

## Visualization: Volume rendering

000

## Visualization

Visualization is any technique for creating images, diagrams or animations to **communicate a message**.

*Wikipedia*

Scientific data visualization

- Abstract
- Physics (fluids, ...)
- Medical (X-Rays, MRI, Images, ...)
- Technics (Mechanics, ...)
- ...

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## Visualization : Problematic

- Complex Data: non visualizable (density, tensors, ...)
- Large amount of data : 10, 100 To (landscape, connections, scanners, ...)
- Noisy data (medical, ...)

**Goal:** Being able to visualization what is **significant**, **usefully**, and **efficiently**.

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## Data types

- Scalar field (temp, pression, ...)
- Vectorial field (vitesse, orientation, ...)
- Tensorial field (mechanical constraints, curvature, ...)

**Goal:** Do we define the data on a surface, on a volume ?

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## Scalar field

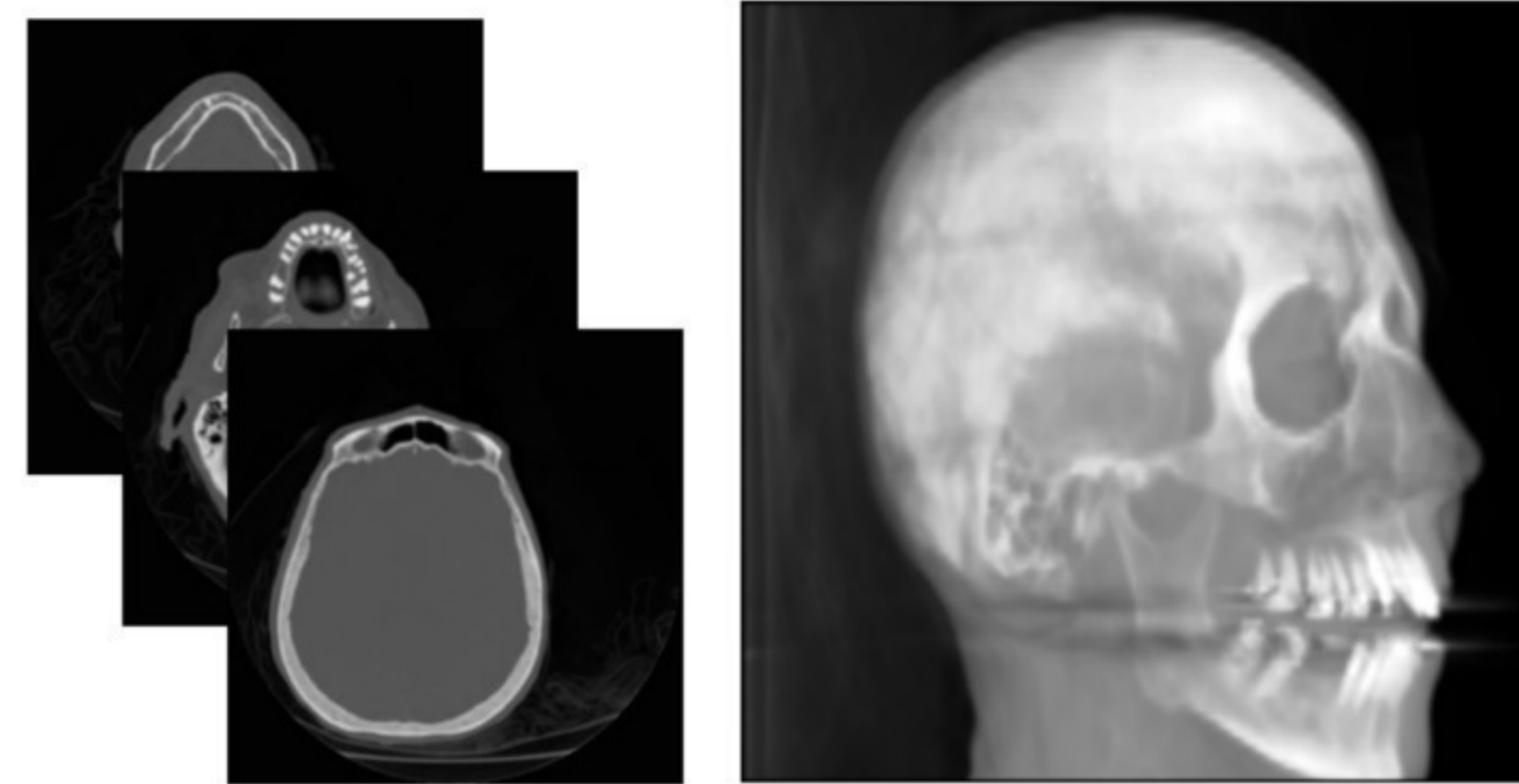
Surface of the domain or internal characteristics



004

## Scalar field

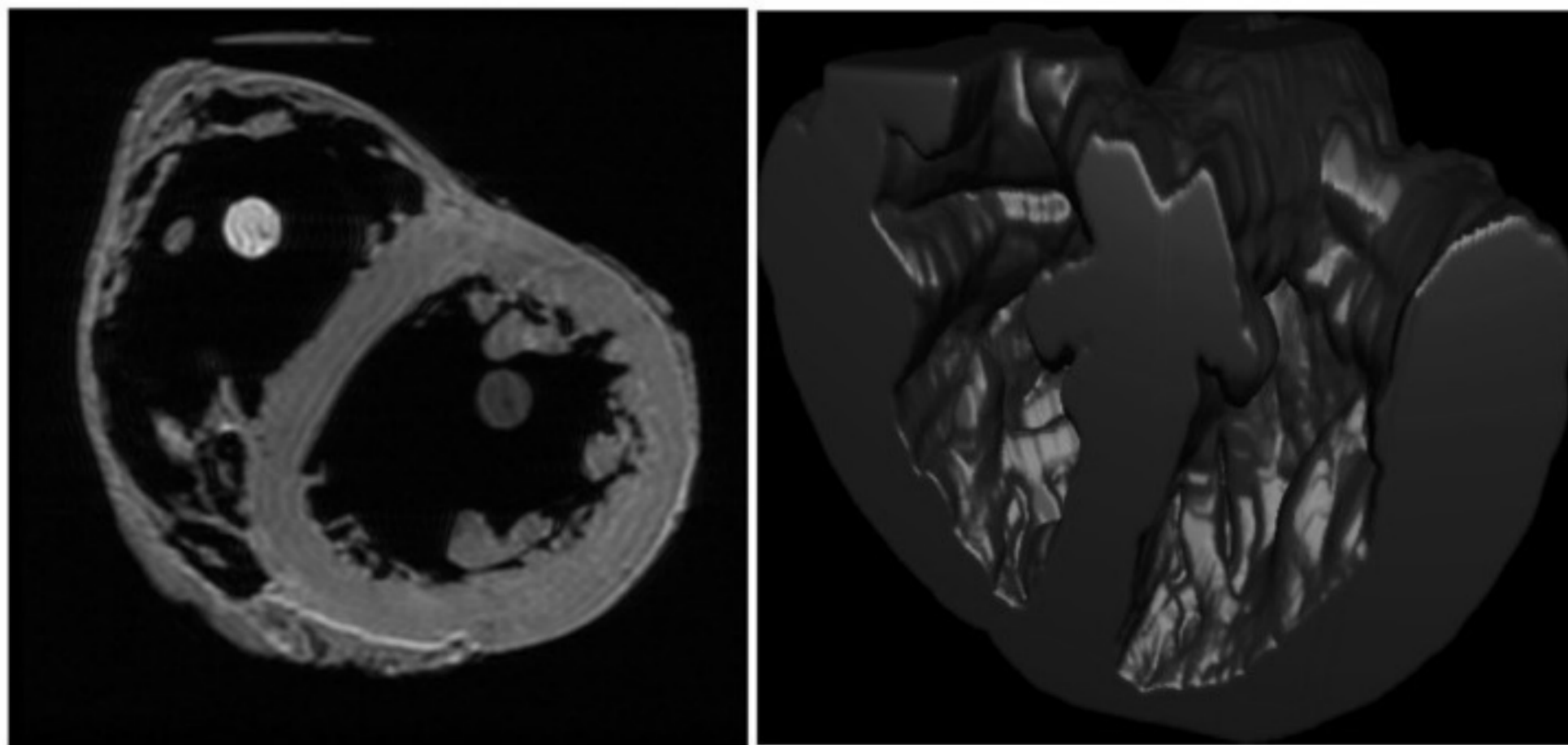
2D section or volume rendering (isosurface, 3D textures, ...)



005

## Scalar field

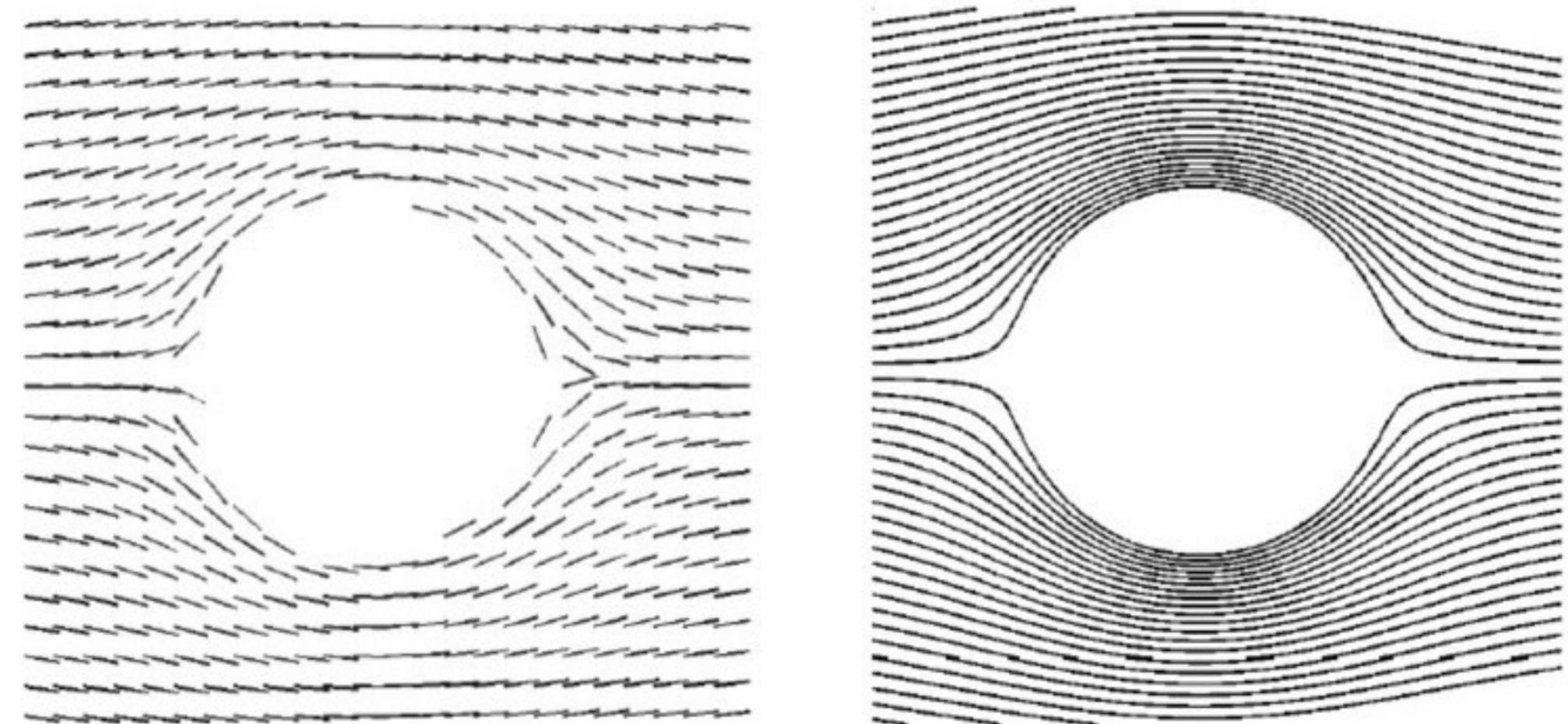
2D Section or 3D Isosurface



006

## Vectorial field

Vectors or trajectories

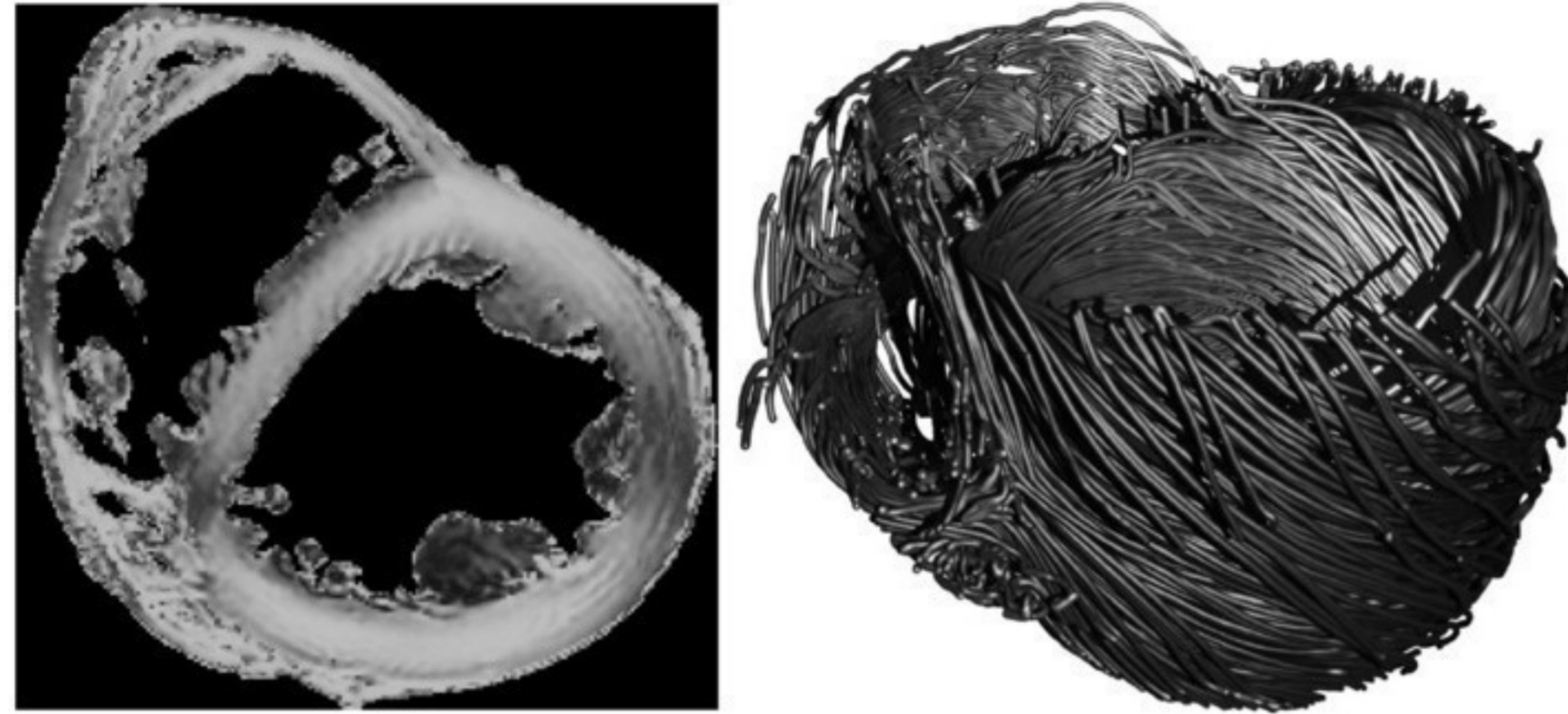


007



## Vectorial field

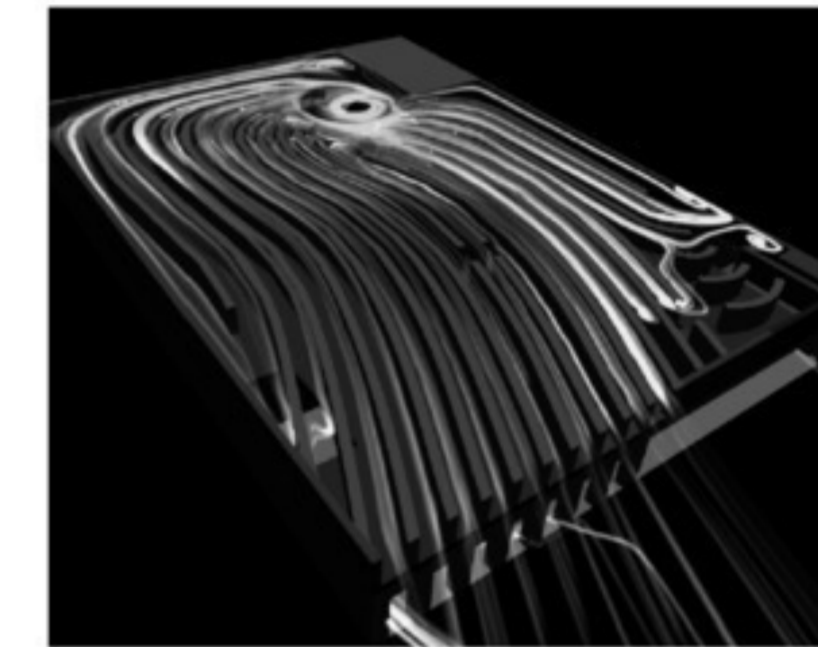
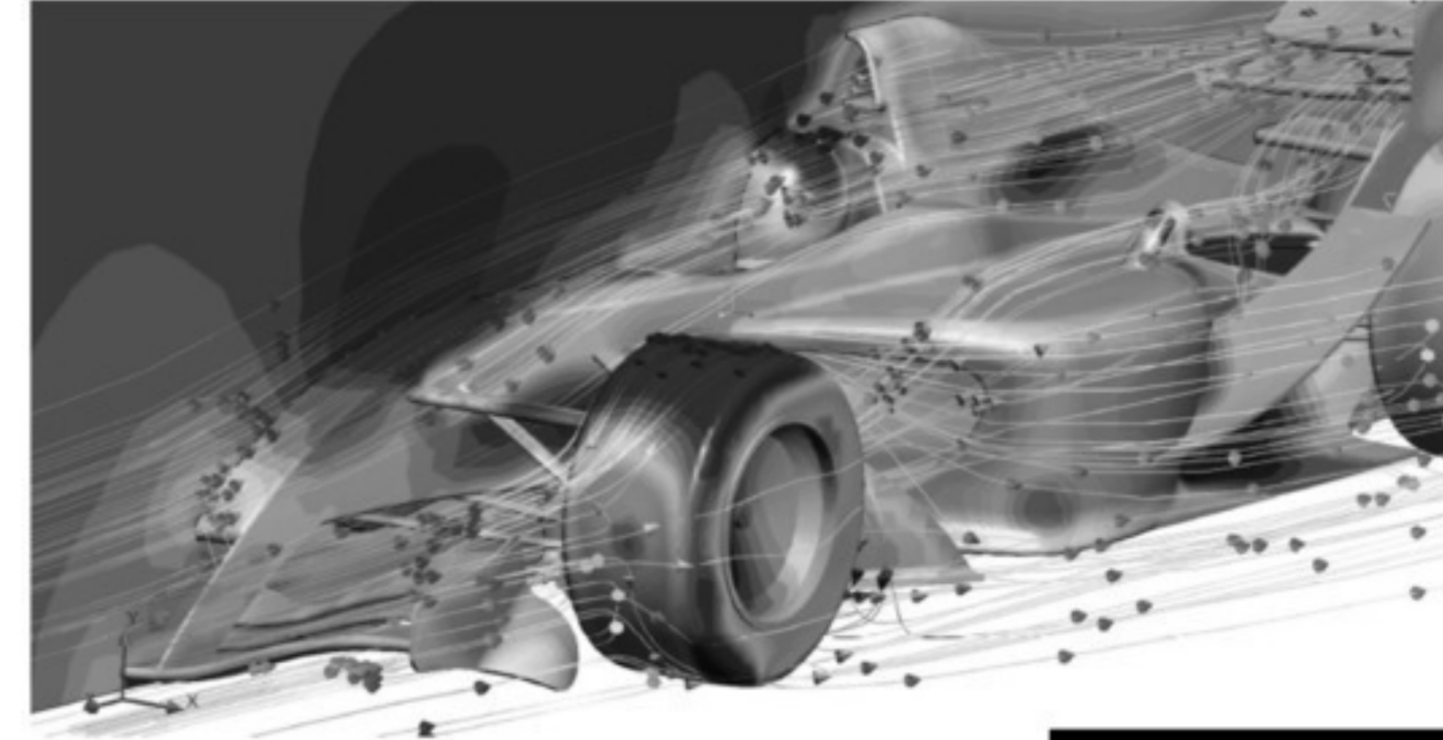
Vectors or trajectories (stream lines can represent real data)



