# **Partitioning**

Completeness Given a fragment U derived from R, all keys in U

Given a fragment U derived from R, all keys in U Disjointness

must be unique foreign key in R

 $R = R_1 \cup R_2... \cup R_n$ Reconstruct

Range partitioning  $\mathbf{R}_1 \, = \, \sigma_{A < 100}(\mathbf{R}), \, R_2 = \, \sigma_{A \in \lceil 100, 500 \rceil}(R), \, \mathbf{R} = \, \mathbf{R}_1$ 

Hash partitioning A record is stored in node N if h(t. A) falls in N's region, adding a new node only affects on node unlike modulo method, but is oblivous to servers' capacity

Derived horizontal partitioning  $R_i = R \ltimes_A S_i$ , each  $S_i$  is a partition of S

for R to be complete all A in R must exist in S

for R to be disjoint, S.A must be unique key

for R to be disjoint and complete, R.a must be a foreign key of S with non-null values of R.a

Complete partitioning F is complete partitioning of R wrt Q, if for all frag-

ment  $R_i \in F$ , either every tuple in  $R_i$  matches Q or every tuple does not match Q

MTPred  $m_i = p_1^* \wedge p_2^*, MTPred(P) = m_0, m_1, ...m_7$ 

e.g.  $m_0 = \neg p_1 \wedge \neg p_2 \wedge \neg p_3$ 

 $S_i = \sigma_{m_i}(R)$ , we say  $S_i$  is the min term predicate partitioning of R wrt Q and F =  $\{S_1, ..., S_m\}$ , F is a complete partitiong wrt every query in Q

# Query processing RA equivalence

Commutativity of binary ops  $R \times S = S \times R, R \bowtie S = S \bowtie R$ 

 $(R \bowtie S) \bowtie T = R \bowtie (S \bowtie T)$ Associativity of binary ops

Idempotency of unary ops  $\pi_{I'}(\pi_L(R)) = \pi_{I'}(R)$ , anti-intuitive reprojection

to push across join

 $\sigma_{p_{1}}(\sigma_{p_{2}}(R)) = \sigma_{p_{1} \wedge p_{2}}(R), \, \text{separate selection}$ 

 $\pi_L(\sigma_p(R)) = \pi_L(\sigma_p(\pi_{L \cup attr(p)}(R)))$ 

Push down selection

Commutating sel and proj

Push down projection

# Join strategies

Strategy Comm cost

Collocated All partitions on the same key

in all tables

only 1 table is not partitioned size(R) if R is being repartion the key

Repartitioned size(R)+size(S) both are not partitioned on

the key

Broadcast  $(n-1) \times size(R)$  if R is broad-both are not partitioned on

casted, R is smaller in size the key

NOTE: If need to compute join from  $J_1$  to other relation, need to see what strategy used previously. For eg. S is partitioned on B, R on C and T on F. Use broadcast join by broadcasting R for  $J_1=R\bowtie_A S$ . Now,  $J_1\bowtie_B T$  only requires directed

join on T since  $J_1$  is partitioned on B already.

# Storage

### LSM storage

- improves write thoughput by converting random I/O to sequential I/O
- append only updates
- vatch insert to disc once mem is full
- · slow down read query coz need to search both mem and disk

#### · updated in-pace

- flush records to disk when reaches a threshold
- SSTables are immutable and are assoc. with a range of ket values and a ts
- · each new update is appended to commit log and updated to MemTable

## Size-tiered compaction strategy

- · SSTables in each tier have approx same size
- compaction happens when no. of SSTables reaches a threshold
- all SSTables in tier L are merged into a single SSTable in L + 1
- L becomes empty after compaction
- $S_0$  is more recent than  $S_1$ ,  $S_{0,4}$  is more recent than  $S_{0,1}$

### Level-tiered compaction strategy

- SSTables at L = 0 may not be disjoint SSTables at L > 0 have same size, disjoint
- SSTable at L iverlaps with at most F SSTables at L + 1
- $\bullet$  compaction at L = 0, merge all SSTables with all overlapping SSTables at L +
- compaction at L > 0, round-robin
- NOTE:  $F^{L-1} < size(L) \le F^L$ , compacts when  $size(L) > F^L$ . Each level stores F times as much data as previous level.

