



# **CS 247 – Scientific Visualization**

## **Lecture 5: Data Representation, Pt. 2**

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# Reading Assignment #3 (until Feb 16)

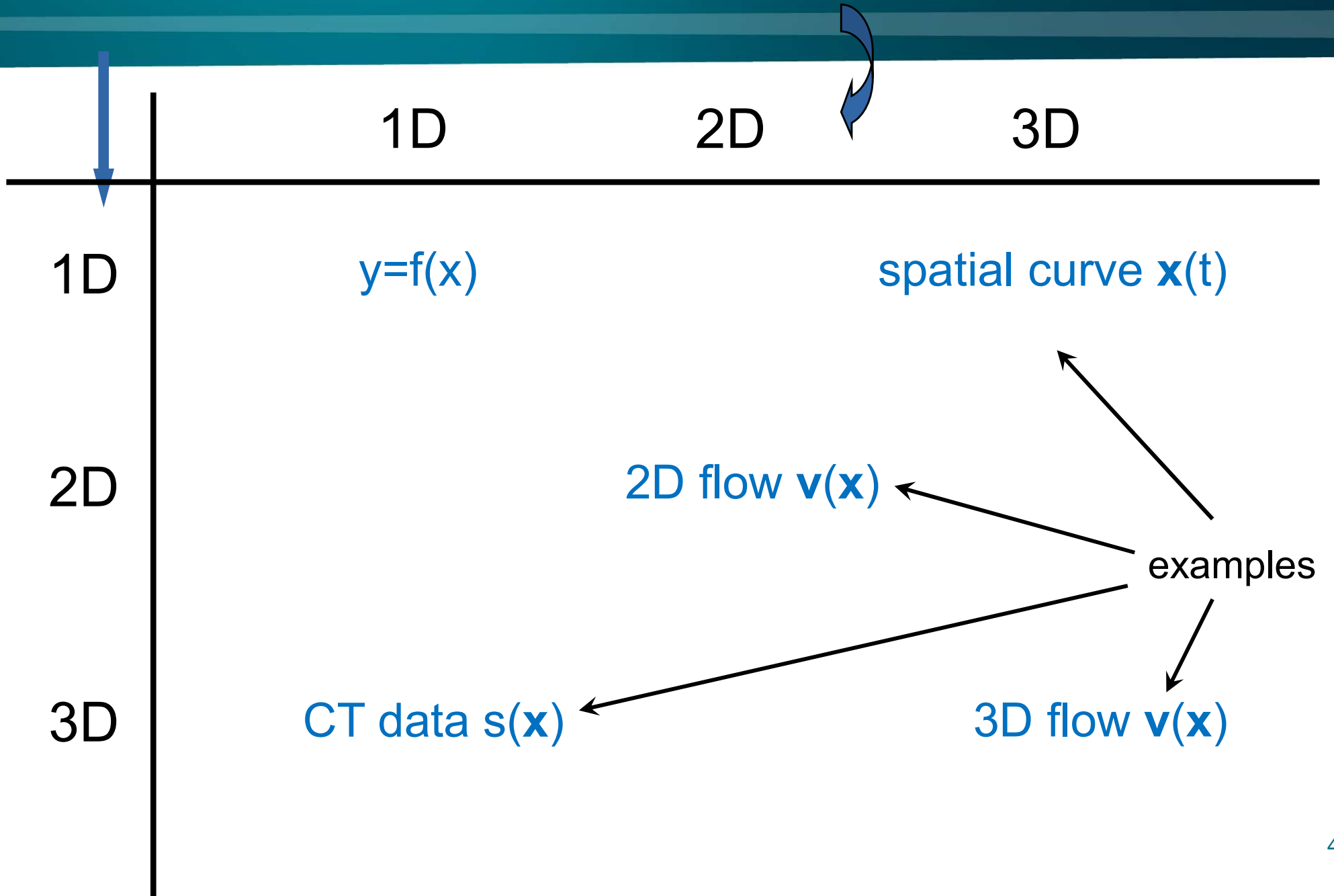


## Read (required):

- Data Visualization book, finish Chapter 3 (read starting with 3.6)
- Data Visualization book, Chapter 5 until 5.3 (inclusive)

# Data Representation

# Data Space (Domain) vs. Data Type (Codomain)



**Data == Functions**

# Mathematical Functions

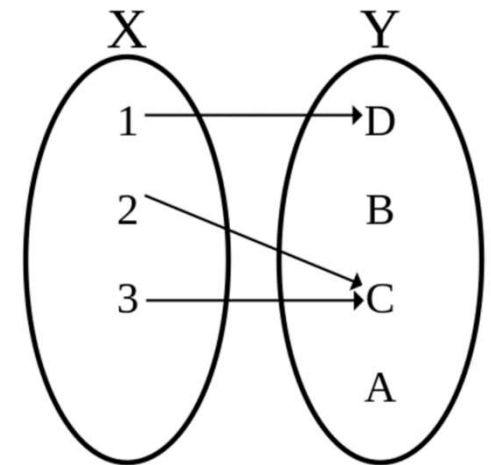


Associates every element of a set (e.g.,  $X$ ) with *exactly one* element of another set (e.g.,  $Y$ )

Maps from *domain* ( $X$ ) to *codomain* ( $Y$ )

$$f: X \rightarrow Y$$

$$x \mapsto f(x)$$



Also important: *range/image*; *preimage*;  
continuity, differentiability, dimensionality, ...

