



Politechnika Łódzka
Instytut Elektroniki

Michał Strzelecki

Institute of Electronics

Medical Imaging

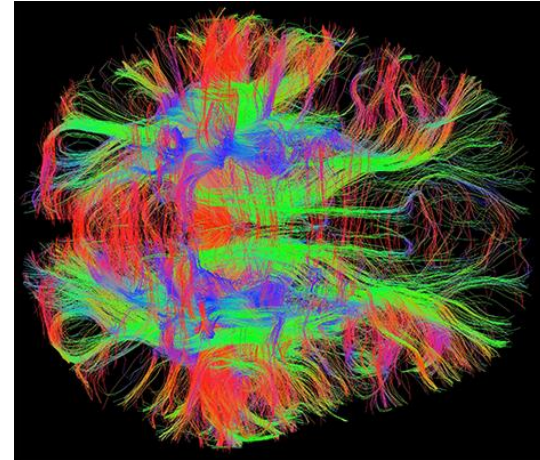
Introduction to Medical Imaging

Biomedical Engineering, 2023



Medical Imaging

- Introduction
- Image quality
- Imaging technology:
 - Radiography
 - Computed Tomography
 - Magnetic Resonance Imaging
 - Nuclear Medicine
 - Endoscopy
 - Thermography – prof. Marcin Janicki, DMCS
 - Ultrasonography
- Processing & analysis of medical images





Learning outcomes

- Written test

By the end of this subject student should be able to:

1. explain the basic principles of the major medical imaging techniques;
2. explain the mode of operation and medical applications of the major medical imaging techniques;
3. understand the advantages and disadvantages of the major imaging techniques, including potential hazards for patients;
4. define clinical applications of medical imaging modalities

5. make use of sample software (or implement simple algorithms) to display and process/analyse biomedical images.

- Lab report





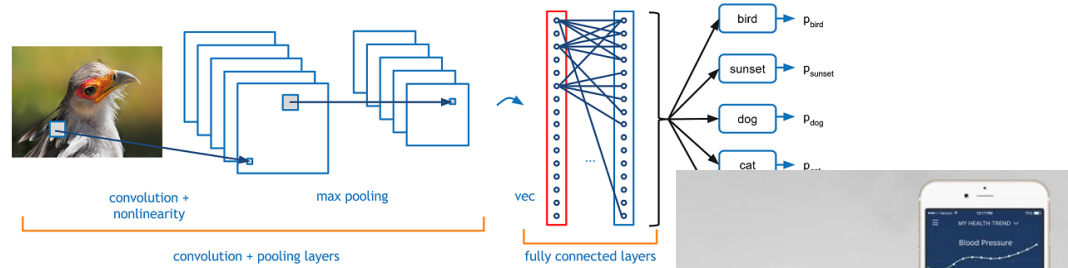
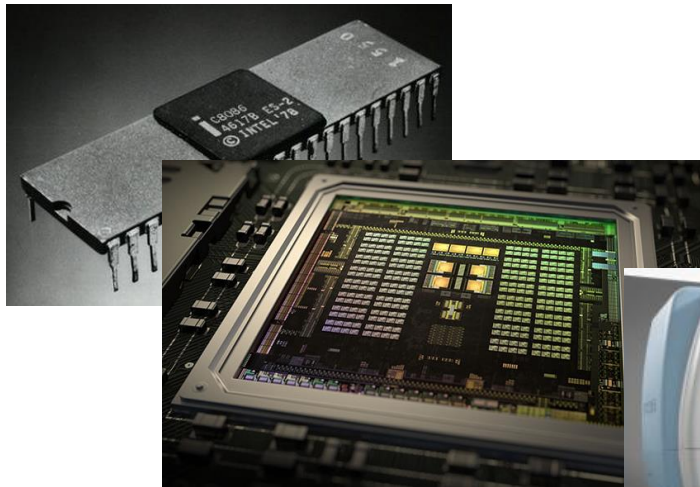
References

- Lecture notes (.pdf files)
- W. R. Hendee, E.R. Ritenour, Medical Imaging Physics, Wiley-Liss, 2002
- C. Guy, D. ffytche, An Introduction to The Principles of Medical Imaging, Imperial College Press, 2008
- R. Tadeusiewicz, J. Smietański, Pozyskiwanie obrazów medycznych oraz ich przetwarzanie, analiza, automatyczne rozpoznawanie i diagnostyczna interpretacja, Wydawnictwo Studenckiego Towarzystwa Naukowego, Kraków 2011 (PL)



Revolution in medical diagnosis

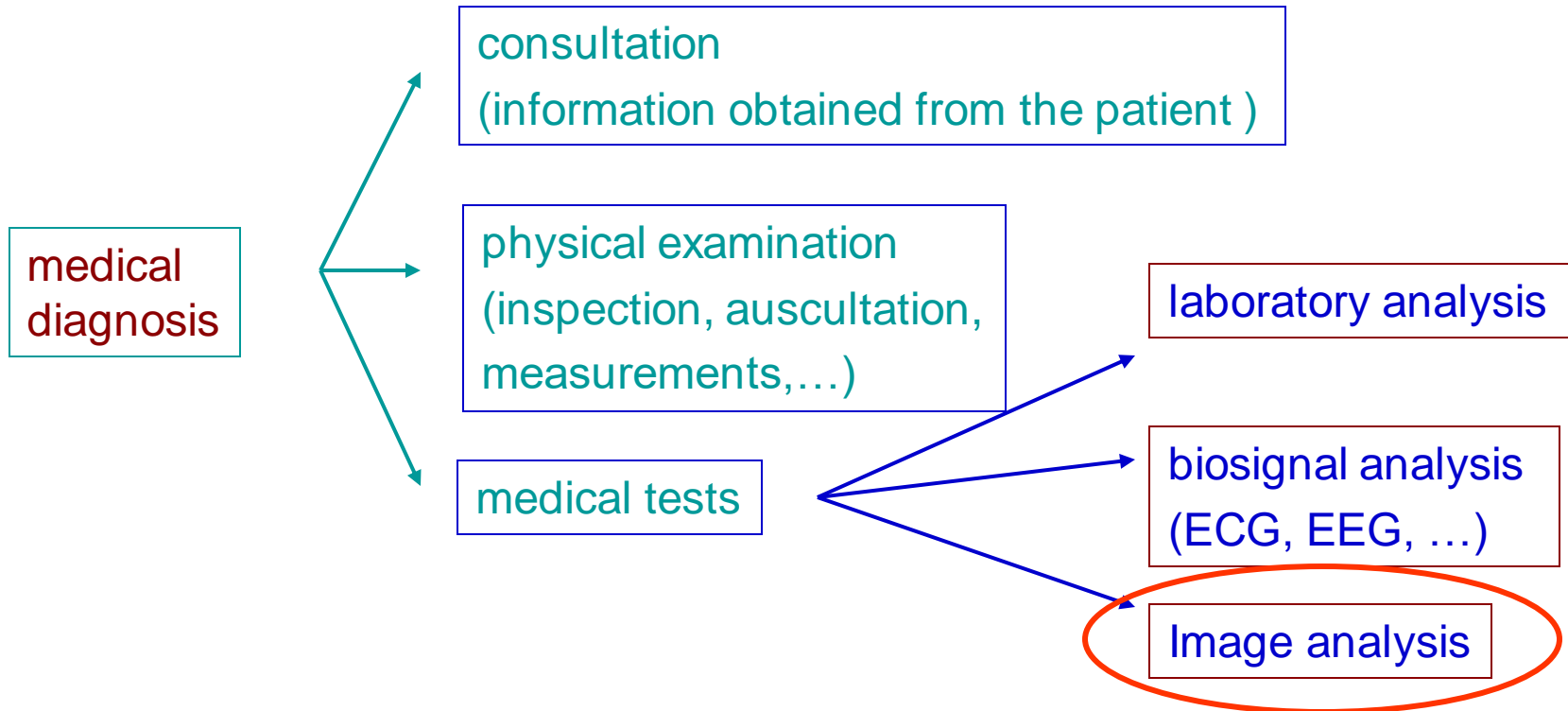
- Advances in microelectronics and computer science (“imaging informatics”)
- Development of tissue imaging technology
- Qualitative diagnosis -> quantitative diagnosis
- “Evidence-based medicine”





Medical Diagnosis

- determination of the identity of a possible **disease or disorder**



Monochrome image as a 2D function

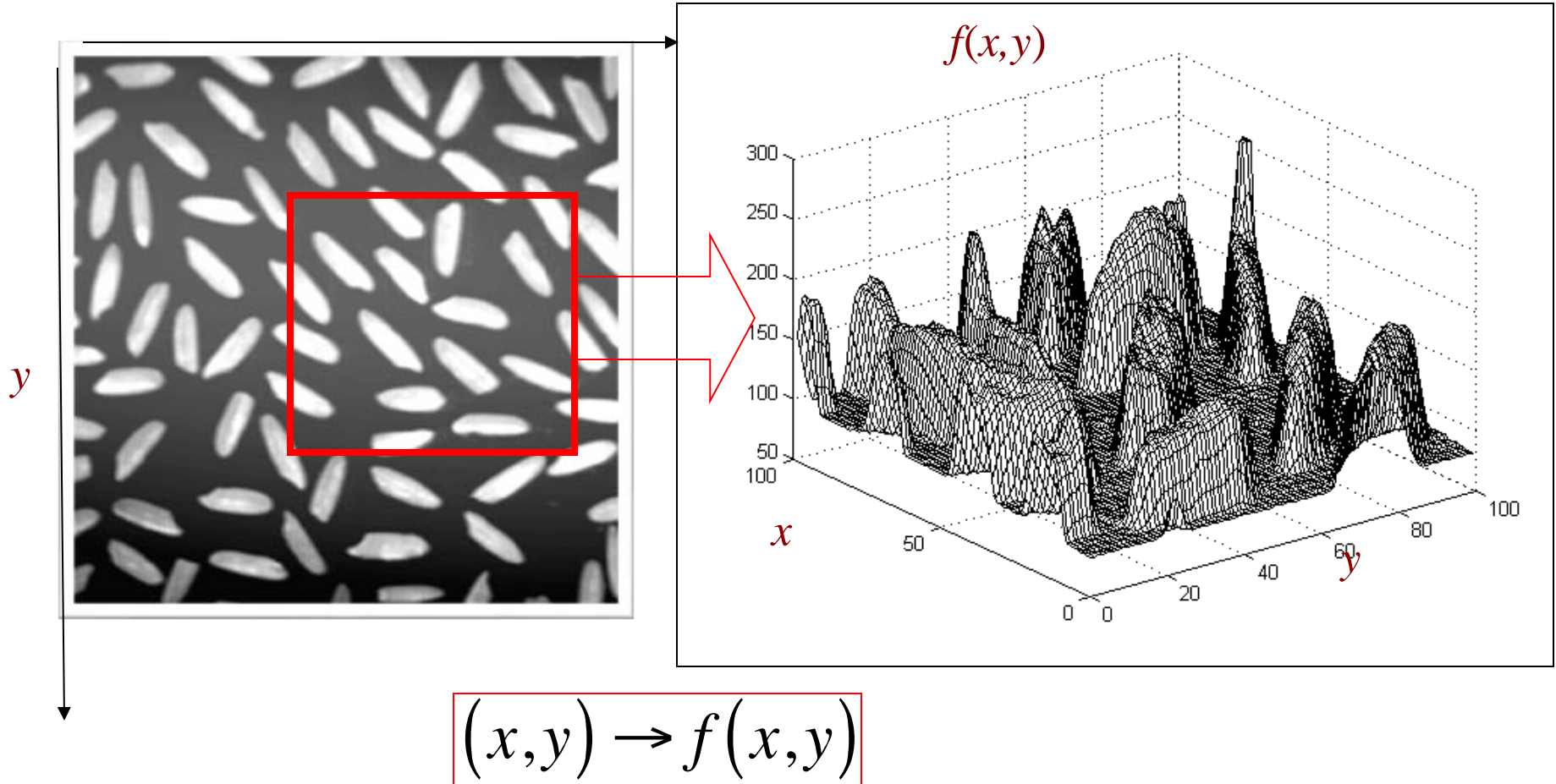
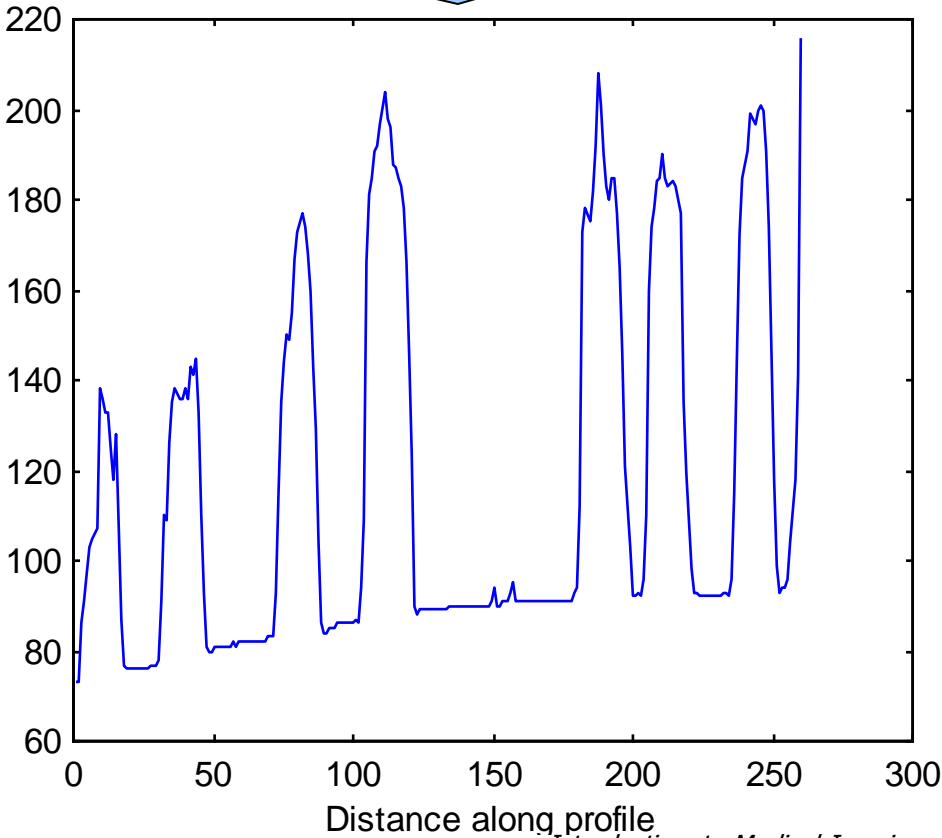
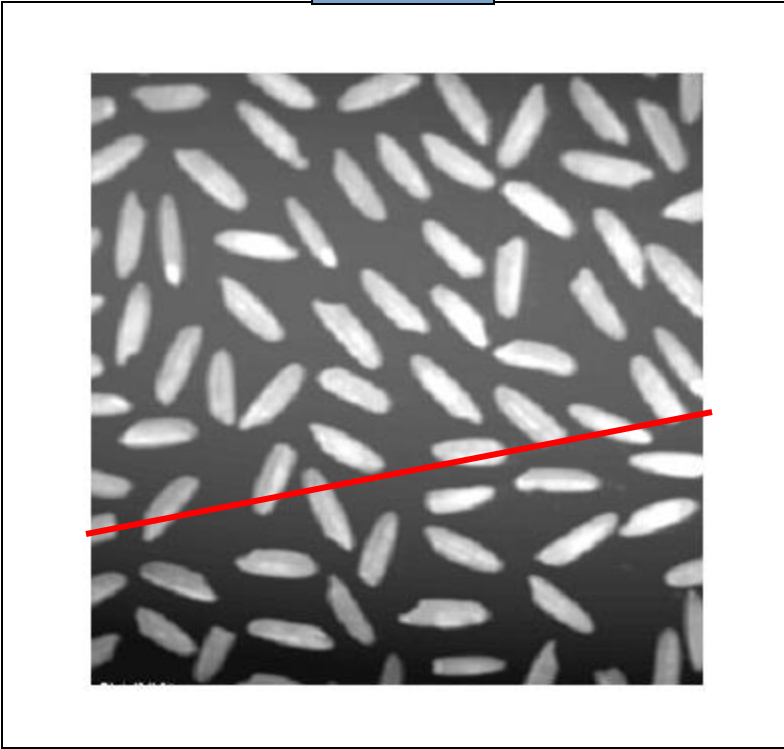
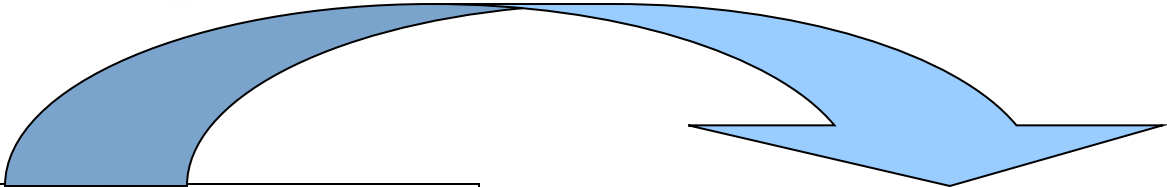




