

CSE 564

VISUALIZATION & VISUAL ANALYTICS

MEDICAL & SCIENTIFIC VISUALIZATION

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Lecture	Topic	Projects
1	Intro, schedule, and logistics	
2	Applications of visual analytics, basic tasks, data types	
3	Introduction to D3, basic vis techniques for non-spatial data	Project #1 out
4	Data assimilation and preparation	
5	Bias in visualization	
6	Data reduction and dimension reduction	
7	Visual perception and cognition	Project #1 due
8	Visual design and aesthetics	Project #2 out
9	Python/Flask hands-on	
10	Cluster analysis: numerical data	
11	Cluster analysis: categorical data	
12	Foundations of scientific and medical visualization	
13	Computer graphics and volume rendering	Project #2 due
14	Scientific and medical visualization	Project #3 out
15	High-dimensional data, dimensionality reduction	
16	Big data: data reduction, summarization	
17	Correlation and causal modeling	Project #3 due
18	Principles of interaction	
19	Midterm #1	
20	Visual analytics and the visual sense making process	Final project proposal due
21	Evaluation and user studies	
22	Visualization of time-varying and time-series data	
23	Visualization of streaming data	
24	Visualization of graph data	Final Project preliminary report due
25	Visualization of text data	
26	Midterm #2	
27	Data journalism	
	Final project presentations	Final Project slides and final report due

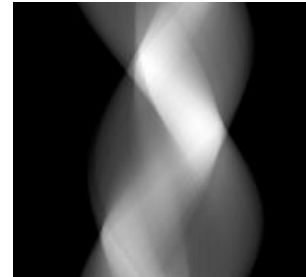
Medical Imaging: Overall Concept



human (in pain)



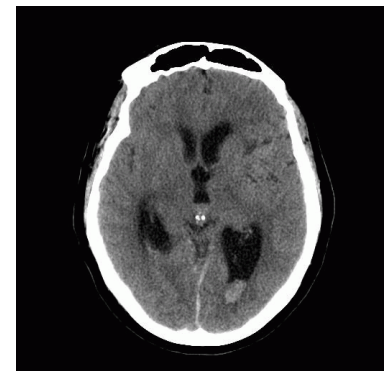
imaging device



data



reconstructed
cross-sectional
image



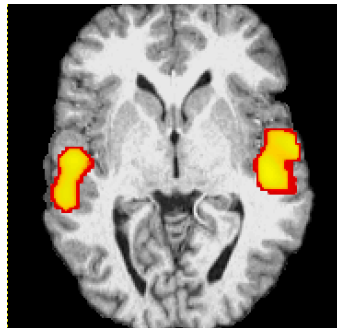
Imaging Modalities Overview

CT



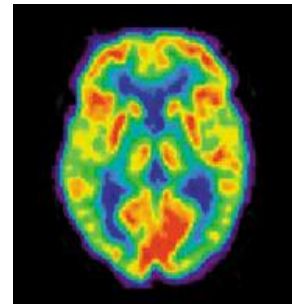
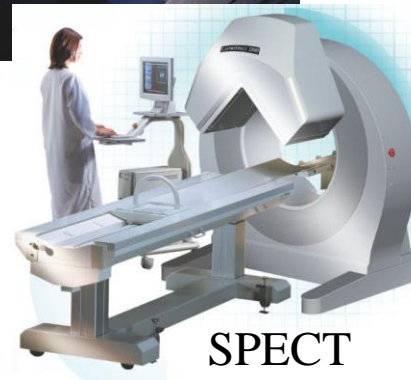
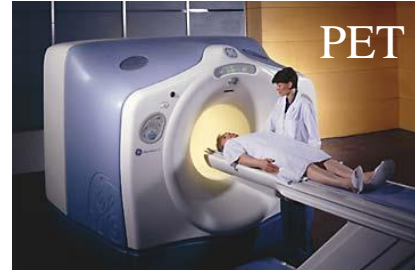
X-ray

MRI / fMRI



magnetic spin

Nuclear



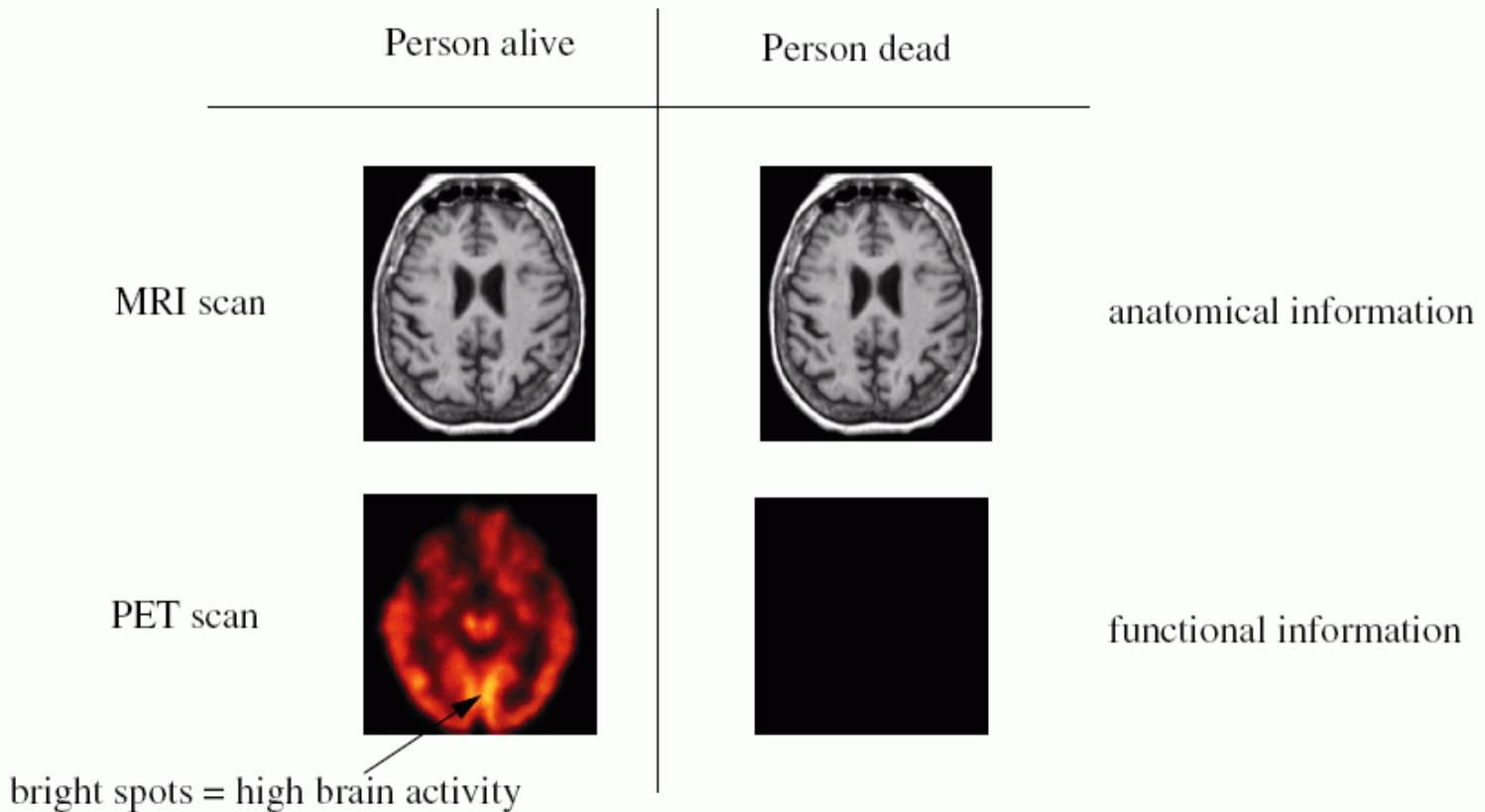
metabolic tracer X-ray
emission

Ultrasound



sound waves

Anatomic vs Functional Imaging



An MRI scan shows you that you have a brain

A PET scan shows that you use it

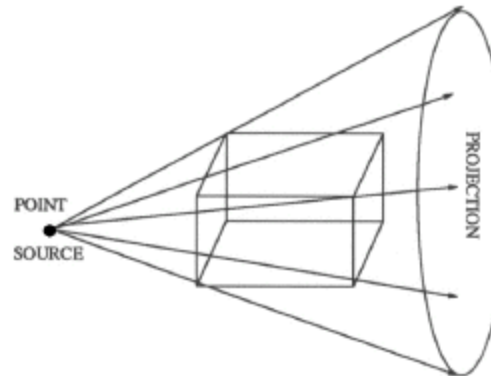
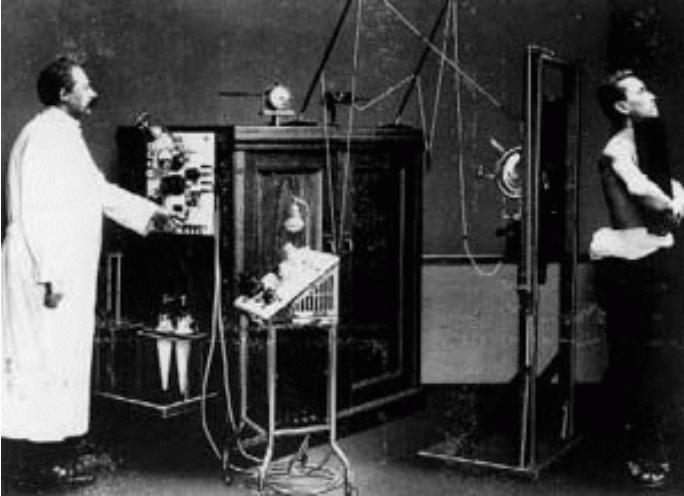
History: X-Rays

