Lecture 14: Evaluation

Information Visualization
CPSC 533C, Fall 2011

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Wed, 2 November 2011

Readings Covered

Evaluating Information Visualizations. Sheelagh Carpendale. Chapter in *Information Visualization: Human-Centered Issues and Perspectives*, Springer LNCS 4950, 2008, p 19-45.

The Perceptual Scalability of Visualization. Beth Yost and Chris North. Proc. InfoVis 06, published as IEEE TVCG 12(5), Sep 2006, p 837-844.

Turning Pictures into Numbers: Extracting and Generating Information from Complex Visualizations. J. Gregory Trafton, Susan S. Kirschenbaum, Ted L. Tsui, Robert T. Miyamoto, James A. Ballas, and Paula D. Raymond. Intl Journ. Human Computer Studies 53(5), 827-850.

Further Readings

Task-Centered User Interface Design, Clayton Lewis and John Rieman, Chapters 0-5.

The challenge of information visualization evaluation. Catherine Plaisant. Proc. Advanced Visual Interfaces (AVI) 2004

Effectiveness of Animation in Trend Visualization. George G. Robertson, Roland Fernandez, Danyel Fisher, Bongshin Lee, and John T. Stasko. IEEE TVCG (Proc. InfoVis 2008). 14(6): 1325-1332 (2008)

Artery Visualizations for Heart Disease Diagnosis. Michelle A. Borkin, Krzysztof Z. Gajos, Amanda Peters, Dimitrios Mitsouras, Simone Melchionna, Frank J. Rybicki, Charles L. Feldman, and Hanspeter Pfister. IEEE TVCG (Proc. InfoVis 2011), 17(12):2479-2488.

Evaluation, Carpendale

- thorough survey/discussion, won't summarize here

Psychophysics

- method of limits
  - find limitations of human perceptions
- error detection methods
  - find threshold of performance degradation
  - staircase procedure to find threshold faster
- method of adjustment
  - find optimal level of stimuli by letting subjects control the level

Cognitive Psychology

- repeating simple, but important tasks, and measure reaction time or error
  - Miller's 7+/- 2 short-term memory experiments
  - Fitts' Law (target selection)
  - Hick's Law (decision making given n choices)
- interference between channels
- multi-modal studies
  - MacLean 2005, Perceiving Ordinal Data Haptically Under Workload
  - using haptic feedback for interruption when the participants were visually (and cognitively) busy

Structural Analysis

- requirement analysis, task analysis
- structured interviews
  - can be used almost anywhere, for open-ended questions and answers
- rating/Likert scales
  - commonly used to solicit subjective feedback
  - ex: NASA-TLX (Task Load Index) to assess mental workload
    - "it is frustrating to use the interface"
    - Strongly Disagree | Disagree | Neutral | Agree | Strongly Agree

Comparative User Studies

- hypothesis testing

- hypothesis: a precise problem statement
  - ex: Participants will be faster with a coordinated overview+detail display than with an uncoordinated display or a detail-only display with the task requires reading details
  - measurement: faster
  - objects of comparison:
    - coordinated O+D display
    - uncoordinated O display
    - uncoordinated D display
  - condition of comparison: task requires reading details

Comparative User Studies

- study design: factors and levels
- factors
  - independent variables
  - ex: interface, task, participant demographics
- levels
  - number of variables in each factor
  - limited by length of study and number of participants

Comparative User Studies

- study design: within, or between?
- within
  - everybody does all the conditions
  - can lead to ordering effects
  - can account for individual differences and reduce noise
  - thus can be more powerful and require fewer participants
  - combinatorial explosion
    - severe limits on number of conditions
  - possible workaround is multiple sessions
- between
  - divide participants into groups
  - each group does only some conditions

Comparative User Studies

- measurements (dependent variables)
  - performance indicators: task completion time, error rates, mouse movement
  - subjective participant feedback: satisfaction ratings, closed-ended questions, interview
  - observations: behaviors, signs of frustration
- number of participants
  - depends on effect size and study design: power of experiment
- possible confounds?
  - learning effect: did everybody use interfaces in a certain order?
  - if so, are people faster because they are more practiced, or because of true interface effect?

