Fault Tolerant Systems - 1

Slide set 6 Distributed Systems

Graduate Level

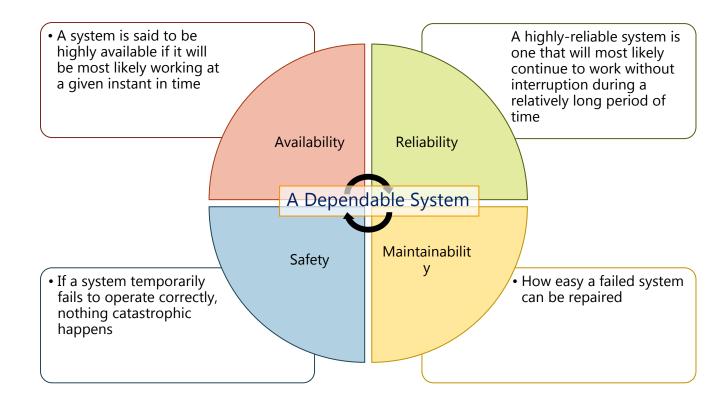
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Fault Tolerant Systems

Concepts

Being fault tolerant is strongly related to what is called a dependable system



- Reliability is defined in terms of a time interval instead of an instant in time
 - A system goes down randomly 1ms every hour
 - System is not reliable
 - System is available 99.999% of times
 - A system is shutdown two weeks a year
 - System is reliable
 - System is available for 96%

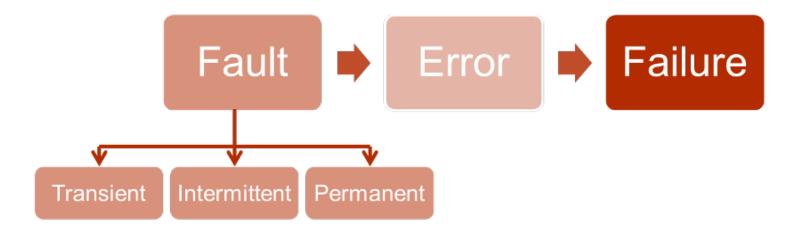
- A system is said to fail when it cannot meet its promises
 - If a distributed system is designed to provide a number of services, it has failed when one or more services cannot be (completely) provided

An error is a part of a system's state that may lead to a failure

Example: receiver receives a erroneous packet

- The cause of an error is called a fault.
 - A crashed software is a failure which is crashes because of programming error. An uninitialized pointer is the fault of this error
- Building dependable systems relates to controlling faults
 - Preventing
 - ► Tolerating
 - Removing
 - Forecasting

- Fault tolerance
 - A system can provide its services even in the presence of faults
 - For erroneous packet, receiver can
 - Request the correct packet from sender
 - Use coding techniques to recover errors
- Fault Types



- Transient faults
 - Occur once and then disappear. If the operation is repeated, the fault goes away
 - Example: losing packet, but sending it again works fine
- Intermittent fault
 - Randomly repeating faults, difficult to diagnose
 - Example: concurrency and thread-interleave issues
- Permanent fault
 - Continues to exist until the faulty component is replaced
 - Example: Burnt-out chips, software bugs

- Partial failures
 - Specific for distributed systems
 - A partial failure may happen when a component in a distributed system fails
- An overall goal in distributed systems is to construct a system in such a way that it can automatically recover from partial failures

- Crash failure
 - Server prematurely halts, but was working correctly until it stopped
 - First solution is reboot!
- Omission failure
 - When a server fails to respond to a request
 - Two types
 - Receive-omission failure: Fail to receive incoming messages
 - Send-omission failure: Fail to send outgoing messages
 - Omission failure: fails to take an action that it should have taken
 - Commission failure: takes an action that it should not have taken.

Timing failure

- When the response lies outside a specified real-time interval
 - Sending data faster than what the client can absorb
 - Server responds too late to a request due to overload known as performance failure

Response failure

- Server response is incorrect, A serious failure
 - Value failure: a server simply provides the wrong reply to a request.
 - A search engine systematically returns web pages not related to any of the search terms
 - State-transition failure: when the server reacts unexpectedly to an incoming request
 - If a server receives an unknown message, a state-transition failure happens if no measures have been taken to handle such messages.

- Arbitrary failures (Byzantine failures)
 - Produce arbitrary responses at arbitrary times
 - ► The most serious failure

- Many of failure models deal with the situation that a process P no longer perceives any actions from another process Q
- Can P conclude that Q has indeed come to a halt?
 - It depends to the type of the distributed system: Synchronous, Asynchronous or Partial-Synchronous

Halting Failures

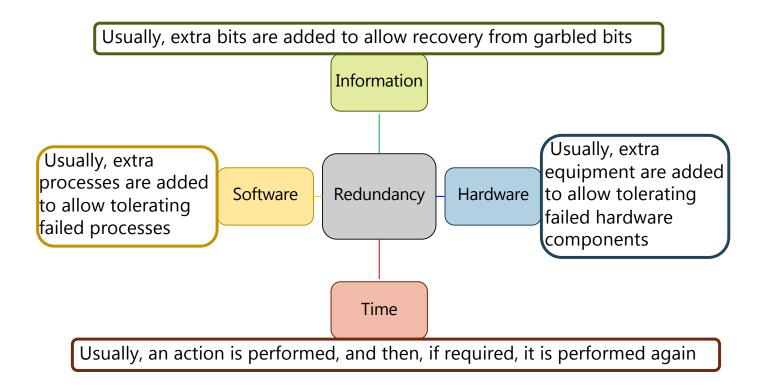
- ► Fail-stop
 - Crash failures that can be reliably detected
 - This may occur when assuming non-faulty communication links and when the failure-detecting process P can place a worst-case delay on responses from Q
- ► Fail-noisy
 - Like fail-stop, but P eventually come to the correct conclusion that Q has crashed
 - Some unknown time in which P's detections of the behavior of Q are unreliable

Halting Failures

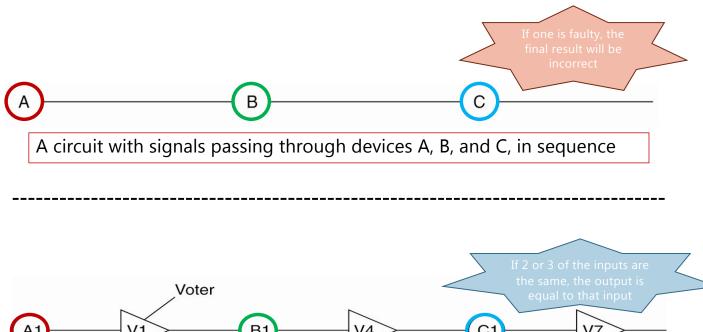
- ► Fail-silent
 - Communication links are nonfaulty, but process P cannot distinguish crash failures from omission failures
- Fail-safe
 - Dealing with arbitrary failures by a process, but these failures are kind: they cannot do any harm
- ► Fail-arbitrary
 - Q may fail in any possible way; failures may be unobservable in addition to being harmful