Wilhelm Conrad Röntgen

- 8 November 1895: discovers X-rays.
- 22 November 1895: X-rays Mrs. Röntgen's hand.
- 1901: receives first Nobel Prize in physics



An early X-ray imaging system:



Note: so far all we can see is a projection across the patient:

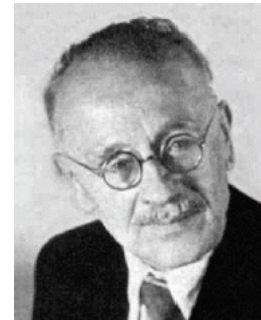
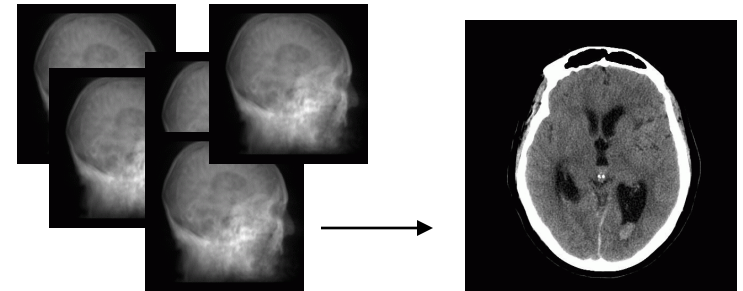
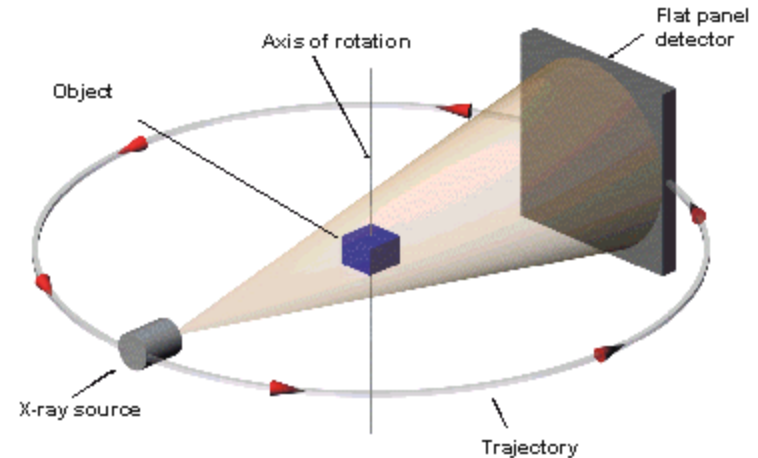
History: Computed Tomography

The breakthrough:

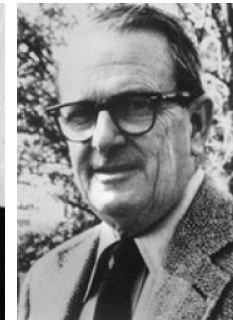
- acquiring many projections around the object enables the reconstruction of the 3D object (or a cross-sectional 2D slice)

CT reconstruction pioneers:

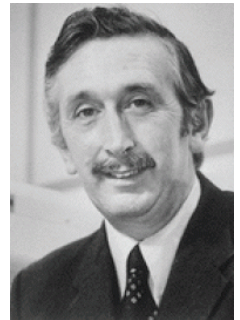
- 1917: Johann Radon establishes the mathematical framework for tomography, now called the Radon transform.
- 1963: Allan Cormack publishes mathematical analysis of tomographic image reconstruction, unaware of Radon's work.
- 1972: Godfrey Hounsfield develops first CT system, unaware of either Radon or Cormack's work, develops his own reconstruction method.
- 1979 Hounsfield and Cormack receive the Nobel Prize in Physiology or Medicine.



