

# Interaction



CS 4460 – Intro. to Information Visualization  
November 4, 2014  
John Stasko

## Interaction?



- What do you mean by “interaction”?

# Background



- Interaction (HCI)
    - = “The communication between user and the system” [Dix et al., 1998]
    - = “Direct manipulation and instantaneous change” [Becker et al., 1987]
- “HCI research is far from having solid (and falsifiable) theories of interaction”  
[Beaudouin-Lafon, 2004]

# Clarifying...



## Interaction

Being interactive, not static

**Today's  
focus**



## Interaction

Communication, analytic discourse

# Main Components



“The effectiveness of information visualization hinges on two things: its ability to clearly and accurately represent information and our ability to interact with it to figure out what the information means.”

S. Few

*Now You See It*, p. 55

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## “Little Brother”



- Two main components in an infovis
  - Representation
  - Interaction



- Representation gets all the attention
- Interaction is where the action is (no pun intended)

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# Research Focus



- Very challenging to come up with innovative, new visual representations
- But can do interesting work with how user interacts with the view or views
  - It's what distinguishes infovis from static visual representations on paper
- Analysis is a process, often iterative with branches and side bars

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# Interaction



- How do you define "interactive"?

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# Response Time



- .1 sec
  - animation, visual continuity, sliders
- 1 sec
  - system response, conversation break
- 10 sec
  - cognitive response

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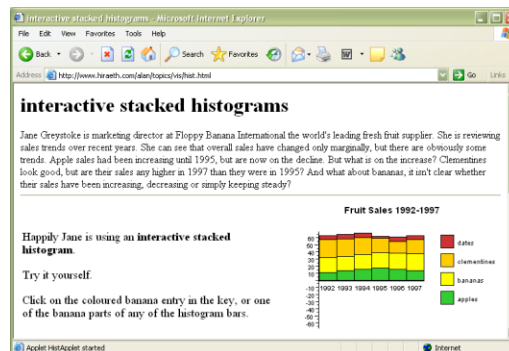
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# Example



Even simple interaction can be quite powerful



Stacked histogram

<http://www.hiraeth.com/alan/topics/vis/hist.html>

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# Interaction Types

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- Dix and Ellis (AVI '98) propose
  - Highlighting and focus
  - Accessing extra info – drill down and hyperlinks
  - Overview and context – zooming and fisheyes
  - Same representation, changing parameters
  - Linking representations – temporal fusion

# Interaction Types

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- Keim's taxonomy (TVCG '02) includes
  - Projection
  - Filtering
  - Zooming
  - Distortion
  - Linking and brushing

# Another Taxonomy



- Operator
  - navigation, selection, manipulation, distortion, filtering
- Space of interaction
  - screen, data value, data structure, attribute, object, visualization structure
- Parameters of the interaction operator
  - focus, extents, transformation, blender

Ward, Grinstein, & Keim  
2010, chapter 10

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# Few's Principles



- Especially useful ways of interacting with data
  - Comparing
  - Sorting
  - Adding variables
  - Filtering
  - Highlighting
  - Aggregating
  - Re-expressing
  - Re-visualizing
  - Zooming and panning
  - Re-scaling
  - Accessing details on demand
  - Annotating
  - Bookmarking

*Now You See It*  
Chapter 4

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# Details



- Sorting (for example)
  - Provide a selection of graphs that support the full spectrum of needed comparisons
  - Provide graphs that are designed for easy comparison of those values and relevant patterns without distraction
  - Provide the means to place a great deal of information that we wish to compare on the screen at the same time, thereby avoiding the need to scroll or move from screen to screen to see the information

Great design checks for your visualization systems

# Challenging



- Interaction seems to be a difficult thing to pin down and characterize
- Let's go back to the user trying to solve problems...
  - User-centered versus system-centered characterizations



## Another take



**Toward a Deeper Understanding of the Role of  
Interaction in Information Visualization**

Ji Soo Yi, Youn ah Kang, John T. Stasko, *Member, IEEE*, and Julie A. Jacko

**Abstract**—Even though interaction is an important part of information visualization (Infovis), it has garnered a relatively low level of attention from the Infovis community. A few frameworks and taxonomies of Infovis interaction techniques exist, but they typically focus on low-level operations and do not address the variety of benefits interaction provides. After conducting an extensive review of Infovis systems and their interactive capabilities, we propose seven general categories of interaction techniques widely used in Infovis: 1) Select, 2) Explore, 3) Reconfigure, 4) Encode, 5) Abstract/Elaborate, 6) Filter, and 7) Connect. These categories are organized around a user's intent while interacting with a system rather than the low-level interaction techniques provided by a system. The categories can act as a framework to help discuss and evaluate interaction techniques and hopefully lay an initial foundation toward a deeper understanding and a science of interaction.

**Index Terms**—information visualization, interaction, interaction techniques, taxonomy, visual analytics

**1 INTRODUCTION**

Information visualization (Infovis) systems, at their core, appear to have two main components: representation and interaction. The representation component, whose roots lie in the field of computer graphics, concerns the mapping from data to representation and how that representation is rendered on the display. The interaction component involves the dialog between the user and the system as the user explores the data set to uncover insights. The interaction component's roots lie in the area of human-computer interaction (HCI). Although discussed as two separate components, representation and interaction clearly are not mutually exclusive. For instance, interaction with a system may activate a change in representation. Nonetheless, the two components seem to compose the two fundamental aspects of Infovis systems, and it seems reasonable to consider what each contributes to an end-user's and jotting down notes on the poster). Spence even suggests the notion of "passive interaction" through which the user's mental model on the data set is changed or enhanced [38]. Finally, through interaction, some limits of a representation can be overcome, and the cognition of a user can be further amplified (e.g., [15, 29]).

