

ENICS 2008 Invited Speech

Hyperspectral imaging: sensors, algorithms and challenges

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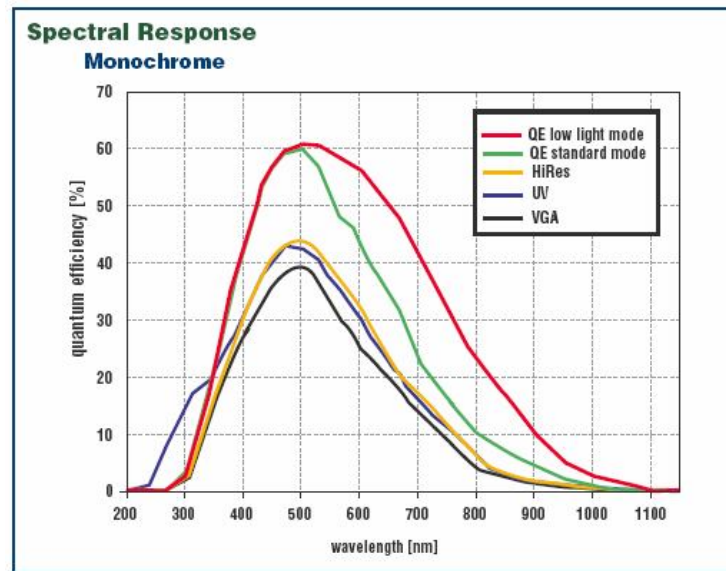


CONTENTS

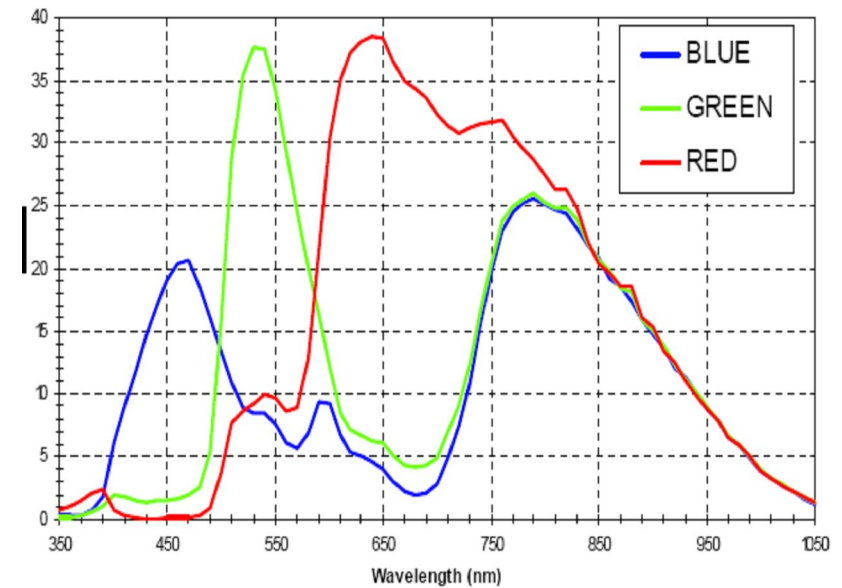
- Problem definition
- Filtering methods
- Sensors
- Data processing issues
- Applications
- Future trends



Problem definition



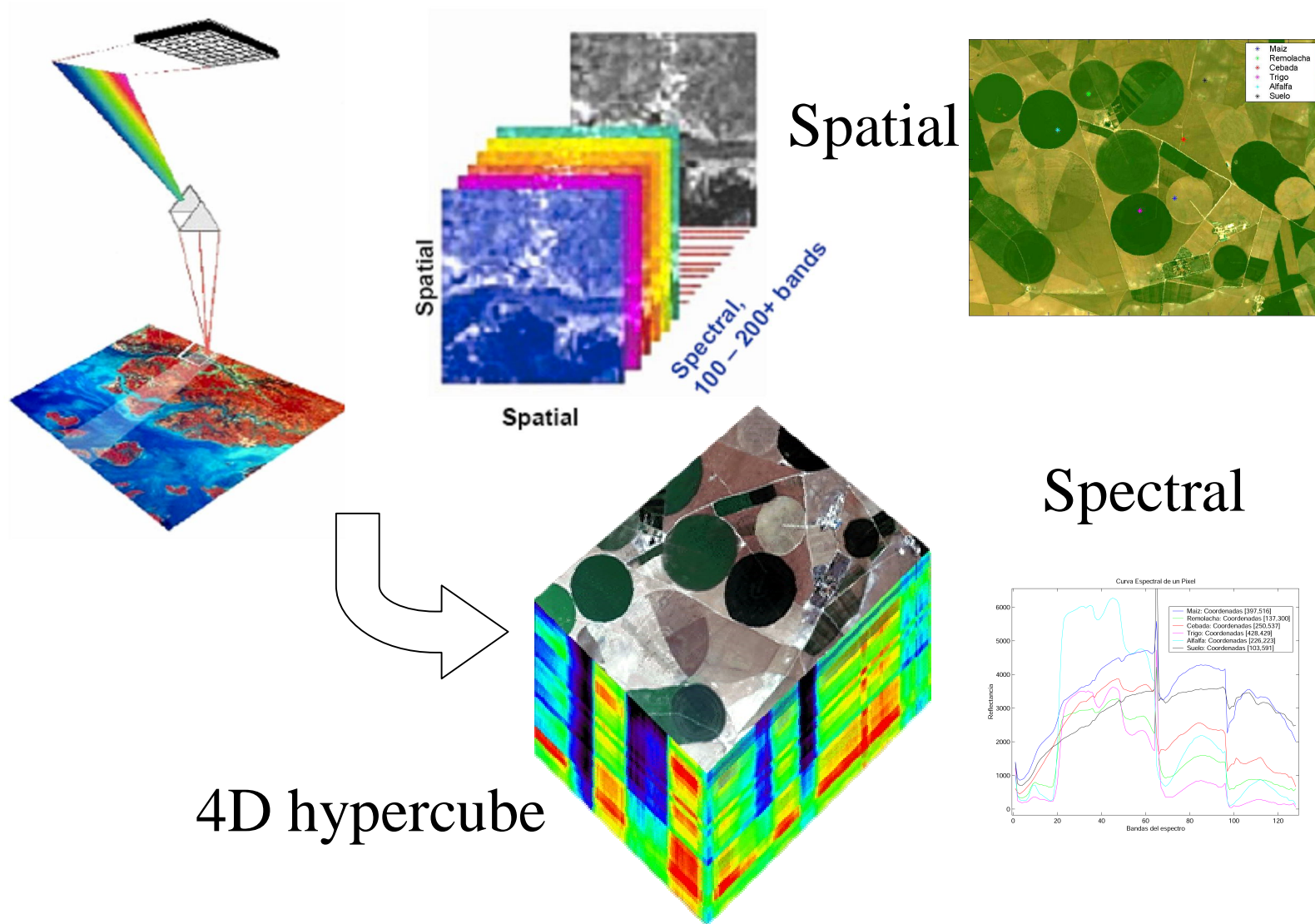
PixelFly monochrome CCD camera



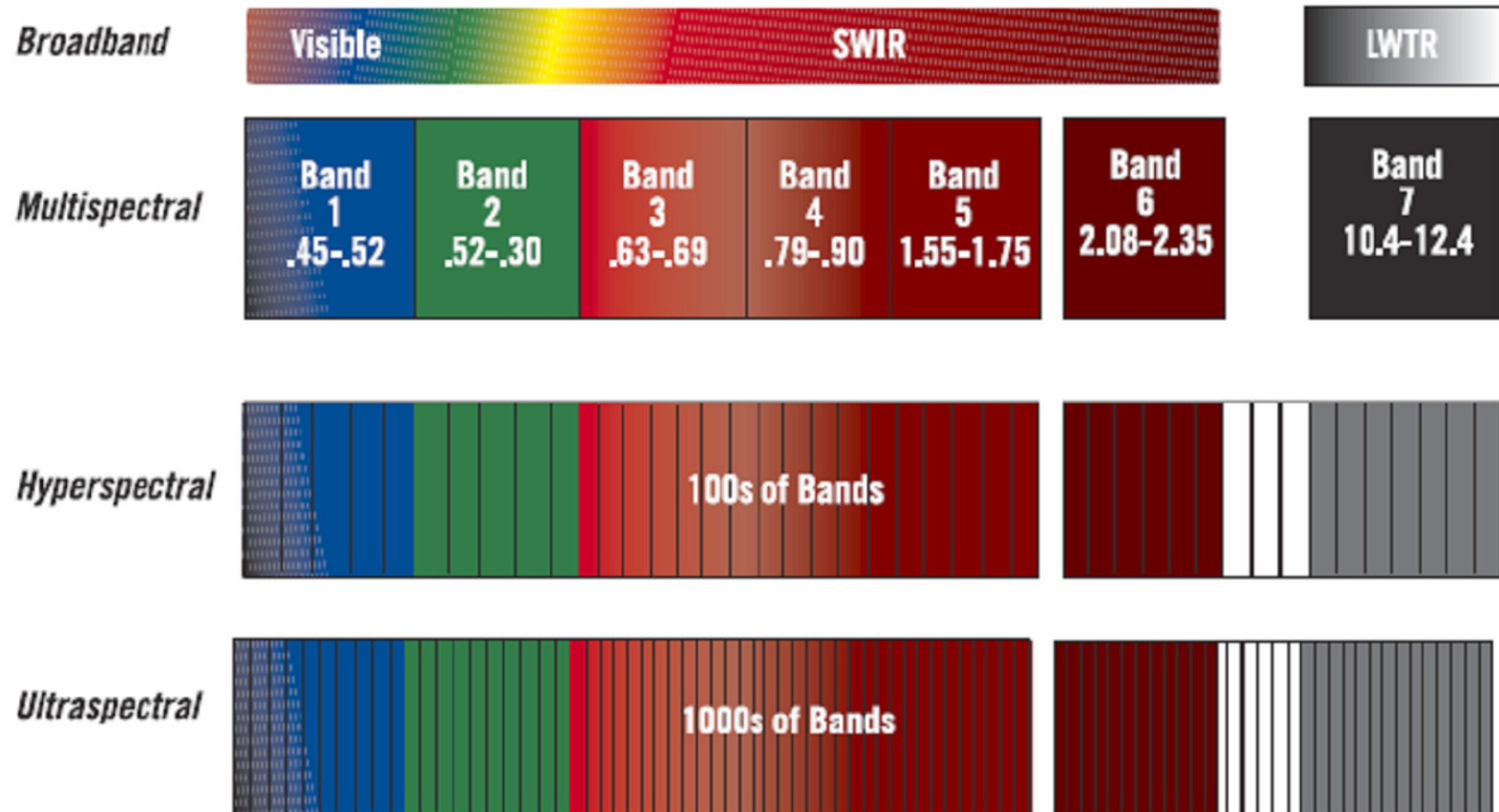
Spectral Response of a CMOS Sensor with RGB CFA



Problem definition



Problem definition



Problem definition

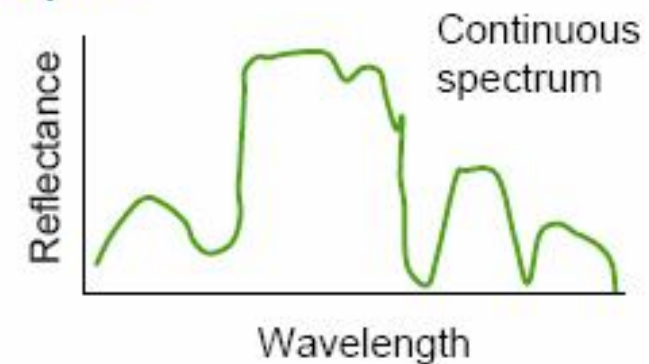
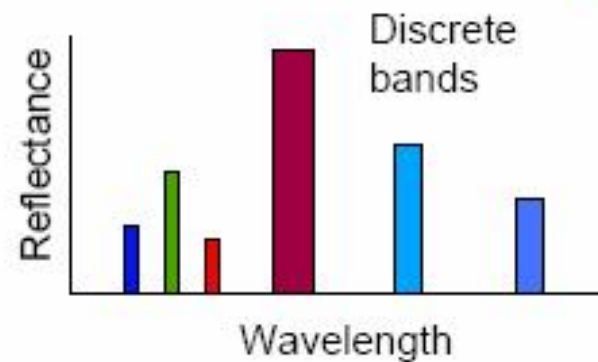
Multispectral