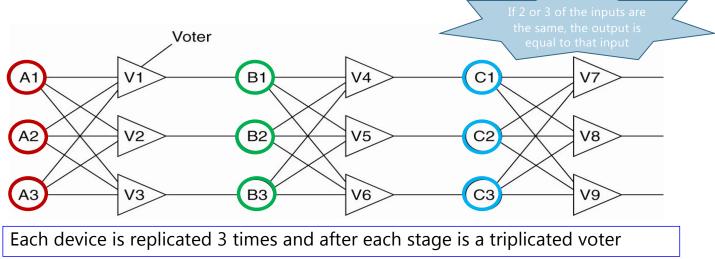
Redundancy

The key technique for masking faults is to use redundancy



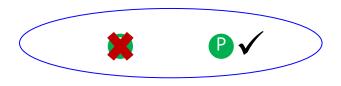
Triple Modular Redundancy Sample





Process Fault Tolerance

- Use Process Redundancy
 - Organize several identical processes into a group
 - Messages received by all members of the group
 - Failure of one to several processes in the group does not halt the whole system



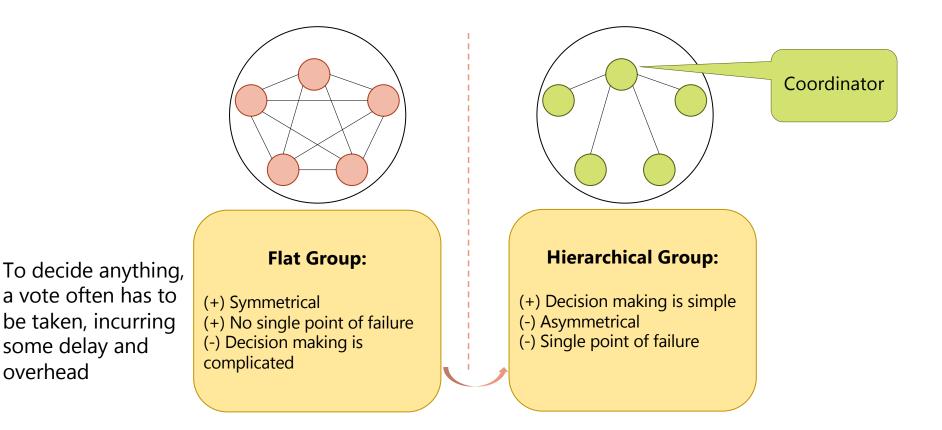
Notes:

- A process can join a group or leave one during system operation
- A process can be a member of several groups at the same time
- Mechanisms are needed for managing groups and group membership.

Process Fault Tolerance

Process Redundancy Models

An important distinction between groups is their internal structure



Group Membership Management

- Central group membership server
 - Easy to implement
 - Has single point of failure problem
- Distributed membership management
 - Servers are added to a multicast group
 - For join, a process can send a membership request to the whole group
 - To leave send a goodbye message to all members
 - In failures, member cannot commit a polite goodbye, other members will have to detect and report to other member groups

Replication Protocols

- Primary-based protocols
- Replicated-write protocols

Replication Protocols

- Primary-based replication
 - Hierarchical group
 - Primary-backup coordinates write operations
 - Needs election algorithms when primary backup fails
- Replicated-write protocols
 - Organize identical processes into a flat group
 - Needs voting for decision (quorum-based)

Replication Protocols

How much replication is sufficient?

k-fault-tolerant system

If a system can survive faults in k components and still meet its specifications

Masking k-failures (k-fault tolerancy)

▶ If faults are crash or omission, then k+1 components is enough

If faults are arbitrary, 2k+1 components is needed. (Why?)

Consensus Problems

Also known as **Agreement Problems**

Consensus Problem

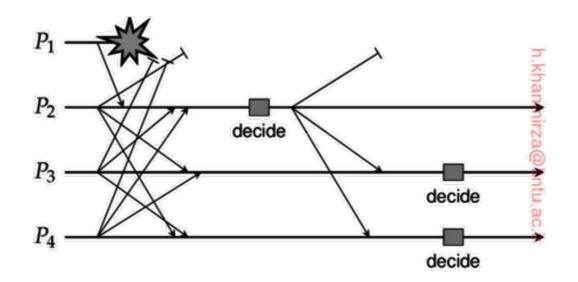
- In a fault-tolerant process group, all non-faulty processes execute the same commands, in the same order
- This means group members need to reach consensus on which command to execute
- Reaching consensus is easy when no failure happen

Flooding Consensus

- Assumes Fail-Stop failures
- Algorithm operates in rounds
- Clients send their proposals to a group of processes P={P₁, P₂,...}
- At each round
 - Processes send their list of commands to all members
 - All processes merge all lists
 - All processes run a similar sorting algorithm, then all processes select the same command
 - Processes received commands from all others, broadcast their decision to others

Flooding Consensus Example

- P_1 crashes, but before crash it sends its list. P_2 receives the list but P_3 , P_4 do not receive the list
- P₃ detects P₁ failure but does not know if others have detected the failure or not
- P_3 knows that if other process has received P_1 list it will decide and send the decision to all
- \triangleright P₃, P₄ do nothing, but P₂ do the decision and its decision to all
- In the next round, P_3 and P_4 can decide based on P_2 list



Flooding Consensus

This model works for fail-stop failures even with only one working process

• What if P_3 could not detect the failure of the P_1 for sure?

Distributed Commit

Distributed System Algorithms Properties

Liveness

- In all conditions algorithms reaches a steady state
- Safety
 - In all conditions with any input, algorithm does not violate initial assumptions

Distributed Systems, KNTU

Distributed Commit

- A set of operations should be performed by all group members or none at all
- All processes should execute operations in the same order
- The problem first was encountered in database systems
 - Suppose a database system is updating some complicated data structures that include parts residing on more than one machine.
- Assumptions:
 - Concurrent processes and uncertainty of timing, order of events and inputs (asynchronous systems)
 - Failure and recovery of machines/processors, of communication channels

One-phase Distributed Commit

- A coordinator (= primary) sends an operation(s) to all participants (= backups)
- Each participant executes the operation
- The simplest Solution
- ► Problem:
 - No way to report back the failure of execution to coordinator!

