

Technology Fundamentals for Analytics

Jason Kuruzovich

Overview

- Introductions
- Let's Get Excited about Data Science
- What do Data Scientists Do?
- Course Syllabus
- Lab 1. Development Environment

Next Startup Tech Valley Event is
September 2 at 5:30 at Brown's
Revolution Hall

See more at [www.startuptechvalley.](http://www.startuptechvalley.org)
[org](http://www.startuptechvalley.org)

Me

- Director of the Severino Center for Technological Entrepreneurship
- Associate Professor of Business Analytics
- Research on online markets and entrepreneurship



You

- What is your background?
- What are you looking for out of this class/program?
- What type of job do you want?
- What are your hobbies?

There have been profound changes in
technology and the information
processes define our society

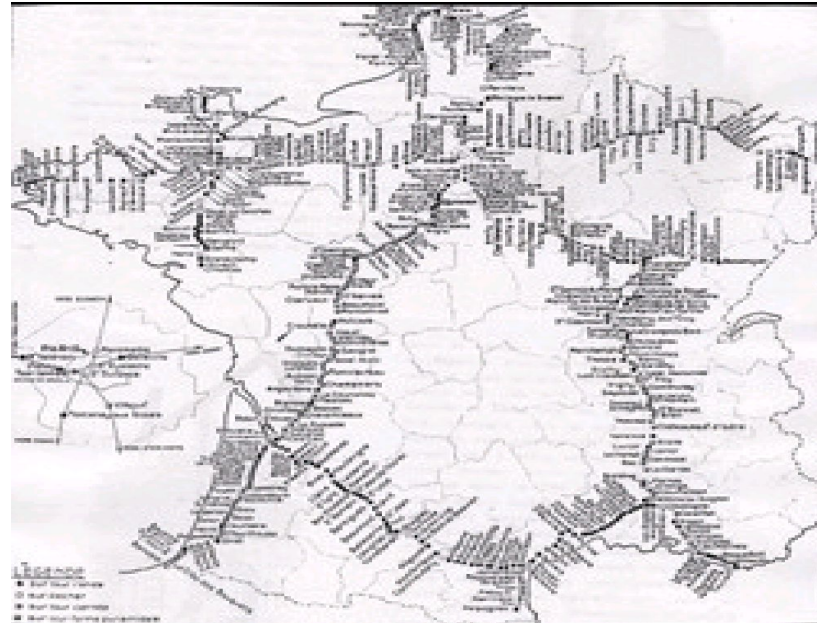
Internet 0.1 beta (18th Century)



Internet 0.1 Beta (18th Century)

Chain of towers or
optical telegraph capable
of transmitting 1-3
symbols per min

Towers 5-20 KM apart



“We create as much information in two days now as we did from the dawn of man through 2003.”