Radon

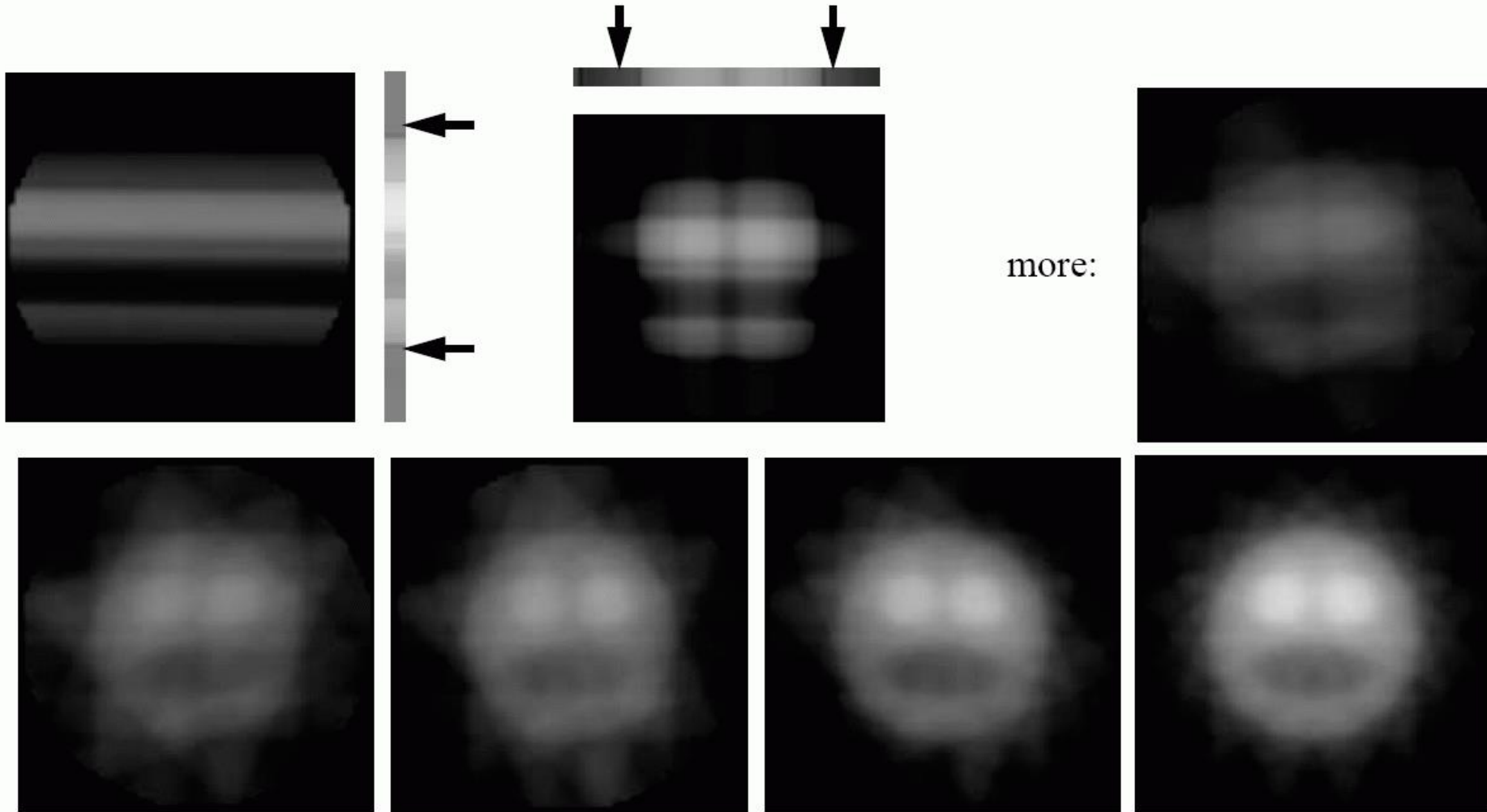


Cormack

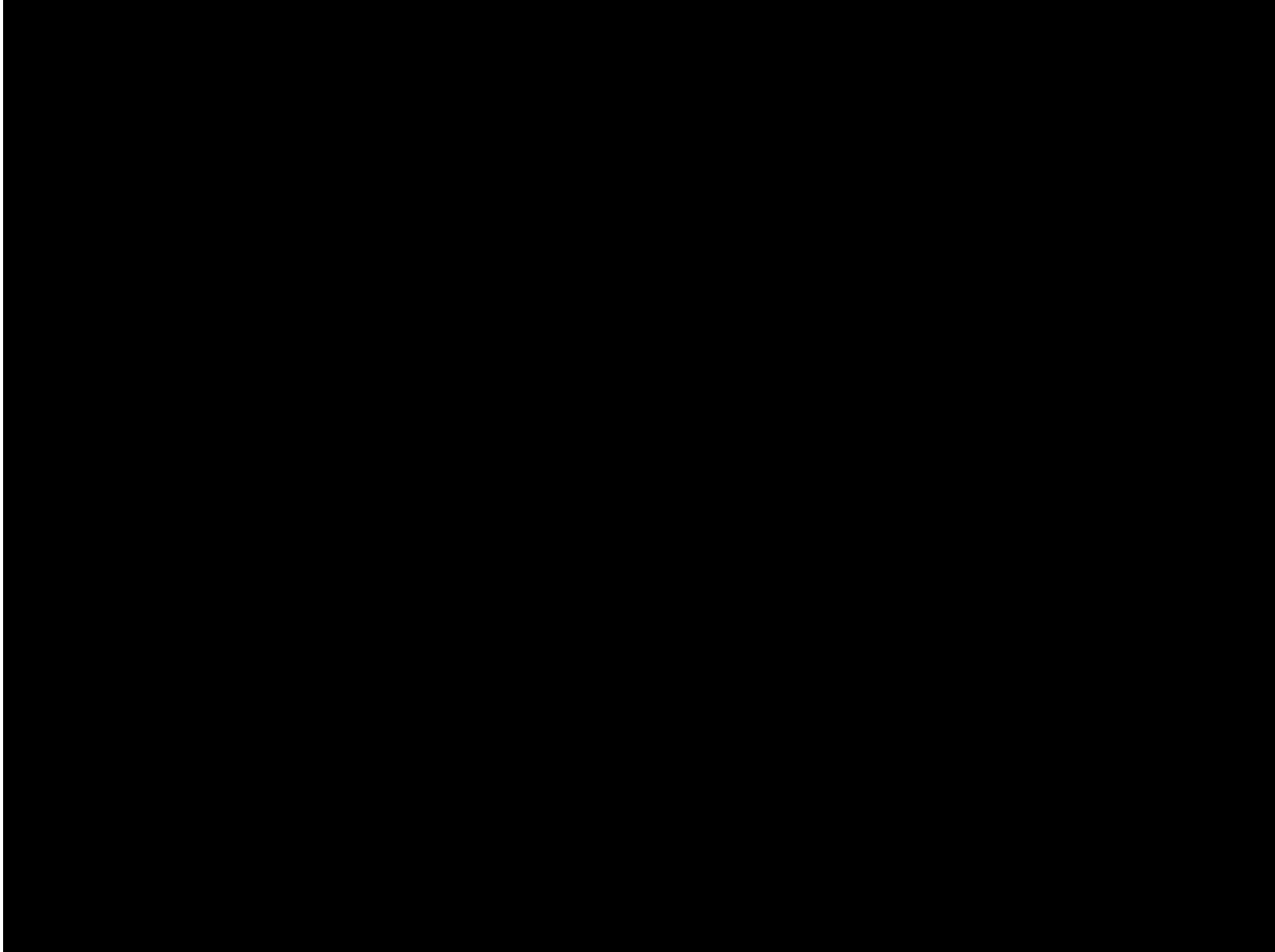


Hounsfield

Computed Tomography: Concept



Slice Viewer

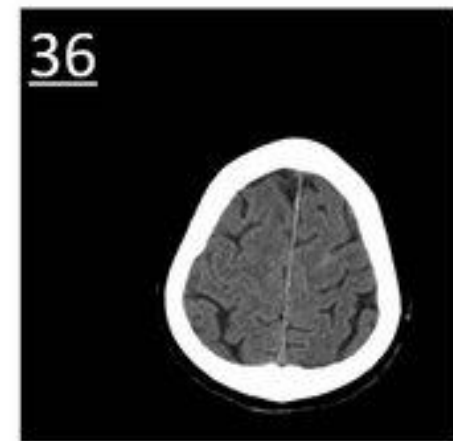
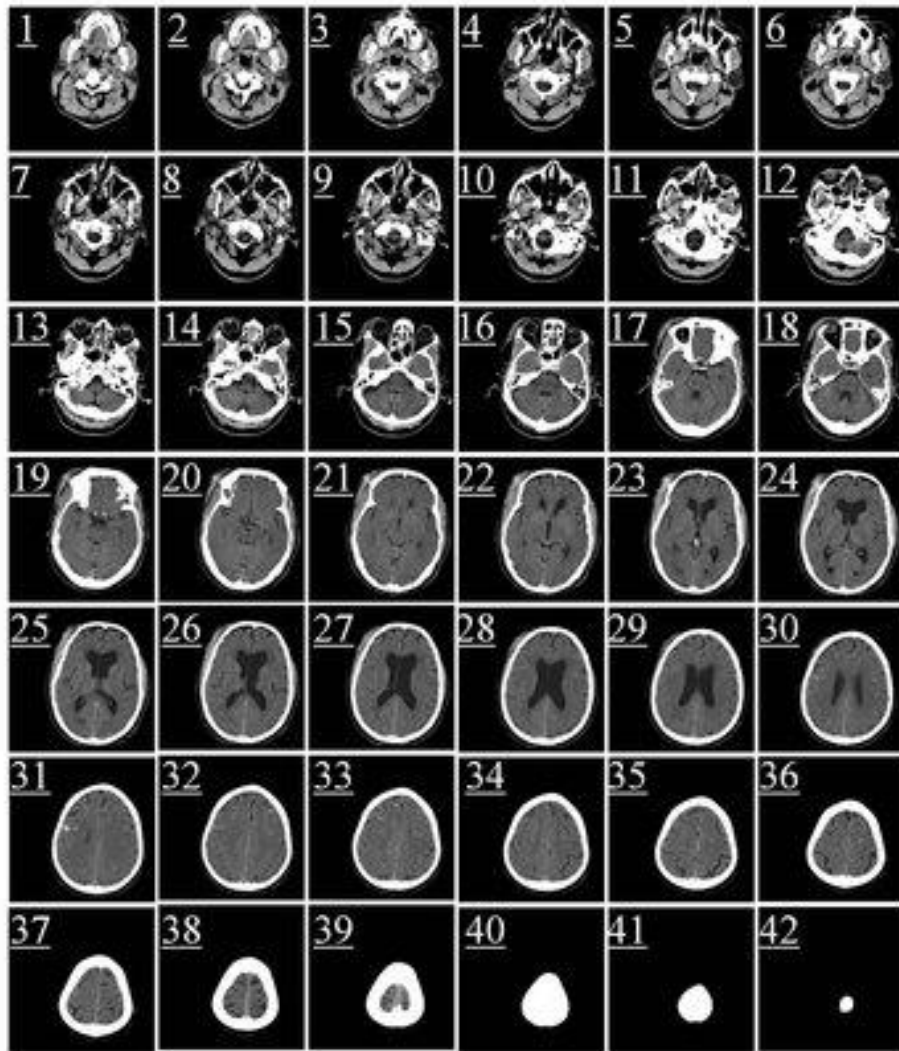


Reviewing Radiographs



Would 3D visualization help?

Slice Matrix

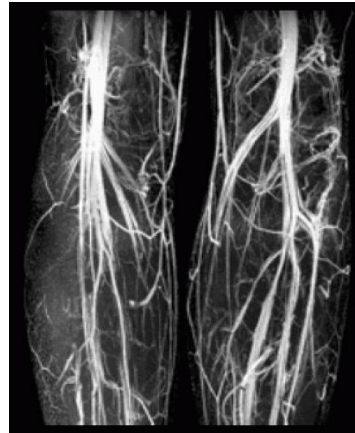
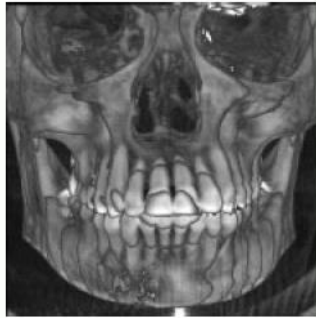


Would 3D visualization help?

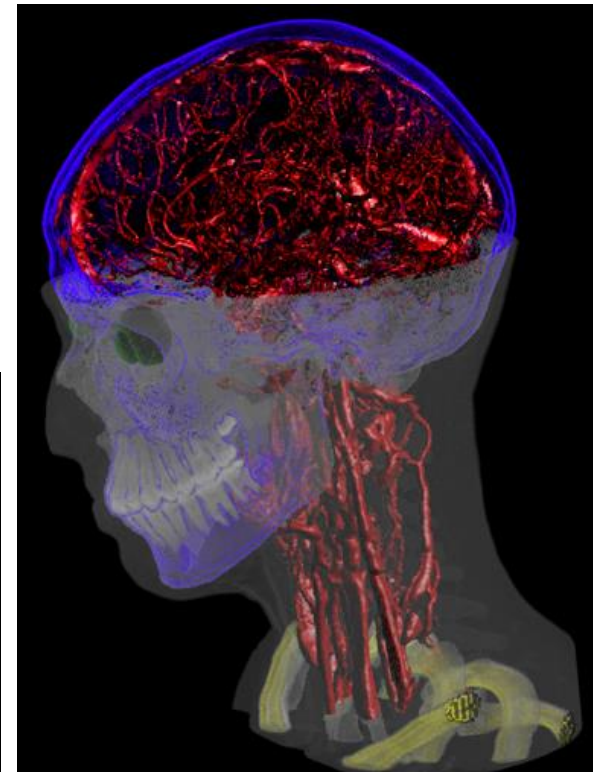
3D Visualization via Volume Rendering

Reconstructed object enables:

- Enhanced X-ray visualization from novel views:
- Maximum Intensity (MIP) visualization:



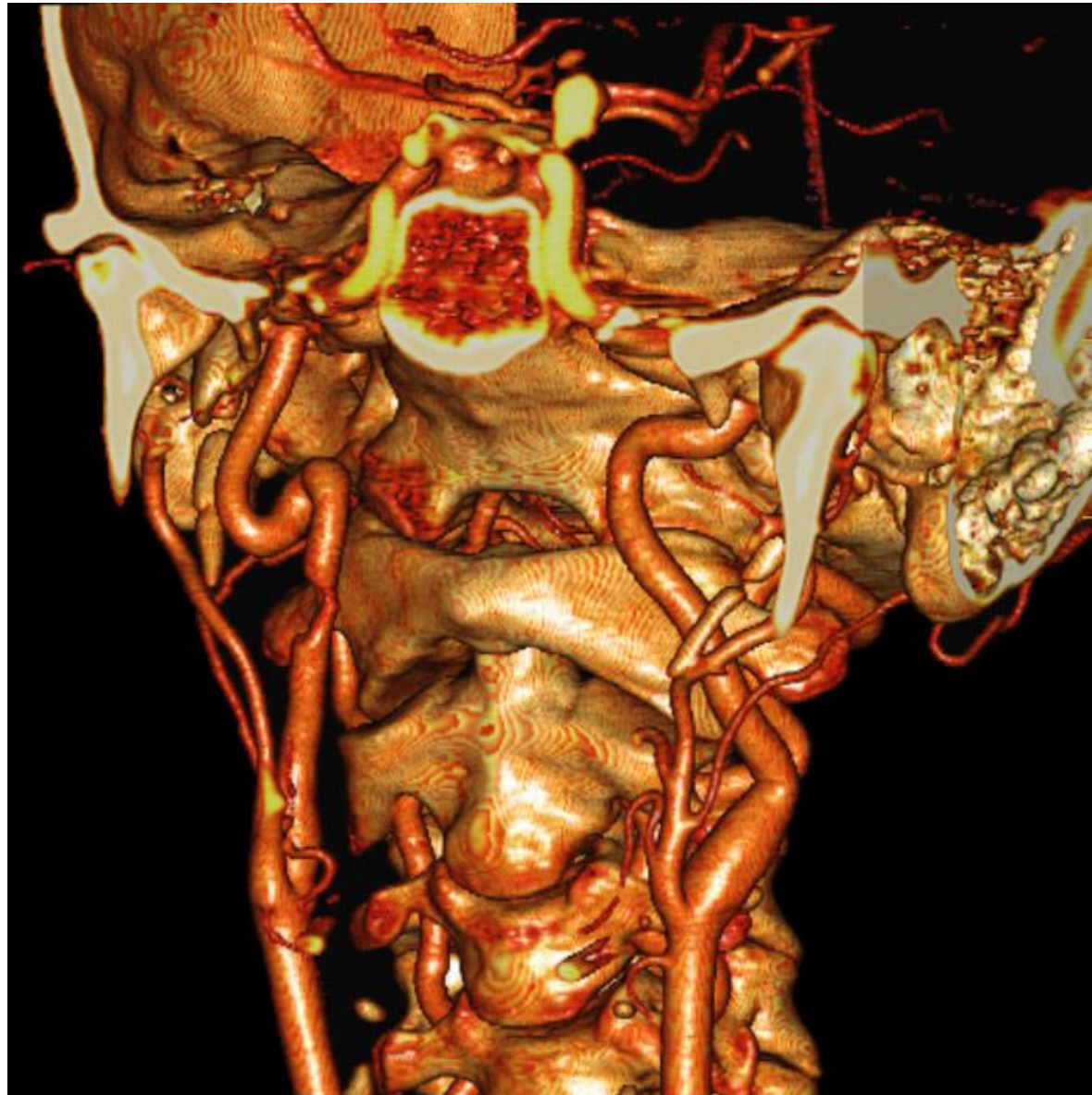
- Shaded object display:



Aortic Stent and Arterial Vessels

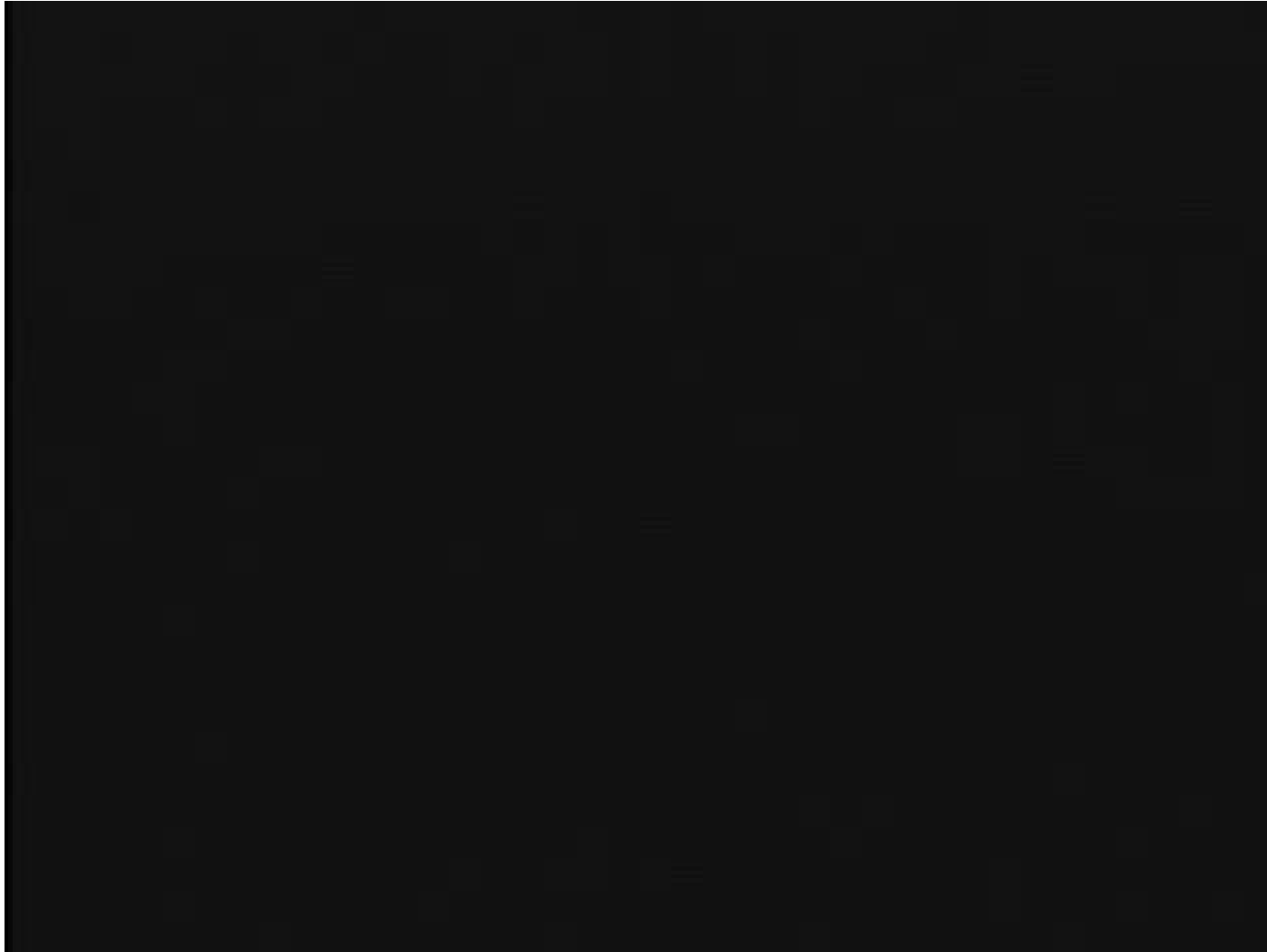


Carotid Stenosis

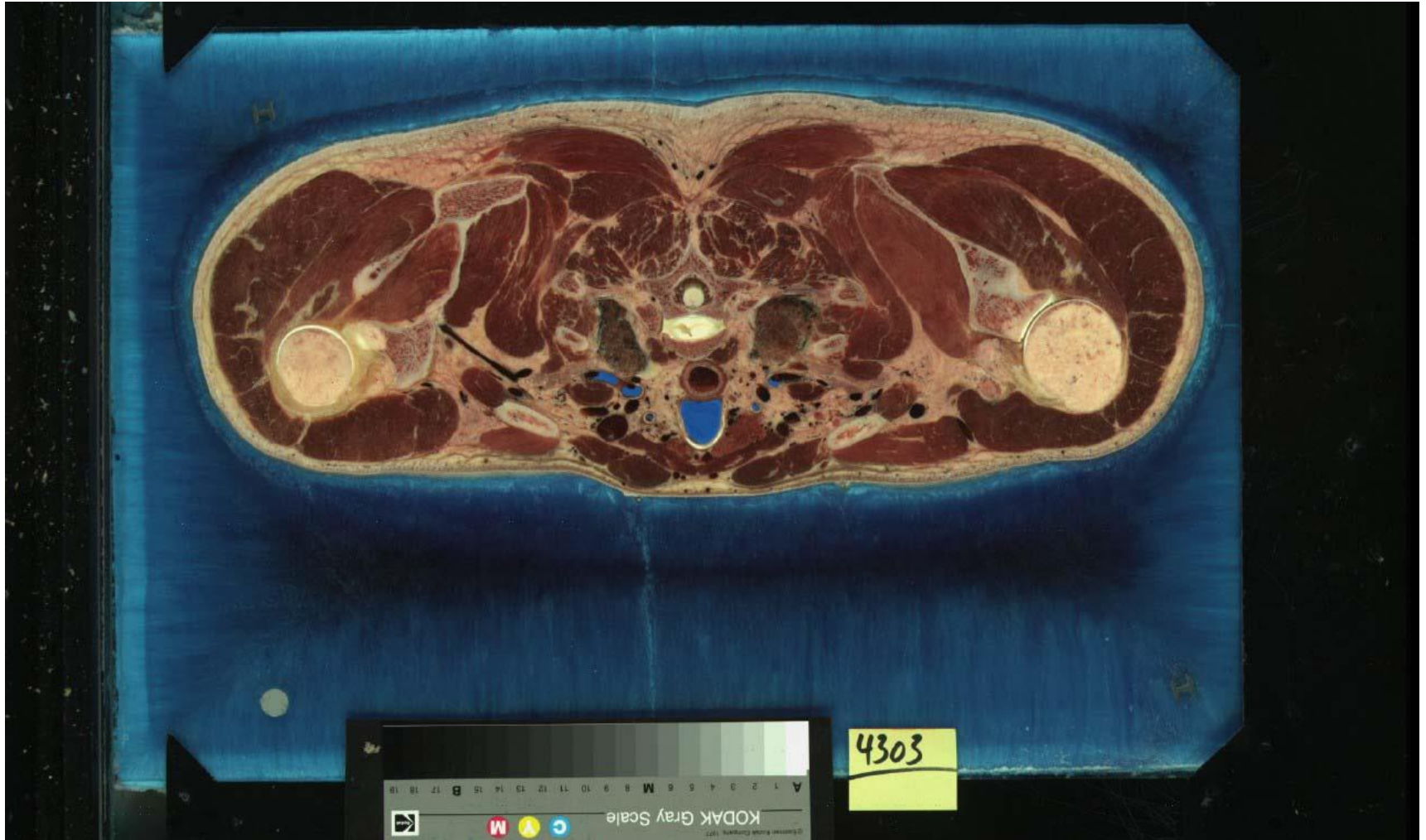


Virtual Colonoscopy

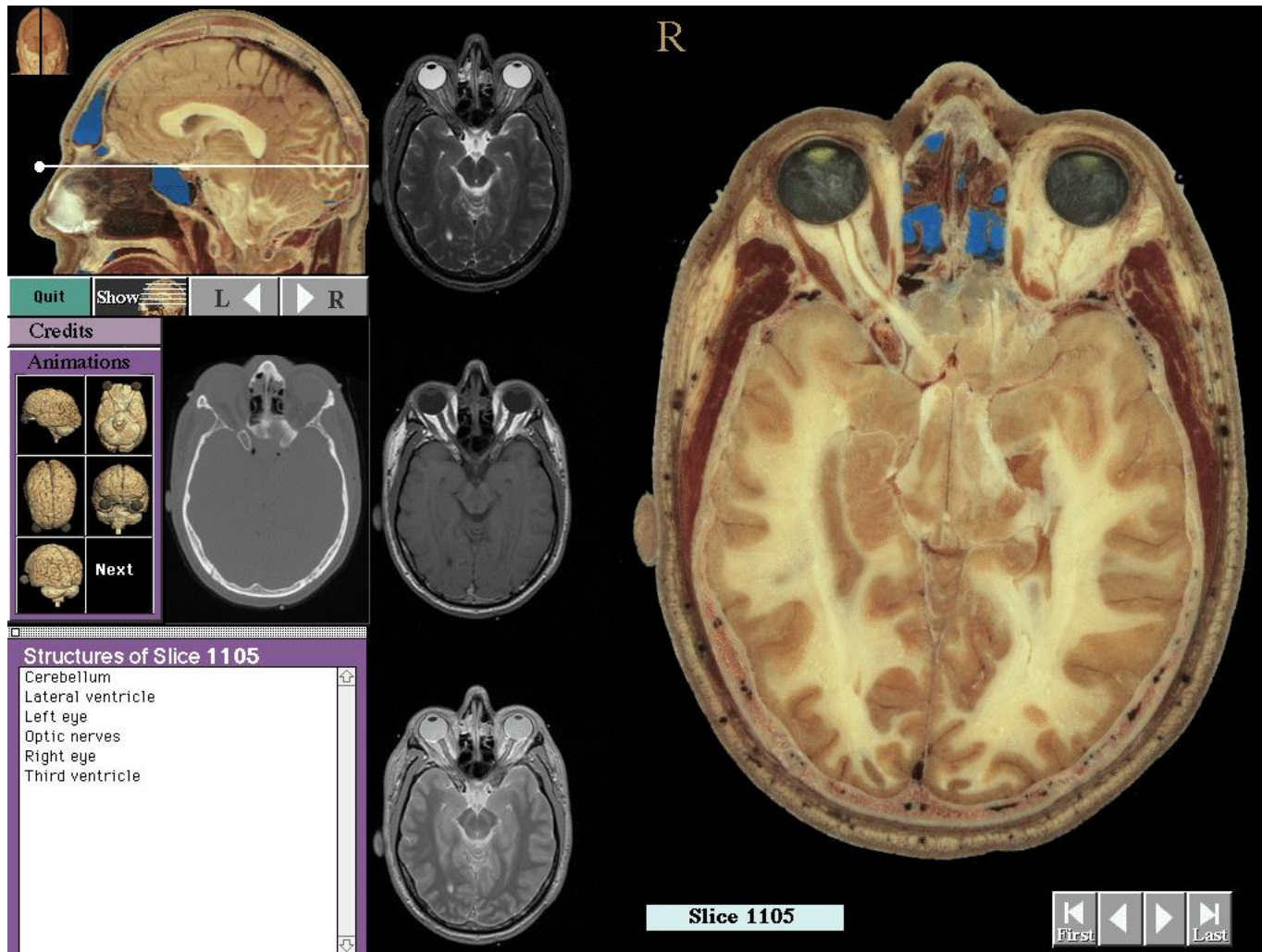
Virtual endoscopy, arthroscopy, etc.



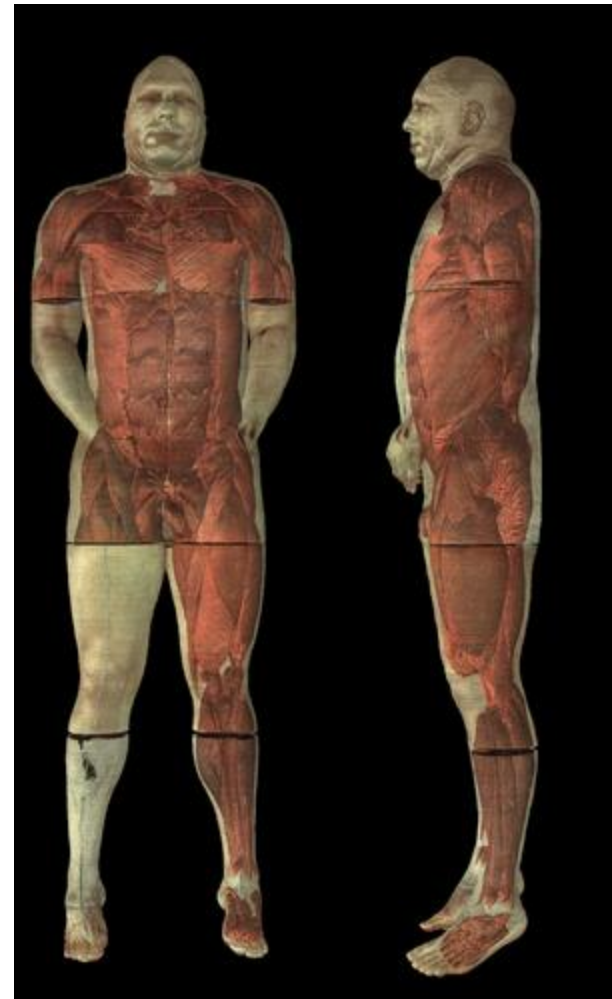
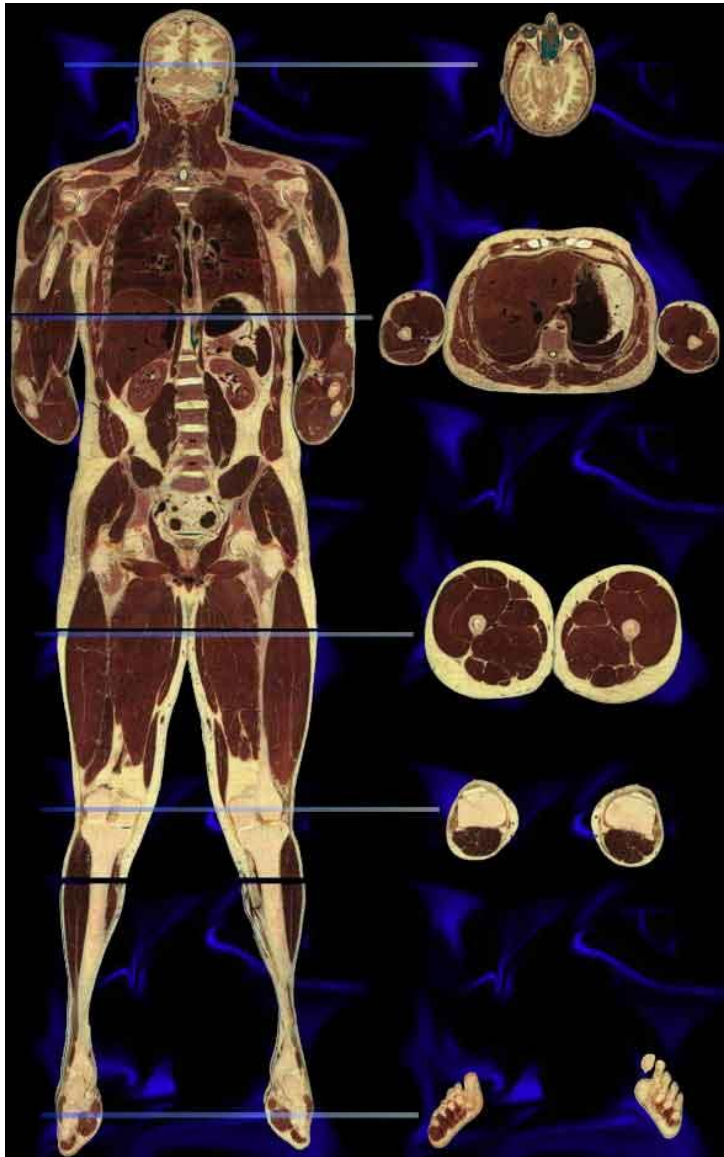
Dataset