Fault Tolerant Systems

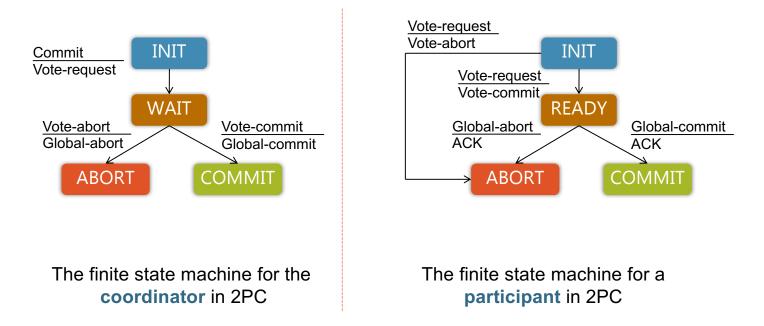
Distributed Commit

- Phase 1: prepare phase
- Phase 2: commit phase

- Phase 1: prepare (voting) phase
 - A: Coordinator asks participants if they can execute the operation (VOTE-REQUEST)
 - B: Participants reply
 - VOTE-COMMIT: if they can execute operation
 - VOTE-ABORT: if they cannot execute the operation

- Phase 2: commit (decision) phase
 - A: coordinator collects all votes
 - Sends GLOBAL-COMMIT: if all participants agree.
 - Sends GLOBAL-ABORT: if even one participant not agree.
 - B: Each participant
 - Commits locally if receive GLOBAL-COMMIT
 - Aborts transaction locally if receive GLOBAL-ABORT

Distributed Commit



- Looking to finite state machine of coordinator and participants, they have three waiting states.
- To avoid forever blocking, both use timeouts

- Blocking 1: participants waiting for receiving VOTE-REQUEST
 - After timeout, participants send VOTE-ABORT message
- Blocking 2: coordinator waits for vote replies
 - After some time if not all votes collected, it sends GLOBAL-ABORT message.

Fault Tolerant Systems

Distributed Commit

Distributed Commit – 2PC

- Blocking 3: participants in ready state wait for coordinator reply
 - Participants cannot decide by themselves!
 - Simple Solution: Block until coordinator reboot and recover
 - Cooperative protocol: ask other participants
 - If the other is in COMMIT state \rightarrow do commit
 - If the other is in ABORT state \rightarrow do abort
 - If the other is in INIT state \rightarrow do abort
 - The other node didn't receive vote-request message, or coordinator has crashed before sending to it
 - If the other is in READY state \rightarrow contact another participant! (may block)

Distributed Commit – 2PC

- Blocking 3: participants in ready state wait for coordinator reply (cont.)
 - Cooperative protocol: ask other participants (cont.)
 - If the other is in READY state \rightarrow contact another participant! (may block)
 - If all are ready:
 - Since some of participants may crash which was received COMMIT/ABORT command
 - If it reboots and it will be in commit state
 - Other participants must wait for coordinator or this participant, but how long should they wait?
 - If it never restarted?

Distributed Commit – 2PC

To ensure recovery, coordinator and participants must log their state in disk.

PC is blocking commit protocol

- Blocking 3 scenario
- If one or more machines fail (we need all to reply)
- 2PC is safe but not live.

Distributed Commit

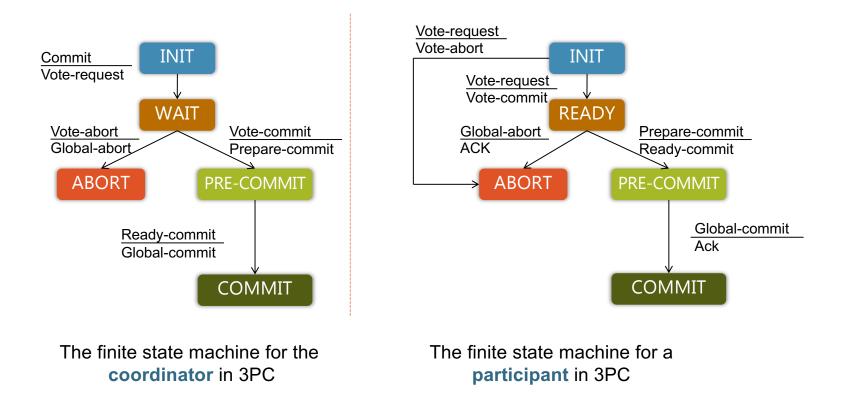
- Avoids blocking processes in the presence of fail-stop crashes
- It is not applied often in practice as the conditions under which 2PC blocks occur rarely
- Phase 1: prepare phase
- Phase 2: pre-commit phase
- Phase 3: commit phase

- Phase 1: prepare phase
 - A: Coordinator asks participants if they can execute the operation VOTE-REQUEST
 - B: Participants reply
 - VOTE-COMMIT: if they can execute operation
 - VOTE-ABORT: if they cannot execute the operation

- Phase 2: pre-commit phase
 - A: coordinator collects all votes
 - Sends PREPARE-COMMIT: if all participants agree
 - Sends GLOBAL-ABORT: if even one participant not agree
 - B: Each participant
 - Send READY-COMMIT if receive PREPARE-COMMIT

- Phase 3: commit phase
 - A: coordinator collects all READY-COMMIT messages
 - Sends GLOBAL-COMMIT: if all participants are prepared
 - B: Each participant
 - Commit locally if receive GLOBAL-COMMIT

Distributed Commit



- ► We skip the blocking scenarios similar to 2PC
- Blocking 1: coordinator is blocked in PRE-COMMIT
 - One or more processes have crashed, but they have voted for commit

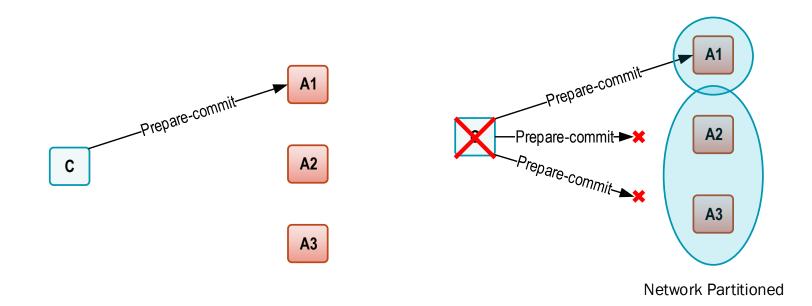
 -> coordinator sends GLOBAL-COMMIT
 - Crashed participator can be recovered by a recovery protocol, later.