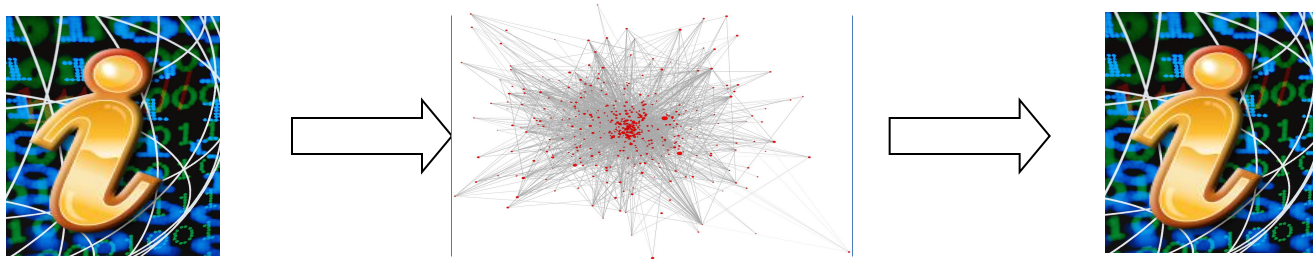
-Eric Schmidt, Former CEO of Google

Information Economy

TRADITIONAL PRODUCTION PROCESS



INFORMATION BASED BUSINESS PROCESS



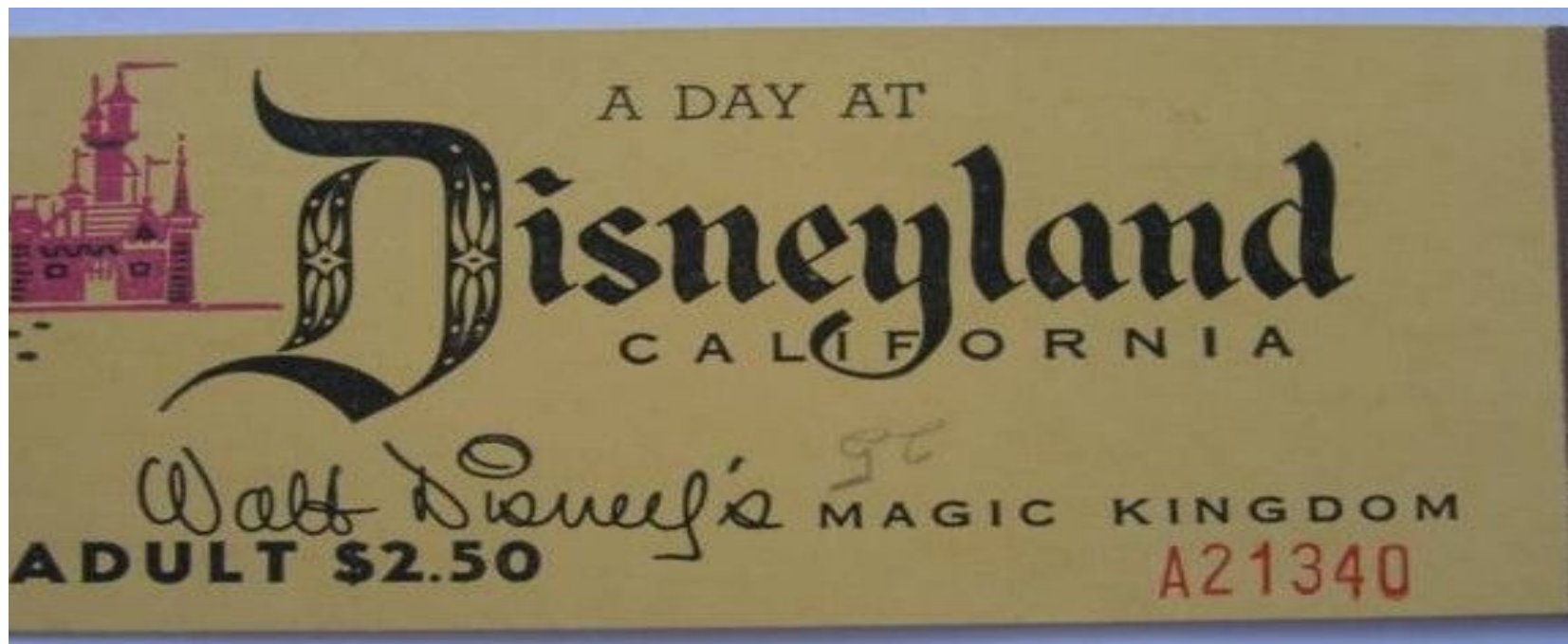
INFORMATION TECHNOLOGY

What is driving the growth of
information and data?

Consider the evolution of a
company like Disney...

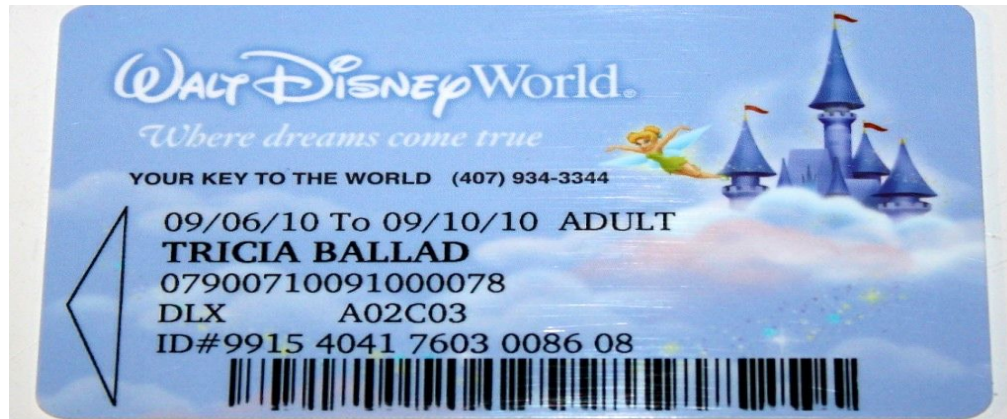
Disney

ROLE OF DATA: How many tickets did we sell?



Disney – Data Warehouse Stage

ROLE OF DATA: How much did our customers spend? How can we understand different customer types?



Disney – Big Data

ROLE OF DATA: What path did customers take through the park, when did they leave? How long did they stand in line? When did they spend money on souvenirs and where? How often did they go to the bathroom and did they have to wait? How long did they spend at dinner in the Mexican pavilion compared with the German pavilion? How does the speed of entry correlate with tipping behavior?



Electronic Commerce



- TRADITIONAL SHOPPING
- TRAFFIC AND POS DATA

amazon Prime

All Departments espresso machine

Shop by Department Jason's Amazon.com Today's Deals Gift Cards Sell Hello, Jason Your Account Your Prime Wish List

1-24 of 5,593 results for Home & Kitchen : Kitchen & Dining : Coffee, Tea & Espresso : "espresso machine" Sort by Relevance

Show results for

Any Category Home & Kitchen Kitchen & Dining Coffee, Tea & Espresso Espresso Machines (1,096) Super-Automatic Espresso Machines (220) Semi-Automatic Espresso Machines (243) Steam Espresso Machines (110) Stovetop Espresso Pots (622) Espresso Machine & CoffeeMaker Combos (556) Coffee (1,288) Coffee & Espresso Machine Parts & Accessories (1,417) Tamper (67) Coffee & Espresso Machine Cleaning Products (383)

Refine by Subscribe & Save Subscribe & Save Eligible (67) Amazon Prime Prime

Showing results in Home & Kitchen. Show instead results in All Departments. Related Searches: coffee grinder, coffee maker, espresso maker.