· optimize with sparse index using block's smallest key value then search with B+ tree; Bloom filter with h(x) to quickly check if a seach key exists in a

Max size of R is mn MB.  $F^{L-1} < mn \le F^L$ , using log we have  $L = [log_F(mn)]ceil$ . Increase F -> smaller L -> improves worst case I/O cost for

searching but more I/O costs when merging SSTables. Local indexing

- · each server keeps a table to store mapping
- redundant index across servers, some sort of scatter-gather query
- · easy to update since in the same server, not so good for searching

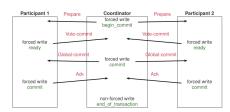
#### Global indexing

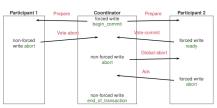
- · every server keeps a metadata to record each index is stored at which server, partitioning done by hashing
- to search a key, go to the server with the index, get the mapping, may need to go to different servers to fetch the actual records
- good for search but update is more expensive if the mapped record is stored in different server

NOTE: To check using which index is more efficient, check no. of index partition and relation partition need to be accessed

# Commit Protocol

#### 2PC protocol





## Recovery of Coordinator

Fails in state Recovery actions

INITIAL, WAIT Writes abort log record, sends Global-Abort to all

Does nothing if received all ACK, else sends Global-Abort ABORT

COMMIT Does nothing if received all ACK, else sends Global-Commit

## Recovery for Participants

INITIAL unilaterally abort

sends Vote-Commit to TC, this is dependent READY

ABORT, COMMIT Does nothing

# Basic Termination for Coordinator timeout in state terminate actions

WAIT Writes abort log record, sends Global-Abort to all ABORT sends Global-Abort to non-responding participants COMMIT sends Global-Commit to non-responding participants

### Basic Termination for Participants

timeout in state terminate actions INITIAL aborts unilaterally

READY Blocked! Need to wait TC to recover first

#### Cooperative termination protocol - Participant Q receives a Decision-Request from Participant P that timeouts.

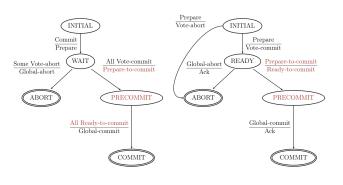
Receive in state Replies actions INITIAL.

aborts unilaterally, "Aborts' "Uncertain' READY COMMIT "Commit"

"Abort" Can still be blocking if the remaining participants are all in READY state.

#### 3PC Commit Protocol

ABORT



Participant

Writes abort log, sends "Global-

Writes commit log, sends "Global-

Sends "Global-commit" or "Global-

abort" to those not yet responded

Does nothing

abort"

commit'

Coordinator

3PC recovery protocol for TC and P Recover in state Recovery actions INITIAL aborts unilaterally WAIT or READY, PRECOMMIT asks other TM

Termination protocol for coordinator

WAIT

PRECOMMIT

COMMIT. ABORT

COMMIT. ABORT

Termincation protocol for P INITIAL

Unilateral abort READY, PRECOMMIT Executes 3PC1

3PC termination protocol 1 - Participants execute this when they timeout in READY or PRECOMMIT state

- · TMs elect new TC
- TC sends State-Request msg to all TMs
- Each TMs responds to TC about its current state
- If some TMs in COMMIT, TC sends "Global-Commit" to all
- else if no TMs in PRECOMMIT, TC sends "Global-Abort" to all
- else (means some in READY some in PRECOMMIT), TC sends
- "Prepare-to-commit" to READY TMs. Sends "Global-commit" after receiving "Ready-to-commit" from these TMs.

NOTE: Failed TMs are not allowed to join Termination protocol to prevent inconsistent global decision. 3PC1 is correct if there is no connection failure. 3PC1 is blocking but correct in the event of total site failure, need to wait for a TM to recover such that it can recover independently(in INITIAL, ABORT, COMMIT) or it was the last TM to fail. The former would notify using its recovered state, the latter would execute termination protocol. In the event of comm failure, execute 3PC2

#### 3-PC termination protocol 2 - to ensure correctness when comm failute

- TMs elect new TC
- TC sends State-Request msg to all TMs
- · Each TMs responds to TC about its current state
- If some TMs in COMMIT, TC sends "Global-Commit" to all • else if some in ABORT, TC sends "Global-Abort" to all
- else if majority in READY/PRECOMMIT, same as 3PC1. If PRECOMMIT and Ready-to-commit forms majority, sends "Global-commit". Otherwise TC and TMs are blocked.
- else if majority in READY/PRECOMMIT/PREABORT, sends
- "Prepare-to-abort. If PREABORT and "Prepare-to-abort" forms majority, sends "Global-abort". Otherwise, TC and TMs are blocked.
- else TC and TMs are blcoked