The importance of interaction and the need for its further study seem undisputed. For example, the recent book *Illuminating the Path: The Research and Development Agenda for Visual Analytics* calls for further research on interaction:

**Recommendation 3.3:** Create a new science of interaction to support visual analytics. The grand challenge of interaction is to develop a taxonomy to describe the design space of interaction techniques that supports the

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IEEE TVCG 13(6), '07

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## Study Methodology



- Survey
  - 59 papers
    - Papers introducing new interaction systems
    - Well-known papers in subareas of Infovis
  - 51 systems
    - Commercial Infovis Systems (SeeIT, Spotfire, TableLens, InfoZoom, etc.)
  - Collected 311 individual interaction techniques
- Affinity Diagram Method

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# Focus Emerged



## User intent

“What a user wants to achieve through a specific interaction technique”

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## Main Idea



- Don't focus so much on particular interactive operations and how they work
- Interaction is ultimately being done by a person for a purpose
  - Seeking more information, solving a problem
  - Fundamental aspect of exploratory, analytic discourse

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# Results



## 7 categories

Select

Explore

Reconfigure

Encode

Abstract/Elaborate

Filter

Connect

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## 1. Select



“Mark something as interesting”

- Mark items of interest to keep track
- Seems to often work as a preceding action to subsequent operations.

e.g.,

- Selecting a placemark in Google Map
- The Focus feature in TableLens

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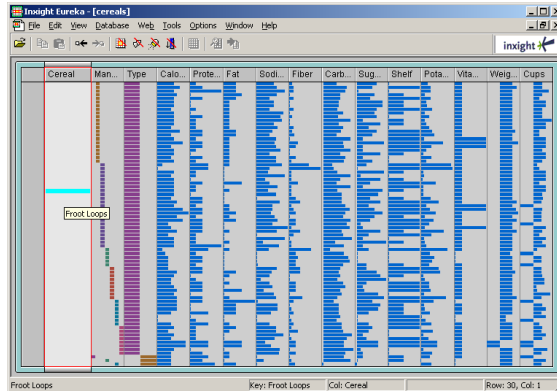
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# Pop-up tooltips



- Hovering mouse cursor brings up details of item



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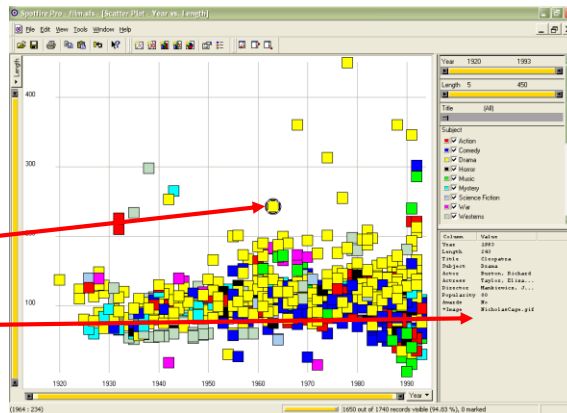
# Mouse Selection



Clicking on an item selects it and attributes of the data point are shown

Selected item

Attributes



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# Challenge



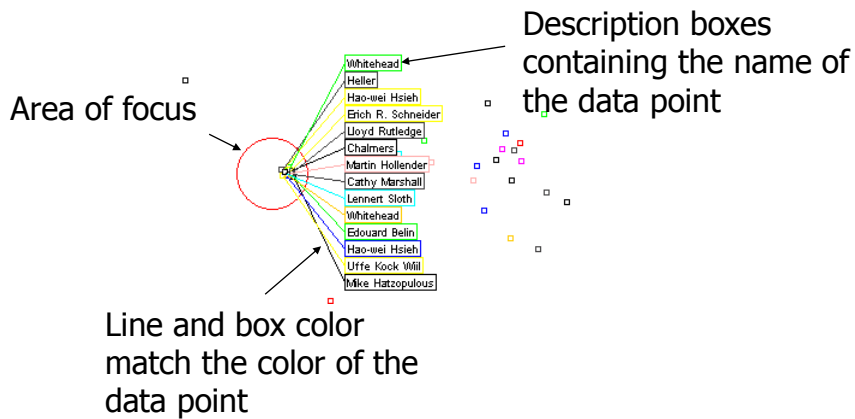
- Where are the labels?
  - Labeling is difficult to do when so many entities exist
  - Can add to ball of string problem

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# Excentric Labeling



Fekete and Plaisant  
CHI '99

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# Being Excentric



- “Invisible” – Does not appear until user hovers over data points
- Describes data points using the name field
- Visually connects labels with data points
- Can order labels to indicate graph position

Demos at <http://www.cs.umd.edu/hcil/excentric>

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# Generalized Selection



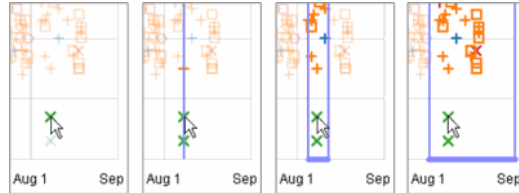
- When you click on an item in a visualization, can we generalize the selection off the precise item?
  - Maybe you want to select items matching some attribute(s) of that item

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# Query Relaxation



As you dwell on your mouse pick, the selection criteria broaden and you can choose sets of items

Video

Heer, Agrawala, Willett  
CHI '08

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## 2. Explore



“Show me something different”

- Enable users to examine a different subset of data
- Overcome the limitation of display size

e.g.,

- Panning in Google Earth
- Direct Walking in Visual Thesaurus

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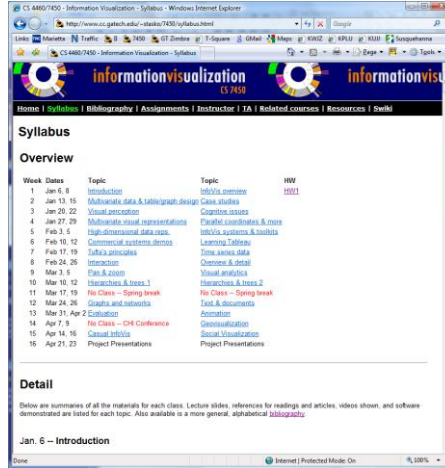
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# Direct Walk



- Linkages between cases
- Exploring one may lead to another
- Example:
  - Following hyperlinks on web pages



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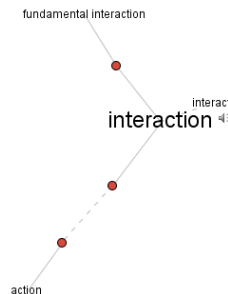
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# Example

<http://www.visualthesaurus.com>



Visual Thesaurus



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## 3. Reconfigure



“Show me a different arrangement”

- Provide different perspectives by changing the spatial arrangement of representation

e.g.,

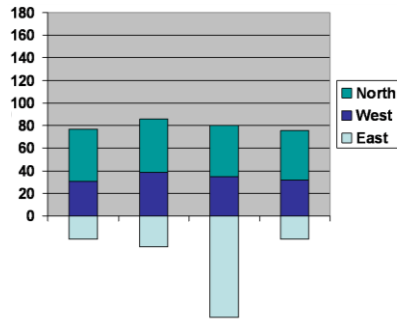
- Sorting and rearranging columns in TableLens
- Changing the attributes in a scatter plot
- The baseline adjustment feature in Stacked Histogram
- The “Spread Dust” feature in Dust & Magnet

