

Scientific Volume and Flow Illustration

(How Do I Make a Data Set Look Like an Artist's
Drawing?)

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**The purpose of computing is insight,
not numbers.**

Hamming

Numbers

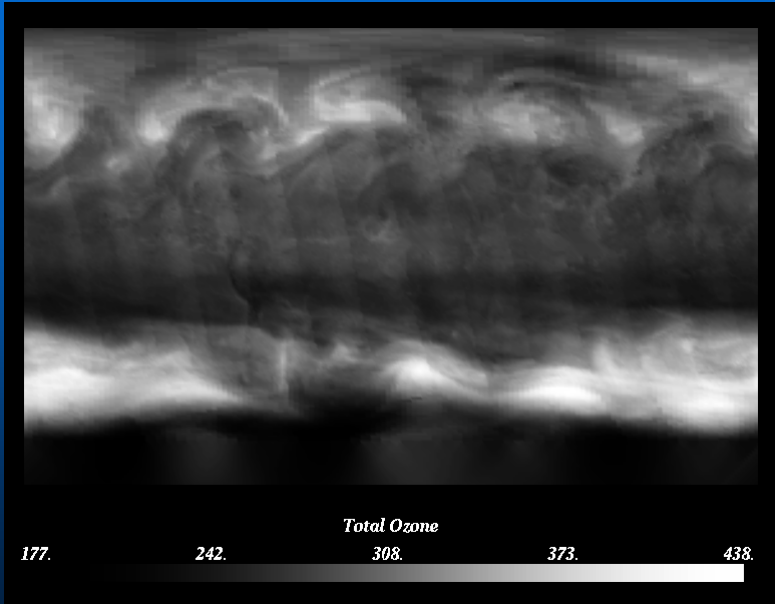
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**What information consumes is rather obvious:
it consumes the attention of its recipients. Hence
a wealth of information creates a poverty of
attention, and a need to allocate that attention
efficiently among the overabundance of
information source that might consume it.**

Herb Simon

Numbers

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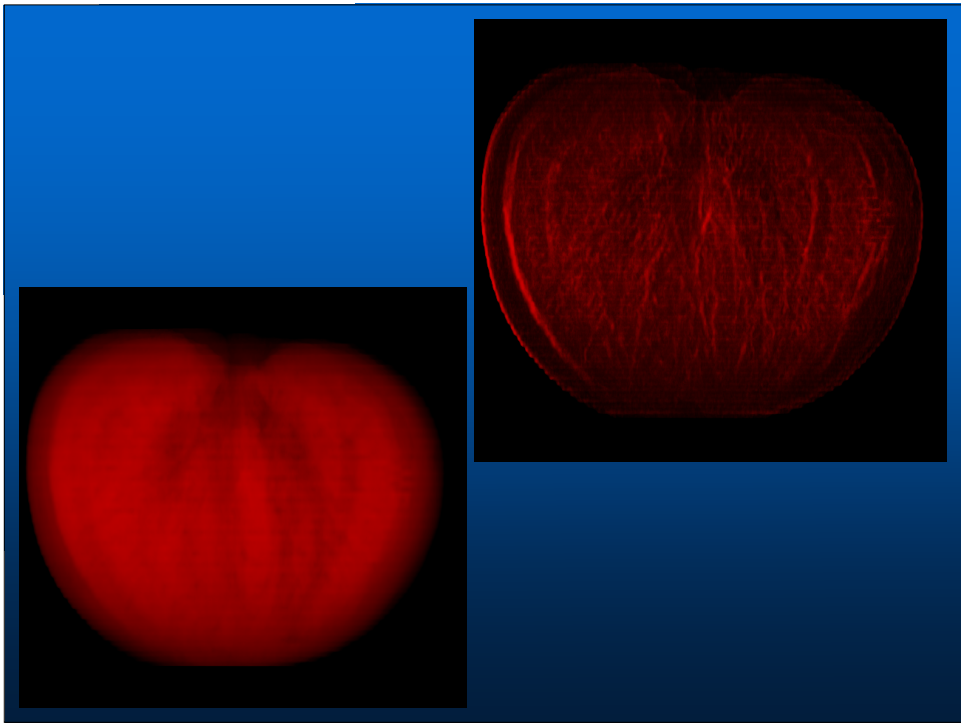
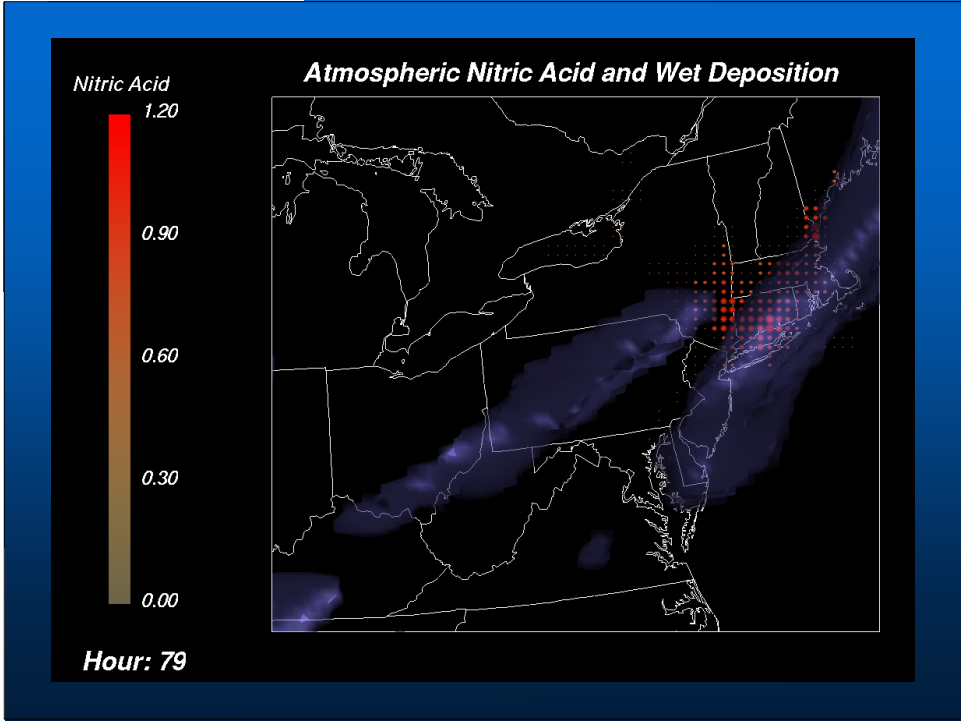


