CS162 Operating Systems and Systems Programming Lecture 24

Distributed 1: Reliability, Transactions, Distributed Decision Making, 2PC

> April 18<sup>th</sup>, 2023 Prof. John Kubiatowicz http://cs162.eecs.Berkeley.edu

# Review: Important "ilities"

- Availability: the probability that the system can accept and process requests
  - Measured in "nines" of probability: e.g. 99.9% probability is "3-nines of availability"
  - Key idea here is independence of failures
- Durability: the ability of a system to recover data despite faults
  - This idea is fault tolerance applied to data
  - Doesn't necessarily imply availability: information on pyramids was very durable, but could not be accessed until discovery of Rosetta Stone
- Reliability: the ability of a system or component to perform its required functions under stated conditions for a specified period of time (IEEE definition)
  - Usually stronger than simply availability: means that the system is not only "up", but also working correctly
  - Includes availability, security, fault tolerance/durability
  - Must make sure data survives system crashes, disk crashes, other problems

# Review: How to Make File Systems more Durable?

- Disk blocks contain Reed-Solomon error correcting codes (ECC) to deal with small defects in disk drive
  - Can allow recovery of data from small media defects
- Make sure writes survive in short term
  - Either abandon delayed writes or
  - Use special, battery-backed RAM (called non-volatile RAM or NVRAM) for dirty blocks in buffer cache
- Make sure that data survives in long term
  - Need to replicate! More than one copy of data!
  - Important element: independence of failure
    - » Could put copies on one disk, but if disk head fails...
    - » Could put copies on different disks, but if server fails...
    - » Could put copies on different servers, but if building is struck by lightning....
    - » Could put copies on servers in different continents...

## Review: RAID 6 and other Erasure Codes

- In general: RAIDX is an "erasure code"
  - Must have ability to know which disks are bad
  - Treat missing disk as an "Erasure"
- Today, disks so big that: RAID 5 not sufficient!
  - Time to repair disk sooooo long, another disk might fail in process!
  - "RAID 6" allow 2 disks in replication stripe to fail
  - Requires more complex erasure code, such as **EVENODD** code (see readings)
- More general option for general erasure code: Reed-Solomon codes
  - Based on polynomials in GF(2<sup>k</sup>) (I.e. k-bit symbols)
  - -m data points define a degree m polynomial; encoding is n points on the polynomial
  - Any m points can be used to recover the polynomial; n m failures tolerated
- Erasure codes not just for disk arrays. For example, geographic replication
  - E.g., split data into m = 4 chunks, generate n = 16 fragments and distribute across the Internet
  - Any 4 fragments can be used to recover the original data --- very durable!

#### File System Reliability: (Difference from Block-level reliability)

- What can happen if disk loses power or software crashes?
  - Some operations in progress may complete
  - Some operations in progress may be lost
  - Overwrite of a block may only partially complete
- Having RAID doesn't necessarily protect against all such failures
  - No protection against writing bad state
  - What if one disk of RAID group not written?
- File system needs durability (as a minimum!)
  - Data previously stored can be retrieved (maybe after some recovery step), regardless of failure
- But durability is not quite enough...!

# Storage Reliability Problem

- Single logical file operation can involve updates to multiple physical disk blocks
  - inode, indirect block, data block, bitmap, ...
  - With sector remapping, single update to physical disk block can require multiple (even lower level) updates to sectors
- At a physical level, operations complete one at a time
  - Want concurrent operations for performance
- How do we guarantee consistency regardless of when crash occurs?

## Threats to Reliability

- Interrupted Operation
  - Crash or power failure in the middle of a series of related updates may leave stored data in an inconsistent state
  - Example: transfer funds from one bank account to another
  - What if transfer is interrupted after withdrawal and before deposit?
- Loss of stored data
  - Failure of non-volatile storage media may cause previously stored data to disappear or be corrupted

# Reliability Approach #1: Careful Ordering

- Sequence operations in a specific order
  - Careful design to allow sequence to be interrupted safely
  - Data block  $\Leftarrow$  inode  $\Leftarrow$  free  $\Leftarrow$  directory
- Post-crash recovery
  - Read data structures to see if there were any operations in progress
  - Clean up/finish as needed
- Approach taken by
  - FAT and FFS (fsck) to protect filesystem structure/metadata
  - Many app-level recovery schemes (e.g., Word, emacs autosaves)

# Berkeley FFS: Create a File

#### Normal operation:

- Allocate data block
- Write data block
- Allocate inode
- Write inode block
- Update bitmap of free blocks and inodes
- Update directory with file name
   → inode number
- Update modify time for directory

#### Recovery:

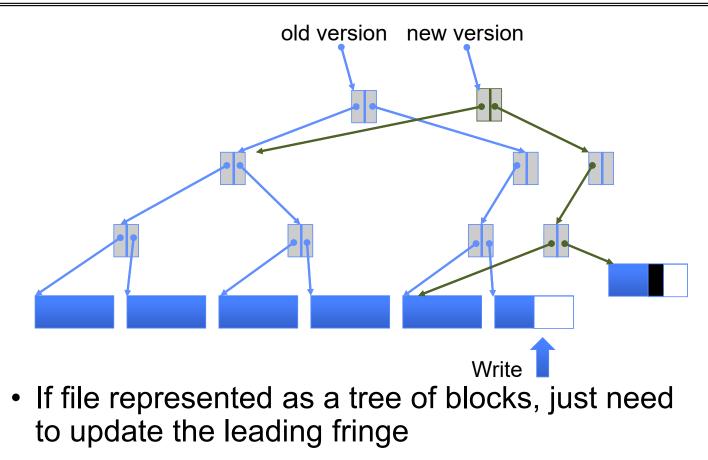
- Scan inode table
- If any unlinked files (not in any directory), delete or put in lost & found dir
- Compare free block bitmap against inode trees
- Scan directories for missing update/access times