## Rearrange View



- Keep same fundamental representation and what data is being shown, but rearrange elements
  - Alter positioning
  - Sort

# Example

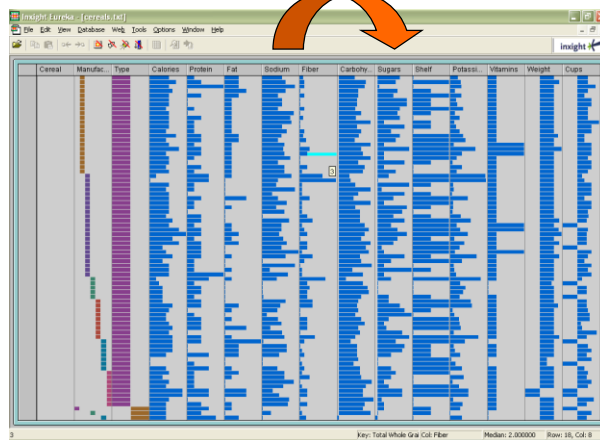


Stacked Histogram

# Rearrange



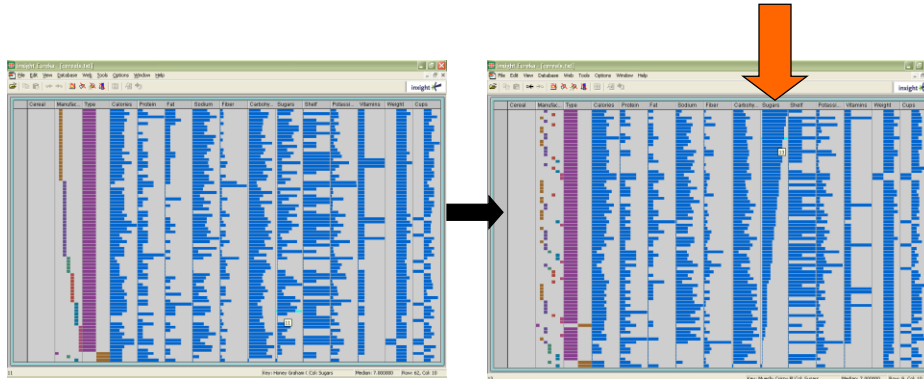
In TableLens you can move columns (attributes) left and right



# Sorting



Can sort data with respect to a particular attribute in Table Lens



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## 4. Encode



“Show me a different representation”

- Change visual appearances

e.g.,

- Changing color encoding
- Changing size
- Changing orientation
- Changing font
- Changing shape

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# Changing Representation



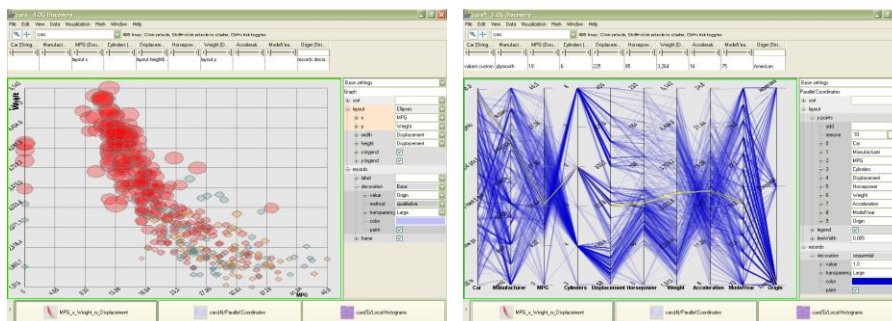
- May interactively change entire data representation
  - Looking for new perspective
  - Limited real estate may force change

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## Example



Selecting different representation from options at bottom

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## 5. Abstract/Elaborate

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“Show me more or less detail”

- Adjust the level of abstraction (overview and details)

e.g.,

- Unfolding sub-categories in an interactive pie chart
- Drill-down in Treemap
- Details-on-demand in Sunburst
- The tool-tip operation in SeeIT
- Zooming (geometric zooming)

## Details-on-Demand

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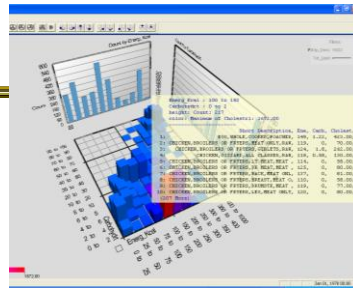


- Term used in infovis when providing viewer with more information/details about data case or cases
- May just be more info about a case
- May be moving from aggregation view to individual view
  - May not be showing all the data due to scale problem
  - May be showing some abstraction of groups of elements
  - Expand set of data to show more details, perhaps individual cases

# Examples



Google Earth



SeeIT

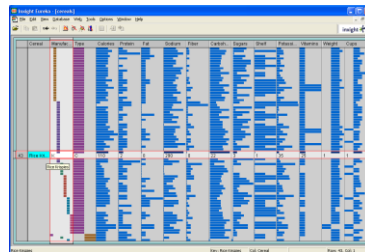


Table Lens

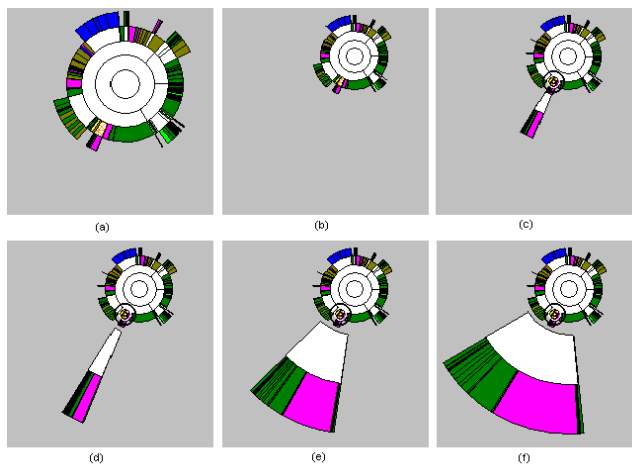
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# Example

Animated SunBurst



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## 6. Filter



“Show me something conditionally”

- Change the set of data items being presented based on some specific conditions.

e.g.,

- Dynamic query
- Attribute Explorer
- Keystroke based filtering in NameVoyager
- QuerySketch

