

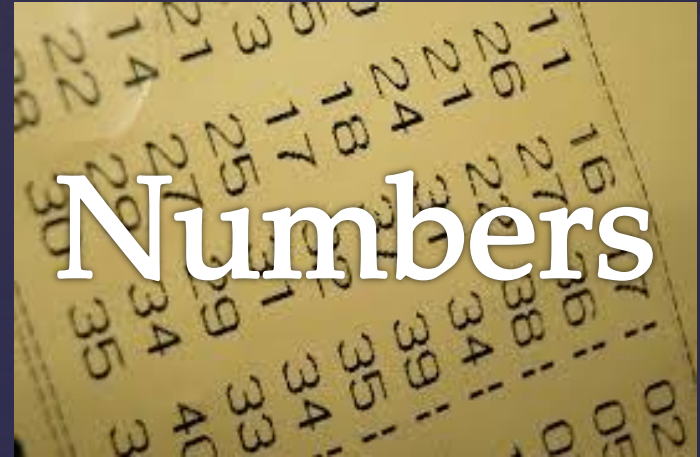
# What is Data Science?

{ Girl Develop It! Meetup  
{ Renée M. P. Teate, March 2015

# Let's start with: "What is Data?"



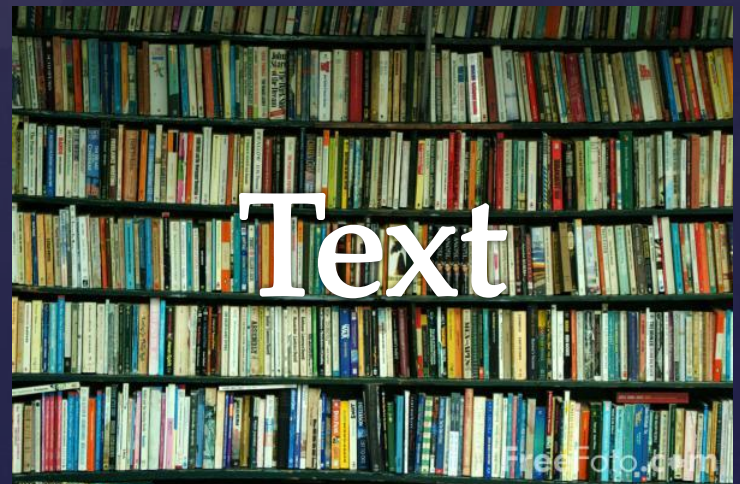
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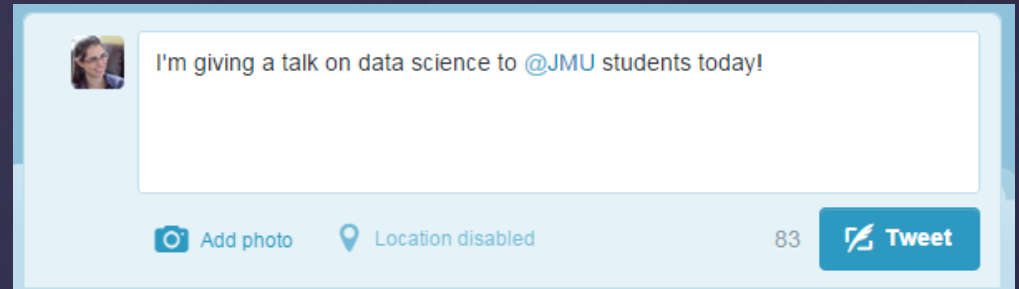


[http://www.freefoto.com/images/1351/06/1351\\_06\\_2--Books--Shakespeare-and-Company-Bookstore--The-Latin-Quarter--Paris\\_web.jpg](http://www.freefoto.com/images/1351/06/1351_06_2--Books--Shakespeare-and-Company-Bookstore--The-Latin-Quarter--Paris_web.jpg)

# Created & Collected



[http://upload.wikimedia.org/wikipedia/commons/9/96/Bill\\_Nye,\\_Barack\\_Obama\\_and\\_Neil\\_deGrasse\\_Tyson\\_selfie\\_2014.jpg](http://upload.wikimedia.org/wikipedia/commons/9/96/Bill_Nye,_Barack_Obama_and_Neil_deGrasse_Tyson_selfie_2014.jpg)



[http://upload.wikimedia.org/wikipedia/commons/e/e4/Green\\_Bank\\_100m\\_diameter\\_Radio\\_Telescope.jpg](http://upload.wikimedia.org/wikipedia/commons/e/e4/Green_Bank_100m_diameter_Radio_Telescope.jpg)



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© NSW DPI

- ⌘ Around **100 hours of video** are uploaded to YouTube **every minute**
  - ⌘ it would take about 15 years to watch every video uploaded in one day
- ⌘ AT&T is thought to hold the world's largest volume of data in one unique database – its **phone records** database is 312 terabytes in size, and contains almost **2 trillion** rows.
- ⌘ **Every minute** we send 204,000,000 emails, generate 1,800,000 Facebook likes, send 278,000 Tweets, and up-load 200,000 photos to Facebook
- ⌘ 570 new websites spring into existence every minute of every day.

