



# CSE3020 - Data Visualization

## Module 2 :Visualization Techniques

Dr. K.P. Vijayakumar, VIT Chennai

# Topics to be covered

2

- Scalar Visualization techniques
  - Color Mapping
  - Designing Effective Colormaps
  - Contouring
  - Height Plots
- Vector visualization techniques
  - Introduction
  - Vector Glyphs
  - Vector Color Coding
  - Stream Objects

# Scalar Visualization techniques

3

## ■ Introduction

- Visualizing scalar data is frequently encountered in science, engineering, and medicine, but also in daily life.
- Scalar datasets, or scalar fields, represent functions  $f:D \rightarrow R$ , where  $D$  is usually a subset of  $R^2$  or  $R^3$ .
- There exist many scalar visualization techniques, both for 2D and 3D dataset

# Scalar Visualization techniques

4

## ■ Introduction

### ■ Scalar attribute

- Scalar attributes are  $c = 1$  dimensional
- Scalar has a Magnitude
- Plain Real Numbers
- Example : Temperature, Pressure, concentration, geometrical measures (length or height)

### ■ Scalar functions

$f: \mathbb{R} \rightarrow \mathbb{R}$

1-D, histogram

$f: \mathbb{R}^2 \rightarrow \mathbb{R}$

2-D, color mapping, contouring, height plot

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

3-D, isosurface, slicing, volume visualization



# Scalar Visualization techniques

5

## ■ Introduction

- Vector attribute
  - Vector attributes are  $c = 2$  or  $3$  dimensional
  - Vector has a Magnitude and Direction or Orientation
  - It can encode position, direction, force or gradients of scalar functions.

# Scalar Visualization techniques

6

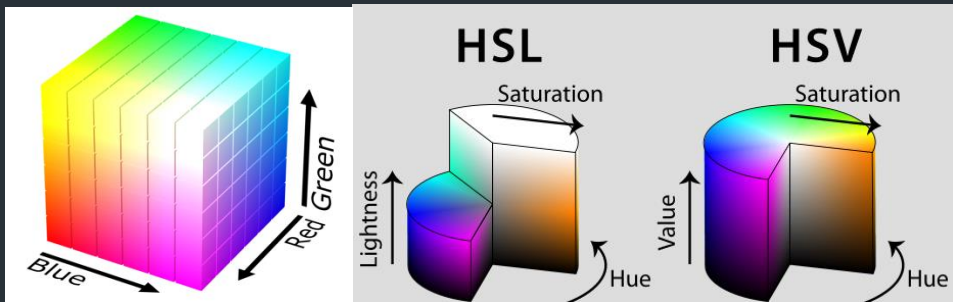
## ■ Introduction

### ■ Color attribute

- Color attributes are  $c = 3$  dimensional and represents the displayable colors
- three components of a color attribute can have different meanings, depending on the color system in use

### ■ Color Representation System

- RGB (Red, Green, Blue)
- HSV (Hue, Saturation, Value)
- HSL (Hue, Saturation, Lightness)

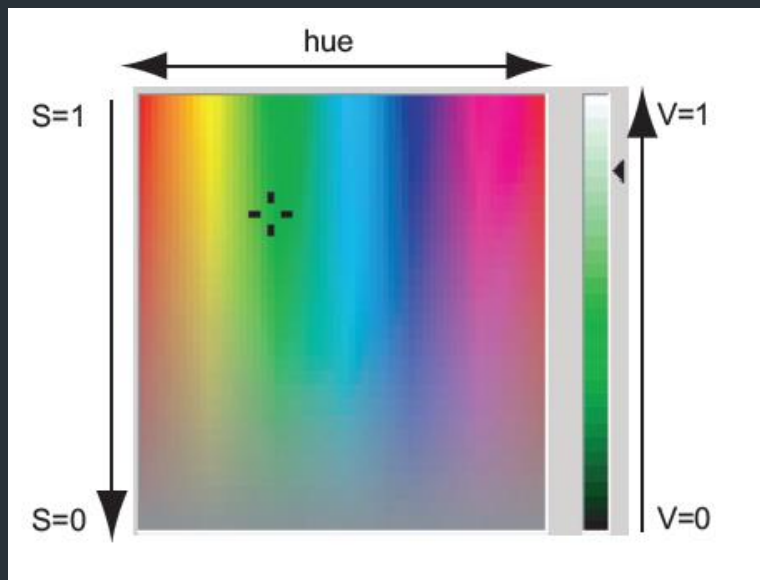


# Scalar Visualization techniques

7

## ■ Introduction

- RGB (Red, Green, Blue)
  - Additive system, i.e., every color is represented as a mix of “pure” red, green, and blue colors in different amounts
  - Equal values - gray shades
- HSV (Hue, Saturation, Value)
  - it is more intuitive for the human user
  - Hue distinguishes between different colors of different wavelengths, such as red, yellow, and blue
  - Saturation represents the color “purity
  - *Value* represents the brightness or luminance



# Scalar Visualization techniques

8

- **Scalar Visualization Techniques**
  - Color mapping
  - Contouring
  - Height Plots



# Scalar Visualization techniques

9

## ■ Color Mapping

- Color mapping is probably the most widespread visualization method for scalar data.
- Color mapping associates a color with every scalar value.
- Mapping function
$$m : D \rightarrow D_v$$
- There are several ways to define such a scalar-to-color function.
  - Color look-up tables
  - Color transfer functions

# Scalar Visualization techniques

10

## ■ Color Look up Tables

- Color look-up tables are the simplest way to implement color mapping.
- Color mapping function  $c$ :

$$C = \{c_i\}_{i=1..N}, \quad \text{where } c_i = c\left(\frac{(N-i)f_{\min} + if_{\max}}{N}\right).$$

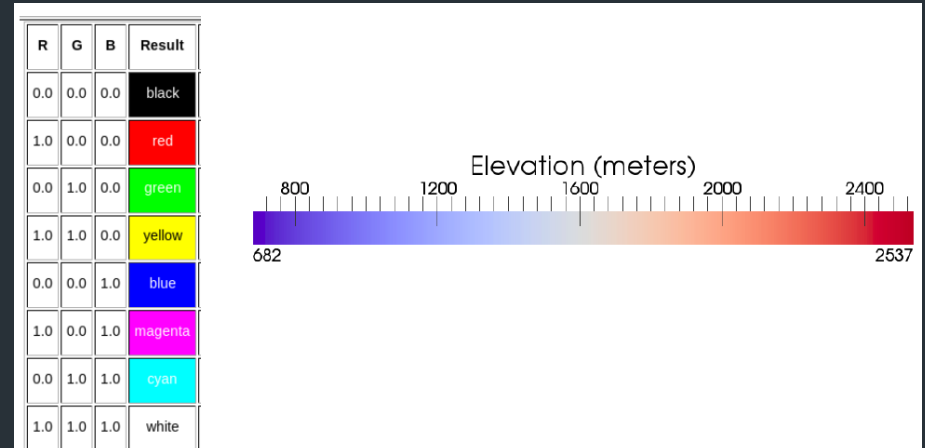
- Simply put, a color look-up table  $C$ , also called a colormap, is a uniform sampling of the color-mapping function  $c$ :

