## Visualization

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THANKS TO DIANA MACLEAN AND JEFF HEER CS 376

## Anscombe's Quartet

| Set A |  |  | Set B |  |
| ---: | ---: | ---: | ---: | ---: |
| X | Y |  | X | Y |
| 10 | 8.04 |  | 10 | 9.14 |
| 8 | 6.95 |  | 8 | 8.14 |
| 13 | 7.58 |  | 13 | 8.74 |
| 9 | 8.81 |  | 9 | 8.77 |
| 11 | 8.33 |  | 11 | 9.26 |
| 14 | 9.96 |  | 14 | 8.1 |
| 6 | 7.24 |  | 6 | 6.13 |
| 4 | 4.26 |  | 4 | 3.1 |
| 12 | 10.84 |  | 12 | 9.11 |
| 7 | 4.82 |  | 7 | 7.26 |
| 5 | 5.68 |  | 5 | 4.74 |

## Set C

| X | Y |
| ---: | ---: |
| 10 | 7.46 |
| 8 | 6.77 |

$8 \quad 7.71$
88.84
88.47
$8 \quad 7.04$
85.25
$19 \quad 12.5$
$8 \quad 5.56$
$8 \quad 7.91$
86.89

Summary Statistics
$\mathbf{u}_{X}=9.0 \quad \sigma_{X}=3.317$
$u_{Y}=7.5 \quad \sigma_{Y}=2.03$

Linear Regression
$Y=3+0.5 X$
$R^{2}=0.67$

Set A


Set C


Set B


Set D


## What is visualization?

. "Transformation of the symbolic into the geometric" [McCormick et al., 1987]

- "...finding the artificial memory that best supports our natural means of perception."
[Bertin 1967]
- "The use of computer-generated, interactive, visual representations of data to amplify cognition." [Card, Mackinlay, and Shneiderman I999]

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1.

APRIL 1854 no MARCH 1855.
 black lines anclosing them

Florence Nightingale, I 857





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## Why visualize data?

- Story or explanation
- Get answers (or questions!)
- Find patterns
- Find mistakes
- Support reasoning
- Convince others
- Share


## Why visualize data?



## Goals of visualization research

- Understand how visualizations convey information What do people perceive and comprehend? How do visualizations correspond with mental models?
- Develop principles and techniques for creating effective visualizations and supporting analysis Amplify perception and cognition Strengthen the tie between visualization and mental models


## Graphical Perception

"The visual decoding of information encoded on graphs" [Cleveland \& McGill, '84]

## Pre-attentive Processing



## Pre-attentive Processing



## Reification


http://en.wikipedia.org/wiki/File:Reification.jpg

## Gestalt law of Proximity



Gestalt law of Similarity

$\rightarrow$


## People are poor at perceiving differences



Cleveland \& McGill, 1984

## Semiologie Graphique



# The Process of Visualization 

## Recording \& Storing



Flickr citynam


为
http://visưalizing.org/visualizations/flickr- citynam


## Authoring

"data": \{"url": "data/weather.csv","formatType": "csv"\},
"mark": "bar",
"encoding": \{
"x": \{"field": "location","type": "nominal"\},
"y": \{
"field": "*",
"type": "quantitative",
"aggregate": "count"
\},
"color": \{"field": "weather","type": "nominal"\}
\}
|

Analyzing

## Interaction: Filtering



## Interaction: Brushing and Linking



## Visual Uncertainty



# Network <br> Visualization 

## Putting things into perspective



## Putting things into perspective



## Putting things into perspective



## Putting things into perspective



## Degree-of-interest trees

## Space-constrained, multi-focal tree layout



Heer \& Card, 2004

## Hierarchical graph layout



## Motifs



## Attribute-based aggregation

Gender Legacy

PivotGraph Matrix
Wattenberg, 2005

## Uh oh...



## Text

Visualization

## Word Tree



Wattenberg \& Viegas, 2007

## Parallel Tag Clouds



## TextArc



Paley, 2002

## Sharing/

Communicating

## Heart Disease Diagnosis



Borkin et al., 20 I I

## Flickr Flow



Viegas \& Wattenberg: http://hint.fm/projects/flickr/

## Discussion rooms

| Rotation | Littleffeld 107 | Littleffeld 103 |
| :--- | :--- | :--- |
| a | 12 | 34 |
| b | 24 | 13 |
| c | 14 | 23 |
| d | 34 | 12 |
| e | 13 | 24 |
| f | 23 | 14 |