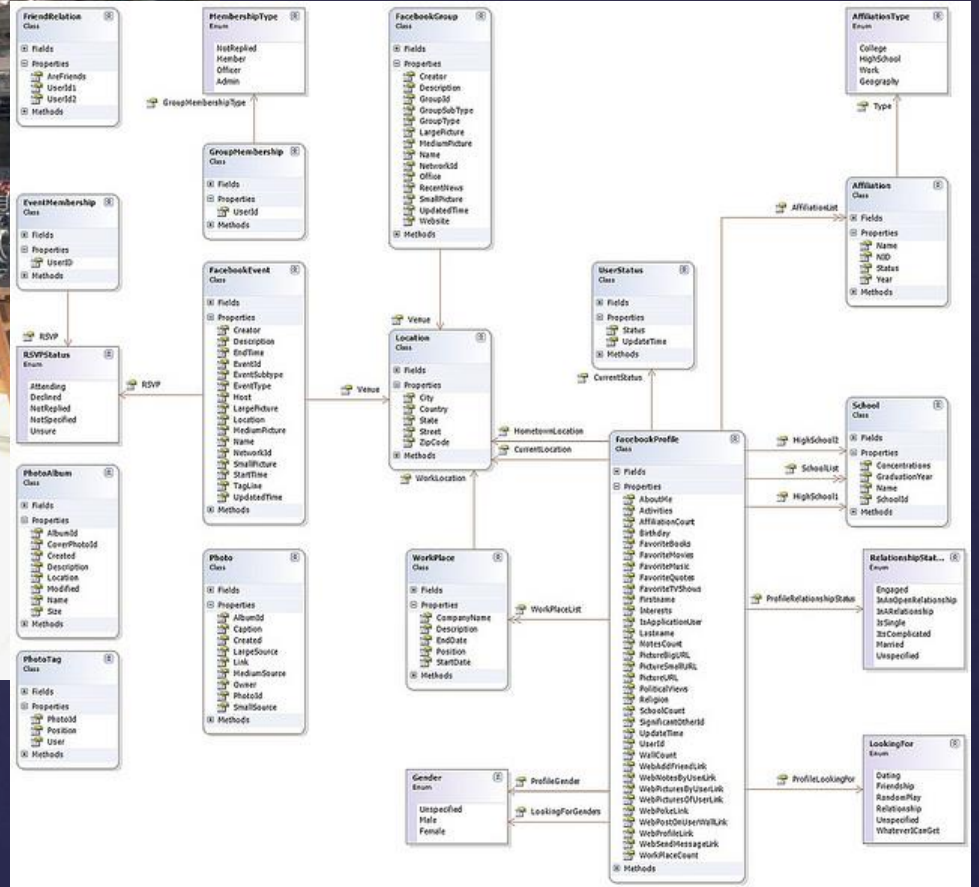
<http://smartdatacollective.com/bernardmarr/277731/big-data-25-facts-everyone-needs-know>

