Jin Wei CS4224 Distributed Databases

Data Partitioning

- Desirable properties of fragmentation
- completeness: each item in R can be found in ≥ 1 fragment (nothing is lost) reconstruction: R can be reconstructed from fragments
- (must be lossless join) disjointness: data items are not replicated

Fragmentation Techniques

Range Partitioning

- Use predicates on ≥ 1 attribute (e.g. < 100, [100, 500), ≥ 500)
- Use catch-all predicate to guarantee correctness OR use a binary tree (p₁ vs ¬p₁)
 Hash Partitioning
 Good hash function + not-skewed data => data will be
- evenly distributed Method 1: modulo method - when adding / removing
- nodes: need to rehash everything (less elastic) * In R_i if $h(...) \mod i$ is iMethod 2: consistent hashing - easier to add / remove
- nodes (more elastic)
 - Partition h(...) using *n* values into $v_1 <$ (replicated to all nodes OR just master)
 - (represented to indices v_n , 2nd: (v_1, v_2)] In R_i if h(...) is in R_i 's range, R_1 is catch-all node Non-uniform data & load distribution (can be managed with virtual nodes -> let variable amount map to same physical node)

Derived Horizontal Fragmentation

- Partition a *R* based on *S* using semi-join $R_i = R \ltimes_A S_i$ For completeness, $R.A \subseteq S.A$
- For disjointness, S.A must be key
- So for both, R.A must be FK of S and NOT NULL

Vertical Fragmentation

- key(R) must be in all partitions (for disjointness: only keys are duplicated)
- heuristic Attribute Affinity Measure: if commonly referenced together, should be in same partition

Complete Partitioning wrt Query

A partitioning F is **complete** wrt to Q if for all fragments $R_i \in F$: either return WHOLE partition *OR* nothing

Minterm Predicate Partitioning

Minterm predicate m = a combination (positive / negative) \land for a set of predicates ($|m| = 2^n$). Use boolean algebra to simplify

- $Q = \{Q_1, ..., Q_k\}, Q_i = \sigma_{p_i}(R)$
- $P = \{p_1, ..., p_k\}$ $F = \{R_1, ..., R_m\}$ where $R_i = \sigma_{m_i}(R)$
- Minterm predicate partitioning F (of Q) is always a complete partitioning wrt to the Q. Watch out for \lor .

Query Processing

Make query plan that minimises total cost (CPU, I/O, comm)

- OR response time. Try to parallelise queries.
- 1. Normalisation (rewrite query into normal form)
- *more common CNF $(p \lor p) \land (p \lor p)$ DNF $(p \land p) \lor (p \land p)$
- p is simple predicate: single attribute A_i op vSemantic Analysis (check against schema + type check) Simplification & Restructuring 2.

3.

- Localisation Program
- Rewrite distributed query into fragment query
- \cup for horizontal partition; \bowtie for vertical partition

Reduction Techniques

- Identify & remove queries that do not contribute to result Reduction with Selection: σ_p(R_i) = Ø if R_i = σ_{Fi}(R)
- and $F_i \land p$ = false Reduction with Join: $R_i \bowtie_a S_i = \emptyset$ if there's no "inter-
- Reduction with John $K_i \boxtimes_a S_j = \emptyset$ if there's no inter-section" of predicates on *join* attributes (*a*) Reduction with Derived Frag.: $S_j \boxtimes_a R_i = \emptyset$ if S_i is
- derived from R and $i \neq i$ Reduction with Vertical Frag .: if missing required attribute,
- drop the fragment

Distributed Join Strategies $R \bowtie_A S$

- both R and S are partitioned on join key
- only R (not S) is partitioned on join key neither are partitioned on join key
- Com nication Cost

Collocated: 0

- all servers perform local join -> send results to server Directed: size(R) if R is repartitioned (R is NOT previously partitioned)
- repartition -> if in wrong server, send to correct one Repartitioned: size(R) + size(S)Broadcast: (n-1) * size(R) where R is smaller one
- broadcast smaller table to ALL servers