008

## Vectorial field

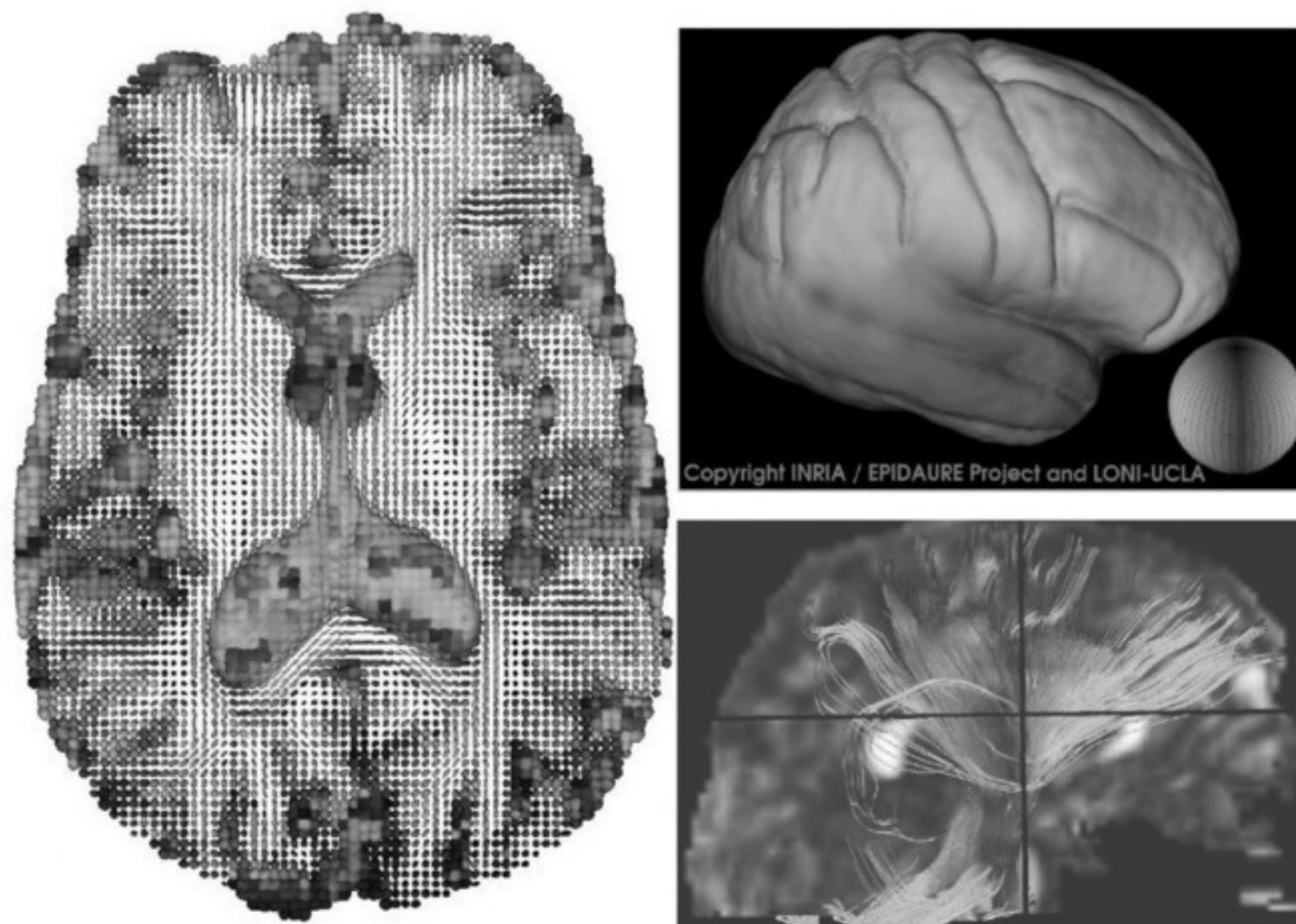
Complex physically based simulation (streamlines, ...)



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## Tensorial field

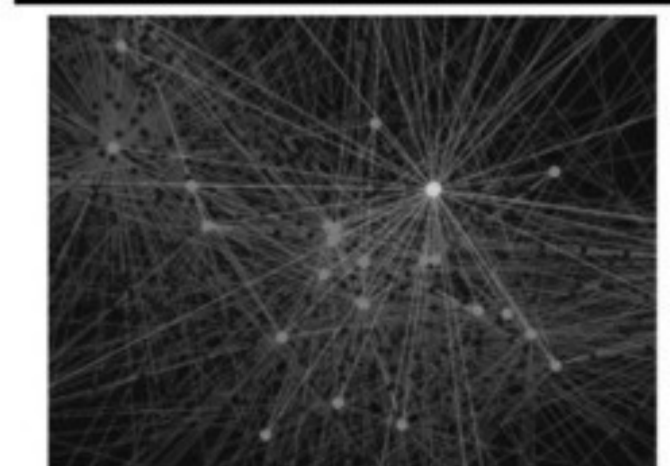
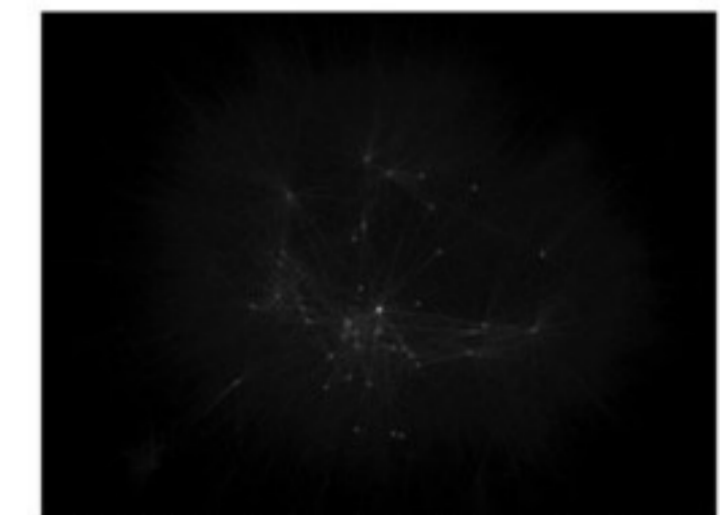
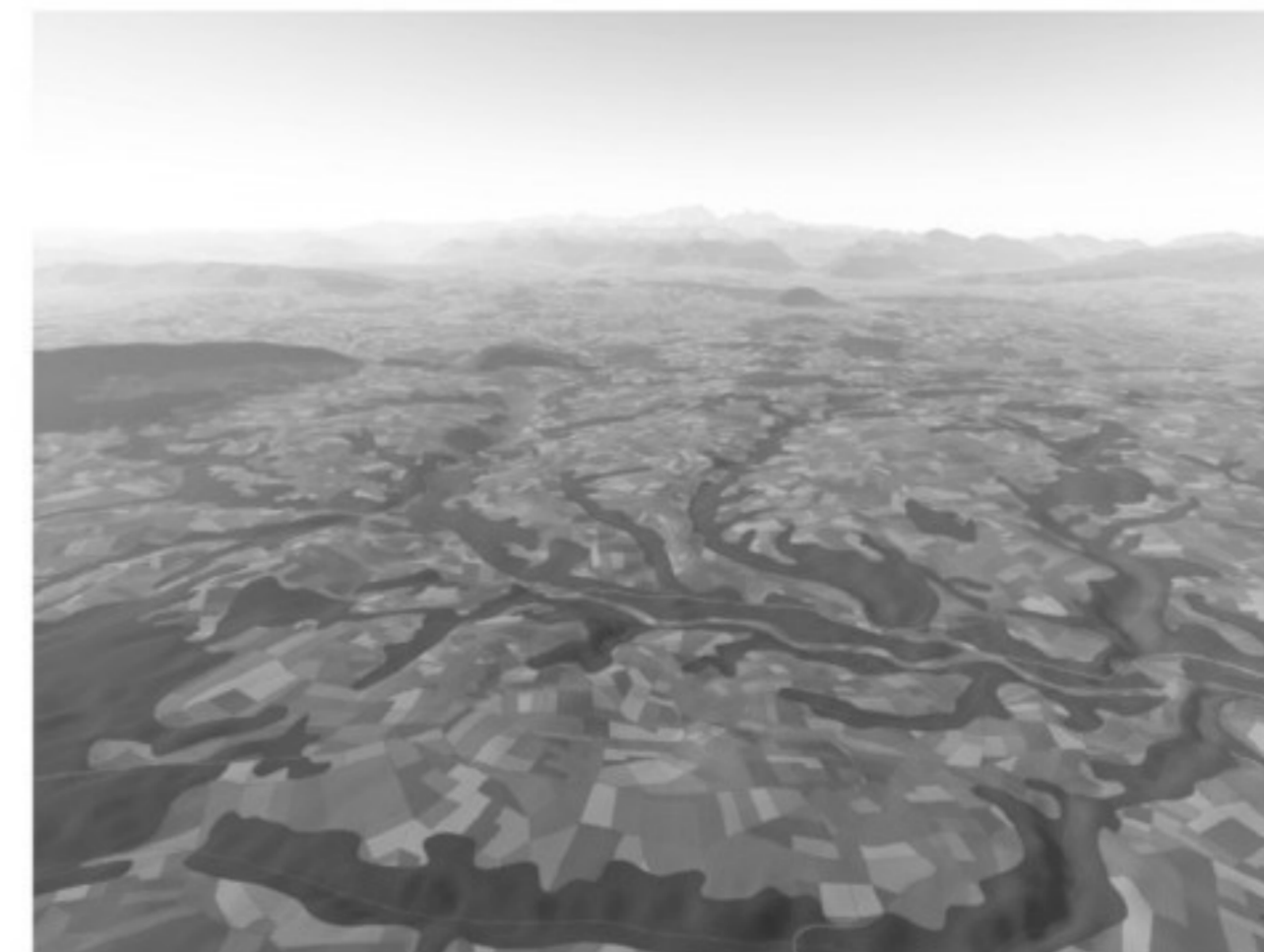
Symmetric matrix 3x3 (Ellipsoid, glyphs, orientation, fiber-tracking, ...)



010

## Large data

Data acquired from physical scanners are often too large (geography, networks, ...)

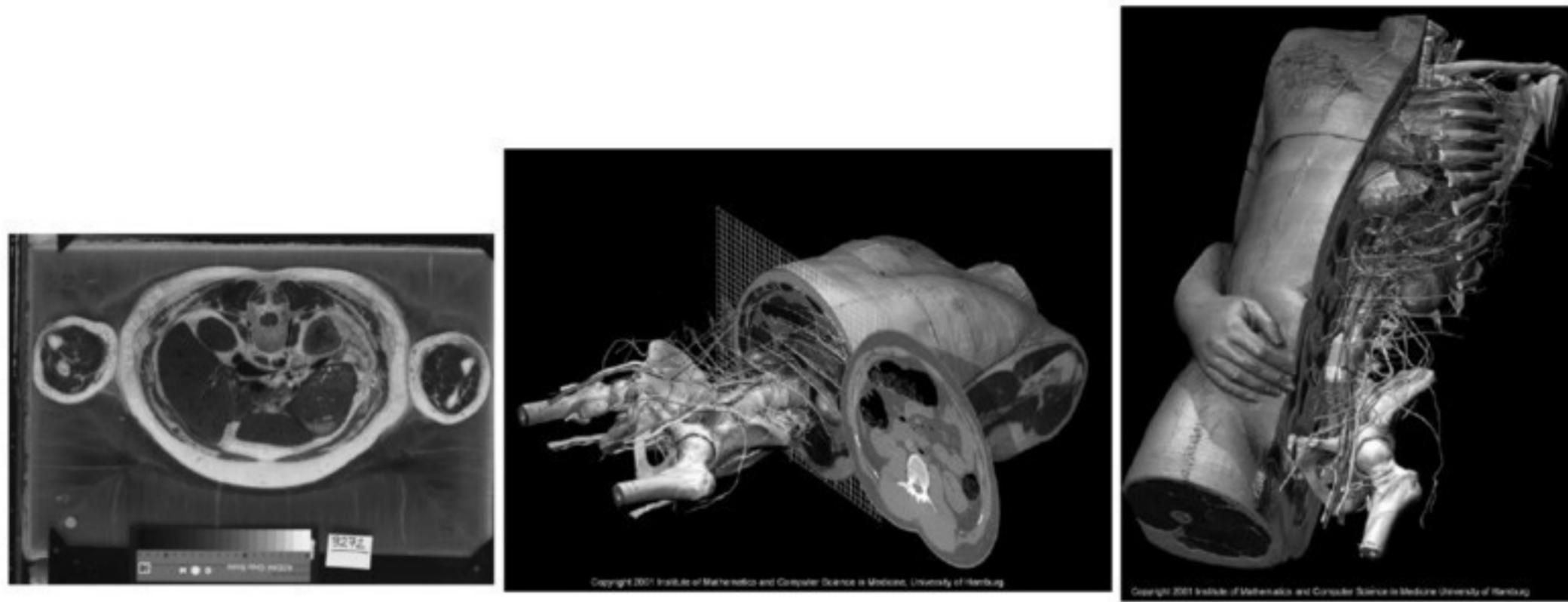


011



# Large data

Visible Human Project, 40Go (slices of 0.33mm)



012

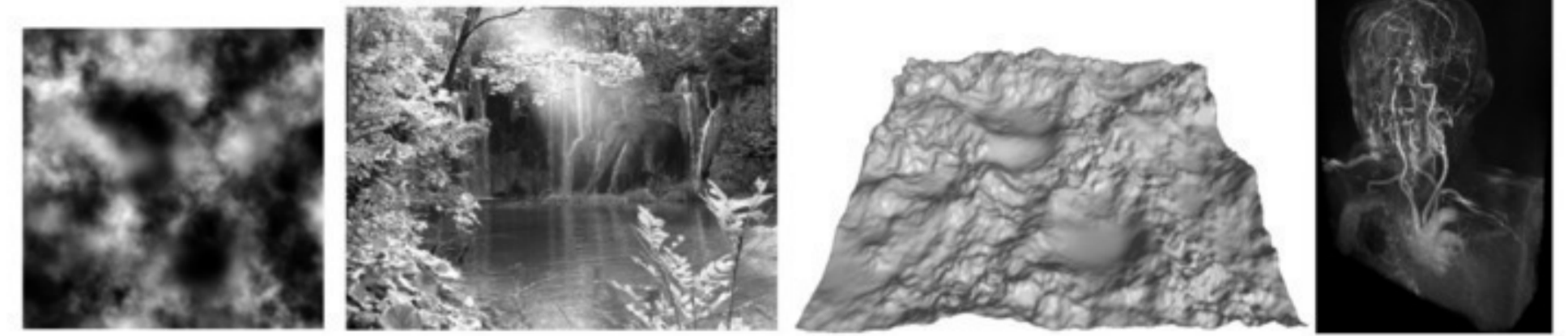
# Classification

Visualize  $f : \begin{cases} \mathbb{R}^v & \rightarrow \mathbb{R}^d \text{ embedded in } \mathbb{R}^n \\ u & \mapsto f(u) \end{cases}$

d=1	scalar field
d>1	vectorial field
d=(i x j)	matrix field

v=1	lineic field
v=2	surfacic field
v=3	volume field

Common special cases	v	d	n	
	2	1	2	B&W image
	2	3	2	Color image (texture)
	2	1	3	Heigh-field (mountains)
	3	1	3	Volume density



