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Big Data or Just Data?

# Big Data vs Data?

- As we've seen, how fast computers can access the data they need depends on how, when, and in what order they access it
- Databases are programs that store data in a particular way
  - They have a language to access specific pieces of data
  - The program contains algorithms for building indexes, using them, and returning results.



## Two Database Queries

- Get information (e.g. average age) on everyone in zip code XXXXX
  - Find where info is stored on people
  - Check if their zip code is XXXXX
  - Return information if it is
- How many unique people live in zip code XXXXX?
  - Can go faster!
  - Maintain a list of unique addresses
  - For each zip code, store information about each person there:
    - Rest of address
    - Age
  - Now, think about how much work needs to be done



## **Current Database World**

- Currently, most database functionality is designed around e.g. commerce: customers, transactions, products
  - Need high availability
  - Can read and write and the same time
  - Usually you look up a little info, not a lot (e.g. look up your account info
- But analyzing data is really different:
  - How many transactions occurred each of the last few months?
  - Which customer looks the most like this customer
  - This requires looking at all the data



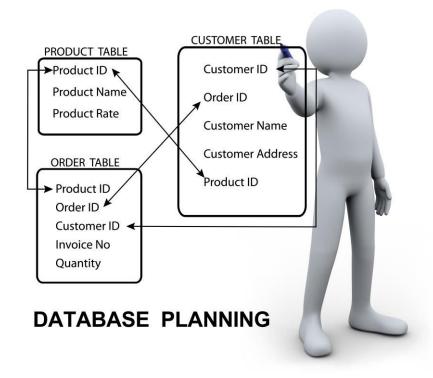
### **Databases**

- Relational Database
- Row vs column stores
  - Row stores make sense for adding new data/looking data up
  - Column stores make sense for analyzing the data set
  - SQL: Structured Query Language
- "NoSQL" database
  - Databases with less structure
  - NoSQL is a marketing buzzword, which people say means "not only SQL"
  - As far as I know, NoSQL stuff always does something which is a subset of SQL functionality



## Relational Database

- Data is stored in tables
- Items in tables can be references to other tables





## Structured Query Language

- SQL is a language for creating views of tables or statistics which are useful
- Benefits:
  - Structure of the tables can represent rich relationships between the data
  - You can look at very specific combinations of data
    - "Show me the things that people who bought yellow umbrellas in June 2012 bought in December 2013"
- Costs:
  - You have to create a very detailed schema for your data
  - It's hard to scale all these very detailed interactions



# What Examples of Relational Databases?

**PostgreSQL** 

Open source

**MySQL** 

Open source, owned by Oracle

**Oracle Database** 

Expensive database, many features

**Microsoft SQL Server** 

Cheaperthan Oracle



## **Key-Value Stores**

- The opposite end of data storage
  - Each key has a "value" which is the data associated with it
  - In its purest form, the only question you can ask the database is "What is the information on SSN XXXX"

#### Benefits:

- It's relatively easy to scale very large (you just have to store different keys on different computers according to some rules)
- It is very fast
- You don't have to worry about a schema

#### Costs:

 You can't do complicated queries without looking at all the data (looking up every key)



# Examples of Key-Value Stores

- Key value stores are used for temporary access in memory
  - Redis
  - Memcached
  - Amazon Elasticache
- Or longer term storage on disk:
  - Amazon S3 a large key value store which scales well



### **Document Oriented Database**

- Instead of rows and tables, there are a bunch of "documents" which might have different combinations of fields
- Benefits:
  - These typically support some querying: get all emails from XXX
  - Different documents can have different fields: if each document pertains to a family, not all families have children
  - These scale better than relational databases: different documents just go on different computers
- Costs:
  - You still can't query arbitrary relationships
- The bottom line is these are somewhere between simple key-value stores and full relational databases
- Examples include MongoDB and ElasticSearch
  - We will use ElasticSearch to store the Enron emails



### **Tabular Databases**

- Relational databases have rich relationships between tables
- "Tabular" databases allow arbitrary querying on just a single table
- Benefits
  - Full querying ability for the single table
  - Can scale fairly easily: put different rows on different computers
- Costs:
  - You only get a single table, so you can't model complex relationships
- In some ways, tabular databases are kind of like Key-Key-Value stores, with some extra functionality



# Examples of Tabular Databases

- BigTable Google's proprietary implementation - they published a paper which everyone implemented
- HBase/Cassandra/Hypertable open source implementations of Google's BigTable paper
- Accumulo another open source implementation, developed at NSA, with "cell level security"



## Other Big Data Databases

#### SQL on Hadoop

- Most relational databases are built for availability and transaction processing
- So you can just build relational databases on top of Hadoop
- This gives you very good scalability AND full relationships
- The only problem is some queries can require lots of looking at references across different computers, etc, so this can be super super slow.
- But if you are a data analyst, you can sometimes just wait

#### Examples

- Hive creates relational databases in Hadoop
- Impala like Hive but faster
- Spark SQL creates relational databases in Spark (like Hadoop, but stores data in memory as much as possible)



# **Lesson Summary**

- Databases are programs that store data in a particular way, and use languages to access that data
- 3 Types of databases:
  - Relational items in one table reference other tables
  - Key-Value Stores a very fast way to access a value for a particular key
  - Tabular arbitrary querying on just a single table
- SQL is the language used to create views of tables and statistics

