## CSCI 4550/6550 Interactive Visualization

https://www.cs.rpi.edu/~cutler/classes/visualization/S24/

## Lecture 9: Streamgraphs, Gestalt Psychology \& Line Arrangements



Holton Rower
"Sometimes I Have to Look in the Mirror to See if I'm Still There"
2011
https://www.youtube.com/watchz?v=Gyktr2OI4v4

http://seaburyschoolnavigators.blogspot.com

## Ebru Art @ American Islamic College



What is the science behind these art forms? What physics/fluid would we need to accurately model to build a simulation?

What is the science behind these art forms? What physics/fluid would we need to accurately model to build a simulation?

- water/oil interaction (chemistry too)
- pen/stick/needle/stylus actions (water depth, speed through \& speed in/out, angle, thickness, material, momentum)
- Momentum of water/color
- Surface tension
- Paper step looks hard
- Layered transparency blending? (not sure)
- Use this technique, paint on flat water, apply pattern to curved surface
- Fluid rigid body simulation
- Surface tension
- Viscosity
- Paint mixing vs displacement
- How to dye the oil? (not water based)


## Today

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## Homework Assignment 5: Experimenting with Color

- Revisit an earlier assignment/data/toolkit
- Make a non-color-related improvement to this visualization
- Prepare many versions of the same visualization experimenting with different color palettes, e.g.:
- Shades of grey
- Black \& white
- Cool vs. warm tones
- Bold/saturated vs. pastel
- Colorblind aware
- Light vs dark background and/or color negation
- Etc.
- Analyze the effectiveness of the color scheme for each visualization.
- How well does it convey the message? Or mislead the viewer?
- Compare the visualizations to each other.


"Modeling Color
Difference for Visualization Design" Szafir, IEEE TVCG / IEEE VIS 2017


Table 1. Regression results for points, where $p=m_{x} * \Delta X$.

| Axis | Size (s) | Size in Px | Slope | $R^{2}$ | $N D(50 \%)$ in $\Delta E$ |
| :---: | :---: | :---: | :---: | :---: | :---: |
| L | $0.25^{\circ}$ | 6 px | 0.059 | 0.948 | 8.37 |
| L | $0.5^{\circ}$ | 12 px | 0.074 | 0.97 | 6.74 |
| L | $0.75^{\circ}$ | 18 px | 0.087 | 0.981 | 5.75 |
| L | $1^{\circ}$ | 25 px | 0.087 | 0.965 | 5.75 |
| L | $1.5^{\circ}$ | 37 px | 0.082 | 0.996 | 6.08 |
| L | $2^{\circ}$ | 50 px | 0.091 | 0.974 | 5.47 |
| a | $0.25^{\circ}$ | 6 px | 0.031 | 0.984 | 16.11 |
| a | $0.5^{\circ}$ | 12 px | 0.05 | 0.988 | 9.98 |
| a | $0.75^{\circ}$ | 18 px | 0.059 | 0.987 | 8.52 |
| a | $1^{\circ}$ | 25 px | 0.064 | 0.992 | 7.81 |
| a | $1.5^{\circ}$ | 37 px | 0.073 | 0.985 | 6.87 |
| a | $2^{\circ}$ | 50 px | 0.073 | 0.994 | 6.84 |
| b | $0.25^{\circ}$ | 6 px | 0.026 | 0.978 | 19.46 |
| b | $0.5^{\circ}$ | 12 px | 0.037 | 0.988 | 13.34 |
| b | $0.75^{\circ}$ | 18 px | 0.044 | 0.994 | 11.35 |
| b | $1^{\circ}$ | 25 px | 0.05 | 0.979 | 10.03 |
| b | $1.5^{\circ}$ | 37 px | 0.056 | 0.979 | 8.97 |
| b | $2^{\circ}$ | 50 px | 0.063 | 0.99 | 7.99 |
|  |  |  |  |  |  |
|  |  |  |  |  |  |

Table 2. Regression results for lines, where $p=m_{x} * \Delta X$.

