

## Seeing, Hearing, and Touching: Putting It All Together

### Seeing Module

Rapid Vision	Rensink
<b>Visual Encoding</b>	
Procedural Vision	Rensink
Navigating Visual Space	Munzner



### Overview

#### Visual Encoding

- Perceptual Channels
- Visualization Frameworks
- Spatial Layout
- Color

#### Navigating Visual Space

- External Representation
- Navigation/Zooming
- Focus+Context
- Occlusion
- Highlighting
- Spatial Navigation
- Zooming
- Focus+Context

### Visual Encoding

represent dataset using perceptual channels

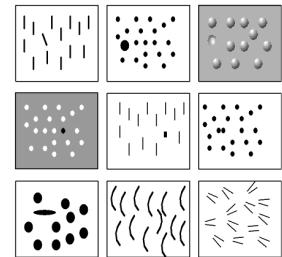
#### challenges

- rapid processing for only one channel
- sometimes two

### Preattentive Visual Channels

many preattentive channels of visual modality

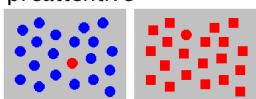
- hue
- shape
- texture
- length
- width
- size
- orientation
- curvature
- intersection
- intensity
- flicker
- direction of motion
- stereoscopic depth
- lighting direction
- and more...



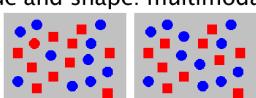
[Chris Healey, Preattentive Processing, [www.csc.ncsu.edu/faculty/healey/PP/PP.html](http://www.csc.ncsu.edu/faculty/healey/PP/PP.html)]

### Preattentive Visual Channels

color alone: preattentive  
shape alone: preattentive



combined hue and shape: multimodal



- requires attention
- search speed linear with distractor count

[Chris Healey, Preattentive Processing, [www.csc.ncsu.edu/faculty/healey/PP/PP.html](http://www.csc.ncsu.edu/faculty/healey/PP/PP.html)]

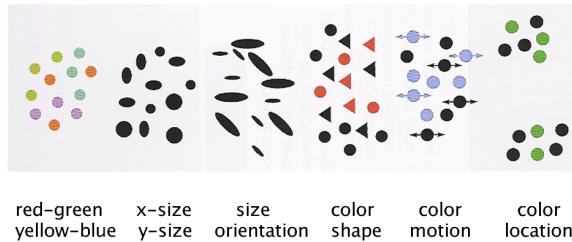
### Visual Encoding

represent dataset using perceptual channels

#### challenges

- rapid processing for only one channel
- sometimes two
- only some channels separable
- others integral

## Integral vs. Separable Channels



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

## Visual Encoding

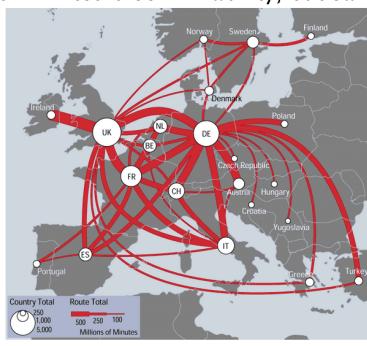
represent dataset using perceptual channels

### challenges

- rapid processing for only one channel sometimes two
- only some channels separable others integral
- not all channels created equal variable dynamic range

## Channel Dynamic Range

linewidth: limited discriminability, but salient



[mappa.mundi.net/maps/maps\_014/telegeography.html]

## Visual Encoding

represent dataset using perceptual channels

### challenges

- rapid processing for only one channel sometimes two
- only some channels separable others integral
- not all channels created equal variable dynamic range

vast parameter space of choices  
· need methodology for guidance

### information visualization framework

- how to match data variables to visual channel

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## Framework

### Data Variables

- 1D, 2D, 3D, 4D, 5D, ..., ND

### Geometric Primitives/ Marks

- point, line, area, surface, volume

### Perceptual Channels/ Retinal Properties

- size, brightness, color, texture, orientation, shape,...
- parameters control appearance of marks
- channels of information flowing from retina to brain