Time proportional to disk size

### Reliability Approach #2: Copy on Write File Layout

- Recall: multi-level index structure lets us find the data blocks of a file
- Instead of over-writing existing data blocks and updating the index structure:
  - Create a new version of the file with the updated data
  - Reuse blocks that don't change much of what is already in place
  - This is called: Copy On Write (COW)
- Seems expensive! But
  - Updates can be batched
  - Almost all disk writes can occur in parallel
- Approach taken in network file server appliances
  - NetApp's Write Anywhere File Layout (WAFL)
  - ZFS (Sun/Oracle) and OpenZFS

**COW with Smaller-Radix Blocks** 



# Example: ZFS and OpenZFS

- Variable sized blocks: 512 B 128 KB
- Symmetric tree
  - Know if it is large or small when we make the copy
- Store version number with pointers
  - Can create new version by adding blocks and new pointers
- Buffers a collection of writes before creating a new version with them
- Free space represented as tree of extents in each block group
  - Delay updates to freespace (in log) and do them all when block group is activated

### Administrivia

- Midterm 3: Next Thursday!
  - No class on day of midterm
  - Three double-sided pages of notes
  - Watch for Ed post about where you should go: we have multiple exam rooms
  - Confict request form due Thursday!
- All material up to next Tuesday's lecture is fair game
- Final deadlines during RRR week:
  - Yes, there will be some office hours watch for specifics
- Extra "fun" lecture on Tuesday of RRR week!



https://tinyurl.com/mby6f47t

# More General Reliability Solutions

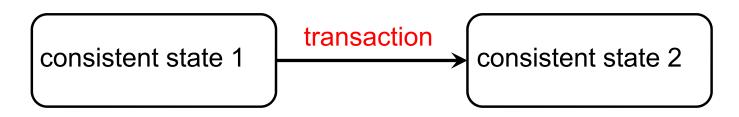
- Use Transactions for atomic updates
  - Ensure that multiple related updates are performed atomically
  - i.e., if a crash occurs in the middle, the state of the systems reflects either all or none of the updates
  - Most modern file systems use transactions internally to update filesystem structures and metadata
  - Many applications implement their own transactions
- Provide Redundancy for media failures
  - Redundant representation on media (Error Correcting Codes)
  - Replication across media (e.g., RAID disk array)

### Transactions

- Closely related to critical sections for manipulating shared data structures
- They extend concept of atomic update from memory to stable storage
   Atomically update multiple persistent data structures
- Many ad-hoc approaches
  - FFS carefully ordered the sequence of updates so that if a crash occurred while manipulating directory or inodes the disk scan on reboot would detect and recover the error (fsck)
  - Applications use temporary files and rename

**Key Concept: Transaction** 

• A *transaction* is an atomic sequence of reads and writes that takes the system from consistent state to another.



- Recall: Code in a critical section appears atomic to other threads
- Transactions extend the concept of atomic updates from *memory* to *persistent storage*

## **Typical Structure**

- Begin a transaction get transaction id
- Do a bunch of updates
  - If any fail along the way, roll-back
  - Or, if any conflicts with other transactions, roll-back
- Commit the transaction

#### "Classic" Example: Transaction

```
BEGIN; --BEGIN TRANSACTION
UPDATE accounts SET balance = balance - 100.00 WHERE
name = 'Alice';
UPDATE branches SET balance = balance - 100.00 WHERE
name = (SELECT branch_name FROM accounts WHERE name
= 'Alice');
UPDATE accounts SET balance = balance + 100.00 WHERE
name = 'Bob';
UPDATE branches SET balance = balance + 100.00 WHERE
name = (SELECT branch_name FROM accounts WHERE name
= 'Bob');
COMMIT; --COMMIT WORK
```

Transfer \$100 from Alice's account to Bob's account

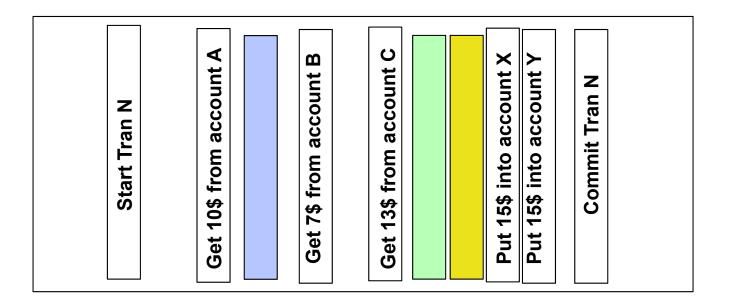
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# Concept of a log

- One simple action is atomic write/append a basic item
- Use that to seal the commitment to a whole series of actions



## **Transactional File Systems**

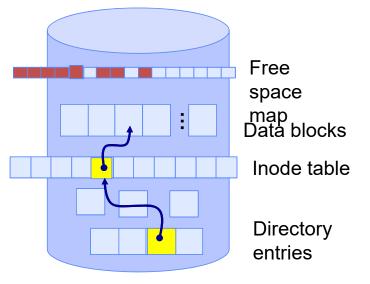
- Better reliability through use of log
  - Changes are treated as transactions
  - A transaction is committed once it is written to the log
    - » Data forced to disk for reliability
    - » Process can be accelerated with NVRAM
  - Although File system may not be updated immediately, data preserved in the log
- Difference between "Log Structured" and "Journaled"
  - In a Log Structured filesystem, data stays in log form
  - In a Journaled filesystem, Log used for recovery

