

# Dynamo: Amazon's Highly Available Key-Value Store

# Availability is important



Tens of millions of customers at peak times

Tens of millions of shopping cart requests, 3 million checkouts per day

Hundreds of thousands of concurrently active sessions

Strict Service-Level Agreements (SLAs) translate to business value

# Key challenges

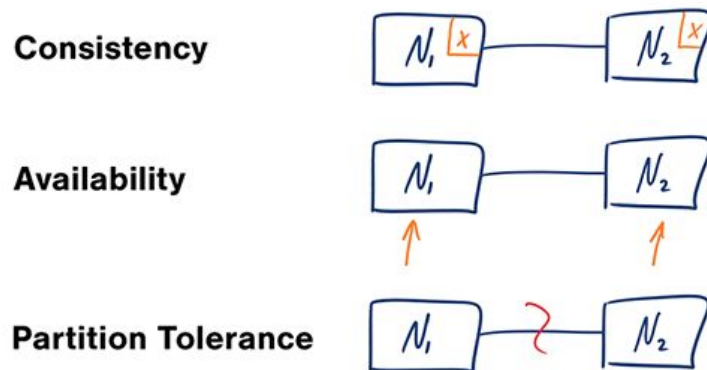


Failure is common

Even if each machine is available 99.999% of the time, a datacenter with 100,000 machines still encounters failures  $(1 - (1 - p)^n) = 63\%$  of the time

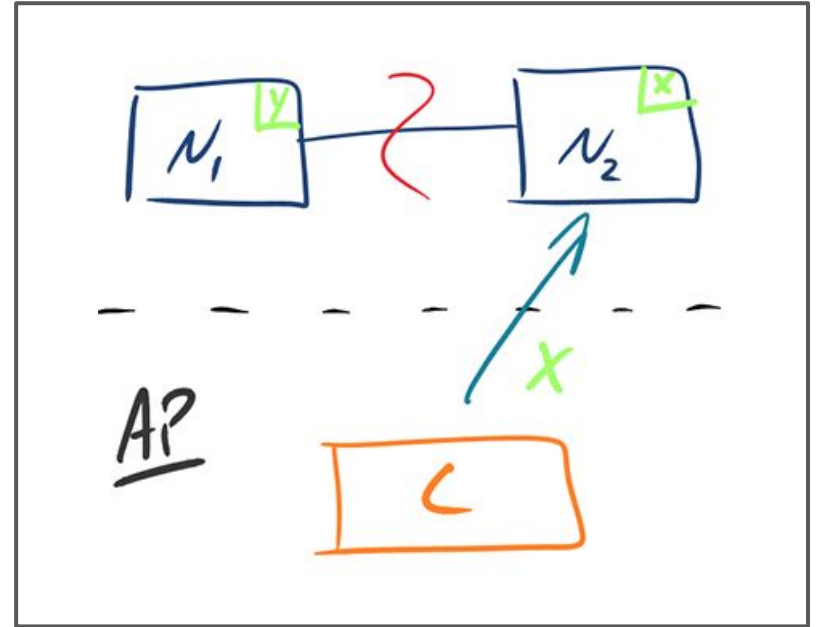
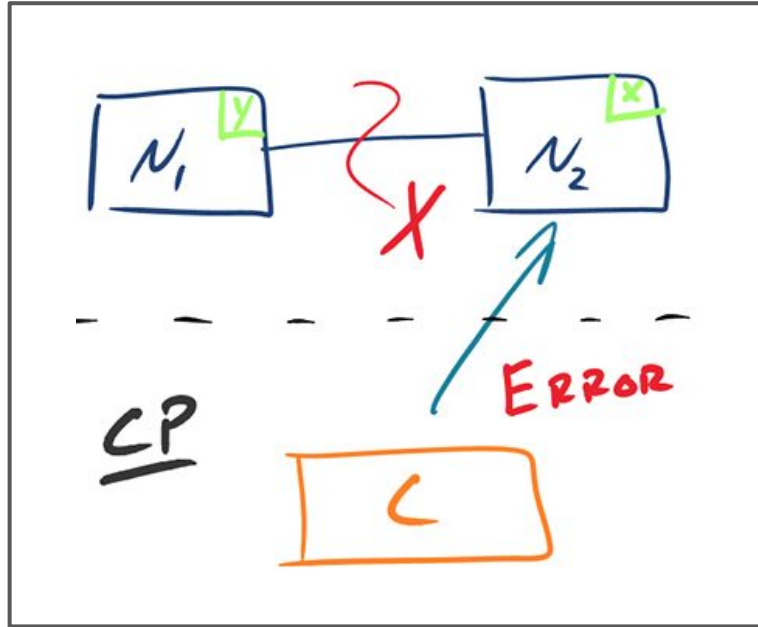
Difficult to provide availability and consistency (*linearizability*)

# CAP Theorem



*Impossible for a system to provide all three simultaneously*

# CAP Theorem



# Dynamo

Fully decentralized, highly available key-value store

Always writeable, resolve conflicts during reads

API for clients to specify SLA requirements (99.9%)

