



University of British Columbia  
CPSC 314 Computer Graphics  
May-June 2005

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**Scientific Visualization,  
Information Visualization I/II**

**Week 5, Thu Jun 9**

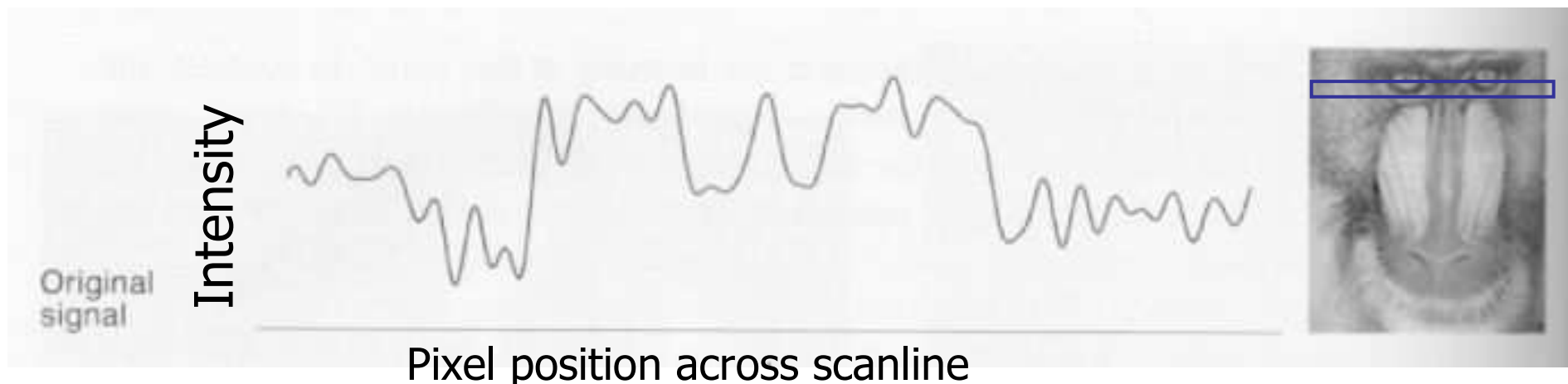
<http://www.ugrad.cs.ubc.ca/~cs314/V/may2005>

# News

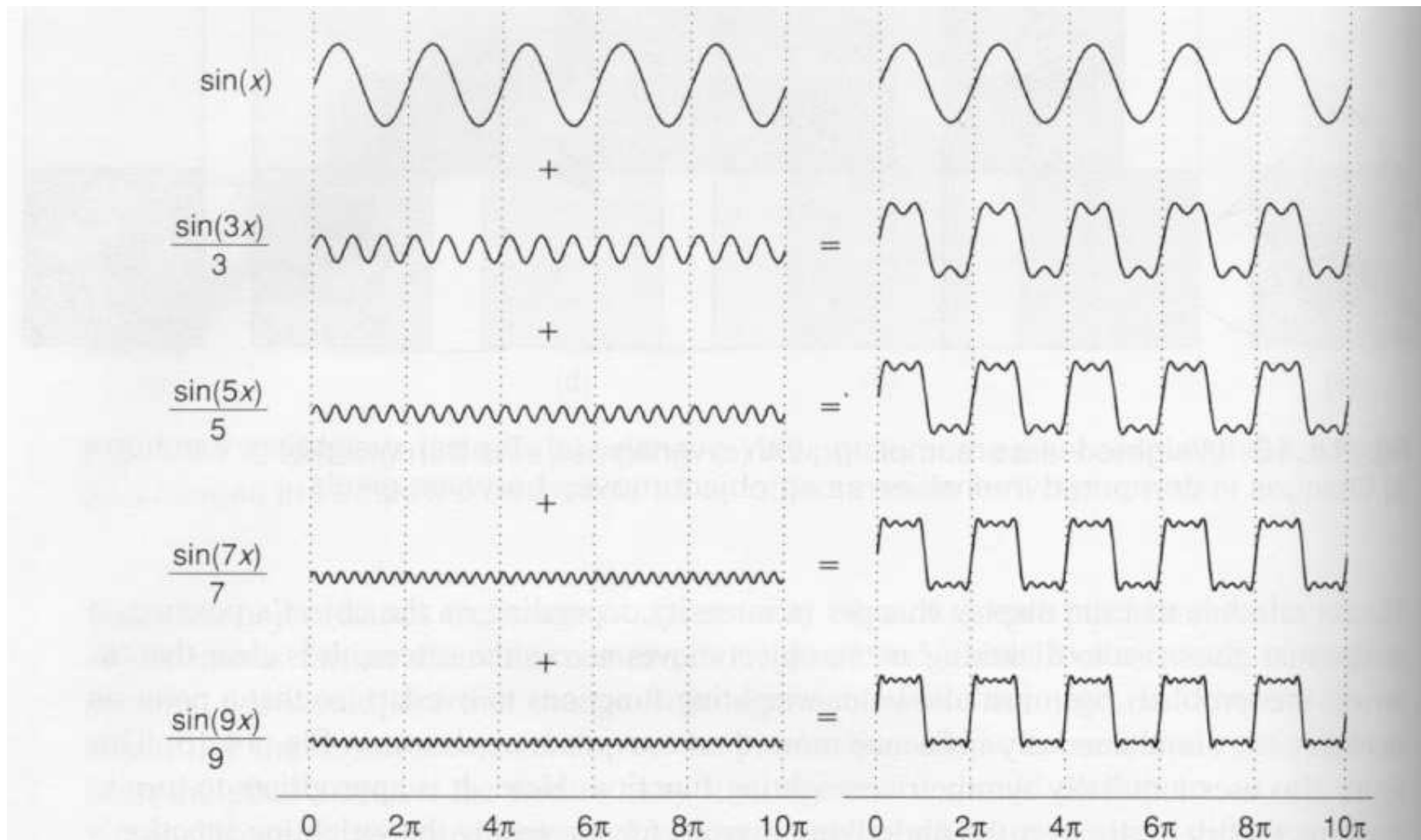
- P1 Hall of Fame take 2
- P4 grading signup
  - 12-4 Mon Jun 20

# Review: Image As Signal

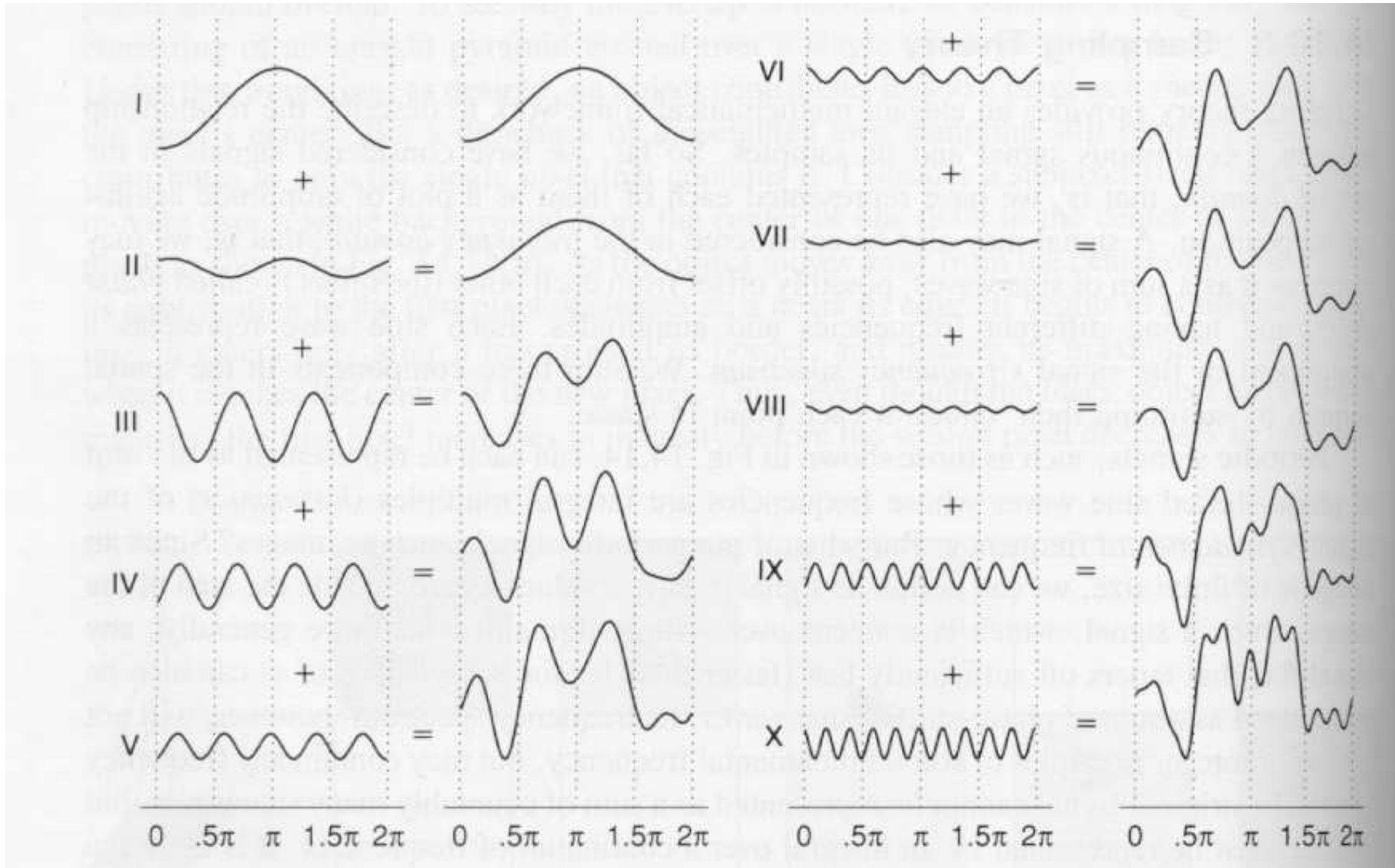
- 1D slice of raster image
  - discrete sampling of 1D spatial signal
- theorem
  - any signal can be represented as an (infinite) sum of sine waves at different frequencies



# Review: Summing Waves I

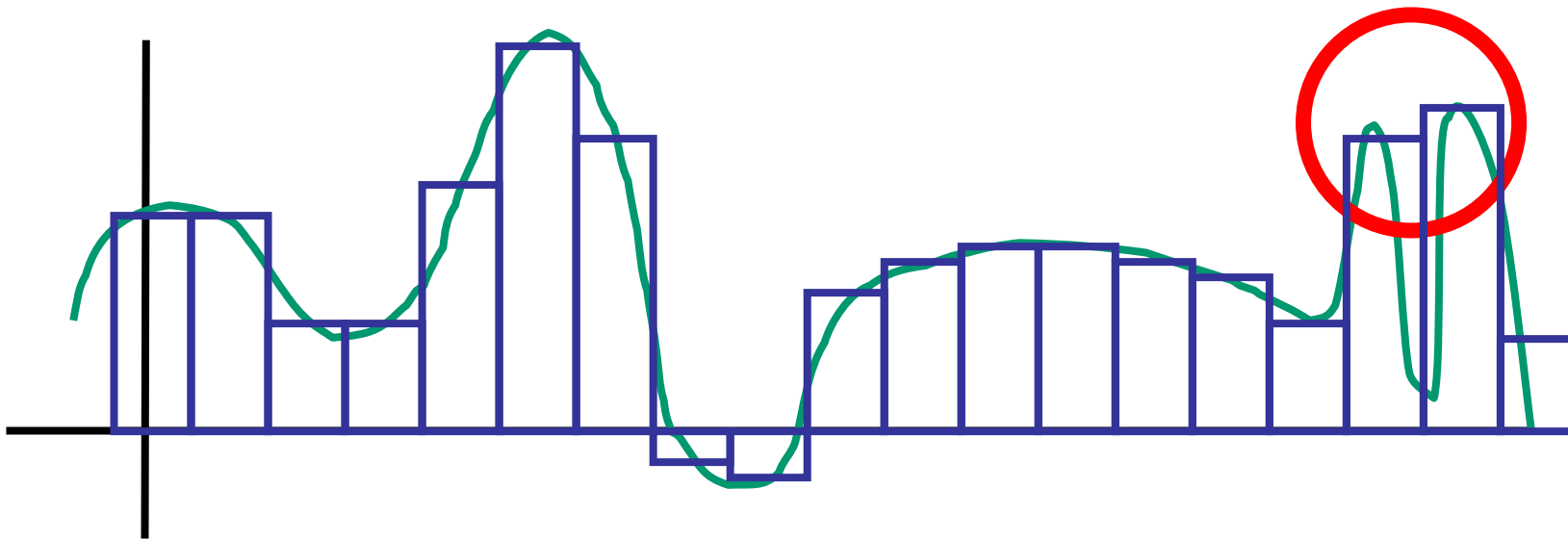


# Review: Summing Waves II



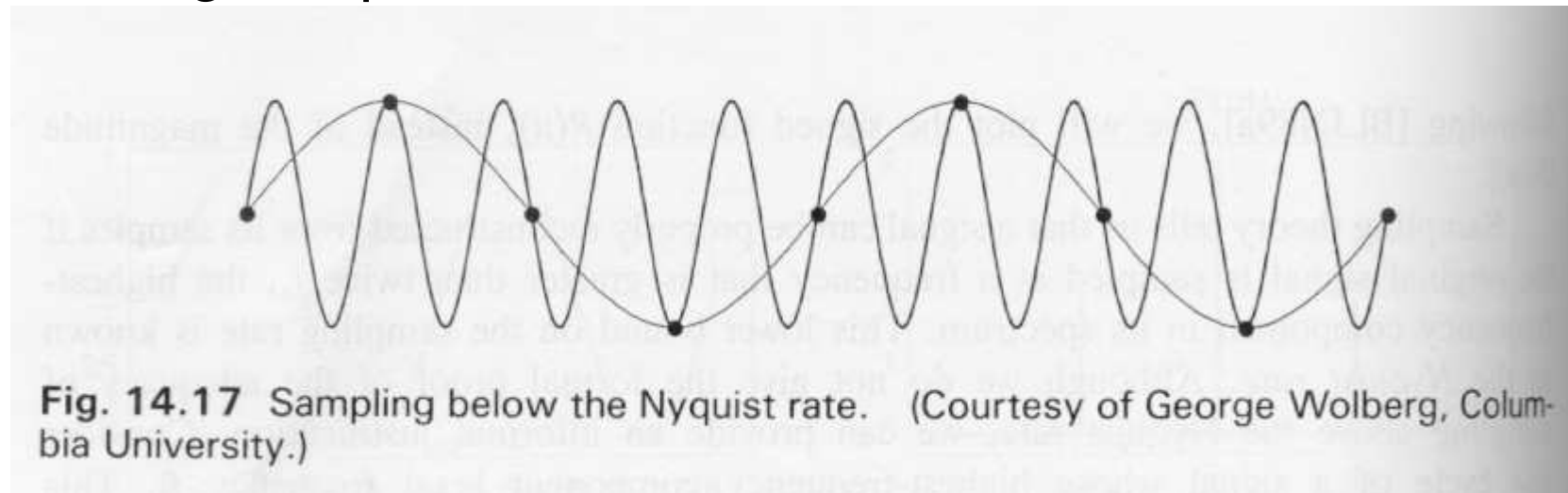
# Review: 1D Sampling and Reconstruction

- problems
  - jaggies – abrupt changes
  - lose data



# Review: Sampling Theorem and Nyquist Rate

- Shannon Sampling Theorem
  - continuous signal can be completely recovered from its samples iff sampling rate greater than twice maximum frequency present in signal
- sample past Nyquist Rate to avoid aliasing
  - twice the highest frequency component in the image's spectrum



# Review: Aliasing

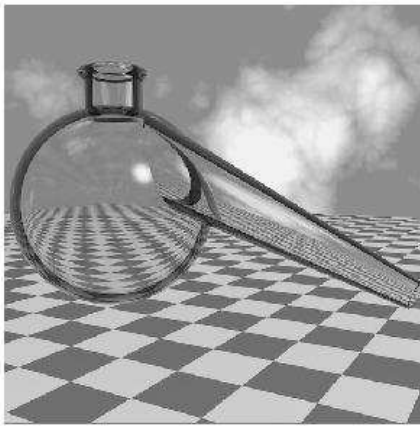
- incorrect appearance of high frequencies as low frequencies
- to avoid: **antialiasing**
  - supersample
    - sample at higher frequency
  - low pass filtering
    - remove high frequency function parts
    - aka prefiltering, band-limiting



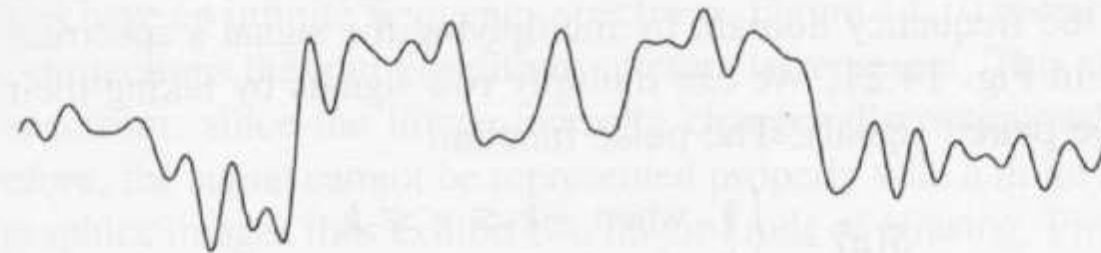
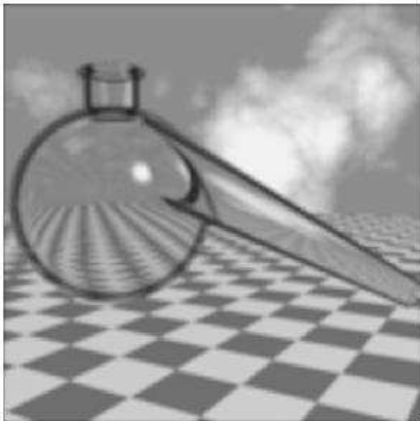
# Review: Supersampling



# Review: Low-Pass Filtering



↓ Low-pass filtering



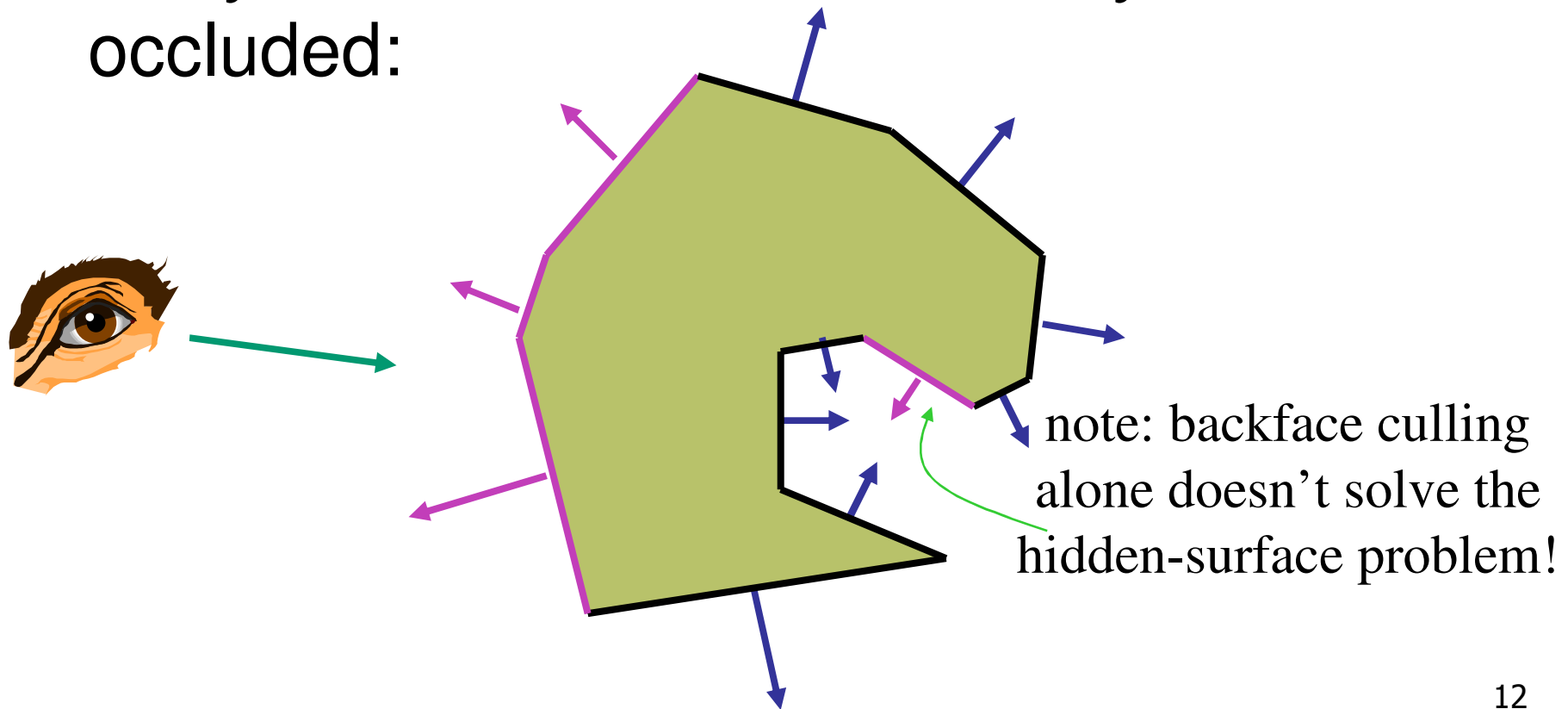
Low-pass  
filtered  
signal

# Review: Invisible Primitives

- *why might a polygon be invisible?*
  - polygon outside the *field of view / frustum*
    - solved by **clipping**
  - polygon is *backfacing*
    - solved by **backface culling**
  - polygon is *occluded* by object(s) nearer the viewpoint
    - solved by **hidden surface removal**

# Review: Back-Face Culling

- on the surface of a closed orientable manifold, polygons whose normals point away from the camera are always occluded:



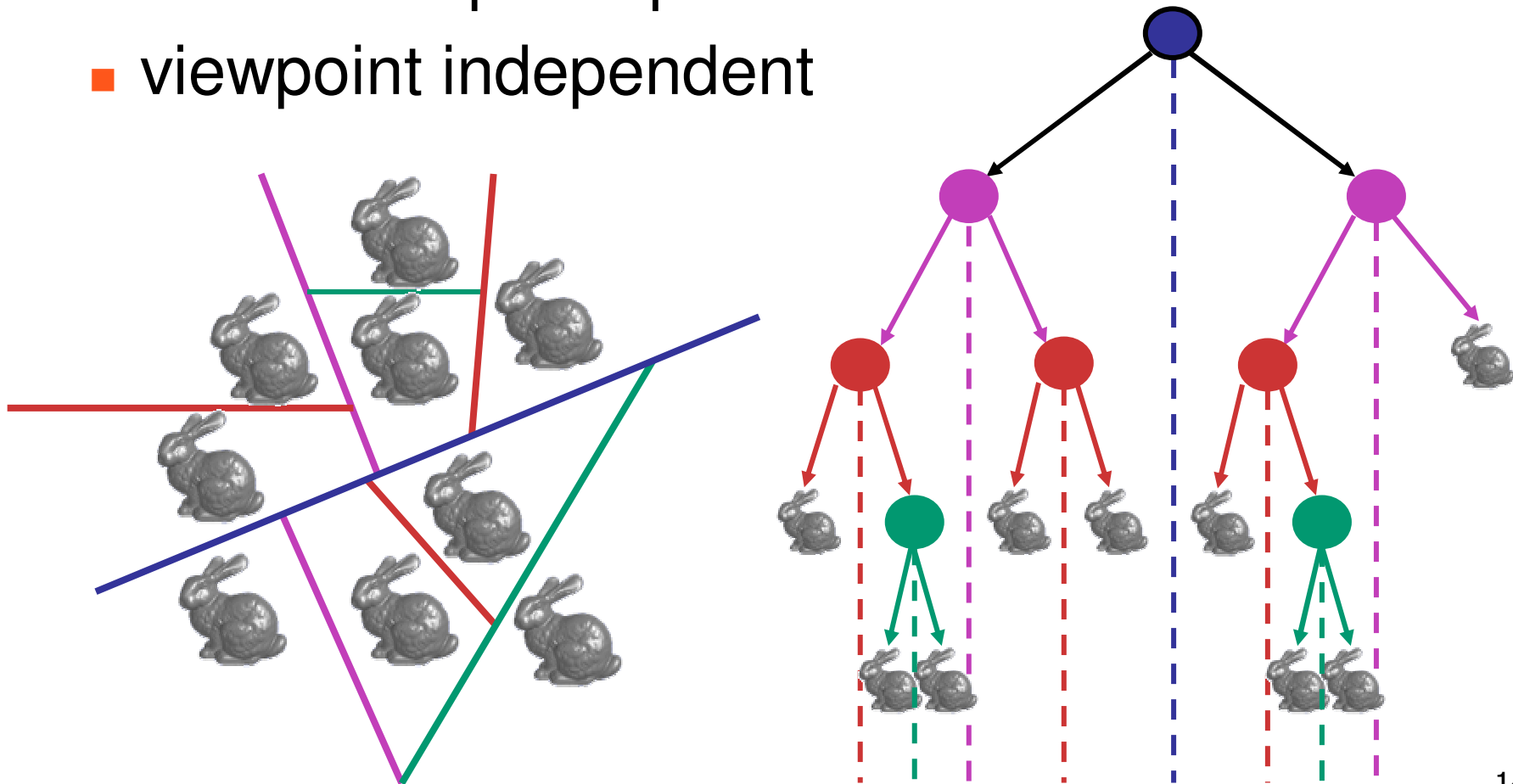
# Review: Painter's Algorithm

- draw objects from back to front
- problems: no valid visibility order for
  - intersecting polygons
  - cycles of non-intersecting polygons possible



# Review: BSP Trees

- preprocess: create binary tree
  - recursive spatial partition
  - viewpoint independent



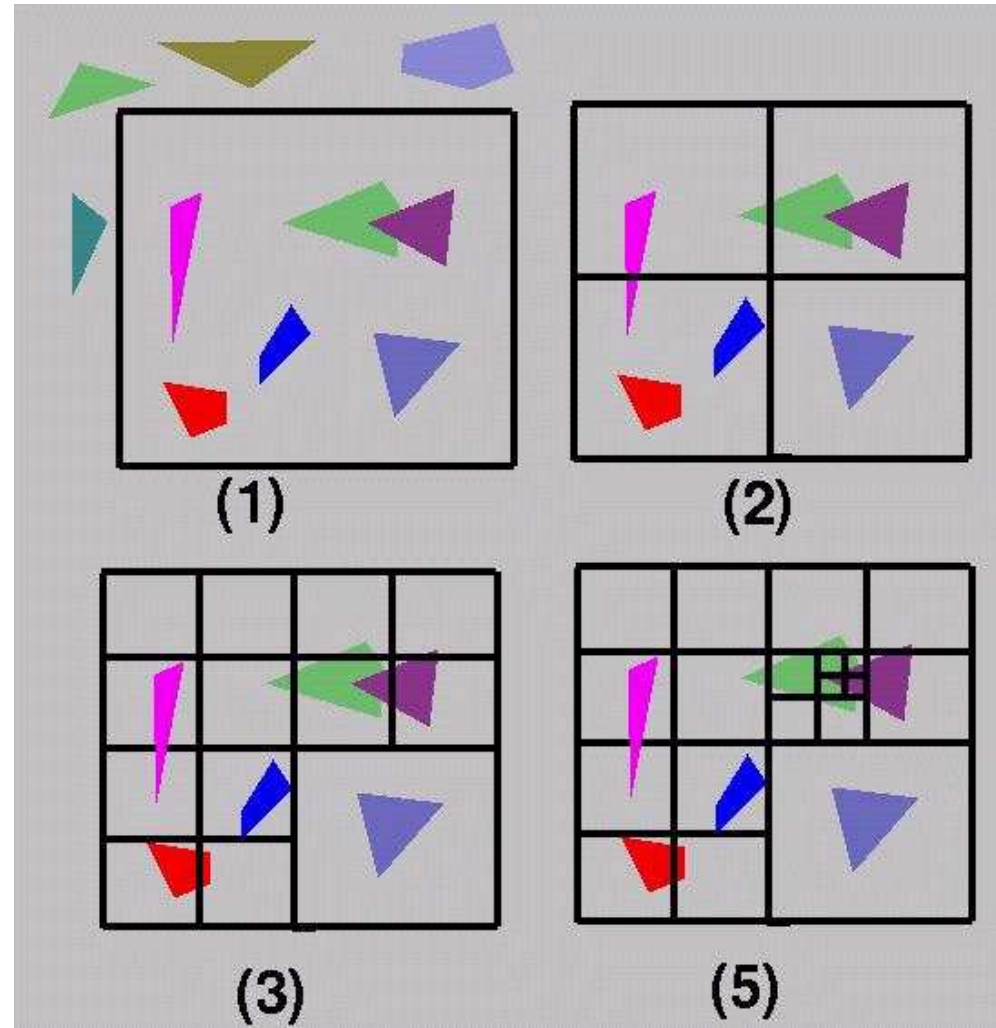
# Review: BSP Trees

- runtime: correctly traversing this tree enumerates objects from back to front
  - viewpoint dependent
    - check which side of plane viewpoint is on at each node
  - draw far, draw object in question, draw near
- pros
  - simple, elegant scheme
  - works at object or polygon level
- cons
  - computationally intense preprocessing stage restricts algorithm to static scenes



# Review: Warnock's Algorithm

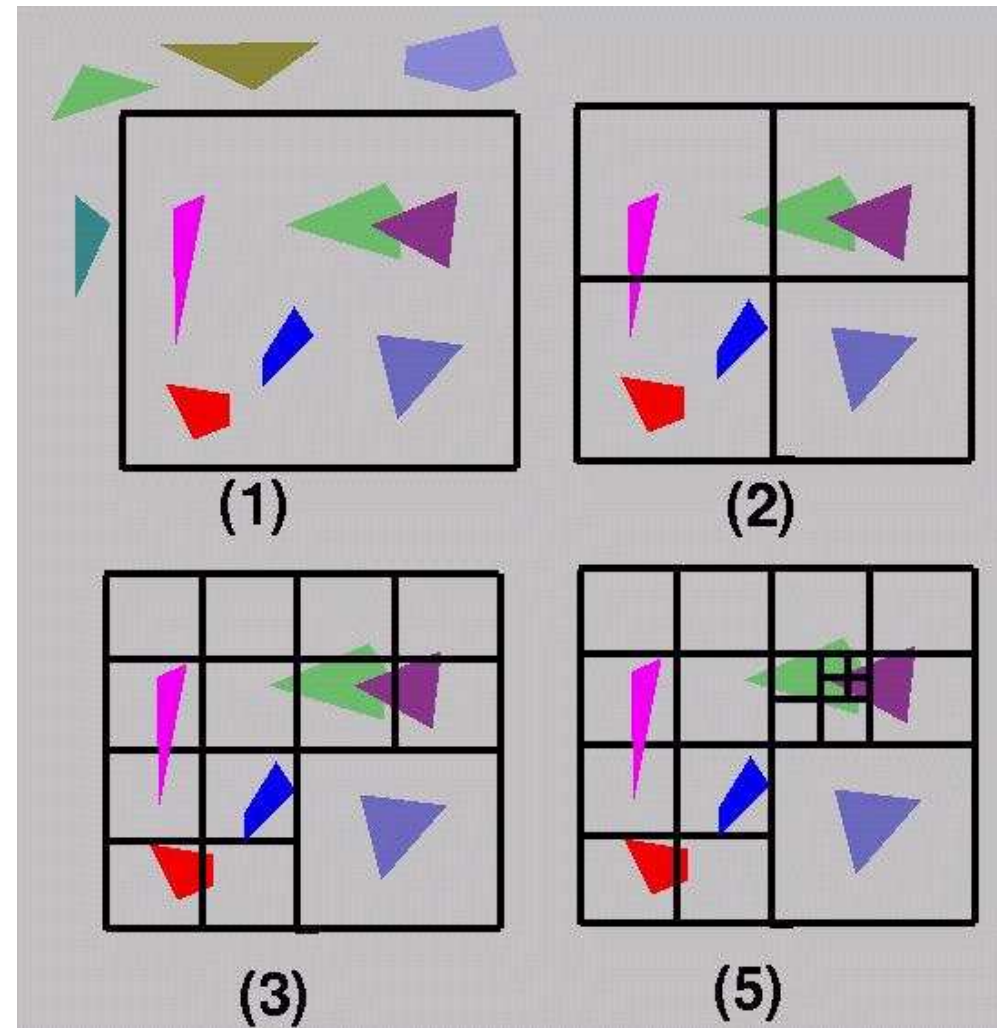
- start with root viewport and list of all objects
- recursion:
  - clip objects to viewport
  - if only 0 or 1 objects
    - done
  - else
    - subdivide to new smaller viewports
    - distribute objects to new viewpoints
    - recurse





# Review: Warnock's Algorithm

- termination
  - viewport is single pixel
  - explicitly check for object occlusion
- single-pixel case common in high depth complexity scenes

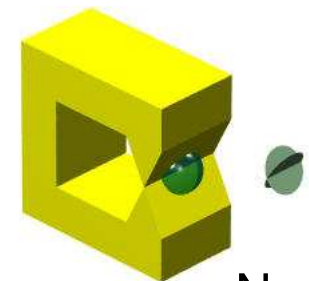
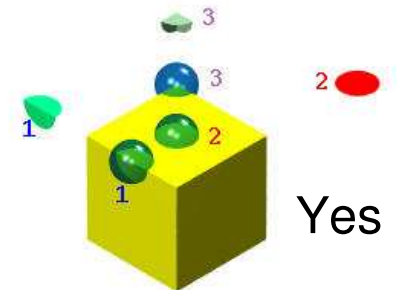


# Review: Z-Buffer Algorithm

- augment color framebuffer with **Z-buffer** or **depth buffer** which stores Z value at each pixel
  - at frame beginning, initialize all pixel depths to  $\infty$
  - when rasterizing, interpolate depth (Z) across polygon
  - check Z-buffer before storing pixel color in framebuffer and storing depth in Z-buffer
  - don't write pixel if its Z value is more distant than the Z value already stored there

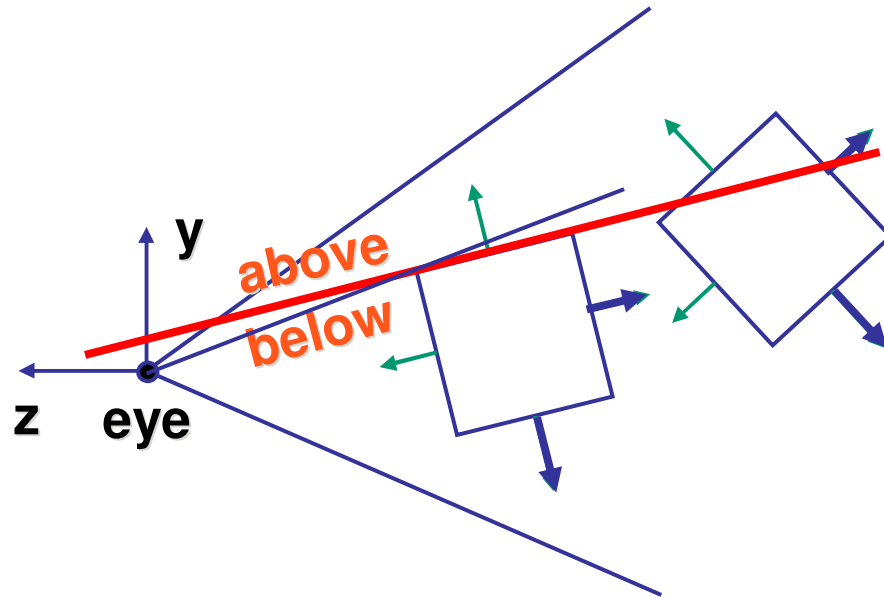
# Review: Back-Face Culling

- most objects in scene are typically “solid”
- rigorously: **orientable closed manifolds**
  - **orientable**: must have two distinct sides
    - cannot self-intersect
    - sphere is orientable
      - boundary partitions space into interior & exterior
    - Mobius strip or Klein bottle is not orientable
      - do not partition space into interior & exterior
  - **closed**: cannot “walk” from one side to other
    - sphere is closed manifold, plane is not
  - **manifold**: local neighborhood of all points isomorphic to disc