- Blocking 2: Participant blocked in READY or PRE-COMMIT.
 - This means coordinator has failed, then contacts with other participants
 - If in COMMIT \rightarrow commit
 - If in PRE-COMMIT \rightarrow commit
 - If in INIT \rightarrow abort (because no participant reached to PRE-COMMIT)
 - If (majority) in READY \rightarrow abort
 - A participant is crashed but no one knows what was the state of the crashed participant
 - If it recovers to INIT then it was aborted
 - If it was recovered to PRE-COMMIT, nothing harmful may be done
 - This situation is the major difference with 2PC. In 3PC no crashed participant may recover to COMMIT, thus they can come to agreement

- Liveness: it always makes progress
- ► Safety: No!
- 3PC results in inconsistent state between replicas when network is partitioned.
- > 3PC trades safety for liveness

Distributed Commit

- ► Safety:
 - C after sending prepare-commit, crashes and network is partitioned
 - ► A1 commits but, A2 and A3 will abort



Distributed Commit

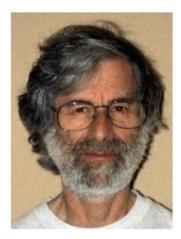
FLP Impossibility

- Impossibility of distributed consensus with one faulty process
 - FLP Fischer-Lynch-Paterson (FLP) M.J. Fischer, N.A. Lynch, and M.S. Paterson, Journal of the ACM, 1985.
- What FLP says: you cannot guarantee both safety and progress when there is even a single fault at an inopportune moment to reach a consensus.
- What FLP does not say: in practice, how close can you get to the ideal.



- Solving 2PC Problems
 - We should not rely on all participants \rightarrow we can use majority vote
 - Having one coordinator is a real issue \rightarrow Add more coordinators
- This makes Paxos algorithm!

- 1979, 2PC, Gray
- 1981, 3PC, Stonebraker
- 1989, 42-page tech report
- 1990, "Part-time Parliament"
 - Paper rejected, ACM Transactions on Computer Systems
 - It was not considered a useful algorithm
- 1996, First implementation
- 1997, Used in Frangipani Distributed Lock
- 1998, Paper resubmitted and accepted TOCS
 - ► Won ACM SIGOPS Hall of Fame Award in 2012!
- 2001, "Paxos Made Simple", Lamport
- 2007, "Paxos Made Live", Chandra
- 2014 RAFT appears

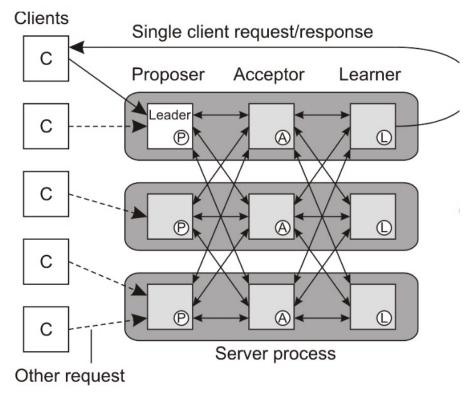


- Paxos is everywhere
 - Yahoo's ZooKeeper (Now an Apache project)
 - Google's Chubby (Distributed Lock)
 - Frangipani (Distributed lock service)
 - Amazon Web Services uses Paxos
 - Windows Fabric, used by many of the Azure services, make use of the Paxos algorithm for replication between nodes in a cluster
 - Neo4j HA graph database implements Paxos, replacing Apache ZooKeeper used in previous versions.
 - Apache Mesos uses Paxos algorithm for its replicated log coordination

▶ ...

- Assumptions
 - The distributed system is partially synchronous
 - Communication is unreliable, messages may be lost, duplicated, or reordered
 - Corrupted messages can be detected
 - All operations are deterministic, once an execution is started, it is known exactly what it will do.
 - Processes may exhibit fail-noisy failures, but not arbitrary failures, nor do processes collude

- Paxos lets all nodes agree on an operation despite node failures, network failures and delays
- Paxos works correctly when less than N/2 nodes fail



- A single machine (server) has three components
- Proposer
 - Handles clients' request
 - Suggest proposals for acceptors
- Acceptor
 - Receives proposals
 - Accepts or reject proposals
- Learner
 - Learns the operation chosen by majority
- When one of these components crashes, server is considered as crashed

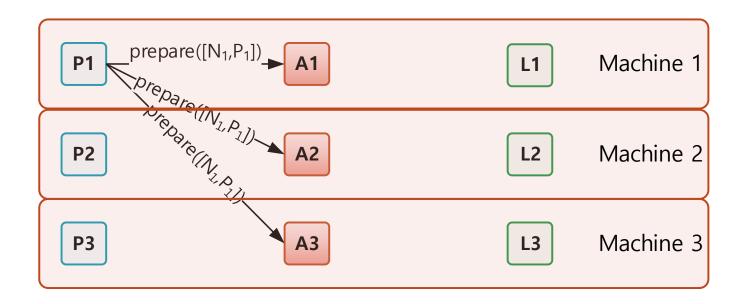
- A clients requests an operation
- Proposers receive and handle requests of clients one at a time
- A Proposer creates a proposal and sends to acceptors
- If majority of acceptors accept the same proposal, it is said to be chosen.

- Multiple proposers and Multiple acceptors
- It is possible proposers never get the vote of majority
- Solution: Let several proposals is accepted by acceptors
- How acceptors distinguish proposals from each other?
- Tag each proposals with a unique number (=N)
 - Each proposer generates a unique number never has generated before
- Proposals are tagged with (proposerID, N) pair as Proposal Number

- The proposer with the highest proposal number is the leader proposer
 - Paxos embeds a Distributed Leader Election process with proposal numbers that are, in fact, Lamport logical clock
- The proposal with the highest proposal number will have the majority
- ► Or
- Acceptors always choose (agree with) the operation with the highest proposal number
- If another proposer transmit a proposal with any higher number than the current chosen proposal, becomes the leader or its proposal is chosen.