Storage

- LSM (Log-Structured Merge) Storage
- Writing to B+ is random I/O (+ splitting & propagate); use LSM instead (append-only updates)
- Memory Table (in memory hash table with in-place updates)
- After threshold: sorted + flush to disk (sequential I/O) SSTables (Sorted String Table): immutable; records are sorted by K; each SSTable associated with *range of key*
- values + timestamp
- Commit Log Files used for durability

Compaction of SSTables

- Why?
 - improves read performance by defragmenting table records improves space utilisation by removing tombstones
 - (must ensure all other versions are gone) & stale values can remove at bottom-most level (because guaran-teed not in any other SSTable at this level, and no
- higher levels) Size-tiered Compaction Strategy (STCS)
- Each tier has approx. same size
- compaction triggered at tier L if number of SSTables == threshold
- * All SSTables at L are merged into one SSTable at
- Tier L becomes empty *

- Each object has ≤ 1 version in every SSTable Levelled Compaction Strategy (LCS)
 - SSTables at level 0 can have overlapping key ranges For level ≥ 1
 - each SSTable is same size
 - key ranges do not overlap within the tier SSTable at L overlaps with at most F SSTables at

COMMIT, Coordinator & that node fail -> global will be Abort

C requests state from participants * if any in COMMIT: Global-Commit to all

if any in COMMIT: Global-Commit to all if any in ABORT: Global-Abort to all if any in PRECOMMIT + no COMMIT / ABORT + majority in READY / PRECOMMIT: Prepare-to-Commit to ~PRECOMMIT; receive Ready-to-

if number of PRECOMMIT + Ready-to-commit is majority: Global-Commit

if *no* COMMIT / ABORT + majority in INITIAL / READY / PREABORT: Prepare-to-Abort to ~PRE-

if number of PREABORT + Ready-to-abort is majority: Global-Abort

Blocked TMs periodically re-attempt protocol; when failed

VSG - (T_j, T_i) if T_i reads-from T_j , or both write to same variable and T_i does final-write VSG cyclic => *not* VSS

VSG acyclic & (serial schedule from topo-sort is VE to

CE: every pair of conflicting actions are ordered in the same

Recoverable Schedule (essential): for every Xact T that commits in S, T must commit after T' if T reads from T

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N N

to O's request queue 2PL => CSS: once release a lock, no more request

if lock request not granted. Xact is blocked. Xact is added

Strict 2PL => strict & CSS: Xact must hold onto lock until

Wait-For-Graph: $T_i \rightarrow T_j$ if T_i waiting for T_j (must remove

Timeout mechanism: when Xact start, start timer, if time-out, assume deadlock

Deadlock Prevention - older Xact has higher priority (not

may starve wound-wait (preemptive): kill T_i ; T_i wait for T_i

MVE if same read-from MVSS if MVE to some serial monoversion schedule

· SI: Xact T takes snapshot of committed state of DB at start

 $VSS \subseteq MVSS$ (not other way round)

Snapshot Isolation (MVCC protocol)

can't read from concurrent Xacts Concurrent if overlap start & commits O_i is more recent than O_j if T_i commit after T_j

monoversion: each read action returns the most recently created object version

Concurrent Update Property: if multiple concurrency Xact update *same object*, only one can commit (if not, may not be serialisable)

First Committer Win (FCW): check at point of commit

First Updater Win (FUW) - locks only used for checking

- to update O: request X-lock on O; when commit / abort,

if O has been updated by concurrent Xact: abort else: grant lock

- A Read-Only Xact reads values that shouldn't be possi-

Garbage Collection: delete version O_i if exists a newer version O_j st for every active Xact T_k that started after commit

of T_i , T_j commits before T_k starts (aka all active Xact can refer to O_j)

• Global schedule S for T and $\{S_1, ..., S_m\}$ is VSS / CSS if

all locks are managed by central TM's lock manager Distributed 2PL (D2PL)

