

Computer- and robot-assisted Surgery



Lecture 2 CT Imaging



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Deutsches Krebsforschungszentrum
Universitätsklinikum Carl Gustav Carus Dresden
Medizinische Fakultät Carl Gustav Carus, TU Dresden
Helmholtz-Zentrum Dresden-Rossendorf

Imaging - Summary



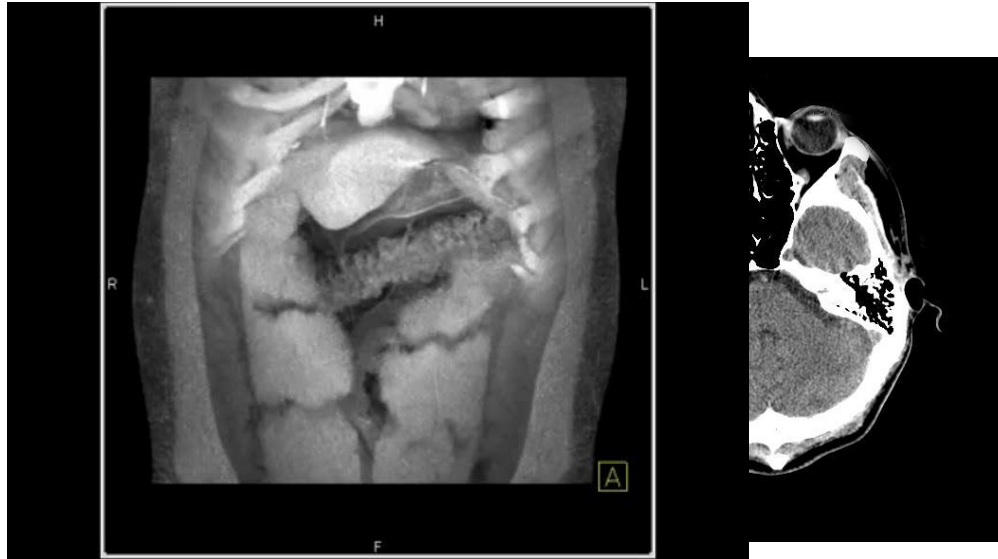
X-Ray



Ultrasound

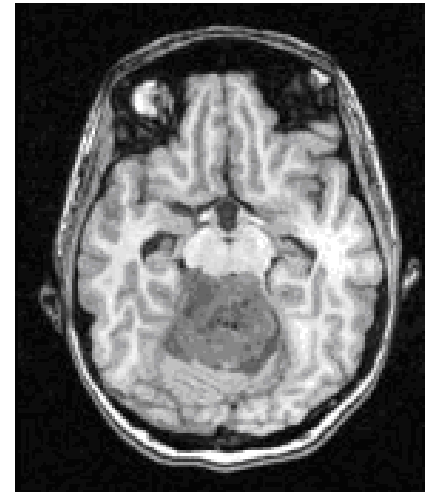
Tomographic Imaging

Computed tomography



CTisus.

Magnetic resonance imaging



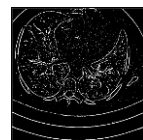
Tomographic Imaging provides cross-sectional images or slices of the human body

Workflow

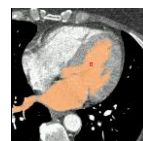
Image
Acquisition



Preprocessing



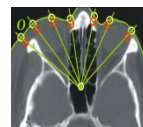
Segmentation



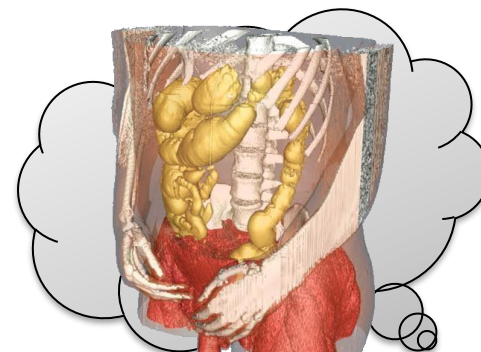
Modeling



Registration



Visualisation



Content

How does compute tomography work?

What is measured, how it is measured?

How are the cross-sectional images reconstructed?

What methods exist?

- Relation X-ray – CT
- Iterative Reconstruction
- Radon-Transformation
 - Fourier-Reconstruction
 - Filtered Backprojection
- Representation of slices

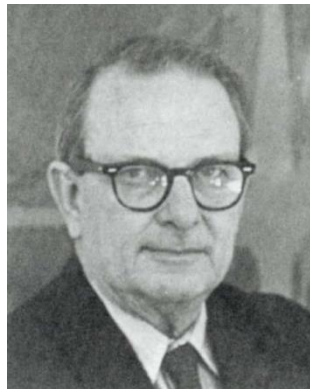
COMPUTED TOMOGRAPHY (CT)

CT- History

- 1895 **Röntgen** discovers X-ray beams
- 1917 **Radon** develops Radon transformation
- 1963 **Cormack** publishes method for calculation of absorption distribution (*Journal of Applied Physics*)
- 1971 **Hounsfield develops CT**, first human examination
- 1979 Cormack and Hounsfield receive Nobel prize



Röntgen

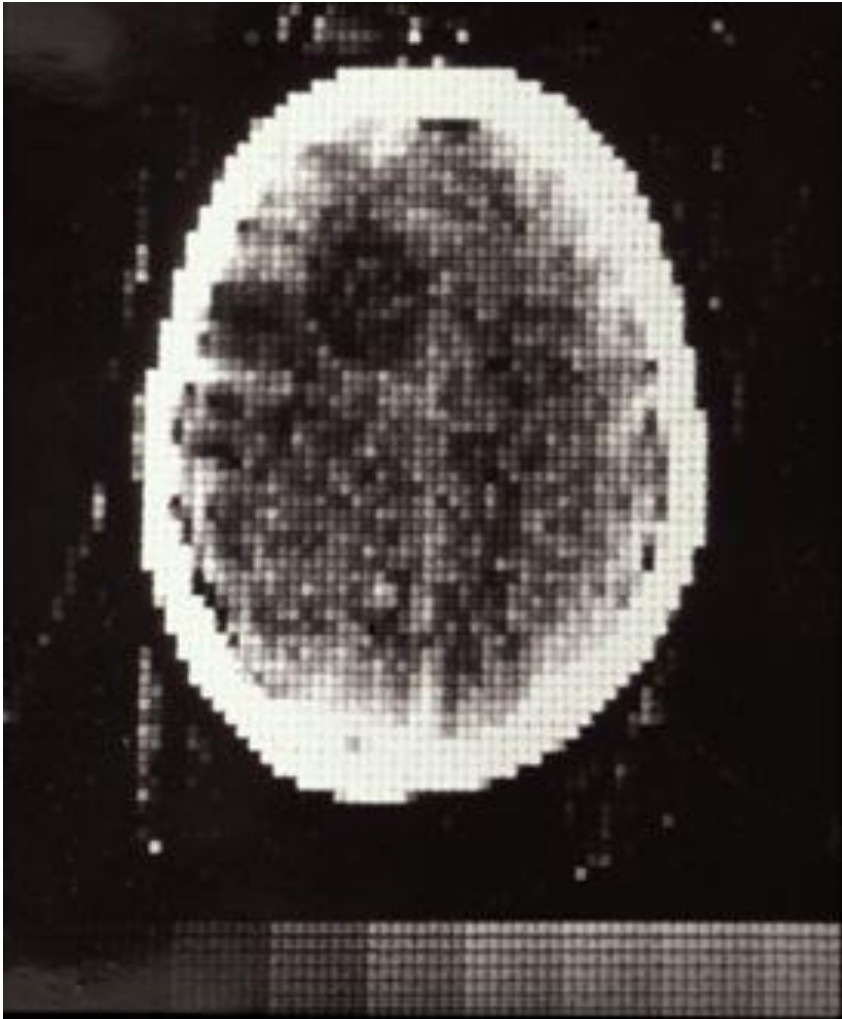


Cormack



Hounsfield

CT – Past / Present



Atkinson Morley's Hospital, October 1971



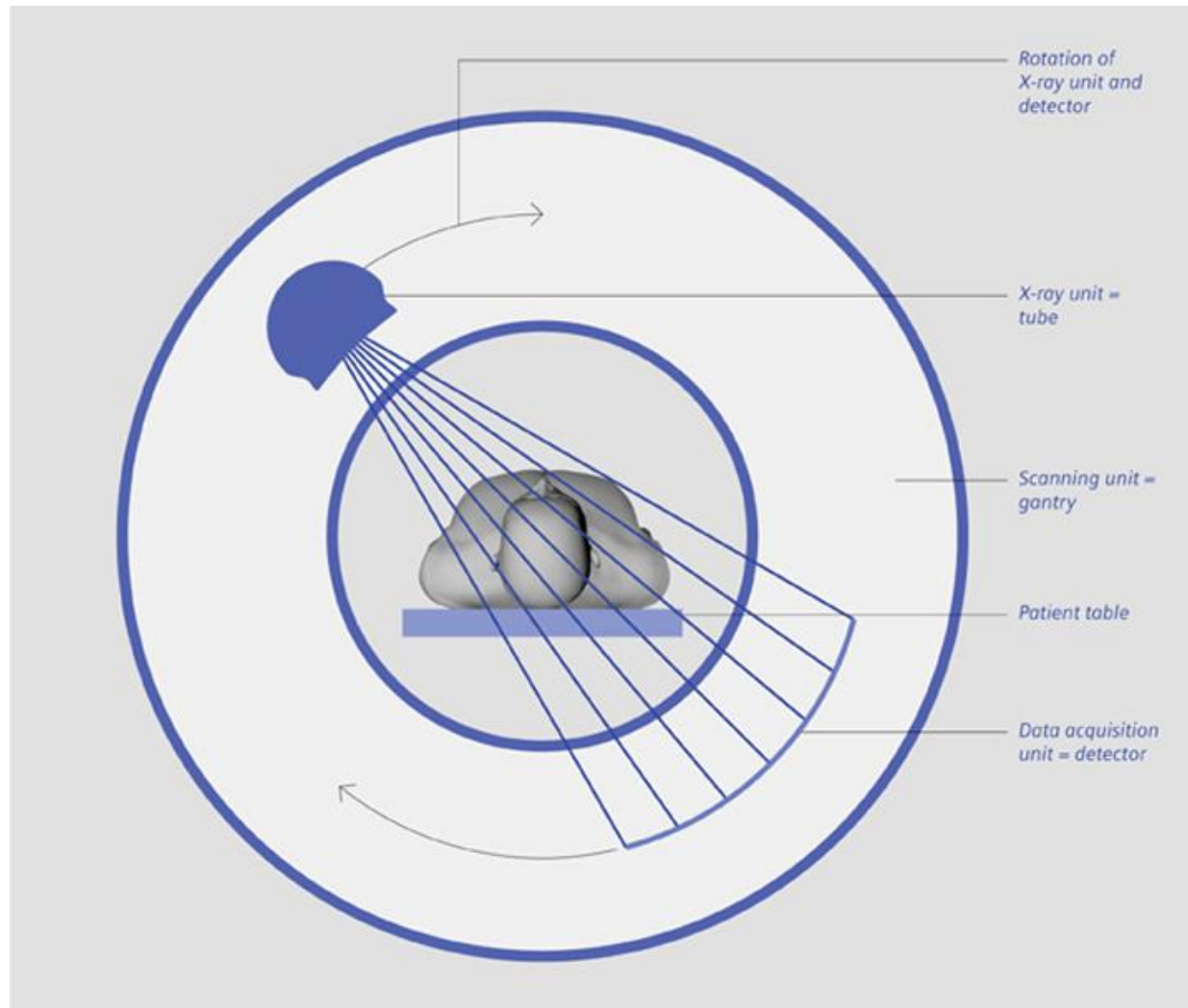
Functional principle

- X-ray measurements are used for Imaging
- Many X-ray measurements taken from different angles produce cross-sectional (tomographic) images
- A tomographic image consists of several voxels (volumetric pixel), that possess a certain gray value depending on the type of tissue



Quelle: Siemens

Functional principle

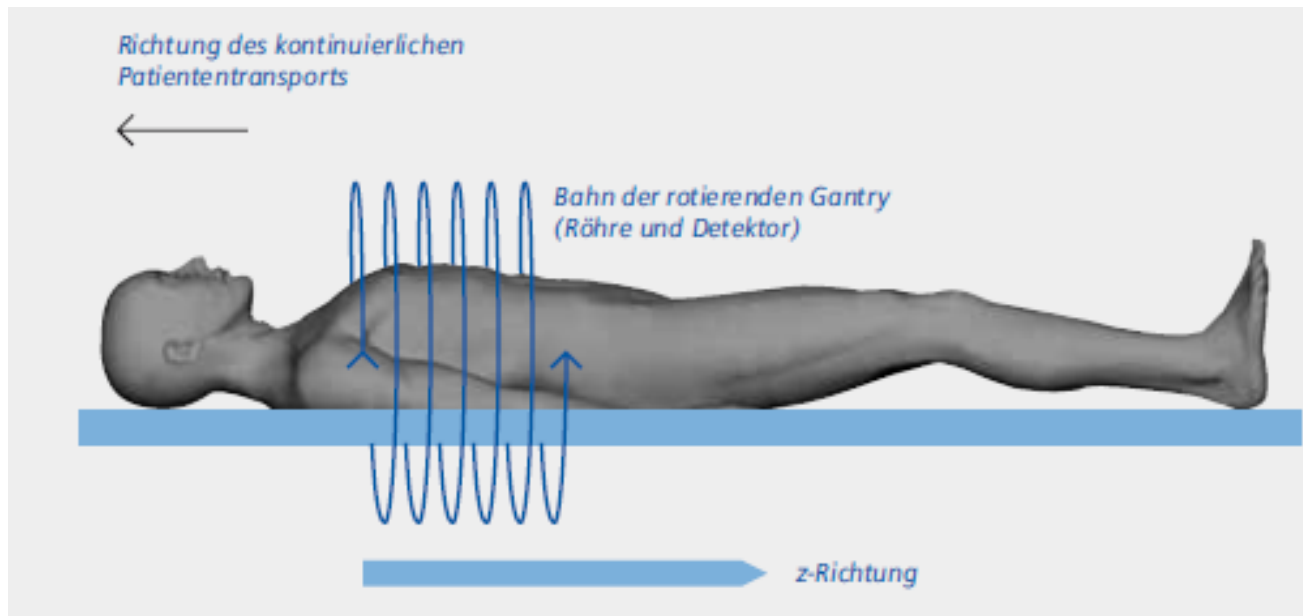


Quelle: Siemens

Functional principle

Technical setup

- Rotating source, rotating detector
- In addition: feed in z-direction, spiral recording



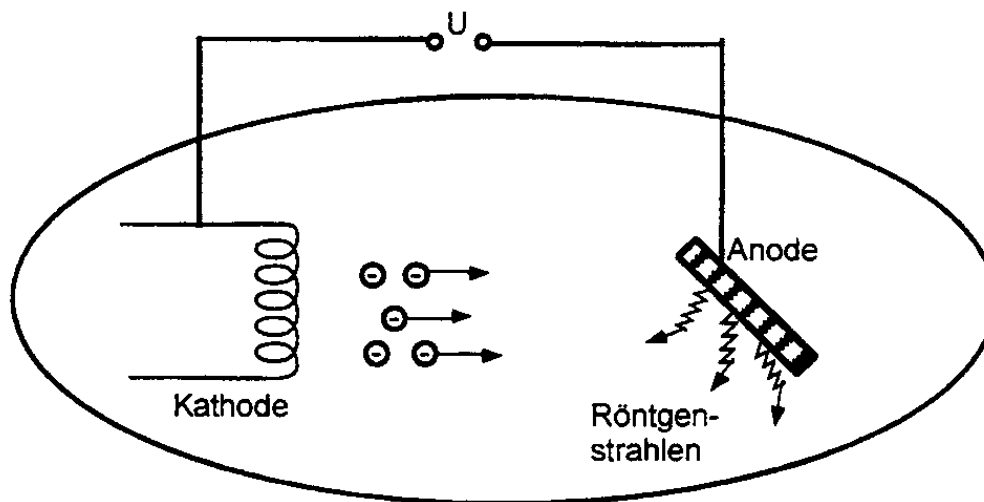
Quelle: Siemens



X-ray - Repetition

X-ray

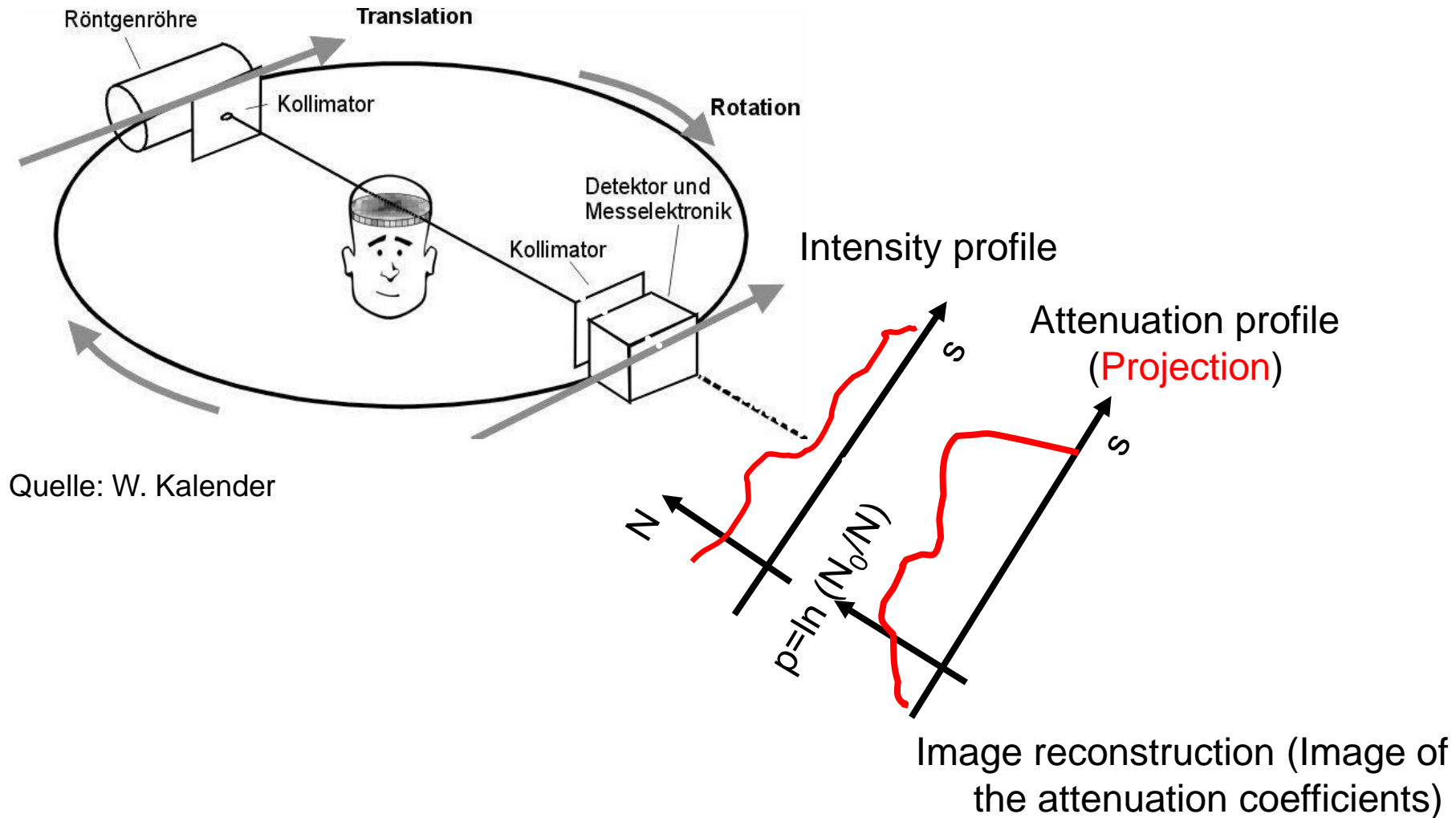
- Transmission of an X-ray beam with intensity N_0
- The intensity N of the beam that crossed the tissue is measured
- The attenuation of the beam is characteristic of the traversed tissue
- The different attenuation is used for imaging



