## Distinguishing Data Science from...

- Business Intelligence
- Statistics
- Data(base) Management
- Visualization
- Machine Learning



- Concepts in Computing with Data, Berkeley
- Practical Machine Learning, Berkeley
- Visualization, Berkeley
- Data Mining and Analytics in Intelligent Business Services, Berkeley
- Data Science and Analytics: Thought Leaders, Berkeley
- Scalable Machine Learning, Berkeley
- Analyzing Big Data with Twitter, Berkeley
- Machine Learning, Stanford
- Paradigms for Computing with Data, Stanford
- Mining Massive Data Sets, Stanford
- Data Visualization, Stanford
- Algorithms for Massive Data Set Analysis, Stanford
- Research Topics in Interactive Data Analysis, Stanford
- Data Mining, Stanford
- Machine Learning, CMU
- Statistical Computing, CMU
- Machine Learning with Large Datasets, CMU
- Machine Learning, MIT
- Data Mining, MIT
- Statistical Learning Theory and Applications, MIT
- Data Literacy, MIT
- Introduction to Data Mining, UIUC
- Learning from Data, Caltech
- Introduction to Statistics, Harvard
- Data-Intensive Information Processing Applications, University of Maryland
- Statistical Inference, UPenn
- Introduction to Data Science, Columbia
- Dealing with Massive Data, Columbia
- Data-Driven Modeling, Columbia
- Introduction to Data Mining and Analysis, Georgia Tech
- Computational Data Analysis: Foundations of Machine Learning and Data Mining, Georgia Tech
- Applied Statistical Computing, Iowa State
- Data Visualization, Rice
- Data Warehousing and Data Mining, NYU
- Data Mining in Engineering, Toronto
- Machine Learning and Data Mining, UC Irvine
- Knowledge Discovery from Data, Cal Poly
- Large Scale Learning, University of Chicago
- Data Science: Large-scale Advanced Data Analysis, University of Florida
- Strategies for Statistical Data Analysis, Universität Leipzig
- Data Analysis, Johns Hopkins (via Coursera)
- Computing for Data Analysis, Johns Hopkins (via Coursera)

Huge number of relevant courses. new and existing. "I worry that the Data Scientist role is like the mythical "webmaster" of the 90s: master of all trades."

-- Aaron Kimball, CTO Wibidata

#### What "data science" tells me:

- If you're a DBA, you need to learn to deal with unstructured data
- If you're a statistician, you need to learn to deal with data that does not fit in memory
- If you're a software engineer, you need to learn statistical modeling and how to communicate results.
- If you're a business analyst, you need to learn about algorithms and tradeoffs at scale



#### **Breadth**

## tools

## abstractions

Hadoop MapReduce

PostgreSQL Relational Algebra

glm(...) in R Logistic Regression

Tableau InfoVis



# Depth

#### structures

## statistics

Management

Relational Algebra

**Standards** 

Analysis

Linear Algebra

ad hoc files



### Scale

desktop

cloud

main memory

distributed

R

Hadoop

local files

S3, Azure Storage



# **Target**

## hackers

analysts

Assume proficiency in Python, Java, R

Assume little or no programming

