



- Course Introduction
  - Hi, I am Polo
    - Gartner's definition of "data scientist"
      - <https://www.gartner.com/it-glossary/data-scientist>
  - Why data and visual analytics?
  - Course goals and expectations
  - Course logistics
- Analytics Building Blocks
  - Overview
  - Example project 1: Apolo graph exploration
    - Apolo: Making Sense of Large Network Data by Combining Rich User Interaction and Machine Learning
      - <https://www.cc.gatech.edu/~dchau/papers/11-chi-apolo.pdf>
  - Example project 2: NetProbe auction fraud detection
    - NetProbe: A Fast and Scalable System for Fraud Detection in Online Auction Networks
      - <http://repository.cmu.edu/cgi/viewcontent.cgi?article=1530&context=compsci>
- Data Science Buzzwords
  - Hype Cycle
    - Gartner Hype Cycle 2017
      - [http://blogs.gartner.com/smarterwithgartner/files/2017/08/Emerging-Technology-Hype-Cycle-for-2017\\_Infographic\\_R6A.jpg](http://blogs.gartner.com/smarterwithgartner/files/2017/08/Emerging-Technology-Hype-Cycle-for-2017_Infographic_R6A.jpg)
      - <https://www.gartner.com/smarterwithgartner/>
  - General AI vs Narrow AI
    - Self-Driving Taxis Hit the Streets of Singapore
      - <http://fortune.com/2016/08/25/self-driving-taxi-singapore/>
    - Google AI beats Go world champion again to complete historic 4-1 series victory
      - <https://techcrunch.com/2016/03/15/google-ai-beats-go-world-champion-again-to-complete-historic-4-1-series-victory/>
    - Microsoft silences its new A.I. bot Tay, after Twitter users teach it racism
      - <https://techcrunch.com/2016/03/24/microsoft-silences-its-new-a-i-bot-tay-after-twitter-users-teach-it-racism/>
    - A Tragic Loss
      - <https://www.tesla.com/blog/tragic-loss>
    - Preparing for The Future of Artificial Intelligence
      - [https://obamawhitehouse.archives.gov/sites/default/files/whitehouse\\_files/microsites/ostp/N](https://obamawhitehouse.archives.gov/sites/default/files/whitehouse_files/microsites/ostp/N)
- Data Collection
  - How to collect data?
    - Data you can download
      - <http://poloclub.gatech.edu/cse6242/2017fall/#datasets>
    - Google Data API (e.g., Google Maps Directions API)
      - <https://developers.google.com/gdata/docs/directory>
    - Twitter (small subset)
      - <https://dev.twitter.com/streaming/overview>
    - Google Data API: GData API Directory
      - <https://developers.google.com/gdata/docs/directory>
  - How to scrape?
    - Google Play Example
      - <https://play.google.com/store/apps/details?id=com.shazam.android&hl=en>
      - Name any sound in seconds
        - <https://www.shazam.com/>
      -

