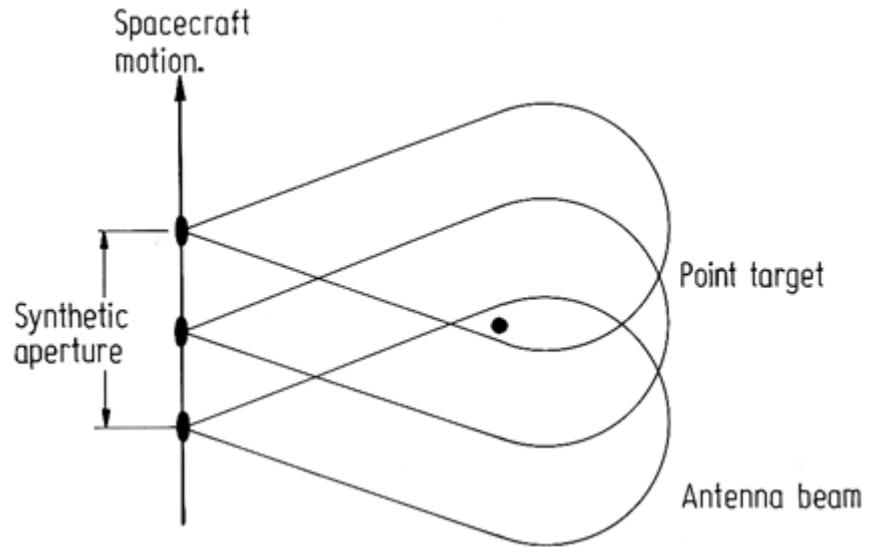
$$r_a = R_0 \lambda / l$$

- This expression shows that a 10 m antenna will yield an azimuth resolution of 20m at a slant range of 1 km for radiation with a wavelength of 20 cm. However, if the slant range is increased to say 100 km – i.e. at low spacecraft altitudes – then a 20 m azimuth resolution would require an antenna of 1 km length, which clearly is impracticable.

(*) the shorter the pulse, the shorter the distance (temporal and spatial) between two detectable echoes (but the lower the power and thus SNR). Pulse modulation can be used to increase ground range resolution.

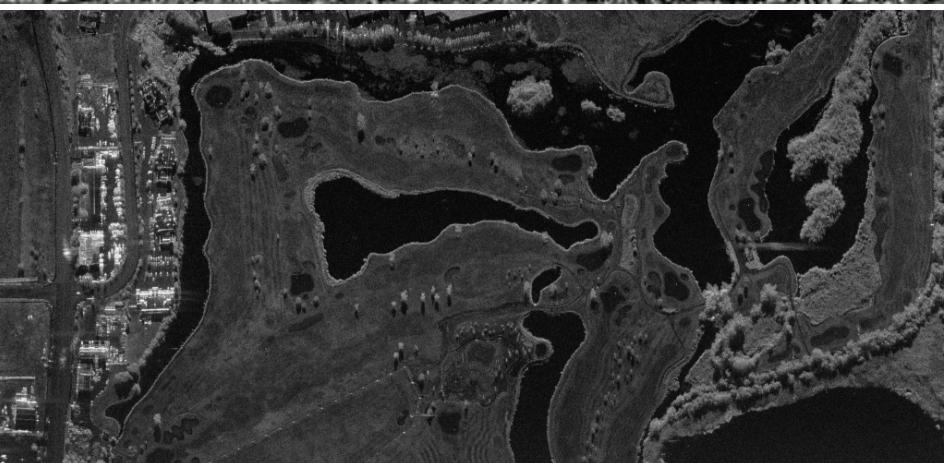
Synthetic Aperture Radar (SAR)

- Due to the above problem when radar image data is to be acquired from spacecraft, a modification of SLAR referred to as **synthetic aperture radar (SAR)** is used.
- Essentially this utilizes the motion of the space vehicle, during transmission of the ranging pulses, to give an effectively long antenna, or a so-called synthetic aperture.
- This principle is illustrated in Figure, wherein it is seen that an intentionally large azimuth beamwidth is employed to ensure that a particular spot on the ground is illuminated and thus provides reflections over a length of spacecraft travel equivalent to the synthetic aperture required.