Graph of a function (mathematical definition):

$$G(f) := \{(x, f(x)) \mid x \in X\} \subset X \times Y$$

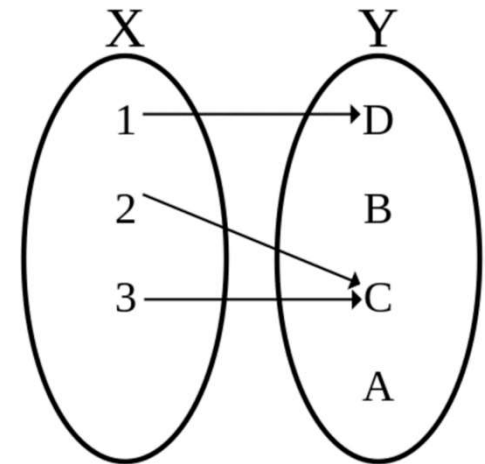
# Mathematical Functions



Associates every element of a set (e.g.,  $X$ ) with *exactly one* element of another set (e.g.,  $Y$ )

Maps from *domain* ( $X$ ) to *codomain* ( $Y$ )

$$f: \mathbb{R}^n \rightarrow \mathbb{R}^m$$
$$x \mapsto f(x)$$

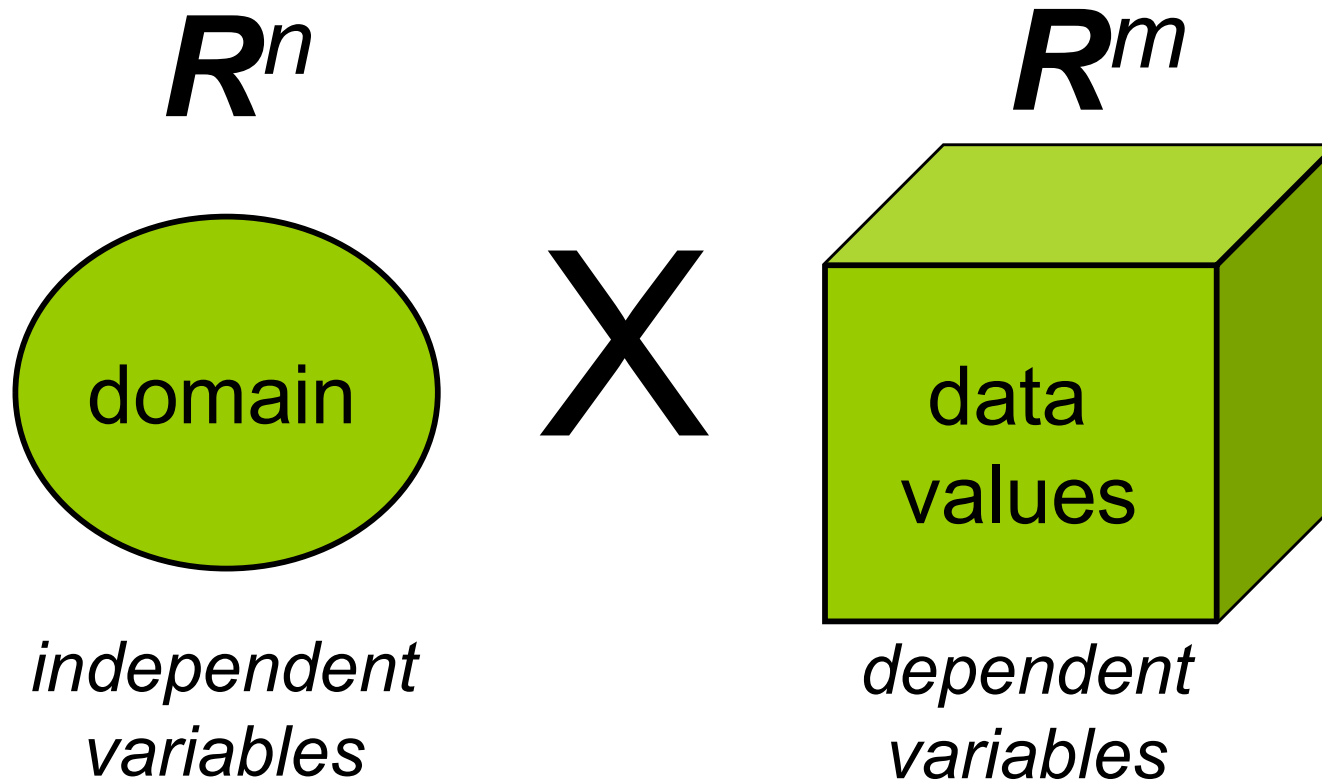


Also important: *range/image*; *preimage*;  
continuity, differentiability, dimensionality, ...