$$N = N_0 e^{-\mu l}$$

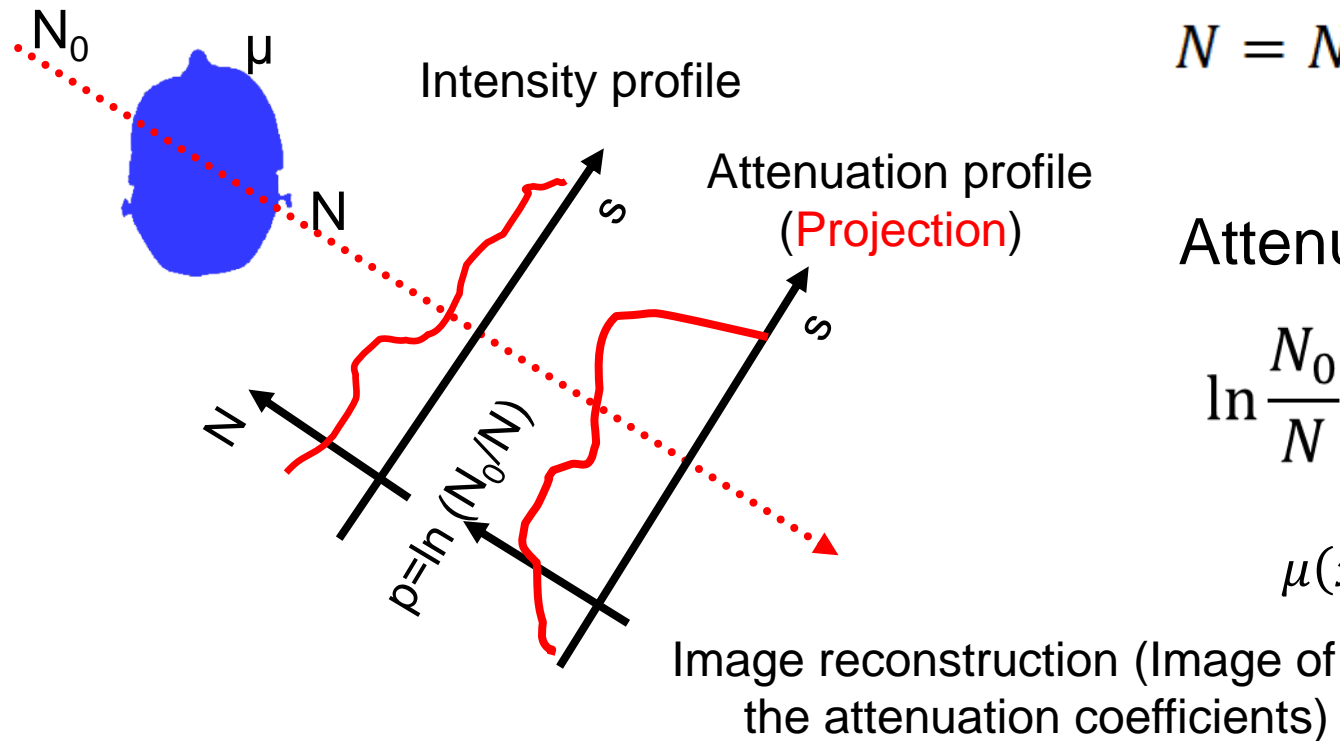
X-ray -> CT: What and how it is measured?

CT: Calculation of the attenuation coefficient $\mu(x,y)$ for every voxel $P(x,y)$



X-ray → CT: What is measured?

CT: Calculation of the attenuation coefficient $\mu(x,y)$ for every voxel $P(x,y)$ with width l in one slice



Intensity equation

$$N = N_0 e^{-\int \mu dl}$$

Attenuation equation

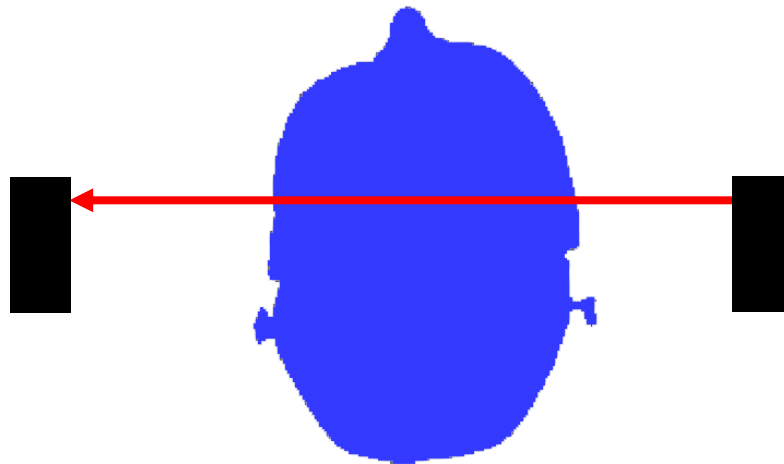
$$\ln \frac{N_0}{N} = \int \mu dl$$

$$\mu(x, y) = ???$$

Slice recording

For every 2D slice recordings from several perspectives

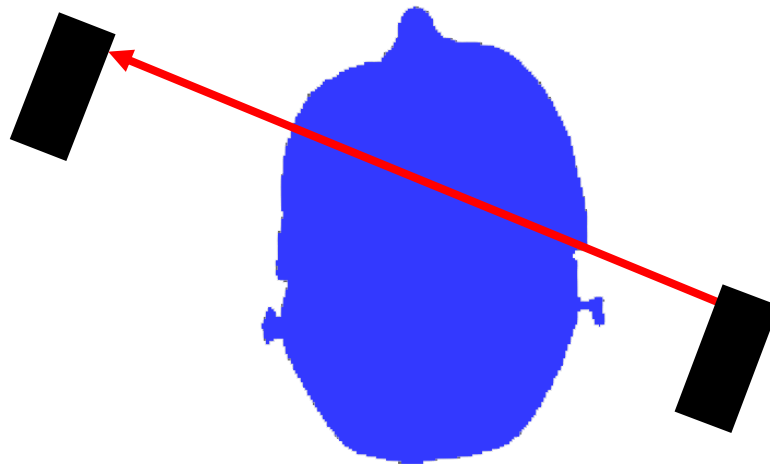
Example: Pencil beam CT (1. Generation)



Slice recording

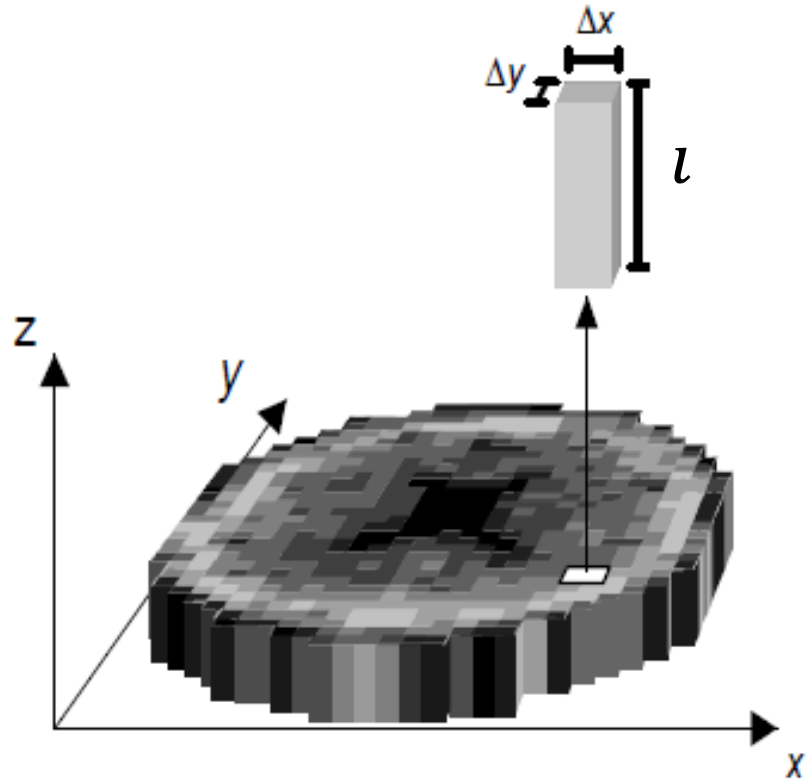
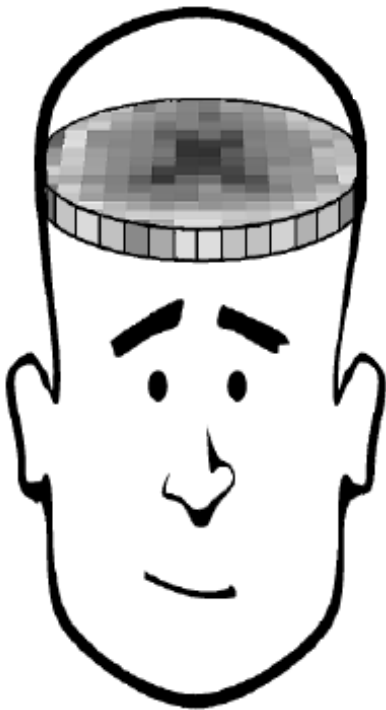
For every 2D slice recordings from several perspectives

Example: Pencil beam CT (1. Generation)



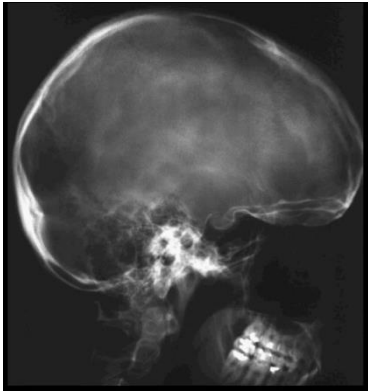
What is visualized in the CT image?

Linear attenuation coefficient averaged for each volume element



Quelle: W. Kalender

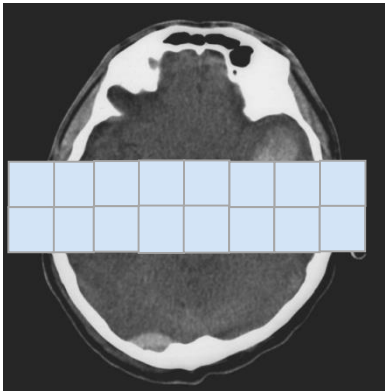
Why do sectional images have higher contrast?



X-ray Image

Skull Imaging is insufficient (X-ray)

$$Kontrast(I_1, I_2) = \frac{I_1 - I_2}{I_1 + I_2}$$



CT Image

700	40	70	50	40	50	670
680	30	20	50	30	60	740

1620
1600

In the x-ray image bone structures are dominant which results in lower contrast

Interaction und Feedback

- <https://pingo.coactum.de/> -> 5766



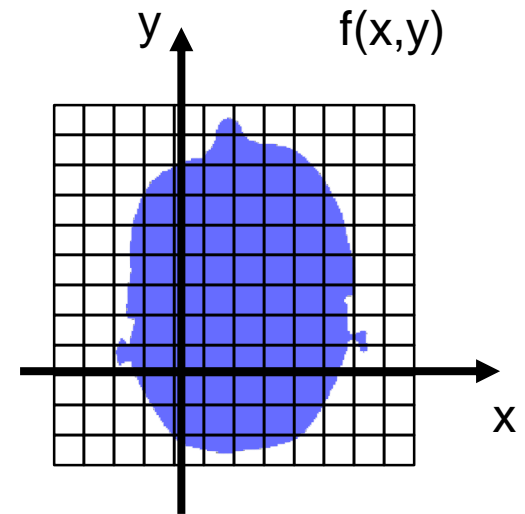
Reconstruction CT Images

How can the CT slices be reconstructed ?

A slice is defined as a matrix $f(x,y) = \mu(x,y)$

Three possible methods:

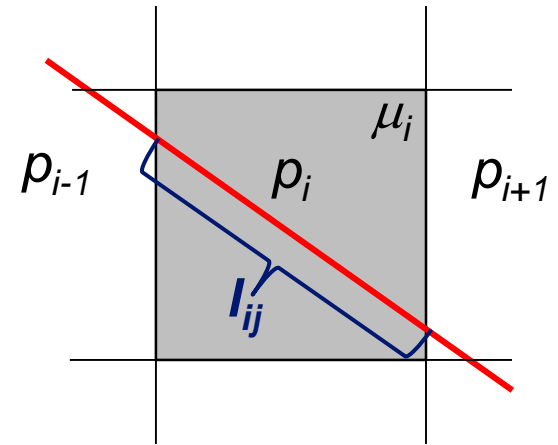
- Iterative reconstruction
- Fourier reconstruction
- Filtered backprojektion



Iterative Reconstruction

General reconstruction equations

In every **Voxel** p_i , through which a **beam** j with **length** l_{ij} passes, the radiation intensity is weakened by the **attenuation coefficient** μ_i , weighted by l_{ij} . This type of attenuation applies to all rays. You get a series of equations describing the whole system:



$$P_j = \sum_{i=0}^{N-1} l_{ij} \cdot \mu_i$$

- Mit
- P_j – Attenuation along of the j -th projection beam,
 - μ_i – *Attenuation coefficient* for the i -th image element,
 - l_{ij} – Length of the j -th projection beam inside the i -th voxel
 - N – Number of voxel

Image reconstruction – direct methods

Modern CT-Scans:

- Number of projections for every slice: 800-1500
- Number of measurement for every projection: 600-1200

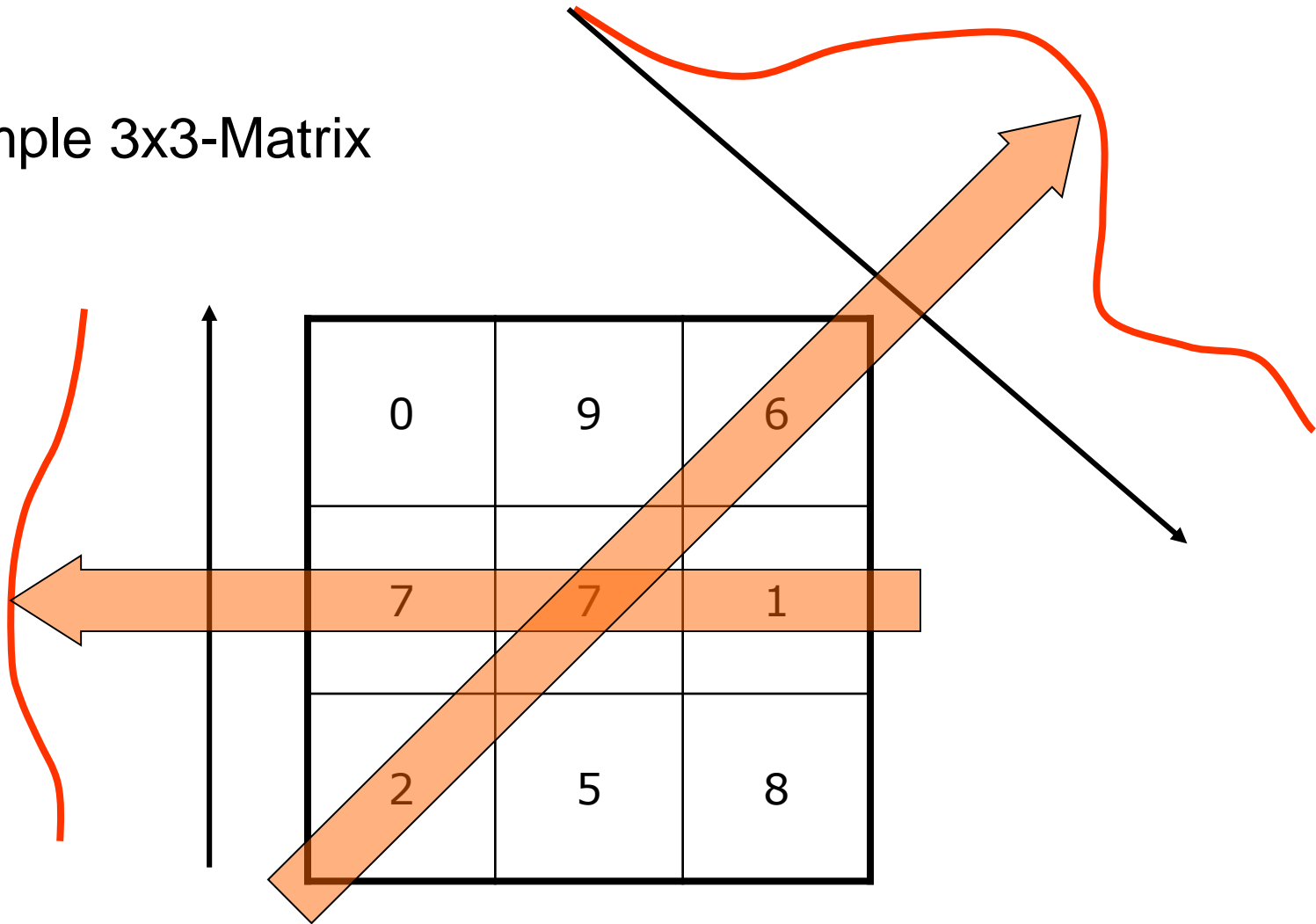
→ $1500 \cdot 1200 = 1.800.000$ measurement for every slice