Hyperspectral

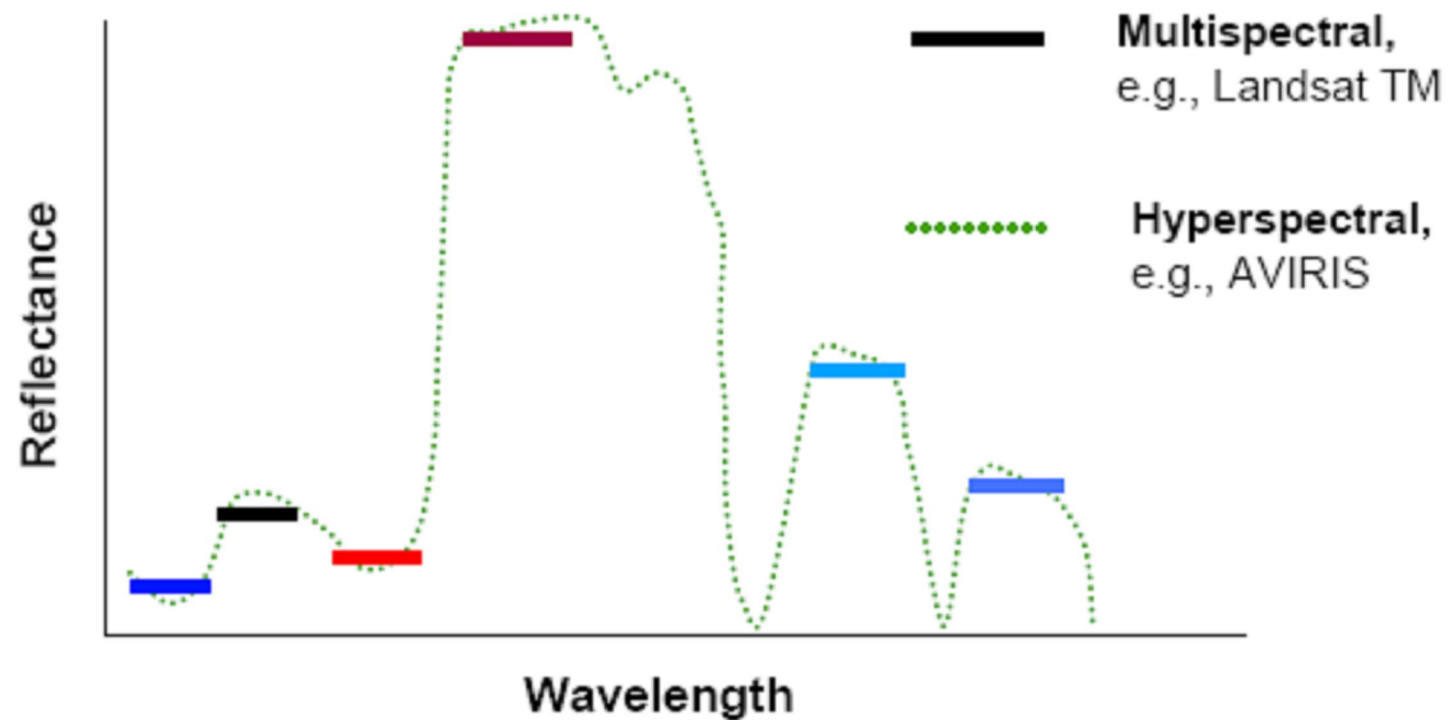


Each pixel



Problem definition

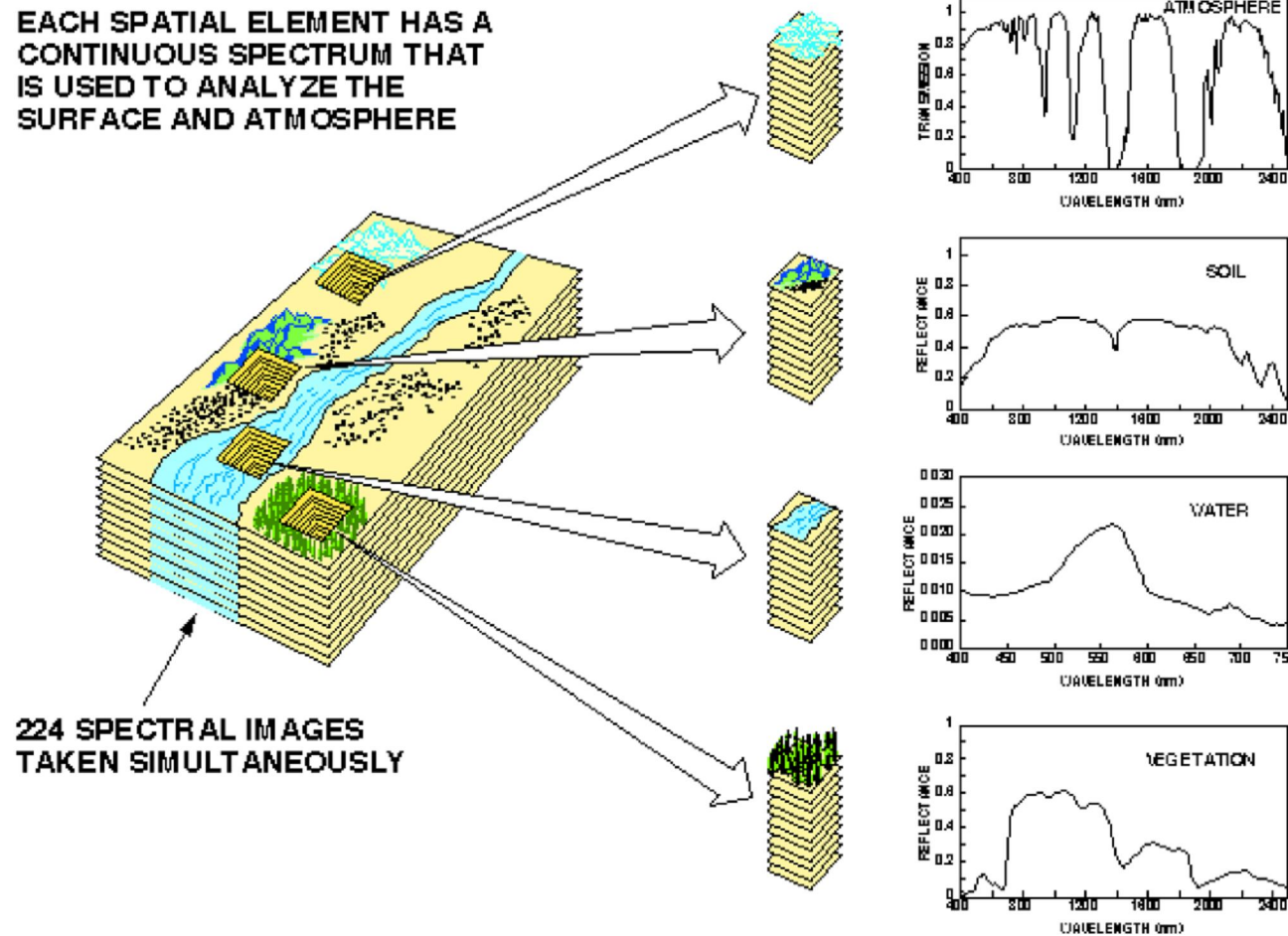
Multispectral vs. Hyperspectral Data



Problem definition

Imaging Spectrometry Concept

EACH SPATIAL ELEMENT HAS A CONTINUOUS SPECTRUM THAT IS USED TO ANALYZE THE SURFACE AND ATMOSPHERE

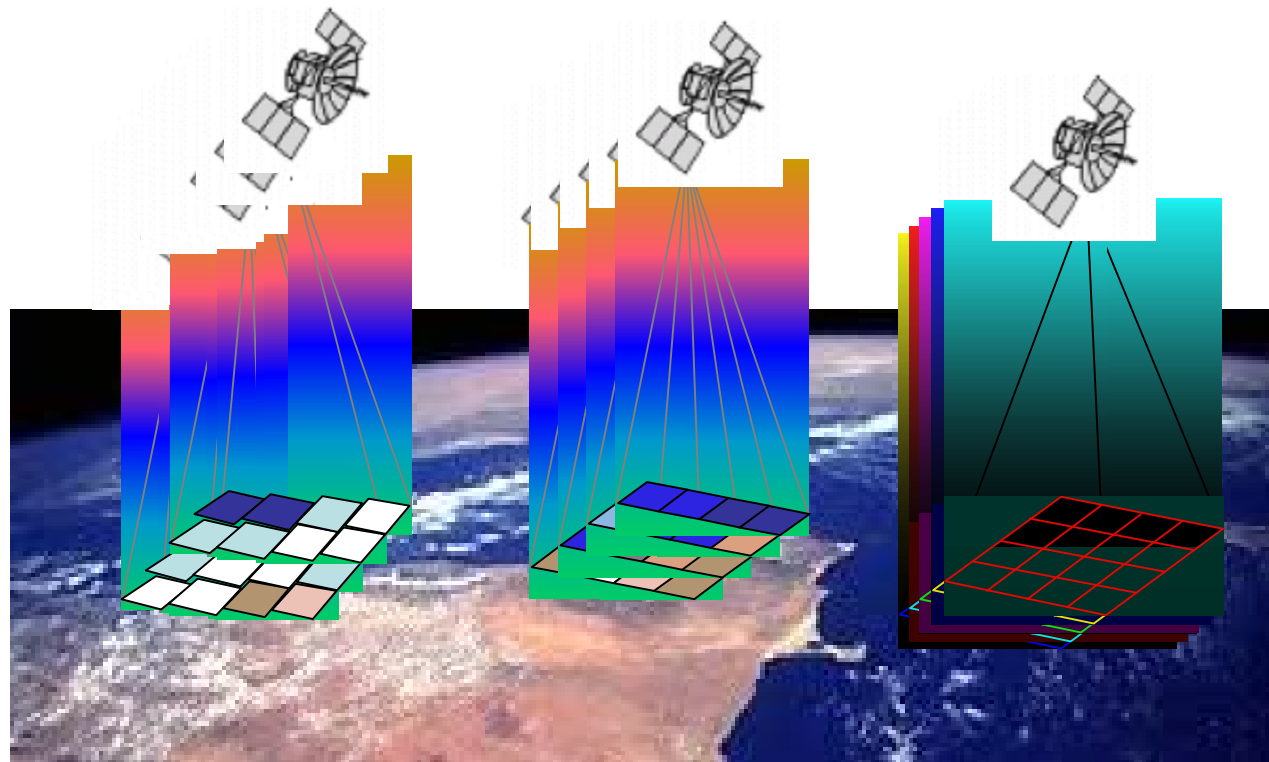


Problem definition: Image formation

whiskbroom
Band Interleaved
By Pixel (BIP)

pushbroom
Band Interleaved
By Line (BIL)

staring
Band Sequential
(BSQ)



CONTENTS

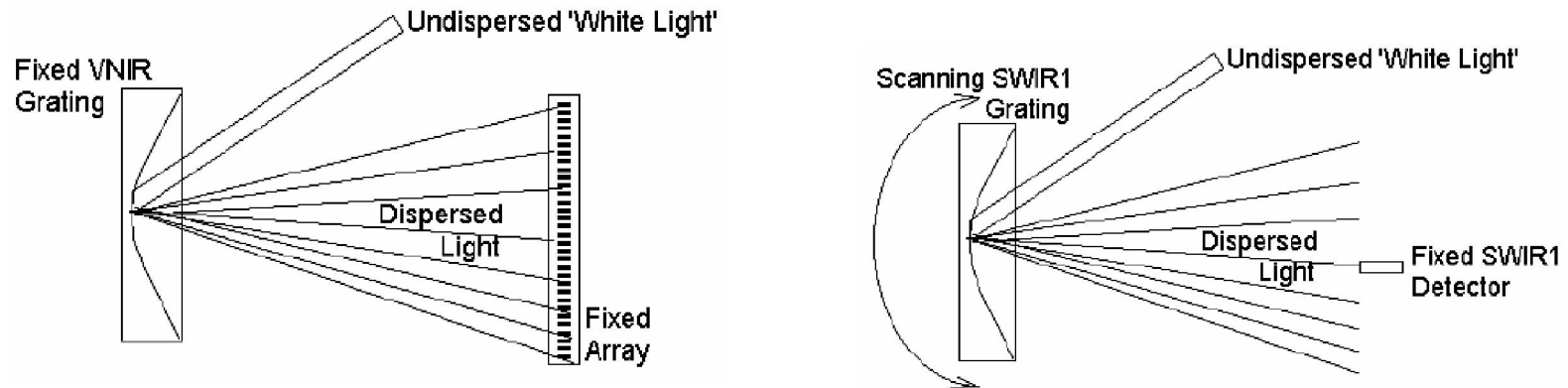
- Problem definition
- **Filtering methods**
- Sensors
- Data processing issues
- Applications
- Future trends



Filtering methods: Point spectrometer

Analytical Spectral Devices, Inc. FieldSpec Pro FR

Principle of measurement	VIS-NIR: A fixed concave holographic reflective grating disperses the light onto a fixed photodiode array SWIR: A rotating concave holographic reflective grating scans the light onto a fixed single InGaAs detector
Spectral range	350-2500 nm
Spectral resolution	3 nm @ 700 nm 10 nm @ 1400 nm & 2100 nm
Detectors	1 512 element Si photodiode array 350-1000nm 2 TE cooled, graded index InGaAs photodiodes 1-2,5um

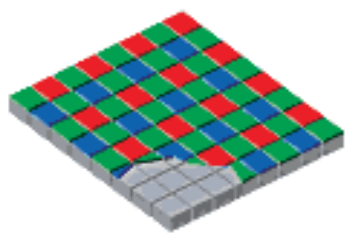


Hyperspectral imaging: sensors, algorithms and challenges

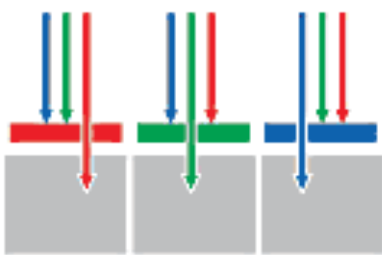
Filtering methods

Tri-CCD to Bayer pattern

Mosaic Capture



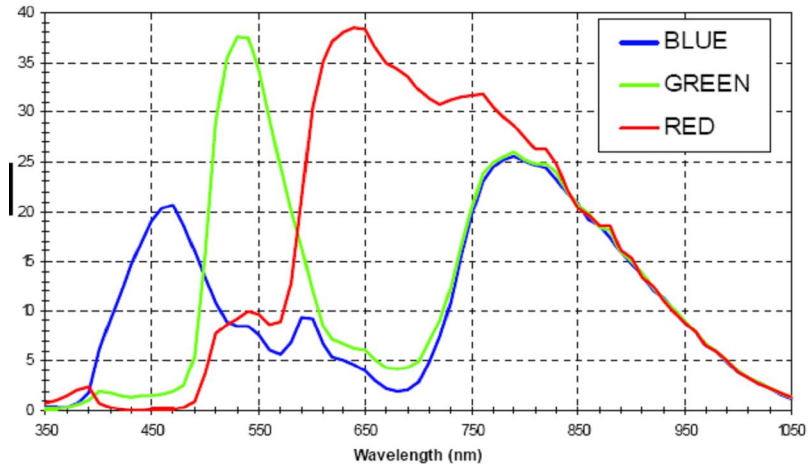
In conventional systems, color filters are applied to a single layer of pixel sensors in a tiled mosaic pattern.



The filters let only one wavelength of light—red, green, or blue—pass through to any given pixel location, allowing it to record only one color.

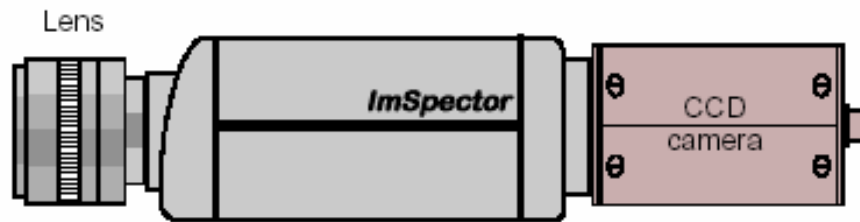


As a result, mosaic sensors capture only 25% of the red and blue light, and just 50% of the green.

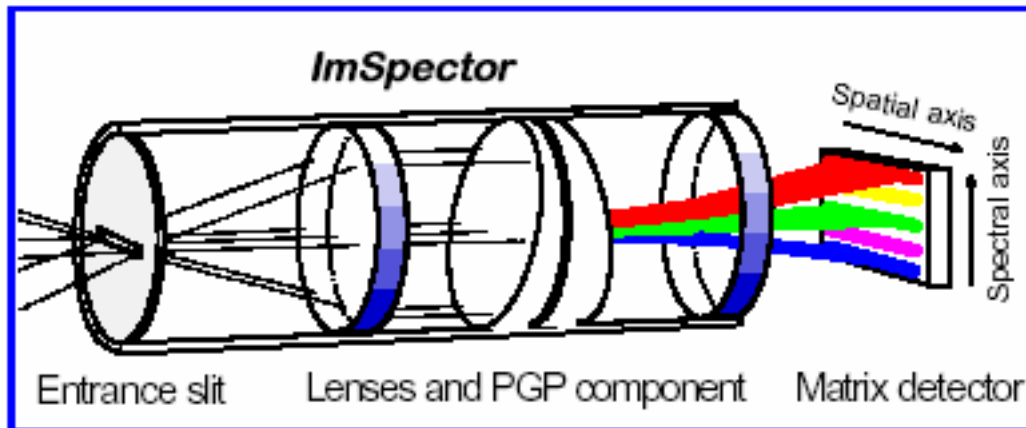


Filtering methods

ImSpector from Specim, Inc



Captures a line image and disperses it to a spectrum. Coupled to a B/W matrix camera converts it to a spectral line imaging system

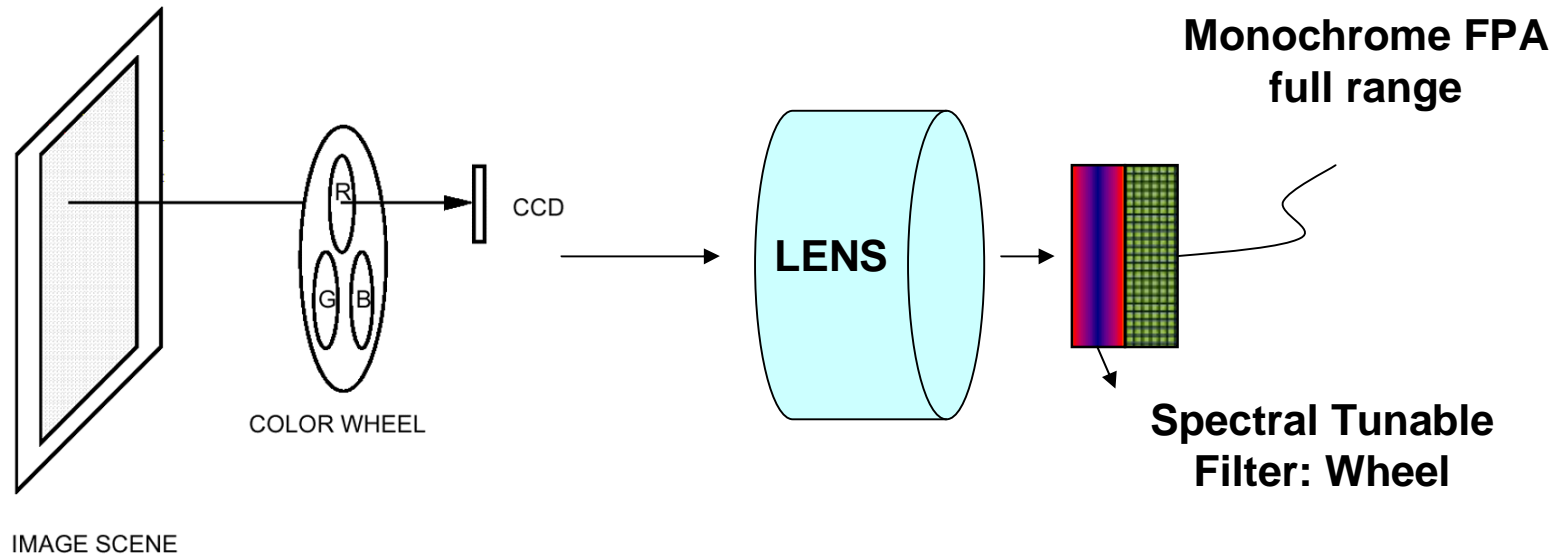


Spectral range:
400-1000 nm

Spectral resolution:
5-7 nm

For Machine Vision

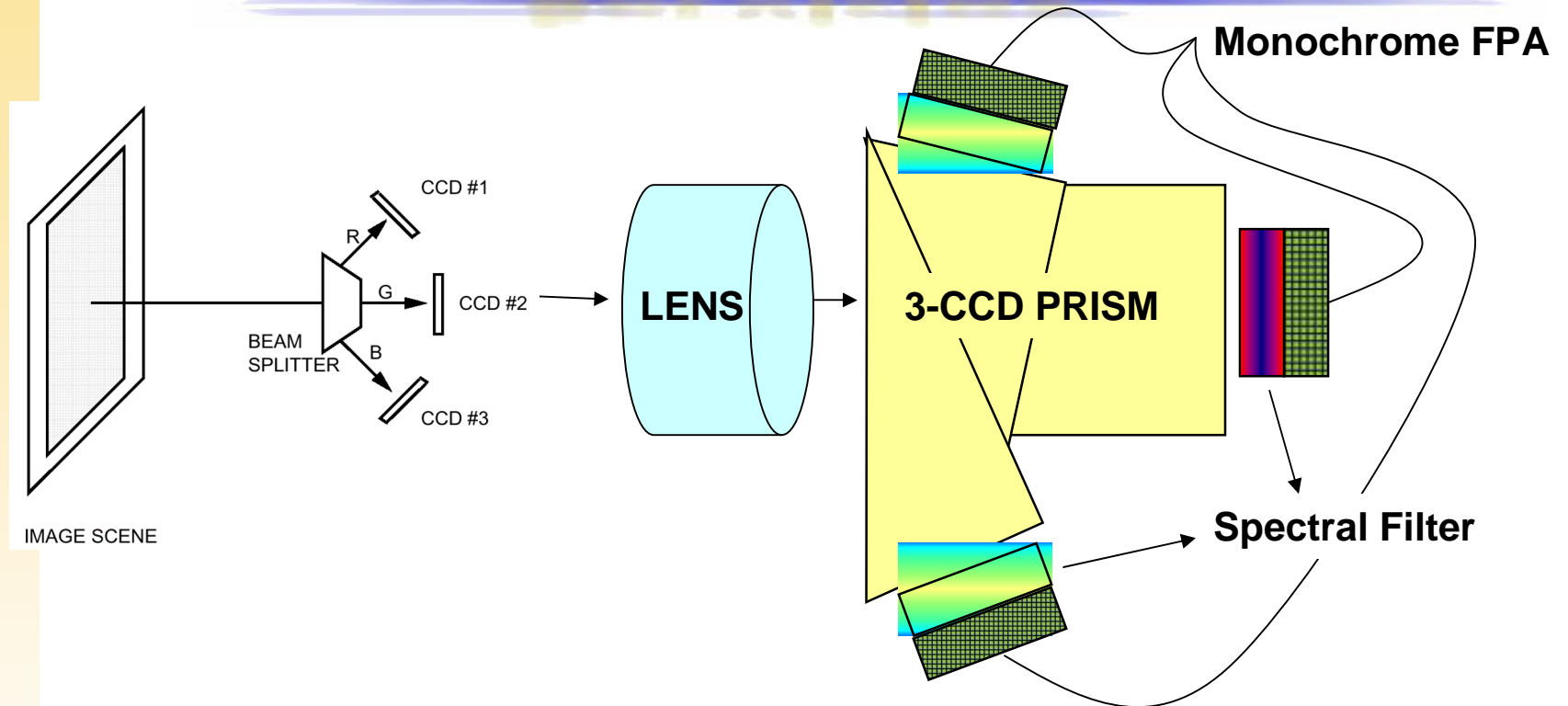
FPA with spectral filter wheel



Key Features	User Advantages/Implications
<p>Multiple spectral bands synthesized using different spectral filters in a wheel</p>	<p>Straightforward implementation</p> <p><u>Spectral/spatial information not simultaneous</u></p> <p>Useful for <u>several fix spectral bands</u> using a single filter wheel</p> <p>Dual color filter wheel implementation can result in large number of bands</p>

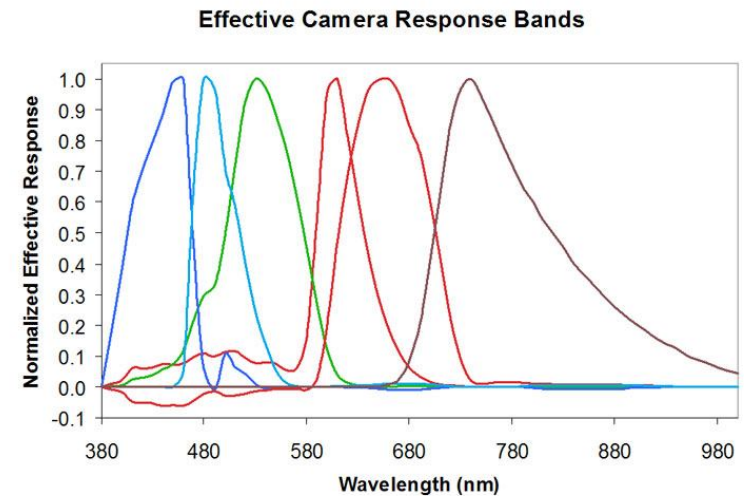
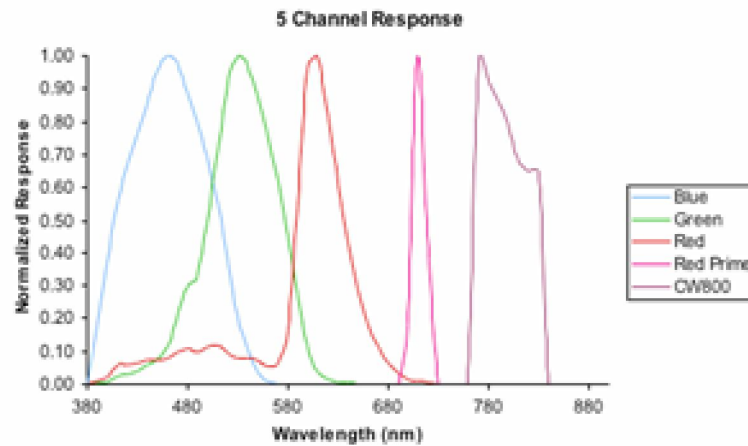


Multiple FPAs with spectral separation elements



Key Features	User Advantages/Implications
<u>Diachroic elements used to spectrally separate and route light in specific spectral bandpasses to individual focal planes</u>	Straightforward implementation for scanners or starers <u>Simultaneous spatial/spectral</u> information Straylight/radiometry implications <u>Small number discrete spectral bands</u>