- SQLite
  - As simple, effective storage
    - SQLite: <http://www.sqlite.org/famous.html>
  - SQL refresher
    - SQL Quick Reference: [https://www.w3schools.com/sql/sql\\_quickref.asp](https://www.w3schools.com/sql/sql_quickref.asp)
  - Beware of missing indexes
    - B-Tree <https://en.wikipedia.org/wiki/B-tree>
- Data Cleaning
  - How dirty is real data?
  - Importance of data cleaning
    - Cleaning Big Data: Most Time-Consuming, Least Enjoyable Data Science Task, Survey Says  
<https://www.forbes.com/sites/gilpress/2016/03/23/data-preparation-most-time-consuming-least-enjoyable-data-science-task-survey-says/#2c5226c6f637>
    - For Big-Data Scientists, 'Janitor Work' Is Key Hurdle to Insights  
<https://www.nytimes.com/2014/08/18/technology/for-big-data-scientists-hurdle-to-insights-is-janitor-work.html>
    - **Big Data Dirty Problem**  
<http://fortune.com/2014/06/30/big-data-dirty-problem/>
    - Indent Code (spacing vs tabs)  
<https://google.github.io/styleguide/javaguide.html#s4.2-block-indentation>
    - There is no way I'm going to be with someone who uses spaces over tabs  
<http://www.businessinsider.com/tabs-vs-spaces-from-silicon-valley-2016-5>
    - Trailing whitespace is evil. Don't commit evil into your repo.  
<http://codeimpossible.com/2012/04/02/trailing-whitespace-is-evil-don-t-commit-evil-into-your-repo/>
  - Data cleaners: OpenRefine & Wrangler
    - Open Refine <http://openrefine.org/>
    - Data Wrangler <http://vis.stanford.edu/wrangler/>
- Class Project Overview
  - Forming great teams
    - <https://www.cs.cmu.edu/~pausch/Randy/tipoForGroups.html>
  - Core project requirements
  - Project idea checklist: Heilmeyer questions
    - [https://en.wikipedia.org/wiki/George\\_H.\\_Heilmeyer](https://en.wikipedia.org/wiki/George_H._Heilmeyer)
    - <http://poloclub.gatech.edu/cse6242/2017spring/slides/CSE6242-999-project.pdf>
  - Pay attention to software licenses early on
    - GPL (General Public License)  
[https://en.wikipedia.org/wiki/GNU\\_General\\_Public\\_License](https://en.wikipedia.org/wiki/GNU_General_Public_License)
- Code Back-up & Version Control
  - Git: Overview and Benefits
    - Git is the **most popular** version control system in software development <https://en.wikipedia.org/wiki/Git>



- Dev put AWS keys on Github. Then BAD THINGS happened  
[http://www.theregister.co.uk/2015/01/06/dev\\_blunder\\_shows\\_github\\_crawling\\_with\\_k](http://www.theregister.co.uk/2015/01/06/dev_blunder_shows_github_crawling_with_k)
    - OneDrive <https://ai.oit.gatech.edu/onedrive>
- Data Integration
  - Knowledge graph
    - Apple Siri <https://www.apple.com/ios/siri/>
    - OpenRefine (Reconcile and Match Data)  
<https://www.youtube.com/watch?v=5tsyz3ibYzk>
    - Freebase (originally by MetaWeb; acquired by Google)
      - [https://en.wikipedia.org/wiki/Freebase\\_\(database\)](https://en.wikipedia.org/wiki/Freebase_(database))
      - <http://youtu.be/TJfrNo3Z-DU>
    - The Knowledge Graph (video); Google's Knowledge Graph website is no longer available  
<https://youtu.be/mmQl6VGvX-c>
    - What does Google know about Taylor Swift?  
<https://developers.google.com/knowledge-graph/>
    - Introducing Facebook Graph Search  
<https://www.youtube.com/watch?v=W3k1USQbq80&feature=youtu.be>
      - Looks like Meta/Facebook has taken down the video, but it seems way back machine (<https://archive.org/web/>) took snapshots of the video!
    - [Supplemental] Mark Zuckerberg explains Facebook's new Graph Search  
<https://youtu.be/U94DTrjAvuA>
  - Data de-duplication
    - D-Dupe: An Interactive Tool for Entity Resolution in Social Networks  
<https://lingpub.soe.ucsc.edu/basilic/web/Publications/2006/bilgic:vast06/>
  - Importance of Similarity Functions
    - Distance and Similarity Measures  
<https://reference.wolfram.com/language/guide/DistanceAndSimilarityMeasures.html>
    - Entity Resolution for Big Data  
[http://legacydirs.umiacs.umd.edu/~getoor/Tutorials/ER\\_KDD2013.pdf](http://legacydirs.umiacs.umd.edu/~getoor/Tutorials/ER_KDD2013.pdf)
  - Example project: Firebird fire risk prediction for Atlanta  
<https://www.cc.gatech.edu/~dchau/papers/16-kdd-firebird.pdf>
- Data Analytics, Concepts and Tasks [cse6242\_wk3\_tasks.pptx]
  - Break complex problems into simpler ones: Part 1
    - Data Science for Business: What You Need to Know about Data Mining and Data-Analytic Thinking  
<https://www.amazon.com/Data-Science-Business-data-analytic-thinking/dp/1449361323>
  - Break complex problems into simpler ones: Part 2
    - How Target Figured Out A Teen Girl Was Pregnant Before Her Father Did  
<https://www.forbes.com/sites/kashmirhill/2012/02/16/how->