# Journaling File Systems

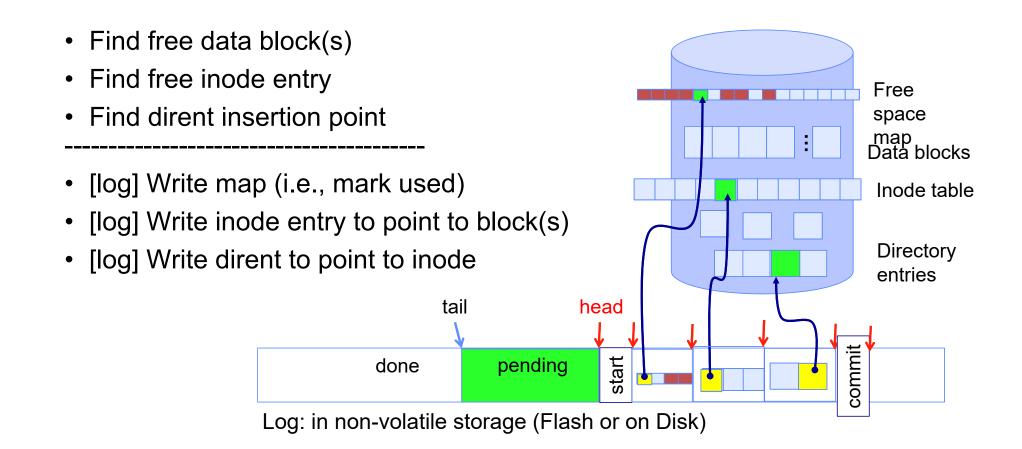
- Don't modify data structures on disk directly
- Write each update as transaction recorded in a log
  - Commonly called a journal or intention list
  - Also maintained on disk (allocate blocks for it when formatting)
- Once changes are in the log, they can be safely applied to file system – e.g. modify inode pointers and directory mapping
- Garbage collection: once a change is applied, remove its entry from the log
- Linux took original FFS-like file system (ext2) and added a journal to get ext3!
   Some options: whether or not to write all data to journal or just metadata
- Other examples: NTFS, Apple HFS+/apfs, Linux XFS, JFS, ext4

## Creating a File (No Journaling Yet)

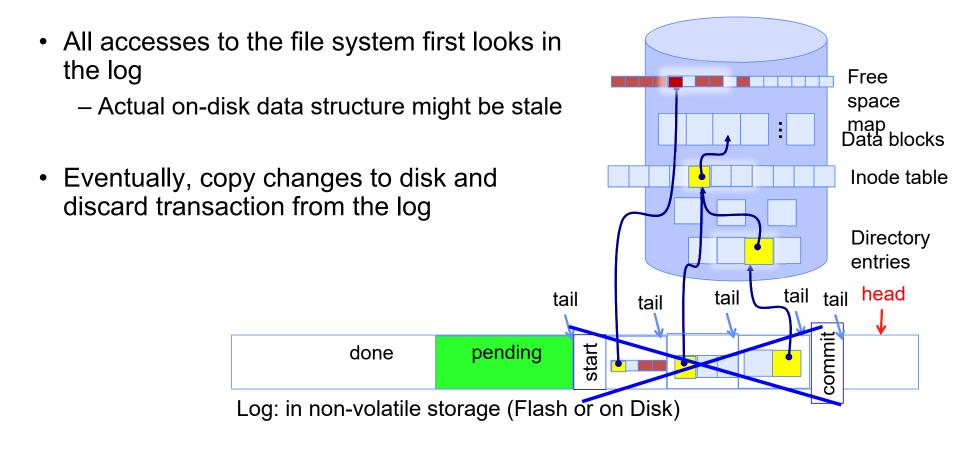
- Find free data block(s)
- Find free inode entry
- Find dirent insertion point
- Write map (i.e., mark used)
- Write inode entry to point to block(s)
- Write dirent to point to inode



# Creating a File (With Journaling)

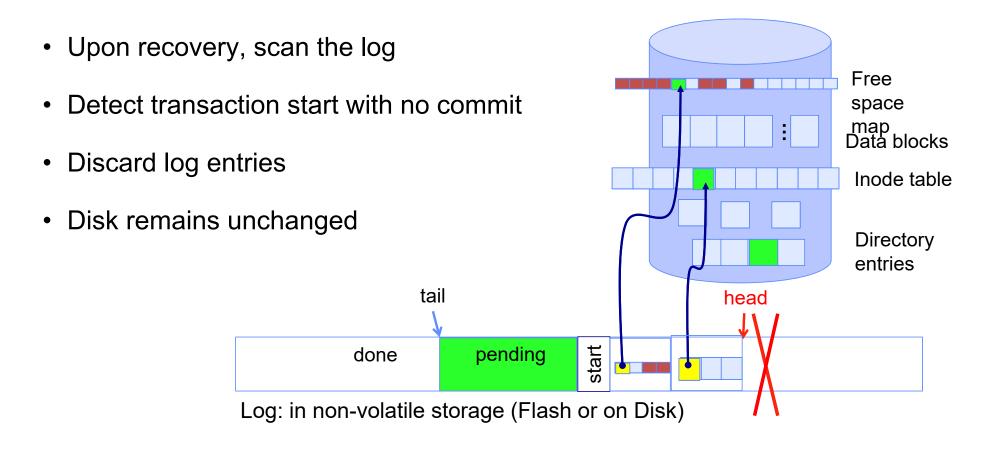


## After Commit, Eventually Replay Transaction



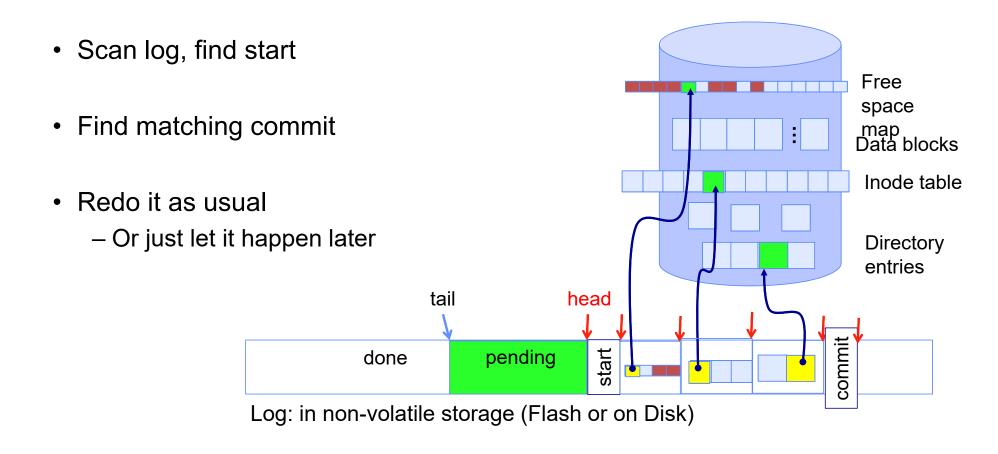
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### Crash Recovery: Discard Partial Transactions



