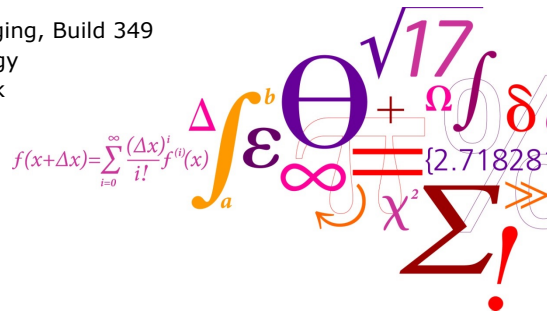


## Reconstruction in CT and hints to the assignments

Jørgen Arendt Jensen

October 28, 2021

Center for Fast Ultrasound Imaging, Build 349  
Department of Health Technology  
Technical University of Denmark

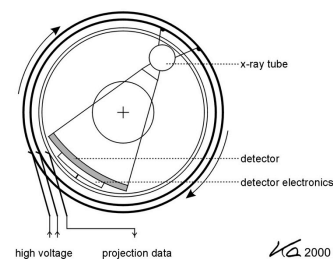
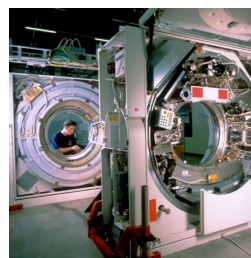


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## CT reconstruction repetition & hints

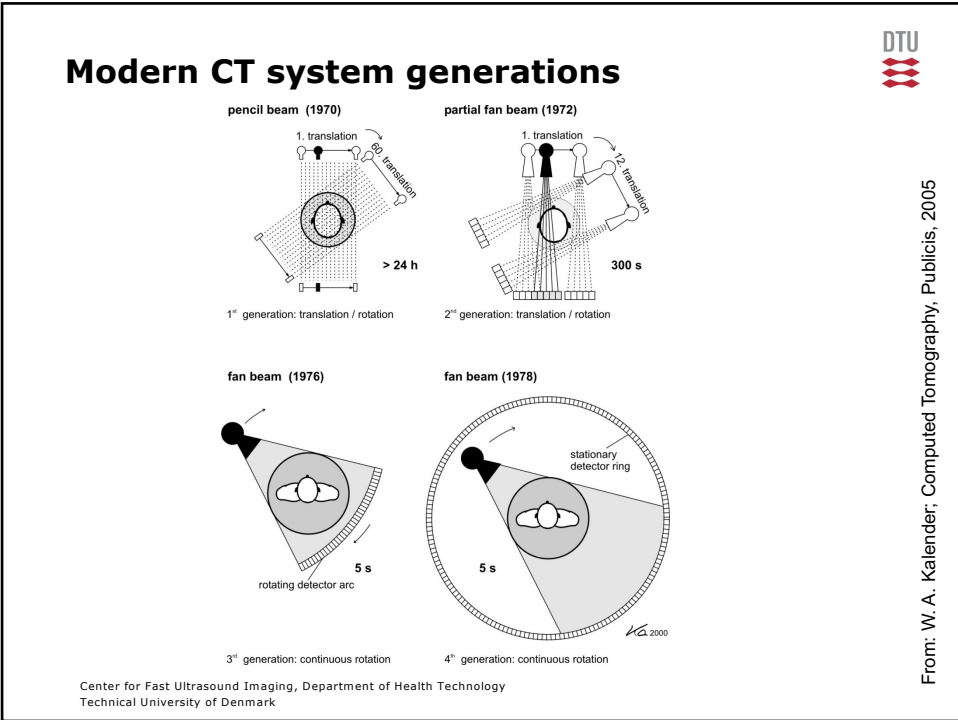
- Filtered backprojection algorithm
  - Radon transform
  - Filtered backprojection
  - Filters and their impulse responses
- Advise for the assignments
- Reading material: Prince & Links Chapter 6



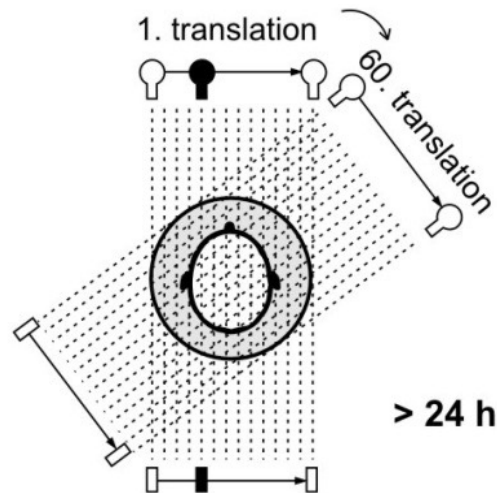
From: W. A. Kalender; Computed Tomography, Publicis, 2005

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## Parallel beam projection

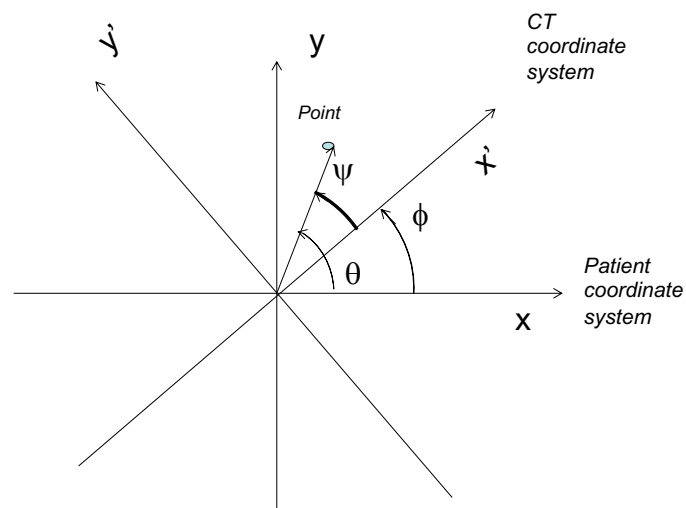


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From: W. A. Kalender; Computed Tomography, Publicis, 2005

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## Parallel beam projection geometry



