Memory taken (how big the data structure is... 2GB, etc.) Use 2 months instead of the 5 months

Report on structure of our dataset after indexing

## Experimental results

 Run experiments on 2 separate team member's computers, see how performance differs

### Visualizations

- What happened to performance as test size increases
- Characterizing datasets (probably tables rather than graphs)
- Distribution of words to files (histogram)

### AVL tree

- Height 21 (should be bigger)
- 178 seconds
- Average words in linked list = 268

# Binary search tree

• 112 seconds

#### Idea is to use same dataset in same order for all data structures

Relational databases may not be the solutoin to all problems:

- Schemas evolve over time
  - Using data model w/ weaker schema enforcement could be beneficial
- Not all apps need full ACID compliance
  - These rules can be slow
- Joins (result of breaking data up into multiple tabes) are expensive
  - In relational schema you break data into tables b/c the more you split it up, the less data duplication you have
- A lot of data is semi structured or unstructured
- Joins, ACID slows data and is less performant

## Scalability

- Vertical: more powerful systems on 1 computer
  - But more power is not always the answer
- Horizontal: split into multiple nodes -> cheaper
  - Distributed system: collection of independent computers that appear as 1. Operate concurrently, fail independently

# Distributed Storage: 2 directions

- Protect data by replicating
  - purpose: can globally distribute easily -> geographic availability (CDN provides this); if 1 computer dies we'll be ok
- Increase speed by sharding

#### Distributed data stores

- Data stored on >1 node is replicated
  - Blocks of data should be available on multiple nodes
- Distributed databases can be relational or non
- System needs to be partition tolerant (can run even w/ network partition)

# Protecting our data - CAP theorem

- Can only have 2/3 dimensions, never all 3
- Consistency: every read receives the most recent write or error thrown
  - Distributed data has inconsistent structure globally, so a read may not be the most recent
- Availability: every request receives response but there is no guarantee that the response contains the most recent write
- Partition tolerance: system operates as soon as there is partition in network

Ex. Consistency + availability: system always responds with latest data and every request gets a response, but not good w network issues...

CAP in reality

- If you cannot limit the number of faults, requests can be directed to any server, and you insist on serving every request, then yo ucannot possibly be consistent
- You must always give up something: consistency, availability, tolerance for failure

#### **ACID** transactions

- Focus on data safety
- Pessimistic concurrency model
  - Assumes that transactions wil lconflict/there will be a problem
  - Assumes that if something could go wrong, it will
- Conflicts prevented by locking resources until transaction is complete
- Optimistic concurrency
  - Assumes conflicts are unlikely, even if there is, it'll be ok
  - Transactions do not obtain locks on data when they read or write
  - Add last update timestamp and version # columns to every table, read them when changing, check at end of transaction to see if any other transaction has caused it to be changed
  - Don't actually do anything unless there's a conflict
  - Low conflict systems
    - Read heavy system
      - Cana't have conflicts when you're only reading
      - Conflicts that arise can be handled by rolling back and re-running transaction that notices a conflict
      - Optimistic concurrency better
      - High conflict system
        - Roll back and rerun transactions the encounter conflict
           -> less efficient
        - Locking scheme preferable

#### No SQL

- Originally described relational database system that did not use SQL
- Nowadays its more like not relations DBs
- Relax restrictions around ACID

# ACID alternative for distributed systems: BASE

- Basically Available:
  - Guarantees availability of data (per CAP) but response can be feailur/eunreliable bc data is inconsistent/changing state
  - System appeared to work most of time
- Soft state:

- state of system could change over time, even w/o input. 2 nodes may not have same data for a period of time.
- Ultimately updates will catch up and all nodes will have same data (eventual consistency)
- Eventual consistency
  - As long as writes, all nodes will have same data

# Categories of NoSQL DBs

- Document DBs
  - Store JSON
- Graph DBs
- Key value
  - Designed around 3 principles:
    - simplicity:
      - Very simple compared to TDBMS
    - Scalability:
      - Operate in eventual consistency model
    - Speed:
      - Deployed as in memoy DB
      - No notion of persistence to secondary storage
  - Use cases:
    - Store intermediate results from data preprocessing/EDA very efficiently
    - Caching scenarios
      - User profiles
      - Shopping cart data
        - Data needs to be available across browsers, machines, sessions
      - Storing session info
- Columnar DBs
- Vector
- Redis (remote directory server)
  - Open source, in memoryy
  - Sometimes called a data structure store
  - Primarily KV store but can be use w/ other models: graph, spatial, etc.
  - can get benefits of math thats more persistent

- Amazon not able to keep up w/ web traffic on their site... came up with distributed key value store -> that became dynamo DB
- Supports durability by saving snapshots to disk + keeping journal of changes that can be used for roll forward if there's failure
- Incredibly fast
- Not meant to handle complex data (only supports lookup by key)
  - In that case, go to document DB
- Data types
  - keys:
    - Strings tpically
  - values:
    - Strings, linked lists, sets, sorted sets, hashes...
- Provides 16 unnamed databases by default
- Use data grip (same commands as CLI) to control
  - Can access redis through python

Hash methods
Create slot
Compute slot
Bum docs num tokens search set base size search time
expeirment.py