Comparative User Studies

- result analysis
  - should know how to analyze the main results/hypotheses BEFORE study
  - hypothesis testing analysis (using ANOVA or t-tests) tests how likely observed differences between groups are due to chance alone
  - ex: a p-value of 0.05 means there is a 5% probability the difference occurred by chance
    - usually good enough for HCI studies
- pilots!
  - should have good idea of forthcoming results of the study BEFORE running actual study trials

Evaluation Throughout Design Cycle

- user/task centered design cycle
  - initial assessments
  - iterative design process
  - benchmarking
  - deployment
- identify problems, go back to previous step

Task-Centered User Interface Design, Clayton Lewis and John Rieman, Chapters 0-5.

Initial Assessments

- what kind of problems are the system aiming to address?
  - analyze a large and complex dataset
- who are your target users?
  - data analysts
- what are the tasks? what are the goals?
  - find trends and patterns in the data via exploratory analysis
- what are their current practices
  - statistical analysis
- why and how can visualization be useful?
  - visual spotting of trends and patterns

- talk to the users, and observe what they do
- task analysis

Iterative Design Process

- does your design address the users' needs?
- can they use it?
- where are the usability problems?

- evaluate without users
  - cognitive walkthrough
  - action analysis
  - heuristics analysis
- evaluate with users
  - usability evaluations (think-aloud)
  - bottom-line measurements

Benchmarking

- how does your system compare to existing ones?
- empirical, comparative studies
  - ask specific questions
  - compare an aspect of the system with specific tasks
    - Amar/Stasko task taxonomy paper
  - quantitative, but limited
    - The Challenge of Information Visualization Evaluation, Catherine Plaisant, Proc. AVI 2004

Deployment

- how is the system used in the wild?
- how are people using it?
- does the system fit into existing work flow? environment?

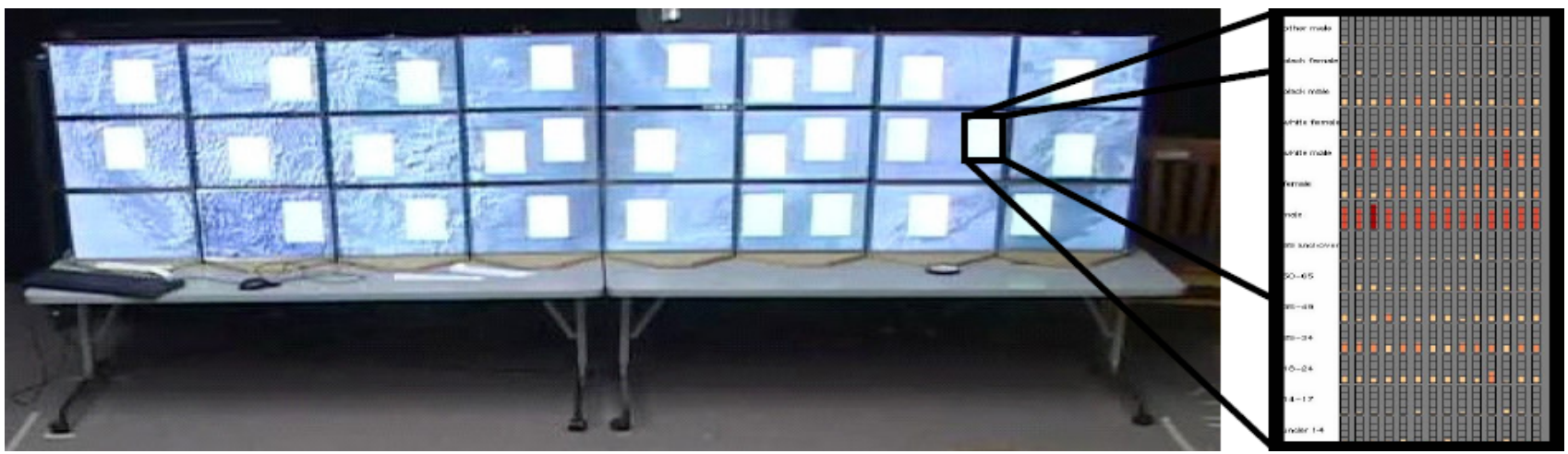
- contextual studies, field studies

Compare Systems vs. Characterize Usage

- user/task centered design cycle:
  - initial assessments
  - iterative design process
  - benchmarking: head-to-head comparison
  - deployment
  - (identify problems, go back to previous step)
- understanding/characterizing techniques
  - tease apart factors
  - when and how is technique appropriate
- line is blurry: intent