512x512-Bildern: 262.144 unknown

→ Iterative Reconstruction

Iterative Reconstruction

Example 3x3-Matrix



Iterative Reconstruction

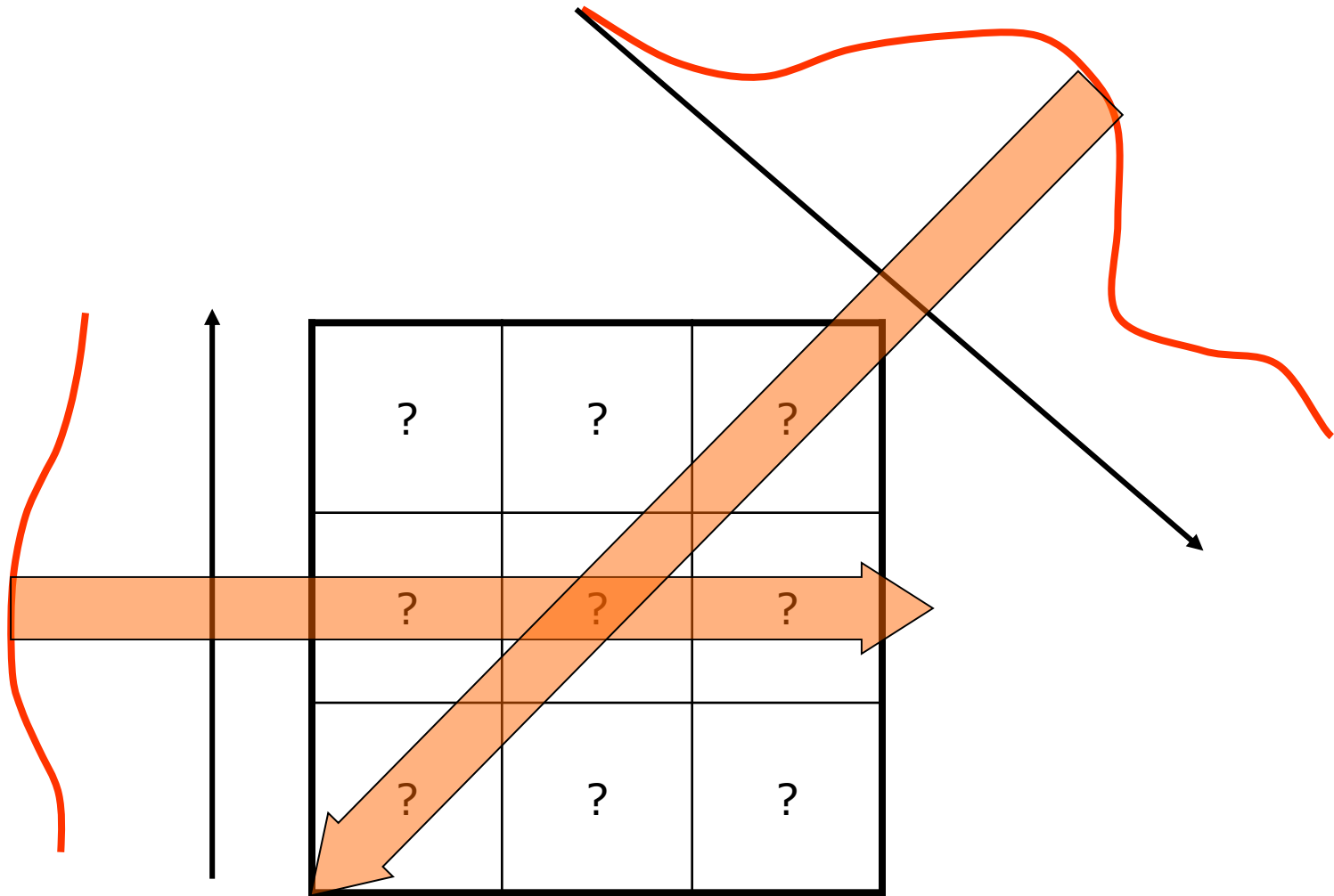


Image reconstruction - iterative

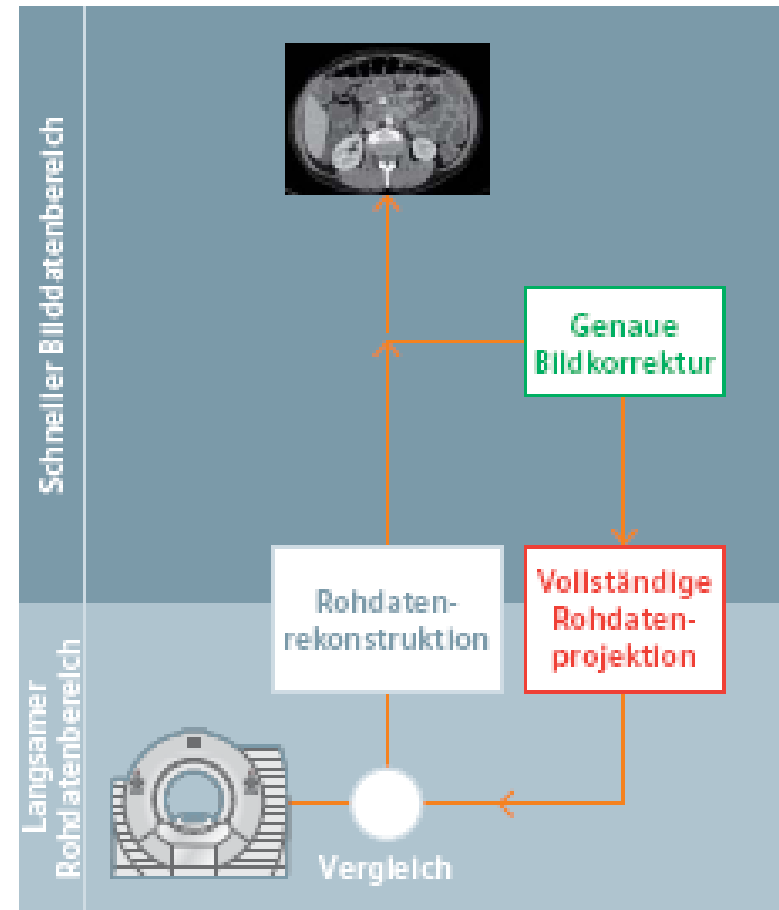
How can we calculate an image from the measurements?

Approximation of the image:

1. Estimate
2. Correction
3. Iteration



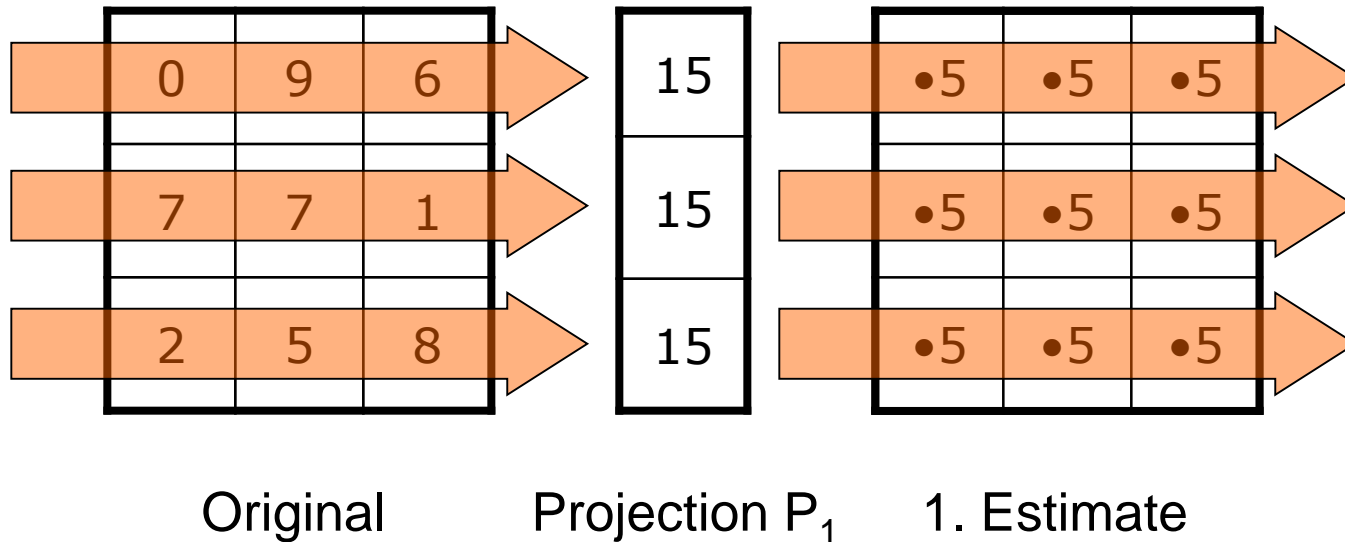
- First Approximation is derived from direction 1
- Creation of correction profiles
- Stop criterion: by specifying an error measure or maximum number of iterations



Quelle: Siemens

Estimate

1. Projection direction: 1. Estimate of the matrix



Correction

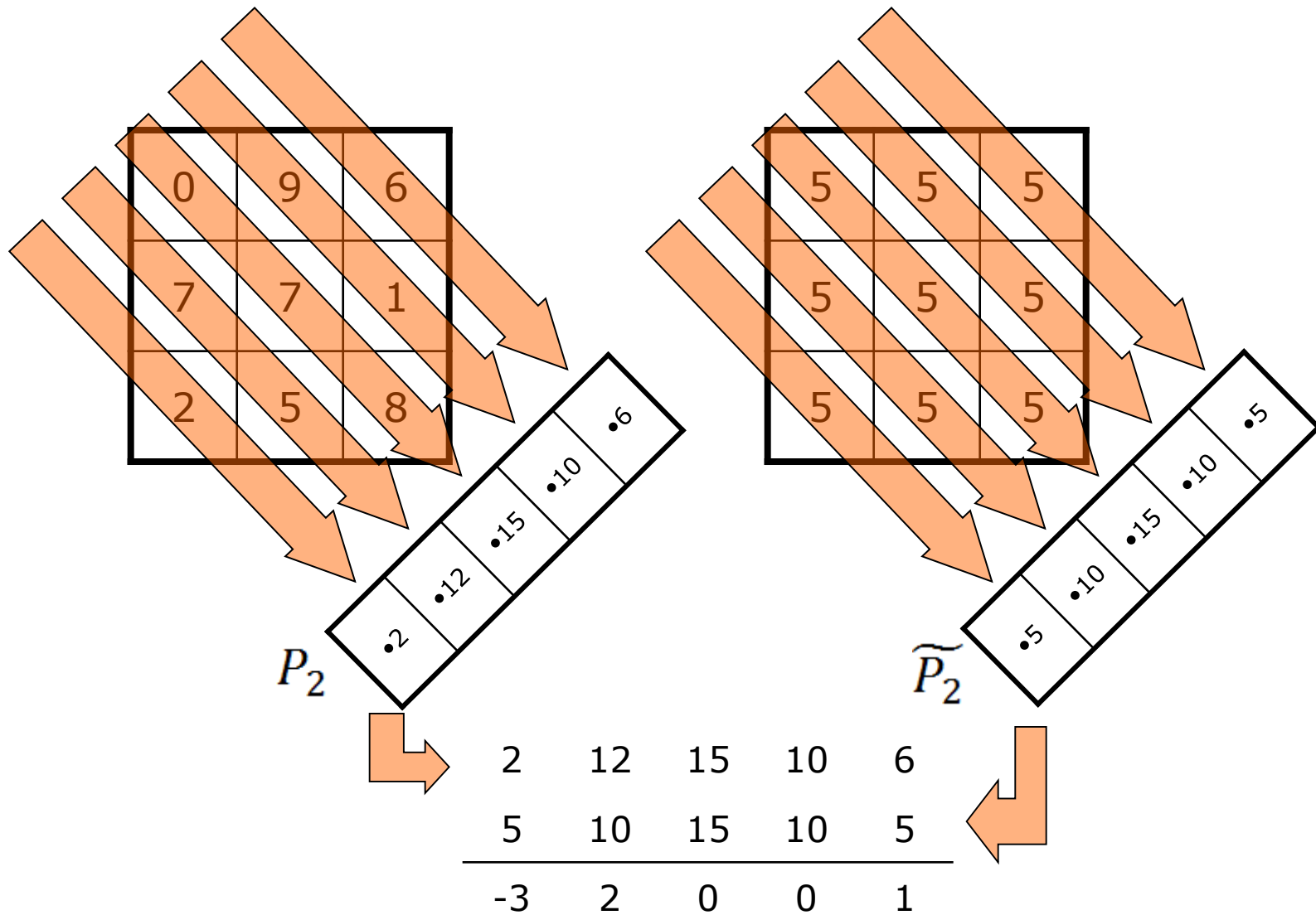
- In the second step, an attempt is made to correct the estimate.
- The 1st estimate is corrected with the 2nd projection P_2
- This is the difference

$$\tilde{P}_2 - P_2$$

between the projection of the estimated values and the actual measured projection

- This value is then distributed to the voxels. The distribution depends on the lengths at which the projection beam cuts the individual voxels.
- Simplification: Length share is always set to 1

Iterative Reconstruction

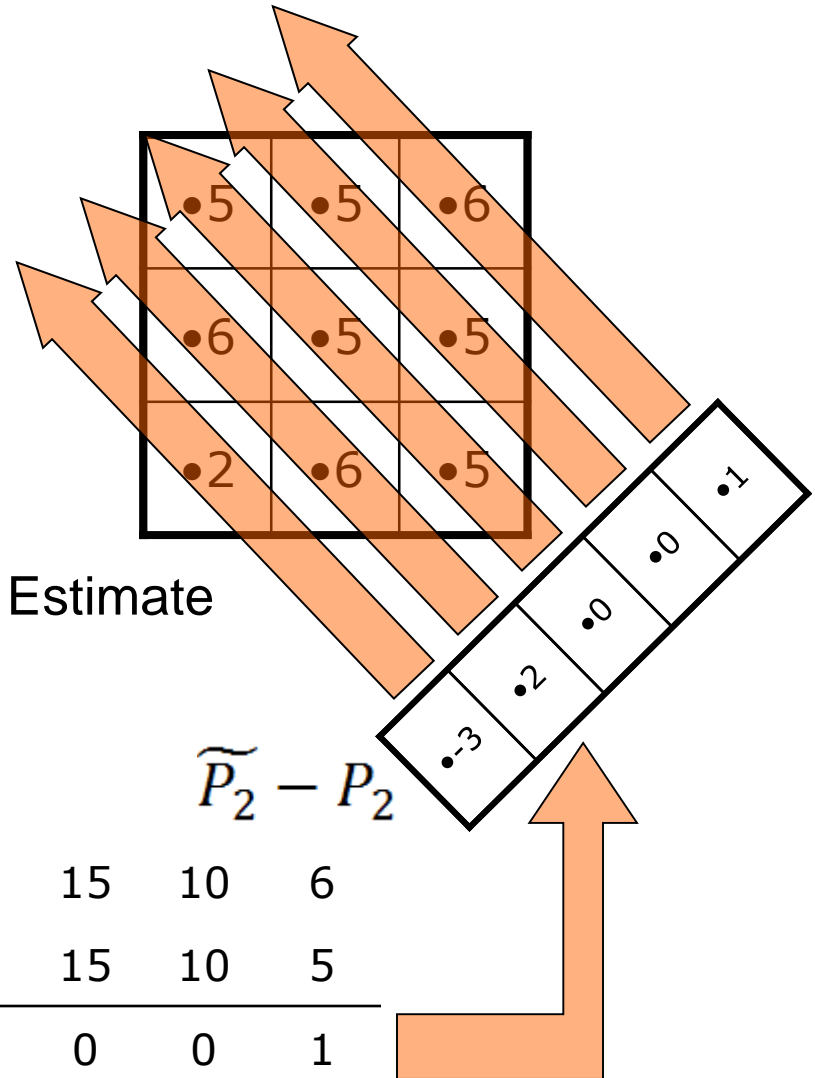


Iterative Reconstruction

0	9	6
7	7	1
2	5	8

Lengths normalized to 1

2. Estimate



Iteration

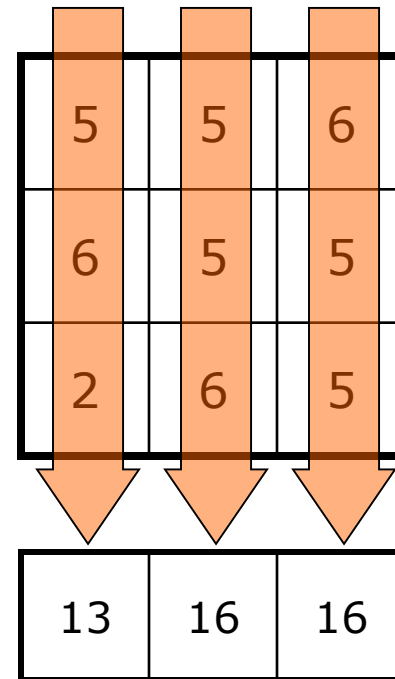
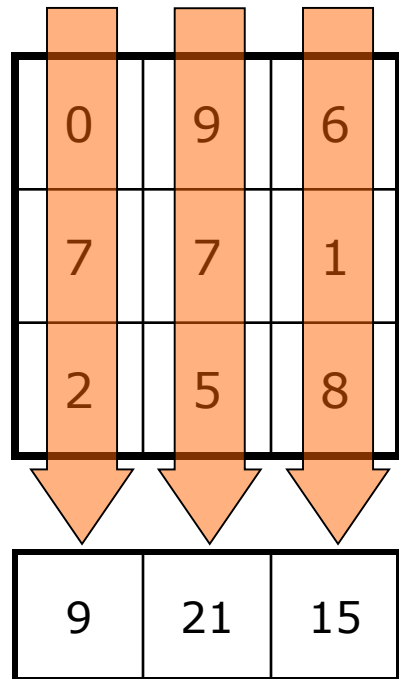
The estimation and correction of all projections is repeated until the norm between measured and estimated projection vector

$$\|\tilde{P}_n - P_n\| < \varepsilon$$

falls below a certain minimum after n iterations or a predetermined maximum number of iterations is exceeded.

The image is traversed multiple times if necessary.