### Data Types

- nominal, ordered, quantitative

[Mackinlay/Card; Bertin; Wilkinson; Stolte et al]

## Data Types

### categorical (nominal)

- apples, oranges, bananas



### ordered (ordinal)

- small, medium, large
- days: Sun, Mon, Tue, Wed, Thu, Fri, Sat



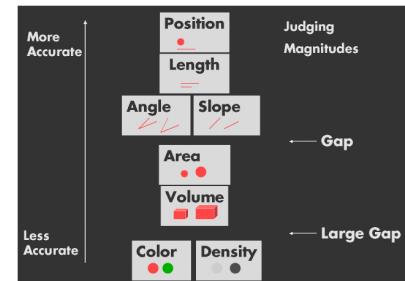
### continuous (quantitative)

- 10 inches, 17 inches, 23 inches



[graphics.stanford.edu/papers/polaris]

## Ranked Perceptual Channels, Quantitative Data

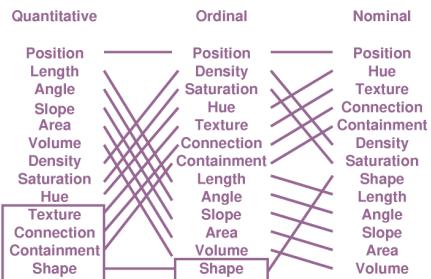


[graphics.stanford.edu/courses/cs448b-02-spring/lectures/encoding/walk015.html]

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## Ranking Varies by Data Type

spatial position best for all types



[Mackinlay, Automating the Design of Graphical Presentations of Relational Information, ACM TOG 5.2, 1986]

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## Overview

### Visual Encoding

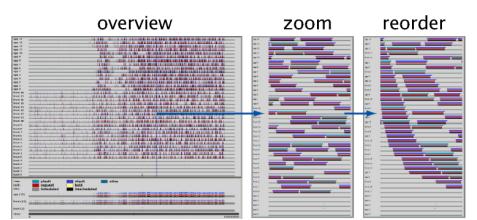
- Perceptual Channels
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## Interactive Ordering: Rivet

performance analysis of parallel system



[Bosch, Performance Analysis and Visualization of Parallel Systems Using SimOS and Rivet: A Case Study, HPCA6, 2000.  
graphics.stanford.edu/papers/rivet\_argus]

## Space vs. Time: Showing Change



animation: show time using temporal change  
· good: show process



[www.geom.uiuc.edu/docs/outreach/oi/evert.mpq]

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## Space vs. Time: Showing Change



animation: show time using temporal change

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



[www.geom.uiuc.edu/docs/outreach/oi/evert.mpg] [www.astroshow.com/ccdpho/pluto.gif]

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## Space vs. Time: Showing Change



animation: show time using temporal change

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



[www.geom.uiuc.edu/docs/outreach/oi/evert.mpg] [www.astroshow.com/ccdpho/pluto.gif]

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## Space vs. Time: Showing Change



animation: show time using temporal change

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

change blindness from intermediate frames



[www.geom.uiuc.edu/docs/outreach/oi/evert.mpg] [www.astroshow.com/ccdpho/pluto.gif]



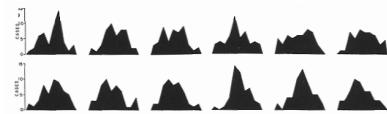
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## Space vs. Time: Showing Change



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]

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## Color/Brightness Constancy

segmentation: relative judgements

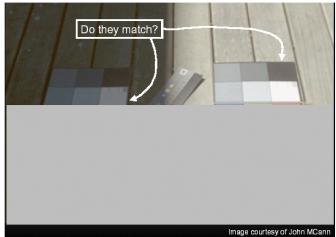


[courtesy of John McCann, from Stone 2001 SIGGRAPH course graphics.stanford.edu/courses/cs448b-02-spring/04cdrom.pdf]