NOTE: 3PC2 is correct when total site failure and comm failure, is non-blocking in the absence of comm failure as long as majortiy of TMs are still operational

# Concurrency Control

View equivalent Conflict equivalent View/Conflict serializable Serializable global schedule

monoversion schedule

Same read from and final Write Same ordering of conflicting pairs

S is view/conflict equivalent to a serial schedule each local schedule is view/conflict serializable -> ex-

ists a local serial schedule Each local serial schedule is a subsequence of an overall global serial schedule -> each local serial schedule

is compatible ordering wise each read action returns the most recently created obiect version

Read from only, ignore final write.  $W_i(x)$  creates a multiversion view equivalent new version of x denoted by  $x_i$ ,  $x_0$  is initial version a multiversion schedule that is multiversion view serial multiversion schedule

equivalent to a serial monoversion schedule if T reads from T', T must commit after T' for S to recoverable schedule be recoverable

#### NOTE MVSS is not necessarily VSS, but VSS must be MVSS

# 2PL Lock based CC protocol

- To read O, a txn must holde a S-lock or X-lock on O . To write to O, a txn must hold X-lock on O
- A txn is not allowed to request for any more locks once it releases a lock, thus 2PL is guaranteed conflict serializable

- · Strict 2PL says a txn must hold on to locks until it commits or aborts, thus S2PL is guaranteed recoverable
- Deadlock is detected using wait-for graph or timeout mechanism.
- Wait-die policy: non-preemptive, txn gets aborted only when reqesting for a lock, a txn with all the locks it needs is never aborted and younger txns may get aborted repeatedly
- wound-wait: preemptive
- lock-conversion to allow for interleave schedule, but need to check before granting conversion

#### Multiversion based CC protocol

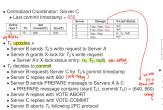
- Benefits: Read-only txns never get aborted and are not blocked by update txns, update txns are never blocked by read-only txns
- Concurrent txns:  $[start(T), commit(T)] \cap [start(T'), commit(T')] \neq 0$ Only allow one txn to commit if multiple concurrent txns updated the same object to ensure serializability. (Disjoint write-sets)
- First-commit win vs First-update win. In FUW if x-lock is not held by T', txn is granted X-lock. Txn aborts if O has been updated by concurrent txns, otherwise txn proceeds. If X-lock is held by T' and it has aborted, txn is granted X-lock and same as previous. If T' commits, txn is aborted. Txn releases X-lock after commit or abort.
- · SI does not guarantee MVSS, must use serializable SI for that

# Centralized vs Distributed 2PL

C2PL D2PL Lock man- CC even if it doesn't store the Managed by each site's lock agement object manager ReqLock and RelLock to CC, Read req to site A storing O, Comm cost read req to site storing object, site A grants S-lock and Read res to coord TM, coord TM read res to coord TM sends RelLock to site A Deadlock Aware of all deadlocks central deadlock detector to construct global WFG from local WFG sent by each site

#### Centralized Snapshot Isolation

- One site as CC, say site A stores x
- Start a new txn T: TC req start(T) and lastCommit(T)
- $\bullet$   $R_i(x)$ : TC sends lastCommit(T) to  $TM_A$ ,  $TM_A$  responds with latest version wrt lastCommit(T)
- $W_i(s)$ : TC sends write req to  $TM_A$ ,  $TM_A$  checks if X-lock can be granted and responds accordingly, T is blocked if cannot get lock
- Commit(T): TC sends req to CC for commit(T). TC execs 2PL with start(T) and commit(T). When P receives "PREPARE", it checks for WW-conflicts btwn T and committed concurrent Txns, responds "Vote-to-abort" if found concurrent version





- 7, decides to commit

  Server D requests Server C for 7, s commit timestamp

  Server C requests Server C for 7, s commit timestamp

  Server D server S explore (\*\*\*) | p\_s\*\*(s) prof.

  Server D server S explore (\*\*\*) | p\_s\*\*(s) prof.

  Server D server S explore (\*\*\*) | p\_s\*\*(s) prof.

  PREPARE (message contains (settrif); commit(f)) | (620, 650)

  Both Servers A & B repty with (vell-CoMMIT)

  Server D commit 7, following 2PC protocol

# Replication

# Mutual consistency and 1-copy serializability

 $S_{RD}$  is equivalent to  $S_{1C}$  if

 $T_i$  reads x from  $T_i$  in  $S_{RD}$  iff  $T_i$  also reads x from  $T_i$  in  $S_{1C}$  and

• for each final write  $W_i(x)$  in  $S_{1C}$ ,  $W_i(x)$  is a final write in  $S_{RD}$  for some copy  $x_A$  of x. MC if all copies of x.