De'Longhi EC155 15 BAR Pump Espresso and Cappuccino Maker by De'Longhi

\$94.08 \$140.00 **Prime** Get it by **Monday, Aug 31**

More Buying Choices **\$82.95** new (40 offers) **\$49.99** used (8 offers)

#1 Best Seller in Semi-Automatic Espresso Machines

★★★★☆ ~ 3,692

Mr. Coffee ECM160 4-Cup Steam Espresso Machine, Black by Mr. Coffee

\$39.99 \$88.03 **Prime** Get it by **Monday, Aug 31**

More Buying Choices **\$39.99** new (20 offers) **\$32.00** used (4 offers)

★★★★☆ ~ 1,170

KRUPS XP1000 Steam Machine with Frothing Cappuccino, Black by KRUPS

\$59.95 \$99.99 **Prime** Get it by **Monday, Aug 31**

More Buying Choices **\$39.99** new (29 offers) **\$44.44** used (1 offer)

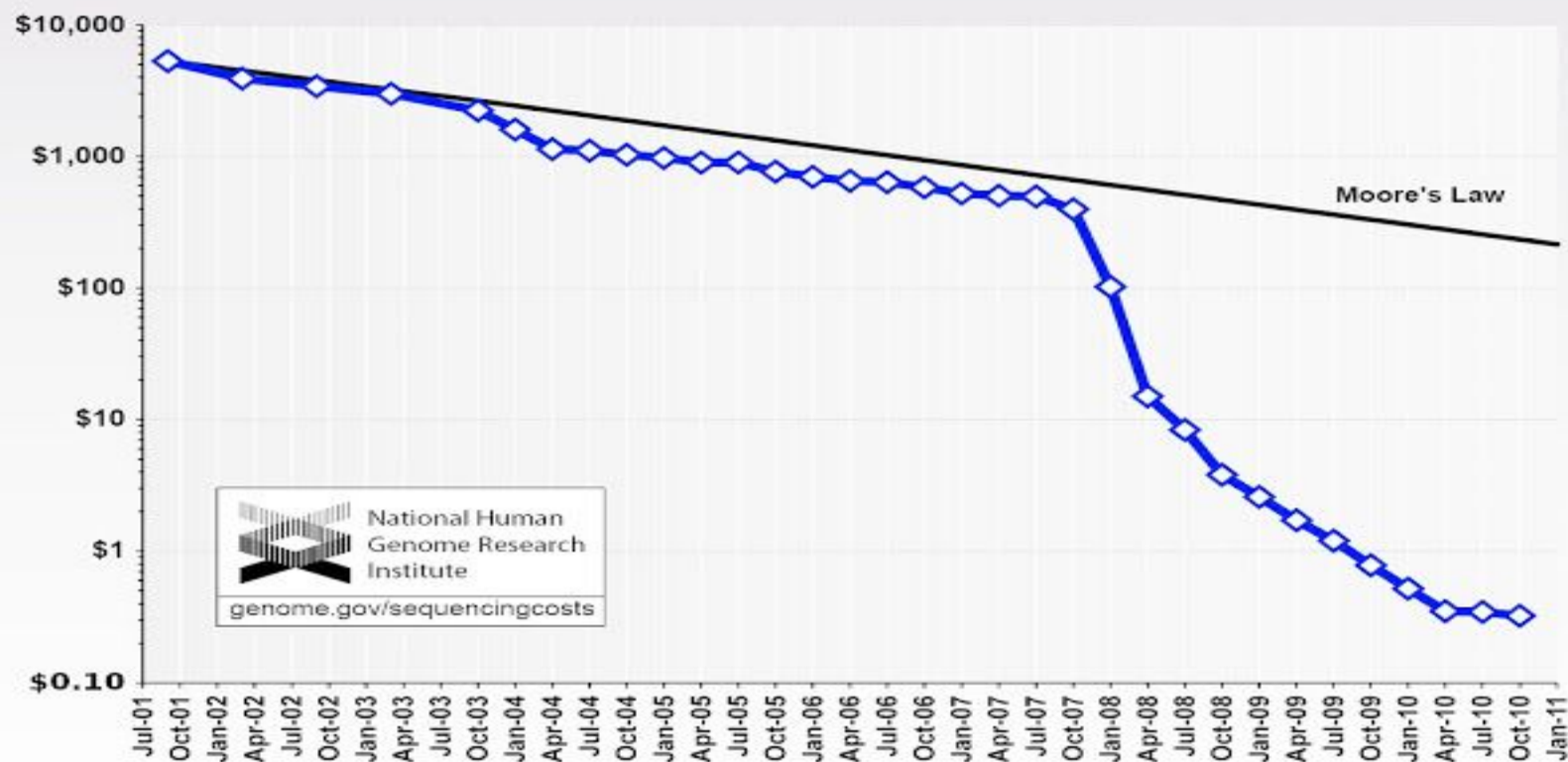
★★★★☆ ~ 357

- EVERY CLICK
- HISTORICAL PURCHASE
- REMARKETING

What if the online and offline
merge?

<https://youtu.be/uiDMLFycNrww>

Cost per Megabase of DNA Sequence



Big Data and Astronomy



The Murchison Widefield Array is the first Square Kilometre Array precursor to enter full operations, generating a vast torrent of information that needs to be stored for later retrieval by researchers.