- A view from above is shown, illustrating that a small real antenna is used to ensure a large real beamwidth in azimuth. Target point on the ground is illuminated by the full synthetic aperture and post-processing is used to better resolve elements in the target region

Synthetic Aperture Radar (SAR)



Examples of various SAR images in different bands



SPATIAL DATA SOURCES IN GENERAL

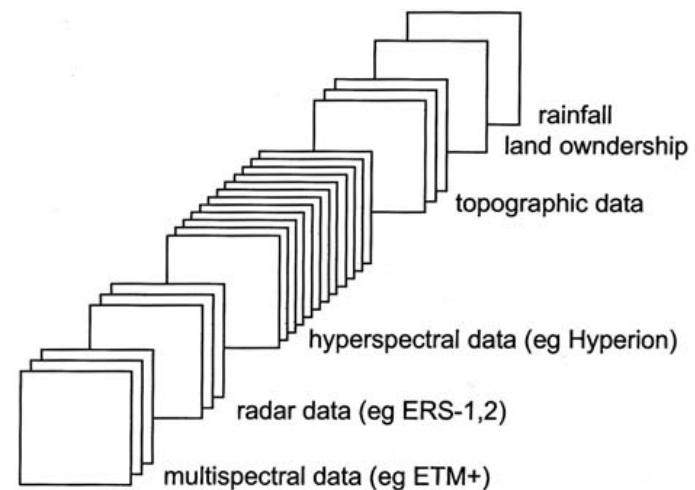
Types of Spatial Data

- We have addressed sources of multispectral digital image data. Other sources of spatially distributed data are also often available for regions of interest.
 - These include simple **maps** that show topography, land ownership, roads and the like, through to more specialised sources of spatial data such as maps of geophysical measurements of the area.
 - Frequently these other spatial data sources contain information not available in multispectral imagery and often judicious *combinations* of multispectral and other map-like data allow inferences to be drawn about regions on the earth's surface not possible when using a single source on its own.
 - Consequently the image analyst ought to be aware of the range of spatial data available for a region and select that subset likely to assist in the information extraction process.
- Sources of spatial data (information can be associated to points, lines or areas)

Point	Line	Area
Multispectral data	road maps	land ownership
Topography	powerline grids	town plans
Magnetic measurements	pipeline networks	geological maps
Gravity measurements		land use licenses
Radiometric measurements		land use maps
Rainfall		land cover maps
Geochemistry (in ppm)		soil type maps

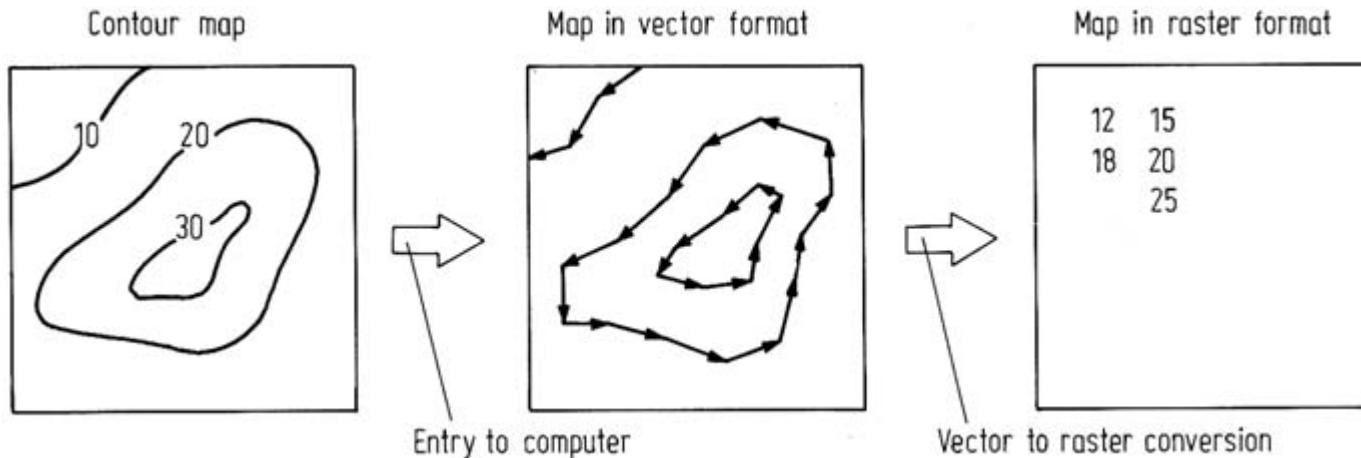
Types of Spatial Data

- Irrespective of type (point, line, area), for a spatial data set to be manipulated using the techniques of digital image processing it must share two characteristics with multispectral data.
 - First it must be available in discrete form spatially, and in value. In other words it must consist of, or be able to be converted to, pixels with each pixel describing the properties of a given (small) area on the ground: the value ascribed to each pixel must be expressible in digital form.
 - Secondly it must be in *correct geographic relation* to a multispectral image data set if the two are to be manipulated together. In situations where multispectral data is not used, the pixels in the spatial data source would normally be arranged to be referenced to a map grid.
- It is usual however, in digital spatial data handling systems, to have all entries in the data set relating to a particular geographical region, mutually registered and referenced to a map base such as the UTM grid system. When available in this manner the data is said to be **geocoded**.



