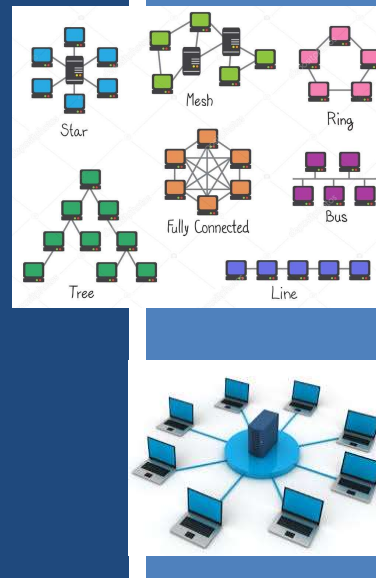


# TCSS 558: APPLIED DISTRIBUTED COMPUTING

## Chapter 6: Coordination

## Consensus Algorithms Chapter 7: Consistency and Replication

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## OBJECTIVES

- Homework 2
- Extra Credit Assignment Posted
- Ch. 6 – Coordination
  - 6.2 Logical clocks, Lamport clocks, Vector clocks
  - 6.3 Distributed mutual exclusion
  - 6.4 Election algorithms
- RAFT Consensus algorithm
- Chapter 7 Consistency and Replication

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## EXTRA CREDIT – 20 PTS (FINAL)

- Write up to be posted - Available until Friday 03/22 @ 11:59pm
- Review TCSS 562 Tutorial #4:
- [http://faculty.washington.edu/wlloyd/courses/tcss562/tutorials/TCSS562\\_f2018\\_tutorial\\_4.pdf](http://faculty.washington.edu/wlloyd/courses/tcss562/tutorials/TCSS562_f2018_tutorial_4.pdf)
- Choose one resource: CPU, memory, disk, or network
- Develop original AWS Lambda service in Java using the FaaS Inspector framework with performance bound by CPU, memory, disk, or network
- Run partestcpu.sh script on laptop, or ec2 instance with <=4 vCPUs
  - `./partestcpu.sh 100 100`
- Capture output using the “parTestCpu.sh script” and paste into a spreadsheet (xlsx)
- Verify that the number of containers is 100 (last row of output)
- Modify your service until it is sufficiently resource bound to achieve 100 containers with single partestcpu.sh 100 100 script run
- Submit spreadsheet, and Java project source code

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## HOMEWORK 2 UPDATE

- Extension to Thursday 3/14 @ 11:59pm
- Please use extra time to ensure support for multithreading and concurrency
- More time to implement extra credit membership tracking methods
- 5 points extra credit for providing Maven build files (pom.xml)

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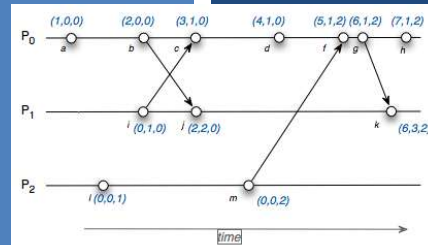
## SHORT-HAND-CODES FOR MEMBERSHIP TRACKING APPROACHES

- Include readme.txt or doc file with instructions in submission
- Must document membership tracking method
- **S-1:** Static file membership tracking only = 0 pts
- **T-1:** TCP membership tracking only = +5 pts (*should be dynamic once servers point to membership server*)
- **U-1:** UDP membership tracking only = +10 pts (*automatically discovers nodes with no configuration*)
- **S+T-2:** Static file + TCP membership tracking = +15 pts (*Static file is not reread to refresh membership during operation*)
- **S+U-2:** Static file + UDP membership tracking = +15 pts (*Static file is not reread to refresh membership during operation*)
- **SD+T-2:** Static file + TCP membership tracking = +20 pts (*Static file is periodically reread to refresh membership during operation*)
- **SD+U-2:** Static file + UDP membership tracking = +20 pts (*Static file is periodically reread to refresh membership during operation*)
- **T+U-2:** TCP + UDP membership tracking = 20 pts (*both dynamic*)

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## CH. 6.2: LOGICAL CLOCKS

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## ORDERING EVENTS IN DISTRIBUTED SYSTEMS

- To order events across nodes (processes), using NTP to synchronize clocks is one approach
- But using monotonically increasing event counters (e.g. logical clocks) may be easier and sufficient to order events
- We would like to understand two conditions:
- Are events causally related?
  - Event A causally happens before event B
- Or are events considered concurrent?
  - Happening at the same time

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## WHAT IS CAUSALITY?

- If an event A causally happens before another event B, then  $\text{timestamp}(A) < \text{timestamp}(B)$
- When entering a house, must first unlock the door
  - Event (A): Unlocking the door
  - Event (B): Enter the house
  - Unlocking the door happens before entering the house
- You receive a letter, after it has been sent
  - Event (A): Letter has been sent
  - Event (B): Letter is received
  - Letter being sent happens before letter being received

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## CAUSALITY

The diagram shows three horizontal timelines for processes  $P_1$ ,  $P_2$ , and  $P_3$ . Events are marked as dots on these timelines. Causal relationships are shown as blue arrows:

- $P_1$ : A, B, C, D, E
- $P_2$ : E, F, G
- $P_3$ : H, I, J

Arrows indicate the following causal paths:

- $A \rightarrow B$
- $B \rightarrow F$
- $F \rightarrow G$
- $G \rightarrow D$
- $D \rightarrow E$
- $E \rightarrow J$
- $H \rightarrow E$
- $I \rightarrow G$

■ What are the causal relationships on the graph?

- $A \rightarrow B$
- $B \rightarrow F$
- $A \rightarrow F$
- $H \rightarrow G$
- $F \rightarrow J$
- $H \rightarrow J$
- $C \rightarrow J$
- $I \rightarrow G$  ?
- $H \rightarrow G$  ?
- $C \rightarrow G$  ?
- $B \rightarrow G$  ?

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## WHAT ARE CONCURRENT EVENTS?

- A pair of concurrent events doesn't have a causal path from one event to another
- Lamport timestamps or vector clocks are not guaranteed to be ordered or unequal for concurrent events
- Clock values from different processes can't be compared
- The clock values may suggest that one event "happens before" another, but because they are from different processes they can't be trusted...

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CONCURRENT EVENTS

■ Are these relationships causal or concurrent?

- $C \rightarrow F?$
- $3 == 3$

- $H \rightarrow C$
- $1 < 3$

- $H \rightarrow F?$
- $B \rightarrow F?$

H & C appear concurrent

Don't know how long delivery of B to P2 takes.

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CONCURRENT EVENTS

■ Are the

- $C \rightarrow$
- $3 =$

Simply having a local time stamp less than the time stamp of another process does not guarantee causality

Here for  $H \rightarrow C$  the events are concurrent

$F?$

$F?$

ow how

very of B

es.