<http://www.skatelescope.org/news/pawsey-centre/>

“To store the Big Data the MWA produces, you’d need almost three 1 TB hard drives every two hours”

Social Media

The Facebook Social Network



Facebook

- 300 Petabyte Data warehouse
- 500+ Terabytes new data each day

<http://www.adweek.com/socialtimes/orcfile/434041>

Online Video

YouTube

- 60 hours of video per minute
- 4 billion views per day
- 800 million unique users

<http://www.jeffbullas.com/2012/05/23/35-mind-numbing-youtube-facts-figures-and-statistics-infographic/#LhtL2qC4Mfj83EBD.99>

Search

Google Flu Trends

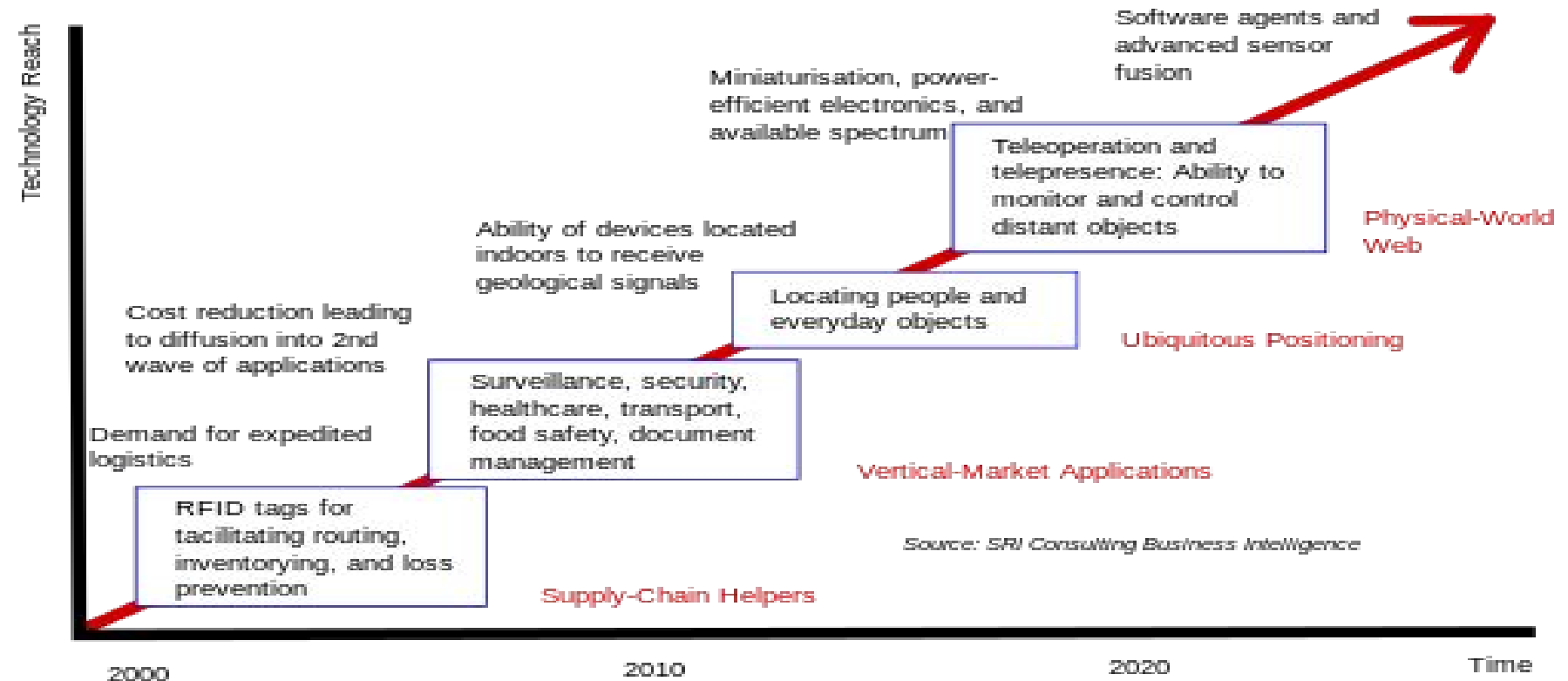
How Google Flu Trends Works



<http://www.google.org/flutrends/about/how.html>

Internet of Things

Technology roadmap: The Internet of Things



https://commons.wikimedia.org/wiki/File%3AInternet_of_Things.svg

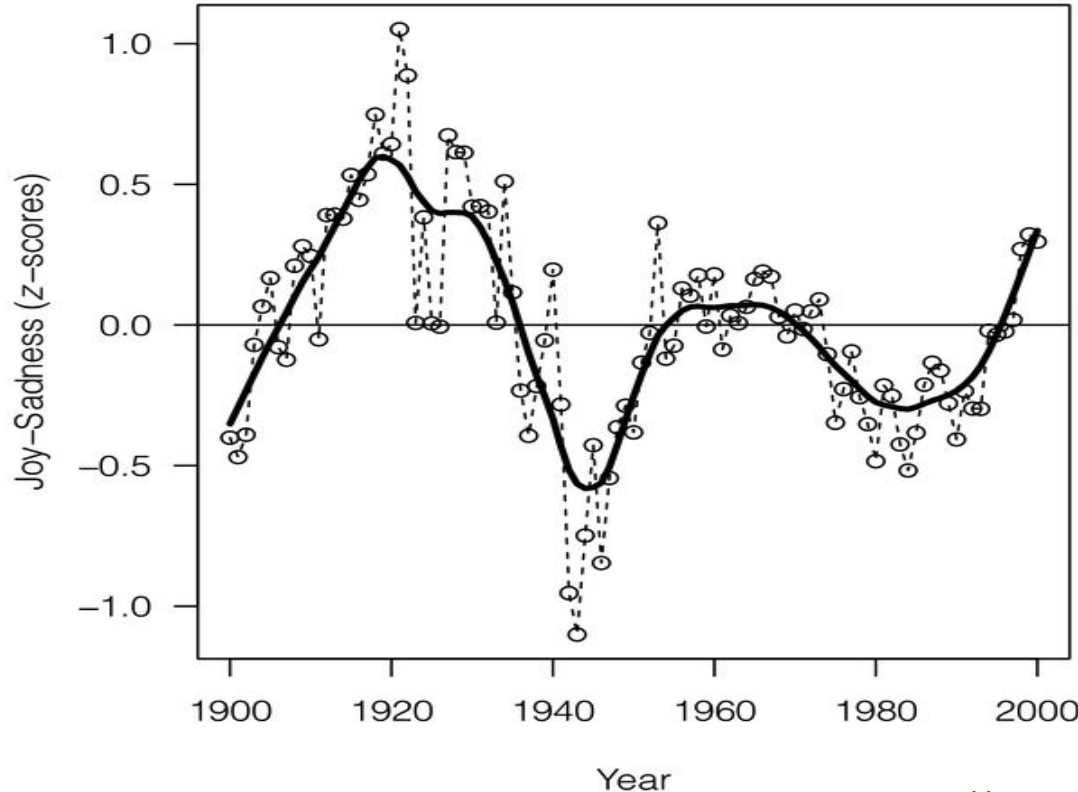
By SRI Consulting Business Intelligence/National Intelligence Council [Public domain], via Wikimedia Commons

Each day GE gathers “50 million pieces of data from 10 million sensors, off equipment worth \$1 trillion.”



Almost the entire corpus of
literature is now digital...

The Expression of Emotions in 20th Century Books