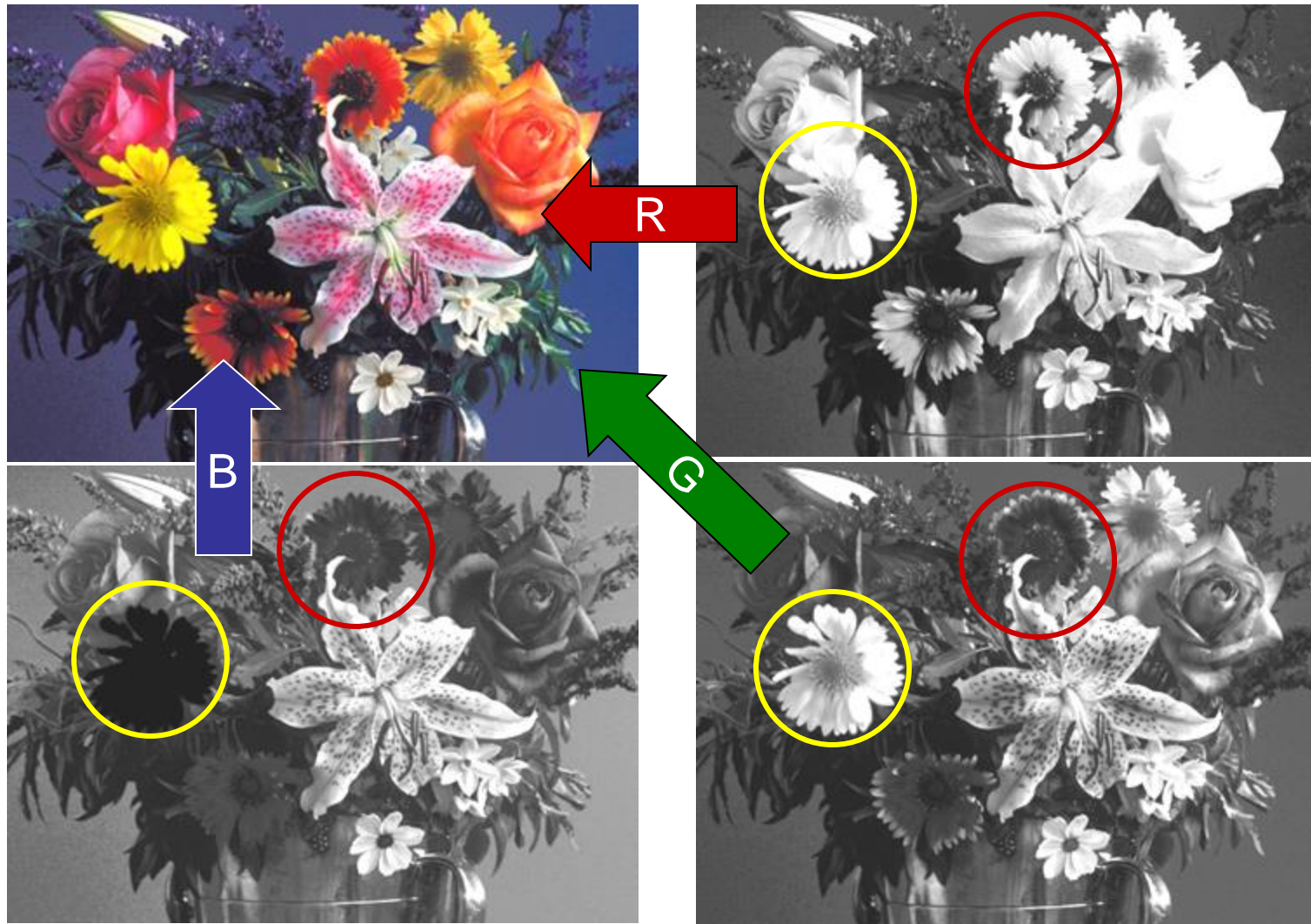
Image brightness profile



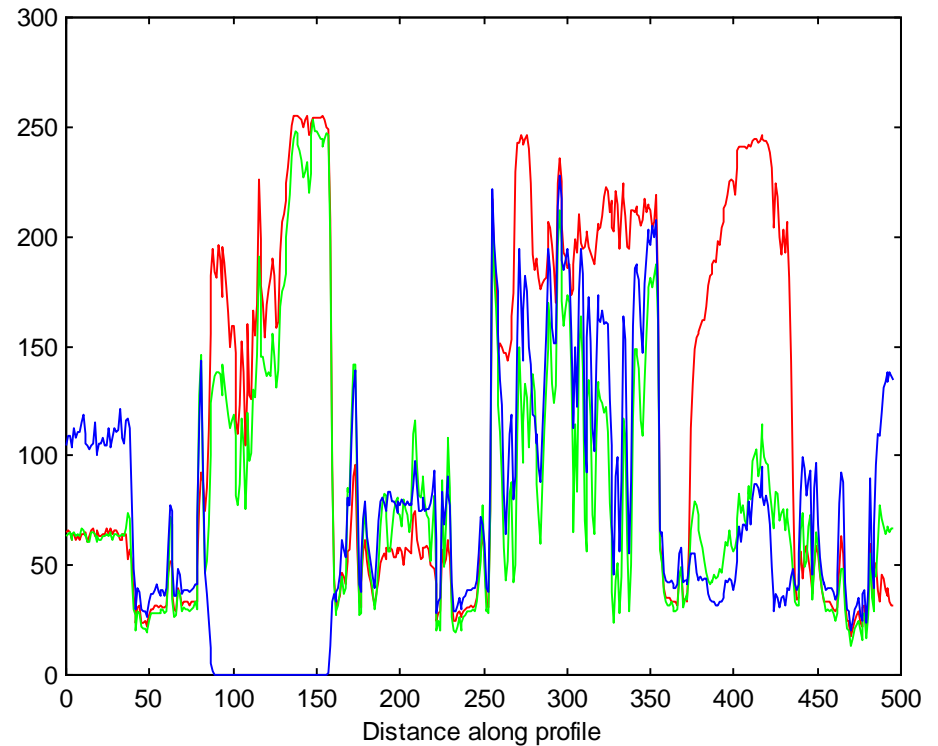
Introduction to Medical Imaging



RGB color image



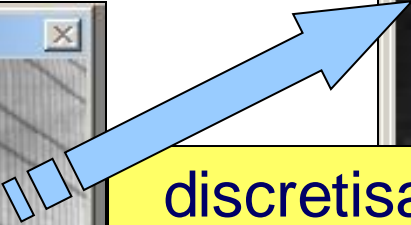
RGB color image color components profiles



RGB image and colour components profiles



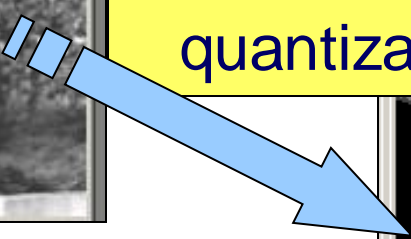
Digital image



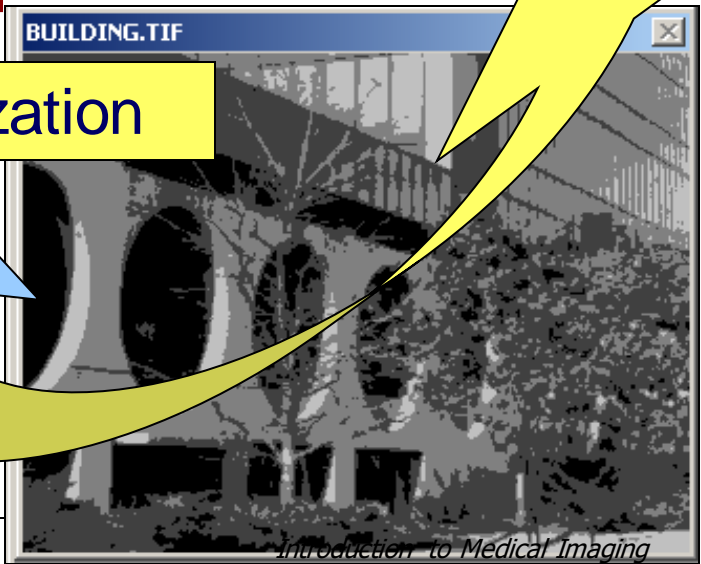
discretisation



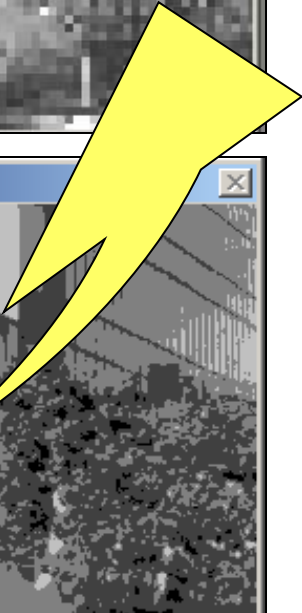
+



quantization



pixel (*picture element*)

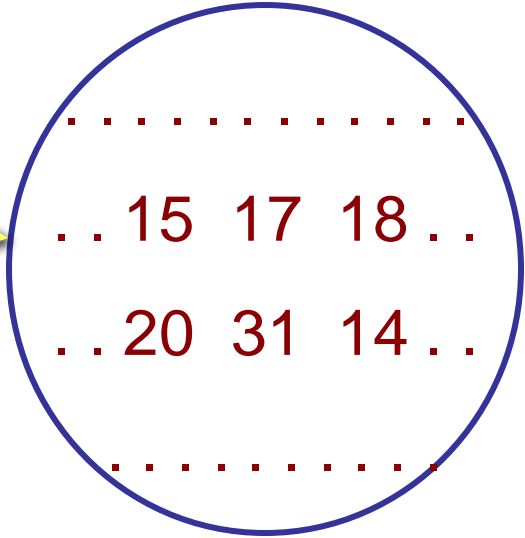
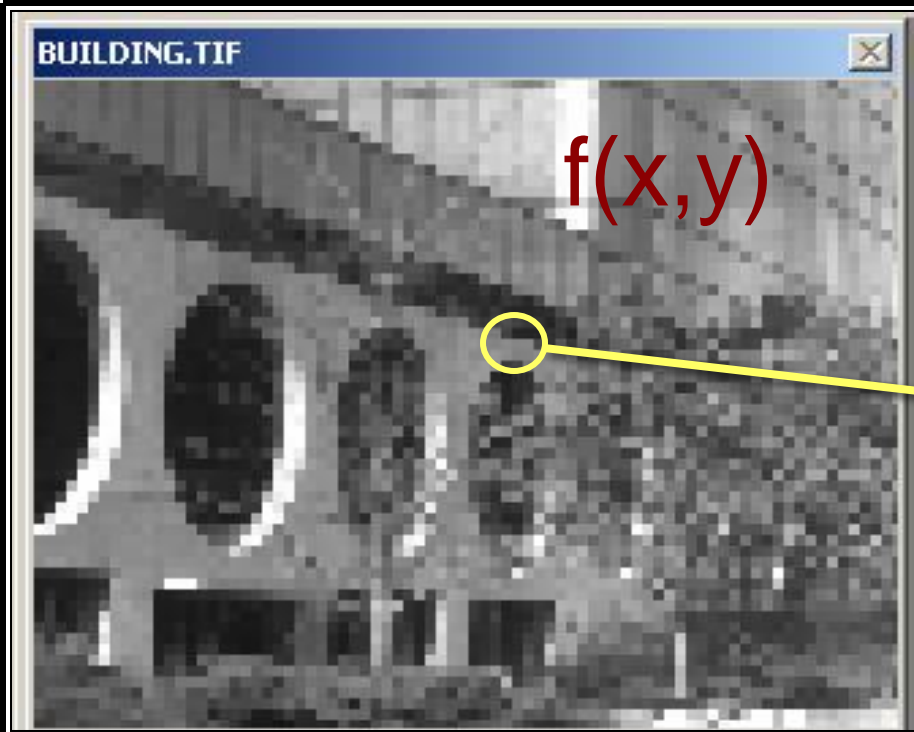




Digital image as pixel array

(0,0)

X



Y



Digital image as pixel array

Digital image $f(x,y)$:

2D array (M,N) ,
ie. of M rows and N columns,
of nonnegative elements assuming
a limited number of levels

$$f(x, y) = 0, 1, \dots, L - 1$$

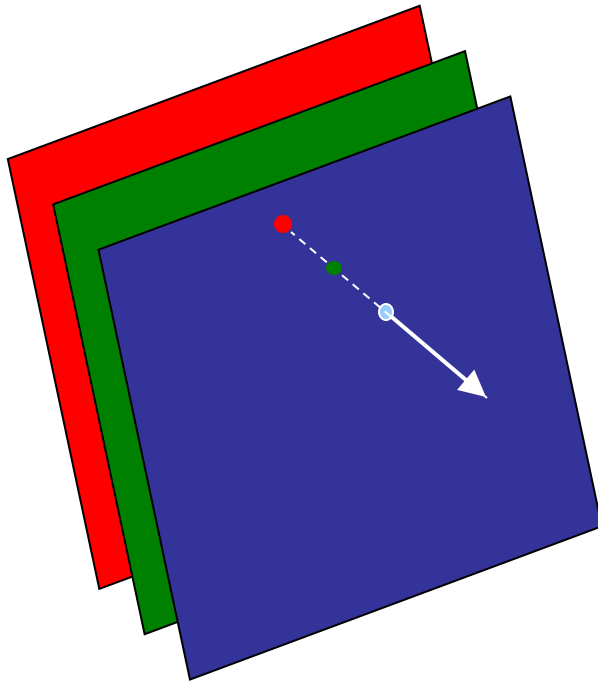
(e.g. $L=256$)

$$x = 0, 1, \dots, N - 1$$

$$y = 0, 1, \dots, M - 1$$

Color digital image?

Color digital RGB image



$$f(x, y) = (f_R, f_G, f_B)$$

If each of the color component is 8 bit coded then 2^{24} different colors can be obtained





Color indexed image

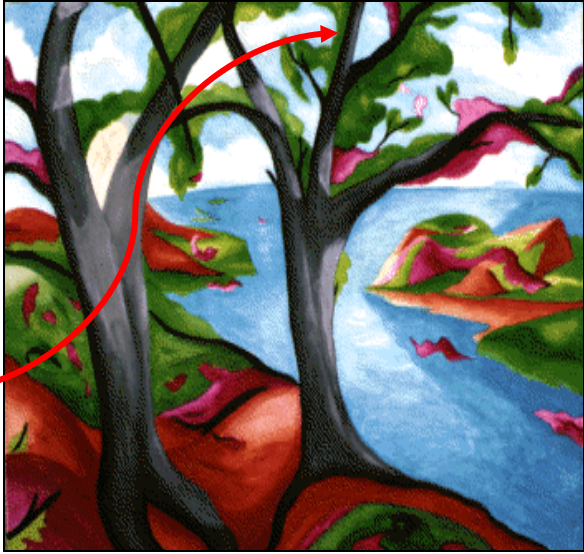
$f=25$



Monochrome image

| | R | G | B |
|-----|----|----|----|
| 0 | | | |
| 1 | | | |
| 2 | | | |
| ... | | | |
| ... | | | |
| ... | | | |
| 25 | 21 | 30 | 99 |
| ... | | | |
| 255 | | | |

Color palette (look-up table)



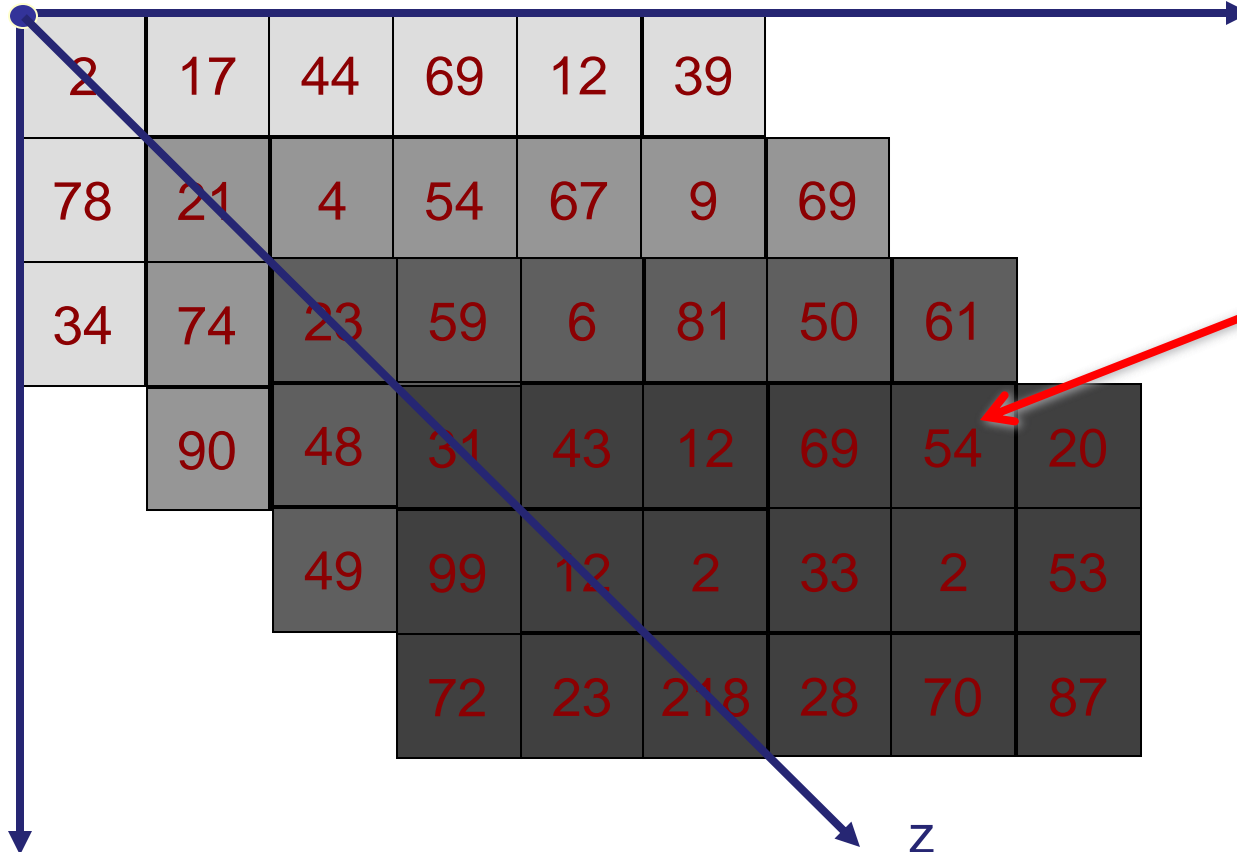
Color image

3D images



(0,0,0)

x



$f(x,y,z)$

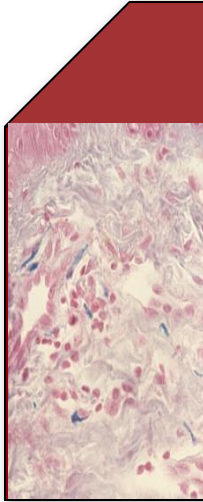
**Voxel
(volume element)**

more dimensions?

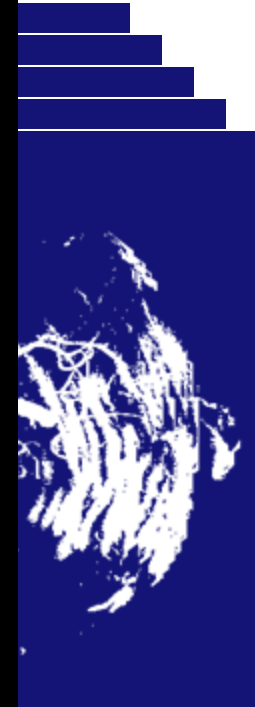
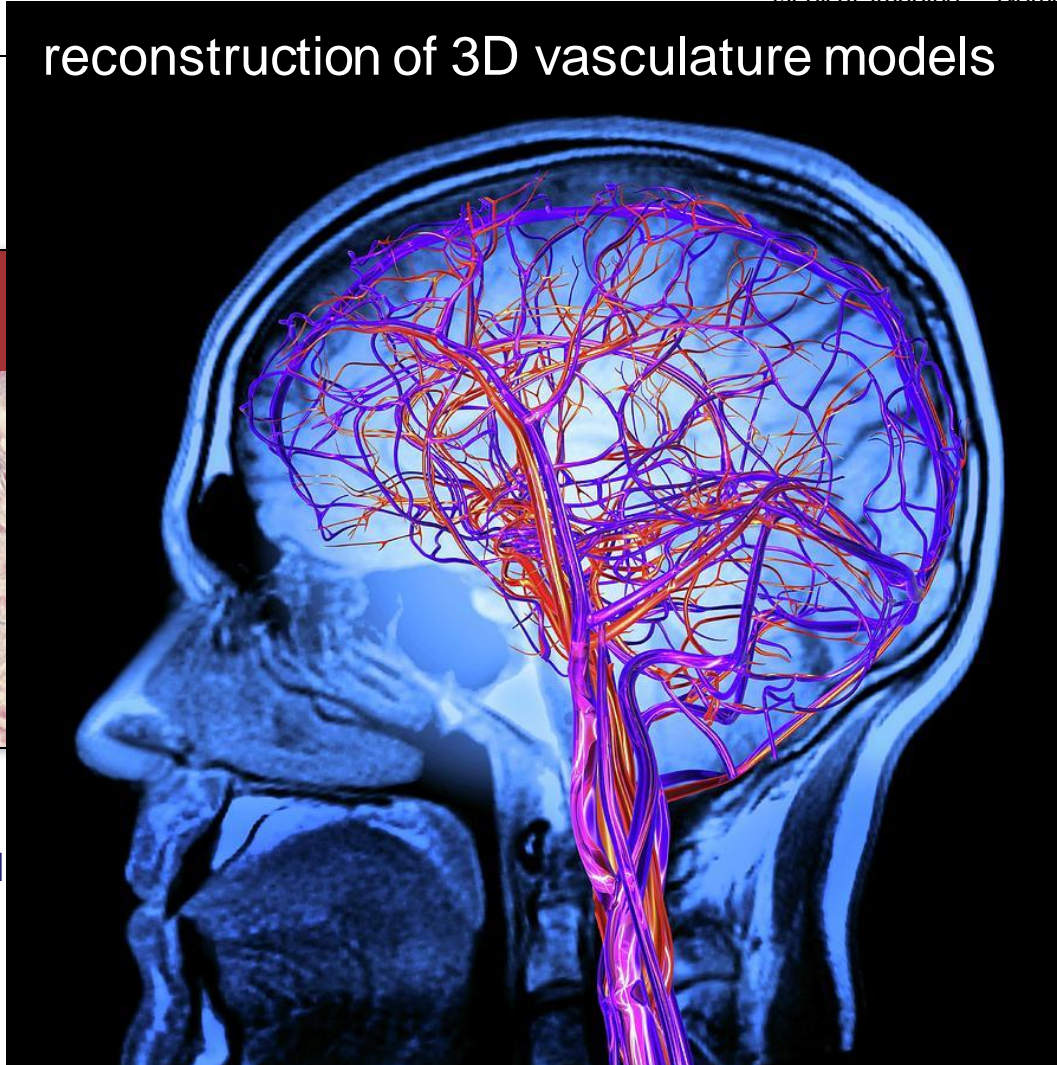