# Scalar Visualization techniques

11

## ■ Color Look up Tables

- Scalar values greater than the maximum are clamped to the maximum color, scalar values less than the minimum are clamped to the minimum value

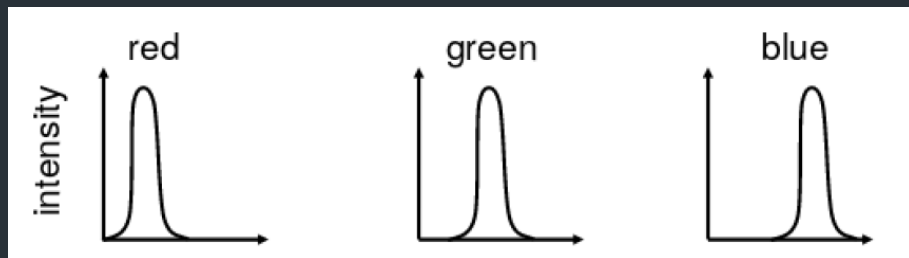


# Scalar Visualization techniques

12

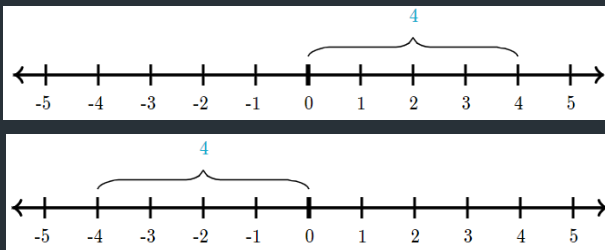
## ■ Color Transfer Function

- A transfer function is any expression that maps scalar values into a color specification.
- Ex: a function can be used to map scalar values into separate intensity values for the red, green, and blue components



# Scalar Visualization techniques

13



- **Designing Effective Color Maps**
- Different types of analysis goals require different types of colormaps.
  - **Absolute values**: Tell the absolute data values at all points in the displayed dataset.
  - **Value ordering**: Given two points in the displayed dataset, tell which of the corresponding two data values is greater.
  - **Value difference**: Given two points in the displayed dataset, tell what is the difference of data values at these points.

# Scalar Visualization techniques

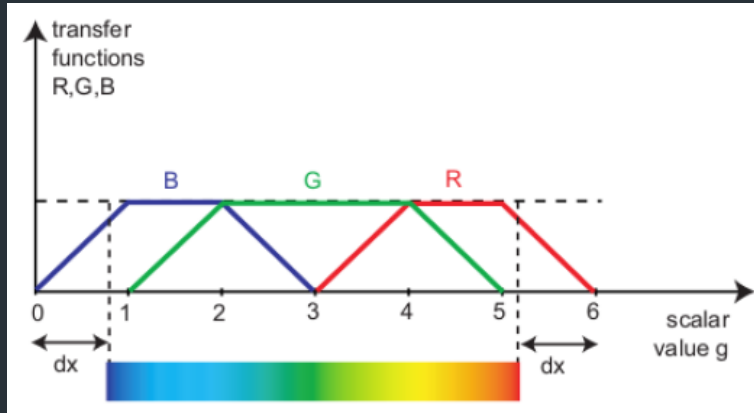
14

- **Designing Effective Color Maps**
  - *Selected values*: Given a particular data value  $f$  interest, tell which points in the displayed data take the respective value  $f$  interest. A variation of this goal replaces  $f$  interest by a compact interval of data values.
  - *Value change*: Tell the speed of change, or first derivative, of the data values at given points in the displayed dataset

# Scalar Visualization techniques

15

- **Designing Effective Color Maps**
- **Rainbow colormap**



- Many engineering and weather forecast applications use a blue-to-red colormap, often called the rainbow colormap.
- This colormap is based on the intuition that blue, a “cold” color, suggests low values, whereas red, a “hot” color, suggests high values

# Scalar Visualization techniques

16

- **Designing Effective Color Maps**
- **Rainbow colormap**

```
void c( float f , float& R, float& G, float& B)
{
    const float dx = 0.8 ;
    f = ( f < 0 ) ? 0 : ( f > 1 ) ? 1 : f ; //clamp f in [0, 1]
    g = ( 6 - 2 * dx ) * f + dx ; // scale f to [dx, 6 - dx]
    R = max( 0 , ( 3 - f * abs ( g - 4 ) - f * abs ( g - 5 ) ) / 2 ) ;
    G = max( 0 , ( 4 - f * abs ( g - 2 ) - f * abs ( g - 4 ) ) / 2 ) ;
    B = max( 0 , ( 3 - f * abs ( g - 1 ) - f * abs ( g - 2 ) ) / 2 ) ;
}
```