## Eager Strong MC ROWA

Txn commits as soon as one replica is updated

Updates other replicas asynchronously using refresh txn

Updates from different txns can conflict Need to ensure updates are applied in same

granted to local replica, not all copies of

Deadlocks are more common since lock is

not managed by a single master copy

For all protocols, we assume strict 2PL and statement propagration Distributed

## Centralized

each primary or master copy site runs a each site runs a lock manager, lock is lock manager for S2PL

1-copy serializability is guaranteed

Update is applied to master copy first be-Update is applied at any site then propafore propagating to slave copies If need latest data, must read master copy

Master/Primary site is bottleneck Write must be done on master site first, Prioritize local copy for write

read can be done locally S2PC runs among involved primary sites S2PC runs among sites that were updated

an object

gated to other replicas

may get stale value

To determine if schedules could be produced by which protocol, do the following steps:

- 1. Check for refresh txn, if yes then lazy
- 2. Check for 1-copy serializability, if no then cannot be eager
- 3. Check where txn is issued. Then check where reads and writes are performed for centralized or distributed

Different operations using different protocols: 1.  $R_i(x)$ : Eager Centralized and Lazy Centralized (Assuming  $T_i$  is issued at  $S_B$ , primary copy at  $S_A$ )

- TM<sub>B</sub> requests for S-lock from TM<sub>A</sub>. Blocked if not granted
   Read locally if local copy exists, else sends read to other site

Eager Distributed and Lazy Distributed • If local copy exists, request S-lock locally. Blocked if S-lock not granted. Read

- Send read to other site, say SA. If S-lock granted, value returned from SA

Eager Centralized and Lazy Cnetralized

- $\begin{array}{l} TM_B \text{ requests $X$-lock from $TM_A$. Blocked if not granted} \\ \bullet TM_B \text{ executes $W_i(x)$ and notifies $TM_B$ lock is granted} \\ \bullet If Eager, $TM_B$ executes $W_i(x)$ and sends $W_i(x)$ to $TM_C$. Ignore this step for $W_i(x)$ and $W_i(x)$ to $TM_i(x)$ are the step for $W_i(x)$ and $W_i(x)$ to $TM_i(x)$.} \end{array}$

#### lazy protocol Eager Distributed

- if has local copy, requests for X-lock locally. Blocked if not granted.
- $TM_B$  executes  $W_i(x)$  locally and sends  $W_i(x)$  to  $TM_A$  and  $TM_C$ .
- $TM_A$  and  $TM_C$  grants X-lock and executes  $W_i(x)$ . Blocked if not granted.
- if no local copy, sends  $W_i(x)$  to site with x, say  $S_A$ .  $TM_A$  grants X-lock to execute  $W_i(x)$ .  $TM_A$  notifies  $TM_B$  and sends  $W_i(x)$ to  $TM_C$

#### Lazy Distributed

- ullet if has local copy, requests for X-lock locally and executes  $W_i(x)$  locally. Blocked if not granted.
- if no local copy, sends W<sub>i</sub>(x) to site with x, say S<sub>A</sub>
- $TM_A$  grants X-lock to execute  $W_i(x)$ .

3.  $Commit_i(T)$ :

Eager centralized and Eager distributed run 2PC among the servers involved. Lazy Centralized:

- $TM_B$  sends  $\operatorname{commit}(T_i)$  to  $TM_A$ .  $TM_A$  executes  $\operatorname{commit}(T_i)$  and releases locks for  $T_i$ .
- $TM_A$  checks if X-locks can be granted for  $T_i$ 's refresh txns
- if granted,  $TM_A$  sends refresh txns to other sites to propagate  $T_i$ 's updates. Otherwise propagation of refresh txns is blocked
- Slave sites must ensure refresh txns are applied in the same order using

# commitTS. This is trivial since $TM_A$ should know the commitTS

- if  $TM_B$  executed  $W_i(x)$  locally,  $TM_B$  will execute commit  $TM_B$  releases X-lock for  $T_i$ , and sends  $T_i^T:W_i(x)$  to  $TM_A$  and  $TM_C$
- $TM_A$  and  $TM_C$  each grants X-lock for  $W_i^T(x)$  and executes  $W_i^T(x)$ .
- Important to have reconciliation of inconsistent updates
- Use Las-Write heuristics (aka timestamp order heuristic) to apply updates. Only works for blind-writes
- If 2 concurrent updates  $W_i(x)$  and  $W_i(x)$ ,  $W_i(x)$  wins if  $TS(T_i^r) < TS(T_i^r)$
- $W_i(x)$  will be ignored by TM. This will not work if  $W_i(x)$  is not a blind write.