Graph of a function (mathematical definition):

$$G(f) := \{(x, f(x)) \mid x \in \mathbb{R}^n\} \subset \mathbb{R}^n \times \mathbb{R}^m \simeq \mathbb{R}^{n+m}$$

# Data Representation



scientific data  $\subseteq R^{n+m}$



# Example: Scalar Fields



2D scalar field

$$f: \mathbb{R}^2 \rightarrow \mathbb{R}$$
$$x \mapsto f(x)$$

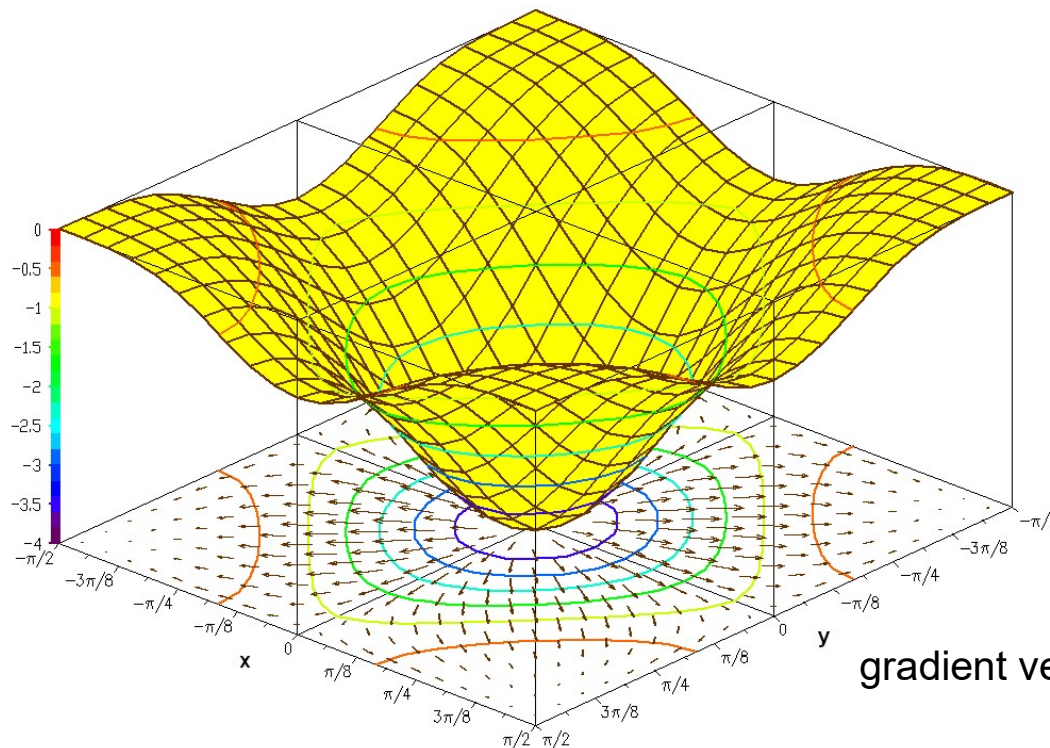
Graph:  $G(f) := \{(x, f(x)) \mid x \in \mathbb{R}^2\} \subset \mathbb{R}^2 \times \mathbb{R} \simeq \mathbb{R}^3$