Multiple FPAs with spectral separation elements

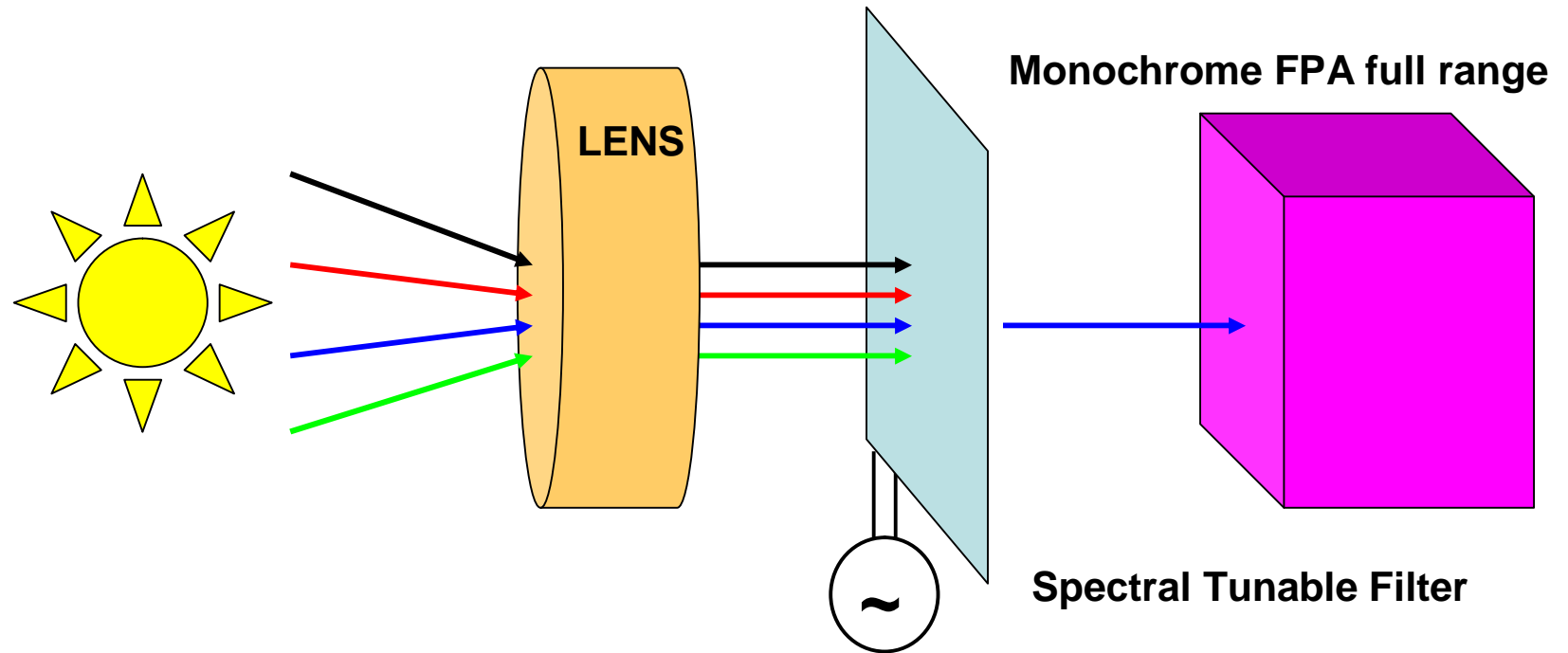


**FluxData FD-1665 3CCD
Multispectral Cameras**



Hyperspectral imaging: sensors, algorithms and challenges

FPA with spectral tunable filter



Key Features	User Advantages/Implications
Multiple spectral bands synthesized using the same <u>spectral tunable filter</u>	Straightforward implementation <u>Spectral/spatial information not simultaneous</u> Useful for <u>several tunable spectral bands</u> using a single filter

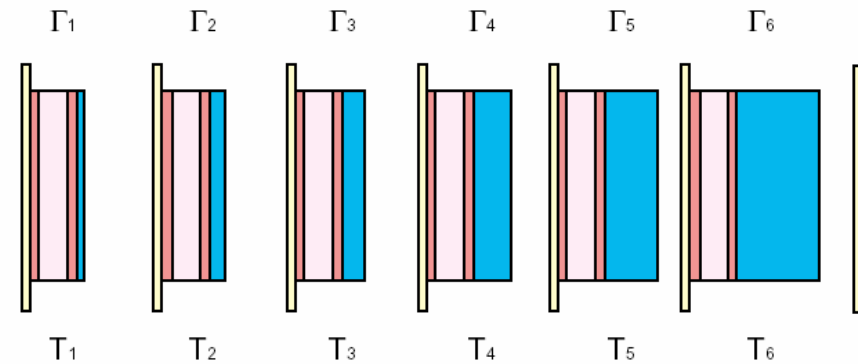
Filtering methods: LCTF

Liquid Crystal Tunable Filter

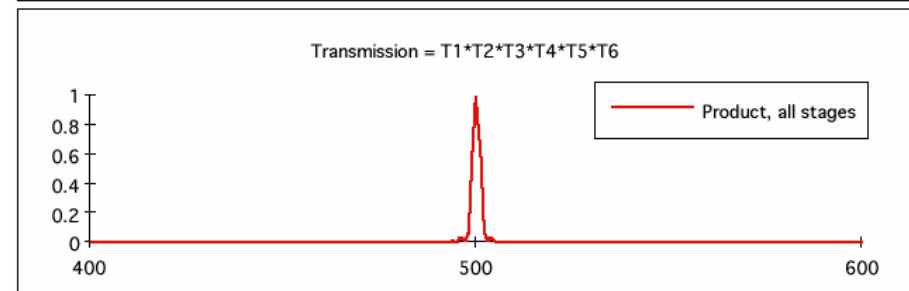
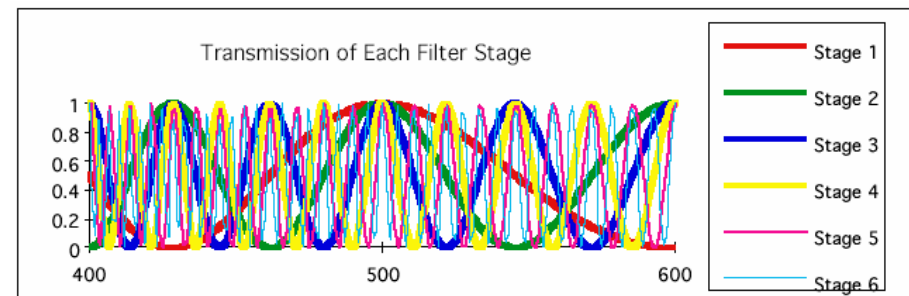
Formed by a stack of polarizers and tunable retardation liquid crystal plates

Combining the transmission of all the plate only a narrow band can be transmitted

Changing the bandpass is very fast (~50 ms)



$$T_{\text{Total}} = T_1 * T_2 * T_3 * T_4 * T_5 * T_6$$

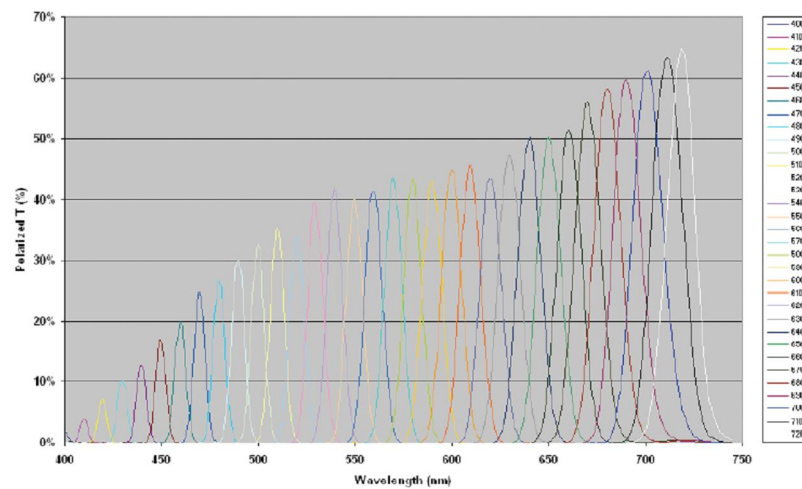


Filtering methods: LCTF

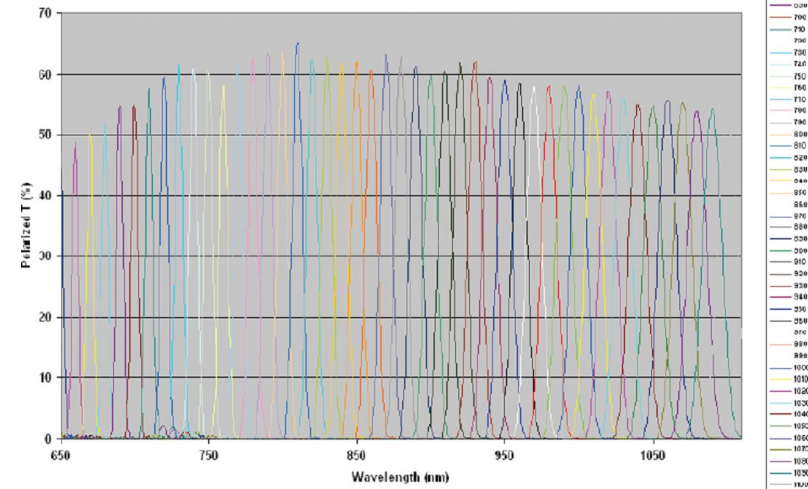
VarisPec Tunable Imaging Filter
(*Cambridge Research, Inc.*)



Typical VIS-10 VariSpec Filter



Typical SNIR-10 VariSpec Filter

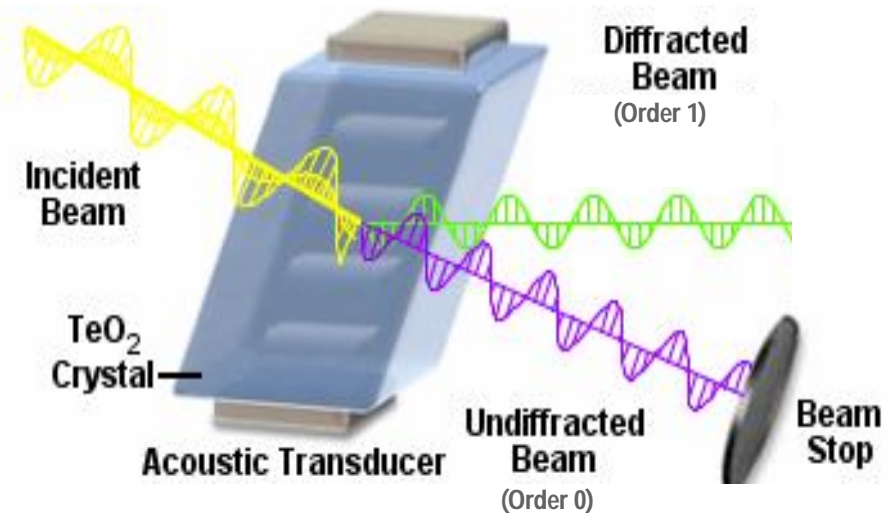


Filtering methods: AOTF

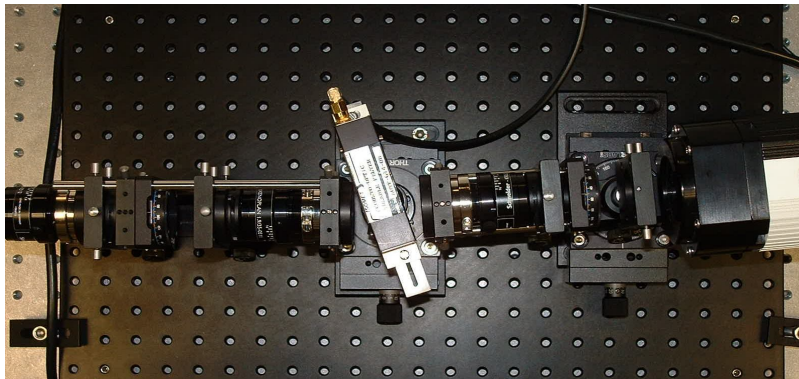
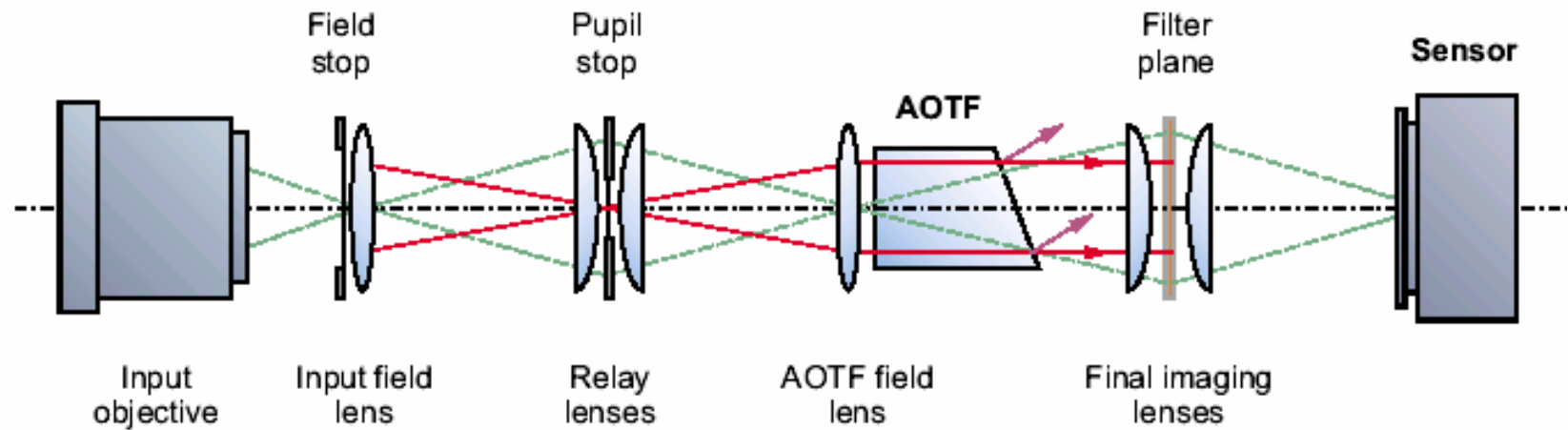
Acousto Optic Tunable Filter

- An RF signal applied to a piezo-electric transducer, bonded to a suitable crystal will generate an acoustic wave.
- Any incident light ray will be diffracted. The wavelength of the 1st order diffracted ray depends on the acoustic frequency.

- ☺ Usable wavelengths: 0.4-5.1 μm
- ☺ Spectral resolution: 0.7nm @400nm to 10nm @ 1000nm
- ☺ μs access time to a wavelength
- ☺ Random or sequential access to any wavelength
- ☹ Filter limited to about one octave
- ☹ AOTF are polarisation sensitive
- ☹ Small active aperture of crystal
- ☹ Cost

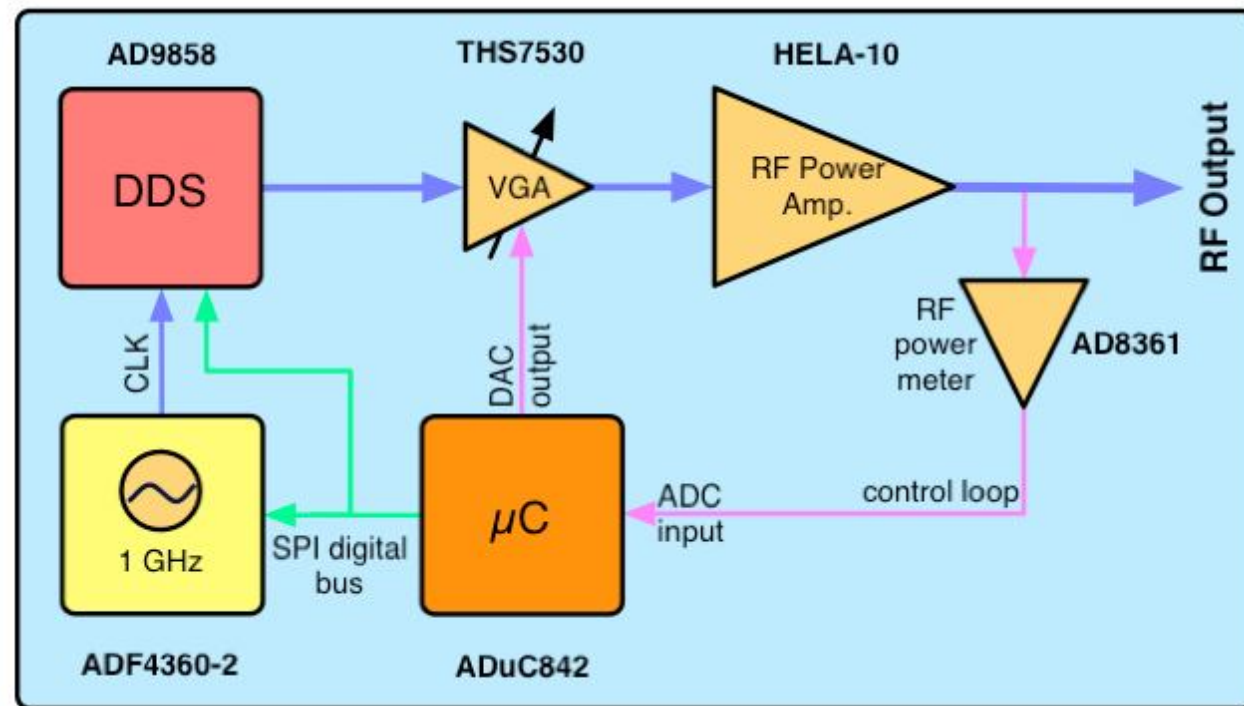


Filtering Methods: AOTF

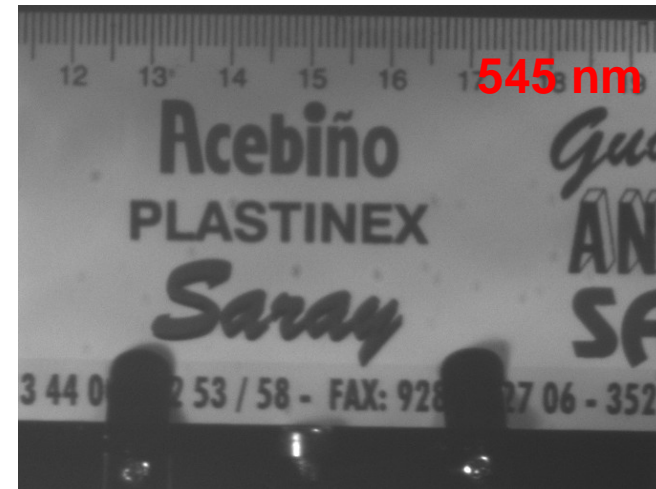


RF generator

- Generates an RF signal with the proper frequency and power to drive the AOTF crystal.
- Based on a Direct Digital Synthesizer circuit and two cascaded monolithic RF amplifiers.



