## Cogsci 220: Information Visualization

## Jim Hollan

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## Cogsci 220: Information Visualization

Welcome to the third week. Hope everyone is well and safe in these challenging times.

Last week I discussed the value of visualization with the goal of convincing you it is crucially important and we tried using breakout rooms for you to start to get to know your classmates.

### Today:

Researchers of the week: John Tukey and Stu Card

Fundamental importance of activities and tasks in designing visualizations

What, why, and how of visualization



If time your reactions to and comments on chapter on *Information Visualization* and *Cognitive Design of Tools of Thought* but want to begin two iterations of topic group breakouts starting at ~10

# Information Visualization

### Early seminal work: Playfield (1786), Bertin (1963), Tukey (1977)







## John Tukey

"The greatest value of a picture is when it forces us to notice what we never expected to see."

-John W. Tukey, Acclaimed Statistician

# John Tukey

### John W. Tukey

### EXPLORATORY DATA ANALYSIS



This book is based on an important principle:

### It is important to understand what you CAN DO before you learn to measure how WELL you seem to have DONE it.

Learning first what you can do will help you to work more easily and effectively.

This book is about exploratory data analysis, about looking at data to see what it seems to say. It concentrates on simple arithmetic and easy-to-draw pictures. It regards whatever appearances we have recognized as partial descriptions, and tries to look beneath them for new insights. Its concern is with appearance, not with confirmation.

A basic problem about any body of data is to make it more easily and effectively handleable by minds—our minds, her mind, his mind. To this general end:

 $\diamond$  anything that makes a simpler description possible makes the description more easily handleable.

 $\diamond$  anything that looks below the previously described surface makes the description more effective.

### **Box and Whisker Plot**

A box and whisker plot (also called a box plot) shows the fivenumber summary of a set of data: minimum, lower quartile, median, upper quartile, and maximum.



It's better to solve the right problem approximately than to solve the wrong problem exactly.

I know of no person or group that is taking nearly adequate advantage of the graphical potentialities of the computer.



# Stu Card

### Google Scholar h-index: 91

51,505 Citations

Stuart K. Card is one of the pioneers of applying human factors in human–computer interaction. His study of input devices led to the Fitts's Law characterization of the computer mouse and was a major factor leading to the mouse's commercial



introduction by Xerox, most notably in the Alto and Star projects, some of the very earliest GUI systems employing a desktop metaphor. The 1983 book *The Psychology of Human-Computer Interaction*, which he co-wrote with Thomas P. Moran and Allen Newell, became seminal work in the HCI field. Further research into the theoretical characterizations of human-machine interaction led to developments like "the Model Human Processor, the GOMS theory of user interaction, information foraging theory, and statistical descriptions of Internet use". His work on information visualization and the "information visualizer" helped create the field.

# **Stu Card: Interaction Science**

https://www.youtube.com/watch?v=3w12AbzHw8E SIGCHI Lifetime Research Award



## **Information Visualizer**





### FIGURE 1.40

Perspective wall. Courtesy of Inxight (1991).



#### THE INFORMATION VISUALIZER, AN INFORMATION WORKSPACE

Stuart K. Card. George G. Robertson, Jock D. Mackinlay Xerox Palo Alto Research Center Palo Alto, California 94304 (415) 494-4362, Card.PARC@Xerox.COM

es a concept for the user interface of retrieval systems called an information The concept goes beyond the usual notion of tion retrieval system to encompass the cost f information from secondary storage to n of the concept, system, called and its rati ms for increasing th able to the user, (2) th for coupling the user to int structure.

KEYWORDS: Information retrieval, interface metapho information visualization, animation, desktop metaphor, UI theory, 3D graphics, interactive graphics.

#### INTRODUCTION

INTRODUCTION A see-paradigm of computing use seems to be energing in selection, and use of most nots of information. Allowed that bases and information retrieval systems have been around for some time, the system developed have relied with some important enceptions (ap. 11/31,120) few systems have been noded for their user interfaces insufficient enceptions (ap. 11/31,120) few systems have been noded for their user interfaces compared and the system of the system in which here metrices could play a more correlar of the their super-interfaces could play a more correlar of the their super-metrices could play a more correlar of the their super-sent systems in the system in the system in the system interfaces could play a more correlar of the their super-sent system in the system in the system in the system interfaces could play a more correlar of the the playmants of the system interfaces the system in the system interfaces are interfaces and the system interfaces the system in the system interfaces and the system interfaces the system interfaces are interfaces and the system interfaces the system interfaces are interfaces and the system interfaces the system interfaces are interfaces and the system interfaces are are and the system interfaces are interfaces and the system interfaces are are associated and the system interfaces are interfaces and the system interfaces are associated and the system interface