# Scalar Visualization techniques

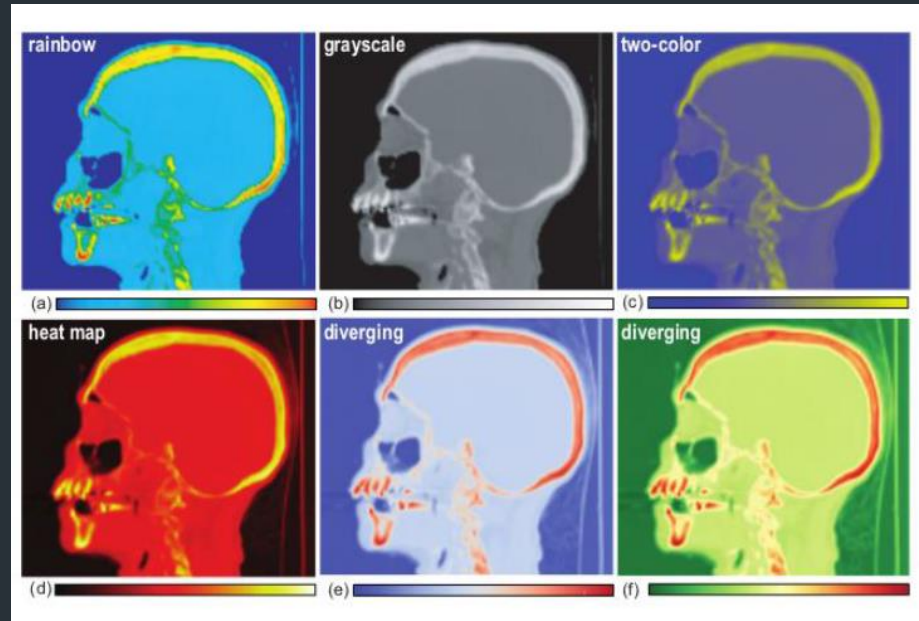
17

- **Designing Effective Color Maps**
- **Rainbow colormap has limitations**
  - **Focus:** Perceptually, **warm colors** arguably attract attention more than cold colors.
  - **Luminances:** of the rainbow colormap entries vary non-monotonically. This leads to users being **potentially attracted more to certain colors** than to others.
  - **Context:** Hues can have **application-dependent semantics**.
  - **Ordering:** we cannot assume that any user will order hues in this particular manner

# Scalar Visualization techniques

18

## ■ Other Colormap designs



# Scalar Visualization techniques

19

- Other colormap designs
- Grayscale:
  - it maps data values  $f$  linearly to luminance, or gray value, with  $f$  min corresponding to black and  $f$  max corresponding to white.
  - Most medical specialists, would agree that the grayscale produces a much easier-to-follow, less-confusing visualization on which details are easier to spot

# Scalar Visualization techniques

20

- **Other colormap designs**
- **Two-hue:**
  - The two-hue colormap can be seen as a generalization of the grayscale colormap, where we interpolate between two colors, rather than between black and white.
- **Heat Map:**
  - It represents the color of an object heated at increasing temperature values.
    - Black corresponding to low data values
    - Red-orange hues for intermediate data ranges
    - Yellow-white hues for the high data values

# Scalar Visualization techniques

21



- Other colormap designs

- Diverging:

- These are constructed starting from two typically isoluminant hues, just as the isoluminant two-hue colormaps.
- However, rather than interpolating between the end colors ***cmin*** and ***cmax***, we now add a third color ***cmid***

- ***cmin*** = blue, ***cmax*** = red, and ***cmid*** = white

- ***cmin*** = green, ***cmax*** = red, and ***cmid*** = bright yellow

# Scalar Visualization techniques

22

## ■ Contouring

### Contouring

A contour line  $C$  is defined as all points  $p$  in a dataset  $D$  that have the same scalar value, or isovalue.

For 2D dataset, a contour line is called an isoline.

For 3-D dataset, a contour is a 2-D surface, called isosurface.