“using the data set provided by Google that includes word frequencies in roughly 4% of all books published up to the year 2008. We find evidence for distinct historical periods of positive and negative

Source: <http://www.plosone.org/article/info:doi/10.1371/journal.pone.0059030>

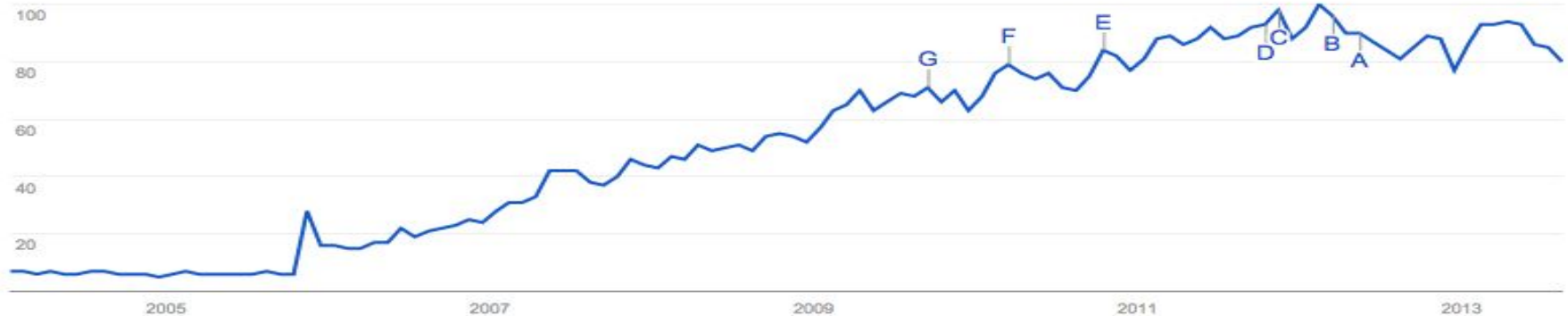
What do we mean by “Analytics”?

(Term Frequency in News)

Interest over time ?

The number 100 represents the peak search interest

☒ News headlines ☐ Forecast ?



Embed

Source: <http://www.google.com/trends/explore?q=analytics#q=analytics&cmpt=q>

What do we mean by “Analytics”?

Analytics as Data Apps

- The web is full of “data-driven apps.”

“The thread that ties most of these applications together is that data collected from users provides added value. Whether that data is search terms, voice samples, or product reviews, the users are in a feedback loop in which they contribute to the products they use. That’s the beginning of data science.”

Prediction is a Great
Business Model!
Even if it doesn't
use analytics!!!



Predict Who is Going to Be a Good Hire



 Sign in |  Join Newsletter |  Search

Follow us:



PRODUCTS

DEMOS

ABOUT US

THOUGHT LEADERSHIP

SUPPORT

CONTACT

Predictive Talent Selection™ Technology Driving Business Results.



Predictive Reference Checking

Using Online Reference Checking to Take a Data-Driven Approach to Your Hiring Process.