# “Big Data”

# Stored & Related



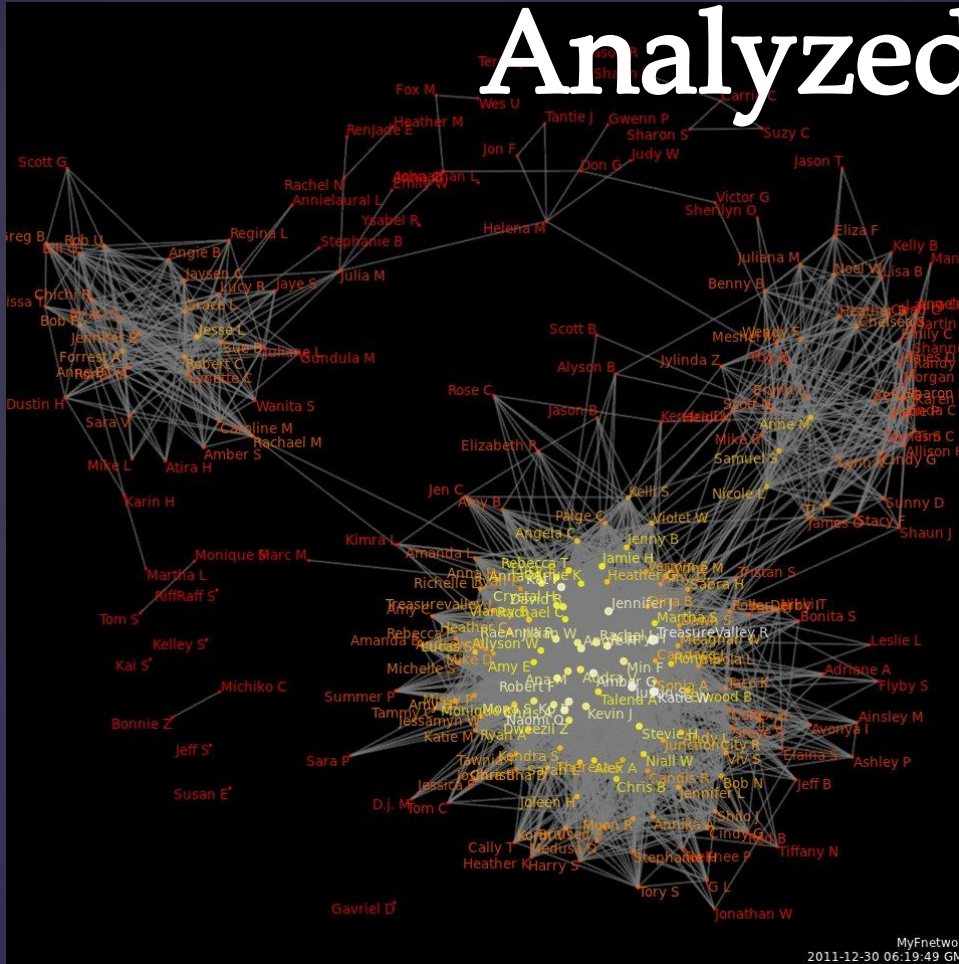
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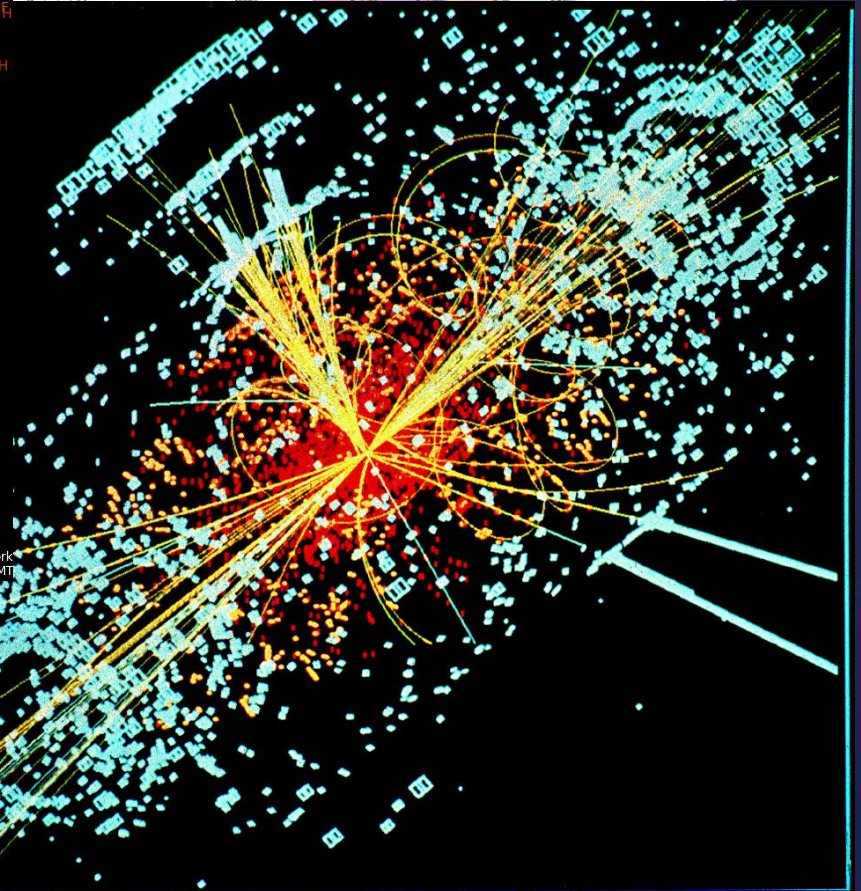
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# Analyzed and Visualized

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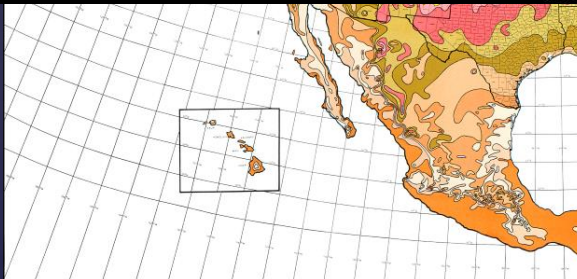


Matts Total	Totals	Items	Cost	Paid	To Pay	Date to pay
£ 2,100	£ 3,300	Wedding	£ 3,300	£ 3,300	£ 0	Paid
£ 2,000	£ 4,200	Food/drink	£ 2,511	£ 2,511	£ 0	Paid
£ 3,100	£ 5,300	Food/drink	£ 3,180	£ 3,180	£ 0	Paid
£ 3,100	£ 5,100	Flora	£ 3,000	£ 3,000	£ 0	Paid
£ 3,900	£ 8,300	Wine + pre drinks	£ 451	£ 451	£ 0	Paid
£ 5,550	£ 8,750	Champagne	£ 139	£ 139	£ 0	Paid
£ 3,650	£ 8,650	Dress	£ 250	£ 250	£ 0	Paid
£ 8,000	£ 8,950	Flowers + Bridesmaids	£ 380	£ 330	£ 50	Paid
£ 8,700	£ 9,650	Shoes + Accessories	£ 300	£ 300	£ 0	Paid
£ 8,200	£ 9,650	Other clothes	£ 382	£ 382	£ 0	Paid
		Tux	£ 500	£ 325	£ 175	Paid
		2 Brides	£ 850	£ 850	£ 0	Paid
		Wedding	£ 150	£ 150	£ 0	Paid
		Gifts	£ 400	£ 400	£ 0	Paid
		Other	£ 80	£ 80	£ 0	Paid



MyNetwork  
2011-12-30 06:19:49 GMT

<http://upload.wikimedia.org/wikipedia/commons/9/90/Ke ncf0618FacebookNetwork.jpg>



[http://upload.wikimedia.org/wikipedia/commons/b/bf/USDA\\_Hardiness\\_zone\\_map.jpg](http://upload.wikimedia.org/wikipedia/commons/b/bf/USDA_Hardiness_zone_map.jpg)

[http://upload.wikimedia.org/wikipedia/commons/1/1c/CMS\\_Higgs-event.jpg](http://upload.wikimedia.org/wikipedia/commons/1/1c/CMS_Higgs-event.jpg)

# Databases You Use

↳ Pretty much every website you interact with

↳ Social Media

↳ Banking

↳ File Sharing

↳ Search Engines

↳ Online Shopping

↳ Course Registration/Canvas

↳ Travel

↳ Etc. etc. etc.....