Each local S_i is VSS / CSS and local serialisation orders are compatible

each site manages locks for their own stuff

Centralised approach - Each site maintains local Wait-For-Graph

SSI (Serialisable SI): produced by SI and is MVSS

restarted on kill to avoid starvation)
 suppose T_i requests a lock held by T_j (Higher; Lower)

wait-die (non-preemptive): T_i wait for T_j ; T_i suicide =>

TM recovers: executes protocol Non-blocking as long as majority are operational

Concurrency Control Manager ensures isolation

VE if same read-froms & same final-writes VSS if VE to some serial schedule

at least one of them is **write action** and actions are from different transactions

CSS: CE to some serial schedule (CSS => VSS)

CSS ⇐⇒ CSG is acvelic

blind write: Xact no read before it writes
 VSS & no blind writes => CSS

Termination Protocol 2 (handles comm. failure)

(but if he rejoins, it should be commit)

commit

else: blocked

else: blocked

else: blocked

Concurrency Control

S) => VSS conflicting actions if

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Lock-Based CC

Requested

commit / abort

if T_i dies, T_i still waits

read-only are never blocked / aborted

MVCC (multiple ver.)

(NOT lock-based)

release locks

Distributed CC

Centralised 2PL (C2PL)

Distributed Deadlock Detection

if not held by anyone

else: wait for T' to abort / commit

Both Xact read from initial valu

Read-Only Xact Anomaly (not MVSS)

Write Skew Anomaly (not MVSS)

if T' commit: abort
else: use (if not held by anyone) case

edge)

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of T

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BORT; receive Ready-to-abort

Run leader-election to elect C

Protocol

Participant: Force write commit / abort log record (if voted

(vote commit): recovers in READY, will revote commit, coordinator might not be able to inform global decision

(vote abort): recovers in INITIAL, will abort -> OK!

2PC Protocol

COMMIT

inants

ABORT

Recovery Protocol (by server that failed)

 Fails in state
 Coordinator's recovery actions

 INITIAL
 Writes an abort record in log & sends "Global-abort" to all participants

 WAIT
 Writes an abort record in log & sends "Global-abort" to all participants

 ABORT
 Does nothing if all ACKs have been received; otherwise, sends "Global-abort" to all participants

 COMMIT
 Does nothing if all ACKs have been received; otherwise, sends "Global-abort" to all participants

Does nothing

independent if can terminate without outside info Termination Protocol (by TC)

non-blocking if can terminate without waiting for re-

Participant's recovery actions Aborts transaction unilaterally Sends "Vote-commit" to coordinator Does nothing

Coordinator's termination actions Writes an abort record in log & sends "Global-abort" to all participants Sends "Global-abort" to participants who have not responded Sends "Global-commit" to participants who have not responded

if any node is COMMIT / ABORT: P does that & tells anyone who is READY

if a node is INITIAL: it aborts, and replies ABORT

Aborts transaction unilaterally Participant is blocked!

INITIAL

ABORT

3PC Protocol

Prepare Vote-comm

Co

INITIAL

READY

COMMIT

Timeout in state | Participant's termination actions

Let participants communicate with each other

If P timeouts in READY: P asks for decision

Site Failures

detected by timeouts

covery

Fails in state

READY ABORT COMMIT

Timeou in state WAIT

ABORT

INITIAL READY

Cooperative Termination Protocol

if all are READY: blocking!

C

Ack

ABORT

Coordinator's pre-commit: write commit log record + send global-commit to operational participants

Participants' ready + pre-commit: execute Termination

if any in COMMIT: Global-Commit to all if none in PRECOMMIT: Global-Abort to all else: Send Prepare-to-Commit to READY, receive

Ready-to-commit from these, then Global-Commit

2 steps are needed: otherwise if it crashes again and none in PRECOMMIT, second if is triggered

if any participant timeout (coordinator failed), elect new coordinator; any participant that fails is ignored; anyone that fails and recovers **CANNOT** participate

P can recover independently (state = INITIAL, ABORT, COMMIT)

Total Site Failure: – Recovering TMs blocked until a TM P recovers:

P notifies recovered TMs

With comm. failure: might be split-brain

With total site failure: blocking

P was last TM to fail
P executes termination protocol

Without total site failure + comm, failure; non-blocking

Recover from earlier failure cannot rejoin: single node in PRE-

Ack

Termination Protocol Changes

Protocol X Recovery Protocol is same as 2CP

Run leader-election to elect C

C requests state from participants

Termination Protocol 1

to all

Protocol

Three Phase Commit (3PC)

(INITIAL)

Commit

Some Vot Global

ABORT

commit), don't need to force write (if voted abort)

(because too long later)

- L + 1Lower level (across tiers) + larger index (within tier) is more recent
- Compaction: new tables stored at L + 1. old tables re-
- for $L \ge 1$: choose a SSTable (round-robin style with wrap-around) -> merge with all overlapping SSTables at L + 1
- for L == 0: merge all SSTables at level 0 with all overlapping SSTables at level 1 if inserting into SSTable violates its F condition,
- make new table
- triggered when number of level 0 reaches threshold; for L ≥ 1: size(L) > F^L MB
 Each level stores F times as much data as previous
- For *n* records of *m* MB each, in worst case: last level stores a version of each of the *n* records. Therefore, $F^{L-1} < mn \le F^L \implies L =$
- * $\lfloor log_F(mn) \rfloor$ Each object has ≤ 1 version in **every** SSTable (in level
- 0), has ≤ 1 version in every other level.

Searching LSM

- Start at MemTable; go to next level, start at right-most table Check key range first: if within, use binary search At each level > 1: either search 0 or one tables
- Optimising SSTable Search

- SSTables are stored in blocks.
- 1. Sparse index
 - $(k_1, k_2, ..., k_N)$ if N blocks k_i is first key value in block i

Easy to update; still need to scatter-gather

Have to check all nodes if not partition key

Index the entire DB, partition index with hashing into

all the nodes Hard to update (need another server); good for searching

- Have to check single node even if not partition key

Tables are partitioned by *partition key* Items in same partition are sorted by *sort key* (if given)

Global Index: index key is simple or composite; partition

key can be different from table PK Local Index: index key is composite only (sort key is in-

Consistency: if each xact is consistent and DB starts consistent, it ends consistent

Isolation: Executions of xacts are isolated from each

Write-Ahead Logging Protocol: flush uncommitted up-date after before-image is flushed

Undoes all updates by xact by restoring before-image

log, immediately flush)

fail-stop model: a site is either operational OR failed

Partial site failure: some sites are operational, some have failed

ommunication failures (all sites operational) lost messages, network partitioning (split-brain prob-

obal-abor

Implementing Commit

 Force-At-Commit Protocol: commit a xact after after

dexed key); partition key must be same as table PK

Durability: if a xact commits, its effects persist

Recovery Manager ensures atomicity and durability

Distributed Commit Protocols

Atomicity: all or nothing

Centralised DBMS Recovery Manager

Redo phase: redo all updates

Undo phase: abort all active xacts

Total site failure: all sites have failed

Two Phase Commit (2PC): voting + decision

All Vote

ALL reach same global decision

once voted, cannot change vote one abort, global = abort

anyone can abort without voting

no failure + all vote commit => commit

Log records are flushed / forced / synchronous writes

Coordinator: Force write commit log record, don't force

Recovers in INITIAL: will abort (but global might be

write abort log record - (both) Recovers in WAIT: after timeout, will abort Participant must force write *ready log record*

commit => all voted commit

COMMIT

item in table has PK, otherwise it's schemaless

Single PK = (partition key) Composite PK = (partition key, sort key)

- Binary search the sparse index in-memory
 Bloom filter
 if match ALL hash functions, *might be* in block (false 2.
- positive) else, definitely not

Global Indexing

Indexing

Local Indexing

DvnamoDB

ACID

other

Implementing Abort

Implementing Restart

Failures in DDBMS

Site failures

lem)

ABORT

INITIAL

(one state transition apart)

commit)

• Co

Each node stores index for its data

One site is Deadlock Detector: others periodically trans mit local WFG to it

Centralised SI

- one site is Centralised Coordinator (responsible for assign-
- ing timestamps) assume FUW & write locks are distributed
- Performing Transaction
- TC requests CC for start and lastCommit for read X, TC requests TM_A to send most recent X
- wrtlastCommit for write X, TC requests TM_A; might be blocked
- For committing xact T:
- TC requests CC for commit
- _
- TC executes modified 2PC * in voting phase: TC includes start & commit in PREPARE messages when participant receives PREPARE, it checks for WW-conflicts between T and committed concurrent
- xacts (votes abort if any)

Producible?