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### Crash Recovery: Keep Complete Transactions



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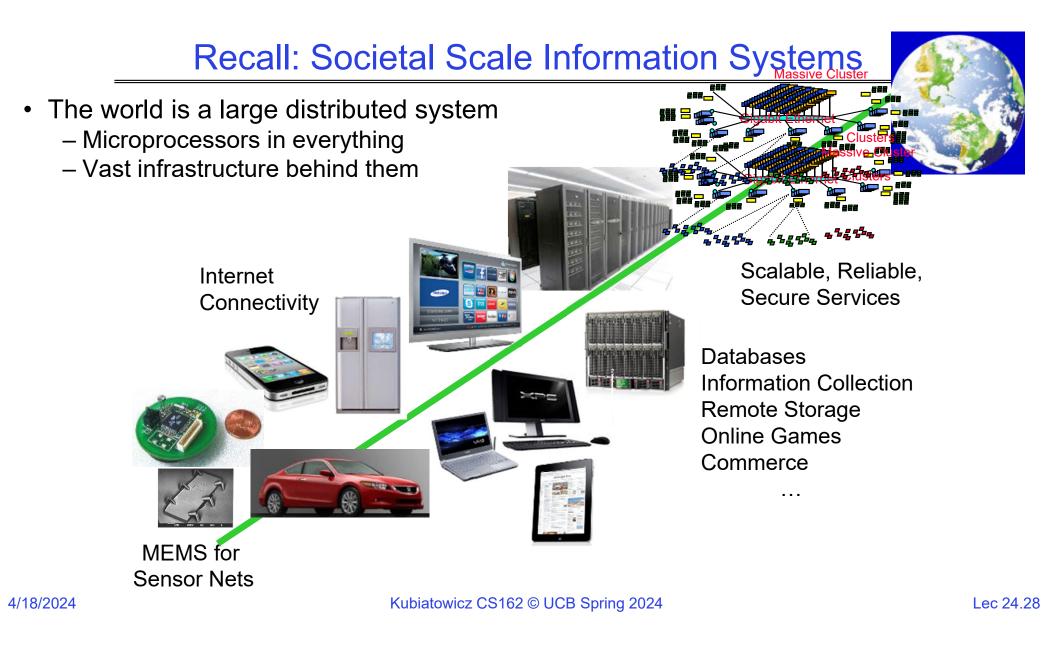
# Journaling Summary

Why go through all this trouble?

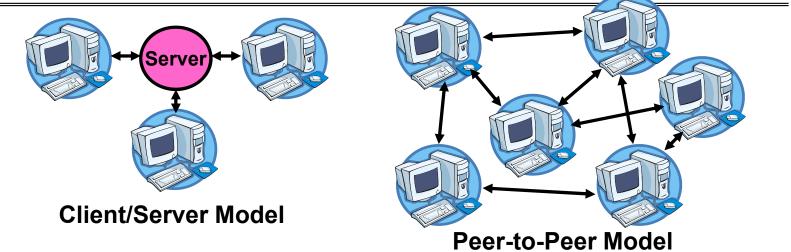
- Updates atomic, even if we crash:
  - Update either gets fully applied or discarded
  - All physical operations treated as a logical unit

Isn't this expensive?

- Yes! We're now writing all data twice (once to log, once to actual data blocks in target file)
- Modern filesystems journal metadata updates only
  - Record modifications to file system data structures
  - But apply updates to a file's contents directly



### **Centralized vs Distributed Systems**



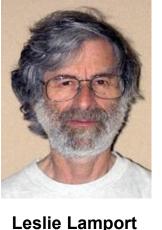
- Centralized System: major functions performed by a single physical computer
  - Originally, everything on single computer
  - Later: client/server model
- Distributed System: physically separate computers working together on task
  - Early model: multiple servers working together
    - » Probably in the same room or building
    - » Often called a "cluster"
  - Later models: peer-to-peer/wide-spread collaboration

#### Distributed Systems: Motivation/Issues/Promise

- Why do we want distributed systems?
  - Cheaper and easier to build lots of simple computers
  - Easier to add power incrementally
  - Users can have complete control over some components
  - Collaboration: much easier for users to collaborate through network resources (such as network file systems)
- The *promise* of distributed systems:
  - Higher availability: one machine goes down, use another
  - Better durability: store data in multiple locations
  - More security: each piece easier to make secure

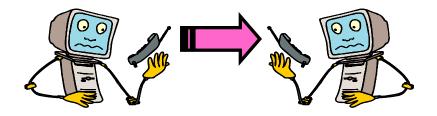
# **Distributed Systems: Reality**

- Reality has been disappointing
  - Worse availability: depend on every machine being up
    - » Lamport: "A distributed system is one in which the failure of a computer you didn't even know existed can render your own computer unusable."
  - Worse reliability: can lose data if any machine crashes
  - Worse security: anyone in world can break into system
- Coordination is more difficult
  - Must coordinate multiple copies of shared state information
  - What would be easy in a centralized system becomes a lot more difficult
- Trust/Security/Privacy/Denial of Service
  - Many new variants of problems arise as a result of distribution
  - Can you trust the other members of a distributed application enough to even perform a protocol correctly?
  - Corollary of Lamport's quote: "A distributed system is one where you can't do work because some computer you didn't even know existed is successfully coordinating an attack on my system!"