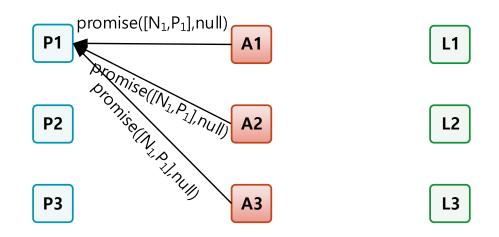
- Detailed Algorithm
- Phase 1a prepare phase
- Phase 1b promise phase
- Phase 2a accept phase
- Phase 2b accepted phase

- Phase 1a prepare phase
- A proposer, P selects a proposal number N and sends a prepare request with number (N_i, P_i) to majority of acceptors

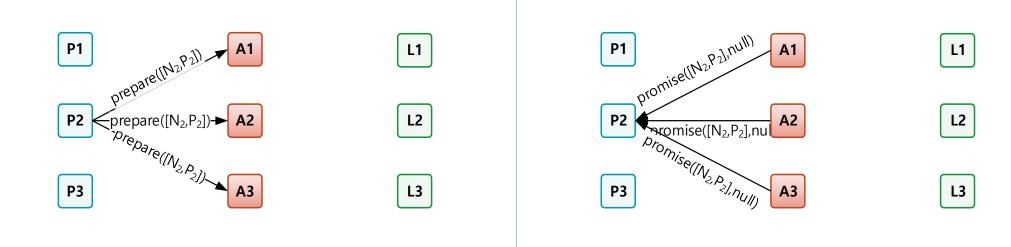


- Phase 1b promise phase
- If an acceptor receives (N_i, P_i)
 - If this is the first proposal, sends promise to the proposer
 - Has promised to proposal (N_j, P_j)
 - If (N_i,P_i) < (N_j,P_j), acceptor sends promise with number (N_j,P_j), the highest-numbered proposal it has accepted so far
 - For optimization no of messages, acceptor may not reply
 - If (N_i, P_i) > (N_j, P_j), acceptor promises P_i, sends a promise with number (N_i, P_i)
 - It promises not to accept any proposal with number less than (N_i, P_i)

- Phase 1b promise phase
 - There is no accepted operation to be announced, they return null.
 - ► P₁ is leader



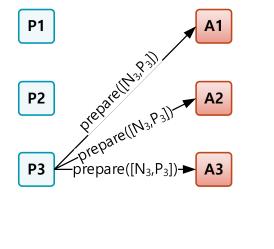
► $N_2 > N_1$ → Now P2 is Leader



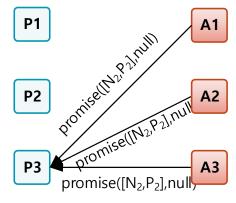
Fault Tolerant Systems

Paxos

 \triangleright N₃ < N₂







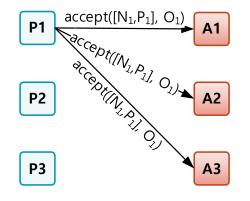


- Phase 2a accept phase
- If a proposer receives corresponding promises from a majority of acceptors:
 - It sends an accept request to each of those acceptors for a proposal numbered (N_i,P_i) with operation P, which is the operation of the highest-numbered proposal among the responses
- Otherwise, aborts and starts again with a new proposal number

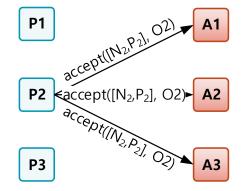
Fault Tolerant Systems

Paxos

Phase 2a - accept phase



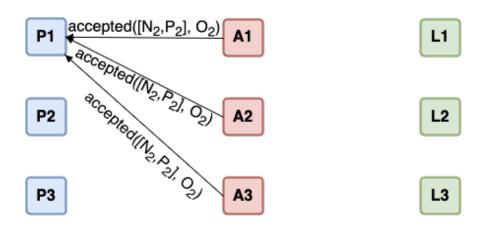
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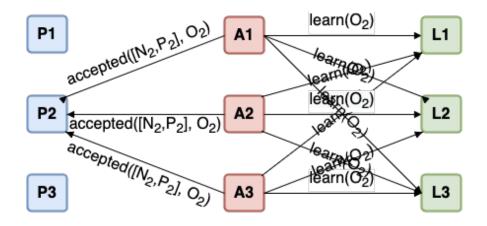
- Phase 2b accepted phase
- An acceptor has promised to proposal (N_i, P_i)
 - If receives an accept request numbered (N_i, P_i) sends accepted message
 - If receives an accept request numbered (N_j, P_j) sends accepted with the accepted number and its operation
- Acceptor accepts the accept request if its proposal no. is the highest proposal no. it have agreed to

- Phase 2b accepted phase
 - Acceptors tell P₁, they have accepted another proposer
 - P₁ may retry

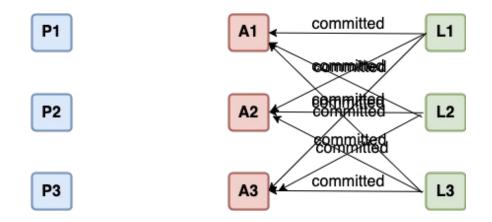


Phase 2b - accepted phase

- After sending accepted, acceptors talk with learners about their decision
- Learners commit if they receive the same operation from majority of acceptors



- Phase 2b accepted phase
 - Learners acknowledge acceptors about their commit
 - When Acceptors received enough committed, start a new cycle



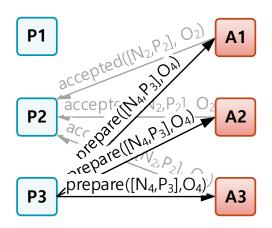
- Phase 2b accepted phase
- What if a new proposal received with higher number than what has accepted, before learn?
- The proposal is accepted if the operation is the same as any previously accepted proposal!

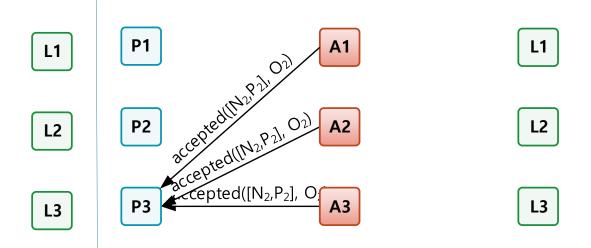
- Once a proposal with operation P is chosen by majority,
 - No new operation will accepted, until the chosen operation get completed
 - If the operation on the highest-numbered proposal has not completed, no new operation can be proposed
 - Every higher-numbered proposal that is chosen also must propose P

The goal is reaching a consensus, it is not important which value is eventually accepted.

- Phase 2b accepted phase
 - What if new proposal received by acceptors before completion of learn with higher proposal no.?