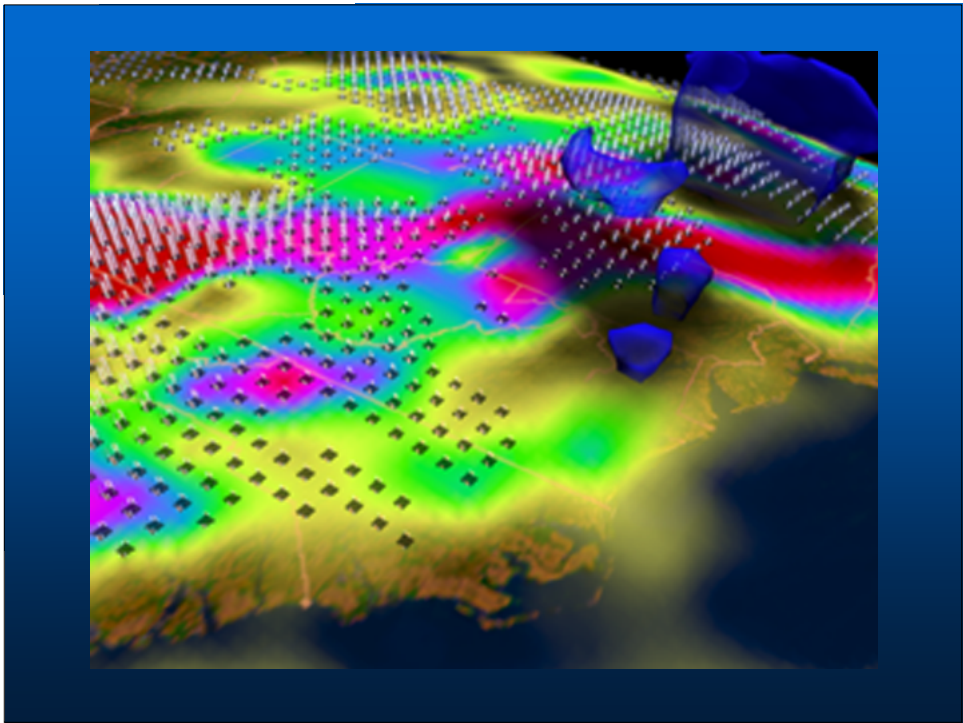
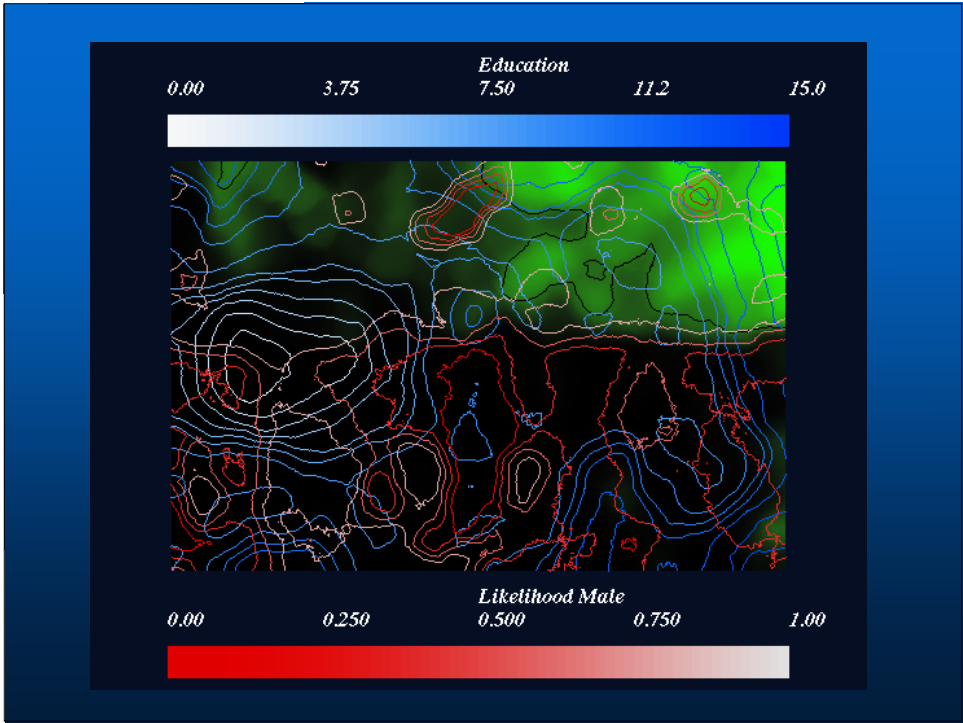
Visualization

- **What?**
 - Def: visual representation of data
 - Connotations:
 - » computer generated (mostly)
 - » LOTS of data
 - Transforms the abstract and symbolic into the geometric
 - Harnesses the human visual perception system
- **When?**
 - Presentation
 - » communicate concept to peer, student, policy -maker
 - Exploration
 - » rapidly construct and test many informal hypotheses

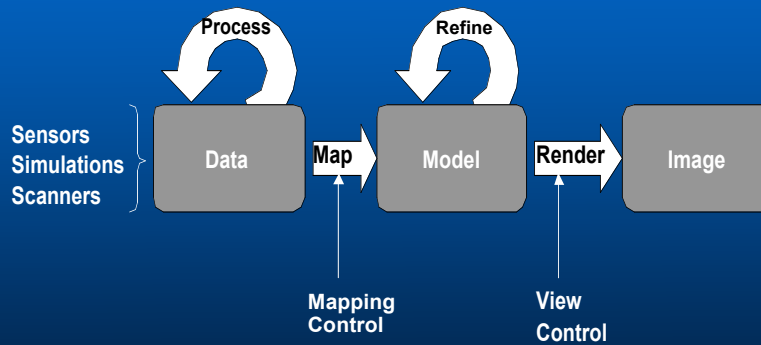
Visualization Tasks

- **See values**
 - extrema
 - anomalies
 - boundaries/thresholds
 - distribution / structure / pattern
- **See multiple variables**
 - relationships
- **See flow/change**
- **Understand process**



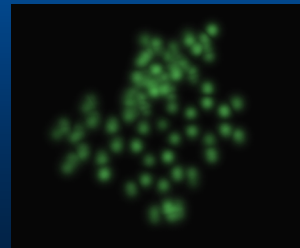
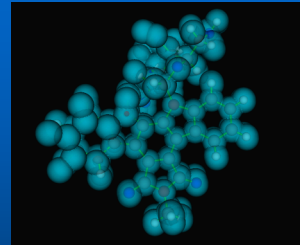


The Visualization Process



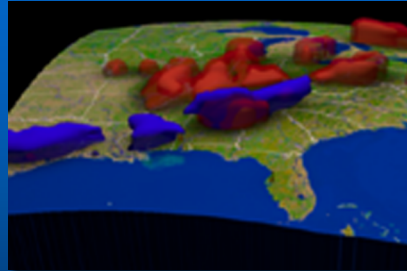
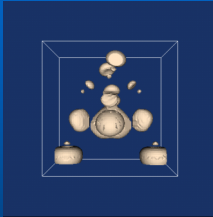
Volume Visualization

- **Isosurface**
 - Pick important isolevel and render threshold surface
- **Direct volume rendering**
 - Accumulate contributions of voxels
 - Realistic rendering
 - » Use physics-based illumination, accumulation, shadowing to enhance perception of data
 - Transfer function design
 - » Arbitrary mappings from scalar value to opacity

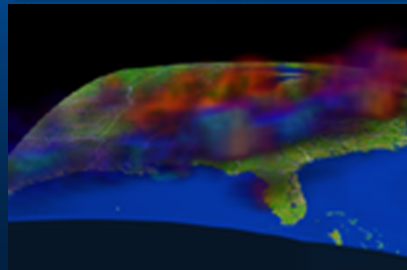
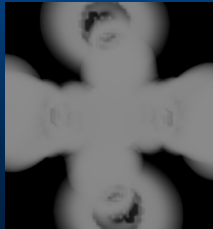