The Landscape



A Relief Model

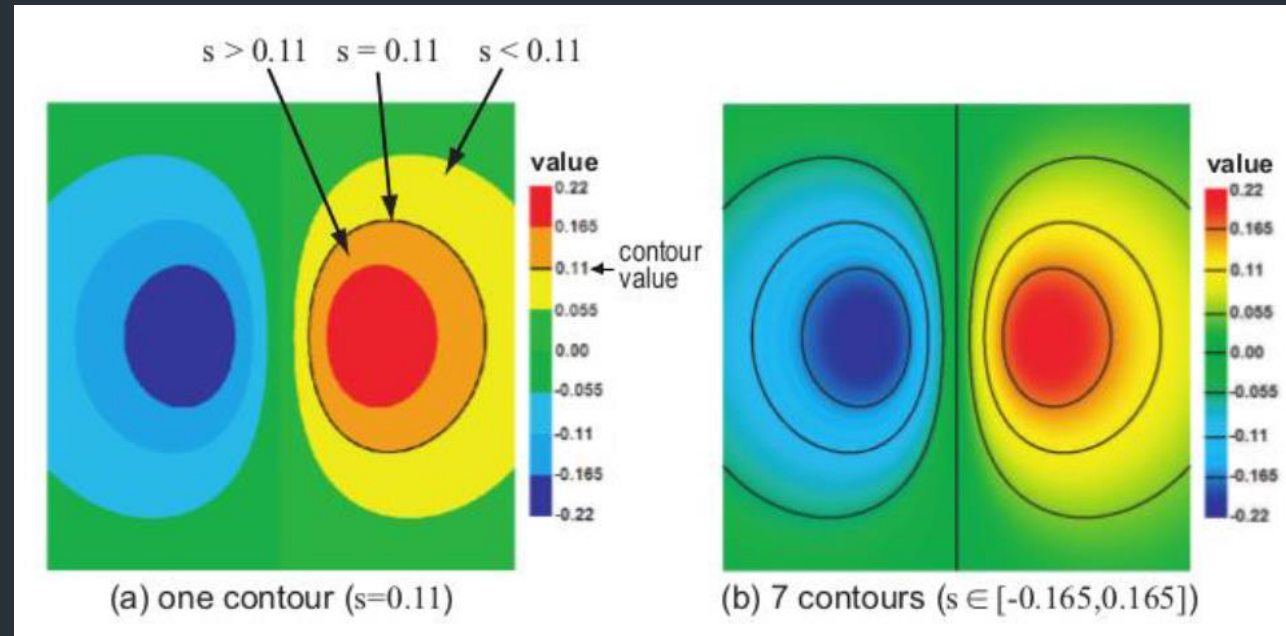


Contour Lines

# Scalar Visualization techniques

23

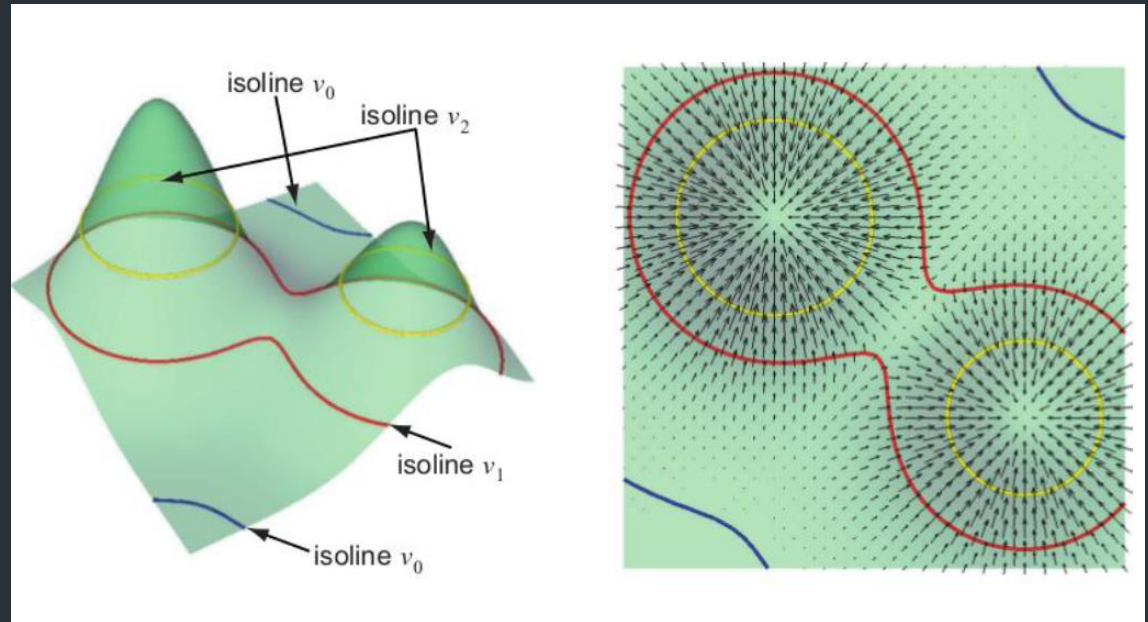
## ■ Contouring



# Scalar Visualization techniques

24

## ■ Properties of Contouring



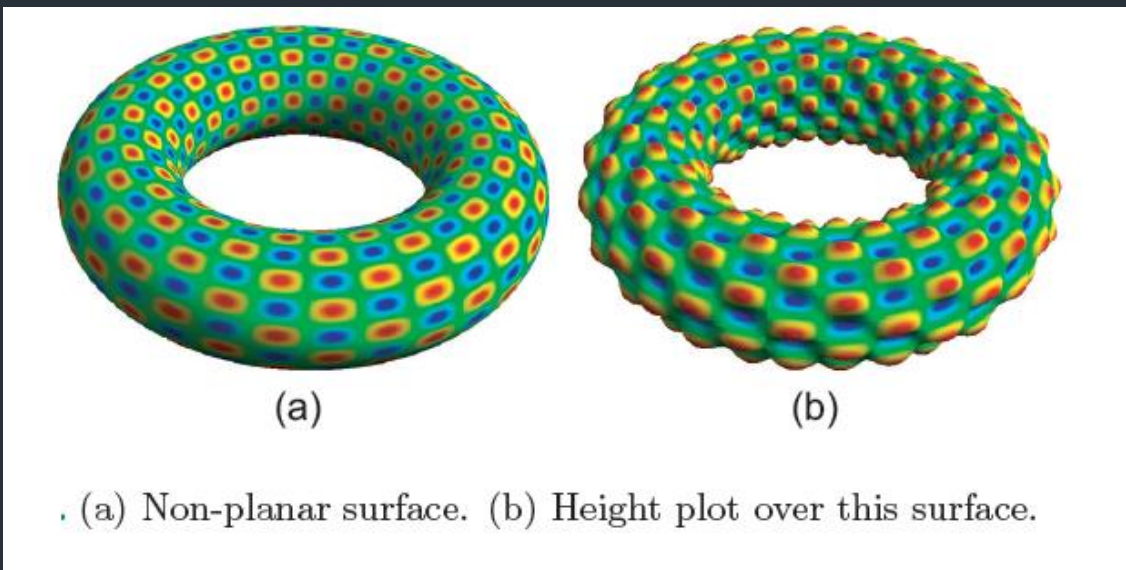


# Scalar Visualization techniques

25

- **Height Plots**

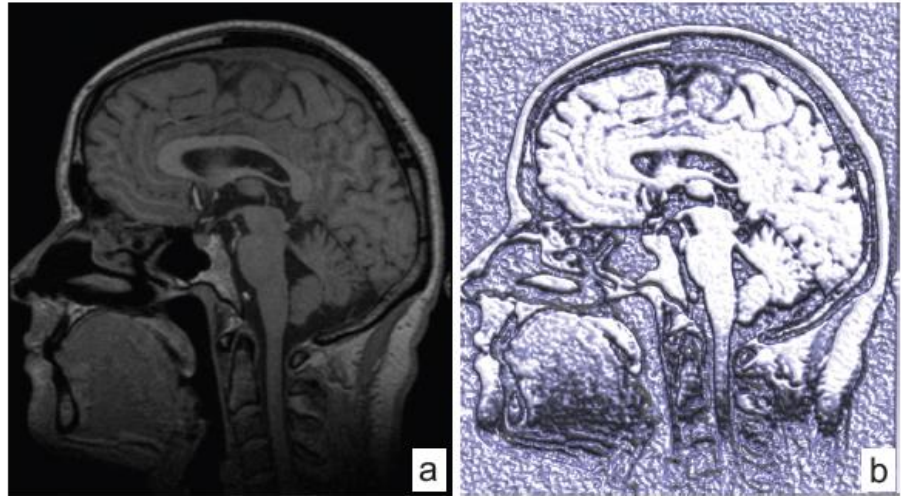
- Also called *elevation* or *carpet plots*



# Scalar Visualization techniques

26

- **Height Plots**
  - Brain CT slice

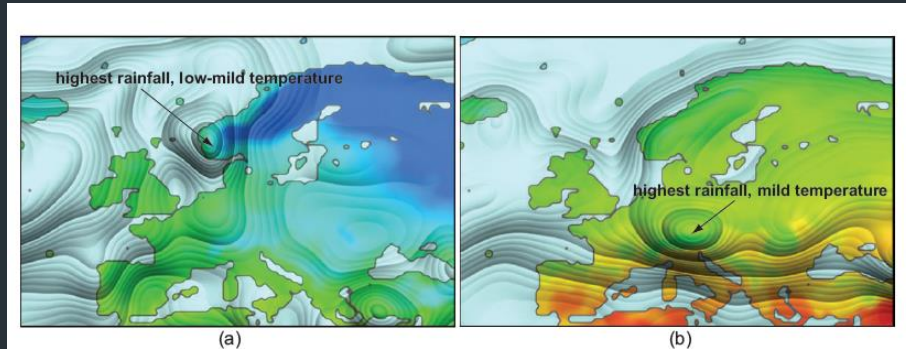


# Scalar Visualization techniques

27

## ■ Enridged Plots

- It combine the appearance of contour plots and height plots
- the nested cushion-like shapes that emerge in this type of plot convey a sensation of height which is much stronger than in classical height plots
- Average rainfall and temperature over Europe for January and July



