Recap

- Relational DBMS software has worked very well for many decades
- Companies have invested lots of money in software built upon relational DBMS infrastructure
- Companies have invested in staff/talent skilled in RDBMS technologies
 BUT
- RDBMS systems struggle to scale to support Big Data's volume, variety, and velocity demands
- · Big Data is exploding faster than RDBMS technologies can handle

NoSQL ("Not Only SQL")

- Uses Clusters:
 - Distribute the Data via Replication & Sharding
 - Distribute the Processing Across Multiple Nodes in a Cluster
- Uses Replication to provide
 - Redundancy
 - High Availability
 - Parallel Processing
- VERY Horizontally scalable



NoSQL ("Not Only SQL")

- Requires Less Structure
 - Does not store data in tables with rigid row/column structure
 - · Uses an "Aggregate" model (very de-normalized)
- Restricts join capabilities
- Relaxes ACID transaction compliance
- May use a non-SQL query language
- Typically open source, very low-cost software acquisition



Relational

- Schema defines rigid structure
 - Tables, Rows, Columns
- Foreign Key relationships enable joins
- Uses SQL language
- Maintains ACID transaction compliance
- Normalized: store a value only once
- Clustering available (but challenging)
- Leading DBMS solutions are quite expensive

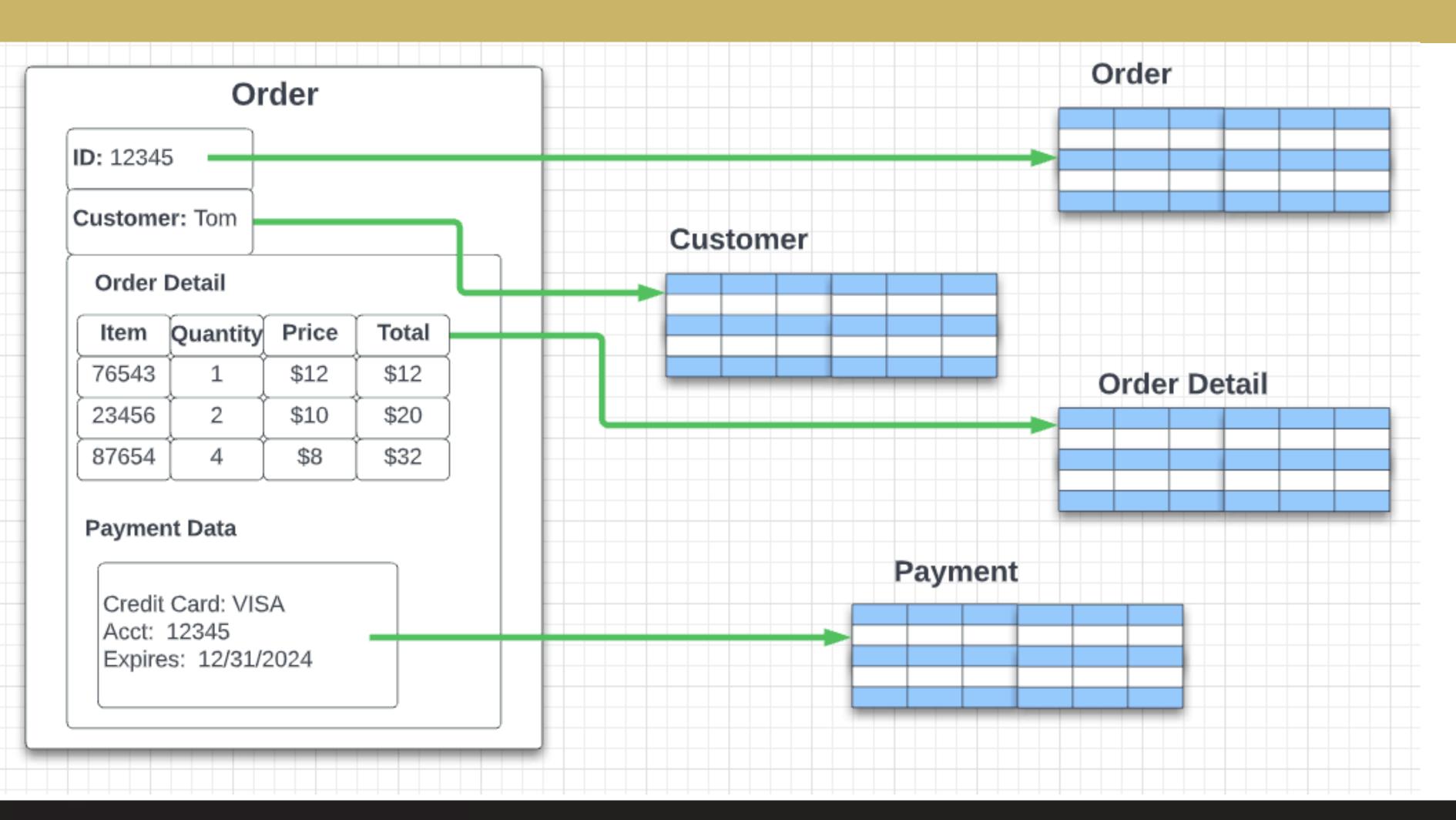
NoSQL

- Stores related values in aggregates
- Flexible structure:
 - Ranges from none to some
- No joins
- Uses alternate query language
- Relaxed ACID compliance
- Data is De-normalized
- Designed to support clustering, replication, sharding
- Almost all players are open source and low-cost

The "Aggregate" Data Model

- RDBMS requires Tables, Rows, Columns as data stores
 - Columns have "domains" of values
 - Third normal form no multi-values, "store it once"
- NoSQL systems use AGGREGATES as data stores
 - · Data values are grouped together as users need them