Need to check S2PL & SI in local schedules, and then consider global schedule across sites.

- S2PL: not global CSS => not S2PL; check for S2PL locally SI: if each object updated by at most one xact (xacts have
- disjoint write-sets) => can be SI
 else: need to consider global schedule across sites to check for concurrency

Data Replication

- Improve system availability + performance + scalability one-copy serialisable (1SR) if same effect as one-copy DB
- equivalence: same read from, weak final write (only one
- replica needs to be the same)
 checking 1SR: similar to globally serialisable,
 * but need to check read from initial
- and check "*in-between*" writes (e.g. W_1, R_3, W_2) · strong mutual consistency if all replicas have identical val-

Updating Replicas

- Statement-based replication: forward all SQL statements Write-ahead Log (WAL) shipping - file-based OR record-
- based (streaming) Physical replication: specify page & byte offset to
- change Logical replication: one logical log record for each af-fected tuple
- Application-level replication
- Use triggers & stored procedures; more flexible but higher overhead

Replication Protocols

- Assume S2PL + statement-based replication · Eager (sync) update - always 1SR: updates all replicas within xact
- Lazy (async) update may not be 1SR: updates only one replica now; rest async via Refresh Xacts (need to be in-
- order) - probably not 1SR because xacts won't read from one another (will read from initial state)
- Centralised techniques: applied to *master copy* first before propagating to other *slave copies*
- Distributed techniques: update is applied to any copy first Note: reading local is best; when writing to all nodes, need to write to self too

Quick identification:

- Refresh xacts => lazy For *some* object, if read & write in **different** servers => centralised (always write in master site)

Eager Primary Copy (Centralised)

- For each object, one copy is primary (different objects can be in different sites) . Each master site runs lock manager for logical object (for
- all replicas)
- For read: req lock from master site, then read from any node For write: req lock from master site, then write to all nodes

Eager Distributed

- Each site runs lock manager on physical object (for local replica)
- Need to request for S-lock and X-lock (blocks if not available)
- Deadlocks are more common For read: req lock + read from *any* node
- For write: req lock + write to all nodes
- Lazy Single-Master (Centralised)

Single master site for all objects

- For read: req lock from master, then read from any node
- For write: req lock from master + write to master n
- For commit: informs master, master releases locks, gets X-locks for refresh xacts & propagates async Must be in same order at all sites, ordered by commit
- timestamp However, doesn't guarantee 1SR, even with single object
- + single xact (because don't read your own writes)

Lazy Distributed

- · Each site runs lock manager on physical object (for local replica)
- For read: req lock + read from any node
- For write: req lock + write to *any* node For commit: release locks, propagates async (other sites grant X-lock for themselves)
- Inconsistent updates: requires reconciliation * Last-Writer-Wins heuristic: accept the last refresh xact (**but** only correct for blind writes)

Handling Failures

- detect failures using use timeout mechanism
- Slave Failure Lazy Single-Master: synchronise unavailable replicas
- later Eager Single-Master: change ROWA to ROWAA (Read
- One / Write-All Available) * Synchronise unavailable replicas later
- Master Failure

1. 2. Wait for master site recovery (bad for availability) Elect new master site (must have majority)

CAP Theorem Data Consistency

- System Availability Tolerance to Network Partitions
- When there's partitioned network:
- forfeit consistency: resume execution on selected partition (might be inconsistent if partition does not have old master as it lacks latest update) forfeit availability: wait for network to recovery

reply with proposedTimestamp

On receiving commitTS, each participant

validate commit using SI replies commit / abort

Blocked by Pending Transaction T'

mitTS(T)

sends to all

CC picks commitTS = max of proposedTimestamp &

updates local clock = max(local, commitTS + 1)

if all commit: write commit log & flush (commit times-

processes local Put-set + add to propagating (async) when done: inform CC + remove from pending

tamp + Put-set), informs client and participants On receiving confirmation, each participant:

Get (k) for T: if T updated same key k & T,proposedTimestamp \leq readTS(T) Validation request for T: both updated same key & T,proposedTimestamp \leq commitTS(T) Replicating update for T: T,proposedTimestamp \leq com-

Block if possible for $commitTS(T') \leq commitTS(T)$

MARTS(T) - timestamp of version (not xact)

Eventual Consistency: 0

and Puts in current session

Raft Consensus Algorithm

Use cases:

Timers

be elected

as follows

1.

2.

3.

4.

5. else:

3.

true)

[T.2T]

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Strong Consistency (only consider primary servers):

let maxTS(k_i) be max timestamp among all versions of

 k_i in primary server of k_i MARTS = **max** of maxTS(k_i) for all k_i in key-set

Bounded Consistency: realToLogicalTime(client clock - t) Causal Consistency: max timestamp of all previous Gets

Monotonic Reads: **max** timestamp of **all** previous Gets in current session (key-set doesn't matter)

Read My Writes: max timestamp of previously committed Puts in current session for objects accessed by T

Election Timer: follower becomes candidate OR candi-

Leader Timer: leader resends RPC to follower if timeout Client Timer: client resends command if timeout

Election Safety Property: at most one leader per term

Good if T » broadcast time (average RTT)

currentTerm: latest term server has seen

votedFor: in current term (can be null)

Persistent State (on disk) for all servers:

RequestVote(candidateId, term.

AND p: - R.votedFor = RPC.candidateId

reply (R.term, false)

with lower index

F.commitIndex

F.lastLogIndex)

of future leaders

votes from majority

Normal Operations

Once committed

Become leader, send heartbeats

same index

reply (F.term, true)

p: R is not more complete than candidate

X is more complete than Y if EITHER:

* OK Alastogicin = flastogicin Xlastogindex Ylastogindex AppendEntries(leaderId, leaderTerm, leaderCommitIndex, prevLogIndex, prevLogTerm, logg]): used for heartheat too 1. if leaderTerm < Fiterm: reply (Fiterm, false)

if leaderTerm > F.term: F.term = leaderTerm if logs[] not empty:If preceding don't match: reject & let leader retry

Kill extraneous entries and append leaderCommitIndex > 1

Leader Completeness Property: if a log entry is committed in a given term, then that entry will be present in the logs

State Machine Safety Property: if a server has applied a log

entry, no other server will apply a different log entry for

Become candidate

currentTerm++.

vote for self

Send RequestVote RPCs to other servers

elector times since out (accurate leader deal)

timeout

RPC from leader

Become follower

Client sends command to leader; Leader appends command to log; Leader sends AppendEntries to all followers

Election Liveness Property: some leader must eventually

Each server chooses Election Timer randomly from

log[]: log entries (index, term, command); 1-indexed

lastLogIndex, lastLogTerm), server R replies

if RPC.term < R.term: reply (R.term, false) if RPC.term > R.term AND p: - R.term = RPC.term; R.votedFor = RPC.candidateId

reply (R.term, true)
 if RPC.term = RPC.term AND r.votedFor = NULL

- reply (R.term, true) if RPC.term = RPC.term AND r.votedFor =

RPC.candidateId (previous reply lost): reply (R.term,

if RPC.term > R.term: R.term = RPC.term; R.votedFor = NULL

X.lastLogTerm > Y.lastLogTerm OR X.lastLogTerm = Y.lastLogTerm AND

F.commitIndex:

min(leaderCommitIndex.

replicate logfile of coordinator in 2PC replicate locks in centralised lock

date restarts an election if timeout

each server only votes once must get majority votes

Leader executes & returns result to client

- => stores same command

Committed Log Entries

AppendEntries (then followers will execute it)

=> logs in all preceding entries are identical

replicated it to a majority of servers - NOT counted even if same server re-elected