pre-image

$$S(c) := f^{-1}(c)$$

iso-contour

$$(\nabla f \neq 0)$$



gradient vector field  $\nabla f$

# Visualization Examples



data

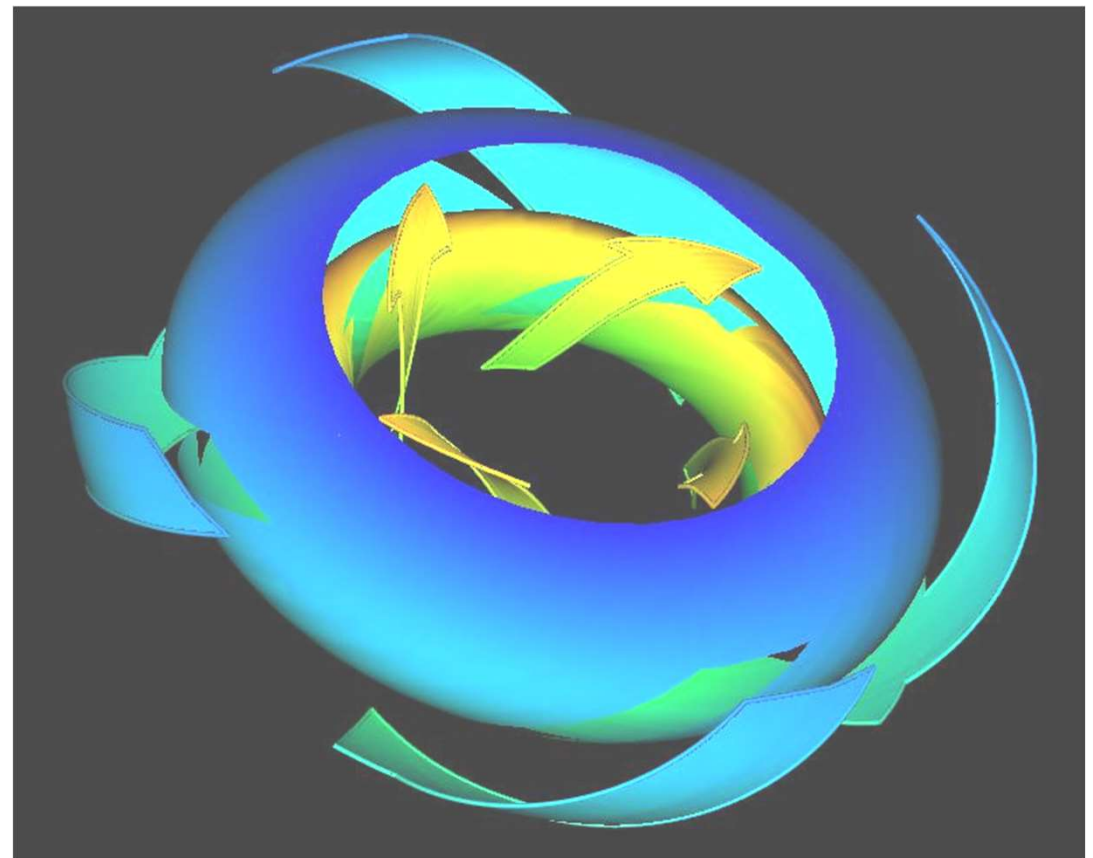
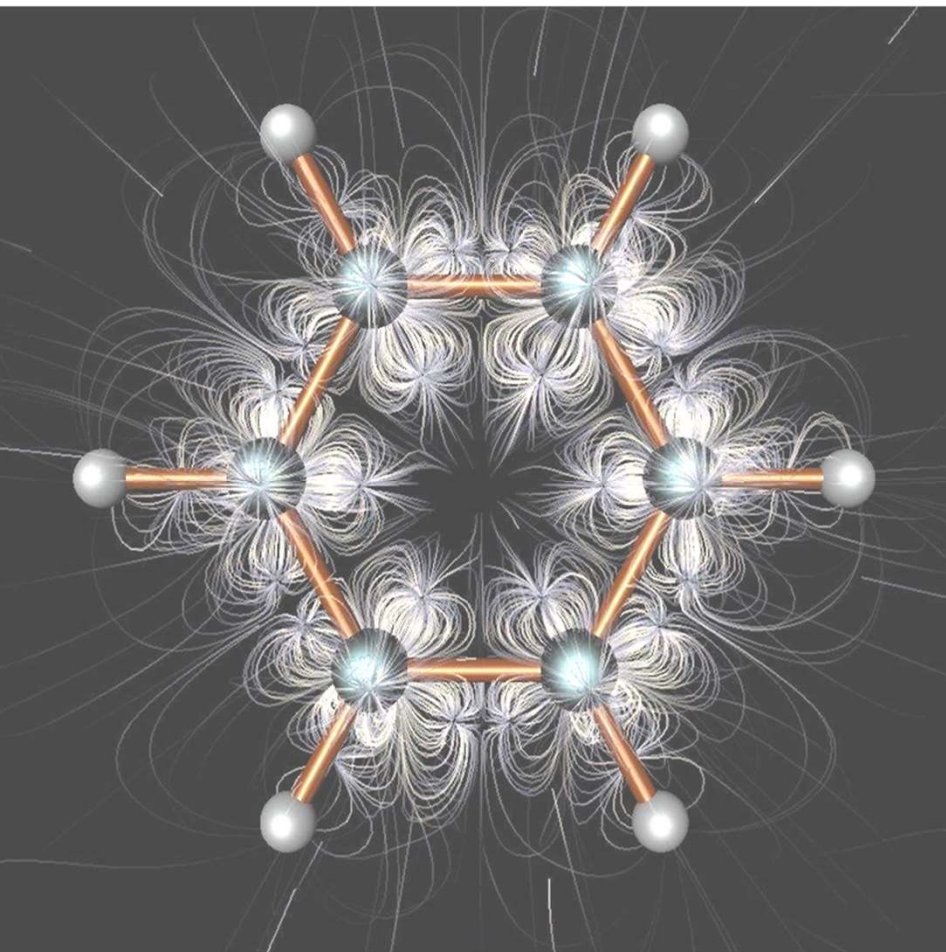
description

