

# EM622 Data Analysis and Visualization Techniques for Decision-Making

From Data Visualization to Data Analytics



# Agenda

- ▶ Why visualization?
- ▶ Graphs that tell you something- Pizza place geography
- ▶ Brief history of data visualization
- ▶ Beautiful examples
- ▶ Trends & tools
- ▶ Course overview

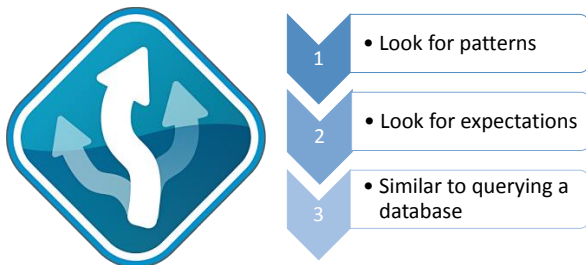
# Why visualization?

*Data visualization is the creation and study of the visual representation of data, meaning "information that has been abstracted in some schematic form, including attributes or variables for the units of information"* - Michael Friendly (2008). "Milestones in the history of thematic cartography, statistical graphics, and data visualization"

- ▶ *"The great fun of information visualization is that it gives you answers to questions you didn't know you had"* - Prof. Ben Schneiderman, University of Maryland;
- ▶ *"The great use of data visualization is that it gives you clues to questions you didn't know you had"* - Saaijen Tist

# Why visualization?

## Direct Navigation: Answer Questions of Interests



*"INFORMS Data Exploration Workshop Workbook"- Shmueli & Hardoon 2013*

# Why visualization?



**Exploratory Navigation:  
Find interesting data stories**

- No pre-specified question
- Explore-discover-ask-explore-discover etc.

*"INFORMS Data Exploration Workshop Workbook"- Shmueli & Hardoon 2013*

# Why visualization?

## Uses of Data Visualization:

- ▶ Evaluate data quality and data issues;
- ▶ Answer questions of interest;
- ▶ Create 'data stories' to identify opportunities and challenges;
- ▶ Communicate 'data stories' to an audience (data presentation).
- ▶ "How to tell a story with data?" by Nathan Yau:

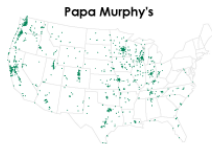
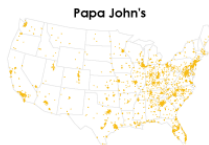
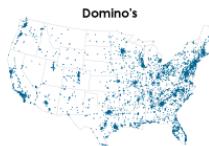
<http://www.youtube.com/watch?v=mkEXx7sDXAI>

# Graphs that tell you something- Pizza place geography

- ▶ Taken from FlowingData (<http://flowingdata.com>) by Nathan Yau.
- ▶ Data source: AggData(<http://aggdata.com>).
- ▶ Pizza chains are everywhere, but some are more popular than the others in a certain region.
- ▶ Given the store locations of Chunk E. Cheese's, CiCi's, Domino's, Godfather's, Little Caesar's, Papa John's, Papa Murphy's, Pizza hut and Sbarro, what can you tell?

# Graphs that tell you something- Pizza place geography

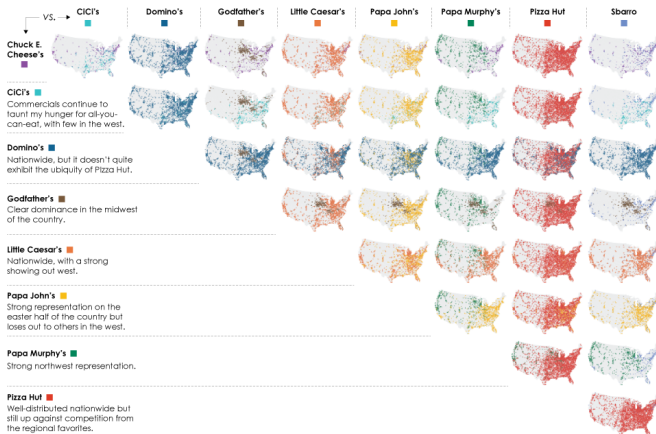
- ▶ Which restaurant is dominant nationally/regionally?