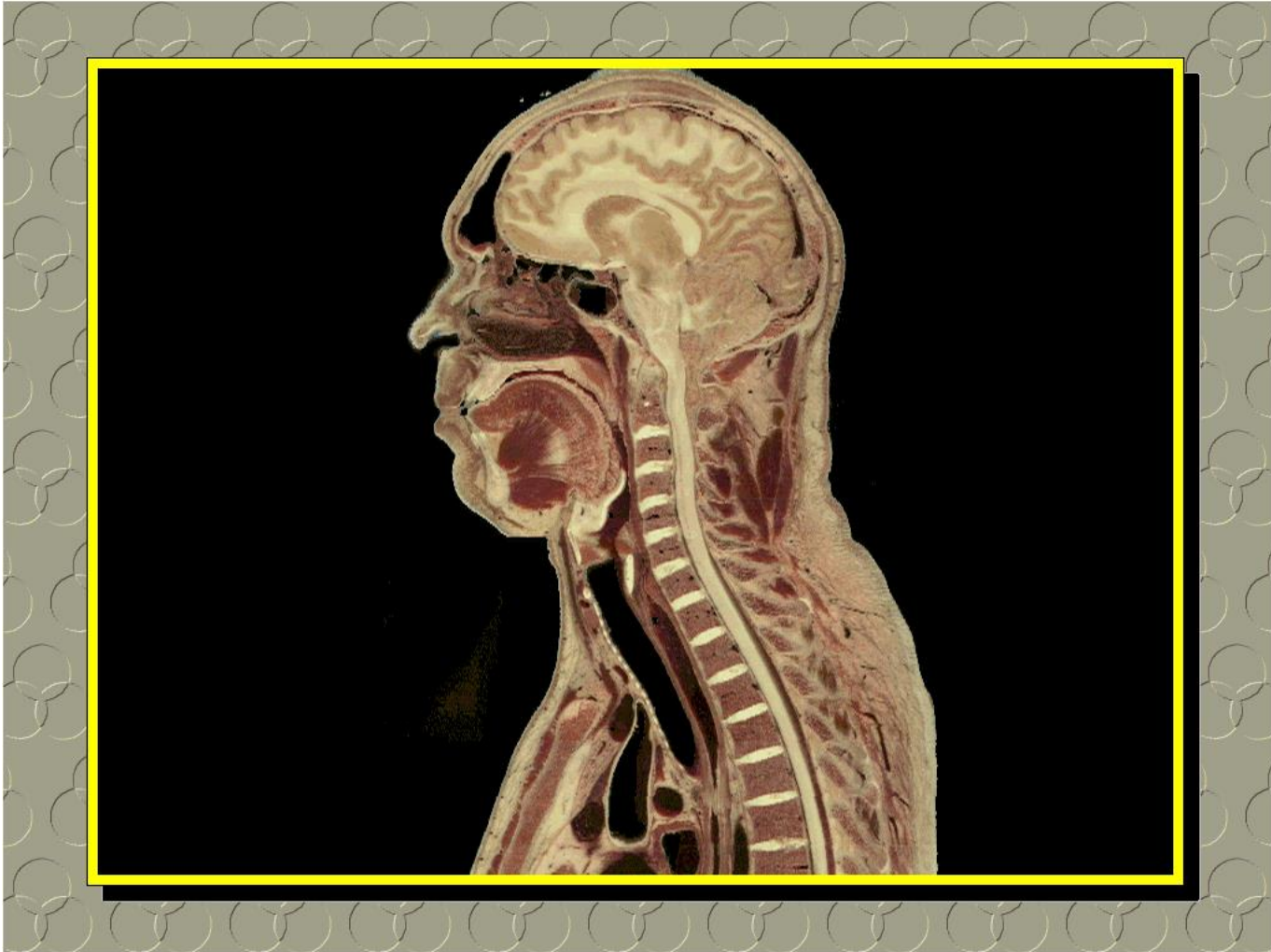
Renderings



Renderings



Renderings



Renderings

- Data scanned with medical scanners (MRI, CT, PET, SPECT, etc.)



aortic aneurysm

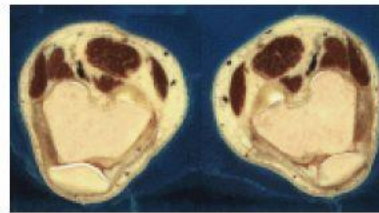
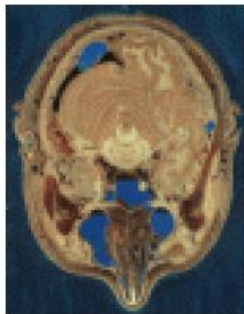


heart



renals (with kidneys)

- Data photographed from histological slices (NIH-NLM *Visible Human*)

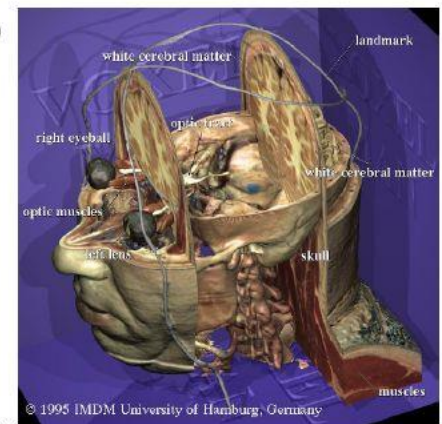


head

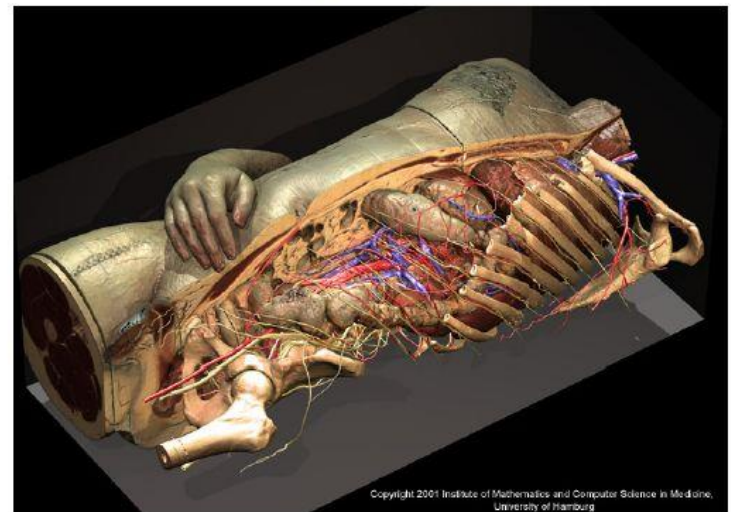
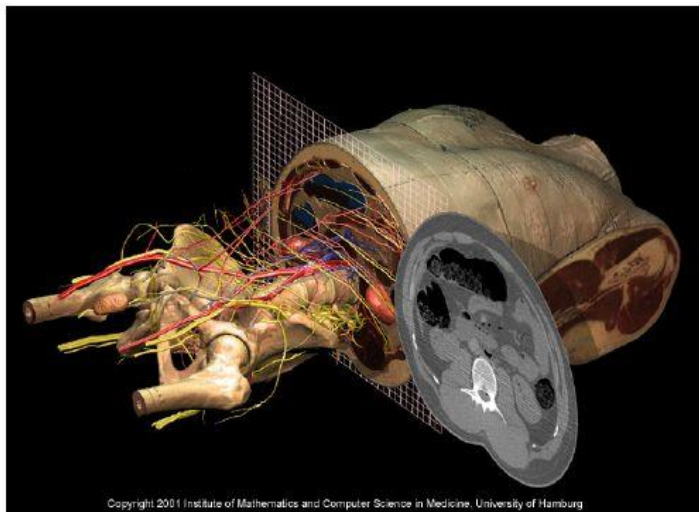
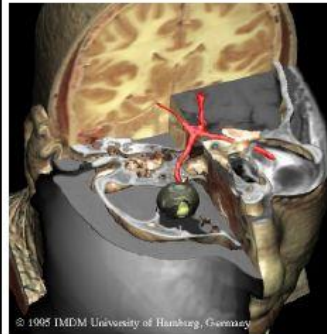
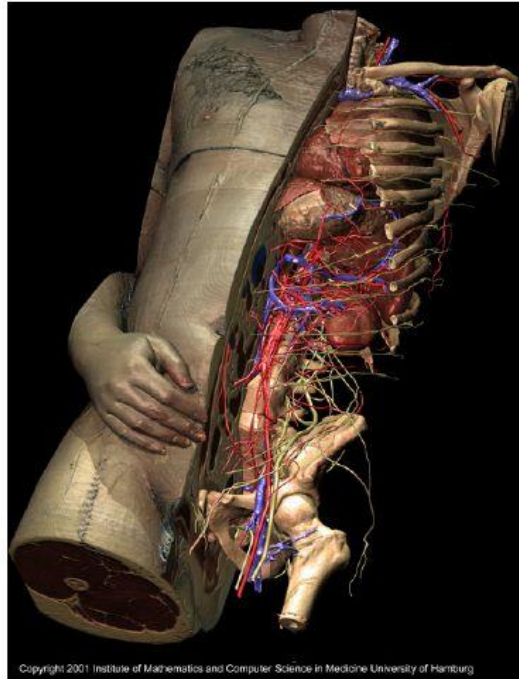
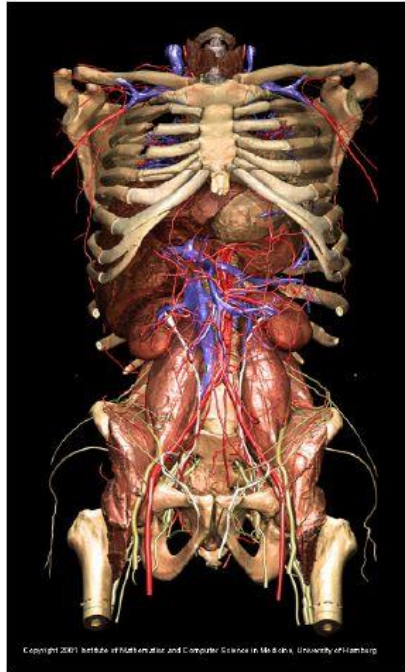
thorax

