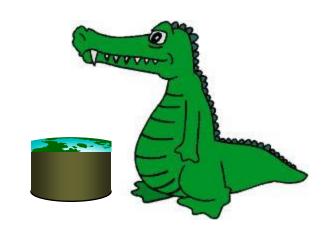
# CAP4770/5771 Introduction to Data Science Fall 2015

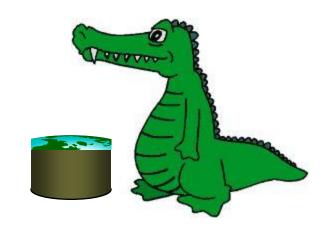
University of Florida, CISE Department Prof. Daisy Zhe Wang



Based on notes from CS194 at UC Berkeley by Michael Franklin, John Canny, and Jeff Hammerbacher

### **Data Science Overview**

Why, Where, What, How, Who





- Data Science -- Why all the excitement?
  - history
  - examples
- Where does data come from?
- What is Data Science?
- How to do Data Science?
- Who are Data Scientists?



### **Data Science – Why all the excitement?**



### Data Analysis Has Been Around for a While...

1935: "The Design of Experiments"

1939: "Quality Control"

1958: "A Business Intelligence System"

R.A. Fisher



W.E. **Deming** 





Peter Luhn

1977: "Exploratory Data Analysis"

1989: "Business Intelligence"



Howard Dresner



1997: "Machine Learning"



2010: "The Data Deluge"

2007: "The Fourth Paradigm"

2009: "The Unreasonable Effectiveness of Data"

1996: Google











### Data Science: Why all the Excitement?





Exciting new effective applications of data analytics

e.g., Google Flu Trends:

Detecting outbreaks two weeks ahead of CDC data

New models are estimating which cities are most at risk for spread of the Ebola virus.

Prediction model is built on Various data sources, types and analysis.



# Why the all the Excitement?

### elections2012

Live results

President

Senate

House

Governor

Choose your

# Numbers nerd Nate Silver's forecasts prove all right on election night

FiveThirtyEight blogger predicted the outcome in all 50 states, assuming Barack Obama's Florida victory is confirmed

#### Luke Harding

guardian.co.uk, Wednesday 7 November 2012 10.45 EST



Predicting political champagne and election Outcome:

the signal and the and the noise and the noise and the noise and the noise and why most noise a predictions fail to but some don't need the noise and the no



# Data and Election 2012 (cont.)

- ...that was just one of several ways that Mr. Obama's campaign operations, some unnoticed by Mr. Romney's aides in Boston, helped save the president's candidacy. In Chicago, the campaign recruited a team of behavioral scientists to build an extraordinarily sophisticated database
- ...that allowed the Obama campaign not only to alter the very nature of the electorate, making it younger and less white, but also to create a portrait of shifting voter allegiances. The power of this operation stunned Mr. Romney's aides on election night, as they saw voters they never even knew existed turn out in places like Osceola County, Fla.
  - -- New York Times, Wed Nov 7, 2012
- The White House Names Dr. DJ Patil as the First U.S. Chief Data Scientist, Feb. 18<sup>th</sup> 2015



# A history of the (Business) Internet: 1997

BackRub Search; university

university Search

### BackRub Query Results

BackRub's Highest Ranked Sites

University of Illinois at Urbana-Champaign

http://www.uiuc.edu/ 694.687 8460 backlinks\_12k - 10/25/96 - 11/1/96

Stanford University Homepage http://www.stanford.edu/

609.303 8857 backlinks 4k - none - 11/1/96

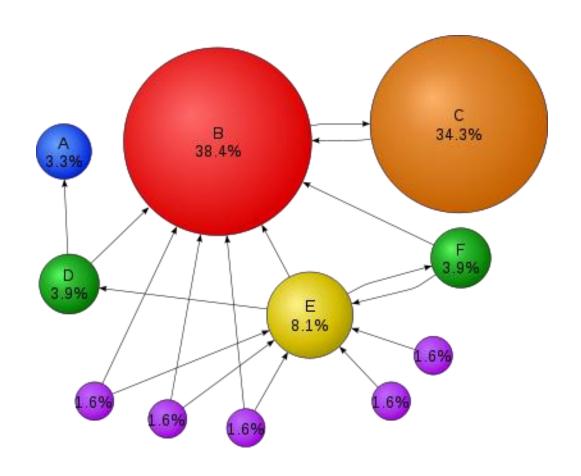
Stanford University: Portfolio Collection

http://www.stanford.edu/home/administration/portfolio.html

167.919 34 backlinks



## PageRank: The web as a behavioral dataset





# Sponsored search



gatco towel bars

Search

Advanced Search

Sponsored Links

Web Show options...