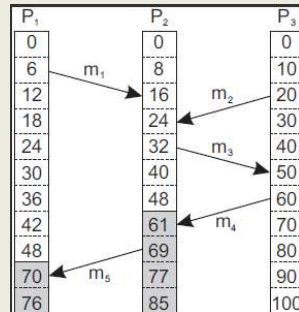
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## CAUSALITY - 2

- Consider the messages:



- P2 receives m1, and subsequently sends m3
- Causality:** Sending m3 may depend on what's contained in m1
- P2 receives m2, receiving m2 is **not** related to receiving m1
- Is sending m3 causally dependent on receiving m2? YES**

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## VECTOR CLOCKS

- Lamport clocks (global sense of logical time) does not help to determine causal ordering of messages
- Vector clocks incorporate local time and support capturing causal histories and offer an alternative

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## VECTOR CLOCKS - 2

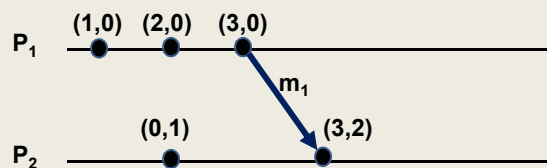
- Vector clocks keep track of causal history
- If two local events happened at process P, then the causal history  $H(p2)$  of event p2 is {p1,p2}
- P sends messages to Q (event p3)
- Q previously performed event q1
- Q records arrival of message as q2
- Causal histories merged at Q  $H(q2) = \{p1,p2,p3,q1,q2\}$
- Fortunately, can simply store history of last event, as a vector clock  $\rightarrow H(q2) = (3,2)$
- Each entry corresponds to the last event at the process

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## VECTOR CLOCKS - 3



- Each process maintains a vector clock which
  - Captures number of events at the local process (e.g. logical clock)
  - Captures number of events at all other processes
- Causality is captured by:
  - For each event at P<sub>i</sub>, the vector clock (VC<sub>i</sub>) is incremented
  - The msg is timestamped with VC<sub>i</sub>; and sending the msg is recorded as a new event at P<sub>i</sub>
  - P<sub>j</sub> adjusts its VC<sub>j</sub> choosing the max of: the message timestamp -or- the local vector clock (VC<sub>j</sub>)

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VECTOR CLOCKS - 4

- $P_j$  knows the # of events at  $P_i$  based on the timestamps of the received message
- $P_j$  learns how many events have occurred at other processes based on timestamps in the vector
- These events “*may be causally dependent*”
- In other words: they may have been necessary for the message(s) to be sent...

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VECTOR CLOCKS EXAMPLE

Is  $m_4$  causally dependent on  $m_2$ ? YES

CAUSALITY

Local clock is Underlined

$ts(m_2)$	$ts(m_4)$	$ts(m_2) < ts(m_4)$	$ts(m_2) > ts(m_4)$	Conclusion
(2,1,0)	(4,3,0)	Yes	No	$m_2$ may causally precede $m_4$

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## VECTOR CLOCKS EXAMPLE - 2

**Is  $m_4$  causally dependent on  $m_2$ ?**

$ts(m_2)$	$ts(m_4)$	$ts(m_2) < ts(m_4)$	$ts(m_2) > ts(m_4)$	Conclusion
(4,1,0)	(2,3,0)	No	No	$m_2$ and $m_4$ may conflict

- $P_3$  can't determine if  $m_4$  may be causally dependent on  $m_2$
- **Is  $m_4$  causally dependent on  $m_3$  ? YES**

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## VECTOR CLOCKS - 5

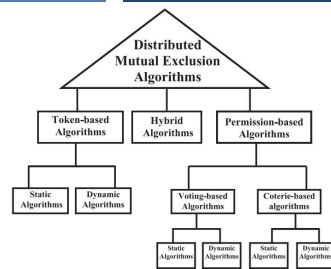
- **Disclaimer:**
- Without knowing actual information contained in messages, it is not possible to state with certainty that there is a causal relationship or perhaps a conflict
- Vector clocks can help us suggest possible causality
- We never know for sure...

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## CH. 6.3: DISTRIBUTED MUTUAL EXCLUSION



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## DISTRIBUTED MUTUAL EXCLUSION ALGORITHMS

- Coordinating access among distributed processes to a shared resource requires **Distributed Mutual Exclusion**
- Algorithms in 6.3
- Token-ring algorithm
- Centralized algorithm
- Distributed algorithm (Ricart and Agrawala)
- Decentralized voting algorithm (Lin et al.)

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## TOKEN-BASED ALGORITHMS

- Mutual exclusion by passing a “token” between nodes
- Nodes often organized in ring
- Only one token, holder has access to shared resource
- Avoids starvation: ***everyone gets a chance to obtain lock***
- Avoids deadlock: easy to avoid

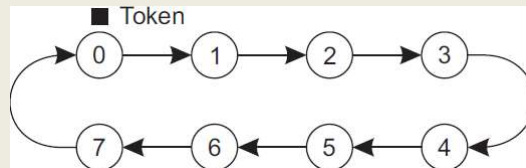
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## TOKEN-RING ALGORITHM

- Construct overlay network
- Establish logical ring among nodes



- Single token circulated around the nodes of the network
- Node having token can access shared resource
- If no node accesses resource, token is constantly circulated around ring

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## TOKEN-RING CHALLENGES

1. If token is lost, token must be regenerated
  - **Problem:** may accidentally circulate multiple tokens
2. Hard to determine if token is lost
  - What is the difference between token being lost and a node holding the token (***lock***) for a long time?
3. When node crashes, circular network route is broken
  - Dead nodes can be detected by adding a receipt message for when the token passes from node-to-node
  - When no receipt is received, node assumed dead
  - Dead process can be “jumped” in the ring

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## DISTRIBUTED MUTUAL EXCLUSION ALGORITHMS - 3

- **Permission-based algorithms**
- Processes must require permission from other processes before first acquiring access to the resource
  - **CONTRAST:** Token-ring did not ask nodes for permission
- **Centralized algorithm**
- Elect a single leader node to coordinate access to shared resource(s)
- Manage mutual exclusion on a distributed system similar to how it mutual exclusion is managed for a single system
- Nodes must all interact with leader to obtain ***“the lock”***

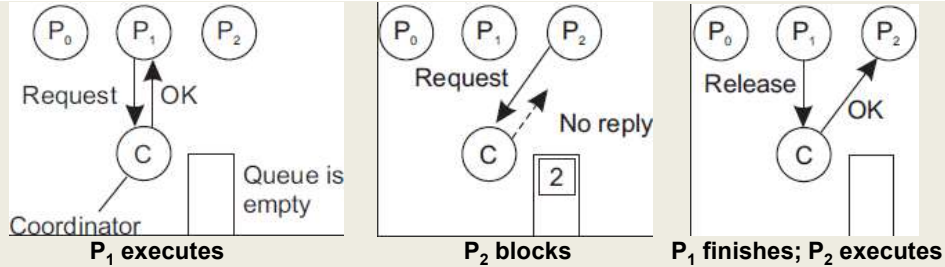
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## CENTRALIZED MUTUAL EXCLUSION

Permission granted from coordinator     $\vee$     No response from coordinator



- When resource not available, coordinator can block the requesting process, or respond with a reject message
- $P_2$  must poll the coordinator if it responds with reject otherwise can wait if simply blocked
- Requests granted permission fairly using FIFO queue
- Just three messages: (request, grant, release)

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## CENTRALIZED MUTUAL EXCLUSION - 2