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# Surfacic scalar data

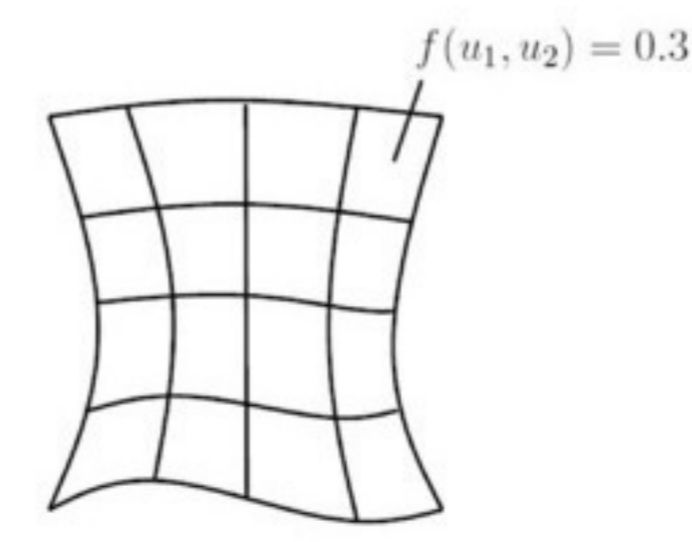
014

# Surfacic scalar data : Notation

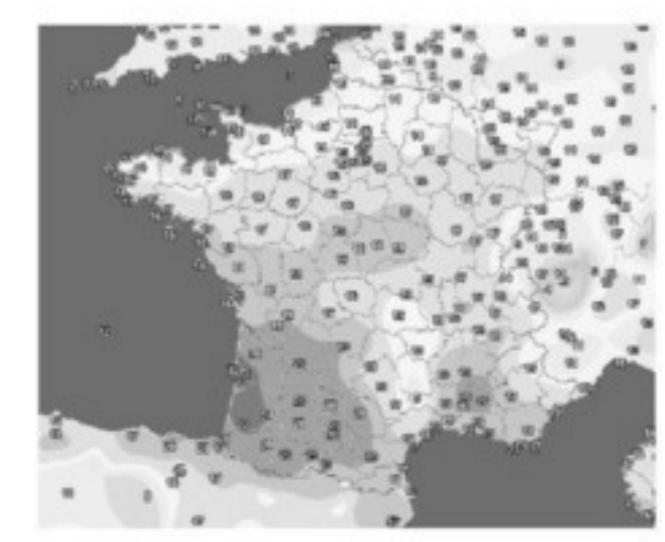
We call a density  $f(u_1, u_2) = I \in \mathbb{R}$

Very often:  $f(x, y) = I$

After discretization:  $f(k_x \Delta x, k_y \Delta y) = I_{k_x, k_y}$

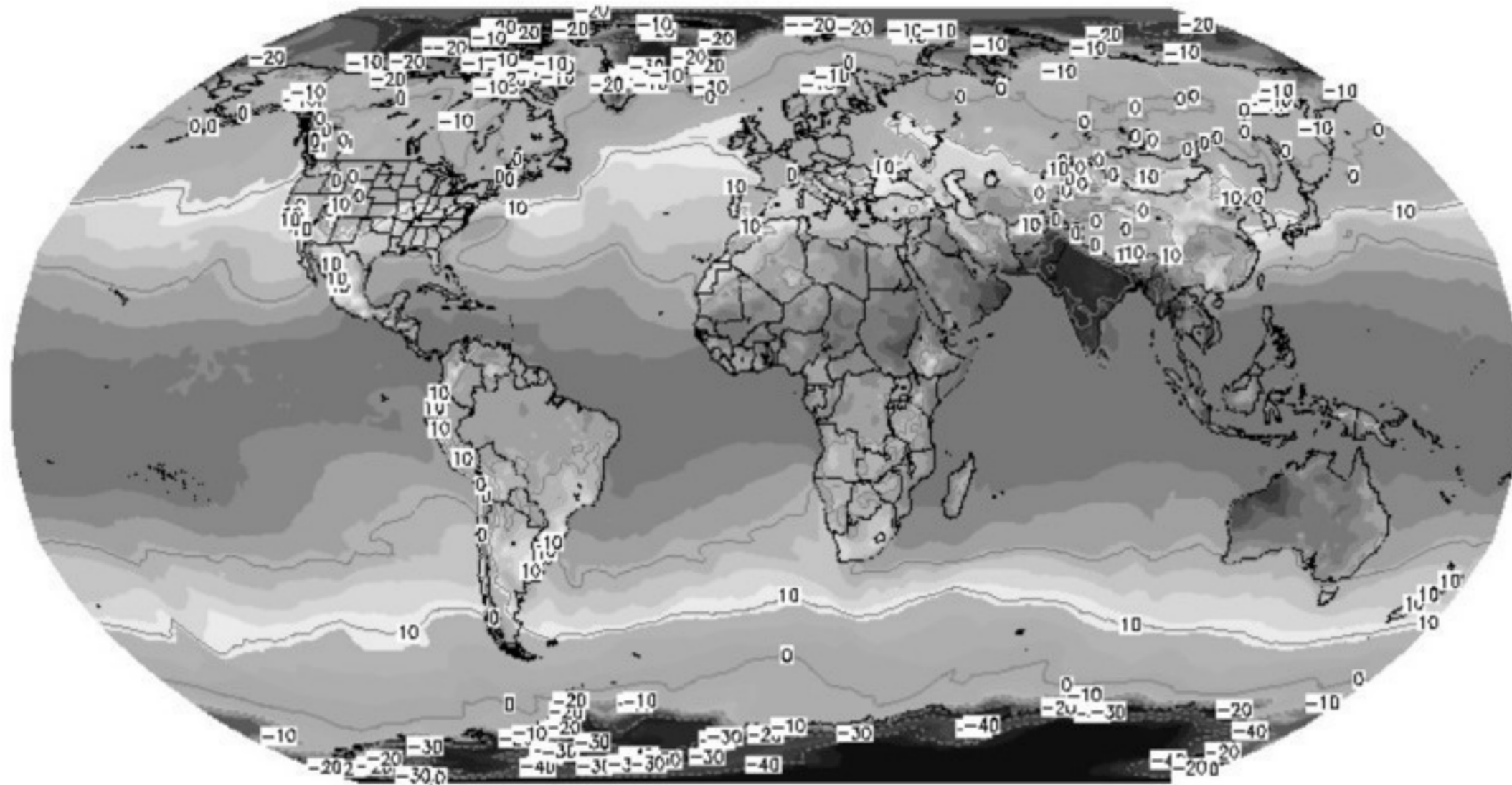


0.5	-0.2	1.1
1.5	0.5	0.9
-0.1	0.0	0.7



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## Surfacic scalar data : Example



016

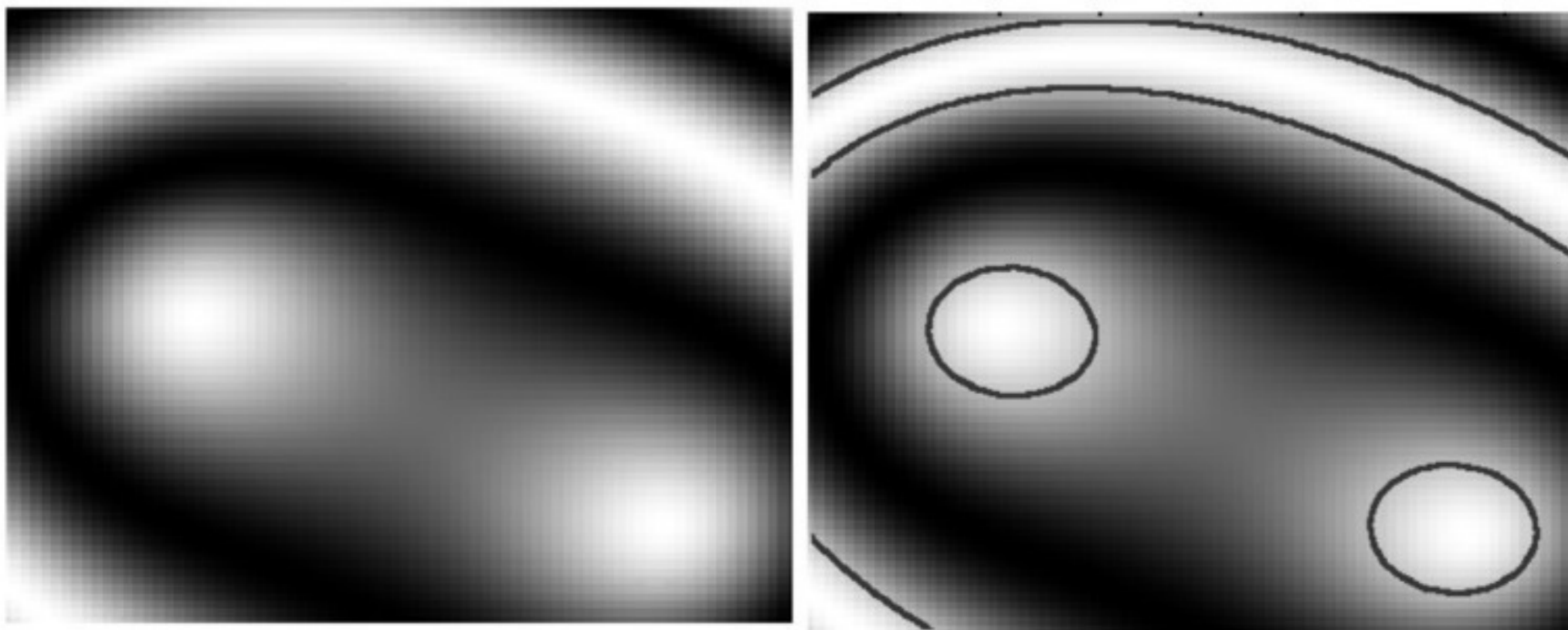
## Surfacic scalar data : Example



017

## Isolines

**Goal:** Trace curves on a specific value  
Called: isolines, isocurves, level sets, ...

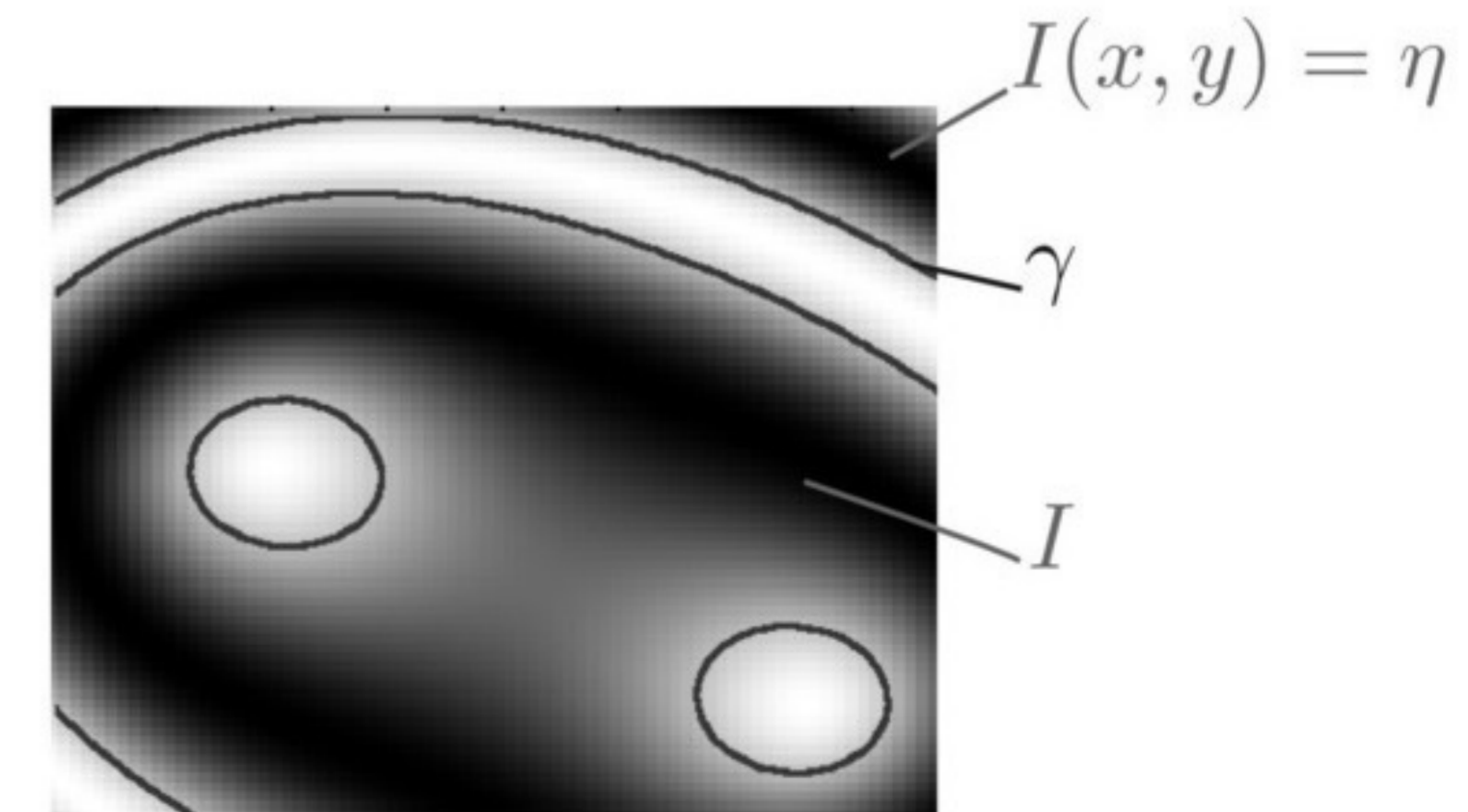


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## Isolines : input/output

**Input:** Scalar values on a regular discrete grid + isovalue  $\eta$

**Output:** Set of curves  $\{\gamma = (x, y) \in \mathbb{R}^2 \mid I(x, y) = \eta\}$   
(degenerated cases: points, regions)



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## Example: continuous cases

For  $\eta = 0$

$$F_1 = 1$$

$$F_2 = 1$$

$$F_3 = (x - x_0)^2 + (y - y_0)^2 - r_0^2$$

$$F_4 = F_3(x_0, y_0, r_0) + F_3(x_1, y_1, r_1)$$

$$F_5 = F_3(x_0, y_0, r_0) \times F_3(x_1, y_1, r_1)$$

We can define a curve by its implicit equation  
+ Arbitrary topology

020

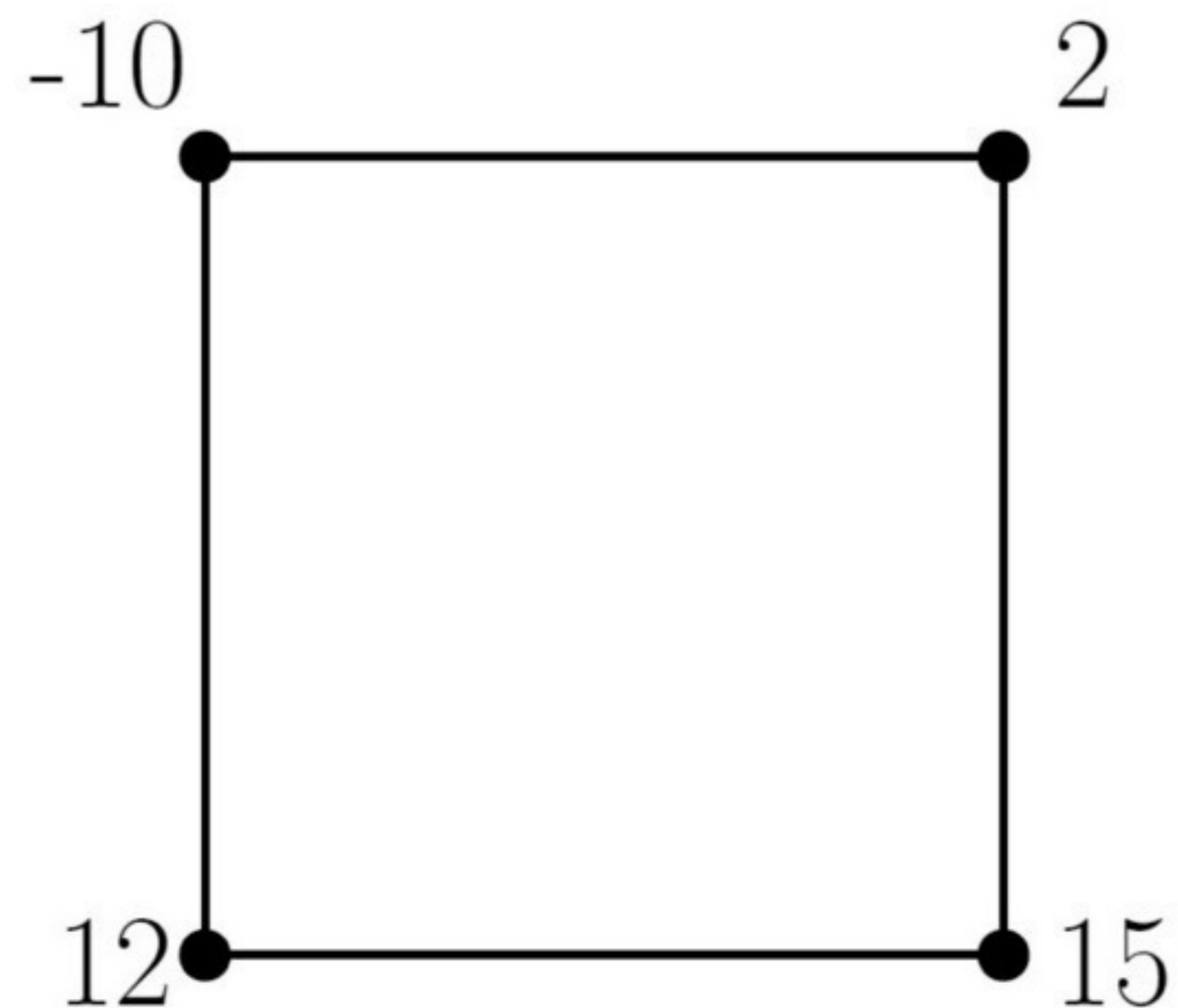
## Marching squares

-61	-45	-42	-52	-72	-91	-99	-89
-17	8	13	-2	-34	-69	-94	-98
25	57	64	43	2	-45	-84	-99
51	87	94	71	25	-30	-76	-99
51	87	94	71	25	-30	-76	-99
25	57	64	43	2	-45	-84	-99
-17	7	13	-2	-34	-69	-94	-98
-61	-45	-42	-52	-72	-91	-99	-89

021

## Marching squares

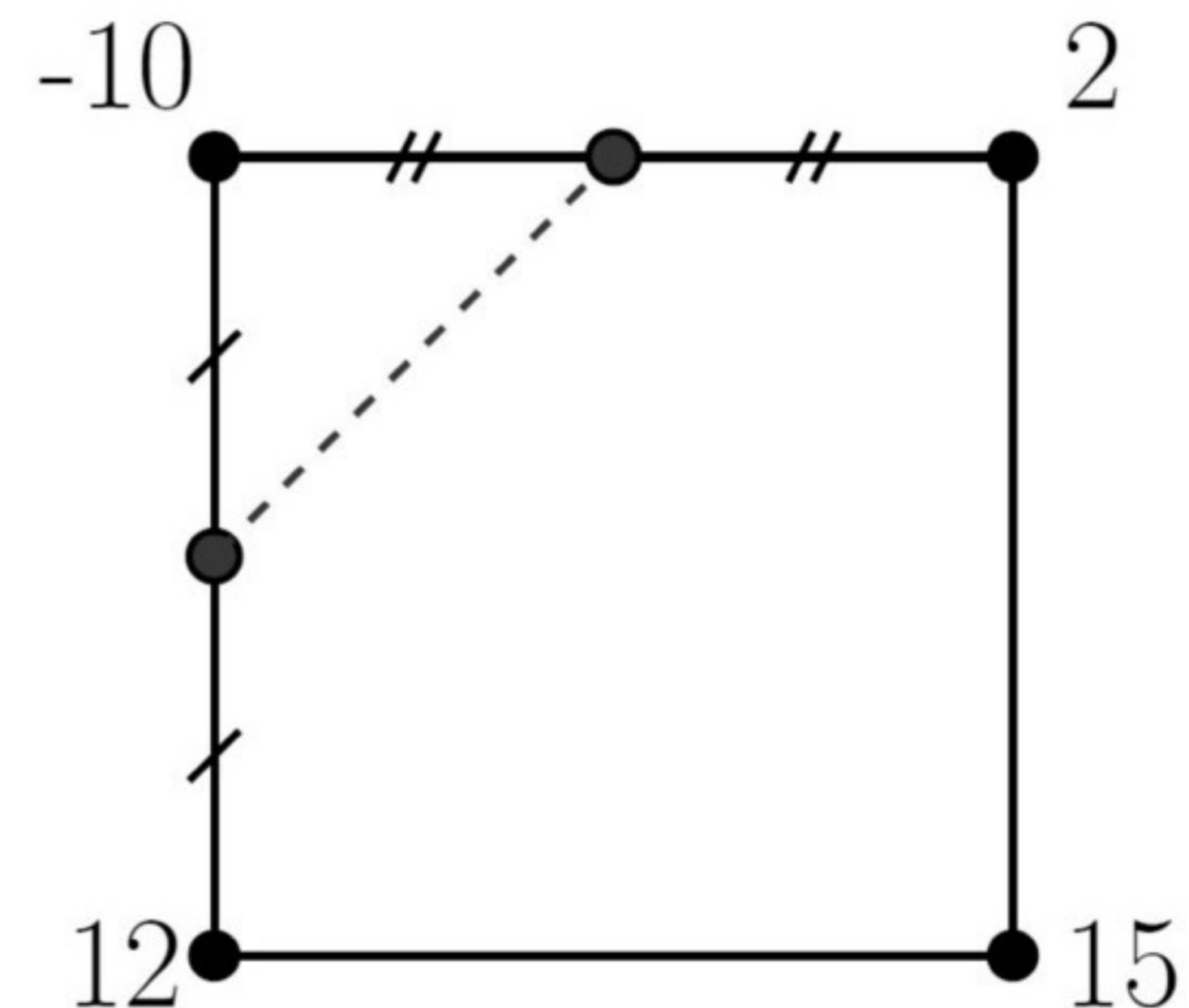
Which curve should we consider?