visualization example

$\mathbb{R}^3 \rightarrow \mathbb{R}^3$

3D-flow

streamlines,  
streamsurfaces



# Visualization Examples



data

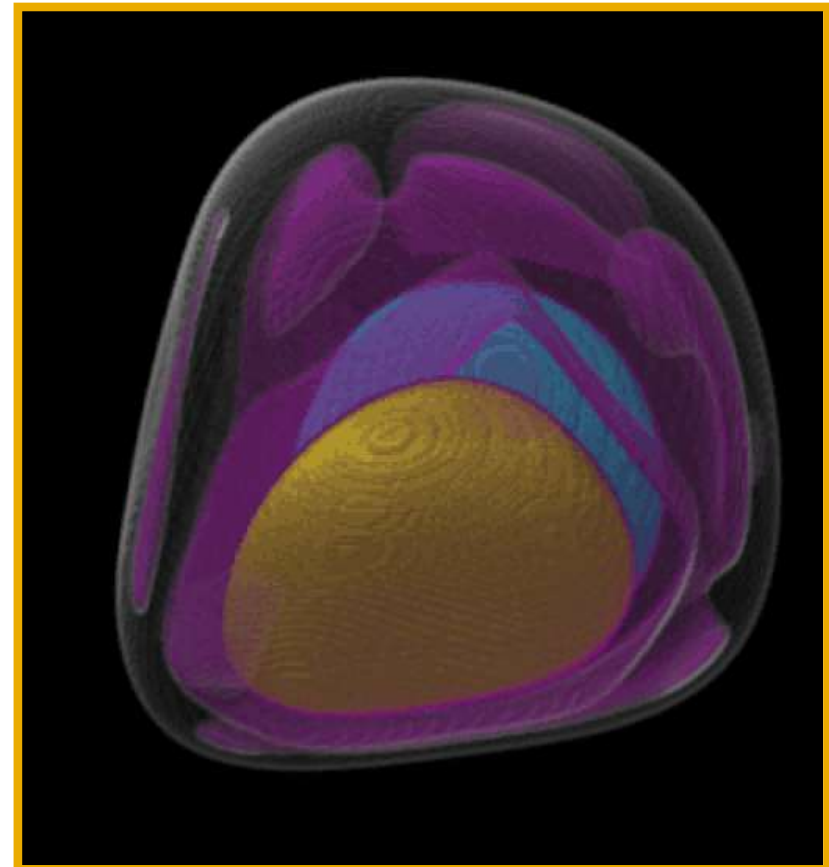
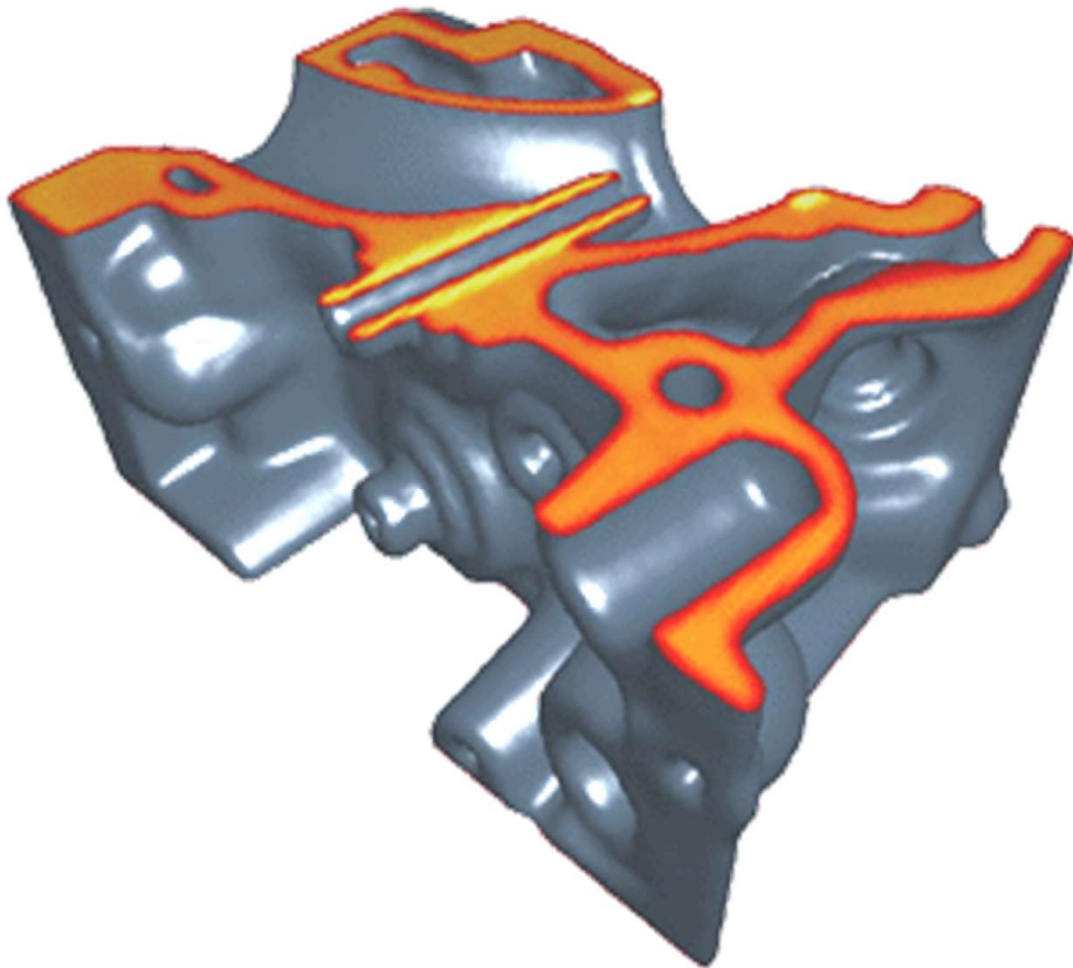
description