Volume Rendering

- Threshold surfaces



- Direct volume rendering



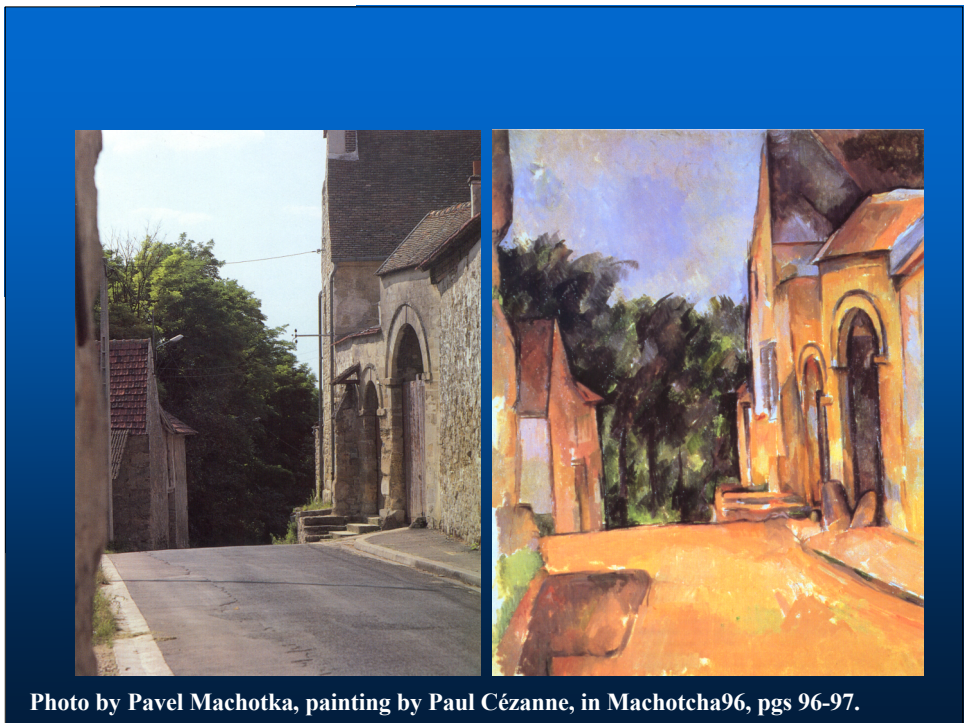
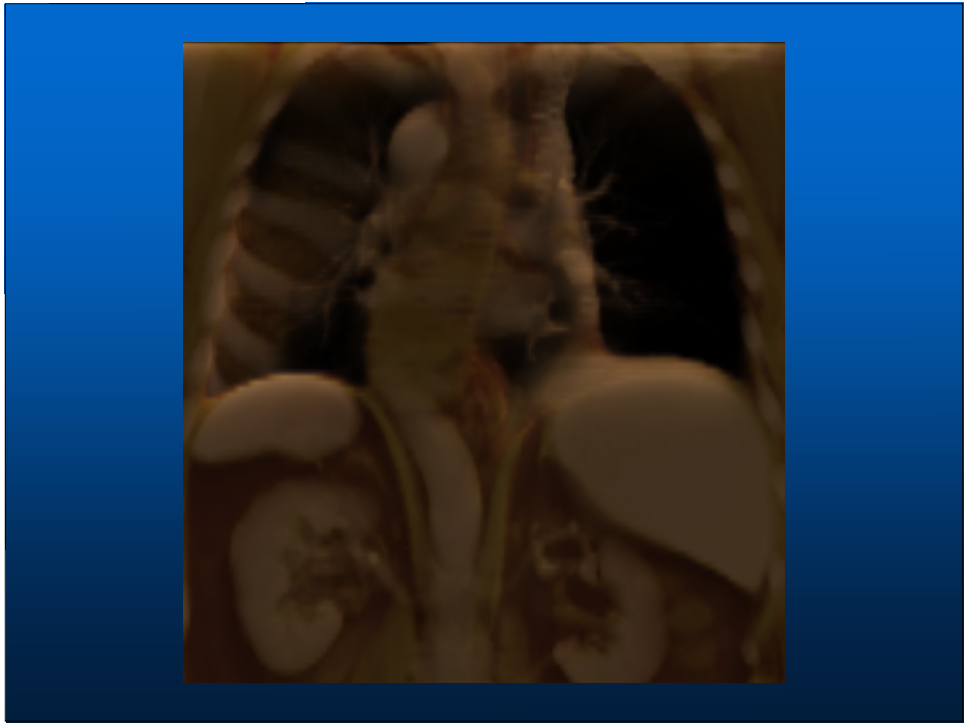
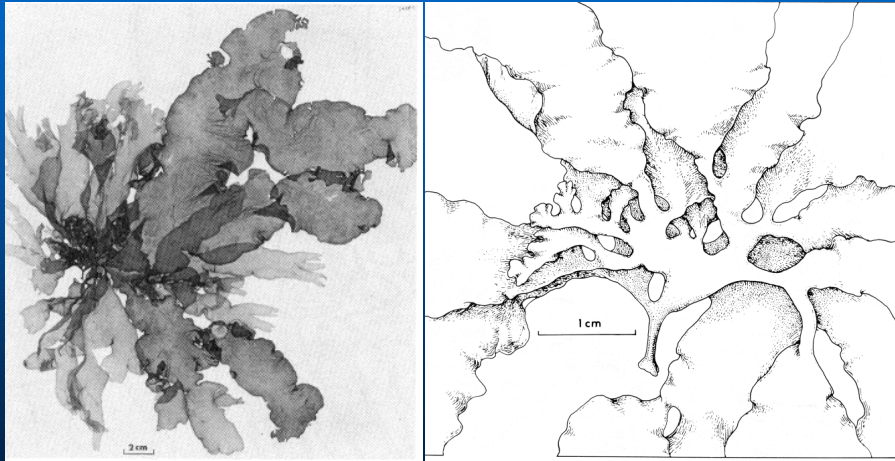


Photo by Pavel Machotka, painting by Paul Cézanne, in Machotcha96, pgs 96-97.

Photograph vs. Illustration



Alice Tangerini, in Hodges89, pg 191

Illustration vs. Volume Rendering

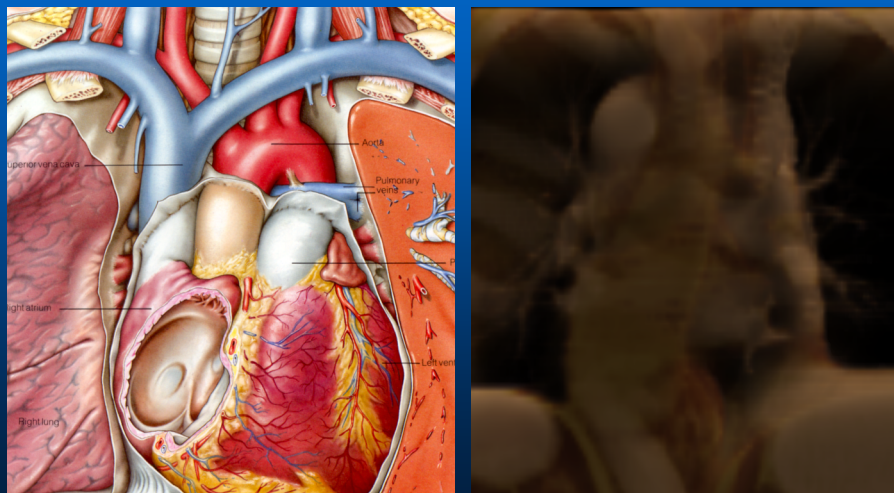
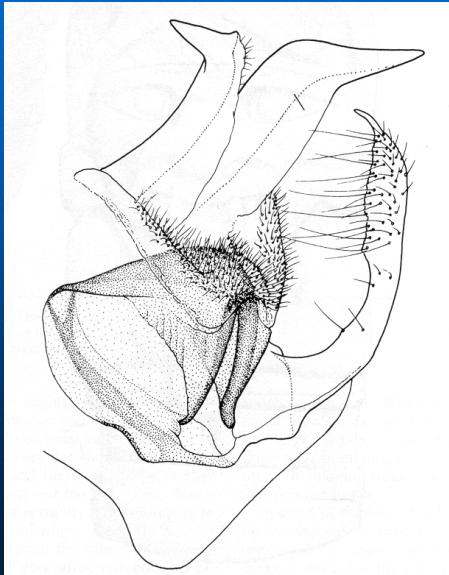


Illustration Goals

- Direct Attention
- Convey Shape
- Convey Depth
- Convey Translucence

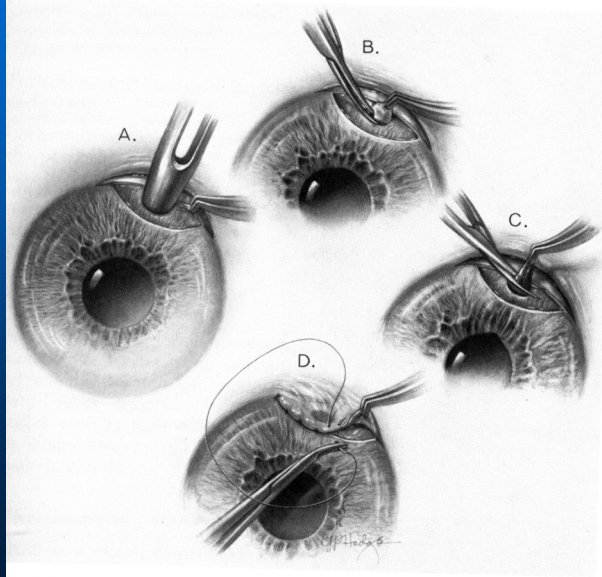
Focus: Levels of Detail



- Only most important areas stippled
- Focal point rendered in detail
- Other structure is simplified

Biruta Akerbergs Hansen, in
Hodges89, pg 109

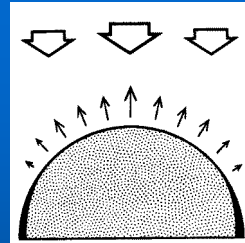
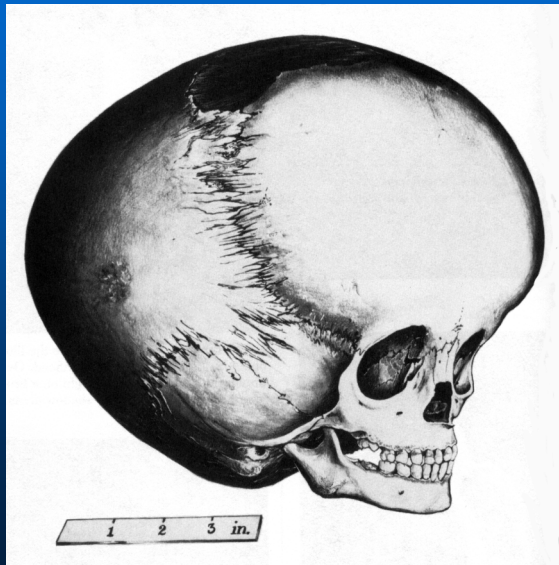
Focus: Vignetting