- Visualization 101
  - What is info vis and why it is important
    - [http://www.infovis-wiki.net/index.php/Information\\_Visualization](http://www.infovis-wiki.net/index.php/Information_Visualization)
    - Why it is importance
      - <https://www.edwardtufte.com/tufte/>
        - Communication: Space Shuttle Challenger disaster
          - [https://en.wikipedia.org/wiki/Space\\_Shuttle\\_Challenger\\_disaster](https://en.wikipedia.org/wiki/Space_Shuttle_Challenger_disaster)
        - Richard Feynman: Challenger Crash O-Ring
          - <https://www.youtube.com/watch?v=6Rwcbsn19c0&feature=youtu.be>
    - **The best stats you've ever seen**
      - [https://www.ted.com/talks/hans\\_rosling\\_shows\\_the\\_best\\_stats\\_you\\_ve\\_ever\\_seen/next](https://www.ted.com/talks/hans_rosling_shows_the_best_stats_you_ve_ever_seen/next)
    - Anscombe's quartet
      - [https://en.wikipedia.org/wiki/Anscombe%27s\\_quartet](https://en.wikipedia.org/wiki/Anscombe%27s_quartet)
  - Human Perception
    - Information Theory
      - <https://www.britannica.com/science/information-theory>
  - Gestalt Psychology
    - [https://en.wikipedia.org/wiki/Gestalt\\_psychology](https://en.wikipedia.org/wiki/Gestalt_psychology)
    - **Gestalt Psychology: Definition & Principles**
      - <https://study.com/academy/lesson/gestalt-psychology-definition-principles-quiz.html>
  - Chart Basics
    - Edward Tufte
      - [https://en.wikipedia.org/wiki/Edward\\_Tufte](https://en.wikipedia.org/wiki/Edward_Tufte)
    - Visual Business Intelligence
      - <http://www.perceptualedge.com/blog/?p=790>
    - Chartjunk
      - <https://en.wikipedia.org/wiki/Chartjunk>
  - Colors
    - RGB Color model
      - [https://en.wikipedia.org/wiki/RGB\\_color\\_model](https://en.wikipedia.org/wiki/RGB_color_model)
    - Color Survey Results
      - <https://blog.xkcd.com/2010/05/03/color-survey-results/>
    - Color Blindness
      - [https://en.wikipedia.org/wiki/Color\\_blindness](https://en.wikipedia.org/wiki/Color_blindness)
    - Color User Guideline for Mapping and Visualization
      - <http://www.personal.psu.edu/faculty/c/a/cab38/ColorSch/Schemes.html>
    - Color Brewer for Picking Color Scales
      - <http://colorbrewer2.org/#type=sequential&scheme=BuGn&n=3>
  - Zoom + Filter
    - The eyes have it
      - <https://www.mat.ucsb.edu/g.legrady/academic/courses/11w259/schneiderman.pdf>
    - Baby names popularity
      - <http://www.babynamewizard.com/voyager#prefix=&sw=both&exact=false>
    - Visually
      - <https://visual.ly/community/infographic/entertainment/every-single-death-game-thrones-series>
- Fixing Common Visualization Issues
  - Fixing bar charts, line charts, tables, and more
    - Blazing-fast data transfer
      - <http://www.apple.com/ibmac/performance/>