• Directly committed once leader that created the entry has

Indirectly committed if preceding a directly committed

commit Committed entries are guaranteed to be in ALL future lead-

Missing entries: replication takes time
Extraneous entries: will be removed by future AppendEn-

commitIndex: index of highest log entry known to be

lastApplied: index of highest log entry applied to state

nextIndex[] for each server (init to leader.lastLogEntry + 1 -> assume all are replicated)

matchIndex[] for each server: highest index that's guar-

if commitIndex > lastApplied: lastApplied++; apply

Upon election: send initial + periodic heartbeats
If received command from client: apply to local log;

if lastLogIndex \geq nextIndex for follower (update fol-

* Send AppendEntries one-by-one; if fail: decrement

if knows command has replicated to majority: update

respond to client after applying command

• $SF(\sigma_{A=v}(R)) \approx \frac{1}{|\pi_A(R)|}$ (uniformity assumption)

 $SF(\sigma_{p_1 \wedge p_2}(R)) \approx SF(\sigma_{p_1}(R)) * SF(\sigma_{p_2}(R))$ (independence)

 $SF(R \bowtie S) \approx 1/(max(|\pi_A(R)|, |\pi_A(S)|))$ (inclusion)

Communication cost = $T_{\text{fixed overhead per msg}} * (\text{number of msgs})$ + $T_{\text{one data unit}} * (\text{total size of data})$

Eliminate dangling tuples (doesn't join with any tuple)

 $Cost = T_{MSG} + T_{TR} * |\pi_A(S)|$ Benefit = $T_{TR} * |R| * (1 - SF(R \ltimes_A S))$

• Two query plans are comparable if satisfy ALL:

order • Plan is better if comparable and lower cost

both plans have same output schema (semijoin and join

AND both plans execute final operator on same server

- AND both plans either unordered or sorted in same

opt({R_i}) = accessPlans(R_i) # index scan, ...
prunePlans(opt({R_i}))

bor S subseted [k_1, ..., k_Br st [s] = 1: opt(S) = None for 0 propersubset S: # join & SJ all pairs for P propersubset 0: # enumerator extension other = opt((S - 0) union P) # re-add P opt(S) += joinPlans(opt(0), other, 0) opt(S) += semijoinPlans(opt(0), other, 0)

while irue: # ix-point iteration S' = new plans with timestamp=ts (prev loop) for 0 subseteq S & 0 is not None: opt(S) += joinPlans(S', opt(0), ts+1) opt(S) += semijoinPlans(S', opt(0), ts+1) prunePlans(opt(S))

· Enumerator Extension: left & right operands may not be

Fix-point Iteration: some plans may not be complete
 Complete = output schema is *same* as not using semijoin

Reasonable query plan heuristic: for each leaf-to-root

Comparable plans for opt({...}) can be found outside the entry (because of incomplete plans)

for i := 2 -> n: # for increasing subsets for S subseteq $\{R_1, \ldots, R_n\}$ st |S| = i:

ts = 0 # timestamp while True: # fix-point iteration

if request / response contains term > currentTerm: cur-

Leader notifies followers of committed entries in future

Leader Append-Only Property: leader never overwrites /

deletes entries in its log Log Matching Property: if two entries in different logs have same index + same term

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ers

tries

Volatile State

Raft Rules

For all servers:

For leaders:

logs[lastApplied]

lower's state):

& retry

commitIndex

 $SF(\sigma_{A < v}(R))$ take ratio

Semijoin Optimisation

NON

for i := 1 -> n:

prunePlans(opt(S))

if S' is None: break

return opt({R_1, ..., R_n})

Avoiding redundant joins & semijoins

path, each predicate only appears once

Need to prune and compare across entries

ts++

disjoint

Vertical Pruning

Assume |R| < |S| and $R \ltimes_A S$

- $SF(R \ltimes_A S) = SF_{SJ}(S.A)$

Semijoin is beneficial if benefit > cost

Cost Estimation

Distributed Query Optimisation

• $SF(R \ltimes_A S) \approx \frac{|\pi_A(S)|}{|domain(A)|}$ (inclusion)