- Issues
  - Coordinator is a single point of failure
  - Processes can't distinguish dead coordinator from "permission denied"
    - No difference between CRASH and Block (*for a long time*)
  - Large systems, coordinator becomes performance bottleneck
    - Scalability: Performance does not scale
- Benefits
  - Simplicity:  
Easy to implement compared to distributed alternatives

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## DISTRIBUTED ALGORITHM

- Ricart and Agrawala [1981], use total ordering of all events
  - Leverages Lamport logical clocks
- Package up resource request message (AKA Lock Request)
- Send to all nodes
- Include:
  - Name of resource
  - Process number
  - Current (logical) time
- Assume messages are sent reliably
  - No messages are lost

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## DISTRIBUTED ALGORITHM - 2

- When each node receives a request message they will:
  1. Say OK (*if the node doesn't need the resource*)
  2. Make no reply, queue request (*node is using the resource*)
  3. Perform a timestamp comparison (*if node is waiting to access the resource*), then:
    1. Send OK if requester has lower logical clock value
    2. Make no reply if requester has higher logical clock value
- Nodes sit back and wait for all nodes to grant permission
- Requirement: every node must know the entire membership list of the distributed system

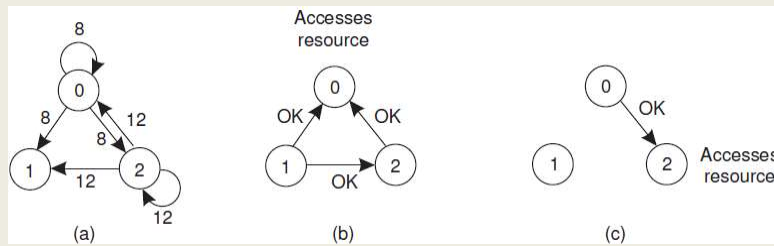
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## DISTRIBUTED ALGORITHM - 3

- If Node 0 and Node 2 simultaneously request access
- Node 0's time stamp is lower (8) than Node 2 (12)
- Node 1 and Node 2 grant Node 0 access
- Node 1 is not interested in the resource, it OKs both requests



- **In case of conflict, lowest timestamp wins!**
- As seen in step (c)

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## CHALLENGES WITH DISTRIBUTED ALGORITHM

- **Problem:** Algorithm has N points of failure !
- Where N = Number of Nodes in the system
- **Problem:** When node is accessing the resource, it does not respond
  - Lack of response can be confused with **failure**
  - **Possible Solution:** When node receives request for resource it is accessing, always send a reply either granting or denying permission (ACK)
  - Enables requester to determine when nodes have died

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## CHALLENGES WITH DISTRIBUTED ALGORITHM - 2

- **Problem:** Multicast communication required –or- each node must maintain full group membership
  - Track nodes entering, leaving, crashing...
- **Problem:** Every process is involved in reaching an agreement to grant access to a shared resource
  - This approach may not scale on resource-constrained systems
- **Solution:** Can relax total agreement requirement and proceed when a simple majority of nodes grant permission
  - Presumably any one node locking the resource prevents agreement
- Distributed algorithm for mutual exclusion works best for:
  - Small groups of processes
  - When memberships rarely change

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## DECENTRALIZED ALGORITHM

- Lin et al. [2004], decentralized voting algorithm
- Resource is replicated N times
- Each replica has its own coordinator
- Accessing resource requires majority vote:  
Votes from  $m > N/2$  coordinators
- **Assumption #1:** When coordinator does not give permission to access a resource (because it is busy) it will inform the requester

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## DECENTRALIZED ALGORITHM - 2

- **Assumption #2:** When a coordinator crashes, it recovers quickly, but will have forgotten votes before the crash.
- Approach assumes coordinators reset arbitrarily at any time
- **Risk:** on crash, coordinator forgets it previously granted permission to the shared resource, and on recovery it errantly grants permission again
- **The Hope:** if coordinator crashes, *upon recovery, the node granted access to the resource has already finished before the restored coordinator grants access again . . .*

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## DECENTRALIZED ALGORITHM - 3

- Even with conservative probability values, the chance of violating correctness is **so low** it can be neglected in comparison to other types of failure
- Leverages fact that a new node must obtain a majority vote to access resource, **which requires time**

N	m	p	Violation
8	5	3 sec/hour	$< 10^{-15}$
8	6	3 sec/hour	$< 10^{-18}$
16	9	3 sec/hour	$< 10^{-27}$
16	12	3 sec/hour	$< 10^{-36}$
32	17	3 sec/hour	$< 10^{-52}$
32	24	3 sec/hour	$< 10^{-73}$

N	m	p	Violation
8	5	30 sec/hour	$< 10^{-10}$
8	6	30 sec/hour	$< 10^{-11}$
16	9	30 sec/hour	$< 10^{-18}$
16	12	30 sec/hour	$< 10^{-24}$
32	17	30 sec/hour	$< 10^{-35}$
32	24	30 sec/hour	$< 10^{-49}$

**N** = number of resource replicas, **m** = required "majority" vote

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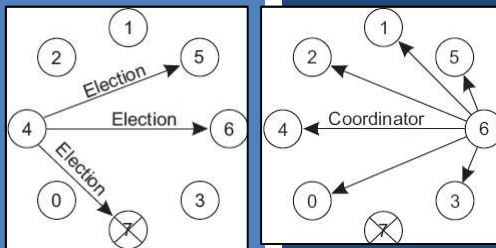
## DECENTRALIZED ALGORITHM - 4

- **Back-off Polling Approach for *permission-denied*:**
- If permission to access a resource is denied via majority vote, process can poll to gain access again with a **random** delay (***known as back-off***)
- If too many nodes compete to gain access to a resource, majority vote can lead to low resource utilization
  - ***No one can achieve majority vote to obtain access to the shared resource***
- Problem Solution detailed in [Lin et al. 2014]

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## CH. 6.4: ELECTION ALGORITHMS

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## ELECTION ALGORITHMS

- Many distributed systems require one process to act as a coordinator, initiator, or provide some special role
- Generally any node (or process) can take on the role
  - In some situations there are special requirements
  - Resource requirements: compute power, network capacity
  - Data: access to certain data/information
- Assumption:
  - Every node has access to a “node directory”
  - Process/node ID, IP address, port, etc.
  - Node directory may not know “current” node availability
- Goal of election: at conclusion all nodes agree on a coordinator

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## ELECTION ALGORITHMS

- Consider a distributed system with N processes (*or nodes*)
- Every process has an identifier  $id(P)$
- Election algorithms attempt to locate the highest numbered process to designate as coordinator
- Algorithms:
  - Bully algorithm
  - Ring algorithm
  - Elections in wireless environments
  - Elections in large-scale systems

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## BULLY ALGORITHM

- When any process notices the coordinator is no longer responding to requests, it initiates an election
- Process  $P_k$  initiates an election as follows:
  1.  $P_k$  sends an ELECTION message to all processes with higher process IDs ( $P_{k+1}, P_{k+2}, \dots P_{N-1}$ )
  2. If no one responds,  $P_k$  wins the election and becomes coordinator
  3. If one of the higher-ups answers, it takes over and runs the election.
- When the higher numbered process receives an ELECTION message from a lower-numbered colleague, it responds with "OK", indicating it's alive, and it takes over the election.