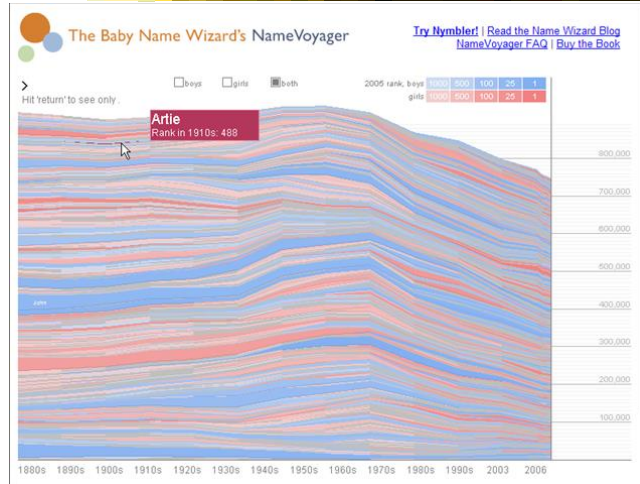
## Filtering/Limiting



- Fundamental interactive operation in infovis is changing the set of data cases being presented
  - Focusing
  - Narrowing/widening

# Example

NameVoyager



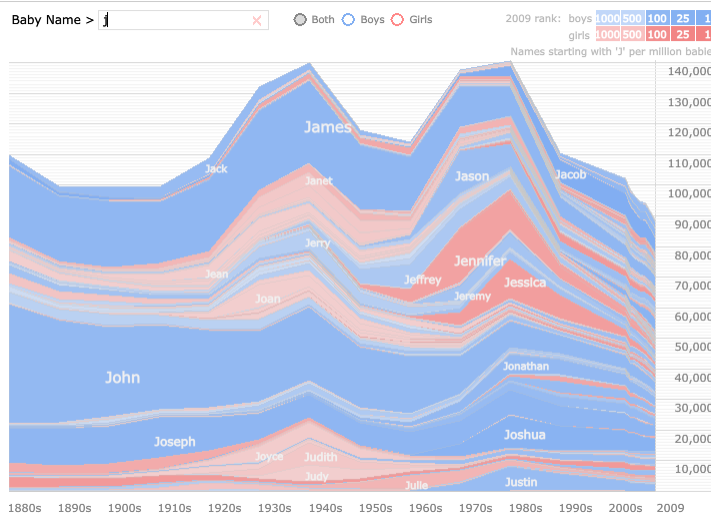
<http://www.babynamewizard.com/namevoyager.html/>

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# Filtering



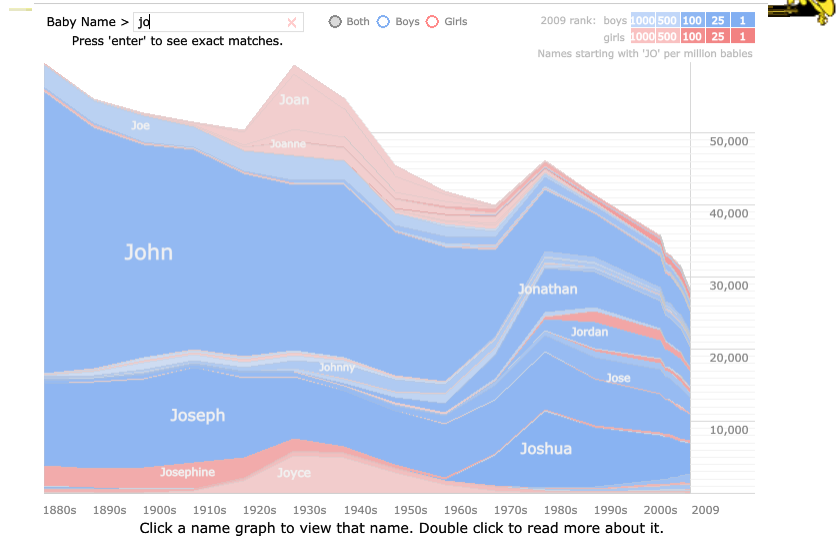
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# Filtering

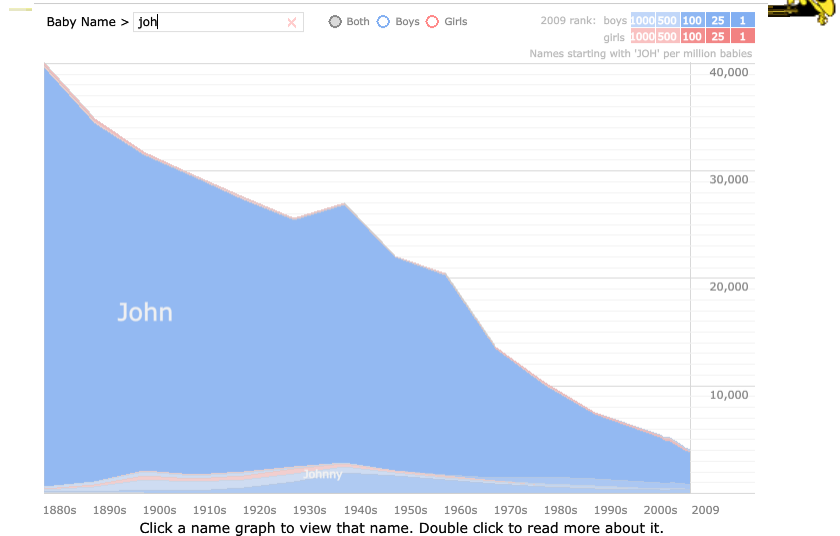


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# Filtering



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# Example



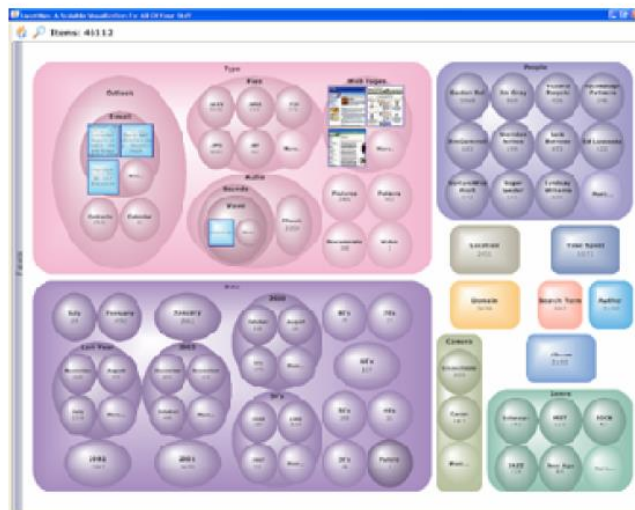
- Faceted metadata
  - Attributes of datasets are grouped into multiple orthogonal categories
  - Selecting a value from one filters on that value and updates the items in other categories
  - User explores data collection by series of selections

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# FacetMap



Video

Smith et al  
TVCG '06

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# Dynamic Query



- Probably best-known and one of most useful infovis techniques
- Let's explore more details...