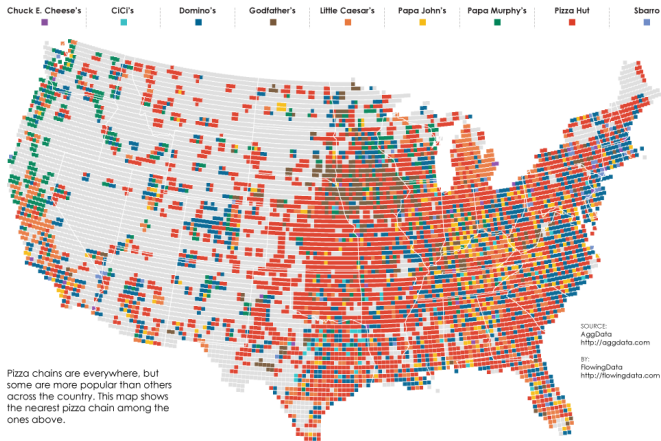
# Graphs that tell you something- Pizza place geography

## Which pizza place is closer?



SOURCE: AggData, <http://aggdata.com> | BY: FlowingData, <http://flowingdata.com>

# Graphs that tell you something- Pizza place geography



# Brief history of data visualization

- ▶ The graphic portrayal of quantitative information has deep roots. These roots reach into histories of thematic cartography, and statistical graphics.
- ▶ The earliest seeds arose in geometric diagrams and in the making of maps to aid in navigation and exploration.
- ▶ Diagrams were used to illustrate mathematical proofs and functions; various graphic forms were invented to make the properties of empirical numbers (trends, tendencies, and distributions- more easily communicated, or accessible to visual inspection.
- ▶ Maps, diagrams and graphs were initially hand drawn, piece-by-piece -> etched on copper-plate and manually colored -> lithography and photo-etching-> computer software

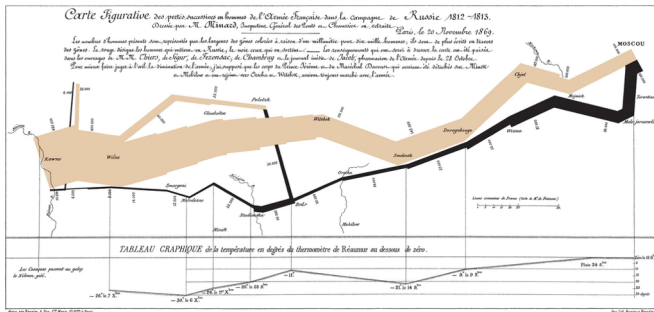
Source: *"Milestones in the history of thematic cartography, statistical graphics, and data visualization"* by Michael Friendly:

<http://www.math.yorku.ca/SCS/Gallery/milestone/milestone.pdf>

# Beautiful Examples

## Charles Minard's flow map of Napoleon's March (1869)

- ▶ The French engineer, Charles Minard (1781-1870), illustrated the disastrous result of Napoleon's failed Russian campaign of 1812.
- ▶ The brown line (on the top) shows the troop levels as they begin their march towards Moscow. The black line shows their retreat.



# Beautiful Examples

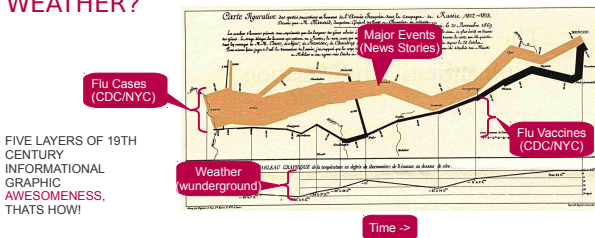
Principles for designing the visualization(Notes from Edward Tufte's training):

1. Show comparisons, contrasts, differences.
2. Show causality, mechanism, explanation, systematic structure.
3. Show multivariate data; that is, show more than 1 or 2 variables.
4. Completely integrate words, numbers, images, diagrams.
5. Documentation. The credibility of an evidence presentation depends significantly on the quality and integrity of the authors and their data sources.(Who/When/Where)
6. Content counts most of all.

