

Radiography

X-Ray Computed Tomography

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# Objectives

- ▷ Describe the difference between gamma and x-rays
- ▷ Explain how an X-ray image is formed
- ▷ Write down the formula for the Radon transform
- ▷ Draw a schematic diagram describing back-projection
- ▷ Explain how filtered back-projection differs

# Outline

- ▷ Introduction to imaging modalities
- ▷ X-ray and CT basics
- ▷ Image reconstruction
- ▷ The radon transform
- ▷ Filtered back-projection

# Medical imaging modalities

## ▽ Source of energy used for imaging



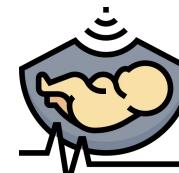
### External Energies



Radiography (RX)  
Computed Tomography (CT)



Dental Cone Beam CT



Ultrasound Imaging  
& Tomography

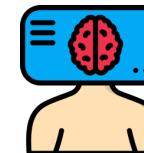
### Internal



Nuclear medicine:

- Single Photon Emission Tomography (SPECT)
- Positron Emission Tomography (PET)

### Internal & External



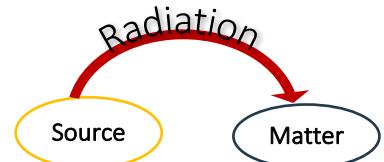
Magnetic Resonance  
Imaging:  

- MRI
- fMRI
- pMRI

Figure 1. Different medical imaging modalities

Icons made by [smashingstocks](#), [Eucalyp](#), [Eucalyp](#), [Freepik](#), [Smashicons](#) from [Flaticon](#)

# Radiation



- ▷ Emission of energy from a source through space or a material medium
- ▷ Described as *wave* and as particle-like units called *photons*
- ▽ Produced in one of two ways
  - ▷ Interaction of a particle with matter
  - ▷ Radioactive decay of an unstable atom
- ▽ Transfer of energy from emitted radiation to matter
  - ▷ Ionization
  - ▷ Excitation

Table 1. The two types of radiation

Radiation	Energy	Mass	Charged	Examples
Electromagnetic	✓	✗	✗	- X-rays - gamma ( $\gamma$ ) radiation
Particulate	✓	✓	✓✗	- beta radiation ( $\beta$ ) - alpha radiation ( $\alpha$ ) - neutrons

## Electromagnetic (EM) wave

- ▷ Consisting of oscillating electric ( $E$ ) and magnetic ( $B$ ) waves
- ▷  $E$  and  $B$  are perpendicular to each other and to the direction of propagation

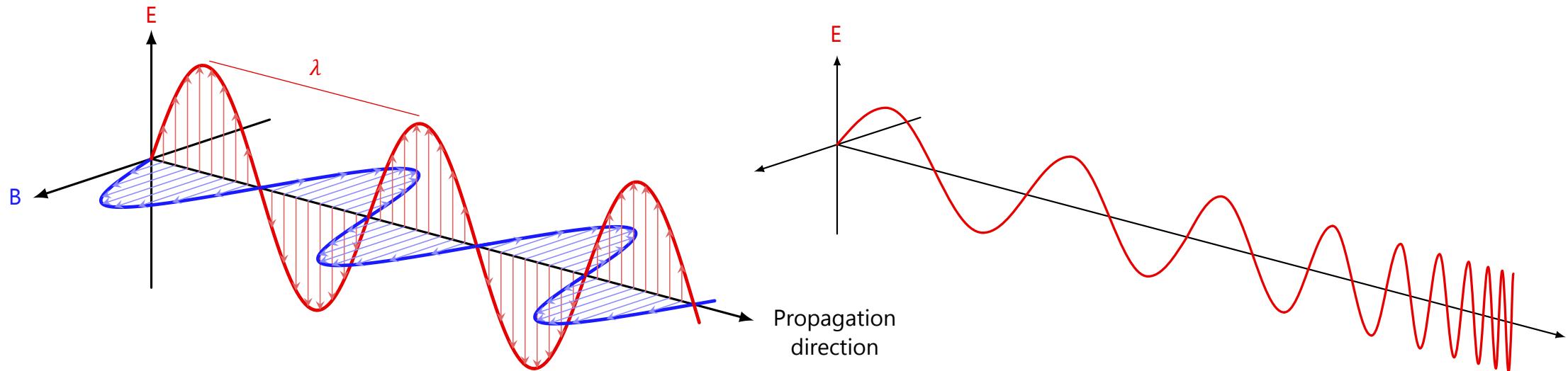


Figure2. The electromagnetic wave and wavelength  
Figures made using [TinZ.net](#)

## EM wave

- ▷ EM radiation is characterized by wavelength ( $\lambda$ ), frequency (f), and energy per photon (E)
- ▷ The energy of a photon:  $E = hf = \frac{hc}{\lambda}$

$\begin{cases} h : \text{Planck's constant} \\ c : \text{speed of the light} \\ hc = 1.2397 \times 10^{-6} \text{ eV} \end{cases}$

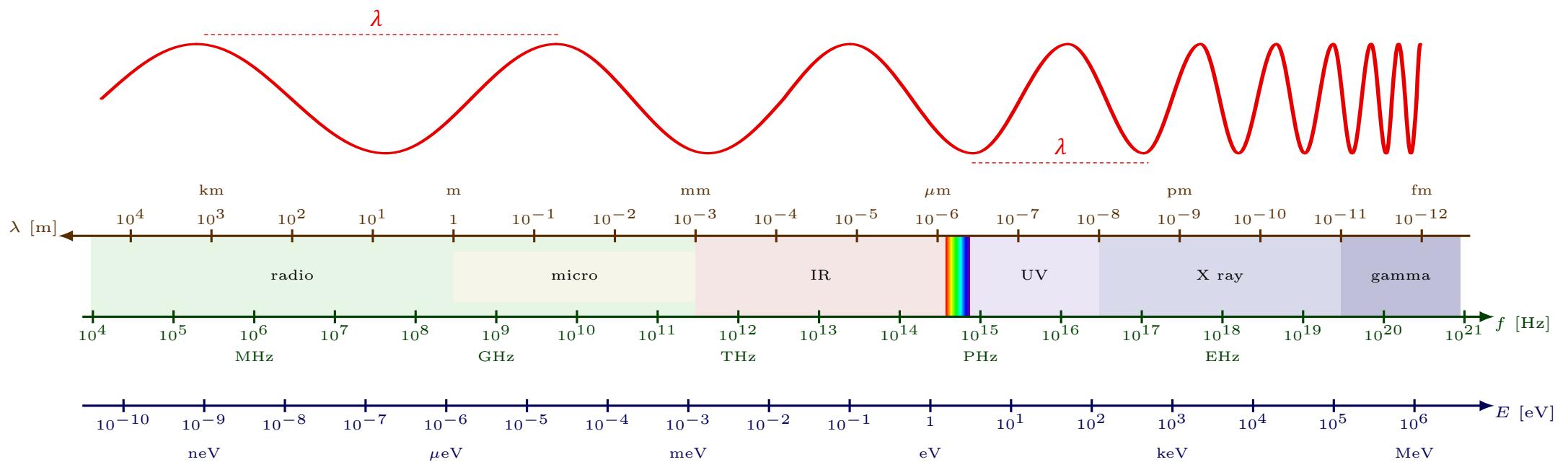
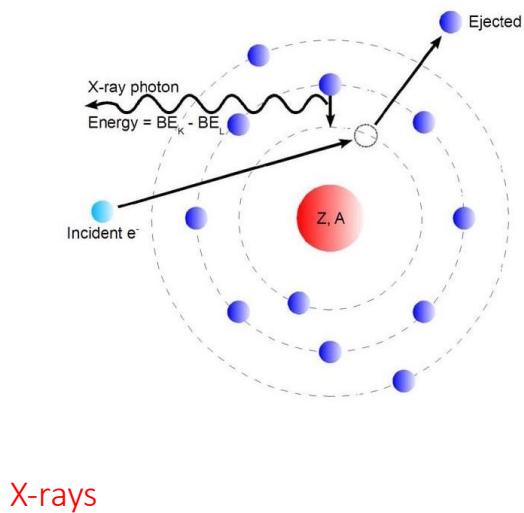


Figure 3. The electromagnetic spectrum  
Figure made using [TikZ.net](#) and [StackExchange](#)