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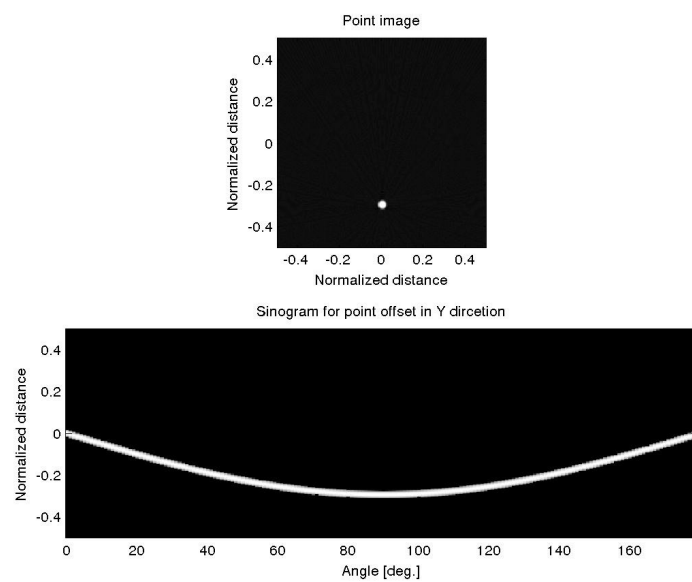
## Radon transform

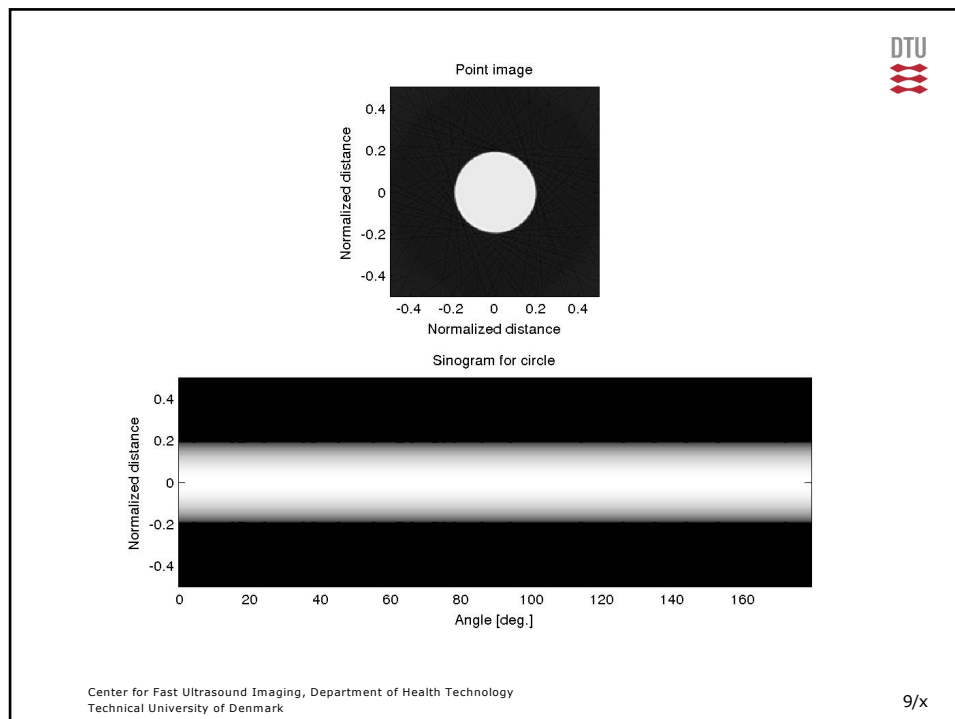
$$p(x', \phi) = \int_{-\infty}^{+\infty} f(x' \cos \phi - y' \sin \phi, x' \sin \phi + y' \cos \phi) dy'$$