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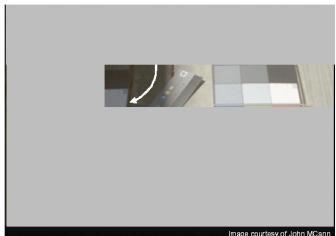


[courtesy of John McCann, from Stone 2001 SIGGRAPH course  
graphics.stanford.edu/courses/cs448b-02-spring/04cdrom.pdf]

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## Color/Brightness Constancy

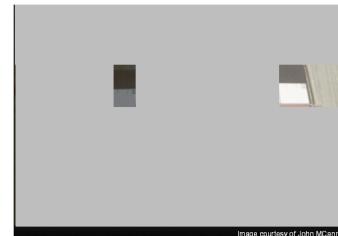
segmentation: relative judgements



[courtesy of John McCann, from Stone 2001 SIGGRAPH course  
graphics.stanford.edu/courses/cs448b-02-spring/04cdrom.pdf]

## Color/Brightness Constancy

segmentation: relative judgements

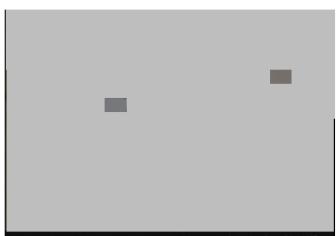


[courtesy of John McCann, from Stone 2001 SIGGRAPH course  
graphics.stanford.edu/courses/cs448b-02-spring/04cdrom.pdf]

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## Color/Brightness Constancy

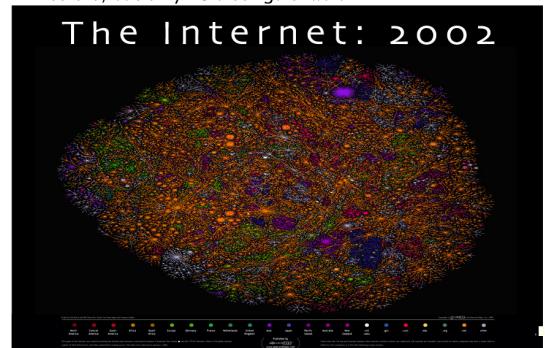
segmentation: relative judgements



[courtesy of John McCann, from Stone 2001 SIGGRAPH course  
graphics.stanford.edu/courses/cs448b-02-spring/04cdrom.pdf]

## Coloring Categorical Data

22 colors, but only ~8 distinguishable



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## Coloring Categorical Data

discrete small patches separated in space

limited distinguishability: around 8–14

- channel dynamic range: low

maximally discriminable colors from Ware

- maximal saturation for small areas



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

choose bins explicitly for maximum milage

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## Minimal Saturation for Large Areas

avoid saturated color in large areas

- "excessively exuberant"



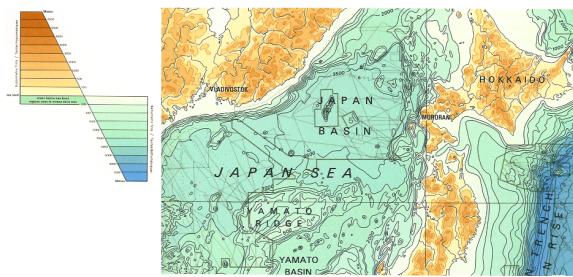
[Edward Tufte, Envisioning Information, p.82]

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## Minimal Saturation for Large Areas

large continuous areas in pastel

- diverging colormap (bathymetric/hypsometric)

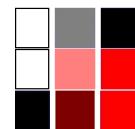


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## Coloring Ordered Data

innate visual order

- greyscale/luminance
- saturation
- brightness



visual order

- hue



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## Coloring Quantitative Data

continuous field

side by side patches highly distinguishable

- channel dynamic range: high

mediocre

- hue (rainbow)