# Scalar Visualization techniques

28

## ■ Color Mapping

### ■ Pros

- share the advantages of height plots and do not suffer from 3D occlusion problems

### ■ Cons

- making quantitative judgments based on color data can be hard
- requires carefully designed colormaps, which may be application or even dataset dependent

# Scalar Visualization techniques

29

## ■ Contour Plots

### ■ Pros

- effective in communicating precise quantitative values

### ■ Cons

- plots are less intuitive to use
- they do not create a dense, continuous, image—information is not shown at all points of the input dataset

# Scalar Visualization techniques

30

## ■ Height Plots

### ■ Pros

- easy to learn, intuitive to understand, generate continuous images, and show the local gradient of the data in terms of actual slope or shading of the plot

### ■ Cons

- they do not create a dense, continuous, image—information is not shown at all points of the input dataset

# Vector Visualization techniques

31

- Introduction
- Fundamental Mathematical Operators
  - Divergence and Vorticity
  - Vector Glyphs
- Vector Color Coding
- Color coding on 2D surfaces

# Vector Visualization techniques <sup>32</sup>

## ■ Introduction

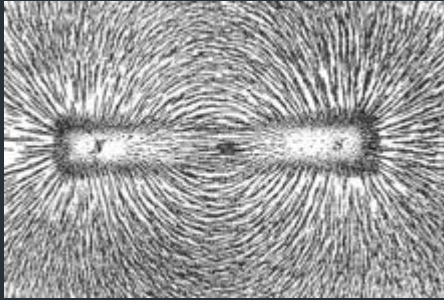
- A vector is a tuple of  $n$  scalar components
$$\mathbf{v} = (v_1, \dots, v_n), v_i \in \mathbb{R}.$$
- An  $n$ -dimensional vector describes a position, direction, rate of change, or force in  $\mathbb{R}^n$ .
- Majority of visualization applications deal with data that describes physical phenomena in 2D or 3D space.
- As a consequence, most visualization software defines all vectors to have three components.
- 2D vectors are modeled as 3D vectors with the third ( $z$ ) component equal to null.



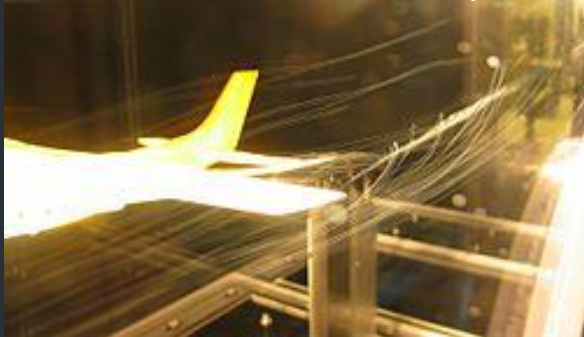
# Vector Visualization techniques

33

Magnetic field lines of an iron bar

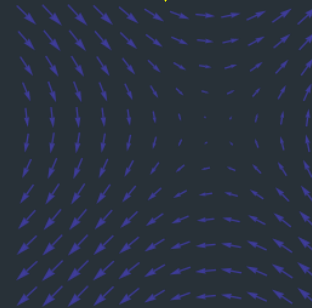


Flow field around an airplane



## ■ Fundamental mathematical operators

- To analyse vector field
  - Vector field
    - fluid flow
    - an assignment of a vector to each point in a subset of space



# Vector Visualization techniques

34

- **Fundamental mathematical operators**

- visualization applications deal with data that describes physical phenomena in 2D or 3D space
- most visualization software defines all vectors to have three components
- Divergence and vorticity are important quantities for vector field visualization
  - other types of datasets such as meshes, images, and scalar and tensor fields.

# Vector Visualization techniques

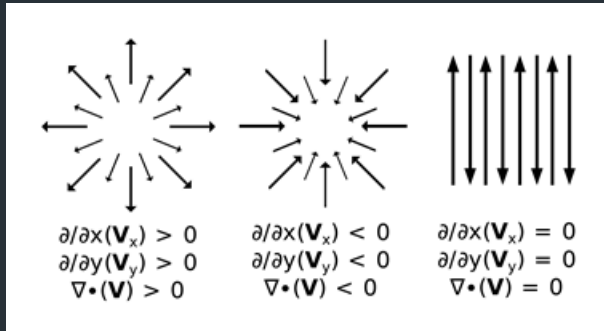
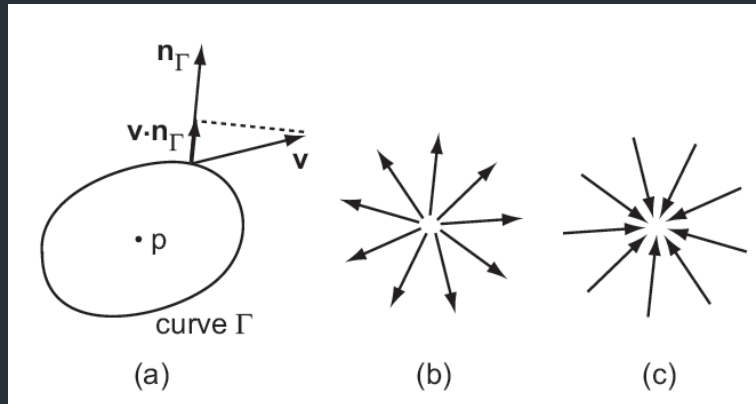
35

- **Divergence**
- Given a vector field  $\mathbf{v} : \mathbb{R}^3 \rightarrow \mathbb{R}^3$ , the divergence of  $\mathbf{v} = (v_x, v_y, v_z)^T$  is the scalar quantity

$$\operatorname{div} \mathbf{v} = \frac{\partial v_x}{\partial x} + \frac{\partial v_y}{\partial y} + \frac{\partial v_z}{\partial z}$$