Log Inconsistencies

On all servers (init to 0);

On leaders (re-init after election):

anteed to be replicated (init to 0)

rentTerm = term; convert to follower

committed

machine

Quorum Consensus

- Handles fault tolerance without replicated state machine.
- Each copy has non-negative weight $Wt(O_i)$ Wt(O) = total weight
- Read threshold $T_r(O)$; Write threshold $T_w(O)$ $T_r(O) + T_w(O) > Wt(O)$: read always reads up-to-date
- write • $2 * T_w(O) > Wt(O)$: write always overwrites up-to-date
- write For read: acquire S-lock on read quorum, read all copies &
- return **highest version number** For write: acquire X-lock on write quorum, write all copies & update version number = max(n) + 1
- *k*-tolerant: can tolerate failure of up to *k* sites Must hold: weights of n kk sites
- Must hold: weights of $n max\{T_w(O), T_r(O)\}$ \geq

Consistency

- Consistency Levels
 - Eventual Consistency: returns any value that was written (might not be valid state) If single variable, always valid state
 - Consistent Prefix: returns all writes $\leq k$ (must be valid state)
 - Bounded Staleness: returns all writes performed $\leq t_{read}$ T, where T is time period of staleness, newer writes may
 - be visible Causal Consistency: T₁ < T₂ (T₁ causally precedes T₂) if
 - any are true: T_2 is executed after T_1 in same session
 - _ T_2 reads from T_1 $T_1 \& T_2$ has same write & T_2 is final write
 - transitivity of causal

Strong Consistency: returns latest value Monotonic Reads: second read returns same OR more re-. cent

- Read My Writes Tradeoffs
- - Strength = size of set of allowable results
 - Performance = read latency Availability = likelihood of success (with server failures) Pileus

 - Lazy Primary-Copy Replication

 Primary sites store master copies: all updates performed here & ordered by commit timestamps

Secondary sites: async propagation Distributed SI

• Each server:

logical clock

Pileus Client

3.

1. 2.

3.

timestamps)

Each application client:

previous Gets

server that:

each key

Gets / Puts)

timestamp + 1)

ing list

primaries):

real-time to logical tin

Pileus Multiversion Storage

Within a session, xacts are serial, defines scope for RMW, MR. * Pileus's eventual = consistent prefix

key-range of keys managed by me store = set of (key, value, timestamp) highTS = commit timestamp of **latest** xact by me

pending (awaiting commit) = list of (Put-set, proposed

propagating (after commit) = queue of (Put-set, commit timestamp)
 Pruning Old Versions by increasing lowTS

version where commitTS \leq lowTS

[lowTS, highTS] (if secondary) S updates logical clock (if primary)

BeginTx(consistency, key-set):

retain all versions with commitTS > lowTS OR latest

each server: key-range, latency, highTS, mapping of

each session: commit timestamps of previous Puts +

Put(key, value): buffered at **client** (visible to Gets in T, but not for ~T)

Client's Get (key): if rejected: restart xact (if primary),

change server (if secondary) Server processing of Get (key, readTS): 1. Accept if readTS ≥ lowTS (if primary) OR readTS in

S returns (v, v.commitTS, S.highTS) where v is most recent and v.commitTS \leq readTS

Get MARTS(T) - minimum acceptable read timestamp (if key-set given) for each k_i in key-set, pick *closest*

has key highTS >= MARTS (if primary, ignore this rule)

tie break by lower latency, then higher highTS

readTS(T) = min highTS among the servers picked for

Client selects Commit Coordinator (CC), and sends it

readTS + Put-set + largest commit timestamp (of all

CC partitions Put-set for participants + send Pre-

pareCommit with subset CC updates local clock to max(local, largest commit

n receiving PrepareCommit, each participant:
 proposedTimestamp = (local clock)++
 append (local Put-set, proposedTimestamp) to pend-

EndTx(consistency, key-set) for committing (only

lowTS = timestamp of latest pruning operation
 Each primary server (only this is involved in 2PC):