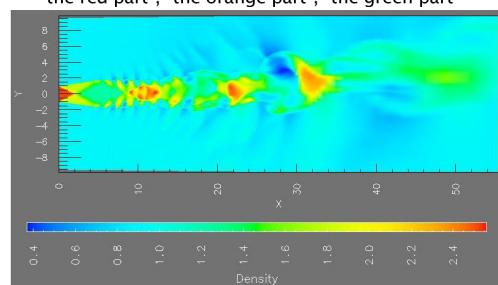
[www.research.ibm.com/visualanalysis/perception.html]

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## 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>]

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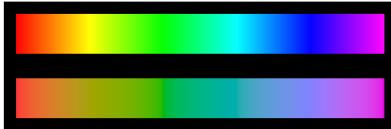
## Rainbow Colormap Disadvantages

segmentation artifacts

- popular interpolation perceptually nonlinear!

solution

- create perceptually isolinear map



[Kindlmann, Reinhard, and Creem.

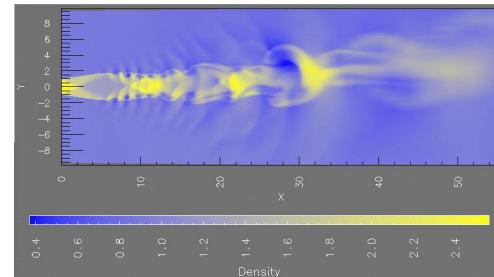
Face-based Luminance Matching for Perceptual Colormap Generation. Proc. Vis 02  
www.cs.utah.edu/~gk/lumFace]

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## Non-Rainbow Colormap Advantages

high-frequency continuity

- interpolating between just two hues

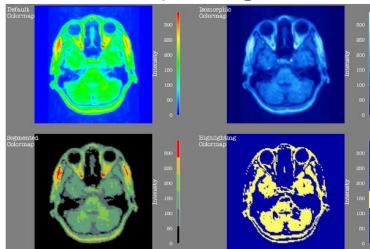


[Rogowitz and Treinish, How NOT to Lie with Visualization,  
www.research.ibm.com/dx/proceedings/prada/truevis.htm

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## Segmenting Colormaps

explicit rather than implicit segmentation



[Rogowitz and Treinish, How NOT to Lie with Visualization,  
www.research.ibm.com/dx/proceedings/prada/truevis.htm

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## Color Deficiency

very low channel dynamic range for some!

protanope

deutanope

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

tritanope

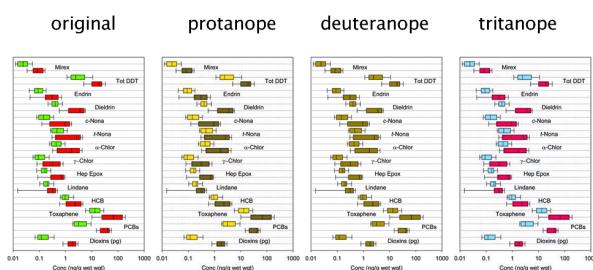
- has yellow/blue deficit

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

- test your images

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## Color Deficiency Examples: vischeck



[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.]

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## Designing Around Deficiencies

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

- redundantly encode with saturation, brightness

original						protanope						deutanope						tritanope					
Q#	Limit	Dest	Status	Ex.05	Q#	Limit	Dest	Status	Ex.05	Q#	Limit	Dest	Status	Ex.05	Q#	Limit	Dest	Status	Ex.05				
29,000	79.95			10,000	29,000	79.95			10,000	29,000	79.95			10,000	29,000	79.95			10,000				
89,000	MKT			13,000	89,000	MKT			13,000	89,000	MKT			13,000	89,000	MKT			13,000				
29,000	MKT			15,000	29,000	MKT			15,000	29,000	MKT			15,000	29,000	MKT			15,000				
200,000	39			86,000	200,000	39			86,000	200,000	39			86,000	200,000	39			86,000				
20,000	79.95	Dot		17,000	20,000	79.95	Dot		17,000	20,000	79.95	Dot		17,000	20,000	79.95	Dot		17,000				
20,000	79.95	Jee O		20,000	20,000	79.95	Jee O		20,000	20,000	79.95	Jee O		20,000	20,000	79.95	Jee O		20,000				
20,000	79.95	DOT		13,000	20,000	79.95	DOT		13,000	20,000	79.95	DOT		13,000	20,000	79.95	DOT		13,000				
20,000	79.95	Jee G		13,000	20,000	79.95	Jee G		13,000	20,000	79.95	Jee G		13,000	20,000	79.95	Jee G		13,000				
20,000	79.95	DOT		10,000	20,000	79.95	DOT		10,000	20,000	79.95	DOT		10,000	20,000	79.95	DOT		10,000				
20,000	MKT			200,000	20,000	MKT			200,000	20,000	MKT			200,000	20,000	MKT			200,000				
20,000	MKT	Jee G		55,000	20,000	MKT	Jee G		55,000	20,000	MKT	Jee G		55,000	20,000	MKT	Jee G		55,000				