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I STRUCTURE OF INFORMATION in retrieval has often been studied as if it wi ined problem (e.g., the library automu Yet from the user's point of view, informa-is almost always part of some larger proce-tion of some larger proceself-contain problem). retrieval is information use. What is really needed fro the user isn't so much the amplification of

Consider, for example, an office worker Information is available in the desk-side omputer ter terminal, in the immediate is ther people using the teleph in files in the filing cabin take diffe

ent, is characterized by a cost stru-nation in it. What is usually meant b

information in it. What is usually meant by an organized office is one with a cost structure arranged so as to lower the cost of the information-based work processes performed within it. File cabinets, desks, filing systems, and computer-based information retrieval systems can be benefit of charged as its means for changing this cost. tractly as jus The cost structure of the info

The cost structure of the information in the office has been arranged with care (this rangement we from a brochure of a professional time mu-frequently seeafed or in immediate any is keyp principally the dark. Voluminoue, the sensed info kept in a higher-cost, larger-capacity Secondar cate. More information is swallable in the library Tertiary Storage areas. In addition to these categories, the information is linked and categories, the untorman structured to aid in its retri

other uses)--that is allow people to bri information more ou

of the paradia Permission to copy without fee all or part of this material is granted provided that the copies are not made or distributed for direct commercial advantage, the ACM copyright notice and the tils of the publication and its date appear, and notice is given that copyring its by permission of the Association for Computing Mohimey. To copy valantaise, or to publish, requires a fee and/or specific permission. Information Visualizer: Table Lens



## Visualization: A Computational Medium

Computation provides the most plastic medium we have ever know for representation.

Alan Kay refers to computers as a metamedium

"It is the first metamedium, and as such it has degrees of freedom for representation and expression never before encountered and as yet barely investigated."

Fundamental importance of understanding tasks and activities

# **Understanding Tasks**

### Rendering Effective Route Maps, Maneesh Agrawala

Distortions in Hand-Drawn Maps: Exaggeration (e.g. road length), Regularization (e.g. turning angle), Simplification (e.g. road shape), Debugging



## Understanding Tasks



Λ

### **Understanding Activity Over Time**

https://www.nytimes.com/interactive/2016/08/20/sports/olympics/ decisive-moments-rio-olympics-composite-pictures.html











### **Jim Hollan**



1,556 collaborators

499,983 emails

**Top Collaborators** My Stats

### **Emails Sent**



**Emails Received** 



**New Collaborators** 



# Tasks and Efficiency

Computer-based visualization systems provide visual representations of datasets designed to help people carry out tasks and activities more effectively.

Tasks and activities serve as constraint on design (as does data)

# Challenge: recast tasks and activities from domain-specific vocabulary to visual forms

# **Exploit Perception and Details Matter**

Replace cognition with perception More than summaries, details matter



## **Resource Limitations**

Vis designers must take into account three very different kinds of resource limitations: those of computers, of humans, and of displays.

Computational limits: processing time, system memory, ...

Human limits: human attention, memory, ...

**Display limits and Information density:** pixels are precious resource, ratio of space used to encode info vs whitespace, ...

## Tamara Munzner: Visualization Analysis & Design



# What, Why, and How

What is shown? **Data** abstraction

Why is the user looking at it? **Task** abstraction

How is it shown? Idiom: visual encoding and interaction



|  |               |            | what.   |             |  |
|--|---------------|------------|---|-------------|--|
| Datasets   |               |            |   |             | Attributes   |
| ata Types  |               |            |   |             | <ul> <li>Attribute Types</li> </ul>  |
| ltems →  | Attributes    | → Links    | → Positions   | → Grids     | → Categorical  |
| ata and Data   | aset Types    |            |   |             | +●■  |
| Tables   | Networks &    | Fields     | Geometry  | Clusters,   | → Ordered  |
|  | Trees         |            |   | Sets, Lists | → Ordinal  |
| Items  | Items (nodes) | Grids      | Items   | Items       | <b>* * *</b>   |
| Attributes   | Links         | Positions  | Positions   |             |  |
|  | Attributes    | Attributes |   |             | → Quantitative   |
| → Tables → Networks Attributes (columns)<br>(rows) ↓ Cell containing value |               |            | → Fields (Continuous) Grid of positions Cell Attributes (columns) Value in cell |             | <ul> <li>→ Sequential</li> <li>→ Diverging</li> <li>→ Diverging</li> </ul> |
| → Multidimensional Table → Trees   |               |            |   |             |  |
| Key 2  | Value in cell |            |   |             | $\bigcirc$   |

Position



### How?





### Mackinlay's ranking of encodings

QUANTITATIVE Position Length Angle Slope Area (Size) Volume Density (Val) Color Sat Color Hue Texture Connection Containment Shape ORDINAL Position Density (Val) Color Sat Color Hue Texture Connection Containment Length Angle Slope Area (Size) Volume Shape

NOMINAL Position Color Hue Texture Connection Containment Density (Val) Color Sat Shape Length Angle Slope Area Volume

# Goal: Reduce Task and Activity Complexity

Don't just draw what you're given

- Decide what the right thing to show is
- Create it with a series of transformations from the original dataset
- Draw that "right thing"









trade balance = exports – imports

**Derived Data** 

## Today Face Many Big Data Issues



Commonly used plots fail to scale to large datasets. Many interesting issues result. How might we address this? Perhaps by using averaging, binning, and smoothing.