3D images

reconstruction of 3D vasculature models



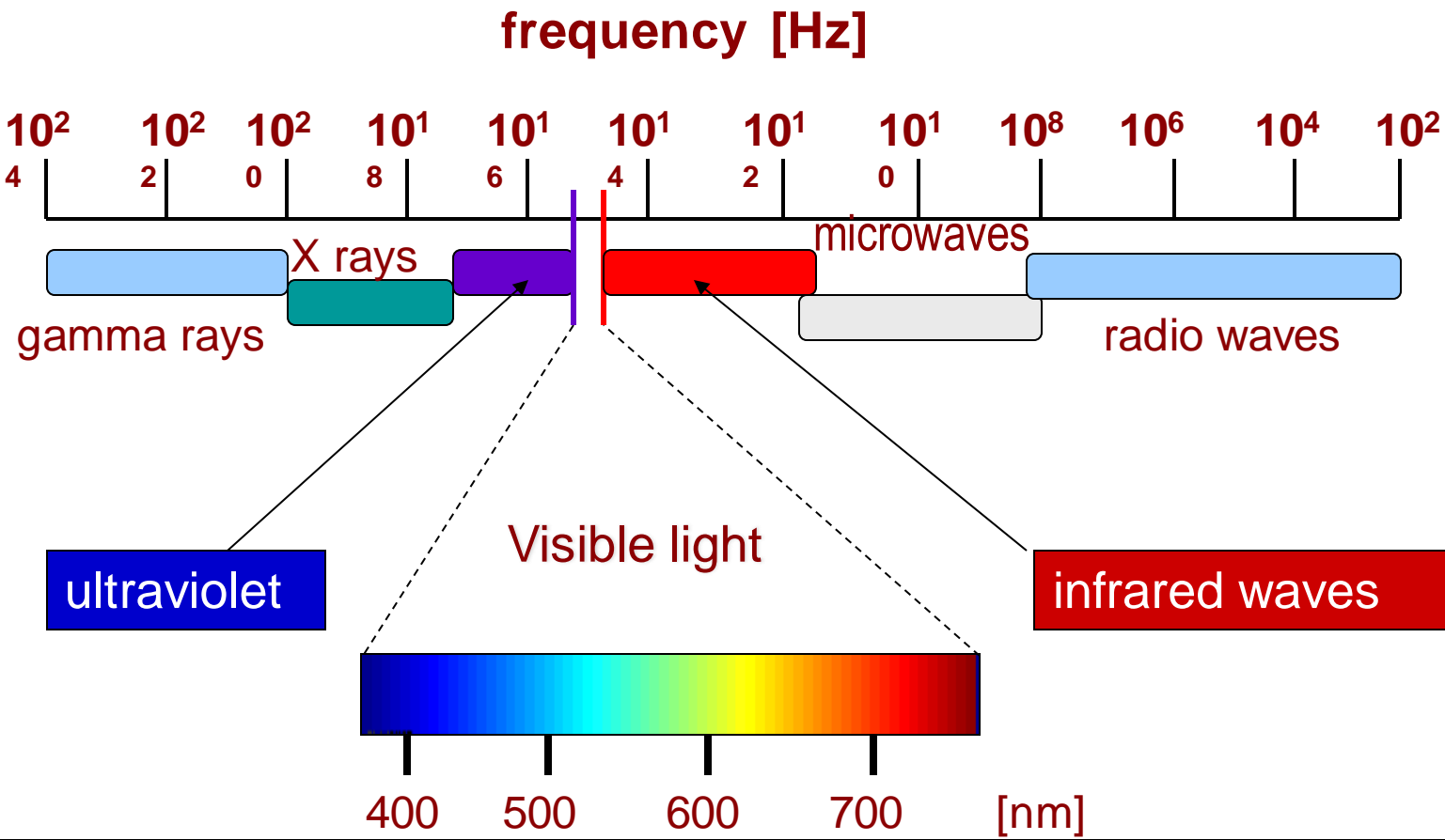
volu



images
(from medical scanners)



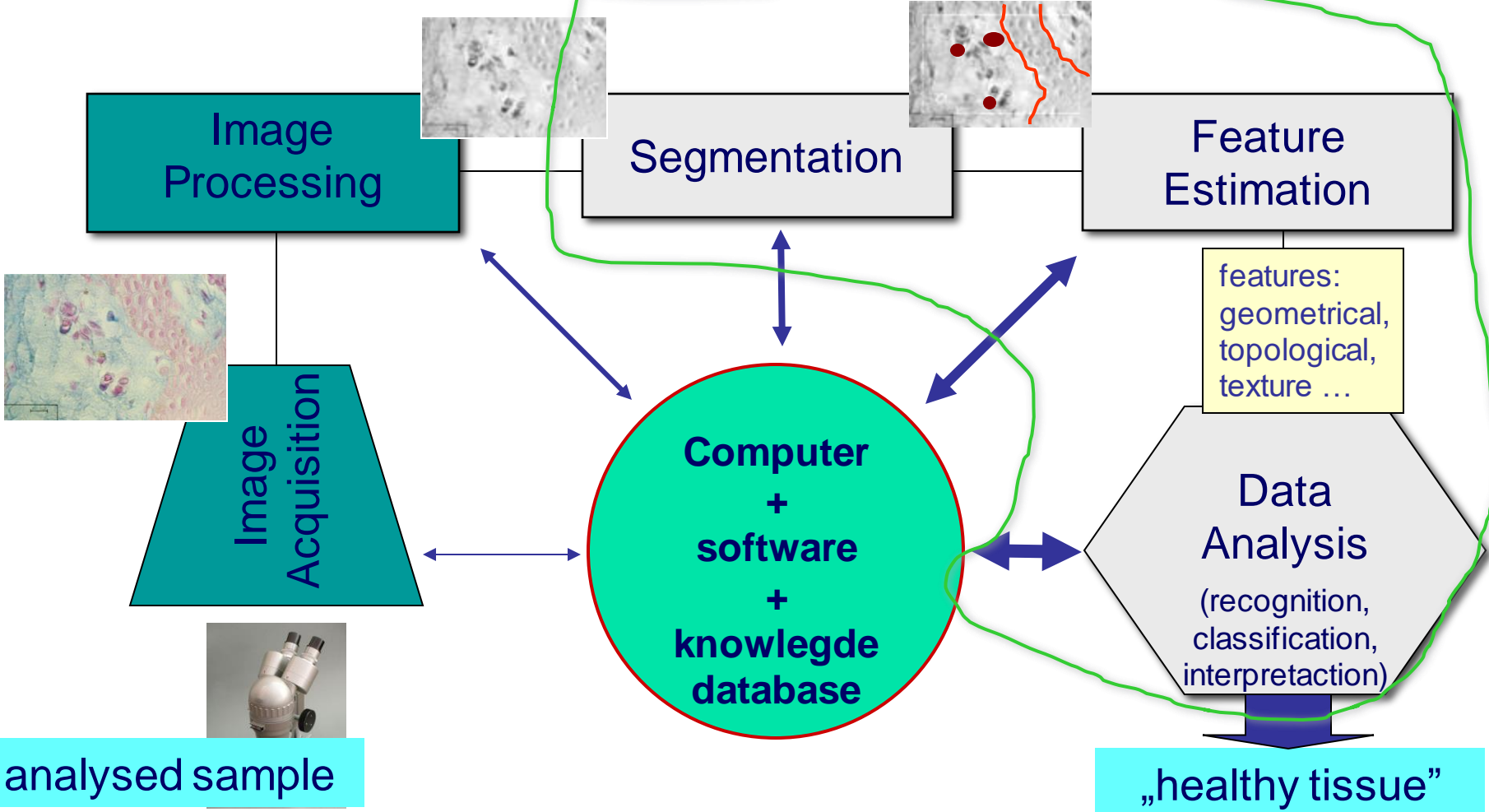
Electromagnetic spectrum





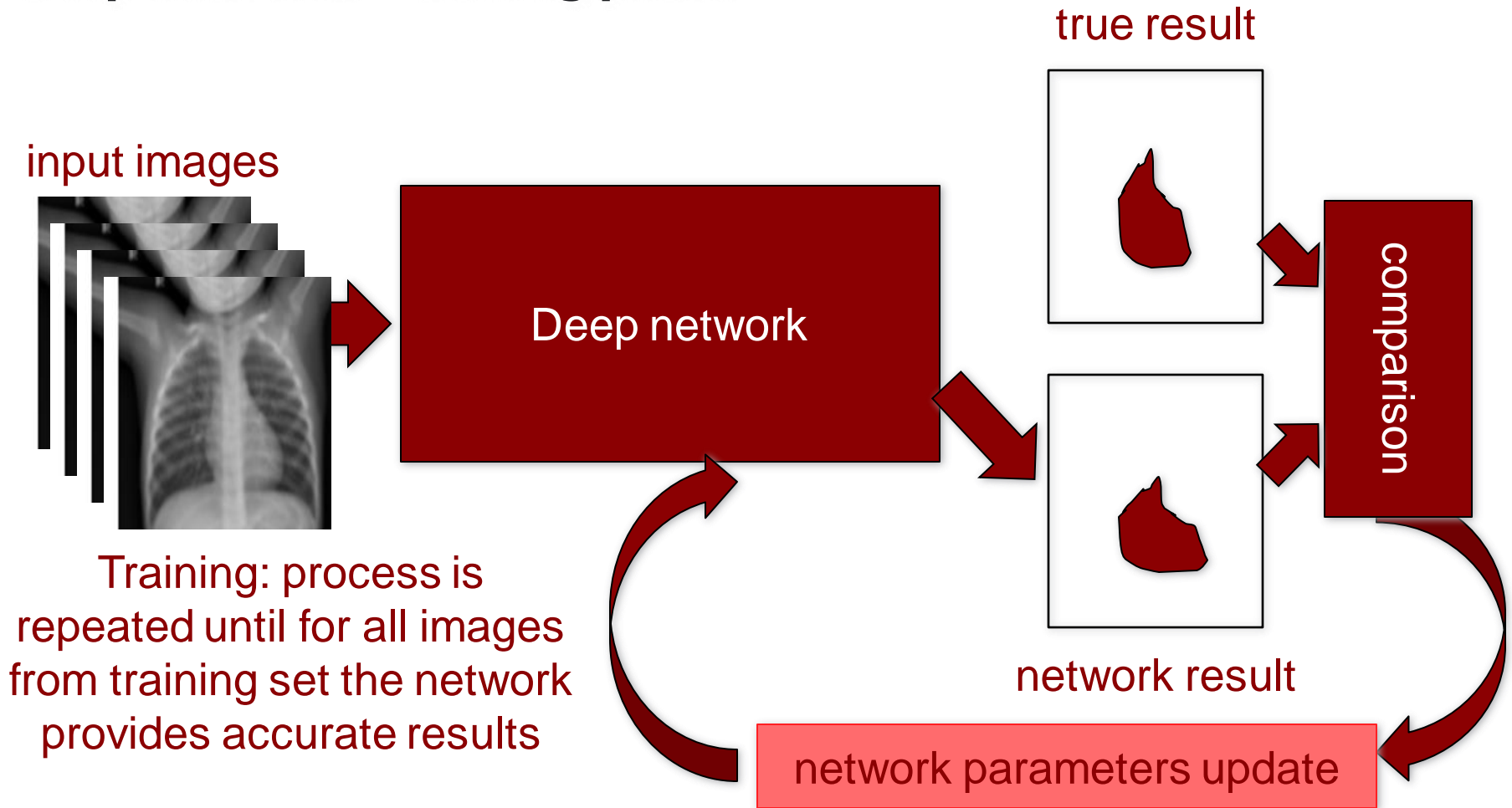
Computer vision system

Deep networks





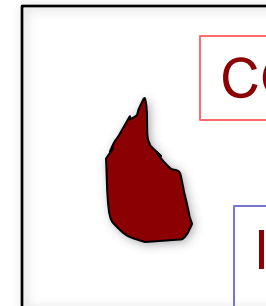
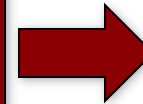
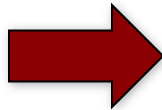
Deep networks – training phase





Deep networks – testing phase

input image



COVID-19

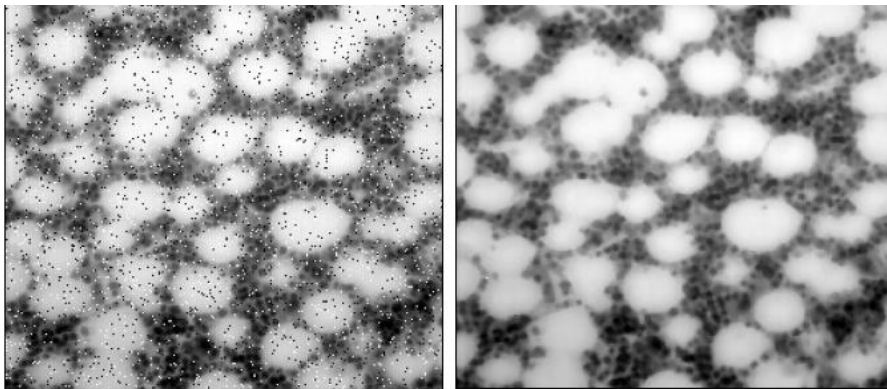
lung cancer
stage III

testing: network analyses
images not present in
training set (generalization)

network result:
segmented
organ, detected
disease or
pathology, degree
of changes

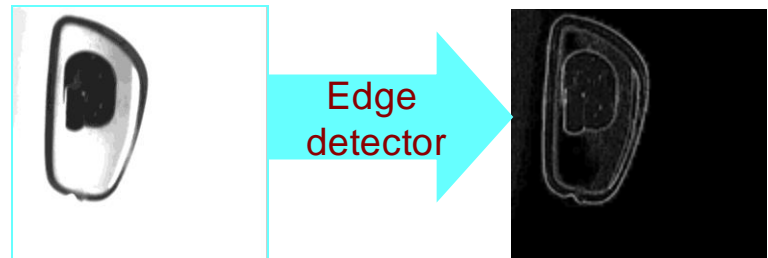
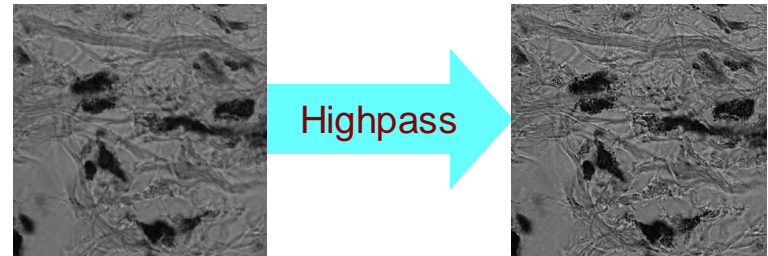
Image filtering in intensity domain

- Linear filters
 - „smoothing” (noise reduction)
 - „sharpening” (details enhancement)
 - Edge detectors
- Nonlinear filters
 - rank filtering (median)



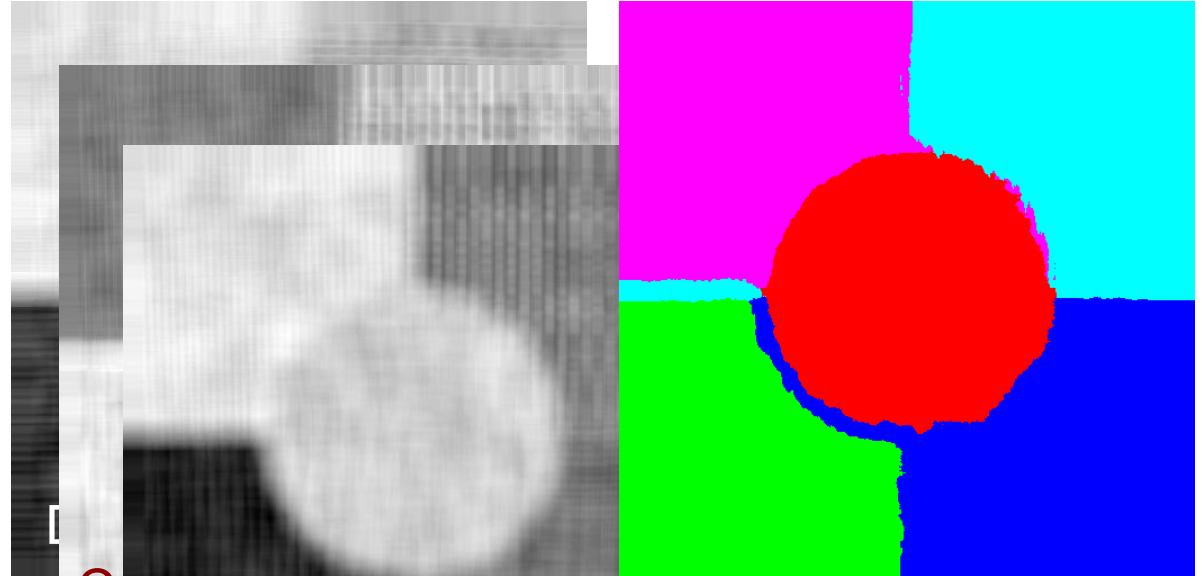
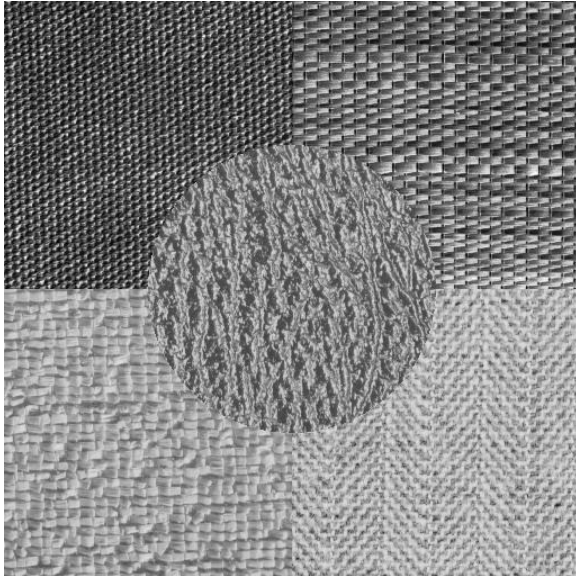
distorted image

