# Distributed systems <br> Lecture 12: Logical time, vector clocks, process groups, and ordered broadcast 

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## Last time

- Clock skew and drift
- The clock synchronization problem
- Cristian's Algorithm, Berkeley Algorithm, NTP
- The happens-before relation
- Saw physical time can't be kept exactly in sync; instead, use logical clocks to track ordering between events:
- Defined $a \rightarrow b$ to mean ' $a$ happens-before $b$ '
- Easy inside single process, \& use causal ordering (send $\rightarrow$ receive) to extend relation across processes


## Example



- Three processes (each with 2 events), and 2 messages
- Due to process order, we know $\boldsymbol{a} \rightarrow \boldsymbol{b}, \boldsymbol{c} \rightarrow \boldsymbol{d}$ and $\boldsymbol{e} \rightarrow \boldsymbol{f}$
- Causal order tells us $\boldsymbol{b} \rightarrow \boldsymbol{c}$ and $\boldsymbol{d} \rightarrow \boldsymbol{f}$
- And by transitivity $a \rightarrow c, a \rightarrow d, a \rightarrow f, b \rightarrow d, b \rightarrow f, c \rightarrow f$
- However, event $e$ is concurrent with $\boldsymbol{a}, \boldsymbol{b}, \boldsymbol{c}$ and $\boldsymbol{d}$
$-a\|e, b\| e, c \| e$, and $d \| e$


## Causal ordering

- NB. "causal" = "casual"!
- As in "cause and effect"
- e.g. P1 sends message m, P2 receives m
- receipt of $m$ is caused by sending of $m$
- so sending event causally precedes receipt event
- e.g. Alice asks a question, Bob answers it
- observer would be confused if they hear the answer before hearing the question
- Causal order is any order that is compatible with happens-before relation


## Logical time

- One early scheme due to Lamport [1978]
- Each process $\mathbf{P}_{\mathbf{i}}$ has a logical clock $\mathbf{L}_{\mathbf{i}}$
- $L_{i}$ can simply be an integer, initialized to 0
$-L_{i}$ is incremented on every local event $\boldsymbol{e}$
- We write $\mathrm{L}_{\mathrm{i}}(\boldsymbol{e})$ or $\mathbf{L}(\boldsymbol{e})$ as the timestamp of $\boldsymbol{e}$
- Distributed time is implemented by propagating timestamps via messages on the network:
- When $P_{i}$ sends a message, it increments $L_{i}$ and copies the value into the packet
- When $P_{i}$ receives a message from $\mathbf{P}_{j}$, it extracts $L_{j}$ and sets $L_{i}:=\max \left(L_{i}, L_{j}\right)$, and then increments $L_{i}$
- Guarantees that if $\boldsymbol{a} \rightarrow \boldsymbol{b}$, then $\mathrm{L}(\boldsymbol{a})<\mathrm{L}(\boldsymbol{b})$
- However if $\mathbf{L}(\mathbf{x})<\mathrm{L}(\boldsymbol{y})$, this doesn't imply $\boldsymbol{x} \rightarrow \boldsymbol{y}$ !


## Lamport Clocks: Example



- When $\mathbf{P}_{\mathbf{2}}$ receives $\mathbf{m}_{1}$, it extracts timestamp 2 and sets its clock to $\max (0,2)$ before increment
- Event timestamps are not unique
- E.g., event $\boldsymbol{e}$ has the same timestamp as event $\boldsymbol{a}$
- Break ties by looking at process IDs, IP addresses, ...
- This gives a total order and globally unique timestamps (assuming process IDs are globally unique)
- Concurrent events are ordered arbitrarily


## Vector clocks

- With Lamport clocks, given $\mathrm{L}(\boldsymbol{a})$ and $\mathrm{L}(b)$, we can't tell if $\boldsymbol{a} \rightarrow \boldsymbol{b}$ or $\boldsymbol{b} \rightarrow \boldsymbol{a}$ or $\boldsymbol{a} \| \boldsymbol{b}$
- One solution is vector clocks:
- An ordered list of logical clocks, one per-process
- Each process $\mathbf{P}_{\mathbf{i}}$ maintains $\mathrm{V}_{\mathrm{i}}[]$, initially all zeroes
- On a local event $\boldsymbol{e}, \mathbf{P}_{\mathbf{i}}$ increments $\mathbf{V}_{\mathbf{i}}[\mathbf{i}]$
- If the event is message send, new $\mathrm{V}_{\mathrm{i}}[$ ] copied into packet
- If $\mathbf{P}_{\mathbf{i}}$ receives a message from $\mathbf{P}_{\mathrm{j}}$ then, for all $\mathbf{k}=0,1, \ldots$, it sets $\mathrm{V}_{\mathrm{i}}[\mathrm{k}]:=\max \left(\mathrm{V}_{\mathrm{i}}[\mathrm{k}], \mathrm{V}_{\mathrm{i}}[\mathrm{k}]\right)$, and increments $\mathrm{V}_{\mathrm{i}}[\mathrm{i}]$
- Intuitively $\mathbf{V}_{\mathbf{i}}[\mathbf{k}]$ captures the number of events at process $\mathbf{P}_{\mathbf{k}}$ that have been observed by $\mathbf{P}_{\mathbf{i}}$