# Review: Back-face Culling

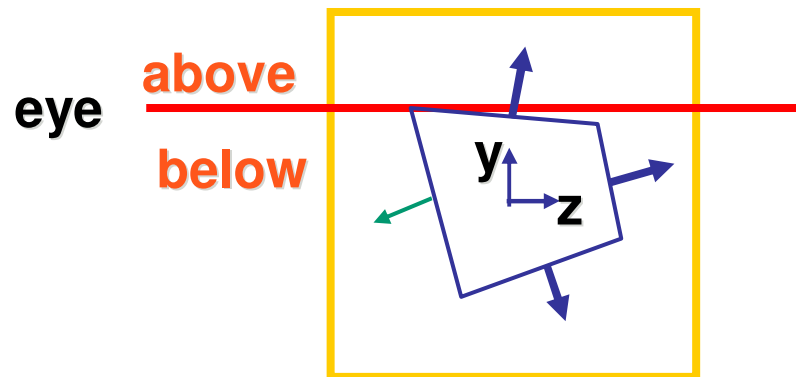
VCS



culling  $N_z < 0$   
sometimes  
misses polygons that  
should be culled

instead, cull if eye is  
below polygon plane

NDCS



works to cull if  $N_z > 0$

## Clarification/Review: Depth Test Precision

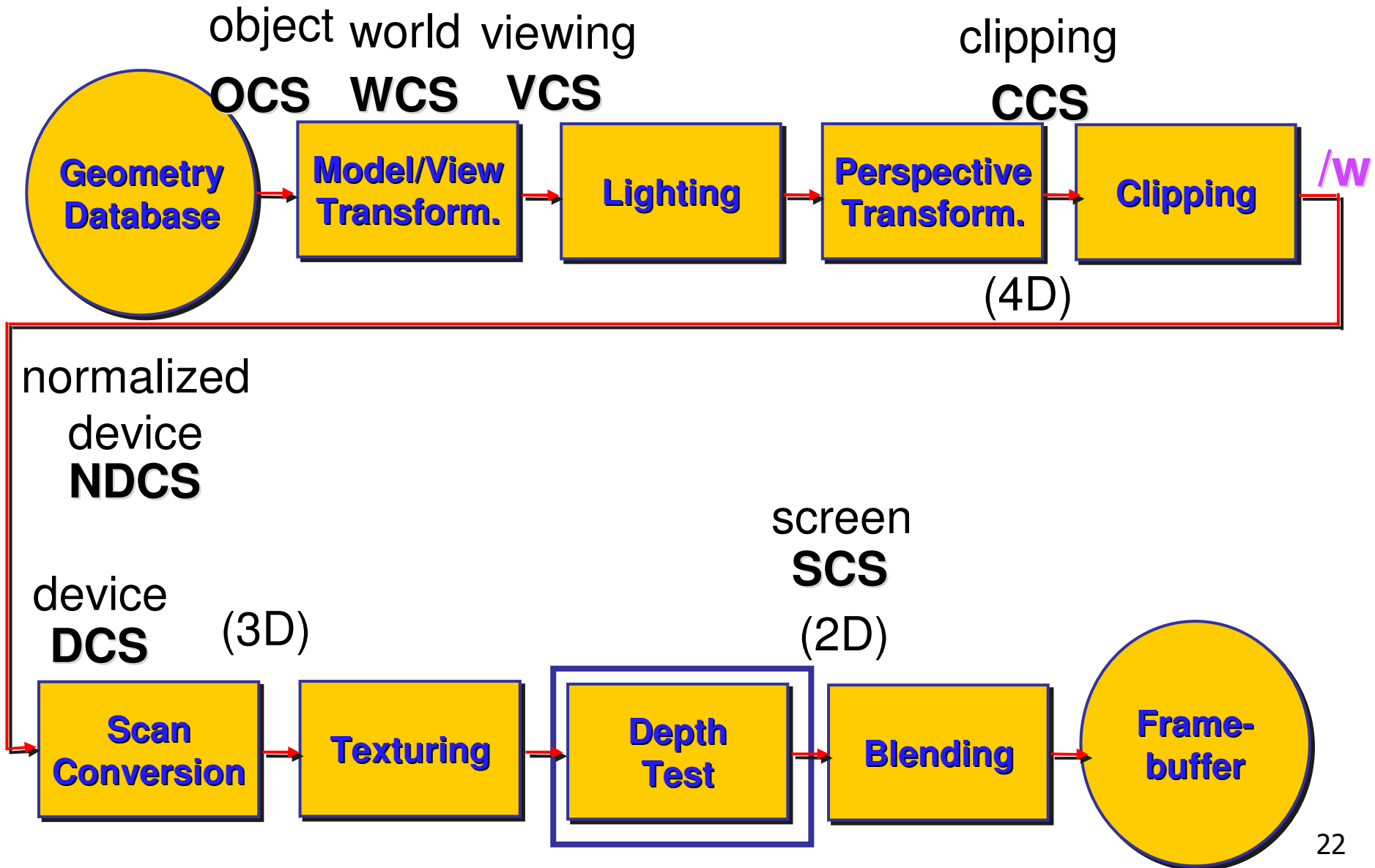
- reminder: projective transformation maps eye-space  $z$  to generic  $z$ -range (NDC)

$$\begin{bmatrix} x_N \\ y_N \\ z_N \\ w_N \end{bmatrix} = \begin{bmatrix} \frac{2n}{r-l} & 0 & \frac{r+l}{r-l} & 0 \\ 0 & \frac{2n}{t-b} & \frac{t+b}{t-b} & 0 \\ 0 & 0 & \frac{-(f+n)}{f-n} & \frac{-2fn}{f-n} \\ 0 & 0 & -1 & 0 \end{bmatrix} \cdot \begin{bmatrix} x_E \\ y_E \\ z_E \\ w_E \end{bmatrix}$$

- thus  $z_N \sim 1/z_E$

$$z_N = \frac{-(f+n)}{f-n} z_E + \frac{-2fn}{f-n} w_E, w_N = -z_E \qquad \frac{z_N}{w_N} = \frac{f+n}{f-n} + \frac{2fn}{f-n} \frac{w_E}{z_E}$$

# Review: Rendering Pipeline



# Scientific Visualization

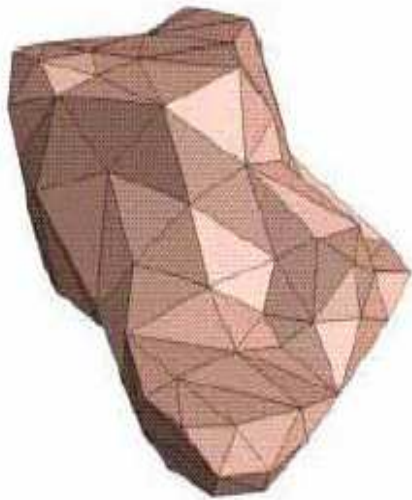
# Reading

- FCG Chapter 23

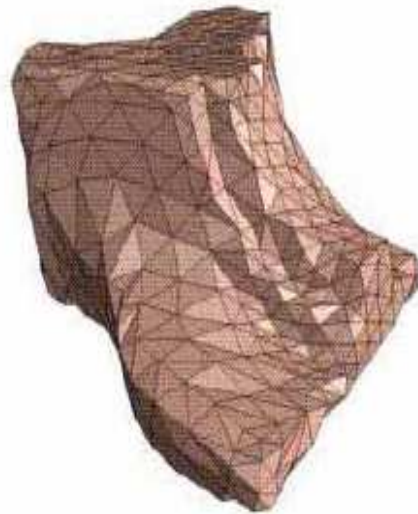


# Surface Graphics

- objects explicitly defined by surface or boundary representation
  - mesh of polygons



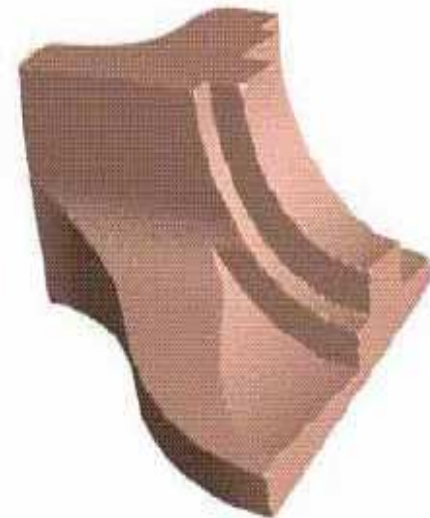
200 polys



1000 polys



15000 polys



# Surface Graphics

- pros
  - fast rendering algorithms available
  - hardware acceleration cheap
  - OpenGL API for programming
  - use texture mapping for added realism
- cons
  - discards interior of object, maintaining only the shell
  - operations such cutting, slicing & dissection not possible
  - no artificial viewing modes such as semi-transparencies, X-ray
  - surface-less phenomena such as clouds, fog & gas are hard to model and represent

# Volume Graphics

- for some data, difficult to create polygonal mesh
- **voxels**: discrete representation of 3D object
  - **volume rendering**: create 2D image from 3D object
- translate raw densities into colors and transparencies
  - different aspects of the dataset can be emphasized via changes in transfer functions



# Volume Graphics

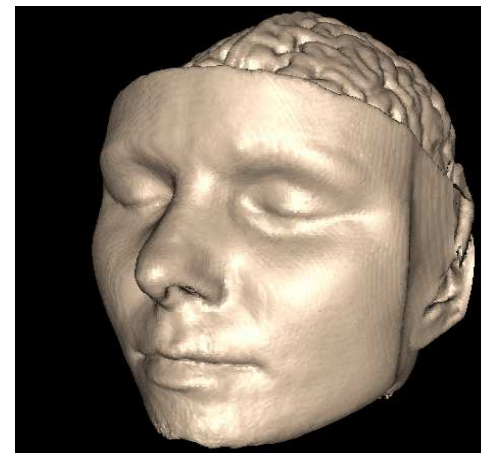
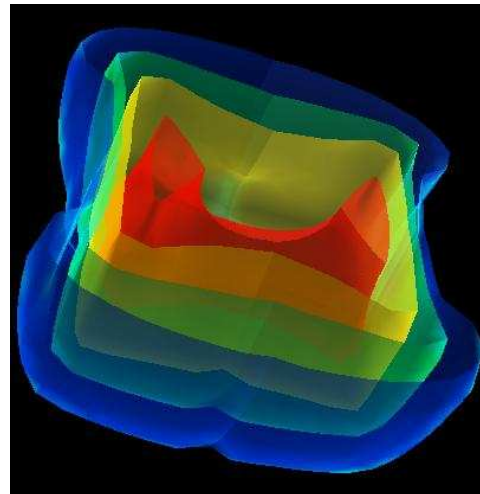
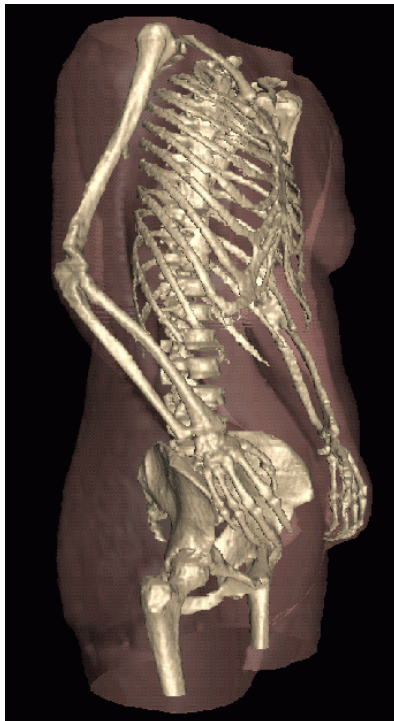
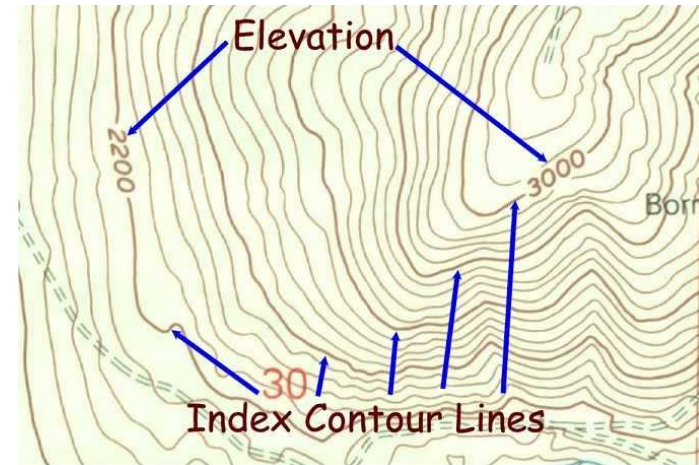
- pros
  - formidable technique for data exploration
- cons
  - rendering algorithm has high complexity!
  - special purpose hardware costly (~\$3K-\$10K)



**volumetric human head (CT scan)**

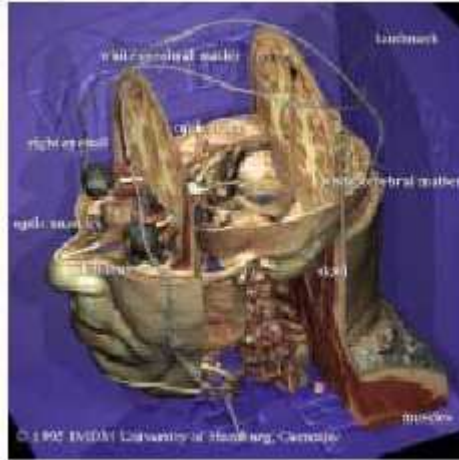
# Isosurfaces

- 2D scalar fields: isolines
  - contour plots, level sets
  - topographic maps
- 3D scalar fields: isosurfaces

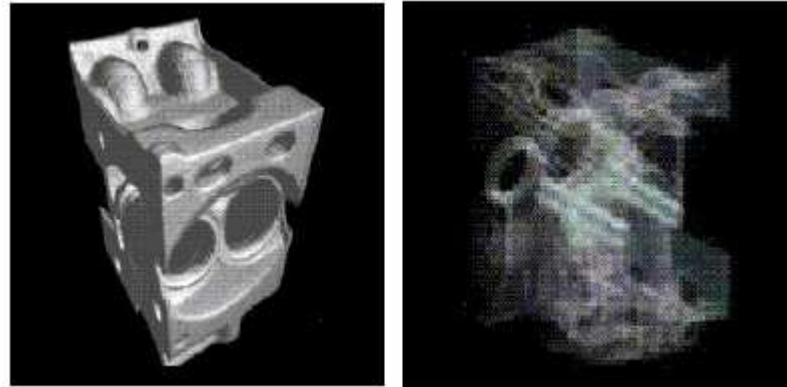




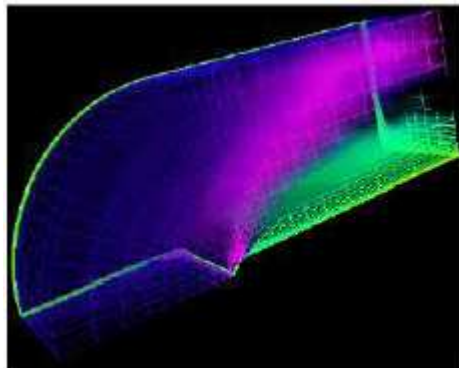
# Volume Graphics: Examples



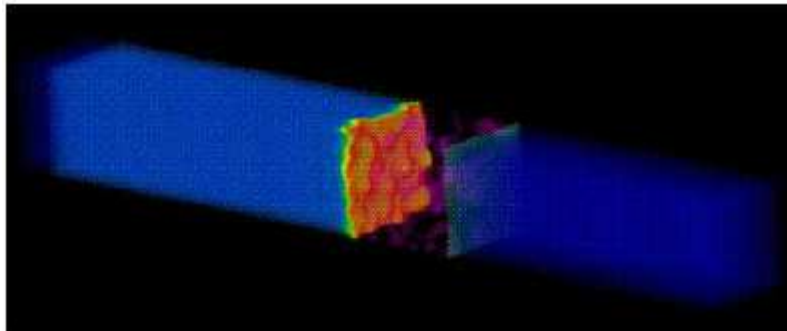
**anatomical atlas from visible human (CT & MRI) datasets**



**industrial CT - structural failure, security applications**



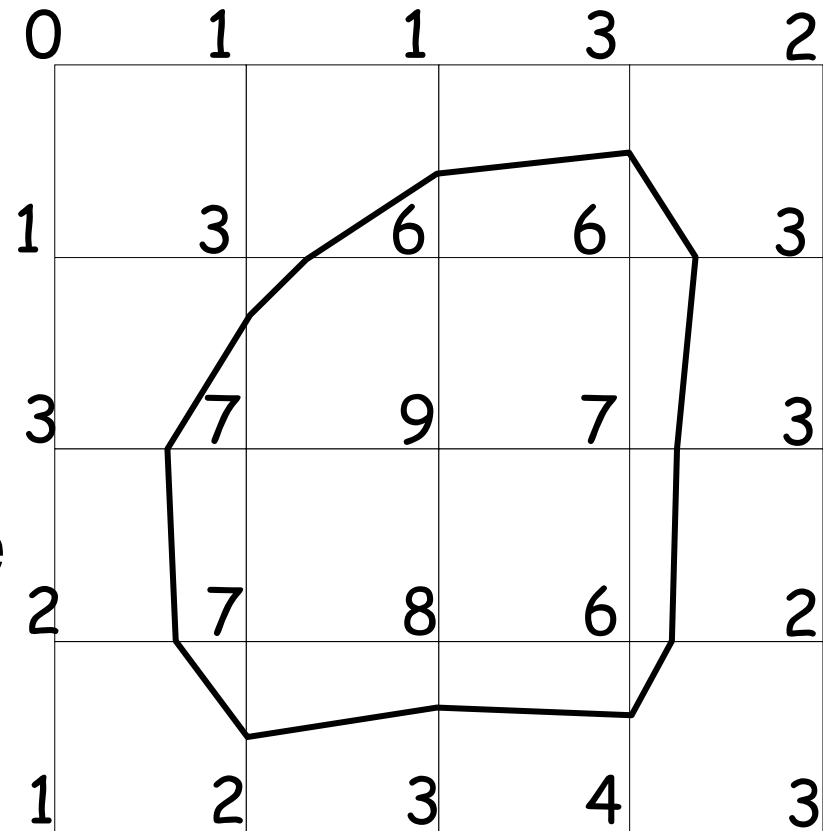
**flow around airplane wing**



**shockwave visualization: simulation with Navier-Stokes PDEs**

# Isosurface Extraction

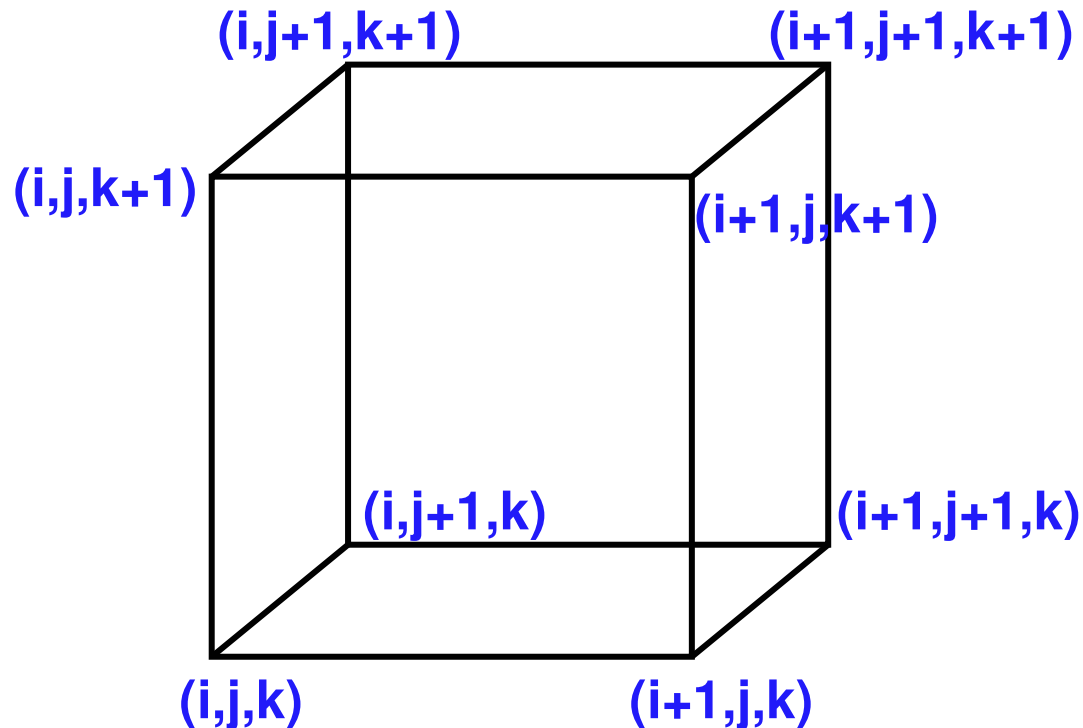
- array of discrete point samples at grid points
  - 3D array: voxels
- find contours
  - closed, continuous
  - determined by iso-value
- several methods
  - marching cubes is most common



Iso-value = 5

# MC 1: Create a Cube

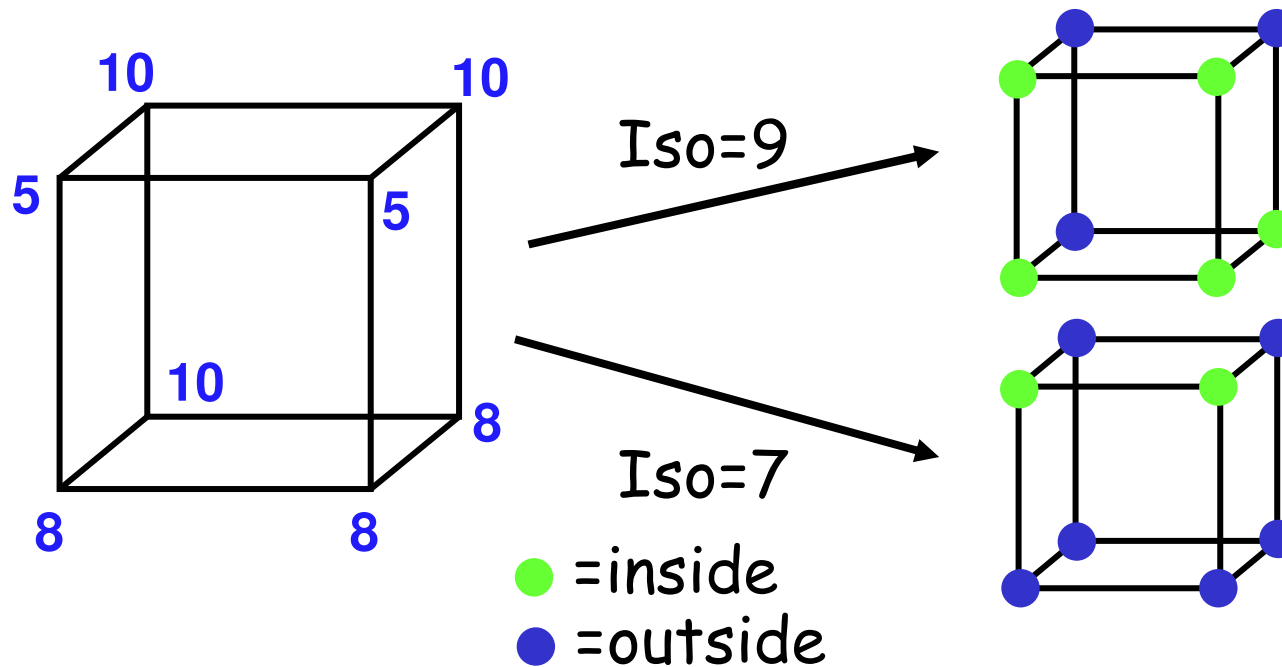
- consider a cube defined by eight data values





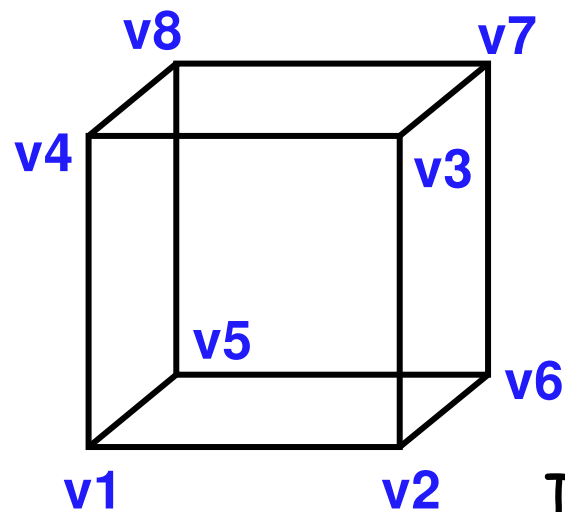
## MC 2: Classify Each Voxel

- classify each voxel according to whether lies
  - outside the surface (value  $>$  iso-surface value)
  - inside the surface (value  $\leq$  iso-surface value)



# MC 3: Build An Index

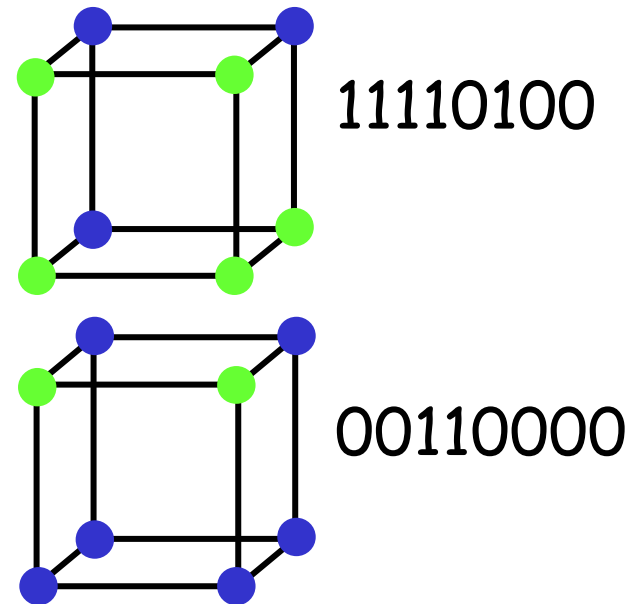
- binary labeling of each voxel to create index



● inside = 1  
● outside = 0

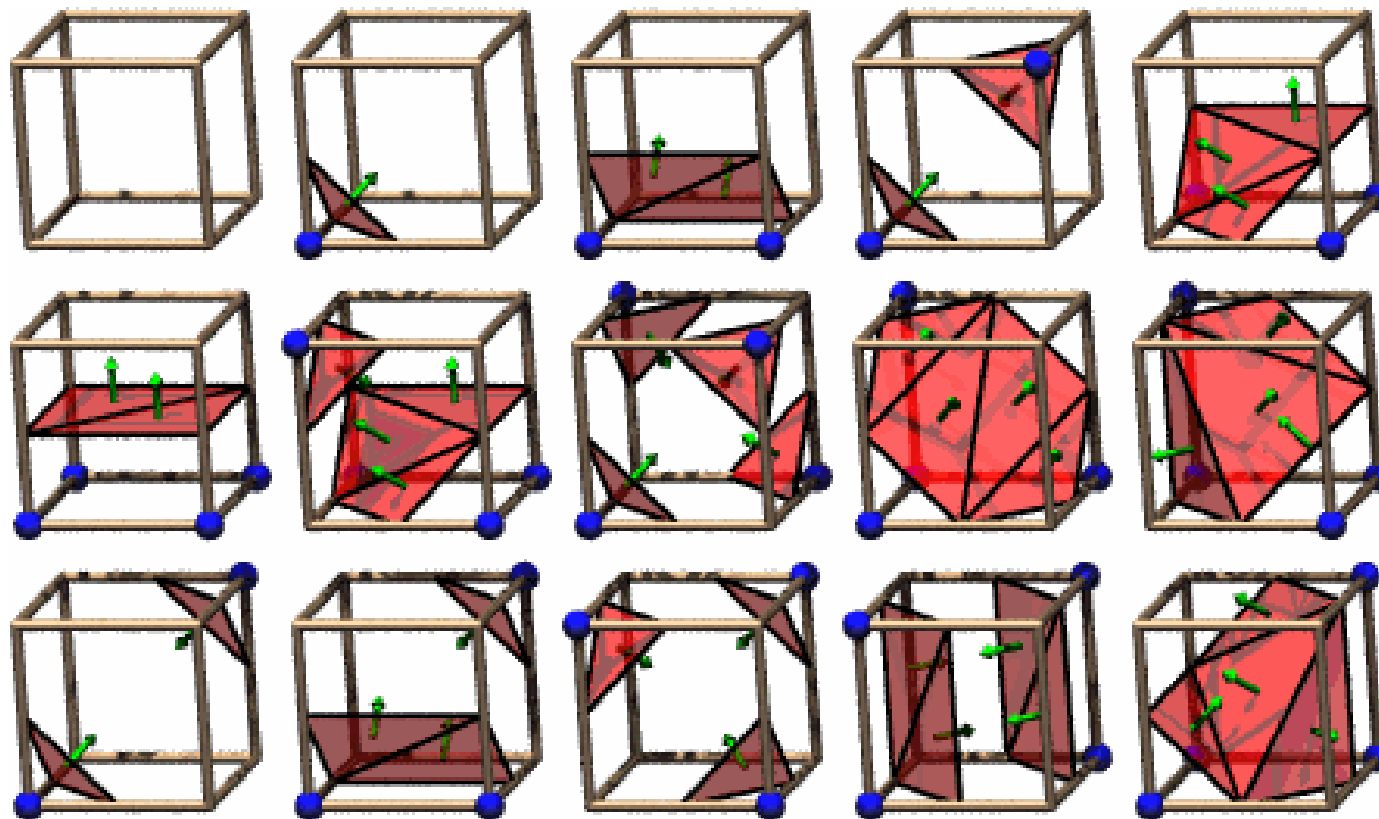
Index:

v1	v2	v3	v4	v5	v6	v7	v8
----	----	----	----	----	----	----	----



# MC 4: Lookup Edge List

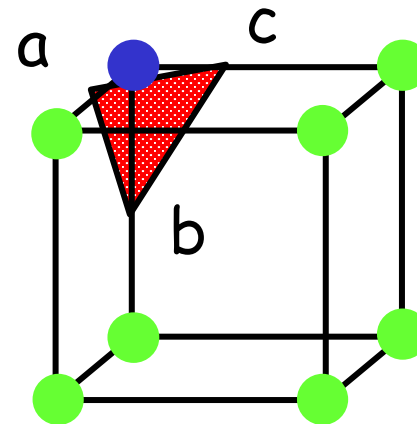
- use index to access array storing list of edges
  - all 256 cases can be derived from 15 base cases



The 15 Cube Combinations

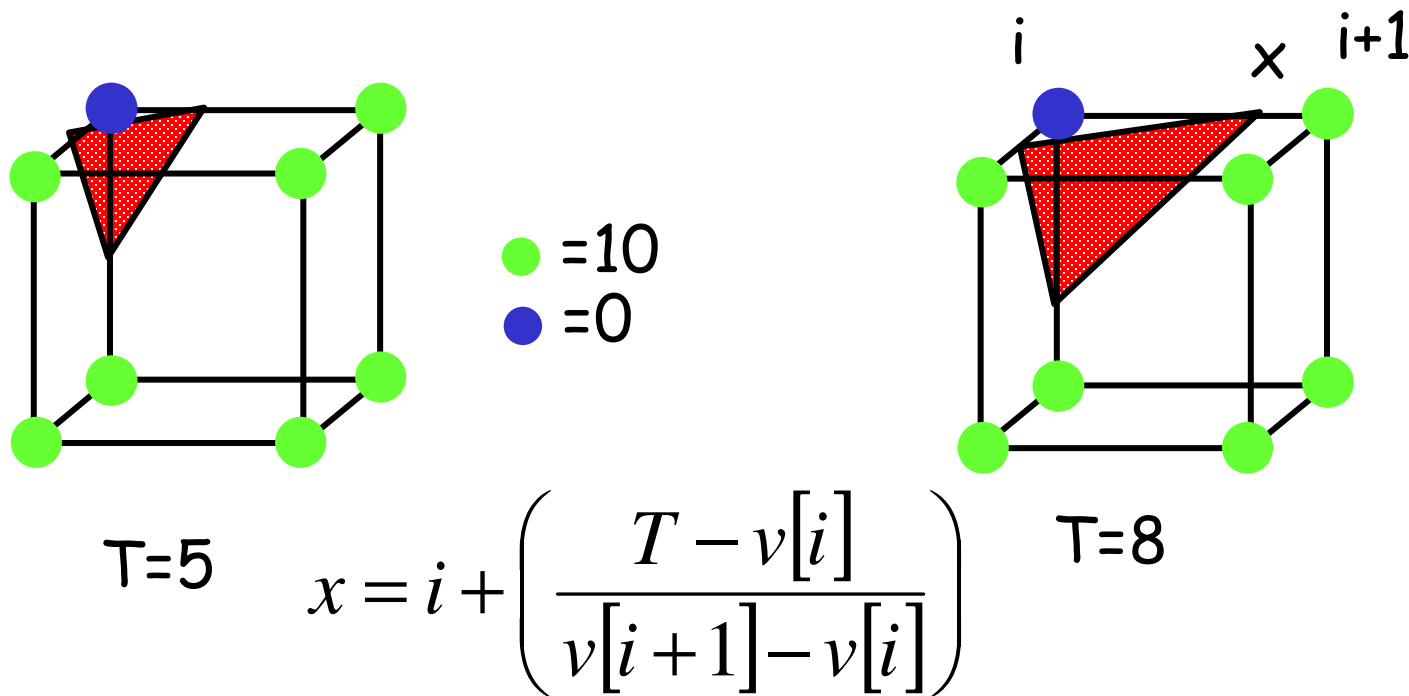
# MC 4: Example

- index = 00000001
- triangle 1 = a, b, c



# MC 5: Interpolate Triangle Vertex

- for each triangle edge
  - find vertex location along edge using linear interpolation of voxel values