# Vector Visualization techniques

36

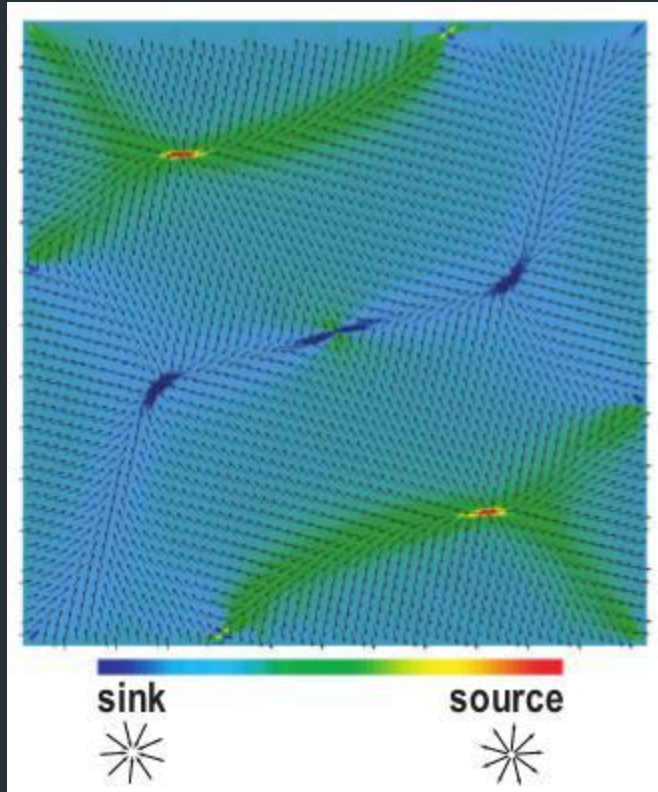


## ■ Divergence

- A **positive divergence** at  $p$  denotes that mass would **spread from  $p$  outward**. Positive divergence points are called *sources*
- A **negative divergence** at  $p$  denotes that **mass gets sucked into  $p$** . Negative divergence points are called *sinks*
- A **zero divergence** at  $p$  denotes that mass is **transported** without getting spread or sucked, i.e., without compression or expansion

# Vector Visualization techniques

37



## ■ Divergence

- The example figure shows the divergence of a 2D flow field using a blue-to-red colormap.
- Red areas indicate high positive divergence(sources).
- Blue areas indicate high negative divergence,(sinks).
- We get the image of a flow field that emerges from the sources and ends up in the sinks

# Vector Visualization techniques <sup>38</sup>

- **Vorticity**
- Given a vector field  $\mathbf{v} : \mathbb{R}^3 \rightarrow \mathbb{R}^3$ , the vorticity of  $\mathbf{v}$ , also called **the curl or rotor** of  $\mathbf{v}$ , is the vector quantity.
- The vorticity ***rot*  $\mathbf{v}$**  of  $\mathbf{v}$  is a vector field that is locally perpendicular to the plane of rotation of  $\mathbf{v}$  and whose magnitude expresses the speed of angular rotation of  $\mathbf{v}$  around ***rot*  $\mathbf{v}$** .
- Hence, the vorticity vector characterizes the **speed** and **direction of rotation** of a given vector field at every point

# Vector Visualization techniques

39

$$\text{rot } \mathbf{v} = \left( \frac{\partial v_z}{\partial y} - \frac{\partial v_y}{\partial z}, \frac{\partial v_x}{\partial z} - \frac{\partial v_z}{\partial x}, \frac{\partial v_y}{\partial x} - \frac{\partial v_x}{\partial y} \right)$$

## ■ Vorticity

- Given a vector field  $\mathbf{v} : \mathbb{R}^3 \rightarrow \mathbb{R}^3$ , the vorticity of  $\mathbf{v}$ , also called **the curl or rotor** of  $\mathbf{v}$ , is the vector quantity.
- The vorticity ***rot*  $\mathbf{v}$**  of  $\mathbf{v}$  is a vector field that is locally perpendicular to the plane of rotation of  $\mathbf{v}$  and whose magnitude expresses the speed of angular rotation of  $\mathbf{v}$  around ***rot*  $\mathbf{v}$** .
- Hence, the vorticity vector characterizes the **speed** and **direction of rotation** of a given vector field at every point



# Vector Visualization techniques

40

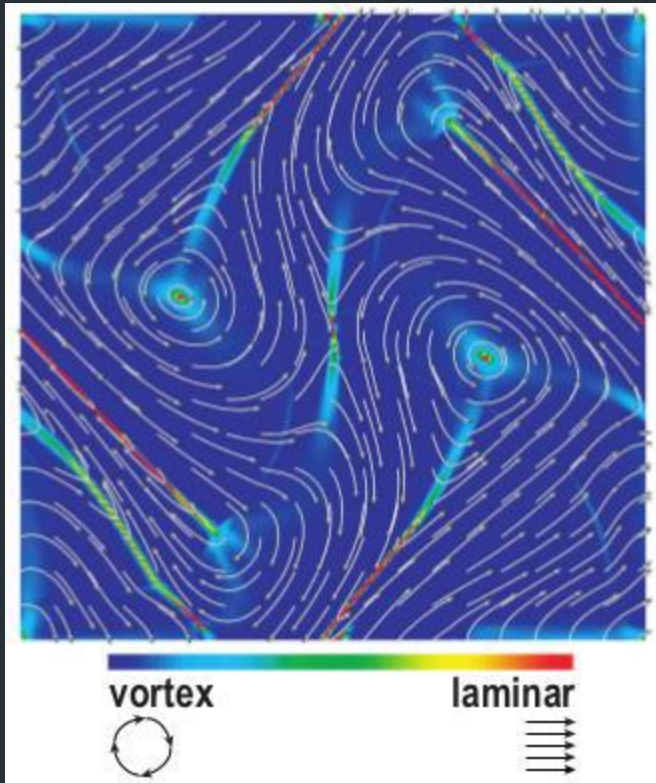
- Positive Earth Vorticity
- Negative Earth Vorticity
- Positive Curvature Vorticity
- Negative Curvature Vorticity
- Positive Shear Vorticity
- Negative Shear Vorticity





# Vector Visualization techniques

41



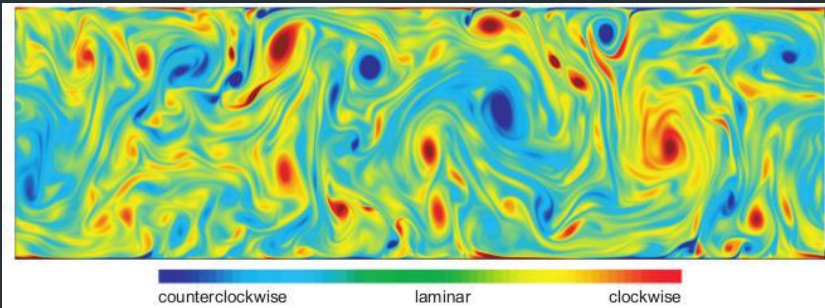
- **Vorticity**
- Blue areas indicate low-vorticity, laminar regions.
- Red areas indicate high-vorticity regions.
- Two small circular red spots indicate localized vortices.
- Several elongated thin red strips indicate areas where the vector field quickly changes direction.