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- pie-charts-are-good-for  
<http://wonkette.com/412361/all-193-of-republicans-support-palin-romney-and-huckabee>
- All 193% of Republicans Support Palin, Romney and Huckabee
- Applying what you've learned
  - Funniest pie chart  
[http://infosthetics.com/archives/2008/09/funniest\\_pie\\_chart\\_ever.html](http://infosthetics.com/archives/2008/09/funniest_pie_chart_ever.html)
  - How to fix the defaults  
<https://www.darkhorseanalytics.com/blog/clear-off-the-table>
- Crown jewel, self-contained figures, more tips
  - Scene Completion Using Millions of Photographs  
<http://graphics.cs.cmu.edu/projects/scene-completion/>
  - Polonium: Tera-Scale Graph Mining and Inference for Malware Detection  
[http://www.cs.cmu.edu/~dchau/polonium\\_sdm2011.pdf](http://www.cs.cmu.edu/~dchau/polonium_sdm2011.pdf)
  - Apollo: Making Sense of Large Network Data by Combining Rich User Interaction and Machine Learning  
<https://www.cc.gatech.edu/~dchau/papers/11-chi-apollo.pdf>
  - Don McMillan: Life After Death by PowerPoint  
[https://www.youtube.com/watch?v=lpvgfmEU2Ck&feature=player\\_embedded](https://www.youtube.com/watch?v=lpvgfmEU2Ck&feature=player_embedded)
- Data Visualization for Web (D3)
  - Why learn D3?
    - Ver4 vs ver3  
<https://iros.github.io/d3-v4-whats-new/#1>
    - Upgrading Ver3 code to ver4 code  
<https://keithpblog.wordpress.com/2016/07/31/upgrading-d3-from-v3-to-v4/>
    - Wat  
<http://www.destroyallsoftware.com/talks/wat>
  - Prerequisites: Javascript and SVG
    - Array map  
[https://developer.mozilla.org/en-US/docs/Web/JavaScript/Reference/Global\\_Objects/Array/map](https://developer.mozilla.org/en-US/docs/Web/JavaScript/Reference/Global_Objects/Array/map)
    - Mozilla Developer Network  
<https://developer.mozilla.org/en-US/docs/Web/JavaScript/Reference>
    - SVG Basics  
[https://en.wikipedia.org/wiki/Scalable\\_Vector\\_Graphics](https://en.wikipedia.org/wiki/Scalable_Vector_Graphics)
    - W3C Standard  
<http://www.w3.org/TR/SVG/>
    - CSS Selectors  
[http://www.w3schools.com/cssref/css\\_selectors.asp](http://www.w3schools.com/cssref/css_selectors.asp)
  - D3 Overview
    - Importing a CSV into D3  
<http://stackoverflow.com/questions/24473733/importing-a-csv-into-d3-cant-convert-strings-to-numbers>
  - Enter-Update-Exit
    - Excellent interactive demo to explain enter-update-exit:  
<http://niceone.org/examples/d3-selections/>
    - Full tutorial:  
[https://medium.com/@c\\_behrens/enter-update-exit-6cafc6014c36#.dqwkermdb](https://medium.com/@c_behrens/enter-update-exit-6cafc6014c36#.dqwkermdb)
  - Attributes, Styles, Classes and Text
    - <text> elements  
<http://www.w3c.org/TR/SVG/text.html>
  - Scales and Axes
    - D3 Arrays  
<https://github.com/d3/d3-3.x-api-reference/blob/master/Arrays.md>
  - Dynamic Data and Interaction
    - Treemap

<https://github.com/mbostock/d3/wiki/Tutorials>


- Scalable Computing: Hadoop
  - Big data is common. How to store them?
  - Why Hadoop?
    - Hadoop: The Definitive Guide  
<http://shop.oreilly.com/product/0636920033448.do>
  - MapReduce: overview and example
  - Example MapReduce program
  - HDFS & Recovering From Failure
    - 2003 Google File System (GFS) paper  
<https://research.google.com/archive/gfs.html>
    - 2004 Google MapReduce paper  
<https://research.google.com/archive/mapreduce.html>
  - When and how to try Hadoop?
- Scalable Computing: Pig
  - Why Pig? How to use it?
  - Example Pig program
- Scalable Computing: Hive
  - Overview, and vs Pig
- Scalable Computing: Spark
  - Overview
    - Spark  
<http://spark.apache.org>
    - Google dumps MapReduce  
<http://www.datacenterknowledge.com/archives/2014/06/25/google-dumps-mapreduce-favor-new-hyper-scale-analytics-system/>
    - The death of MapReduce at Google  
[http://www.reddit.com/r/compsci/comments/296agr/on\\_the\\_death\\_of\\_mapreduce\\_at\\_google](http://www.reddit.com/r/compsci/comments/296agr/on_the_death_of_mapreduce_at_google)
  - Example Spark programs
  - Spark SQL and other Spark libraries
    - MLlib  
<https://spark.apache.org/docs/2.2.0/mllib-guide.html>
    - Spark 2.0  
<https://databricks.com/blog/2016/07/26/introducing-apache-spark-2-0.html>
- Scalable Computing: HBase
  - Overview
    - HBase : The Definitive Guide  
<http://shop.oreilly.com/product/0636920014348.do>
  - How HBase Scales Up Storage
    - Excellent Summary  
<http://blog.cloudera.com/blog/2013/04/how-scaling-really-works-in-apache-hbase/>
  - How to use HBase
    - Why need to disable a table before dropping it?  
<https://stackoverflow.com/questions/35441342/hbase-why-do-i-need-to-disable-a-table-before-dropping-it>
  - To learn more about HBase
    - 2006 Google BigTable paper  
<https://research.google.com/archive/bigtable.html>
    - Bad key design  
<http://hbase.apache.org/book/rowkey.design.html>
- Classification
  - Overview
  - Overfitting and Cross Validation
  - K-NN
    - Elements of Statistical Learning (ESL) Book Chapter 13.3.  
<https://web.stanford.edu/~hastie/ElemStatLearn/>