G&H VIS laboratory setup imaging

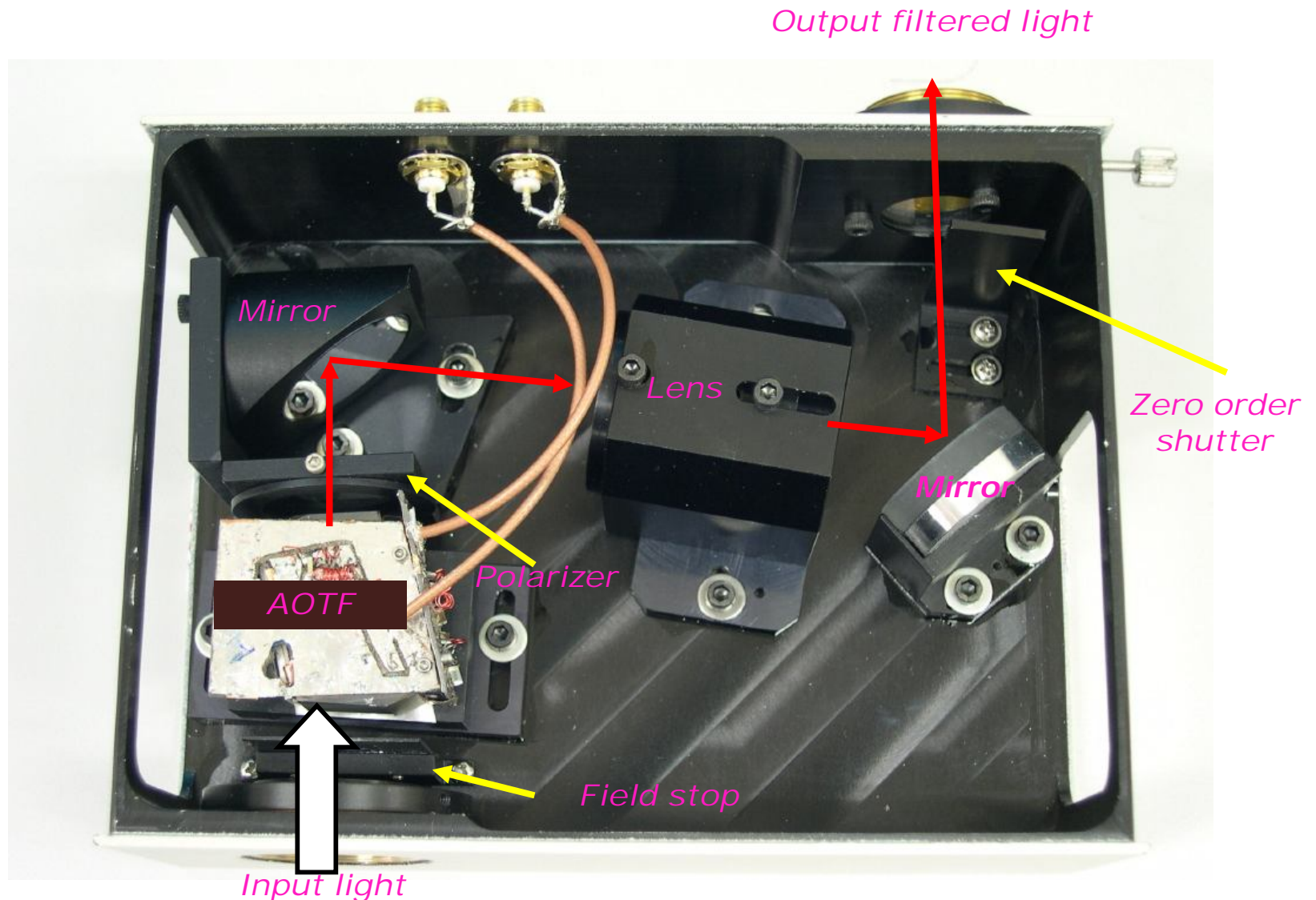


Hyperspectral imaging: sensors, algorithms and challenges

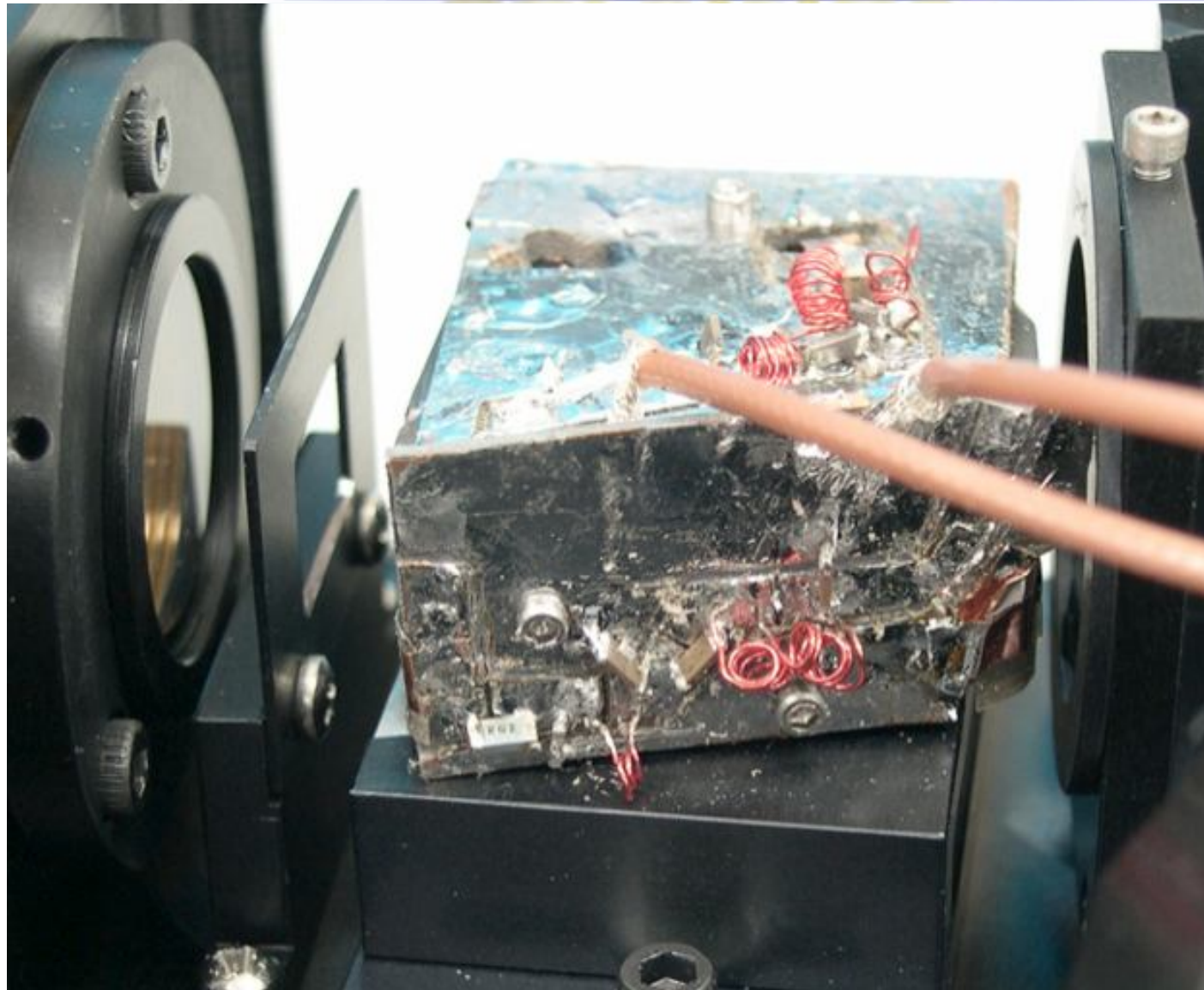
Brimrose optical system



Brimrose optical system



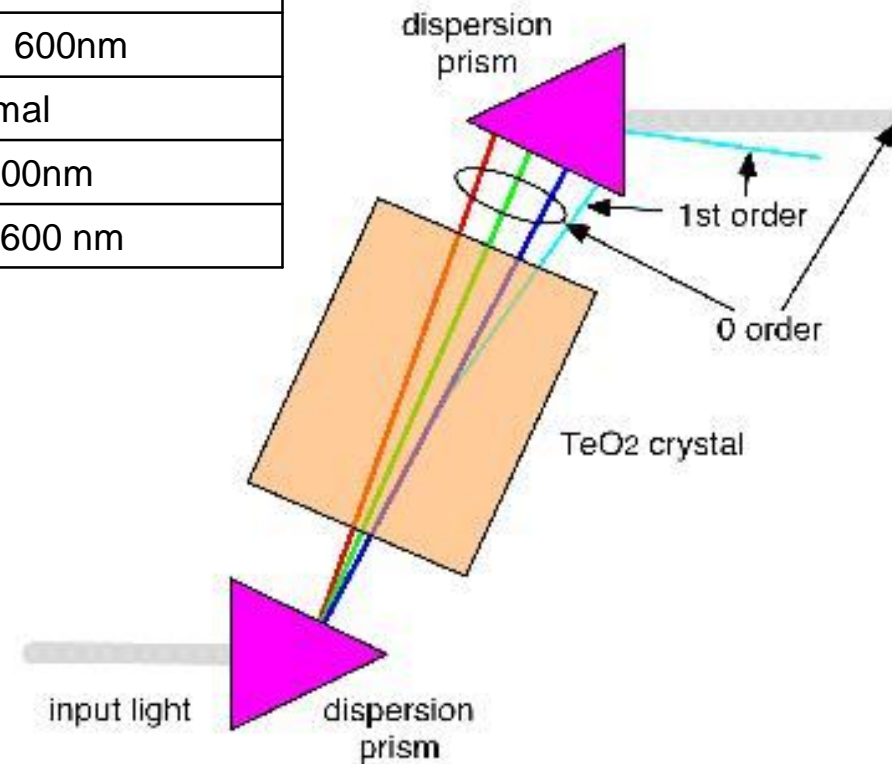
Brimrose AOTF



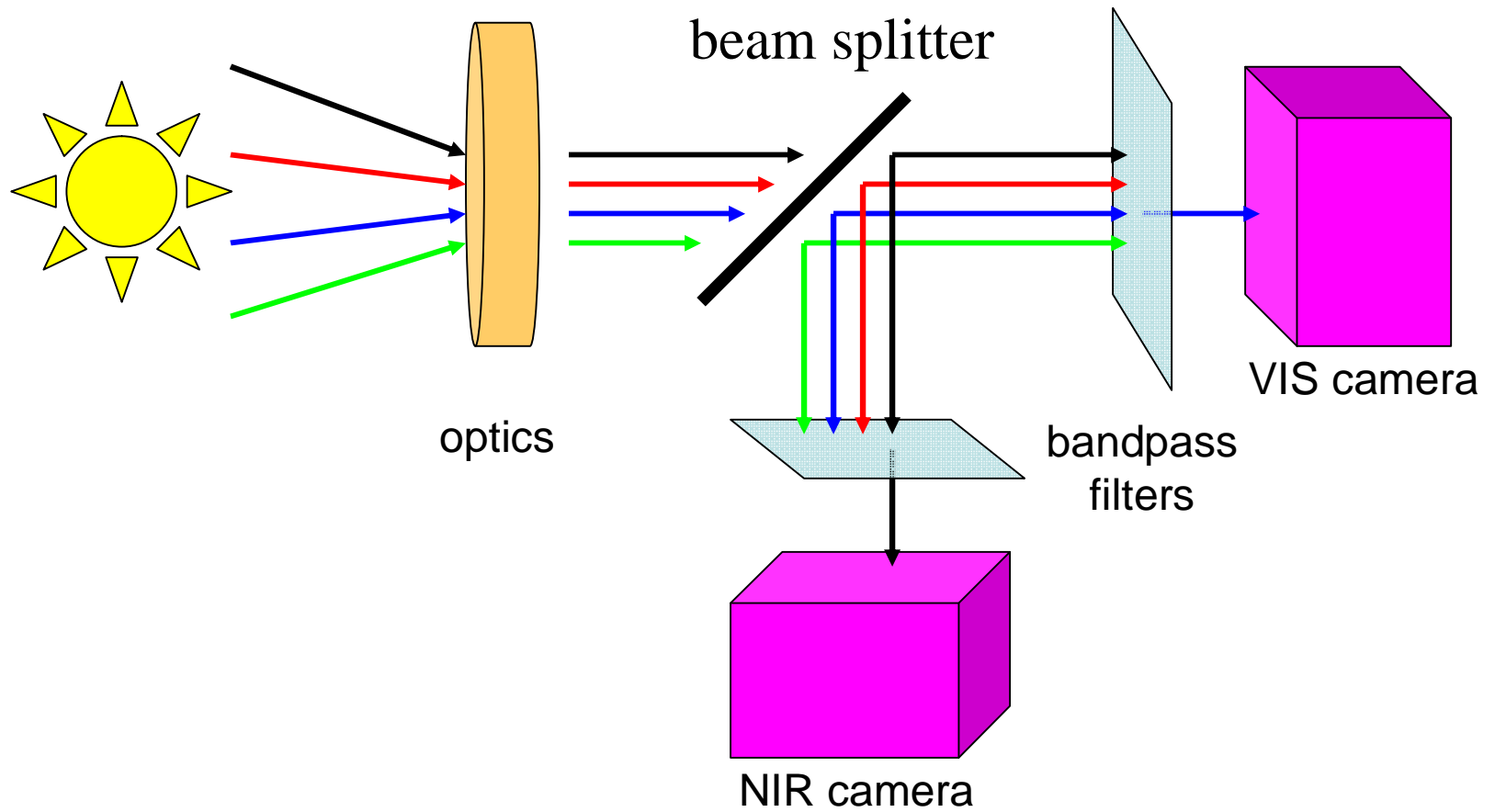
Hyperspectral imaging: sensors, algorithms and challenges

OSTF (Isomet)

Aperture	5mm x 5mm
Wavelength range	400nm – 1000nm (nominal)
Frequency range	445-110 MHz (nominal)
Diffraction efficiency	>85%
Bandwidth	3.5nm @ 600nm
Incidence Angle	Normal
Acceptance angle	4° @ 600nm
Separation angle	3.36° @ 600 nm



Multiple arrays sensor



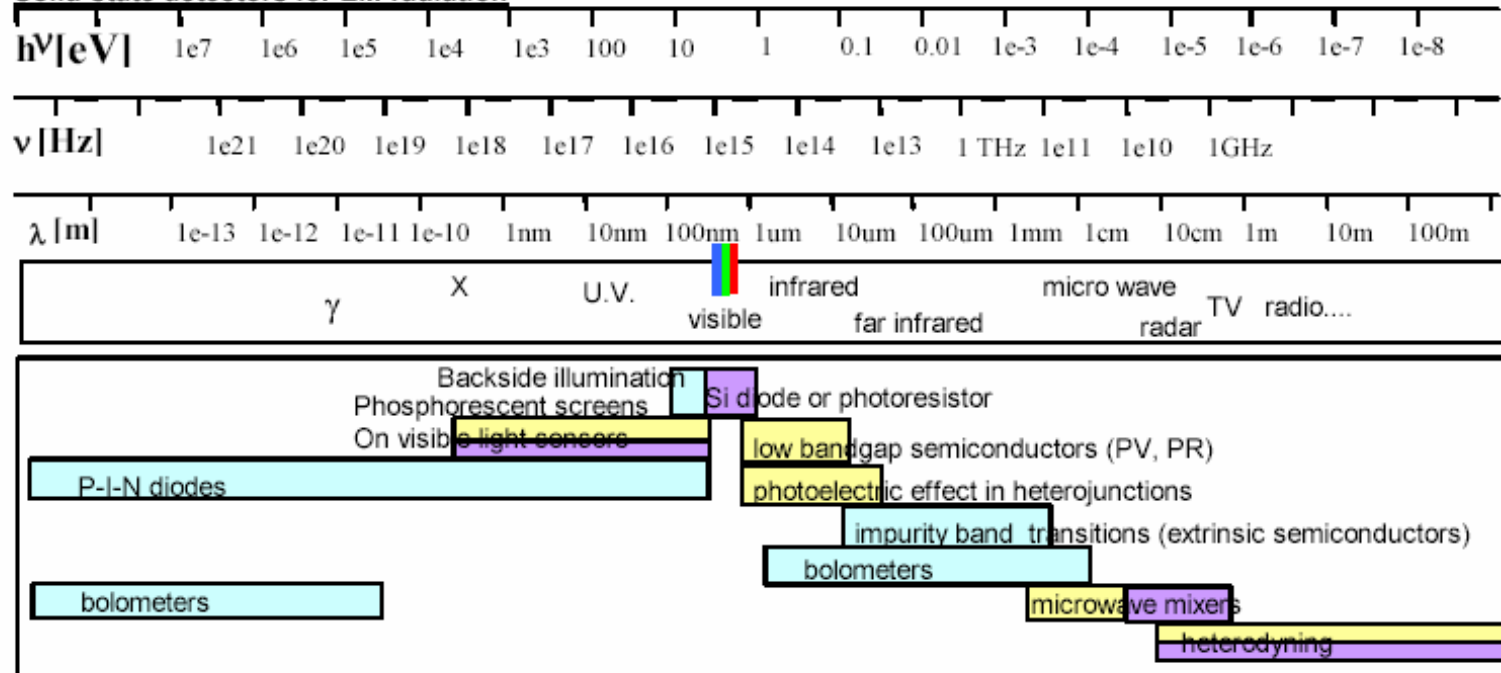
CONTENTS

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- **Sensors**
- Data processing issues
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Sensors

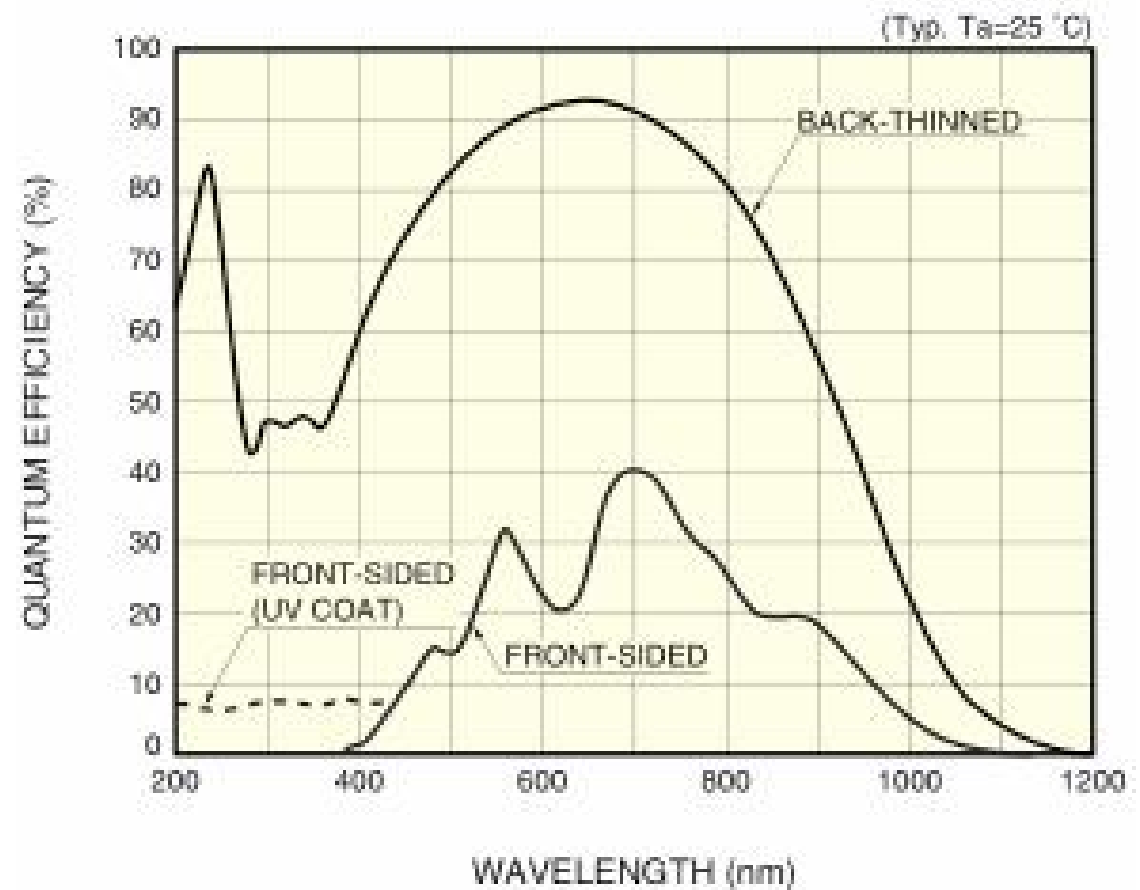
Solid-state detectors for EM-radiation



Few photons get to the sensors

■ Intensified technologies:

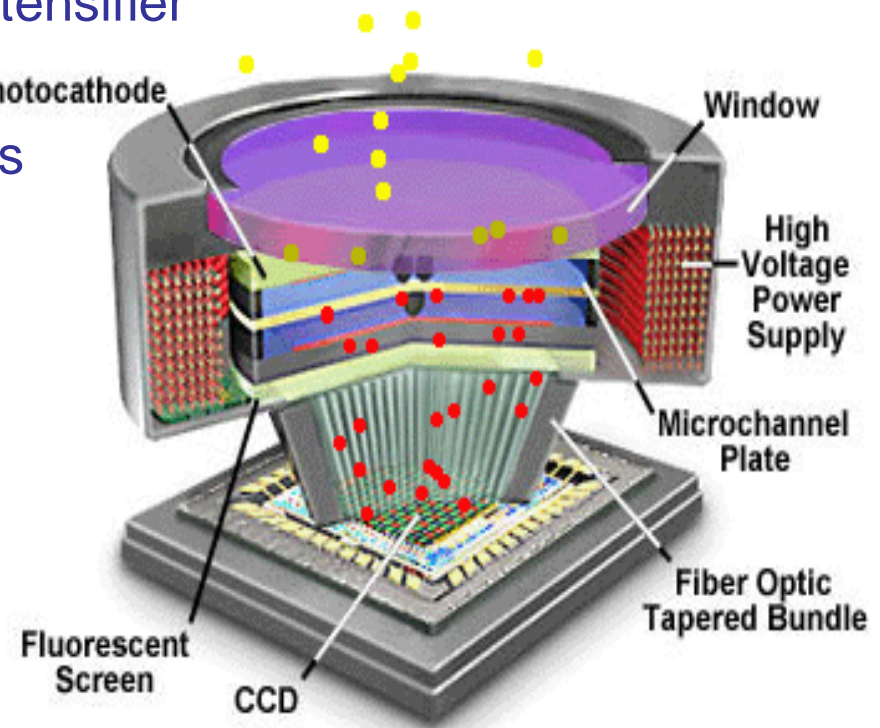
- ICCD
- EBCCD
- L3CCD



Sensors: Intensified technologies. ICCD

CCD plus image intensifier fibre-optically coupled
Spectral sensitivity depending of the photocatode
High voltage for accelerating electrons
Pulse amplifier for gated intensifier

- Delft Electronic Products
- Intevac
- Hamamatsu (10,000 €)
- Proxitronic

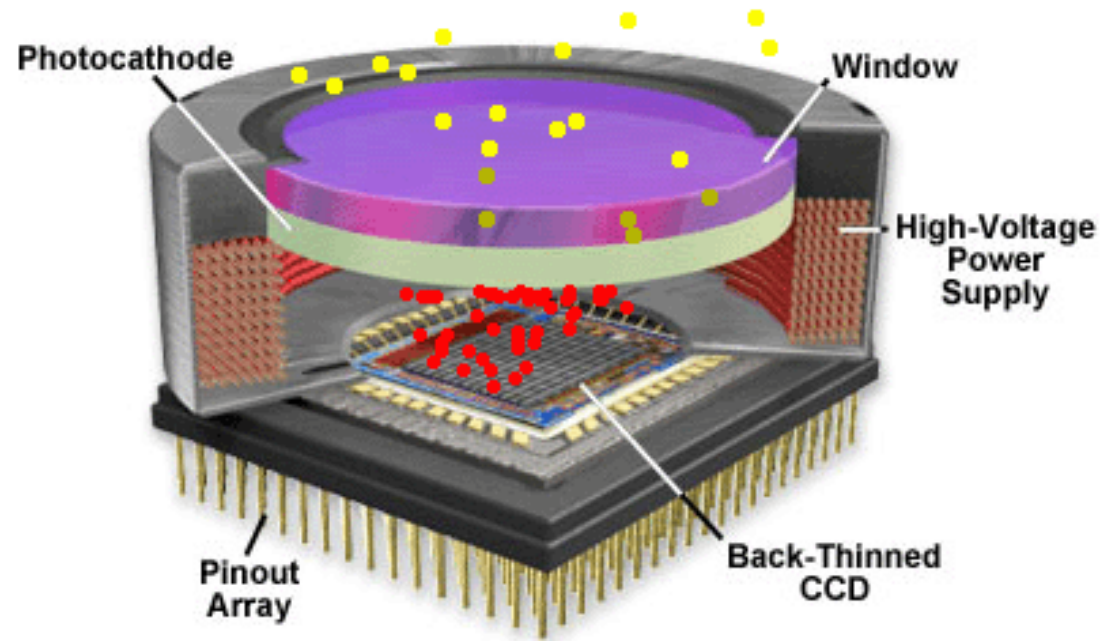


Sensors: Intensified technologies. EBCCD

Hybrid of an image intensifier and a CCD camera

Electrons impact on the back side of a back thinned CCD

- EB-CCD N7640 Hamamatsu (640x480)
 - ▶ Spectral range 370–920 nm
 - ▶ Frame rate 60 Hz interlaced
- EBAPS Intevac



Sensors: Intensified technologies. L3CCD

Applies gain to the signal charge prior to the output node.
This effectively reduces the magnitude of the read out noise

E2V Technologies CCD87 (512x512)

Spectral range . . . 400–1060nm

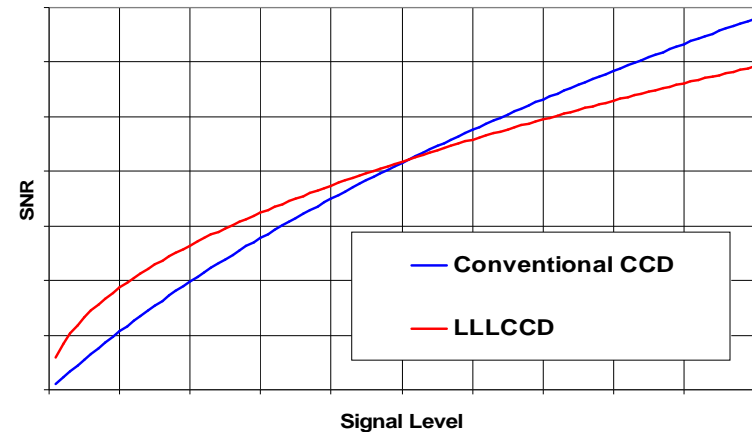
Fill factor 100%

Frame rate 30 Hz

TI TC253SPD (680x500)

High Uniformity from DUV to NIR

Frame rate 30 Hz



Conventional CCD

Image Area

On-Chip Amplifier



Serial register

LLLCCD

Image Area
(Architecture unchanged)

On-Chip Amplifier



Multiplication register Serial register



Sensors: Intensified technologies

ICCD

- ✓ Much higher gain than EBCCD
- ✓ Spectral range depending on selected photocatode
- ✗ Reducing average contrast
- ✗ Gated intensifier needs pulse amplifier and high voltage power supply
- ✗ Noise factor due to MCP
- ✗ Image intensifier are “lived” items (function of the faceplate illumination)
- ✗ Significant phosphor lag, improves SNR at the expense of DR
- ✗ Saturated even with modest light levels
- ✗ Image intensifier can be damaged by high light overloads

EBCCD

- ✓ Gain means speed
- ✓ Relatively low noise (40 e-/ pixel)
- ✓ No Lag, No distortion
- ✓ Better spatial resolution and SNR at moderate light levels than ICCD
- ✗ DR limited for increased gain
- ✗ Modest low light level detection capability (gain not as high as ICCD)
- ✗ Very expensive (around 16000 \$)

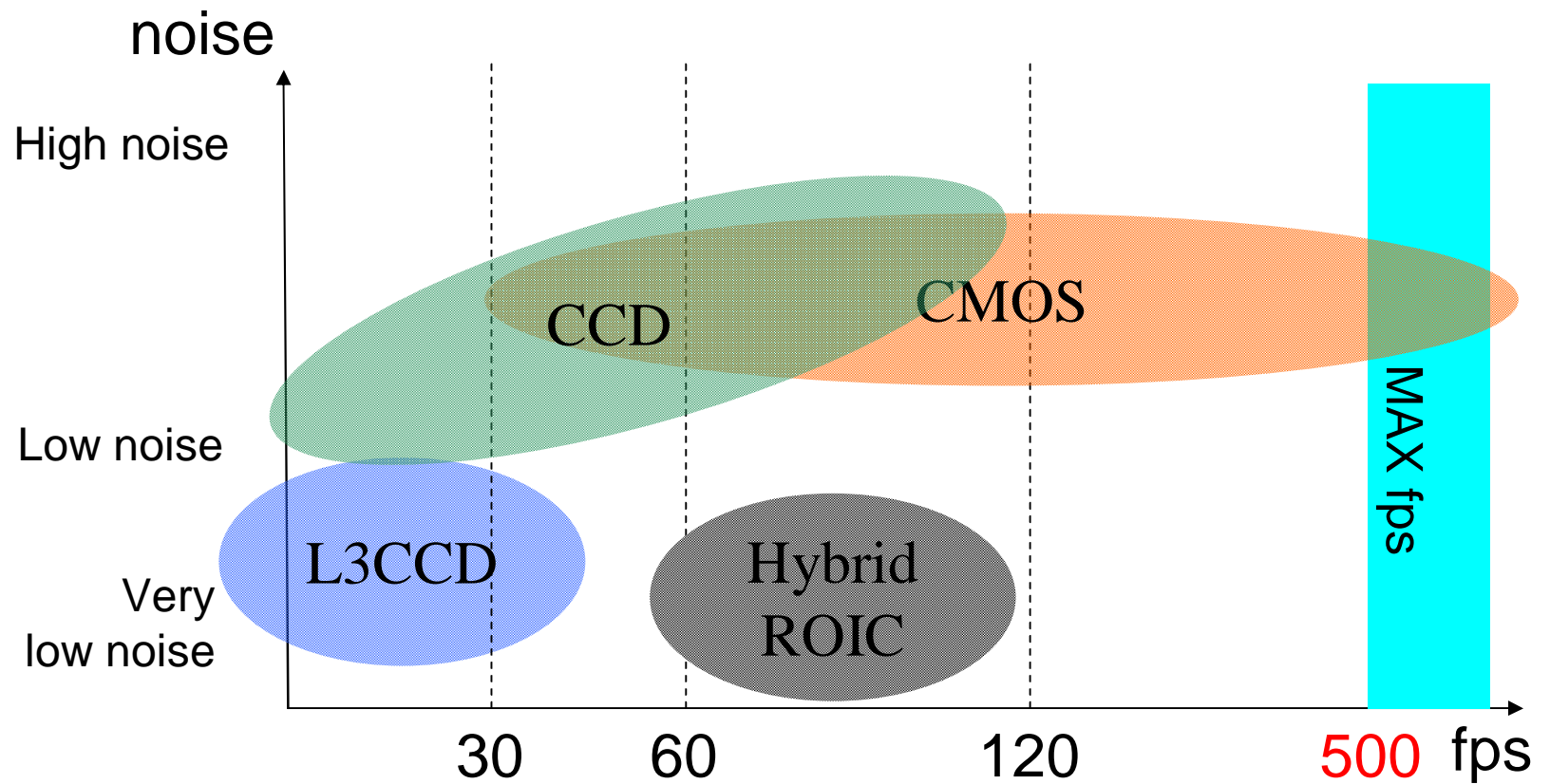
LLLCCD

- ✓ CCD working at very different light conditions without image intensifier (three different modes)
- ✓ No risk of hardware damage due to overexposure
- ✓ Spatial resolution is the same as for an standard CCD and not reduced by a photocathode or MCP
- ✓ Price not so high (4,500 € for front illuminated)
- ✓ Higher SNR than ICCDs and CCDs (at low light levels)
- ✗ High voltage clock (more electronics involved)
- ✗ Degradation of QE in High Gain Mode
- ✗ Dark current electrons are amplified above the readout noise (cooling possibly needed)



Hyperspectral imaging: sensors, algorithms and challenges

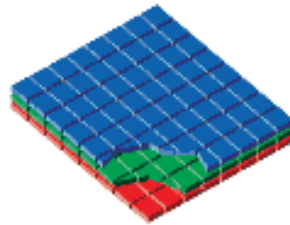
Sensors



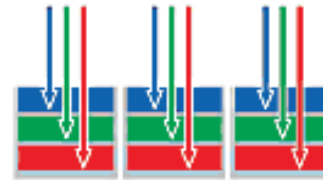
Foveon Image Sensors



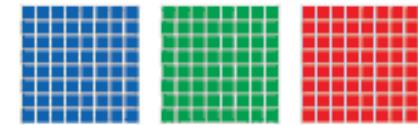
Foveon X3[®] Capture



A Foveon X3 direct image sensor features three separate layers of pixel sensors embedded in silicon.

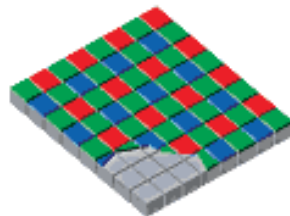


Since silicon absorbs different wavelengths of light at different depths, each layer records a different color. Because the layers are stacked together, all three colors are captured.

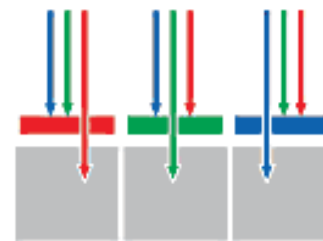


As a result, only Foveon X3 direct image sensors capture red, green, and blue light at every pixel location.

Mosaic Capture



In conventional systems, color filters are applied to a single layer of pixel sensors in a tiled mosaic pattern.



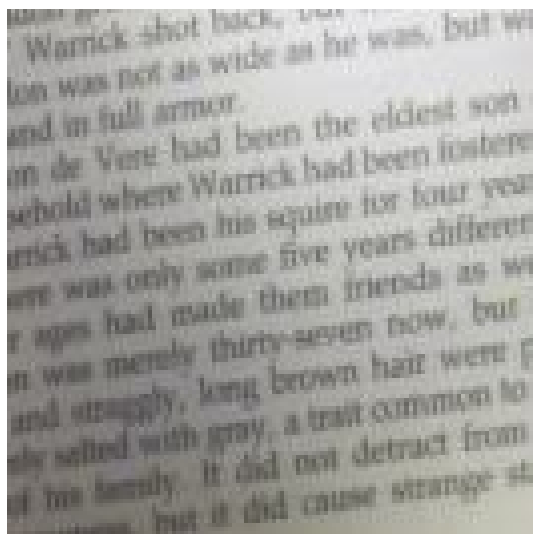
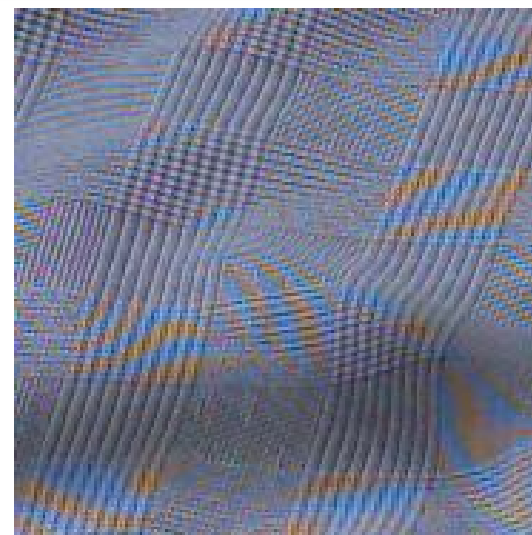
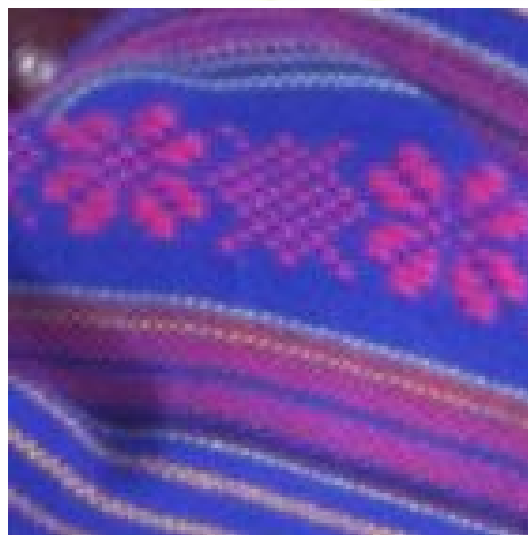
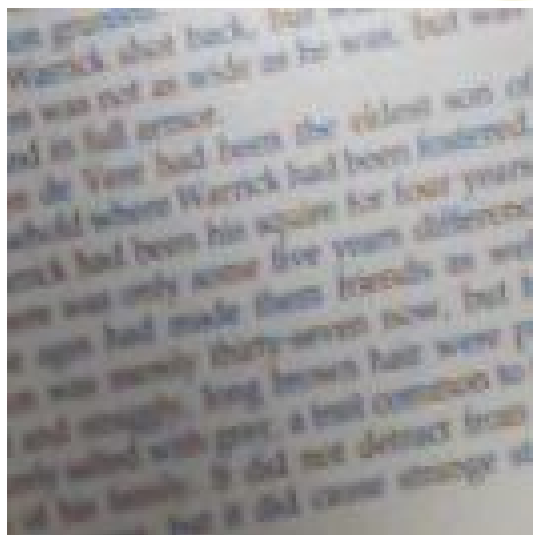
The filters let only one wavelength of light—red, green, or blue—pass through to any given pixel location, allowing it to record only one color.



As a result, mosaic sensors capture only 25% of the red and blue light, and just 50% of the green.