$f(x, y)$  – Attenuation image

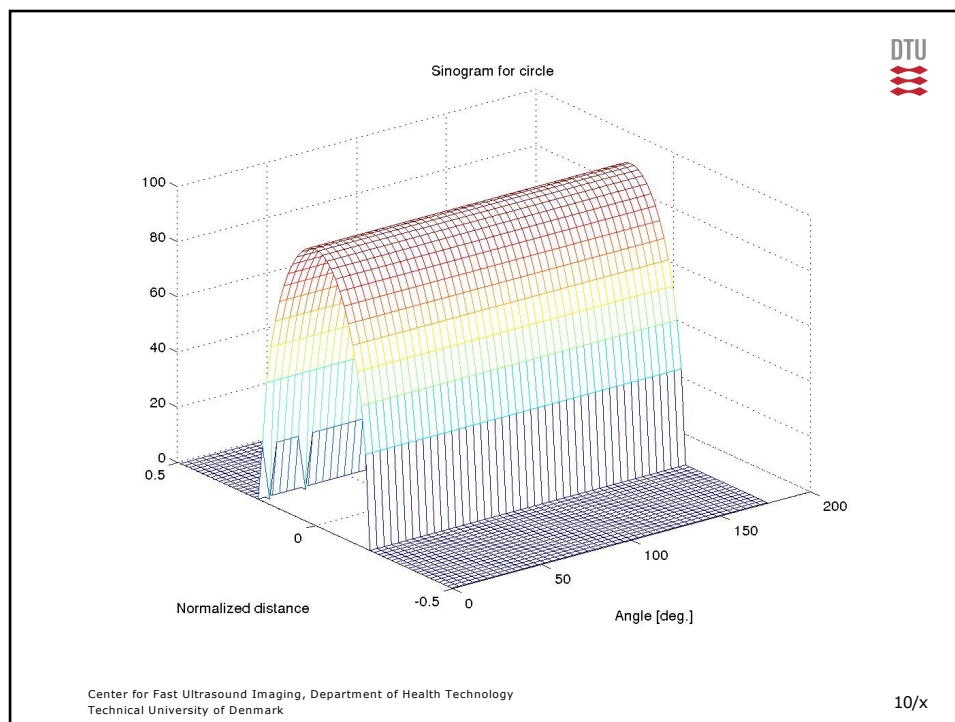
$x', y'$  – Gantry coordinate system

$x, y$  – Patient coordinate system

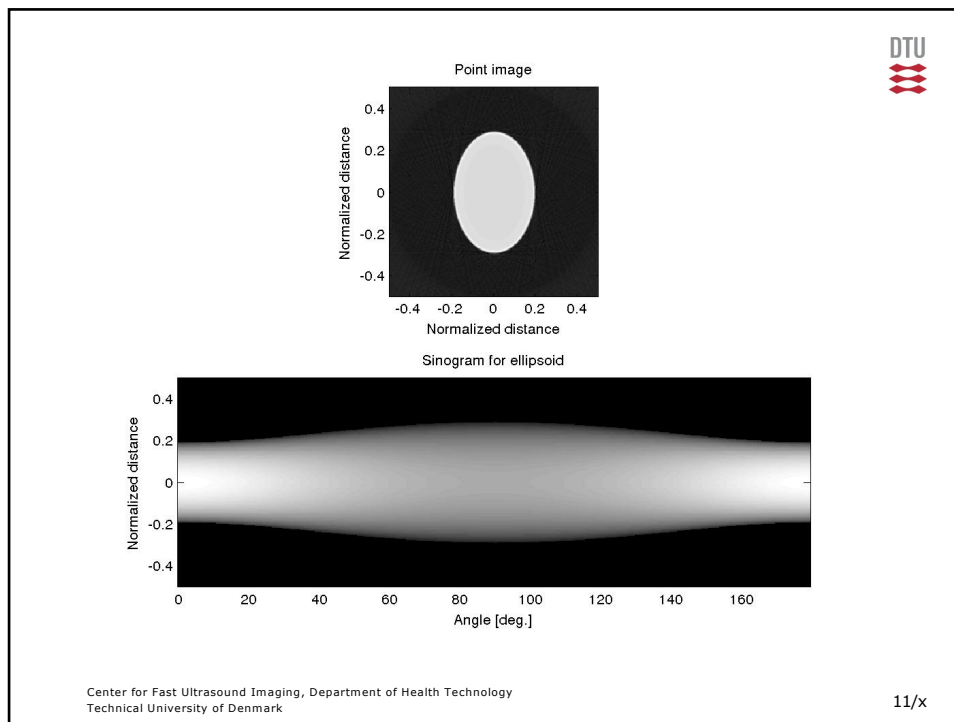




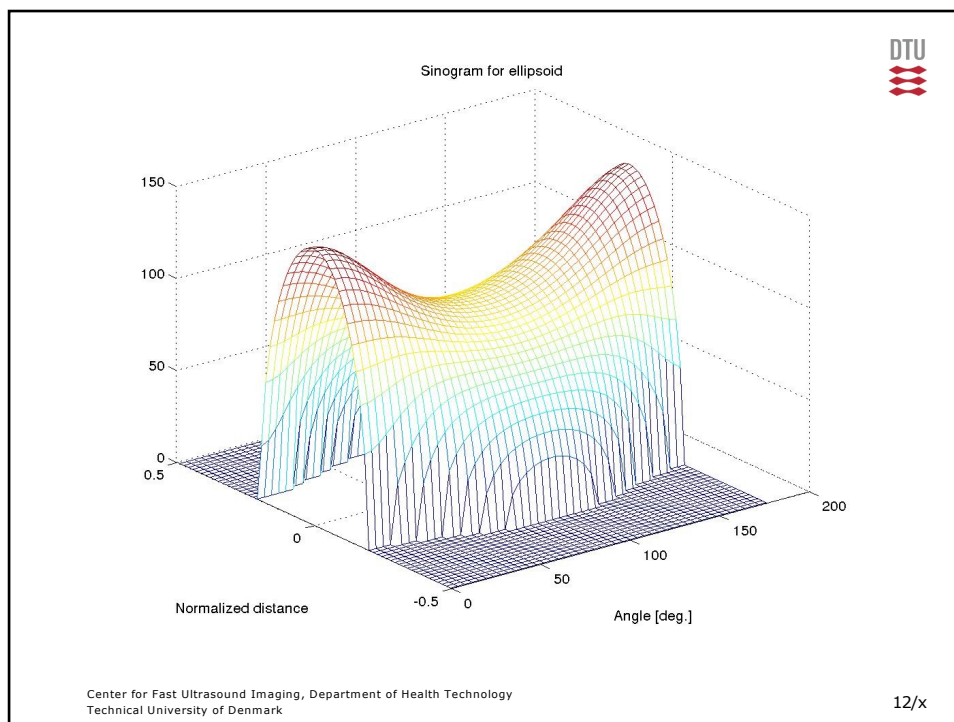
9



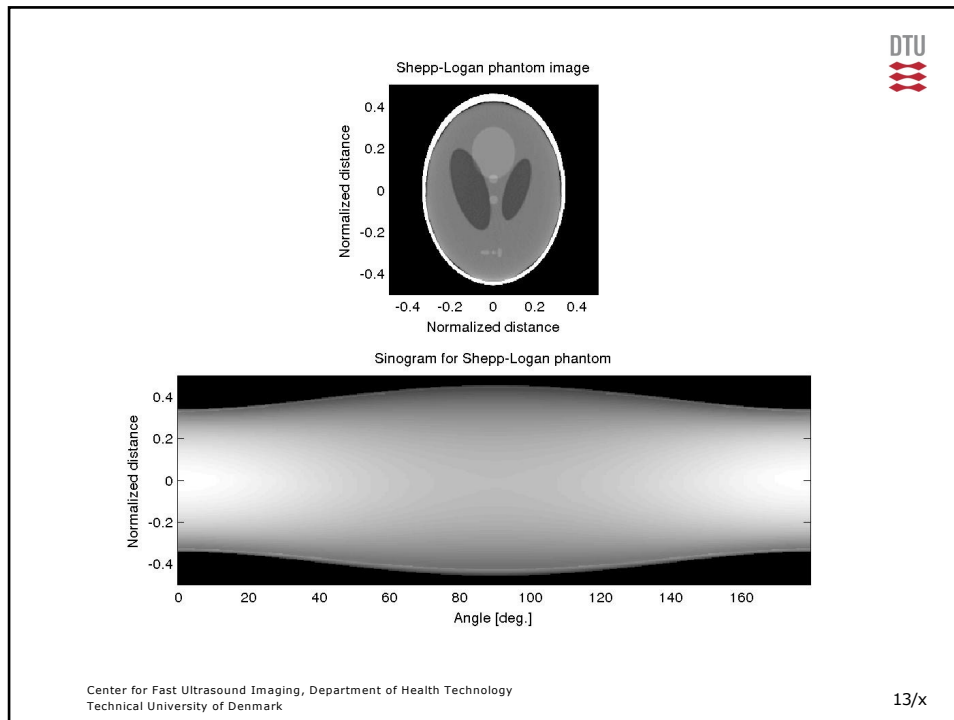
10



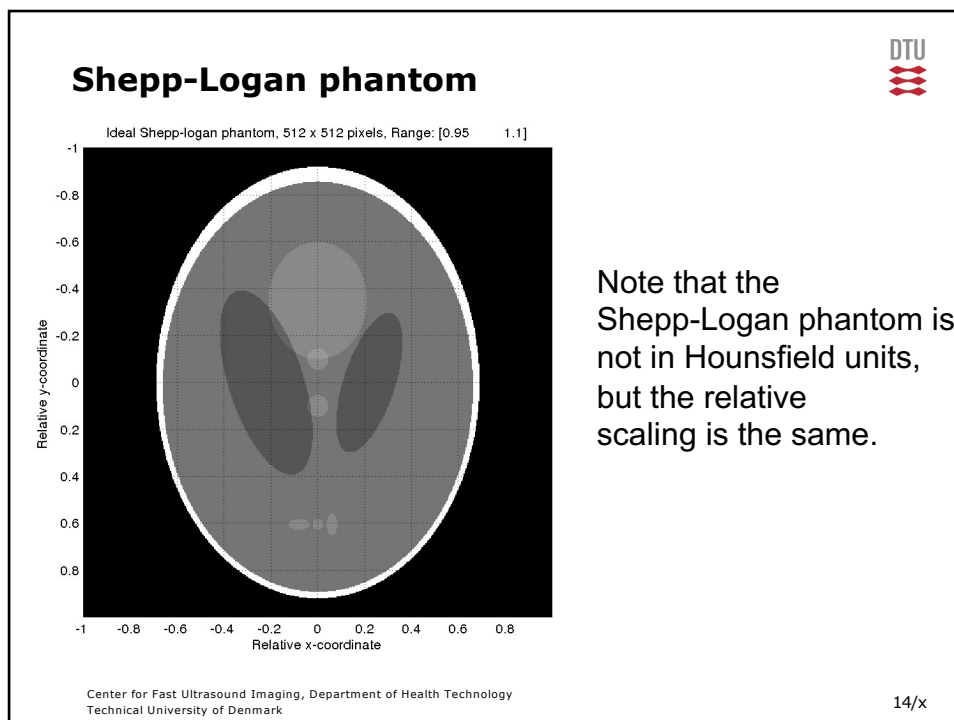
11



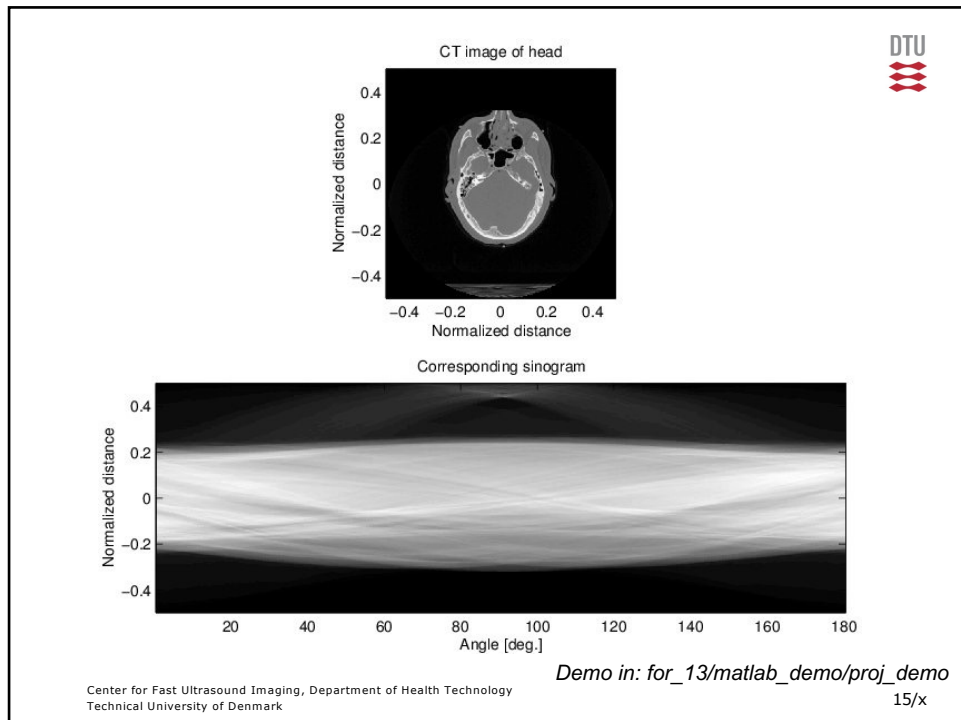
12



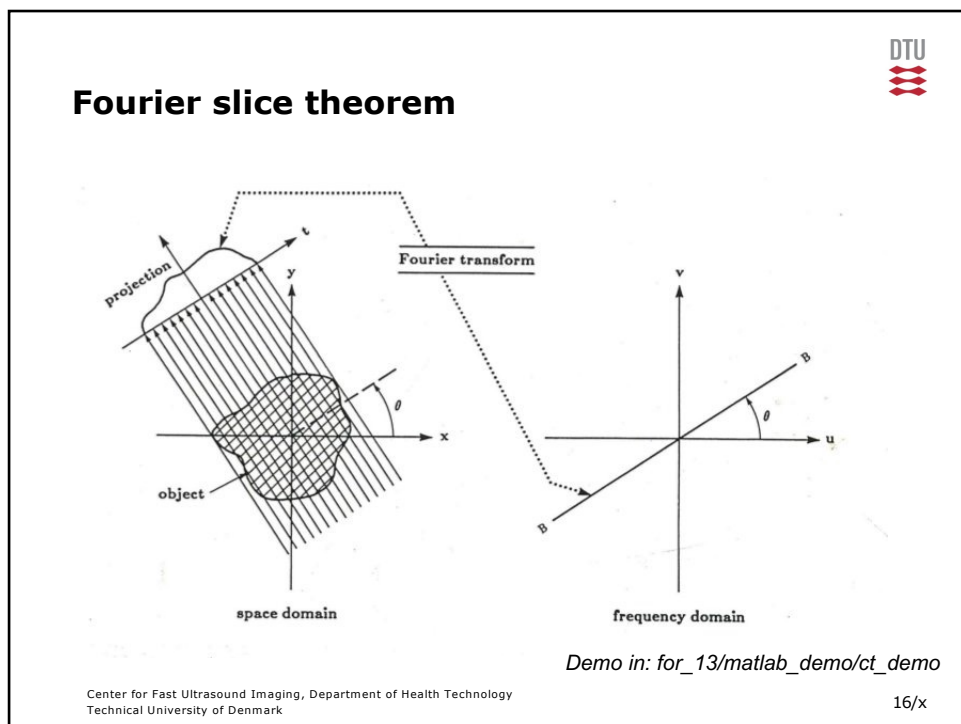
13



14



15



16



## Fourier Slice Theorem

$$P(\rho, \phi) = \int_{-\infty}^{+\infty} p(x', \phi) e^{-j2\pi\rho x'} dx'$$

$$= F(\rho \cos \phi, \rho \sin \phi)$$

$F(u, v)$  – 2D Fourier transform of image  
 $\phi$  – Gantry rotation

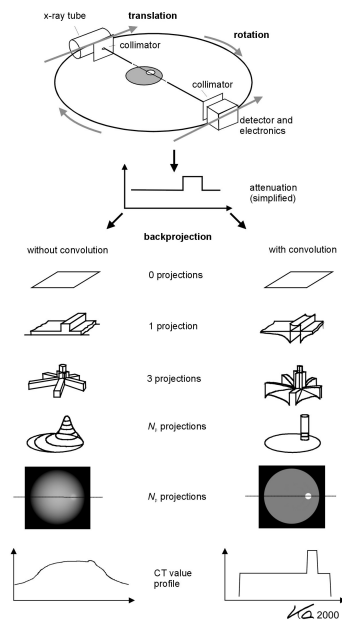