022

## Marching squares

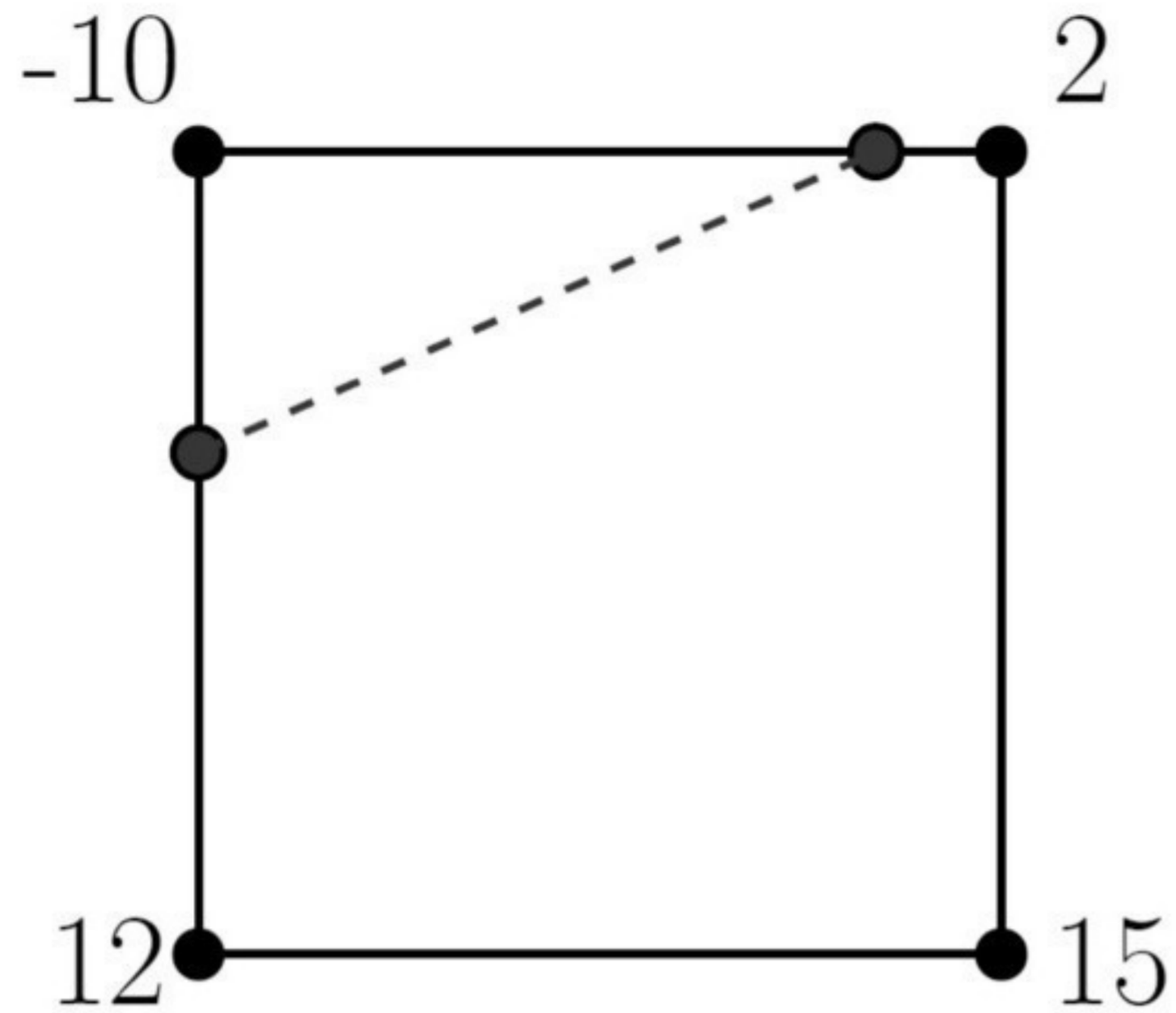
Middle of the edges



023

## Marching squares

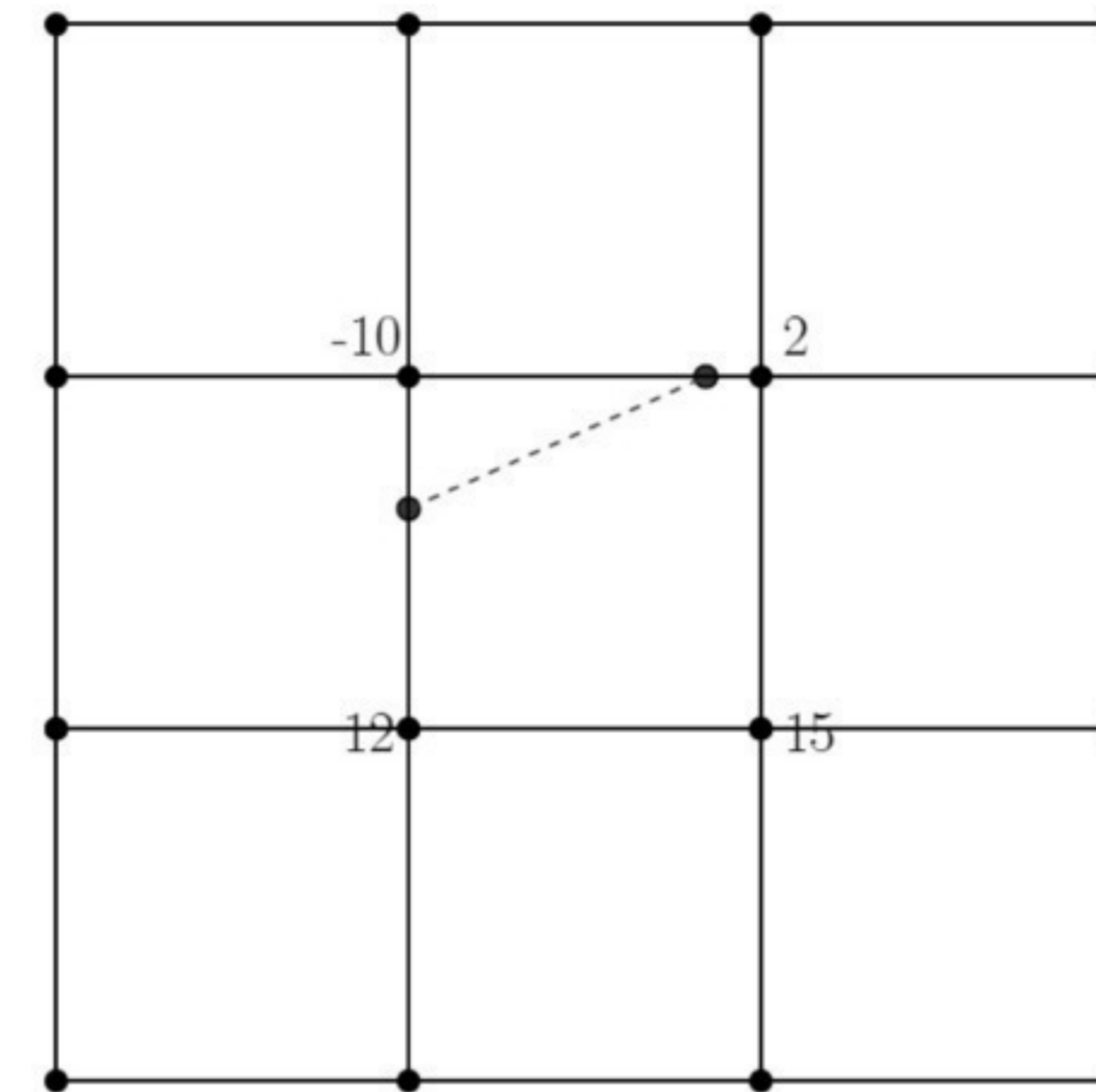
Interpolation (bi-)linear



024

## Marching squares

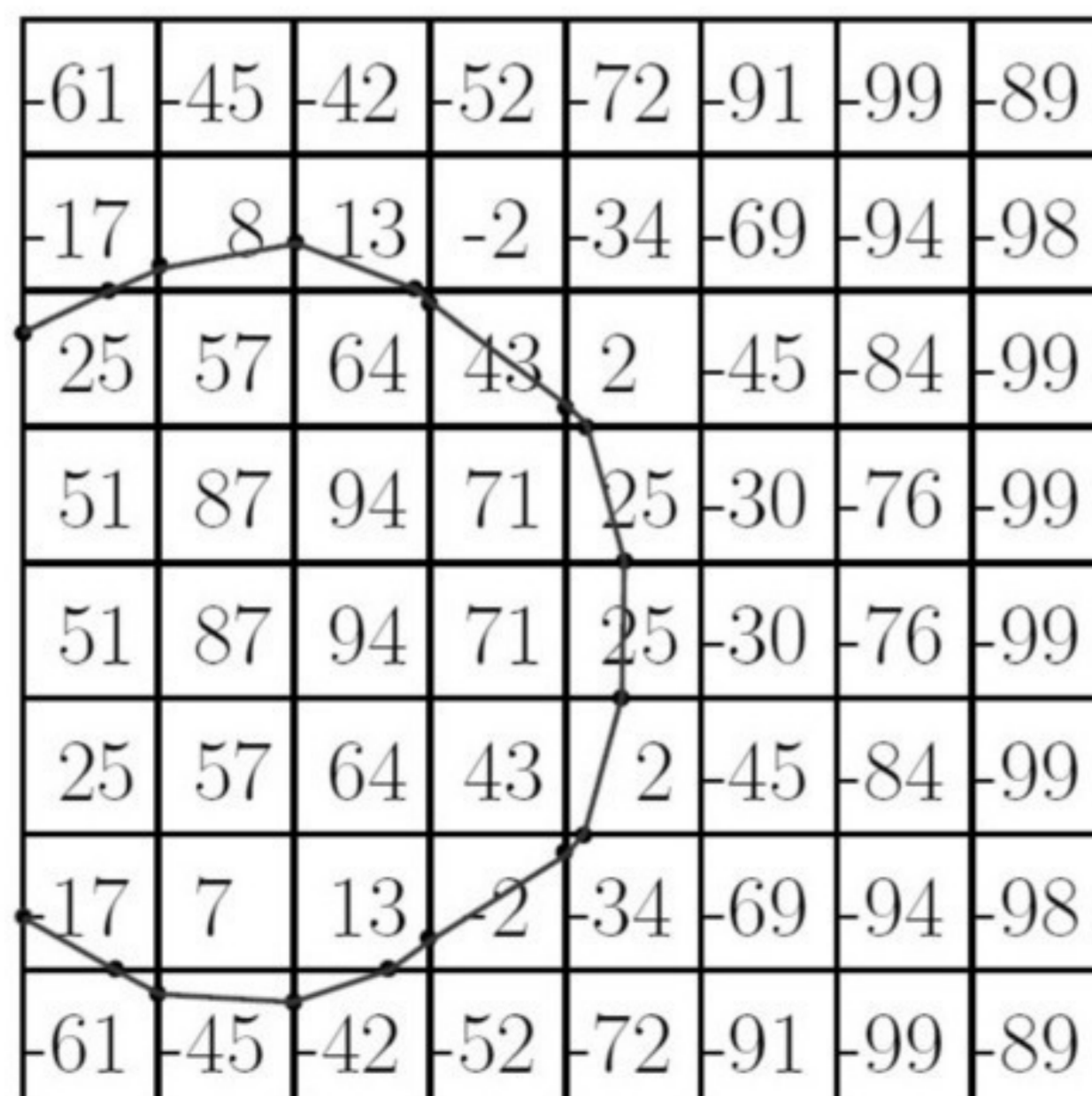
Other interpolation (cubic, spline, etc)