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## BULLY ALGORITHM - 2

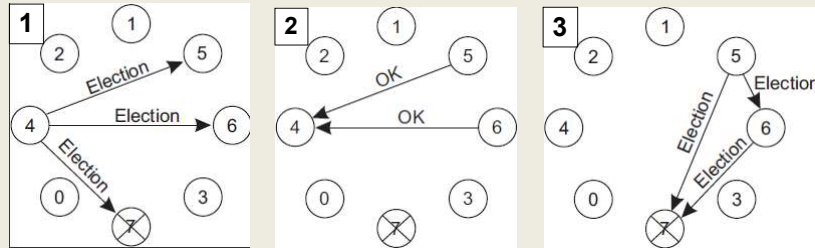
- The higher numbered process then holds an election with only higher numbered processes (nodes).
- Eventually all processes give up except one, and the remaining process becomes the new coordinator.
- The coordinator announces victory by sending all processes a message stating it is starting as the coordinator.
- If a higher numbered node that was previously down comes back up, it holds an election, and ultimately takes over the coordinator role.
- The process with the "*biggest*" ID in town always wins.
- Hence the name, bully algorithm

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## BULLY ALGORITHM - 3



**[1]** Process 4 holds an election

**[2]** Process 5 and 6 respond

**[3]** Process 5 and 6 each hold an election

**[4]** Process 6 tells Process 5 to stop

**[5]** Process 6 wins and tells everyone

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## BULLY SUMMARY

- Every node knows who is participating in the distributed system
  - Each node has a group membership directory
- First process to notice the leader is offline launches a new election
- GOAL: Find the highest number node that is running
  - Loop over the nodes until the highest numbered node is found
  - May require multiple election rounds
- Highest numbered node is always the **"BULLY"**

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## RING ALGORITHM

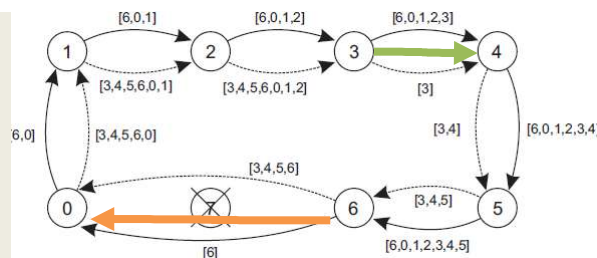
- Election algorithm based on network of nodes in a logical ring
- *Does not use a token*
- Any process ( $P_k$ ) starts the election by noticing the coordinator is not functioning
  1.  $P_k$  builds an **election message**, and sends to its successor
    - If successor is down, successor is skipped
    - Skips continue until a running process is found
  2. When the **election message** is passed around, each node adds its ID to a **separate active node list**
  3. When **election message** returns to  $P_k$ ,  $P_k$  recognizes its own identifier in the **active node list**. Message is changed to COORDINATOR and “**elected( $P_k$ )**” message is circulated.
    - Second message announces  $P_k$  is the NEW coordinator

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## RING: MULTIPLE ELECTION EXAMPLE



- **PROBLEM:** Two nodes start election at the same time:  $P_3$  and  $P_6$
- $P_3$  sends **ELECT( $P_3$ )** message,  $P_6$  sends **ELECT( $P_6$ )** message
  - $P_3$  and  $P_6$  both circulate ELECTION messages at the same time
- Also circulated with ELECT message is an **active node list**
- Each node adds itself to the **active node list**
- Each node votes for the highest numbered candidate
- $P_6$  wins the election because it's the candidate with the **highest ID**

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## ELECTIONS WITH WIRELESS NETWORKS

- Assumptions made by traditional election algorithms not realistic for wireless environments:
  - Message passing is reliable
  - Topology of the network does not change
- A few protocols have been developed for elections in ad hoc wireless networks
- Vasudevan et al. [2004] solution handles failing nodes and partitioning networks.
  - Best leader can be elected, rather than just a random one

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## VASUDEVAN ET AL. WIRELESS ELECTION

1. Any node (source) (P) starts the election by sending an ELECTION message to immediate neighbors (any nodes in range)
2. Receiving node (Q) designates sender (P) as parent
3. (Q) Spreads election message to neighbors, but not to parent
4. Node (R), receives message, designates (Q) as parent, and spreads ELECTION message, but not to parent
5. Neighbors that have already selected a parent immediately respond to R.
  - If all neighbors already have a parent, R is a leaf-node and will report back to Q quickly.
  - When reporting back to Q, R includes metadata regarding battery life and resource capacity
6. Q eventually acknowledges the ELECTION message sent by P, and also indicates the most eligible node (based on battery & resource capacity)

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## WIRELESS ELECTION - 2

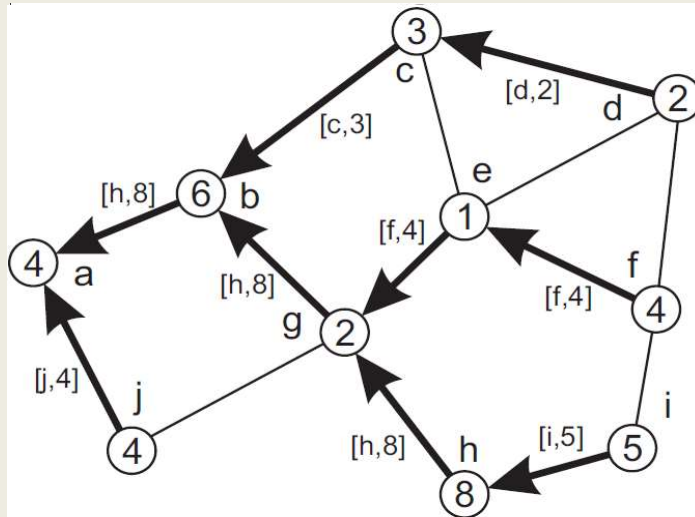
### SOURCE NODE: [A]

Node [A]  
initiates election

Election messages  
propagated to all  
nodes

Each node reports  
to its parent node  
with best capacity

Node A then  
facilitates Node H  
becoming leader



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## WIRELESS ELECTION - 3

- When multiple elections are initiated, nodes only join one
- Source node tags its ELECTION message with unique identifier, to uniquely identify the election.
- With minor adjustments protocol can operate when the network partitions, and when nodes join and leave

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## ELECTIONS FOR LARGE-SCALE SYSTEMS

- Large systems often require several nodes to serve as coordinators/leaders
- These nodes are considered **“super peers”**
- **Super peers** must meet operational requirements:
  1. Network latency from normal nodes to super peers must be low
  2. Super peers should be evenly distributed across the overlay network (ensures proper load balancing, availability)
  3. Must maintain set ratio of super peers to normal nodes
  4. Super peers must not serve *too many normal nodes*

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## ELECTIONS FOR DHT BASED SYSTEMS