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# DB Queries



- Query language
  - **Select** house-address
  - From** atl-realty-db
  - Where** price  $\geq$  200,000 **and**  
price  $\leq$  400,000 **and**  
bathrooms  $\geq$  3 **and**  
garage == 2 **and**  
bedrooms  $\geq$  4

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# DB Queries



- Pros?
  - Powerful, flexible
- Cons?

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# Typical Query Response



- 124 hits found
  - 1. 748 Oak St. - a beautiful ...
  - 2. 623 Pine Ave. -
  - ...
- 0 hits found

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## Further Cons

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- Must learn language
- Only shows exact matches
- Don't know magnitude of results
- No helpful context is shown
- Reformulating to a new query can be slow
- ...

## Dynamic Query

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- Specifying a query brings immediate display of results
- Responsive interaction (< .1 sec) with data, concurrent presentation of solution
- "Fly through the data", promote exploration, make it a much more "live" experience
  - Timesharing vs. batch

# Dynamic Query Constituents



- Visual representation of world of action including both the objects and actions
- Rapid, incremental and reversible actions
- Selection by pointing (not typing)
- Immediate and continuous display of results

Shneiderman  
IEEE Software '94

Ahlberg & Shneiderman  
CHI '94

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# Imperfection



- Idea at heart of Dynamic Query
  - There often simply isn't one perfect response to a query
  - Want to understand a set of tradeoffs and choose some "best" compromise
  - You may learn more about your problem as you explore

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# DQ Examples



- HomeFinder - Univ. of Maryland



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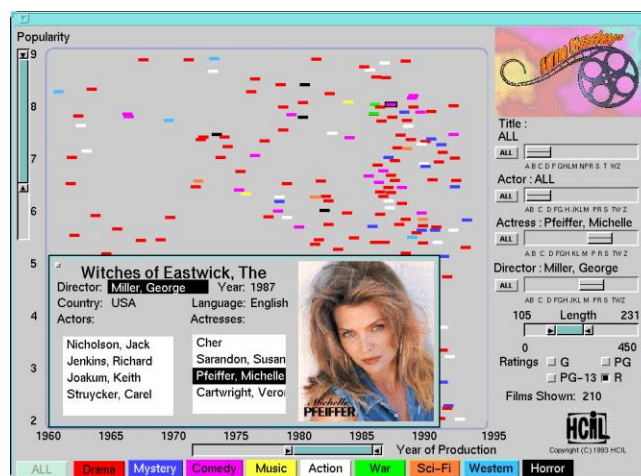
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# FilmFinder



C. Ahlberg  
Maryland

Video



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# What Did We See?



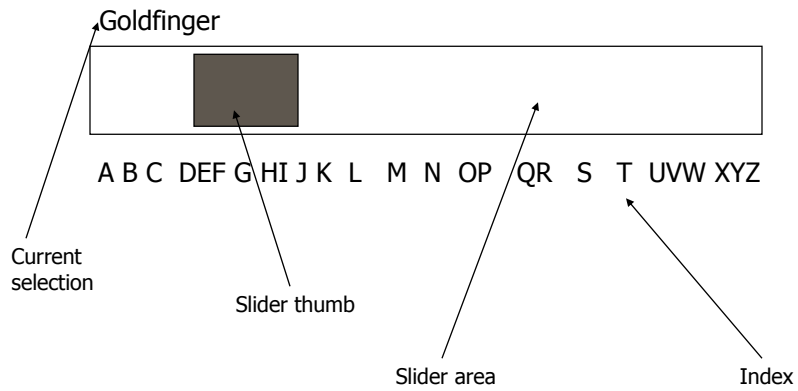
- Interface
  - buttons
  - sliders (nominal --> ordinal)
  - alphasliders

# Query Controls



- Variable types
  - Binary nominal - Buttons
  - Nominal with low cardinality - Radio buttons
  - Ordinal, quantitative - sliders

# Alphaslider

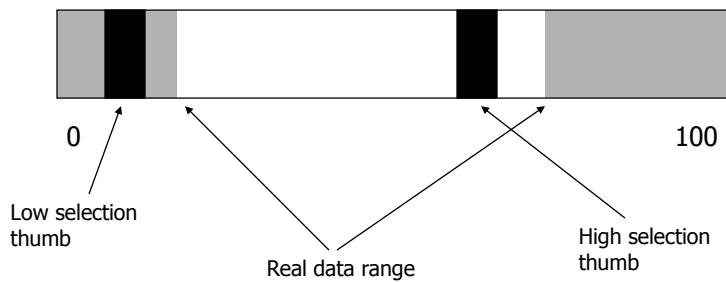


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# Rangeslider

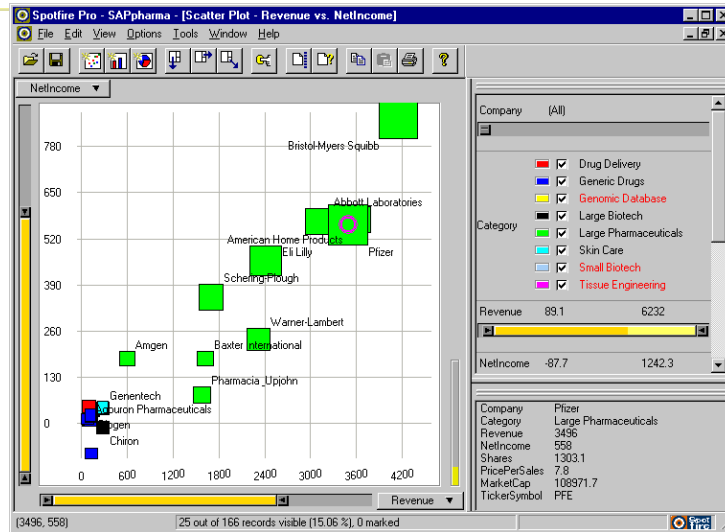


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# Spotfire



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## Spotfire Features

- Starfield display
- Tight coupling
  - features to guide the user
  - rapid, incremental, reversible interactions
  - display invariants
  - continuous display
  - progressive refinement
  - details on demand

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# Another

Note quite DQ though

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Select your DIAMOND Select your SETTING COMPLETE Select ring size

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158,072 Diamonds Reset Filters

SHAPE PRICE CARAT

CUT COLOR CLARITY

Delivery Date + Advanced Filters >

|                          |       |      |  |       |       |   |
|--------------------------|-------|------|--|-------|-------|---|
| <input type="checkbox"/> | Round | 0.23 |  | Nov 6 | \$296 | > |
| <input type="checkbox"/> | Round | 0.23 |  | Nov 6 | \$296 | > |

<http://www.bluenile.com/build-your-own-ring/diamonds?elem=sub4&track=hero>

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# DQ Pros

- ?