025

## Marching squares

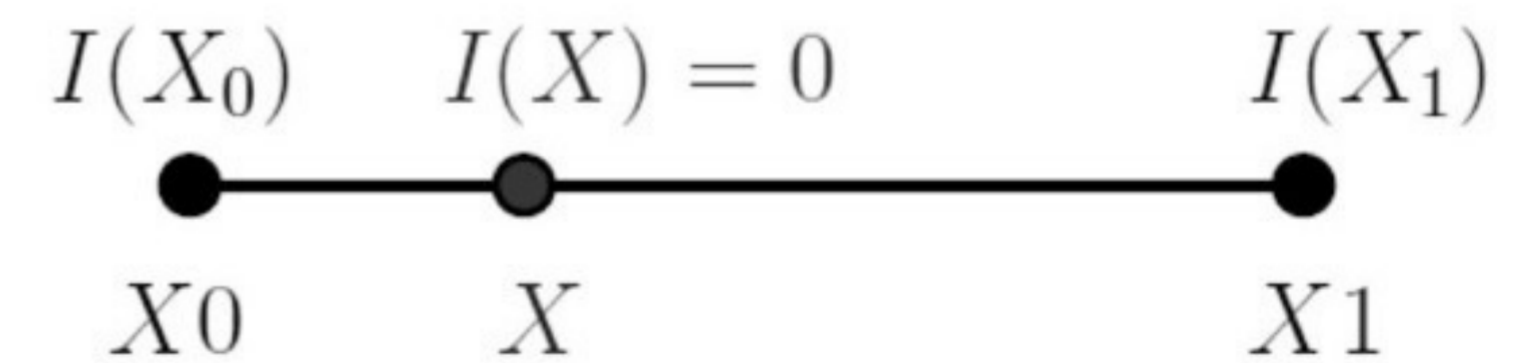
Result for the previous grid



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## Interpolation

Zeros finding in linear interpolation

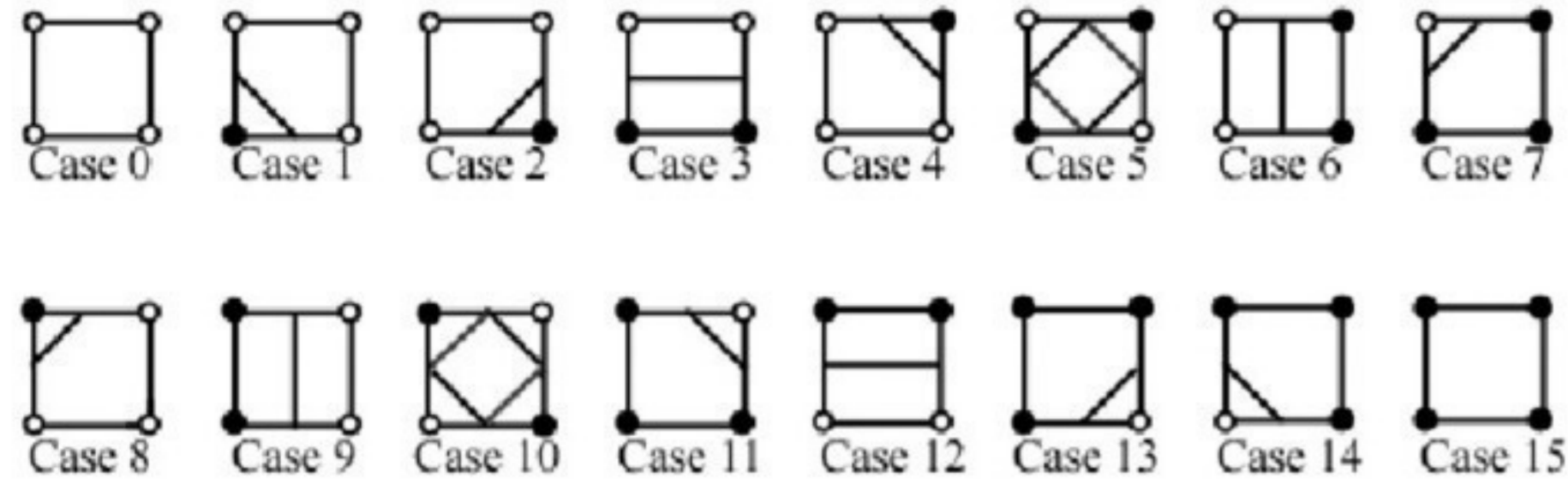


$$X = \frac{I(X_1)X_0 - I(X_0)X_1}{I(X_1) - I(X_0)}$$

027

## Marching square

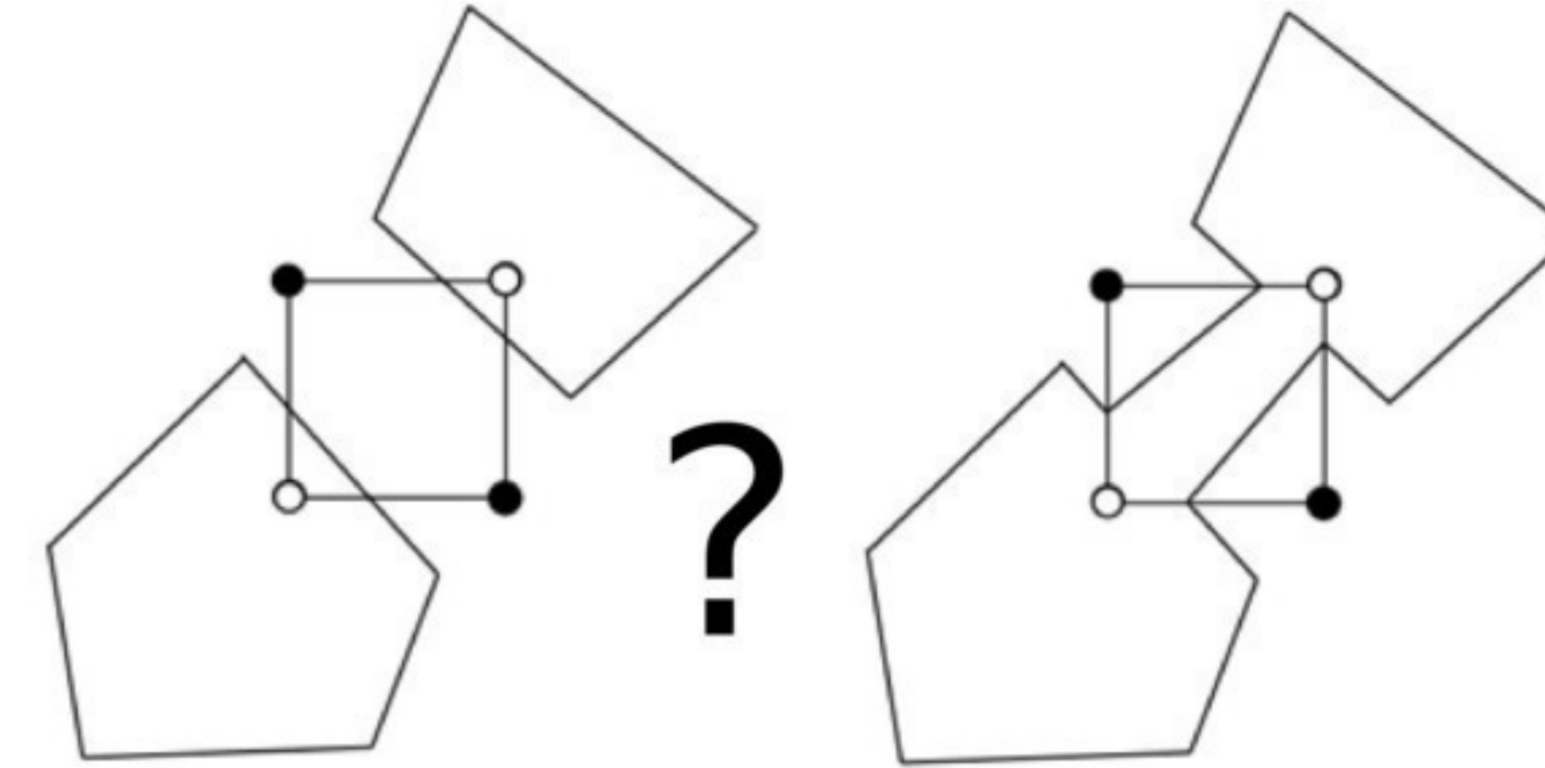
For a single cell: 16 different possibilities



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## Marching square

Some undetermined case



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## Volume data

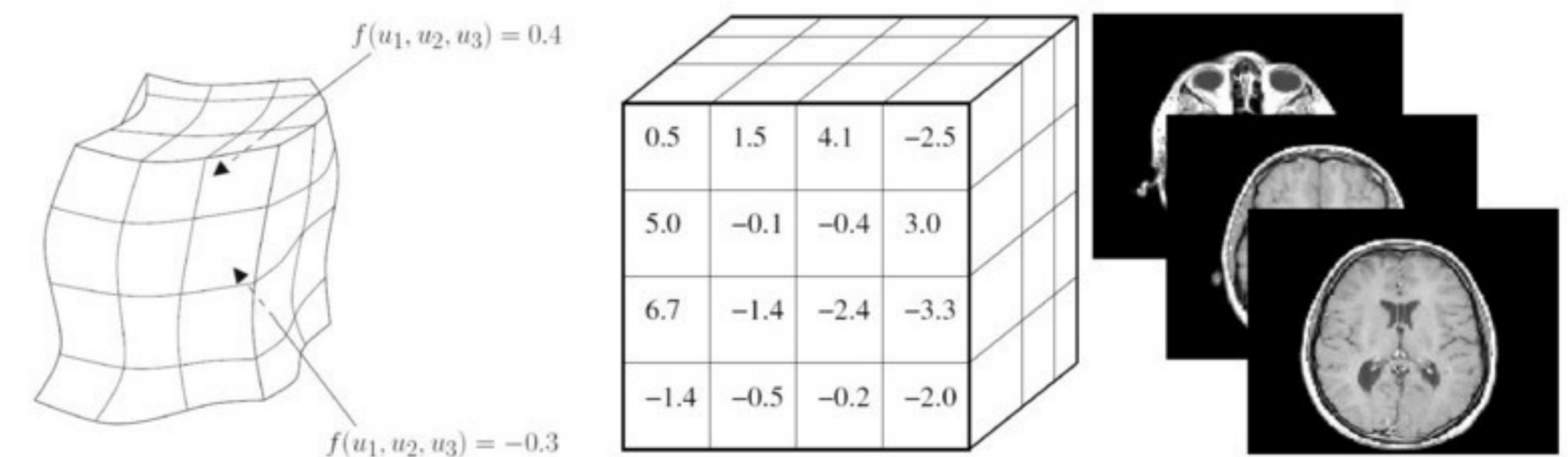
030

## Volume data : Notation

For volume field:  $f(u_1, u_2, u_3) = I \in \mathbb{R}$

Very often:  $f(x, y, z) = I$

After discretization:  $f(k_x \Delta x, k_y \Delta y, k_z \Delta z) = I_{k_x, k_y, k_z}$



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## Medical Imaging Modalities

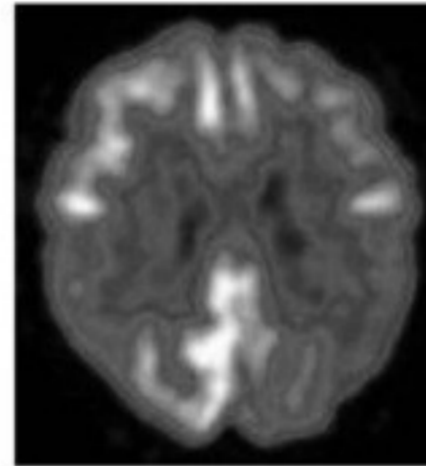
### X-Ray

Anatomical  
Absorbtion measurement  
(*inverse problem*)



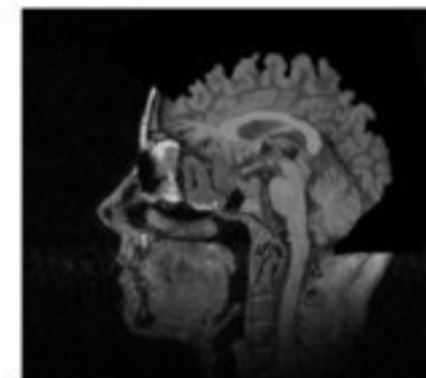
### Nuclear (PET, SPECT)

Functional  
Attenuated emission  
(*inverse problem, noise*)



### MRI

Anatomical (*MRI, Angiography*)  
or Functional  
Density measurement (*direct*)

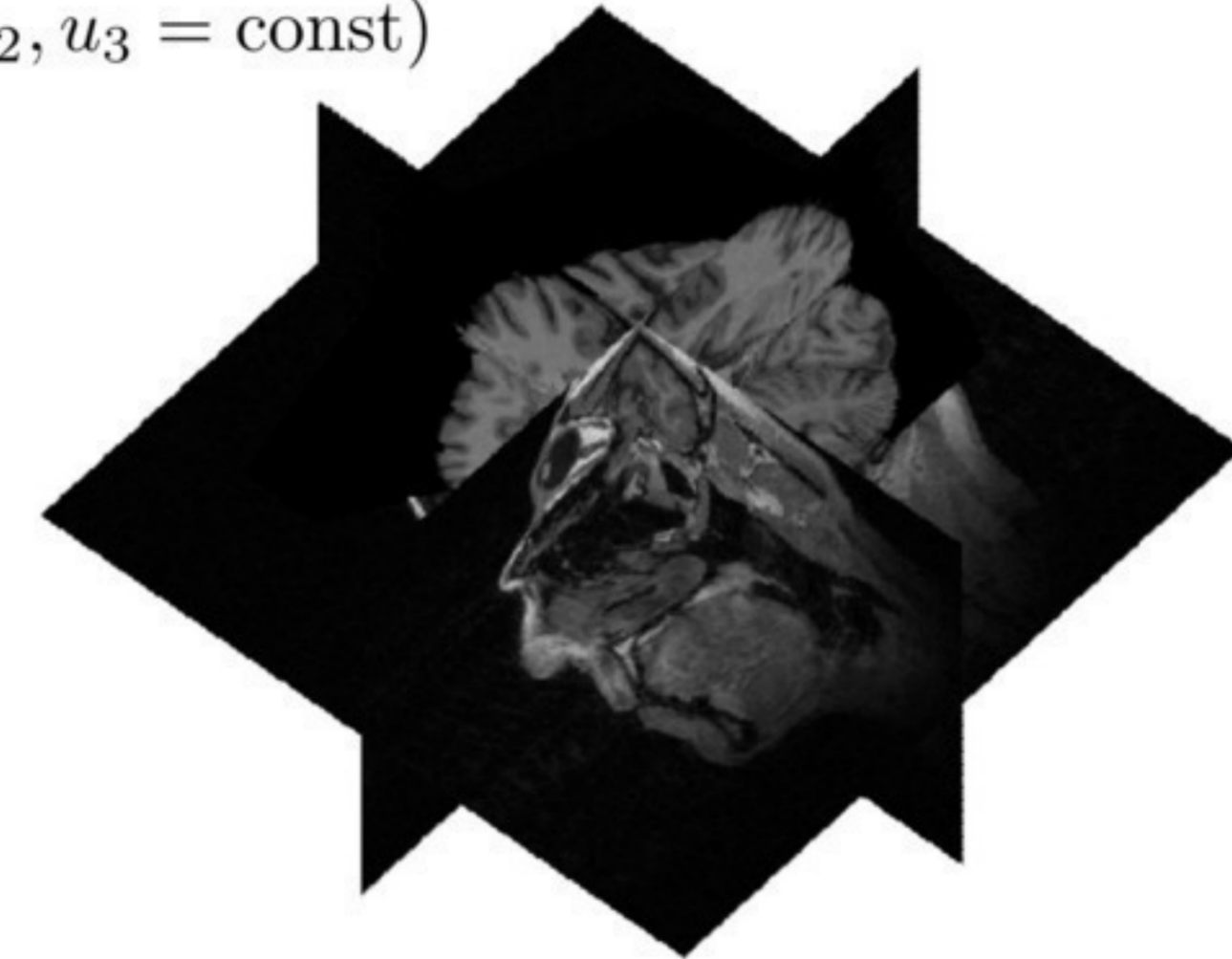


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## Slicing visualization

Idea: Slice some surfaces on the volume  
Encode the field as a color (gray level, texture, etc)

Draw  $I(u_1 = \text{const}, u_2, u_3)$   
 $I(u_1, u_2 = \text{const}, u_3)$   
 $I(u_1, u_2, u_3 = \text{const})$



033

## Slicing visualization

We can use more general surfaces  
Which is the best surface ?



034

## Marching cubes

A common surface is the iso-surface

The isosurface of isovalue  $\eta$  of the  $I$  function is the set

$$\{(x, y, z) \in \mathbb{R}^3 | I(x, y, z) = \eta\}$$

In making  $\eta$  evolving, we obtain different surfaces

How to triangulate such implicit surface ?

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## Marching cubes : Examples

For  $\eta = 0$

$$F_1 = 1$$

$$F_2 = 0$$

$$F_3 = (x - x_0)^2 + (y - y_0)^2 + (z - z_0)^2 - r_0^2$$

$$F_4 = F_3(x_0, y_0, z_0, r_0) + F_3(x_1, y_1, z_1, r_1)$$

$$F_5 = F_3(x_0, y_0, z_0, r_0) \times F_3(x_1, y_1, z_1, r_1)$$

A surface can be defined by its equation  
+ Arbitrary topology

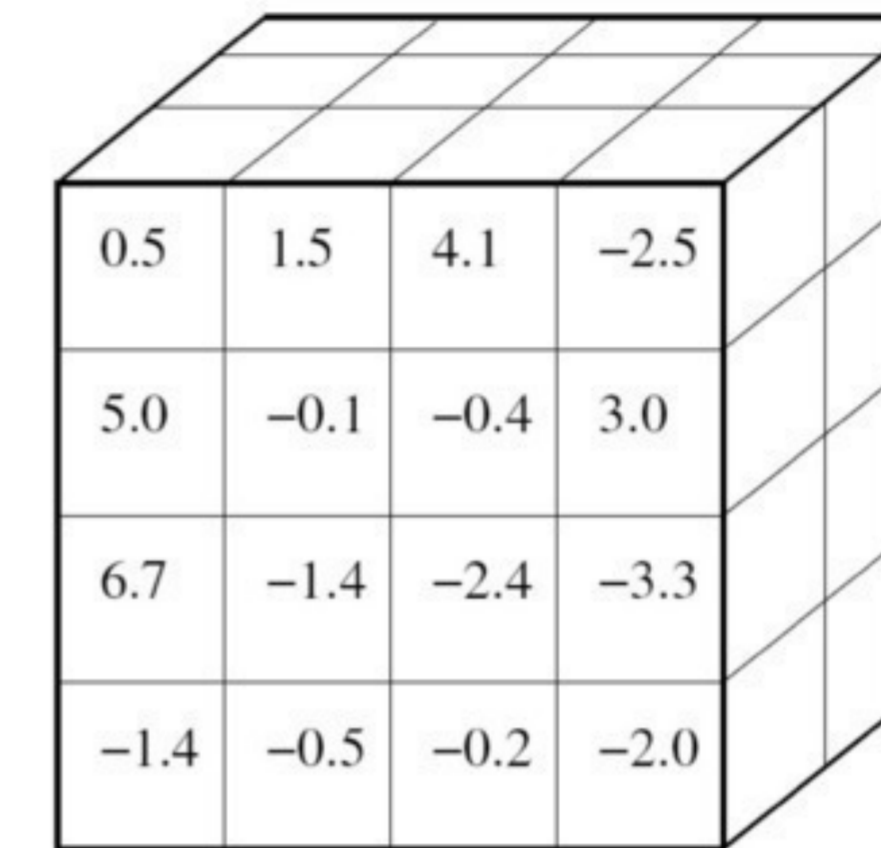
036

## Marching cubes : Intro

**Goal:** Build a triangulated surface from a discrete volumetric scalar field given by  $I(x, y, z) - \eta$

First software patent in CG in 1985 from Lorensen & Cline.

Input data: 3D Grid in (x,y,z) of (Ni,Nj,Nk) voxels.



037

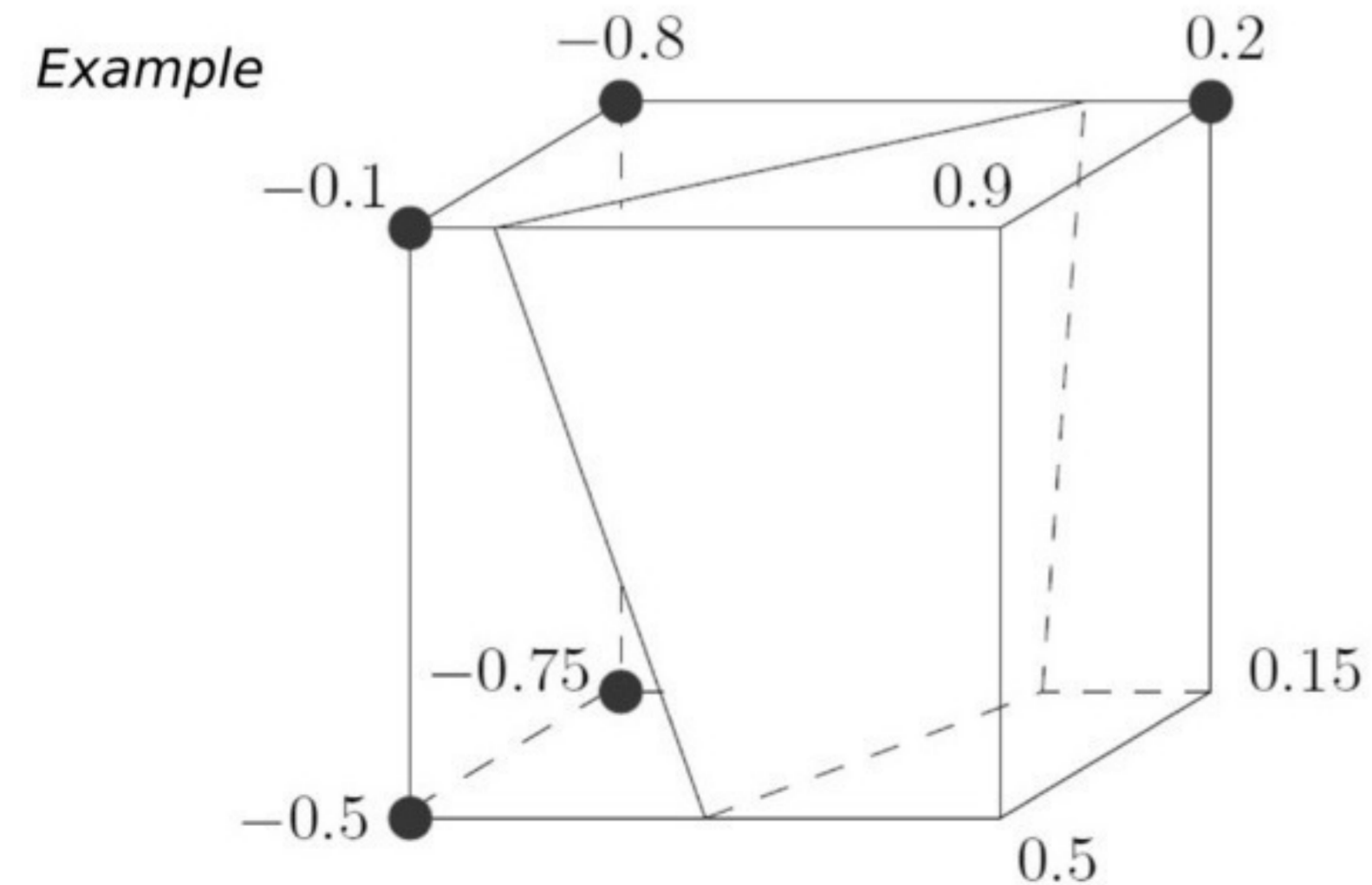
## Marching cubes : Principle

Traversal of the grid "cube by cube"