Perceptual Scalability

- what are perceptual/cognitive limits when screen-space constraints lifted?
  - 2 vs. 32 Mpixel display
  - macro/micro views
- perceptually scalable
  - no increase in task completion times when normalize to amount of data

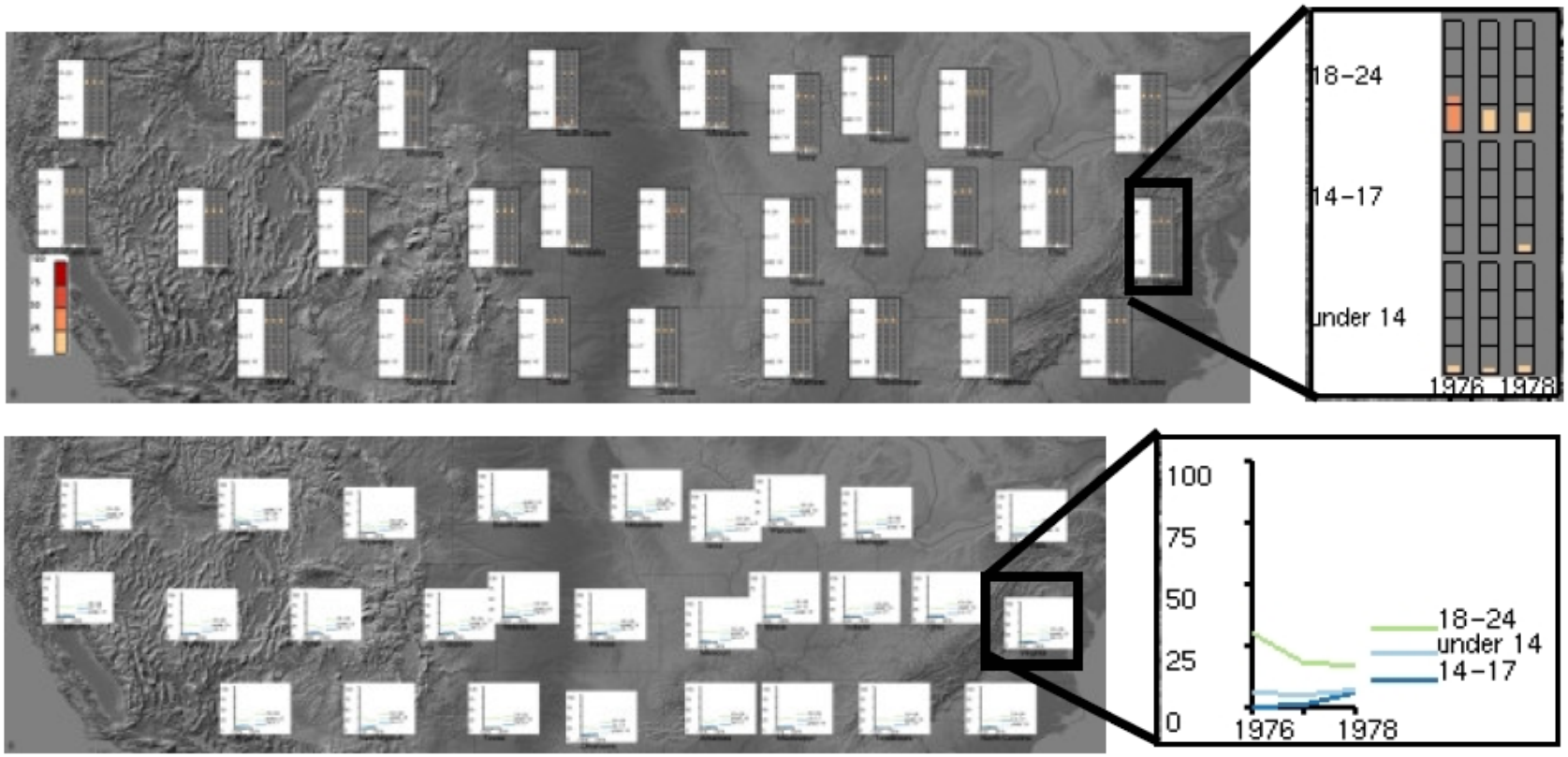


[The Perceptual Scalability of Visualization. Beth Yost and Chris North. IEEE TVCG 12(5) (Proc. InfoVis 06), Sep 2006, p 837-844.]