## Challenge 1

Based on Minard's flow map of Napoleon's March, think about a new example nowadays that may use principles demonstrated in the flow map.

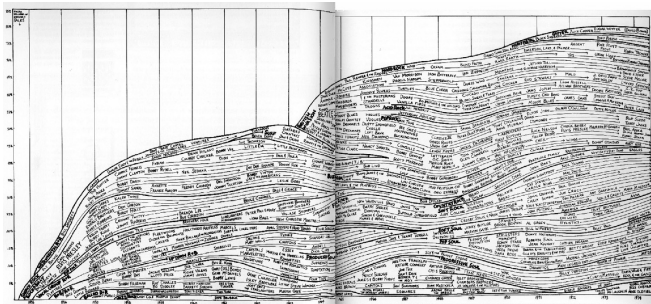
## HOW DO YOU TRACK THE SPREAD OF FLU THROUGHOUT NYC OVER LONG PERIODS OF TIME WHILE SHOWING THE EFFECTS OF VACCINES, MAJOR EVENTS, AND THE WEATHER?



## Beautiful Examples

# Rock and Roll History

- ▶ This graphic was originally designed by Steve Chappel and Reebe Garofalo in *Rock 'N' Roll is Here to Pay: The History and Politics of the Music Industry* (1977)



# Beautiful Examples

- ▶ Hans Rosling's motion bubble chart
- ▶ Rosling's lectures use huge quantities of public data to reveal the story of the world's past, present and future development. Now he tells the story of the world in 200 countries over 200 years using 120,000 numbers - in just four minutes. <http://www.youtube.com/watch?v=jbkSRLYSojo>
- ▶ Play with the similar motion bubble chart on world population for recent 50 years developed by Google :

<https://code.google.com/p/google-motion-charts-with-r/>

- ▶ Economic infographics on US debt 2013 in 100 dollar bills:

<http://demonocracy.info/>



# Trend & Tools

Emerging industry: biochemical, financial industry, etc.

- ▶ FINVIS-Stock screener for investors and traders, financial visualizations.

- ▶ <http://finviz.com/map.ashx?t=sec>

Popular trend: interactive infographics with audience or analyst

- ▶ "Where the Heat and the Thunder Hit Their Shots"(NYT):

<http://www.nytimes.com/interactive/2012/06/11/sports/basketball/nba-shot-analysis.html>

- ▶ How to get the data? NBA player tracking:

<http://stats.nba.com/playerTracking.html>

- ▶ Microsoft Research prototype: Draw your graphics on a touch screen and create your datavis in real time:<http://www.datastorytelling.tv/>

Microsoft-Research-prototype-Draw-your-graphics-on-a-touch-screen-and-create-your-datavis-in-real-time\_a47.html

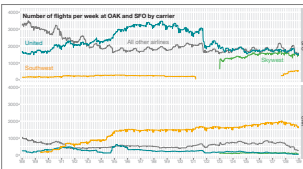
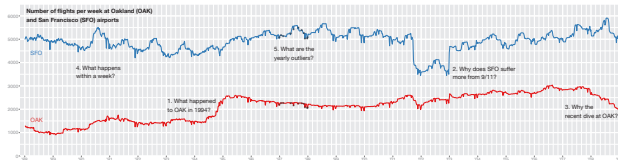
# Trend & Tools

Popular tools: R

## A Tale of Two Airports

AN EXPLORATION OF FLIGHT TRAFFIC AT OAK AND SFO

Charlotte Wickham  
University of California, Berkeley  
cwickham@gmail.com



1. What happened to OAK in 1994?

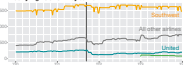
In 1994 Southwest opened a crew base at Oakland. Since then the majority of flights to and from OAK are with Southwest. SFO's largest airline is United. SkyWest is probably operating as United Express. Flights to and from SFO exhibit some seasonality, with more flights during the summer, whereas flights at OAK do not.