DOWNLOAD NEW EBOOK

Predict the Best Type/Time of Post



The image shows a promotional graphic for Cortex, an artificial intelligence tool for social media marketing. The background is a blue-tinted office scene with people working at computers. In the center, a computer monitor displays the Cortex web application interface. The interface includes a sidebar with navigation options like Dashboard, Campaigns, Reports, and Settings. The main content area shows a calendar view for 'The Ritz-Carlton Hotel Company (GMT -5)' with a 14-day forecast. Each day has a 'Recommended Post/Week' section with a dropdown menu. A yellow button at the bottom of the monitor asks 'What Can Cortex Do For You?'. In the top right corner of the blue overlay, there is a 'SIGN IN' link.

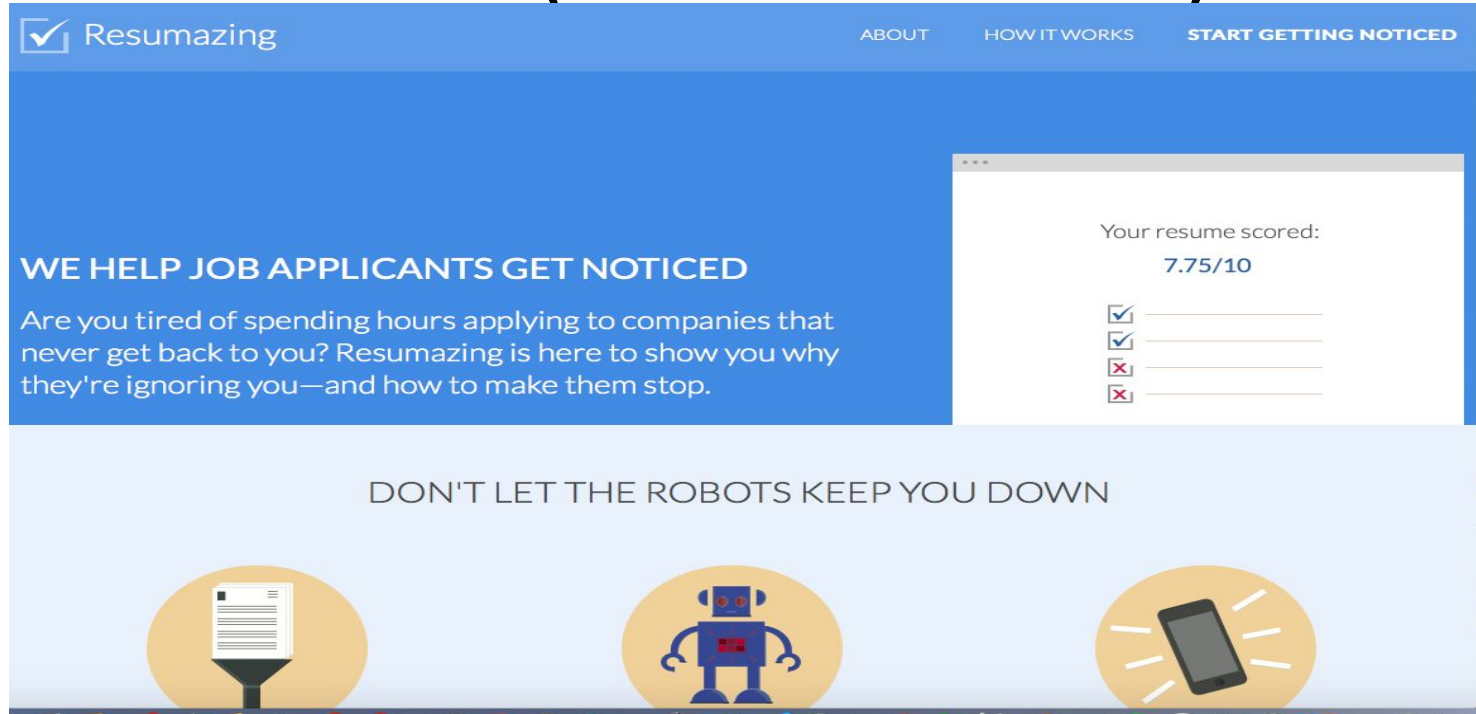
CORTEX
Artificial Intelligence for
Social Media Marketing

SIGN IN

What Can Cortex Do For You?

www.meetcortex.com

Predict what Terms Can Help Get You Hired (RPI STARTUP!!)

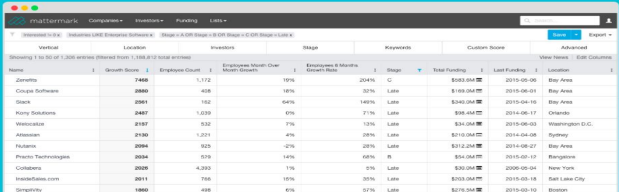


www.resumazing.net

PRODUCTS + PRICING ABOUT + BLOG SIGN IN SIGN UP

Data-Driven Deal Making

Prospect the world's fastest-growing companies. [START NOW](#)



Vertical	Location	Investors	Stage	Keywords	Custom Score	Adjusted
Showing 1 to 30 of 1,000+ entries (filtered from 1,000 at 10 total entries)						
Vertical	Location	Investors	Stage	Keywords	Custom Score	Adjusted
Cloud	San Francisco	1,172	100%	204%	C	\$100,000
Cloud Software	2000	458	10%	37%	Later	\$100,000
Cloud	2000	162	60%	140%	Later	\$100,000
Cloud Solutions	2000	1,039	6%	71%	Later	\$100,000
Web Services	2107	532	7%	13%	Later	\$100,000
Web Services	2100	1,201	4%	28%	Later	\$100,000
Web Services	2000	525	2%	20%	Later	\$100,000
Web Services	2000	519	14%	65%	R	\$100,000
Cloud	2000	4,293	1%	5%	Later	\$100,000
Cloud	2011	765	10%	30%	Later	\$100,000
Cloud	1900	498	6%	57%	Later	\$100,000