## Distributed Systems: Goals/Requirements

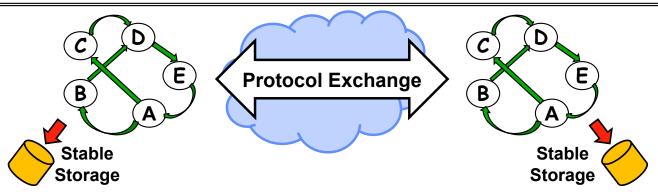
- Transparency: the ability of the system to mask its complexity behind a simple interface
- Possible transparencies:
  - Location: Can't tell where resources are located
  - Migration: Resources may move without the user knowing
  - Replication: Can't tell how many copies of resource exist
  - Concurrency: Can't tell how many users there are
  - Parallelism: System may speed up large jobs by splitting them into smaller pieces
  - Fault Tolerance: System may hide various things that go wrong
- Transparency and collaboration require some way for different processors to communicate with one another



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## How do entities communicate? A Protocol!



- A protocol is an agreement on how to communicate, including:
  - Syntax: how a communication is specified & structured
    - » Format, order messages are sent and received
  - Semantics: what a communication means
    - » Actions taken when transmitting, receiving, or when a timer expires
- Described formally by a state machine
  - Often represented as a message transaction diagram
  - Can be a partitioned state machine: two parties synchronizing duplicate sub-state machines between them
  - Stability in the face of failures!

## **Examples of Protocols in Human Interactions**

- Telephone
  - 1. (Pick up / open up the phone)
  - 2. Listen for a dial tone / see that you have service
  - 3. Dial
  - 4. Should hear ringing ...
  - 5. Callee: "Hello?"6. Caller: "Hi, it's Anthony...."
  - Or: "Hi, it's me" ( $\leftarrow$  what's *that* about?)
  - 7. Caller: "Hey, do you think ... blah blah blah ..." pause



- Caller: Bye
   3.
- 4. Hang up <

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Callee: Bye

## **Distributed Applications**

- How do you actually program a distributed application?
  - Need to synchronize multiple threads, running on different machines
    - » No shared memory, so cannot use test&set



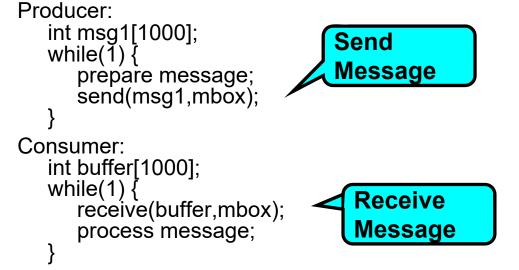
- One Abstraction: send/receive messages
  - » Already atomic: no receiver gets portion of a message and two receivers cannot get same message
- Interface:
  - Mailbox (mbox): temporary holding area for messages
    - » Includes both destination location and queue
    - » Over Internet, destination specified by IP address and Port (Recall Web server example!)
  - Send(message,mbox)
    - » Send message to remote mailbox identified by mbox
  - Receive(buffer,mbox)
    - » Wait until mbox has message, copy into buffer, and return
    - » If threads sleeping on this mbox, wake up one of them

# Using Messages: Send/Receive behavior

- When should send (message, mbox) return?
  - When receiver gets message? (i.e. ack received)
  - When message is safely buffered on destination?
  - Right away, if message is buffered on source node?
- Actually two questions here:
  - When can the sender be sure that receiver actually received the message?
  - When can sender reuse the memory containing message?
- Mailbox provides 1-way communication from T1 $\rightarrow$ T2
  - $-T1 \rightarrow buffer \rightarrow T2$
  - Very similar to producer/consumer
    - » Send = V, Receive = P
    - » However, can't tell if sender/receiver is local or not!

Messaging for Producer-Consumer Style

• Using send/receive for producer-consumer style:

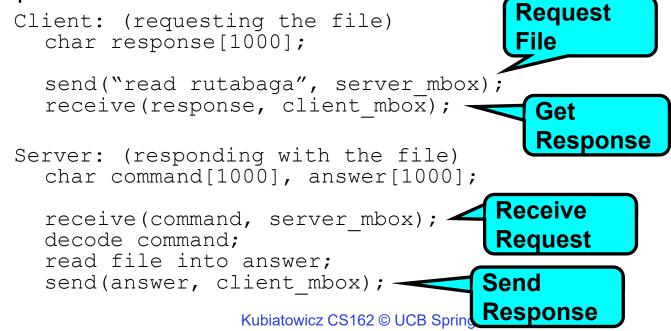


- No need for producer/consumer to keep track of space in mailbox: handled by send/receive
  - This is one of the roles of the window in TCP: window is size of buffer on far end
  - Restricts sender to forward only what will fit in buffer

### Messaging for Request/Response communication

- What about two-way communication?
  - Request/Response
    - » Read a file stored on a remote machine
    - » Request a web page from a remote web server
  - Also called: client-server
    - » Client  $\equiv$  requester, Server  $\equiv$  responder
    - » Server provides "service" (file storage) to the client
- Example: File service

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### **Distributed Consensus Making**

- Consensus problem
  - All nodes propose a value
  - Some nodes might crash and stop responding
  - Eventually, all remaining nodes decide on the same value from set of proposed values
- Distributed Decision Making
  - Choose between "true" and "false"
  - Or Choose between "commit" and "abort"
- Equally important (but often forgotten!): make it durable!
  - How do we make sure that decisions cannot be forgotten?
    - » This is the "D" of "ACID" in a regular database
  - In a global-scale system?
    - » What about erasure coding or massive replication?
    - » Like BlockChain applications!

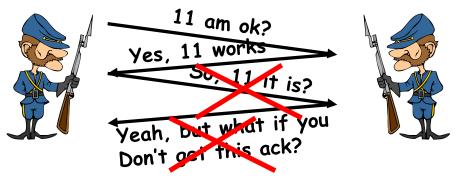
### **General's Paradox**

- General's paradox:
  - Constraints of problem:
    - » Two generals, on separate mountains
    - » Can only communicate via messengers
    - » Messengers can be captured
  - Problem: need to coordinate attack
    - » If they attack at different times, they all die
    - » If they attack at same time, they win
  - Named after Custer, who died at Little Big Horn because he arrived a couple of days too early



## General's Paradox (con't)

- Can messages over an unreliable network be used to guarantee two entities do something simultaneously?
  - Remarkably, "no", even if all messages get through

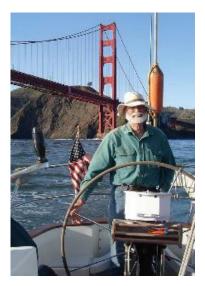


- No way to be sure last message gets through!
- In real life, use radio for simultaneous (out of band) communication
- So, clearly, we need something other than simultaneity!