after median filtration





Segmentation of Brodatz textures



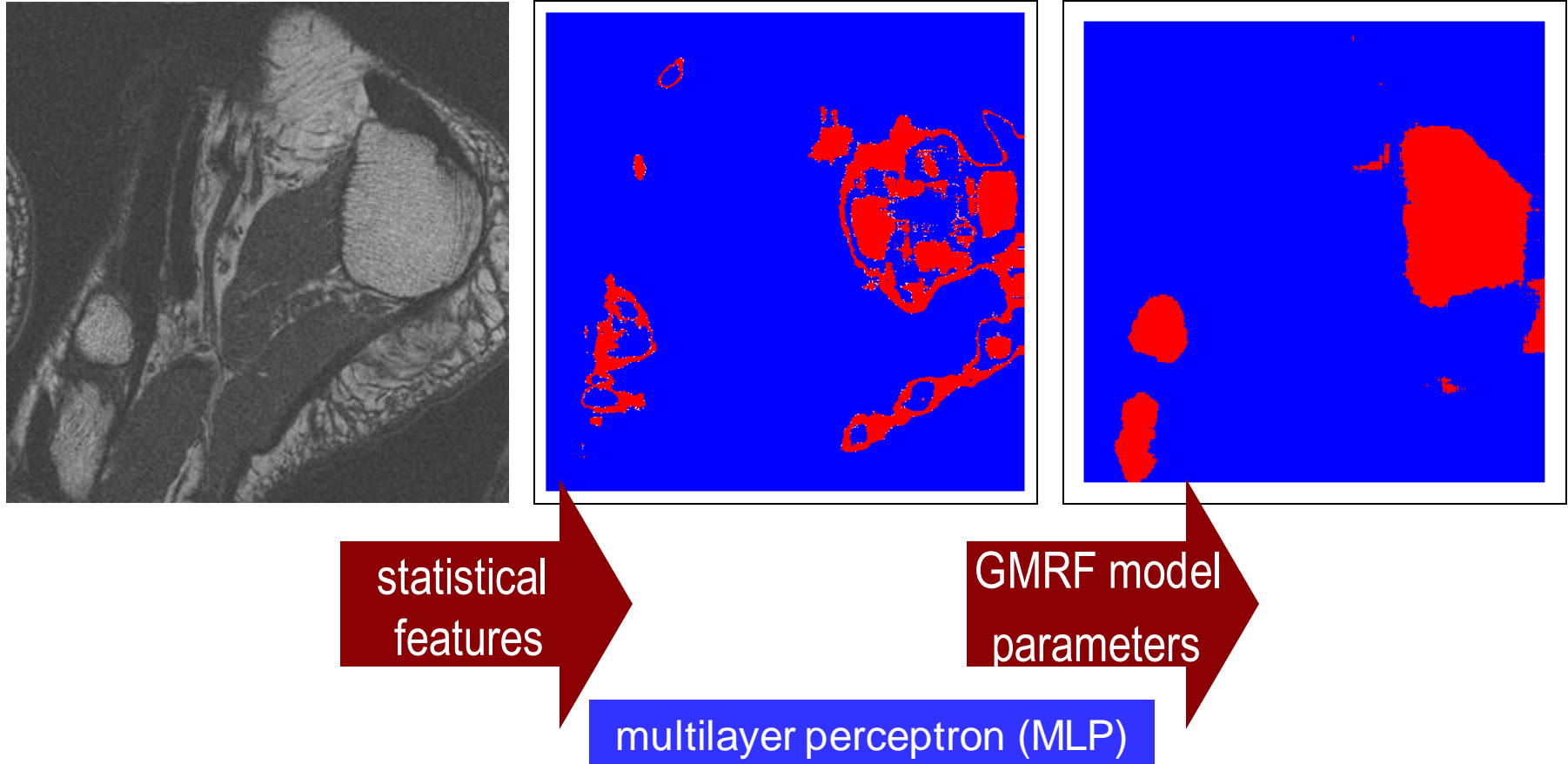
statistical features

feature maps

k-means segmentation results

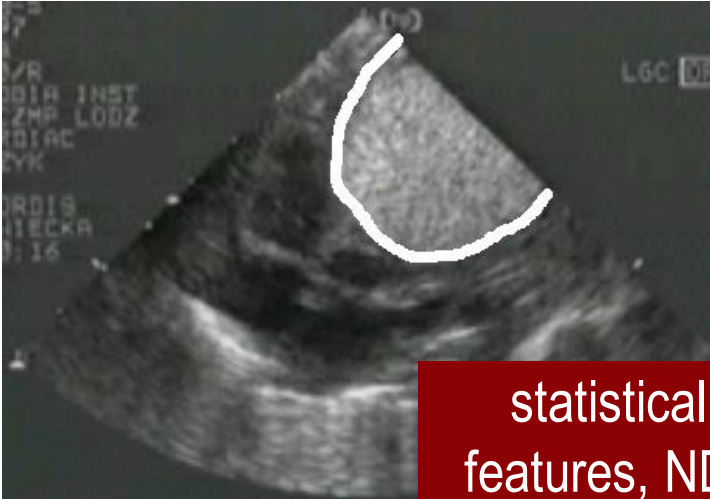


Segmentation of MR foot image

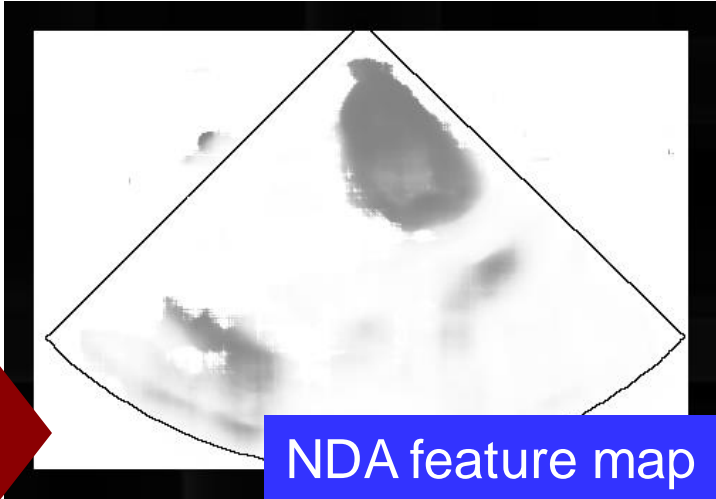




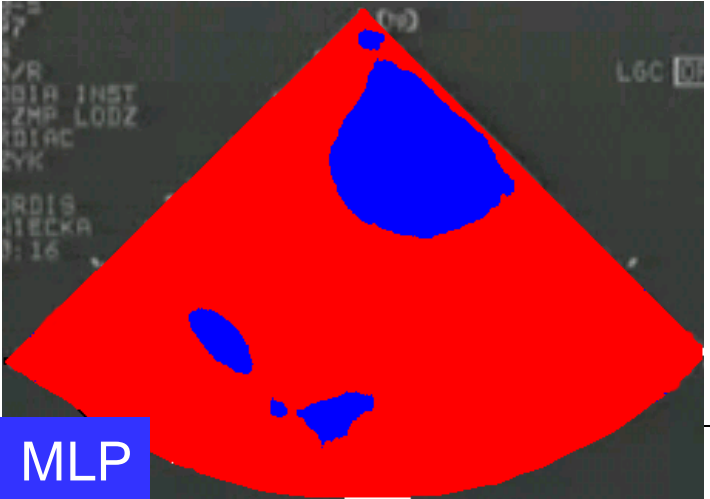
Segmentation of heart mass echocardiogram



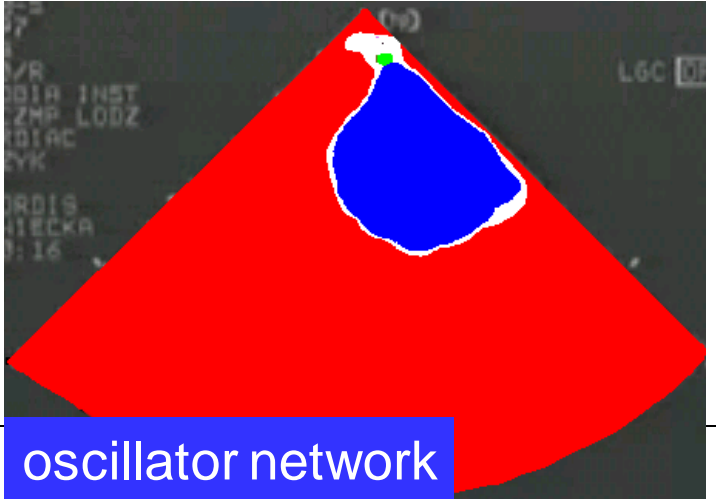
statistical features, NDA



NDA feature map

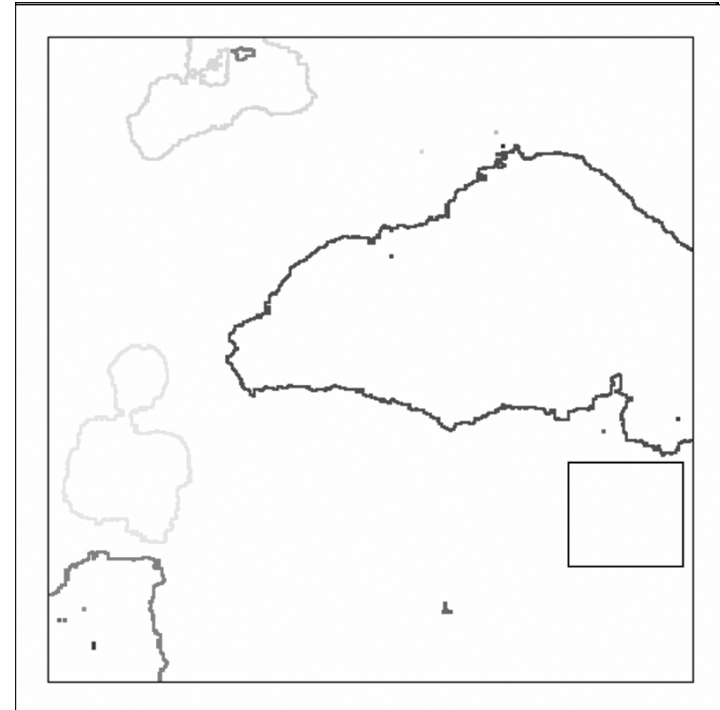
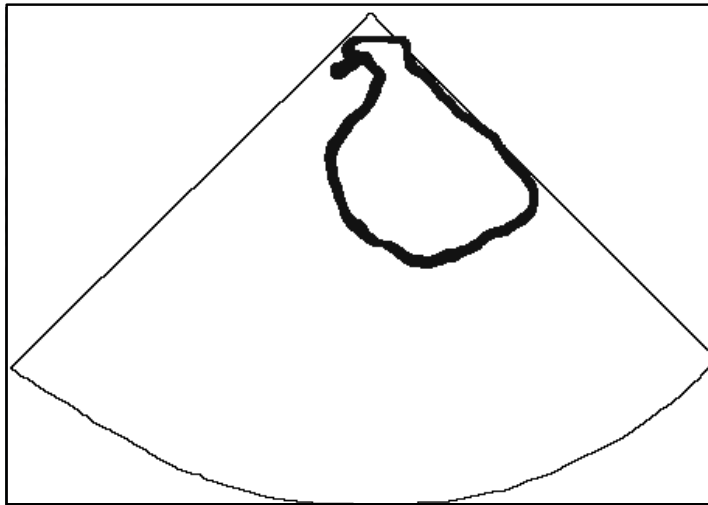


MLP



oscillator network

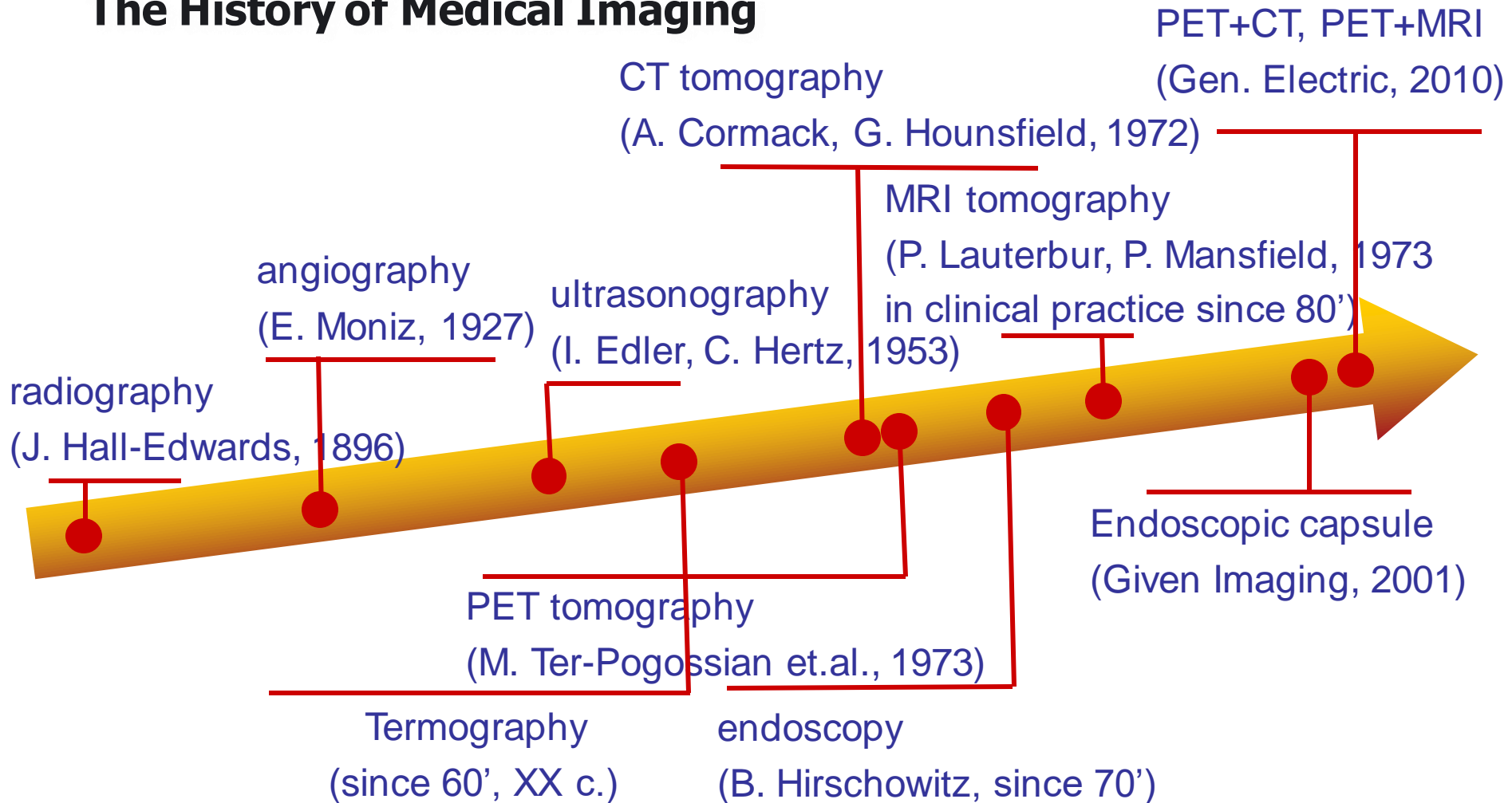
Segmentation based on edge detection



oscillator network

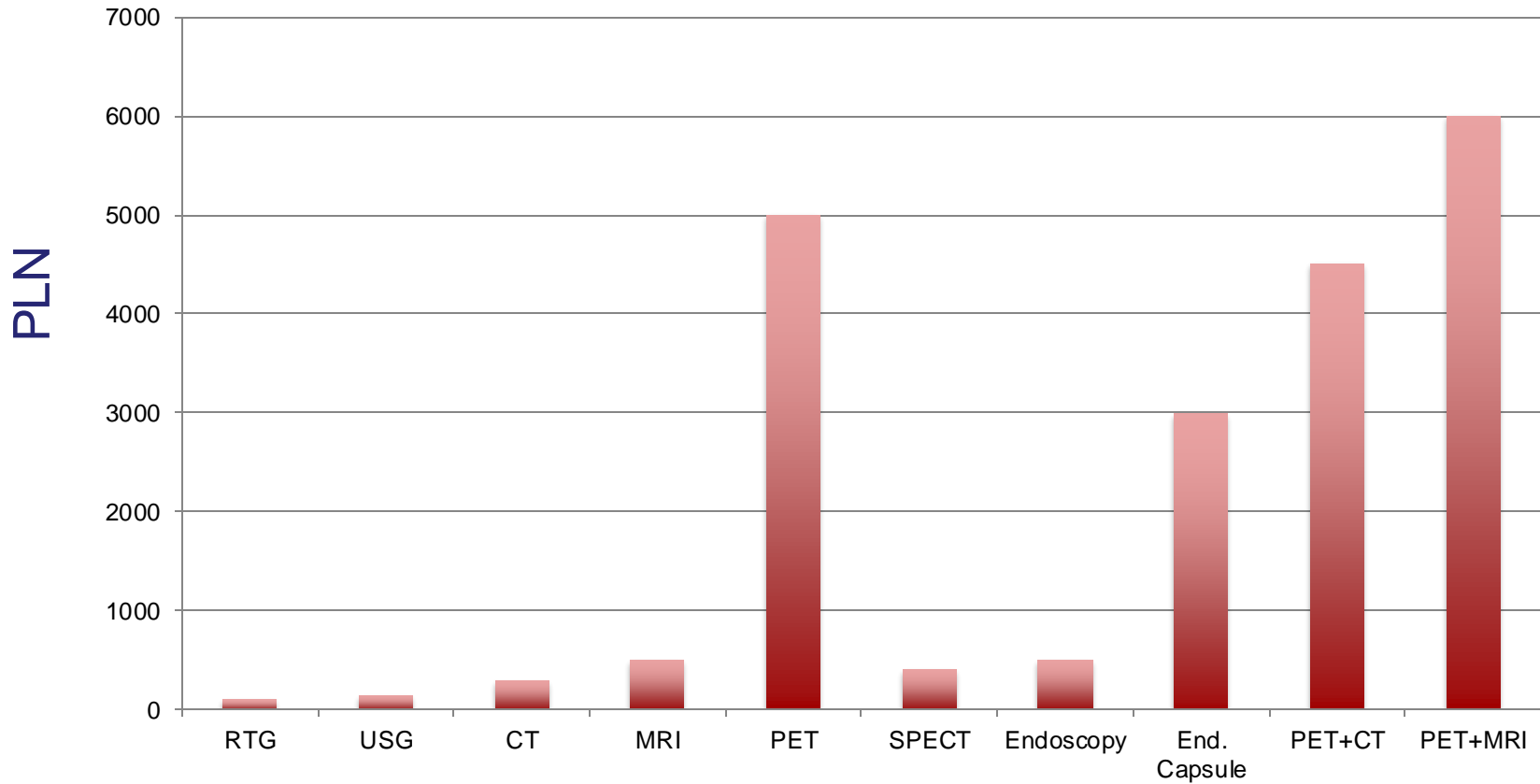


The History of Medical Imaging



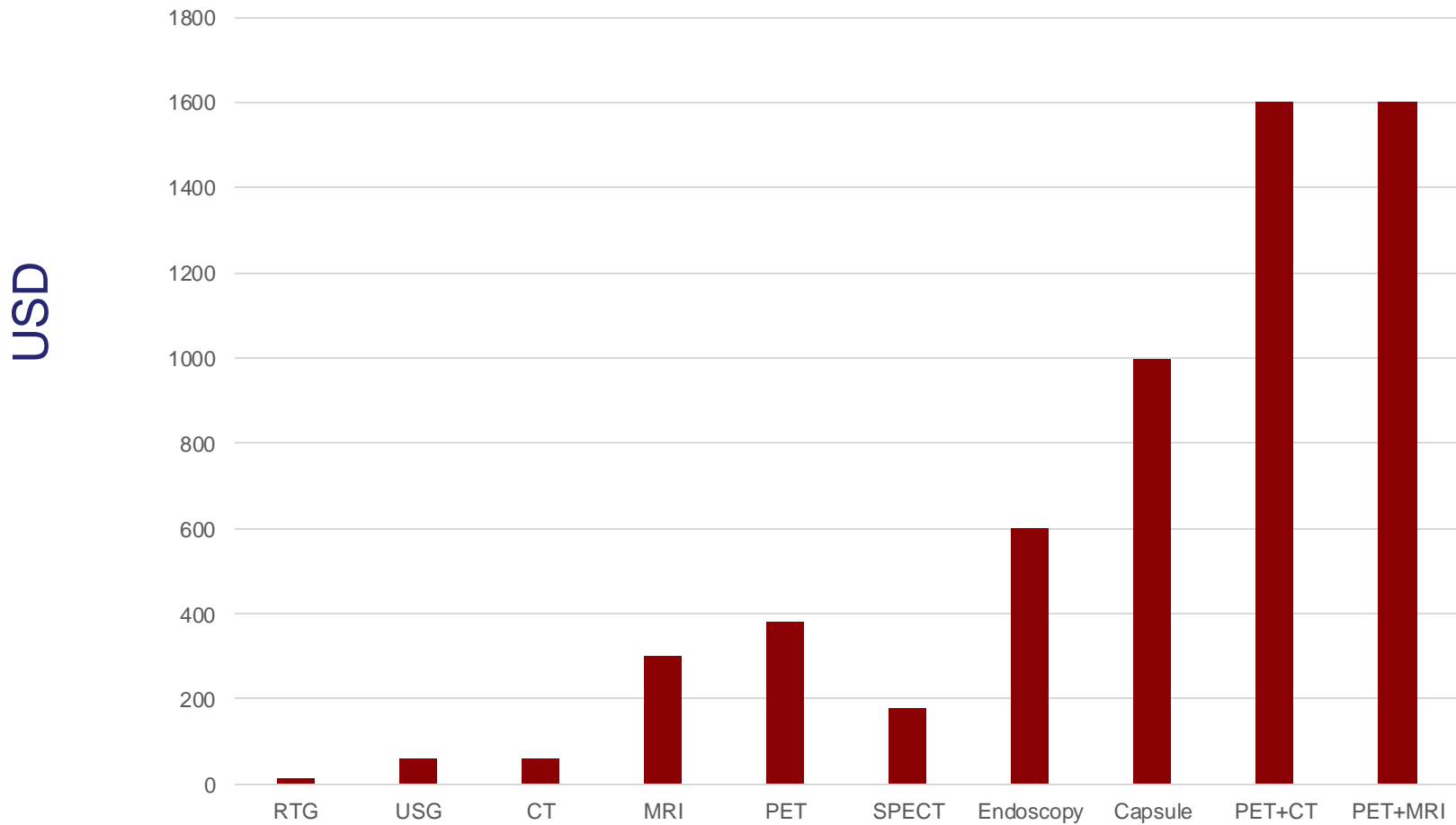


Examination costs (Poland)