- Allow edges or unimportant structure to fade away to nothing

Gerald Hodge, in
Hodges89, pg 137

Shape Cues: Rim Shadow



- Periphery in shadow
- Distant areas darkened
- Simulates beam of light from front
- William Brudon, in
Hodges89, pg 86

Conveying Shape: Tone Shading



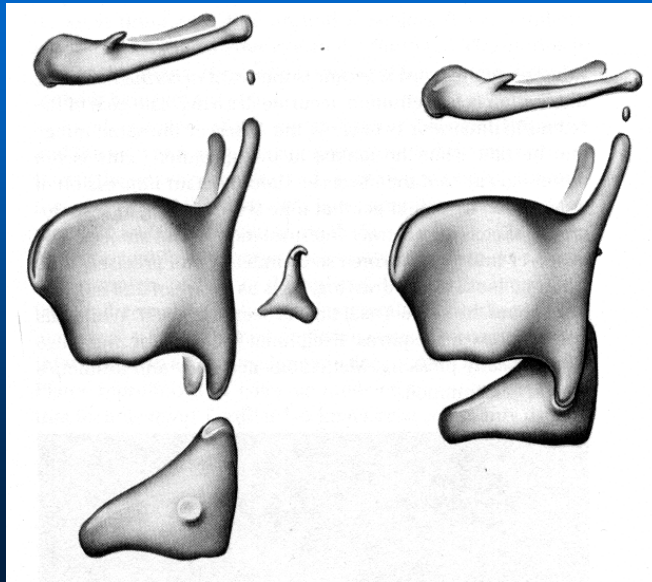
Gail Browne, in
Griffel94, pg 35

Aerial Perspective



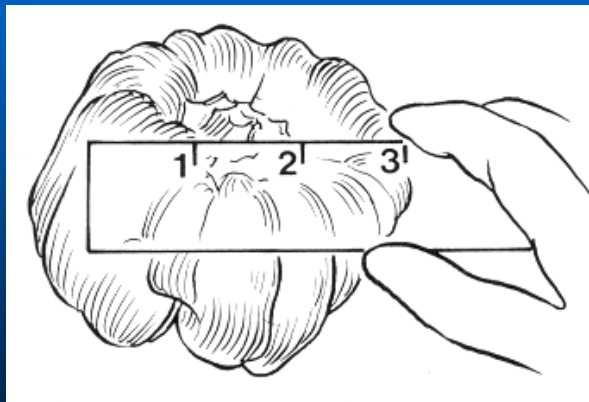
Peter Guest, in Griffel94, pg 44

Depth Cues: Atmospheric Perspective



Robert Demarest,
in Wood94, pg 7

Translucence: Detail Cues

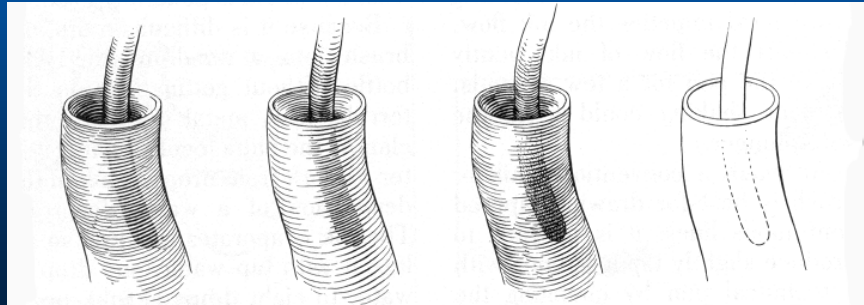


- Top layer seen clearly
- Underlying part is muted and shows less detail

Phyllis Wood in Wood94, pg.
16

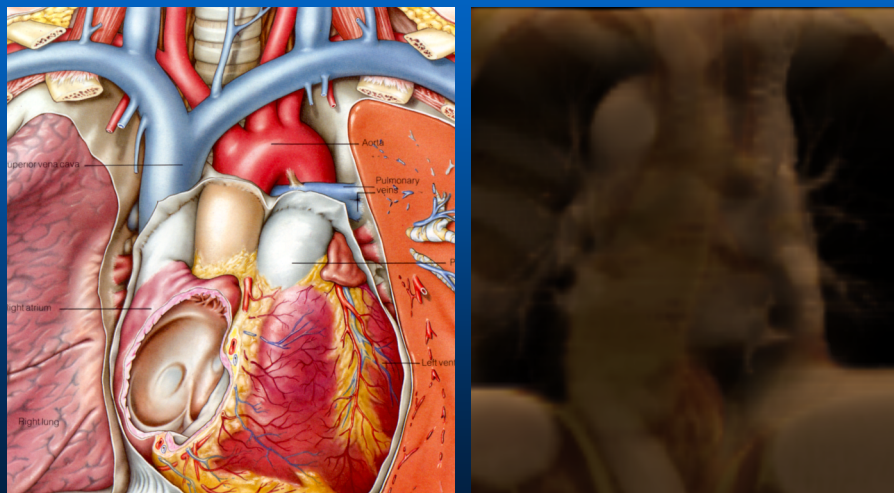
Translucence: Obscuration Cues

- Technique
 - Strengthen object before it enters another,
 - then eliminate all traces briefly,
 - then fade back in



Gerald Hodge, in Hodges89, pg 101

Illustration vs. Volume Rendering



Volume Illustration

- **Joint work with David Ebert, now at Purdue Univ. and our students (Aidong Lu, Chris Morris, Nik Svakhine, Alark Joshi, Jesus Caban)**
- **Approach**
 - Apply expressive-level NPR techniques to volume models to improve comprehensibility
- **Issues**
 - What to show?
 - How to show it?
 - How to implement it?

Features

- **Surface Rendering**
 - Surfaces
 - Silhouettes, high curvature regions, CFD
- **Volume Rendering**
 - Surfaceness
 - Indicators
 - » Gradient, higher-order properties
 - » Variability
 - » Local structure

Toolbox of Techniques

- **Feature enhancement**
 - Boundary enhancement
 - Silhouette enhancement
 - Oriented fading
 - Tone shading
- **Depth enhancement**
 - Aerial perspective
 - Halos
- **Directing focus**
 - Regional enhancement

Boundary/Silhouette Enhancement

- **Silhouette voxels where**
 - there is a feature (boundary)
 - feature normal ortho to view
- **Enhance boundary opacity by function of gradient**



where
$$o_g = o_v \left(k_{gc} + \left(k_{gs} \|\nabla_f\| \right)^{k_{ge}} \right)$$

$k_{gc} = 1, k_{gs} = 0$ yields no gradient enhancement

$k_{gs} \geq 1$ yields full gradient enhancement

$k_{gc} = 0$ yields only areas with large gradients

- **Enhance silhouettes based on gradient direction**

where
$$o_s = o_v \left(k_{sc} + k_{ss} \left(1 - \text{abs}(\nabla_f \cdot V) \right)^{k_{se}} \right)$$