## Vector clocks: example



- When P2 receives $\mathbf{m}_{1}$, it merges entries from P1's clock
- choose the maximum value in each position
- Similarly when P3 receives $\mathbf{m}_{2}$, it merges in P2's clock
- this incorporates the changes from P1 that P2 already saw
- Vector clocks explicitly track transitive causal order: timestamp of $\boldsymbol{f}$ captures the history of $\boldsymbol{a}, \boldsymbol{b}, \boldsymbol{c} \& \boldsymbol{d}$


## Using vector clocks for ordering

- Can compare vector clocks piecewise:
$-V_{i}=V_{j}$ iff $V_{i}[k]=V_{j}[k]$ for $k=0,1,2, \ldots$
$-V_{i} \leq V_{j}$ iff $V_{i}[k] \leq V_{j}[k]$ for $k=0,1,2, \ldots$
$-V_{i}<V_{j}$ iff $V_{i} \leq V_{j}$ and $V_{i} \neq V_{j}$
$-\mathbf{V}_{\mathbf{i}} \| \mathbf{V}_{\mathbf{j}}$ otherwise
- For any two event timestamps $\mathbf{T}(\mathbf{a})$ and $\mathbf{T}(\mathbf{b})$
- if $\boldsymbol{a} \rightarrow \boldsymbol{b}$ then $\mathrm{T}(\boldsymbol{a})<\mathrm{T}(b)$; and
- if $\mathrm{T}(\boldsymbol{a})<\mathrm{T}(\boldsymbol{b})$ then $\boldsymbol{a} \rightarrow \boldsymbol{b}$
- Hence can use timestamps to determine if there is a causal ordering between any two events
- i.e. determine whether $\boldsymbol{a} \rightarrow \boldsymbol{b}, \boldsymbol{b} \rightarrow \boldsymbol{a}$, or $\boldsymbol{a} \| \boldsymbol{b}$

Does this seem familiar? Recall Time-Stamp Ordering and Optimistic Concurrency Control for transactions

## Consistent global state

- We have the notion of "a happens-before $\boldsymbol{b}$ " $(\boldsymbol{a} \rightarrow \boldsymbol{b})$ or " $\boldsymbol{a}$ is concurrent with $\boldsymbol{b}$ " ( $\boldsymbol{a} \| \boldsymbol{b}$ )
- What about 'instantaneous' system-wide state?
- distributed debugging, GC, deadlock detection, ...
- Chandy/Lamport introduced consistent cuts:
- draw a (possibly wiggly) line across all processes
- this is a consistent cut if the set of events (on the LHS) is closed under the happens-before relationship
- i.e. if the cut includes event $\boldsymbol{x}$, then it also includes all events $\boldsymbol{e}$ which happened before $\boldsymbol{x}$
- In practical terms, this means every delivered message included in the cut was also sent within the cut


## Consistent cuts: example



- Vertical cuts are always consistent (due to the way we draw these diagrams), but some curves are ok too:
- providing we don't include any receive events without their corresponding send events
- Intuition is that a consistent cut could have occurred during execution (depending on scheduling etc)


## Observing consistent cuts - sketch

We will skip this material in lecture and it is not examinable - but it is helpful in thinking about distributed algorithms:

- Chandy/Lamport Snapshot Algorithm (1985)
- Distributed algorithm to generate a snapshot of relevant system-wide state (e.g. all memory, locks held, ...)
- Flood a special marker message $\mathbf{M}$ to all processes; causal order of flood defines the cut
- If $\mathbf{P}_{\mathbf{i}}$ receives $\mathbf{M}$ from $\mathbf{P}_{\mathbf{j}}$ and it has yet to snapshot:
- It pauses all communication, takes local snapshot \& sets $\mathbf{C}_{\mathrm{ij}}$ to $\}$
- Then sends $\mathbf{M}$ to all other processes $\mathbf{P}_{\mathbf{k}}$ and starts recording $\mathbf{C}_{\mathbf{i k}}=$ \{ set of all post local snapshot messages received from $\boldsymbol{P}_{\boldsymbol{k}}$ \}
- If $\mathbf{P}_{\mathbf{i}}$ receives $\mathbf{M}$ from some $\mathbf{P}_{\mathbf{k}}$ after taking snapshot
- Stops recording $\mathrm{C}_{\mathrm{ik}}$, and saves alongside local snapshot
- Global snapshot comprises all local snapshots \& $\mathbf{C}_{\mathrm{ij}}$
- Assumes reliable, in-order messages, \& no failures