[Courtesy of Brad Paley]

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## More Reading: Perceptual Channels

Information Visualization: Perception for Design. Colin Ware. Morgan Kaufmann 1999.  
Chapter 5: Visual Attention and Information That Pops Out

Information Visualization: Perception for Design. Colin Ware. Morgan Kaufmann 1999.  
Chapter 6: Static and Moving Patterns

The Psychophysics of Sensory Function, S. S. Stevens, Sensory Communication, MIT Press, 1961, pp 1-33.  
<http://www.cs.ubc.ca/~tmm/courses/cpsc533c-03-spr/readings/ss.pdf>

Perception in Visualization. Christopher G. Healey  
<http://www.csc.ncsu.edu/faculty/healey/PP/index.html>

## More Reading: Frameworks

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

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>

The Structure of the Information Visualization Design Space. Stuart Card and Jock Mackinlay, Proc. InfoVis 97  
<http://citeseer.nj.nec.com/card96structure.html>

The Grammar of Graphics, Leland Wilkinson, Springer 1999

Semiology of Graphics: Diagrams, Networks, Maps. Jaques Bertin. University of Wisconsin Press, Madison (WI), 1983. W. J. Berg (Translator).

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## More Reading: Spatial Layout

The Visual Design and Control of Trellis Display  
R. A. Becker, W. S. Cleveland, and M. J. Shyu  
Journal of Computational and Statistical Graphics, 5:123–155. (1996).  
<http://cm.bell-labs.com/stat/doc/trellis.jcgs.col.ps>

Envisioning Information. Edward Tufte. Graphics Press, 1990.  
Chapter 4: Small Multiples, Chapter 6: Narratives of Space and Time

The Elements of Graphing Data, William S. Cleveland, Hobart Press 1994.

The Table Lens: Merging Graphical and Symbolic Representations in an Interactive Focus + Context Visualization for Tabular Information  
Ramana Rao and Stuart K. Card, SIGCHI'94, pp. 318-322.  
<http://citeseer.stt.psu.edu/545353.html>

Performance Analysis and Visualization of Parallel Systems Using SimOS and Rivet: A Case Study. Robert Bosch, Chris Stolte, Gordon Stoll, Mendel Rosenblum, and Pat Hanrahan. In Proc. Sixth IEEE International Symposium on High-Performance Computer Architecture, Jan 2000. [http://graphics.stanford.edu/papers/rivet\\_argus/](http://graphics.stanford.edu/papers/rivet_argus/)

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## More Reading: Color

Information Visualization: Perception for Design. Colin Ware. Morgan Kaufmann 1999.  
Chapter 3: Lightness, Brightness, Contrast, and Constancy

Information Visualization: Perception for Design. Colin Ware. Morgan Kaufmann 1999.  
Chapter 4: Color

Envisioning Information. Edward Tufte. Graphics Press, 1990. Chapter 5: Color and Information

How Not to Lie with Visualization, Bernice E. Rogowitz and Lloyd A. Treinish, Computers In Physics 10(3) May/June 1996, pp 268-273.  
<http://www.research.ibm.com/dx/proceedings/pravda/truevis.htm>

A Field Guide To Digital Color, Maureen Stone, AK Peters 2003

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