Foveon Image Sensors: Samples

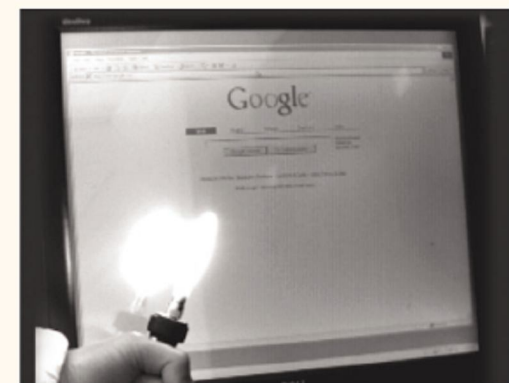
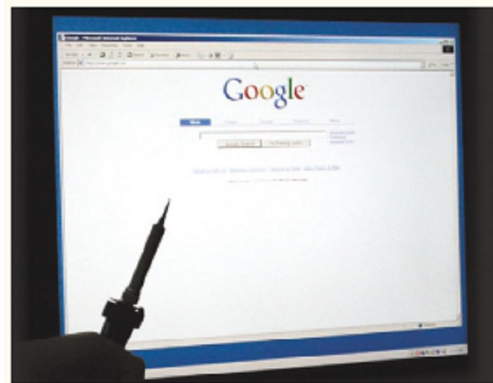
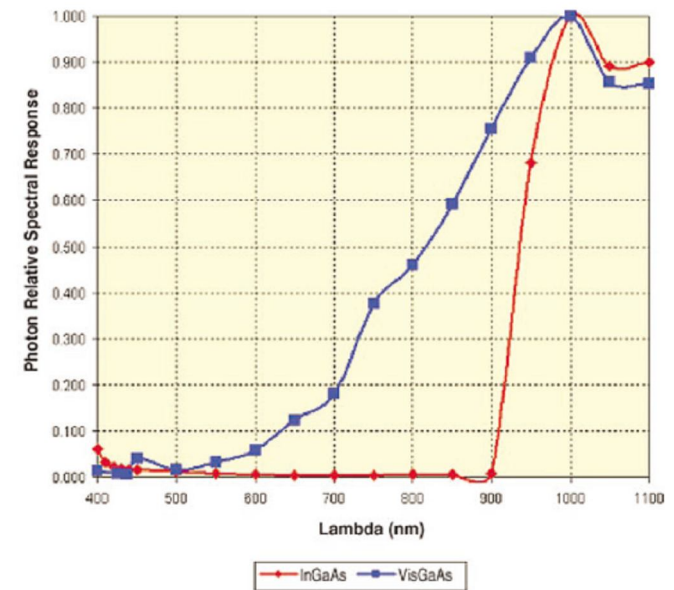


VISGaAs sensors: Indigo and FLIR



InGaAs: 0.9 – 1.7 μm
VisGaAs: 0.4 – 1.7 μm

InGaAs and VisGaAs Photon Relative Spectral Response



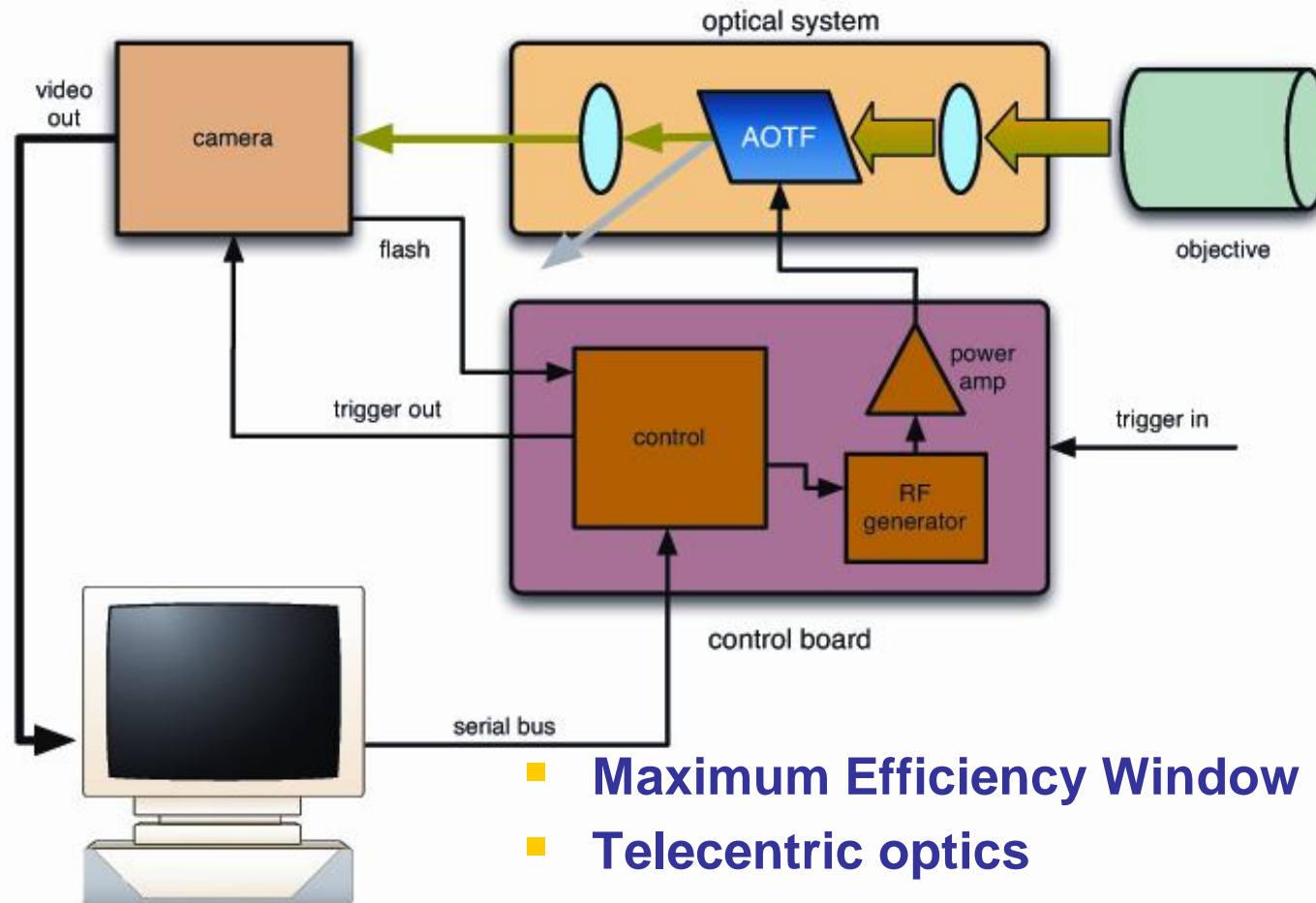
Hyperspectral imaging: sensors, algorithms and challenges

SmartSpectra project

- Develop a **Multispectral System** that can be used on a wide range of commercial and industrial applications.
- Camera characteristics:
 - **Cost-effective** sensor for commercial applications
 - Provide up to 6 **electronically configurable spectral bands**
 - Spectral resolution: **5-50 nm**
 - Spatial resolution: **640 x 480**
 - Wide spectrum range: **400-1800nm**



Autonomous Tunable Filter System ATFS



- Maximum Efficiency Window of AOTF
- Telecentric optics
- Dynamic range optimization for each spectral band: Gain, RF power & Texp
- 8 to 12-bit sensor

Hyperspectral imaging: sensors, algorithms and challenges

CONTENTS

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Processing issues

- Hyperspectral sensors generate lots of data
- Is it manageable?
 - How to store them?
 - How to transmit them?
 - How to process them?
- Coregistration
- Comparison among sensors



Processing issues: Preprocessing

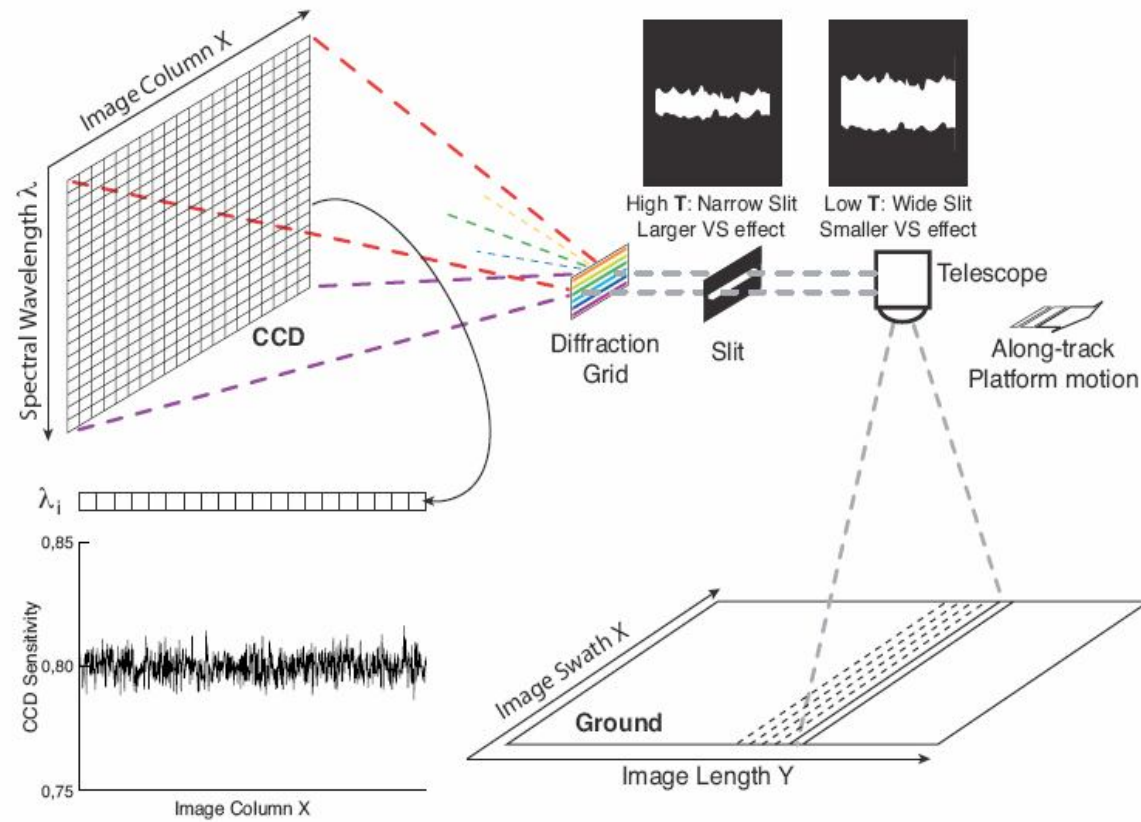


Figure 4.1: Design of a push-broom imaging spectrometer that shows its operation mode and the sources of the coherent spatial noise patterns.(Credit: figure based on an original of Barducci and Pippi (2001))

Processing issues: Preprocessing

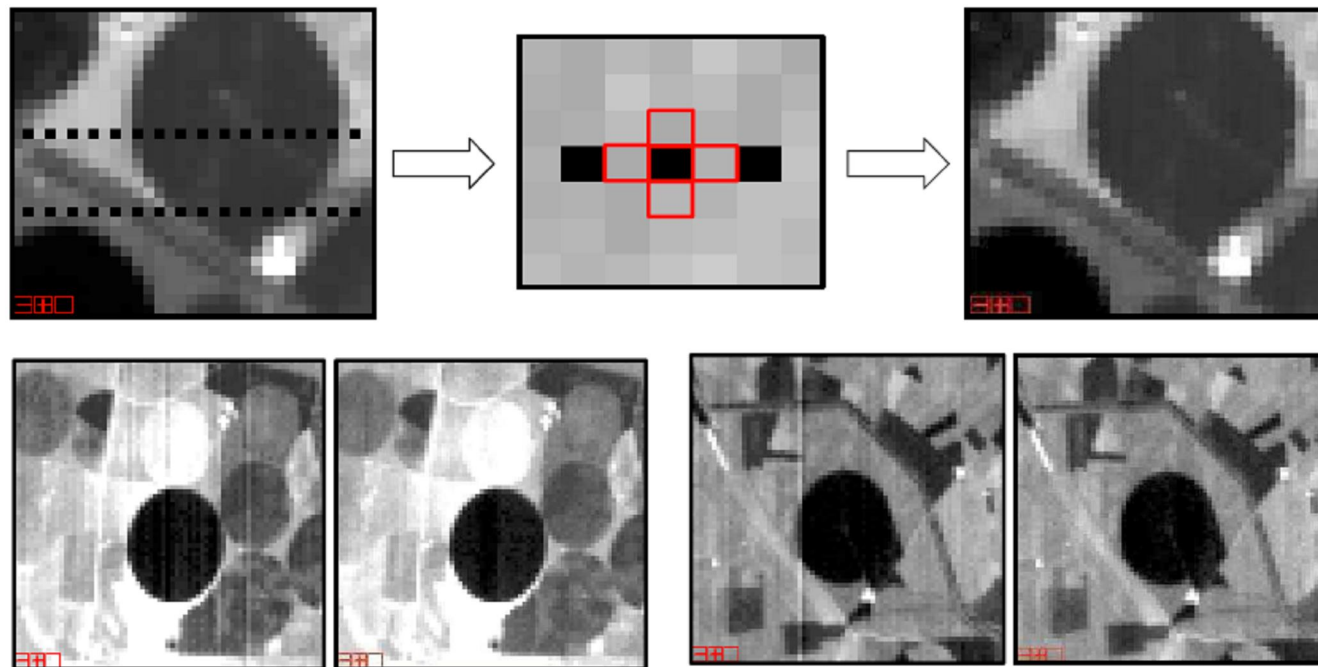
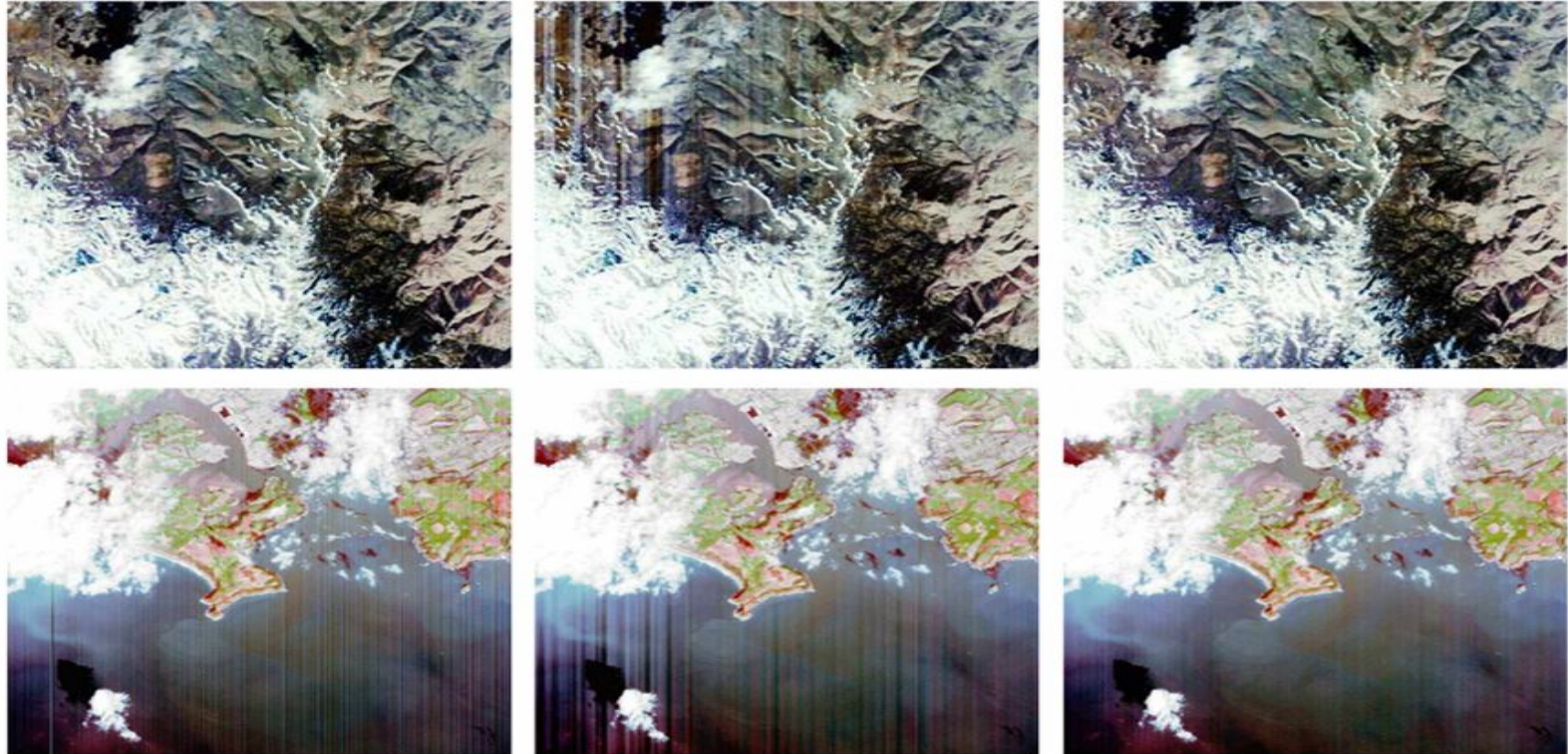


Figure 4.2: Illustration of the correction of the drop-out errors based on the four-connected neighbors (*top*) and the vertical striping (*bottom*). Credits: Garcia and Moreno (2004).

Processing issues: Preprocessing



Processing issues: Band selection

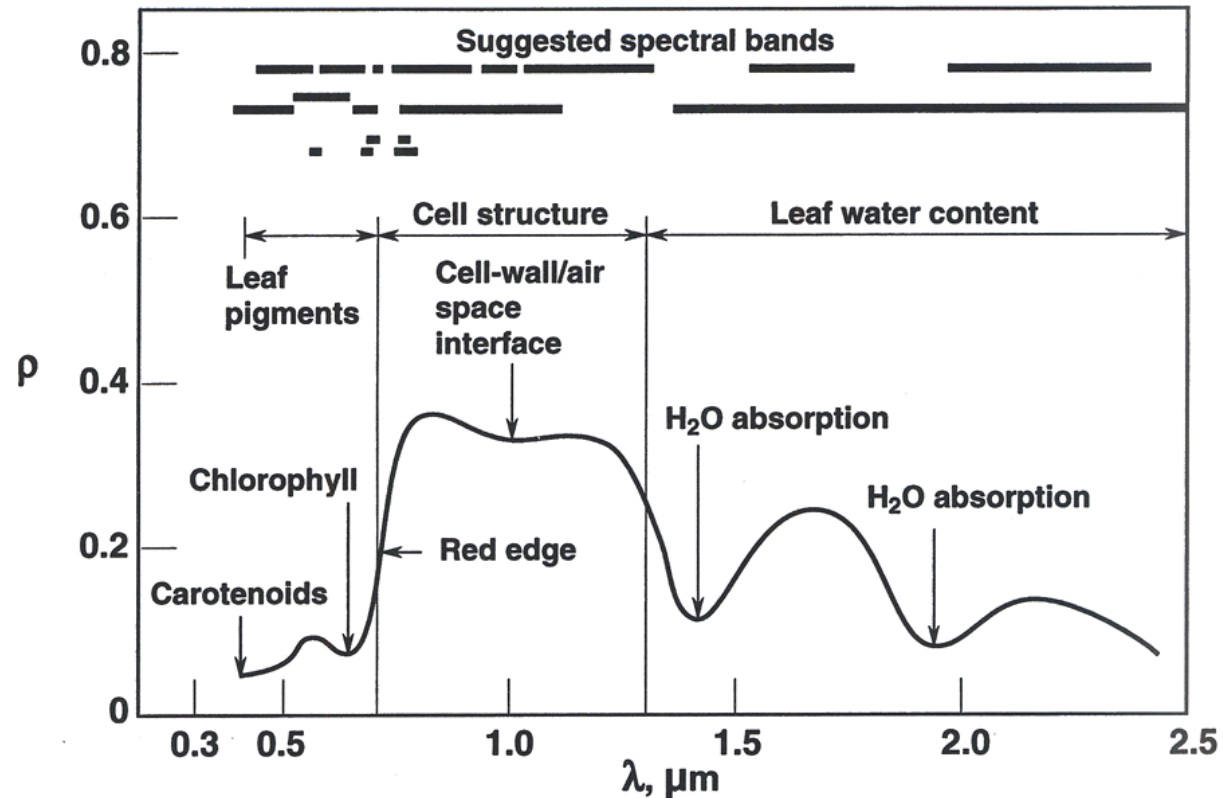
- A priori knowledge
- Information theory



Processing issues: Band selection

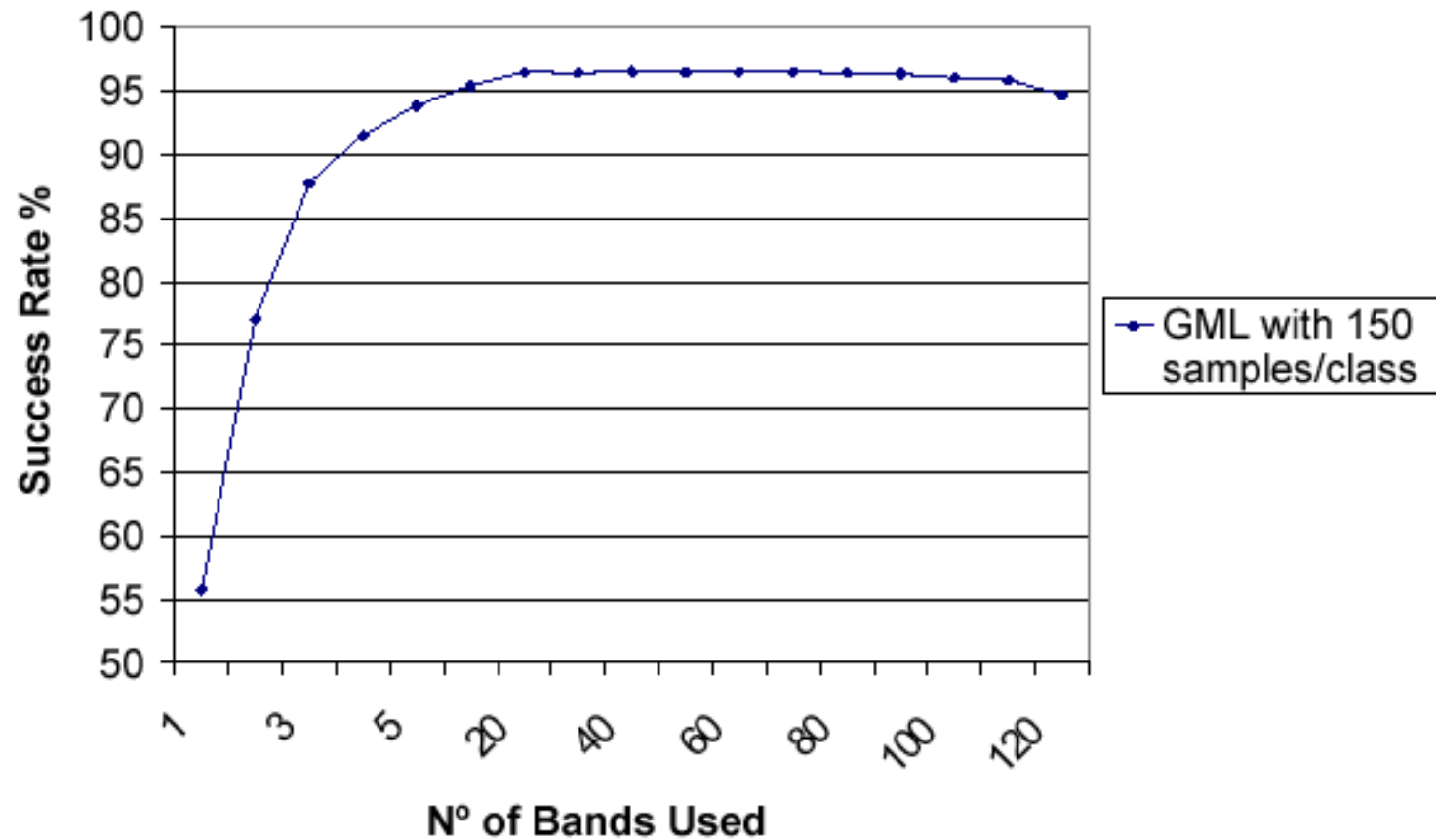
Land surface classification with hyperspectral data