## How is radiation produced?

- Interaction of a particle with matter
- Radioactive decay of an unstable atom



X-rays

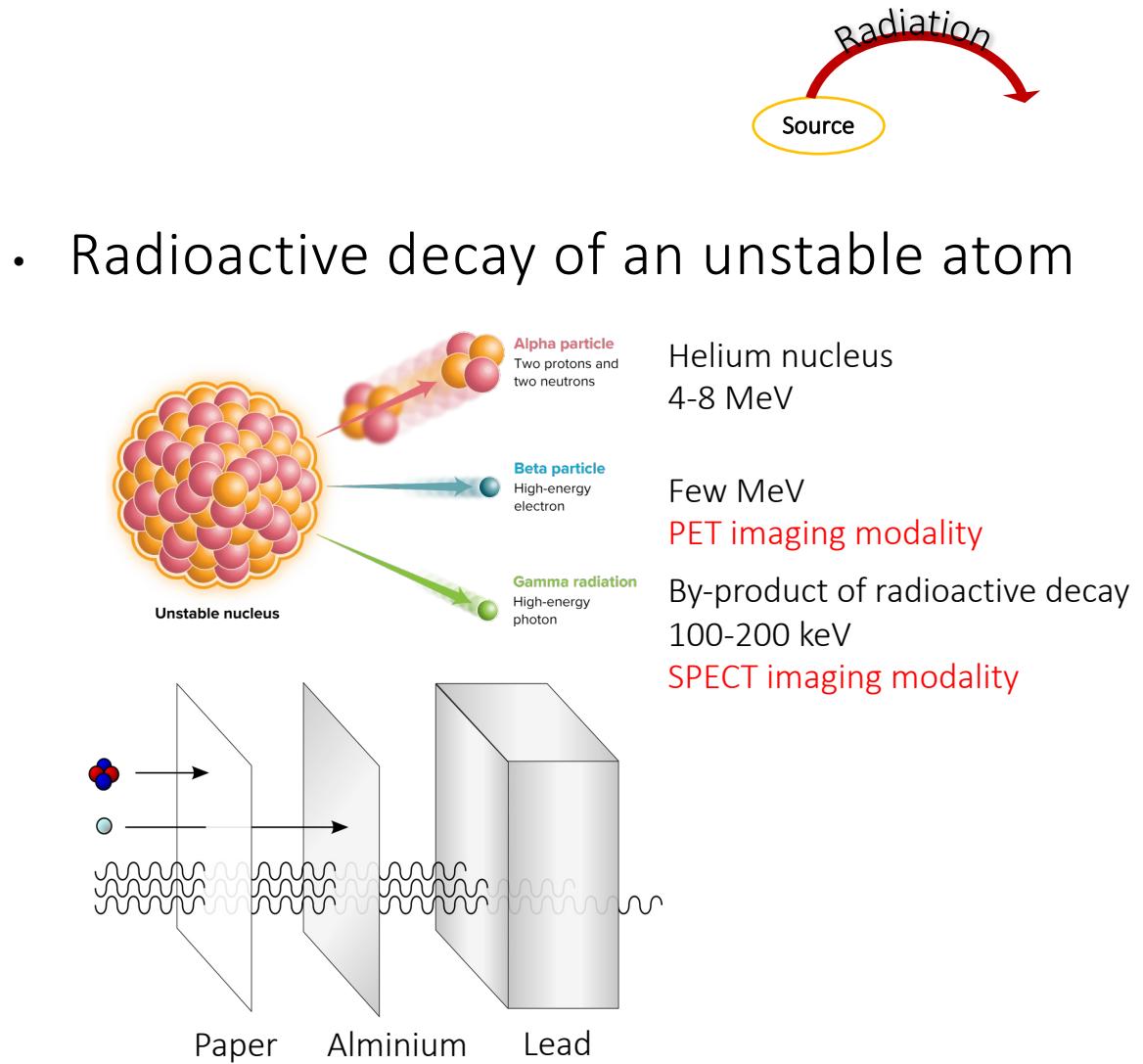
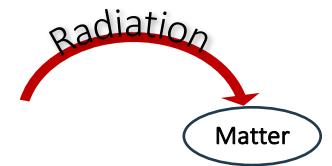


Figure 4. Radioactivity and the ability of ionizing radiation to penetrate matter

Figure from [OMP](#), [Knowablemagazine](#), and [Wikipedia](#)

# Transfer of energy from emitted radiation to matter



Depending on its *energy* and ability to *penetrate matter* a radiation can be

▽ Ionizing radiation

- High energy ( $>13.6 \text{ eV}$ ) radiation
- Cause *ionization* in the medium through which it passes
- Ionization: an atom or a molecule acquires a negative or positive charge by gaining or losing electrons to form ions

▽ Excitation (non-ionizing) radiation

- Low energy ( $< 13.6 \text{ eV}$ ) radiation
- Cannot form an ion in the medium through which it passes but change some configuration in the atom or molecule



Figure 5. Transfer of energy from radiation to matter

Figure made using [TikZ.net](#)

- alpha particles
- beta particles
- neutrons

## X-rays vs. gamma rays

- ▽ Distinguish based on *wavelength*
  - ▷ X-rays:  $10^{-9} - 10^{-11}$
  - ▷ Gamma rays:  $10^{-11} - 10^{-13}$
  - ! Only possible if the wavelength is known
  
- ▽ Distinguish based on their *source*
  - ▷ X-rays are emitted by electrons
  - ▷ gamma rays are emitted by the atomic nucleus

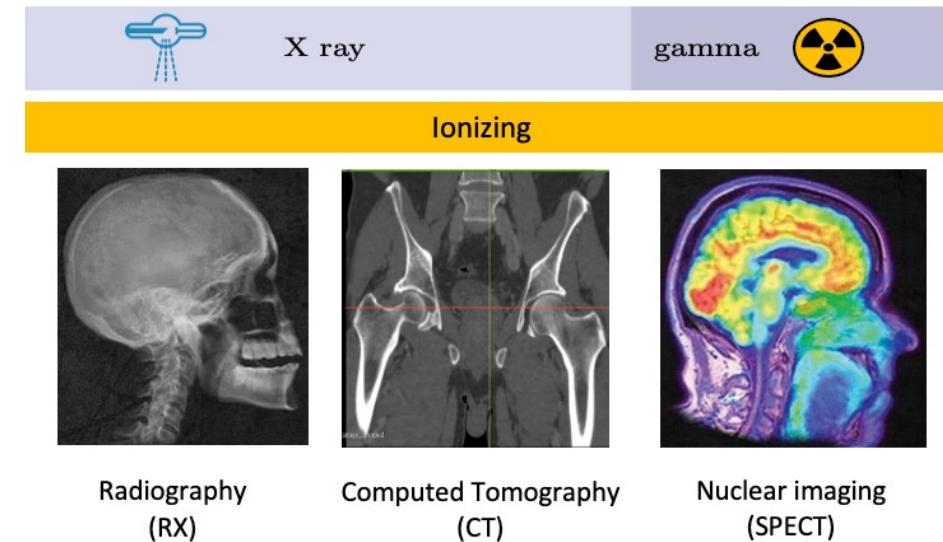


Figure 6. x-rays vs. gamma rays

Figures from [Radnet](#)

