## 03 Visual Perception

# 36-721 Statistical Graphics and Visualization 

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## Last time

- Legible graphs: image format and quality
- Comprehensible graphs: labels, titles, and annotations
- Core charts in base R
- HW 1


## Today

- Quantitative comparisons: basic perceptual tasks, distance
- Grouping and search: preattentive processing, gestalt, separable dimensions, alignment
- Cognition: derived variables, ranking
- Consistency: across small multiples, in design, with semantic associations
- R: choosing color, point symbol, line type
- text, matplot, RColorBrewer
- mfrow, layout, mtext


## Today

Follow along:

- Editable code in 03_Perception_code.R
- Code with output examples in 03_Perception_code.html


## Quantitative comparisons

- Basic perceptual tasks
- Distance


## Quantitative comparisons

Experiment on next few slides:

|  | A | B | C | D |
| :--- | :--- | :--- | :--- | :--- |
| Positions | 1 | $?$ | $?$ | $?$ |
| Lengths | 1 | $?$ | $?$ | $?$ |
| Angles | 1 | $?$ | $?$ | $?$ |
| Areas | 1 | $?$ | $?$ | $?$ |

Quantitative perceptual tasks: position, aligned


## Quantitative perceptual tasks: length



## Quantitative perceptual tasks: angle



## Quantitative perceptual tasks: area



## Quantitative perceptual tasks: answers

|  | A | B | C | D |
| :--- | :--- | :--- | :--- | :--- |
| Positions | 1 | $3 / 4$ | $1 / 4$ | $2 / 4$ |
| Lengths | 1 | $2 / 4$ | $3 / 4$ | $1 / 4$ |
| Angles | 1 | $2 / 3$ | $1 / 3$ | $4 / 3$ |
| Areas | 1 | $2 / 4$ | $1 / 4$ | $3 / 4$ |

Cleveland and McGill (1984)
Cleveland, The Elements of Graphing Data

## Quantitative perceptual tasks: effect of angle orientation



Same angle looks wider when bisector is horizontal.

## Ordering of perceptual tasks

Cleveland and McGill's ordering


## Ordering of perceptual tasks



## Distance







Figure 4. Graphs from position-length experiment.

## Cleveland and McGill (1984)

## Quantitative perceptual tasks

Lessons:

- Best to show quantitative variables with position or length
- Bars encode length, so start bars at 0; to zoom in, use dotplots (position) instead
- Avoid stacked bars (not aligned); use dots or lines (aligned baselines) instead
- Avoid pies, area, and volume entirely
- Choose and order hues sensibly; use Color Brewer
- Place things-to-be-compared near each other


## Grouping and Search

- Preattentive processing
- Gestalt
- Separable dimensions
- Alignment


## Preattentive processing: example task

Find and count the 6s

$$
\begin{array}{llllllllllllllllllll}
0 & 5 & 0 & 8 & 2 & 4 & 9 & 3 & 2 & 0 & 6 & 9 & 0 & 0 & 3 & 0 & 4 & 6 & 2 & 7 \\
9 & 0 & 1 & 1 & 7 & 9 & 9 & 7 & 9 & 3 & 4 & 6 & 4 & 4 & 9 & 7 & 4 & 8 & 0 & 7 \\
3 & 7 & 6 & 5 & 2 & 7 & 5 & 9 & 5 & 5 & 9 & 2 & 7 & 3 & 1 & 0 & 0 & 3 & 6 & 8 \\
4 & 4 & 5 & 5 & 4 & 6 & 7 & 2 & 7 & 3 & 2 & 4 & 3 & 8 & 5 & 0 & 3 & 6 & 2 & 7 \\
4 & 7 & 4 & 1 & 5 & 5 & 1 & 8 & 1 & 3 & 7 & 9 & 9 & 1 & 1 & 2 & 2 & 1 & 5 & 2
\end{array}
$$