Iterative reconstruction



$$\begin{array}{rrr} 9 & 21 & 15 \\ 13 & 16 & 16 \\ \hline -4 & 5 & -1 \end{array}$$

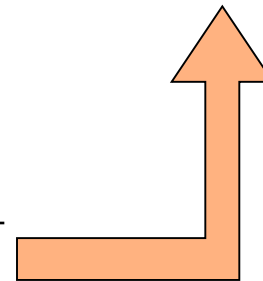
Iterative reconstruction

0	9	6
7	7	1
2	5	8

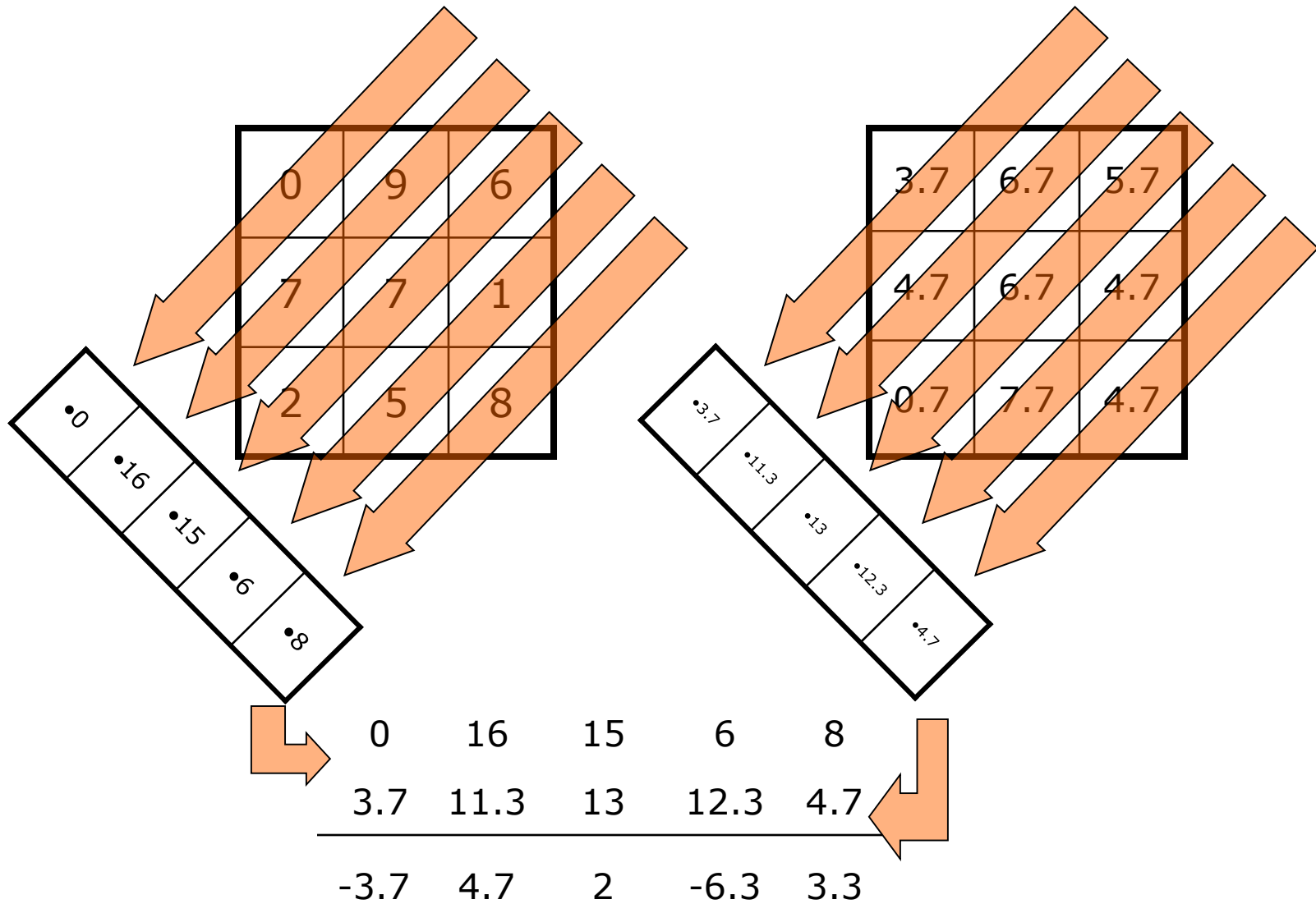
•3.7	•6.7	•5.7
•4.7	•6.7	•4.7
•0.7	•7.7	•4.7

-4	5	-1
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9	21	15
13	16	16
<hr/>		
-4	5	-1

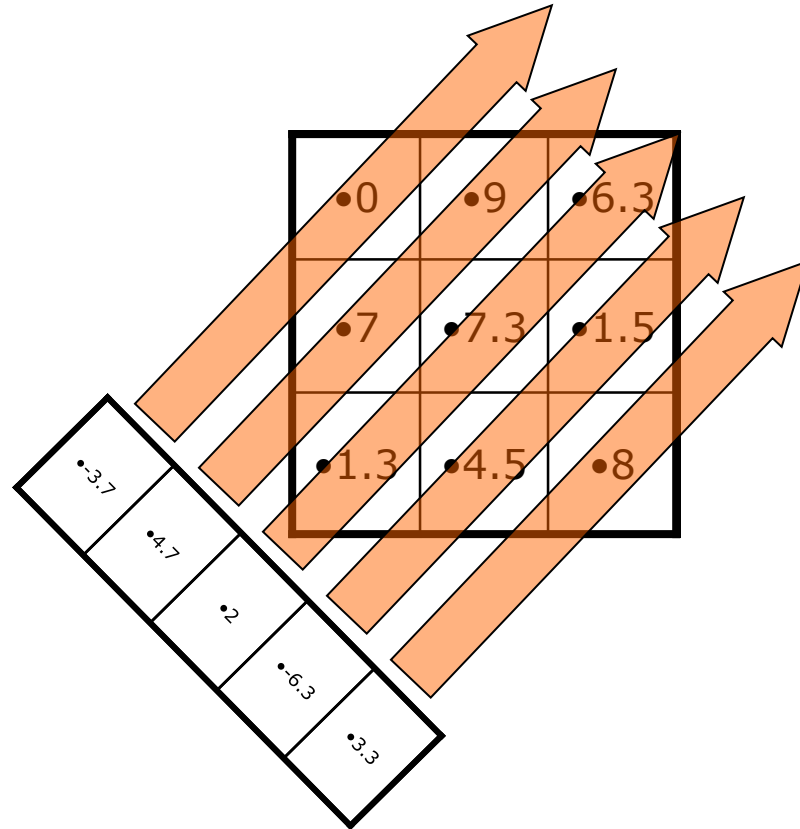


Iterative reconstruction



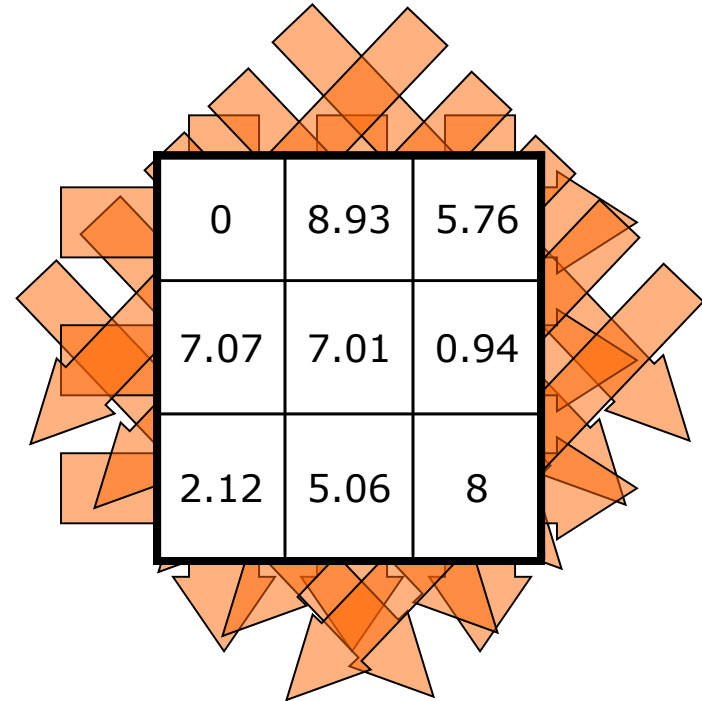
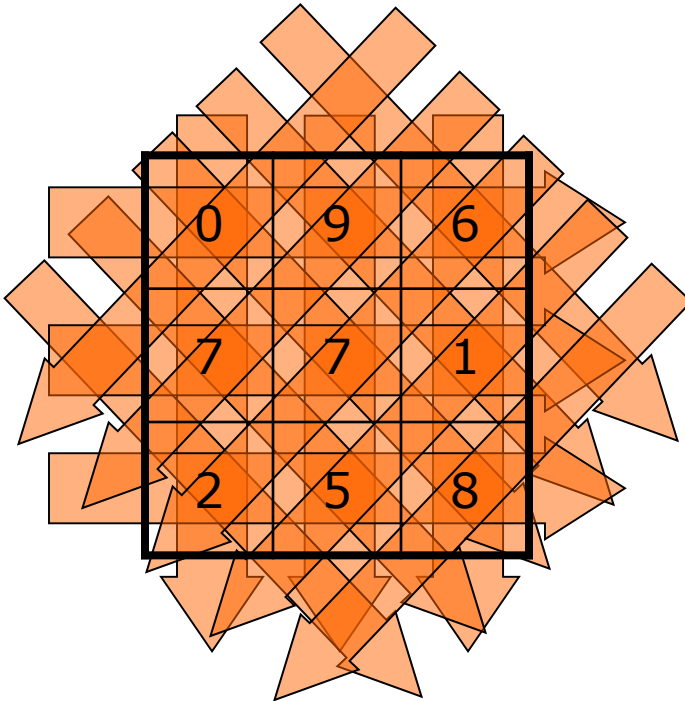
Iterative reconstruction

0	9	6
7	7	1
2	5	8

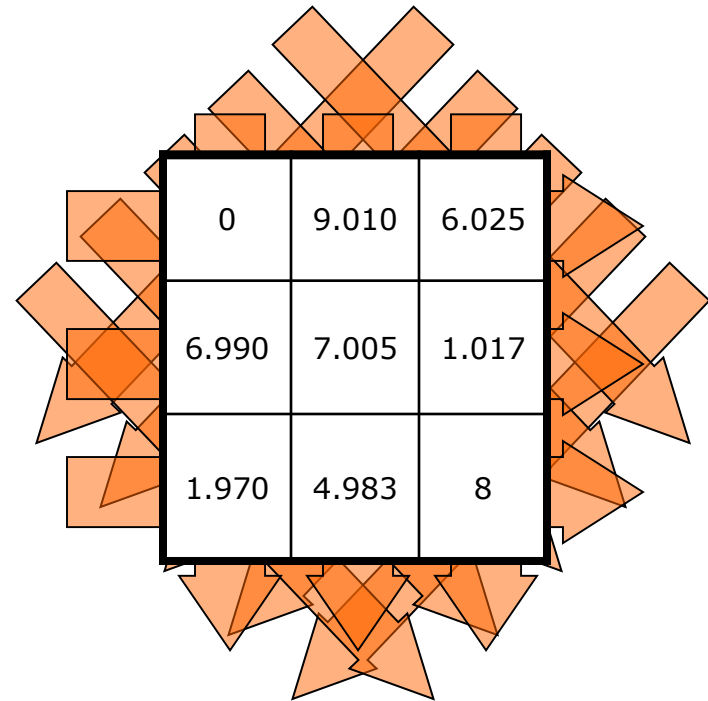
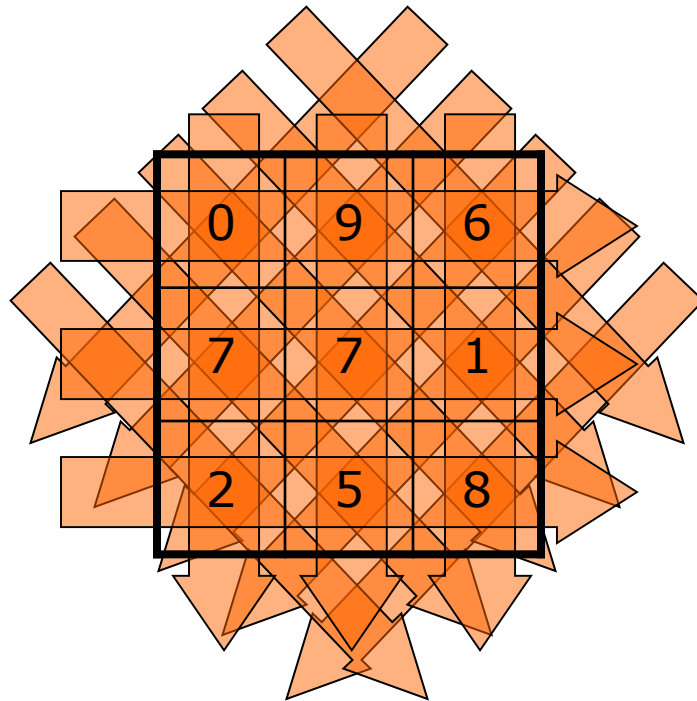


0	16	15	6	8
3.7	11.3	13	12.3	4.7
<hr/>				
-3.7	4.7	2	-6.3	3.3

Result of first iteration



Result after terminating



Evaluation iterative reconstruction

- Method converges always
- Regularization through the use of prior knowledge: modeling of local noise
 - Decoupling the spatial resolution from image noise
 - Smoothing in low-contrast areas, keeping contrast borders
 - Very good signal-to-noise ration
- Exact mathematical description of the device needed
- Computationally expensive because of many iterations
 - Iterative Reconstruction in Image Space (IRIS):

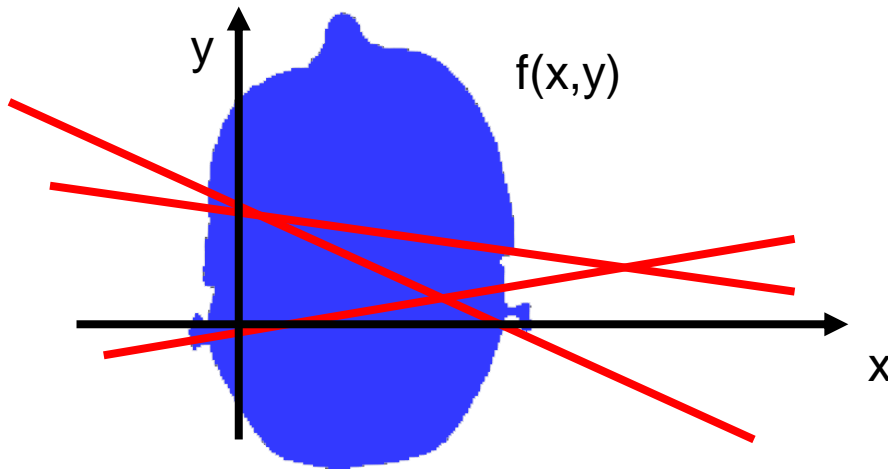
Reduction of the effort of iterating steps while maintaining image quality

Fourier Reconstruction

Radon Transformation

Mathematical Basis: Radon-Transformation

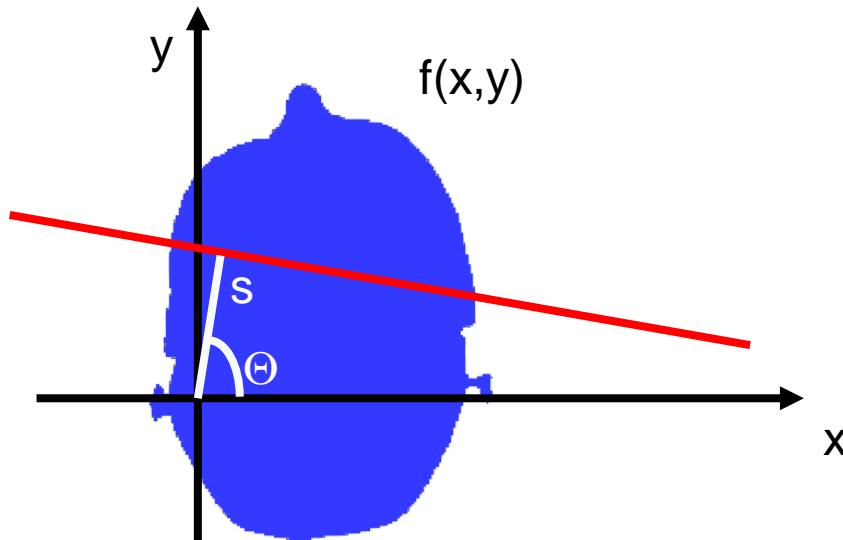
- Any integrable function $f(x, y)$ is described by **ALL line integrals** over the domain of f
- The 2D distribution of an object property can be described exactly if there is an infinite number of line integrals



Radon

Radon Transformation

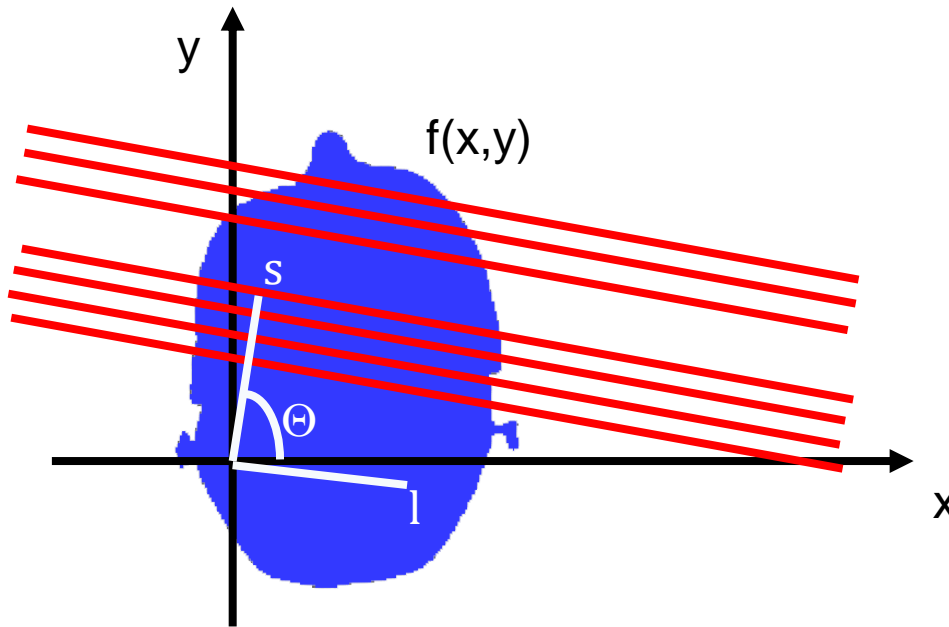
- Simplification by ordering scheme, so that all line integrals occur only once
- Angle Θ : $0..180^\circ$
- $s_{\min} \leq s \leq s_{\max}$



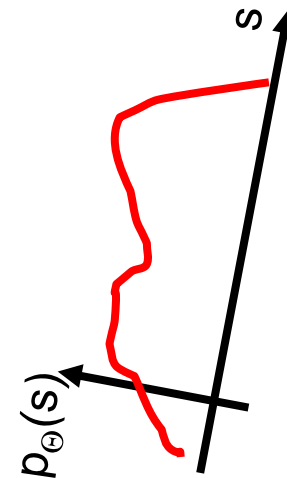
Radon Transformation

For a specific angle Θ all line integrals are calculated

The result is can be presented as $p_{\Theta}(s)$ as a function of s
(Projection of Θ)

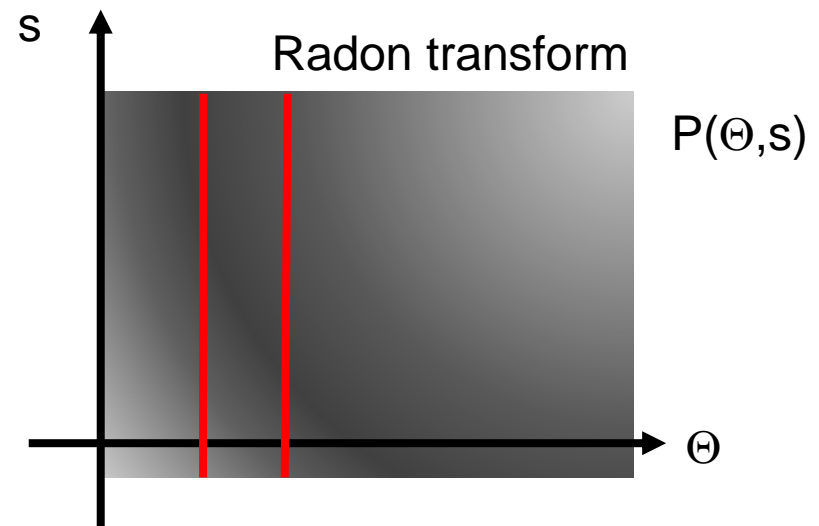
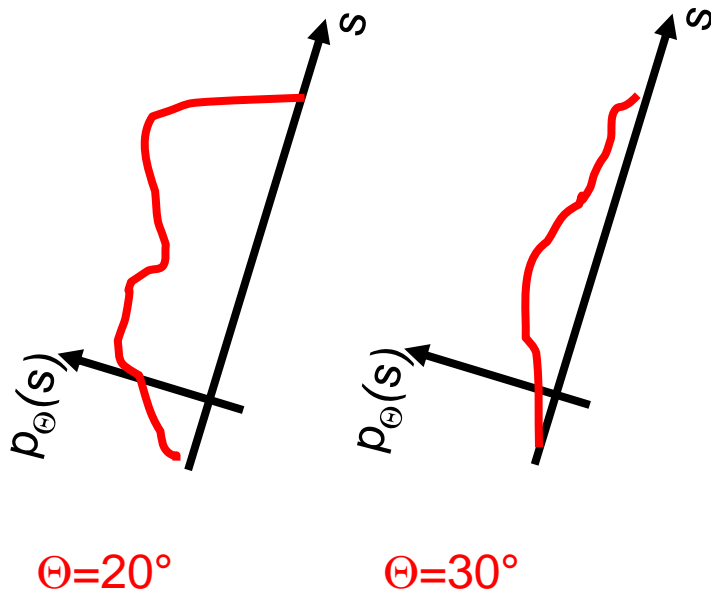


$$p_{\Theta}(s) = \int_{-\infty}^{\infty} f(x,y) dl$$



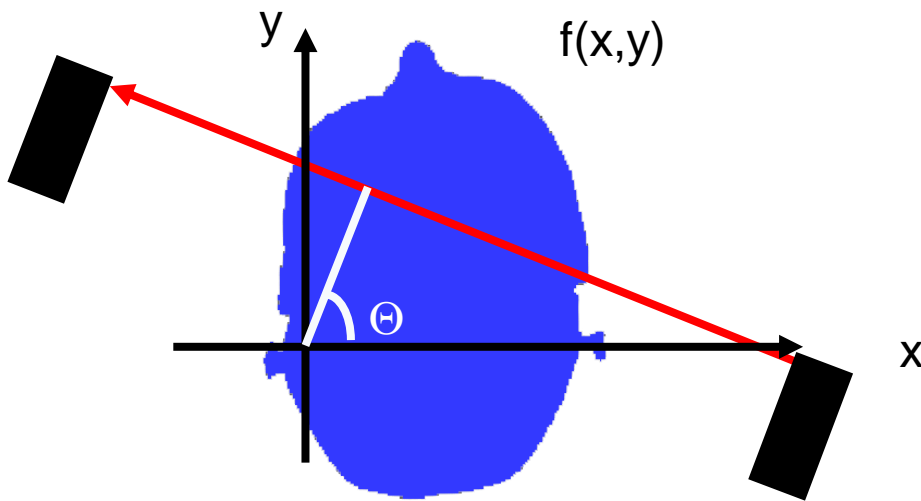
Radon Transformation

Based on the functions of several angles Θ : $0..180^\circ$ the 2D radon transformation of the original function $f(x,y)$ can be calculated



Radon Transform - CT

What is the relationship between the measured data of a CT and the radon transformation?