### Handling failure

- Detect site failures with timeout mechanism
- If slave sites fail:
- Lazy replication: Sync unavailable replicas later when they are available Eager replication: ROWA cannot terminate if one replica is down. Use ROWAA (ROWA Available) to only update available replicas and terminate txn -> sync unavailable replicas when they are available
- If master site fail:
- Wait for master to recover -> bad availability
- Elect new master -> might have split brain problems in the event of network partition
- CAP theorem: When there is network partition, forfeit consistency or availability, can't have both

# Quorum consensus protocl

- $T_r(O) + T_w(O) > Wt(O)$
- $2 \times T_{uv}(O) > Wt(O)$
- To read an object O. acquire S-lock on a read quorum  $Q_r(O)$  where  $Q_r(O) > T_r(O)$ , read all copies in Q and return highest version copy
- To write an object O, acquire X-lock on a write quorum  $Q_w(O)$  where  $Q_w(O) > T_w(O)$ , write all copies in Q and update their version to n + 1
- For a system with n servers to be k-tolerant where k server has failed, w is the weight of each server:
- $-(n-k)w \geq max(T_w(O), T_r(O))$  for the system to be functional
- Solve for n to know the min number of servers for k-tolerant

# Consistency level

In Pileus, we use  ${\bf 2PC}$  commit protocol and distributed SI protocol concurrency control To determine readTS of a txn:

- · Client selects a MART based on the desired consistency level
- Monotonic read: Max commitTS of All previous Get regardless of object in current sesh
- Read-my-writes: Max commitTS of previous put of object in current sesh Causal: Max commitTS of put and get regardless of objects in current sesh
- Eventual: 0 Bounded staleness: realTimeToLogicalTime(client's clock time - realTime)
- Strong: Max CommitTS of latest version of all objects in all sesh
- Get servers that has highTS geq MART(T) of all objects Each object, select the server with lowest latency, if tie then select the server with larger highTS
- readTS = min of all highTS

### End txn commit protocol

- client selects a commit coordinator among participants, where participants are pServers with data updated by txn
- client sends commit req to CC using readTS(txn), Put-set (PS), Largest commit timestamp (LCT) among all PS
- CC updates its localClock = max(localClock, LCT+1), and sends "Prepare-to-commit" with  $PS_i$  to  $P_i$
- P responds with proposedTS and appends (proposedTS, PS) to pending list CC picks largest proposedTS as commitTS(txn), and sends commitTS to all P.
- · P checks commitTS against SI protocol for concurrent updates, responds
- "Vote-to-abort" or "Vote-to-commit"

- CC force-write log before sending "Global-commit" and all PS, or
- non-force-write for "Global-abort. CC informs client that txn has committed.  $\bullet$   $P_i$  processes  $PS_i$  by creating new version of object upon receiving
- Global-commit" and appends to propagate list. Sends "ACK" to CC, removes txn's entry from pending list, asynchronously propagates refresh txn to secondary servers from propragte list.

# Operations blocked by pending txn T' in pServer:

- Get(k) by T if T' has updated k and T''s proposedTS  $\leq$  readTS(T) -> commitTS(T') leq readTS(T)
- both have updated the same key and T''s proposedTS < commitTS(T) -> commitTS(T') leq commitTS(T)
- · Replicating updates of T for propagation, same reasoning as above.