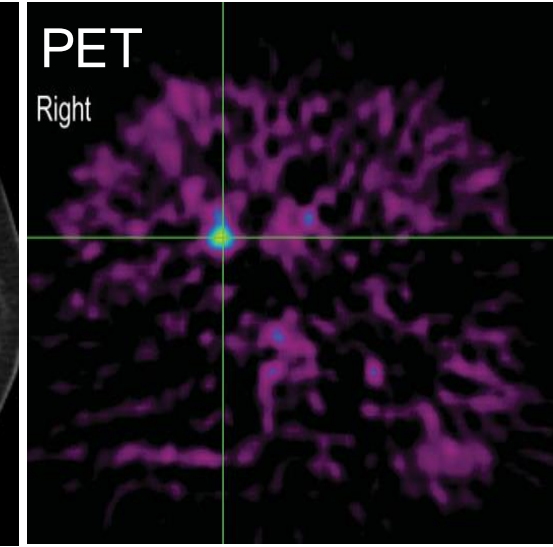
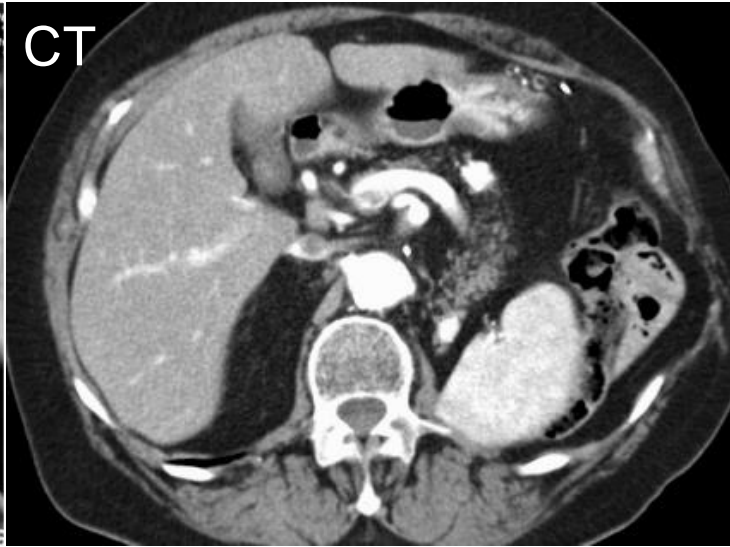
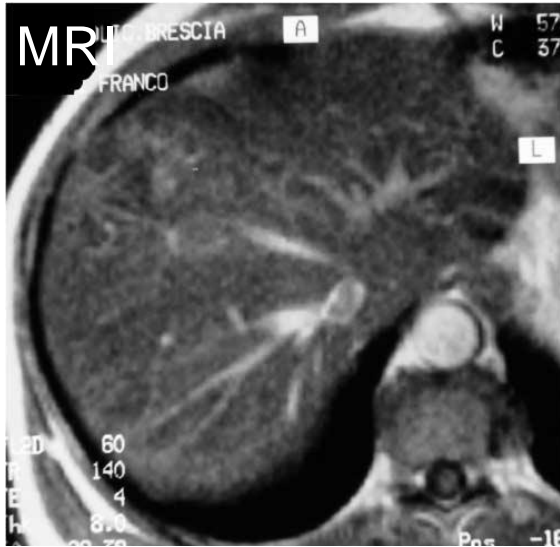
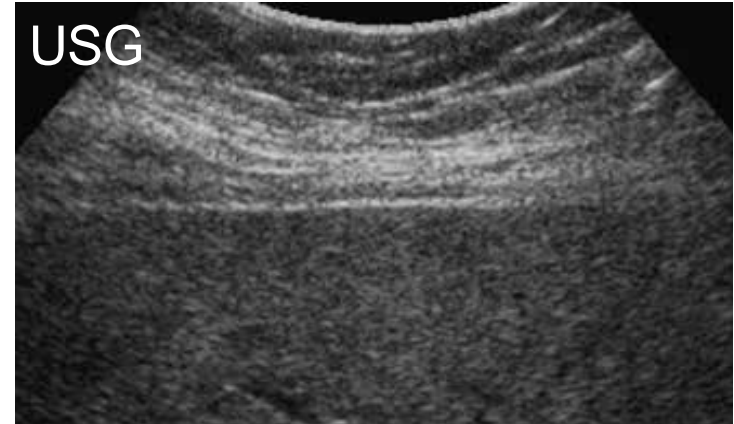


Examination costs (US)



Why so many imaging modalities?

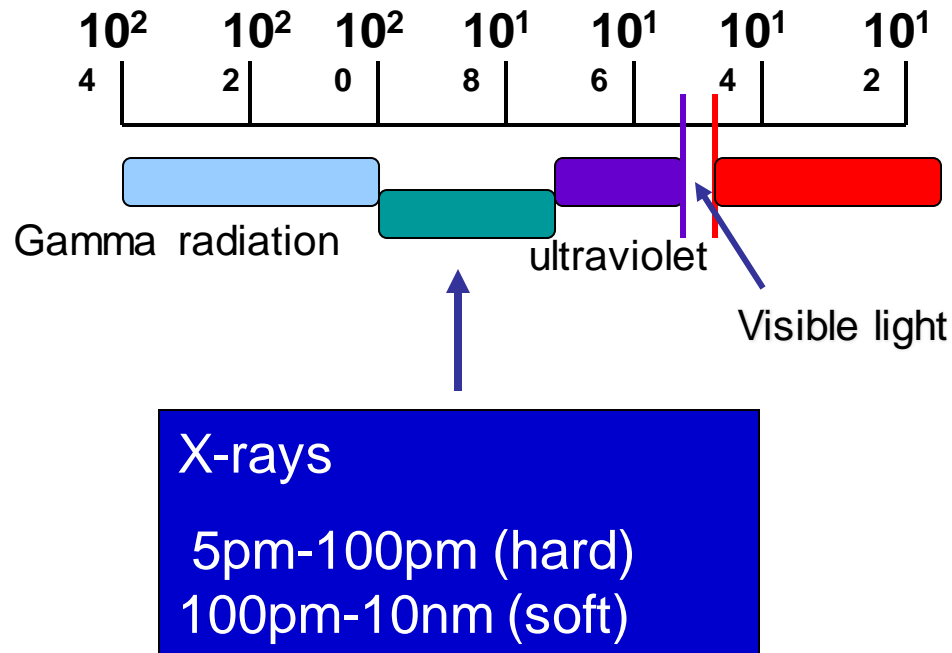
- Sonography (53%-77% lesions)
- CT (l. vasculature gold standard)
- MRI (91% benign – malignant discrimination)
- PET (highest sensitivity in tumor detection)





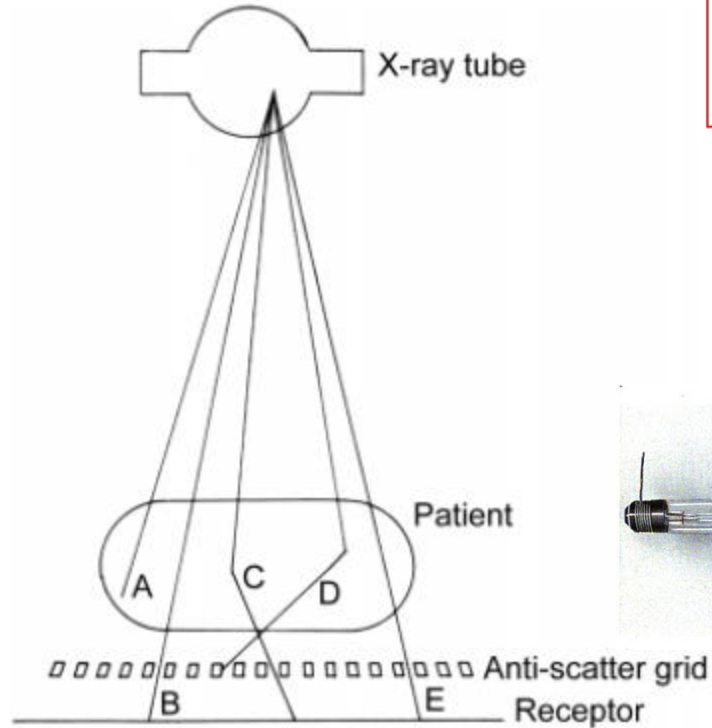
Radiography

Roentgen radiation (X-ray radiation), discovered and described by Wilhelm Röntgen in 1895, Nobel prize in physics in 1901.

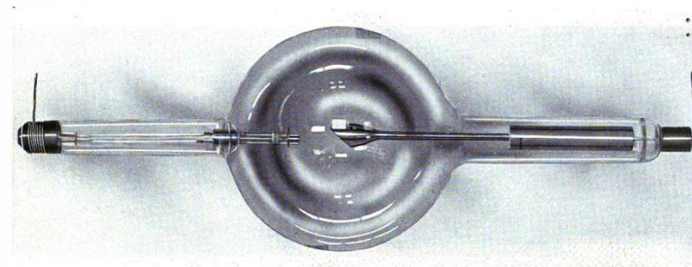
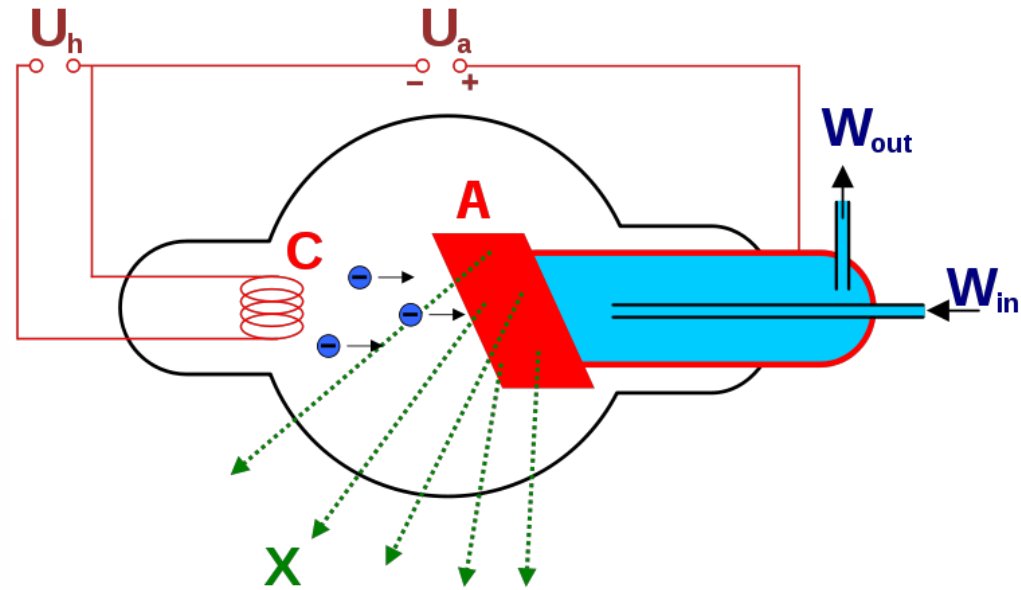


Ms. Röntgen hand x-ray

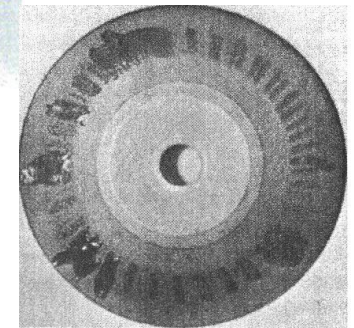
X-ray devices



resulting image is a projection



tungsten anode



Radiography

- film images,
- digital images,
- invasive examination,
- limited quality,
- low equipment price, mobility





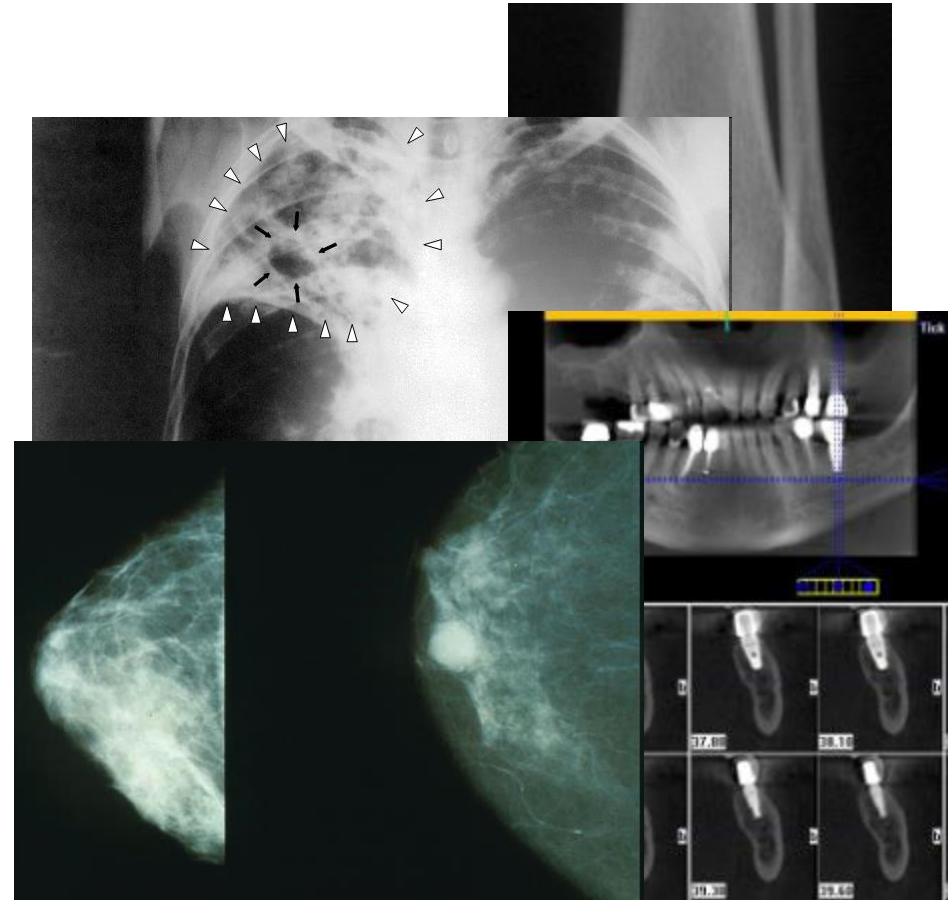
Radiography

Applications:

- orthopedics
- pulmunology
- dentistry

Diagnosis:

- breast cancer (mammography)
- osteoporosis

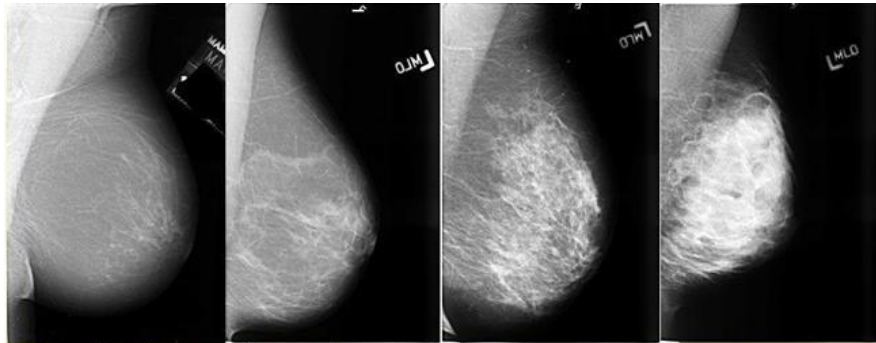


dr Piotr Cichy

www.kavo.pl, Gendex



Digital Breast Tomosynthesis



Breast composition and its mammographic appearance.³

mammography



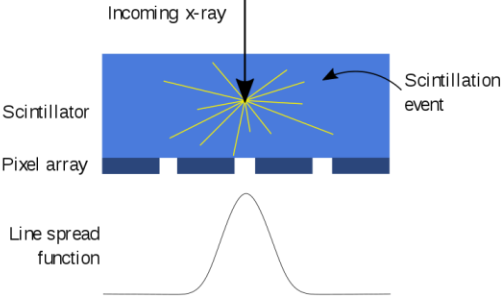
DBT



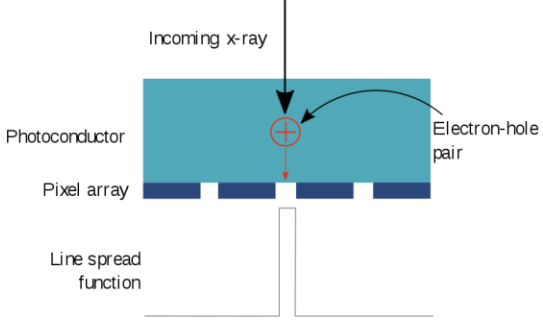


Fluoroscopy – ra sequence of X-ray images

Indirect Detector

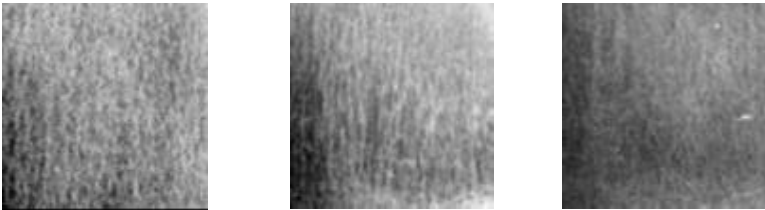


Direct Detector





Analysis of wrist radiograms

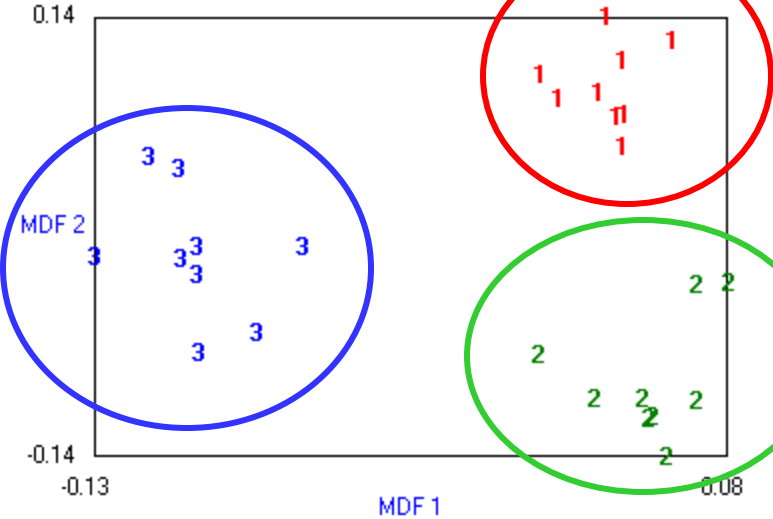


Control (1)

Osteopenia (2)

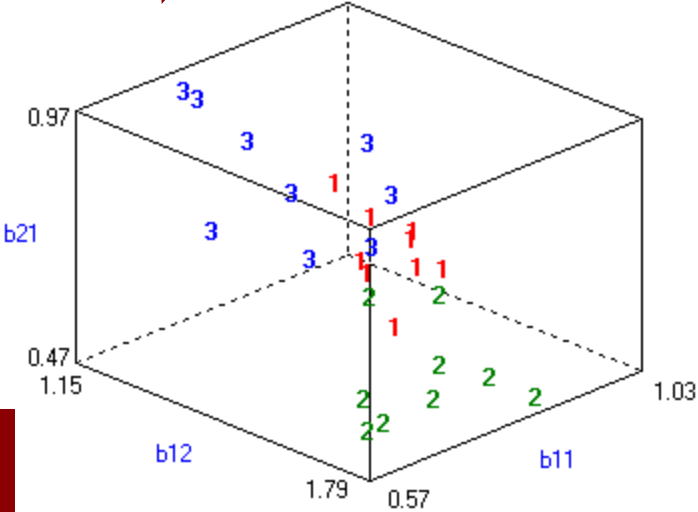
Osteoporosis (3)

Markov Random Field model



Classification error: 0%

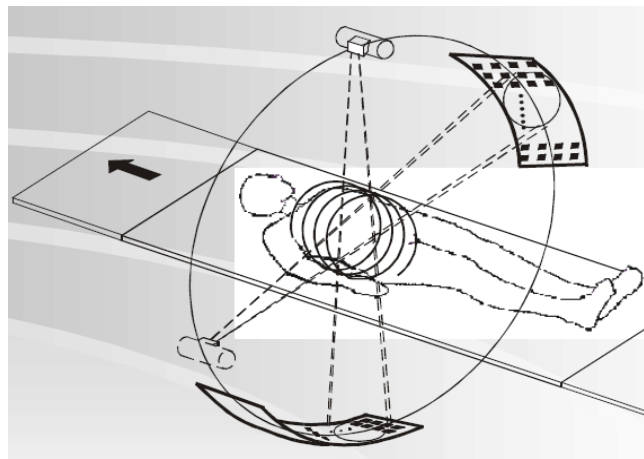
Linear Discriminant Analysis



Classification error: 9%

Computed Tomography (CT)

- cross-section images (not a projections)
- not applicable for soft tissues,
- very good image quality,
- invasive examination,
- high equipment price



[biomech.pwr.wroc.pl/
konferencja/Cierniak.pdf](http://biomech.pwr.wroc.pl/konferencja/Cierniak.pdf)



Hounsfielda units

The Hounsfield units scale is a linear transformation of the measurement of the linear X-ray attenuation coefficient in which the radiological density of distilled water at standard temperature and pressure (0°C, 1000 hPa) is defined as zero Hounsfield units (HU), while air density under standard conditions is defined as - 1000 HU.