↳ You broadcast/generate data everywhere you go

↳ Cell phones

↳ Purchases

↳ Driving (GPS)

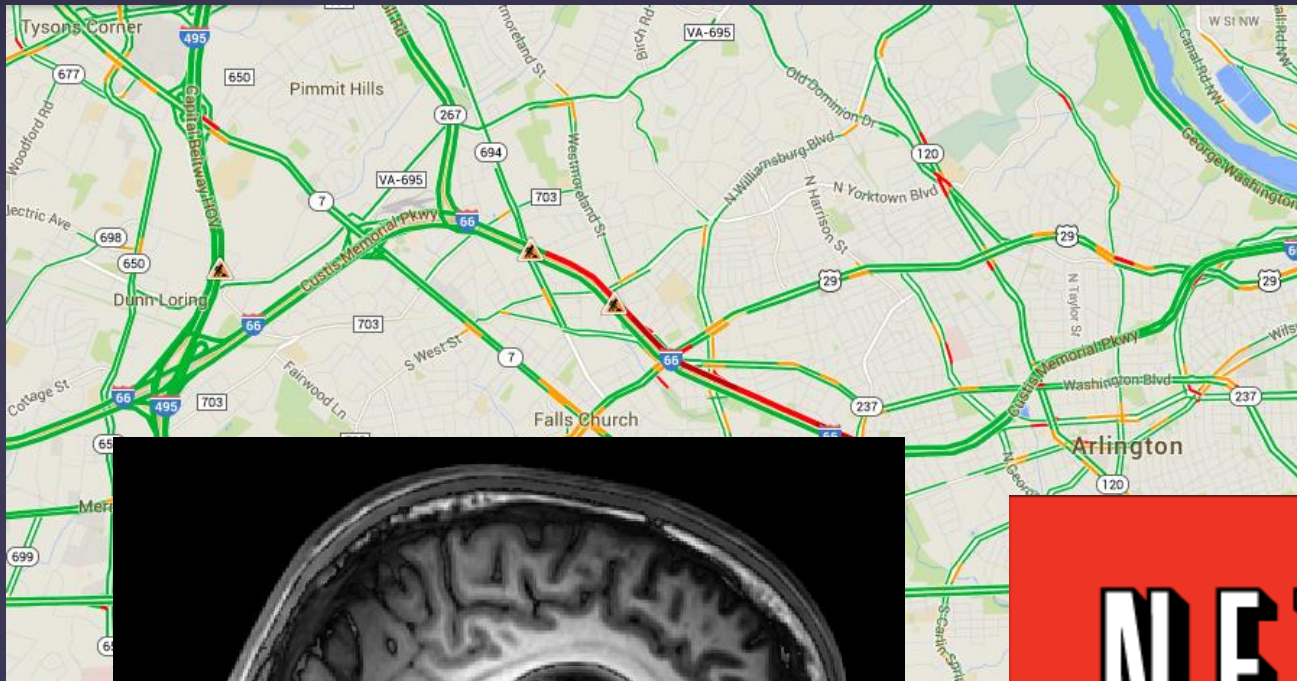
↳ Streaming music

↳ Email

↳ Posting status updates

↳ Attending events

↳ Etc. etc. etc.....



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How is data collected about you used to help you?



Who builds these systems?

# Data Scientist

## Computer Scientist

- Data collection systems
- Machine Learning Algorithms
- Interface Design
- Design/Manage/Query Databases
- Data Aggregation
- Data Mining