visualization example

$\mathbb{R}^3 \rightarrow \mathbb{R}^1$

3D-densities

iso-surfaces in 3D,  
volume rendering



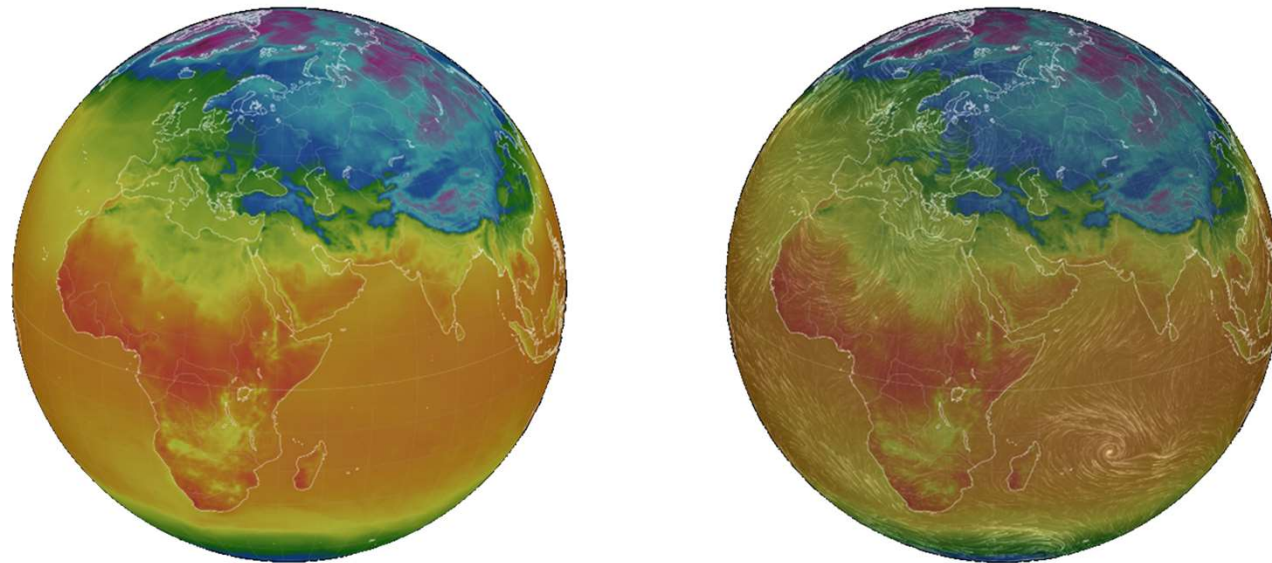
# Domain is Not Always Euclidean



## Manifolds



- Scalar, vector, tensor fields on manifolds

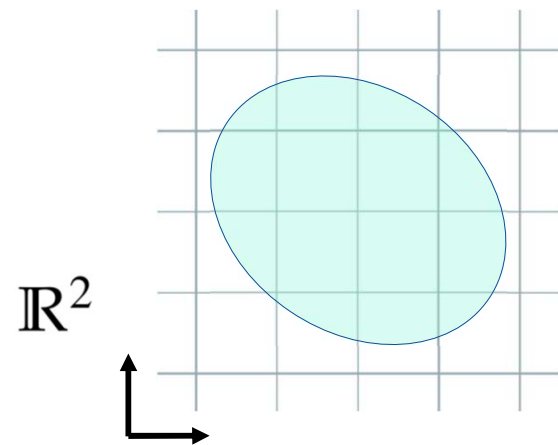
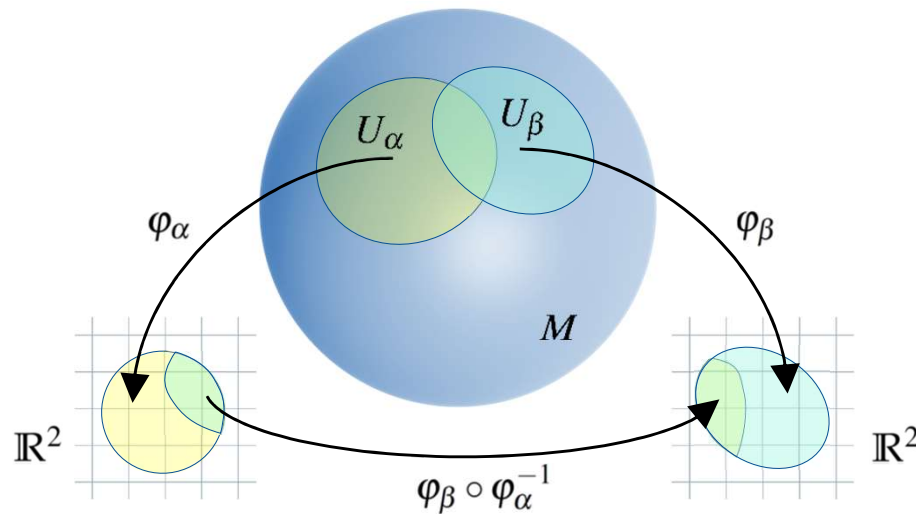