[https://pl.wikipedia.org/wiki/Skala_Hounsfielda]

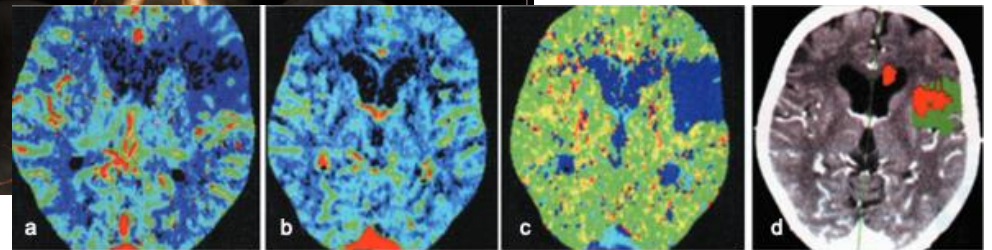
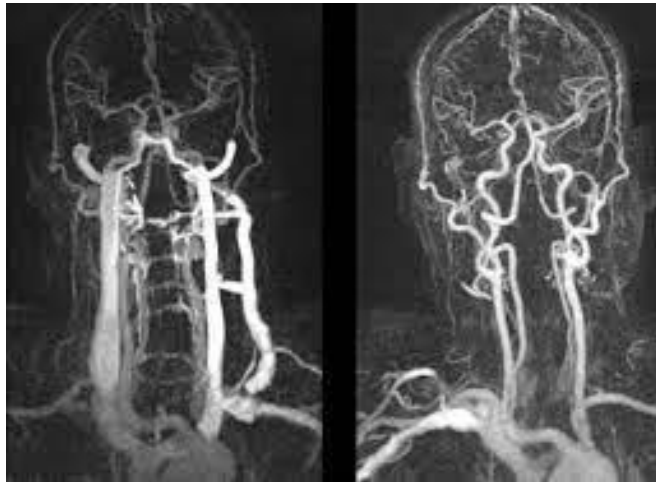
$$HU = \frac{\mu_X - \mu_{H_2O}}{\mu_{H_2O} - \mu_{air}} 1000$$

| Rodzaj tkanki | Współczynnik pochłaniania (jH.) |
|---|---------------------------------|
| Kości | od 300 do 1000 |
| Tarczyca | 70 ± 10 |
| Wątroba | 65 ± 5,0 |
| Śledziona | 50 ± 5,0 |
| Nerka | 30 ± 10 |
| Trzustka | 40 ± 10 |
| Tkanka tłuszczowa | -65 ± 10 |
| Płuca | od -600 do -800 |
| Płyny ustrojowe: | |
| • Krew wynaczyniona (do 6–8 dnia po krwotoku) | 80 ± 10 |
| • Krew żylna | 55 ± 5,0 |
| • Wysięk | >18 ± 2,0 |
| • Przesięk | <18 ± 2,0 |



CT angiography

contrast examination: detection of aneurysms, analysis of arteries in the lungs, kidneys, aortic dissection examination, **assessment of the blood supply to the brain**





Computed Tomography (CT)

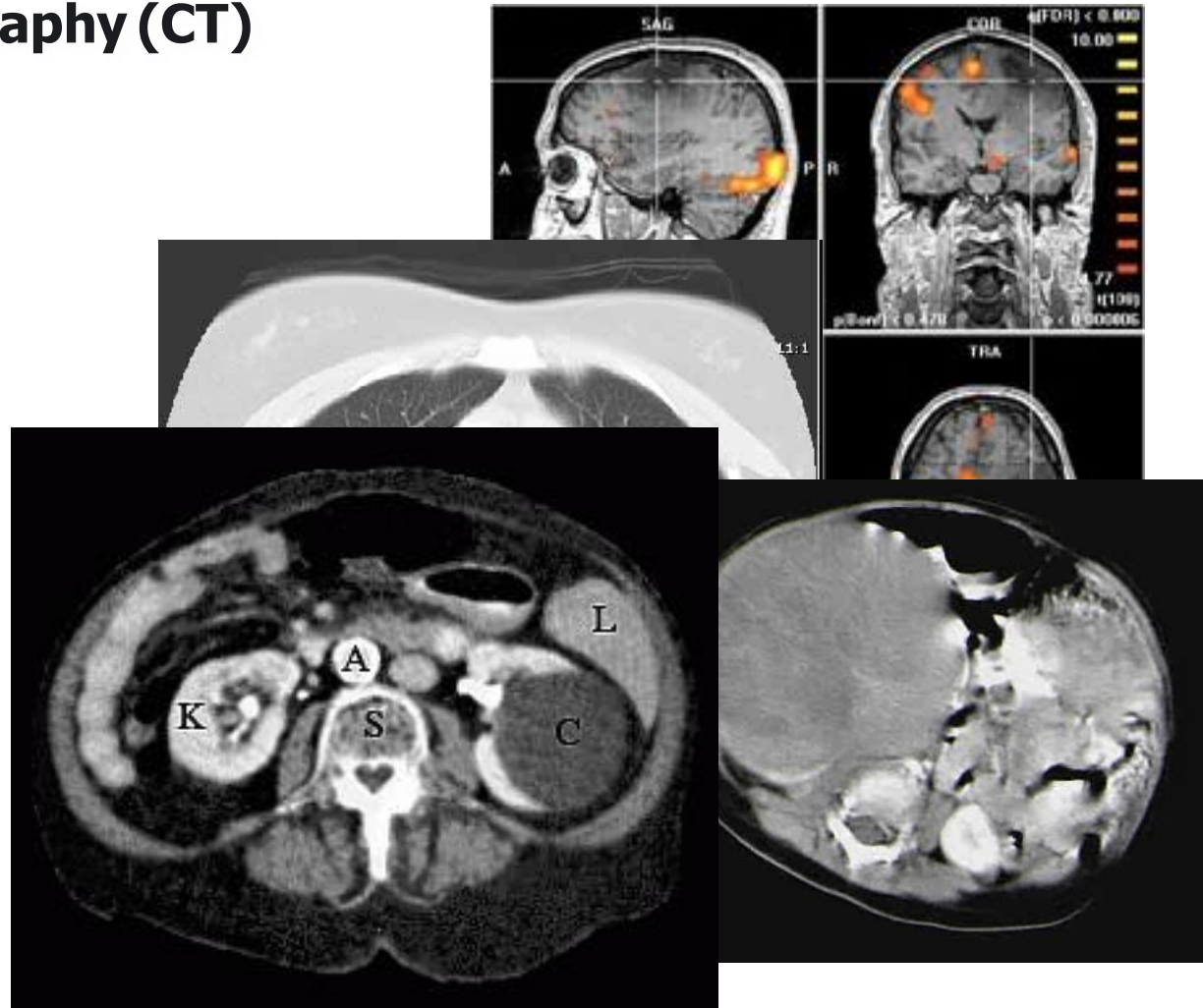
Applications:

- neurology
- cardiology
- pulmunology
- gastroenterology

.....

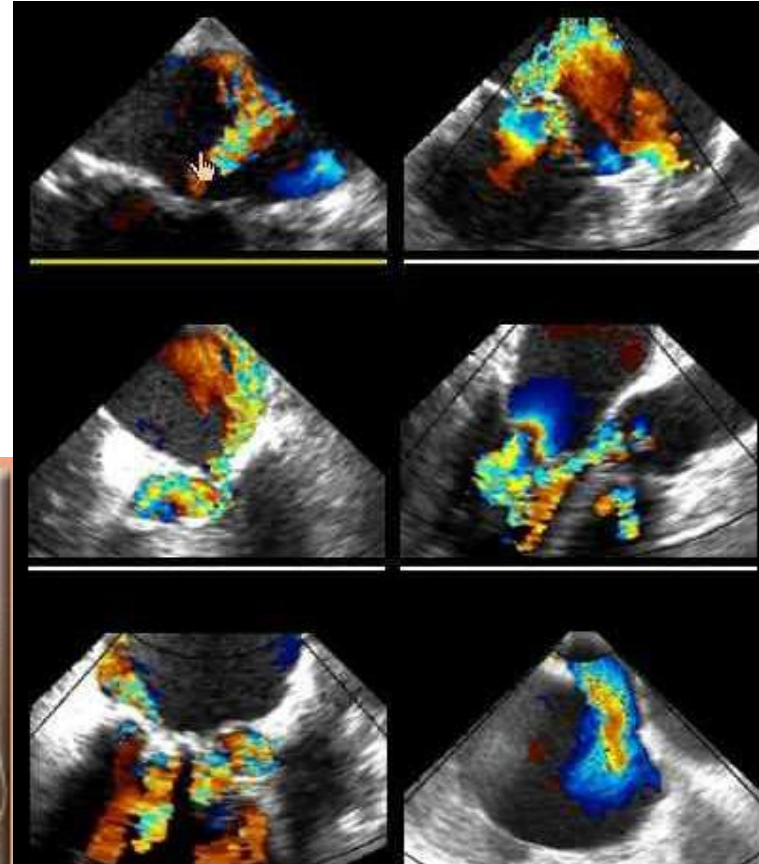
Diagnosis:

- brain tumors
- kidney, liver
- lung diseases



Ultrasonography

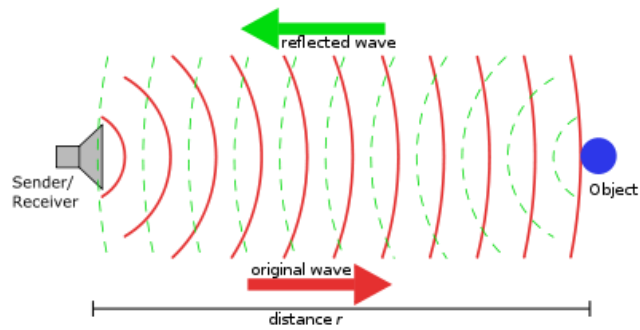
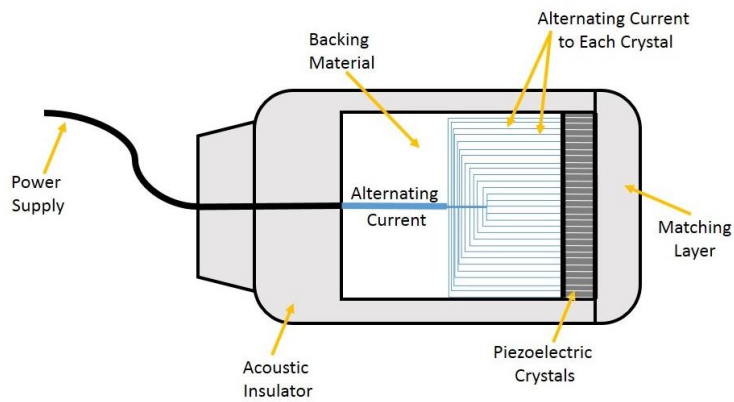
- low image quality,
- difficult for interpretation,
- Ultrasound elasticity (tissue stiffness measurement)
- blood flow examination (Doppler effect),
- non-invasive examination,
- low equipment price, mobility





Ultrasonography

Transducer Basics





Ultrasonography

Applications:

cardiology

gynecology&obstetrics

urology

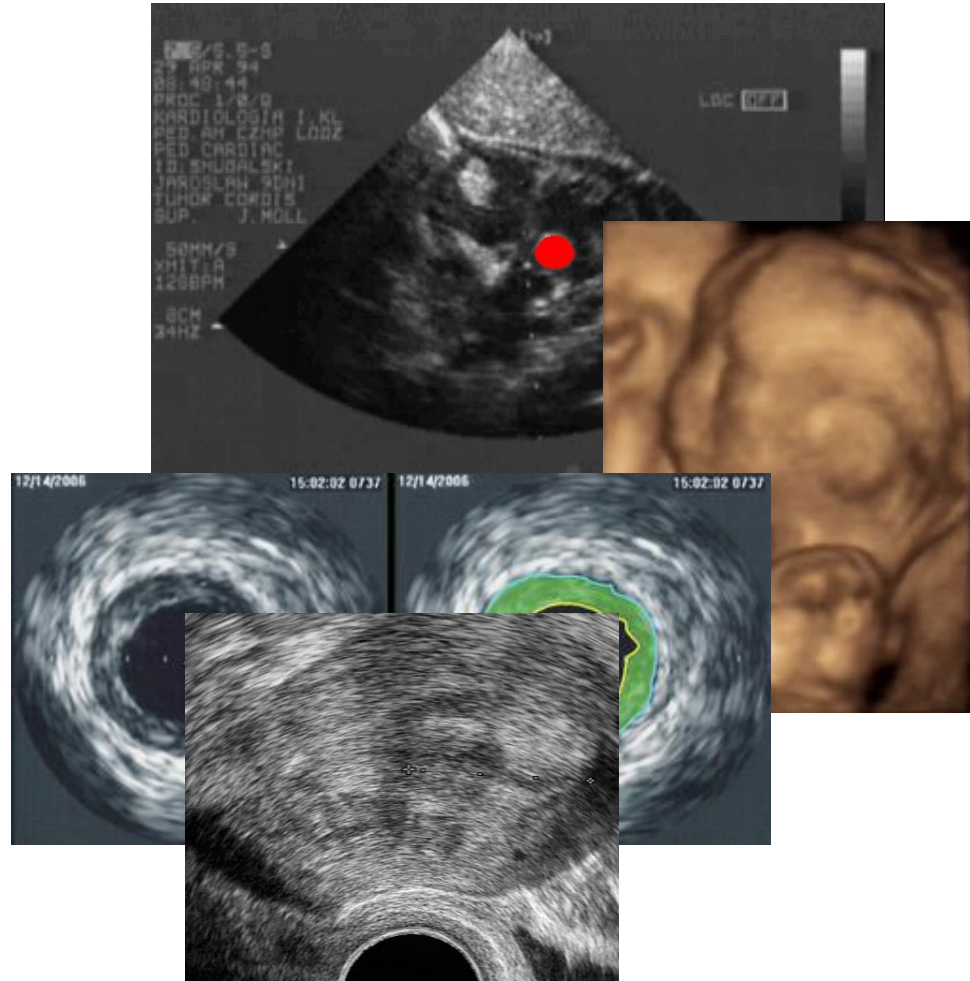
gastrology

.....

Diagnosis:

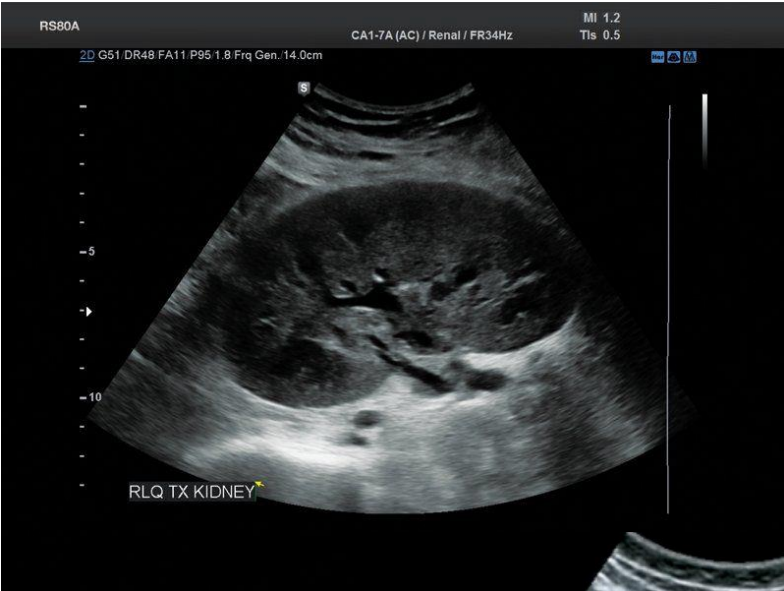
prostate, urinary bladder

uterus



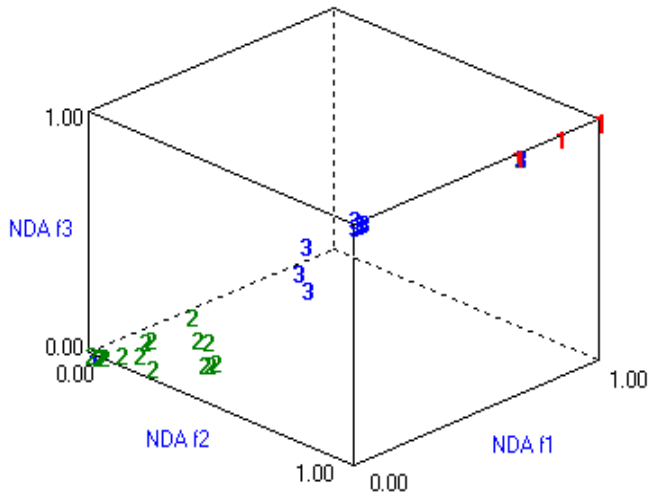
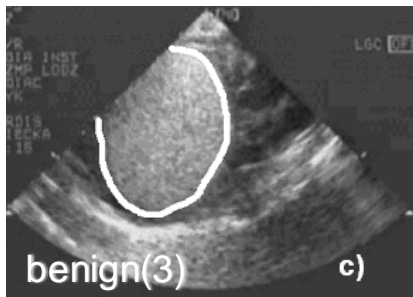
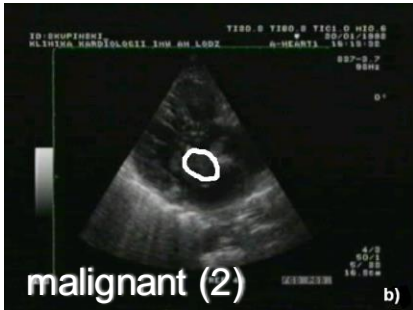
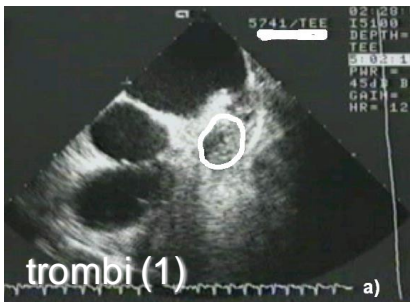