Compute the sign of  $I(x, y, z) - \eta$

Check the possible cases

The 0 value is obtain by interpolation

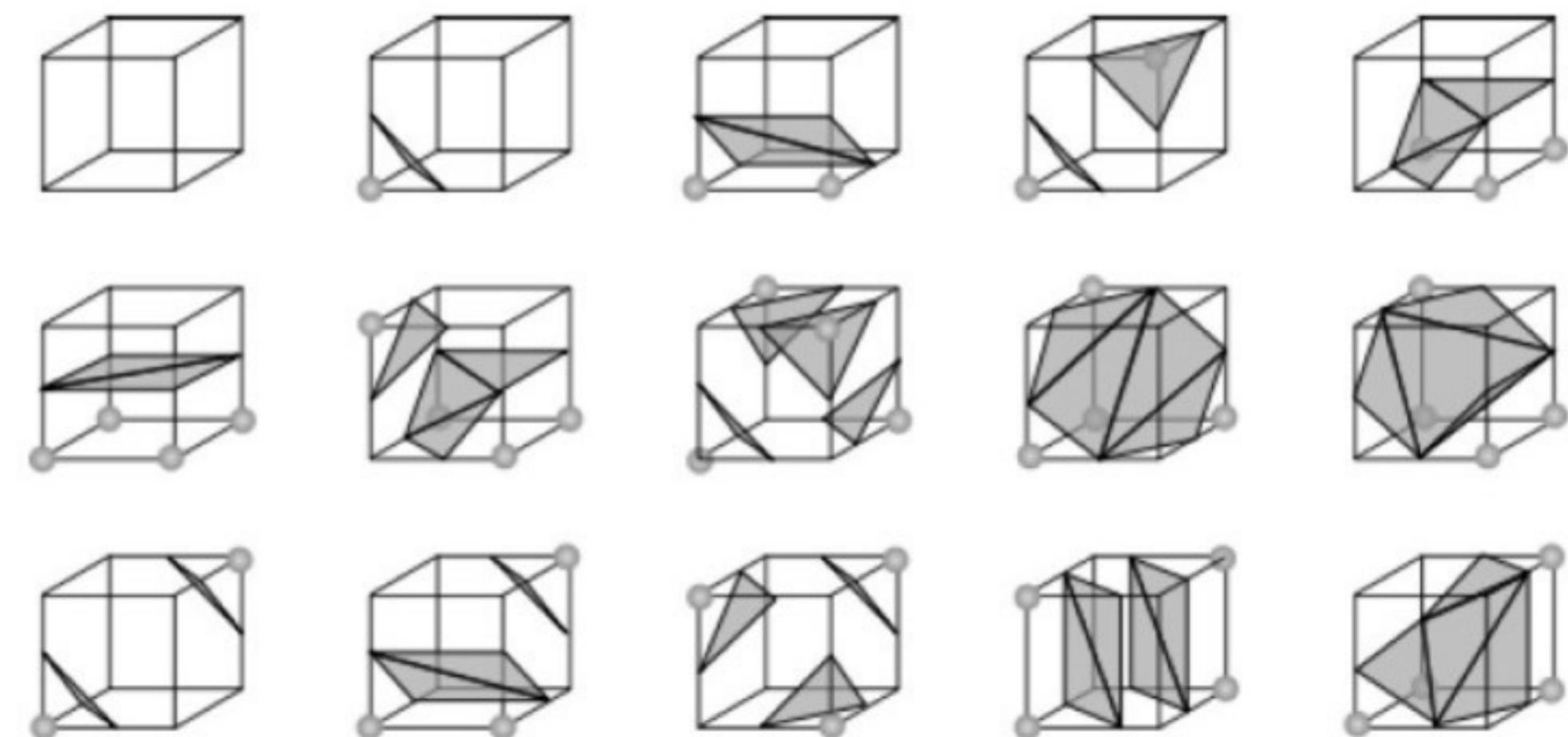


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## Marching cubes : Different cases

A total of 256 possible cases

Only 15 basic cases



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## Marching cubes : Usage

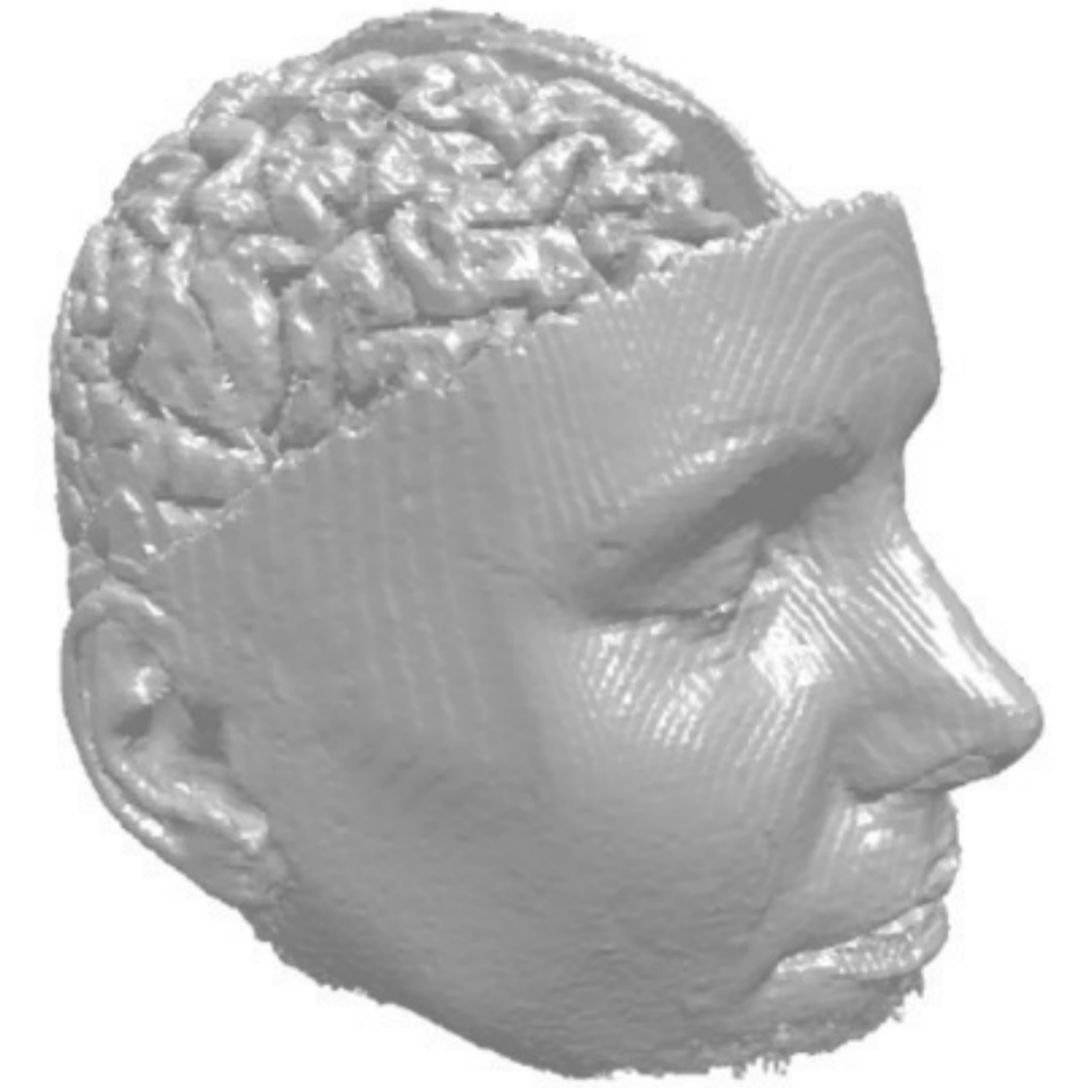
### + Efficient

- Cubic aspect
  - Smooth volume
  - Smooth surface
  - Medical correctness
- Undetermined cases

040

## Isosurface example: MRI

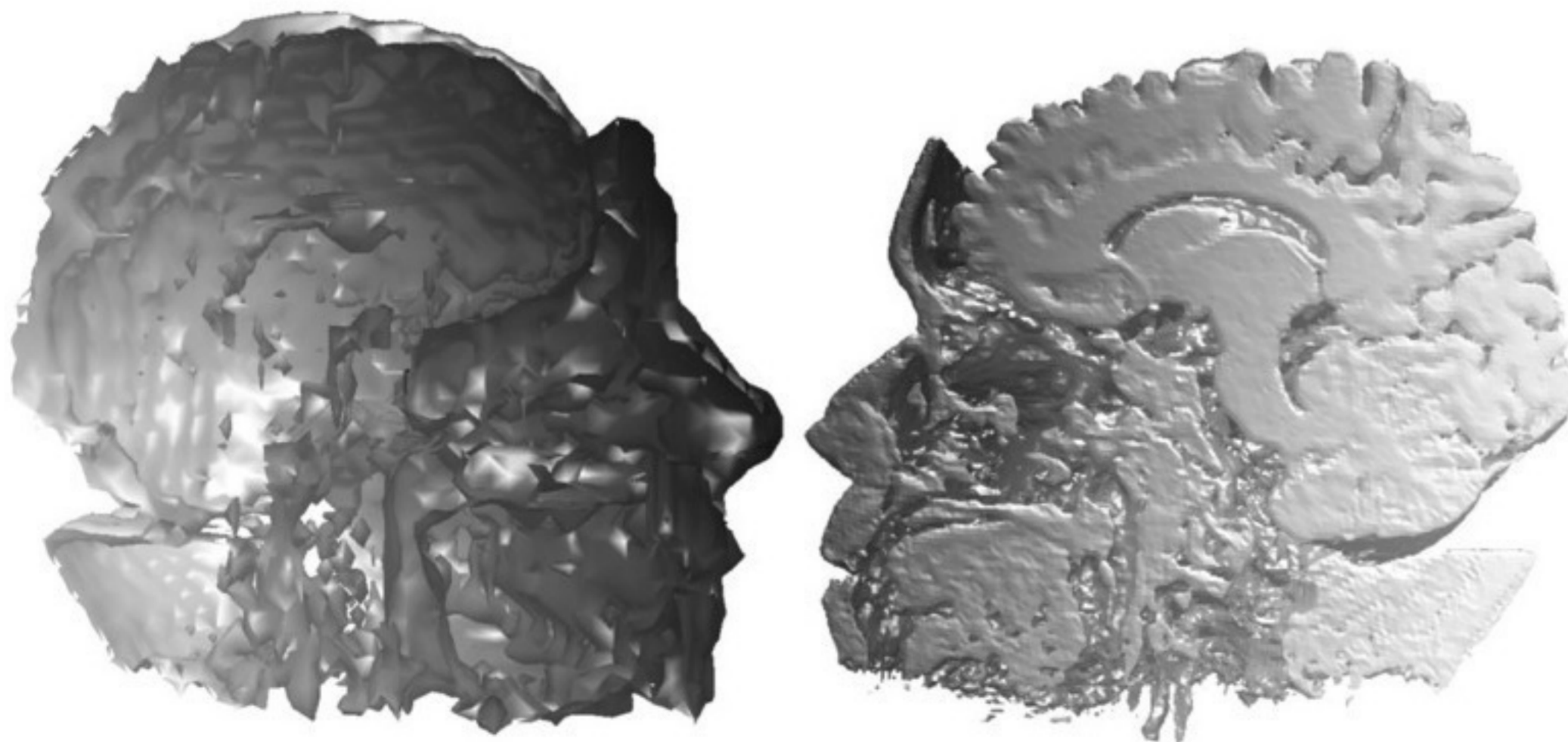
MRI Data (256 x 256 x 99)