## Filtered Back Projection (FBP)

$$\hat{f}(x, y) = \int_0^{\pi} \int_{-\infty}^{+\infty} |\rho| P(\rho, \phi) e^{j2\pi\rho x'} d\rho d\phi$$

$\hat{f}(x, y)$  – Reconstructed image  
 $\phi$  – Gantry rotation  
 $x'$  – Detector position

## Filtered backprojection

- Perform for all projections:
  - Make Fourier transform of projected data
  - Apply filter in Fourier domain
  - Make inverse transform
  - Back-project and sum with previous image

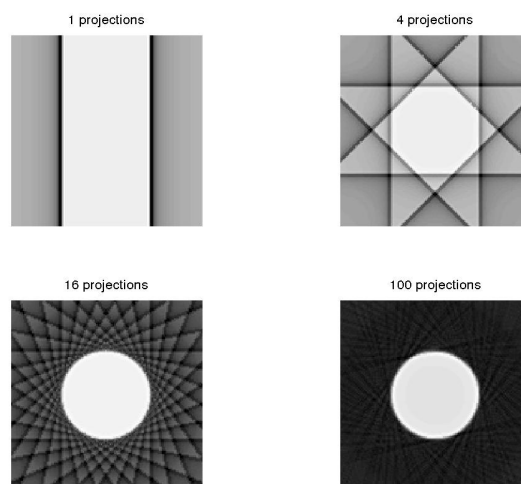


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## Influence from number of projections



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## Ram-Lak filter

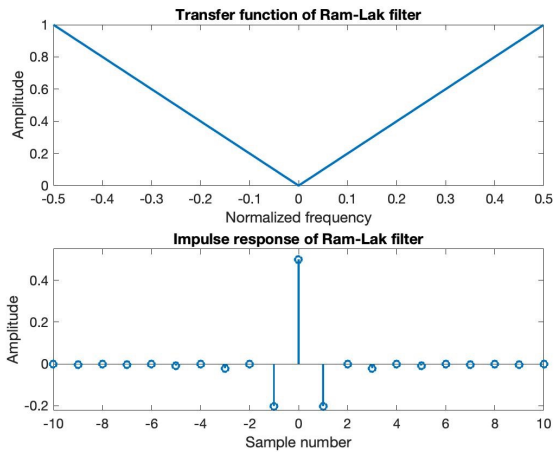


Transfer function:

$$h(\rho) = \begin{cases} |\rho|, & |\rho| \leq B \\ 0 & \text{else} \end{cases}$$

Impulse response

$$h(k) = \begin{cases} B^2 & k = 0 \\ -\frac{B^2}{\left(\frac{\pi}{2}k\right)^2} & k \text{ odd} \\ 0 & k \text{ even} \end{cases}$$



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## Impulse response for Ram-Lak filter



- Impulse response of square wave:

$$h_{\text{square}}(x) = A2B \frac{\sin 2\pi B x}{2\pi B x}$$

- Ram-Lak impulse response: square wave – triangle:

$$h_{\text{ramlak}}(x) = 2BB \frac{\sin 2\pi B x}{2\pi B x} - B^2 \frac{\sin^2 \pi B x}{(\pi B x)^2}$$

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## Sampling of impulse response for Ram-Lak filter