Ultrasonography

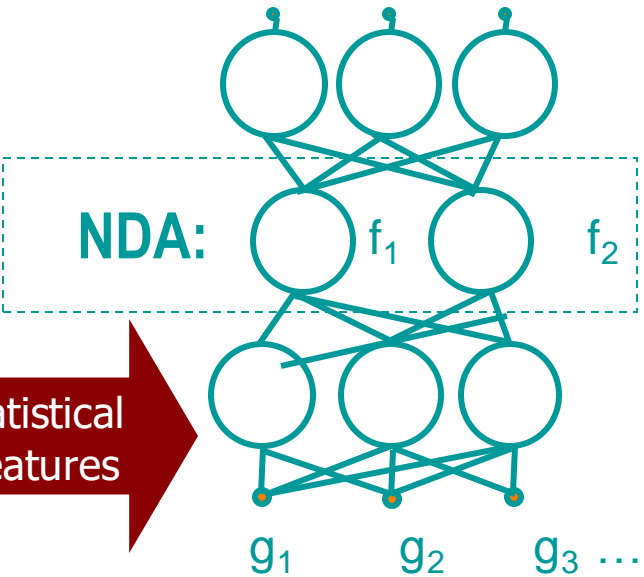




Analysis of heart echo images (classification)



Classification error: 10% (55 images)

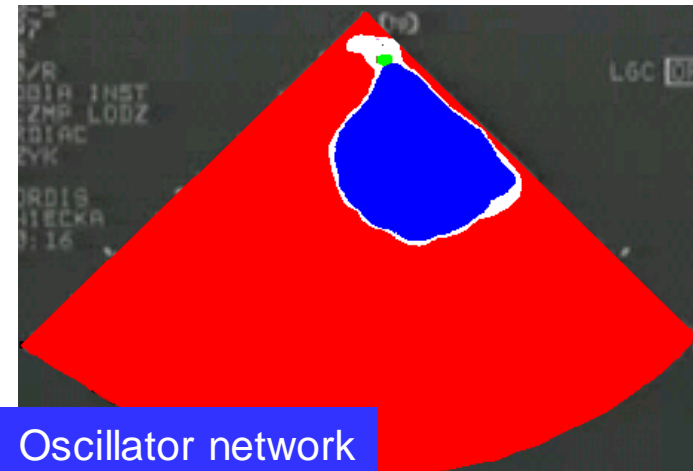
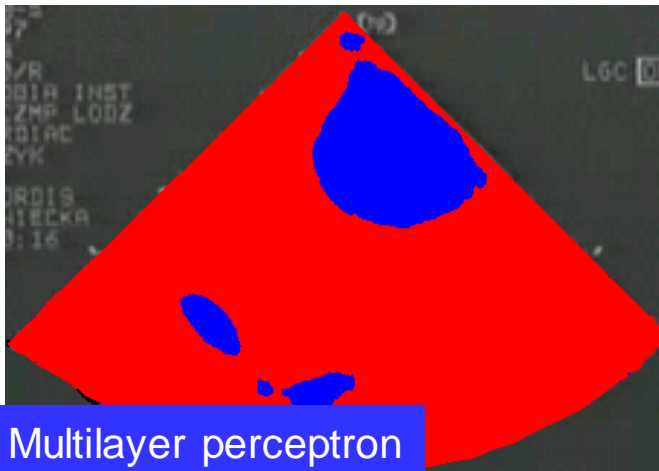
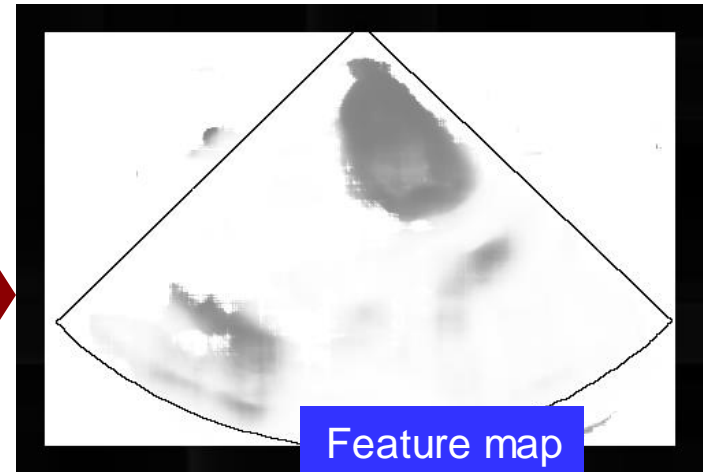




Analysis of heart echo images (segmentation)



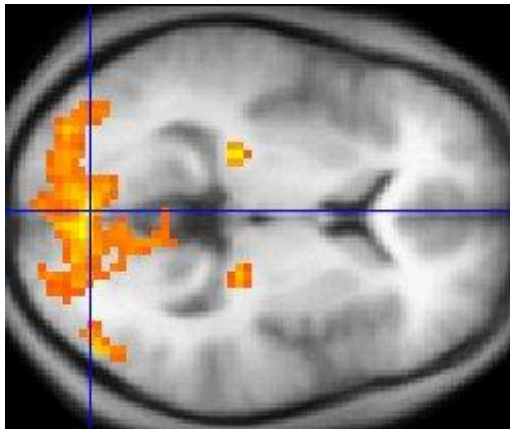
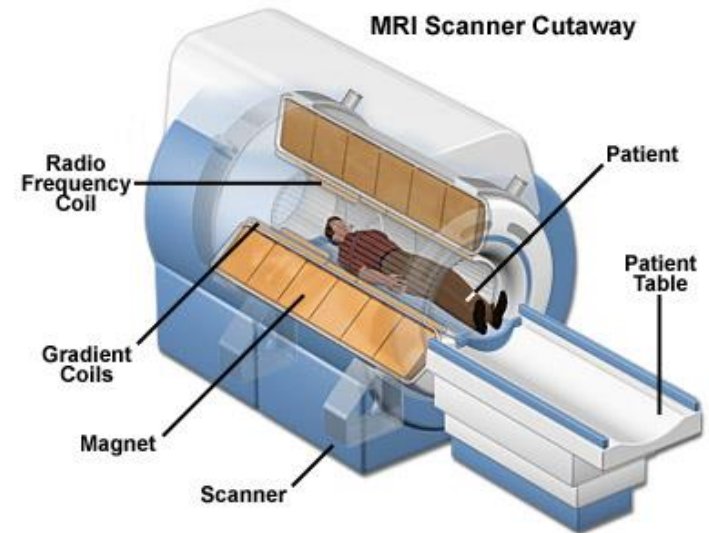
Statistical features





Magnetic Resonance Imaging (MRI)

- effective for soft tissues,
- functional tomography (BOLD),
- MR angiography,
- very good image quality,
- non-invasive examination,
- high equipment price



Magnetic Resonance Imaging (MRI)

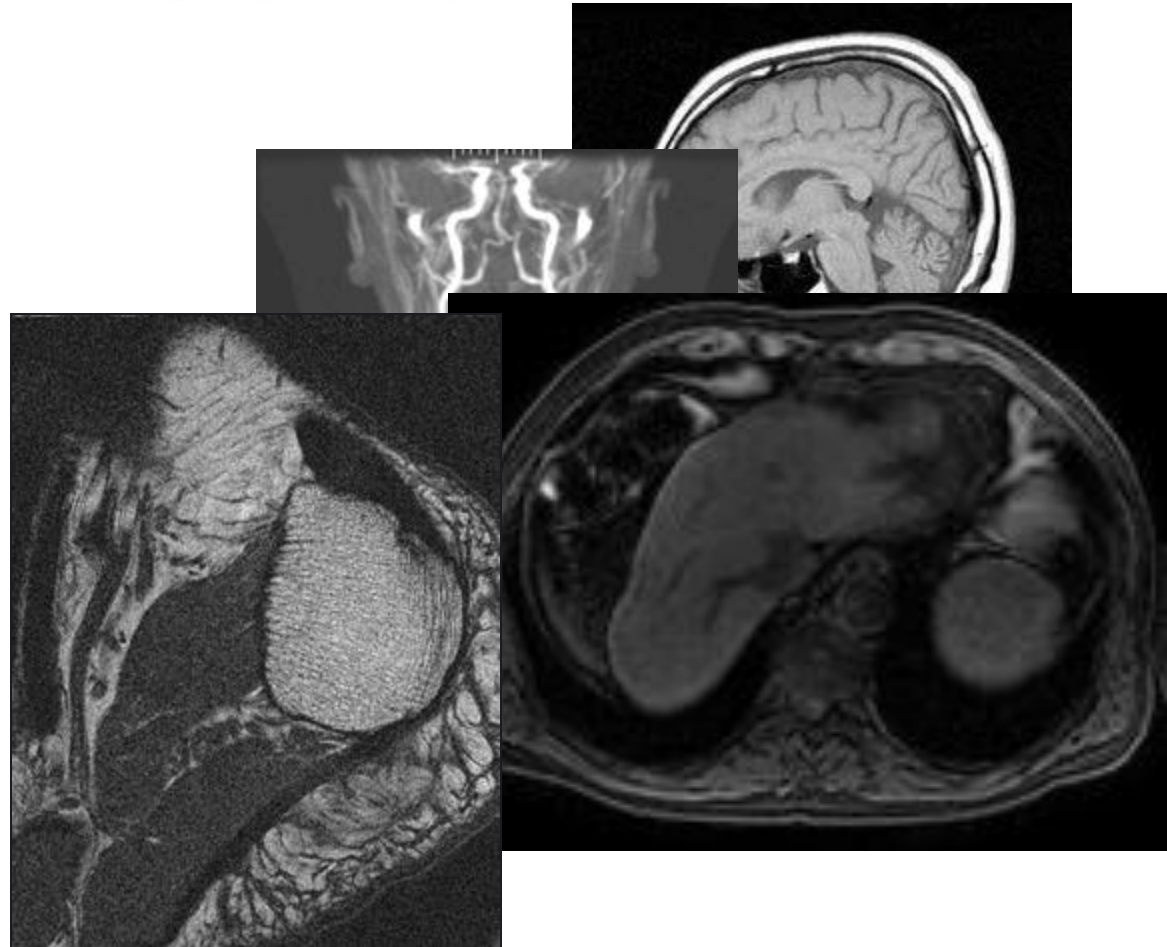
Applications:

neurology
angiography
gastroenterology

.....

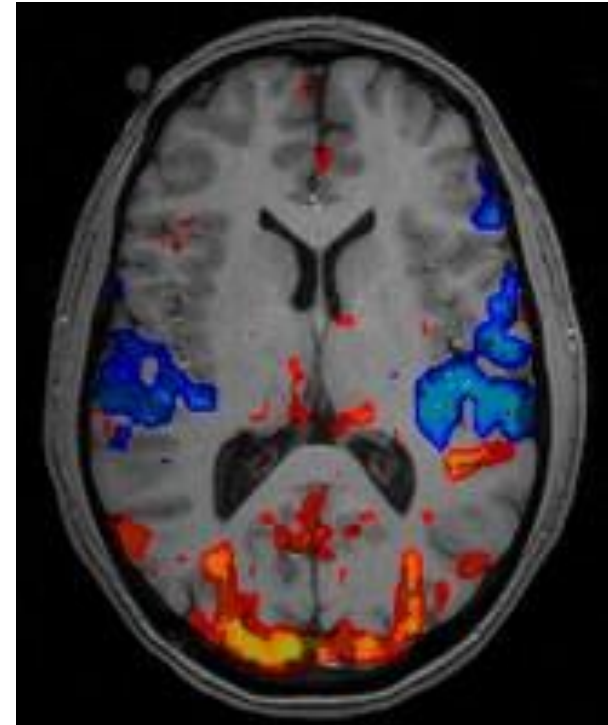
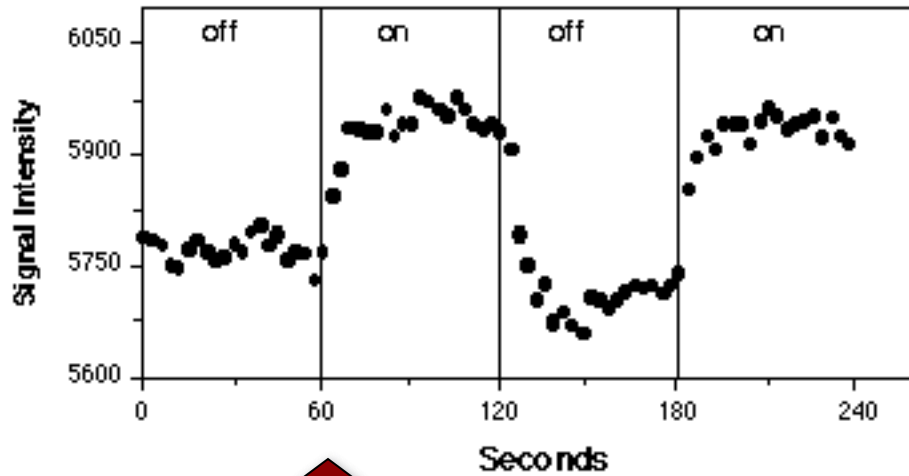
Diagnosis:

brain tumors
abdomen organs
osteoporosis

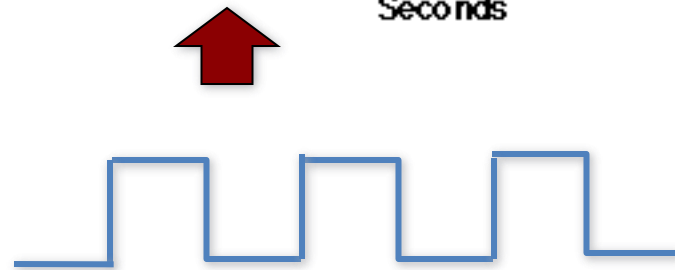


Functional Magnetic Resonance Imaging (fMRI)

Measured brain signal



Brain activation map

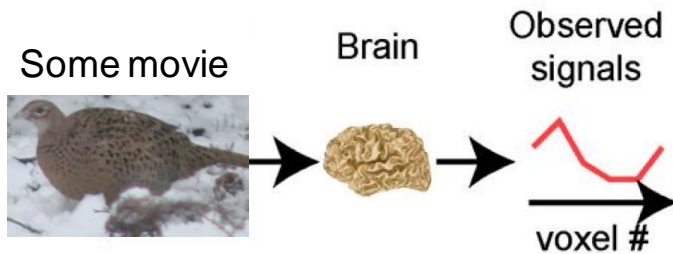


Visual stimulus

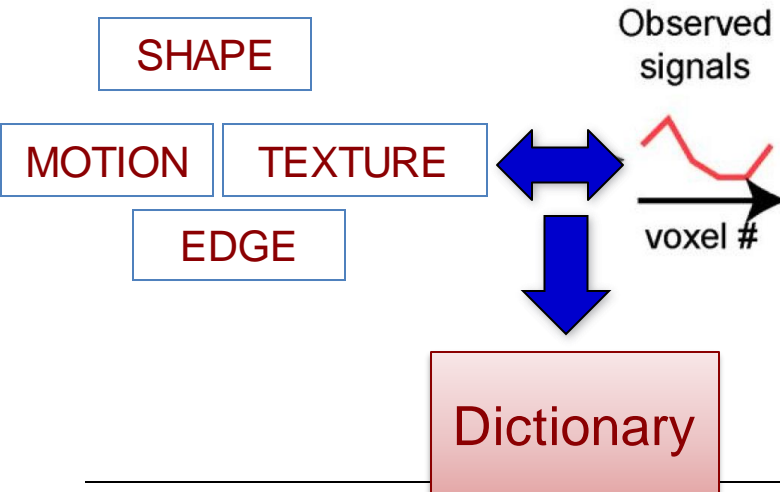


Functional Magnetic Resonance Imaging (fMRI)

Reconstructing visual experiences from brain activity evoked by natural movies
(The Gallant Lab, UC Berkeley)



[1] Record brain activity while the subject watches several hours of movie trailers.

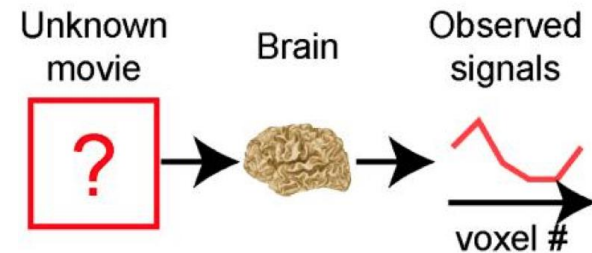


[2] Build dictionaries (i.e., regression models) that translate between the shapes, edges and motion in the movies and measured brain activity. A separate dictionary is constructed for each of several thousand points at which brain activity was measured.



Functional Magnetic Resonance Imaging (fMRI)

[3] Record brain activity to a new set of movie trailers that will be used to test the quality of the dictionaries and reconstructions.



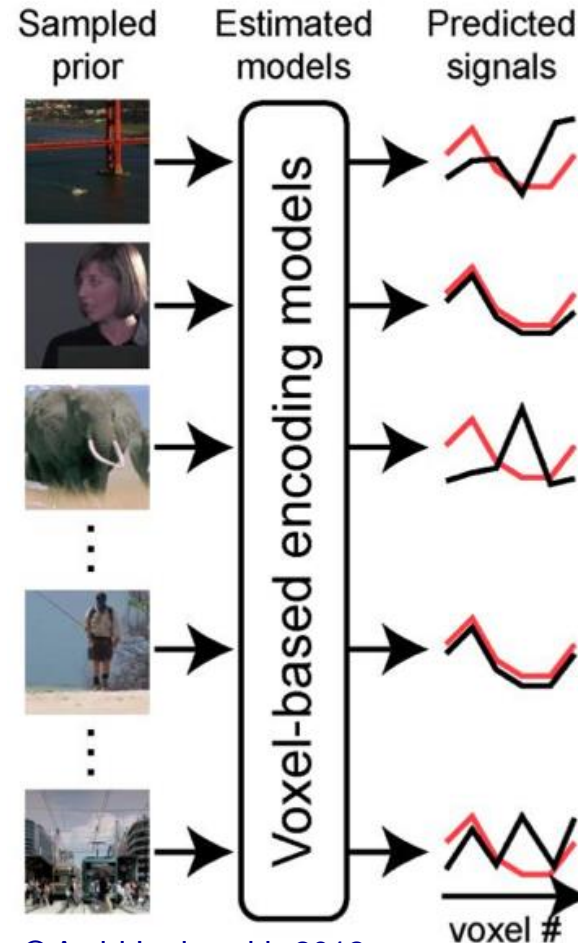
© Arvid Ludervold, 2012

<https://www.youtube.com/watch?v=6FsH7RK1S2E>



Functional Magnetic Resonance Imaging (fMRI)

[4] Build a random library of ~18,000,000 seconds (5000 hours) of video downloaded at random from YouTube. (Note these videos have no overlap with the movies that subjects saw in the magnet). Put each of these clips through the dictionaries to generate predictions of brain activity. Select the 100 clips whose predicted activity is most similar to the observed brain activity. Average these clips together. This is the reconstruction.