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## DQ Pros



- Work is faster
- Promote reversing, undo, exploration
- Very natural interaction
- Shows the data

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## DQ Cons



- ?

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## DQ Cons



- Operations are fundamentally conjunctive
- Can you formulate an arbitrary boolean expression?
  - $\neg(A1 \vee A2) \wedge A3 \vee (A4 \vee A5 \wedge A6) \vee \dots$
- But do people really do this often?

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## DQ Cons



- Controls are global in scope
  - They affect everything
- Controls must be fixed in advance

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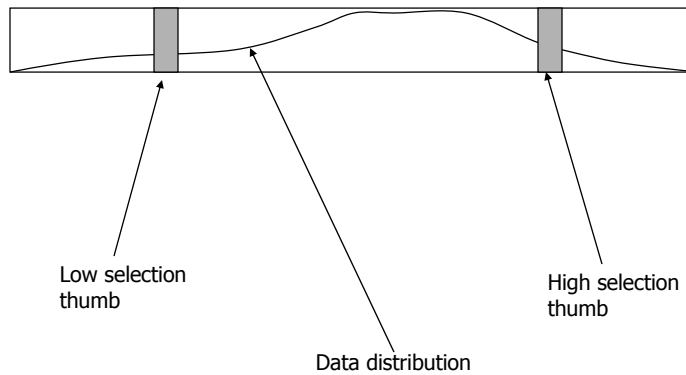
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# DQ Cons



- Controls take space!
  - How much in Spotfire?
  
- Put data in controls...

# Data Visualization Sliders



Eick  
UIST '94

## DQ Cons



- As data set gets larger, real-time interaction becomes increasingly difficult
- Storage - Data structures
  - linear array
  - grid file
  - quad, k-d trees
  - bit vectors

Tanin et al  
InfoVis '97

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## Brushing Histograms



- Special case of brushing
- Data values represented in histograms that can be clicked on and selected (controls region)
- When items selected there, the corresponding item(s) are highlighted in main view windows

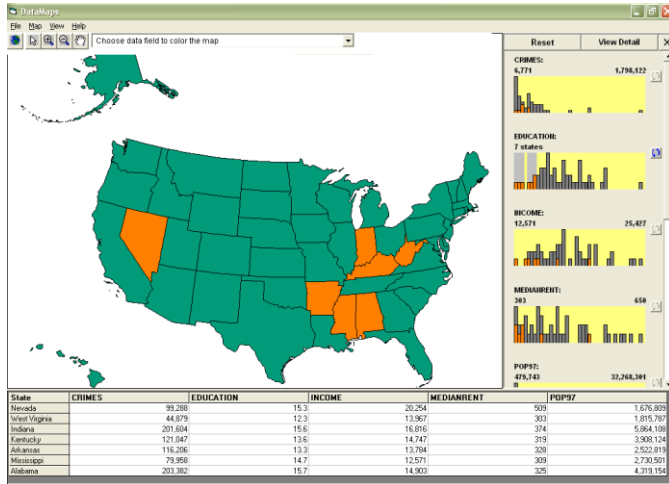
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# BH Example



DataMaps

Maryland & Va Tech

Demo

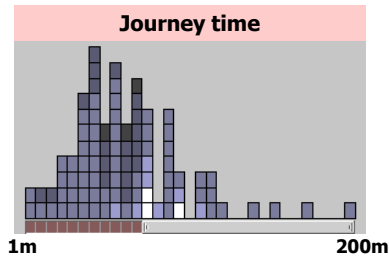
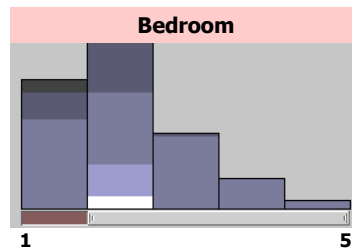
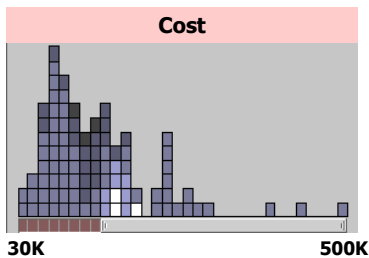
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# Attribute Explorer

Spence & Tweedie  
Inter w Computers '98



Attribute histogram  
All objects on all attribute scales  
Interaction with attributes limits  
Brushing across views  
Color-encoded sensitivity

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# DQ Disadvantage



- Operations are global in scope
- Can we do something to fix that...?

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# Magic Lenses

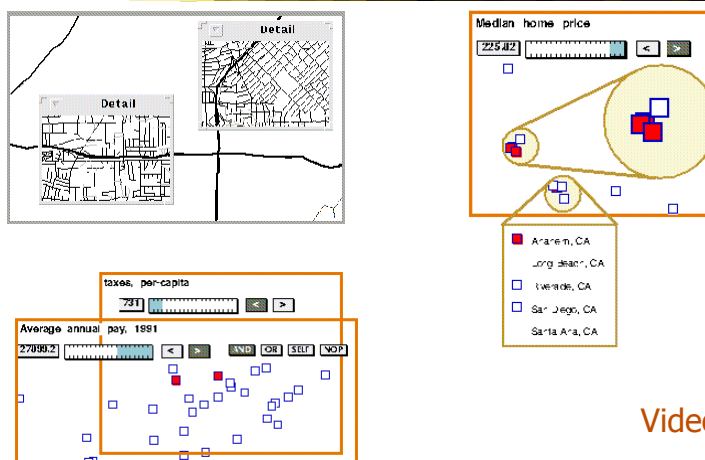


Figure 1(a) High salaries AND low taxes.