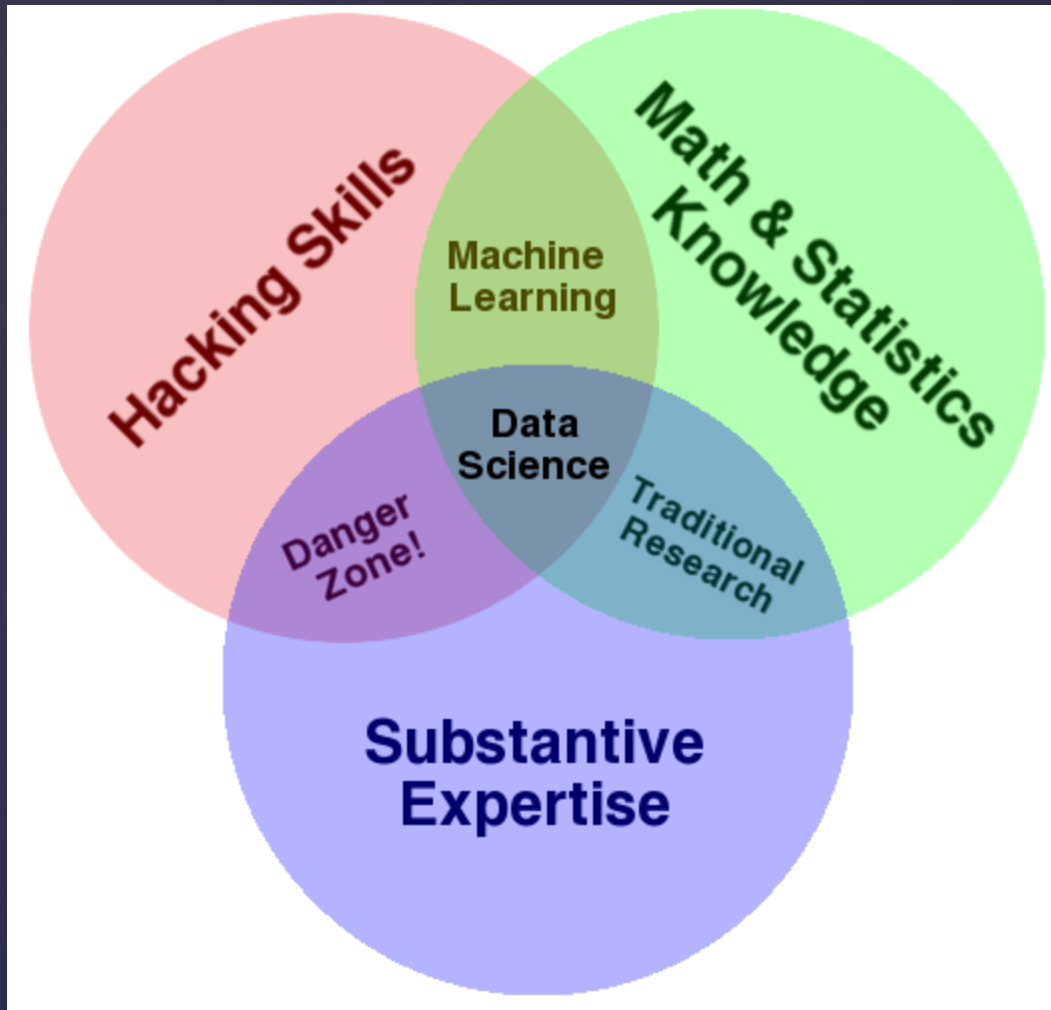
## Mathematician

- Statistical Models
- Evaluation Metrics
- Predictive Analytics
- Data Visualizations

## Business Person

- Domain Expertise
- Knowing what questions to ask
- Interpreting results for business decisions
- Presenting outcomes

*Examples – not a complete definition, and not all simultaneously necessary skills*



Data Science Venn Diagram by Drew Conway

[http://static.squarespace.com/static/5150aec6e4b0e340ec52710a/t/51525c33e4b0b3e0d10f77ab/1364352052403/Data\\_Science\\_VD.png?format=750w](http://static.squarespace.com/static/5150aec6e4b0e340ec52710a/t/51525c33e4b0b3e0d10f77ab/1364352052403/Data_Science_VD.png?format=750w)

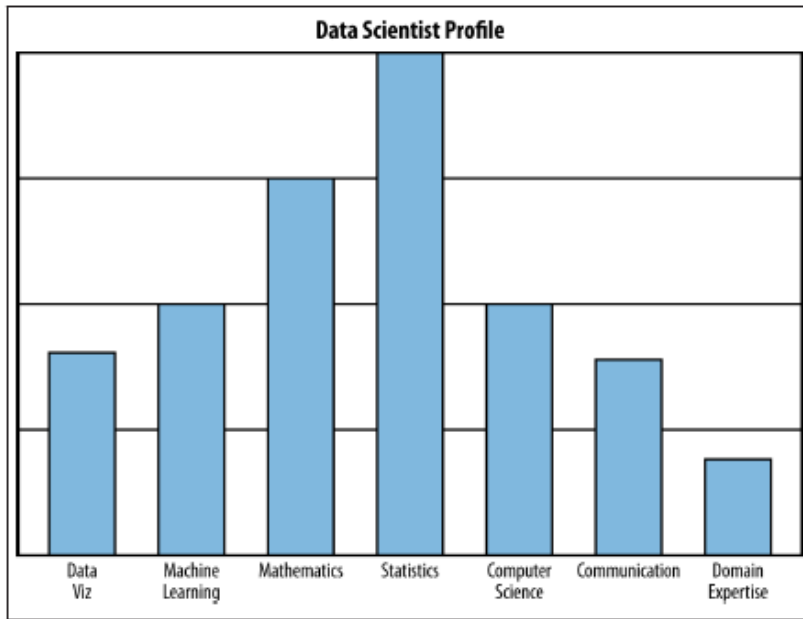


Figure 1-2. Rachel's data science profile, which she created to illustrate trying to visualize oneself as a data scientist; she wanted students and guest lecturers to "riff" on this—to add buckets or remove skills, use a different scale or visualization method, and think about the drawbacks of self-reporting

From "Doing Data Science" by Cathy O'Neill & Rachel Schutt

[http://www.becomingadatascientist.com/wp-content/uploads/2014/06/DS\\_profile.png](http://www.becomingadatascientist.com/wp-content/uploads/2014/06/DS_profile.png)