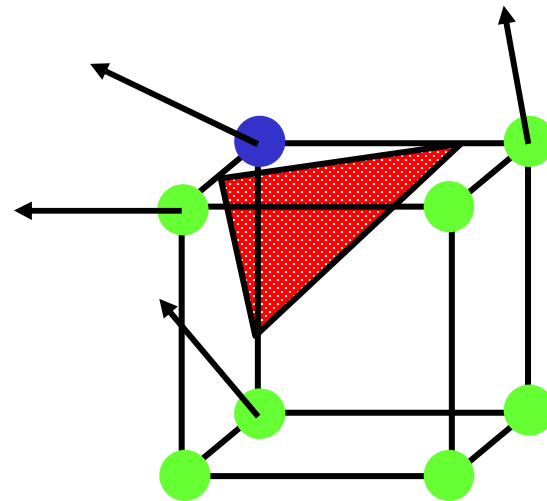
## MC 6: Compute Normals

- calculate the normal at each cube vertex
  - use linear interpolation to compute the polygon vertex normal

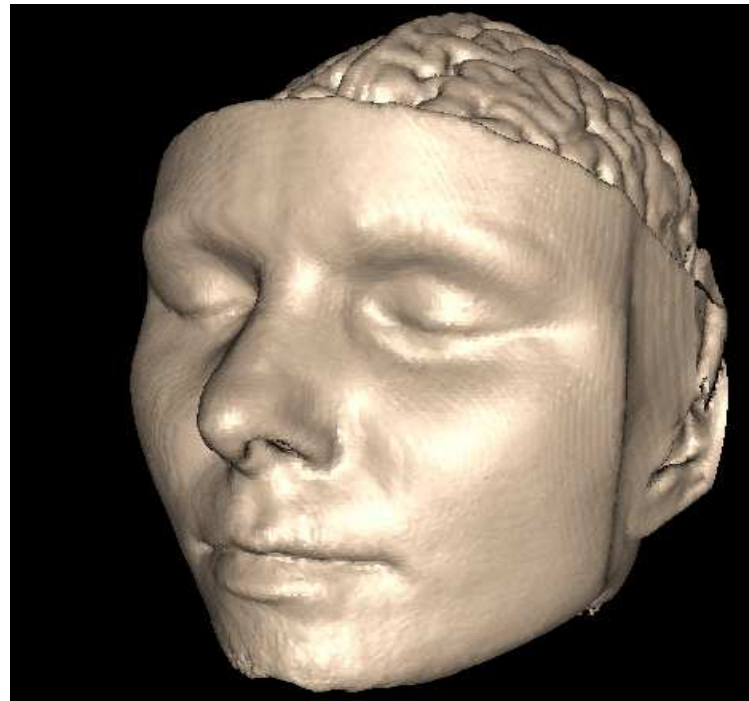
$$G_x = v_{i+1,j,k} - v_{i-1,j,k}$$

$$G_y = v_{i,j+1,k} - v_{i,j-1,k}$$

$$G_z = v_{i,j,k+1} - v_{i,j,k-1}$$

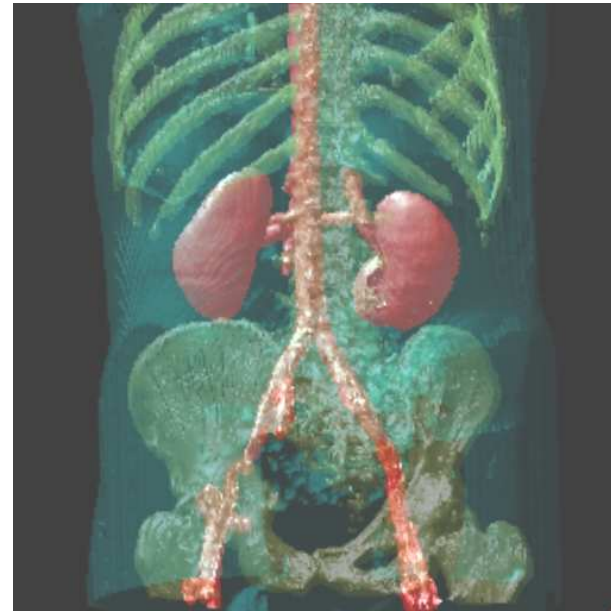
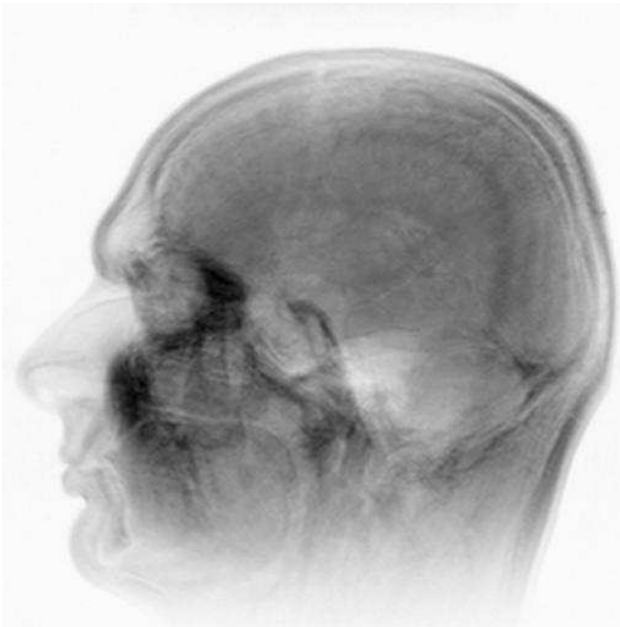


# MC 7: Render!



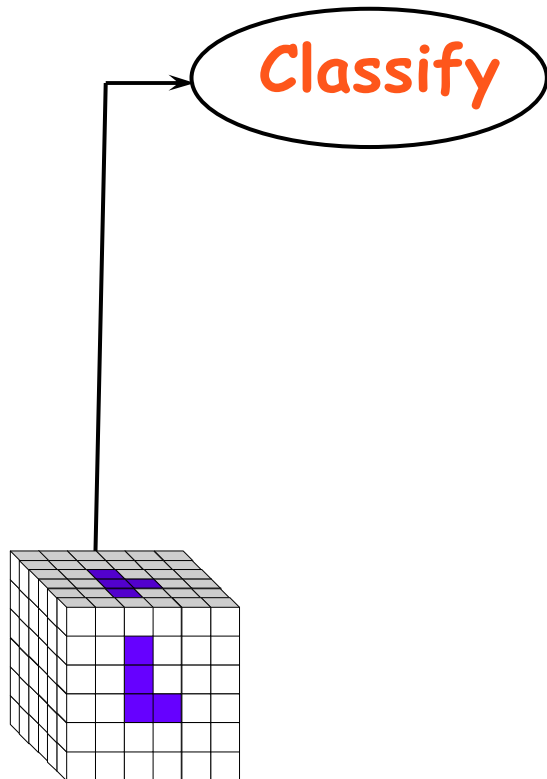
# Direct Volume Rendering

- do not compute surface



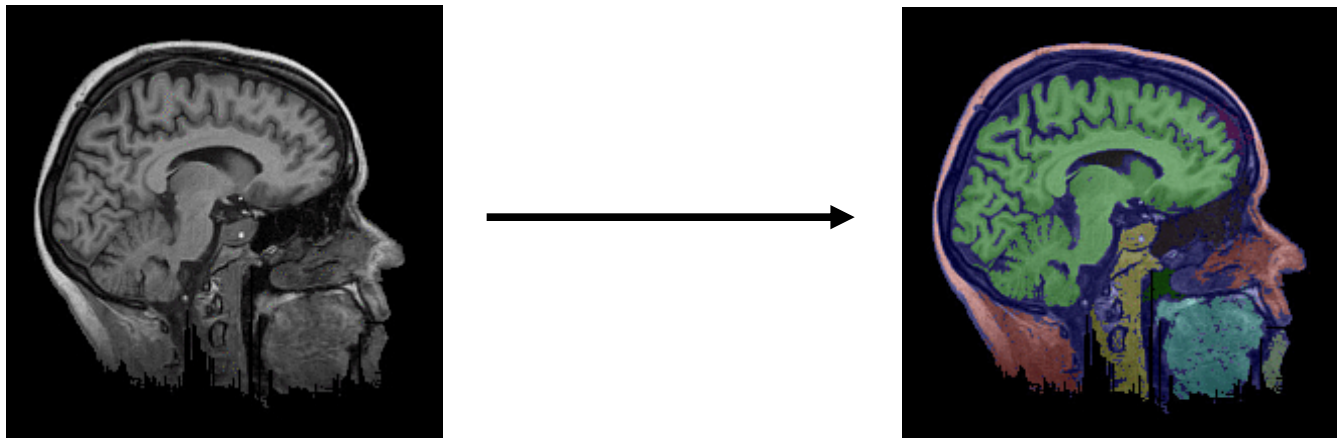


# Rendering Pipeline



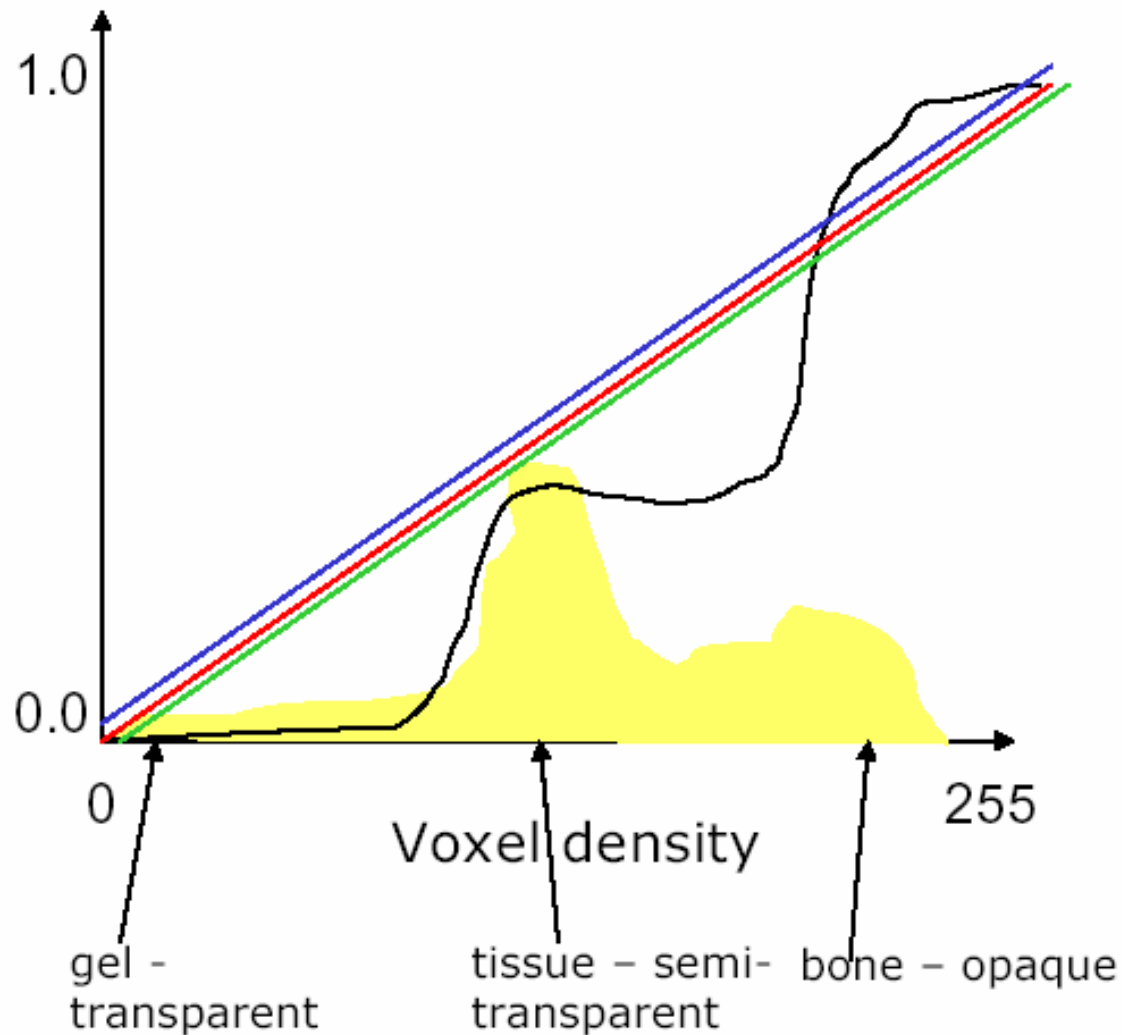
# Classification

- data set has application-specific values
  - temperature, velocity, proton density, etc.
- assign these to color/opacity values to make sense of data
- achieved through transfer functions

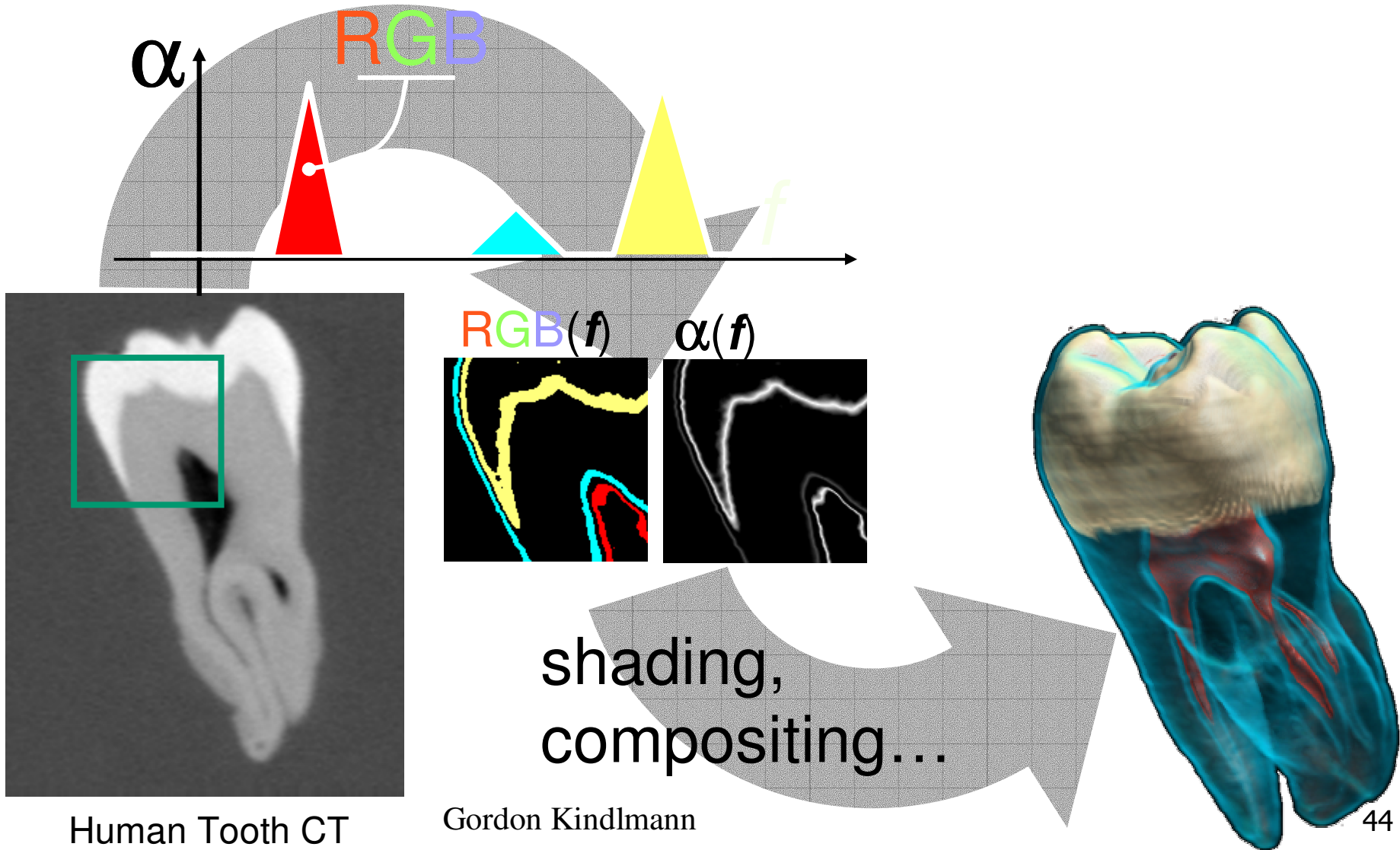


# Transfer Functions

- map data value to color and opacity



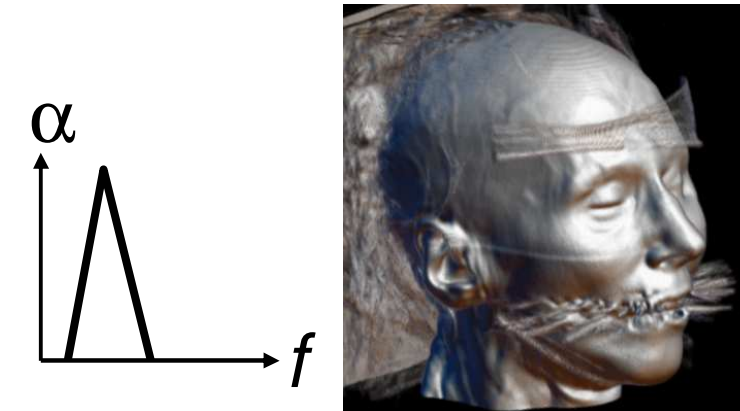
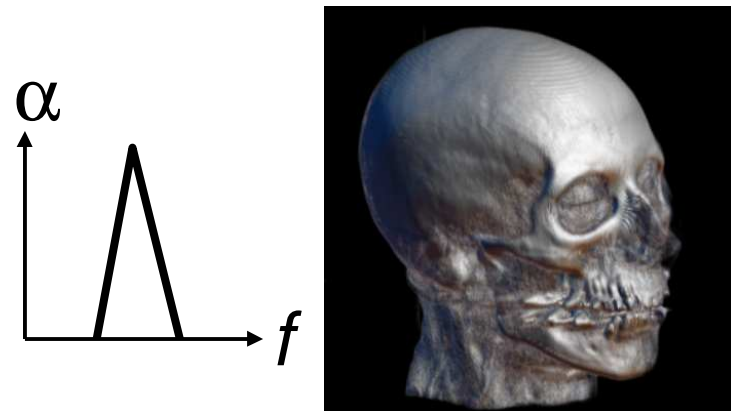
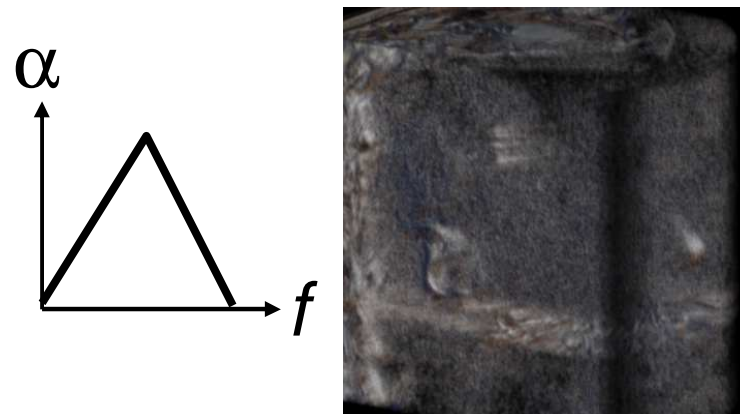
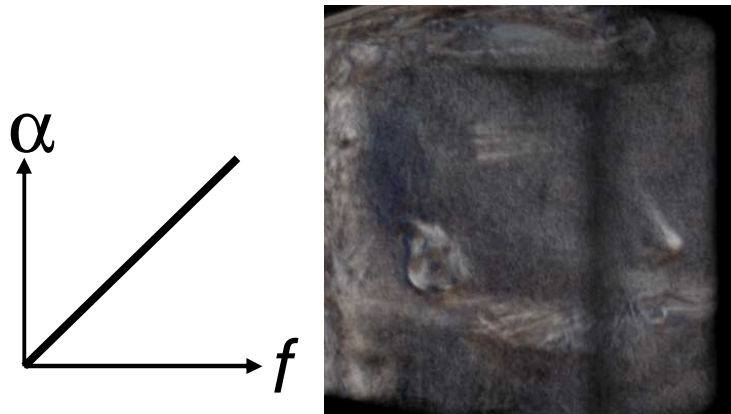
# Transfer Functions



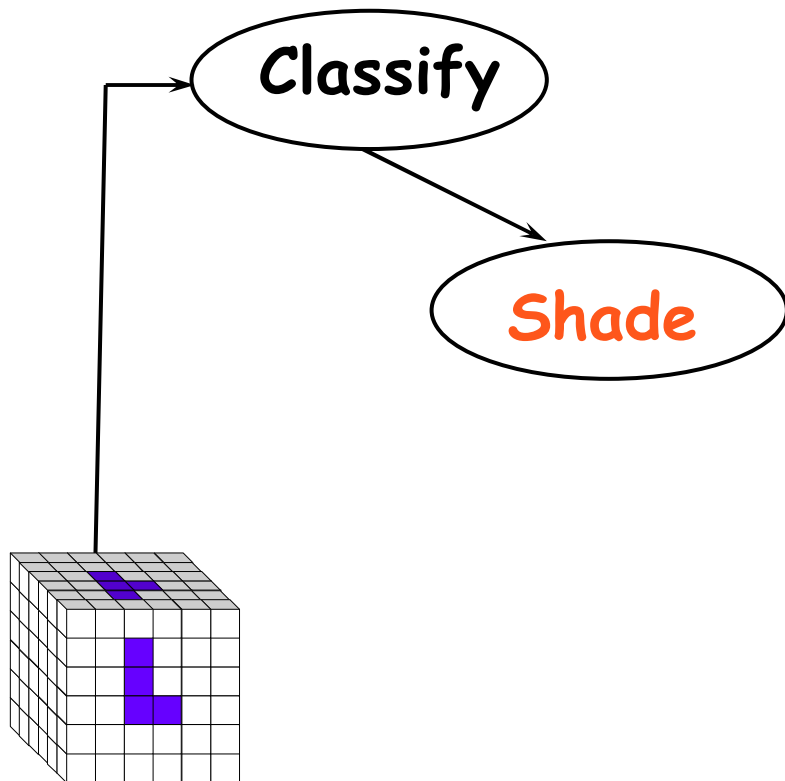
Human Tooth CT

# Setting Transfer Functions

- can be difficult, unintuitive, and slow

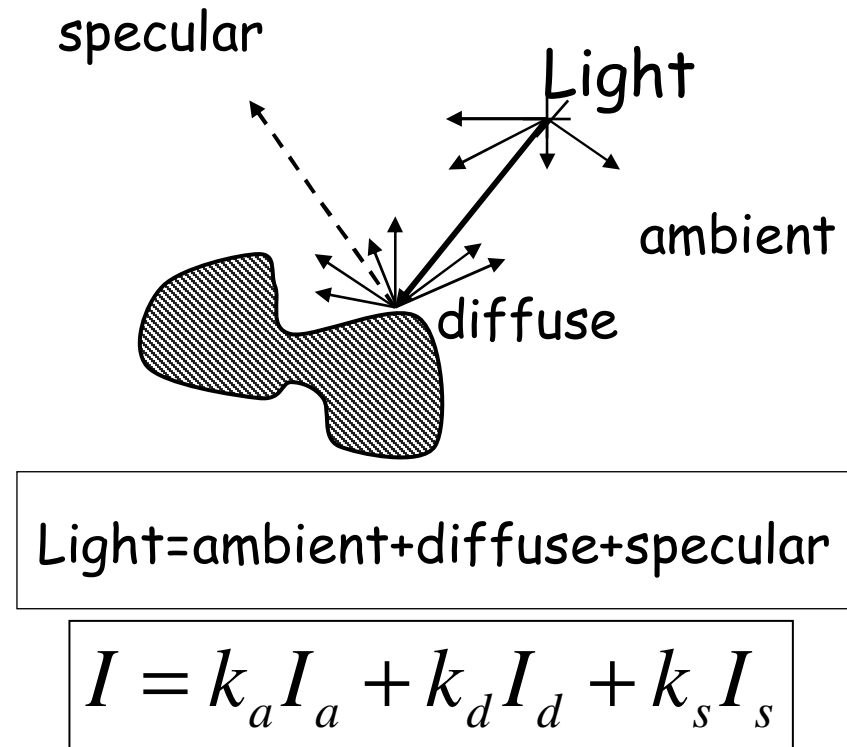
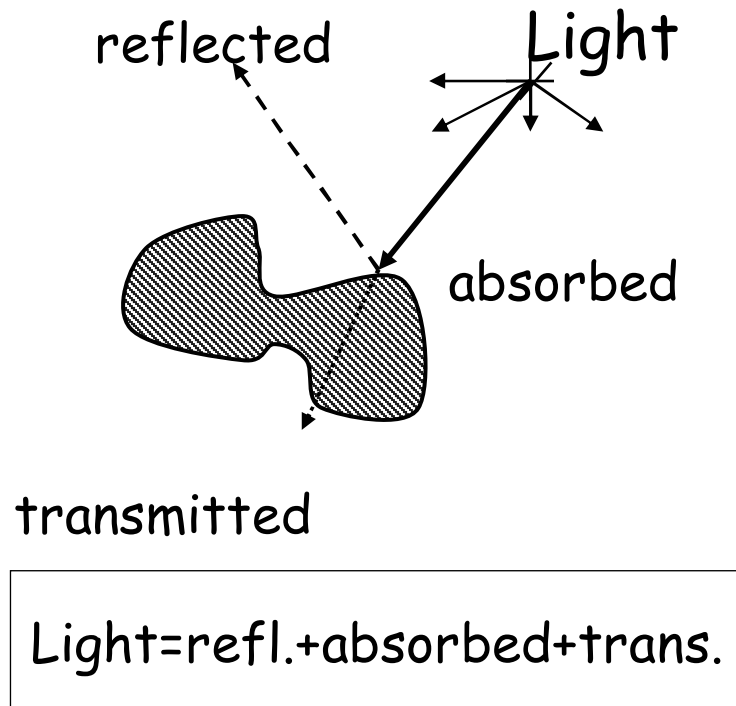


# Rendering Pipeline

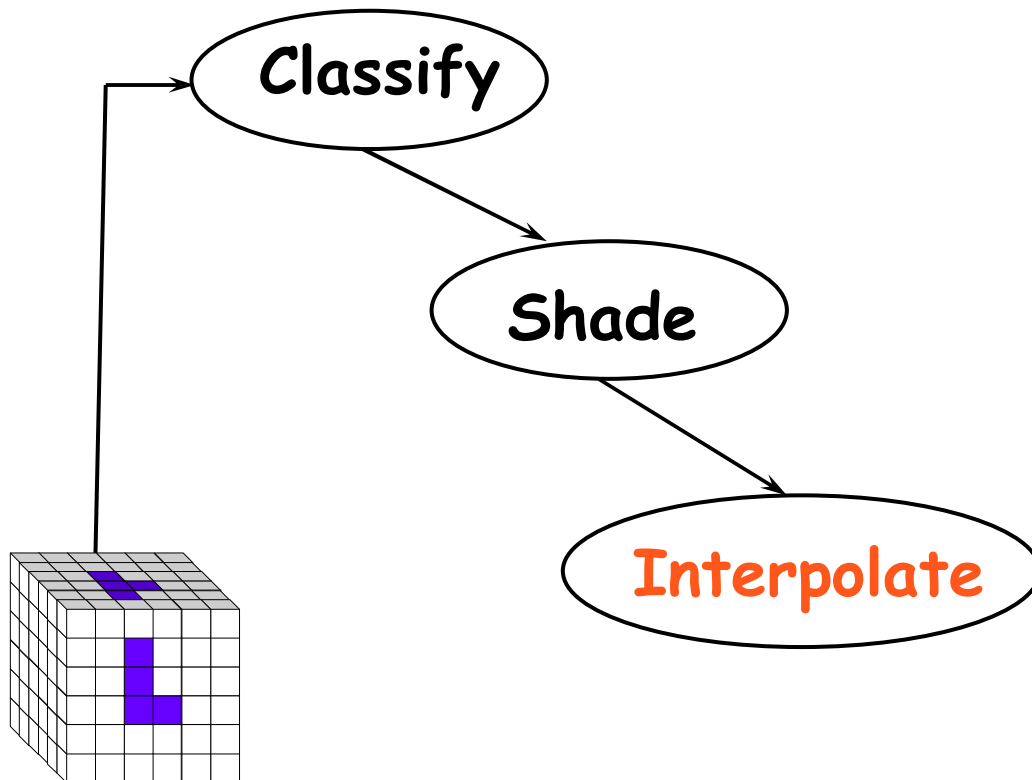


# Light Effects

- usually only consider reflected part



# Rendering Pipeline

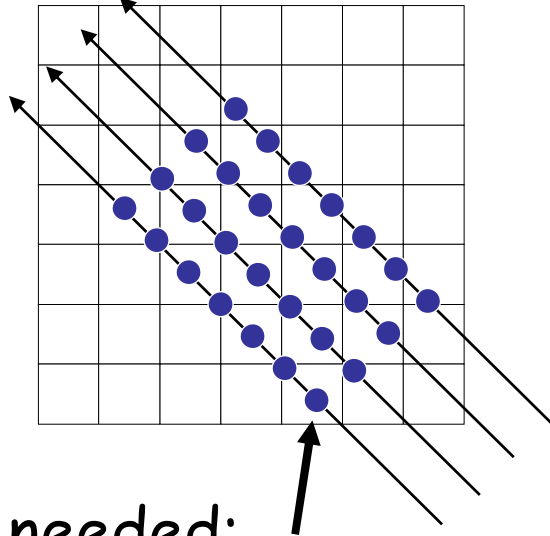




# Interpolation

2D

■ given:



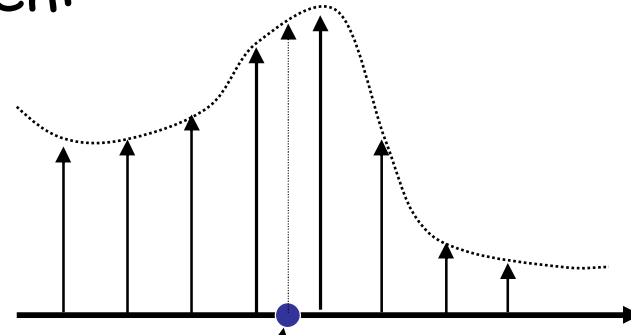
■ needed:

nearest  
neighbor



1D

■ given:

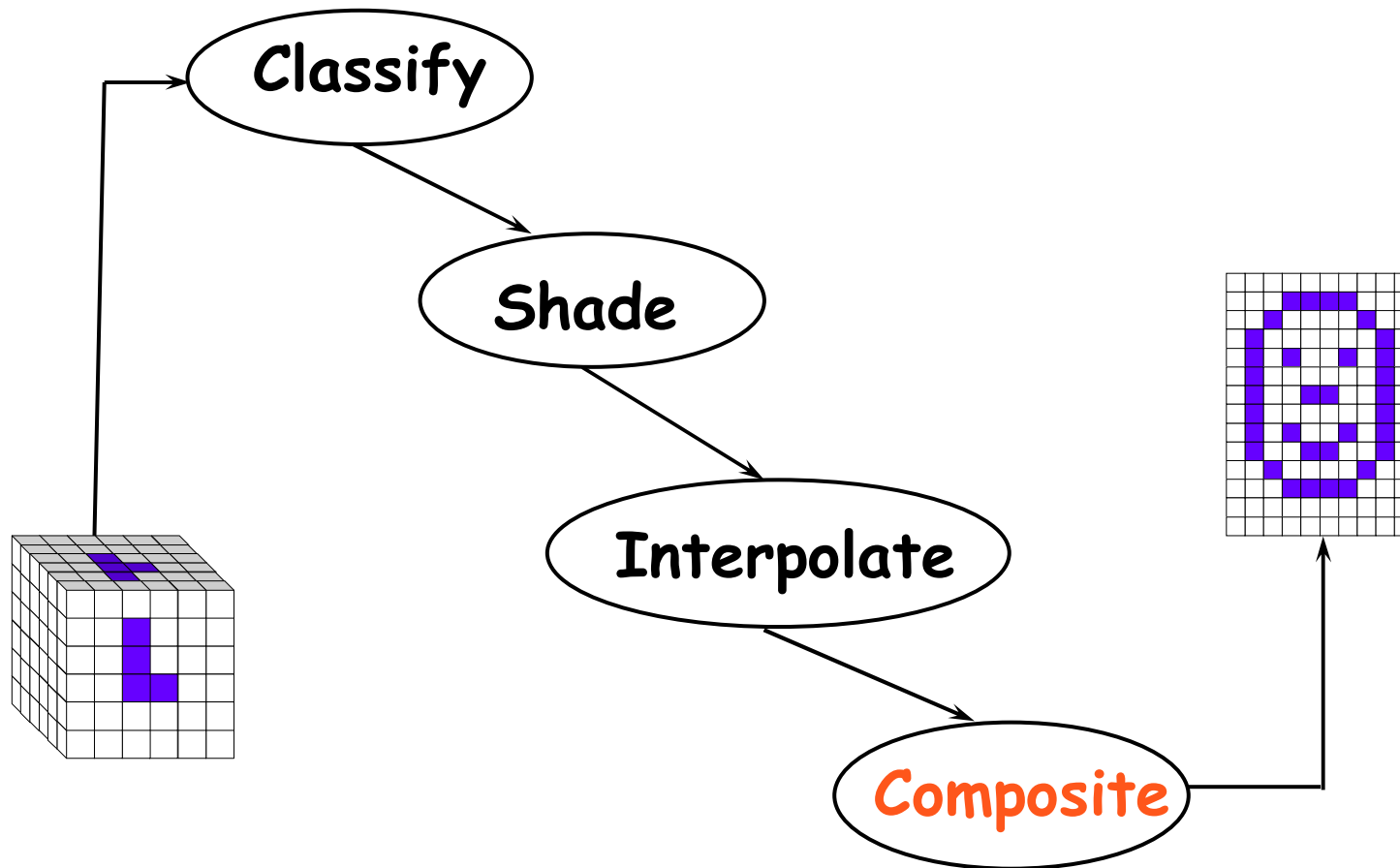


■ needed:

linear

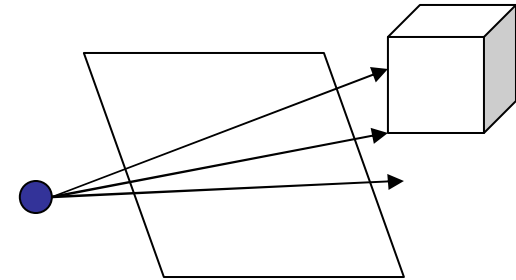


# Rendering Pipeline

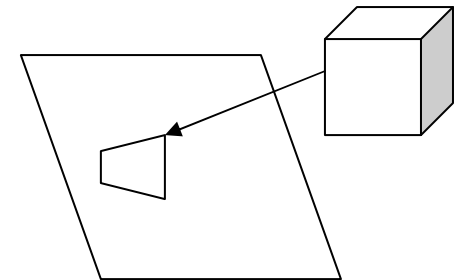


# Volume Rendering Algorithms

- ray casting
  - image order, forward viewing

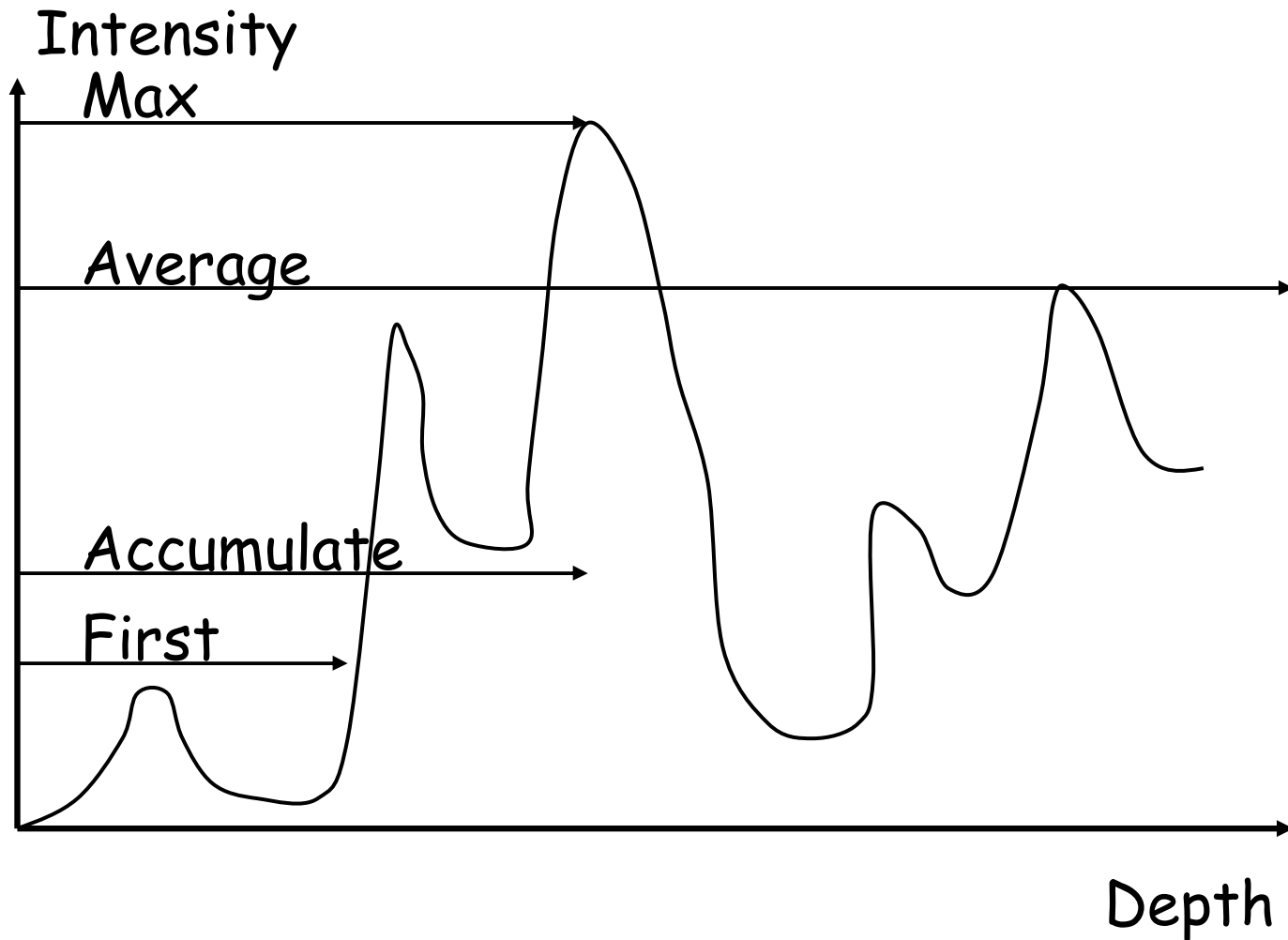


- splatting
  - object order, backward viewing



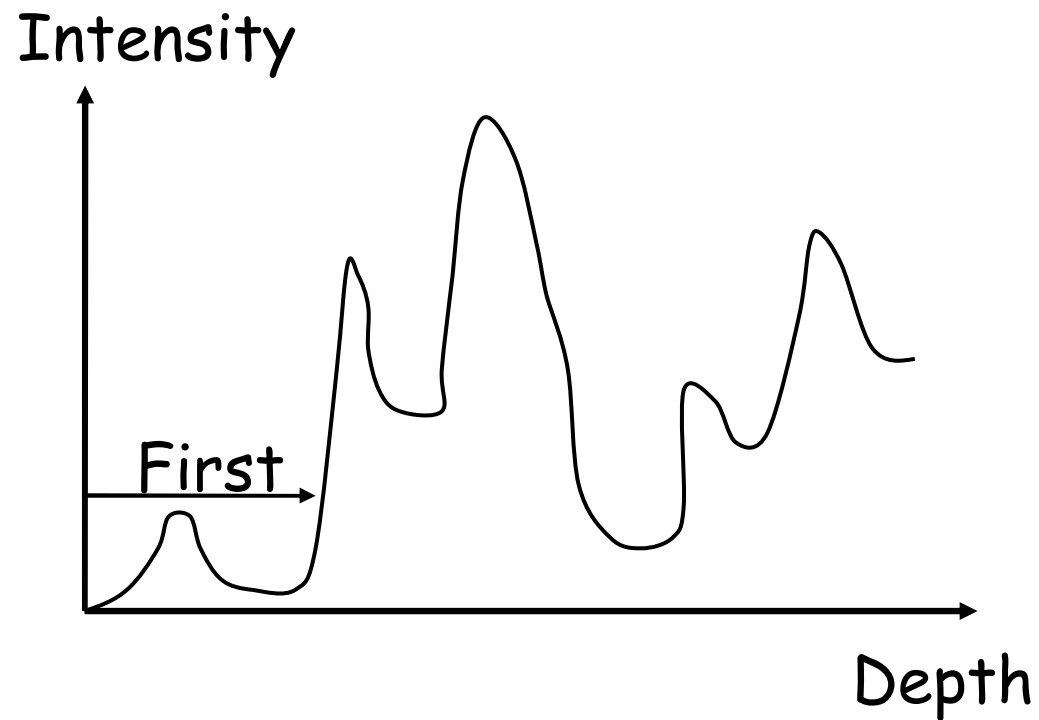
- texture mapping
  - object order
  - back-to-front compositing

# Ray Traversal Schemes



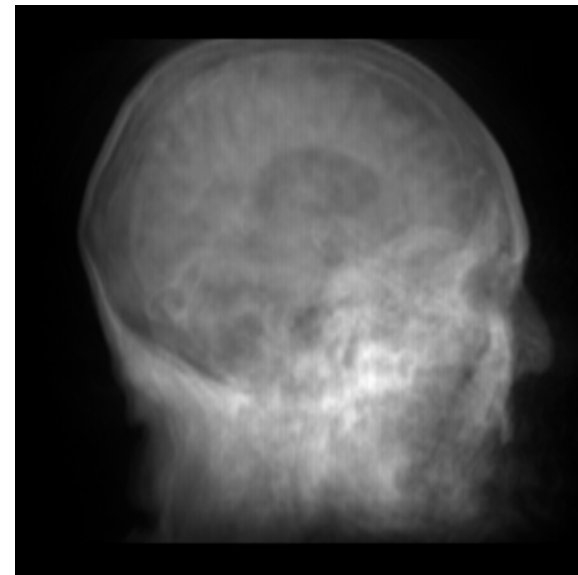
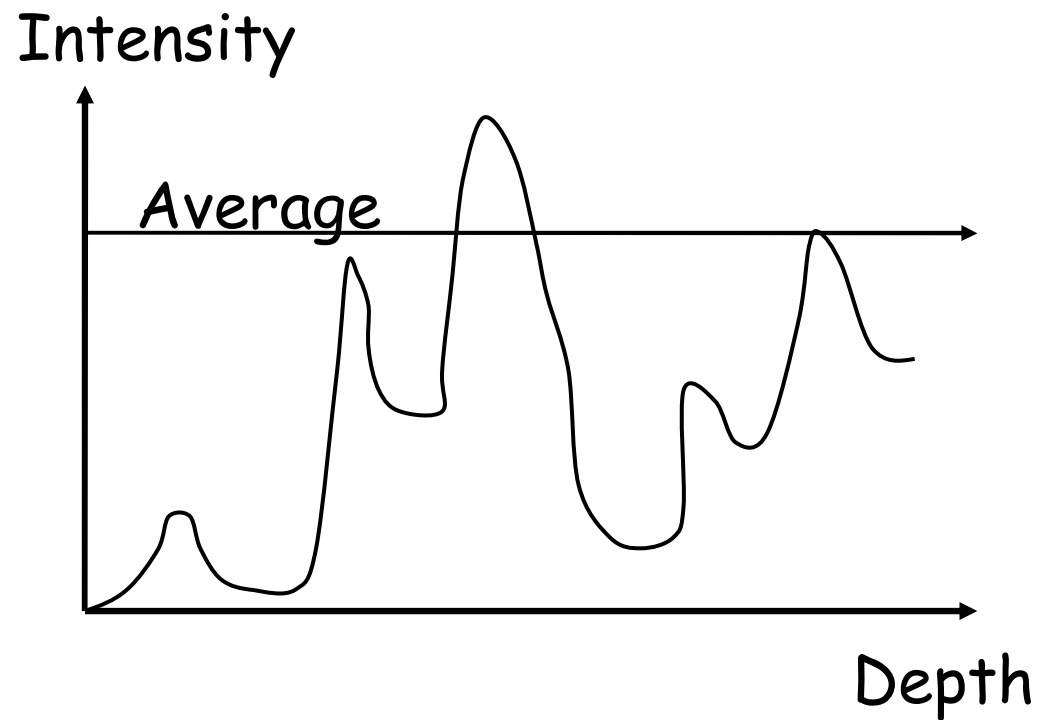
# Ray Traversal - First

- first: extracts iso-surfaces (again!)



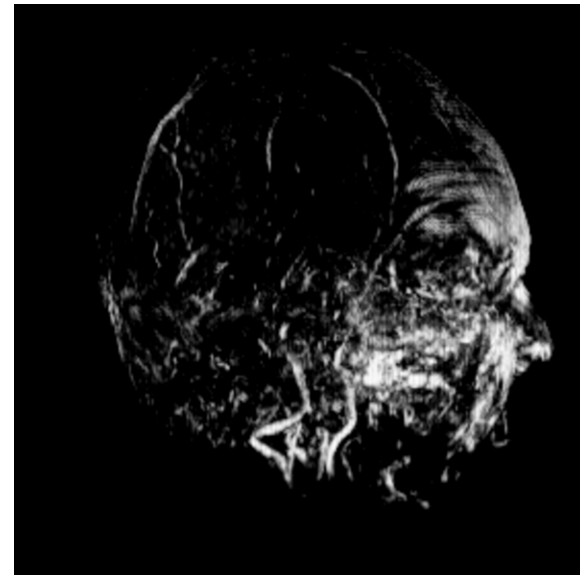
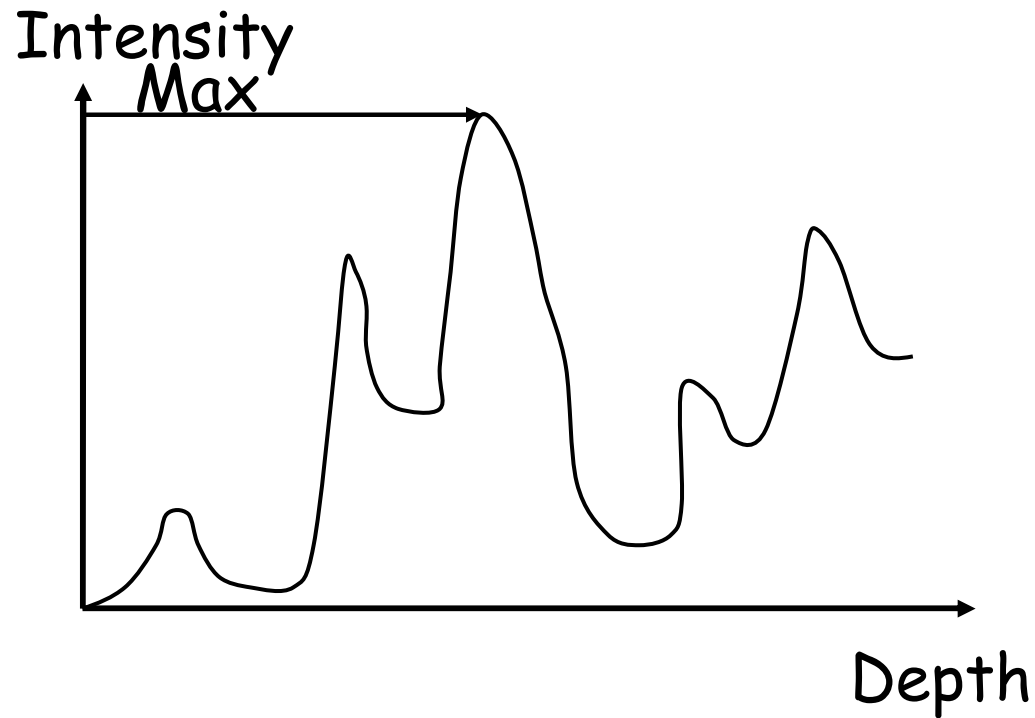
# Ray Traversal - Average

- average: looks like X-ray



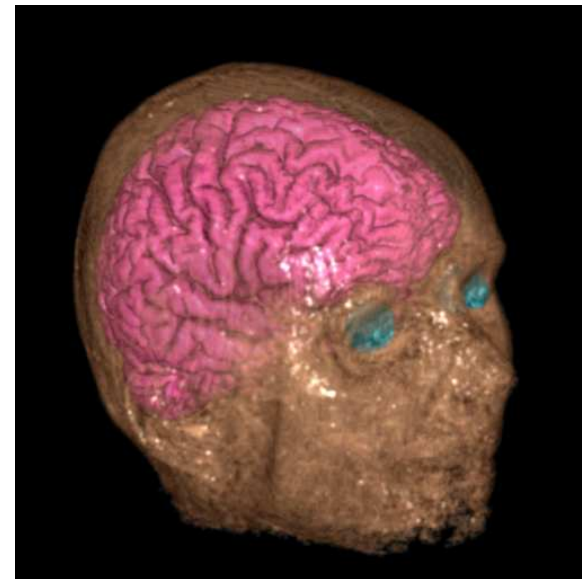
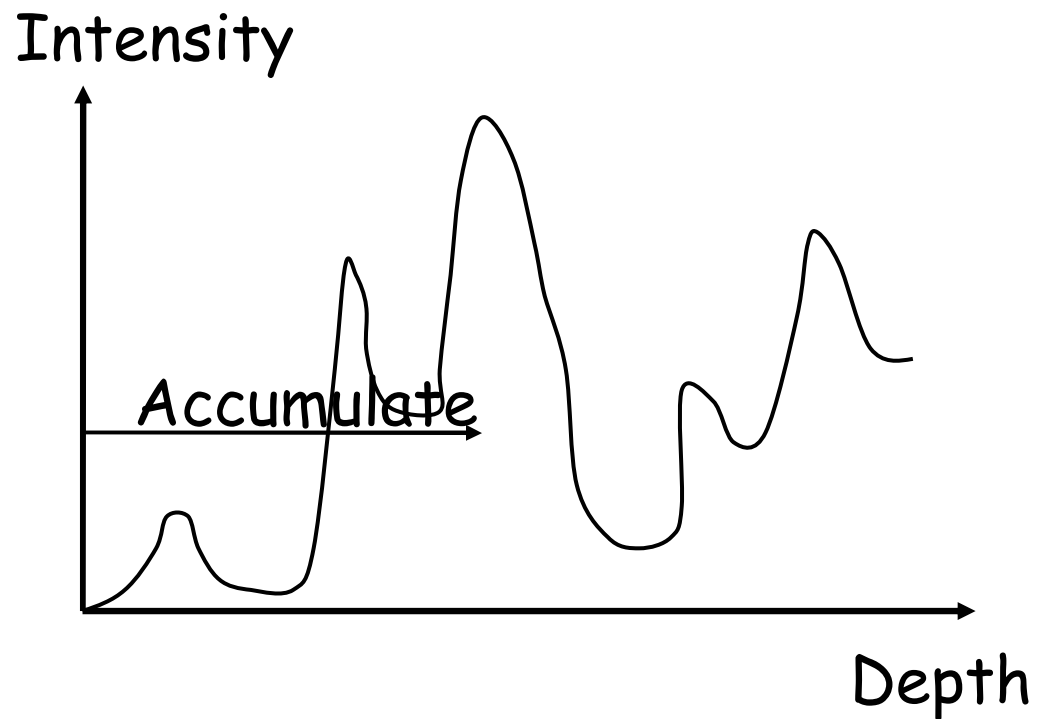
# Ray Traversal - MIP

- max: Maximum Intensity Projection
  - used for Magnetic Resonance Angiogram



# Ray Traversal - Accumulate

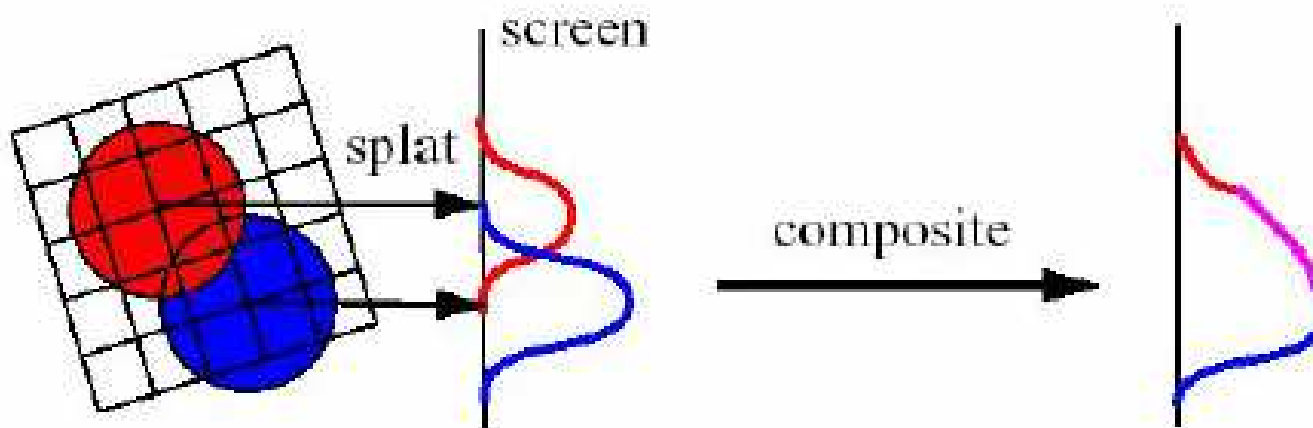
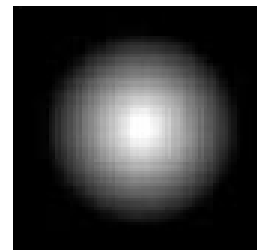
- accumulate: make transparent layers visible





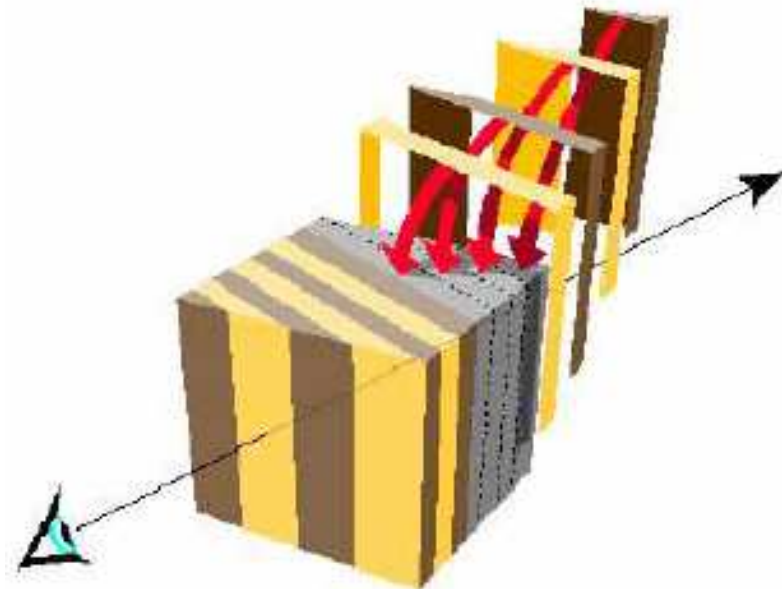
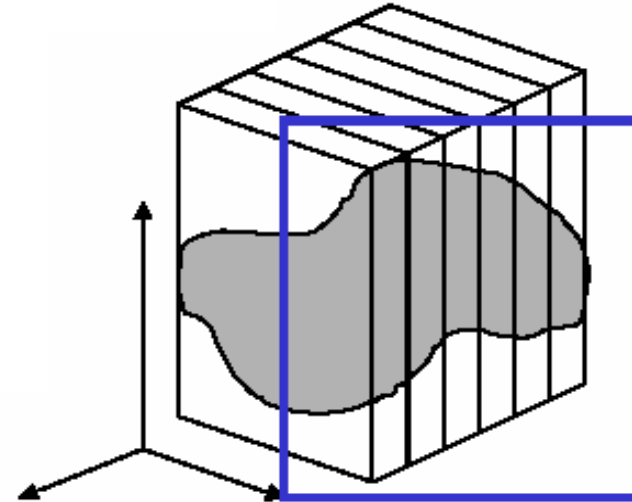
# Splatting

- each voxel represented as fuzzy ball
  - 3D gaussian function
  - RGBa value depends on transfer function
- fuzzy balls projected on screen, leaving footprint called **splat**
  - **composite front to back, in object order**



# Texture Mapping

- 2D: axis aligned 2D textures
  - back to front compositing
  - commodity hardware support
  - must calculate texture coordinates, warp to image plane
- 3D: image aligned 3D texture
  - simple to generate texture coordinates



# Information Visualization

**interactive** visual representation of abstract data

# Interactivity

## static images

- 10,000 years
- art, graphic design

## moving images

- 100 years
- cinematography

## interactive graphics

- 20 years
- computer graphics, human-computer interaction

# Information Visualization

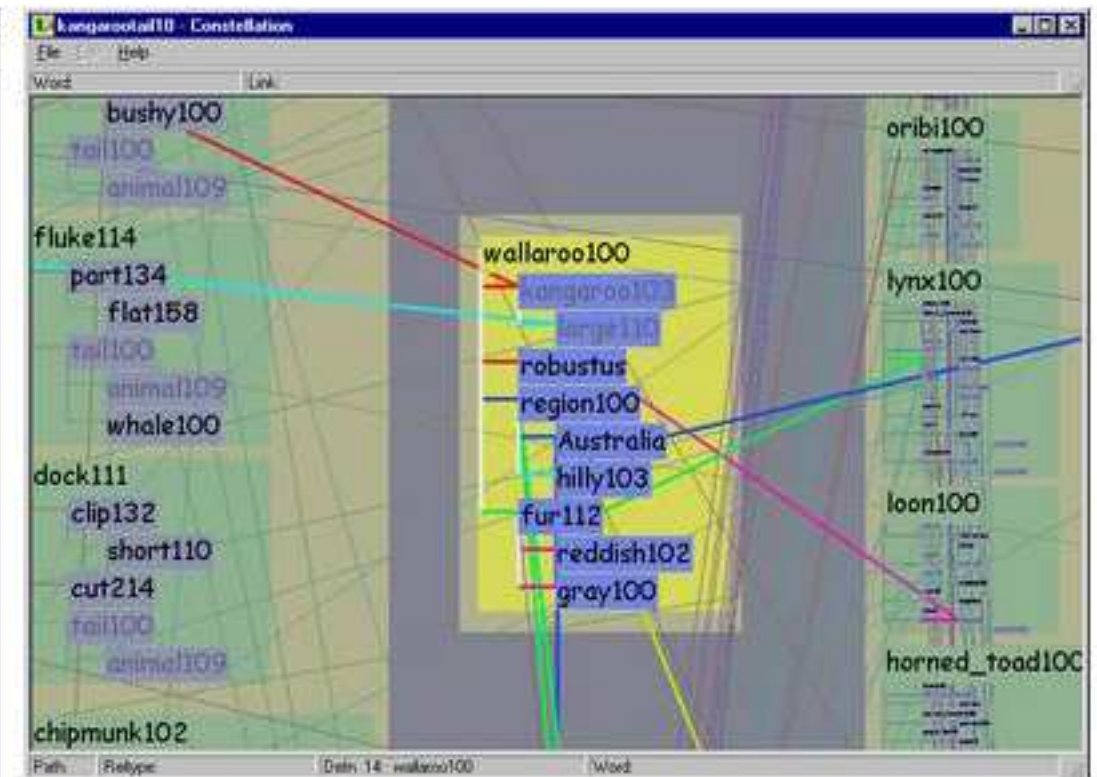
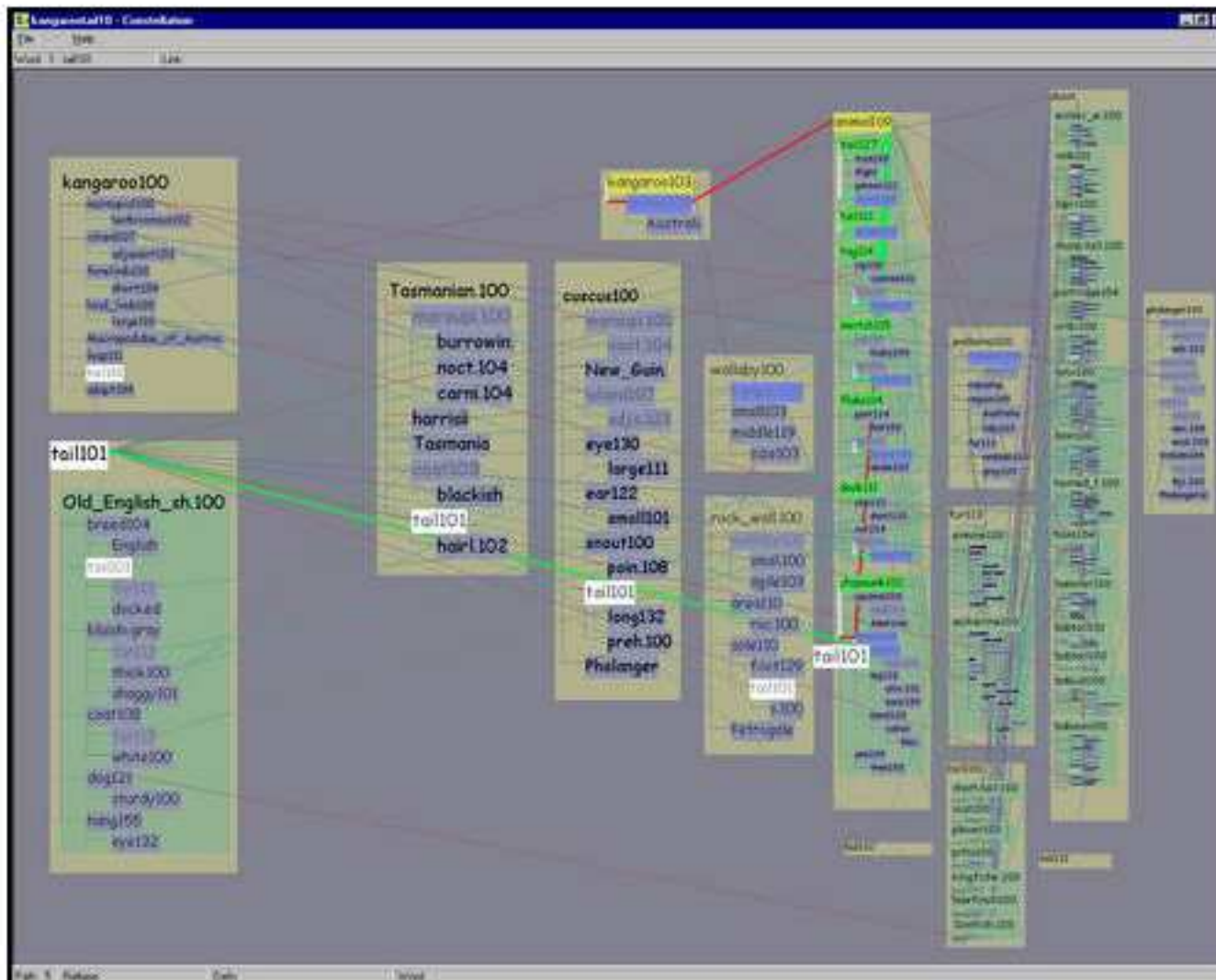
interactive visual representation of abstract data

- help human perform some **task** more effectively

# Task-Oriented Design: Constellation

custom design for checking semantic networks

- reading definition subgraph labels
- following paths through network

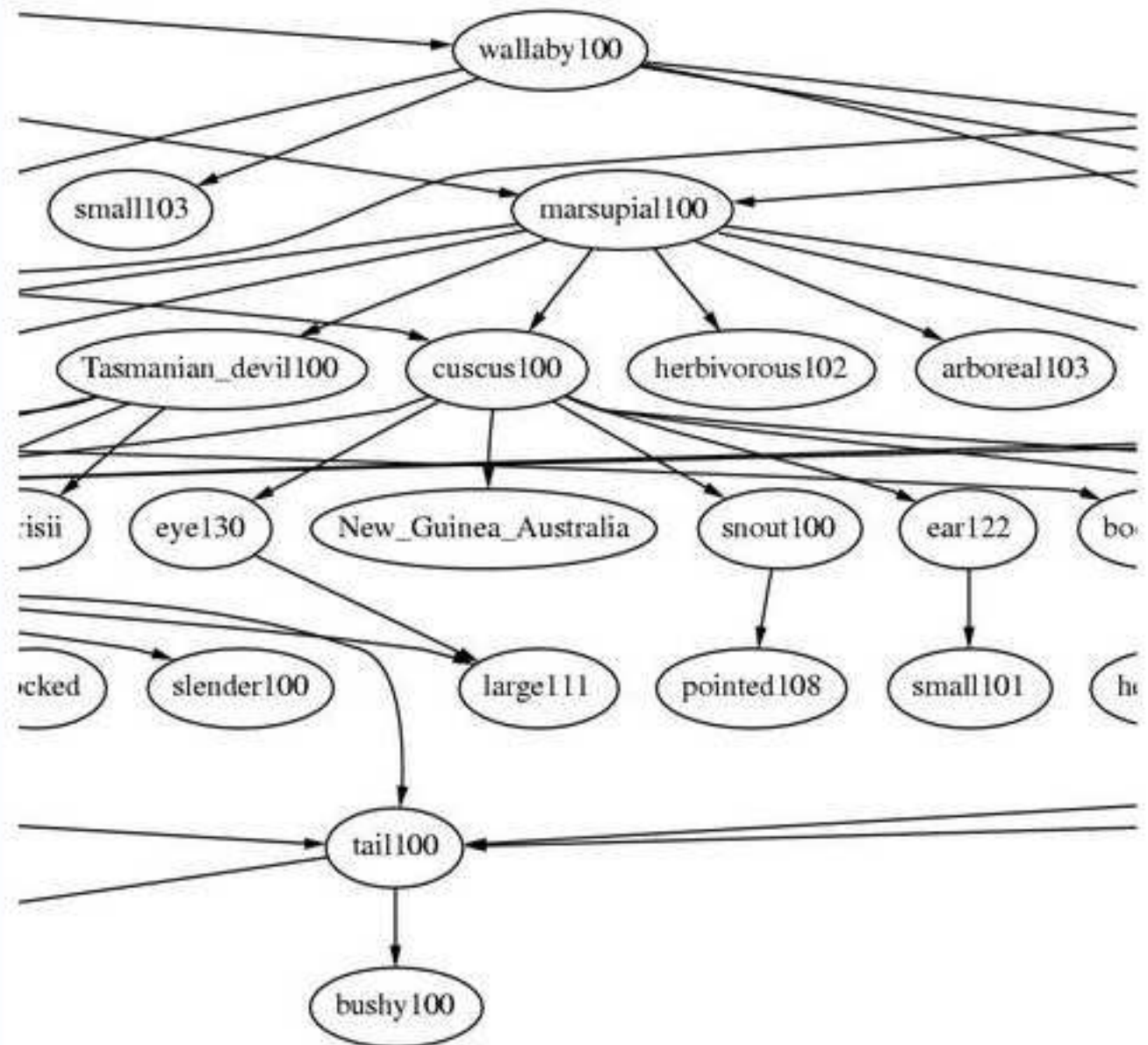
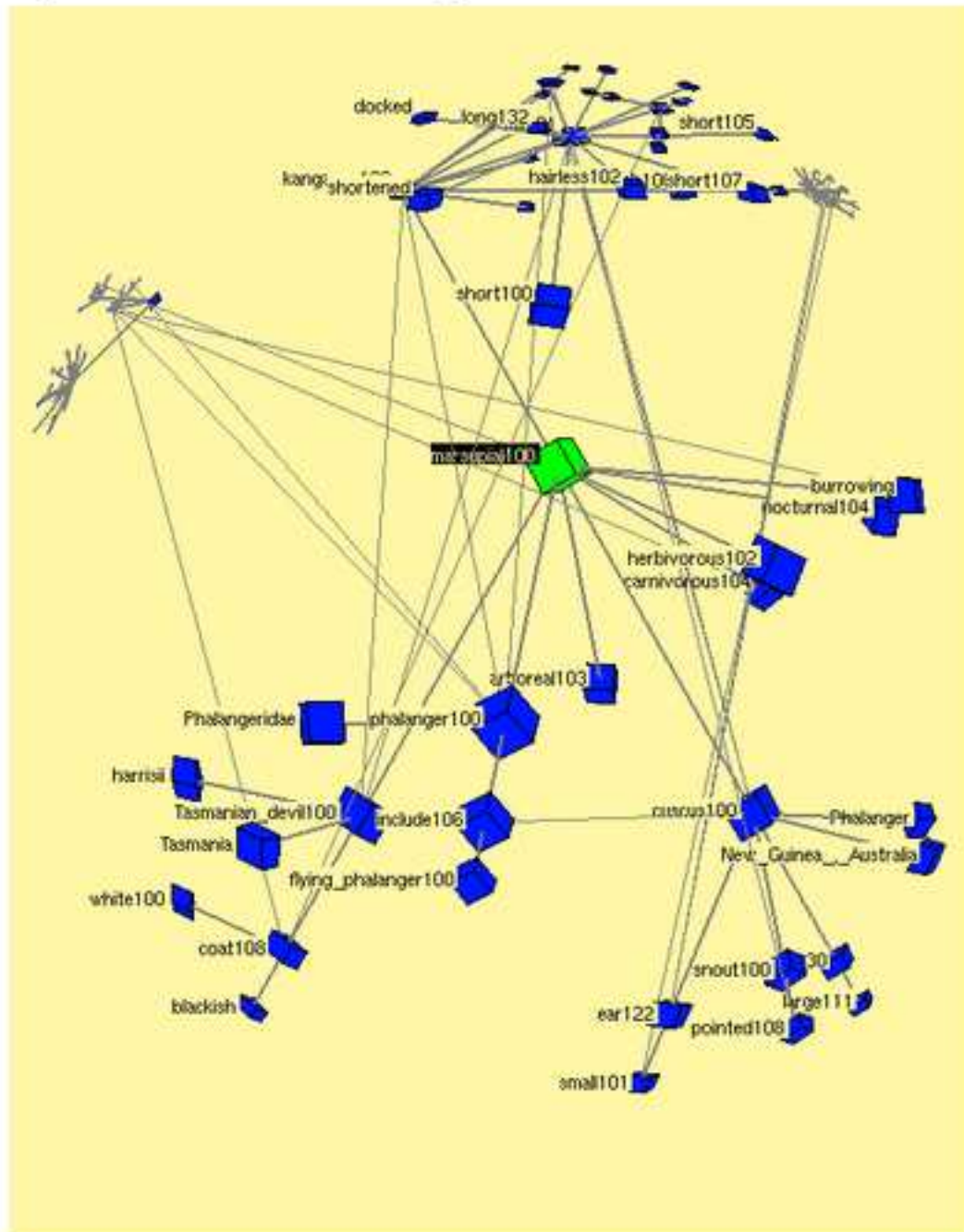