# Vector Visualization techniques

42

## ■ Vorticity

- Visualizes the vorticity of a more complex turbulent 2D flow.
- Blue and red indicate respectively counterclockwise and clockwise spinning vortices.
- Green indicates low-vorticity, laminar regions.
- The image clearly conveys the high complexity of the flow



# Vector Visualization techniques <sup>43</sup>

- **Vector Glyphs**

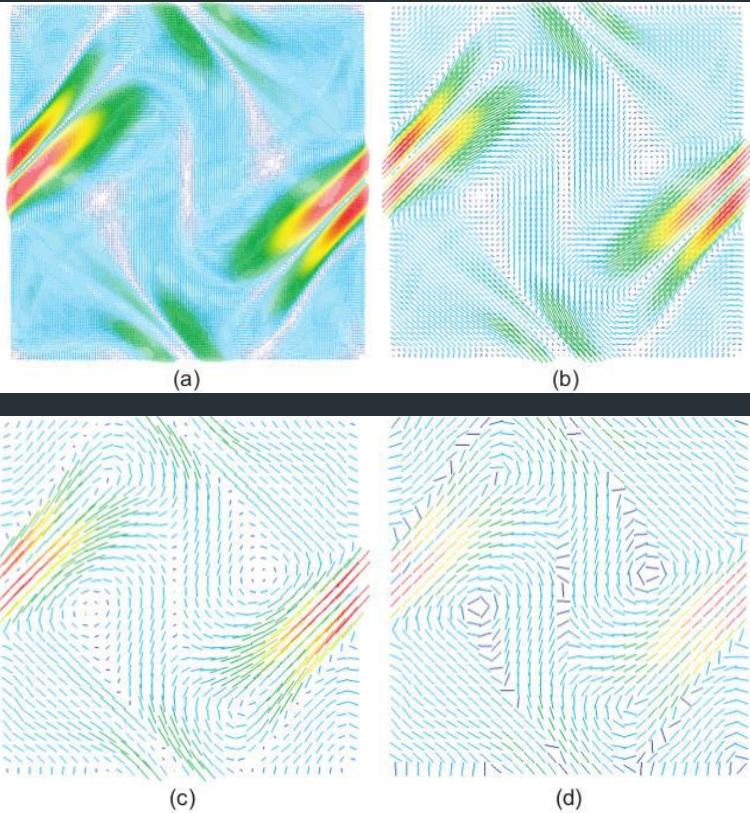
- The name *glyph*, meaning “sign” in Greek
- i.e., associating discrete visual signs with individual vector attributes.
- Sign that conveys, by its appearance, properties of the represented vector
  - direction, orientation, and magnitude
- Type of glyphs
  - Line
  - Cone
  - Arrow

# Vector Visualization techniques <sup>44</sup>

- **Line Glyphs**
- Lines essentially show the position, direction, and magnitude of a set of vectors.
- $I = (x, x + kv(x))$ 
  - every sample point  $x \in D$
  - $k$  - the scaling factor
  - $v(x)$  - vector attribute
- Also called hedgehogs

# Vector Visualization techniques

45



## ■ Line Glyphs

- a line glyph, or hedgehog, visualization of a 2D vector field defined on a square domain
- clarity of hedgehog - depends strongly on the glyph scaling factor
- (a) a rate of 2,
- (b) a rate of 4
- (c) a rate of 8
- (d) the vector field is uniformly subsampled at a rate of 8, but the line glyphs are all scaled to the same length

# Vector Visualization techniques

46

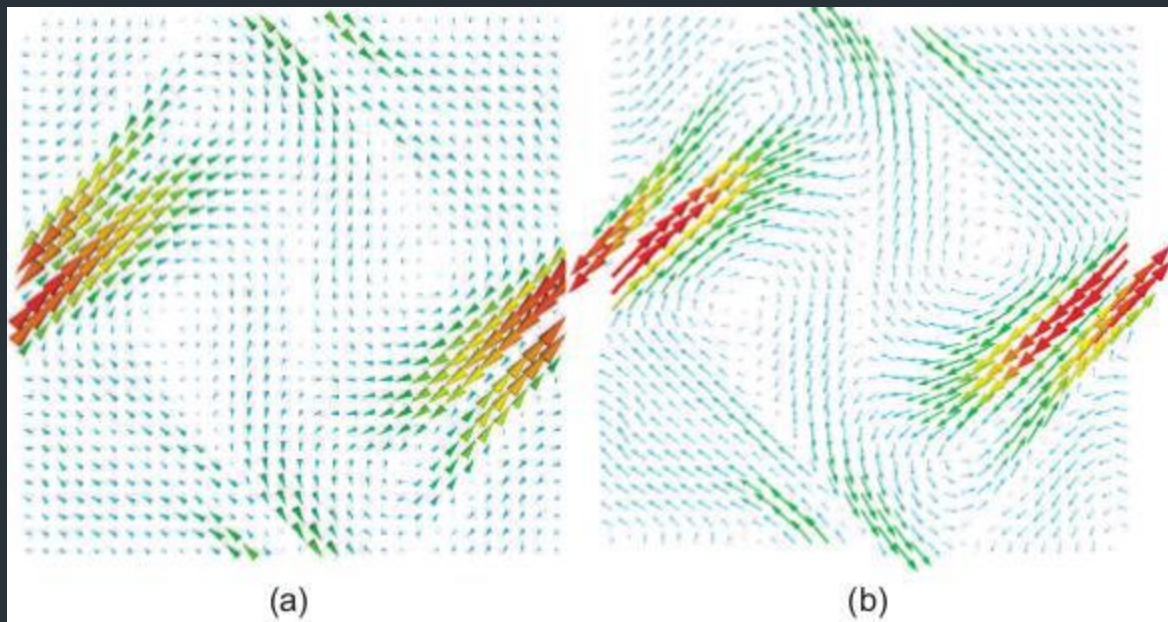
## ■ Cone and Arrows Glyphs

- Cone and arrow glyphs have the advantage of being able to convey a signed direction, whereas lines convey an unsigned direction only
- Glyphs take more space to draw
- Require lower-resolution datasets.