Results 1 - 10 of about 661,000 for gatco towel bars. (0.33 seconds)

#### Gatco Towel Bars

www.eFaucets.com/Gatco Low Price Guarantee, Free Shipping, 110% Price Match, No Tax, Shop Now! Google Checkout

#### Gatco Towel Bars

www.AmericanHomePlus.com/Gatco 110% Low Price Guarantee. Buy Now. Free Shipping On Gatco Accessories.

#### Gatco Towel Bars

www.PlumberSurplus.com Free S/H Available, Large Selection Gatco Towel Bars, ready to ship! Google Checkout

#### Gatco Towel bars, Gatco toilet paper holders, Gatco Bathroom ...

Gatco Towel bars. Gatco toilet paper holders. Gatco Bathroom Accessories. Gatco robe hooks. Gatco bathroom shelves. Gatco hotel shelves. Gatco double towel ... www.kitchensnbath.com/qatco-bath-accessories.html - Cached - Similar - 🗇 🗐 🗵

#### Discount Towel Bars, Towel Bars, Towel Racks

Discount Towel Bars offers only the highest quality bath hardware. We are factory direct distributors for Moen, Baldwin, Dynasty Hardware and Gatco. ... www.discounttowelbars.com/ - Cached - Similar - P A

#### Gatco at Lowe's: 24" Franciscan Chrome Double Towel Bar

24" Franciscan Chrome Double Towel Bar - 69656 5286. www.lowes.com/lowes/lkn?action=productDetail... - Cached - Similar - 🗩 🖹 🔀

#### Shopping results for gatco towel bars



#### Sponsored Links



Gatco Bleu 18 in. Towel Bar - Polished Chrome

\$39.99 - Sears



Gatco Spa Towel Rack, 3 Tier - Satin Nickel \$94.99 - Sears



Gatco Chenille 18 in. Towel Bar - Vintage ... \$44.99 - Sears

#### Gatco Bath Accessories

Lowest prices. All Gatco collections www.TheHomeDecor.net

#### Towel Bars on Sale

Save 20%-50% Off List- New Styles Lowest Prices + Free Shipping! www.FixtureUniverse.com Corole Checkout



# Sponsored search

- Google revenue around \$50 bn/year from marketing, 97% of the companies revenue.
- Sponsored search uses an auction a pure competition for marketers trying to win access to consumers.
- In other words, a competition for models of consumers

   their likelihood of responding to the ad and of determining the right bid for the item.
- There are around 30 billion search requests a month. Perhaps a trillion events of history between search providers.
- Google Adwords and Adsense





# Other Data Science Applications

- Transaction Databases → Recommender systems (NetFlix), Fraud Detection (Security and Privacy)
- Wireless Sensor Data → Smart Home, Real-time Monitoring, Internet of Things
- Text Data, Social Media Data → Product Review and Consumer Satisfaction (Facebook, Twitter, LinkedIn), Ediscovery
- Software Log Data → Automatic Trouble Shooting (Splunk)
- Genotype and Phenotype Data → Epic, 23andme, Patient-Centered Care, Personalized Medicine



### Where does data come from?



# "Big Data" Sources

### It's All Happening Online



Every:
Click
Ad impression
Billing event
Fast Forward, pause,...
Server request
Transaction
Network message
Fault

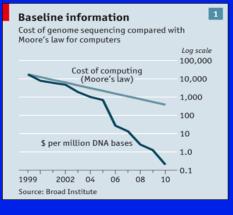
...

# Internet of Things / M2M





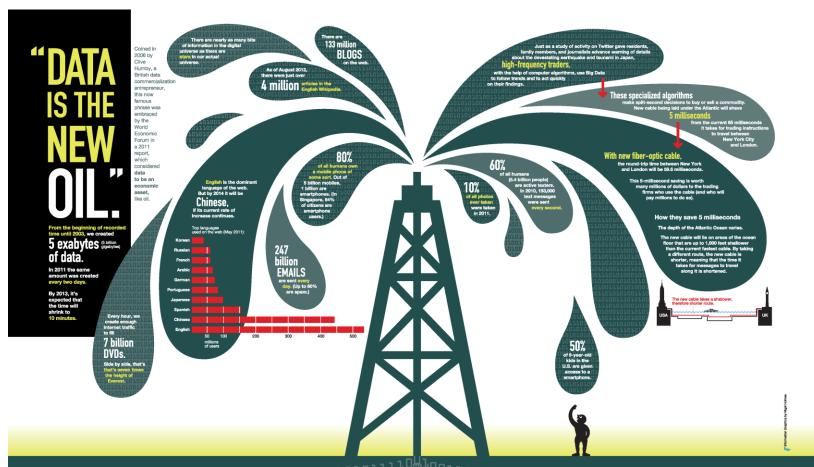






# "Data is the New Oil"

### – World Economic Forum 2011



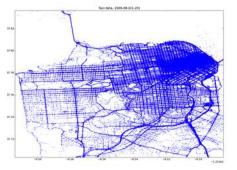


- Raw Data: Volume
- Change over time: Velocity
- Data types: Variety
- Data Quality: Veracity
- Information for Decision Making: Value



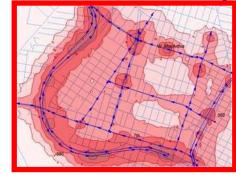
What can you do with the data?