 - · Think of an unnormalized document, or an "object"
 - Contains related values that are retrieved and manipulated together





Aggregate
VS

3rd Normal Form

Aggregates are conceptually the opposite of 3rd Normal Form

Why aggregates?

- · It is difficult to spread a relational model across nodes in a cluster
 - Replication and sharding introduce big challenges in consistency
- Each query should minimize the number of nodes being accessed across the cluster
- · Data values that are accessed together should live on the same node

FOUR basic NOSQL Database Models

- Document Store (using XML or JSON format)
- Graph (using Node/Edge structures with Properties)
- Key-Value pairs
- Wide Column Store (rows with dynamic columns

holding key-value pairs)

Document Database

- Organized around a "document" containing text
- Can handle very large data volumes
- Provides Speed and Scalability
- Document format is easily understood by humans
- No "schema", but JSON/XML provides internal structure within a document
- Documents are indexed and stored within "collections"
- Supports full text search

Popular Implementations (open source)

- MongoDB
- CouchDB



```
: ObjectId("5e97444c99cddc2f99933a94"),
             "address" : {
             "building": "284",
             "coord" : [
                          -73.9829239,
                           40.6580753
             "street": "Prospect Park West",
             "zipcode" : "11215"
"borough": "Brooklyn",
"cuisine": "American",
"grades" : [
     "date" : ISODate("2012-12-05T00:00:00Z"),
     "grade" : "A",
     "score": 13
     "date" : ISODate("2012-05-17T00:00:00Z"),
     "grade" : "A",
     "score" : 11
"name": "The Movable Feast",
"restaurant_id" : "40361606"
```

Sample Document

- JSON (Java Script Object Notation)
- Key:Value pairs provide some structure
- One primary key per document
- Not all documents must have the same key:value pairs