Perceptual Scalability

- design
  - 2 display sizes, between-subjects
    - (data size also increased proportionally)
  - 3 visualization designs, within
    - small multiples: bars
    - embedded graphs
    - embedded bars
  - 7 tasks, within
  - 42 tasks per participant
    - 3 vis x 7 tasks x 2 trials

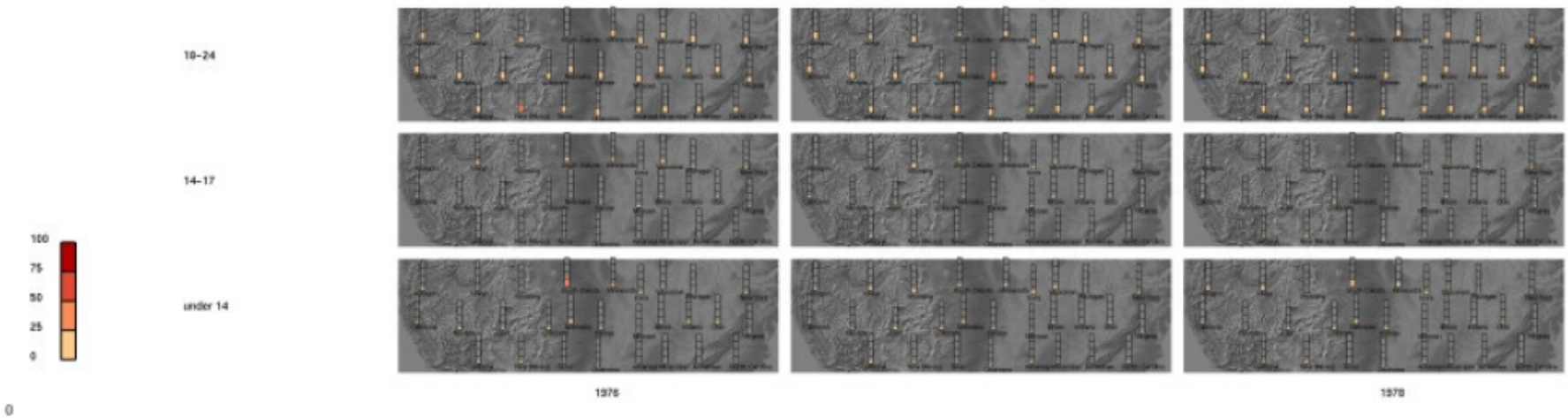
Embedded Visualizations



[The Perceptual Scalability of Visualization. Beth Yost and Chris North. IEEE TVCG 12(5) (Proc. InfoVis 06), Sep 2006, p 837-844.]

Small Multiples Visualizations

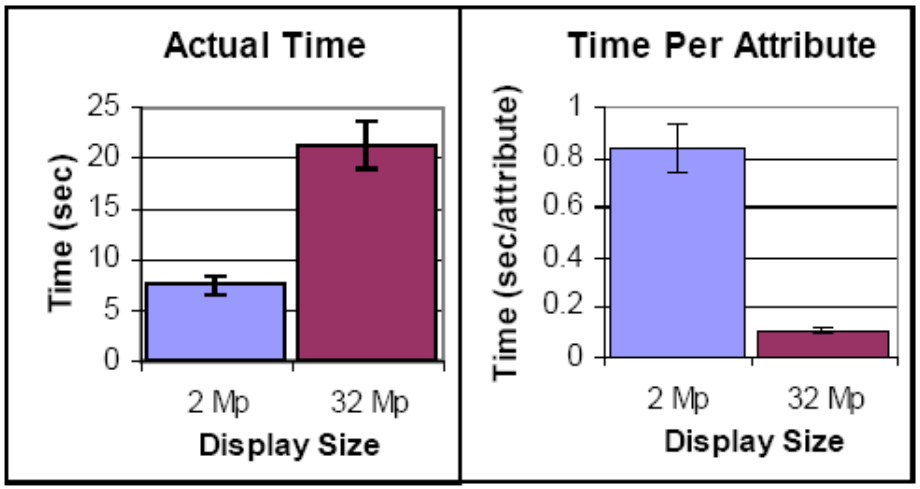
- attribute-centric instead of space-centric



[The Perceptual Scalability of Visualization. Beth Yost and Chris North. IEEE TVCG 12(5) (Proc. InfoVis 06), Sep 2006, p 837-844.]