| Axis | Size $(s)$ | Size in Pixels | Slope $(m)$ | $R^{2}$ | $N D(50 \%)$ in $\Delta E$ |
| :---: | :---: | :---: | :---: | :---: | :---: |
| L | $0.05^{\circ}$ | 2 px | 0.033 | 0.876 | 15.35 |
| L | $0.1^{\circ}$ | 3 px | 0.042 | 0.92 | 11.98 |
| L | $0.15^{\circ}$ | 4 px | 0.058 | 0.921 | 8.69 |
| L | $0.25^{\circ}$ | 6 px | 0.065 | 0.955 | 7.74 |
| L | $0.3^{\circ}$ | 7 px | 0.069 | 0.947 | 7.23 |
| L | $0.35^{\circ}$ | 9 px | 0.072 | 0.96 | 6.92 |
| a | $0.05^{\circ}$ | 2 px | 0.036 | 0.978 | 13.92 |
| a | $0.1^{\circ}$ | 3 px | 0.043 | 0.956 | 11.57 |
| a | $0.15^{\circ}$ | 4 px | 0.049 | 0.959 | 10.28 |
| a | $0.25^{\circ}$ | 6 px | 0.053 | 0.94 | 9.39 |
| a | $0.3^{\circ}$ | 7 px | 0.061 | 0.933 | 8.15 |
| a | $0.35^{\circ}$ | 9 px | 0.064 | 0.919 | 7.79 |
| b | $0.05^{\circ}$ | 2 px | 0.026 | 0.981 | 19.47 |
| b | $0.1^{\circ}$ | 3 px | 0.031 | 0.967 | 16.15 |
| b | $0.15^{\circ}$ | 4 px | 0.033 | 0.934 | 15.17 |
| b | $0.25^{\circ}$ | 6 px | 0.036 | 0.918 | 13.75 |
| b | $0.3^{\circ}$ | 7 px | 0.04 | 0.927 | 12.43 |
| b | $0.35^{\circ}$ | 9 px | 0.045 | 0.945 | 11.05 |

## Visual Salience

 Laurent Itti (2007), Scholarpedia, 2(9):3327. http://www.scholarpedia.org/article/Visual_salience- ... is the perceptual quality that makes some items in the world stand out from their neighbors and grab our attention

- Designers use saliency to create objects (such as this emergency triangle) that appear highly salient in a wide range of viewing conditions

- Berlin \& Kay's 11 basic color terms:
black, white, red, green, yellow, blue, brown, purple, pink, orange, gray


Figure 3. Berlin and Kay's hypothesis about seven evolutionary stages of colour terms (1969:4).


Fig. 6. Berlin and Kay's diagram of the eight basic colours in English (redrawn from [BK69, Appendix I, p.119]). As in Figure 5, the colour space is that of the Munsell colour system. See Figure 4 for an explanation of the notation. Berlin and Kay used a 320 chip Munsell array. They asked participants to determine, for each basic colour term, $\boldsymbol{x}$, (1) all those colour chips which they would, under any conditions, call $\boldsymbol{x}$, and (2) the best, most-typical examples of $\boldsymbol{x}$. The small crosses mark the locations of the "best, most-typical example" for each colour. The colour of each area matches that best most-typical example, within the limits of the available gamut. The white areas represent colour chips that were not given an unequivocal colour name.
"What is the "opposite" of "blue"? The language of colour wheels." Dodgeson, Perceptual Imaging 2019.

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# Reading for Tuesday pick one 

"Stacked Graphs - Geometry \& Aesthetics"
Lee Byron \& Martin Wattenberg, IEEE TVCG 2008