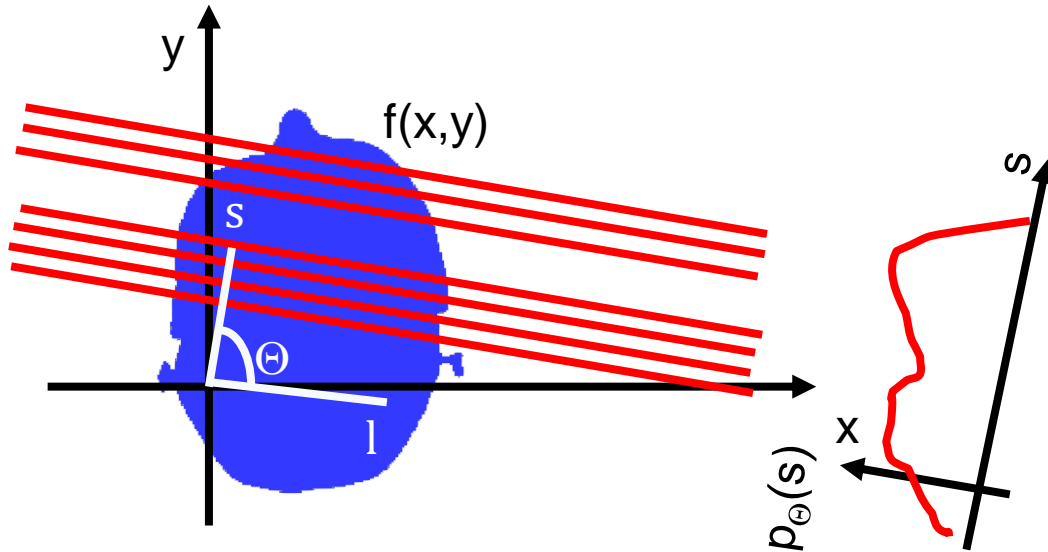


- Transmitter and detector rotate 180° around the patient
- Projections of the X-ray attenuation are measured

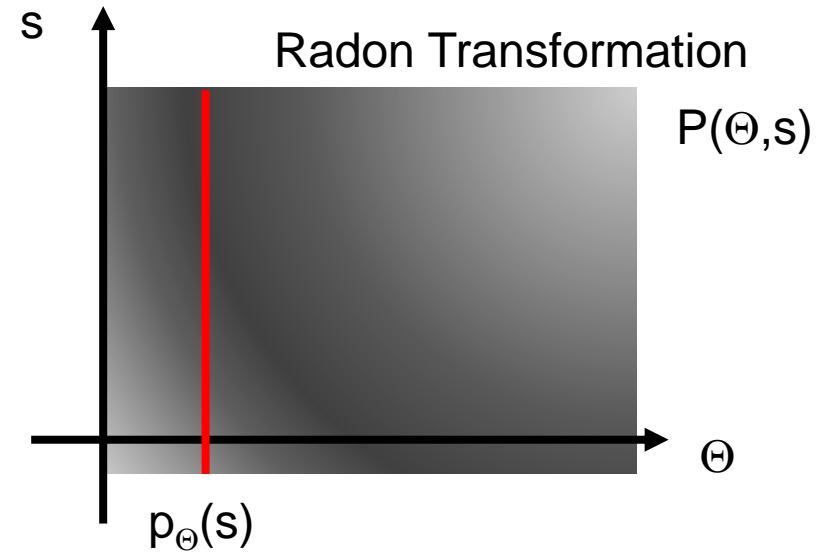
$$p_\theta(s) = \ln \frac{N_0}{N(\theta, s)}$$

This corresponds to a description of the **slice image of a patient** $f(x, y)$ by line integrals with a specific ordering scheme

Radon Transformation - CT

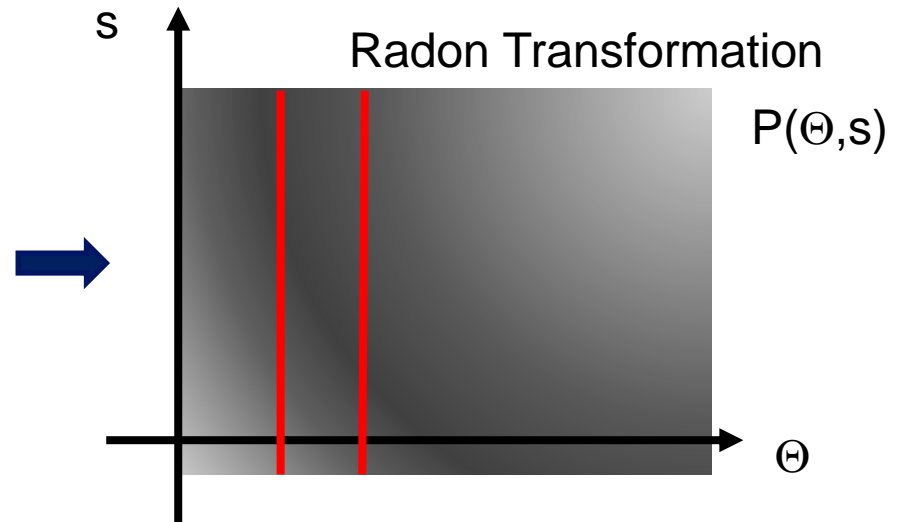


A line in the radon transformation with $\Theta = \text{const}$ is called a projection $p_{\Theta}(s)$



Radon Transformation - CT

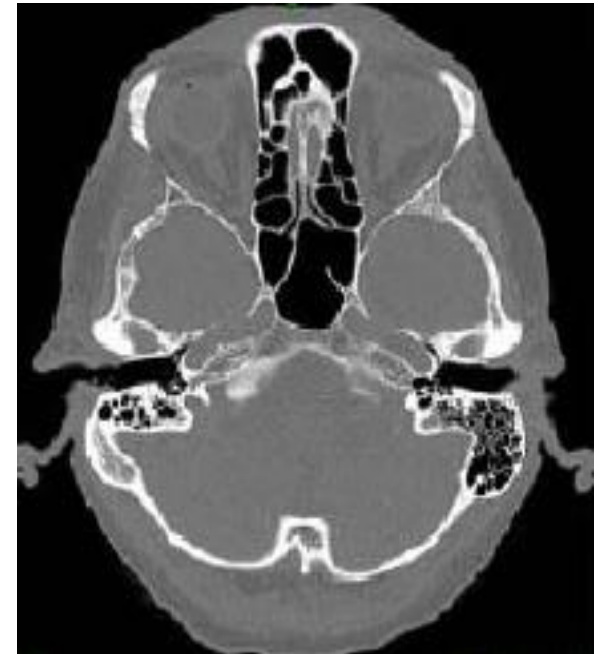
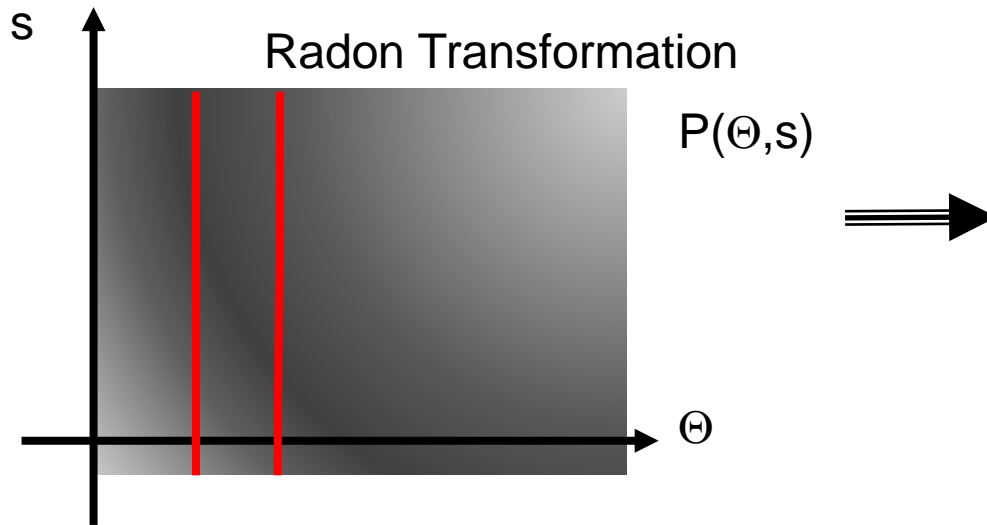
What is the relationship between the measured data of a CT and the radon transformation?



The CT calculates the radon transformation

Reconstruction

- How can the function $f(x,y)$ be determined from the measured data (radon transformation)?



Slice Image $f(x,y)$?

Idea: use relationship between **Radon- und Fourier-Transformation**

Inverse Radon Transformation

Fourier-Slice-Theorem

- Given: $f(x,y)$ and the 2D Fourier transformation $F(u,v)$

$$f(x,y) \xrightarrow{\text{2D-FT}} F(u,v) = \iint_{-\infty}^{\infty} f(x,y) e^{-j2\pi(ux+vy)} dx dy$$

- Let $p_{\Theta}(s)$ be the projection from $f(x,y)$ with a specific angle Θ and $P_{\Theta}(w)$ the 1D Fourier transformation

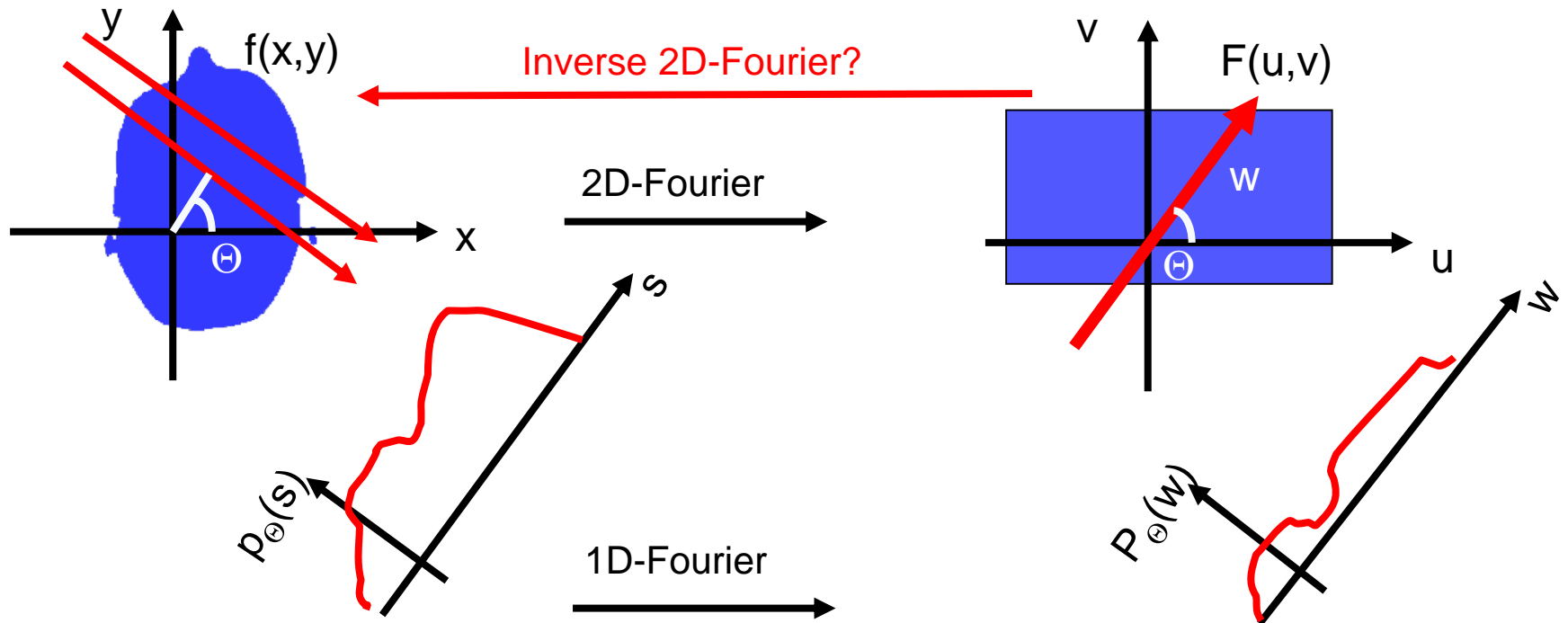
$$p_{\Theta}(s) \xrightarrow{\text{1D-FT}} P_{\Theta}(w) = \int_{-\infty}^{\infty} p_{\Theta}(s) e^{-j2\pi ws} ds$$

- Then $P_{\Theta}(w)$ describes the function $F(u,v)$ along the Θ through the origin, where:

$$F(w, \Theta) = P_{\Theta}(w)$$

Fourier Slice Theorem

Fourier Slice Theorem (general angle Θ)



Coordinate systems of the projection

Goal: geometric relationship between projection $p_{\Theta}(s)$ and slice $f(x,y)$

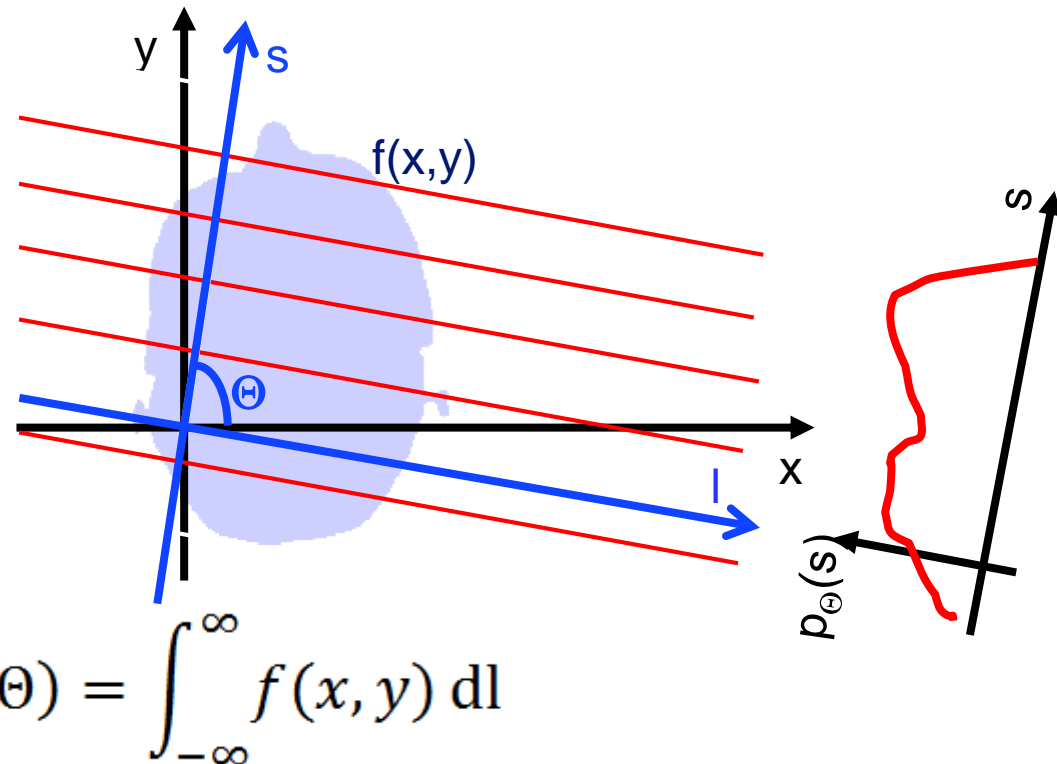
- p is represented in the coordinate system (s,l) with angle Θ
- Transformation from coordinate system (x,y) to (s,l) :

$$\begin{pmatrix} s \\ l \end{pmatrix} = \begin{pmatrix} \cos \Theta & \sin \Theta \\ -\sin \Theta & \cos \Theta \end{pmatrix} \begin{pmatrix} x \\ y \end{pmatrix}$$

$$s = x \cos \Theta + y \sin \Theta$$

$$l = -x \sin \Theta + y \cos \Theta$$

$$p_{\Theta}(s) = p_{\Theta}(x \cos \Theta + y \sin \Theta) = \int_{-\infty}^{\infty} f(x, y) dl$$



Coordinate systems of the projection

Goal: geometric relationship between projection $p_{\Theta}(s)$ and slice $f(x,y)$