## Preattentive processing: example task

Find and count the 6 s now

$$
\begin{array}{llllllllllllllllllll}
0 & 5 & 0 & 8 & 2 & 4 & 9 & 3 & 2 & 0 & 6 & 9 & 0 & 0 & 3 & 0 & 4 & 6 & 2 & 7 \\
9 & 0 & 1 & 1 & 7 & 9 & 9 & 7 & 9 & 3 & 4 & 6 & 4 & 4 & 9 & 7 & 4 & 8 & 0 & 7 \\
3 & 7 & 6 & 5 & 2 & 7 & 5 & 9 & 5 & 5 & 9 & 2 & 7 & 3 & 1 & 0 & 0 & 3 & 6 & 8 \\
4 & 4 & 5 & 5 & 4 & 6 & 7 & 2 & 7 & 3 & 2 & 4 & 3 & 8 & 5 & 0 & 3 & 6 & 2 & 7 \\
4 & 7 & 4 & 1 & 5 & 5 & 1 & 8 & 1 & 3 & 7 & 9 & 9 & 1 & 1 & 2 & 2 & 1 & 5 & 2
\end{array}
$$

## Preattentive processing

We automatically process and notice certain features, while others require conscious thought to find

We process faster when there are few categories to distinguish

## Preattentive processing: features

Colin Ware, Information Visualization


Shape

Curved/straight


Size


Shape


Number


## Preattentive processing: features



Addition


Enclosure


Juncture


Convexity/concavity


Parallelism


## Preattentive processing

Lessons

- Distinguish categorical groups by features like hue \& shape
- Hue also lets you use direct labels instead of a legend
- Don't try to show too many groups on one plot; use small multiples to show more sub-groups
- If highlighting one group, use a preattentive attribute


## Gestalt

Gestalt $=$ "pattern" in German
We automatically structure data into patterns / groups using certain features


Enclosure


Connection


## Gestalt

Lessons

- Distinguish categorical groups by similarity, proximity, or enclosure
- Use proximity to structure your layout (arrange small multiples)
- Use connection to show groups on line chart, parallel coordinates chart, network graph, etc.
- To highlight one group, use gestalt principles such as enclosure or similarity


## Separable dimensions

Some examples from Colin Ware, Information Visualization <- More integral ... More separable ->


## Integral dimensions example

## US Census Bureau map using hue and saturation



## Separable dimensions

Lessons

- Use color and another variable (shape, size, orientation, motion)
- Use small multiples rather than different plotting symbols
- Avoid mixing 2 aspects of color, or 2 aspects of size
- Don't combine too many grouping variables at once


## Alignment

Among male newborns, compare by race


## Alignment

Among male newborns, compare by race: easier search now, though harder comparison


## Alignment

Lessons

- Decide on visual task, and helpfully align elements to be compared
- During EDA, try several arrangements


## Cognition

- Derived variables
- Ranking


## Derived variables

William Playfair, one of the earliest line charts
What does the difference look like?


## Derived variables

Differences shown directly, by Cleveland and McGill


## Ranking: alphabetical



## Ranking: informative



## Derived variables and Ranking

## Lessons

- If differences or ratios are interesting, compute and plot them directly
- Order your dots/bars meaningfully: ranked by a variable, not alphabetical


## Consistency

- Across small multiples
- In design
- With semantic associations


## Consistency

Which age group weighs the least?


## Consistency

Give all small multiples the same structure, usually including axis limits, to make comparisons easier and reduce cognitive load


Age (months)

## Consistency

Ensure design changes are meaningful (tied to data changes)

## SUPREME COURT <br> Three out of nine <br> Ithonhind

CONGRESS 104 out of 535
$\square$

HOUSE OF REPRESENTATIVES
84 women out of 435 (19\%)

## SENATE



## Consistency

More consistent redesign, Stephen Few


## Consistency

Avoid meaningless visual variables like shadow or 3D STRUCTURE OF SERVICES 2007


## Consistency

Lessons

- Use consistent mappings (colors and shapes, axis limits) across graphs
- Don't reuse same mappings for a different data variable
- Avoid meaningless variety in design
- Avoid shadow, 3D, and other variables not mapped to data


## Semantic associations

Orange vs blue crab species: I've seen this in a talk (crabs dataset in MASS package)


## Semantic associations

## Lessons

- Use meaningful mappings: orange vs blue crab species = orange and blue symbols
- Use conventional mappings: blue $=$ cold, red $=$ hot
- "More = more": deeper saturation or larger size $=$ higher value of variable
- Choosing color, point symbol, line type
- text, matplot, RColorBrewer
- mfrow, layout, mtext


## For next time

- We'll cover the Grammar of Graphics framework, and how it is the basis for ggplot2 and Tableau
- HW 2 due Saturday at 5pm, through Blackboard