- Internet feedback was a large part of paper
- Unnecessary?
- started off as a story or documentary rather than an academic paper, strange
- vulgar language :(, seemed unprofessional (?)
- Cannot measure "organic and emotionally pleasing", proper analysis of comments beyond 'some people liked it / some did not' was not attempted/difficult/impossible
- Like other art... it is controversial, and that's ok!
- Eye magnets
- Layout
- Tufte's macro/micro: show both the sum and the individual values
- Minimize "wiggle" of extremes \& middle curves, thicker layers weighted more highly (but does not display data as accurately?)
- Keep graph centered (don't drift up or down)
- Border/space between layers? If required by media
- Labels are important
- Interaction is good
- Looks like mountains, foreground/background, perceived overlap implies some data is bigger than just the visible area
- Colors
- Natural \& pleasing, not too loud or distracting, (boring?)
- For a particular dataset is it necessary to match disjoint regions by color?
- Choose color from relevant 2D axes mapped to color \& saturation
- Don't all need to be unique, aren't limited by \# of distinguishable colors
- Local contrast
- Display data, e.g., time of onset, popularity,
- Bias color selection to keep image balanced
- Order
- Lack of prescribed ordering is unsettling
- Sort by time of offset or "measure of volatility"
- Generally alternating top \& bottom seems to be best
- Entrance position discussion interesting
- This is not a black box one-size-fits-all visualization technique. It requires thought to choose colors \& tweak layout. It won't work for all data. Could be done badly...
- Difficult for newbies - no clear, straightforward solution/guidance for layout or color
- Waviness of output appropriate for music data
- Handles massive amount of data
- This should be a graph option in Excel!
- Legend mandatory to understand and interpret a particular streamgraph (no conventions)
- The plots are so interesting you are motivated to figure it out
- Abstract was awkward talking about an image that wasn't right there
- Insufficient comparison images within the paper (copyright thing? page limit? assumed to be "common knowledge"?)
- Didn't explain improvements streamgraph vs. theme river
- Personalized visualizations are cool
- Purpose of this visual: to look cool \& be engaging \& draw interest or to scientifically measure \& conclude things?
- Some sloppy figure callouts/captions/labels. Some captions too short. Why was this image included? Need to do more than just describe the source of the data
- Vertical vs horizontal: horizontal most appropriate for time data.
- Helpful reference:
http://www.visualisingdata.com/index.php/2010/08/making-sense-of-streamgraphs/


## Reading for Tuesday pick one

"Baby Names, Visualization, and Social Data Analysis"<br>Martin Wattenberg, IEEE InfoVis 2005



- Value in a tool that encourages exploration
- Users spending considerable time
- Data analysis is fun, becomes a game, exploration not just for an individual, also fun as a group or social activity, family connections
- Tool is a minor fad, broadly popular, no formal advertising investment
- Not scientific, anecdotal review of lots of blog posts
- Data from ~100 years of U.S. SSN data
- Time series data for approximately 6,000 distinct names
- Darker shades of blue/pink for names that are currently more popular
- "Overview first, zoom and filter, details on demand" [ Shneiderman 1996 ]
- Visualization updates on each keystroke (don't need to press enter)
- Compares to other contemporary interactive visualization designs
- Total data drawn regulated to avoid performance problems
- Bartles taxonomy: achievers, socializers, explorers, killers
- What makes, or how to create a successful visualization / interaction app? Common but unique perspective, expressive spectator interface, discovery transfer


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## Interpreting Physical Sketches as Architectural Models



> Barbara Cutler and Joshua Nasman
> Advances in Architectural Geometry 2010

## Spatially Augmented Reality (SAR) Projection



## Our Contributions

- Algorithm for automatic interpretation of interior space vs. exterior space
- Construction of a watertight 3D mesh
- User study collected >300 example designs
- Validation of algorithm
- Compare to annotations by the original designer
- Quantify design ambiguity
- Compare annotations of a design by other users


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## Related Work

- Tangible User Interfaces [e.g., Ben-Joseph et al. 2001]
- Sketch-based Modeling User Interfaces
[Zeleznik et al. 1996; Igarashi et al. 1999; Dorsey et al. 2007]
- Pen-based Sketch Recognition [e.g., Wacom 2010]
- Automated Recognition of CAD Drawings [Aoki et al. 1996; Llados et al. 1997; Ah-Soon and Tombre 2001; Kulikov 2004; Lu et al. 2005]
- Human Vision, Perception, \& Gestalt Psychology
- Seek the simplest explanation
$\angle$ for an incomplete diagram
- Closure, proximity, symmetry, continuity, collinearity, \& parallelism