- System: Analysis of HyMap data for band selection
- Spectral Bands: 6 significant wavelengths (6 class problem) 500, 670, 740, 770, 1980, 2320nm

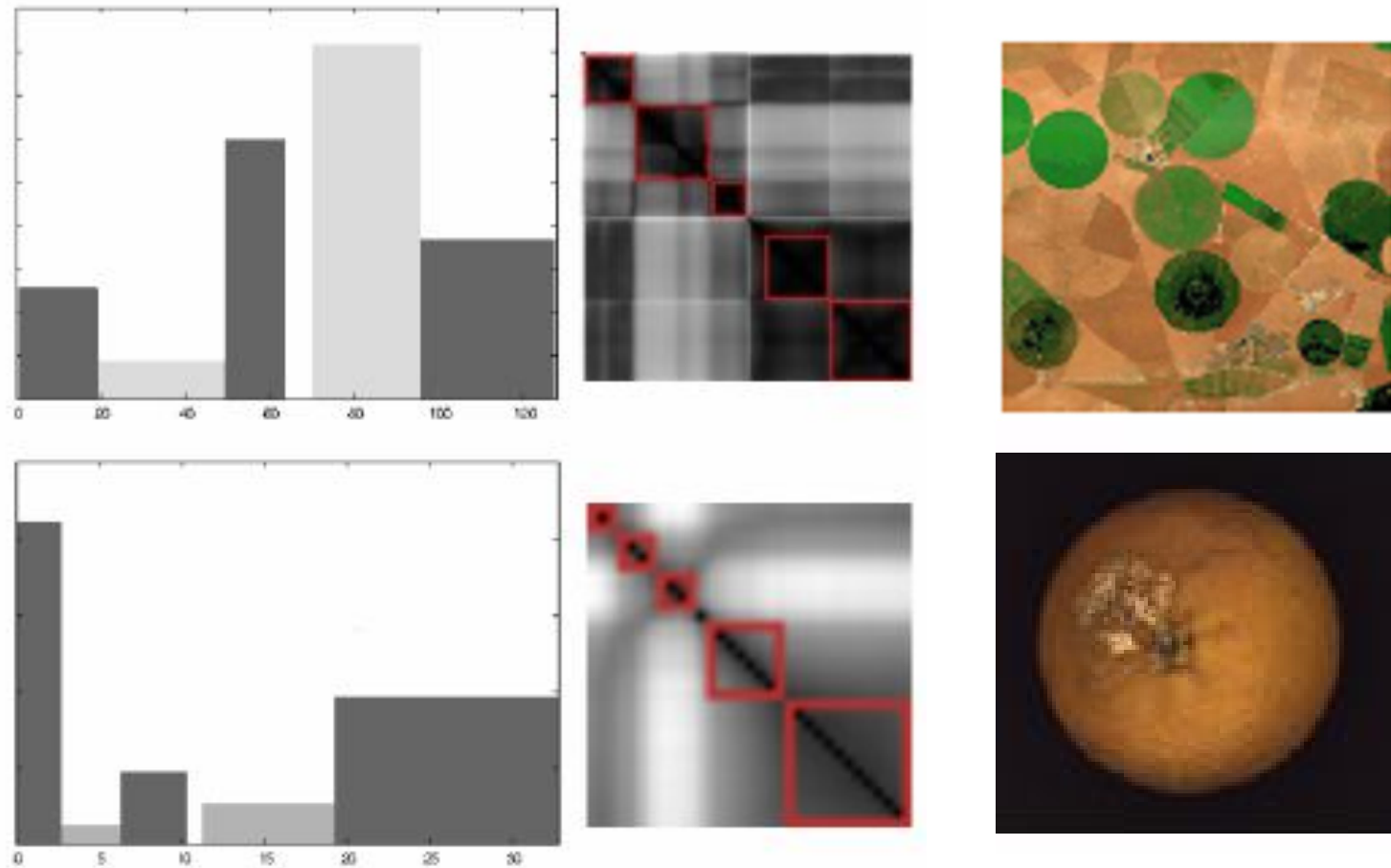


Processing issues: Band selection

Hughes Phenomenon

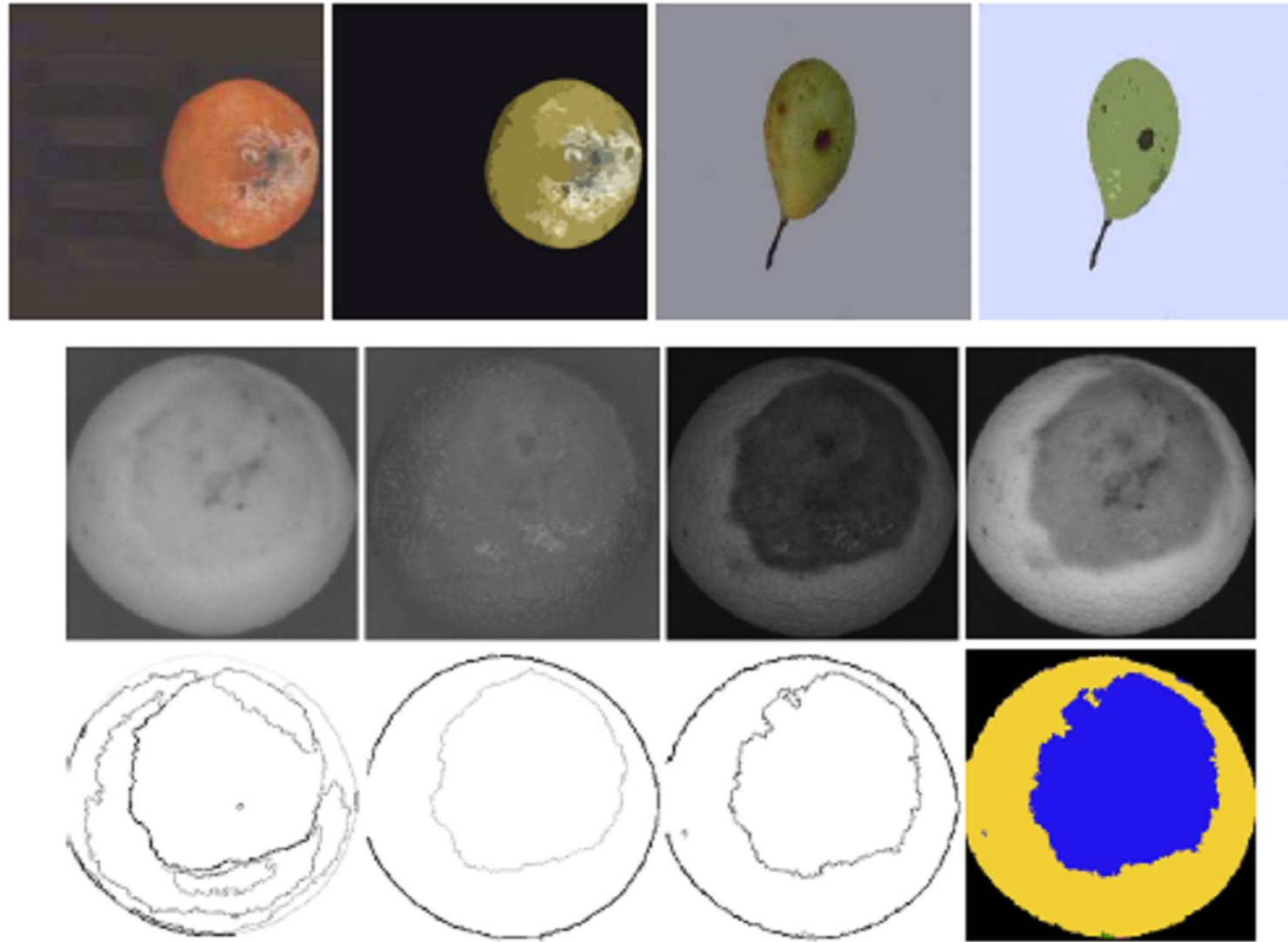


Processing issues: Band aggregation



From Martinez-Uso at altii ICIAR 2008

Processing issues: Segmentation

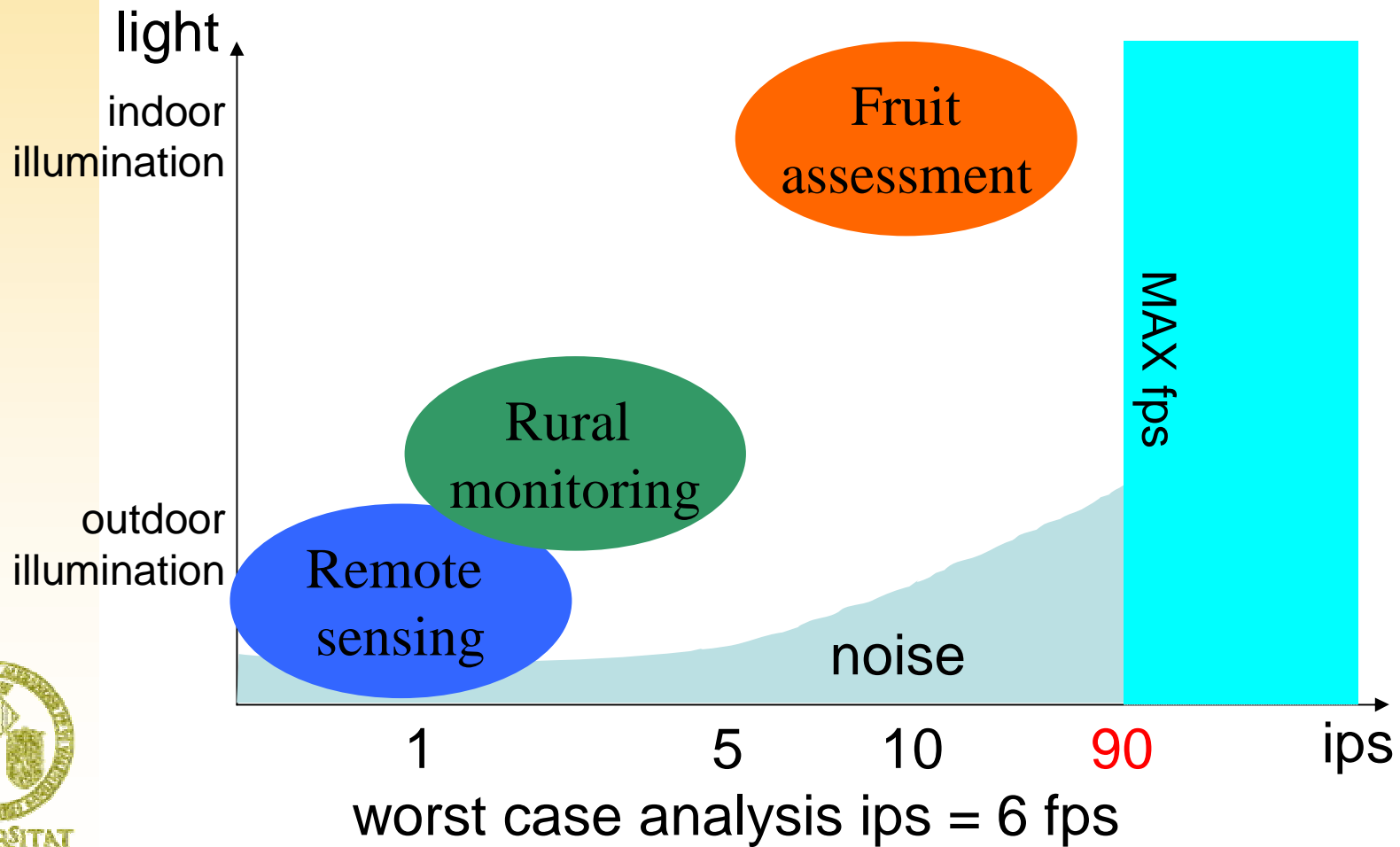


CONTENTS

- Problem definition
- Filtering methods
- Sensors
- Data processing issues
- **Applications**
- Future trends



Applications



Applications: Remote Sensing

MERIS on Envisat



■ MERIS 15 spectral bands

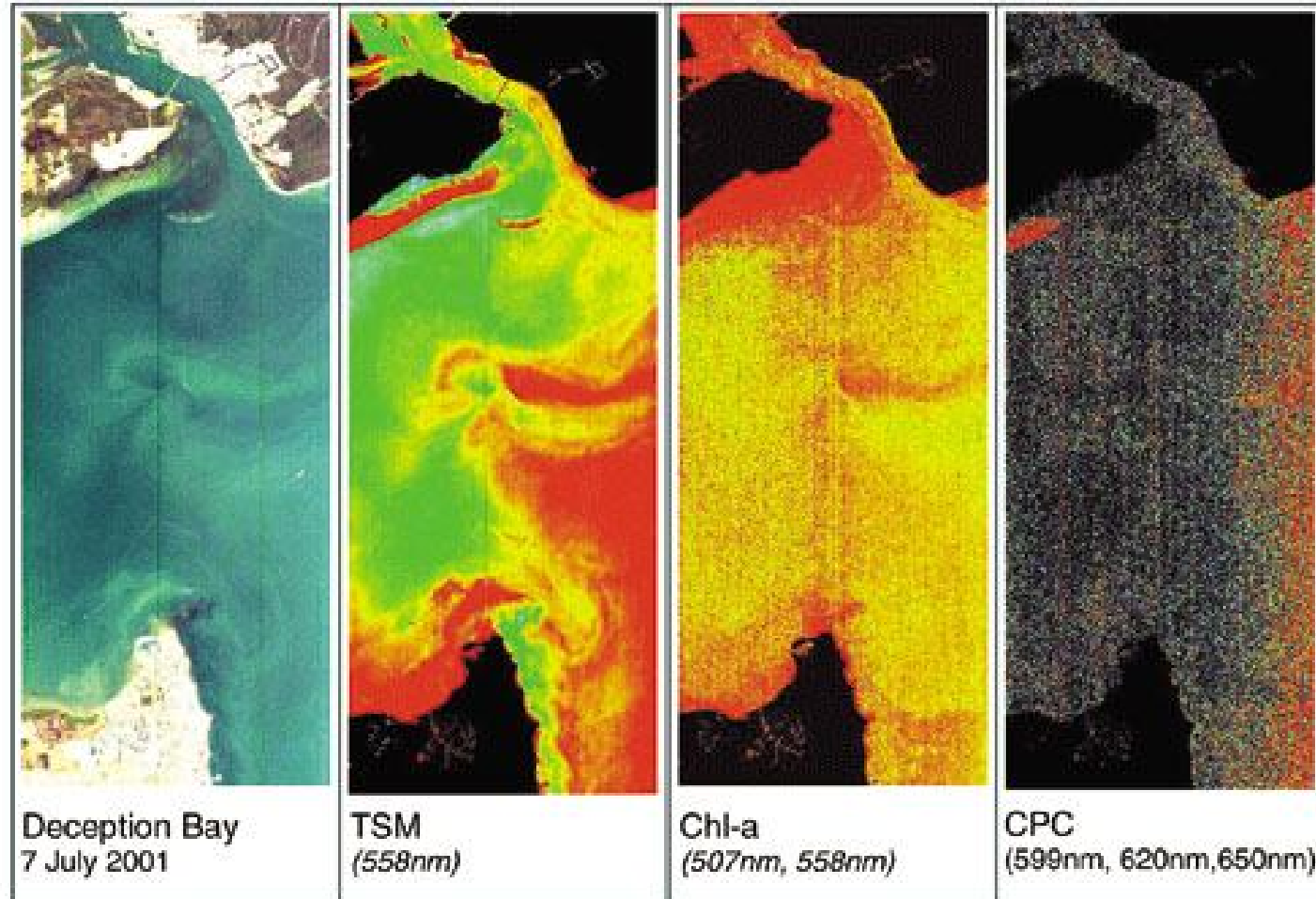
	Band	Band centre (nm)	Bandwidth (nm)	Primary Use
V I S I B L E	1	412.5	10	Yellow substance and detrital pigments
	2	442.5	10	Chlorophyll absorption maximum
	3	490	10	Chlorophyll and other pigments
	4	510	10	Suspended sediment, red tides
	5	560	10	Chlorophyll absorption minimum
	6	620	10	Suspended sediment
	7	665	10	Chlorophyll absorption and fluo. reference
	8	681.25	7.5	Chlorophyll fluorescence peak
	9	708.75	10	Fluo. Reference, atmospheric corrections
I N F R A R E D	10	753.75	7.5	Vegetation, cloud
	11	760.625	3.75	Oxygen absorption R-branch
	12	778.75	15	Atmosphere corrections
	13	865	20	Vegetation, water vapour reference
	14	885	10	Atmosphere corrections
	15	900	10	Water vapour, land