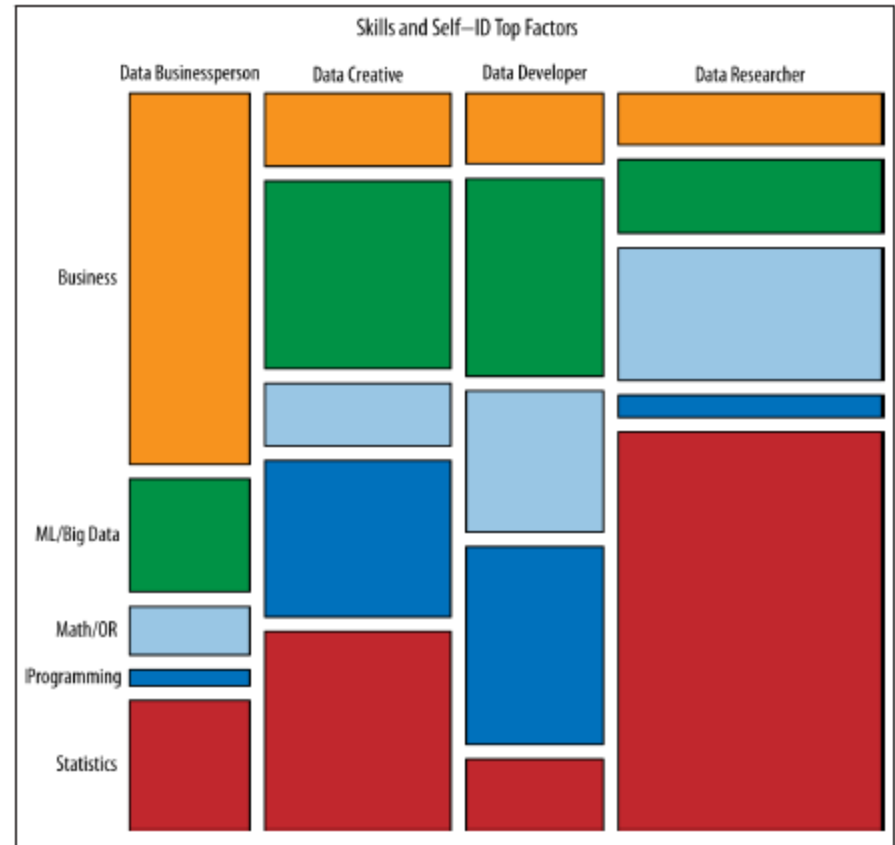


Figure 1-4. Harlan Harris's clustering and visualization of subfields of data science from *Analyzing the Analyzers* (O'Reilly) by Harlan Harris, Sean Murphy, and Marck Vaisman based on a survey of several hundred data science practitioners in mid-2012

<http://semanticcommunity.info/@api/deki/files/27057/Figure1-4.png?size=bestfit&width=484&height=541&revision=1>

No need to be a "unicorn", but do need to know something about all of these areas, and become expert in some

# Some other names for “Data Scientist”

⌘ Statistician

⌘ Data Mining Specialist

⌘ Biostatistician

⌘ Social Science Researcher

⌘ Big Data Analyst

⌘ Spatial/GIS Analyst

⌘ Natural Language

Programmer

⌘ Computational Physicist

⌘ Pythonista

⌘ Financial Analyst

⌘ Recommendation System

Engineer

⌘ Information Architect

⌘ Artificial Intelligence

Researcher

⌘ Neuroscientist

⌘ Data Visualization Designer

Data Science jobs pay an average of \$118,000 per year

It is estimated that by 2018, US could have a shortage of 140,000+ people with advanced analytical skills & need 1.5M managers/analysts that can make decisions based on data analysis

# “Extraction of Knowledge”

⌘ Also known as “knowledge discovery”