## Gestalt Principles: Reification

- Constructive or generative aspect of perception



## Pragnanz: Gestalt Laws of Grouping

- Proximity
- Similarity
- Closure
- Symmetry


-     -         -             -                 - 
- Common fate
$\bigcirc \bigcirc \bigcirc \bigcirc \bigcirc \bigcirc$
- Continuity
- "Good" gestalt (regular, simple \& orderly, eliminate complexity \& unfamiliarity)
- Past experience


## Gestalt Principles



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## Overview of Algorithm

- Image Processing (our earlier publications)
- Lack of precision in sketch:
- Should elements be parallel?
- collinear?
- perpendicular?
- tangent?
- Link tangent walls to form continuous chains
that divide space into zones
- Determine interior vs. exterior
- Generate floor plan diagram \& watertight mesh geometry


## Tolerance Example: Collinearity



Detected Geometry



Designer's Intention


Other Users' Interpretations


Favor Skew Lines


## Connecting Segments Together

- End points near each other (what epsilon/tolerance?)
- Approximately parallel (what epsilon/tolerance?)
- Snap to perfect line? Or preserve original shape?
- What if we have multiple matches?


## Linking Elements to Form Chains

- Nearby walls with similar tangents can be joined into a chain




## A Modified "Line Arrangement"

- In addition to infinite straight lines, a "wall chain" may:
- Bend or be curved!
- Be a closed loop!
- Cross itself!
- Cross another wall chain more than once!



## Complexity Analysis?

- Input: $n$ physical walls or sketched pen strokes
- Consider connecting into chains
- How many endpoint-endpoint connections?
- How to reduce \# of comparisons?
- After joining into $m$ "wall chains" ( $m \leq n$ )
- How many point intersections (between wall chains)?

What if the wall chains are perfect lines?
What if they wall chains are general curves?

- How many zones/cells/faces (assume lines)?
- How to uniquely label faces?
- Labeling Interior vs. Exterior
- How many ways to label entire diagram interior vs. exterior?

Assume $f$ faces, and each face should be labeled interior or exterior.

## Complexity Analysis?

- Input: $n$ physical walls or sketched pen strokes
- Consider connecting into chains
- How many endpoint-endpoint connections? $(2 n * 2(n-1)) / 2=O\left(n^{2}\right)$
- How to reduce \# of comparisons? Spatial data structure, like a quadtree
- After joining into $m$ "wall chains" ( $m \leq n$ )
- How many point intersections (between wall chains)?

What if the wall chains are perfect lines? $O\left(m^{2}\right)$
What if they wall chains are general curves? $O(\infty)$

- How many zones/cells/faces (assume lines)? $\mathrm{O}\left(2^{m}\right)$
- How to uniquely label faces? Binary code, each bit represents which
- Labeling Interior vs. Exterior "side" of each wall chain it lies on.
- How many ways to label entire diagram interior vs. exterior? $\mathrm{O}\left(2^{f}\right)=\mathrm{O}\left(2^{2^{m}}\right.$ Assume $f$ faces, and each face should be labeled interior or exterior.


4 lines (wall chains)

with this configuration, limited to this circle, we have 9 faces/zones

## Halfspace Zones \& Enclosure

- For $n$ wall chains
- For simplicity, assume they are infinite straight lines
- We will have $O\left(n^{2}\right)$ faces/cells in the arrangement
- Each face/cell can be "interior" or "exterior"
- $\rightarrow 2^{O\left(n^{2}\right)}$ possible buildings

Not feasible to check all of them!!