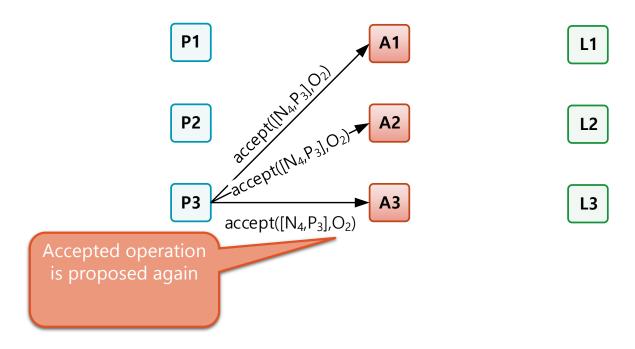
► N₄>N₂



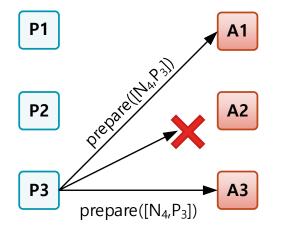


- Phase 2b accepted phase
 - What if new proposal received by acceptors before completion of learn with higher proposal no.?

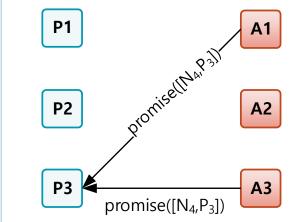
► N₄>N₂



► A faulty scenario (1)

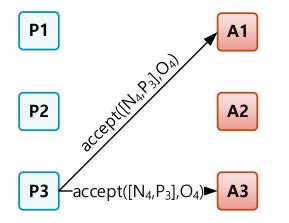


L1
L2
L3

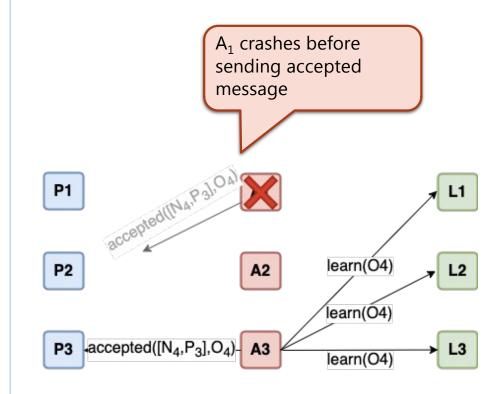


	L1]
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► A faulty scenario (2)



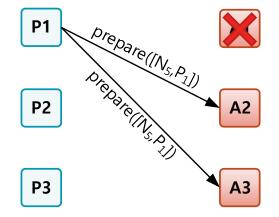


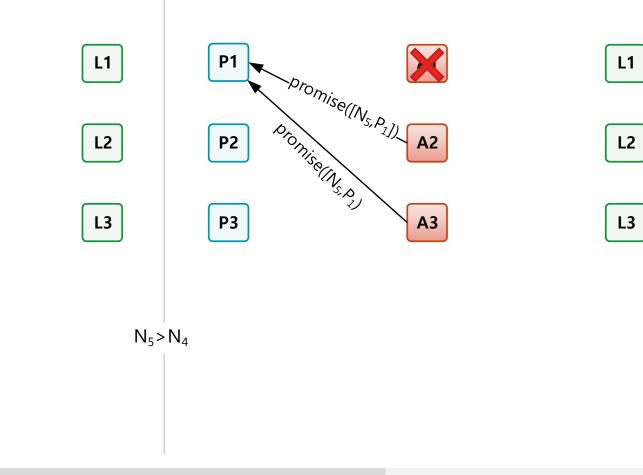


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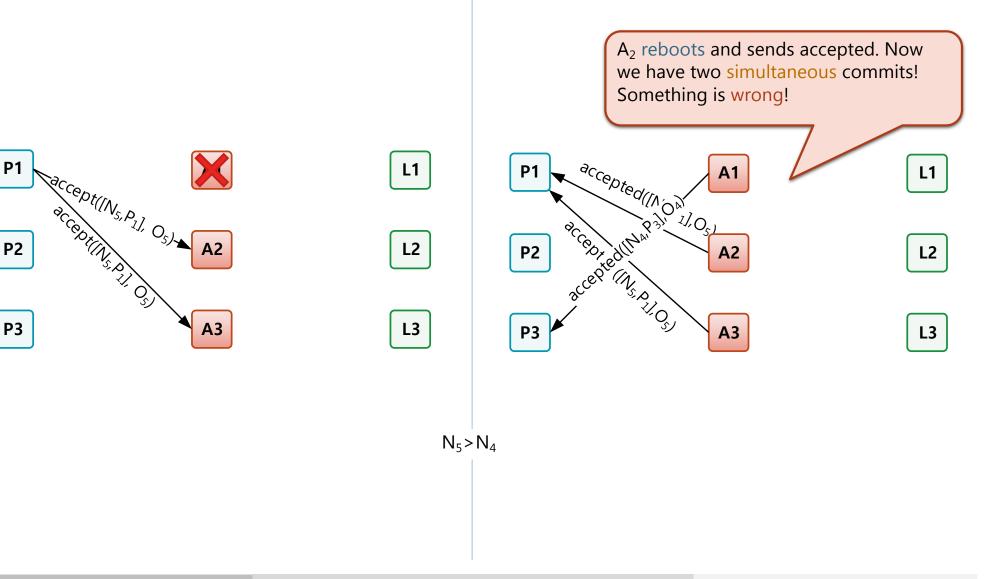
Paxos

► A faulty scenario (3)