2. Why does SFO suffer more from 9/11?

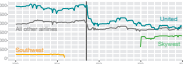
OAK suffers only a small drop (top) in flight numbers after September 11 because Southwest maintains flight volume at OAK. In fact looking across all airports

nationally (bottom) Southwest is the only carrier to maintain flight volume after September 11. United filed for bankruptcy in Dec 2002.

Weekly flights at OAK by carrier



Weekly flights at SFO by carrier



Weekly flights nationally by carrier



3. Why the recent dive at OAK?

Flights from OAK to most destinations decreased in 2008. Shown here are destinations which decrease the most. Denver and Phoenix are interesting because as flights from OAK decreased flights from SFO increased.

Las Vegas



Denver



Los Angeles



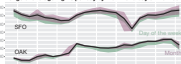
Flights by day of the week



4. What happens within a week?

Early Weekends have fewer flights, especially Saturdays. (Below) At OAK the change in the number of flights within a week has been larger than that between months since about 1995.

Range of average flights per day by month and day of the week



# Trend & Tools

- ▶ Popular tools: **Spotfire Analytics**
- ▶ A business intelligence software that designs, develops and distributes in-memory analytics with interactive visualization;
- ▶ Fastest To Actionable Insight;
- ▶ Visibility Into the Unknown;
- ▶ Self-Service Data Discovery;
- ▶ Universal Adaptability;
- ▶ Feature demo <http://www.youtube.com/watch?v=KoUswm18ZfQ>

# Trend & Tools

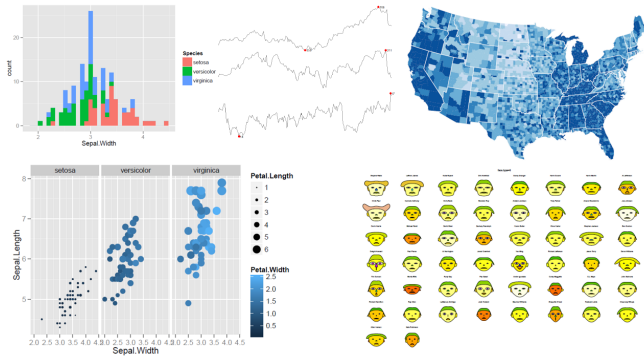
- ▶ Popular tools: **Google APIs**
- ▶ Google Fusion Table API can insert, update, delete and query data programmatically;
- ▶ Visualize the table instantly on a map or as a chart;
- ▶ Can be embed in a web page or blog post;
- ▶ Example: Qing's project on visualizing Sandy's impact in NJ.

# Trend & Tools

- ▶ Popular tools: **D3.js**
- ▶ A JavaScript library for manipulating documents based on data allowing highly efficient exploration on large multi-dimensional database.
- ▶ D3 helps you bring data to life using HTML, SVG and CSS.
- ▶ Example: Where Are House Hunters Searching?

<http://trends.truliablog.com/vis/metro-movers/>

# Course Overview



# Resources:

1. Data visualization course material offered by Hadley Wickham:  
<http://courses.had.co.nz/>
2. "A Tour through the Visualization Zoo" by Jeffrey Heer, Michael Bostock, Vadim Ogievetsky: <http://queue.acm.org/detail.cfm?id=1805128>
3. "Storytelling with maps" from Esri: <http://storymaps.esri.com/home/>
4. "Visualize This: The FlowingData Guide to Design, Visualization, and Statistics": <http://www.amazon.com/gp/product/0470944889/?tag=flowingdata-20>
5. Visual Exploration of Big Spatio-Temporal Urban Data: A Study of New York City Taxi Trips <http://vgc.poly.edu/projects/taxivis/#video>

# What have we learned?

1. The advantages of data visualization.
2. How to develop a data story.
3. Current trends in visualization and emerging industries.
4. Popular tools in developing nice visualization.



# Homework

Read material in the "Resources" slide, and prepare for discussions:

1. Recall Prof. Rosling's motion bubble chart, can you tell us a story from your own perspective?(by region/country/time)
2. Recall the NBA heatmap from New York Time, summarize your takeaways from this chart that might be used to create other visualizations?