- Sampling at  $\frac{1}{\Delta x} = 2B, x = k \Delta x = \frac{k}{2B}$ :

$$h_{ramlak}(k) = 2B^2 \frac{\sin 2\pi B \frac{k}{2B}}{2\pi B \frac{k}{2B}} - B^2 \frac{\sin^2 \pi B \frac{k}{2B}}{(\pi B \frac{k}{2B})^2}$$

$$\sin 2\pi B \frac{k}{2B} = \sin \pi k = 0$$

$$\sin^2 \pi B \frac{k}{2B} = \sin^2 \frac{\pi}{2} k = 1 \text{ (k odd) else } 0$$

- Gives:

$$h(0) = B^2$$

$$h(k) = -B^2 \frac{\sin^2 k \frac{\pi}{2}}{(k \frac{\pi}{2})^2} = -\frac{B^2}{(k \frac{\pi}{2})^2} \text{ (k odd)}$$

$$h(k) = 0 \text{ else}$$

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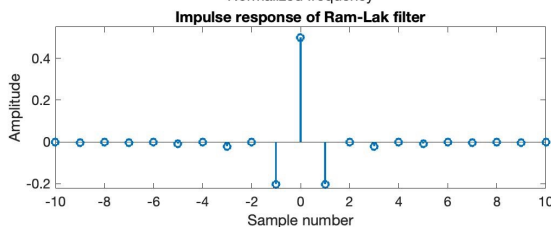
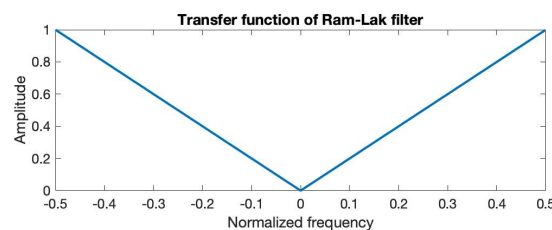
## Ram-Lak filter

Transfer function:

$$h(\rho) = \begin{cases} |\rho|, & |\rho| \leq B \\ 0 & \text{else} \end{cases}$$

Impulse response

$$h(k) = \begin{cases} B^2 & k = 0 \\ -\frac{B^2}{\left(\frac{\pi}{2} k\right)^2} & k \text{ odd} \\ 0 & k \text{ even} \end{cases}$$

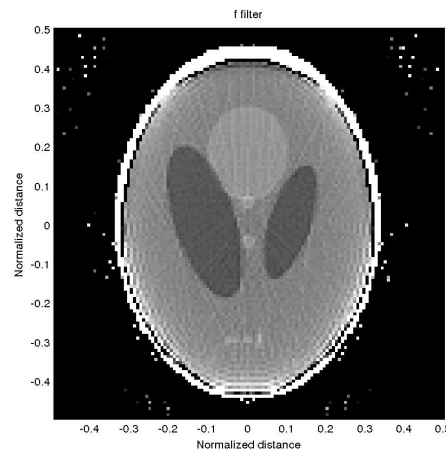


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## Transfer function of filters – Ram-Lak



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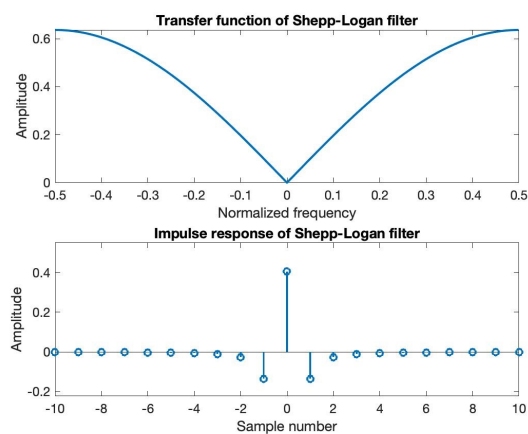
## Shepp-Logan filter

Transfer function:

$$h(\rho) = \begin{cases} |\rho| \frac{\sin \frac{2\pi\rho}{4B}}{\frac{2\pi\rho}{4B}}, & |\rho| \leq B \\ 0 & \text{else} \end{cases}$$