Departure from RDBMS: simpler functionality, fewer guarantees, runs on commodity hardware

# Techniques for achieving availability

***Consistent hashing*** for partitioning key space

***Vector clocks*** for reconciling conflicts during reads

***Sloppy quorums*** for handling temporary failures

***Anti-entropy using Merkle trees*** for handling permanent failures

***Gossip-based protocol*** for membership notifications

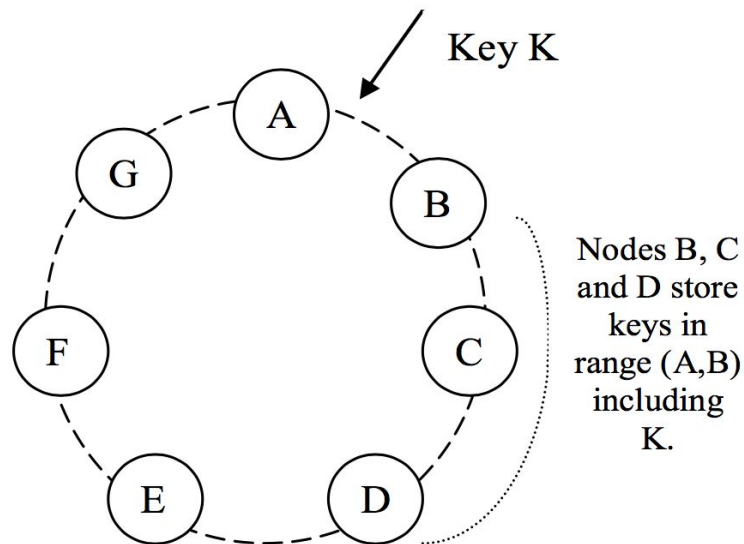
# Consistent Hashing

Assign each node a random position on the ring

Node owns the preceding key range

For fault tolerance, replicate each key at N successor nodes in the ring

**Virtual nodes:** each physical node gets assigned multiple nodes on the ring





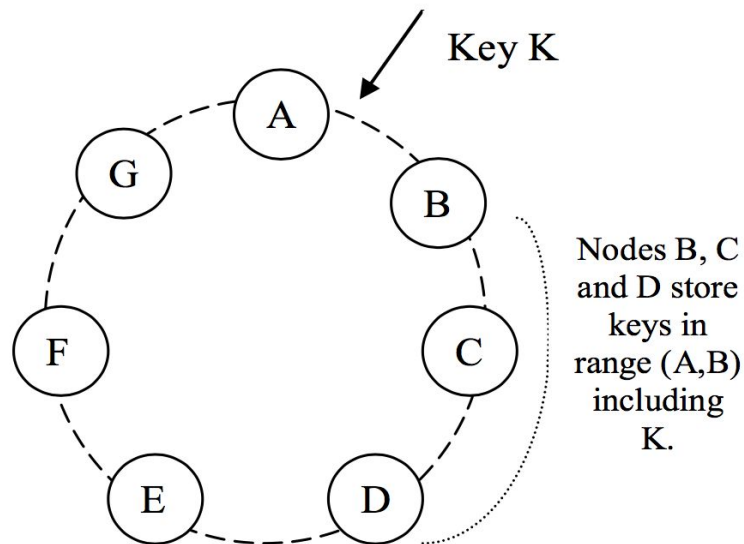
# Consistent Hashing

*Desirable properties?*

Uniform distribution of load

Minimum object movements when nodes join or leave the ring

Number of virtual nodes can be adjusted for device heterogeneity



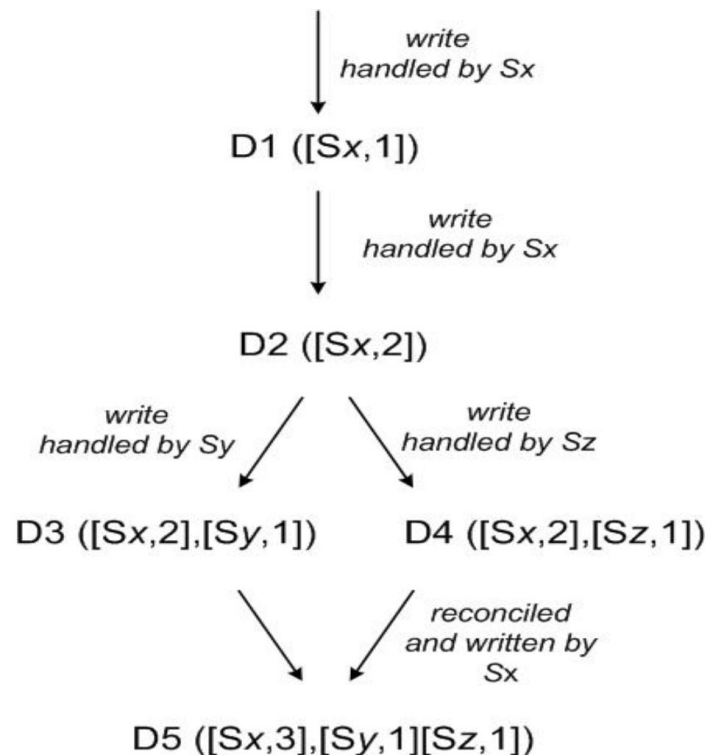
# Conflict resolution

Two machines write different values to the same key

*Vector clocks*: list of (node, count) pairs where count is incremented on write

If one vector clock subsumes another, discard older value

Else, return all conflicting values to client



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# Sloppy Quorums

Write to  $N$  nodes, return success when  $W < N$  nodes respond