# Topological Manifolds



Every point of an  $n$ -manifold is homeomorphic  
(topologically equivalent) to a region of  $\mathbb{R}^n$

Think about being able to assign coordinates to a region:  
coordinate chart; (collection of charts: atlas)



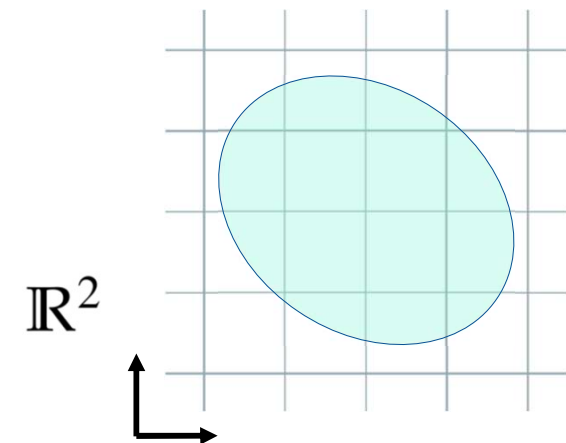
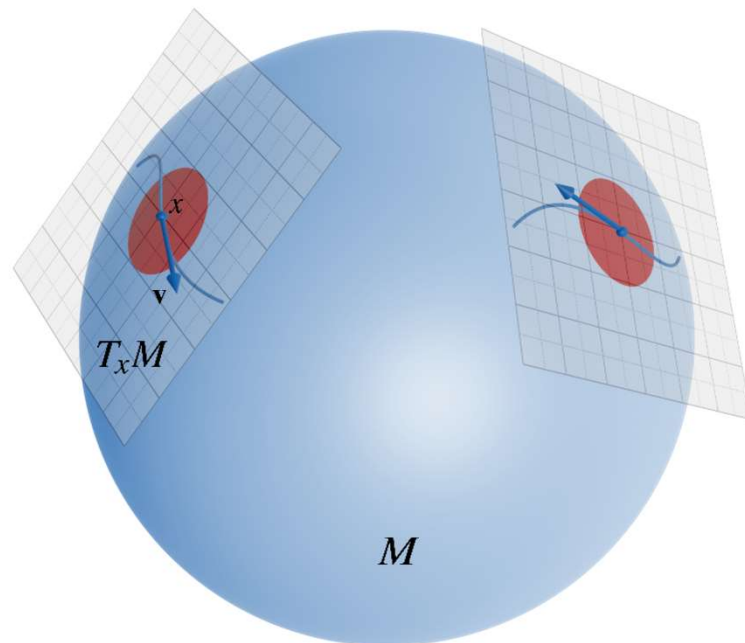
# Smooth Manifolds



Well-defined tangent space at every point

- Dimensionality of each tangent space is the same as that of manifold

Enables calculus on manifolds (and vector fields, tensor fields, ...)



# Sampled Functions and Data Structures

# Data Representation

- Discrete (sampled) representations
  - The objects we want to visualize are often ‘continuous’
  - But in most cases, the visualization data is given only at discrete locations in space and/or time
  - Discrete structures consist of samples, from which grids/meshes consisting of cells are generated
- Primitives in different dimensions

dimension	cell	mesh
0D	points	
1D	lines (edges)	polyline(–gon)
2D	triangles, quadrilaterals (rectangles)	2D mesh
3D	tetrahedra, prisms, hexahedra	3D mesh



# Domain

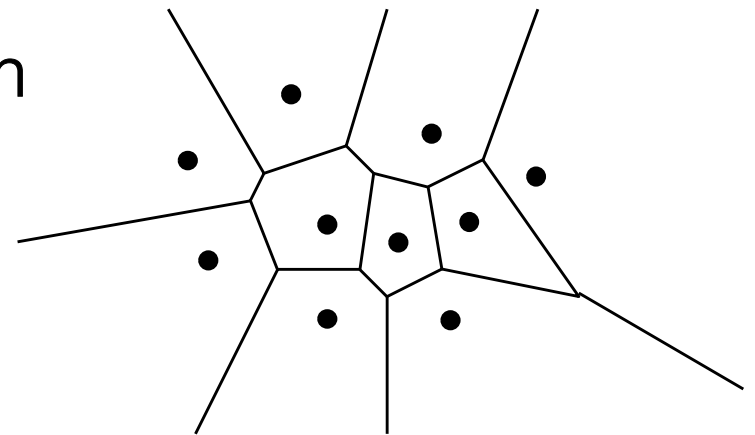
- The (geometric) shape of the domain is determined by the positions of sample points
- Domain is characterized by
  - Dimensionality: 0D, 1D, 2D, 3D, 4D, ...
  - Influence: How does a data point influence its neighborhood?
  - Structure: Are data points connected? How? (Topology)