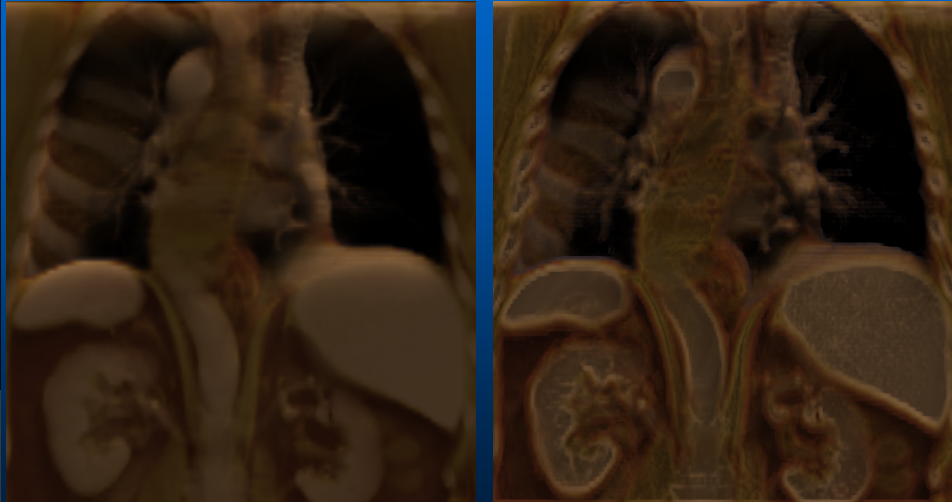
k_{sc} scales opacity of unenhanced features

k_{ss} controls size of maximum enhancement

k_{se} controls rate of enhancement

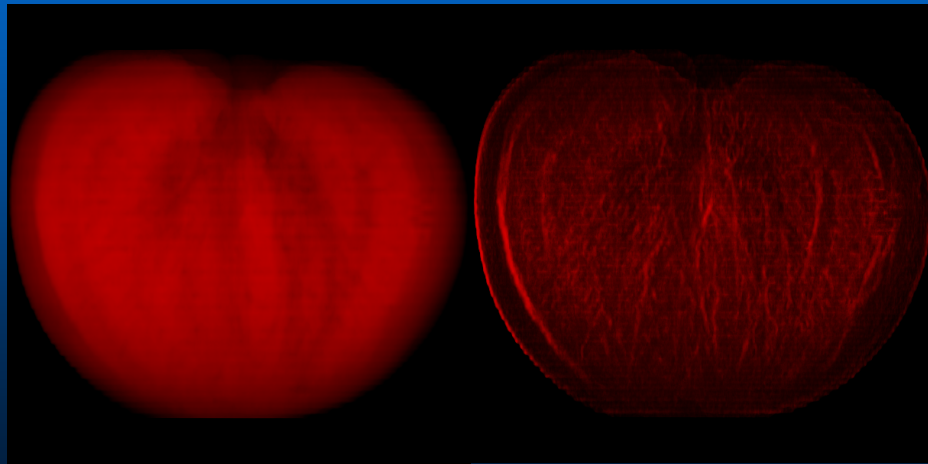
Illuminated Gas

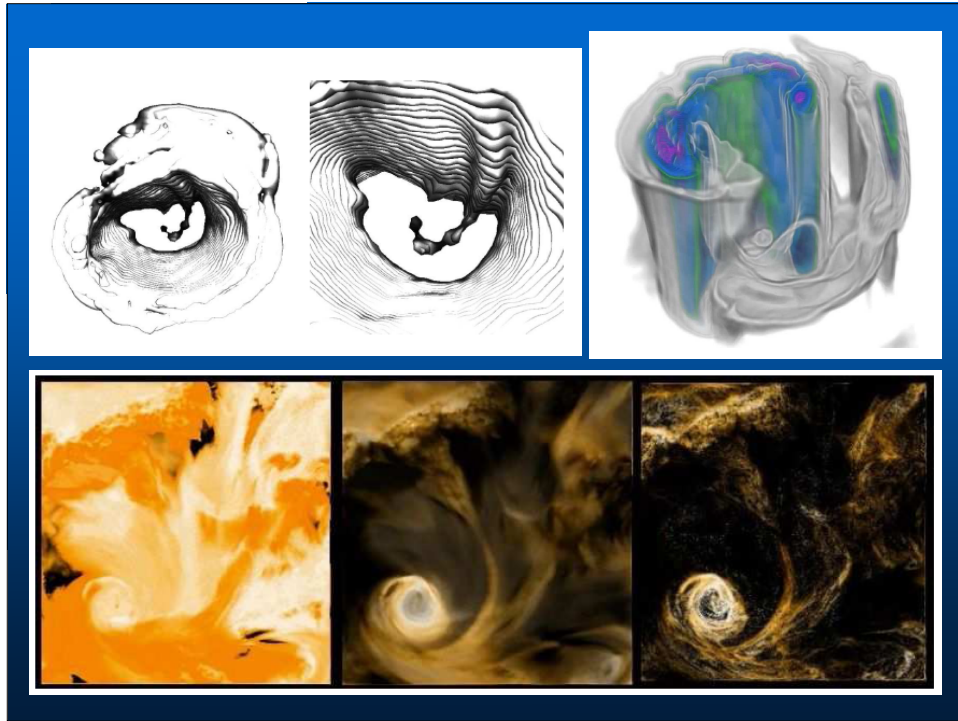
**Silhouette and
Boundary Enhanced Image**



Illuminated Gas

**Boundary and
Silhouette Enhancement**





Tone Shading

- Artistic technique:
 - change tone of color with orientation to light
 - mimics illumination by warm light source
- Gooch et al. [S98] introduced synthetic illumination model for automatic tone shading
 - linear interpolation between warm and cool color for surface using $N \cdot L$ as parameter

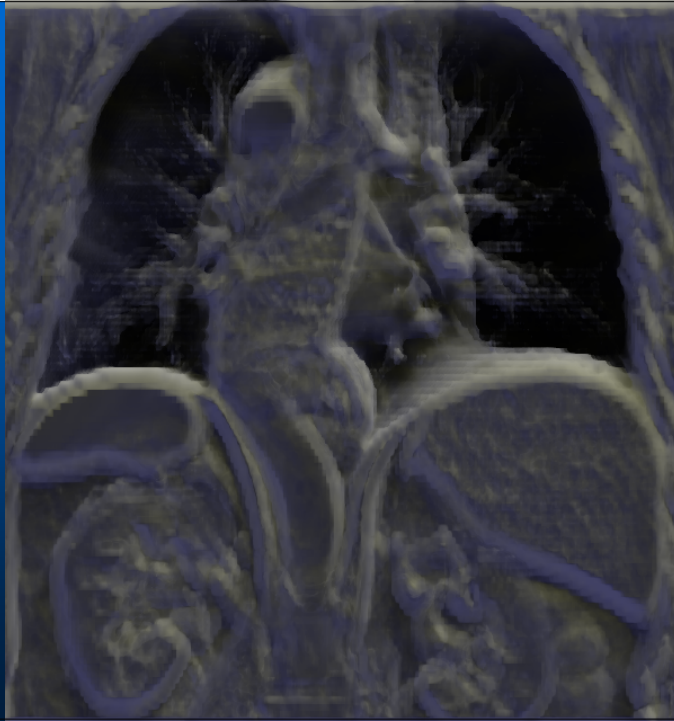
- Computed as

$$c = k_{ta} I_G + \sum_i^{N_L} (I_t + k_{td} I_o)$$

- with tone contribution

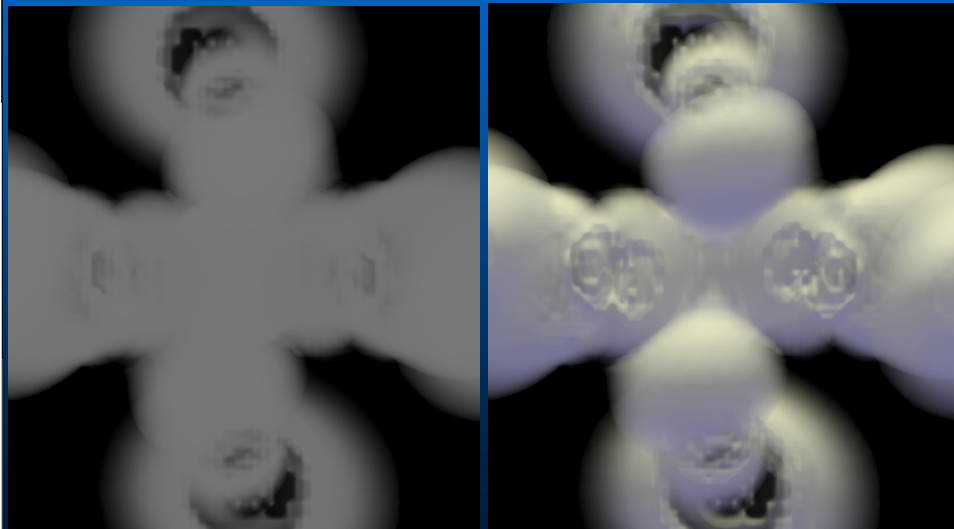
$$I_t = \left((1.0 + \nabla_f \cdot L) / 2 \right) c_w + \left(1 - (1.0 + \nabla_f \cdot L) / 2 \right) c_c$$