- DHT-based systems use a bit-string to identify nodes
- **Basic Idea:** Reserve fraction of ID space for super peers
- The first  $\log_2(N)$  bits of the key identify super-peers
- $m$ =number of bits of the identifier
- $k$ =# of nodes each node is responsible for (Chord system)
- **Example:**
  - For a system with  $m=8$  bit identifier, and  $k=3$  keys per node
  - Required number of super peers is  $2^{(k - m)} \cdot N$ , where  $N$  is the number of nodes
    - In this case  $N=32$
    - **Only 1 super peer is required for every 32 nodes**

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## SUPER PEERS IN AN M-DIMENSIONAL SPACE

- Given an overlay network, the idea is to position superpeers throughout the network so they are evenly disbursed
- Use tokens:
- Give N tokens to N randomly chosen nodes
- No node can hold more than (1) token
- Tokens are “repelling force”. Other tokens move away
- All tokens exert the same repelling force
- This automates token distribution across an overlay network

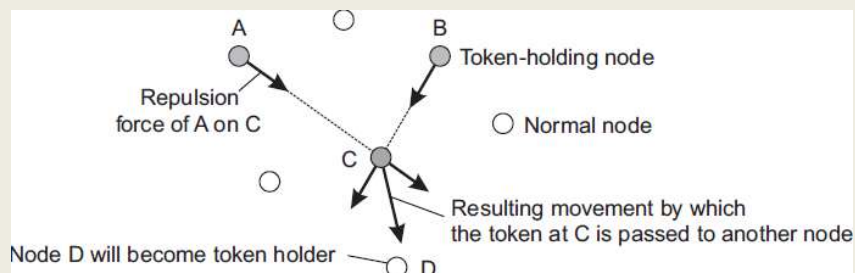
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## OVERLAY TOKEN DISTRIBUTION

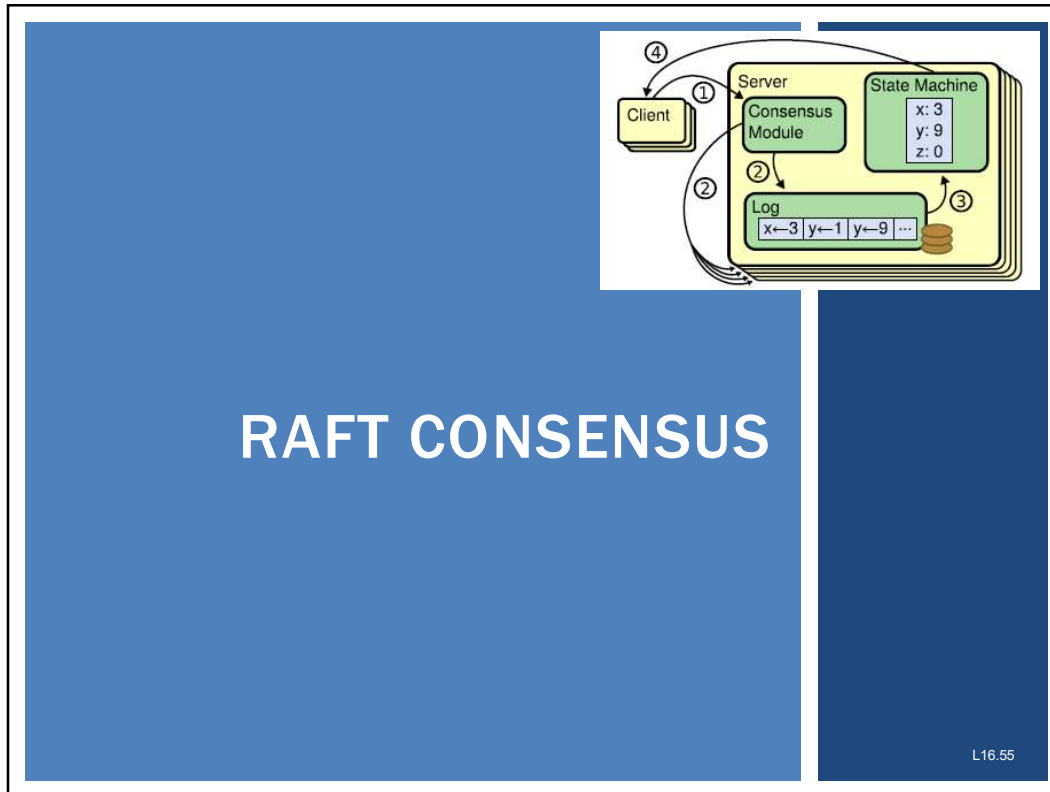
- Gossiping protocol is used to disseminate token location and force information across the network
- If forces acting on a node with a token exceed a threshold, token is moved away
- Once nodes hold token for awhile they become superpeers



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## CONSENSUS IN DISTRIBUTED SYSTEMS

- **Paxos** Algorithm (originally published in 1989)
- Original algorithm by Leslie Lamport (logical clocks) for consensus
- **Single decree Paxos**: supports reaching agreement on a single decision
  - To agree on contents of a single log entry
- **Multiple decree Paxos**: use multiple instances of the protocol to facilitate series of decisions such as a log
- Ensures safety and liveness
- Changes in cluster membership
- Has been proven “correct” (e.g. via proofs)

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## PAXOS DRAWBACKS

- As reported by the inventors of RAFT . . .
  - *Diego Ongaro and John Ousterhout from Stanford University*
- Exceptionally difficult to understand
- Most descriptions focus on single-decree version
- Survey at the 2012 USENIX Symposium (UNIX Users Group, Advanced Computing Systems Association)
  - Few seasoned researchers comfortable with Paxos
  - Understanding typically requires reading multiple papers

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## PROBLEMS WITH PAXOS

- Problem 1: Single Decree Paxos
  - Two stages
  - Lacks simple intuitive explanation
  - Hard to understand why the “single-decree” protocol works
  - Used for agreement on just one log entry
- Problem 2: Lacks foundation for building practical implementation
  - No widely agreed upon algorithm for multi-Paxos
    - Multi decree for agreement on an entire log file
  - Lamport’s multi-Paxos description has missing detail
    - Mostly focused on single decree

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## PROBLEMS WITH PAXOS - 2

- Other attempts to flesh out details are divergent from Lamport's own sketches
- **Problem 3:** Paxos architecture is poor for building practical systems
- Paxos' notion of consensus is for a single log entry
- Consensus approach can be designed around a sequential log
- **Problem 4:** Paxos approach uses a symmetric peer-to-peer approach vs. a leader-based approach
  - Works when just (1) decision
  - Having a leader simplifies making multiple decisions

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## RESULTING PROBLEMS

- Implementations of Paxos typically diverge as each develops a different architecture for solving the difficult problem(s) of implementing Paxos
- Paxos formulation is good for proving theorems about correctness, but challenging to use for implementing real systems
  - Though it has been used a fair bit
  - See paper: Consensus in the Cloud: Paxos Systems Demystified
- Observation: significant gaps between the description of the algorithm and the needs of a real-world system, result in final systems based on divergent, unproven protocols

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## DESIGN GOALS FOR RAFT

- Complete and practical foundation for building systems
  - Reduce design work for developers
- Safe under all conditions
- Efficient for common operations
- **UNDERSTANDABLE**
  - So Raft can be implemented and extended as needed in real world scenarios

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## DESIGN GOALS FOR RAFT - 2