[[graphics.stanford.edu/papers/munzner\\_thesis/html/node10.html#layouteffig](http://graphics.stanford.edu/papers/munzner_thesis/html/node10.html#layouteffig)]



# Task-Oriented Design

previous general methods



[[graphics.stanford.edu/papers/munzner\\_thesis/html/node10.html#dotconstfig](http://graphics.stanford.edu/papers/munzner_thesis/html/node10.html#dotconstfig)]

# Information Visualization

interactive visual representation of abstract data

- help human perform some task more effectively

bridging many fields

- graphics: interacting in realtime
- cognitive psych: finding appropriate representation
- HCI: using task to guide design and evaluation

external representation

- reduces load on working memory
- offload cognition
  
- familiar example: multiplication/division



# External Representation: multiplication

paper

mental buffer

$$\begin{array}{r} 57 \\ \times 48 \\ \hline \hline \end{array}$$

# External Representation: multiplication

paper

mental buffer

$$\begin{array}{r} 57 \\ \times 48 \\ \hline \end{array}$$

$$[ 7 * 8 = 56 ]$$

# External Representation: multiplication

paper

mental buffer

$$\begin{array}{r} 5 \\ 57 \\ \times 48 \\ \hline \end{array}$$

$$[ 7 * 8 = 56 ]$$

6

# External Representation: multiplication

paper

mental buffer

$$\begin{array}{r} 5 \\ 57 \\ \times 48 \\ \hline \end{array}$$

$$[5 * 8 = 40 + 5 = 45]$$

6

# External Representation: multiplication

paper

mental buffer

$$\begin{array}{r} 57 \\ \times 48 \\ \hline \end{array}$$

$$[5 * 8 = 40 + 5 = 45]$$

456

# External Representation: multiplication

paper

mental buffer

$$\begin{array}{r} 57 \\ \times 48 \\ \hline \end{array}$$

$$[7*4=28]$$

456

# External Representation: multiplication

paper

mental buffer

$$\begin{array}{r} 2 \\ 57 \\ \times 48 \\ \hline \end{array}$$

$$[7*4=28]$$

$$\begin{array}{r} 456 \\ 8 \end{array}$$

# External Representation: multiplication

paper

mental buffer

$$\begin{array}{r} 2 \\ 57 \\ \times 48 \\ \hline \end{array}$$

$$[5 * 4 = 20 + 2 = 22]$$

$$\begin{array}{r} 456 \\ 8 \end{array}$$



# External Representation: multiplication

paper

mental buffer

$$\begin{array}{r} 57 \\ \times 48 \\ \hline \end{array}$$

$$[5 * 4 = 20 + 2 = 22]$$

$$\begin{array}{r} 456 \\ 228 \end{array}$$

# External Representation: multiplication

paper

mental buffer

$$\begin{array}{r} 57 \\ \times 48 \\ \hline \end{array}$$

$$\begin{array}{r} 456 \\ 228 \\ \hline 6 \end{array}$$

# External Representation: multiplication

paper

mental buffer

$$\begin{array}{r} 57 \\ \times 48 \\ \hline \end{array}$$

$$\begin{array}{r} 456 \\ 228 \\ \hline 6 \end{array}$$

$$[8+5 = 13]$$

# External Representation: multiplication

paper

mental buffer

$$\begin{array}{r} 57 \\ \times 48 \\ \hline 1 \\ 456 \\ 228 \phantom{0} \\ \hline 36 \end{array}$$

$$[8+5 = 13]$$

# External Representation: multiplication

paper

mental buffer

$$\begin{array}{r} 57 \\ \times 48 \\ \hline 1 \\ 456 \\ 228 \phantom{0} \\ \hline 36 \end{array}$$

$$[4 + 2 + 1 = 7]$$

# External Representation: multiplication

paper

mental buffer

$$\begin{array}{r} 57 \\ \times 48 \\ \hline \end{array}$$

$$\begin{array}{r} 456 \\ 258 \\ \hline 736 \end{array}$$

$$[4+2+1=7]$$

# External Representation: multiplication

paper

mental buffer

$$\begin{array}{r} 57 \\ \times 48 \\ \hline \end{array}$$

$$\begin{array}{r} 456 \\ 258\text{---} \\ \hline 2736 \end{array}$$

# Information Visualization

interactive visual representation of abstract data

- help human perform some task more effectively

bridging many fields

- graphics: interacting in realtime
- cognitive psych: finding appropriate representation
- HCI: using task to guide design and evaluation

external representation

- reduces load on working memory
- offload cognition
  
- familiar example: multiplication/division
- infovis example: topic graphs



# External Representation: Topic Graphs

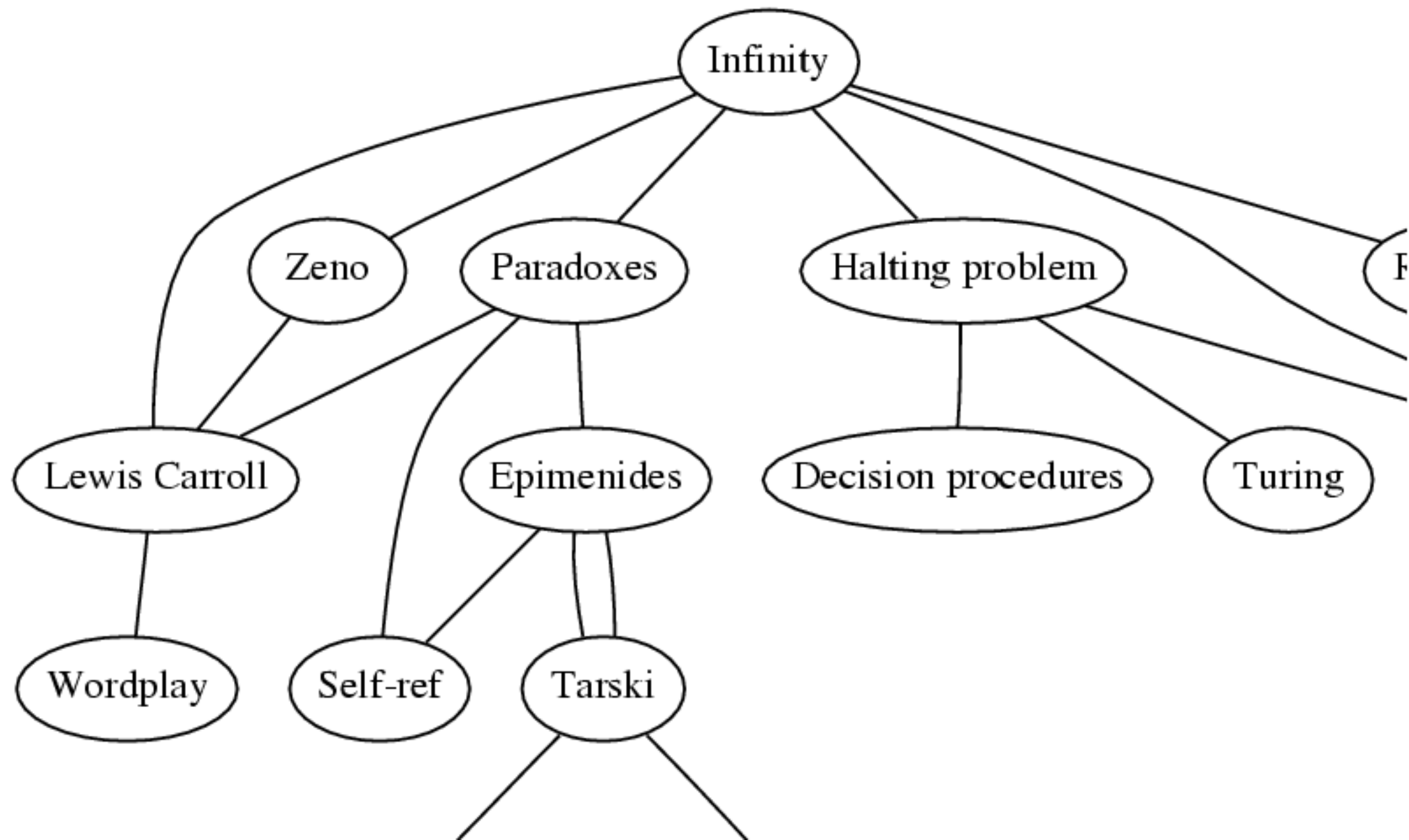
[Godel, Escher, Bach. Hofstadter 1979]

Paradoxes – Lewis Carroll  
Turing – Halting problem  
Halting problem – Infinity  
Paradoxes – Infinity  
Infinity – Lewis Carroll  
Infinity – Unpredictably long searches  
Infinity – Recursion  
Infinity – Zeno  
Infinity – Paradoxes  
Lewis Carroll – Zeno  
Lewis Carroll – Wordplay

Halting problem – Decision procedures  
BlooP and FlooP – AI  
Halting problem – Unpredictably long searches  
BlooP and FlooP – Unpredictably long searches  
BlooP and FlooP – Recursion  
Tarski – Truth vs. provability  
Tarski – Epimenides  
Tarski – Undecidability  
Paradoxes – Self-ref  
[...]

# External Representation: Topic Graphs

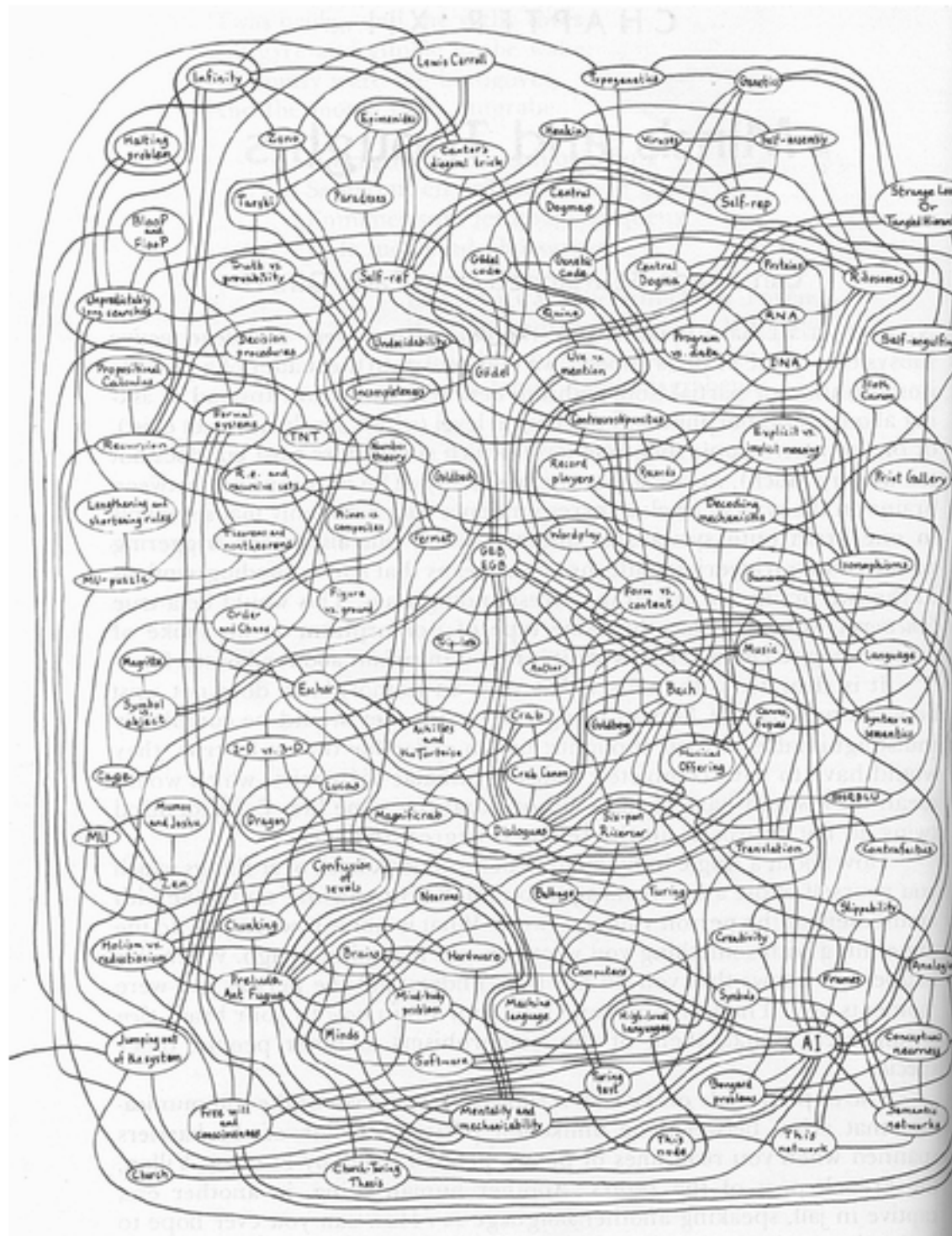
offload cognition to visual systems  
minimal attention to read answer



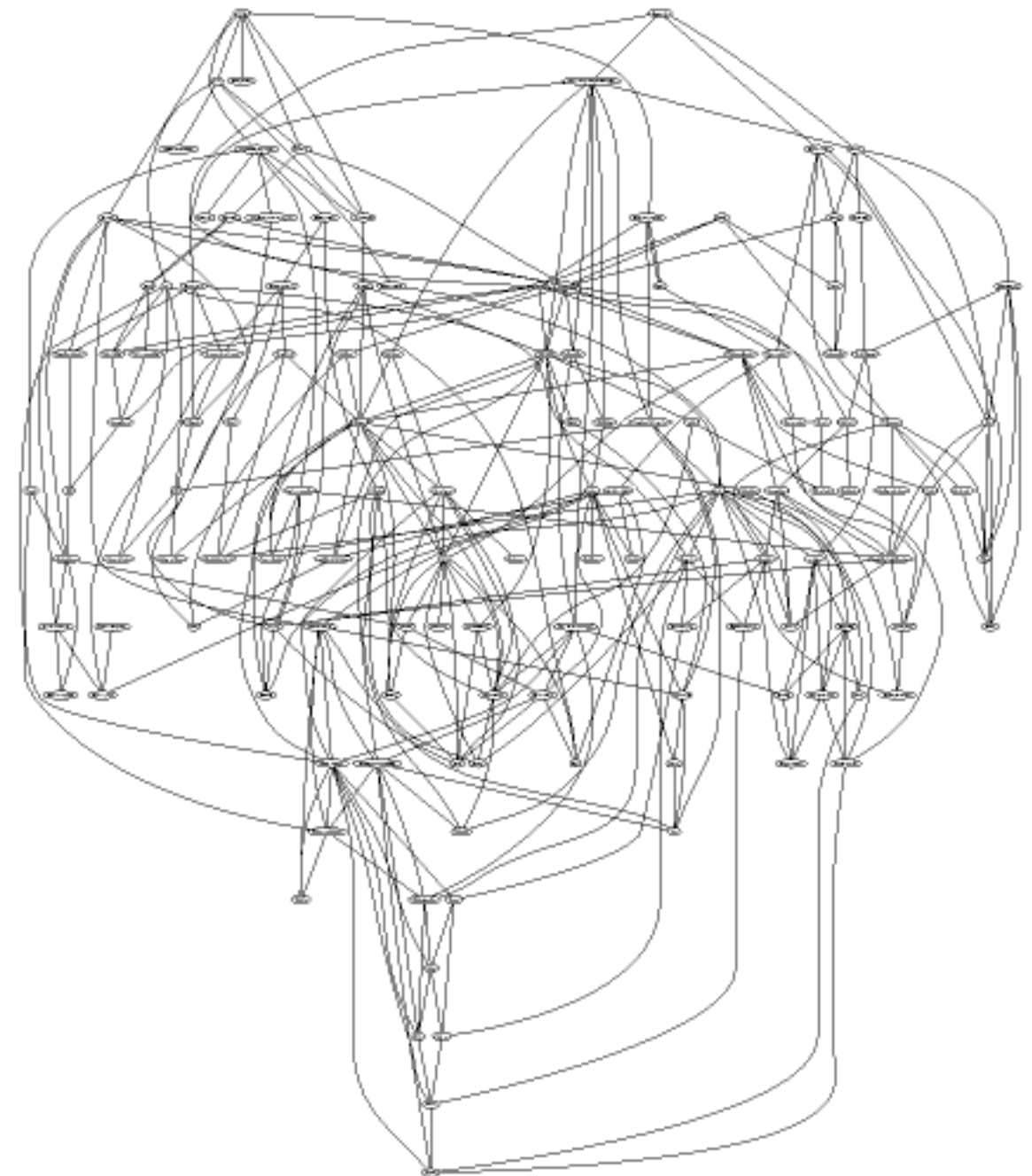
# External Rep: Automatic Layout

manual: hours, days

automatic: seconds



[Godel, Escher, Bach. Hofstadter 79]



dot, [Gansner et al 93]

# InfoVis vs. SciVis

is spatialization **given** (scivis) or **chosen** (infovis)

- my definition

names are unfortunate historical accidents

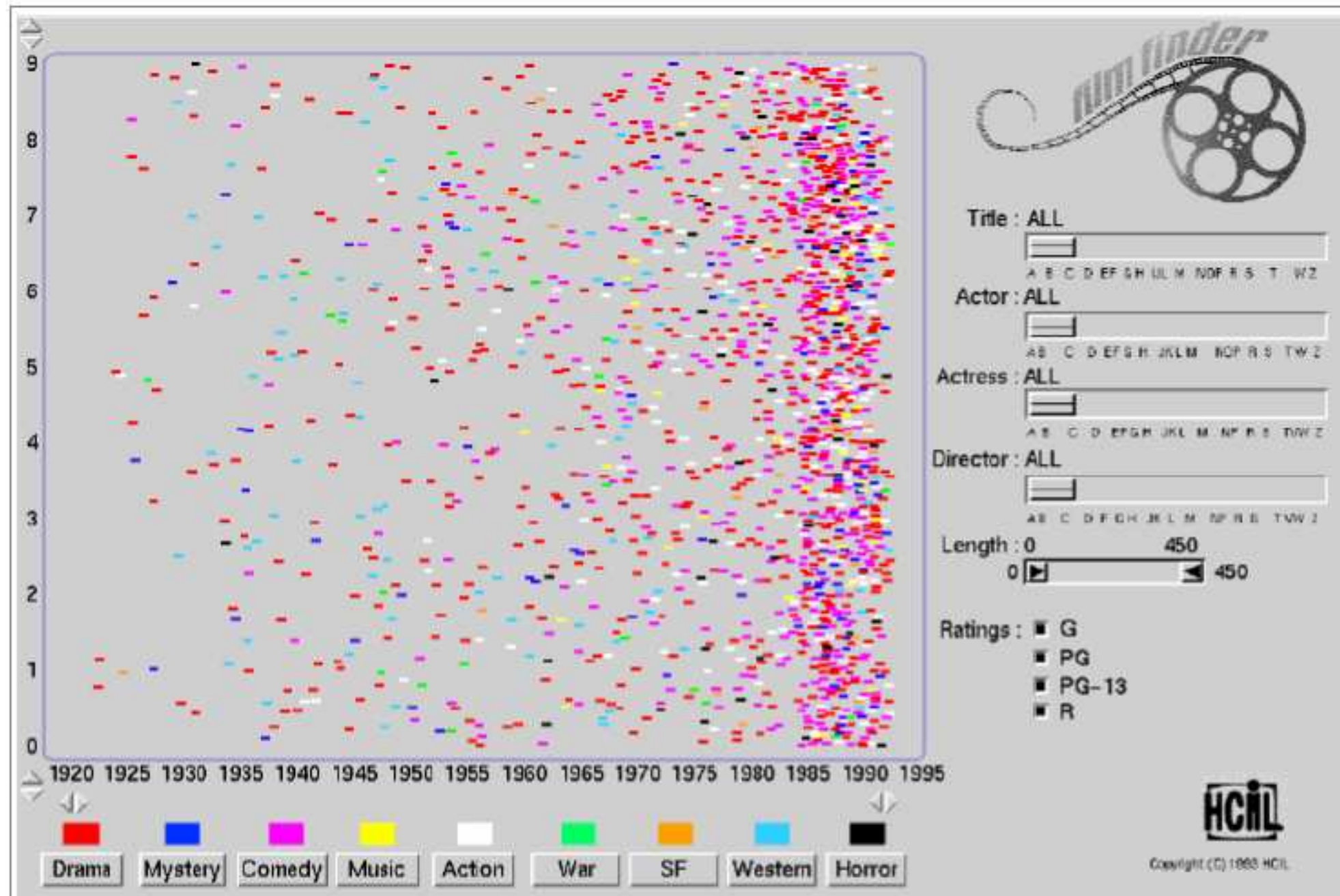
- **not** scivis iff data generated by scientists
- infovis not unscientific
- scivis not uninformative
- but – too late to change

infovis: how to represent

- choosing, doing, evaluating
- huge space of possibilities: random walk ineffective
- need design guidelines



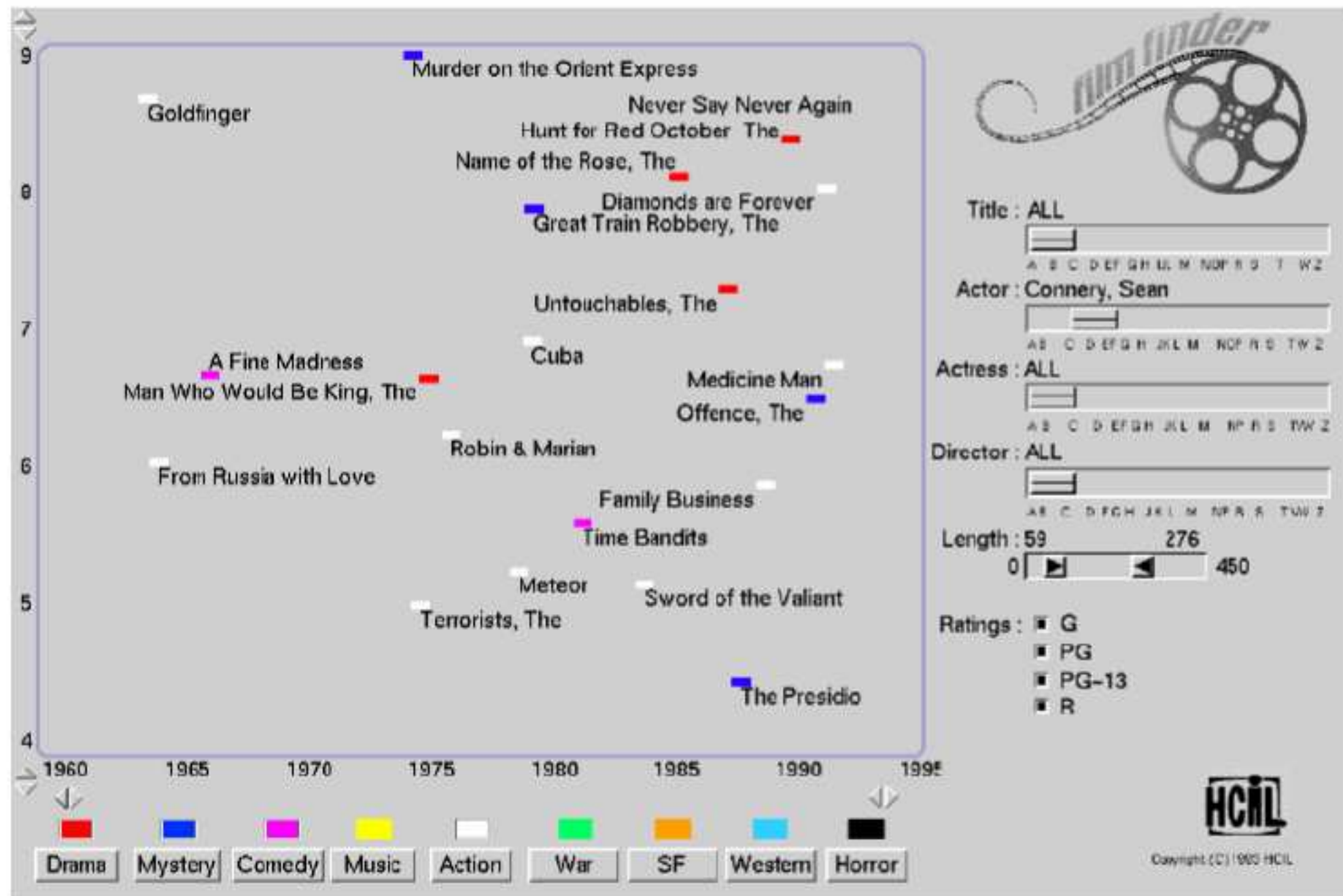
# Overviews: mantra overview



Ahlberg & Shneiderman, Color plate 1. The FilmFinder.

# Overviews: mantra

## overview, zoom and filter

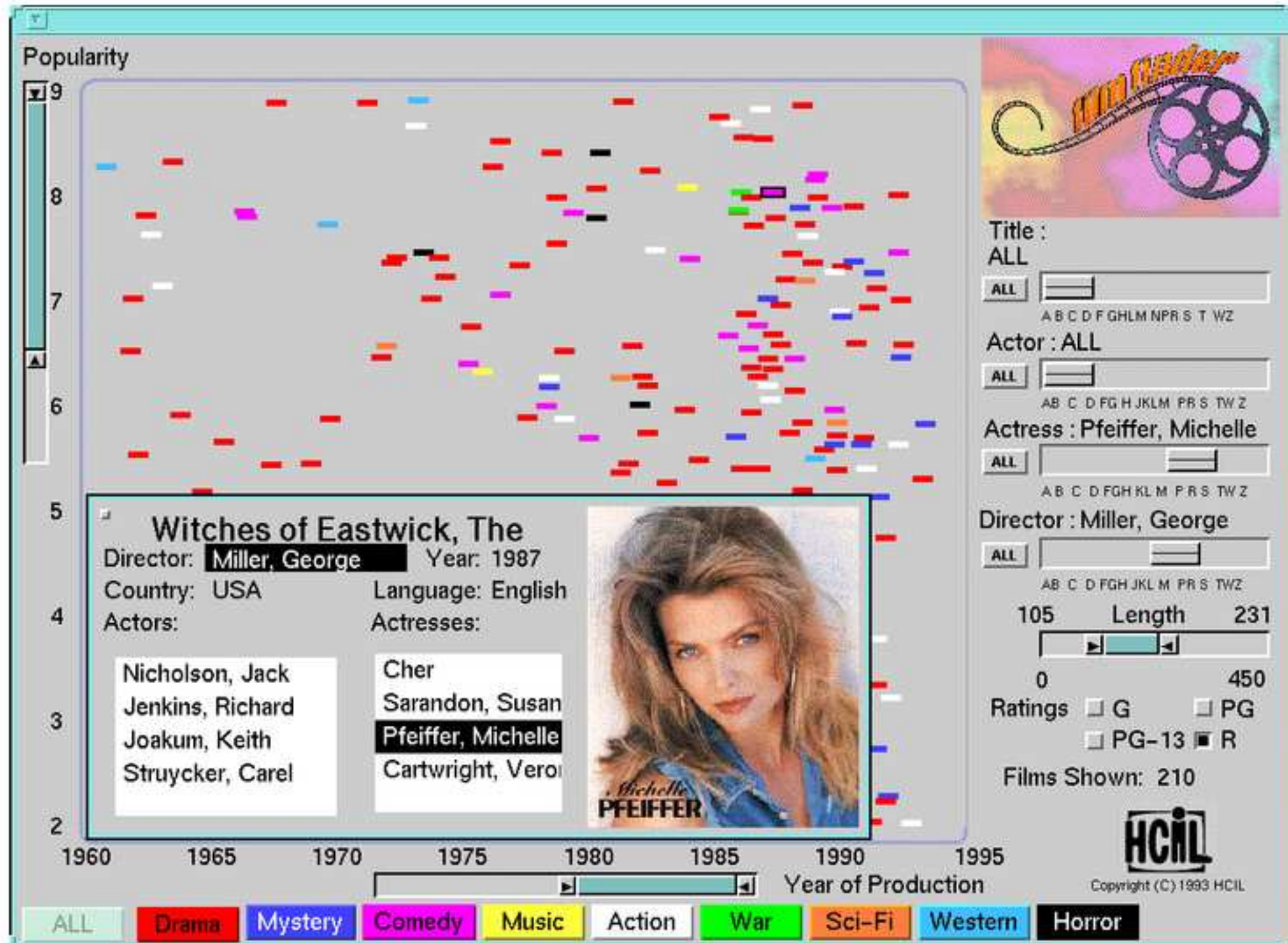


Ahlberg & Shneiderman, Color plate 2. Categories have been selected, the displayed is zoomed



# Overviews: mantra

overview, zoom and filter, details-on-demand



# Overviews: Shneiderman mantra

overview first,  
then zoom and filter,  
details-on-demand

The Eyes Have It: A Task by Data Type Taxonomy for Information Visualizations.  
Ben Shneiderman, Proc. 1996 IEEE Visual Languages, also Maryland HCIL TR 96-13  
<ftp://ftp.cs.umd.edu/pub/hcil/Reports-Abstracts-Bibliography/96-13html/96-13.html>



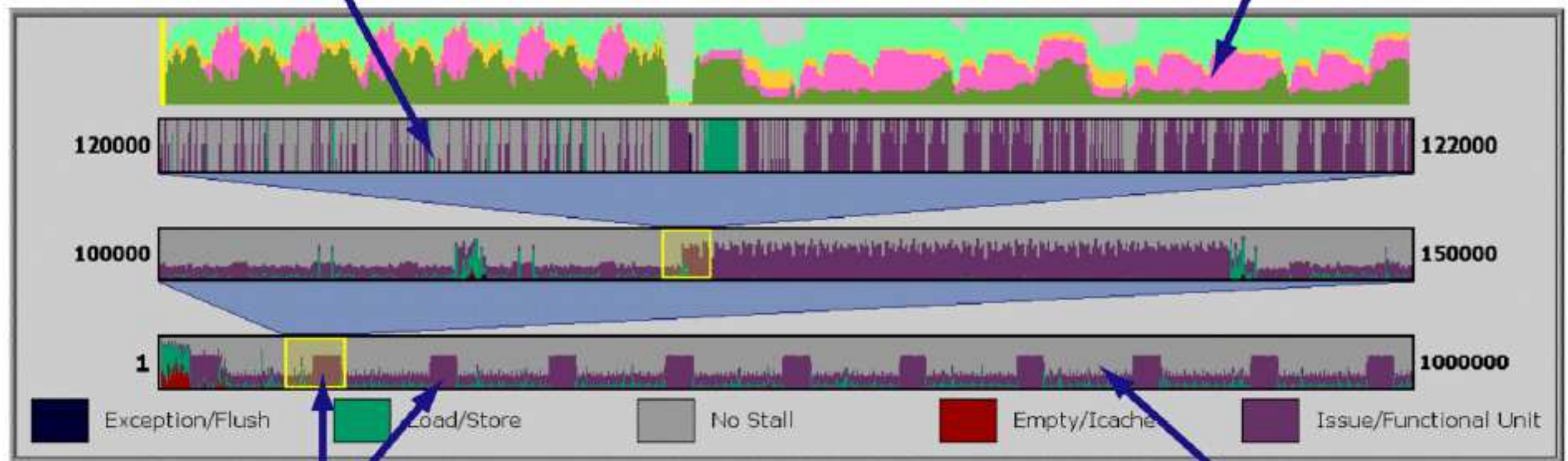
# Overviews: Rivet

## performance tuning

- levels of detail

③ We are able to focus the area of interest to 2000 cycles – few enough cycles that we can use animation for further investigation.

④ The instruction mix chart lets us see what types of instructions are in the pipeline during the time interval of interest.



② There are periods of increased pipeline stall throughout the execution

① The overview displays stall and throughput information for the entire execution.