*Q: Compare the photon energy of x-ray and gamma-rays...*

# X-rays Source

## X-ray tube diagram

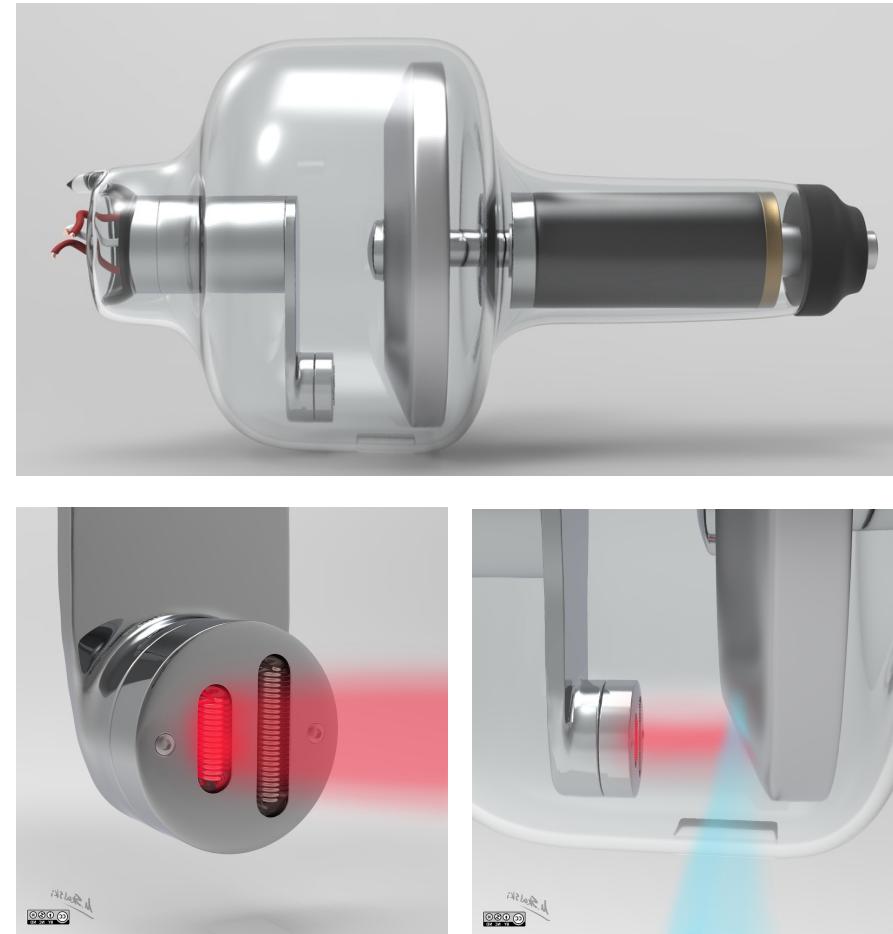
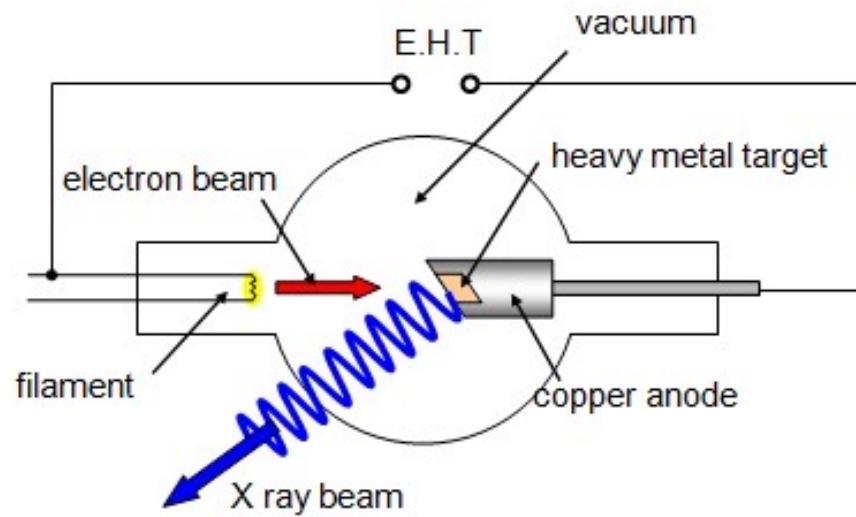


Figure 7. x-ray tube  
Figures from [E&C](#) and [TubeDiagrams](#)

## How are X-rays released?

Generated as the result of interactions of high-speed electrons with heavy target atoms

- ▷ Brehmsstrahlung : A continuous X-ray spectrum
- ▽ Characteristic radiation
  - An accelerated electron loses energy in interaction with an atom and the loss of energy emits X-ray photons in a scattered direction

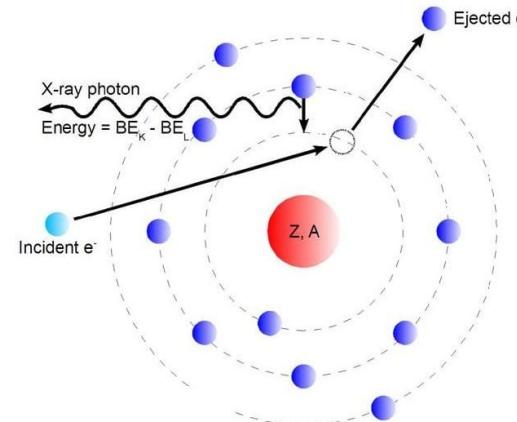
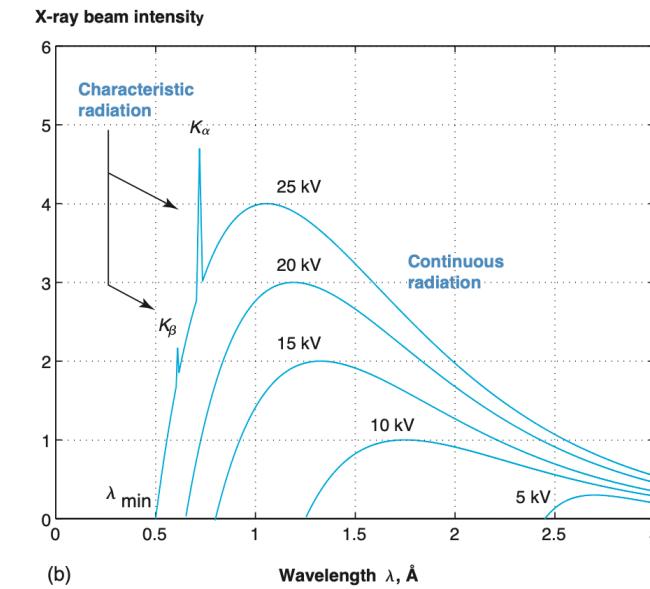


Figure 8. source of x-ray  
Figure from [OMP](#) and [FoMI](#)



# Radiography

## Radiography images

- ▷ 2D images
- ▷ Diagnose of structural damage, abnormalities,...



Frontal chest radiograph  
Figure from [radiology cafe](#)



Normal hip X-ray  
Figure from [CSS](#)

Figure 9. Radiography examples

## Interaction x-ray beam with tissue

- ▷ Material with thickness of  $d = x_{\text{out}} - x_{\text{in}}$
- ▽ Homogeneous matter:

$$I_{\text{out}} = I_{\text{in}} e^{-\mu d}$$

$\mu \begin{cases} \text{linear attenuation coeff. (cm}^{-1}\text{)} \\ f(E, \text{material}) \end{cases}$

$\mu(10\text{keV, H}_2\text{O}) = 5 \text{ cm}^{-1}$   
 $\mu(100\text{keV, H}_2\text{O}) = 0.17 \text{ cm}^{-1}$

- ▽ Non-homogeneous matter, single photon energy:

$$I_{\text{out}} = I_{\text{in}} e^{-\int_{x_{\text{in}}}^{x_{\text{out}}} \mu(x) dx}$$

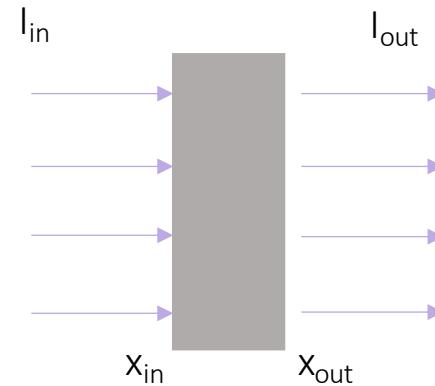


Figure 10. Attenuation

# X-ray image reconstruction

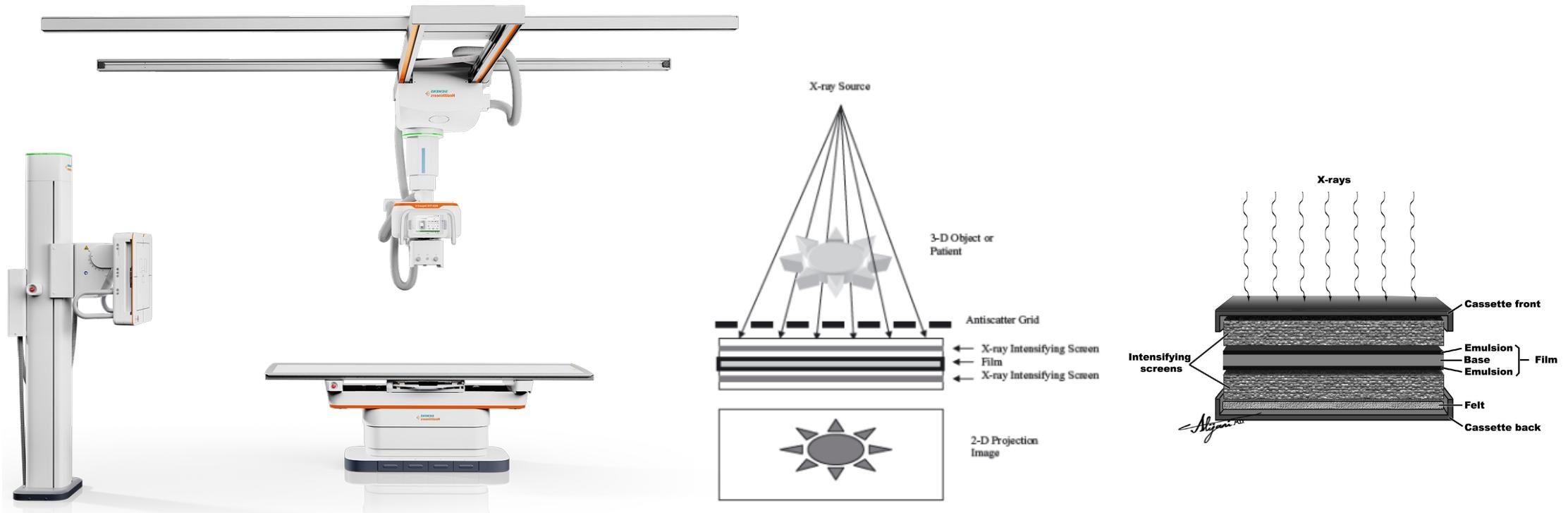


Figure 11. X-ray scanner machine and the screen-film detector

Figure from [Siemens](#) and [MIA book](#), and the [RK](#)