- Raft decomposes consensus into sub-problems:
  - **Leader election:** leader election algorithms adjustable
  - **Log replication:** leader accepts log entries and coordinates replication across cluster enforcing log consensus
  - **Safety:** if any state machine applies a log entry, then no other server can apply a different log entry for the same log index
  - **Membership changes:** must migrate from old-configuration to new-configuration in a coordinated way

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## DESIGN GOALS FOR RAFT - 3

- Simplify the state space
- Reduce the number of states to consider
- Make system more coherent
- Eliminate non-determinism
- LOGS not allowed to have holes
- Limit ways logs can be inconsistent

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## RAFT ALGORITHM BASICS

- Begins by electing a leader
- Leader manages log replication
- LEADER ACTIVITIES
  - Accepts log entries from other nodes
  - Replicates them on other servers
  - Tells nodes when safe to apply log entries to their state machines (KV store)
  - Leader can make decisions without consulting others
  - Data flows from leader → to nodes
  - When leader fails, a new leader is elected

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## RAFT BASICS - 2

- Server states: leader, (\*)follower, candidate
  - (\*) – initial state of every node is follower
- Nodes redirect all requests to the leader
- Candidate server in a leader election
  - Server with most votes wins election, becomes leader
  - Other nodes become followers
  - Each candidate sponsors its own election, and solicits votes
  - More than one candidate can be conducting an election at the same time

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## TERMS

- Raft divides time into TERMS of arbitrary length
- Terms are numbered with consecutive integers
- Terms start with an election (term # is incremented)
- If election results in a **SPLIT VOTE**, term ends, and a **new term** is started with an election
- There is only (1) Leader in any given term
- Terms act as a logical clock
- Each server stores current term number
- Terms are exchanged in communication

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## TERMS - 2

- If a larger term # is found, then all nodes update term # and defer to the term's leader
  - If candidate or leader finds its term is out of date, will immediately become a follower node
- If server receives request with stale term #, then request is rejected

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## RAFT METHODS

- Implemented as “RPCs”, but can be implemented as TCP stream by marshalling data inputs/outputs
- RequestVote()
  - Initiated by candidates during an election
- AppendEntriesToLog()
  - Sent by leaders to follower nodes at regular intervals
  - Used as a heartbeat to maintain leadership
  - Provides log updates to nodes
  - Performs consistency checks
- Commands are retried if no response after timeout
- Commands sent in parallel using multiple threads (performance)

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## RAFT ELECTIONS

- Every node has a randomized ElectionTimeout value
- If a node (**follower**) receives no heartbeat from the **leader** after the timeout, node expects the **leader** has gone offline
- **NEW ELECTION:**
- (1) The node **begins a new election** as **candidate**, sending RequestVote() to every node in the system
  - **Candidate** immediately votes for itself
  - RequestVote() sent in parallel to all nodes
- (2) Follower votes for **first candidate** a RequestVote() is received from **only if the candidate's log is at least (or more) up-to-date**
  - Inspect **candidate** provided last log index and log term values
- (3) If **candidate** obtains a majority of the votes (*determined by calculating majority total from node directory*) **it wins the election!!!**

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## ELECTIONS - 2

- **Election outcomes**
- A – **Candidate** wins
- B – Another server establishes leadership
- C – There is no winner
- Servers vote for only one **candidate**
- Only (1) winner per election
- Only (1) **leader** per term
  - “Election safety property”
- New **leader** sends empty heartbeat to nodes to establish leadership

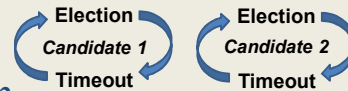
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## ELECTIONS - 3

- While a **candidate** waits for votes, it may receive an **AppendEntries()** call from another **leader**
  - If the **leader's** term  $\geq$  **candidate's** term then the **candidate** concedes the election and returns to **Follower** state
- If multiple elections, then no one **candidate** may receive a majority vote. One election times out **first** based on a randomized-election-timeout value
  - Random timeout values help spread out the **candidates** to prevent endless looping
- **KEY IDEA:** by using random timeouts, when no majority vote occurs, a random node times out first and starts a new election before anyone else by incrementing the term #, and sending RequestVote()



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## ELECTIONS - 4

- Randomized timeout values should be reset every time
- Paper suggests a min timeout of 150ms, and max of 300ms
- Timeout should be “an order of magnitude” greater (10x) than the node-to-node communication latency
  - *I'm presently using 500 - 1000ms*
- Can experiment with different values

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## ELECTIONS - 5

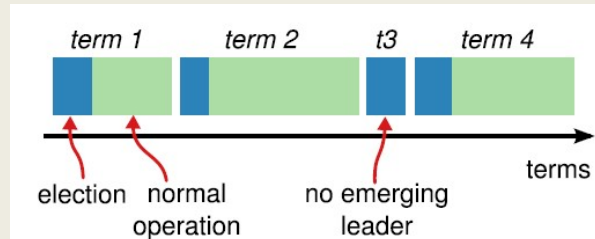
- RAFT enforces leader logs to be up-to-date during an election
- Nodes **ONLY** vote for a candidate **\*if\*** :
  - **Candidate** local term and log number  $\geq$  **follower**
  - Candidate's log **\*must be\*** at least as up-to-date as the majority of follower's log
- **MORE up-to-date log is defined as log with:**
  - Higher term # in last log entry
  - --- OR ---
  - When term of last log entries match, log with more entries
  - *E.g. longer log*

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## TYPICAL ELECTION SEQUENCE



- Term 1: normal election
- Term 2: normal election
- Term 3: SPLIT VOTE, no **leader** emerges, election times out
- Term 4: normal election

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## RAFT SAFETY

**Election Safety:** at most one leader can be elected in a given term. §5.2

**Leader Append-Only:** a leader never overwrites or deletes entries in its log; it only appends new entries. §5.3

**Log Matching:** if two logs contain an entry with the same index and term, then the logs are identical in all entries up through the given index. §5.3

**Leader Completeness:** if a log entry is committed in a given term, then that entry will be present in the logs of the leaders for all higher-numbered terms. §5.4

**State Machine Safety:** if a server has applied a log entry at a given index to its state machine, no other server will ever apply a different log entry for the same index. §5.4.3

- Raft guarantees that each of these properties is always true

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## LOG REPLICATION

- Leader receives commands forwarded from followers
- Ways logs can diverge
  - (a) Follower may be missing entries present on leader
  - (b) Follower may have extra entries not present on the leader
  - (c) Both A and B
- Because raft uses a “coordinator” node to achieve consensus the number of possible ways logs can diverge is limited
- Raft leaders **FORCE** followers logs to match its own
- Conflicting entries in follower logs are overwritten

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## LOG REPLICATION - 2

- **FOR THE WHOLE SYSTEM THERE IS JUST ONE MONOTONICALLY INCREASING LOG INDEX**
  - Akin to Lamport's Clocks
- **Possible *follower* states at start of new term**
  - (a) Missing entries
  - (b) Extra uncommitted entries
  - (c) Both

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## RAFT - LOG REPLICATION ALGORITHM