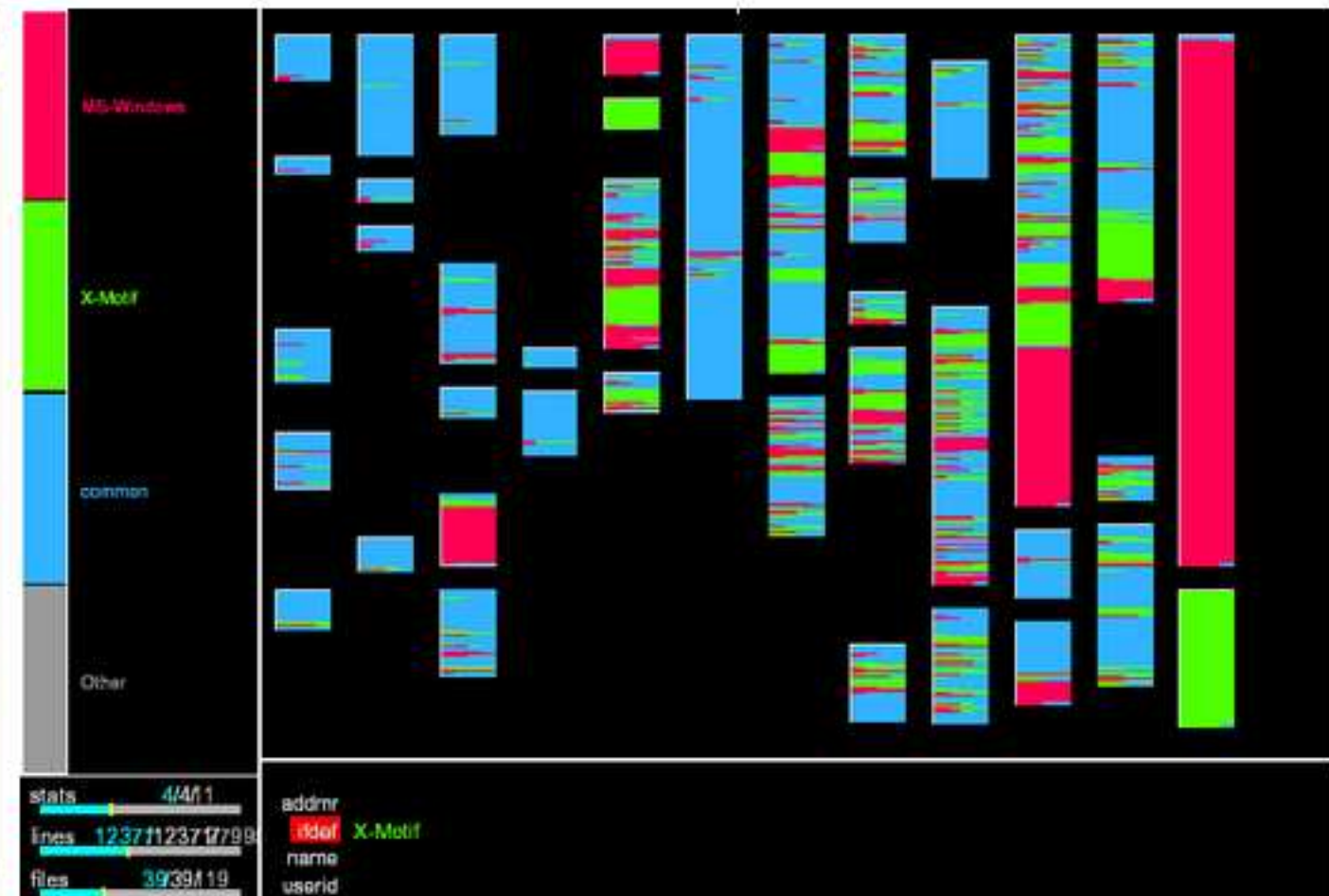
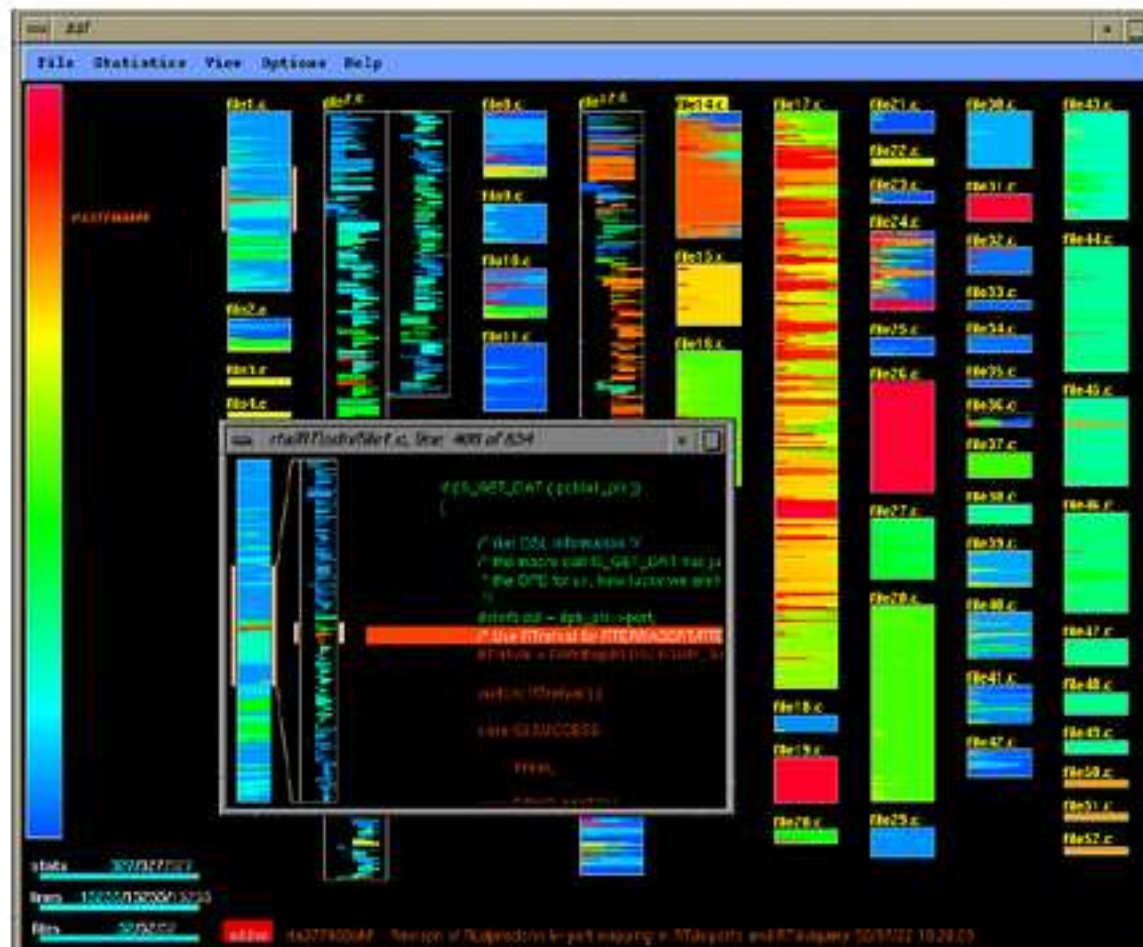
# Overviews: SeeSoft

software maintenance

- colored lines of code -> lines one pixel high

code age

platform dependencies



[Ball and Eick, Software Visualization in the Large, Computer 29:4, 1996  
[citeseer.nj.nec.com/ball96software.html](http://citeseer.nj.nec.com/ball96software.html)]

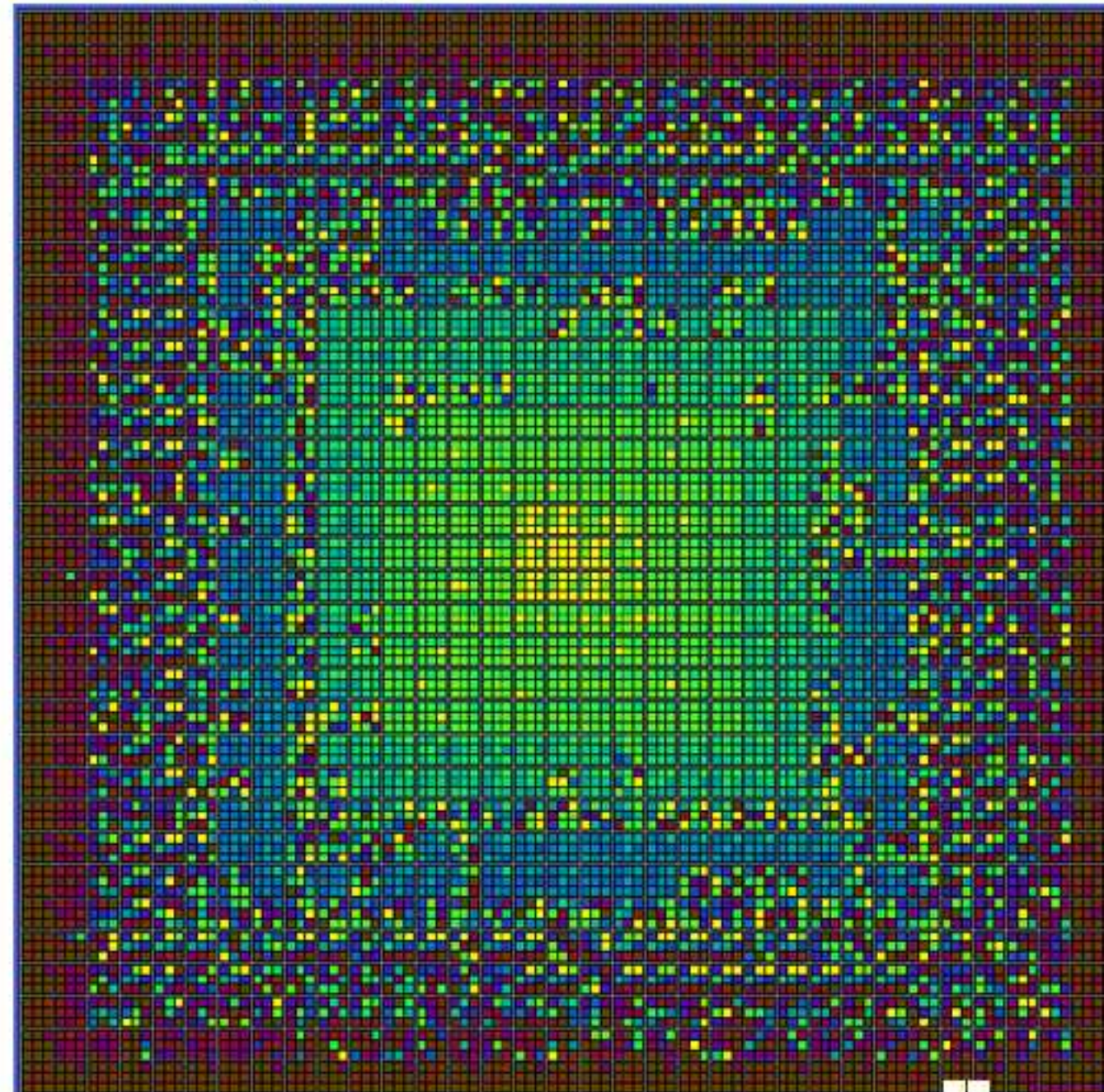
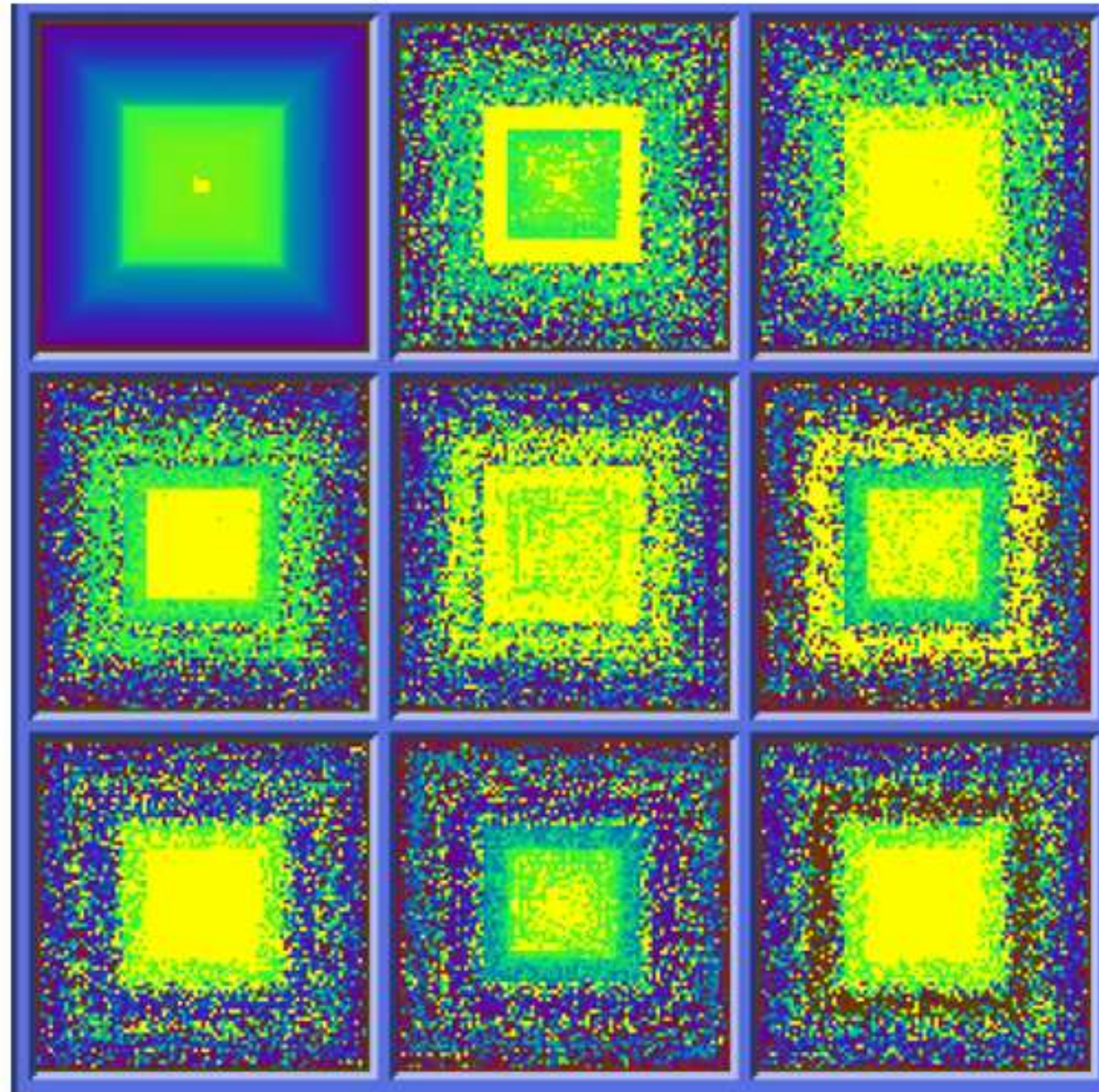


# Overviews: VisDB

database queries

separate attributes

grouped attributes



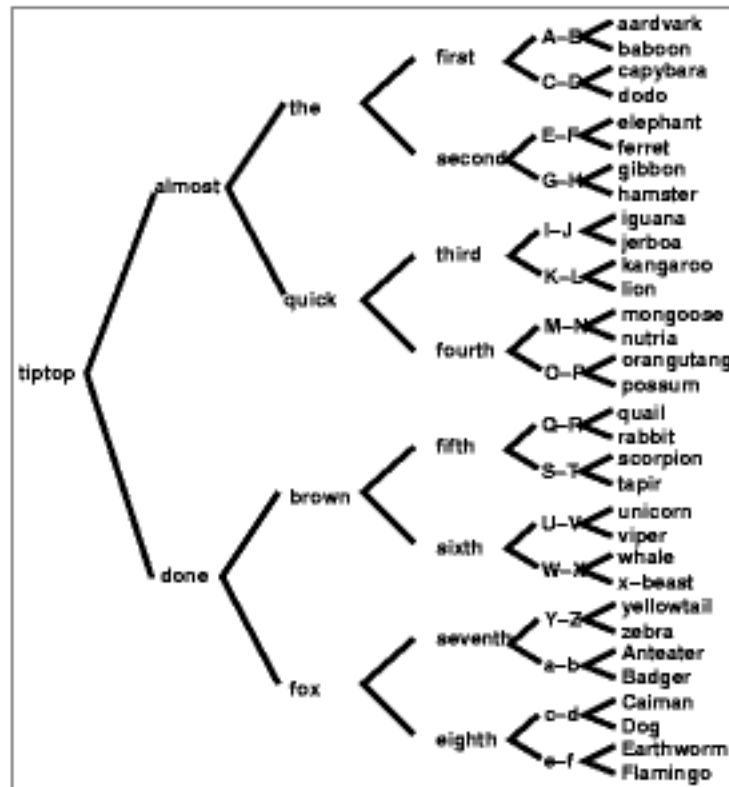


# Overview+Detail

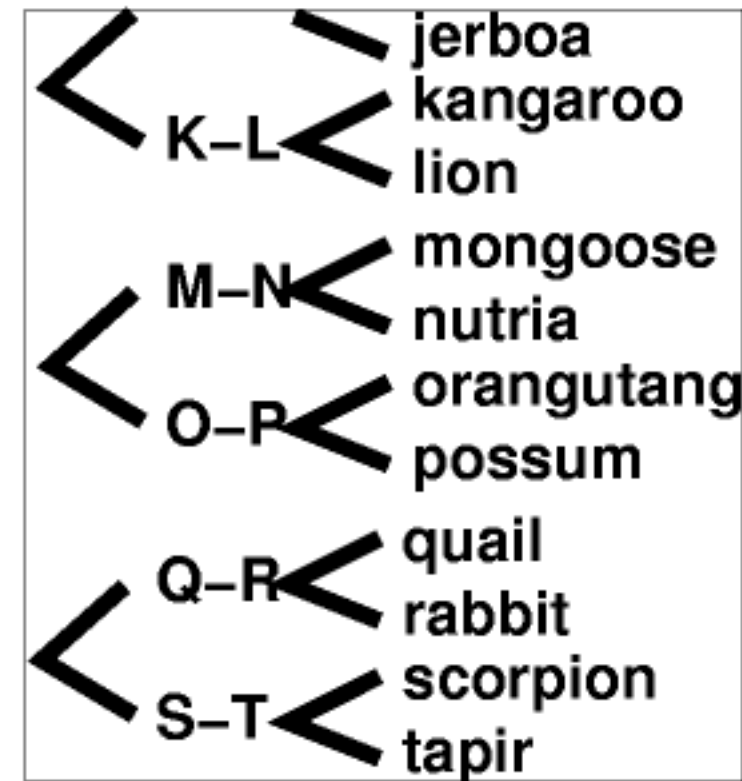
## problem

- avoid user disorientation when inspecting detail
- hard for big datasets

bad: one window, must remember position



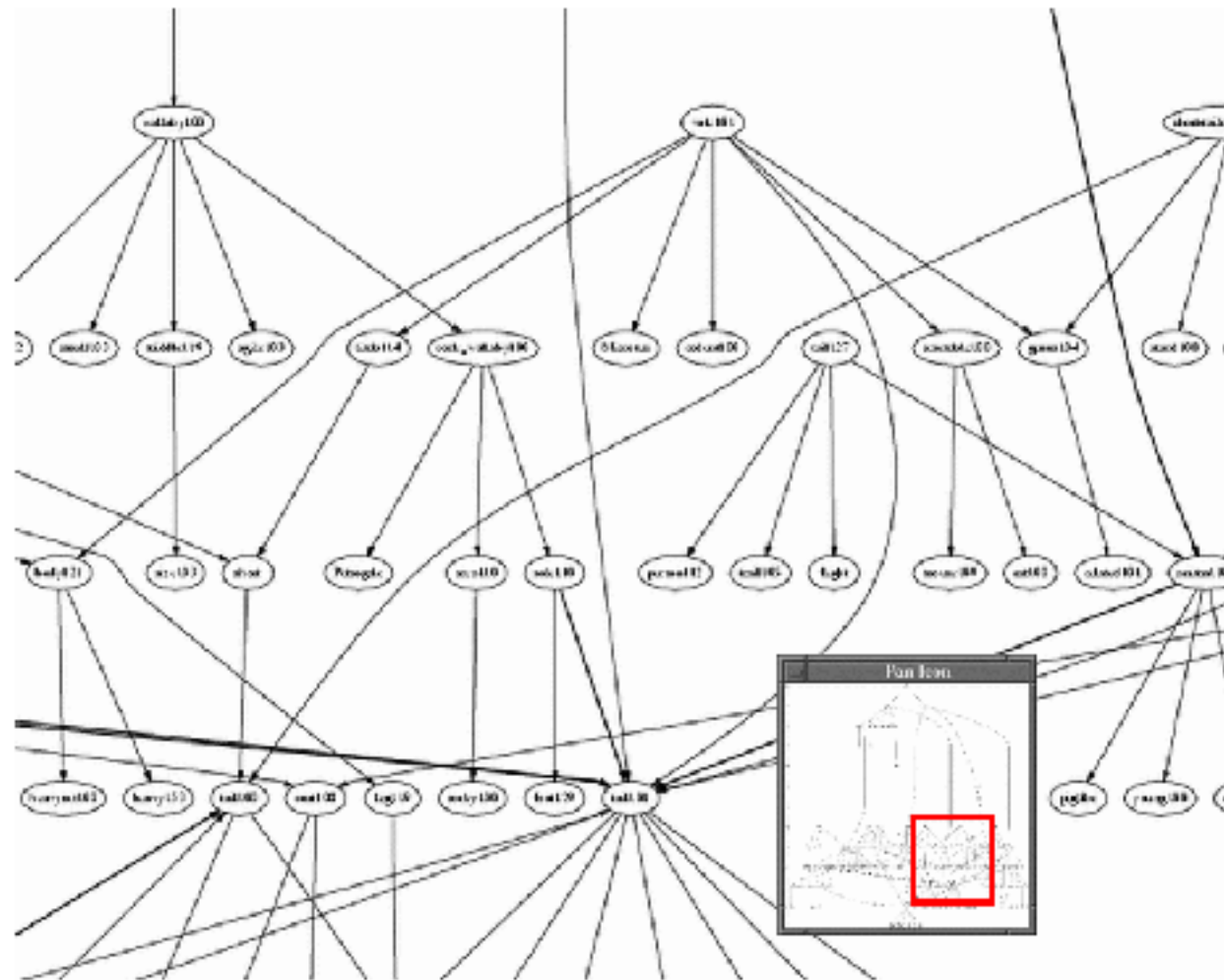
global overview



local detail

# Overview+Detail

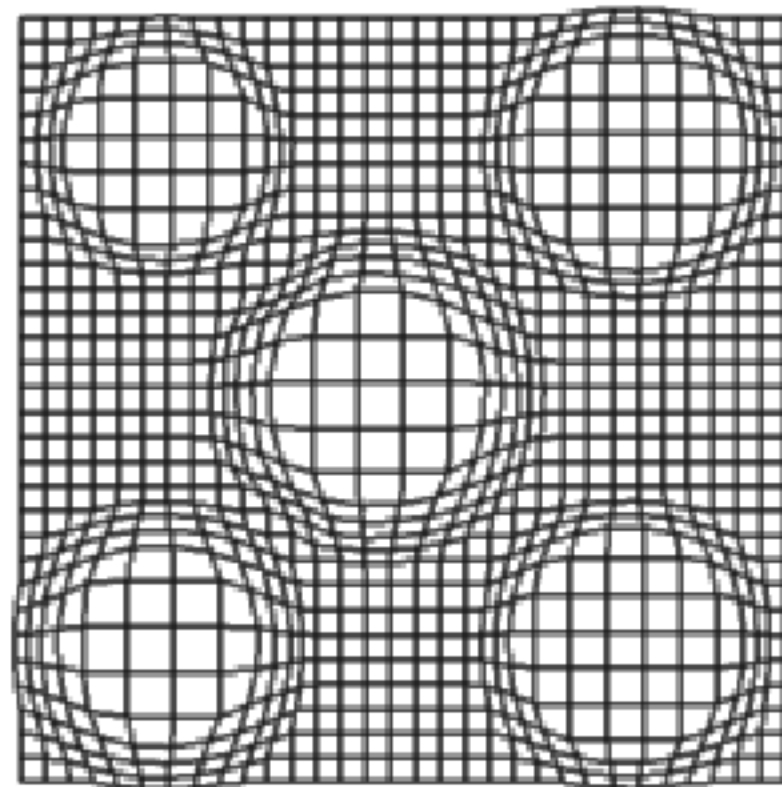
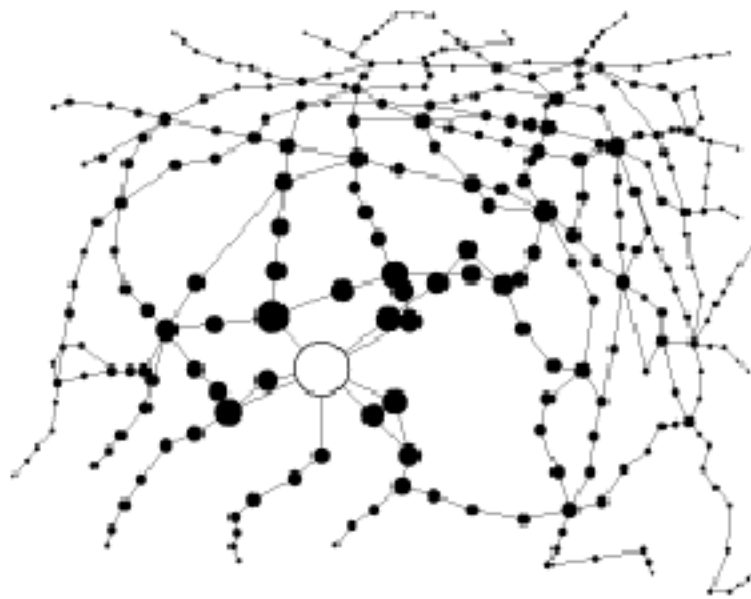
better: add linked overview window(s)  
problem: still cognitive load to correlate



# Focus+Context

merge overview, detail into single window

- fisheye views [Furnas 86], [Sarkar et al 94]
- nonlinear magnification [Keahey 96]



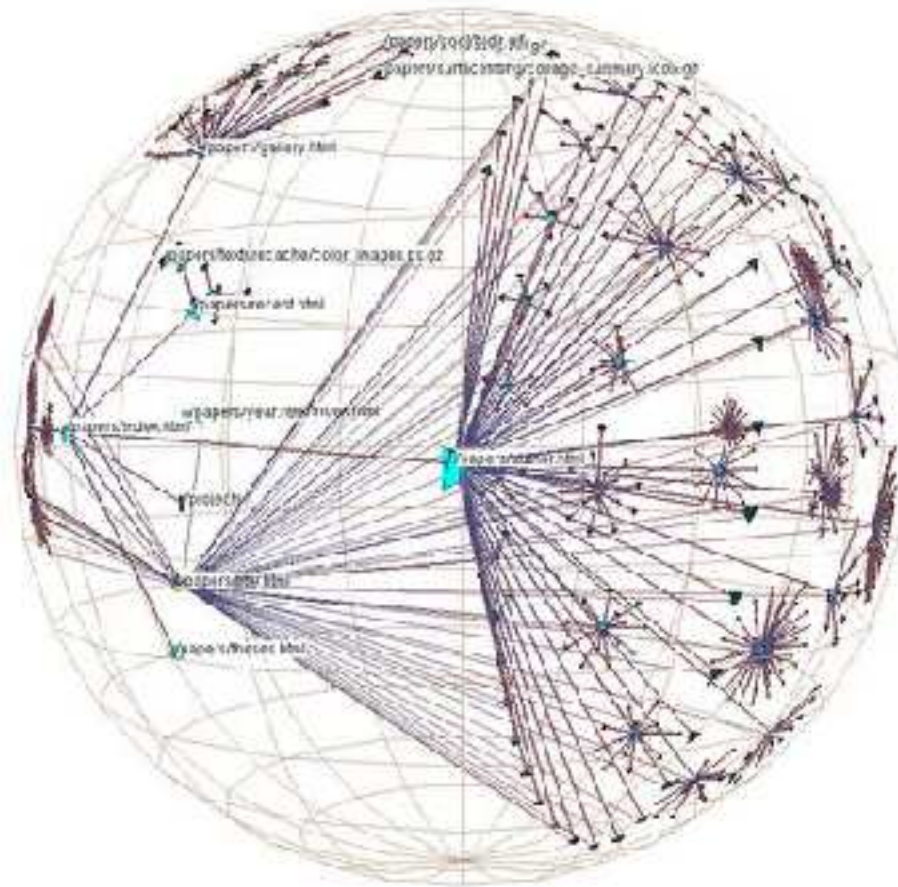




# Focus+Context: H3

fish-eye effect from 3D hyperbolic geometry

- [demo: [graphics.stanford.edu/~munzner/h3](http://graphics.stanford.edu/~munzner/h3)]



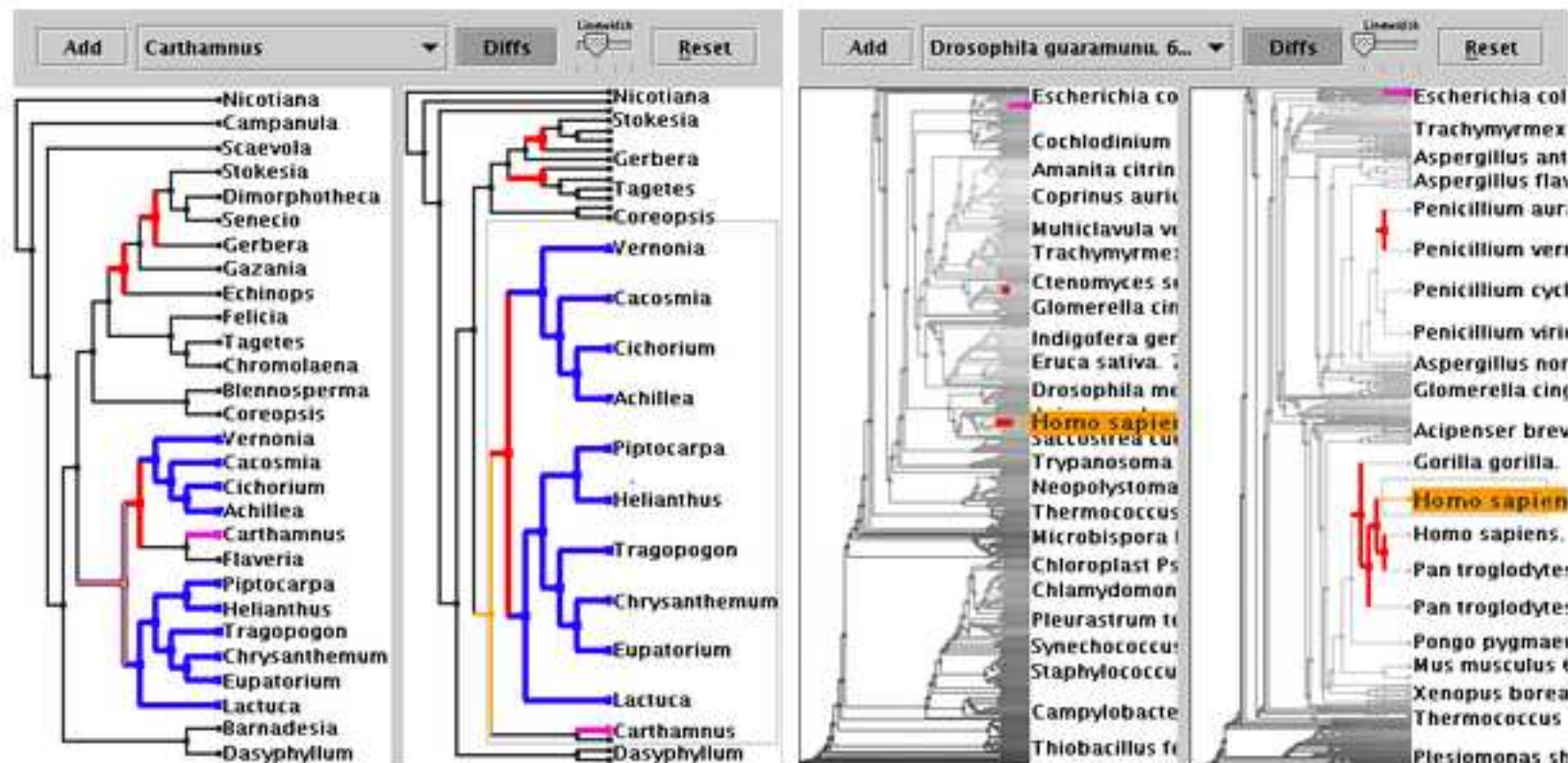
[Tamara Munzner. H3: Laying Out Large Directed Graphs in 3D Hyperbolic Space. Proc. InfoVis 1997. [graphics.stanford.edu/papers/h3](http://graphics.stanford.edu/papers/h3)]



# Focus+Context: TreeJuxtaposer

stretch and squish "rubber sheet"  
guaranteed visibility

- keeping highlighted marks visible at all times
- [demo: [olduvai.sf.net/tj](http://olduvai.sf.net/tj)]

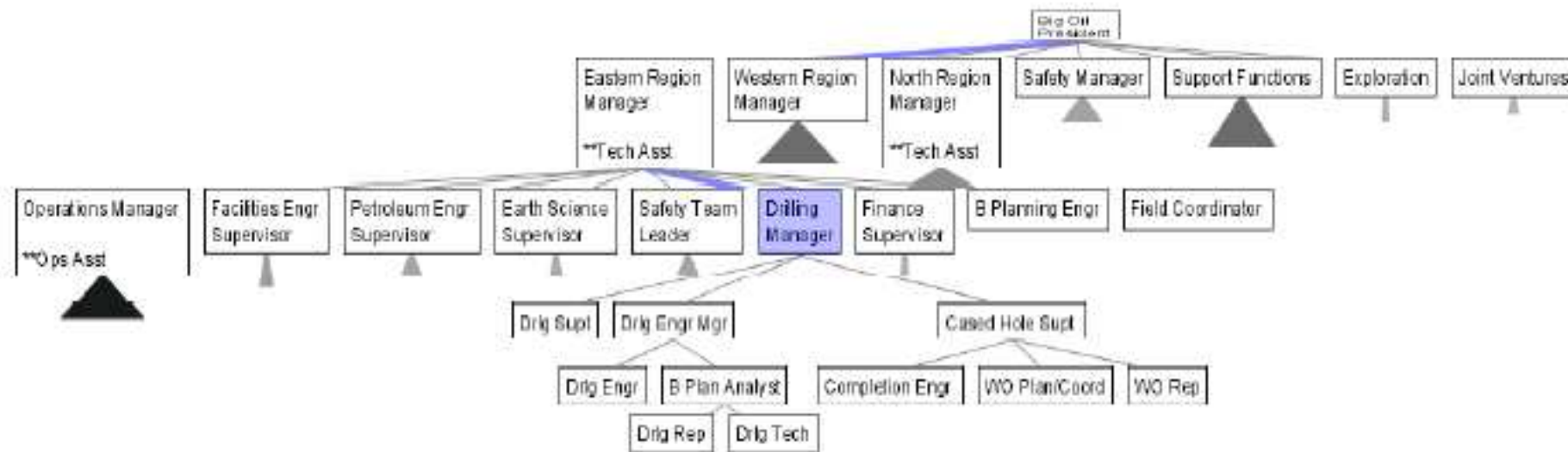


[Tree]Juxtaposer: Scalable Tree Comparison using Focus+Context with Guaranteed Visibility.  
Munzner et al. SIGGRAPH 2003. [www.cs.ubc.ca/~tmm/papers/tj](http://www.cs.ubc.ca/~tmm/papers/tj)

# Focus+Context: SpaceTree

interactively expand/contract

- not stretching space
- [demo: [www.cs.umd.edu/hcil/spacetree](http://www.cs.umd.edu/hcil/spacetree)]

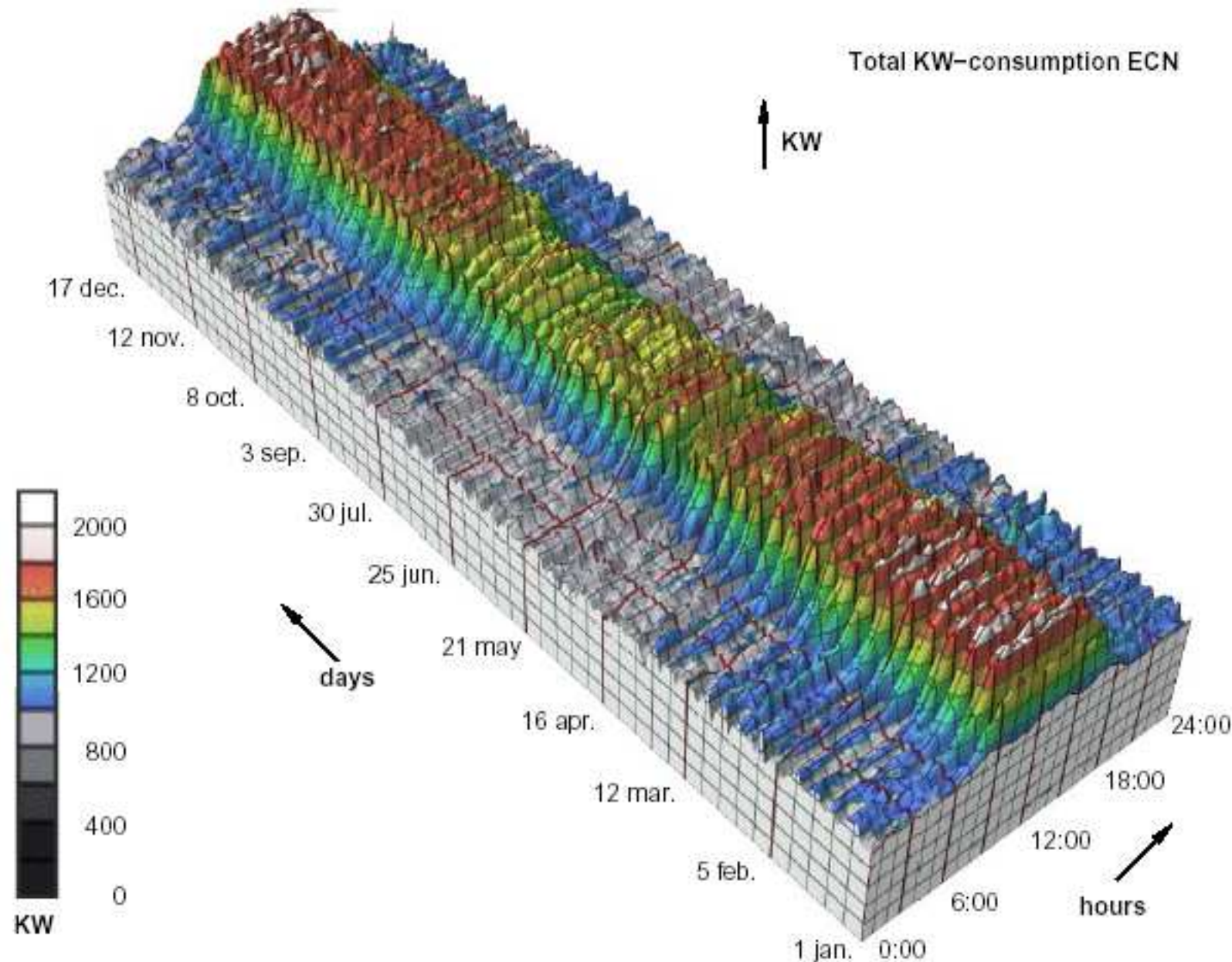


[SpaceTree. Catherine Plaisant, Jesse Grosjean and Ben B. Bederson. Proc. InfoVis 2002  
<ftp://ftp.cs.umd.edu/pub/hcil/Reports-Abstracts-Bibliography/2002-05html/2002-05.pdf>]