### **Two-Phase Commit**

- Since we can't solve the General's Paradox (i.e. simultaneous action), let's solve a related problem
- Distributed transaction: Two or more machines agree to do something, or not do it, atomically

   No constraints on time, just that it will eventually happen!
- Two-Phase Commit protocol: Developed by Turing award winner Jim Gray
  - (first Berkeley CS PhD, 1969)
  - Many important DataBase breakthroughs also from Jim Gray



Jim Gray

## **Two-Phase Commit Protocol**

- Persistent stable log on each machine: keep track of whether commit has happened
  - If a machine crashes, when it wakes up it first checks its log to recover state of world at time of crash
- Prepare Phase:
  - The global coordinator requests that all participants will promise to commit or rollback the transaction
  - Participants record promise in log, then acknowledge
  - If anyone votes to abort, coordinator writes "Abort" in its log and tells everyone to abort; each records "Abort" in log
- Commit Phase:
  - After all participants respond that they are prepared, then the coordinator writes "Commit" to its log
  - Then asks all nodes to commit; they respond with ACK
  - After receive ACKs, coordinator writes "Got Commit" to log
- Log used to guarantee that all machines either commit or don't

### 2PC Algorithm

- One coordinator
- N workers (replicas)
- High level algorithm description:
  - Coordinator asks all workers if they can commit
  - If all workers reply "VOTE-COMMIT", then coordinator broadcasts "GLOBAL-COMMIT"

Otherwise coordinator broadcasts "GLOBAL-ABORT"

- Workers obey the **GLOBAL** messages
- Use a persistent, stable log on each machine to keep track of what you are doing
  - If a machine crashes, when it wakes up it first checks its log to recover state of world at time of crash

### **Two-Phase Commit: Setup**

- One machine *(coordinator)* initiates the protocol
- It asks *every* machine to **vote** on transaction
- Two possible votes:
  - Commit
  - Abort
- Commit transaction only if unanimous approval

### **Two-Phase Commit: Preparing**

### **Worker Agrees to Commit**

- Machine has **guaranteed** that it will accept transaction
- Must be recorded in log so machine will remember this decision if it fails and restarts

### Worker Agrees to Abort

- Machine has guaranteed that it will never accept this transaction
- Must be recorded in log so machine will remember this decision if it fails and restarts

### **Two-Phase Commit: Finishing**

### **Commit Transaction**

- Coordinator learns all machines have agreed to commit
- Record decision to commit in local log
- Apply transaction, inform voters

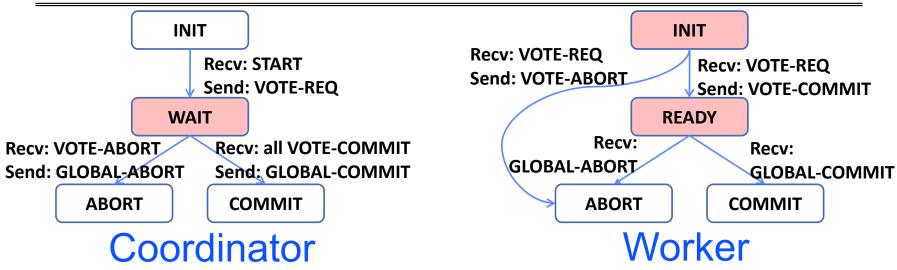
### **Abort Transaction**

- Coordinator learns at least one machine has voted to abort
- Record decision to abort in local log
- Do not apply transaction, inform voters

### Two-Phase Commit: Finishing

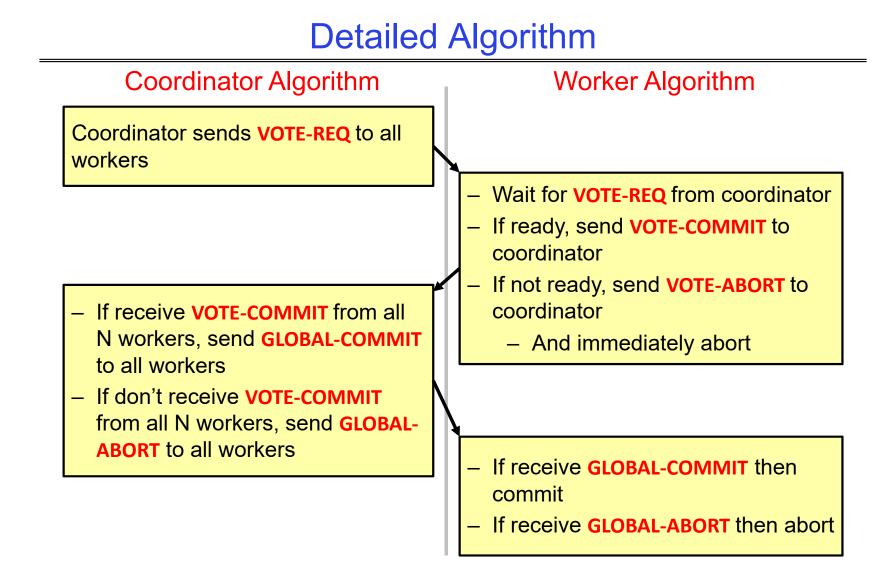
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### State Machine Description of 2PC