Results

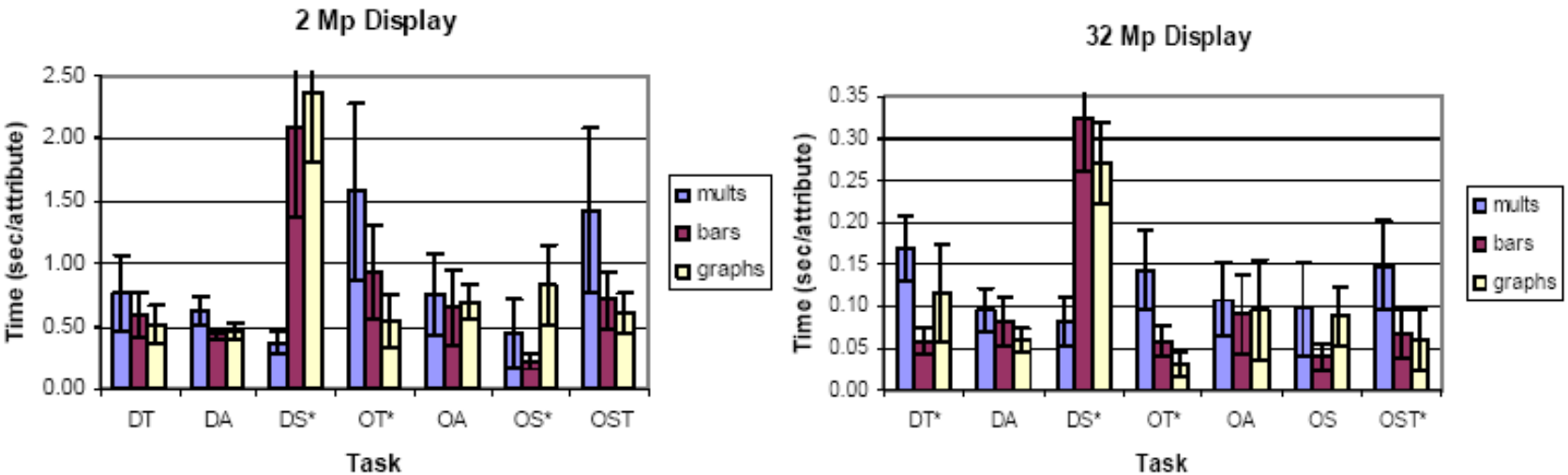
- 20x increase in data, but only 3x increase in absolute task times



[The Perceptual Scalability of Visualization. Beth Yost and Chris North. IEEE TVCG 12(5) (Proc. InfoVis 06), Sep 2006, p 837-844.]

Results

- significant 3-way interaction
  - between display, size, task



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Results

- visual encoding important on small displays
  - DS: mults sig slower than graphs on small
  - DS: mults sig slower than embedded on large
  - OS: bars sig faster than graphs for small
  - OS: no sig difference bars/graphs for large
- spatial grouping important on large displays
  - embedded sig faster+preferred over small mult
  - no bar/graph differences