Read from  $N$  nodes, return value(s) from  $R < N$  nodes

Typically,  $W+R > N$  means at least one writer and one reader overlap, so values are consistent

*Sloppy* here means skip nodes that have failed, such that even if  $W+R > N$ , the readers and writers may not overlap = **not consistent!**

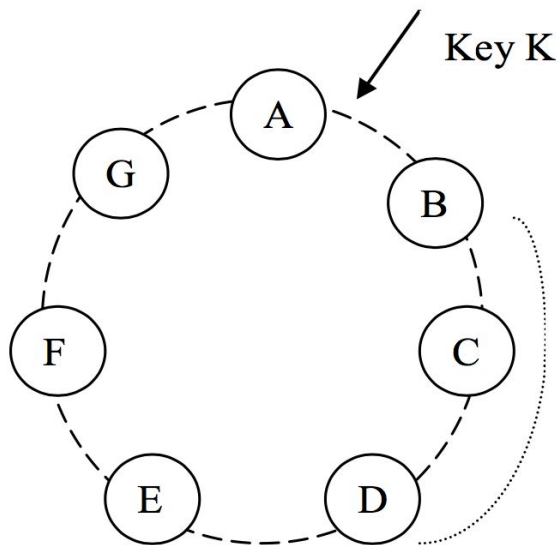
# Sloppy Quorums

Example:

Typical values are  $N = 3$ ,  $W = R = 2$

Nodes C and D have failed, so key  $k$  is written to E and F instead

Nodes C and D recover, and now client tries to read from C and D = **stale value**

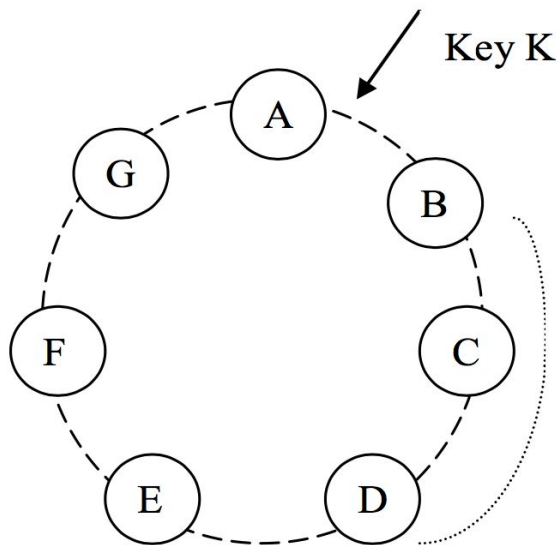


# Hinted Handoff

Example:

Nodes E and F remember they are writing on behalf of C and D

As soon as C and D recovers, E and F transfer their values for  $k$  to C and D

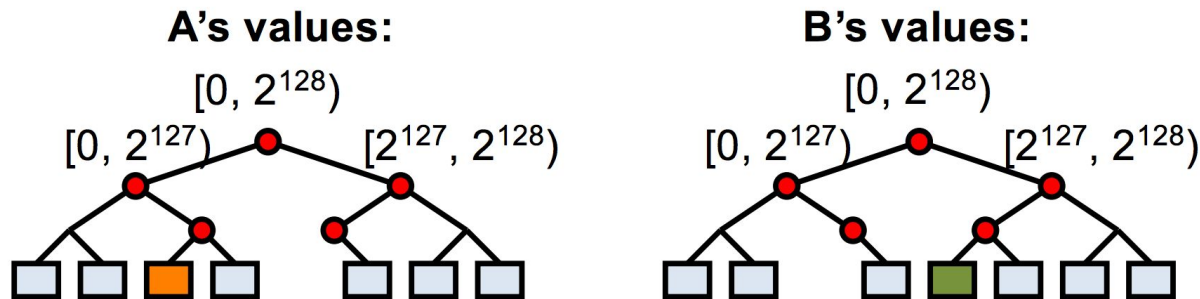


# Anti-entropy using Merkle trees

Goal: minimize durability loss from above techniques

Nodes responsible for the same key spaces exchange Merkle trees

Find differences quickly while exchanging little information





# Membership notification

Gossip-based protocol to propagate membership changes

Each node learns the key spaces handled by all other nodes

**Result:** zero-hop distributed hash table (DHT)

*Clearly not infinitely scalable* → finger tables?

# References

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