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## Isosurface example: MRI

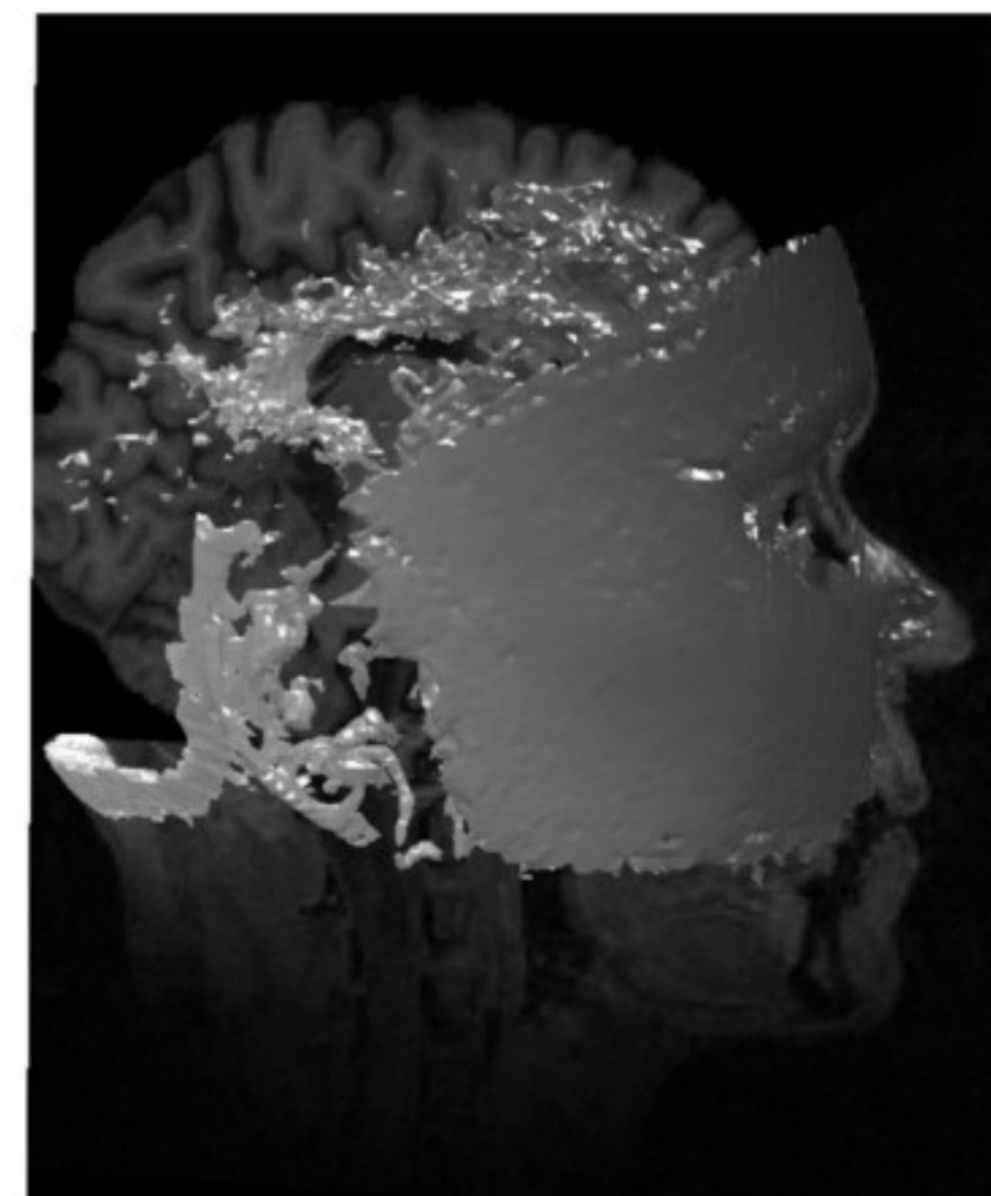
Can observe internal structure



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## Isosurface example: MRI

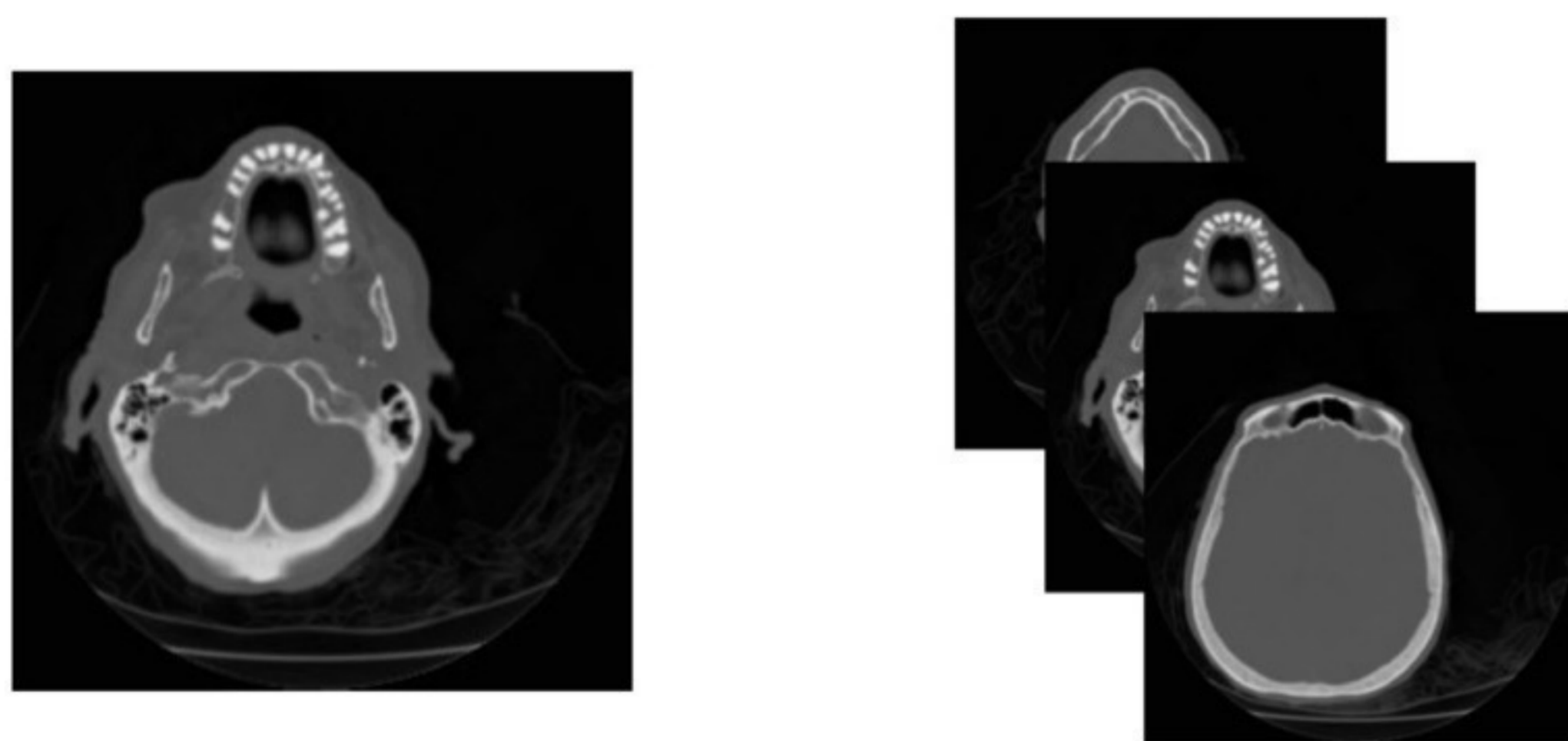
Combining Slicing + isosurface



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## Isosurface example: CT

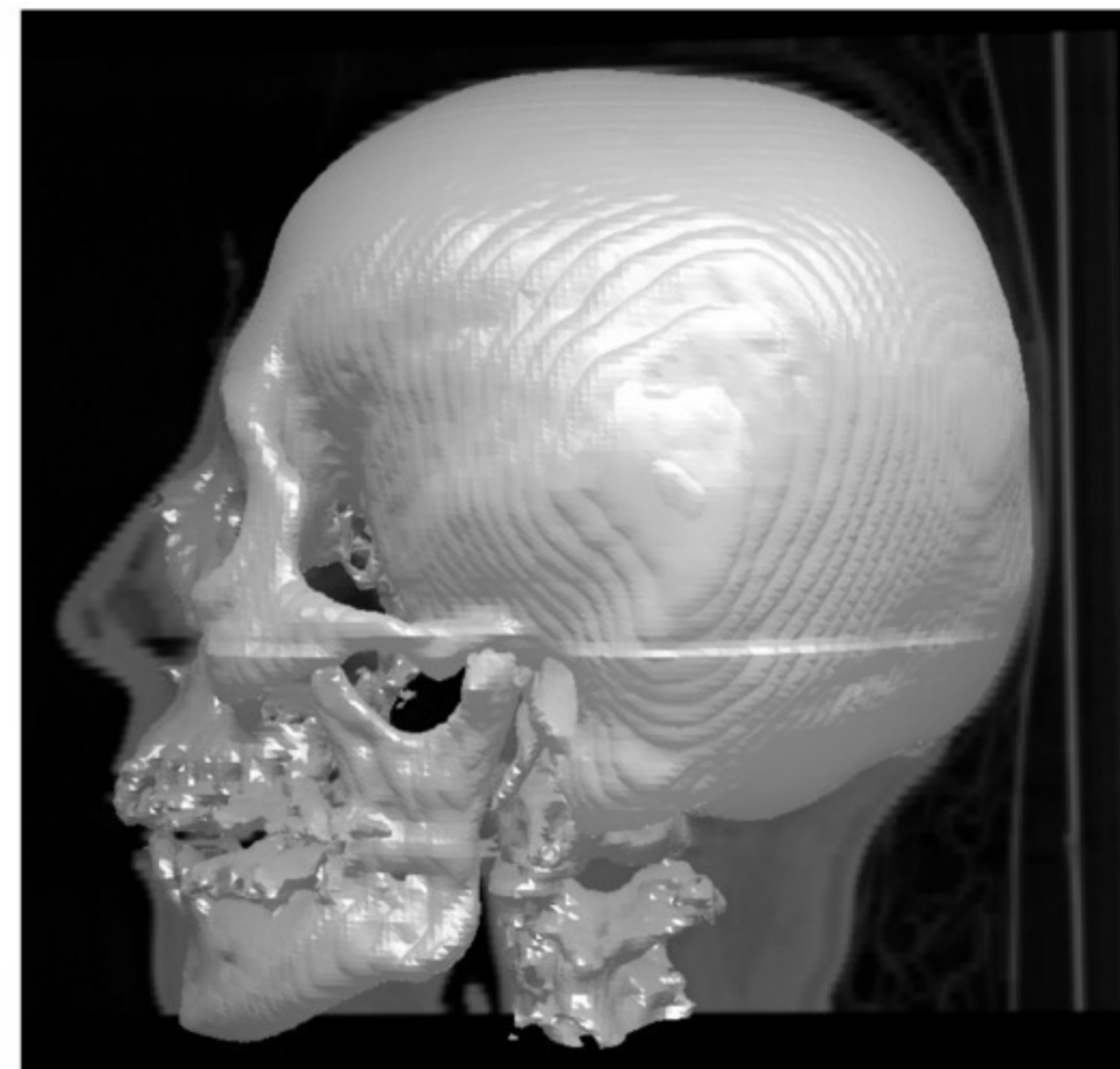
CT (X-Ray) data  
Morphological data (skin, bone)  
256 x 256 x 99



044

## Isosurface example: CT

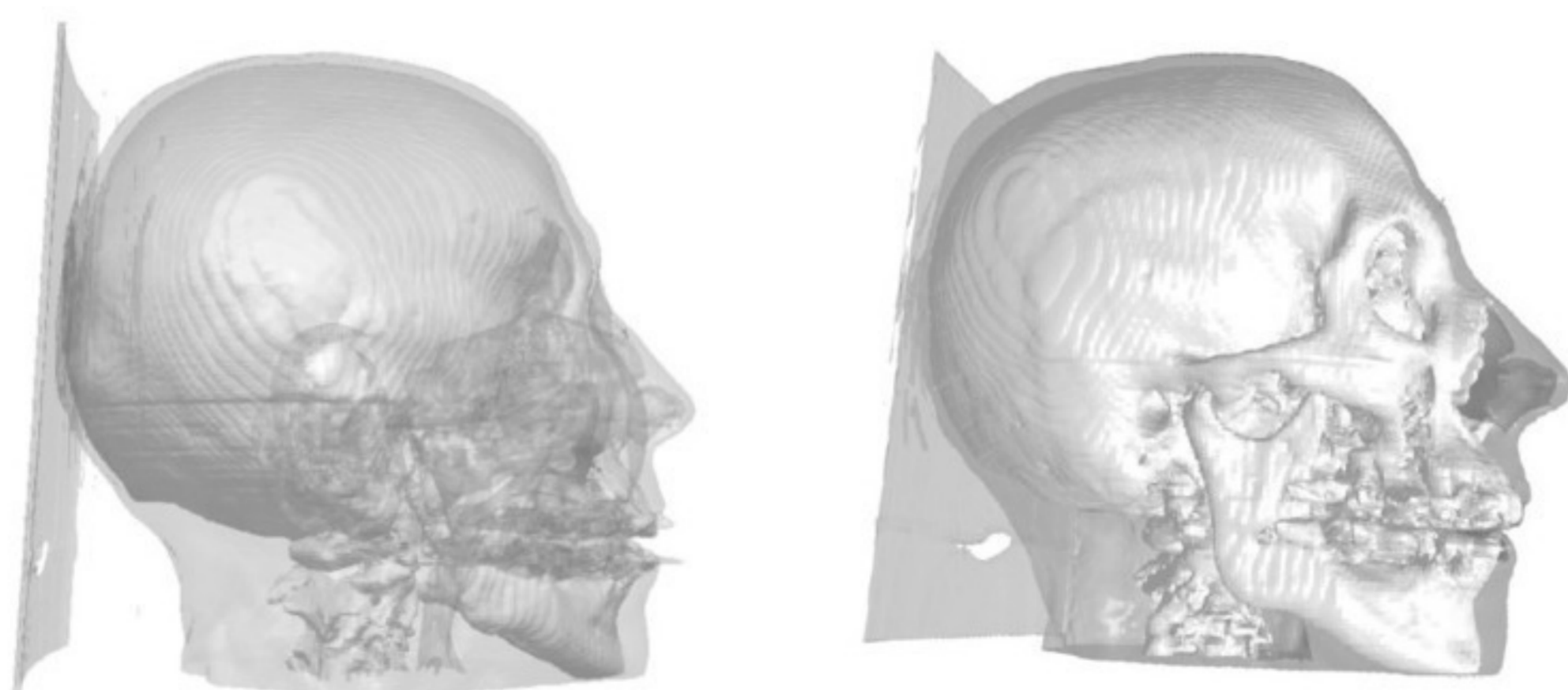
Combination slice + isosurface



045

## Isosurface example: CT

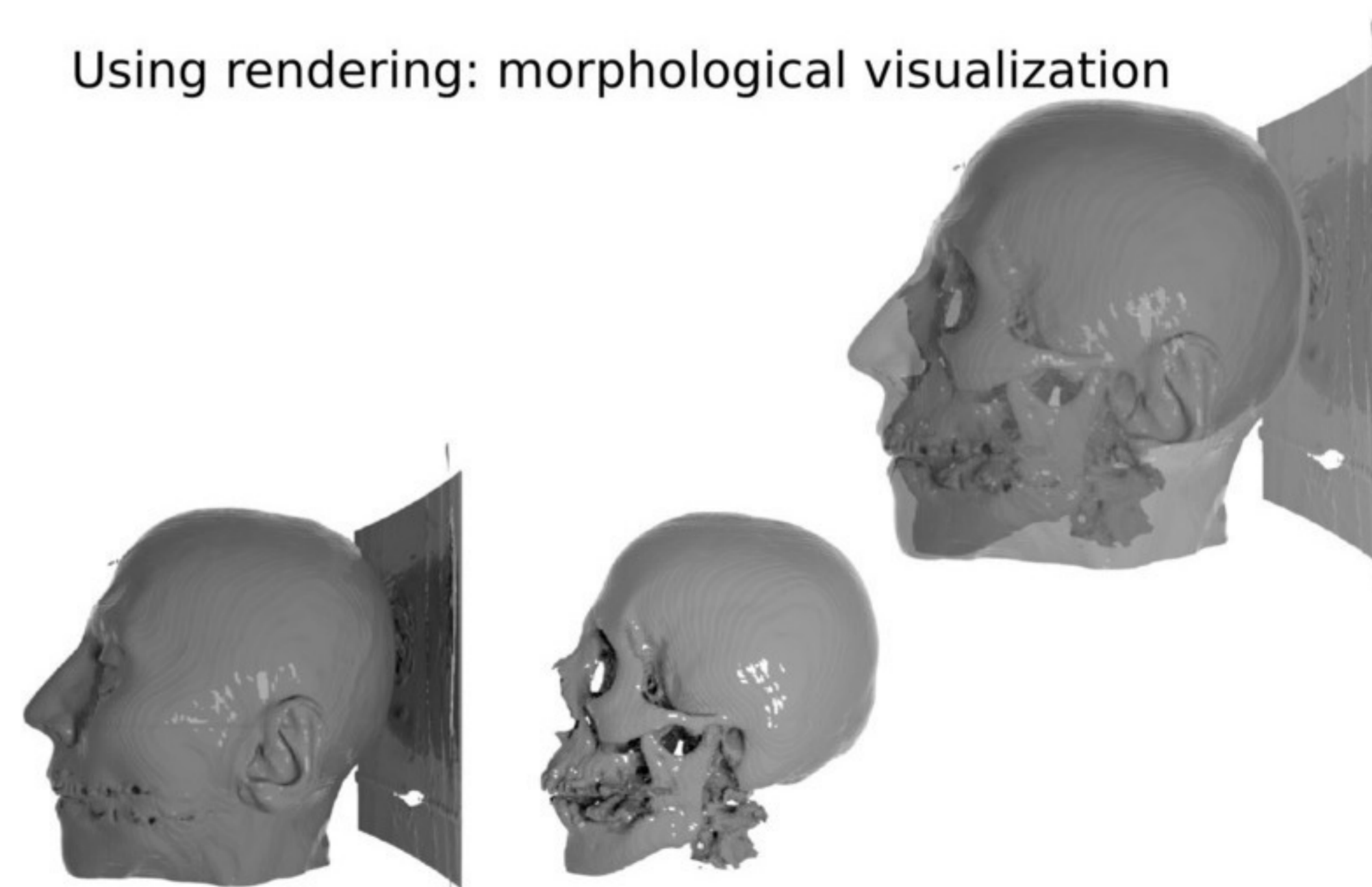
Accumulation of surface with transparency



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## Isosurface example: CT

Using rendering: morphological visualization



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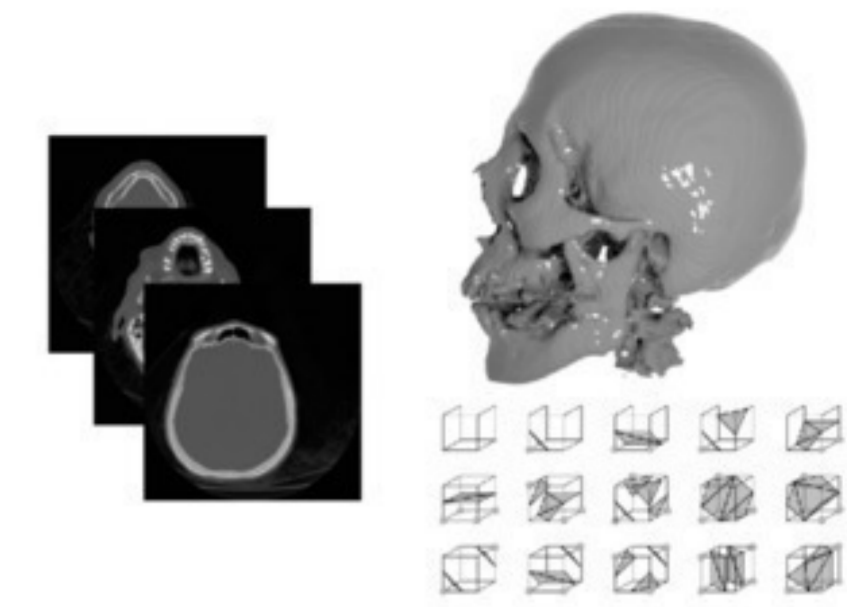
## Ray casting

048

## Ray casting

What we have seen:

- Slice in a volume
- Isosurface extraction (marching cubes/tetrahedron)



What we are going to see  
- Transparency rendering  
= **volume rendering**



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## Ray casting

### Surface rendering

- + Accurate
- + Data reduction
- Local information
- A-priori knowledge



### Volume rendering

- + Global information, direct visualization
- Not accurate, transparency can be tricky



*Pipe-line: Volume rendering to guide a surface extraction*

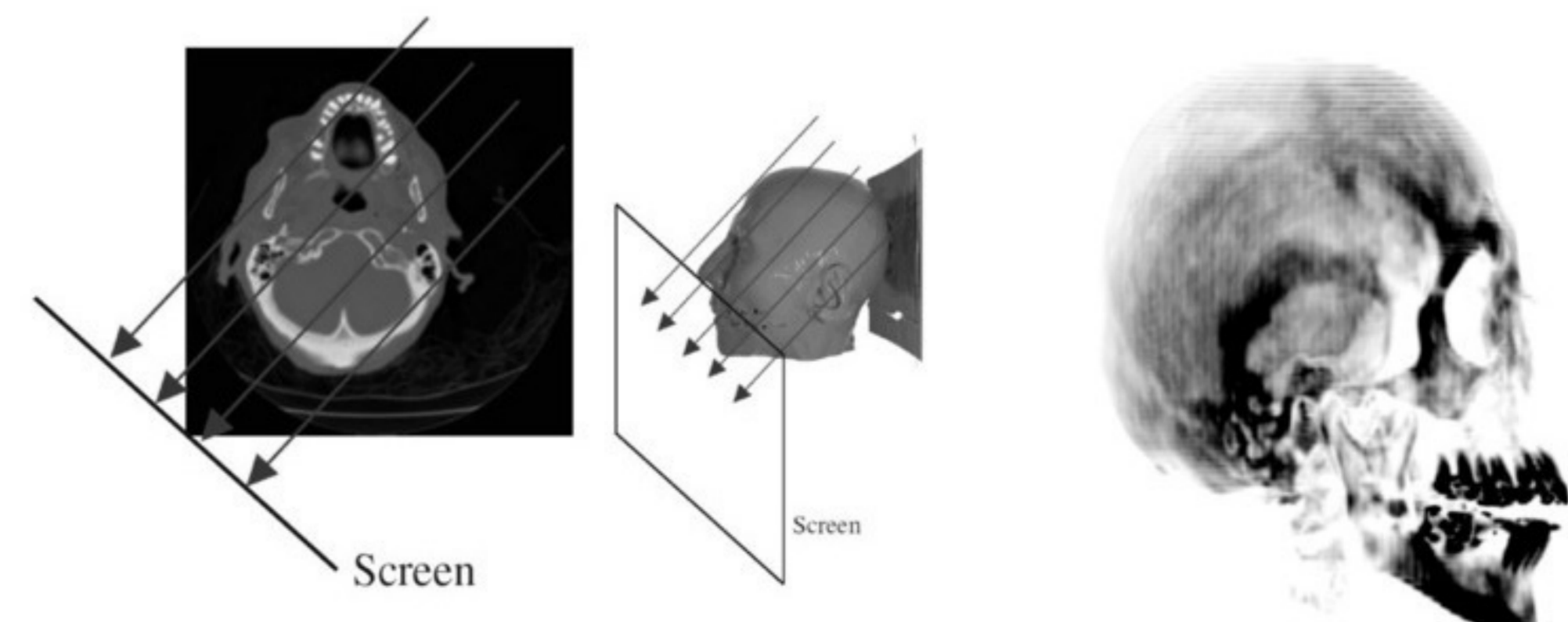
050

## Ray casting

**Goal:** Modeling a data acquisition using transparency

**Problem:** Human are not used to see transparency

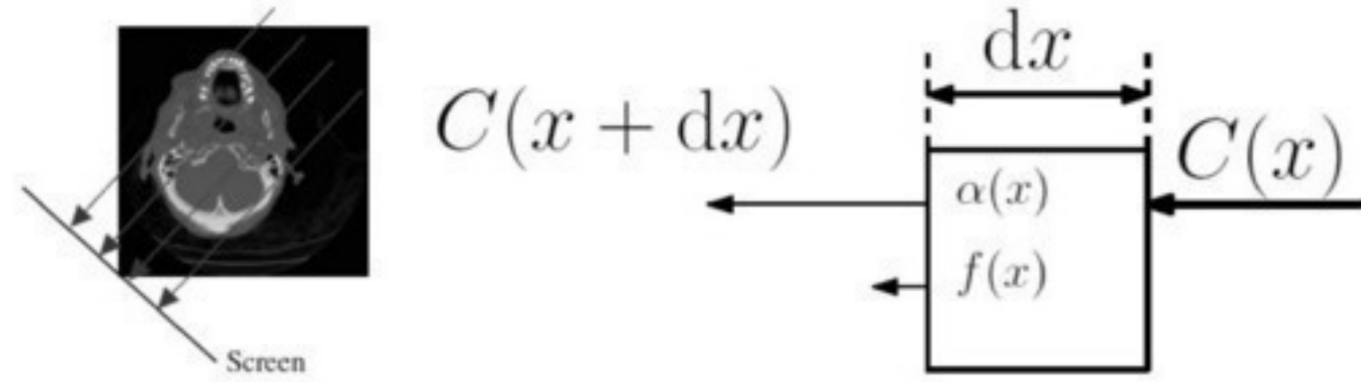
**General approach:** Ray-tracing/casting = Throw rays and set the color as a function of path and obstacles.