⌘ Goes beyond queries

⌘ Data Mining

⌘ Business Understanding

⌘ Data Understanding

⌘ Data Preparation

⌘ Modeling

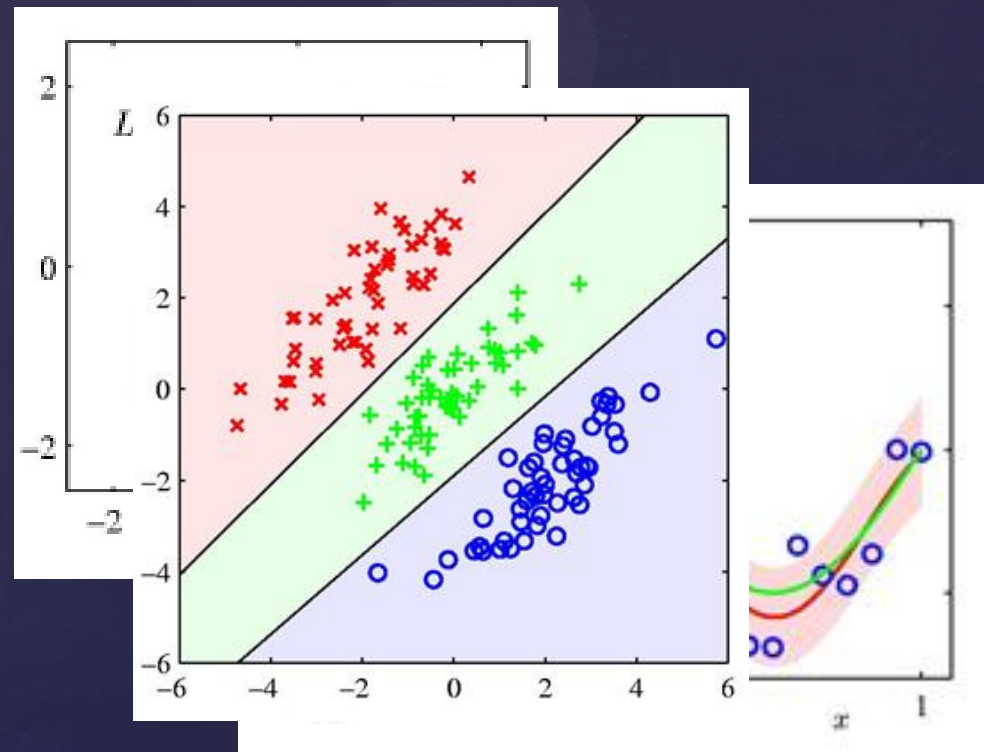
⌘ Clustering

⌘ Classification

⌘ Regression

⌘ Evaluation

⌘ From “Data Science for Business” by Provost & Fawcett



Images from ODU ECE 607 Lecture Slides by Prof. Jiang Li



Video clip: Interview with Neha Kothari, LinkedIn Data Scientist

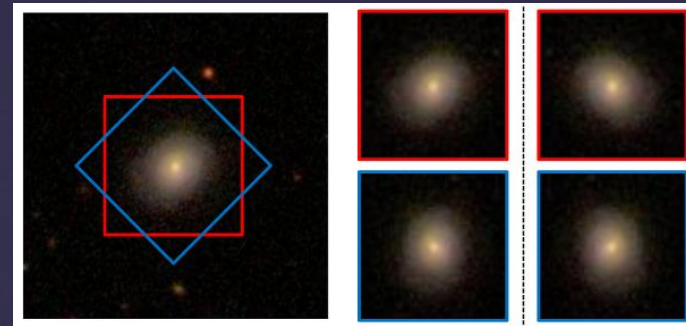
<http://youtu.be/8dxKe5cGHdA?t=17s>



# Examples

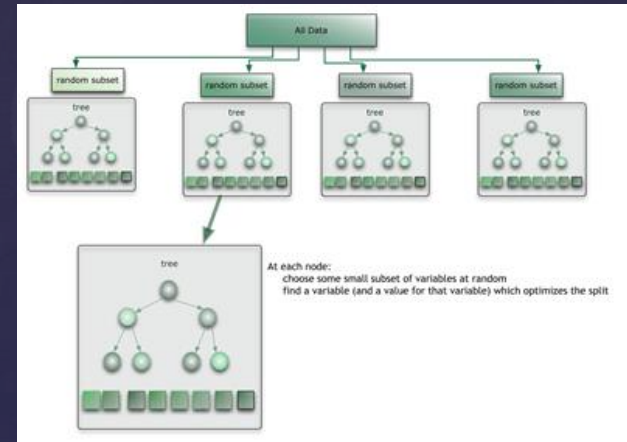
- Galaxy Classification using Convolutional Neural Networks

<http://benanne.github.io/2014/04/05/galaxy-zoo.html>



- Choosing Facebook Audience for Content Promotion using Random Forests

<http://citizennet.com/blog/2012/11/10/random-forests-ensembles-and-performance-metrics/>

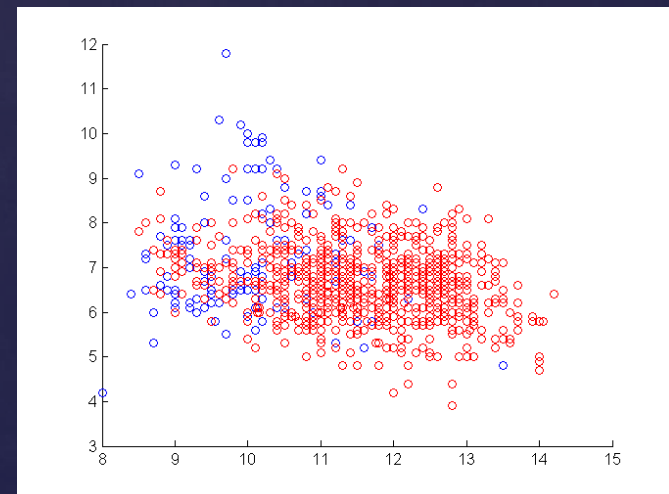


- Predicting Wine Quality with Principal Component Analysis

<http://fastml.com/predicting-wine-quality/>

- Readmission Risk Score to decide which patients to give additional follow-up help at Mt. Sinai hospital

<http://www.technologyreview.com/news/518916/a-hospital-takes-its-own-big-data-medicine/>



WHEN A USER TAKES A PHOTO,  
THE APP SHOULD CHECK WHETHER  
THEY'RE IN A NATIONAL PARK...

SURE, EASY GIS LOOKUP.  
GIMME A FEW HOURS.

... AND CHECK WHETHER  
THE PHOTO IS OF A BIRD.

I'LL NEED A RESEARCH  
TEAM AND FIVE YEARS.