# 3D Extrusion: Obvious but Nonoptimal

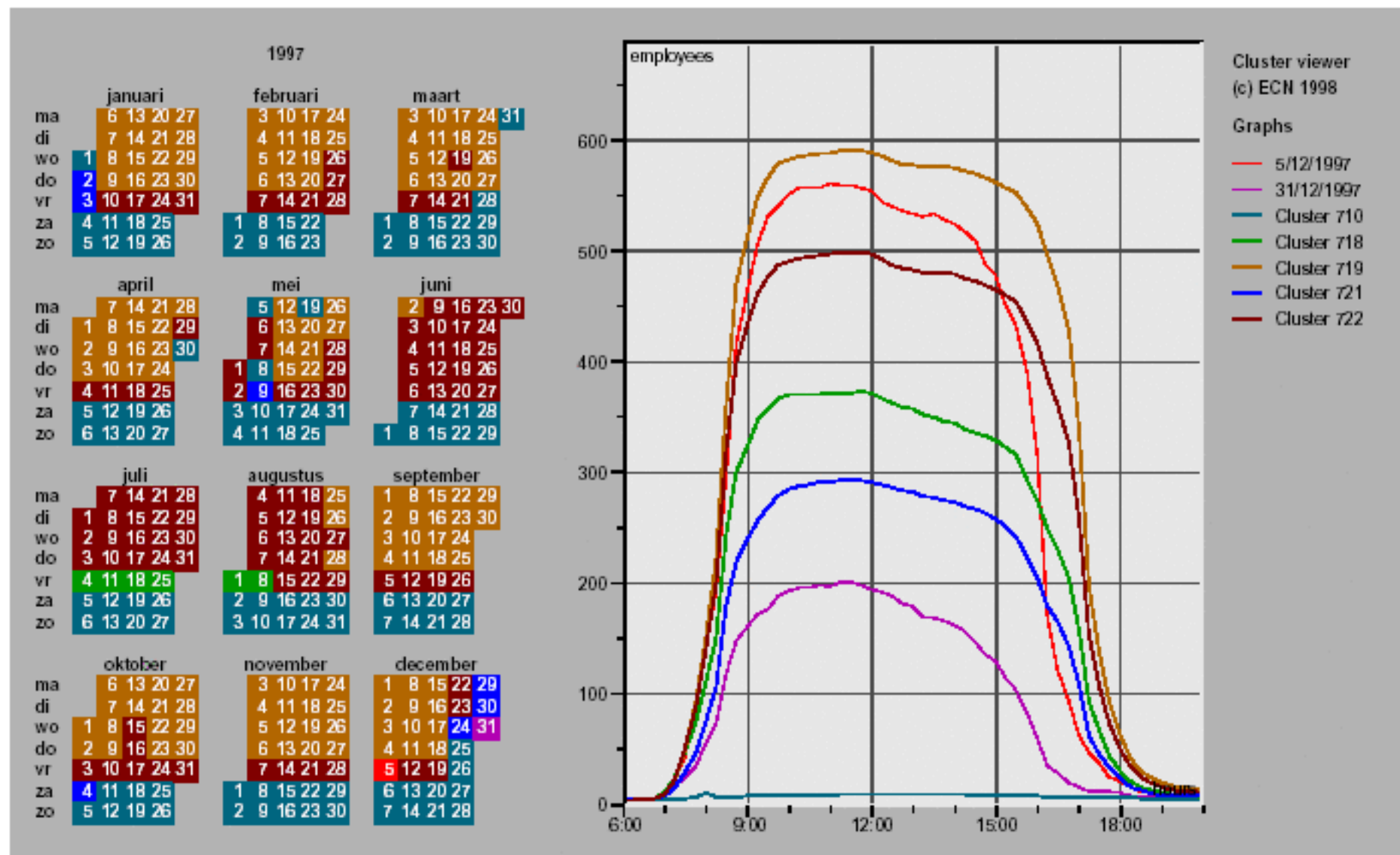
perspective interferes with comparison  
daily, weekly patterns hard to see



# Link Clusters and Calendar

2D linked clusters–calendars shows patterns

- office hours, weekend/holidays, summer/fridays
- school break, post-holiday, santa claus

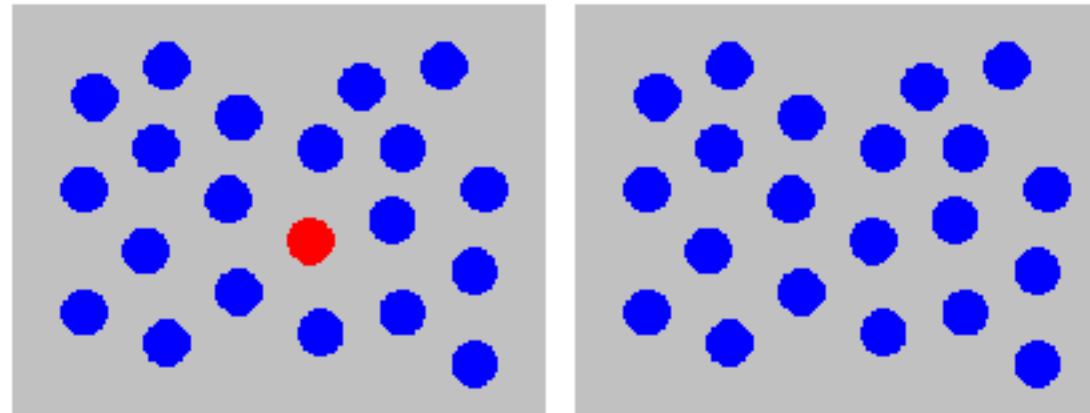


[van Wijk and van Selow, Cluster and Calendar based Visualization of Time Series Data, InfoVis99, Figure 4, [citeseer.nj.nec.com/vanwijk99cluster.html](http://citeseer.nj.nec.com/vanwijk99cluster.html)]

# Preattentive Visual Channels: Popout

color (hue) alone: preattentive

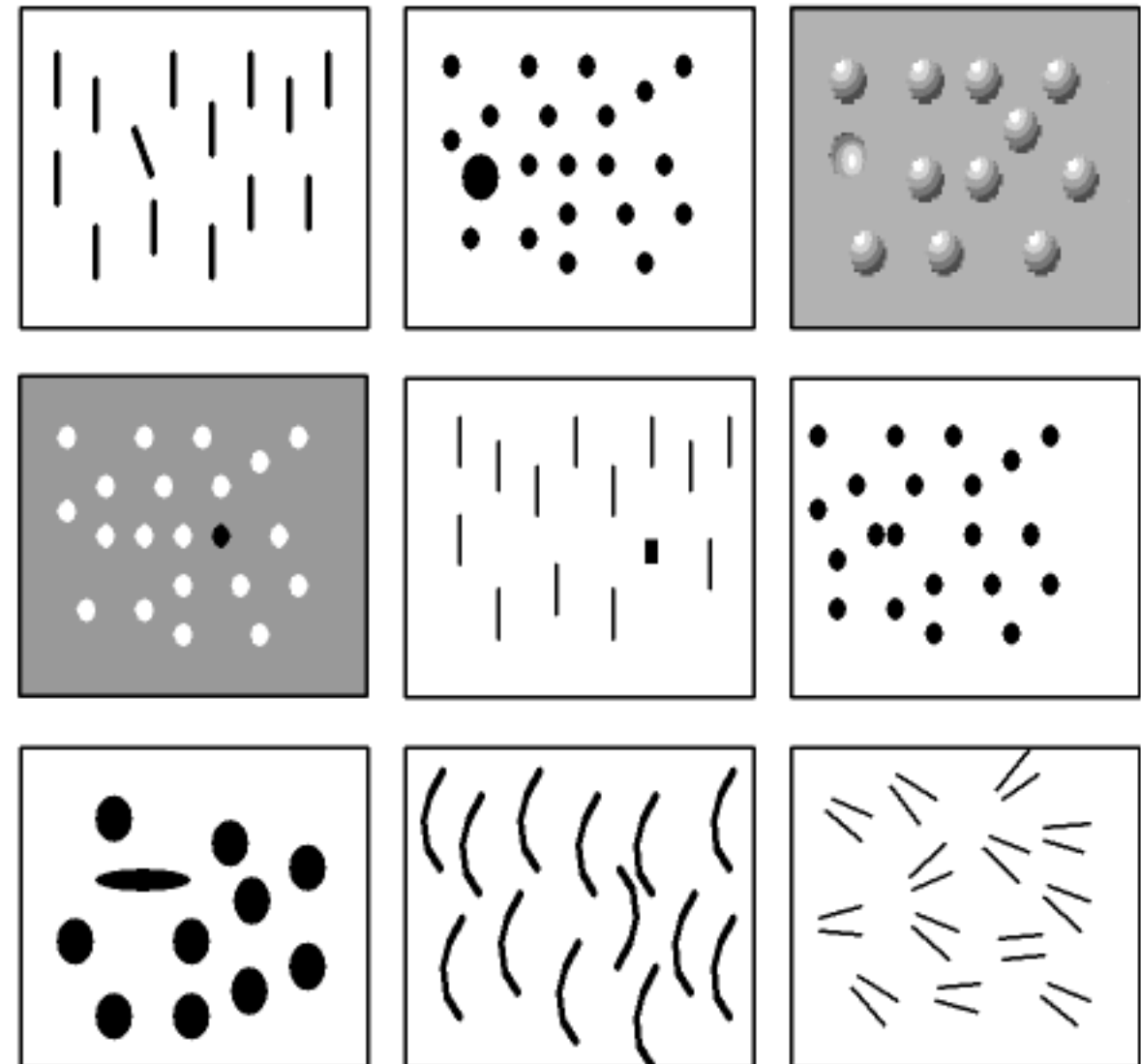
- visual attentional system not invoked
- parallel search: speed independent of distractor count



# Preattentive Visual Channels: Popout

many preattentive channels of visual modality

- hue
- shape
- texture
- length
- width
- size
- orientation
- curvature
- intersection
- intensity
- flicker
- direction of motion
- stereoscopic depth
- lighting direction
- [and many more...]

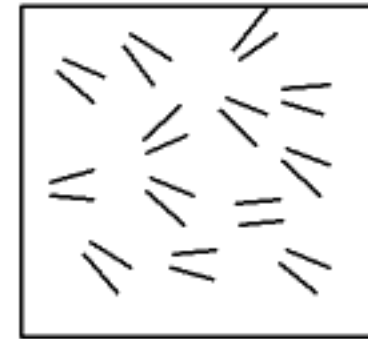




# Non-preattentive: parallelism

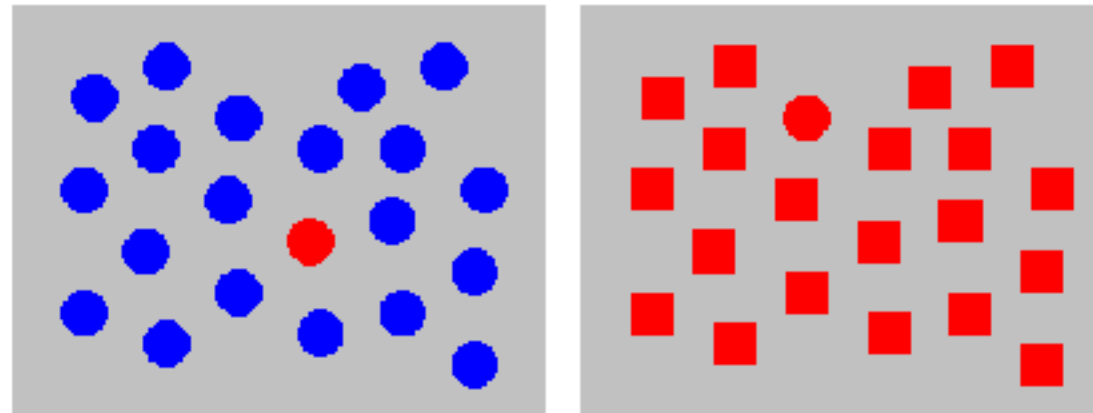
many preattentive channels of visual modality

- hue
- shape
- texture
- length
- width
- size
- orientation
- curvature
- intersection
- intensity
- flicker
- direction of motion
- stereoscopic depth
- lighting direction
- [and many more...]

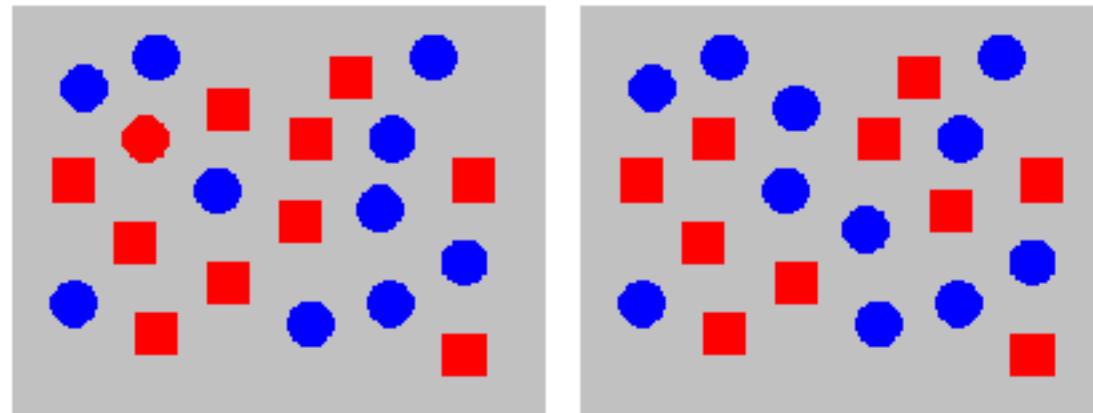


# Preattentive Visual Channels

color alone: preattentive  
shape alone: preattentive



combined hue and shape: not preattentive



- requires attention
- sequential search: speed linear with distractor count



# Data Types

continuous (quantitative)

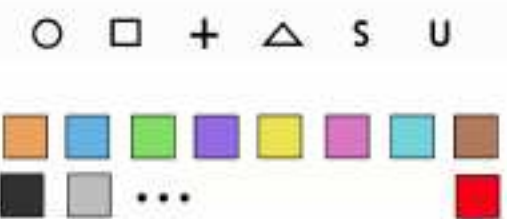
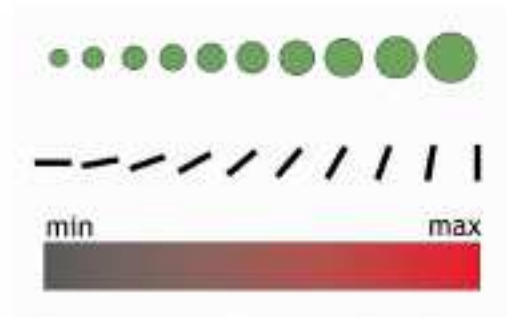
- 10 inches, 17 inches, 23 inches

ordered (ordinal)

- small, medium, large

categorical (nominal)

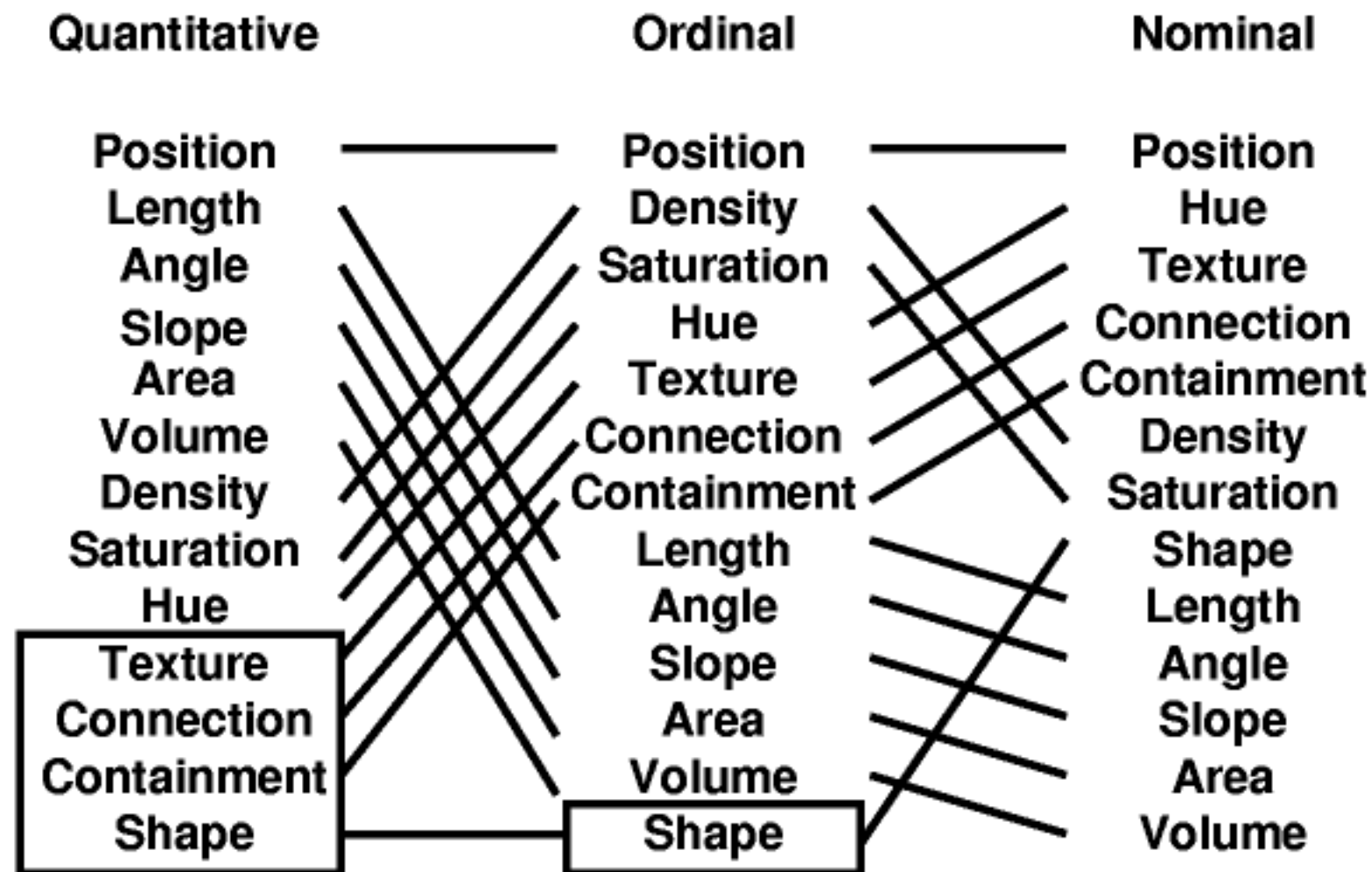
- apples, oranges, bananas



# Data Type Affects Channel Ranking

spatial position best for all types

- accuracy at judging magnitudes, from best to worst



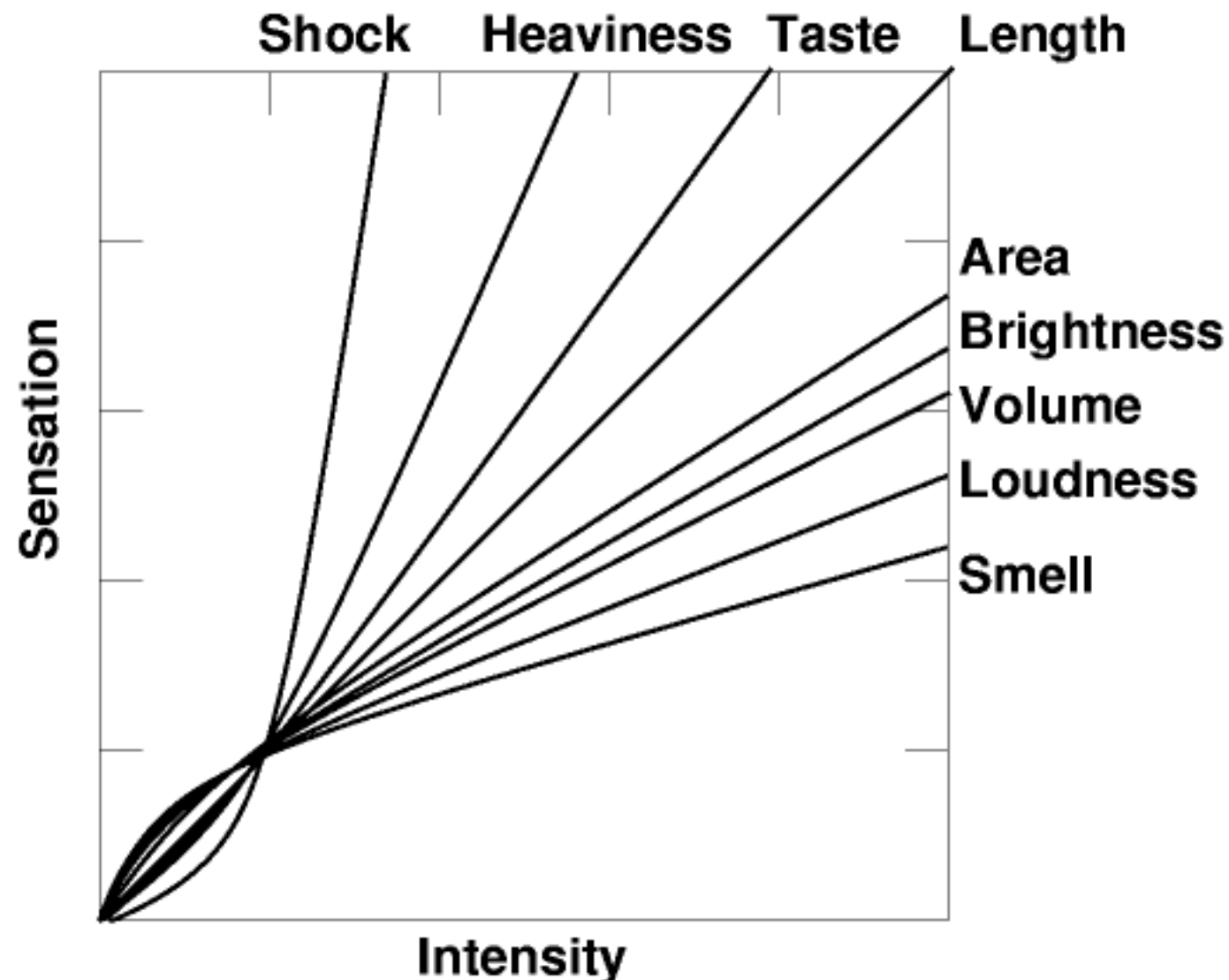
[Mackinlay, Automating the Design of Graphical Presentations of Relational Information, ACM TOG 5:2, 1986]

[Card, Mackinlay, and Shneiderman. Readings in Information Visualization: Using Vision to Think. Morgan Kaufmann 1999. Chapter 1]

# Nonlinear Perception of Magnitudes

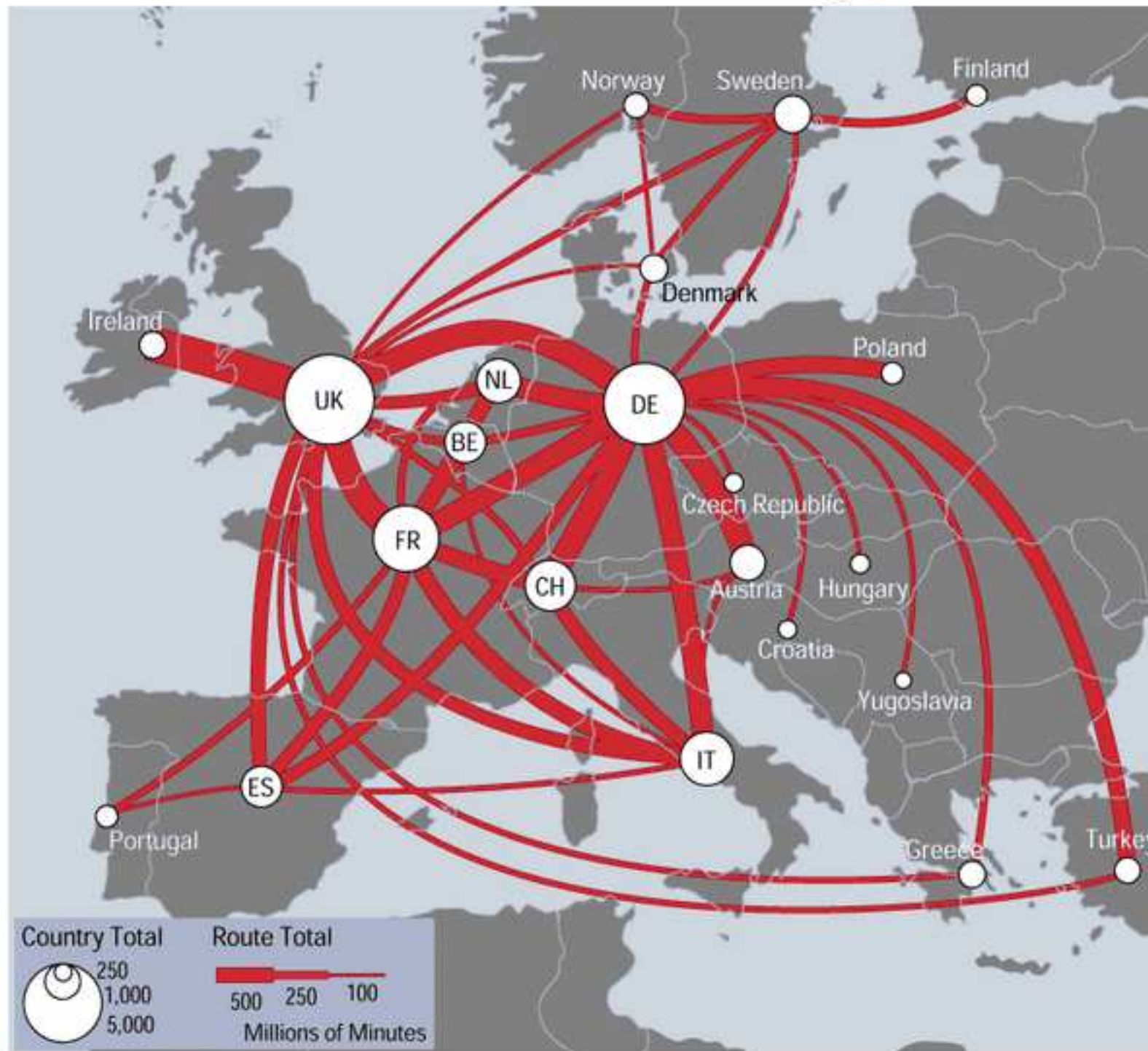
sensory channels **not** equally discriminable

Stevens' Power Law:  $I = S^p$



# Channel Dynamic Range

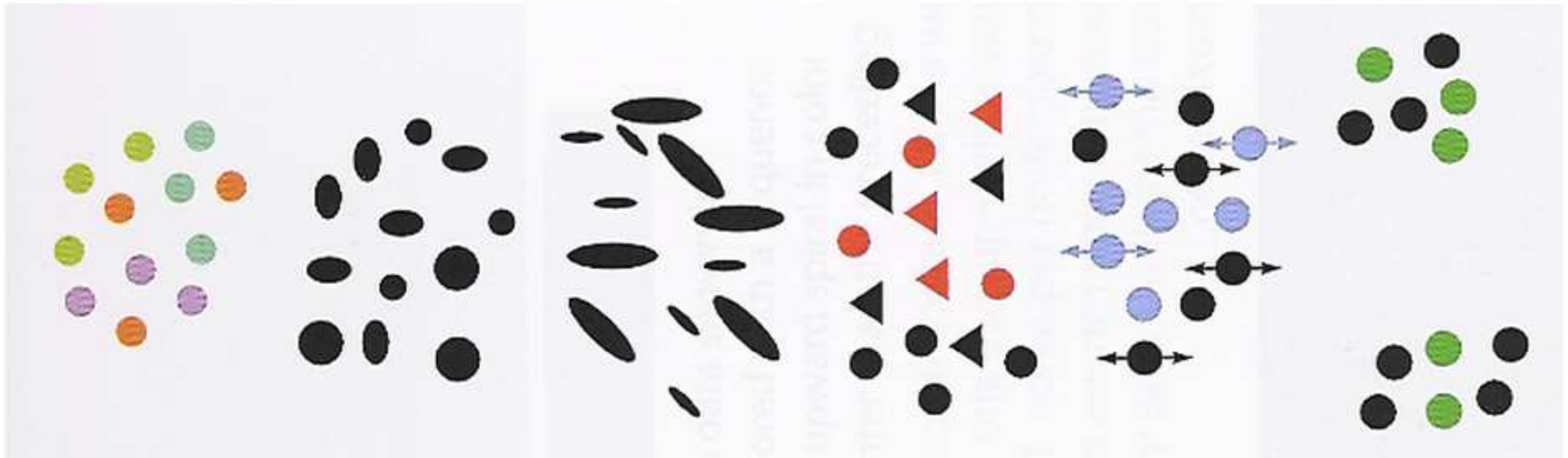
linewidth: limited discriminability, but useful



[[mappa.mundi.net/maps/maps\\_014/telegeography.html](http://mappa.mundi.net/maps/maps_014/telegeography.html)]



# Integral vs. Separable Channels



red-green  
yellow-blue

x-size  
y-size

size  
orientation

color  
shape

color  
motion

color  
location

[Colin Ware, Information Visualization: Perception for Design. Morgan Kaufmann 1999.]

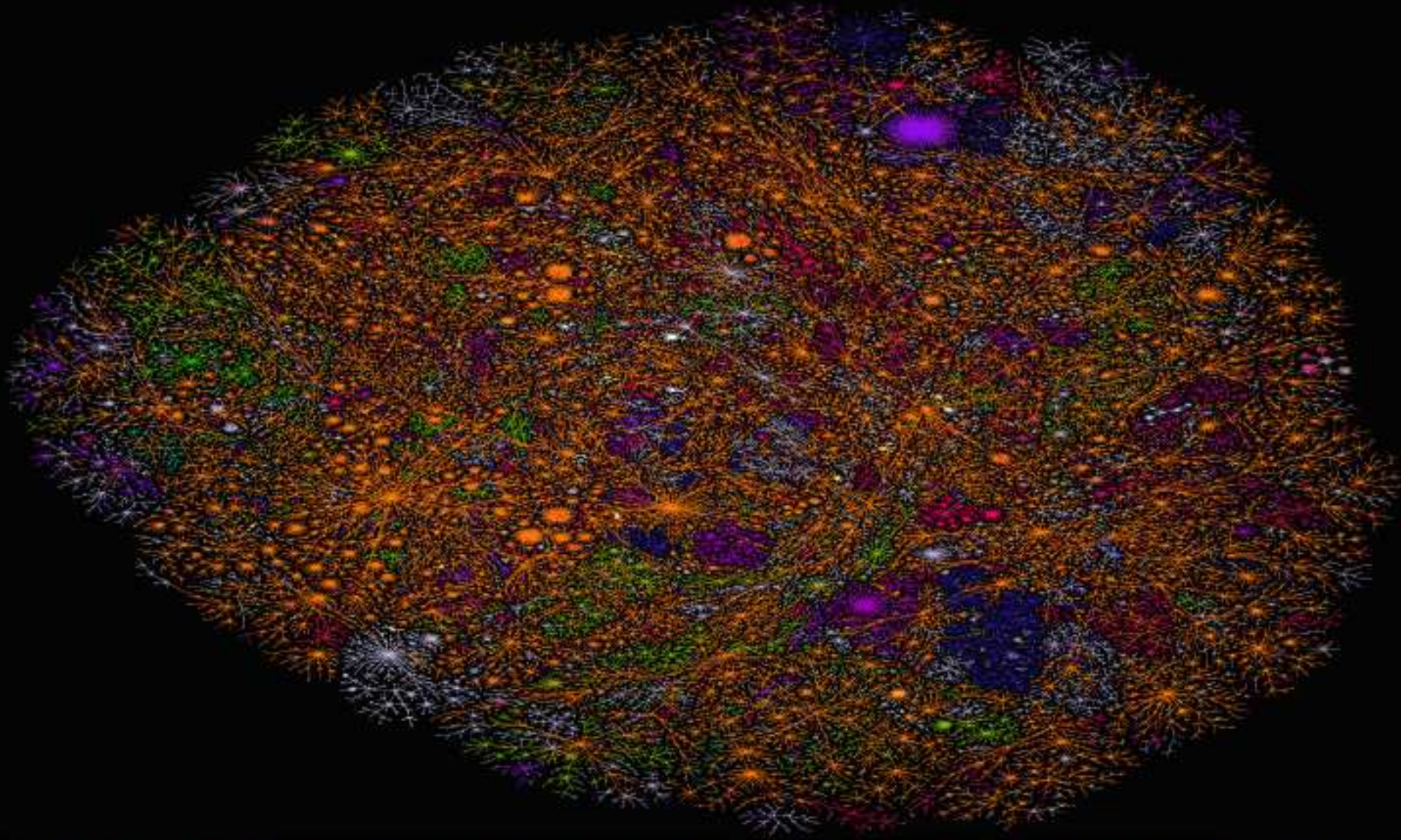


# Coloring Categorical Data

22 colors, but only ~8 distinguishable



## The Internet: 2002



Created by MIT Research and IT Consulting. Source: <http://www.internet-map.com>

Copyright © 2002 UMIST. All Rights Reserved. 2002

North America	Central America	South America	Africa	South Africa	Europe	Germany	France	Netherlands	United Kingdom	Asia	Japan	Pacific Islands	Australia	New Zealand	India	Malaysia	China	Iran	Other
---------------	-----------------	---------------	--------	--------------	--------	---------	--------	-------------	----------------	------	-------	-----------------	-----------	-------------	-------	----------	-------	------	-------

Published by [www.internet-map.com](http://www.internet-map.com)

The goal of the Internet map is to provide the most up-to-date and accurate representation of the Internet. The map is updated regularly and is available in various formats. The map is a work of art and is not intended to be used as a scientific or technical illustration. The map is a work of art and is not intended to be used as a scientific or technical illustration. The map is a work of art and is not intended to be used as a scientific or technical illustration.