Track Company Growth
<http://mattermark.com>

TL TAPLYTICS Features + Plans Docs Blog More + [Sign Up](#) [Log In](#)

Mobile optimization made simple

Most advanced, fully integrated mobile A/B testing, push notification and analytics platform

[Learn more](#) [Get Started](#)

A/B Testing for Mobile Apps
<https://taplytics.com>

FRAMED PRICING ENTERPRISE BLOG LOGIN

Get the insights you need to stop customer churn.

Framed uses machine learning to analyze your analytics and tell you which customers are about to buy or abandon your product. Sign up today to find out how.

[SHOW ME WHICH CUSTOMERS ARE ABOUT TO CHURN!](#)

Find which Customers Will Churn
<http://framed.io>

SEGMENTIFY Solution How it Works Features Pricing Contact Login

DESIGN REAL TIME PERSONALIZED CAMPAIGNS IN MINUTES

[FEATURES](#) [TRY NOW](#)

CLOUD BASED SERVICES CAMPAIGN TEMPLATES 5 MINUTES INTEGRATION

Segment Customers
<http://www.segmentify.com>



Predict the players who are the
best value...

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

Predict Where to Advertise

- “The 2012 campaign took advantage of advanced set-top-box monitoring technology to figure out what shows the voters they wanted to reach were watching and when, resulting in a smarter and cheaper — if potentially more invasive — way to beam commercials into their homes. The system gave Obama a significant advantage over Mitt Romney, according to Democrats and many Republicans (at least those who were not on Romney’s media team).”

Source:

http://www.nytimes.com/2013/06/23/magazine/the-obama-campaigns-digital-masterminds-cash-in.html?pagewanted=all&_r=0

“Analytics is the discovery and communication of meaningful patterns in data.”

-Wikipedia

The goal of this course will be to provide the **technical foundation** to enable students to become **data scientists**.

What do “Data Scientists” do?



Data Scientist

- “A data scientist is someone who can obtain, scrub, explore, model and interpret data, blending hacking, statistics and machine learning. Data scientists not only are adept at working with data, but appreciate data itself as a first-class product.”
 - Hilary Mason, chief scientist at bit.ly

Data Scientist

Data science requires skills ranging from traditional computer science to mathematics to art. Describing the data science group he put together at Facebook (possibly the first data science group at a consumer-oriented web property), Jeff Hammerbacher said:

“... on any given day, a team member could author a multistage processing pipeline in Python, design a hypothesis test, perform a regression analysis over data samples with R, design and implement an algorithm for some data-intensive product or service in Hadoop, or communicate the results of our analyses to other members of the organization.”

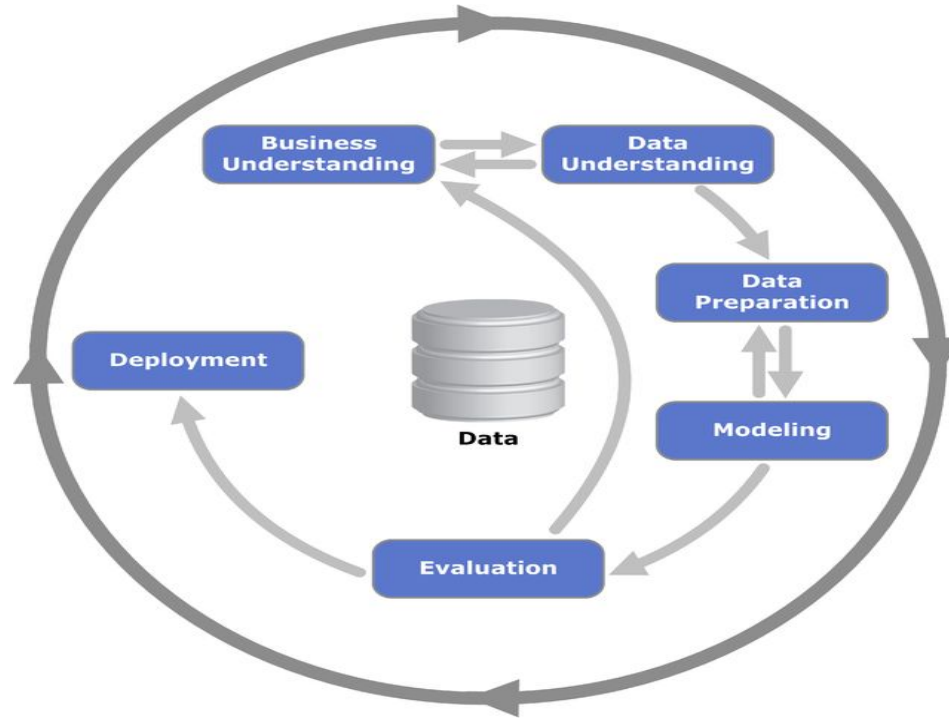
“Analytics is the discovery and communication of meaningful patterns in data.”