Tone shading

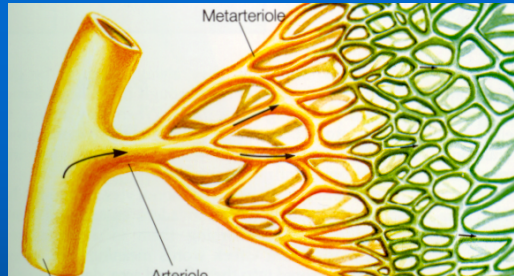


Illuminated Gas

Tone Shaded



Feature Halos



- **Concept**
 - Null halos
 - Clarify depth
- **Feature haloed by neighbors**
 - most strongly for close neighbors of weak pixels

$$h_i = \left(\sum_n^{\text{neighbors}} \frac{h_n}{\|P_i - P_n\|^2} \right) (1 - \|\nabla_f(P_i)\|)$$

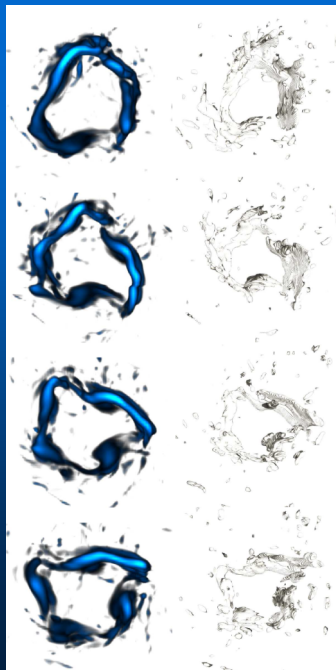
- **Halo potential of each voxel**
 - highest for silhouette voxels with strong gradient to this voxel

$$h_n = \left(\nabla_{fn}(P_n) \cdot \left(\frac{P_i - P_n}{\|P_i - P_n\|} \right) \right)^{k_{hpe}} (1 - \nabla_{fn}(P_n) \cdot V)^{k_{hse}}$$

Without **Features Halos** **With**

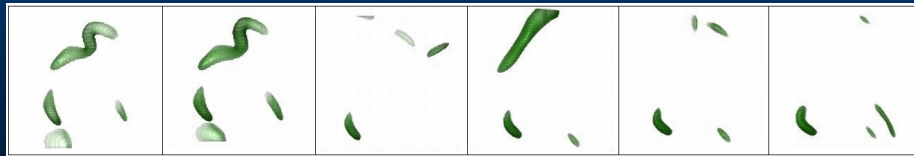


Understanding Change and Process



Flow Illustration

- Research done primarily by Alark Joshi
- Adding a dimension
 - Volume: What's inside this surface?
 - Temporal: How did it get this way?
- Questions
 - Where was this feature before?
 - What is pattern of motion of features?
 - How has this feature changed?



daVinci

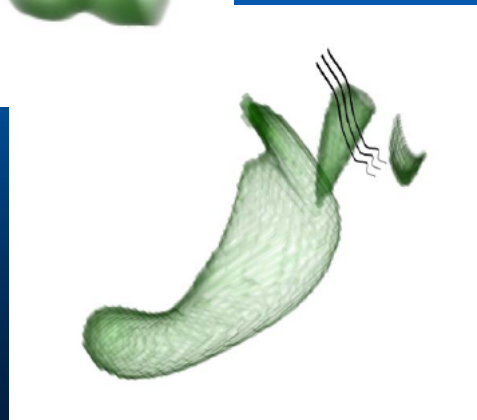
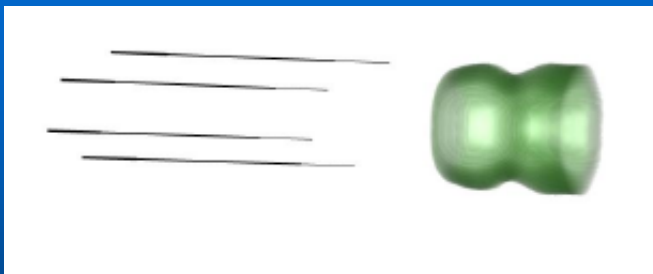


Inspiration: Flow Paths

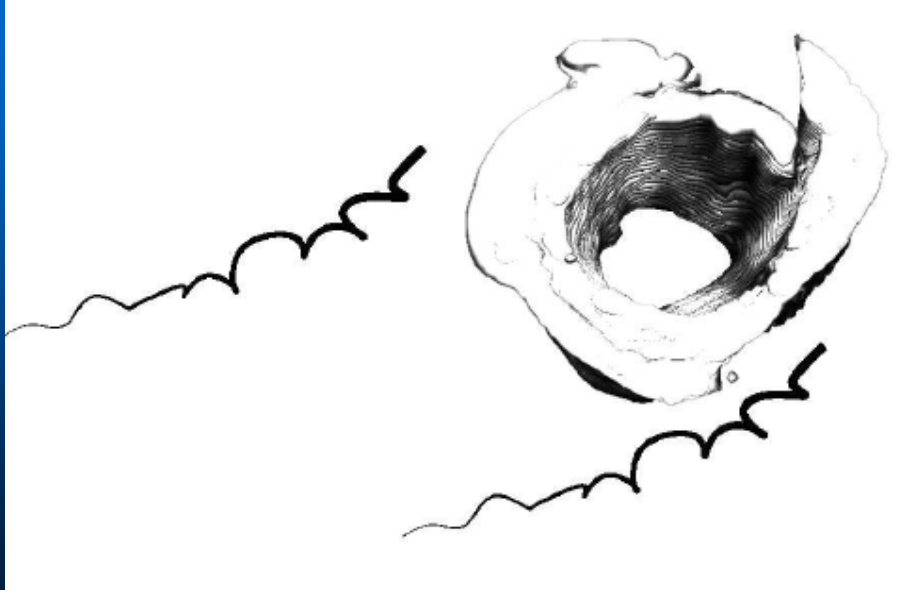


- McCloud

Adaptation: Flow Paths



Application: Flow Paths



Inspiration: Flow Ribbons



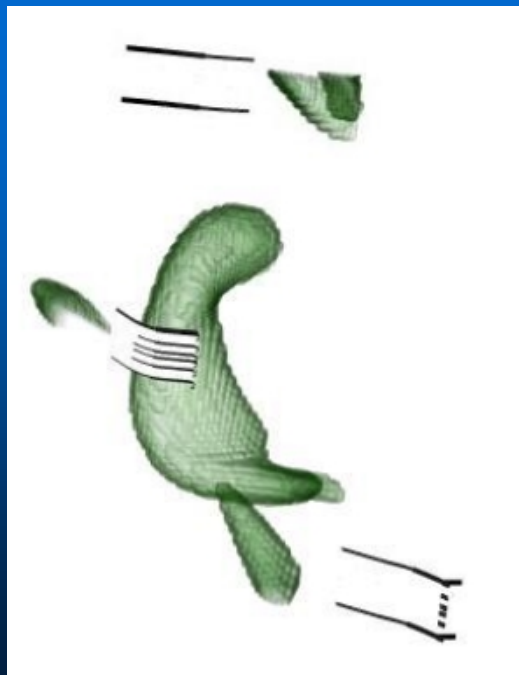
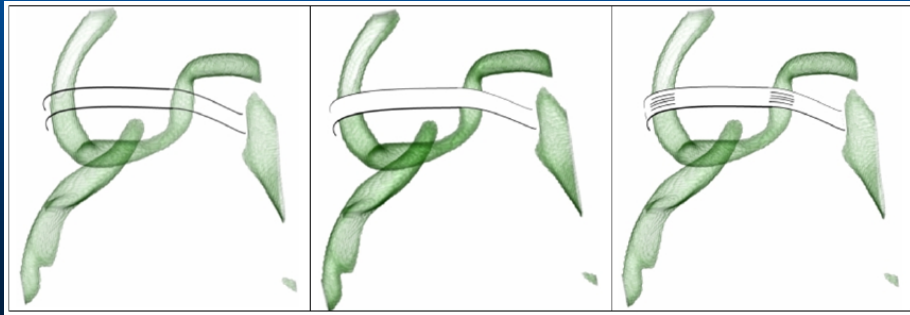
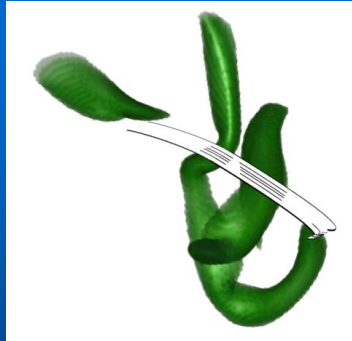
- McCloud