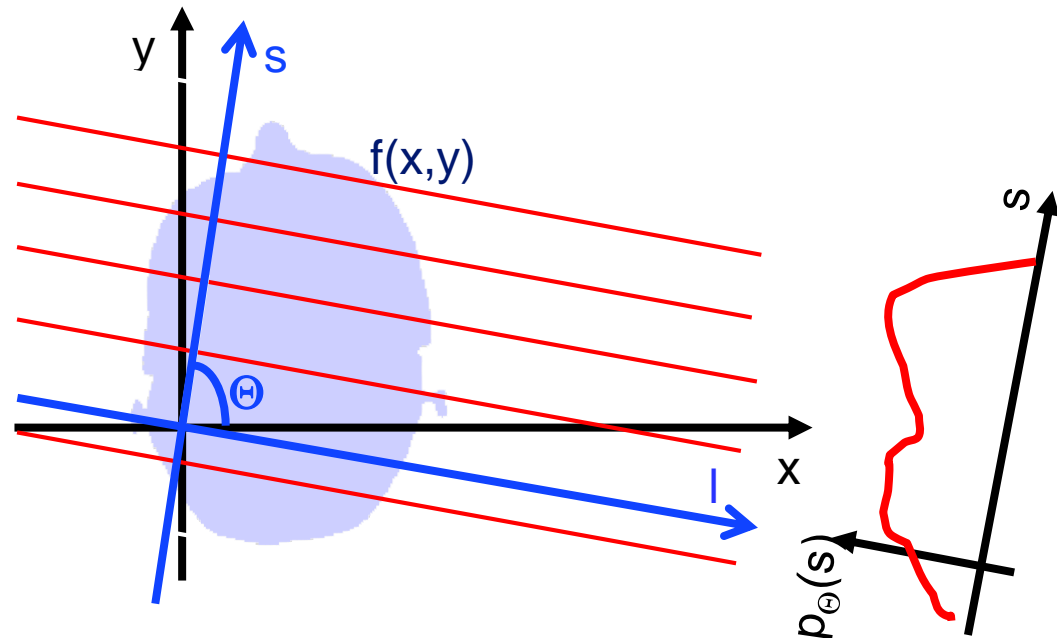
- p is represented in the coordinate system (s,l) with angle Θ
- Transformation from coordinate system (x,y) to (s,l) :

$$\begin{pmatrix} s \\ l \end{pmatrix} = \begin{pmatrix} \cos \Theta & \sin \Theta \\ -\sin \Theta & \cos \Theta \end{pmatrix} \begin{pmatrix} x \\ y \end{pmatrix}$$

$$x = s \cos \Theta - l \sin \Theta$$

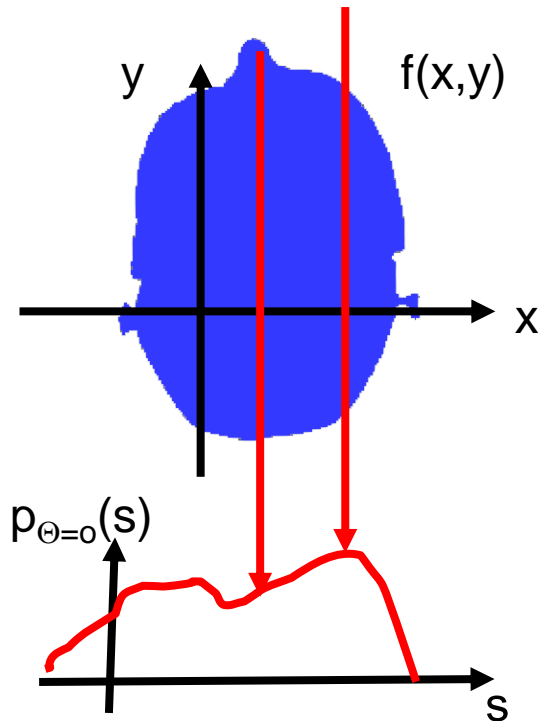
$$y = s \sin \Theta + l \cos \Theta$$

$$p_{\Theta}(s) = \int_{-\infty}^{\infty} f(x,y) dl = \int_{-\infty}^{\infty} f(s \cos \Theta - l \sin \Theta, s \sin \Theta + l \cos \Theta) dl$$



Projection equation

Fourier Slice Theorem (Proof for angle $\Theta = 0^\circ$)



general:
$$p_{\Theta}(s) = \int_{-\infty}^{\infty} f(x, y) dl$$

here $\Theta = 0$:

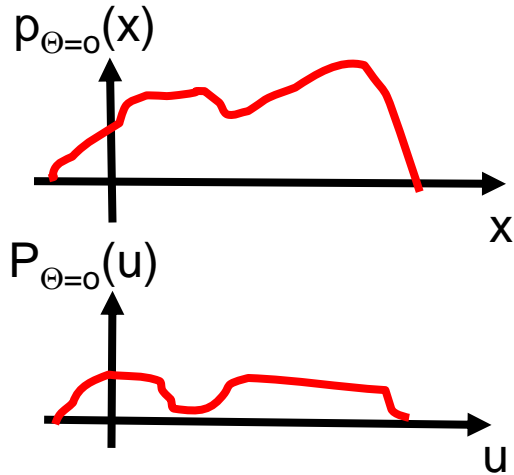
$$s = x \cos 0 + y \sin 0 = x$$

$$dl = dy$$

$$p_{\Theta=0}(s) = p_0(x) = \int_{-\infty}^{+\infty} f(x, y) dy$$

Fourier Slice Theorem

Fourier Slice Theorem (angle $\Theta = 0^\circ$)



$$p_{\Theta=0}(s) = p_0(x) = \int_{-\infty}^{+\infty} f(x, y) dy$$

↓ 1D Fourier transformation

$$P_0(w) = P_0(u) = \int_{-\infty}^{+\infty} p_0(x) e^{-j2\pi ux} dx$$

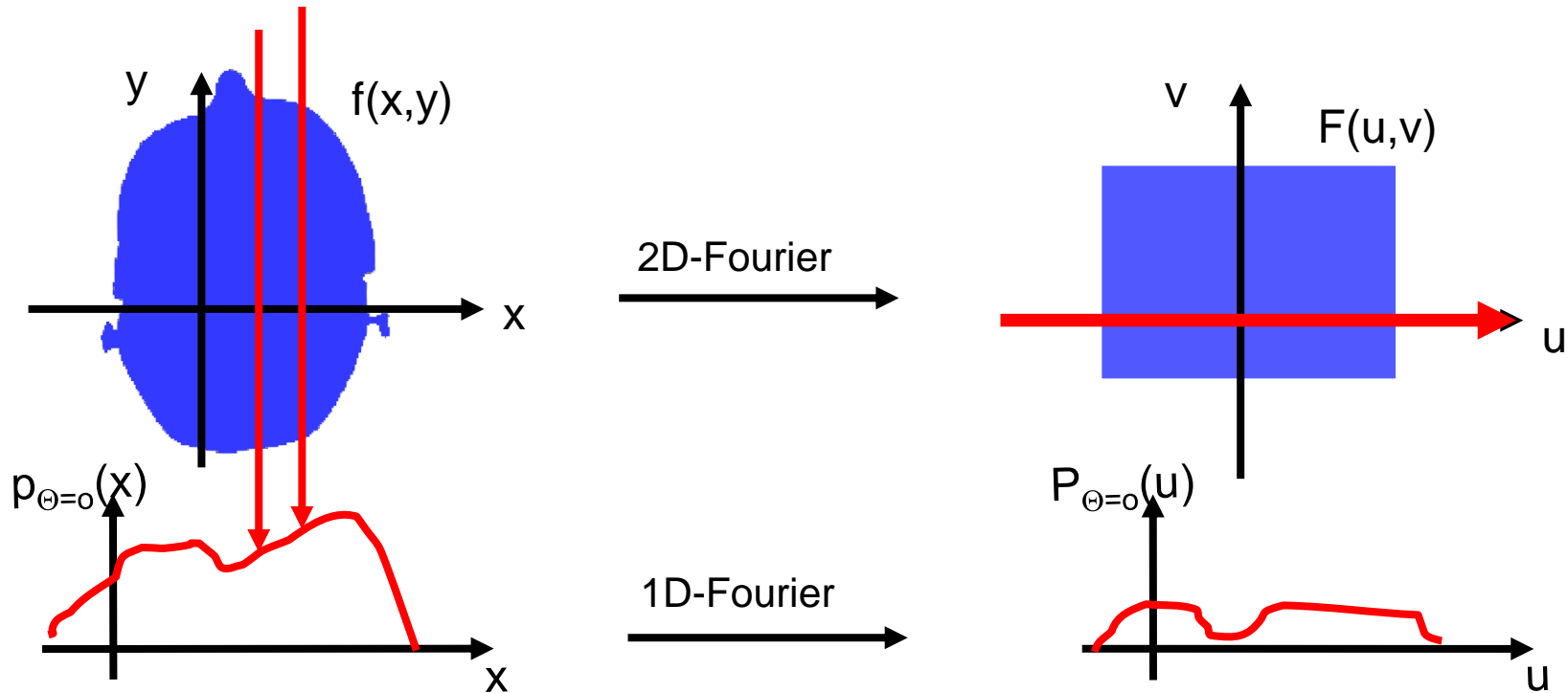
$$P_0(u) = \int_{-\infty}^{+\infty} \int_{-\infty}^{+\infty} f(x, y) e^{-j2\pi(ux+0y)} dx dy$$

$$P_0(u) = F(u, 0)$$

Fourier Slice Theorem

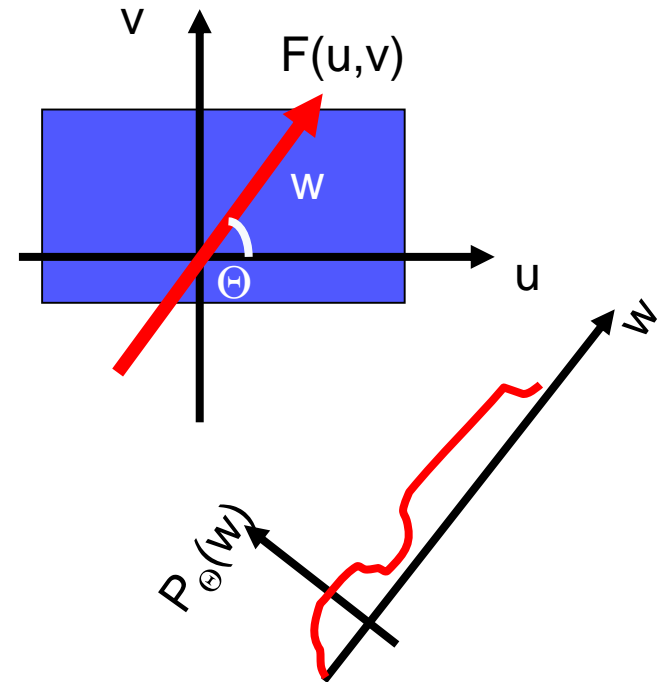
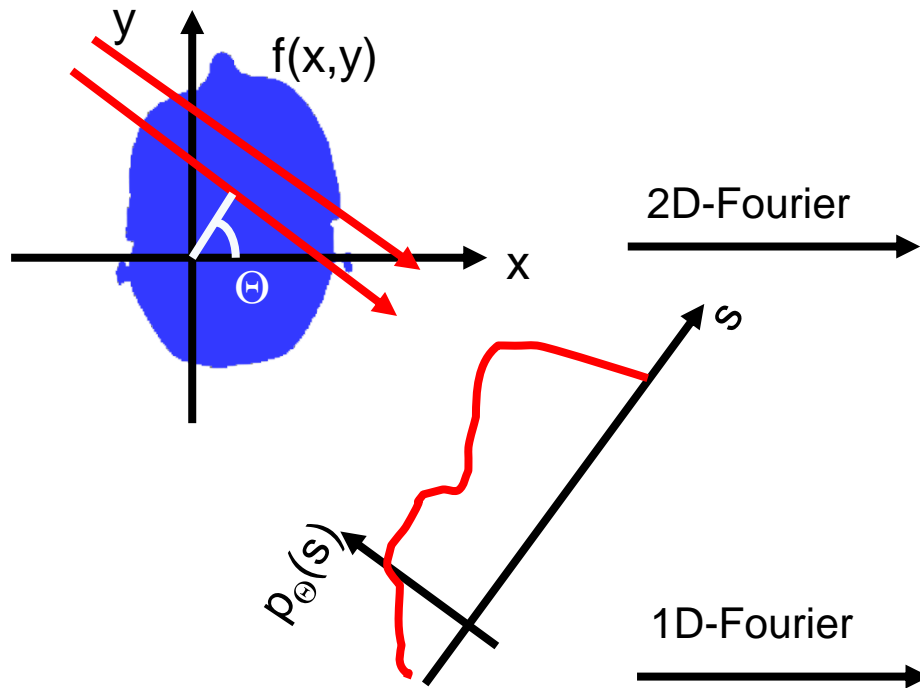
Fourier Slice Theorem (Angle $\Theta = 0^\circ$)

$$P_0(u) = F(u, 0)$$



Fourier Slice Theorem

Fourier Slice Theorem (Angle Θ in general)



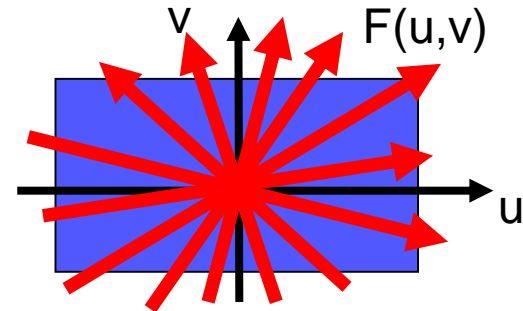
Summary Fourier Reconstruction

Rekonstruktion of CT images:

- Measure projections $p_{\Theta}(s)$ for as many as possible Θ
- Calculate 1D Fourier transformation through: $P_{\Theta}(w)$
- Construct from all $P_{\Theta}(w)$ the matrix $F(u,v)$
- Calculate $f(x,y)$ through inverse 2D Fourier transformation

Summary Fourier Reconstruction

- Problem: in fourier space the $P_{\Theta}(w)$ lie closer to the origin than in the margins



- low frequencies are amplified
- Interpolation of the values lead to subsequent errors
(Data is presented in polar coordinates; FFT needs cartesian coordinates)

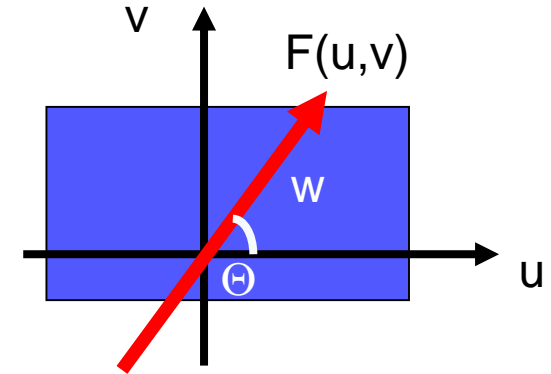
→ Filtered backprojection

Filtered Backprojection

Reconstruction: Filtered Backprojection

Basic equation FFT

$$f(x, y) = \int_{-\infty}^{+\infty} \int_{-\infty}^{+\infty} F(u, v) e^{j2\pi(ux+vy)} du dv$$



Derivation: How can you express (u,v) with (w,Θ) ?

→ Introduction of **polar coordinates** in Fourier space and **coordinate transformation**

$$u = w \cos \Theta \quad v = w \sin \Theta \quad du dv = w dw d\Theta$$

$$f(x, y) = \int_{\boxed{0}}^{\boxed{2\pi+\infty}} \int_{\boxed{0}}^{\boxed{0}} F(w, \Theta) e^{j2\pi w(x \cos \Theta + y \sin \Theta)} w dw d\Theta$$

Reconstruction: Filtered Backprojection

Change of integration margins

$$f(x, y) = \int_0^{\pi} \int_{-\infty}^{+\infty} F(w, \Theta) e^{j2\pi w (x \cos \Theta + y \sin \Theta)} |w| dw d\Theta$$

Replace

$$x \cos \Theta + y \sin \Theta = s$$

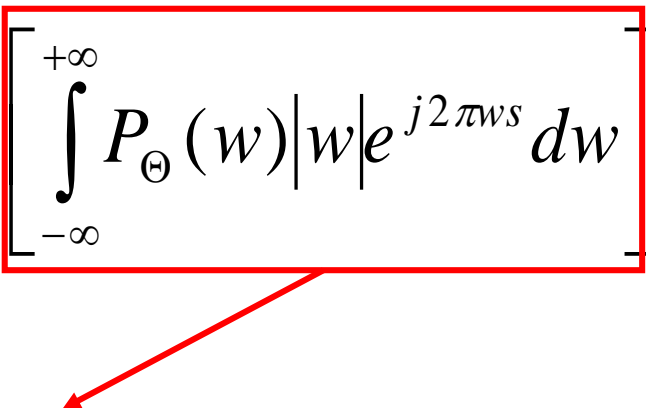
Fourier Slice Theorem:

$$F(w, \Theta) = P_{\Theta}(w)$$

Insert:

$$f(x, y) = \int_0^{\pi} \left[\int_{-\infty}^{+\infty} P_{\Theta}(w) |w| e^{j2\pi w s} dw \right] d\Theta$$

Filtered Backprojection

$$f(x, y) = \int_0^\pi \left[\int_{-\infty}^{+\infty} P_\Theta(w) |w| e^{j2\pi ws} dw \right] d\Theta$$


$$\tilde{p}_\Theta(s) = \int_{-\infty}^{\infty} P_\Theta(w) |w| e^{j2\pi ws} dw$$

- Inverse 1D Fourier transformation of $P_\Theta(w)$ multiplied with $|w|$.
- Multiplication in fourier space corresponds to a convolution in time domain

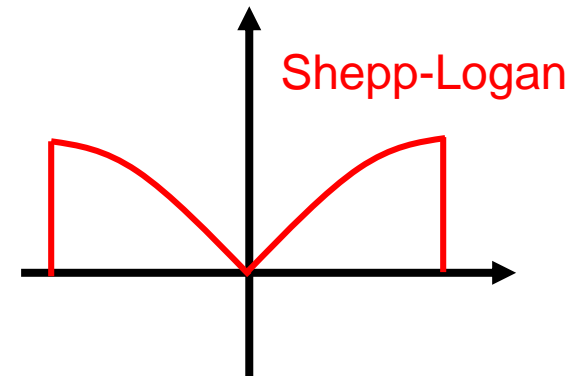
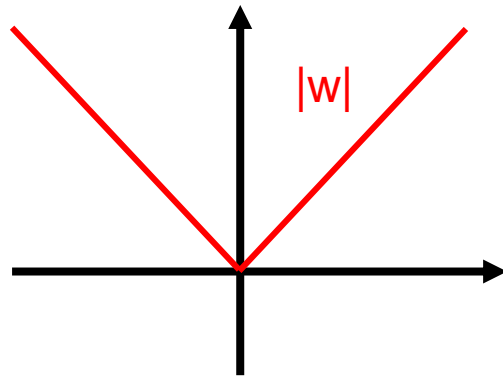
$$p_\Theta(s) \quad \circ \text{---} \bullet \quad P_\Theta(w)$$

$$h(s) \quad \circ \text{---} \bullet \quad |w|$$

$$\tilde{p}_\Theta(s) = p_\Theta(s) * h(s) \quad \circ \text{---} \bullet \quad P_\Theta(w) \cdot |w|$$