## Information Visualization

The power of the unaided mind is highly overrated. Without external aids, memory, thought, and reasoning are all constrained. But human intelligence is highly flexible and adaptive, superb at inventing procedures and objects that overcome its own limits. The real powers come from devising external aids that enhance cognitive abilities. How have we increased memory, thought, and reasoning? By the invention of external aids: It is things that make us smart. (Norman, 1993, p. 43)

#### How information visualization amplifies cognition.

#### **Increased Resources**

| High-bandwidth hierarchical interaction             | The human moving gaze system partitions limited channel capacity so that it<br>resolution and wide aperture in sensing visual environments (Resnikoff, 1987)                                | inventing procedures and o<br>The real powers come from<br>cognitive abilities. How haw<br>reasoning? By the inventio<br>make us smart. (Norman, 1                           |  |
|---|---|--|--|
| Parallel perceptual processing                      | Some attributes of visualizations can be processed in parallel compared to te   | An important class of th   |  |
| Offload work from cognitive to<br>perceptual system | Some cognitive inferences done symbolically can be recoded into inferences perceptual operations (Larkin and Simon, 1987).  | are graphical inventions of<br>but quite distinct purpose<br>ing an idea, for which it is<br>ten thousand words.*! Co  |  |
| Expanded working memory                             | Visualizations can expand the working memory available for solving a problem  | course, already having the<br>purpose is to use graphic<br>idea itself: using the specia<br>resolve logical problems,<br>Using vision to think. This s<br>ject of this book. |  |
| Expanded storage of information                     | Visualizations can be used to store massive amounts of information in a quick maps).  |  |  |
| Reduced Search                                      | a property of the second se   | Graphic aids for think<br>history. What is new is t  |  |
| Locality of processing                              | Visualizations group information used together, reducing search (Larkin and S   | making possible a mediu<br>improved rendering, real  |  |
| High data density                                   | Visualizations can often represent a large amount of data in a small space (Tu  | ly lower cost. This media  |  |
| Spatially indexed addressing                        | By grouping data about an object, visualizations can avoid symbolic labels (L   | 'According to Paul Martin L<br>up by ad writer Frederick R.<br>The ad writer wanted to ma  |  |
| Enhanced Recognition of Patterns                    |   | and Printers' Ink, March 10,   |  |
| Recognition instead of recall                       | Recognizing information generated by a visualization is easier than recalling tuser.  | -  |  |
| Abstraction and aggregation                         | Visualizations simplify and organize information, supplying higher centers with age<br>information through abstraction and selective omission (Card, Robertson, and Ma<br>Resnikoff, 1987). | gregated forms of<br>ickinlay, 1991;   |  |
| Visual schemata for organization                    | Visually organizing data by structural relationships (e.g., by time) enhances pattern   | 18.  |  |
| Value, relationship, trend                          | Visualizations can be constructed to enhance patterns at all three levels (Bertin, 1977/1981).  |  |  |
| Perceptual Inference                                |   |  |  |
| Visual representations make some problems obvious   | Visualizations can support a large number of perceptual inferences that are extremely easy for<br>humans (Larkin and Simon, 1987).  |  |  |
| Graphical computations                              | Visualizations can enable complex specialized graphical computations (Hutchins, 1996).  |  |  |
| Perceptual Monitoring                               | Visualizations can allow for the monitoring of a large number of potential events if<br>nized so that these stand out by appearance or motion.  | the display is orga-   |  |
| Manipulable Medium                                  | Unlike static diagrams, visualizations can allow exploration of a space of parameter values and ca<br>amplify user operations.  |  |  |