Sample Document

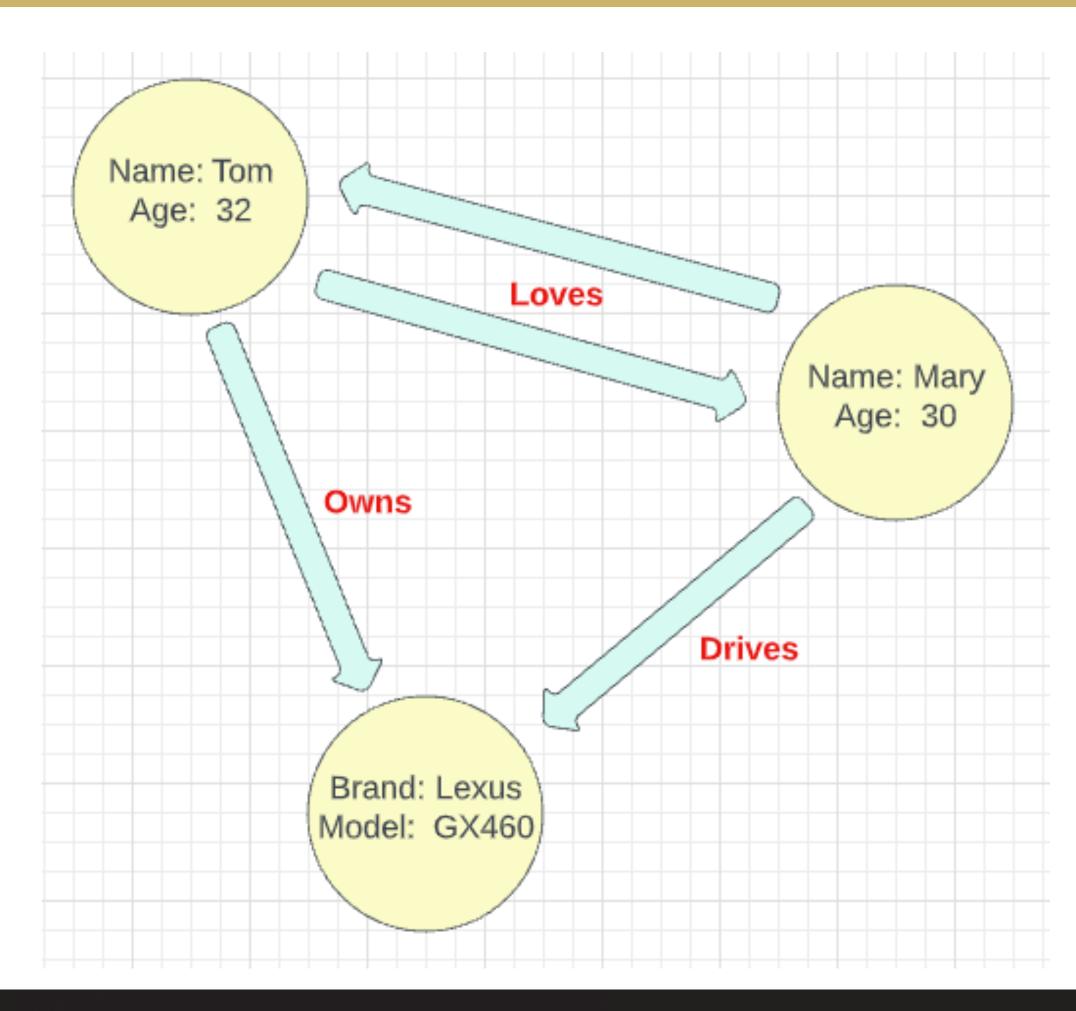
- XML (Extended Markup Language)
- Tag:Value pairs provide some structure

Document Database

- Keeps related information together (not normalized into tables)
- Access to a document is fast (index/key/URL)
- ACID compliance is maintained only within a document
- Cannot "join" across documents
- Documents are kept in "collections"

Graph Database

- Uses a graph structure consisting of
 - · Nodes Represents an entity (like a person)
 - Edges Represents a relationship between entities
 - Properties Attributes associated with Nodes and Edges
- Supports navigation along edges from a starting point node
- Designed for applications tracking the inter-connections among entities
 - Who is friends with whom? (In a social network application)
 - Who is following me, who am I following?
- · Uses a pattern matching query language to navigate nodes & edges
- Popular Implementations (open source)
 - Neo4j



Sample Graph

- Nodes (with Properties)
- Edges (with Properties)
- Key:Value Pairs provice some structure

Key:Value Pairs Database

- "Schemaless" no structure
- Maps a key to an opaque value
 (That is, the database doesn't understand anything within the value)
- Simple query operations (put, get, remove, modify)
- Keys are unique in a collection
- May be a building block for other data models (such as key:value pairs within a document or a graph)

Popular Implementations

- Amazon Dynamo (available via AWS in the cloud)
- Redis (open source)



```
Item = {
        Id: "207",
        Title: "27-Bicycle 207",
        Description: "207 description",
        BicycleType: "Touring",
        Brand: "ParaBikes",
        Price: 899,
        Color: ["Blue", "White"],
        ProductCategory: "Bike",
        QuantityOnHand: 6,
        RelatedItems:
            342,
            478,
            644
        Pictures: {
            FrontView: "http://example.com/products/207_front.jpg",
            RearView: "http://example.com/products/207_rear.jpg",
            SideView: "http://example.com/products/207_left_side.jpg"
        ProductReviews: {
            FiveStar:
                "Love this bike !!",
                "Top quality components"
            OneStar:
                "The paint chips easily"
```

Sample Key: Value aggregate

- One primary key
- Each attribute has a key and a value
- May store multiple values in an array
- Key:Value Pairs provice some structure
- Not all documents will have the same key:value pairs

Key-Value Pairs Database Example (Amazon DynamoDB)

- The primary key value (Id) is 207.
- Most of the attributes have simple data types, such as String, Number, Boolean and Null.
- One attribute (Color) is a String Set in an array.
- The following attributes are document data types:
 - · A List of Related Items. Each element is an Id for a related product.
 - A Map of Pictures. Each element is a short description of a picture, along with a URL for the corresponding image file.