Impulse response

$$h(k) = -\frac{8B^2}{\pi(4k^2 - 1)}$$

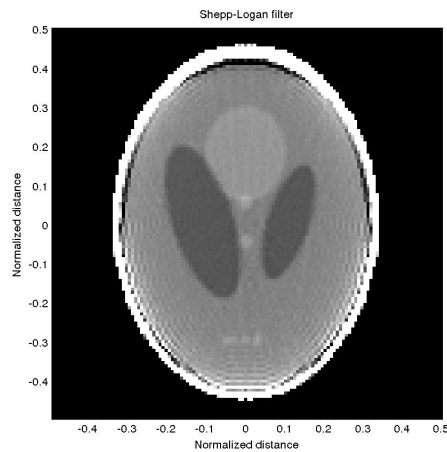


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## Shepp-Logan filter

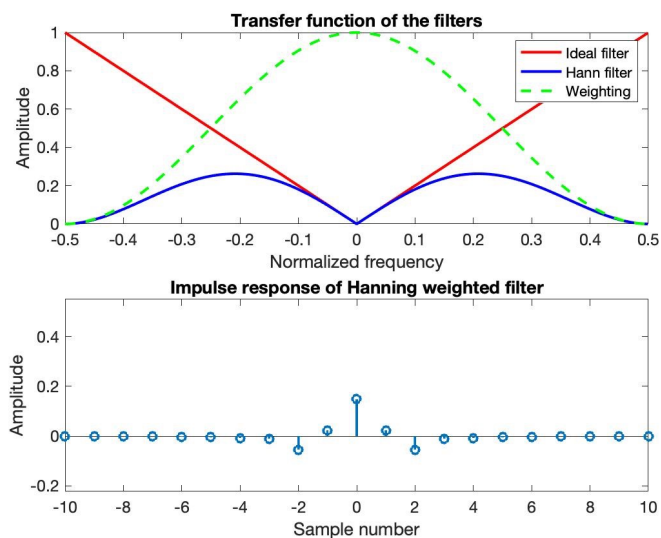


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## Hanning weighted filter

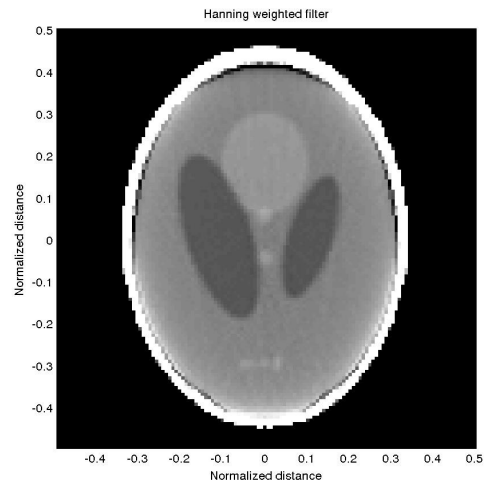


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## Hanning weighted filter

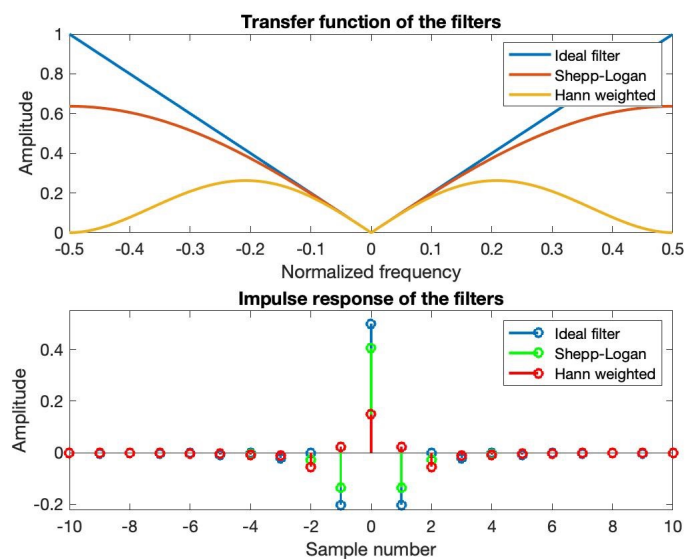


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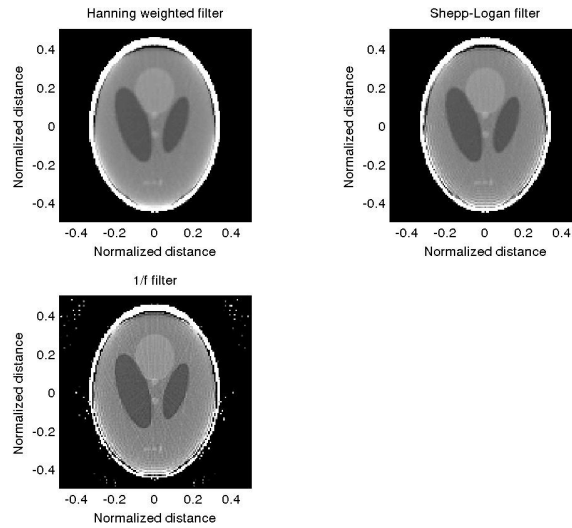
## Filter transfer functions and impulse responses



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## Comparison between filters

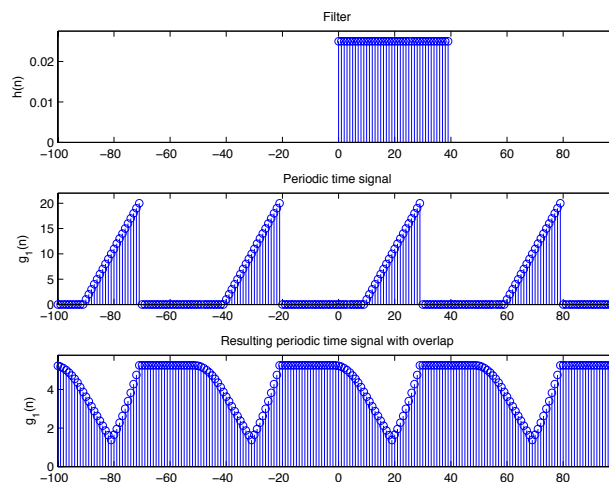


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## Circular convolution



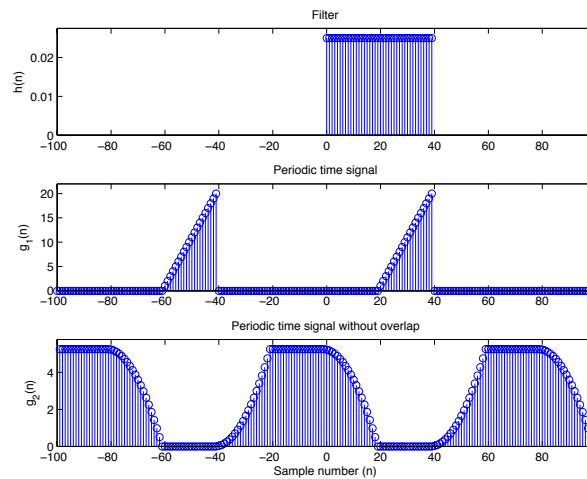
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32/x