feet

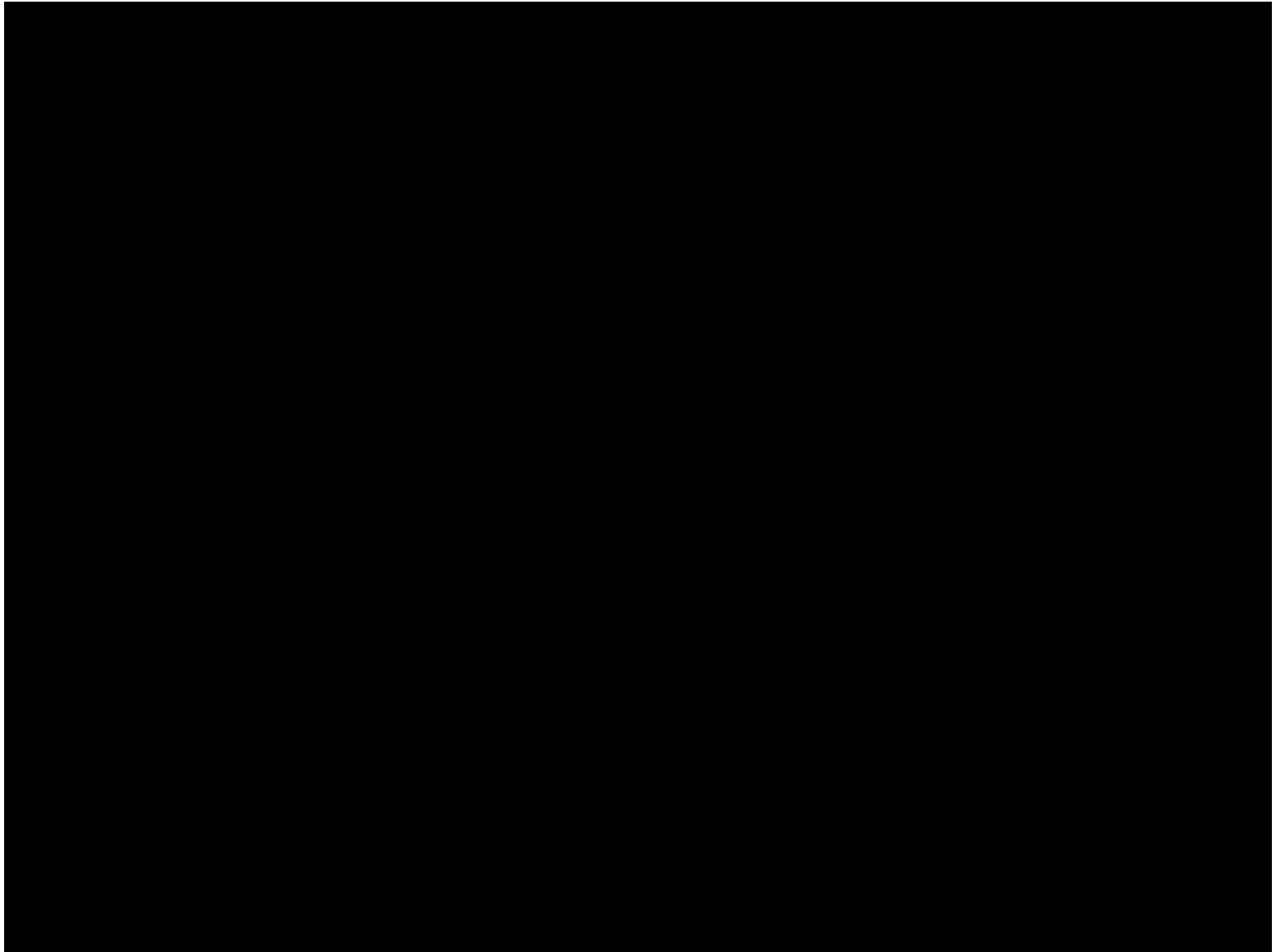
atlas created from ~1700 1/3 mm slices



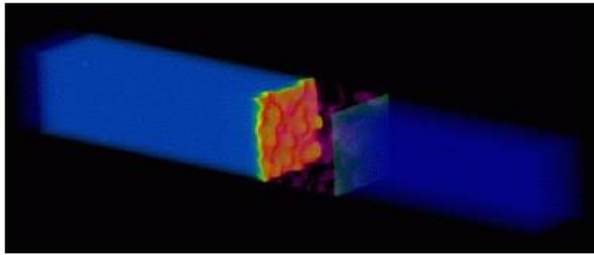
Renderings



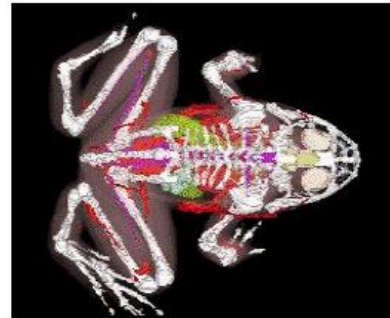
Comes Back to Life...