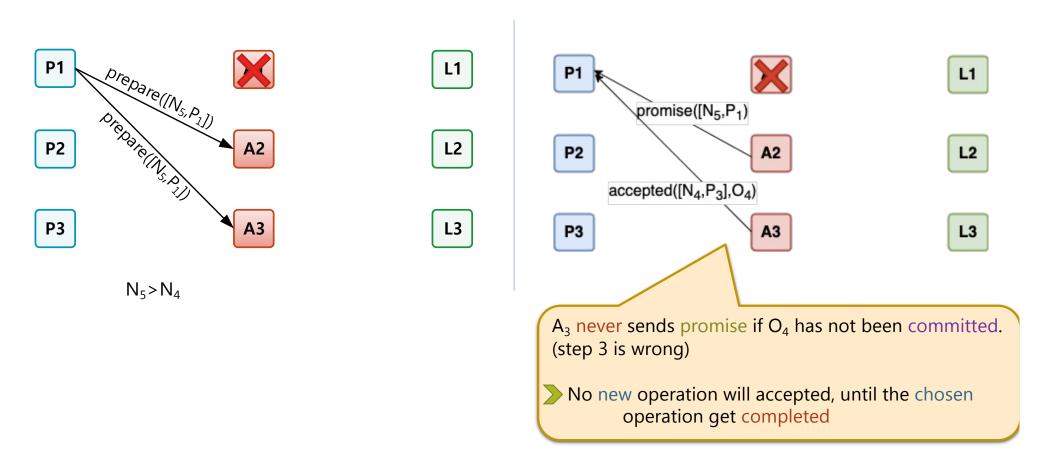




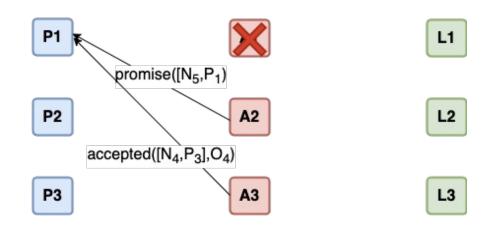




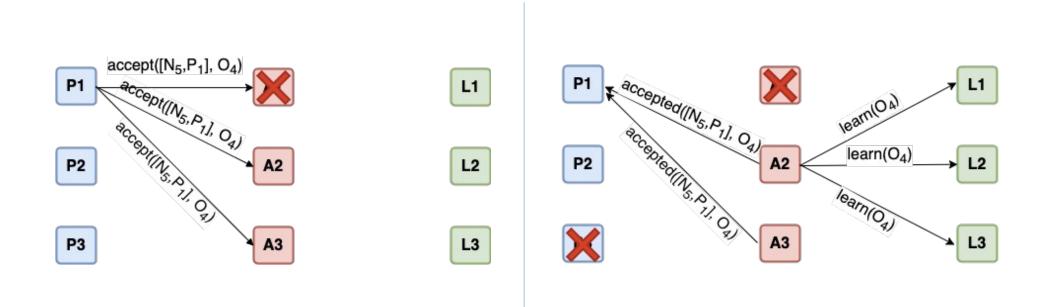
- ► A faulty scenario (3-2)
 - correct version
- After a while A₁ reboots and sends accepted and operation continues



- A faulty scenario
- What if A₁ crash and does not reboot again or it doesn't remember its previous choice?



- A faulty scenario
- ▶ P1 retries with the O₄ operation!!



Think about other bad conditions:

- What if leader fails
 - Before sending accept
 - After sending accept
 - To send accept to majority of acceptors
 - To send accept to some of acceptors (not majority)
- What if a node fails after receiving accept?
 - ▶ If it doesn't restart …
 - ▶ If it reboots …
- What if a node fails after sending promise?
 - ► If it reboots …

- Safety Property
 - Only an operation that has been proposed may be accepted.
 - Only a single operation is chosen
 - An learner learns an operation that has been chosen

- Liveness Property (= Termination)
 - If two or more proposers race to propose new values, they might step on each other toes all the time.
 - P1: prepare(n1)
 - ► P2: prepare(n2)
 - P1: accept(n1 , v1)
 - P1: prepare(n3)
 - P2: accept(n2 , v2)
 - ► P2: prepare(n4) , ….
 - ▶ n1 < n2 < n3 < n4 <…
 - With randomness, this occurs exceedingly rarely.

To read a client must ask several nodes and choose the value of majority

Paxos Issues

- Difficult to understand
- "The dirty little secret of the NSDI* community is that at most five people really, truly understand every part of Paxos ;-)."— NSDI viewer
- Very difficult to implement
- "There are significant gaps between the description of the Paxos algorithm and the needs of a real-world system...the final system will be based on an unproven protocol." – Chubby Authors

Designing for Understandability: The Raft Consensus Algorithm

RAFT

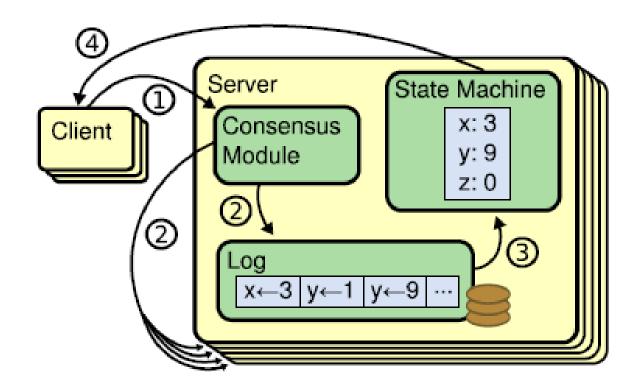
Replicated State Machine

- Each command from a client changes the state of a replica
- Each replica maintains a log of events
- Replicas apply events in the log to update their state
- Log Consensus
- All replicas must agree on the order of events in the log
- Consensus algorithm (i.e. Paxos) ensures that all logs contain the same commands in the same order
- Replicated log => Replicated State Machine

RAFT

Distributed Log

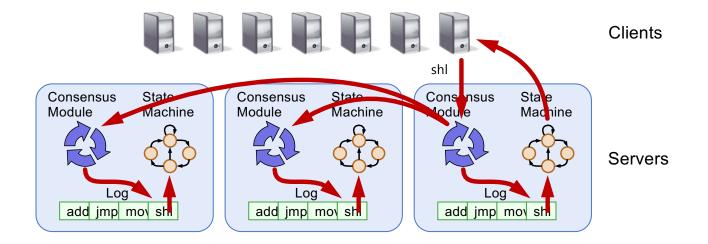
- State machines always execute commands in the log order
- They will remain consistent as long as command executions have deterministic results





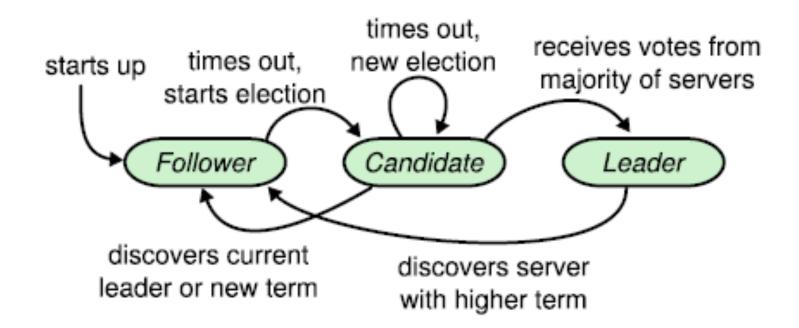
Overview

- Client sends a command to one of the servers
- Server adds the command to its log
- Server forwards the new log entry to the other servers
- Once a consensus has been reached, each server state machine process the command and sends it reply to the client