IN THIS APPROACH, BOTH THE *MOVING OBJECT* AND THE *BACKGROUNDS* ARE DRAWN IN A *CLEAR, ARTICULATED* STYLE, AND THE *PATH* OF MOTION IS IMPOSED *OVER* THE SCENE



• MULTIPLE IMAGES CAN BE FOR

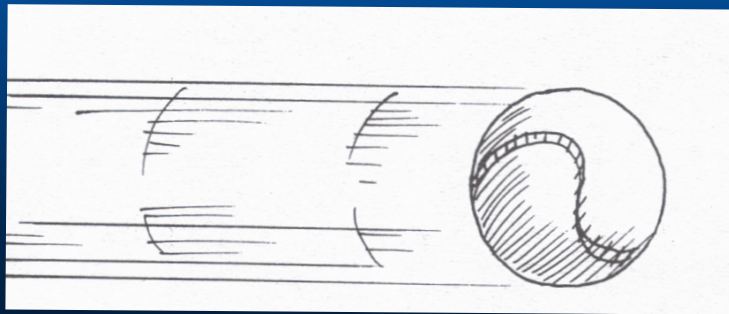
Adaptation: Flow Ribbons



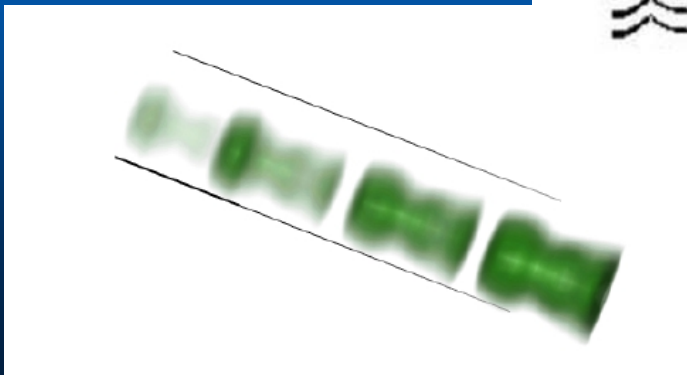
Inspiration: Strobe Silhouettes



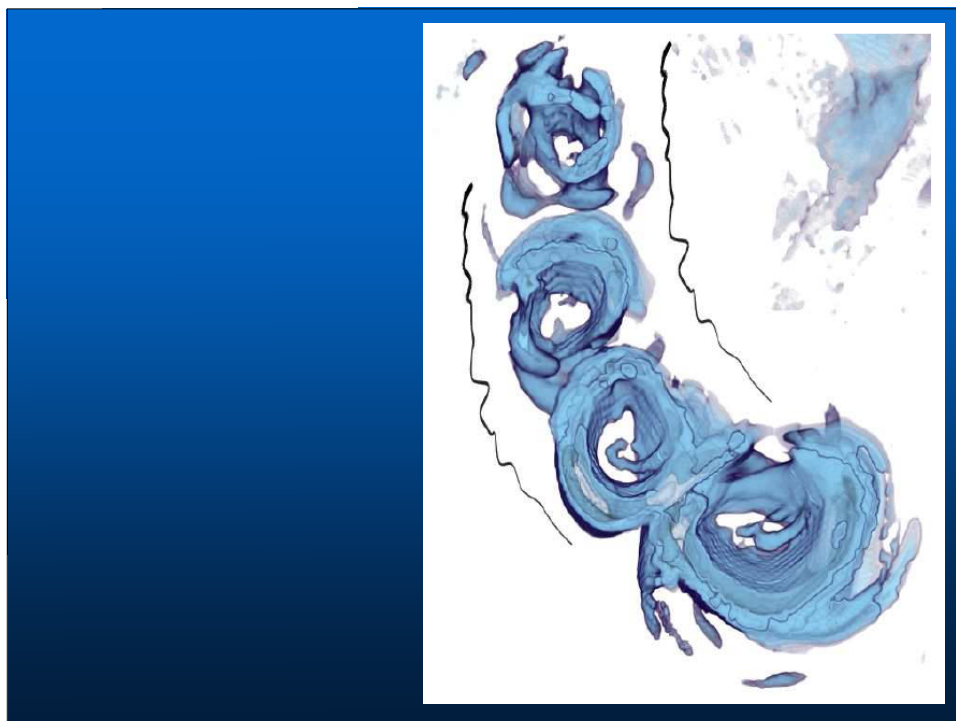
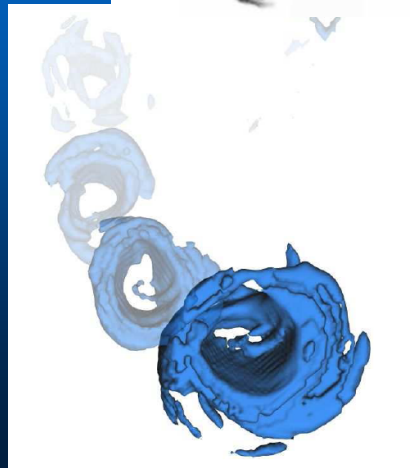
McCloud



Adaptation: Strobe Silhouettes



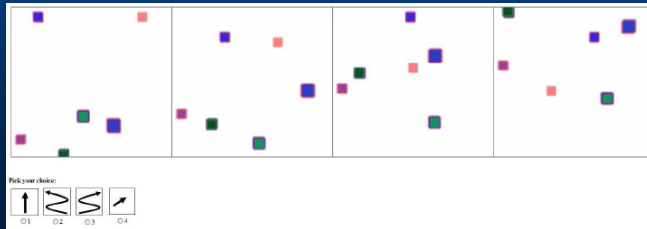
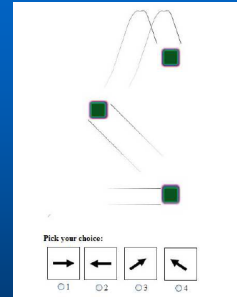
**Application:
Strobe Silhouettes**





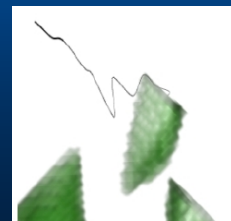
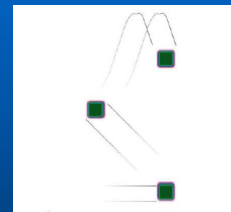
Flow Illustration Evaluation

- Conducted user study to compare
 - Snapshots
 - Augmented snapshots
 - Animation
 - Augmented animation
- Measured
 - Accuracy
 - Speed
 - Confidence



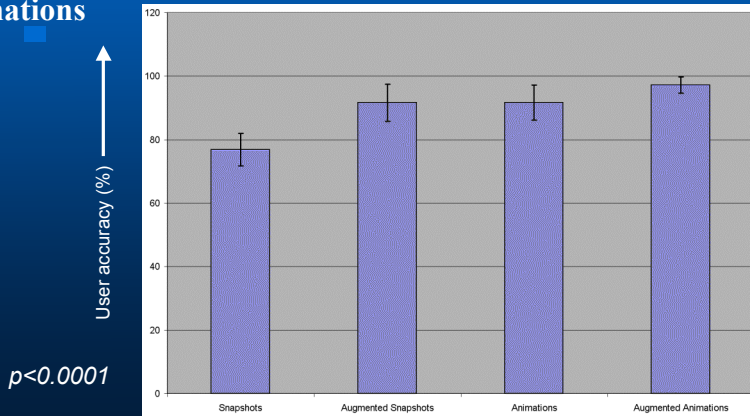
Datasets

- Both synthetic and real-world data were presented in all four representations.
- The synthetic datasets consisted of
 - A single feature tracing a simple path (linear or circular)
 - Multiple features tracing simple paths (linear, circular, spiral)
 - Multiple features tracing complex paths.
- Our real-world dataset was the turbulent vortex dataset courtesy of Rutgers university