## X-ray image quality

### ▽ Resolution

- The effective size of the X-ray tube
- The distance between the X-ray source and the patient
- The thickness of the intensifying screen
- The speed of X-ray film

### ▽ Contrast: the intensity difference in adjacent regions of the image

- The attenuation coefficient of what is imaged
- Clinically one can inject/orally administer materials that increase the total attenuation coefficient

### ▽ Signal-to-noise ratio (SNR)

- The X-ray exposure
- Source and detector instrumentation
- Thickness and heterogeneity of the tissue
- Scattering
- Contrast agents

BREAK  
10 min

# X-ray Computed Tomography (CT)

## Computed Tomography (CT) images

- ▷ 3D detailed information of the structures inside the body
- ▷ Diagnose bone disorders, damage to internal organs, cancer , ...

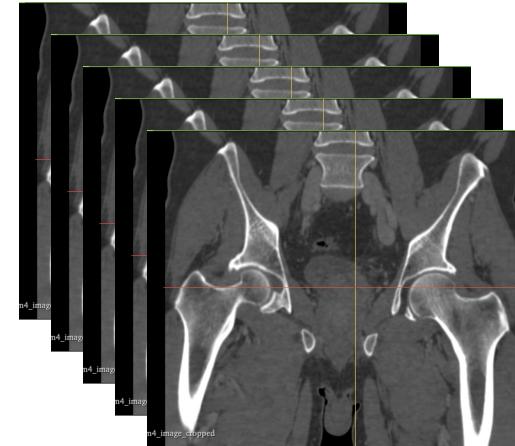
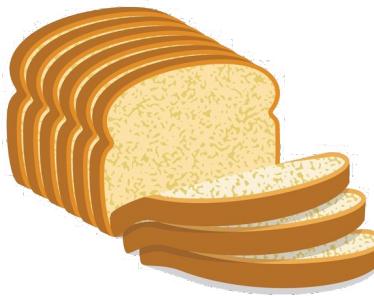


Figure 12. CT example of the hip joint area  
Figures from [LibHip](#) github repository and [ClipartMax](#)

## X-ray Computed Tomography (CT)

- ▷ Imaging modality that produces cross-sectional images of the body
- ▷ X-rays produced by an X-ray tube, attenuated by the patient, and measured by an X-ray detector

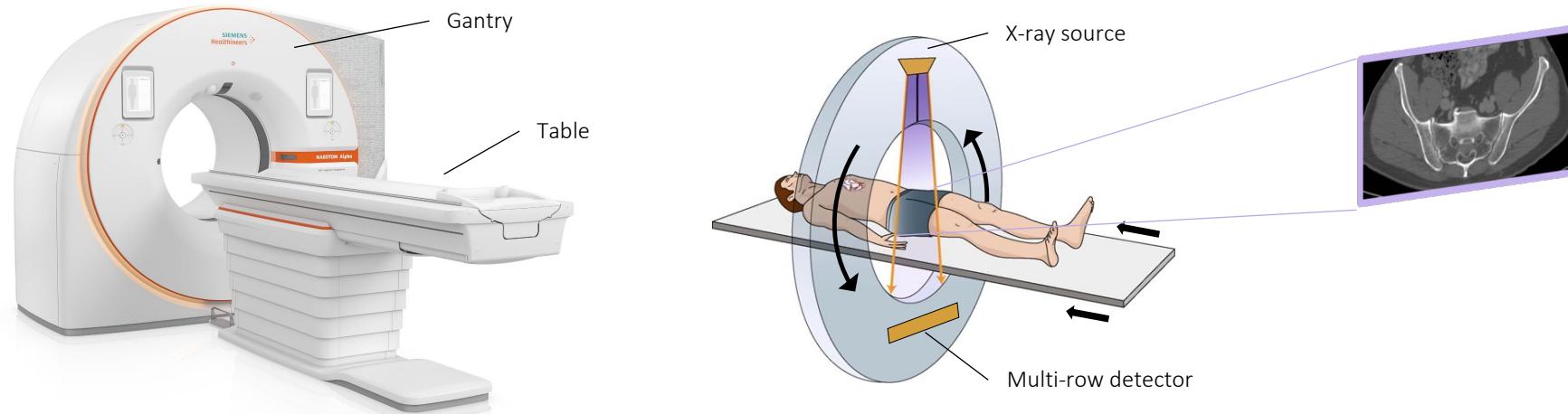
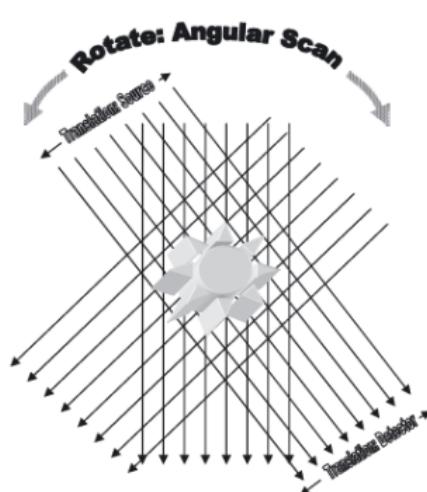


Figure 13. CT scanner machine and the main parts  
Figure from [Siemens](#), [CardiacCT book](#), and [LibHip](#)

## CT: many X-rays!



1<sup>st</sup> generation

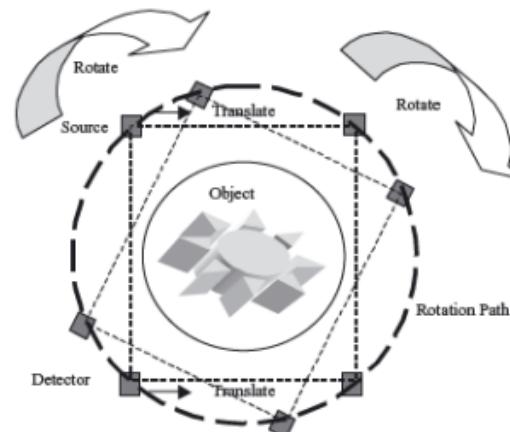
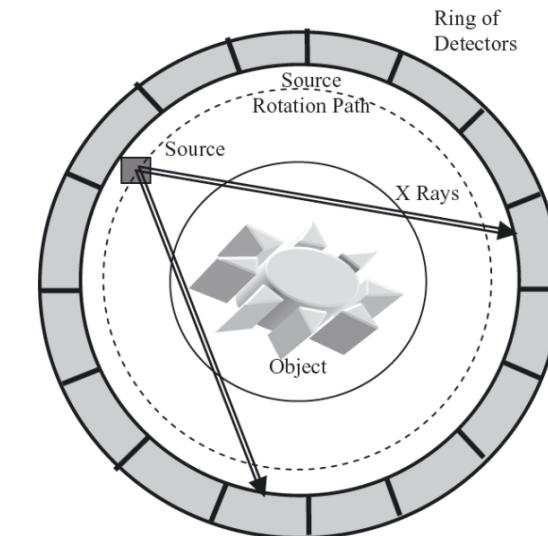


Figure 14. CT basic principles  
Figure from the [MIA book](#)



4<sup>th</sup> generation

# Imaging in three dimensions

## ▽ Single-slice CT

- Detector CT yields a single slice (2D) and via movement along the z direction one arrives at a 3D volume

## ▽ Multi-slice CT

- Can acquire multiple 2D slices at the same time, hence creating a 3D volume

## ▽ Spiral CT (often already multi-slice):

- Faster scan at lower radiation dose
- Slightly sacrifices image resolution and sharpness
- Higher temporal resolution allows gated imaging

## CT image quality

- ▷ Same restrictions as for X-ray imaging
- ▽ Additional impact on resolution & SNR:
  - Correlated with the number of projections (angular sampling) and number of detectors (projection sampling); for higher spatial resolution, data must be acquired with higher sampling rate in the projection space
  - BUT the higher sampling rate is compromised by the limitations on scan time, method of data collection, and detector size and efficiency

## Let's do an experiment...

Spend 10 minutes in your study groups looking up and discussing what the **Radon transform** is and try to summarize what it does, by adding a post to my Radon transform thread in the discussion forum on Absalon!