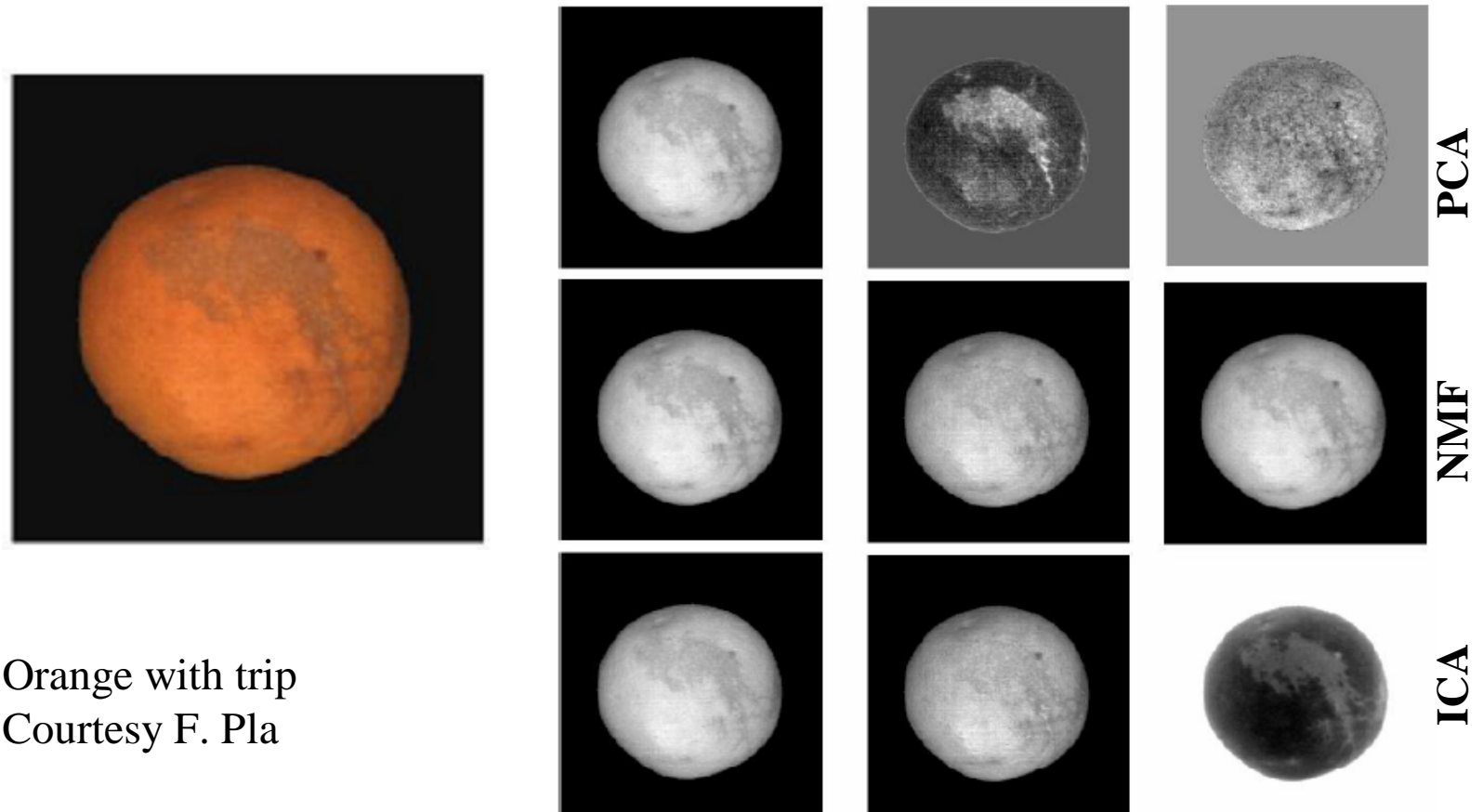
Hyperspectral imaging: sensors, algorithms and challenges

Applications: Remote sensing

Qualitative products in Moreton Bay. TSM = total suspended matter. CPC refers to cyanophycocyanin

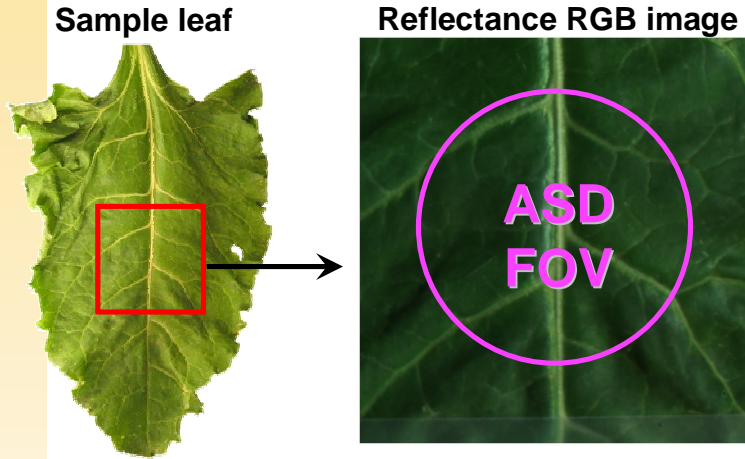


Applications: Classification

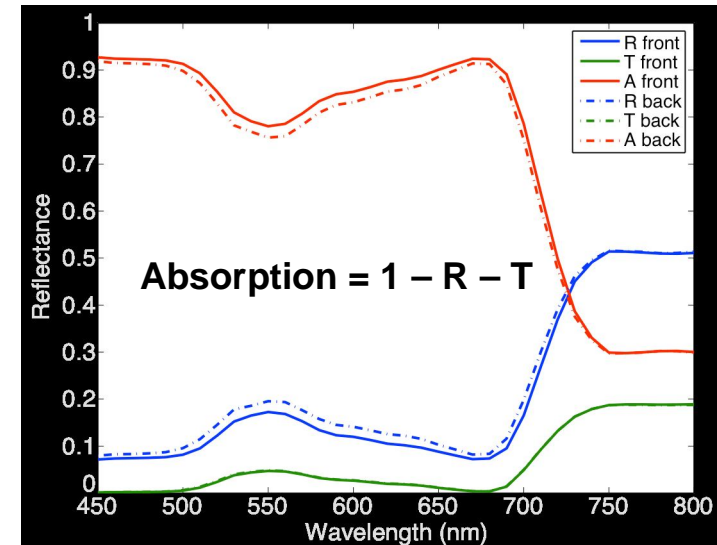
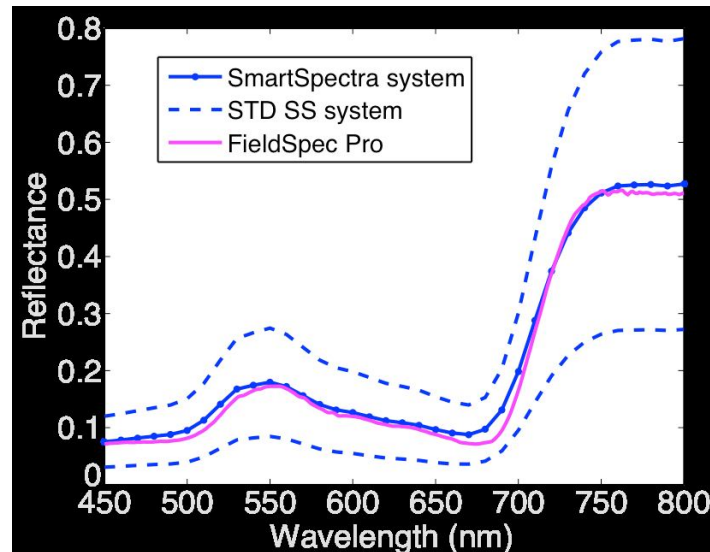


Orange with trip
Courtesy F. Pla

Applications: Light Absorption in Leaves



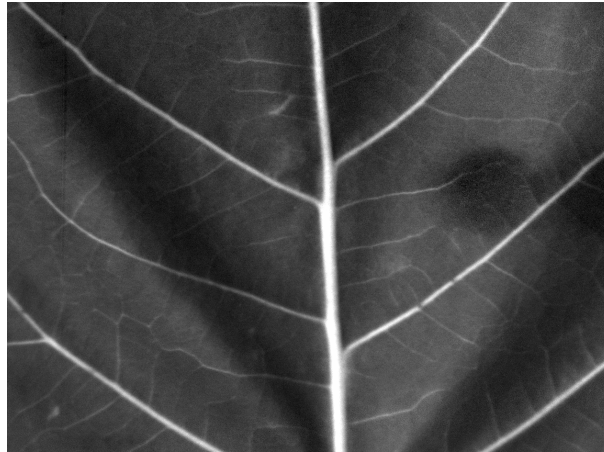
- Two sugar beet leaves were acquired with the FR at the same time that the ATFS
- FR Spectrum compared to the integrated area in the AOTF image
- Absorption estimated from abaxial and adaxial leaf measurements



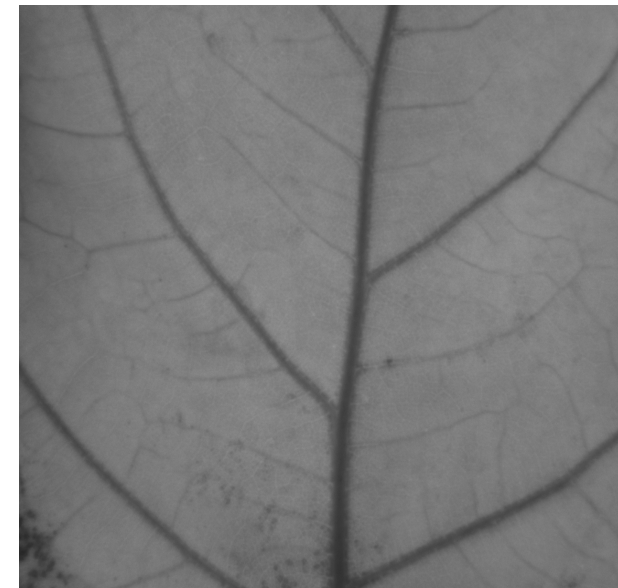
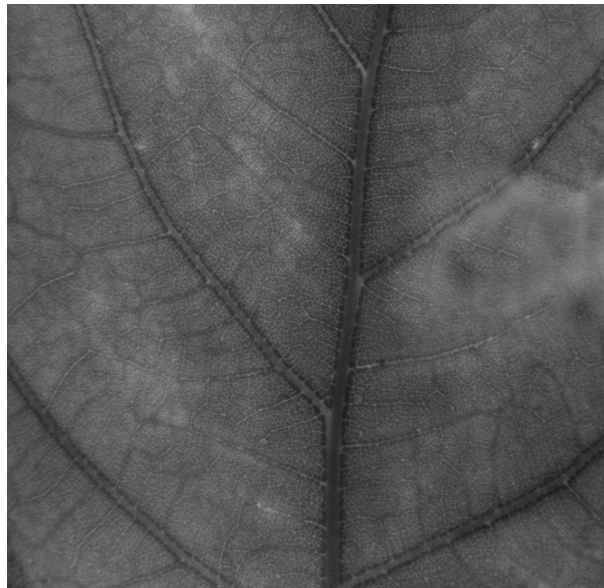
Applications: Light Absorption in Leaves

550 nm (equallized for visualization)

850 nm



Sample A



Sample B

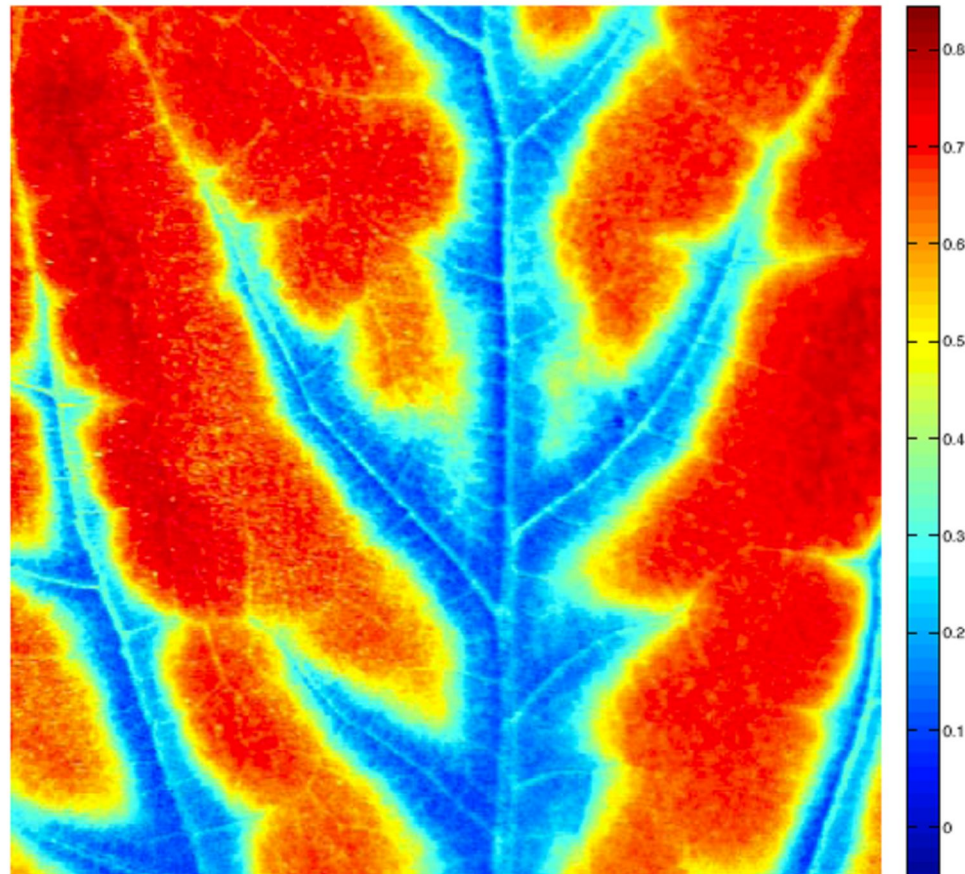


Applications: Light Absorption in Leaves

Potato



Applications: Light Absorption in Leaves



Chlorophyll content estimate for a sunflower (*Helianthus annuus*) leaf, using the NDVI index $(R800-R680)/(R800+R680)$, Courtesy: Joan Vila

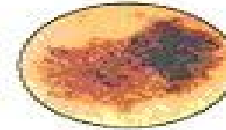
Applications: Dermatology

- Requirements:
 - Spectral range: 440 - 750nm
 - Bandwidth around 10nm
 - Resolution > 500x500 pixels.
 - SNR: > 50dB.

Skin cancer signs

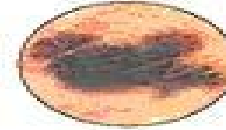
Alphabet test

Checking for skin cancer can be as simple as a-b-c-d:



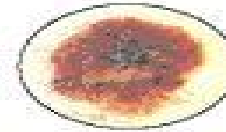
Asymmetry

One-half unlike the other half.



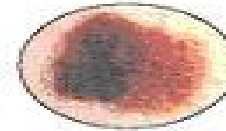
Border irregularity

Scalloped or poorly circumscribed.



Color varied

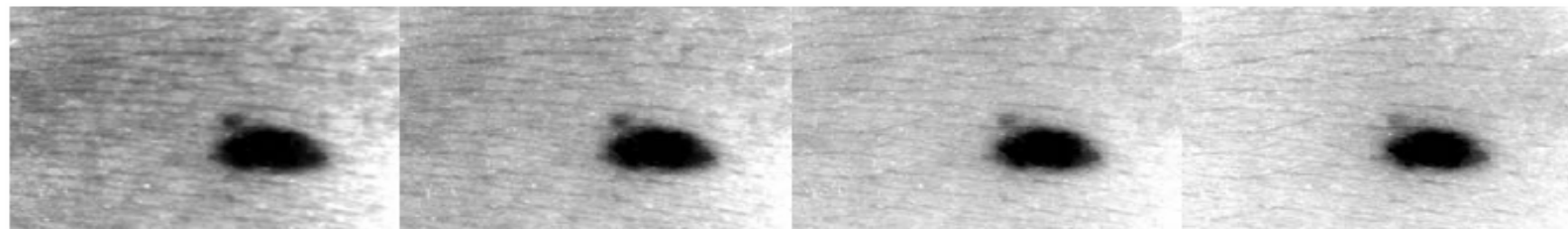
From one area to another.



Diameter

Larger than 6 mm as a rule (diameter of a pencil eraser).

Source: American Cancer Society



440 nm

520 nm

600 nm

680 nm



Hyperspectral imaging: sensors, algorithms and challenges

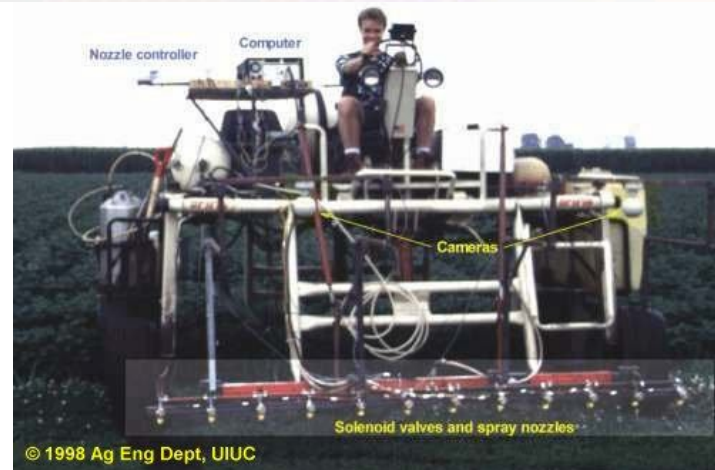
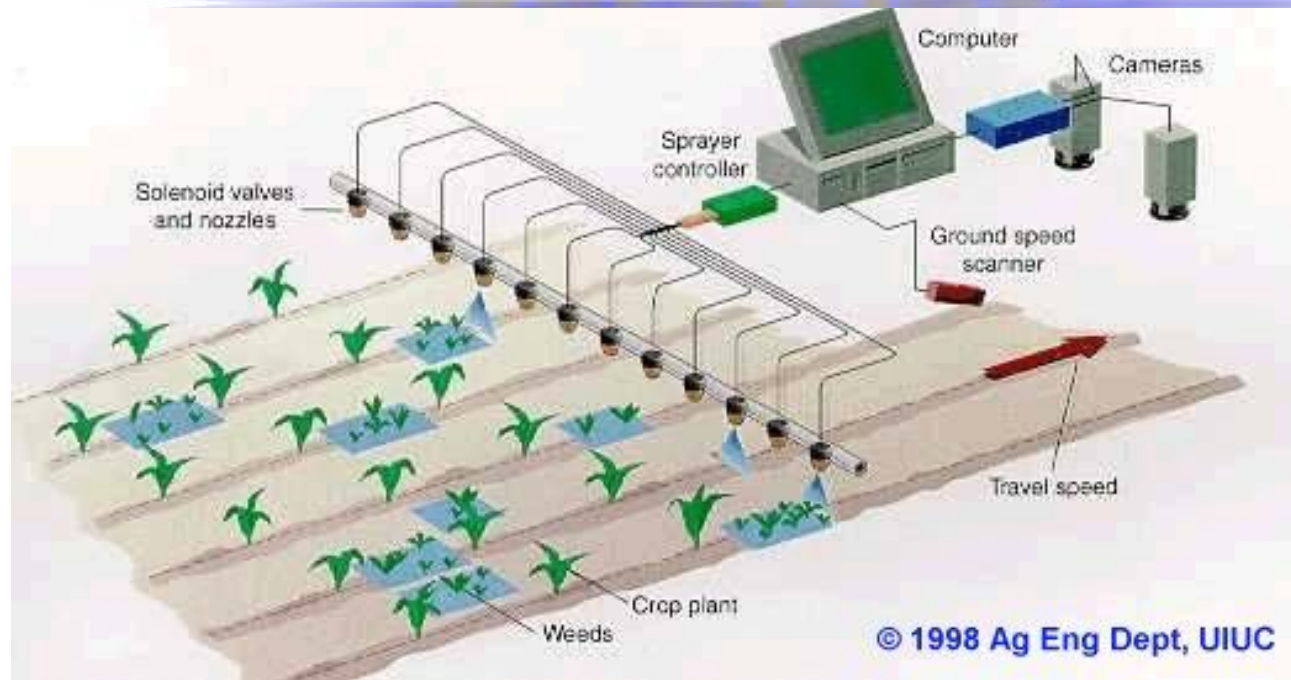
Applications: Food processing automation

Fecal and ingesta detection on poultry carcasses (U.S. Dept. of Agriculture)

- **System:** Three CCD (Monochrome) sensors with filters
- **Spectral Bands:** 3 spectral bands (470-960 nm)
 - 445nm \Rightarrow deoxymyoglobin (DeoxyMb)
 - 485nm \Rightarrow metmyoglobin (MetMb)
 - 560nm \Rightarrow oxymyoglobin (OxyMb)
 - 635nm \Rightarrow sulfmyoglobin (SulfMb)
 - 465, 575, 705 nm \Rightarrow skin tumors
- **Speed:** Real time (90 birds/min. ~ 2im./sec)
- **Implications:** Significant wavelengths required (Inspector)



Applications: Precision agriculture



Hyperspectral imaging: sensors, algorithms and challenges

Future

- Imaging is evolving from few bands to many bands
- Remote sensing pioneered the field, shy industrial penetration
- More sensitive sensors pave the way to extension
- Synergy with different sensors
- New processing algorithms will be required

Monochrome

RGB

Multispectral

Hyperspectral

Ultraspectral