## Halfspace Zones \& Enclosure

- Further subdivided using GraphCuts (if needed)



## Interior/Exterior Optimization

- Analyze histogram of point-sampled enclosure values
- Maximize usage of lengths of real wall elements
- Minimize length of inferred (added) walls
- Minimize area assigned in opposition of simple threshold metric



## Interior/Exterior Optimization

- Analyze histogram of point-sampled enclosure values
- Maximize usage of lengths of real wall elements
- Minimize length of inferred (added) walls
- Minimize area assigned in opposition of simple threshold metric



## Interior/Exterior Enclosure Threshold

There is no universal threshold - varies design-to-design, and within-a-design


Automatic Interior/Exterior Determination \& Final Floorplan


Compare to Designer's Intention

## Interior/Exterior Optimization

- (Courtyard option) Minimize total enclosed area



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## Our Goals in Conducting User Study Design

- Understand range of designs possible
- Improve physical sketching user interface
- Improve algorithm for sketch recognition
of interior/exterior space
- Learn common human interpretation "rules"
- Quantify design ambiguity
- Measure effectiveness of Virtual Heliodon as an architectural daylighting design tool


## User Study 1: Open-Ended Design

- 30 participants
(15 architects)
- 20 mins of sketching
- 329 unique designs
(154 by architects)

- After design session:
- Designer annotates each design
- Then, we reveal our automatic interpretation



## User Study: Identify/Quantify Ambiguous Designs



## User Study 2: Re-Interpretation

- 114 designs from Study 1
- All ambiguous designs included
- Some clear designs (as controls)
- 15 participants
- Re-interpreted by another user
- 3-6 new annotations for each
- 346 total ( 124 by architects)

- Then compare to original designer's annotation
- And finally, to our automatic interpretation


## Re-Interpretation Results

- No correlation found between background (architecture/arts/none) \& interpretation accuracy
- We will continue to improve the robustness of our software

| matches the original designer's intention |  |  |  |  |  |  |  |
| :---: | :---: | :---: | :---: | :---: | :---: | :---: | :---: |
|  | correct |  | mostly correct |  | incorrect |  | total |
| clear | 155 | 78\% | 17 | 9\% | 26 | 13\% | 198 |
| $\rightarrow$ ambiguous | 74 | 56\% | 35 | 27\% | 22 | 17\% | 131 |
| total | 229 | 70\% | 52 | 15\% | 48 | 15\% | 329 |
| multiple interpretations possible |  |  |  |  |  |  |  |

## Domain-Specific Knowledge Required

- Standard vocabulary of architectural forms (e.g., cruciform, portico, etc.)
- Maybe architectural data and modern $\mathrm{Al} / \mathrm{ML}$ would help in these cases?



## Future Work

- Improve/robustify interpretation algorithm
- Detect symmetry \& repetition
- Multi-zone interiors \& circulation paths
- Incorporate domain-specific knowledge
- Enhance user interface
- Additional tokens, more complex element shapes
- Alternative to sketching in plan: sketch (double height, multi-floor) vertical sections
- Apply to pen-based sketch interpretation


## Thanks!

- Yu Sheng, Ted Yapo, \& Andrew Dolce
- Our user study volunteer participants
- Funding from NSF \& IBM


Automatic Interpretation

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## Reading for Friday pick one

"Error Bars Considered Harmful: Exploring Alternate Encodings for Mean and Error", Correll \& Gleicher, TVCG 2014

(a) Bar chart with error bars: the height of the bars encodes the sample mean, and the whiskers encode a $95 \% \mathrm{t}$ confidence interval.

(b) Modified box plot: The whiskers are the $95 \% \mathrm{t}$-confidence interval, the box is a 50\% t-confidence interval.

(c) Gradient plot: the transparency of the colored region corresponds to the cumulative density function of a $t$ distribution.

(d) Violin plot: the width of the colored region corresponds to the probability density function of a $t$-distribution.

## Reading for Friday pick one

## "Visual Encodings of Temporal Uncertainty: A Comparative User Study", Gschwandtner, Bogl, Federico, \& Miksch, TVCG 2016



Fig. 1: Six different visual encodings of start/end uncertainty of temporal intervals used in the user study: (a) gradient plot, (b) violin plot, (c) accumulated probability plot, (d) error bars, (e) centered error bars, and (f) ambiguation. We designed encodings (a)-(c) to encode statistical uncertainty and encodings (d)-(f) to encode bounded uncertainty. All encodings were used to estimate earliest start, latest start, earliest end, and latest end, as well as minimum, maximum, and average interval duration. Moreover, encodings (a)-(c) were used to estimate the probability that the interval has already started/ended at a marked position in time.