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## Ray casting: equations

For attenuated emission



$$C(x + dx) = [1 - \alpha(x) dx] C(x) + f(x)$$

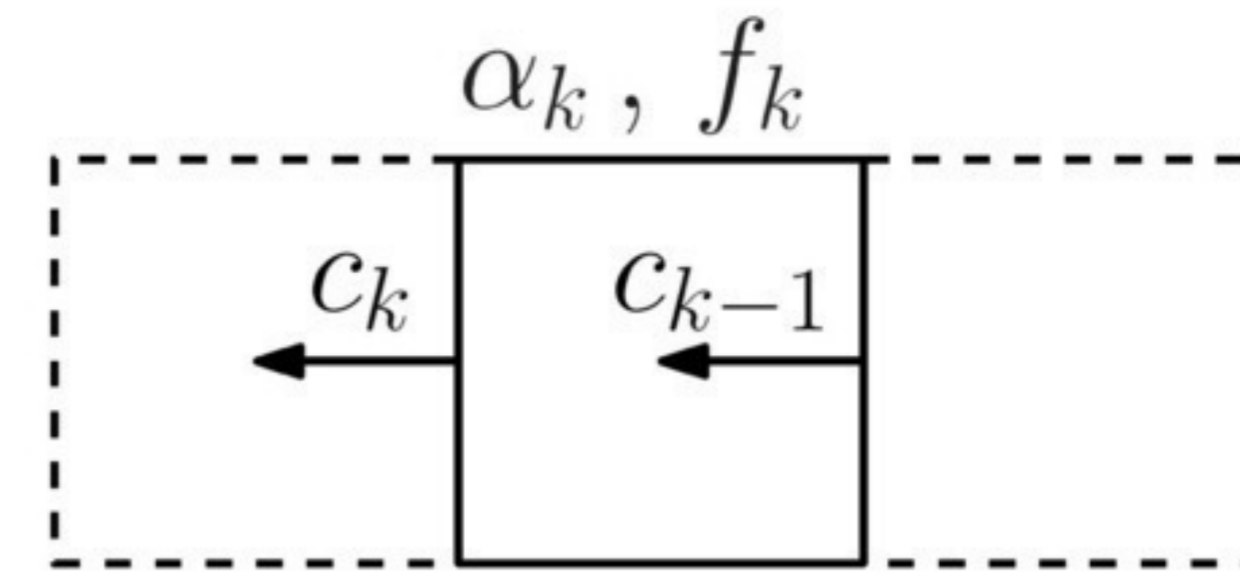
$$\Rightarrow C'(x) = -\alpha(x)C(x) + f(x)$$

$$\Rightarrow C(x) = \left( \int_{x_0}^x f(u) e^{\int_{x_0}^u \alpha(t) dt} + C(x_0) \right) e^{-\int_{x_0}^x \alpha(t) dt}$$

For a given  $\alpha, f$ , find  $C$  = Volume rendering  
 For a given  $C$ , find  $\alpha, f$  = Tomography

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## Ray casting: discretization



In discrete form  $c_k = (1 - \alpha_k) c_{k-1} + f_k$

$\alpha_k, f_k$  are functions of the intensity  $I$  of the current voxel  
 Can also depends on the derivatives

ex.  $\alpha_k = A \Delta x I_k, f_k = B \Delta x I_k$

More generally, transfert functions are used

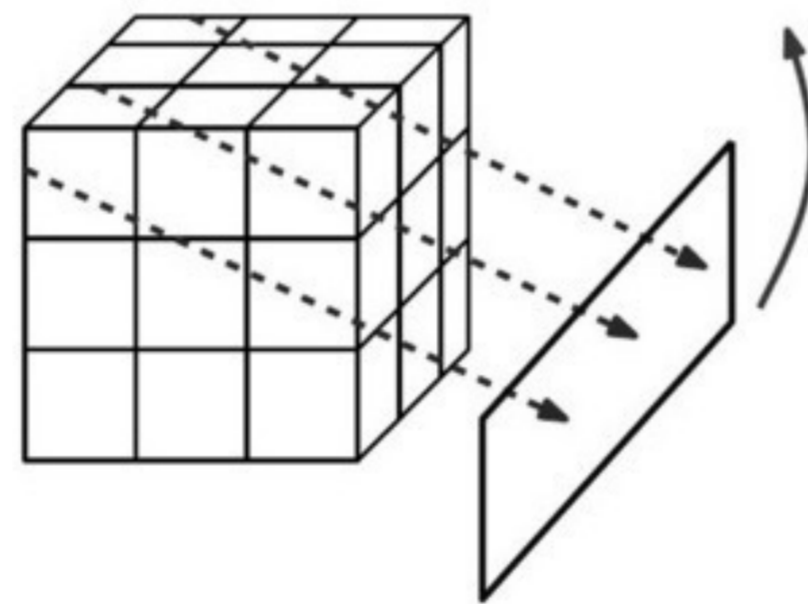
$$\alpha_k = \mathcal{F}(I_k) \quad f_k = \mathcal{G}(I_k)$$

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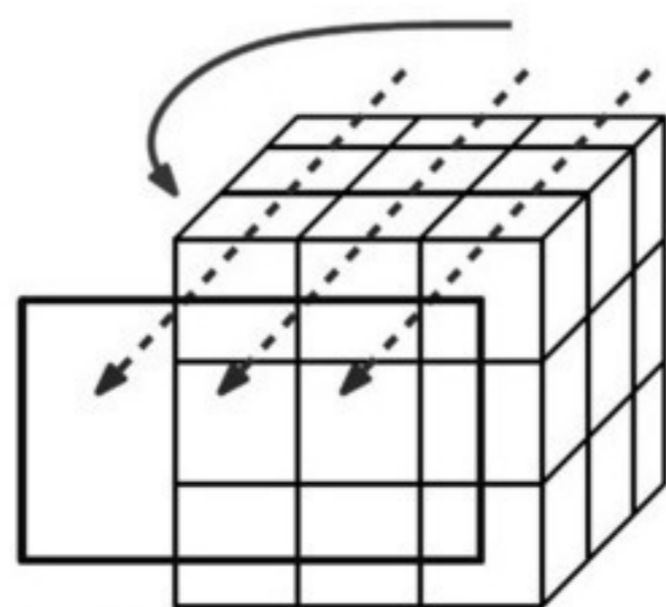
## Ray casting: Implementation

2 Approches

Throw rotated lines in fixed grid



Rotate grid and integrate along fixed axis  
 (3D texture)



Trivial parallelisation

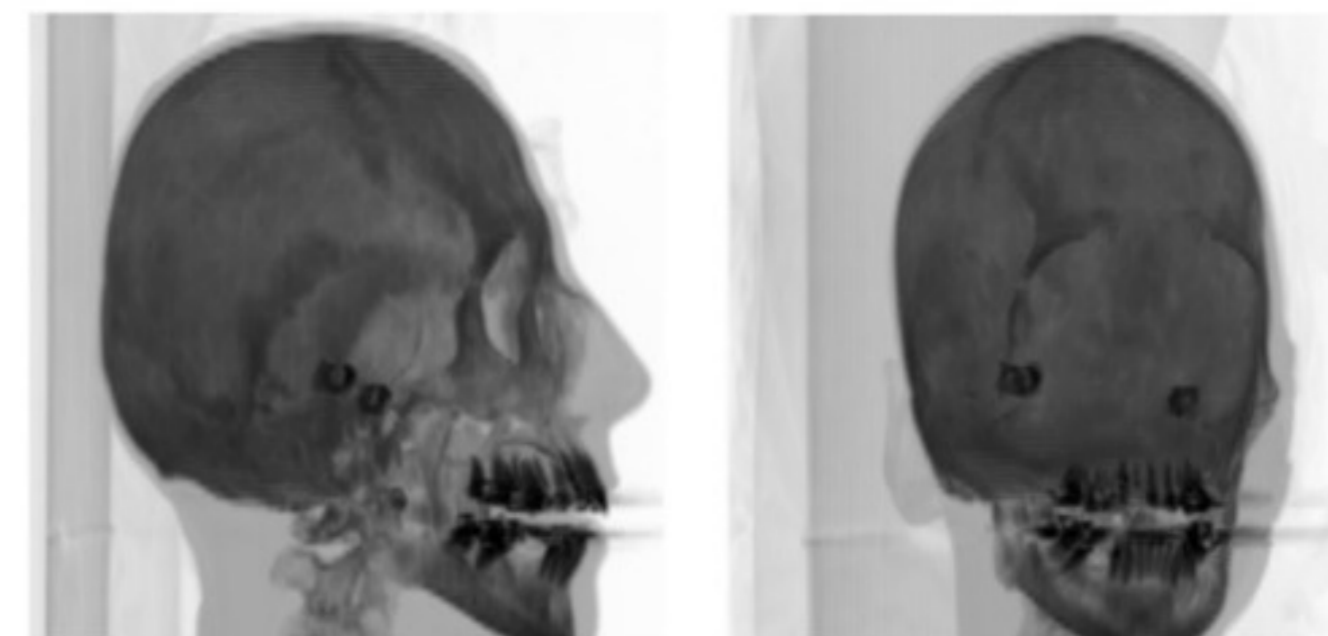
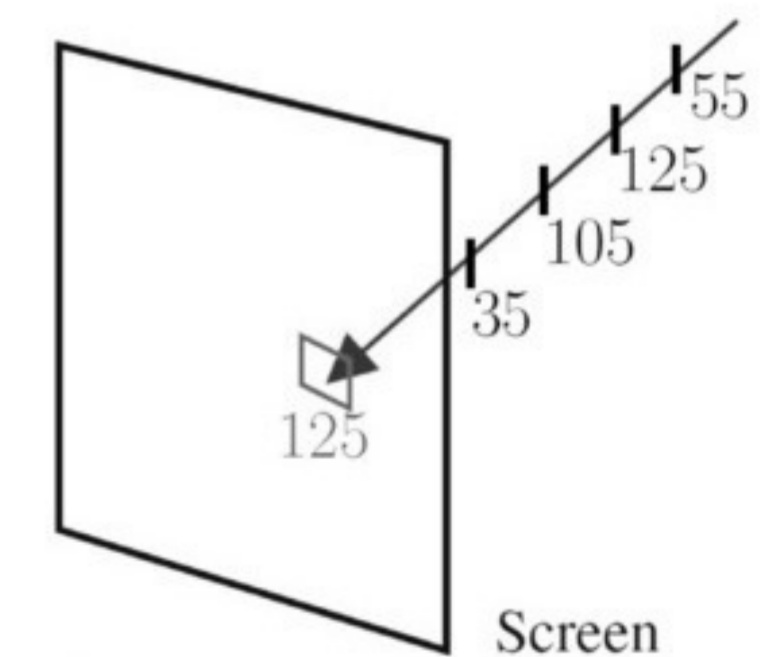
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## MIP

MIP = Maximum Intensity Projection  $c = \max_k(I_k)$

- + Fast, simple
- + Standard in medical domain

- No information about depth  
 (without motion)



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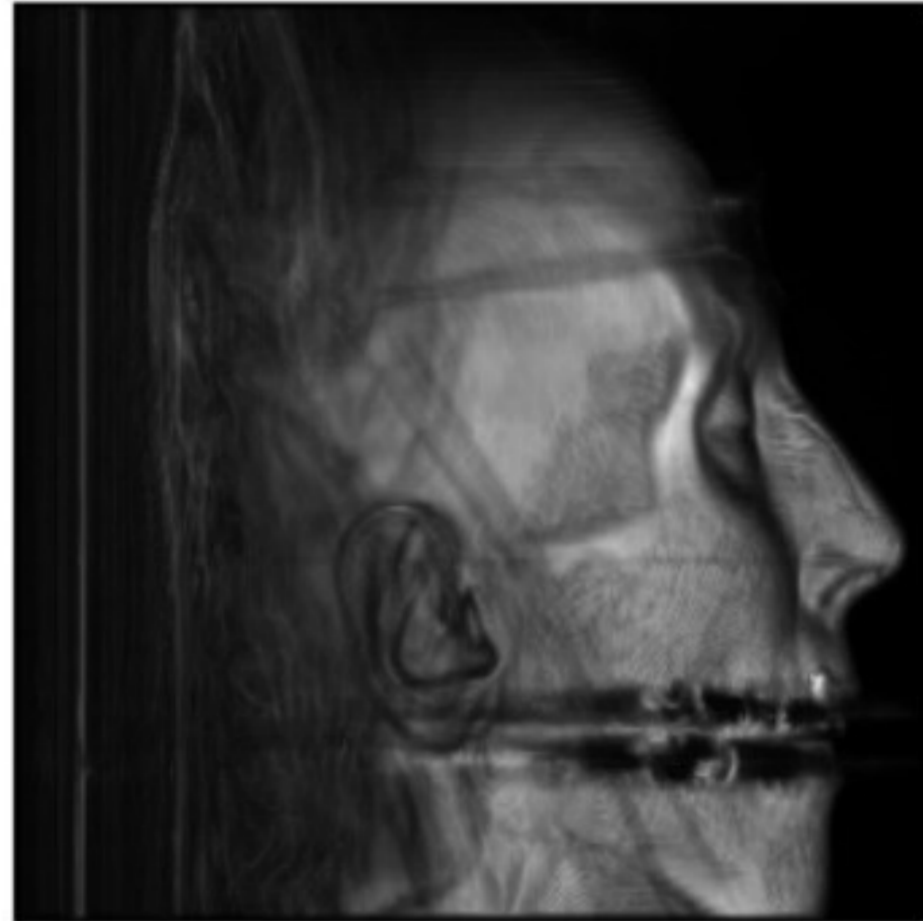
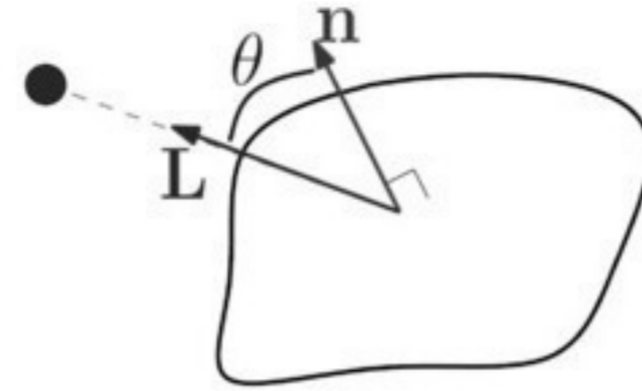


## Shading

Diffuse shading  $\cos(\theta) = \langle \mathbf{L}, \mathbf{n} \rangle$

In a given voxel, approximates the surface normal

$$\mathbf{n} = \frac{\nabla I}{\|\nabla I\|}$$

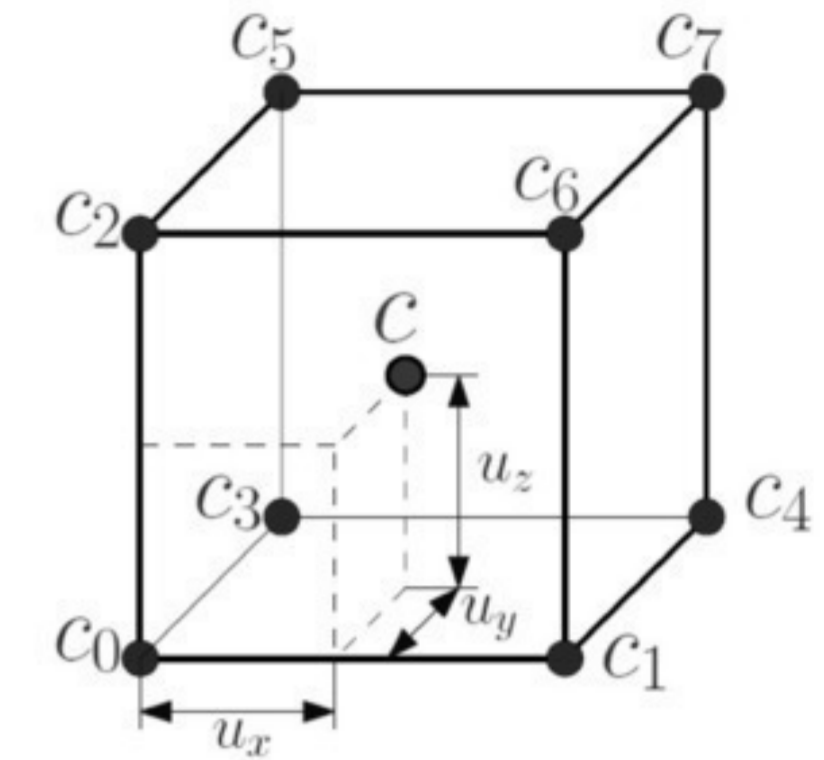


$$\nabla I = \begin{pmatrix} I(k_x + 1, k_y, k_z) - I(k_x - 1, k_y, k_z) \\ I(k_x, k_y + 1, k_z) - I(k_x, k_y - 1, k_z) \\ I(k_x, k_y, k_z + 1) - I(k_x, k_y, k_z - 1) \end{pmatrix}$$

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## Trilinear interpolation

$$c = \begin{pmatrix} (1 - u_x)(1 - u_y)(1 - u_z) & c0+ \\ u_x(1 - u_y)(1 - u_z) & c1+ \\ (1 - u_x)(1 - u_y)u_z & c2+ \\ (1 - u_x)u_y(1 - u_z) & c3+ \\ u_x u_y(1 - u_z) & c4+ \\ (1 - u_x)u_y u_z & c5+ \\ u_x(1 - u_y)u_z & c6+ \\ u_x u_y u_z & c7 \end{pmatrix}$$



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## Libraries

VTK: The Visualization ToolKit

Heavy and complete set of tools.

<http://www.vtk.org>

Volume rendering library (Stanford).

Standard, old.

<http://www-graphics.stanford.edu/software/volpack/>

ImageVis3D (Utah).

<http://www.sci.utah.edu/cibc/software/41-imagevis3d.html>

V3.

Fast on the GPU

<http://www.stereofx.org/volume.html>

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