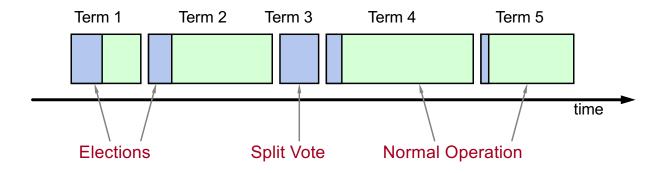


- RAFT assumes starts with electing one leader
- Each server can be in one of three states
 - Leader
 - ► Follower
 - Candidate (to be the new leader)
- Raft guarantees at a given time only one leader exists

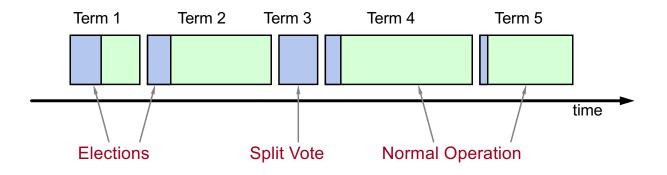
- Leader transmits heartbeats
- If Election-Timeout elapses followers start the election process



- Time is divided into Terms
- A term may has
 - ▶ no leader \rightarrow election / split vote
 - one leader \rightarrow normal operation



- Term is like logical clock
- Followers
 - maintain current Term, to identify obsolete info
 - include in all messages
 - update the term if receive a higher value



Leader Election Process

- When a follower starts an election, it
 - Increments its current term
 - Transitions to candidate state
 - Votes for itself
 - Issues RequestVote RPCs to all the other servers in the cluster.
- A candidate remains in that state until
 - It wins the election
 - Another server becomes the new leader
 - A period of time goes by with no winner, backs off with random interval
- Candidate receive the majority of votes become leader
- Each server will vote for at most one candidate in one term
- Winner sends heartbeat messages to all others

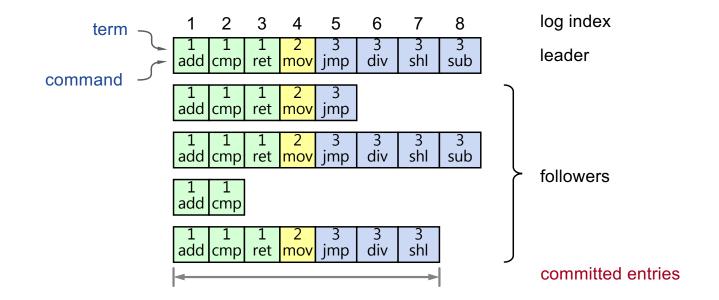
Log Replication

Leaders

- Accept client commands
- Append them to their log (new entry)
- Issue AppendEntry RPCs in parallel to all followers
- Followers record the log and acknowledge the leader
- Leader commits (updates the state machine) if majority acknowledged
 - Re-issue the command for slow servers, no problem!
- Heartbeats and subsequent messages include the index of last committed log
- Committing an entry also commits all previous entries

Log Structure

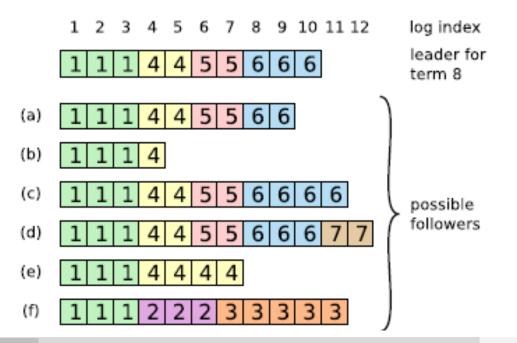
- Log entry = { index, term, command }
- Log stored on stable storage (disk); survives crashes
- Entry committed if known to be stored on majority of servers
 Durable & stable, will eventually be executed by state machines



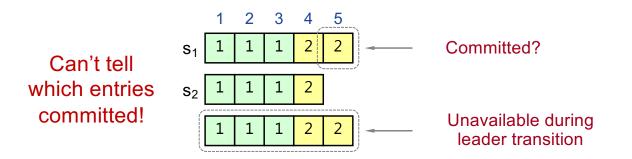
Log Structure

- Raft commits entries in strictly sequential order
 - No gap is accepted
- If log entries on different server have same index and term:
 - Store the same command
 - Logs are identical in all preceding entries
- Entry committed if known to be stored on majority of servers
 - Durable & stable, will eventually be executed by state machines

- Can leave the cluster in a inconsistent state if the old leader had not fully replicated a previous entry
- Some followers may have in their logs entries that the new leader does not have
- Other followers may miss entries that the new leader has



Elect candidate most likely to contain all committed entries

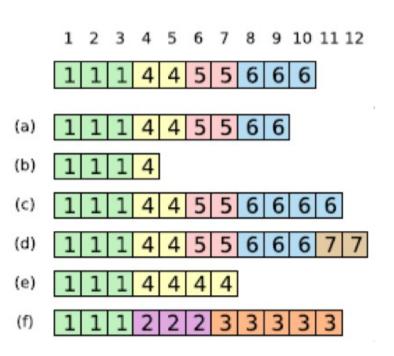


In RequestVote, candidates include {index,term} of last log entry

- Vote for candidate unless
 - Their own log is more "up to date" (higher term-longer log)
 - They have already voted for another server
- Leader will have "most complete" log among electing majority

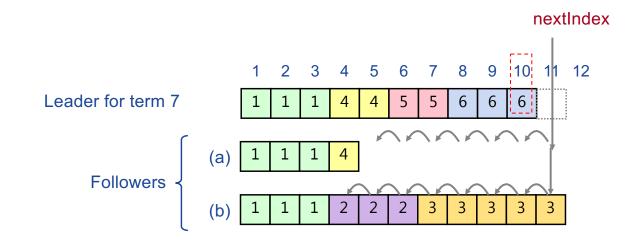
- New leader forces followers' log to duplicate its own
- Conflicting entries in followers' logs will be overwritten

- New leader sets its nextIndex to the index just after its last log entry (11 in the example)
- Broadcasts it to all its followers



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RAFT
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- Leader maintains a nextIndex for each follower
 - Index of entry it will send to that follower
- Followers that have missed some AppendEntry calls will refuse all further AppendEntry calls
- Leader will decrement its nextIndex for that follower and redo the previous AppendEntry call



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