- **Leader:**
  1. Receives command(s)
  2. Appends commands to local log (concurrent hash table)
  3. Sends AppendEntries() to **followers**
- **Leader** tracks index of its highest committed log entry
- Provides this index to **followers** in AppendEntries() RPC
- **Leader commit to state machine:**
  - (1) When log entries replicated at a majority of the **followers**, **leader** commits to its state machine (KV-store)

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## LOG REPLICATION ALGORITHM - 2

- **Synchronizing follower logs**
- (2) If **follower** rejects `AppendEntries()` then **leader** decrements its “follower-nextIndex” by one, and *retries* `AppendEntries()`.
  - “follower-nextIndex” tracks which logs entries are sent to the follower for each `AppendEntries()` RPC call
- Loop continues until **leader walks back** its “follower-nextIndex” until it **matches** what is committed at the **follower**
  - **Follower** has a **commitIndex**
  - Tracks 1st phase of a “two-phase” commit
  - **Follower** has a **lastApplied** index
  - Tracks 2<sup>nd</sup> phase of “two-phase” commit
- Once **leader** matches follower-nextIndex, the **follower** accepts the `AppendEntries()` RPC, and writes data to its log
  - Conflicting log entries are overwritten

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## LOG REPLICATION ALGORITHM - 3

- Leader based consensus algorithms require the leader to “eventually store” all committed log entries
- Raft handles follower node failure by retrying communication indefinitely
  - If crashed server restarts, the log will be resurrected, and the follower’s state machine will be restored (kv-store)

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## COMMITTING LOG ENTRIES

- Each node keeps a commitIndex and lastApplied index variable

### PHASE I

- Leader: when log message replicated at a majority of follower logs (not state machines) *\*\* described next slide*
- Leader increments its commitIndex
- Followers set commitIndex to  $\text{Min}(\text{leader-commitIndex}, \text{index of last new log entry})$

If leaderCommit > commitIndex, set commitIndex = min(leaderCommit, index of last new entry)

### PHASE II

- For any node (follower, leader):
- If commitIndex > lastApplied
  - Increment lastApplied by 1
  - commit log[lastApplied] to state machine (kv-store)

If commitIndex > lastApplied: increment lastApplied, apply log[lastApplied] to state machine (§5.3)

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## UPDATING COMMIT-INDEX OF LEADER

- If there exists an  $N$  such that  $N > \text{commitIndex}$ , a majority of  $\text{matchIndex}[i] \geq N$ , and  $\text{log}[N].\text{term} == \text{currentTerm}$ :  
 set  $\text{commitIndex} = N$  (§5.3, §5.4).

- How leader determines when to update its commitIndex**
- Use a majority consensus of what has been committed at follower logs
- Leader maintains follower state arrays:
  - nextIndex[]**: index of next log entry to send to follower
  - matchIndex[]**: index of highest log entry known to be replicated (to log) at follower
- Find  $N$ , such that  $N > \text{commitIndex}_{\text{leader}}$
- and** a majority of  $\text{matchIndex}[i] \geq N$  (from followers)
- and**  $\text{log\_entry}_{\text{leader}}[N].\text{term} == \text{currentTerm}_{\text{leader}}$
- then** set  $\text{commitIndex}_{\text{leader}} = N$

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## RAFT CLUSTER MEMBERSHIP – A3

- Cluster discovery performed at startup
- Use any method:
  - Static file, UDP discovery (kv-store), TCP discovery (kv-store)
- One membership is discovered, it can remain static/fixed
- Nodes can go offline, come back online
- Once a common configuration is propagated across the system, it can not be changed without restarting
- RAFT specifies a configuration change protocol where the system does a “hand-off” between an old and new configuration (section 6 of the paper)

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## A3 RAFT SIMPLIFICATIONS

- RequestVote() can be single threaded
  - AppendEntries() probably should have one thread per follower
- TCP client catch exceptions:
  - IOException – newSocket()
  - IOException – getOutputStream()
  - IOException – getInputStream()
  - Leader should catch exceptions, and retry requests indefinitely
  - Use socket method .setSoTimeout() to set a socket timeout in MS
- Node directory should generate and track nodeIDs
  - E.g. 1, 2, 3, 4, ... n
- Node directory should retrieve a node by ID, or IP/PORT

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## A3 RAFT SIMPLIFICATIONS - 2

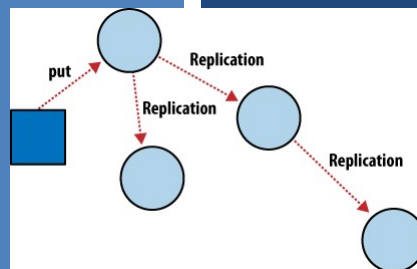
- **Leader** election: if using a single thread for **election candidate** should retry RequestVote() up to 10 times for a **follower** then give-up and move to next **follower**
- Instead of pushing data to **followers** when put() or del() is received by **leader**, can wait until next scheduled heartbeat to **follower**

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## CONSISTENCY AND REPLICATION



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## WHY REPLICATE DATA?

- (1) Fault tolerance: continue working after one replica crashes
- (2) Provide better protection against corrupted data
- (3) Performance
  - (3a) Scaling up systems (*scalability*)
    - Replicate server, load balance workload across replicas
  - (3b) For providing geographically close replicas
    - Replicas at the edge
    - **MOVE DATA TO THE COMPUTATION**
    - Performance *perceived* at the edge increases
    - **But what is the cost of localized replication?**

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## DATA REPLICATION COSTS

- Network bandwidth consumed maintaining replicas
  - Updates must be sent out and coordinated
- Maintaining consistency may be difficult
- All copies must be updated to ensure consistency
- **WHEN and HOW** updates need to be performed determines the prices of data replication...
- **Web caching example**
  - Web browser caches local content to improve performance
  - Doesn't know when content is "stale"
  - **Solution:** Place server in charge of replication not browser
  - Server invalidates and updates client cached copies
  - Track how current copies are
  - Degrades server performance → overhead from tracking, etc.

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## REPLICATION TRADEOFF EXAMPLE

- **Process P** accesses a local replica **N** times per second
- Replica is updated **M** times per second
- Updates involve complete refreshes of the data
- If  $N \ll M$  (very low access rate) many updates **M** are never accessed by **P**.
- Network communication overhead for most updates is useless.
- **TRADEOFFS:**
- Either move the replica away from **P**
  - So the total number of accesses from multiple processes is higher
- Or, apply a different strategy for updating the replica
  - i.e. less frequent updates, possibly need based
- **BALANCE TRADEOFF BETWEEN REPLICA ACCESS FREQUENCY AND COSTS OF REPLICATION (communication overhead)**

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## REPLICATION: SCALABILITY ISSUES

- **TIGHT CONSISTENCY**
- Reads must return same result
- Replication must occur after an update, before a read
- Provided by synchronous replication
- Update is performed across all copies as a single atomic operation (or transaction)
- **Assignment 2 replication is with tight consistency.**
- Keeping multiple copies consistent is subject to scalability problems
- May need global ordering of operations (e.g. Lamport clocks), or the use of a coordinator to assign order
- Global synchronization across a wide area network is time consuming (network latency)

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## REPLICATION SCALABILITY - 2