# Domain

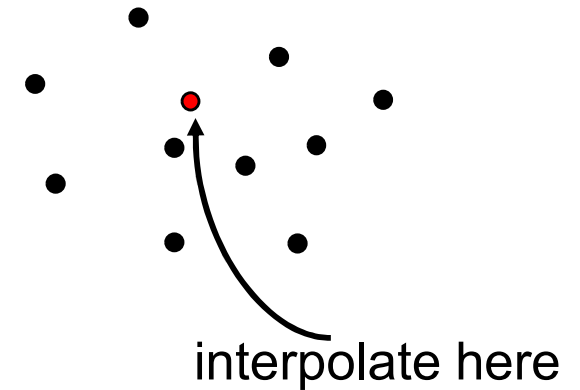
- Influence of data points
  - Values at sample points influence the data distribution in a certain region around these samples
  - To reconstruct the data at arbitrary points within the domain, the distribution of all samples has to be calculated
- Point influence
  - Only influence on point itself
- Local influence
  - Only within a certain region
    - Voronoi diagram
    - Cell-wise interpolation (see later in course)
- Global influence
  - Each sample might influence any other point within the domain
    - Material properties for whole object
    - Scattered data interpolation

# Domain

- Voronoi diagram
  - Construct a region around each sample point that covers all points that are closer to that sample than to every other sample
  - Each point within a certain region gets assigned the value of the sample point
  - Nearest-neighbor interpolation



# Domain



- Scattered data interpolation
  - At each point the weighted average of all sample points in the domain is computed
  - Weighting functions determine the support of each sample point
    - Radial basis functions simulate decreasing influence with increasing distance from samples
  - Schemes might be non-interpolating and expensive in terms of numerical operations

# Data Structures

- Requirements:
  - Efficiency of accessing data
  - Space efficiency
  - Lossless vs. lossy
  - Portability
    - Binary – less portable, more space/time efficient
    - Text – human readable, portable, less space/time efficient
- Definition
  - If points are arbitrarily distributed and no connectivity exists between them, the data is called scattered
  - Otherwise, the data is composed of cells bounded by grid lines
  - Topology specifies the structure (connectivity) of the data
  - Geometry specifies the position of the data

# Data Structures

- Some definitions concerning topology and geometry
  - In topology, qualitative questions about geometrical structures are the main concern
    - Does it have any holes in it?
    - Is it all connected together?
    - Can it be separated into parts?
- Underground map does not tell you how far one station is from the other, but rather how the lines are connected (topological map)



# Grids – General Questions

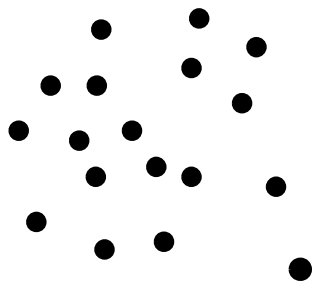


## Important questions:

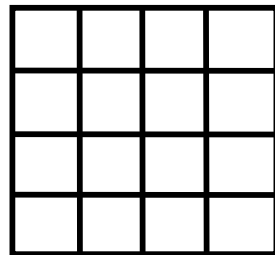
- Which data organization is optimal?
- Where do the data come from?
- Is there a neighborhood relationship?
- How is the neighborhood info stored?
- How is navigation within the data possible?
- What calculations with the data are possible ?
- Are the data structured (regular/irregular topology)?

# Data Structures

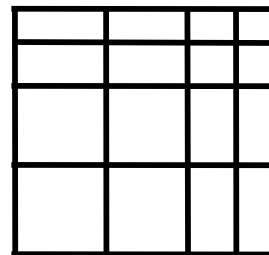
- Grid types
  - Grids differ substantially in the cells (basic building blocks) they are constructed from and in the way the topological information is given



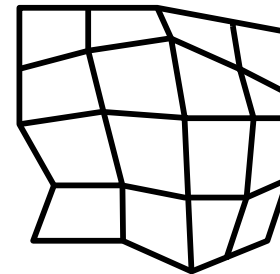
scattered



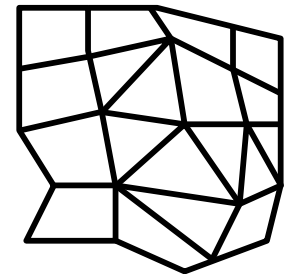
uniform



rectilinear



structured



unstructured



# Thank you.

## Thanks for material

- Helwig Hauser
- Eduard Gröller
- Daniel Weiskopf
- Torsten Möller
- Ronny Peikert
- Philipp Muigg
- Christof Rezk-Salama