- [https://docs.google.com/document/d/e/2PACX-1vSLq\\_y31NRM86UnxX0UOG5Bfsypf8uGbigffGzvXoqHVPojeBiHHVcQTbS9iPpLIGiqwlb-4Maec9KD/pub](https://docs.google.com/document/d/e/2PACX-1vSLq_y31NRM86UnxX0UOG5Bfsypf8uGbigffGzvXoqHVPojeBiHHVcQTbS9iPpLIGiqwlb-4Maec9KD/pub) 7/9



- Interactive Graph Exploration
- Ensemble Method
  - Bagging and Random forests
  - Random Forests
    - Section 15.3.1 of [http://statweb.stanford.edu/~tibs/ElemStatLearn/printings/ESLII\\_print10.pdf](http://statweb.stanford.edu/~tibs/ElemStatLearn/printings/ESLII_print10.pdf)
    - [https://www.stat.berkeley.edu/~breiman/RandomForests/cc\\_home.htm#ooberr](https://www.stat.berkeley.edu/~breiman/RandomForests/cc_home.htm#ooberr)
    - <http://stackoverflow.com/questions/18541923/what-is-out-of-bag-error-in-random-forests>
  - PERT - Perfect Random Tree Ensembles
    - <http://www.interfacesymposia.org/I01/I2001Proceedings/ACutler/ACutler.pdf>
  - Extremely randomized trees
    - <http://orbi.ulg.be/bitstream/2268/9357/1/geurts-mli-advance.pdf>
  - Random forests: ESL Chapter 15
    - [http://www-stat.stanford.edu/~tibs/ElemStatLearn/printings/ESLII\\_print10.pdf](http://www-stat.stanford.edu/~tibs/ElemStatLearn/printings/ESLII_print10.pdf)
- Scaling up Algorithms with Virtual Memory
  - Overview
  - Power Iteration
    - [http://en.wikipedia.org/wiki/Power\\_iteration](http://en.wikipedia.org/wiki/Power_iteration)
  - MMap Paper
    - <https://www.cc.gatech.edu/~dchau/papers/14-bigdata-mmap.pdf>
  - MMap Website
    - <http://poloclub.gatech.edu/mmap>
- Text Analytics
  - Basics: Preprocessing, Representation, Word Importance
  - Latent Semantic Indexing (Singular Value Decomposition)
  - SVD: Dimensionality Reduction, and Other Uses
  - Text Visualization
  - Stemming
    - <https://en.wikipedia.org/wiki/Stemming>
  - Stopwords
    - [https://en.wikipedia.org/wiki/Stop\\_words](https://en.wikipedia.org/wiki/Stop_words)
  - TD-IDF Example
    - [https://en.wikipedia.org/wiki/Tf-idf#Example\\_of\\_tf-idf](https://en.wikipedia.org/wiki/Tf-idf#Example_of_tf-idf)
  - SVD vs PCA (intuitive relation)
    - <https://math.stackexchange.com/questions/3869/what-is-the-intuitive-relationship-between-svd-and-pca>
  - PCA Visualization
    - <http://setosa.io/ev/principal-component-analysis/>
  - Word bubbles
    - <https://www.infocaptor.com/bubble-my-page>
  - Word Tree
    - <https://www.jasondavies.com/wordtree/>
  - PhraseNet
    - <http://hint.fm/projects/phrasenet/>
  - Termite
    - <http://vis.stanford.edu/papers/termite>



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