-Wikipedia

Data scientists do **analytics**.

Well...how do you “do analytics”?

THE CRISP-DM PROCESS MODEL



Cross Industry Standard Process for Data Mining

https://en.wikipedia.org/wiki/Cross_Industry_Standard_Process_for_Data_Mining

Business Understanding

- Project objectives and requirements
 - Are we trying to *predict* or *understand*?
 - Do we want to reduce churn, segment customers, A/B test designs...etc.
- Converting knowledge into a data mining problem definition and a preliminary plan
 - What data is needed/accessible?

Data Understanding

- Data properties, type, distribution,
 - Understand data
- Data quality
 - Are there issues with the data? Is it as we would expect?

Visualization can be your
friend for data understanding

Data Preparation

- Clean data
 - Missing values? Outliers?
- Match data from different sources
 - Common key? If not can we match text fields.
- Feature creation
 - Does data need to be processed to enable new insights?
- Aggregate, sample and subset
 - Do we want to do analysis on entire dataset, an aggregation?

Modeling

- Feature selection
 - Which of the identified features should be included in the model
- Splitting (fold) data
 - How should data be split to train the algorithm
- Algorithm selection and tuning
 - What algorithm should be used and what parameters set

Evaluation

- Statistical output (Understanding)
 - What data are meaningful in predicting the variable of interest
- Prediction
 - How well does the data predict the desired outcome in the training and test datasets

Deployment

- Implement prediction in a business process or in an application
 - Product recommendation
 - Job applicant
 - Customer segmentation

Data Analytics in the Wild

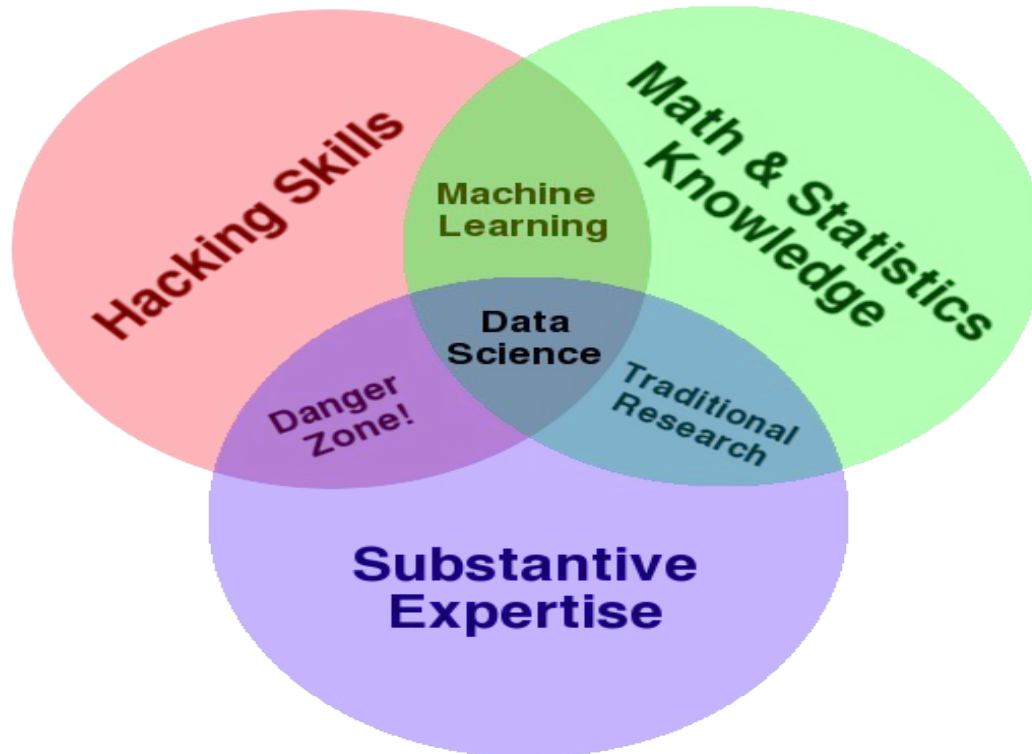
In a small group of 3-4, quickly discuss what you select for the data analytics in the wild assignment

Then go through the process (at a high level) for business understanding (and even a bit of data understanding) for the most interesting one in the group

Be prepared to report back to the class (~1 minute)

What skills are needed as a data scientist?

Data Science Venn Diagram



Source: <http://drewconway.com/zia/2013/3/26/the-data-science-venn-diagram>

Key Tools of the Data Scientist

- Data Munging - parsing, scraping, and formatting data
- Statistics - traditional analysis you're used to thinking about
- Visualization - graphs, tools, etc.

8 Skills to Get You Hired as a Data Scientist

1. Basic Tools
2. Basic Statistics
3. Machine Learning
4. Multivariable Calculus and Linear Algebra
5. Data Munging
6. Data Visualization & Communication
7. Software Engineering
8. Thinking Like A Data Scientist

Abstractions vs Tools

- *Abstractions* of data science
 - Matrices and linear algebra
 - Relations and relational algebra
 - MapReduce
 - Feature selection in Visualization
- Tools
 - Python
 - R
 - SAS
 - SQL/MySQL
 - Hadoop (MapReduce)
 - Tableau (Visualization)

Syllabus and Lab