Critique

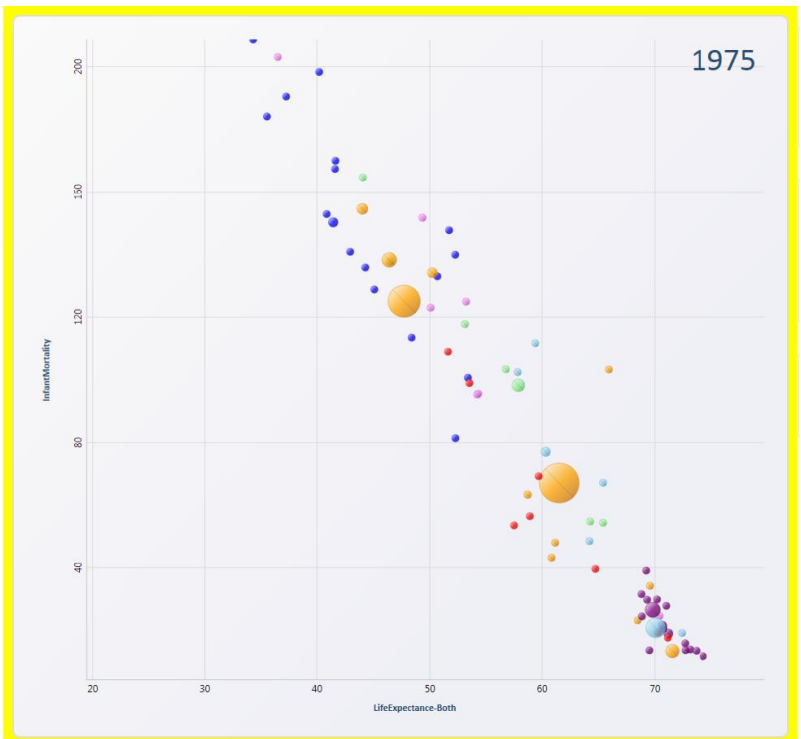
Critique

- first study of macro/micro effects
  - breaking new ground

- many possible followups
  - physical navigation vs. virtual navigation
    - The Effects of Peripheral Vision and Physical Navigation in Large Scale Visualization. GI 08
    - Move to Improve: Promoting Physical Navigation to Increase user Performance with Large Displays. CHI 07

Trends: Animation, Trails, SmallMult

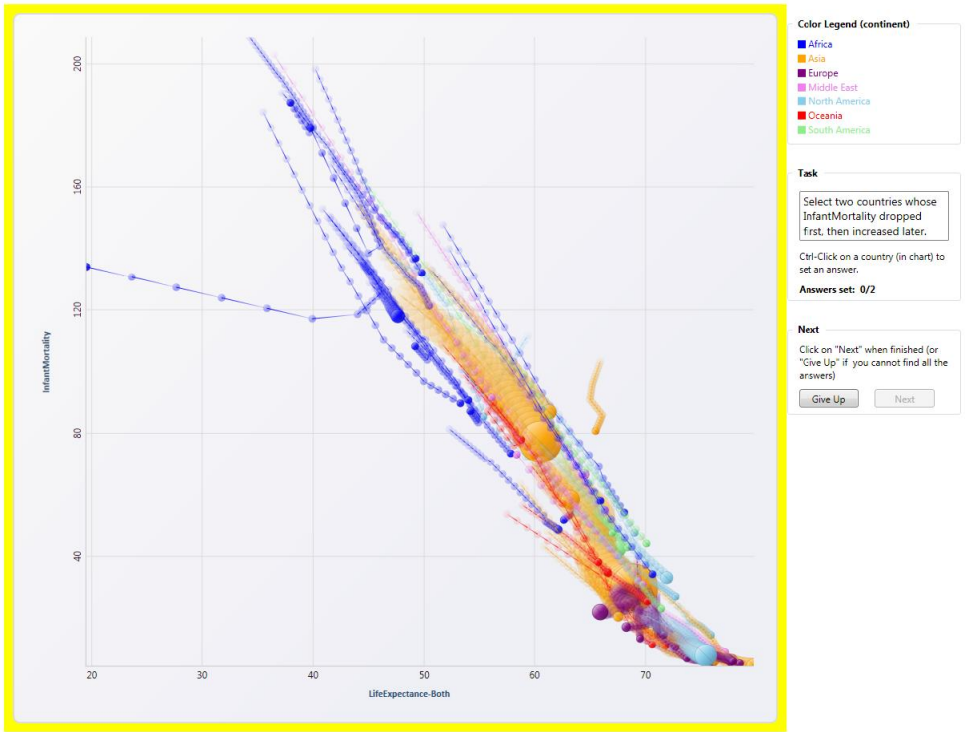
- Gapminder: animated bubble charts + human
  - x/y position, size, color, animation
  - is animation effective?
    - presentation vs analysis
    - trend vs transitions



[Effectiveness of Animation in Trend Visualization. Robertson et al. IEEE TVCG (Proc. InfoVis 2008). 14(6): 1325-1332 (2008)]

Trends

- many countertrends lost in clutter



[Effectiveness of Animation in Trend Visualization. Robertson et al. IEEE TVCG (Proc. InfoVis 2008). 14(6): 1325-1332 (2008)]

Small Multiples

- individual plots get small

[Effectiveness of Animation in Trend Visualization. Robertson et al. IEEE TVCG (Proc. InfoVis 2008). 14(6): 1325-1332 (2008)]

Design

- 2 use: presentation vs. analysis (between-subjects)
- 3 vis encodings: animation vs. traces vs. small mults
- 2 dataset size: small vs. large
  - 3 encoding x 2 size: within-subjects
- 24 tasks per participant
  - 4 tasks x 3 encodings x 2 sizes

Results

- small multiples more accurate than animation
- animation faster for presentation, slower for analysis
  - than small multiples and trends
- dataset size matters (unsurprisingly)

Critique

Critique

- nice idea to investigate the gapminder phenomenon!
- well done study

Pictures Into Numbers

- field study
- participants: professional meterologists
  - two people: forecaster, technician
- interfaces: multiple programs used
- protocol
  - talkaloud
  - videotaped sessions with 3 cameras

[Turning Pictures into Numbers: Extracting and Generating Information from Complex Visualizations. Trafton et al. Intl J. Human Computer Studies 53(5), 827-850.]