Video

Fishkin & Stone  
CHI '95

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## 7. Connect



“Show me related items”

- Highlight associations and relationships
- Show hidden data items that are relevant to a specified item

e.g.,

- Highlighting directly connected nodes in Vizster
- Brushing in InfoScope

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## Highlighting Connections



- Viewer may wish to examine different attributes of a data case simultaneously
- Alternatively, viewer may wish to view data case under different perspectives or representations
  
- But need to keep straight where the data case is

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# Brushing



- Applies when you have multiple views of the same data
- Selecting or highlighting a case in one view generates highlighting the case in the other views
- Very common technique in InfoVis

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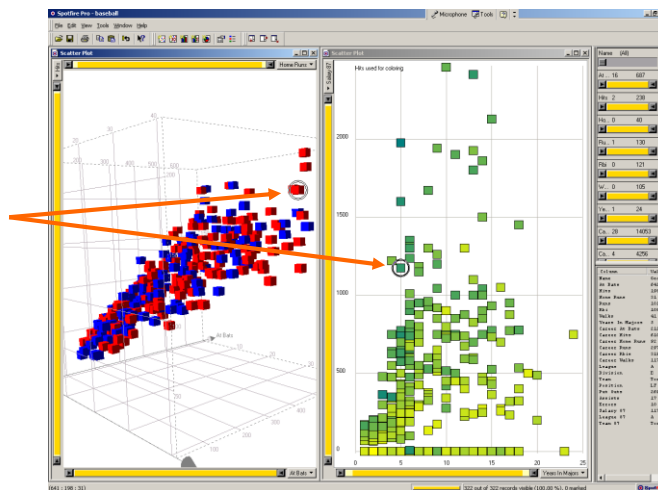
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# Brushing



Same item

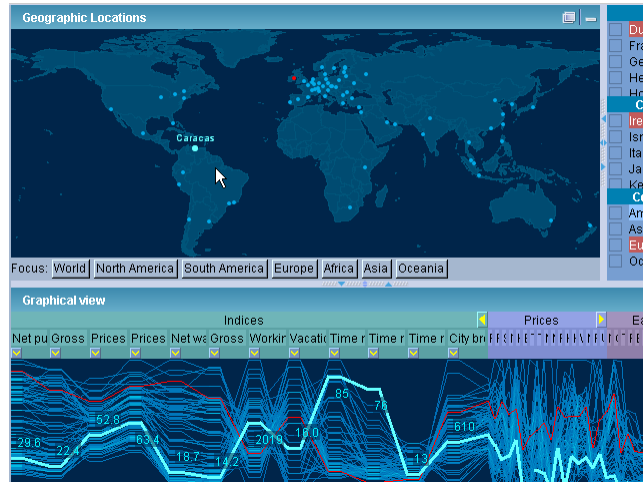


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# Example



InfoScope

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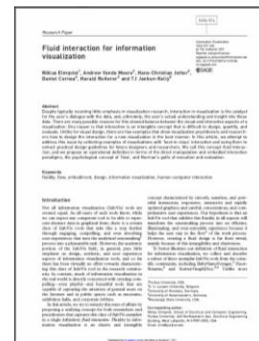
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# Interaction Characteristics



- Fluidity a key
  - Promotes “flow”
    - Balanced challenge
    - Concentration
    - Loss of self-consciousness
    - Transformation of time
    - Prompt feedback
    - Sense of control
    - Intrinsically rewarding
  - Supports direct manipulation
  - Minimizes the gulfs of action

Elmqvist et al  
*Information Visualization '11*



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# Fluidity Design Guidelines



- Use smooth animated transitions between states
- Provide immediate visual feedback on interaction
- Minimize indirection in the interface
- Integrate user interface components in the visual representation
- Reward interaction
- Ensure that interaction never 'ends'
- Reinforce a clear conceptual model
- Avoid explicit mode changes

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# Animation for Transitions



- Principles
  - Animation can help “soften the blow” when a view changes
  - Preserve context, allow the viewer to track where things went
- Project overview
  - Developed variety of different transitions and applications
  - Performed experiments to see how these are perceived

Heer & Robertson  
*TVCG (InfoVis) '07*

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# Transition Types



- View transformation
- Substrate transformation
- Filtering
- Ordering
- Timestep
- Visualization change
- Data schema change

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# Design Principles



- Congruence (mental matching)
  - Maintain valid data graphics during transitions
  - Use consistent syntactic-semantic mappings
  - Respect semantic correspondence
  - Avoid ambiguity
- Apprehension (easily perceivable)
  - Group similar transitions
  - Minimize occlusion
  - Use simple transitions
  - Use staging for complex transitions
  - Make transitions as long as needed, but no longer

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# Key Component



- Staging
  - Animation proceeds in stages, not all at once
  - Varies by animation type and view

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# DynaVis



- Implemented in C# and Direct3D graphics
- Let's see it!

Video

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# OK



- Let's take a step back and think about representation & interaction again

# Supporting Representation

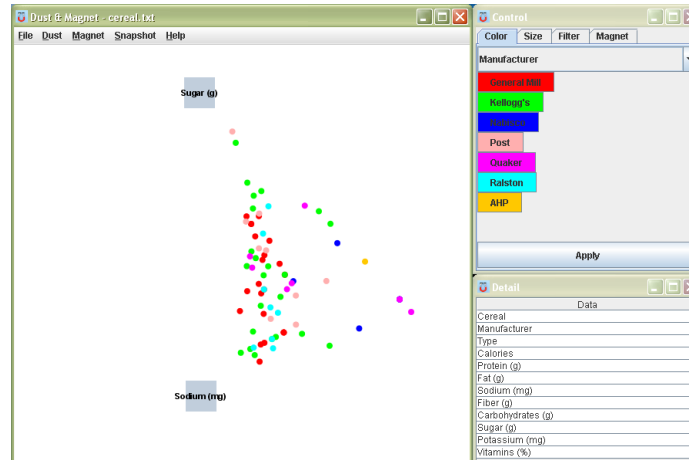


- Interaction in many cases is vital to representation
  - Provides useful perspective
    - Many, many examples:
      - Parallel coords, InfoZoom, anything 3D
  - Necessary for clarifying representation
    - Dust & Magnet

# Dust & Magnet



Demo



Yi et al  
*Information Visualization '05*

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# Moving Past WIMP



- WIMP metaphor on desktop machines assumes certain input devices
- How does interaction change when we move to a more mobile platform?
  - Tablet, phone, etc.

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# Multi-touch InfoVis



- What will it be like to interact with visualizations on a (touch) tablet computer?
  - Lots of UI controls in vis applications
  - Lots of small data objects to manipulate
- Many touch gestures possible, but what are the right ones?