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## Circular convolution

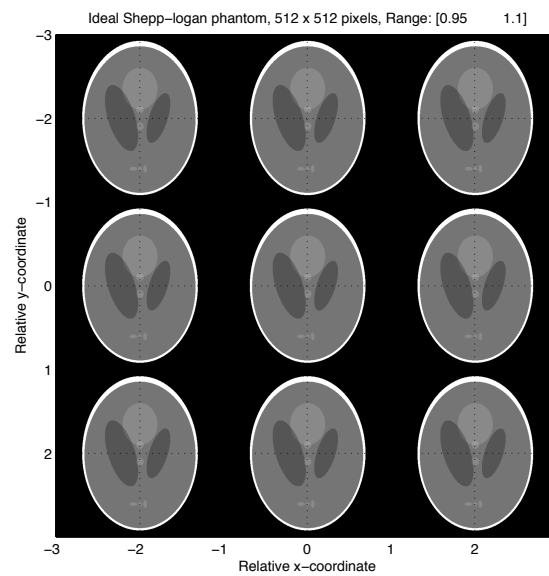


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33/x

33

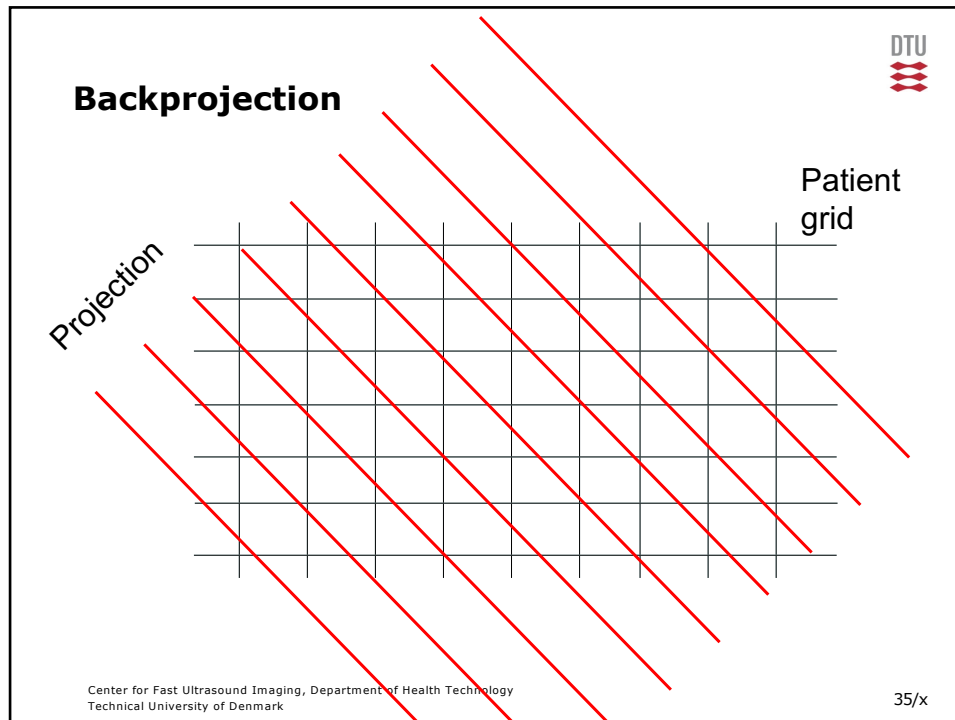
## Circular convolution – Shepp-Logan



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34



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## Data for testing and validation

- Use data sets on web site
- Circular phantom for geometry test
- Shepp-Logan for orientation and quantitative data
- In-vivo images for Hounsfield units

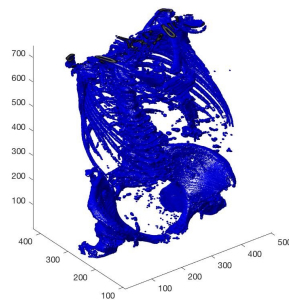
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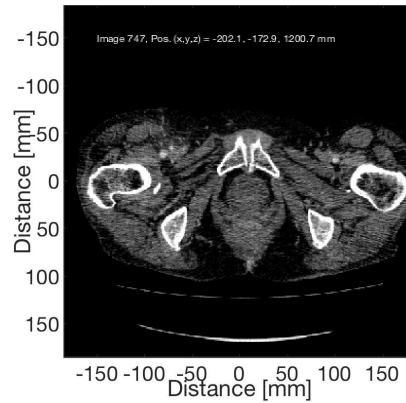
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## Assignment data

- DICOM data from female patient
- All data available on the web
- Task is to find which slice it is



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Data and program in:  
undervisning/k\_22485\_31545\_billeder/ct\_data/dicom\_data

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## Reading DICOM data

```
% Set overall parameters
dir_name='DICOM/ST00001/SE00001/'; % Directory name
start_image=1; % First image in series
end_image=747; % Last image in series
frame_rate=50; % Frame rate for playing back the movie

% Set the dynamic range for the display
off_set=100; % Offset [Hu]
range=400; % Range to display [Hu]
map_values=128; % Number of gray level values
bone_off_set= -250; % Offset for showing the bones
bone_range=100; % Range for showing the bones

% Initialize figure
colormap(gray(map_values));
dicom_movie(end_image+1-start_image) = struct('cdata',[],'colormap',[]);

% Read information for the first images
file_name='IM00001';
info=dicominfo([dir_name, file_name]);
dx=info.PixelSpacing(1);
dy=info.PixelSpacing(2);
Y = dicomread(info);
[Nx,Ny]=size(Y);

% Make space for all the images
Y=zeros(Nx,Ny,end_image+1-start_image);
z_positions=zeros(end_image+1-start_image,1);
```

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```
% Loop through the images and read and display them

for i=start_image:end_image
    file_name=[ 'IM00',num2str(floor(i/100)),num2str(floor(rem(i,100)/10)),num2str(rem(i,10))];
    info=dicominfo([dir_name, file_name]);
    Y(:, :, i) = dicomread(info);
    image((1:Nx)-Nx/2)*dx, ((1:Ny)-Ny/2)*dy, (double(Y(:, :, i))+off_set)/range*map_values)
    xlabel('Distance [mm]')
    ylabel('Distance [mm]')
    pos=sprintf('%5.1f, %5.1f, %5.1f', info.ImagePositionPatient(1), ...
        info.ImagePositionPatient(2), info.ImagePositionPatient(3));
    z_positions(i)= info.ImagePositionPatient(3);
    text(-150, -150, ['Image ', num2str(i), ' Pos. (x,y,z) = ', pos, ' mm'], 'Color', [1 1 1])
    axis('image')
    drawnow
    dicom_movie(i)=getframe;
end

% Display the movie

movie(dicom_movie, 5, frame_rate);
```

Full script can be found at:

[courses.healthtech.dtu.dk/22485/files/ct\\_data/dicom\\_data/display\\_dicom\\_images.m](https://courses.healthtech.dtu.dk/22485/files/ct_data/dicom_data/display_dicom_images.m)

on the page for the CT data: [courses.healthtech.dtu.dk/22485/?ct\\_data/assign\\_data.html](https://courses.healthtech.dtu.dk/22485/?ct_data/assign_data.html)