Cognitive Task Analysis

- initialize understanding of large scale weather
- build qualitative mental model (QMM)
- verify and adjust QMM
- write the brief

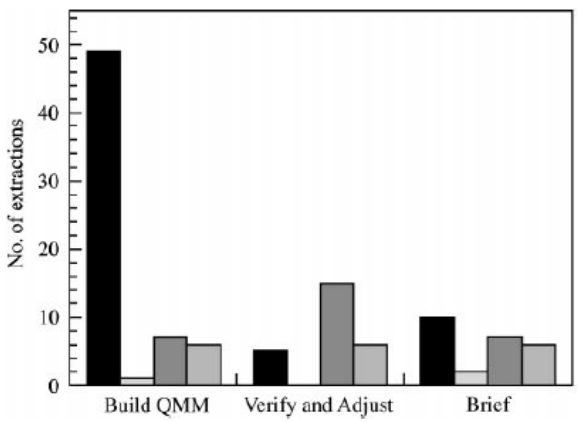
- task breakdown part of paper contribution

Coding Methodology

- interface
  - which interface used
  - whether picture/chart/graph
- usage (every utterance!)
  - goal
  - extract
    - quant/qual
    - goal-oriented/opportunistic
    - integrated/unintegrated
  - brief-writing
    - quant/qual
    - QMM/vis/notes

Results

- sig difference between vis used at CTA stages
  - charts to build QMM
  - images to verify/adjust QMM
  - all kinds during brief-writing
- many others...



The relation between the stage of the CTA and the type of visualization used by the forecasters: ■, chart; ■, graph; ■, picture; ■, text.

[Turning Pictures into Numbers: Extracting and Generating Information from Complex Visualizations. Trafton et al. Intl J. Human Computer Studies 53(5), 827-850.]

Critique

Critique

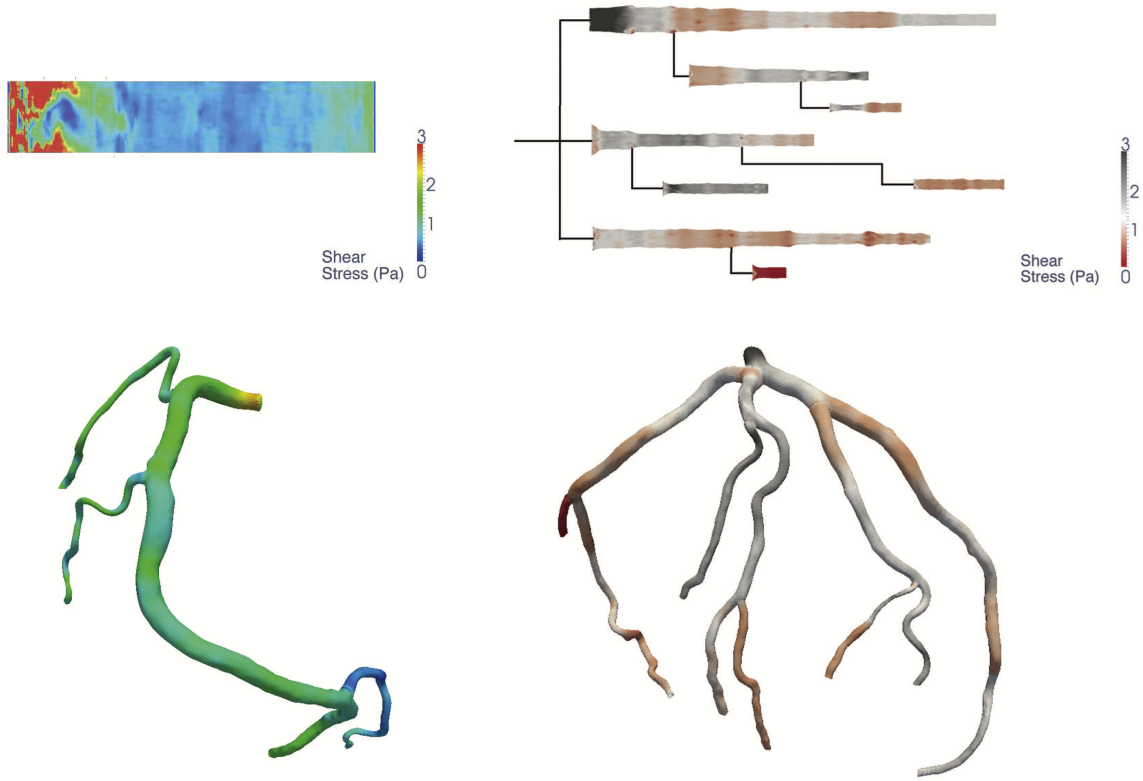
- video coding is huge amount of work, but very illuminating
  - untangling complex story of real tool use
- methodology of CTA construction not discussed here
  - often bottomup/topdown mix