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# Scatterplot Vis



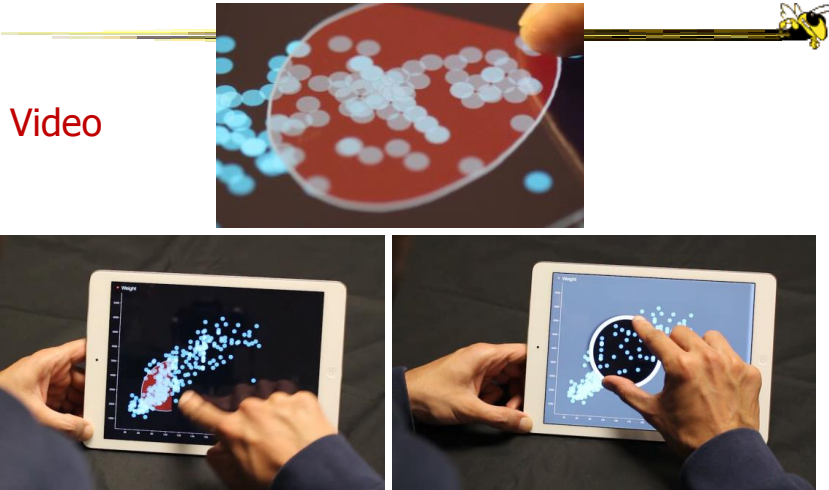
- Design interactive scatterplot for a tablet
- Identify operations to be supported
- Consider different feasible gestures for each operation
  - Draw upon existing research
  - Consider new gestures
- Prototype ideas with users

Sadana & Stasko  
AVI '14

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## Key Points

- Interaction facilitates a dialog between the user and the visualization system
- Multiple views amplify importance of interaction
- Interaction often helps when you just can't show everything you want

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# Upcoming



- Commercial Tools
  - Reading:
- Value of Visualization
  - Video lecture

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## Additional Material

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# DQ vs. BH



- Empirical Study
  - Use DataMaps, a geographic (US states) data visualization tool
  - Have participants do different tasks with both methods
    - How many states have pop between x and y in 1970?
    - Given 3 states, which has the lowest median income?
    - What's the relationship between education and income?
    - List states with pops. 0->x and y->z.
    - What kind of a state is Florida?

Li & North  
InfoVis '03

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## Findings

Functioned more as its own  
infovis tool



- Brushing histograms better and more highly rated for more complex discovery tasks
  - Attribute correlation, compare, and trend evaluation
- Dynamic queries better for more simple range specification tasks
  - Single range, multiple ranges, multiple criteria

Functioned more as auxiliary control for other vizzes

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## BH versus DQ



- BH
  - Highlights data of interest
  - Allows multiple ranges of selection
  - Users interact directly with data
  - Displays query results too (I/O)
- DQ
  - Filters out unwanted data
  - Does single range query
  - Users interact with the query (low,hi)
  - Visualizes query formulation (1 way)

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## TouchWave



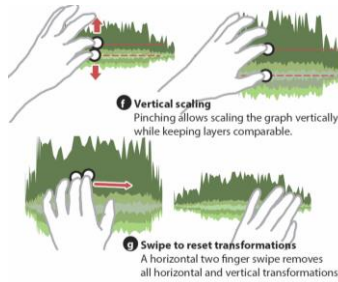
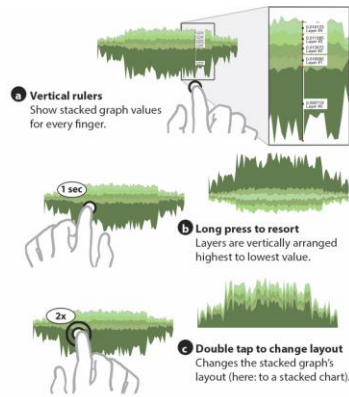
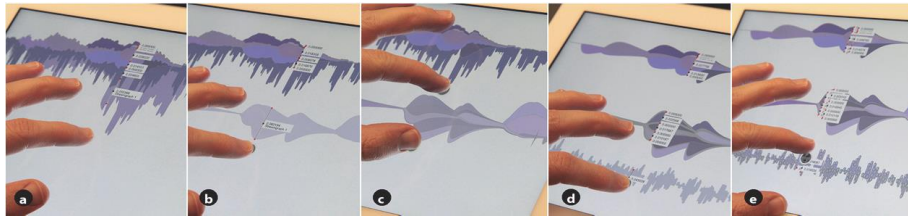
- Interactions for a stacked graph on a tablet
  - For temporal, hierarchical data
  - Uses multi-touch interactions
  - Seeks to avoid complex gestures

Baur et al  
ITS '12

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## Comparison to WIMP



- On a tablet, compared WIMP-style interactions to multi-touch for a bar chart
- Users did series of tasks (within subjects)
- Participants performed better and preferred the touch-based gesture interface

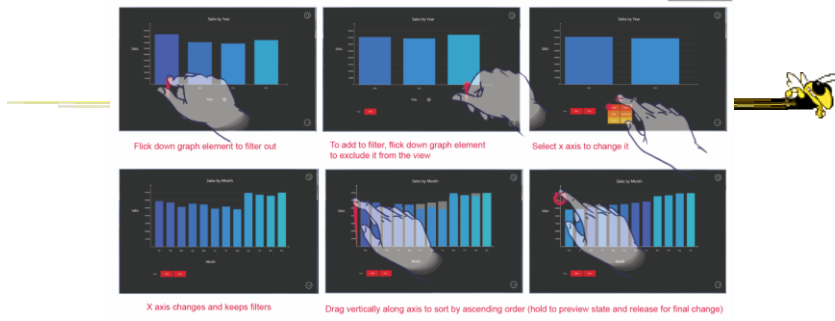
Drucker et al  
CHI '13

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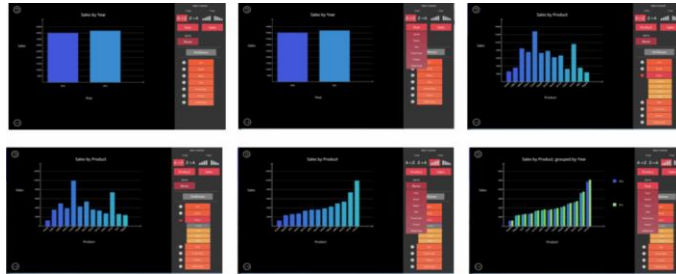
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versus



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