Data Formats

- Sometimes the data will be available as analog maps that require digitisation before entry into a digital data base. That is particularly the case with line and area data types, in which case consideration has to be given also to the "value" that will be ascribed to a particular pixel.
 - For a road map, for example, pixels that fall on highways might be given a value of 1 whereas those on secondary roads could be given a value of 2, and so on.
- Consider the case for example (in figure), of needing to create a digital topographic map from its analog contour map counterpart.
 - Some spatial data handling computer systems operate in vector format entirely.
 - However to be able to exploit the techniques of digital image processing the vector formatted data has to be turned into a set of pixels arranged on rectangular grid centres (raster format).



Use of colour in remote sensing images

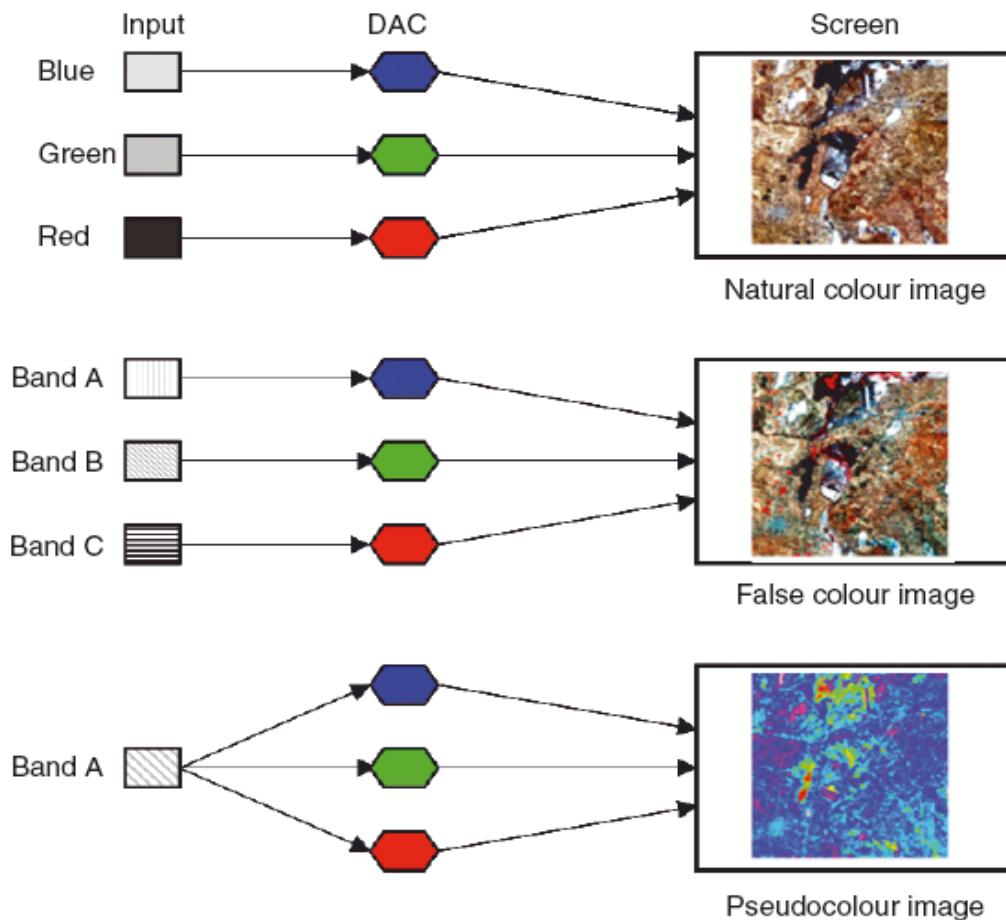


FIGURE A natural colour image (top) is generated when the input pixel RGB values correspond to red, green and blue reflectance from the target. If the three input pixel values represent reflectance, emittance or backscatter in three independent wavebands A, B and C that are not actually red, green and blue in nature then a false colour image is generated – for example the RGB values might represent thermal infrared, shortwave infrared and green (middle). If the input consists of a single band A (bottom) then the DAC can be programmed so that the red, green and blue graphics memory cells receive inputs corresponding to a colour (so that, for example the single input image pixel value is 197 then the RGB input to graphics memory might be 255, 255 and 0, respectively, giving the colour yellow, thus producing a pseudocolour image). If the same value is sent to the red, green and blue inputs of the monitor, (e.g. the input image A value is 135 and the input RGB DACs receive the values 127, 127 and 127 respectively) then a greyscale image is generated.