IN CS, IT CAN BE HARD TO EXPLAIN  
THE DIFFERENCE BETWEEN THE EASY  
AND THE VIRTUALLY IMPOSSIBLE.

How to get started

# Topics to learn about

## ⌘ Programming

- ⌘ Any language is good to start with. Gain core understanding.
- ⌘ Python or R data analysis experience a plus
- ⌘ Database design, SQL

## ⌘ Math

- ⌘ Calculus
- ⌘ Linear Algebra
- ⌘ Statistics
- ⌘ Advanced: Optimization / Linear Programming

## ⌘ Research and Analysis

- ⌘ Science involving data collection and interpretation
- ⌘ Working with “messy” real life data
- ⌘ Business Analytics
- ⌘ Data Mining

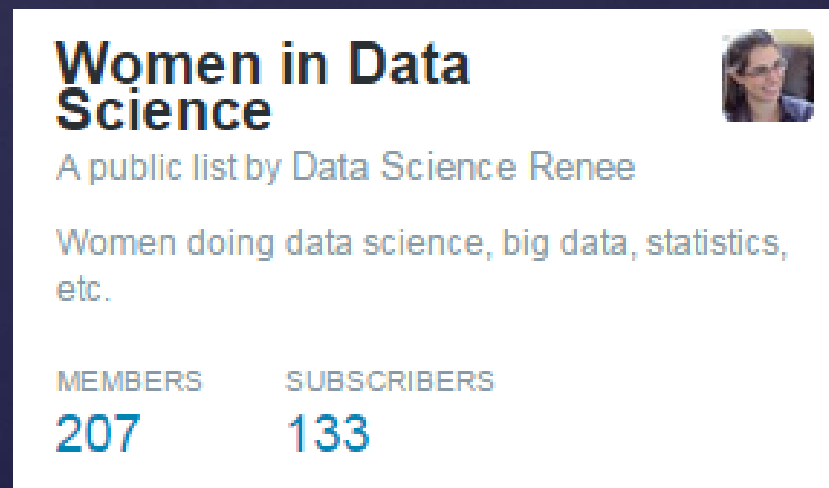
## ⌘ Others

- ⌘ Business / Communication
- ⌘ Graphic Design

# Read, read, read

- ⌘ *Doing Data Science* by Cathy O'Neil\* & Rachel Schutt
- ⌘ *Data Science for Business* by Forster Provost & Tom Fawcett
- ⌘ *Data Smart* by John Foreman\* (uses Excel)
- ⌘ I review other books as I read them:  
<http://www.becomingadatascientist.com/learning/>
- ⌘ Blogs & News Feeds (FlowingData.com is a good one to start with)
- ⌘ Twitter – look for curated lists of people to follow  
<https://twitter.com/BecomingDataSci/lists/women-in-data-science/members>

\*on Twitter and willing to chat!



**Women in Data Science**

A public list by Data Science Renee

Women doing data science, big data, statistics, etc.

MEMBERS	SUBSCRIBERS
207	133

The image shows a screenshot of a Twitter list. At the top, the title 'Women in Data Science' is displayed in bold black text. To the right of the title is a small profile picture of a woman with glasses. Below the title, it says 'A public list by Data Science Renee'. Underneath that is a description: 'Women doing data science, big data, statistics, etc.'. At the bottom, there are two columns: 'MEMBERS' with the number '207' and 'SUBSCRIBERS' with the number '133'. The numbers are in a larger, bold blue font.

# Free Online Courses

- ⌘ *Python Fundamentals* – Codecademy <http://www.codecademy.com/tracks/python>
- ⌘ *Machine Learning* – Coursera / Stanford <https://www.coursera.org/course/ml>
- ⌘ *Data Analyst Nanodegree* – Udacity <https://www.udacity.com/course/nd002>  
(includes Hadoop mini-course)
- ⌘ *Applied Data Mining and Statistical Learning* – Penn State  
<https://onlinecourses.science.psu.edu/stat857/>
- ⌘ Pretty comprehensive list here: <http://www.kdnuggets.com/education/online.html>
- ⌘ TED talks on Data <http://www.ted.com/search?q=data>
  - ⌘ Susan Etlinger\* [http://www.ted.com/talks/susan\\_etlinger\\_what\\_do\\_we\\_do\\_with\\_all\\_this\\_big\\_data](http://www.ted.com/talks/susan_etlinger_what_do_we_do_with_all_this_big_data)
    - ⌘ “Need to spend more time on critical thinking skills...[because we have the] potential to make bad decisions far more quickly, efficiently, and with far greater impact than we did in the past.”
    - ⌘ “...we need to be clear about ..the methodologies that we use, ...because if I don't know what ...questions you asked, I don't know what questions you didn't ask.”

# Explore

⌘ Volunteer to Analyze Data (DataKind)

⌘ Play with public data sets

⌘ <http://101.datascience.community/2014/10/17/data-sources-for-cool-data-science-projects-part-1-guest-post/>

⌘ <https://www.opensciencedatacloud.org/publicdata/>

⌘ <http://catalog.data.gov/dataset>

⌘ <https://archive.ics.uci.edu/ml/datasets.html?format=&task=clu&att=&area=&numAtt=&numIns=&type=&sort=nameUp&view=table>

⌘ Data Science Competitions

(Kaggle also has “knowledge competitions” for learning)

# Questions?

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<http://www.becomingdatascientist.com>