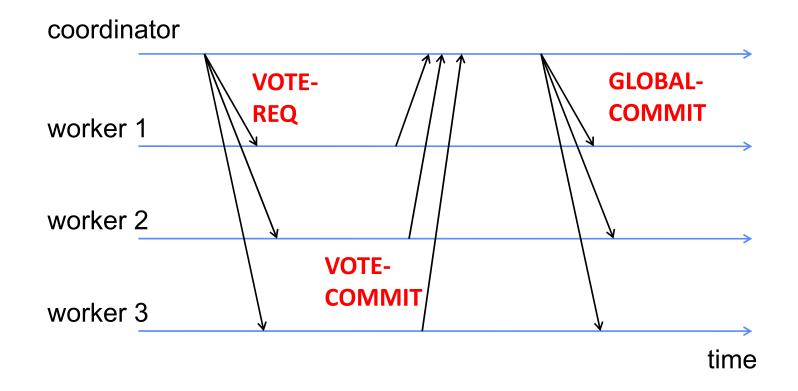


- Two Phase Commit (2PC) can be described with interacting state machines
- Coordinator only waits for votes in "WAIT" state
  - In WAIT, if doesn't receive N votes, it times out and sends GLOBAL-ABORT
- Worker waits for VOTE-REQ in INIT
  - Worker can time out and abort (coordinator handles it)
- Worker waits for GLOBAL-\* message in READY
  - Coordinator fails ⇒ workers BLOCK waiting for coordinator to recover and send GLOBAL\_\* message

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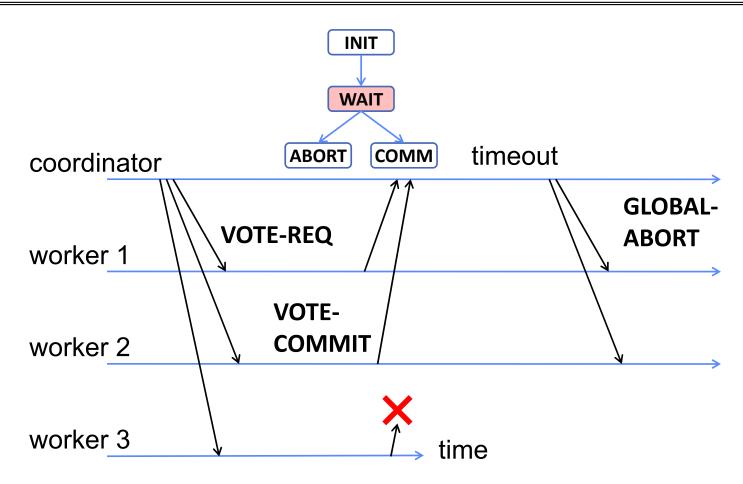


### Failure Free Example Execution



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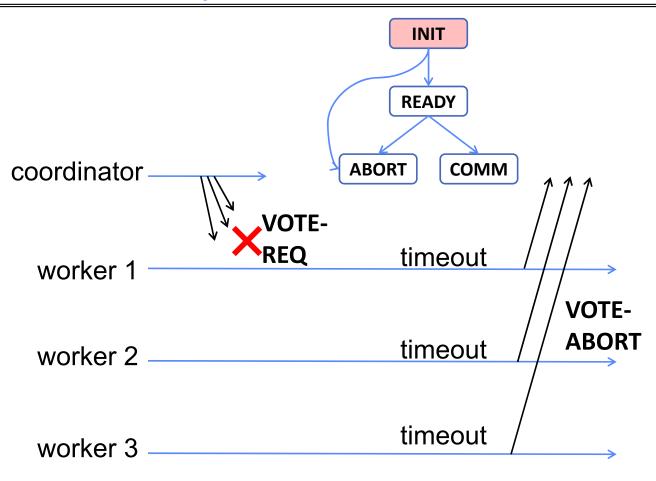
### **Example of Worker Failure**



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### Example of Coordinator Failure #1

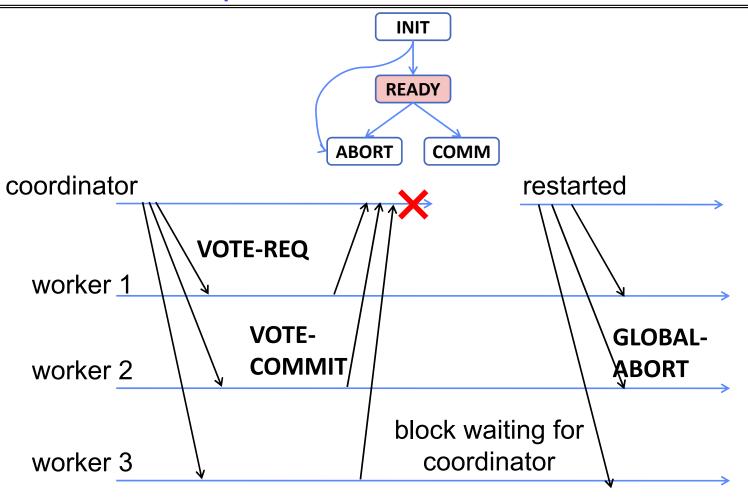


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### Example of Coordinator Failure #2



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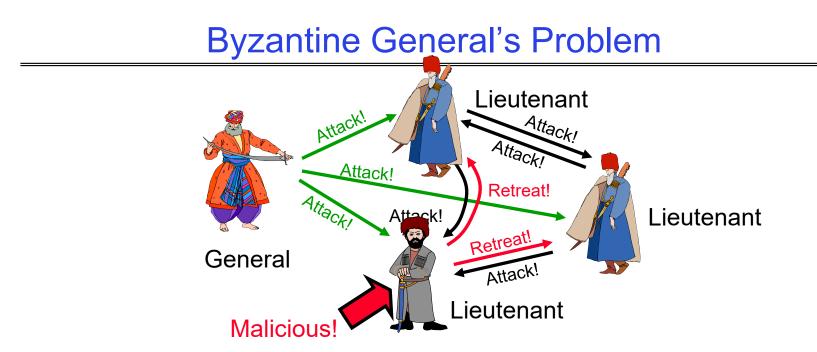
### Durability

- All nodes use stable storage to store current state
  - stable storage is non-volatile storage (e.g. backed by disk) that guarantees atomic writes.
  - -E.g.: SSD, NVRAM
- Upon recovery, nodes can restore state and resume:
  - Coordinator aborts in INIT, WAIT, or ABORT
  - Coordinator commits in COMMIT
  - -Worker aborts in INIT, ABORT
  - -Worker commits in COMMIT
  - -Worker "asks" Coordinator in READY