Filtered Projection

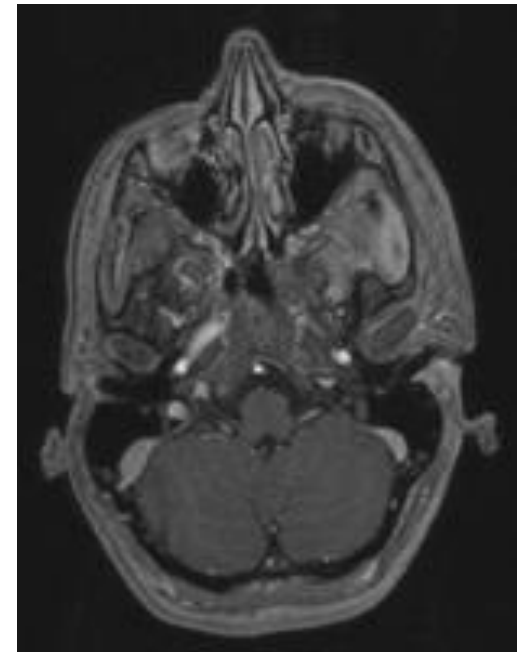
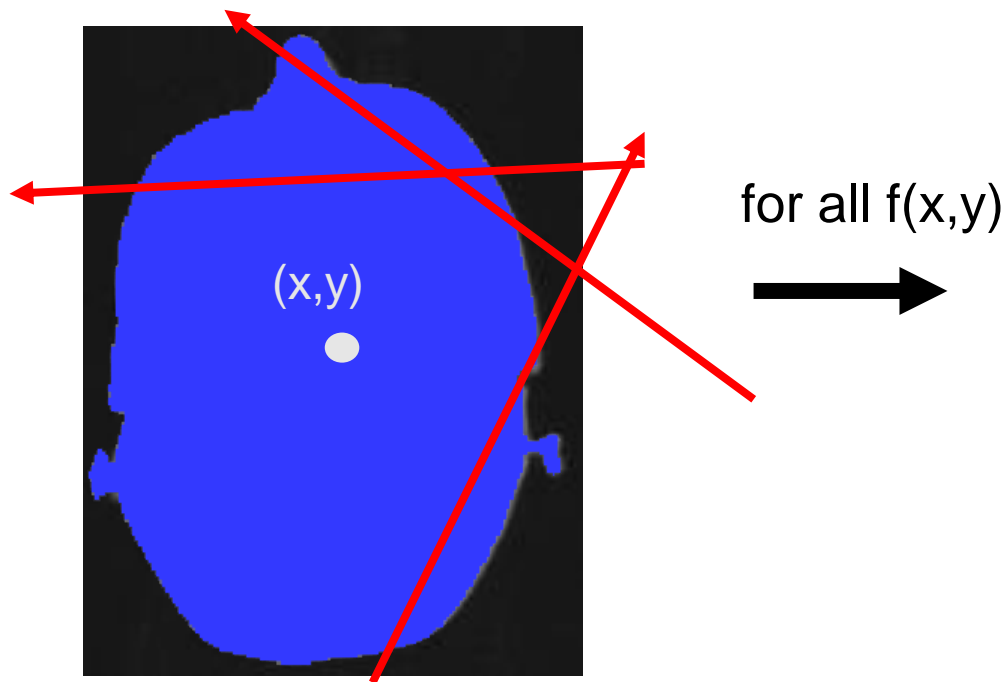
- Filter of $|w|$: Amplification of high frequencies, suppression of low frequencies
- In practice, this filter function is replaced (e.g. with Shepp & Logan function)
- Reason: limited sensor resolution, sampling theorem



Backprojection

$$f(x, y) = \int_0^{\pi} \tilde{p}_{\Theta}(s) d\Theta = \int_0^{\pi} \tilde{p}_{\Theta}(x \cos \Theta + y \sin \Theta) d\Theta$$

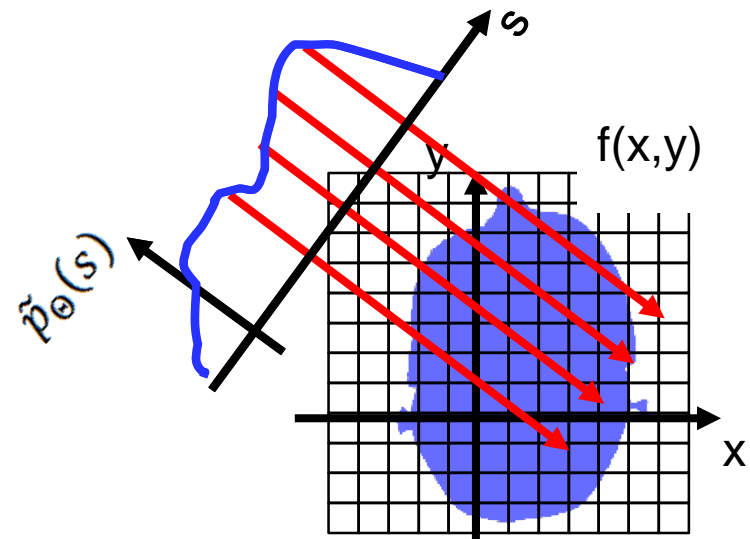
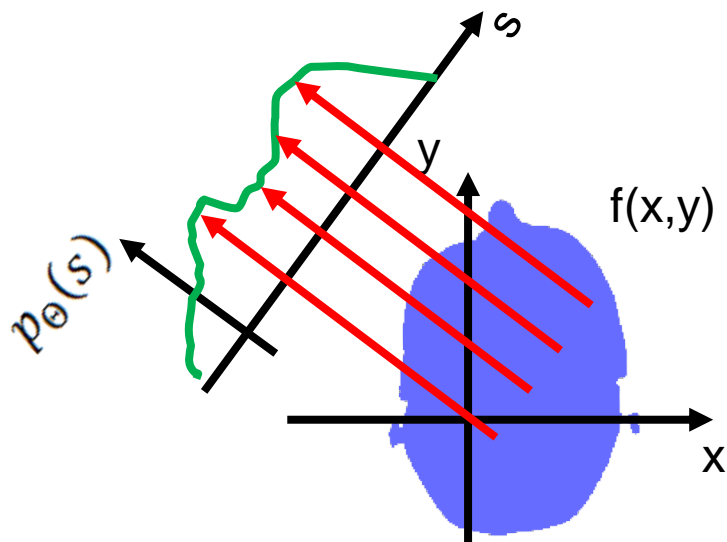
Obtain for point (x, y) the value $f(x, y)$, in which all filtered projections are summed up at the point $x \cos \Theta + y \sin \Theta$



Summary filtered backprojection

- Filter all projections $p_{\theta}(s)$ with filter function $h(s)$ by transformation into the Fourier space $\tilde{p}_{\theta}(s) = p_{\theta}(s) * h(s)$
- Draw all $\tilde{p}_{\theta}(s)$ like a comb along the angle Θ over the image matrix $f(x,y)$, add the appropriate value on each pixel hit

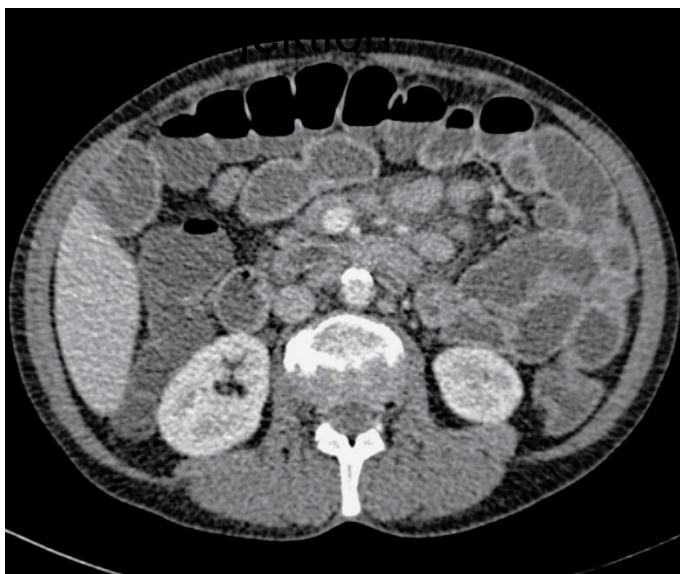
$$\tilde{p}_{\theta}(s') = \tilde{p}_{\theta}(x_1 \cos \theta + y_1 \sin \theta)$$



Evaluation filtered backprojection

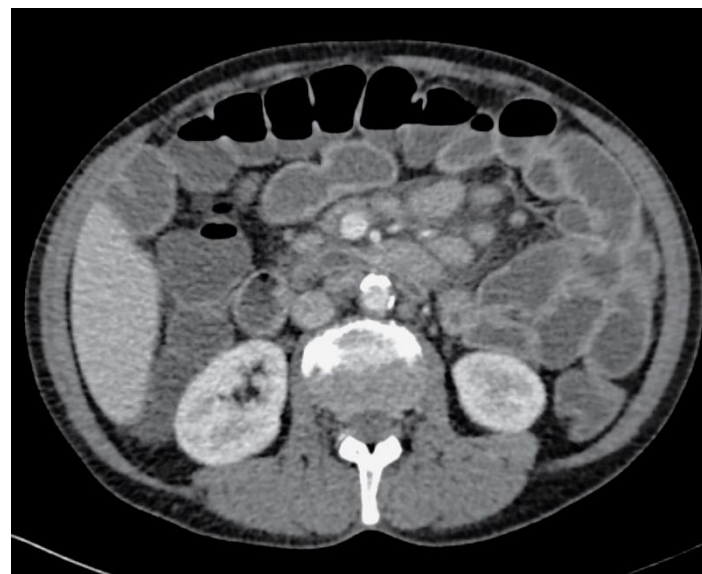
- Standard method, established in clinical routine
 - Very fast: result is directly calculated
 - Signal-to-noise ratio is worse compared to the iterative approach
- Reduction of dosis limited

Filtered Backprojection



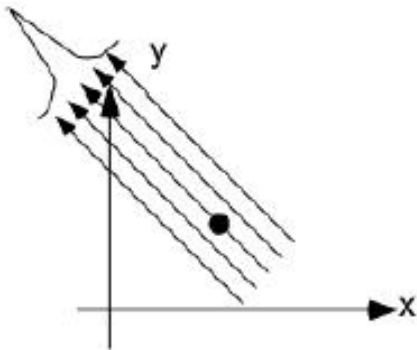
Quelle: Siemens

Iterative Reconstruction

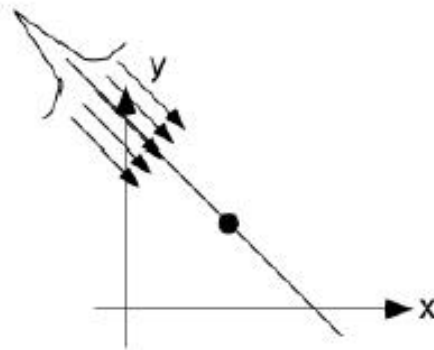


Quelle: Siemens

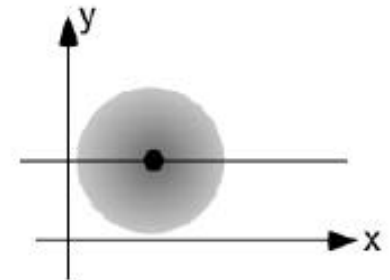
Filtered vs. unfiltered backprojection



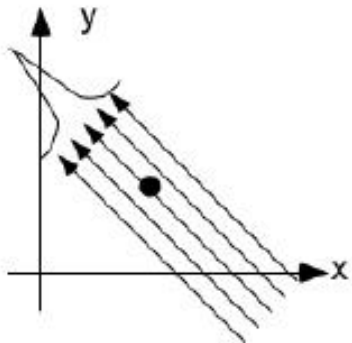
Messung



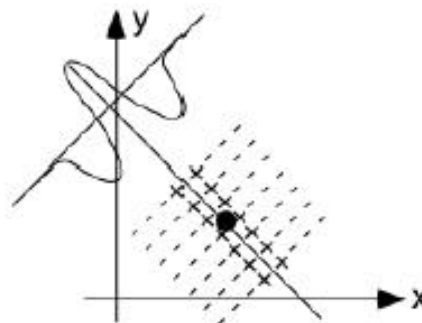
ungefilterte Rückprojektion
einer Messung



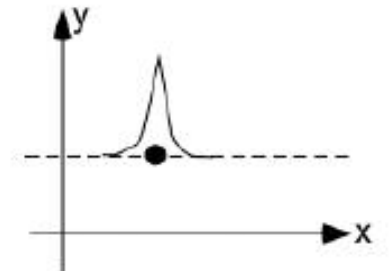
ungefilterte Rückprojektion
alle Messungen



Messung



gefilterte Rückprojektion
einer Messung



gefilterte Rückprojektion
aller Messungen

Quelle: O. Dössel: Bildgebende Verfahren in der Medizin

What is illustrated in the CT?

The spatial distribution of the attenuation coefficient $\mu(x,y)$ is measured

Problem:

- Not very descriptive measurement

Therefore:

- Relative indication of "CT numbers" (relative in terms of attenuation coefficient of water)

Hounsfield scale

In honor of Hounsfield

- Values between -1000 and +3000
- min. 12 Bit gray values necessary (=4096)

$$\text{"CT - Zahl"} = \frac{\mu - \mu_{Wasser}}{\mu_{Wasser}} \bullet 1000 [HU]$$

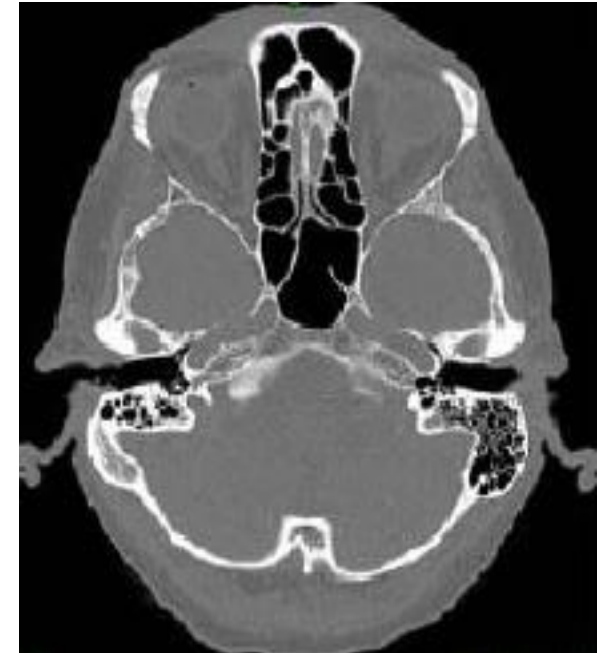
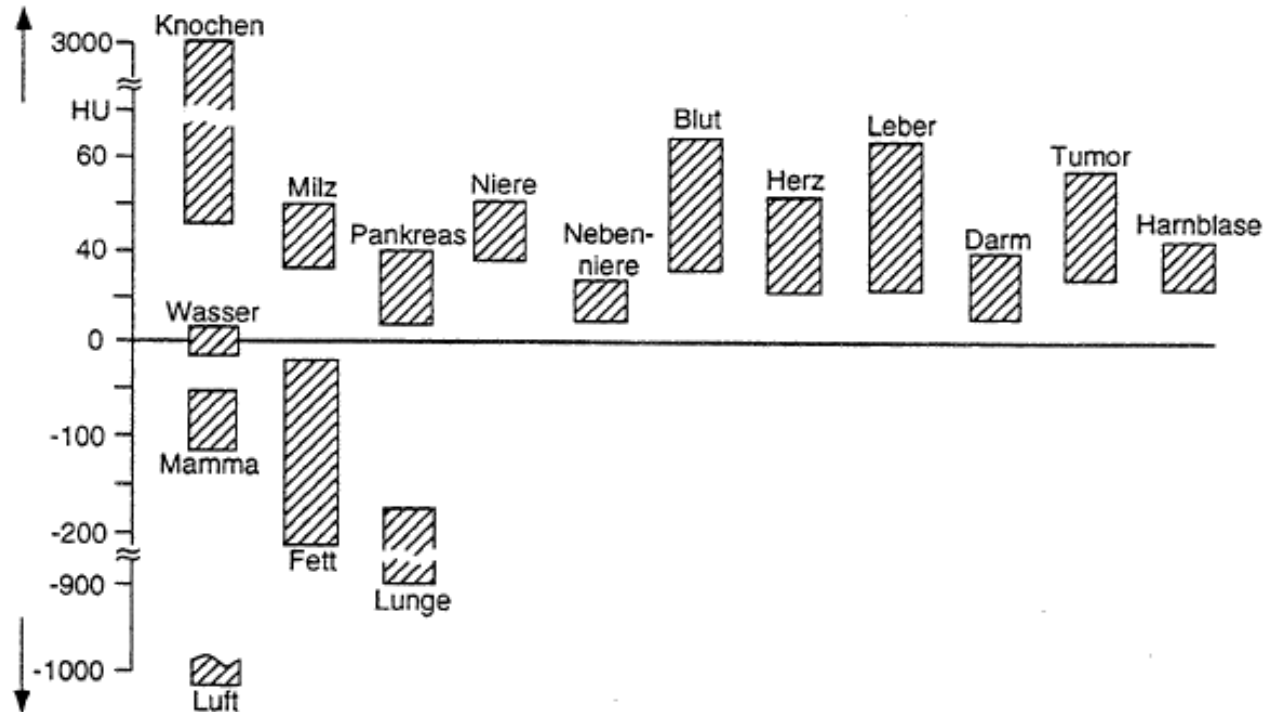


Hounsfield

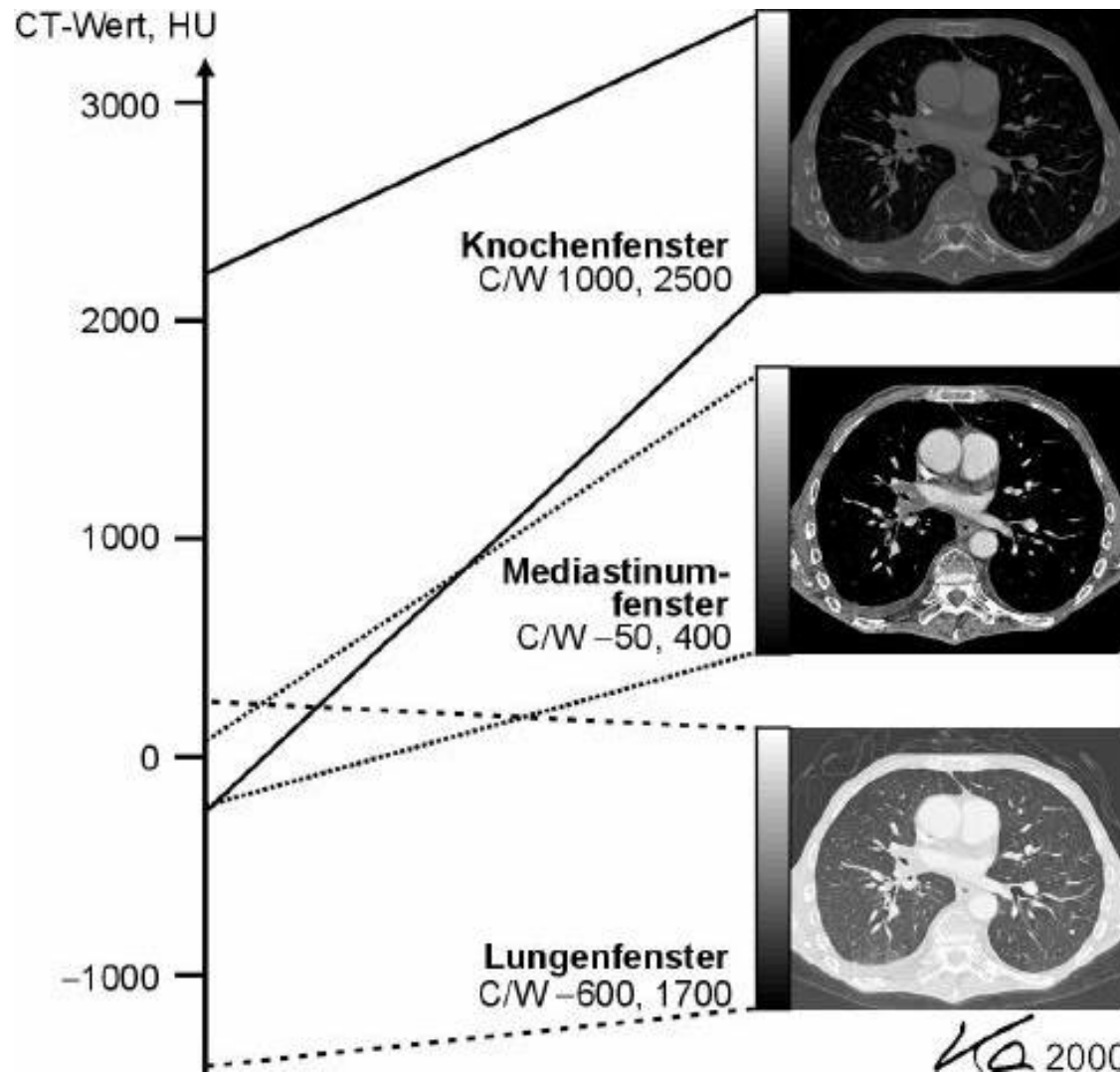
Windowing for visualization necessary

Hounsfield scale

Schwächungswerte von Gewebe (bezogen auf Wasser)