# Vector Visualization techniques <sup>47</sup>

## ■ Cone and Arrow Glyphs

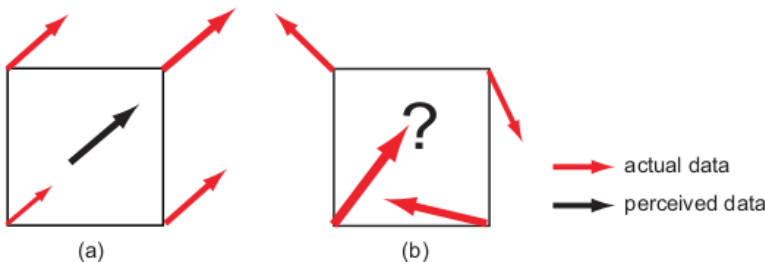


# Vector Visualization techniques

48

## ■ Vector Glyphs in 2D

- Consider a zoomed-in detail showing a hedgehog plot over a single cell of a 2D vector field in the figure below.
- In the first case the vector field variation over the displayed cell is quite small.
- There is an increase in magnitude in upper-right direction and orientation.
- In the second case the situation is more problematic



Visual interpolation of vector glyphs.

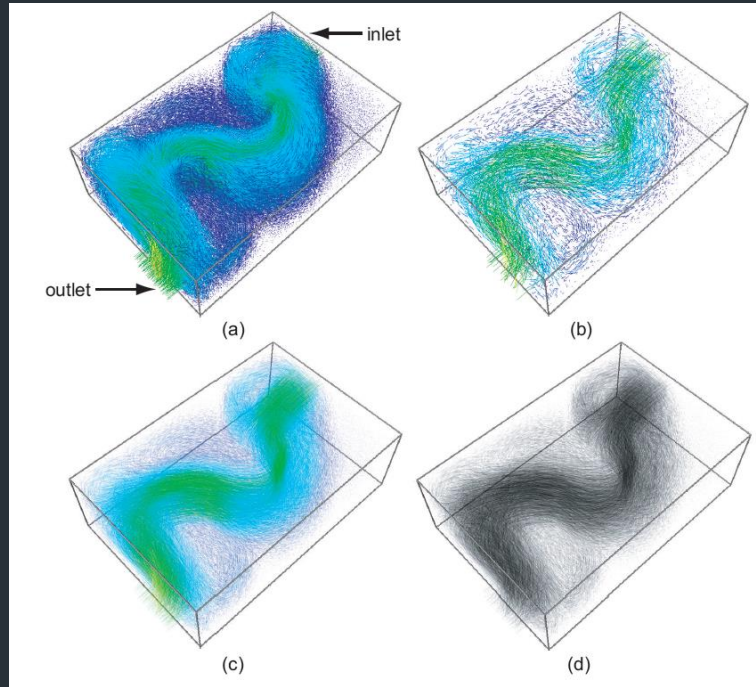
(a) Small data variations are easily interpolated.

(b) Large data variations create more problems.



# Vector Visualization techniques

49



glyphs transparently

Visual effect by using  
monochrome

- **Vector Glyphs in 3D**
- Flow of water in a Box shaped basin
- an arrow glyph visualization of a 3D vector dataset sampled on a uniform grid containing  $128 \times 85 \times 42$  data points that describes the flow of water in a box-shaped basin that has an inlet, located upper-right, and an outlet, located lower-left that cause the sinuous behavior of the flow

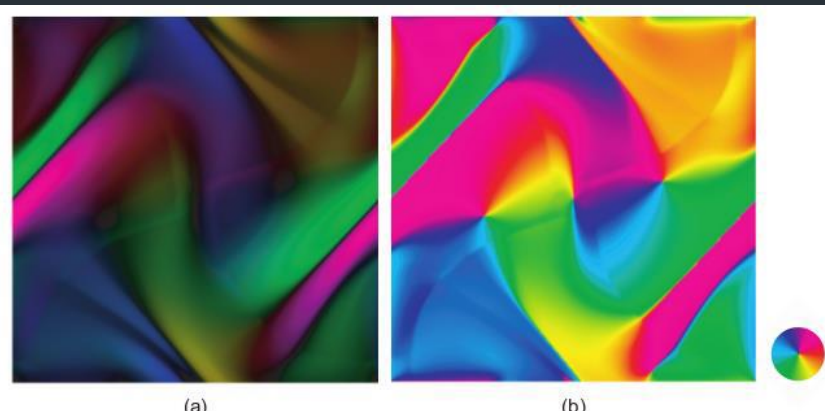
# Vector Visualization techniques

50

- **Vector Color Coding**
- Similar to scalar color mapping, vector color coding associates a color with every point of a given surface on which we have defined a vector dataset

# Vector Visualization techniques

51



(a)

(b)

**a) Orientation and Magnitude**

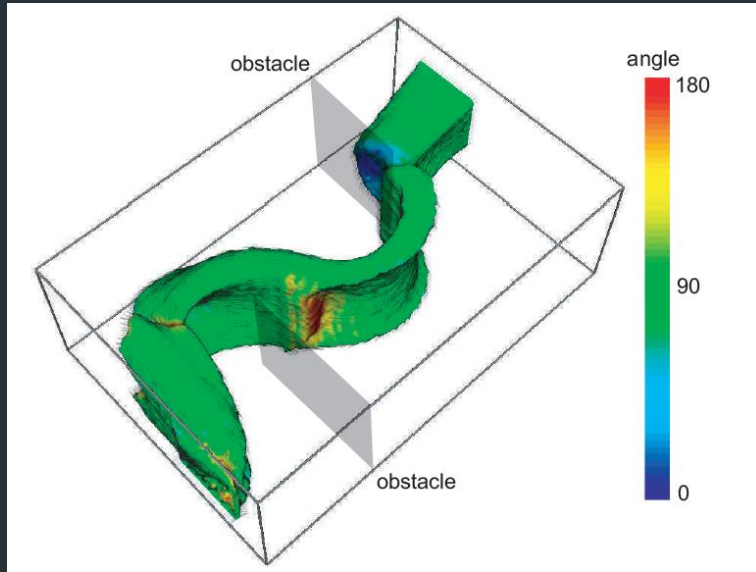
**b) Orientation only**

## ■ Color Coding on 2D Surface

- Every distinct hue corresponds to a different angle of the color wheel.
  - Red is  $0^\circ$
  - Magenta is  $60^\circ$
  - Blue is  $120^\circ$
  - cyan is  $180^\circ$
  - green is  $240^\circ$
  - yellow is  $300^\circ$
- Saturation is represented as the distance from the wheel center to a given color point.
- Value is usually represented as a separate one-dimensional “luminance” parameter

# Vector Visualization techniques

52



## ■ Color Coding on 3D Surface

- the mapping of a 3D orientation to hues on the color wheel is not as simple as in the 2D case

The angle between the vector and surface normal is encoded via a rainbow colormap