## CT image reconstruction

- ▷ Most common form is still (filtered) back projection
- ▷ Also exist iterative methods for reconstruction e.g. OSEM reconstruction
- ▷ Depends on type of imaging – transmission or emission
- ▷ Also depends on the scanner shape! E.g. Siemens HRRT is not circular and hence filtered back projection is not implemented, but only OSEM

## Data acquisition

- Non-homogeneous matter, single photon energy:

$$\begin{bmatrix} r \\ s \end{bmatrix} = \begin{bmatrix} \cos \theta & \sin \theta \\ -\sin \theta & \cos \theta \end{bmatrix} \begin{bmatrix} x \\ y \end{bmatrix}$$

$$\begin{bmatrix} x \\ y \end{bmatrix} = \begin{bmatrix} \cos \theta & -\sin \theta \\ \sin \theta & \cos \theta \end{bmatrix} \begin{bmatrix} r \\ s \end{bmatrix}$$

$$\begin{aligned} I_\theta(r) &= I_0 \cdot e^{- \int_{L_{r,\theta}} \mu(x,y) ds} \\ &= I_0 \cdot e^{- \int_{L_{r,\theta}} \mu(r \cos \theta - s \sin \theta, r \sin \theta + s \cos \theta) ds} \end{aligned}$$

$$\begin{aligned} P_\theta(r) &= -\ln \frac{I_\theta(r)}{I_0} \\ &= \int_{L_{r,\theta}} \mu(r \cos \theta - s \sin \theta, r \sin \theta + s \cos \theta) ds \end{aligned}$$

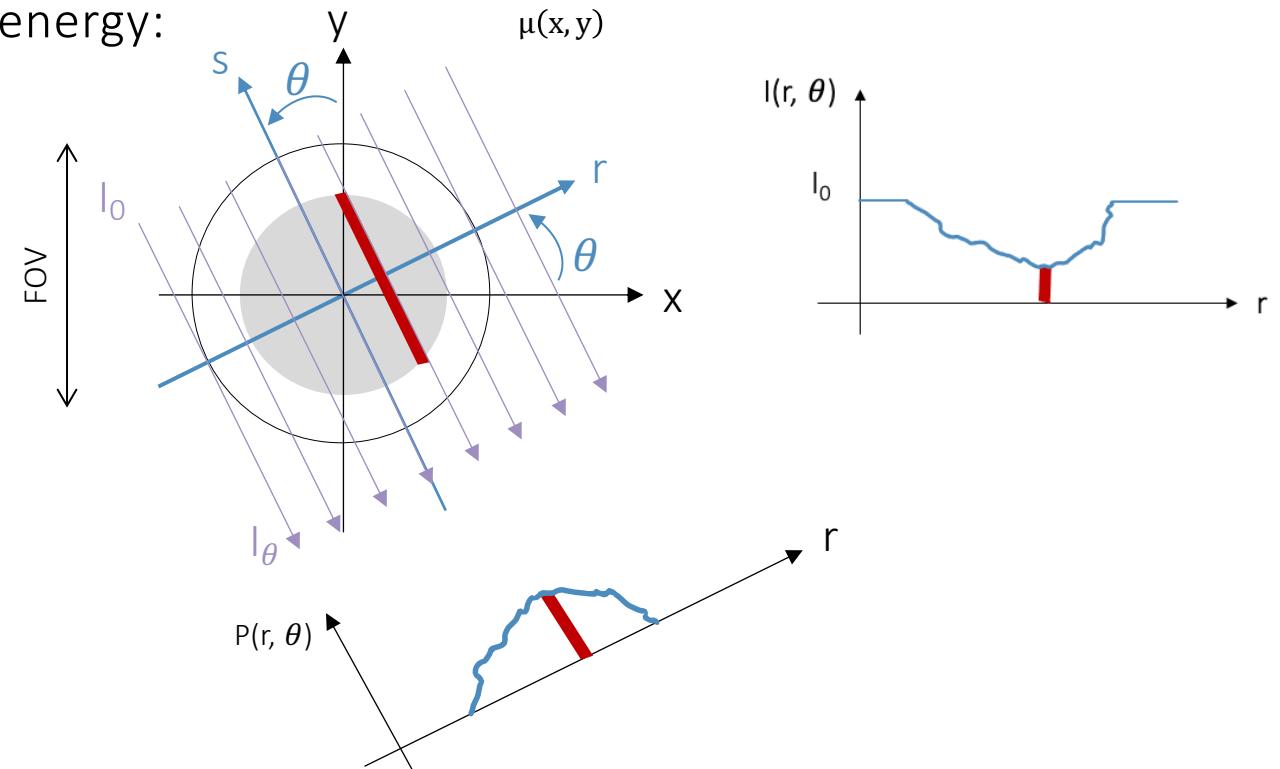


Figure 15. Data acquisition in CT

# The Radon transform

▽ Objective function  $f(x, y)$

$$x \cos \theta + y \sin \theta = r$$

$$-x \sin \theta + y \cos \theta = s$$

$$\begin{aligned} P(r, \theta) &= R\{f(x, y)\} = \int_L f(x, y) dl \\ &= \int_{-\infty}^{\infty} f(r \cos \theta - s \sin \theta, r \sin \theta + s \cos \theta) ds \end{aligned}$$

where the **line integral**  $\int_L$  is computed along the path  $L$ ,  
which are parallel arrow lines defined by angle  $\theta$

Objective function → Projection domain

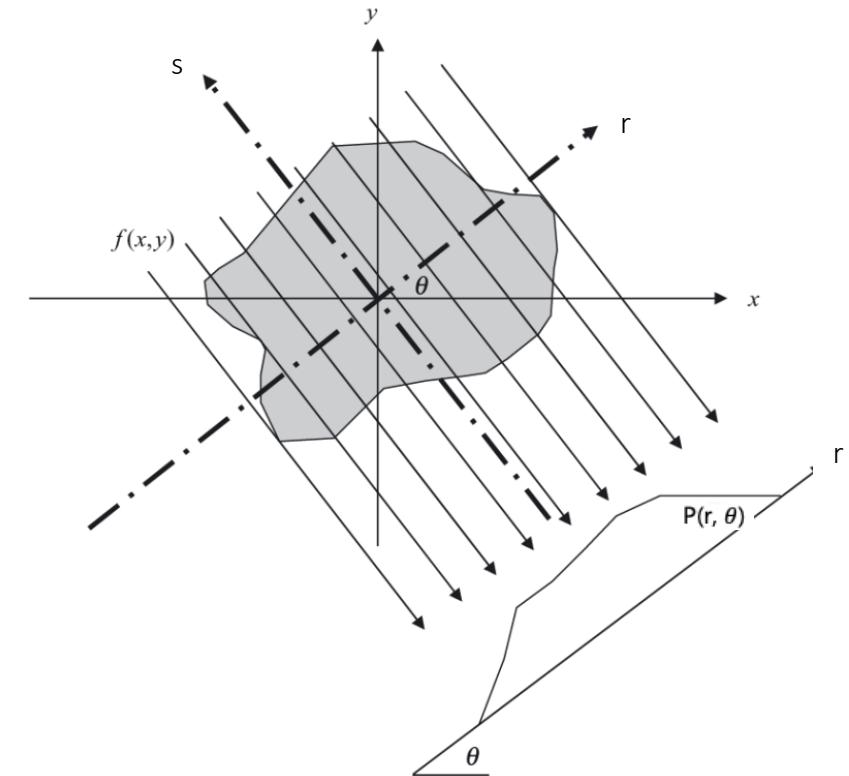


Figure 16. Radon transform from the [MIA book](#)

## 2D image reconstruction

- ▷ Back-projection of line integrals
- ▽ How to reconstruct the distribution  $\mu(x, y)$  from the projection domain?
  - For a particular line  $(r, \theta)$  assign the projection value  $P(r, \theta)$  to all points  $(x, y)$  along that line
  - Repeat this ( i.e., integrate) for  $\theta$  ranging from zero to 180