# Coloring Categorical Data

discrete small patches separated in space

limited distinguishability: around 8–14

- channel dynamic range: low
- choose bins explicitly for maximum milage

maximally discriminable colors from Ware

- maximal saturation for small areas

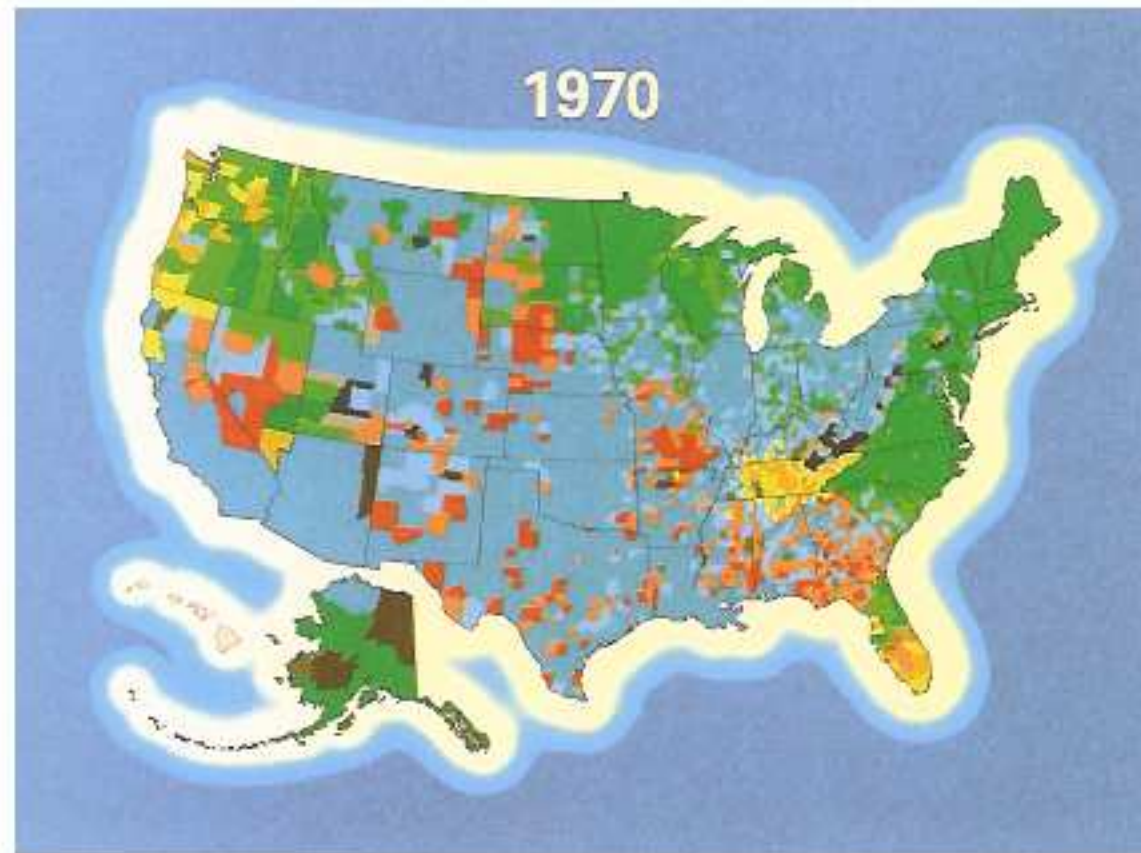


[Colin Ware, Information Visualization: Perception for Design.  
Morgan Kaufmann 1999. Figure 4.21]

# Minimal Saturation for Large Areas

avoid saturated color in large areas

- "excessively exuberant"



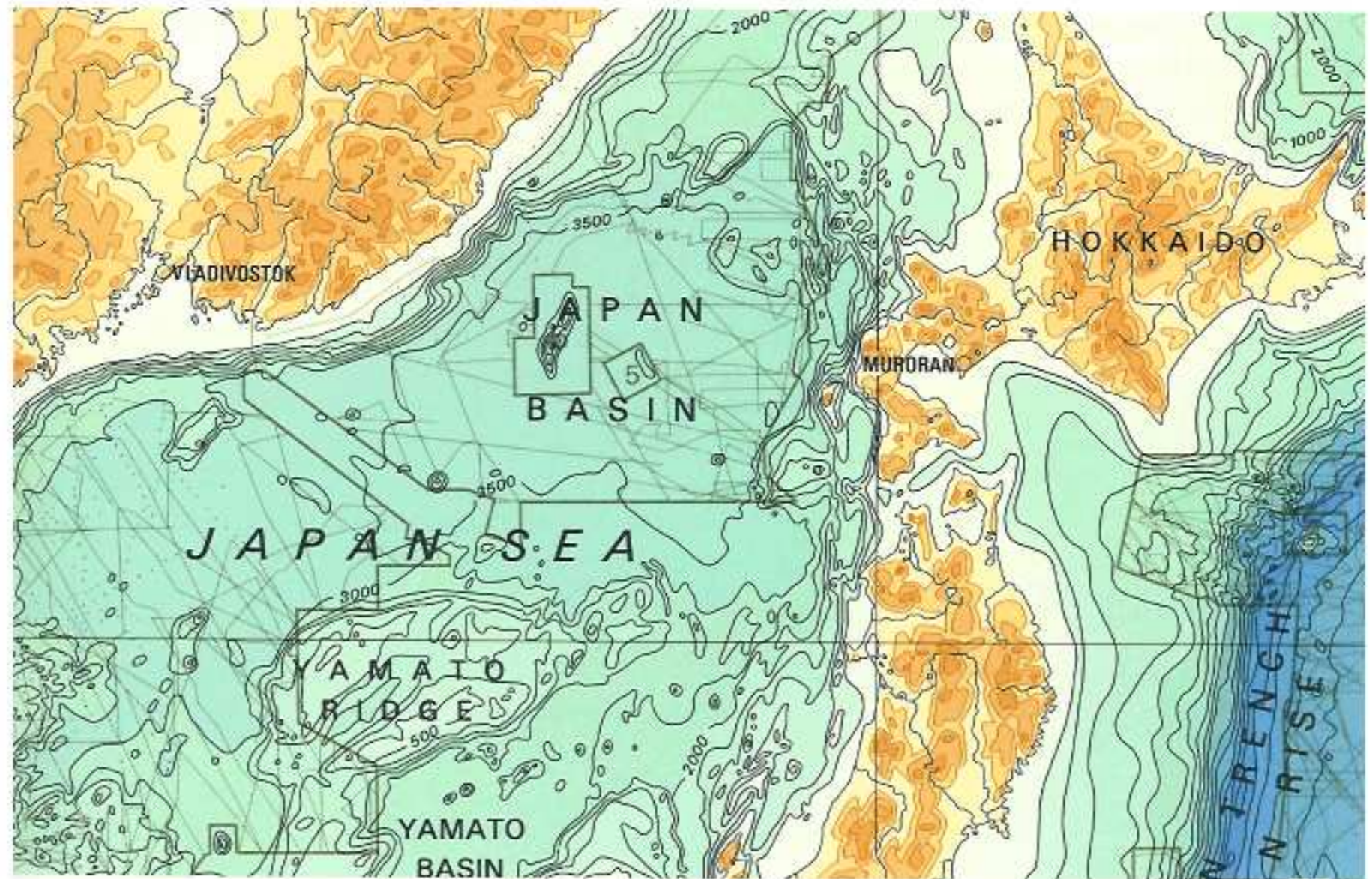
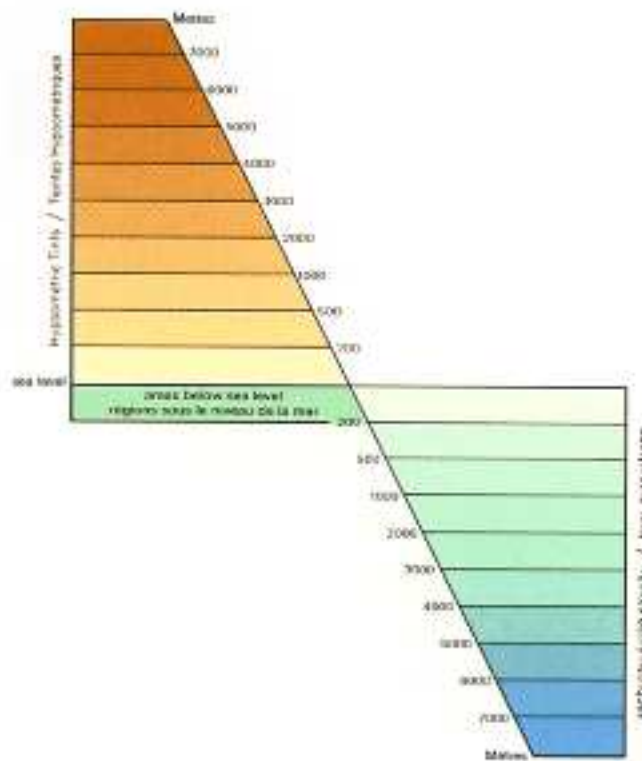
[Edward Tufte, Envisioning Information, p.82]



# Minimal Saturation for Large Areas

large continuous areas in pastel

- diverging colormap (bathymetric/hypsometric)



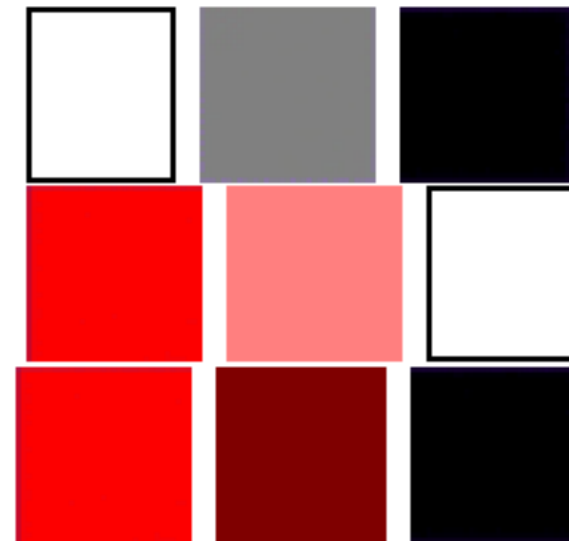
[Tufté, Envisioning Information, p. 91]



# Coloring Ordered Data

innate visual order

- greyscale/luminance
- saturation
- brightness



debatable visual order

- hue



# Coloring Quantitative Data

continuous field

side by side patches highly distinguishable

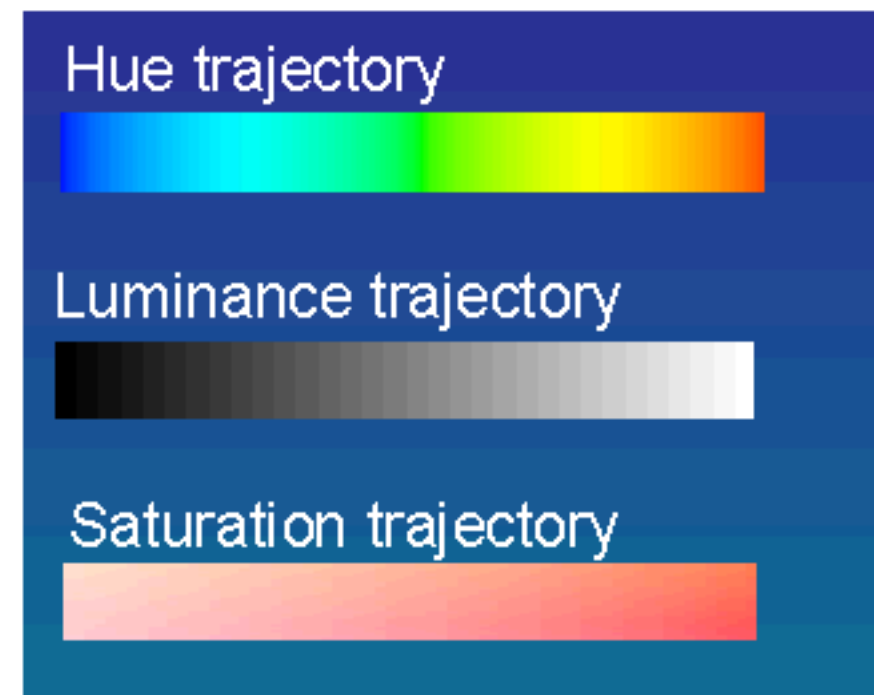
- channel dynamic range: high

mediocre

- hue (rainbow)

good

- greyscale/luminance
- saturation
- brightness

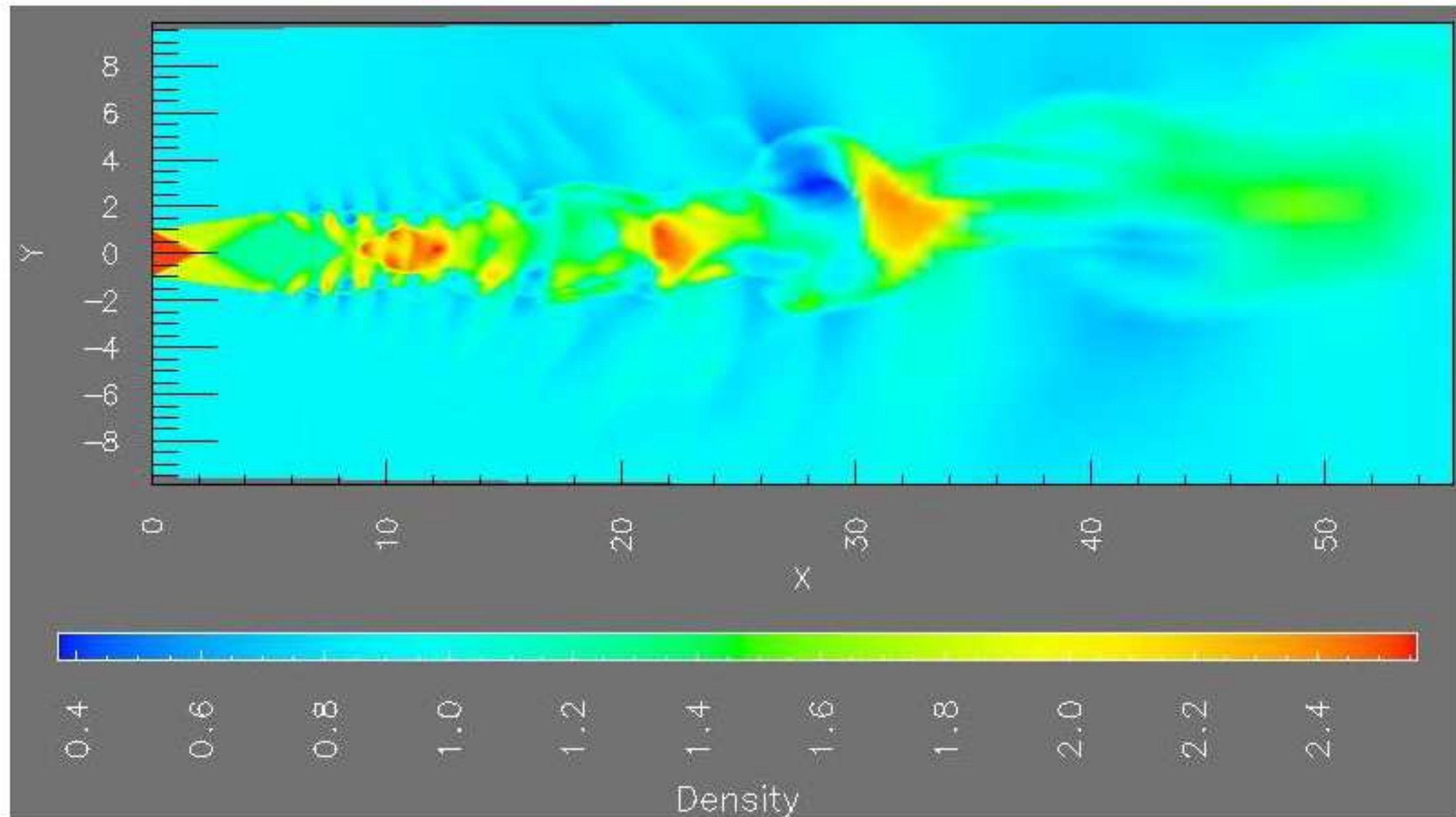


[[www.research.ibm.com/visualanalysis/perception.html](http://www.research.ibm.com/visualanalysis/perception.html)]

# Rainbow Colormap Advantages

low-frequency segmentation

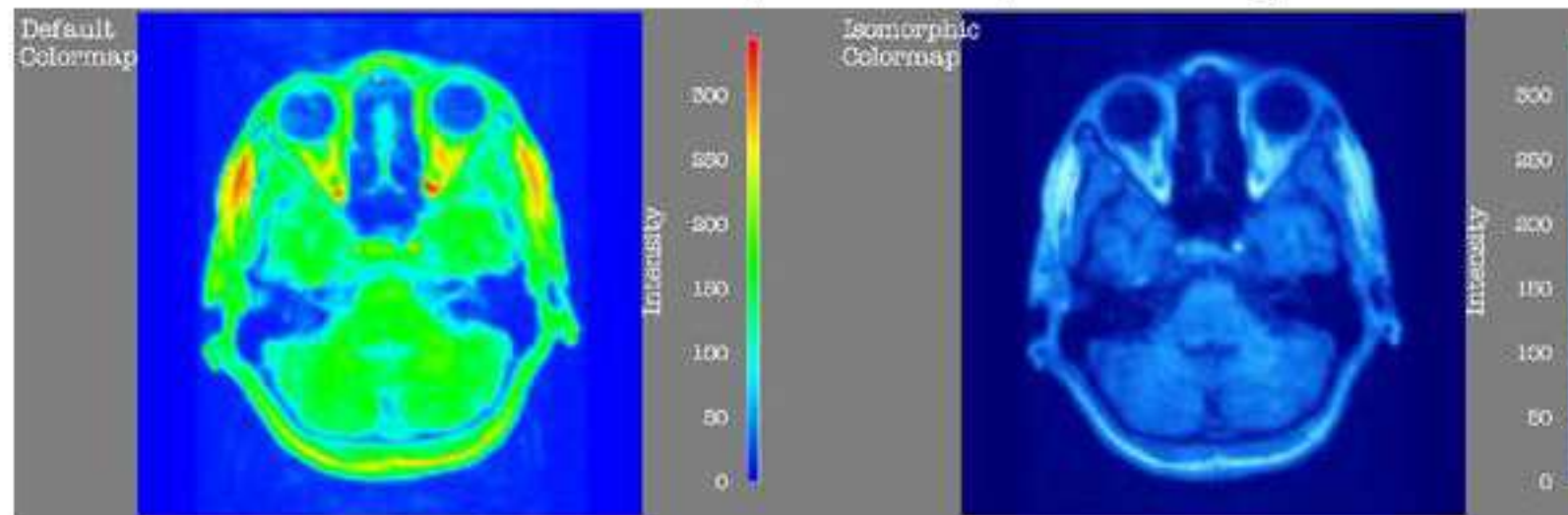
- "the red part", "the orange part", "the green part"



[Rogowitz and Treinish, Why Should Engineers and Scientists Be Worried About Color?  
<http://www.research.ibm.com/people/l/lloyd/color/color.HTM>

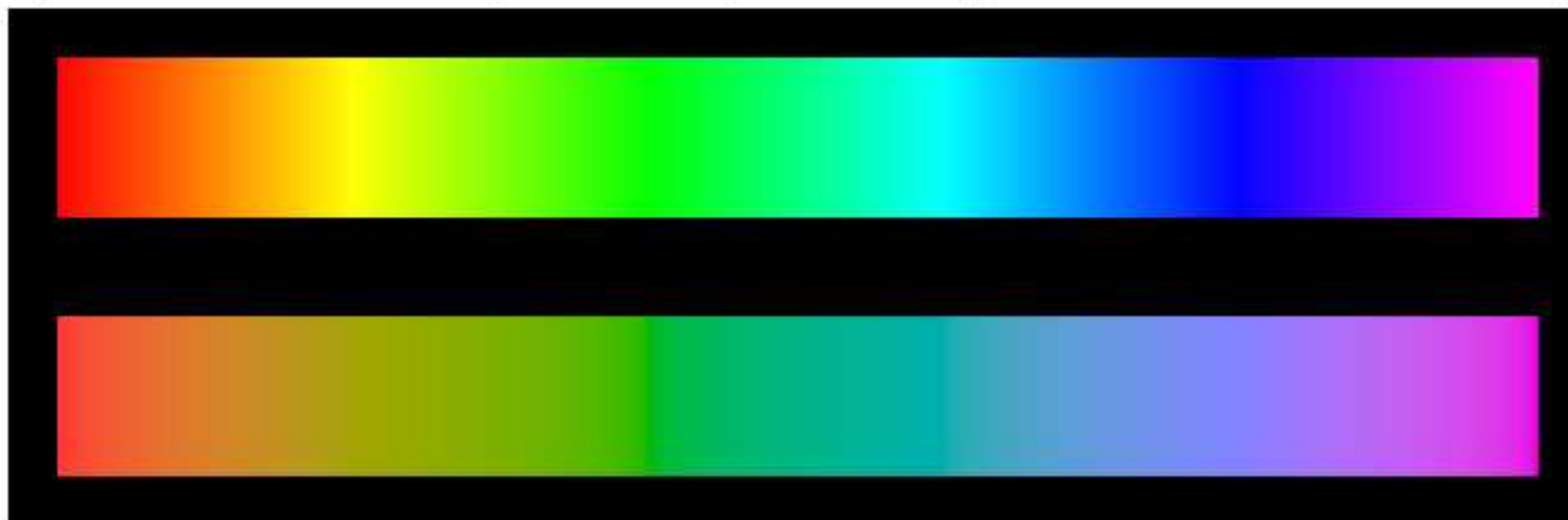
# Rainbow Colormap Disadvantages

segmentation artifacts: perceptually nonlinear!



[Rogowitz and Treinish, How NOT to Lie with Visualization,  
[www.research.ibm.com/dx/proceedings/pravda/truevis.htm](http://www.research.ibm.com/dx/proceedings/pravda/truevis.htm)

(partial) solution: perceptually isolinear map



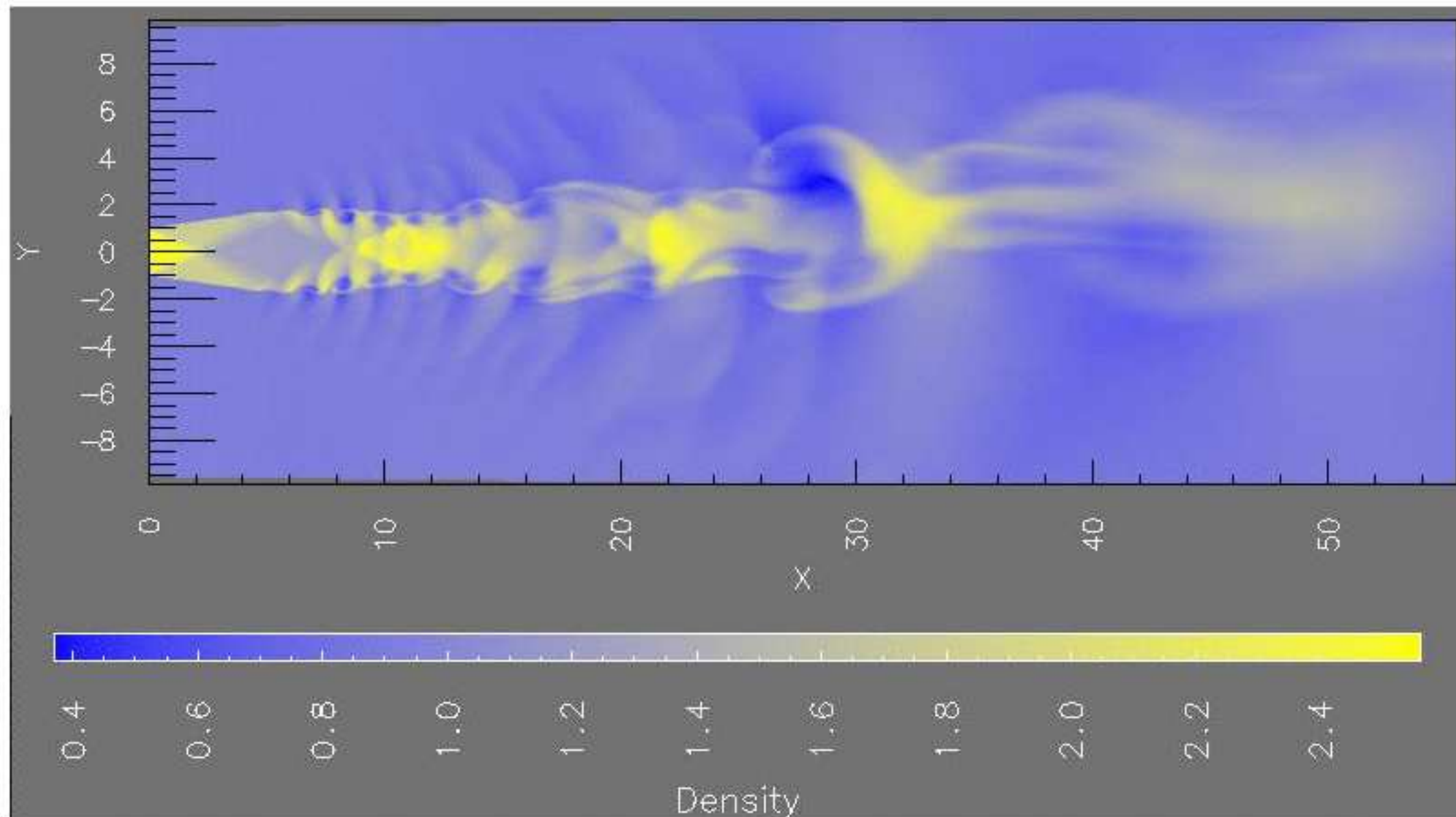
[Kindlmann, Reinhard, and Creem.  
Face-based Luminance Matching for Perceptual Colormap Generation. Proc. Vis 02  
[www.cs.utah.edu/~gk/lumFace](http://www.cs.utah.edu/~gk/lumFace)]



# Non-Rainbow Colormap Advantages

high-frequency continuity

- interpolating between just two hues



[Rogowitz and Treinish, How NOT to Lie with Visualization,  
[www.research.ibm.com/dx/proceedings/prayda/truevis.htm](http://www.research.ibm.com/dx/proceedings/prayda/truevis.htm)



# Color Deficiency

very low channel dynamic range for some!

protanope

deuteranope

- has red/green deficit
- 10% of males!

tritanope

- has yellow/blue deficit

<http://www.vischeck.com/vischeck>

- test your images

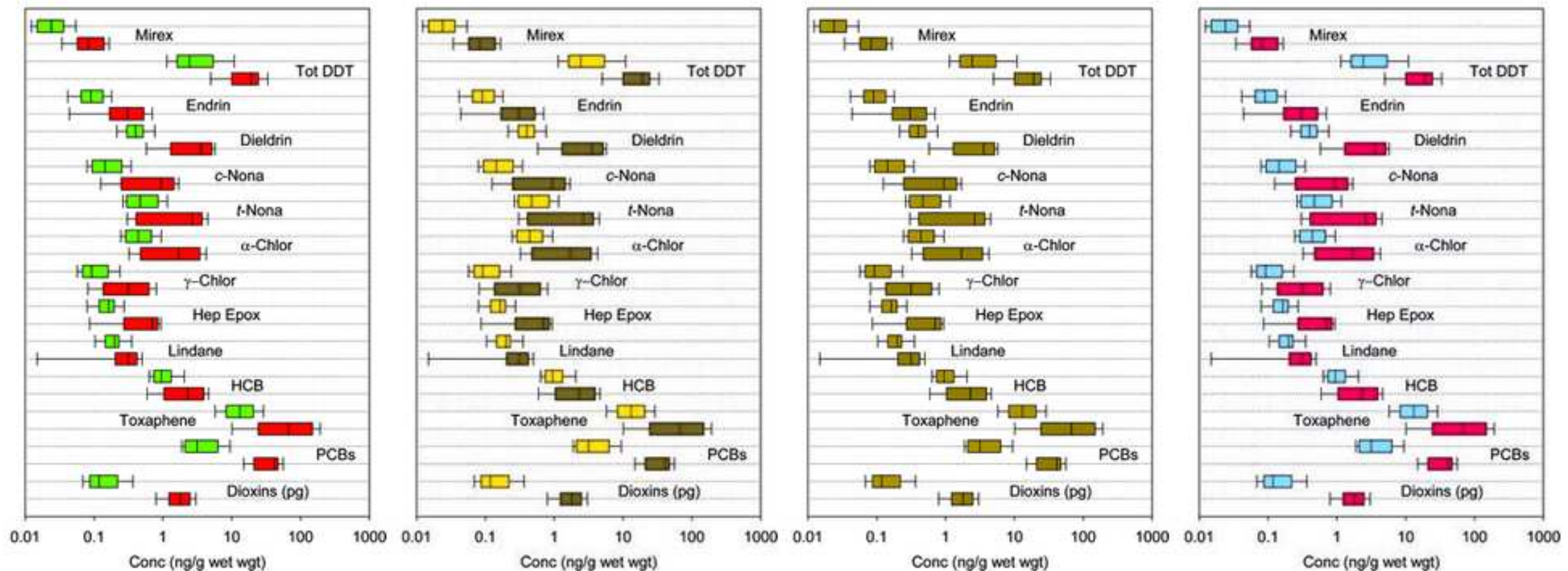
# Color Deficiency Examples: vischeck

original

protanope

deuteranope

tritanope



[[www.cs.ubc.ca/~tmm/courses/cpsc533c-04-spr/a1/dmitry/533a1.html](http://www.cs.ubc.ca/~tmm/courses/cpsc533c-04-spr/a1/dmitry/533a1.html),  
citing Global Assessment of Organic Contaminants in Farmed Salmon,

Ronald A. Hites, Jeffery A. Foran, David O. Carpenter, M. Coreen

Hamilton, Barbara A. Knuth, and Steven J. Schwager, Science 2004 303: 226-229.]



# Designing Around Deficiencies

red/green could have domain meaning  
then distinguish by more than hue alone

- redundantly encode with saturation, brightness

original

Qty	Limit	Dest	Status	Ex Qty
+ 20,000	29.96			10,000
+ 80,000	MKT			13,000
+ 20,000	MKT		Cxl:Trd	15,000
- 200,000	30		Cor:Yes	86,000
+ 20,000	29.96	DOT		13,000
+ 20,000	29.96	Port		17,000
+ 20,000	29.96	Joe G.	Cxl:Trd	20,000
20,000	29.96	DOT		13,000
+ 20,000	29.96	Port	Cxl:Brk	
20,000	29.96	Joe G.		13,000
80,000	29.96	DOT		10,000
- 200,000	MKT			200,000
+ 20,000	MKT	Joe G.		25,000

protanope

Qty	Limit	Dest	Status	Ex Qty
+ 20,000	29.96			10,000
+ 80,000	MKT			13,000
+ 20,000	MKT		Cxl:Trd	15,000
- 200,000	30		Cor:Yes	86,000
+ 20,000	29.96	DOT		13,000
+ 20,000	29.96	Port		17,000
+ 20,000	29.96	Joe G.	Cxl:Trd	20,000
20,000	29.96	DOT		13,000
+ 20,000	29.96	Port	Cxl:Brk	
20,000	29.96	Joe G.		13,000
80,000	29.96	DOT		10,000
- 200,000	MKT			200,000
+ 20,000	MKT	Joe G.		25,000

deuteranope

Qty	Limit	Dest	Status	Ex Qty
+ 20,000	29.96			10,000
+ 80,000	MKT			13,000
+ 20,000	MKT		Cxl:Trd	15,000
- 200,000	30		Cor:Yes	86,000
+ 20,000	29.96	DOT		13,000
+ 20,000	29.96	Port		17,000
+ 20,000	29.96	Joe G.	Cxl:Trd	20,000
20,000	29.96	DOT		13,000
+ 20,000	29.96	Port	Cxl:Brk	
20,000	29.96	Joe G.		13,000
80,000	29.96	DOT		10,000
- 200,000	MKT			200,000
+ 20,000	MKT	Joe G.		25,000

tritanope

Qty	Limit	Dest	Status	Ex Qty
+ 20,000	29.96			10,000
+ 80,000	MKT			13,000
+ 20,000	MKT		Cxl:Trd	15,000
- 200,000	30		Cor:Yes	86,000
+ 20,000	29.96	DOT		13,000
+ 20,000	29.96	Port		17,000
+ 20,000	29.96	Joe G.	Cxl:Trd	20,000
20,000	29.96	DOT		13,000
+ 20,000	29.96	Port	Cxl:Brk	
20,000	29.96	Joe G.		13,000
80,000	29.96	DOT		10,000
- 200,000	MKT			200,000
+ 20,000	MKT	Joe G.		25,000

[Courtesy of Brad Paley]

# Space vs. Time: Showing Change



animation: show time using temporal change

- good: show process



[Outside In excerpt. [www.geom.uiuc.edu/docs/outreach/oi/evert.mpg](http://www.geom.uiuc.edu/docs/outreach/oi/evert.mpg)]



# Space vs. Time: Showing Change



animation: show time using temporal change

- good: show process
- good: compare by flipping between two things



[Outside In excerpt. [www.geom.uiuc.edu/docs/outreach/oi/evert.mpg](http://www.geom.uiuc.edu/docs/outreach/oi/evert.mpg)]

[[www.astroshow.com/ccdpho/pluto.gif](http://www.astroshow.com/ccdpho/pluto.gif)]







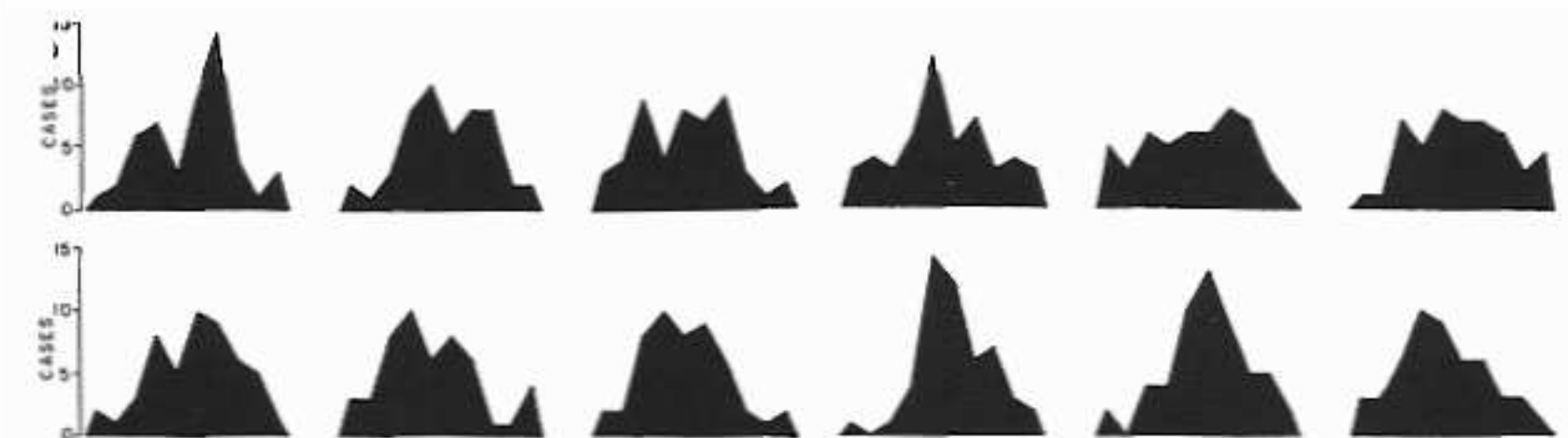


# Space vs. Time: Showing Change



small multiples: show time using space

- overview: show each time step in array
- compare: side-by-side easier than temporal  
external cognition instead of internal memory
- general technique, not just for temporal changes



[Edward Tufte. The Visual Display of Quantitative Information, p 172]

# More Information

<http://www.cs.ubc.ca/~tmm>

- talks, papers, projects: lots of pictures!

UBC Term 1 grad course

- CPSC 533C Visualization

current project domains

- bioinformatics, data mining, sustainability

past project domains

- topology, networking, computational linguistics, ...