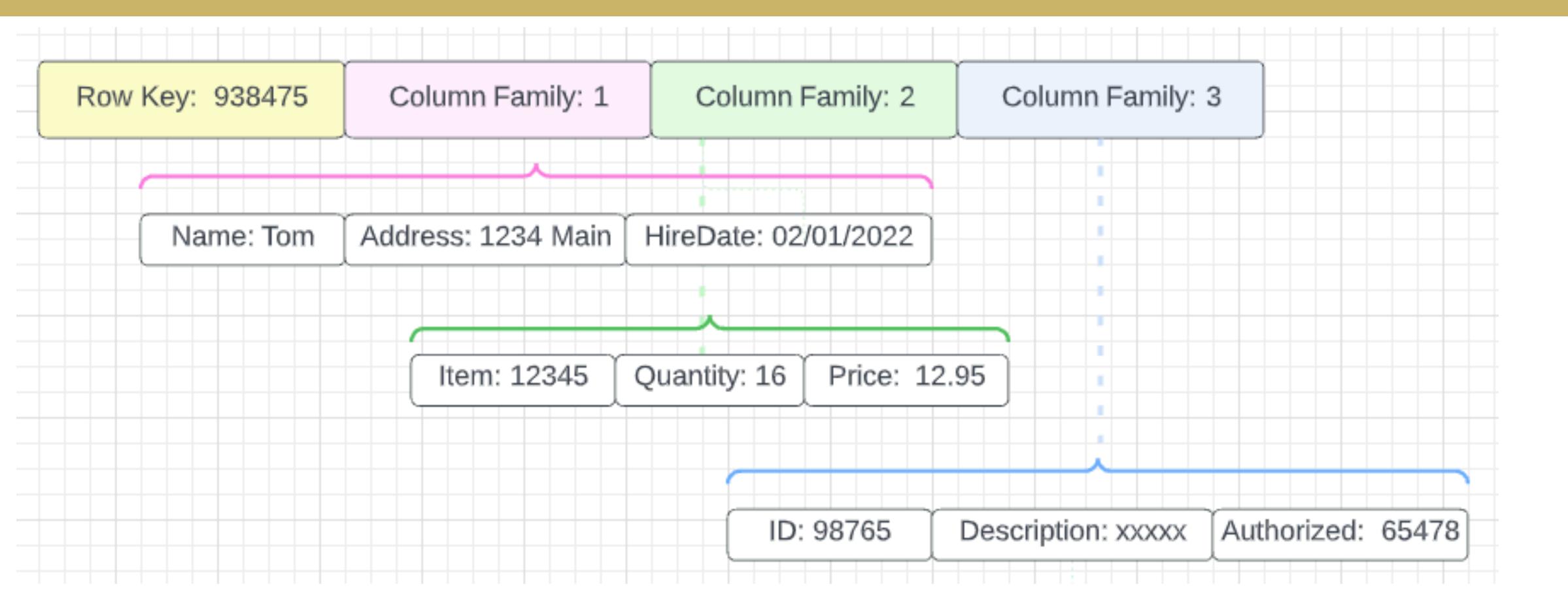
Wide-Column (Column Family) Store Database

- A TWO-LEVEL aggregate
- Data is stored within "collections" of dynamic related columns
- Similar to key:value with the pairs having columnar structure
- · Based on Google's "Big Table"
- Popular Implementations (open source)
 - Cassandra
 - HBase



Wide-Column (Column Family) Store Database

- The first key is the row-key
 - The entire row is an aggregate of related data
 - The row consists of many key-value pairs ("columns")
- The second key is the column family
 - · Each column family consists of sparse key:value pairs
 - · "Sparse" means the column value isn't stored if it isn't needed



Benefits of a Wide Column Store

- Lookup of a row by the row key will be very fast
- · In a distributed cluster system, the complete row is stored on a single node
- A row may be stored redundantly across the cluster
- A row can be retrieved with one access
- Massively scalable -- can scale to very large capacity with high availability
- The columns are "sparse"
 - · That is, a column with no value is not stored

Issues with a Wide Column Store

- · The data model is complex, and not very intuitive
- · Generally, you create your data model based on your users' queries
 - The aggregation matches your users' query needs
 - Possibly taking into account how data is distributed across the cluster
 - A new query type might require a new data store

In Summary:

- NoSQL Database Software can be adopted to allow organizations to better handle Big Data
- Four types of NoSQL databases:
 - Document
 - Graph
 - Key:Values Pairs
 - Wide Columnar