# SCALABLE CAUSAL CONSISTENCY FOR WIDE-AREA STORAGE WITH COPS

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## MOTIVATION

- Distributed data stores support complex online applications
   e.g. social networks
- Theory constrains properties
  - CAP Theorem
  - Seq Consistency || Low Latency
- Most practical systems adopt eventual consistency
  - Complicates application logic



# **IDEAL PROPERTIES**

- Availability
- Low Latency
- Partition Tolerance
- Scalability
- Stronger Consistency

Systems with the first four properties are ALPS systems

Exposes inconsistencies to users

# **CAUSAL+ CONSISTENCY**

### Causal consistency

- Related ops appear in the correct order
- Plus convergent conflict handling
  - Conflicting puts are handled identically in each DC
- Spectrum of Consistency Models:

Linearizability > Seq. > Causal+ (Impossible with ALPS) > Causal+ > PK Seq. > Eventual

## **CAUSAL+ EXAMPLES**

Alice uploads photo
 Alice adds photo to album

A) Carol sets coffee.time = 8amB) Dave sets coffee.time = 10am

Causal+: Referential integrity. Photo always exists before album.

Eventual: Broken reference in album is possible.

Causal+: One time will be agreed upon. Either 8am, 10am, or something fancier.

Causal: Forever divergent times are possible.

## **CLUSTERS OF ORDER PRESERVING SERVERS**



### **Client Library**

- Interface hides complexity from programmer
- Calls include a context that tracks causality
- Get transactions provide a consistent view of multiple keys, even from diff. nodes

## **Key-Value Store**

- Client ops are local, replication occurs in the background
- Provides availability, low latency, partition tolerance
- Lamport timestamps version writes
  - Used to enable get transactions and in the default last-writer-wins conflict handler
- Put\_after and dep\_check operations order replication between clusters and nodes
  - Provides causal consistency

- Minimize space footprint
  - Garbage collect old state

Challenges

- Minimize overhead of consistent replication
  - Leverage transitivity of causality
- Ensure fast get transactions: Worst-case 2 rounds under concurrent writes
  - Get\_by\_version

### Implementation

Built on top of FAWN-KV
~13,000 LOC
Latency < 1ms</li>
Throughput similar to weaker systems
Scales linearly