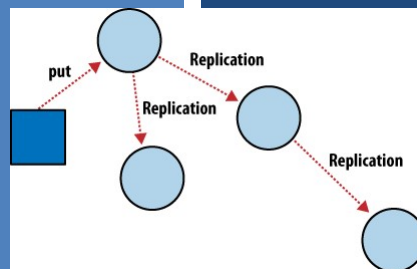
- Only solution is often to relax the consistency constraints
- Updates do not need to be executed as atomic operations
- Try to avoid instantaneous global synchronizations
- **TRADEOFF: consistency**
  - Not all copies may always be the same everywhere
- Whether consistency requirements can be relaxed depends on:
  - Access and update patterns
  - Use cases of the data
- Range of consistency models exist
- Implemented with distribution and consistency protocols

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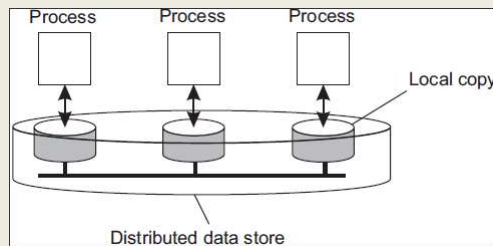
## DATA CENTRIC CONSISTENCY MODELS



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## DATA-CONSISTENCY MODELS

- Data consistency is discussed in the context of
  - Distributed shared memory
  - Distributed shared database
  - Distributed shared file system
- Generically referred to as a **“data store”**
- Each process has a nearby replica:



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## DATA-CONSISTENCY MODELS

- **CONSISTENCY MODEL**
- Rules that must be followed to ensure consistency
- Represents a contract between processes and data store
- If processes agree to obey certain rules, store promises to work correctly
- No general rules for loosening consistency
- What can be tolerated is highly application dependent
- **Three types of Inconsistencies**
  - Data variation
  - Staleness
  - Ordering of update operations

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## CONTINUOUS CONSISTENCY

- Ranges assigned to “what is allowed” for these deviations:
  - How much data variation?
  - How old/stale can the data be?
  - How much can ordering of update operations vary?
- Idea is to specify bounds for numeric deviation:
- **Relative numeric deviation:** 2% (percent)
- **Absolute numeric deviation:** .2 (implies a particular scale)
- **Numeric deviation:** may also refer to the number of updates applied to a replica
- **Staleness:** specifies bounds relative to time, e.g. how old?
- **Ordering of updates:** updates applied tentatively to local copy; may later be rolled back and applied in different order before becoming permanent

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## CONSISTENCY UNITS (CONIT)

- Abbreviated as “Conit”
- Specified the unit to measure consistency
- **Example:** Tracking fleet of rental cars
- Variables for a “conit”:
  - (g) gasoline consumed
  - (p) price paid for gasoline
  - (d) distance traveled
- Server keep conit consistently replicated

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## CONSISTENCY UNIT (CONIT)

**Replica A**

Conit  
 d = 558 // distance  
 g = 95 // gas  
 p = 78 // price

Operation	Result
< 5, B> g ← g + 45	[ g = 45 ]
< 8, A> g ← g + 50	[ g = 95 ]
< 9, A> p ← p + 78	[ p = 78 ]
< 10, A> d ← d + 558	[ d = 558 ]

Vector clock A = (11, 5)  
 Order deviation = 3  
 Numerical deviation = (2, 482)

**Replica B**

Conit  
 d = 412 // distance  
 g = 45 // gas  
 p = 70 // price

Operation	Result
< 5, B> g ← g + 45	[ g = 45 ]
< 6, B> p ← p + 70	[ p = 70 ]
< 7, B> d ← d + 412	[ d = 412 ]

Vector clock B = (0, 8)  
 Order deviation = 1  
 Numerical deviation = (3, 686)

**Log of Events**

**sum of unseen events**

■ Each process has vector clock (known time @A, known time @B)

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## SEQUENTIAL CONSISTENCY

■ Result of any execution is the same as if the operations of all processes were executed in some sequential order, and the operations of each individual process appear in this sequence in the order specified by its program.

**Sequentially Consistent**

P1:	W(x)a	
P2:	W(x)b	
P3:	R(x)b	R(x)a
P4:	R(x)b	R(x)a

**NOT Sequentially Consistent**

P1:	W(x)a	
P2:	W(x)b	
P3:	R(x)b	R(x)a
P4:	R(x)a	R(x)b

■ Exact order seen by processes **DOES NOT MATTER**

■ As long as they all agree

■ Processes here must see: R(x)b, then R(x)a

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CAUSAL CONSISTENCY

- Writes that are potentially causally related ***must be seen*** by all processes ***in the same order***.
- Concurrent writes*** may be seen ***in a different order*** by different processes.
- Concurrent writes happen with no READS in between
  - Events can be seen as “concurrent events”
- Which writes are concurrent?***

P1:	W(x)a		W(x)c	
P2:		R(x)a	W(x)b	
P3:		R(x)a		R(x)c
P4:		R(x)a		R(x)b
- Note** how the reads after the concurrent write for P3 and P4 are ***in a different order***.
- This is ok with causal consistency

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CAUSAL CONSISTENCY - 2

- Which timing graphs uphold causal consistency?***
- (A)

P1:	W(x)a		
P2:		W(x)b	
P3:			R(x)b
P4:			R(x)a
- (B)

P1:	W(x)a		
P2:		R(x)a	W(x)b
P3:			R(x)b
P4:			R(x)a
- Which writes are concurrent?***
- For (B), since R(x)a can influence W(x)b, the subsequent reads by P3 and P4 ***must be in the same order*** . . .

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## ENTRY CONSISTENCY

- Locks can be used to control access to data members
- Releasing a lock tells the distributed system that a variable needs to be synchronized / updated.
- A simple read without obtaining a lock may result in a stale value

P1:	L(x) W(x)a L(y) W(y)b U(x) U(y)
P2:	L(x) R(x)a R(y) NIL
P3:	L(y) R(y)b

- Here P2 does not obtain L(y) before reading y R(y)
  - P2 receives a stale/old value

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## CONSISTENCY VS. COHERENCE

- Consistency models define what to expect when processes concurrently operate on distributed data
- Data is consistent, if it adheres to the rules of the model
- Coherence models: describe what can be expected for only a *single data item*
- Data item is replicated
- Data item is coherent when copies adhere to consistency model rules
- Coherence often uses sequential consistency applied to a single data item
- For concurrent writes, all processes eventually see the same order of updates

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## EVENTUAL CONSISTENCY

- If no new updates are made to a given data item, eventually all accesses to that item will return the last updated value.
- System must reconcile differences between multiple distributed copies of data
- Servers must exchange data updates
- Servers must reconcile updates to agree on final state
  - Read repair: correction done when read finds inconsistency
  - Write repair: correct done on write operation
  - Asynchronous repair: correction done independently from read and write

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## EVENTUAL CONSISTENCY - 2


- Most processes mainly read from data store
  - Rarely update data
- How fast should updates be made to read-only processes?
- Example: Content Delivery Networks (video streaming)
  - Updates are propagated slowly
- Conflicts: write-write and read-write (most common)
- Often acceptable to propagate updates in a lazy manner when most processes perform only READ-ONLY access
- All replica gradually (eventually) become consistent

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# QUESTIONS




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# EXTRA SLIDES



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