### The Cognitive Design of Tools of Thought **Information Visualization Barbara** Tversky automatically assemble thousands of data objects into pic-tures, revealing hidden patterns. It allows diagrams that move, react, or wen initiate. These, in turn, create new methods for amplifying cognition, new means for coming to hnowledge and insight about the work of A few years ago, the power of this new medium was applied to active, re-sulting in interimit vanilation. Now we is possible to apply the medium more generally to business, to schadmidy, and of information vanilation. The superson of this book its or introduce information vanilation, to collect some of the important papers in the field, and to yee anaples do not superson of the superson of the some of the superson of the superson of the some is the field of the superson of superson of the superson of superson of the supe To understand something is called 'seeing' it. We try to make our ideas 'clear,' to bring them into 'Tocos,' to 'arrange' our thoughts. The ubhquipy of visual meraphors in describing cognitive processes thins at a news of relation-align between what we see and what we think. When we imagine someone hard at mental work, we might picture as scholar drawing a diagram, a book of sources opera the safe. To we might imagine a sockbroker, watching com-pared daplays of linearial datar, subjust to act on events. puter displays of financial data, rushing to act on events. Whatever the activity, mental work and perceptual interac-tions of the world are likely to be interwoven. This interweaving of interior mental action and external perception (and manipulation) is no actionent. It is the essence of how we achieve expanded intelligence. As Norimportant papers in the field, and to give samples of some of the latest work. ONLIN **Review of Philosophy and** Psychology FIRST man says, **EXTERNAL COGNITION** man stys, The power of the unstitled mind is highly overrated. Without ex-ternal ada, memory, thought, and enasoning are all constrained. But human intelligues to highly fixed the and adaption, superb a investing procedures and objects that overcome its own limits. The real powers correction and exist that evercome its own limits, the real powers correction and objects that overcome its owning Bby the investion of external add: It is things that make as smart. (Norman, 1993, p. 43) ISSN 1878-5158 To understand the intuition behind information visualiza-tion, it is useful to gain an appreciation for the important role of the external world in thought and reasoning. This Rev.Phil.Psych. DOI 10.1007/s13164-014-0214-3 notion is sometimes called external cognition (Scaife and Rogers, 1996) to express the way in which internal and ex-The Review of ternal representations and processing weave together in thought. As Norman suggests, the use of the external world, R Comman (1992). A Norman suggest material solution of all sons. These serve two related reventions of all sons. These serve two related reventions of all sons. These serve two related reventions of all sons. These serve two solutions is contained as a sonset which it is sometimes said, 'A picture is works works'. Communicating an least requires the least to communicate the second problems, as Berni (1977/1981) words and thoring the great meta-spectrum to the problems, as Berni (1977/1981) words are specificated to reproduce the second second second second second the second second second second second second second the second second second second second second second second the second second second second second second second the second second second second second second second second the second second second second second second second second the second second second second second second second second the second second second second second second second second the second second second second second second second second the second second second second second second second second the second second second second second second second second the second second second second second second second second the second second second second second second second second the second se and especially the use of cognitive artifacts or physical in-ventions to enhance cognition, is all around us. Philosophy and Psychology Take multiplication, one of the most mental of activities Take multiplication, one of the most mental of activities. Have a person multiply a pair of two-digit numbers, such as 34 × 72, in his or her head and time how long it takes. Now repeat the experiment with another pair of numbers, in longhand using pencil and paper. ink. This second sense of graphics is the subk. 5 for thinking have an ancient and venerable is new is that the evolution of computers is de a medium for graphics with dramatically tering, real-itume interactivity, and dramatical-This medium allows graphic depictions that × 72 68 23<sup>2</sup>80 24148 al Martin Lesser, professor of communications at the University of California at Fullerton, this quotation was simply made rederick R. Burnard and included as an invented "Chinese proverb" in a streetcar adventisement for Royal Baking Powder. Intel to make the point that pictures can attract attention faster than other media. See http://www5.Fullerton.edu/es/ad.huml March 10, 1927. s of

# Barbara Tversky

In her new book, Mind in Motion, Barbara Tversky cogently describes research on *how we think about space—and how we use space to think.* Based on decades of empirical work in spatial cognition and external representation, Tversky formulates two principles for cognitively-driven design:

**Principle of Correspondence**: The content and form of the representation should match the content and form of the targeted concepts.

**Principle of Use**: The representation should promote efficient accomplishment of the targeted tasks.



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### First

Stringer, Latona-Tequida, Tenney, White

Sharkey, Rizvi, Yarmand, Chen

Representation Yarmand, Yang, Haupt, Rizzi, Sharkey, Gahl, Nakai

Activity Histories, Pad++, Lenses Wolfe, Hill-Lindsay, Chen, Mehan, Smart, Sun

### Second

Stringer, Latona-Tequida, Tenney, White Sharkey, Rizvi, Yarmand. Chen

Representation Wolfe, Hill-Lindsay

Organization Yang, Haupt

## **Breakout Groups**



Ideally by the end of the breakout groups you should be close to forming a group with a general topic focus.

By the end of the week (Friday 1/22), send a note to <u>220-g@ucsd.edu</u> with a list of your team members and your general topic focus. Be prepared next Tuesday (1/26) to give a short (5 minute) description of your focus.