### Alternatives to 2PC

- Three-Phase Commit: One more phase, allows nodes to fail or block and still make progress.
- PAXOS: An alternative used by Google and others that does not have 2PC blocking problem
  - Develop by Leslie Lamport (Turing Award Winner)
  - No fixed leader, can choose new leader on fly, deal with failure
  - Some think this is extremely complex!
- RAFT: PAXOS alternative from John Osterhout (Stanford)

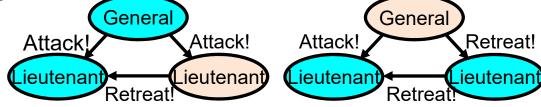
   Simpler to describe complete protocol
- What happens if one or more of the nodes is malicious?
  - -Malicious: attempting to compromise the decision making
  - Use a more hardened decision making process:
     Byzantine Agreement and Block Chains



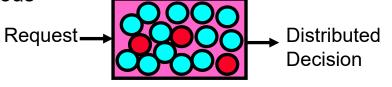
- Byazantine General's Problem (n players):
  - One General and n-1 Lieutenants
  - Some number of these (f) can be insane or malicious
- The commanding general must send an order to his n-1 lieutenants such that the following Integrity Constraints apply:
  - IC1: All loyal lieutenants obey the same order
  - IC2: If the commanding general is loyal, then all loyal lieutenants obey the order he sends

## Byzantine General's Problem (con't)

- Impossibility Results:
  - Cannot solve Byzantine General's Problem with n=3 because one malicious player can mess up things



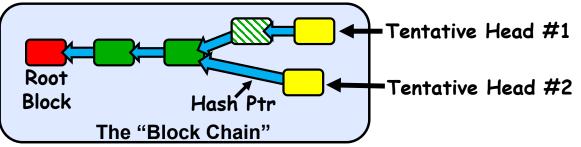
- With f faults, need n > 3f to solve problem
- Various algorithms exist to solve problem
  - Original algorithm has #messages exponential in n
  - Newer algorithms have message complexity O(n<sup>2</sup>)
    - » One from MIT, for instance (Castro and Liskov, 1999)
- Use of BFT (Byzantine Fault Tolerance) algorithm
  - Allow multiple machines to make a coordinated decision even if some subset of them (< n/3) are malicious</li>



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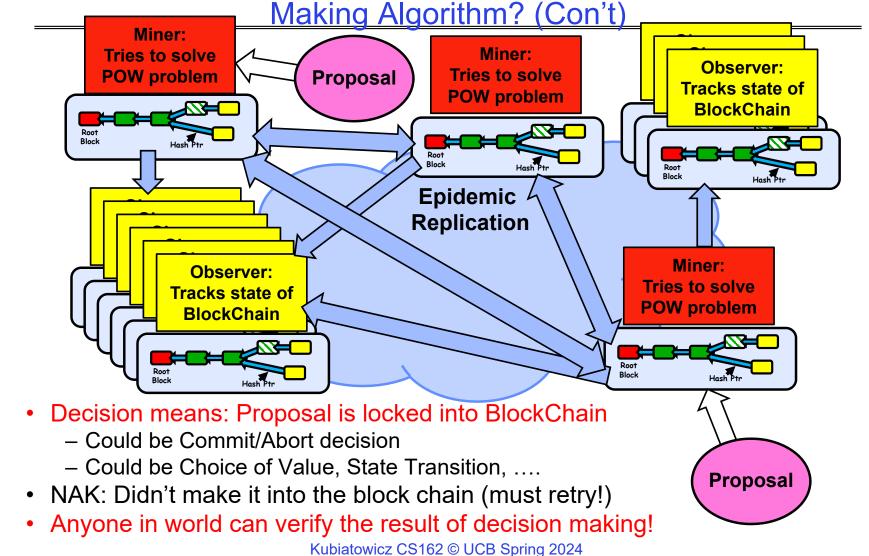
### Is a BlockChain a Distributed Decision Making Algorithm?



- BlockChain: a chain of blocks connected by hashes to root block
  - The Hash Pointers are unforgeable (assumption)
  - The Chain has no branches except perhaps for heads
  - Blocks are considered "authentic" part of chain when they have authenticity info in them
- How is the head chosen?
  - Some consensus algorithm
  - In many BlockChain algorithms (e.g. BitCoin, Ethereum), the head is chosen by solving hard problem
    - » This is the job of "miners" who try to find "nonce" info that makes hash over block have specified number of zero bits in it
    - » The result is a "Proof of Work" (POW)
    - » Selected blocks above (green) have POW in them and can be included in chains
  - Longest chain wins

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# Is a Blockchain a Distributed Decision



4/18/2024

Lec 24.60

## Summary (1/3)

- Copy-on-write provides richer function (versions) with much simpler recovery

   Little performance impact since sequential write to storage device is nearly free
- Transactions over a log provide a general solution
  - Journaled file systems such as ext3, NTFS
  - Commit sequence to durable log, then update the disk
  - Log takes precedence over disk
  - Replay committed transactions, discard partials

## Summary (2/3)

- A protocol is an agreement on how to communicate, including:
  - Syntax: how a communication is specified & structured
    - » Format, order messages are sent and received
  - Semantics: what a communication means
    - » Actions taken when transmitting, receiving, or when a timer expires
- Consensus problem
  - All nodes propose a value
  - Some nodes might crash and stop responding
  - Eventually, all remaining nodes decide on the same value from set of proposed values
- Two-phase commit: a form of distributed decision making
  - First, make sure everyone guarantees they will commit if asked (prepare)
  - Next, ask everyone to commit

## Summary (3/3)

- Byzantine General's Problem: distributed decision making with malicious failures
  - One general, n-1 lieutenants: some number of them may be malicious (often "f" of them)
  - All non-malicious lieutenants must come to same decision
  - If general not malicious, lieutenants must follow general
  - Only solvable if  $n \ge 3f+1$
- BlockChain protocols:
  - Cryptographically-driven ordering protocol
  - Could be used for distributed decision making