User Study Goals

- compare systems
  - (Untangling the Usability of Fisheye Menus, Hornbaek 2007)
- characterize methods
  - Sizing the Horizon, Heer 2009
- formative feedback
  - Hotel Visits, Weaver 2007
  - Genealogical Graphs, McGuffin 2005
- summative judgement
  - LiveRAC, McLachlan 2008
  - Genealogical Graphs, McGuffin 2005
  - Prefuse, Heer 2005
- convince stakeholders
  - (InfoVis Eval in Large Companies, Sedlmair 2011)
  - (Evaluation of Artery Visualizations for Heart Disease Diagnosis, Borkin 2011)

HemoVis: Round 1

- formative qualitative study with experts
- task taxonomy led to design of HemoVis



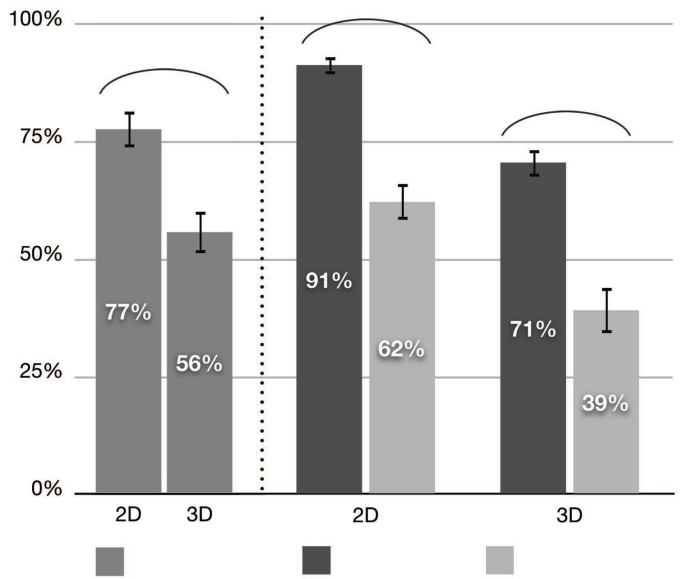
[Fig 1. Borkin et al. Artery Visualizations for Heart Disease Diagnosis. Proc InfoVis 2011.]

HemoVis: Round 2

- experts balk: demand familiar 3D and rainbows

HemoVis: Round 2

- experts balk: demand familiar 3D and rainbows
- quantitative user study
  - advanced Harvard Med School students
  - real patient data
  - 91% with 2D/diverging vs. 39% with 3D/rainbow
- medical experts now convinced to use new system



[Fig 1. Borkin et al. Artery Visualizations for Heart Disease Diagnosis. Proc InfoVis 2011.]

Credits

- significant influence from Heidi Lam guest lecture

http://www.cs.ubc.ca/~tmm/courses/cpsc533c-06-fall/#lect10

Readings For Next Time

Process and Pitfalls in Writing Information Visualization Research Papers. Tamara Munzner. Chapter from Information Visualization: Human-Centered Issues and Perspectives. Andreas Kerren, John T. Stasko, Jean-Daniel Fekete, Chris North, eds. Springer LNCS Volume 4950, p 134-153, 2008.

Reproducible Research in Signal Processing - What, why, and how. Patrick Vandewalle, Jelena Kovacevic and Martin Vetterli. IEEE Signal Processing Magazine, 26(3):37-47, May 2009.