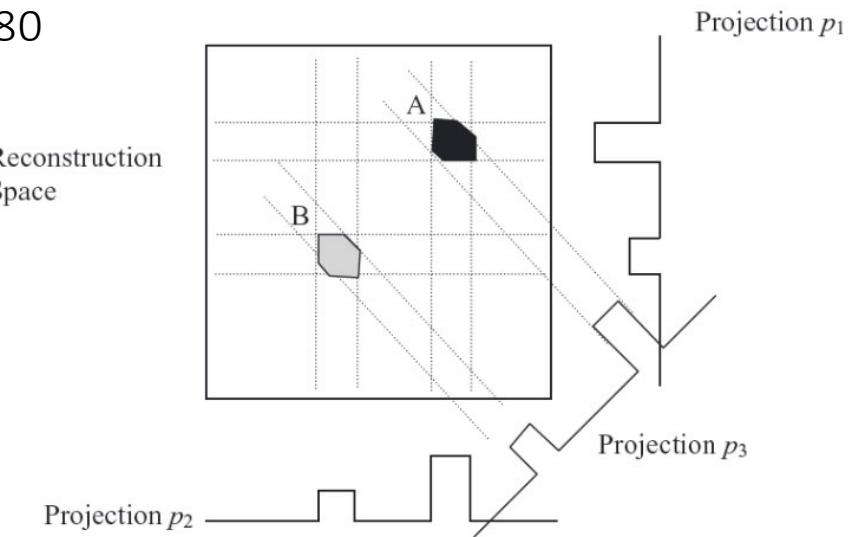


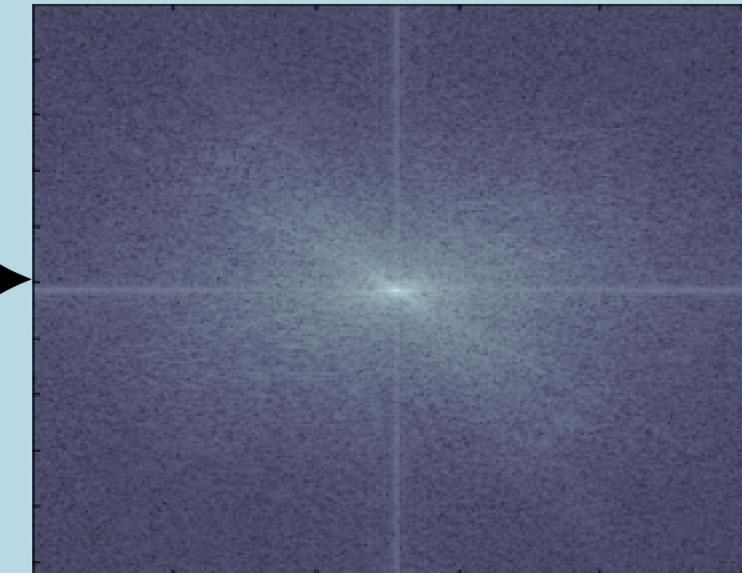
Figure 17. Back-projection

## Quick check – Image vs. Fourier domain



**Spatial Domain**

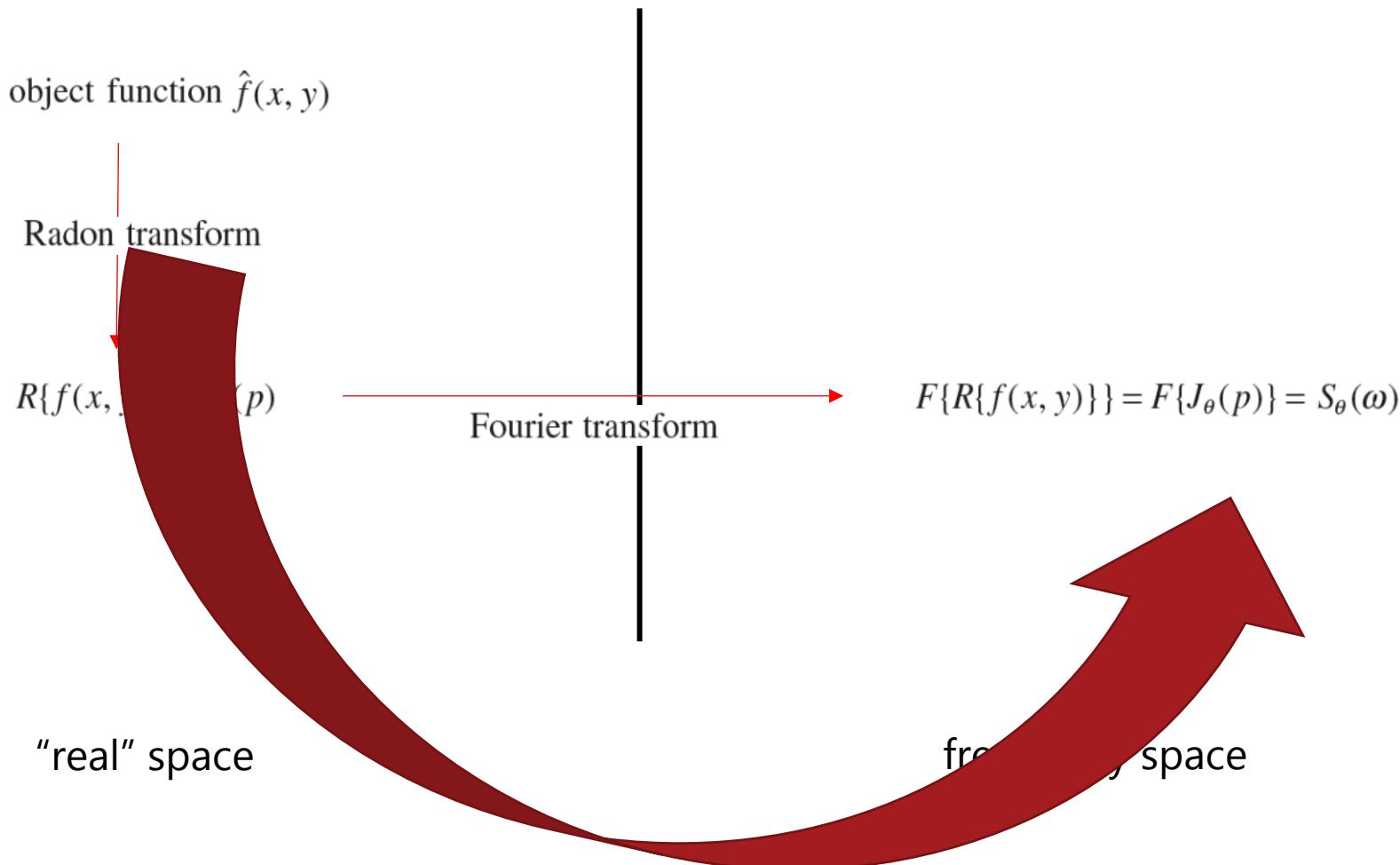
Fourier Transform



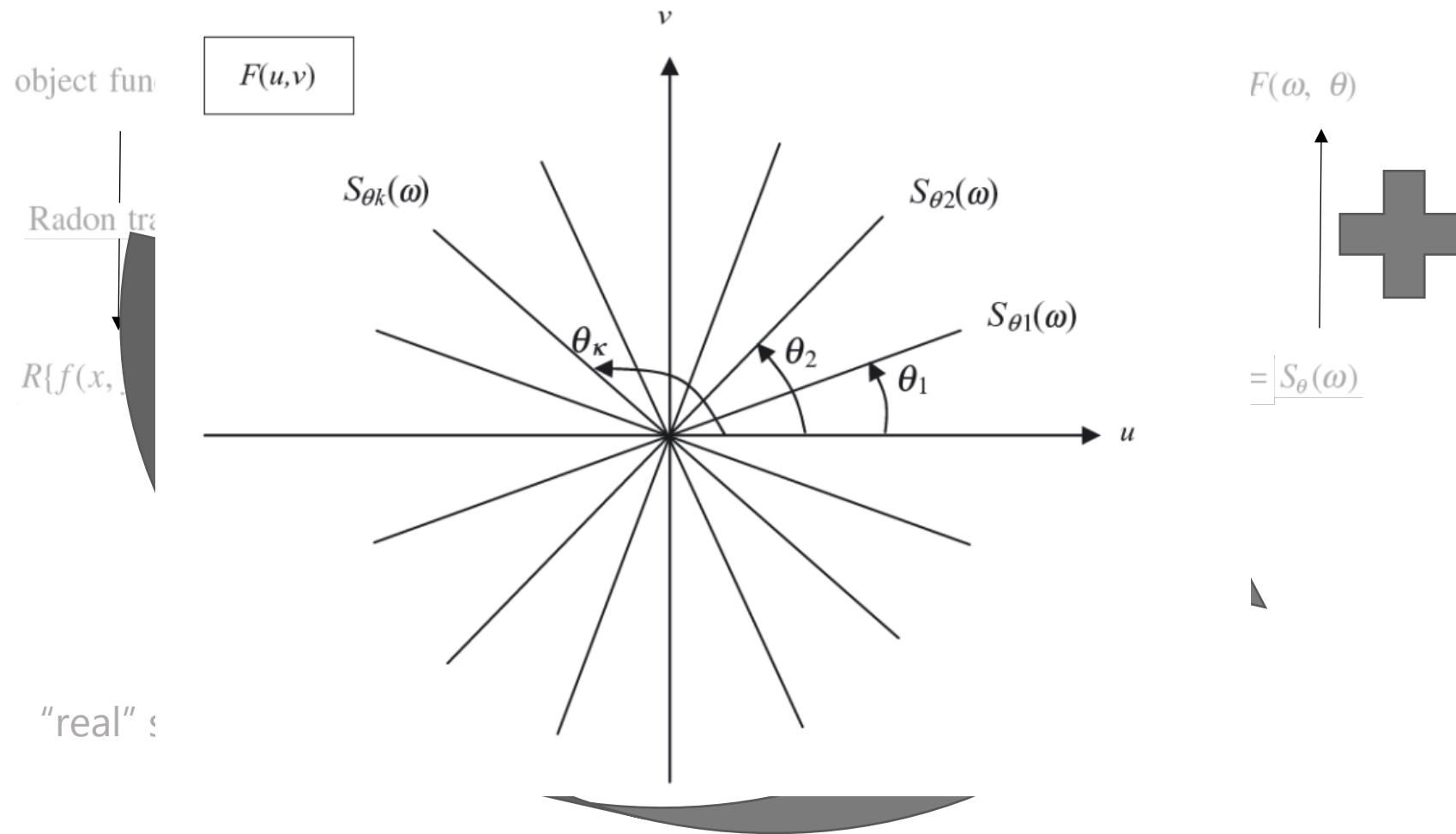