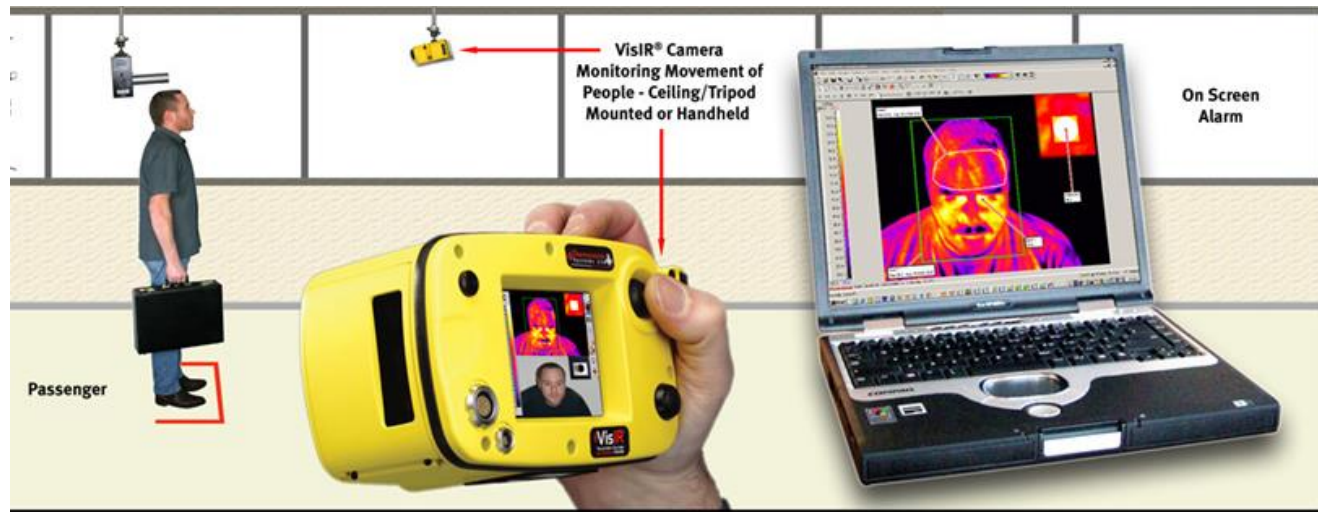
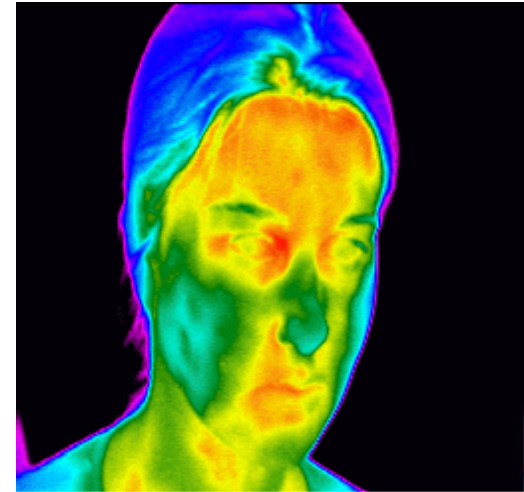


<http://www.youtube.com/watch?v=nsjDnYxJ0bo>



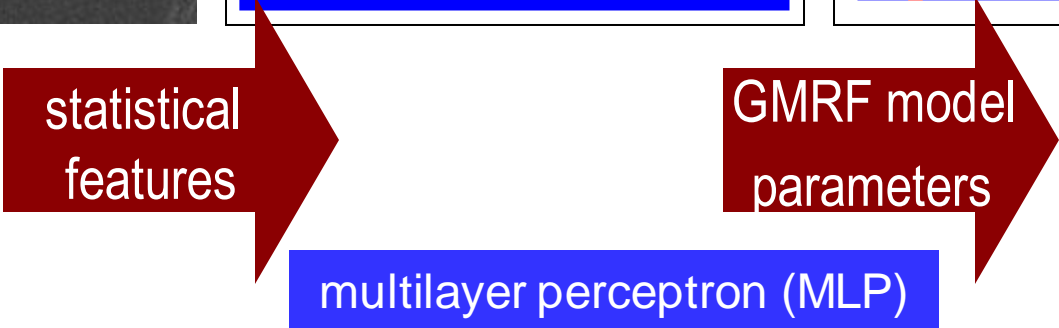
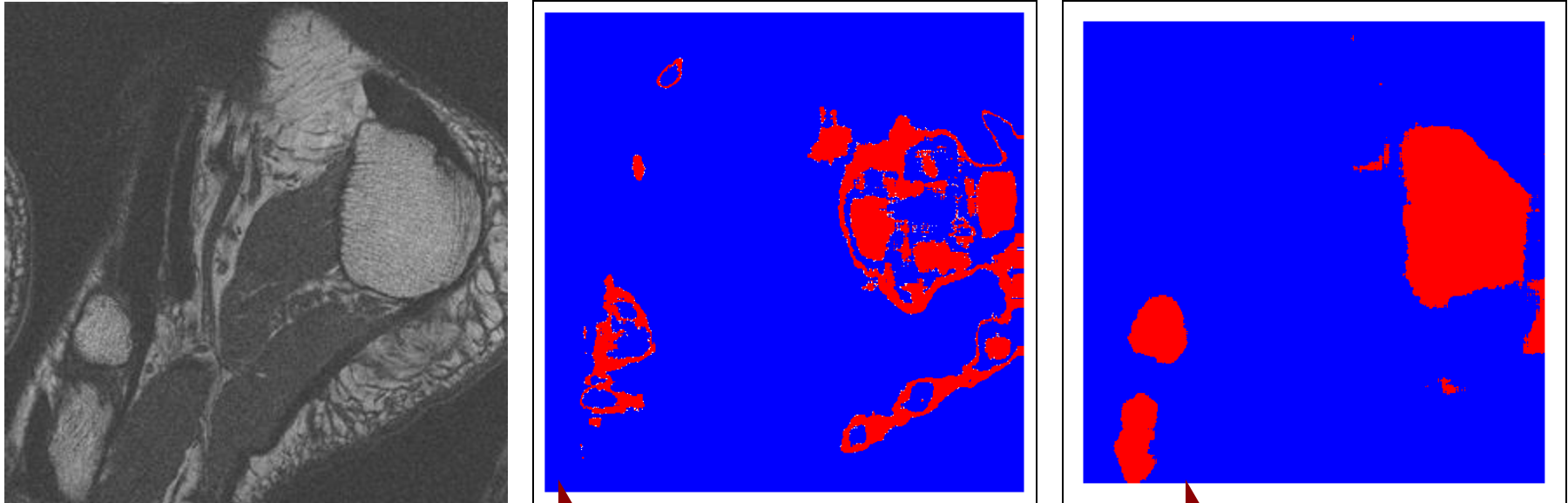
Medical Thermography

- low image quality
- complementary procedure to other diagnostic modalities
- non-invasive examination
- low equipment price, mobility





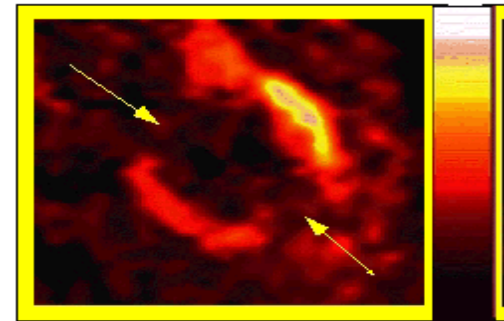
Segmentation of MR foot image





Nuclear Medicine

- different approaches (PET, SPECT, Scintigraphy)
- analysis of molecular changes,
- often together with CT,
- short examination time (limited by half-life disintegration of radioisotope),
- invasive examination,
- high equipment price





Nuclear Medicine

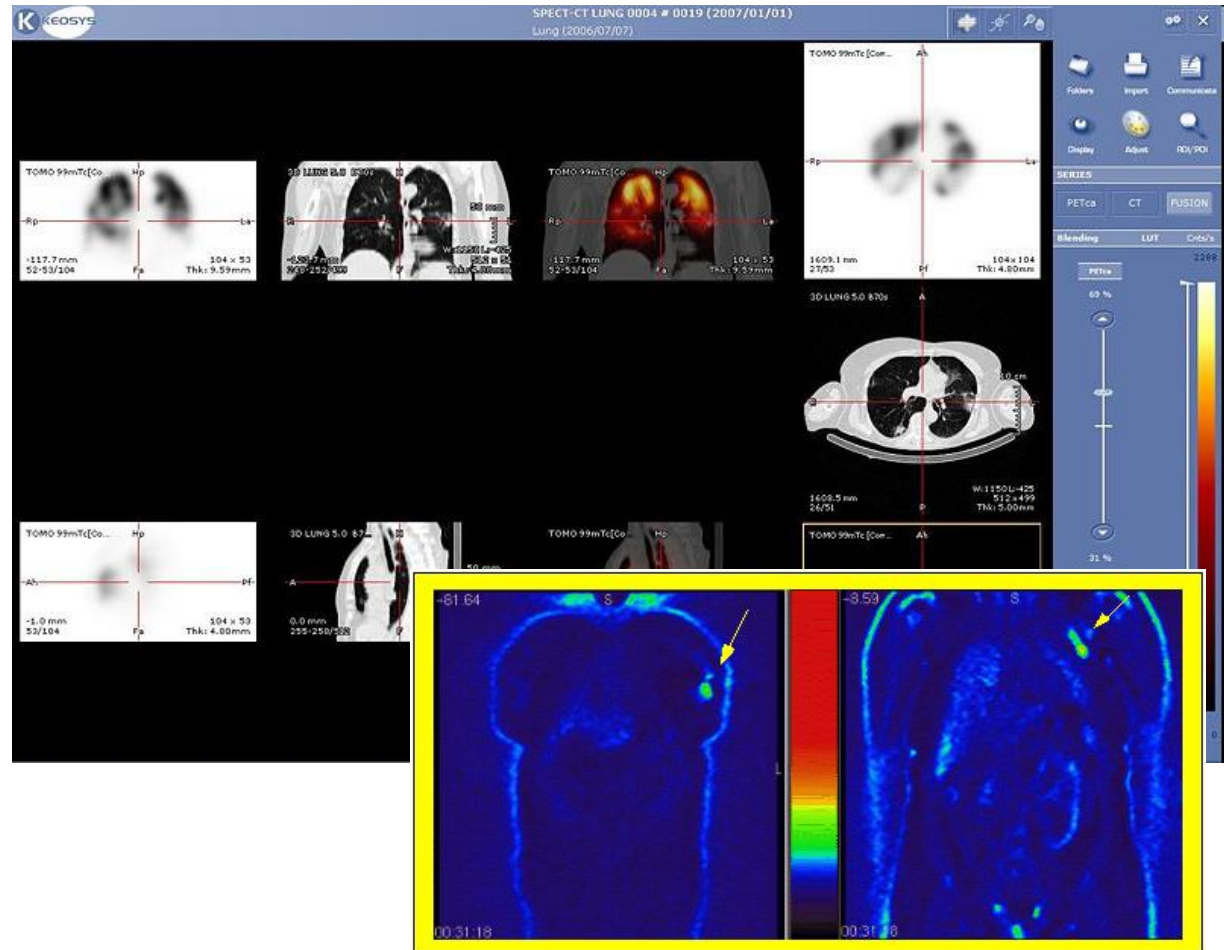
Applications:

almost all medical specialties

Diagnosis:

Huntington,
Alzheimer,
Parkinson diseases

early stage tumor
detection



Endoscopy

- optical images of internal organs,
- additional surgical intervention (laparoscopy),
- endoscopic capsules,
- image processing is necessary,
- invasive examination,
- high equipment price





Endoscopy

Applications:

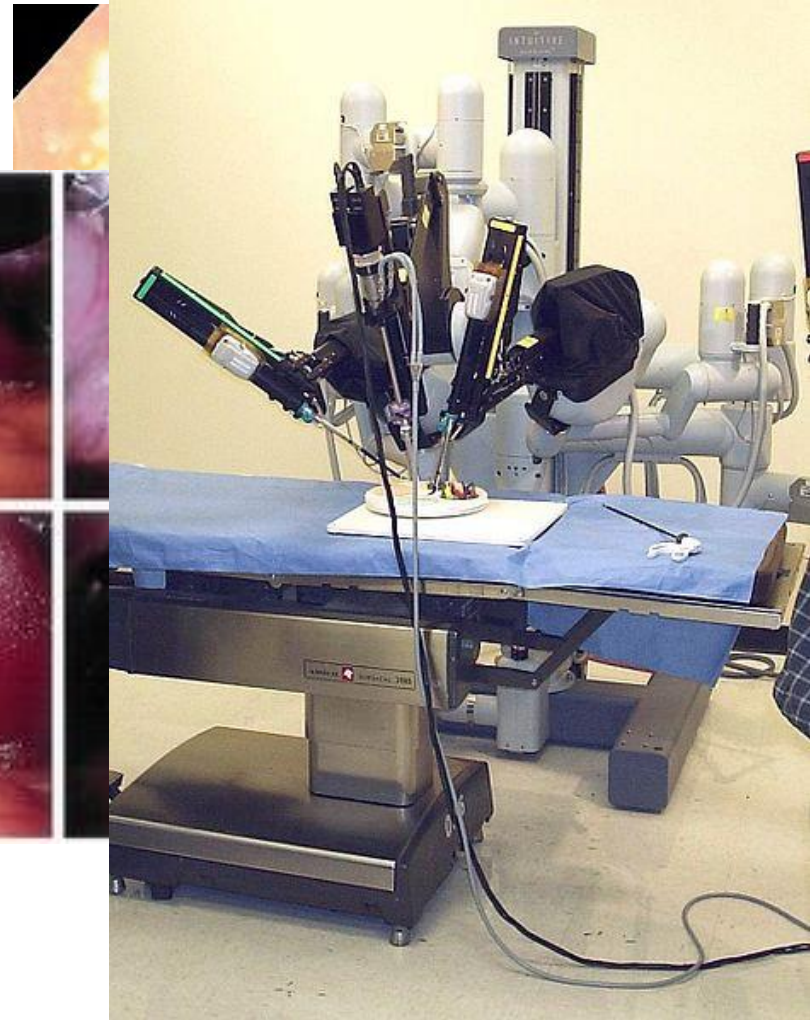
gastrointestinal tract
(stomach, intestine,
colon)

respiratory tract

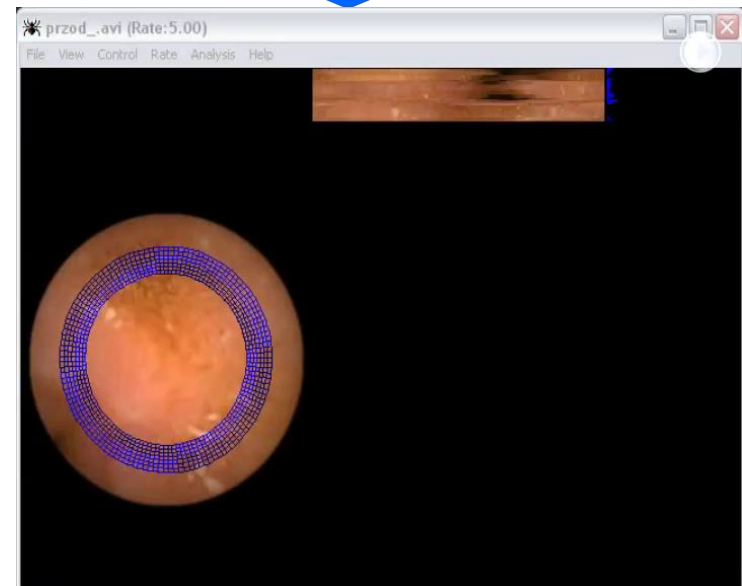
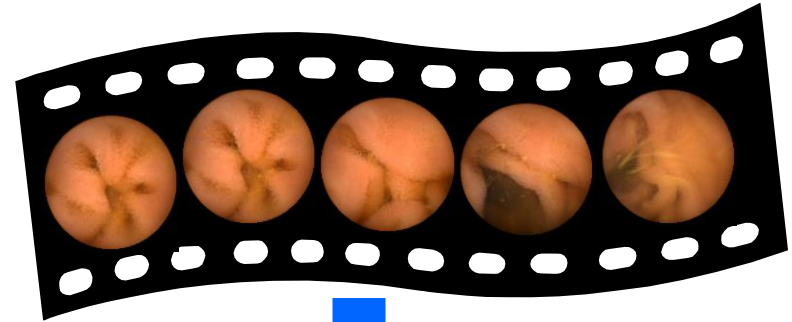
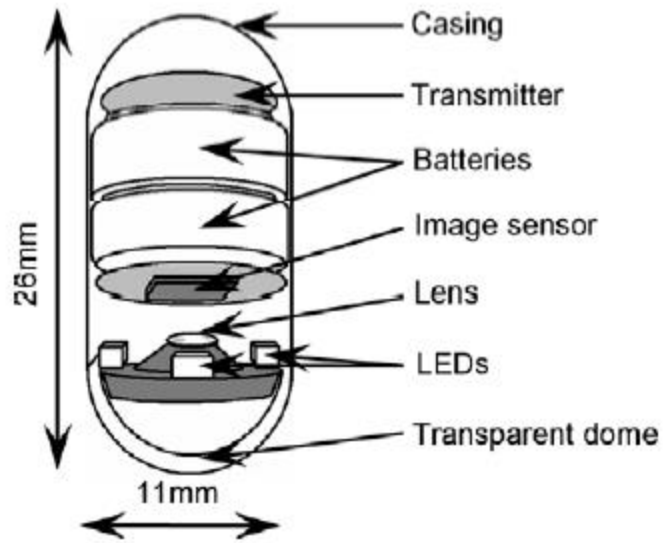
urinary tract

Laparoscopy:

removal of the
gallbladder, polyp,...

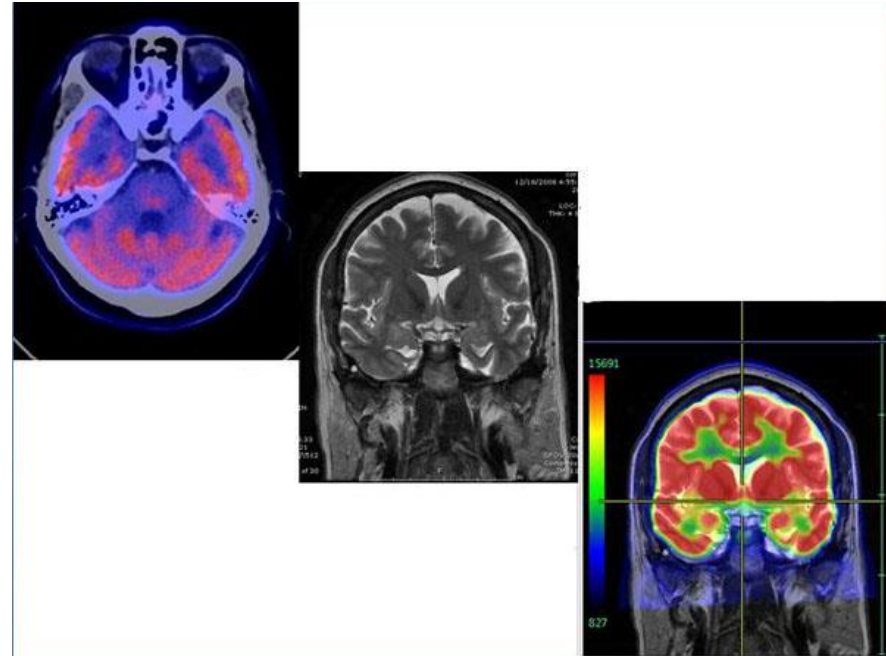
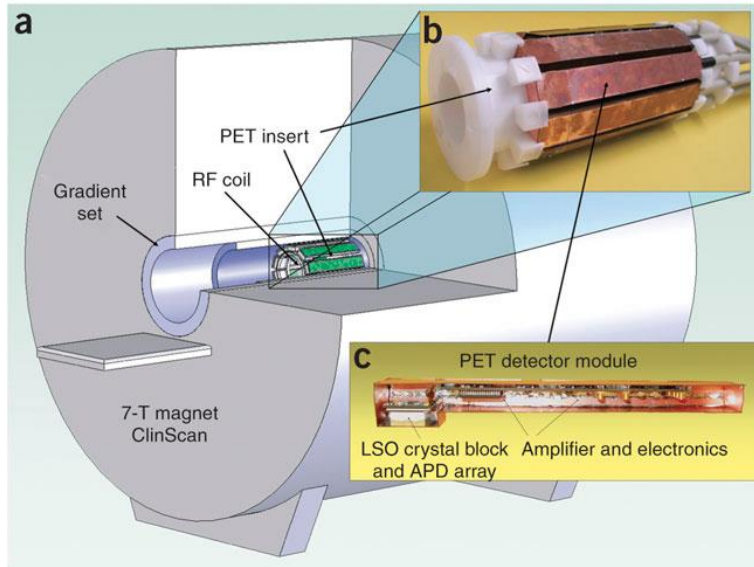


Endoscopic capsule



prof. Piotr Szczypiński, IE

Recent advances: PET + MRI



Imaging device that simultaneously performs positron-emission tomography (PET) and magnetic resonance imaging (MRI) scans, producing more detailed images than either technique alone and thus providing extended diagnostic information.

http://www.youtube.com/watch?feature=player_embedded&v=K2hAcri-ZIE

<https://www.youtube.com/watch?v=r3TiTfMNLw8>



References

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- C. Guy, D. ffytche, An Introduction to The Principles of Medical Imaging, Imperial College Press, 2008
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- http://en.wikipedia.org/wiki/Medical_imaging
- http://en.wikipedia.org/wiki/Computed_tomography