Traffic Prediction and Earthquake Warning



Petrola#





Crowdsourcing

+ physical modeling

+ sensing

+ data assimilation

### to produce:







From Alex Bayen, UCB, Director, Institute for Transportation Studies



### **What is Data Science?**



# "Data Science" an Emerging Field



O'Reilly Radar report, 2011



# Data Science – A Definition

**Data Science** is the science which uses computer science, statistics and machine learning, visualization and human-computer interactions to collect, clean, integrate, analyze, visualize, interact with data to create data products.

Turn data into data products.



Some recent ML Competitions at

https://www.kaggle.c om/

NIST Pre-Pilot Data Science Evaluation – likely to be incorporated to be part of Labs/Final project

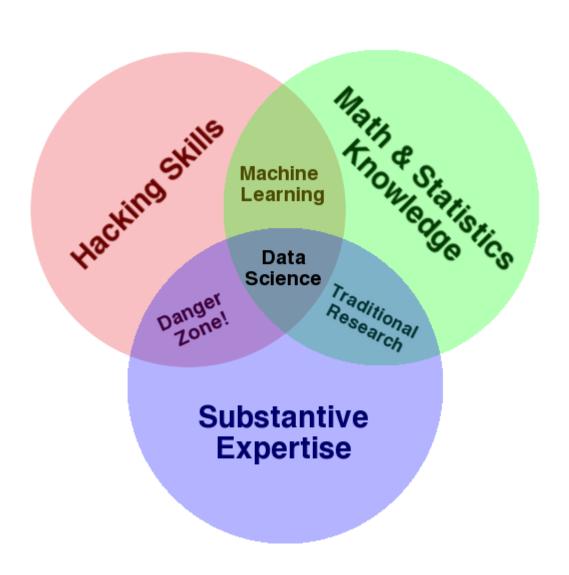
#### kaggle **Active Competitions** Flight Quest 2: Flight Optimization 33 days Coming Final Phase of Flight Quest 2 soon \$220,000 Packing Santa's Sleigh 5.8 days 338 teams He's making a list, checking it twice; to fill up his sleigh, he needs \$10,000 your advice Flu Forecasting 41 days Genentech 37 teams Predict when, where and how strong the flu will be Galaxy Zoo - The Galaxy Challenge 2 months 160 teams Classify the morphologies of distant galaxies in our Universe \$16,000 Loan Default Prediction - Imperial College Lon... 52 days 82 teams Constructing an optimal portfolio of loans \$10,000 Dogs vs. Cats 11 days 166 teams

Create an algorithm to distinguish dogs from cats

Swag



# Data Science – A Visual Definition



# Contrast: Databases

Databases	<b>Data Science</b>
"Precious"	"Cheap"
Modest	Massive
Bank records, Personnel records, Census, Medical records	Online clicks, GPS logs, Tweets, Building sensor readings
Consistency, Error recovery, Auditability	Speed, Availability, Query richness
Strongly (Schema)	Weakly or none (Text)
Transactions, ACID*	CAP* theorem (2/3), eventual consistency
SQL	NoSQL: MongoDB, CouchDB, Hbase, Cassandra, Riak, Memcached,
lation and Durability	Apache River,
	"Precious"  Modest  Bank records, Personnel records, Census, Medical records  Consistency, Error recovery, Auditability  Strongly (Schema)  Transactions, ACID*

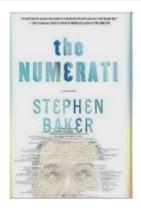
CAP = Consistency, Availability, Partition Tolerance

ACID =

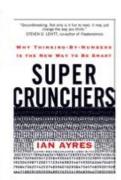


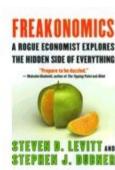
### Contrast: Business Intelligence

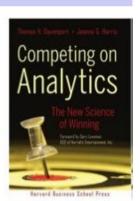
Business Intelligence	Data Science
Querying the past	Querying the past present and future













### Contrast: Machine Learning

### **Machine Learning**

Develop new (individual) models

Prove mathematical properties of models

Improve/validate on a few, relatively clean, small datasets

Publish a paper

### **Data Science**

Explore many models, build and tune hybrids

Understand empirical properties of models

Develop/use tools that can handle massive datasets

Take action!