**Frequency Domain**

Figure 18. Figure from [Medium](#)

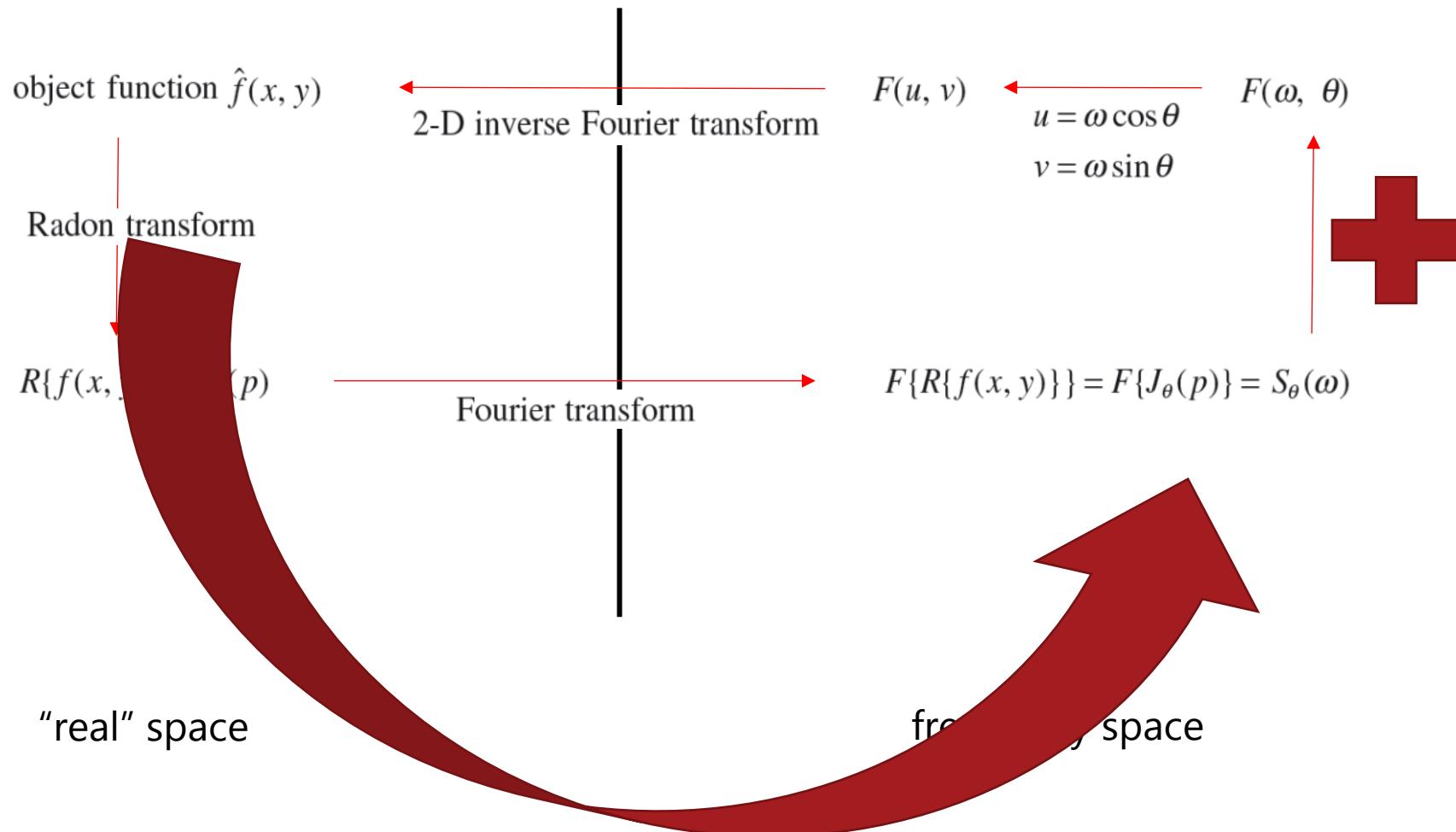
# Central limit theorem & backprojection



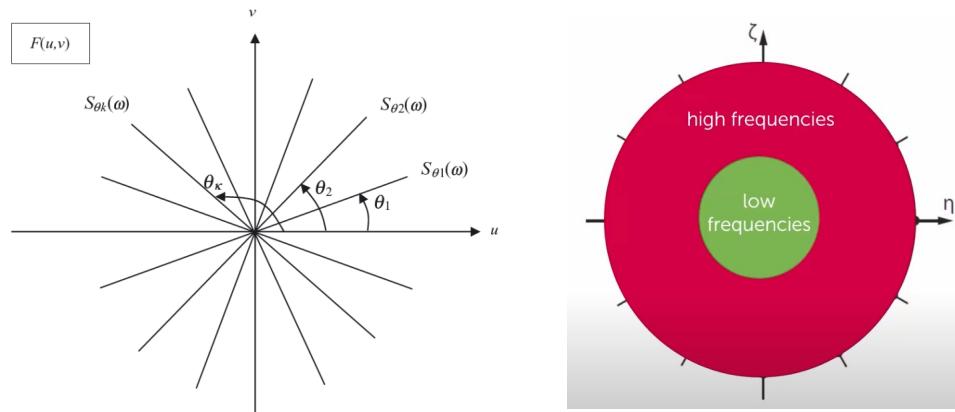
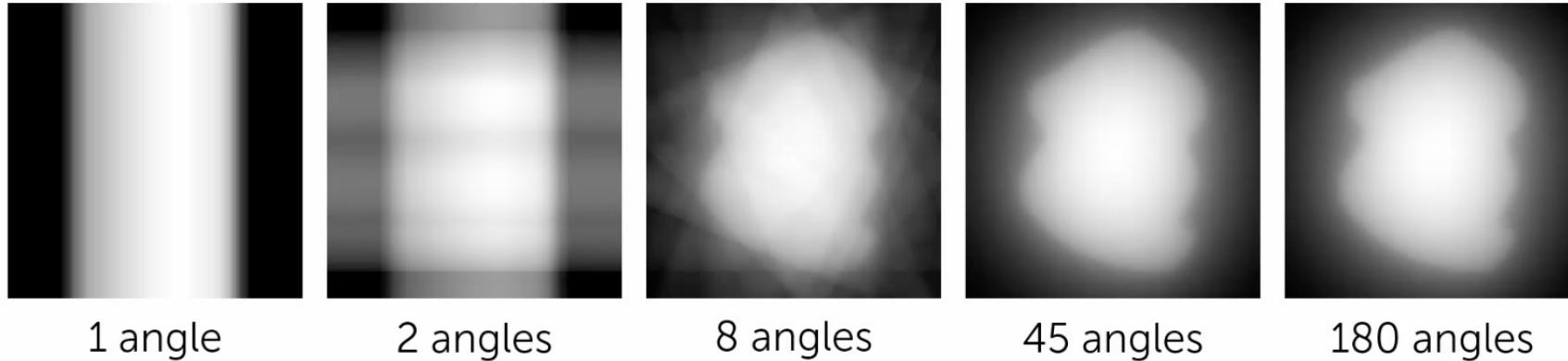
# Central limit theorem & back-projection