# Raft Consensus algorithm

- 2PC and 2PL use RSM to replicate log files. i.e. when a coordinator crashes in 2PC, we can use RSM to replicate log file to other replicas for fault tolerance. Centralized lock manager maintains a lock table for 2PL, can be replicated for fault tolerance and prevent blocking

- each term starts with election
- server replies RPC with its term and updates its current term number upon receving larger term number

- X.lastLogTerm > Y.lastLogTerm OR
- $\bullet \quad RequestVote(candidateId, term, lastLogIdx, lastLogTerm) \ (term, voteGranted)\\$ • Election timer, Leader Timer, Client Timer: If latency is expected to increase

- RPC.term = R.currentTerm AND R.votedFor = null AND P
- R.votedFor = RPC.candidateId AND RPC.term = R.currentTerm NOTE: If RPC.term > R.currentTerm but  $\neg P$ , then R.currentTerm =RPC.term but R.votedFor = null. These rules ensure leader's log is at least as complete as a majority of servers'
- · Log matching property: 2 entries with same index and term:
- preceding entries are identical
- Volatile states of all servers: commitIdx, lastAppliedIdx; All leaders: nextIdx[],
- AppendEntries(leaderId,leaderTerm,leaderCommit,prevLogIdx,prevLogTerm, entries[]) (term, success)
- set F.currentTerm = leaderTerm if leaderTerm > currentTerm
- (currentTerm,false) so leader can back off and send older logs over
- else, delete conflicting entries and append logs
- commitIdx commitIfx > lastApplied, increment lastApplied by 1 and apply
- · Bules for leaders:
- Only respond to client after commitment and execution of command
- > commitIdx, matchIdx[i] > N and log[N].term = currentTerm • Election safety, Election liveness, Leader Append-Only (never deletes its own logs), Log matching, Leader Completeness, State machine safety(once executed no other servers will apply different log entry at the same index)

# Query optimization

$$\begin{split} SF(\sigma_p(R)) &= \frac{card(\sigma_p(R))}{card(R)} \ SF(R \bowtie S) = \frac{card(R \bowtie S)}{card(R) \times card(S)} \\ SF(R \bowtie S) &= \frac{card(R \bowtie S)}{card(R)} \end{split}$$

Join selectivity estimation  $SF(R \ltimes_A S) \approx \frac{1}{max(card(\pi_A(R)), card(\pi_A(S)))}$ 

# $SF(R \ltimes_A S) \approx SF_{SJ}(S.A) = \frac{card(\pi_A(S))}{|domain(A)|}$

# Optimizing total cost

 $R \ltimes_A S$  removes dangling tuple in R wrt to  $R \bowtie S$ . Beneficial semijoin happens if

Const( $R \times_A S$ ) =  $T_{msg} + T_{tr} \times size(\pi_A(S))$  to send  $\pi_A(S)$  over to site R Benefit( $R \times_A S$ ) =  $T_{tr} \times size(R) \times (1 - SF_{SJ}(S.A))$  Comparable plans

- 2. final operator for both plans is executed at the same site3.
- 3. both plans output are either unordered or sorted in the same order
- 1. basic does not allow for semijoin
- Avoid redundant join and semijoin (every leaf to root path appears once only)
- Vertical pruning such as inter and intra-entry pruning, as comparable plans

- Terms
- · at most one leader can be elected per term
- each server maintains currentTerm, votedFor, log[(index,term,command)]
- Election safety and liveness: each follower can only vote once per term. Some
- leader must eventually be elected, thus election timeout >> broadcast time RPC and Timer
- More complete log: X is more complete than Y
- (X.lastLogTerm = Y.lastLogTerm) AND (X.lastLogIdx > Y.lastLogIdx)
- for i.e. geographical latency, need to increase timer as well
- RequestVote is success iff (P = R's log is not more complete than sender's):
  - RPC.term > R.currentTerm AND P

- store the same command
- Leader only executes committed log. Log is deemed committed if the leader that created it has replicated the log to majority of servers
- matchIdx[]
- F processes AppendEntries if not a heartbeat msg:
- if F's does not contain prevLogIdx and prevLogTerm, reply
- set F.commitIdx = min(leaderCommit, F.lastLogIdx) if leaderCommit >
- Rules for all servers:
- log[lastApplied] to RSM step down to follower if received term > currentTerm
- if AppendEntries is successful, update nextIdx and matchIdx. Otherwise
- decrement nextIdx and resend older entries set commitIdx = N if logs are replicated to majority of server, such that N

$$SF(\sigma_p(R)) = \frac{card(\sigma_p(R))}{card(R)} SF(R \bowtie S) = \frac{card(R\bowtie S)}{card(R) \times card(S)}$$
$$SF(R \bowtie S) = \frac{card(R\bowtie S)}{card(R)}$$

benefit > cost where,

# 1. both plans have the same output schema

- Basic vs Enhanced DP
- 2. enhanced requires more processing to handle semijoin:
- ullet Enumerator extension since left and right operand might not be disjoint
- Fix-point iteration to make plans complete
- may be stored across different optPlan() entries