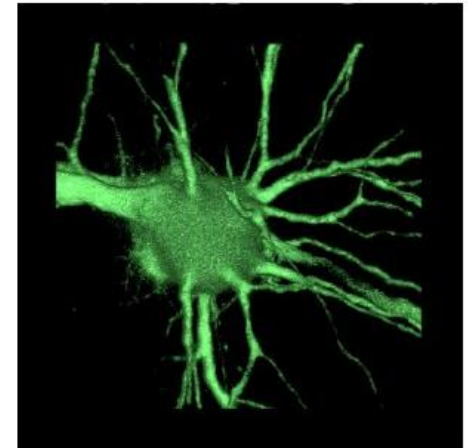
Scientific Visualization



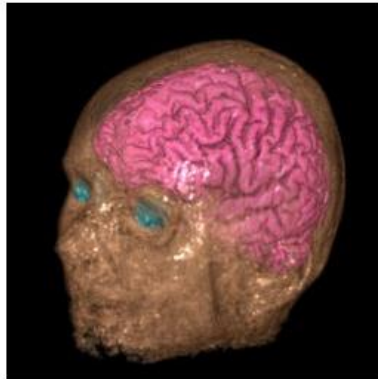
shock wave



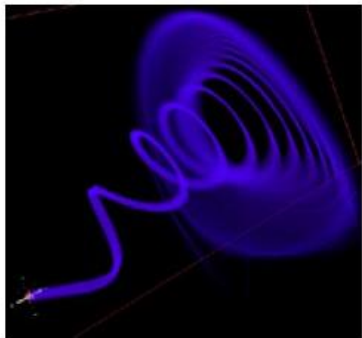
virtual frog



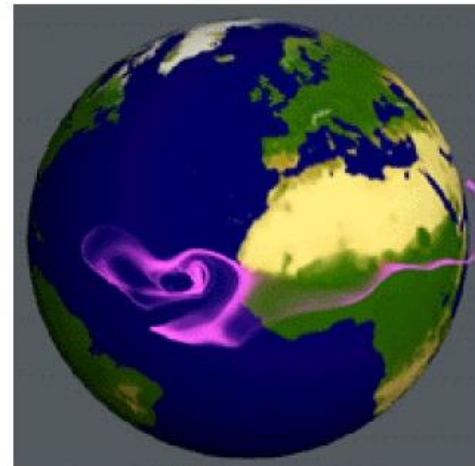
nerve cell



transparent MRI head



spiral flow



wind flow

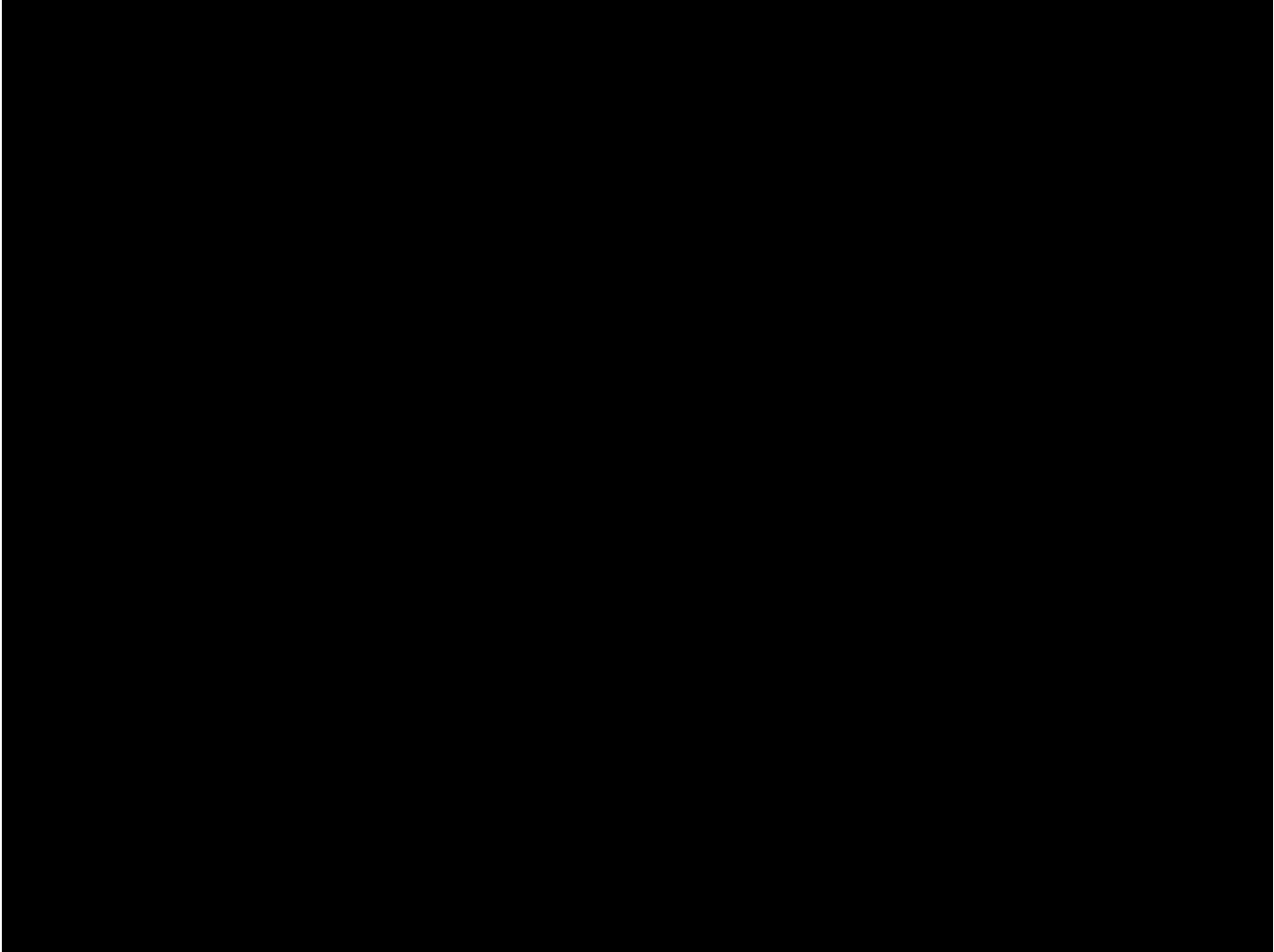


MRI head



semi-transparent
tomato

Simulations



Relativistic simulation of laser particle acceleration in an under-dense hydrogen plasma (800M particles)

Fluid Dynamics Simulations

Navier-Stokes equations for viscous, **incompressible liquids**.

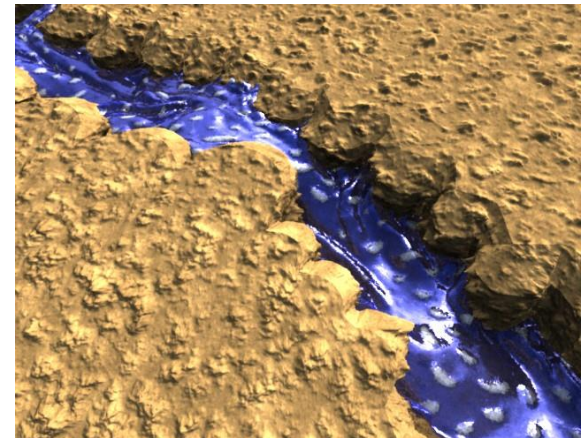
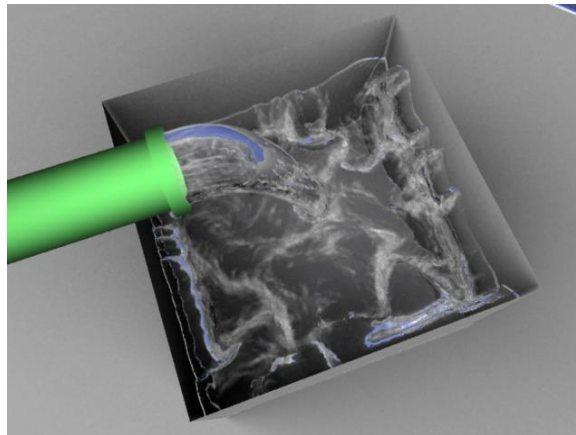
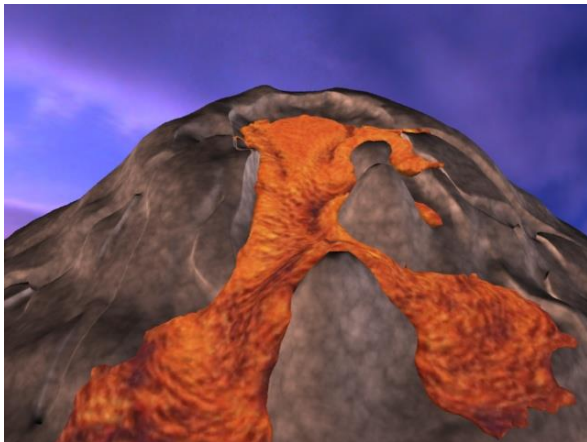
$$\nabla \cdot \mathbf{u} = 0 \quad \text{Conservation of mass}$$

$$\mathbf{u}_t = -(\mathbf{u} \cdot \nabla) \mathbf{u} + \nu \nabla^2 \mathbf{u} - \frac{1}{\rho} \nabla p + \mathbf{f}$$

Advection

Diffusion

Pressure



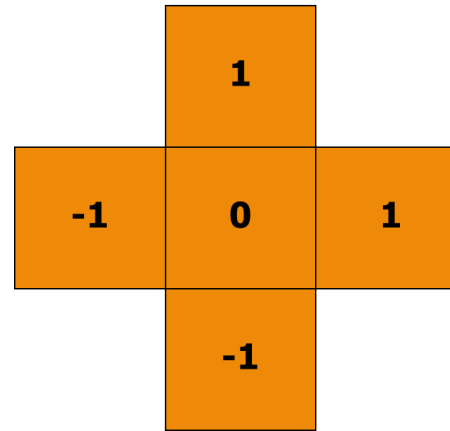
Navier-Stokes Solution

Via finite differencing

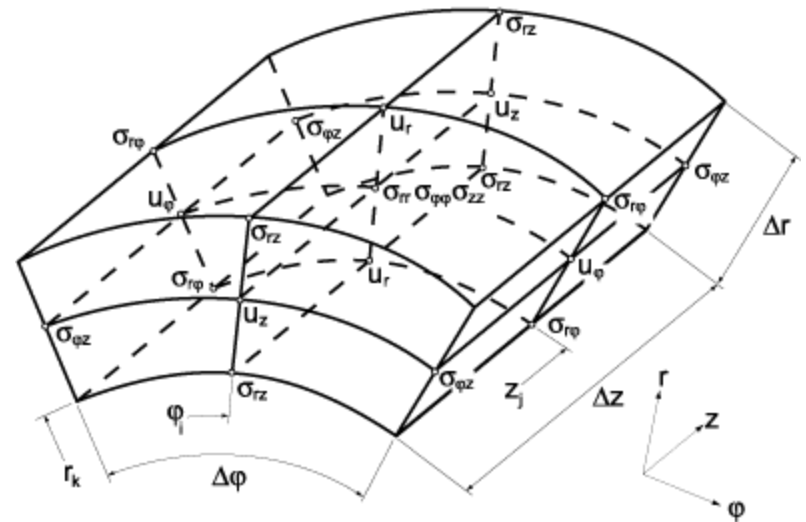
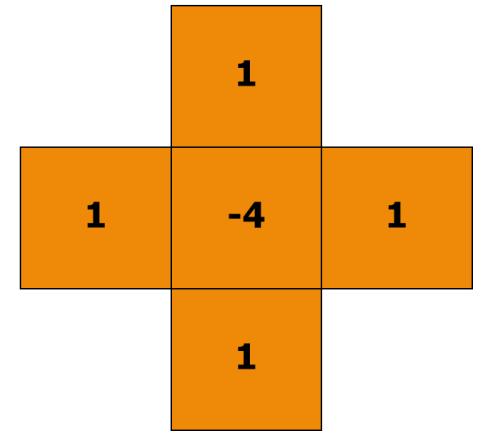
It all boils down to $Ax=b$.

$$\begin{bmatrix} ? & ? & \dots & \dots & ? \\ ? & ? & & & \vdots \\ \vdots & & \ddots & & \vdots \\ \vdots & & & \ddots & \vdots \\ ? & \dots & \dots & \dots & ? \end{bmatrix}_{n^d \times n^d} \begin{bmatrix} x_1 \\ x_2 \\ \vdots \\ \vdots \\ x_{n^d} \end{bmatrix} = \begin{bmatrix} b_1 \\ b_2 \\ \vdots \\ \vdots \\ x_{n^d} \end{bmatrix}$$

Divergence Operator



Laplacian Operator



Visualize via Volume Rendering