# Central limit theorem & backprojection



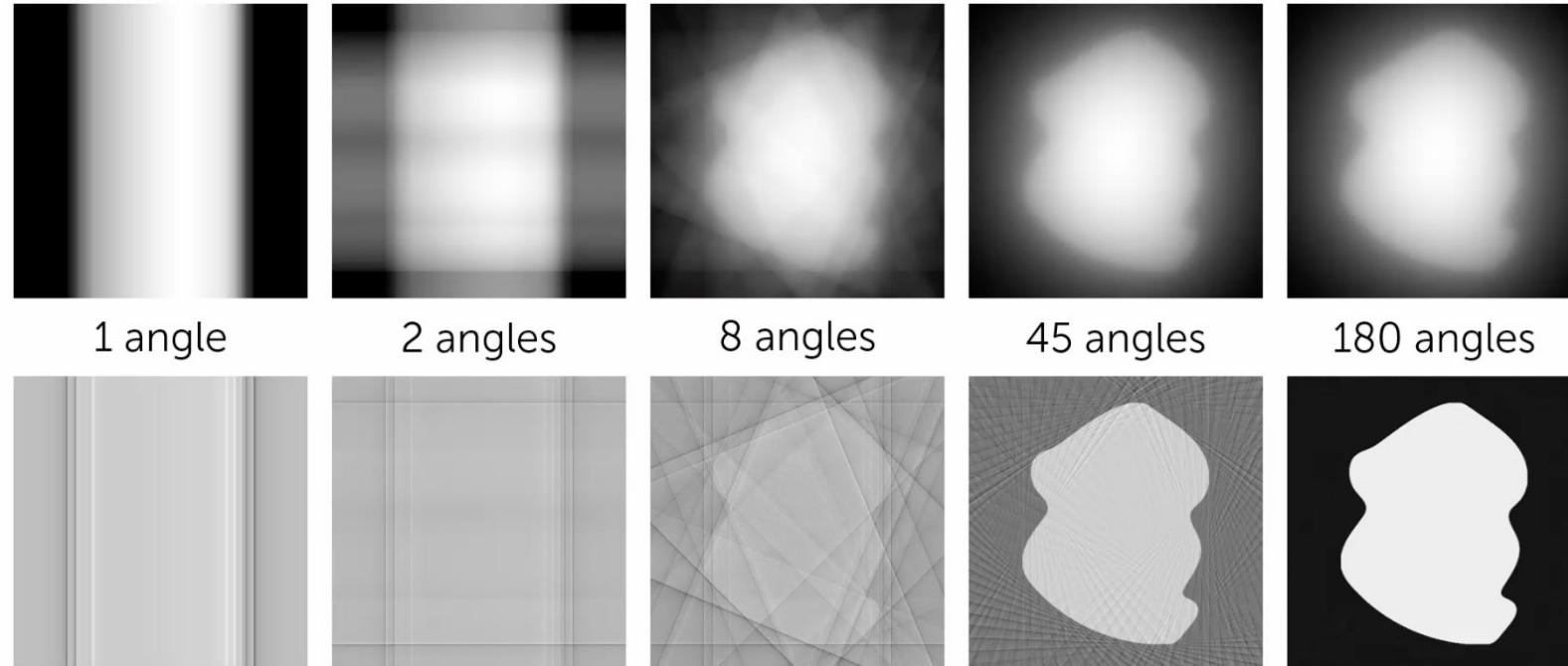
## Blurring in back-projection



Figures are screenshot from [ASTRA Toolbox](#) video . Refer to the video for more information.

# Filtered back-projection

- Filter out low frequencies to avoid blurring.



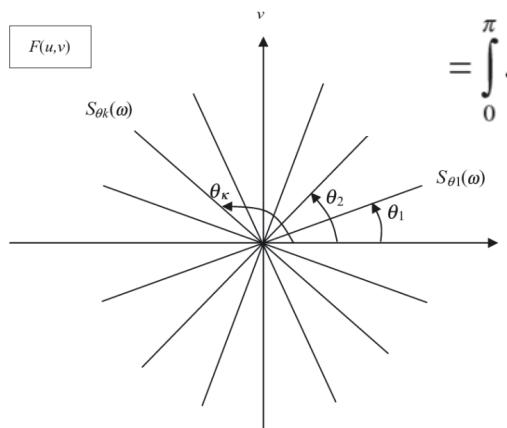
Figures are screenshot from [ASTRA Toolbox](#) video . Refer to the video for more information.

# Filtered back-projection

object function  $\hat{f}(x, y) \quad \hat{f}(r, \theta)$

$$\hat{f}(r, \theta) = \int_0^\pi \int_{-\infty}^\infty F(\omega, \theta) e^{j2\pi\omega(x\cos\theta + y\sin\theta)} |\omega| d\omega d\theta.$$

$$\begin{aligned} \hat{f}(r, \theta) &= \int_0^\pi \int_{-\infty}^\infty |\omega| S_\theta(\omega) e^{j2\pi\omega(x\cos\theta + y\sin\theta)} d\omega d\theta \\ &= \int_0^\pi J_\theta^*(p') d\theta \end{aligned}$$



$$\begin{aligned} J_\theta^*(p') &= \int_{-\infty}^\infty |\omega| S_\theta(\omega) e^{j2\pi\omega(x\cos\theta + y\sin\theta)} d\omega \\ &= \int_{-\infty}^\infty |\omega| S_\theta(\omega) e^{j2\pi\omega p'} d\omega \\ &= F^{-1}\{|\omega| S_\theta(\omega)\} \\ &= F^{-1}\{|\omega|\} \otimes J_\theta(p) \\ &= \int_{-\infty}^\infty J_\theta(p') h(p - p') dp' \end{aligned}$$

By limiting spatial frequencies

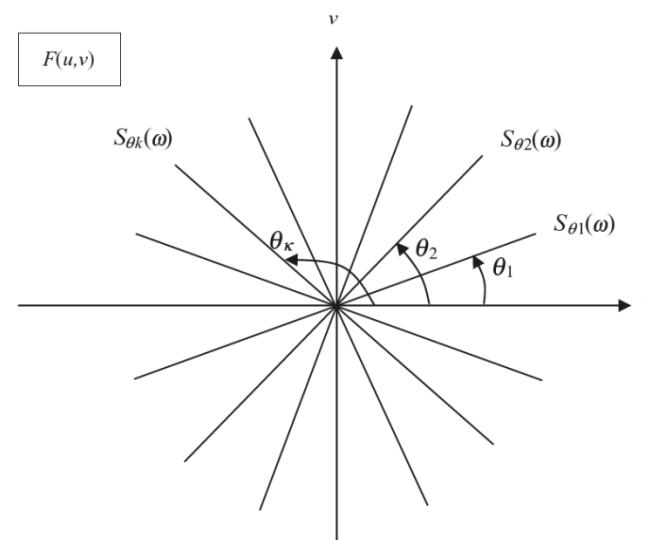
**Trick 1** →  $\hat{f}(x, y) = \frac{\pi}{L} \sum_{i=1}^L J_{\theta_i}(p')$

Limit number of necessary projections

## Filtered back-projection

$$\hat{f}(r, \theta) = \int_0^{\pi} \int_{-\infty}^{\infty} |\omega| S_\theta(\omega) e^{j2\pi\omega(x\cos\theta + y\sin\theta)} d\omega d\theta$$

$$= \int_0^{\pi} J_\theta^*(p') d\theta$$



## Trick 2?

Watch the video I shared about filtered back projection under the Modalities page (access. via modules) and try to figure out what the second trick of filtered back projection is.

# Conclusion

- ▷ Describe the difference between gamma and x-rays
- ▷ Explain how an X-ray image is formed
- ▷ Write down the formula for the Radon transform
- ▷ Draw a schematic diagram describing back-projection
- ▷ Explain how filtered back-projection differs

# Questions?

## Next week

- ▽ Lectures on Tuesday 9-12 and Thursday 9-12
  - MRI
  - SPECT/PET
  - External lecture on Thursday by Cyril Pernet, Senior researcher, Rigshospital
- ▽ Exercises on Thursday from 13-15
  - 1<sup>st</sup> assignment is due Monday the 19<sup>th</sup> of September
  - 2<sup>nd</sup> assignment will be accessible from the same day on