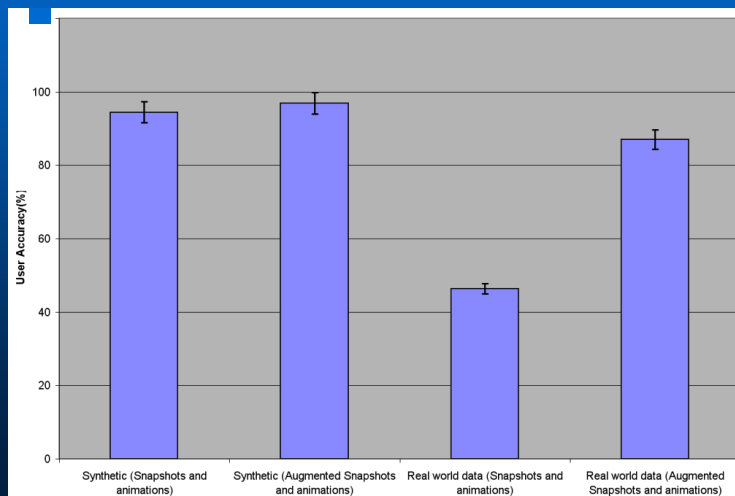
User accuracy

- *User accuracy* - number of correct answers per user per technique
- Accuracy was higher for augmented snapshots and augmented animations than for plain snapshots or animations



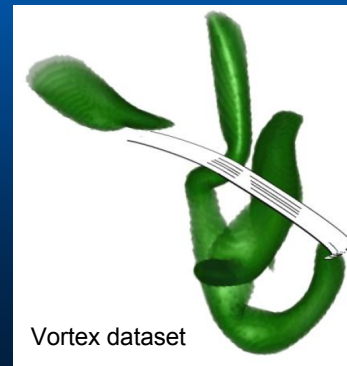
Synthetic vs Real-world data

- For synthetic data, subjects were fast and accurate for all four representations.



Synthetic vs Real-world data

- User accuracy for real world data was 30% for snapshots and 66.67% using animation.
- For real-world data, when visualized using augmented snapshots, the user accuracy is much higher at 82%.
- Subjects performed best (user accuracy = 92.66%) with the real world data when visualized using augmented animations.

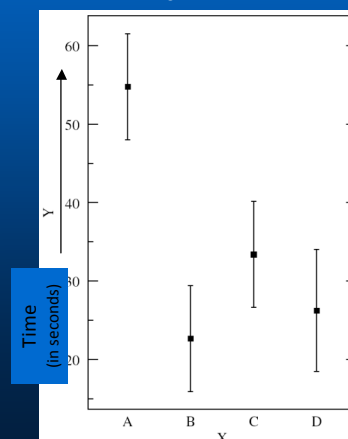


Task time

- Task time - the time required to complete each task per visualization technique.
- The subjects required more time when viewing snapshots than in the other three cases.
- Augmented animations helped subjects answer questions faster than just animations.
- The p -value < 0.0001 from the ANOVA test implies that it is a significant result.

Legend

- A – Snapshots
- B – Augmented snapshots
- C – Animation
- D – Augmented animations

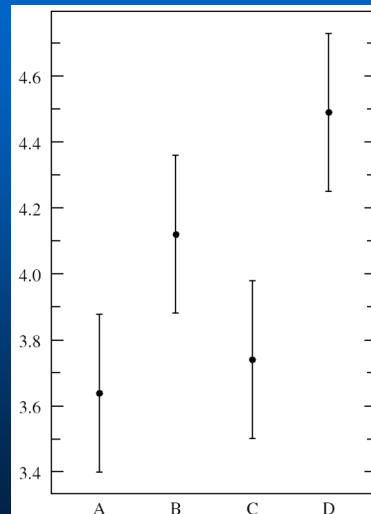


User confidence

- The subjects were asked to specify a confidence level for each answer.
- Subjects were more confident in their answers when using illustration-inspired techniques
- The $p\text{-value} < 0.0007$ from the ANOVA test implies that this is a significant result.

Confidence
1 – lowest
5 – highest

Legend
A – Snapshots
B – Augmented snapshots
C – Animation
D – Augmented animations



65

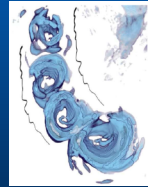
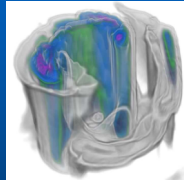
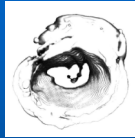
Directions

- Larger toolbox of illustration techniques
 - Structure
 - Motion
 - Attribute change
- Additional applications and evaluation

- More direct visualization of models

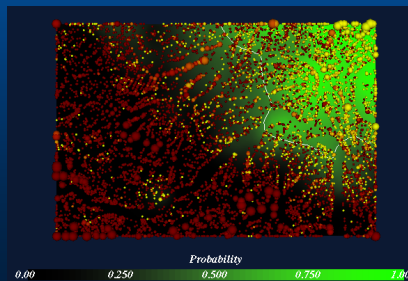
A Very Short History of 3D Visualization

- Where?
- What?
- When?
- Why?

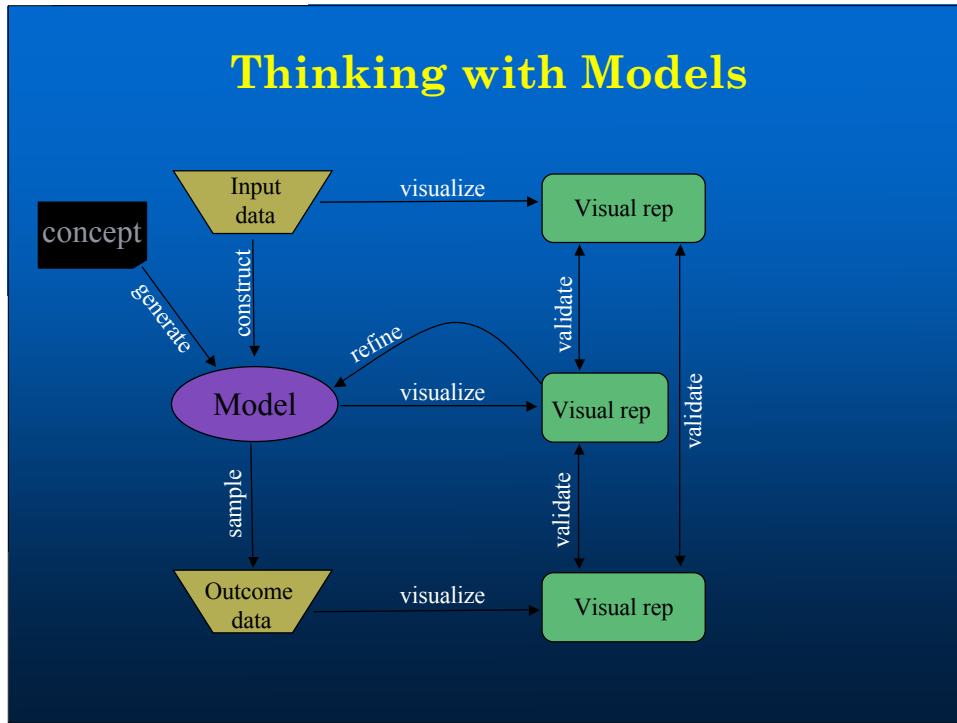


What's a Model?

- A system of postulates, data, and inferences presented as a mathematical description of an entity or state of affairs -- (12) Webster's Ninth Collegiate Dictionary
- Data vs Model
 - Discrete : continuous
 - Deterministic : probabilistic
 - Examples : explanations

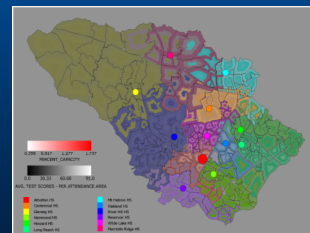
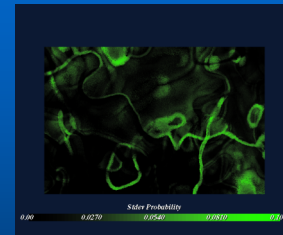


Thinking with Models



Some Challenges

- **Understanding models**
 - Sampling and interrogating
 - High-dimensional structure of model
 - Model sensitivity and variability
- **Comparing models**
 - Validating outcome against reality
 - Validating model against from reality
 - Examining families of models
- **Constructing models**
 - Selecting parameters
 - Incremental construction
 - Abstract specification



Questions?

Image References

- John O.E. Clark. *A Visual Guide to the Human Body*, Barnes and Noble Books, 1999.
- Elaine Hodges (ed), *The Guild Handbook of Scientific Illustration*, John Wiley & Sons, 1989.
- Scott McCloud, *Understanding Comics*, Kitchen Sink Press, 1993.
- Phyllis Wood, *Scientific Illustration*, Second Edition, John Wiley & Sons, 1994.