Windowing



Interpretation CT numbers

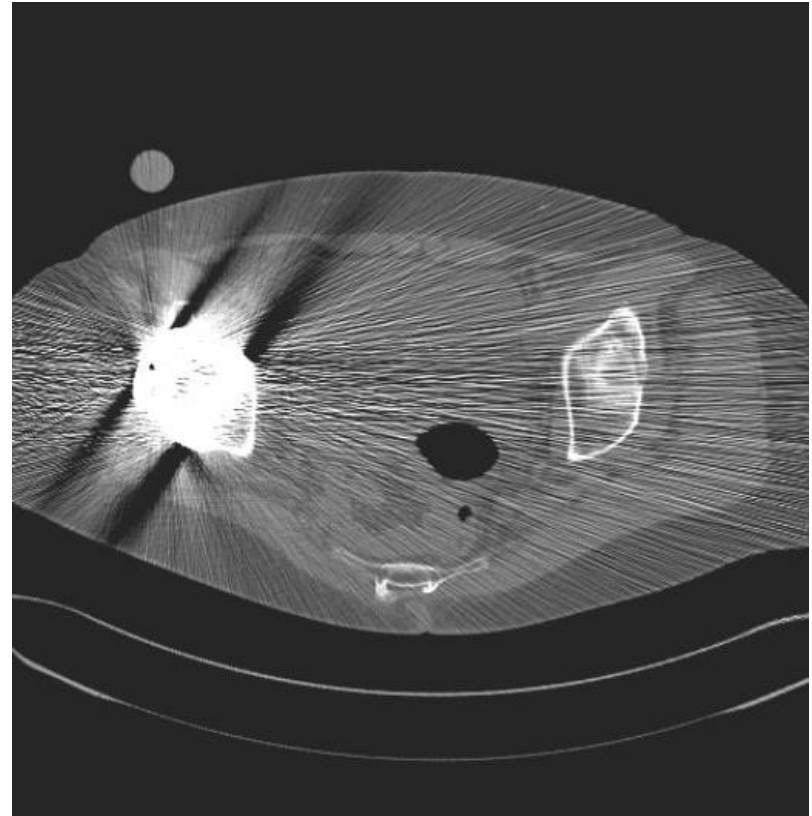
Interpretation

- Normally unique, since feedback to a physical effect (attenuation) is possible
- But: every volume element consists of different materials
- Ambiguous diagnostic findings are possible

Artefact

Reasons

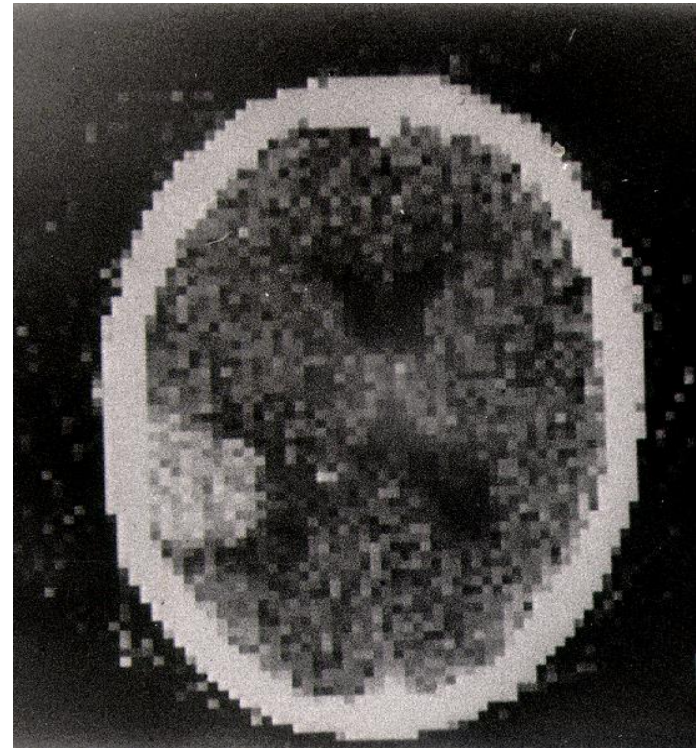
- Different tissue types in one pixel
- Deformation of organs
- metallic implants
- Imprecise approximation of slices
- Sampling errors
- Sensor failure
- ...



CT development

1974 Siemens Siretom

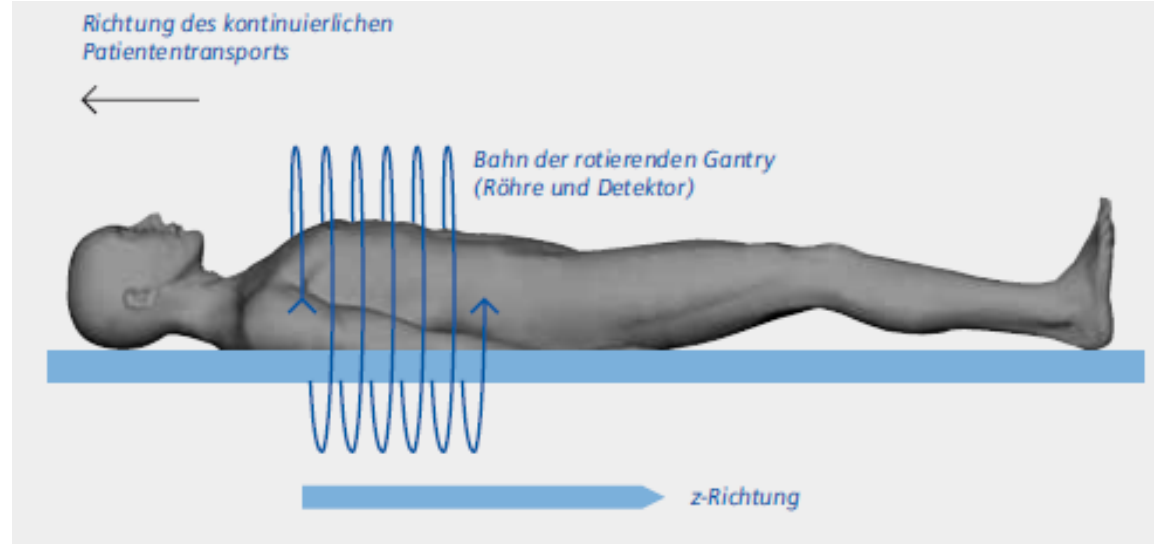
- 80x 80 Pixel, 300s recording time



CT development

1988 Siemens Somatom Plus

- Spiral-CT with slip ring technology
- Continuous tube rotation, continuous feed
shorter recording times, volume recording

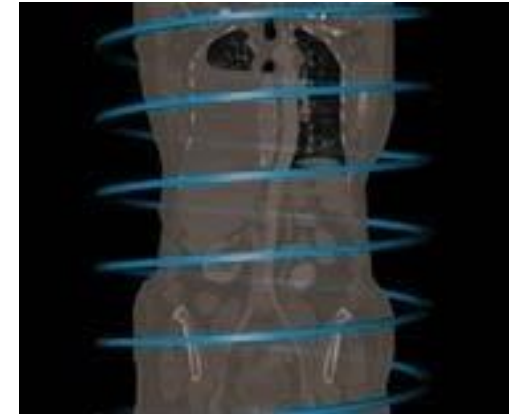
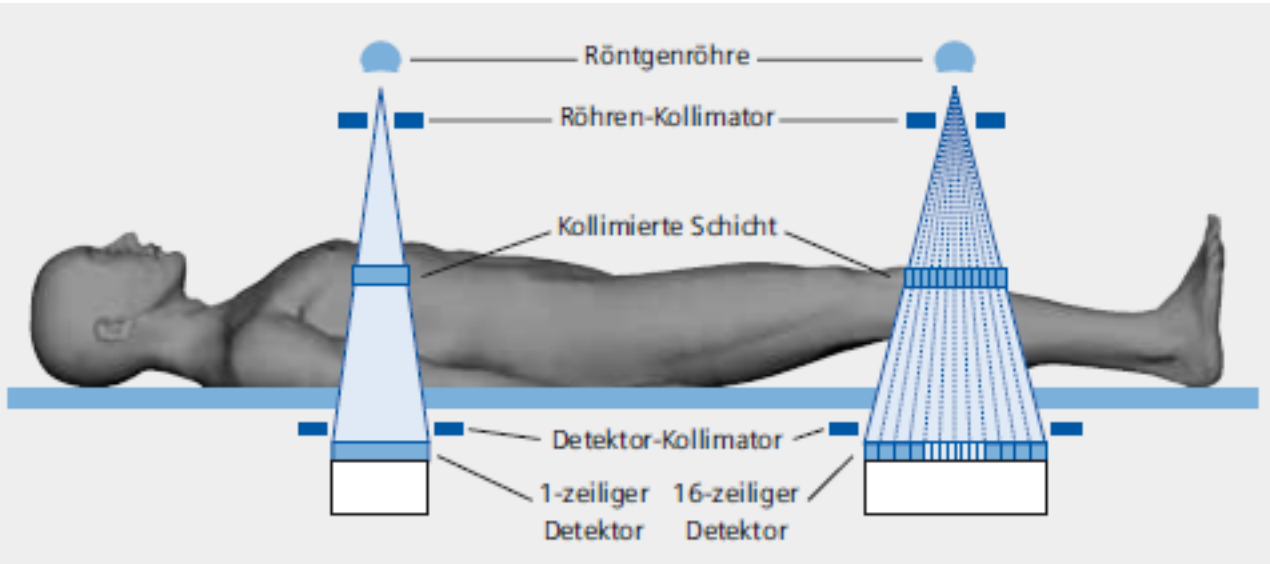


Quelle: Siemens

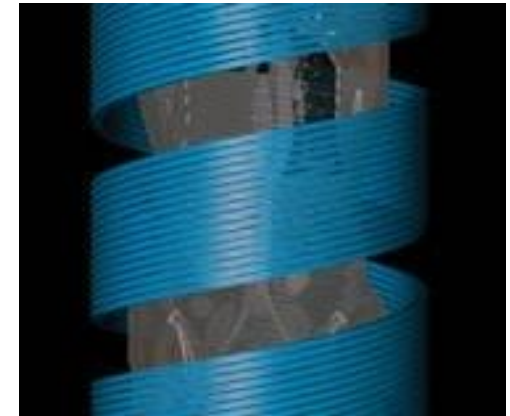
CT - Entwicklung

1998 Siemens Somatom Volume Zoom

- Multislice-Detector, several detector lines
- Recording of 4 slices simultaneously
- Rotation time 0.5 sec



1 slice



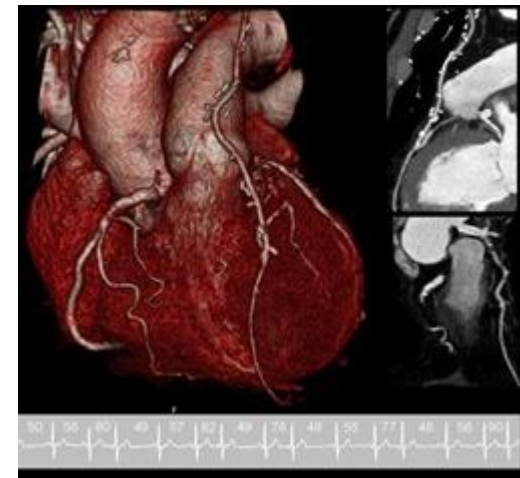
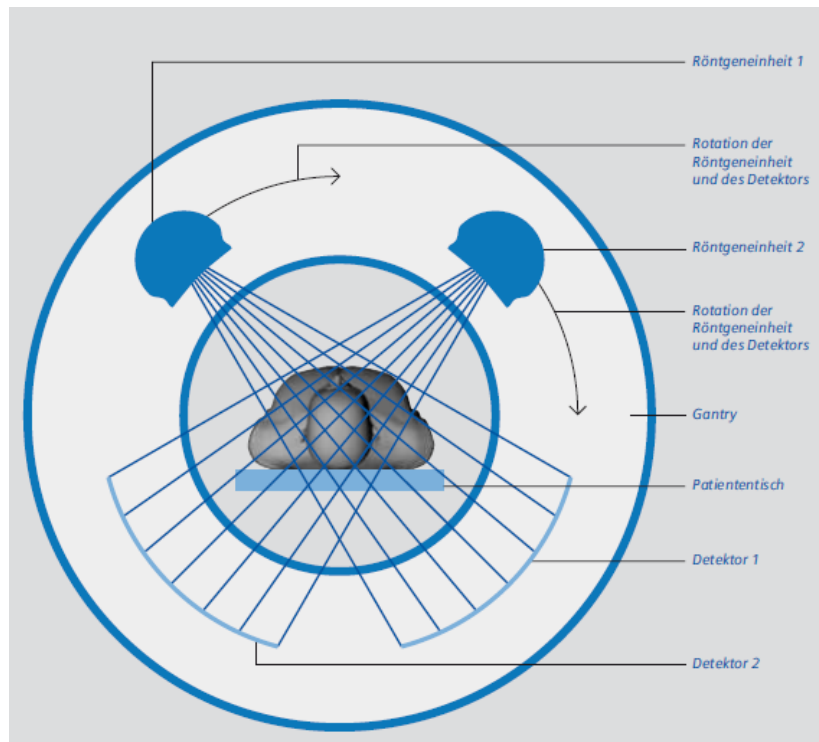
16 slices

Quelle: Siemens

CT development

2006 Siemens Somatom Definition Dual Source CT

- Two X-ray sources, recording time halved

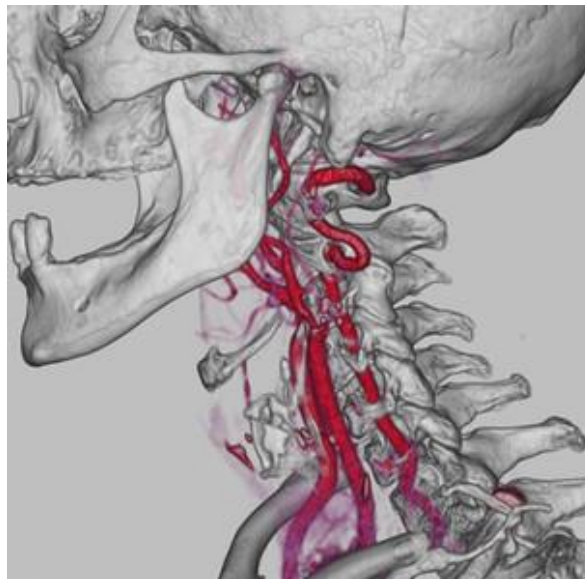
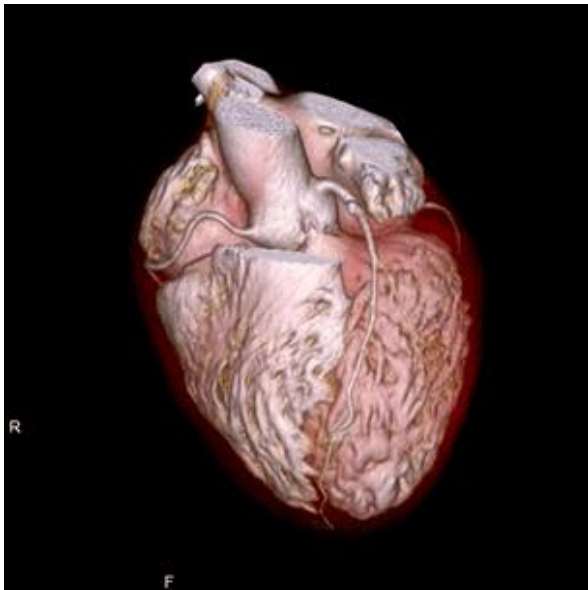


→ Better beating heart recording

CT development

2012 Toshiba Aquilion One Vision Volume Scanner

- 640 slices per recording, 16 cm wide volume
- Dosis reduction due to volume acquisition



Quelle: Toshiba

CT – Evaluation

Principle

- X-ray beams are used for Imaging
- Based on recordings from different perspectives a slice image is calculated

Advantage

- Good visualization of bones, ...
- Very good resolution (Somatom Dual Source 0,24 mm)
- Very fast (Rotation Somatom Dual Source 0,33 sec, Aquillion One 0,35 sec)

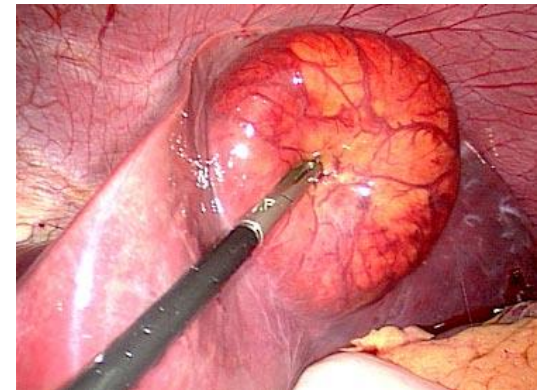
Disadvantages

- Radiation exposure
 - Reduction through better hardware and rekonstruction techniques
- Intraoperative application costly

Outlook

Themen der nächsten Vorlesung:

- Magnetresonanztomographie
 - Physikalische Grundlagen: Kernspin
 - Signalerzeugung: Längs- und Quermagnetisierung
 - Signalmessung: Relaxationsprozesse
 - Signalkodierung: Gradientenfelder
 - Signalrekonstruktion
- Endoskopie
 - Systeme
 - Anwendungen



Literature

- O. Dössel, Bildgebende Verfahren in der Medizin, Springer
- W. Kalender, Computertomographie, Publics MCD Verlag
- Buzug, Einführung in die Computertomographie, Springer Verlag
- H. Handels, Medizinische Bildverarbeitung, Teubner
- T. Lehmann, Bildverarbeitung für die Medizin
- A. Dhawan, Medical Image Analysis
- Elektronisches Skriptum zum Thema Röntgen usw:
http://www.emk.e-technik.tu-darmstadt.de/~ronblech/bmt/www_Bildarchiv.htm
- Fa. Siemens
- http://www.vms.ei.tum.de/publ/pdf/at0210_472.pdf
- <http://www.slaney.org/pct/pct-toc.html>
- http://www.medical.siemens.com/siemens/de_DE/rg_marco_m_FBAs/files/Events/drk2010/CT_IRIS_04-2010.pdf