Multispectral raster image formats

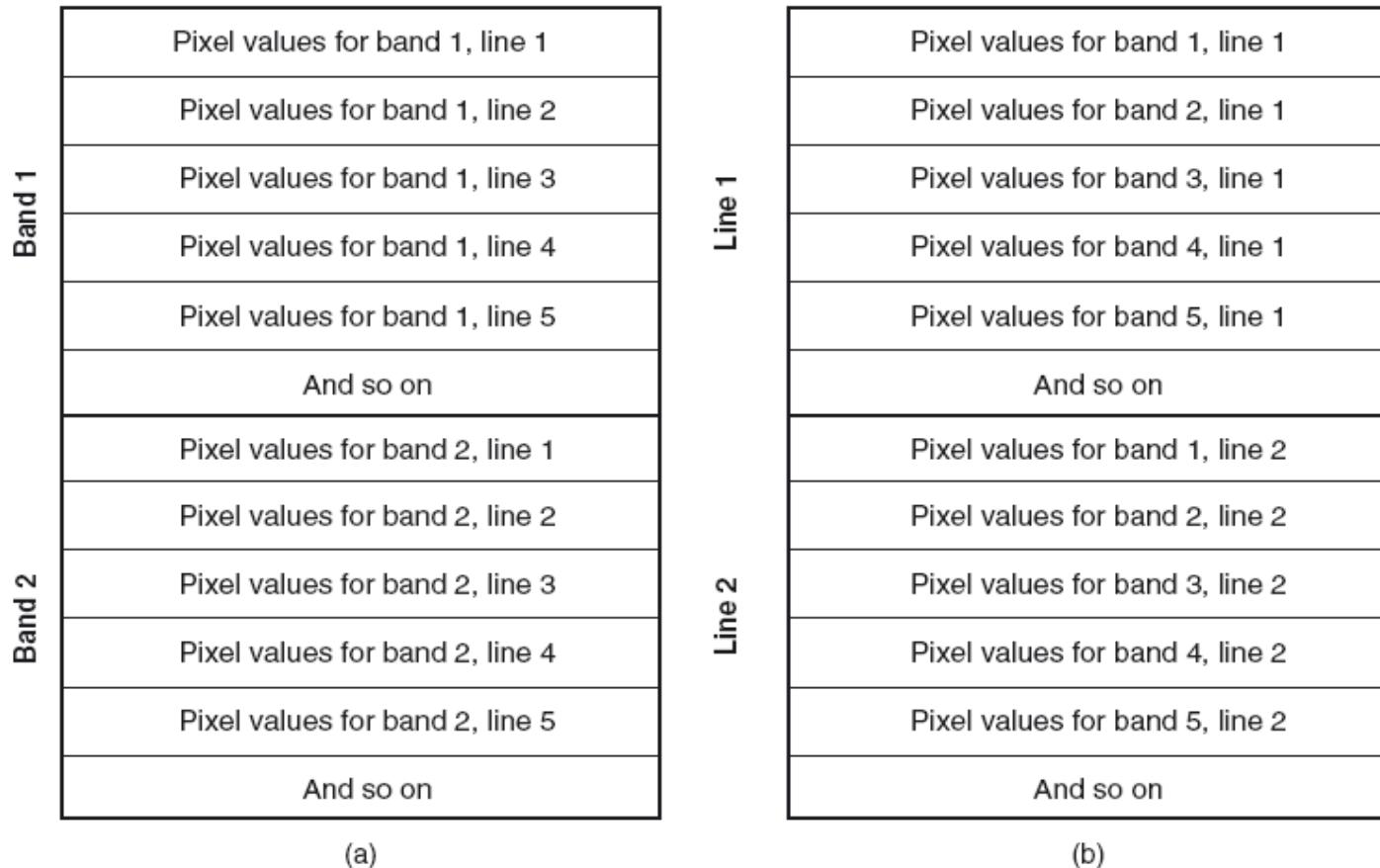


FIGURE Illustrating (a) band sequential (BSQ) and (b) band interleaved by line (BIL) formats for the storage of remotely sensed image data. The layout in (b) assumes a seven band image.