## Process groups

- Process groups are a key distributed-systems primitive:
- Set of processes on some number of machines
- Possible to multicast messages to all members
- Allows fault-tolerant systems even if some processes fail
- Membership can be fixed or dynamic
- If dynamic, have explicit join() and leave() primitives
- Groups can be open or closed:
- Closed groups only allow messages from members
- Internally can be structured (e.g. coordinator and set of slaves), or symmetric (peer-to-peer)
- Coordinator makes e.g. concurrent join/leave easier...
- ... but may require extra work to elect coordinator


## Group communication: assumptions

- Assume we have ability to send a message to multiple (or all) members of a group
- Don't care if 'true' multicast (single packet sent, received by multiple recipients) or "netcast" (send set of messages, one to each recipient)
- Assume also that message delivery is reliable, and that messages arrive in bounded time
- But may take different amounts of time to reach different recipients
- Assume (for now) that processes don't crash
- What delivery orderings can we enforce?


## FIFO ordering


physical time

- With FIFO ordering, messages from process $\mathbf{P}_{\mathrm{i}}$ must be received at each process $\mathbf{P}_{\mathbf{j}}$ in the order they were sent
- E.g. in the above, each receiver must see $\mathbf{m}_{1}$ before it sees $m_{3}$
- But other relative delivery orders are unconstrained - e.g., $m_{1}$ vs $m_{2}, m_{2}$ vs. $m_{4}$, etc.
- Looks easy, but is non-trivial on delays/retransmissions
- E.g. what if message $\mathbf{m}_{\mathbf{1}}$ to $\mathbf{P 2}$ takes a loooong time?
- Receivers may need to buffer messages to ensure order
- Must "hold back" $\mathrm{m}_{3}$ until $\mathrm{m}_{\mathbf{1}}$ has been delivered to P2


## Receiving versus delivering

- Group communication middleware provides extra features above 'basic' communication
- e.g. providing reliability and/or ordering guarantees on top of IP multicast or netcast
- Assume that OS provides receive() primitive:
- returns with a packet when one arrives on wire
- Received messages either delivered or held back:
- Delivered means inserted into delivery queue
- Held back means inserted into hold-back queue
- Held back messages are delivered later as the result of the receipt of another message...


## Implementing FIFO ordering



- Each process $\mathbf{P}_{\mathbf{i}}$ maintains sequence number (SeqNo) $\mathbf{S}_{\mathbf{i}}$
- New messages sent by $\mathbf{P}_{\mathbf{i}}$ include $\mathbf{S}_{\mathbf{i}}$, incremented after each send
- Not including retransmissions, which retransmit with the same SeqNo!
- $\mathbf{P}_{\mathrm{j}}$ maintains $\mathrm{S}_{\mathrm{j} i}$ : the SeqNo of the last delivered message from $\mathbf{P}_{\mathrm{i}}$
- If receive message from $\mathrm{P}_{\mathrm{i}}$ with $\operatorname{SeqNo} \neq\left(\mathrm{S}_{\mathrm{ji}}+1\right)$, hold back
- When receive message with SeqNo $=\left(S_{j i}+1\right)$, enqueue for delivery
- Also deliver consecutive messages in hold-back queue (if present)
- Update $\mathrm{S}_{\mathrm{ji}}$
- Apps. receive asynchronously as they read from delivery queue


## Stronger orderings

- Can also implement FIFO ordering by just using a reliable FIFO transport like TCP/IP
- But the general 'receive versus deliver' model also allows us to provide stronger orderings:
- Causal ordering: if $\operatorname{send}\left(\boldsymbol{g}, \boldsymbol{m}_{\mathbf{1}}\right) \rightarrow \operatorname{send}\left(\boldsymbol{g}, \boldsymbol{m}_{\mathbf{2}}\right)$, then all processes will see $\mathbf{m}_{1}$ before $\mathbf{m}_{2}$
- Total ordering: if any process delivers a message $\mathbf{m}_{1}$ before $\mathbf{m}_{\mathbf{2}}$, then all processes will deliver $\mathbf{m}_{\mathbf{1}}$ before $\mathbf{m}_{\mathbf{2}}$
- Causal ordering implies FIFO ordering, since any two multicasts by the same process are related by $\rightarrow$
- Total ordering (as defined) does not imply FIFO (or causal) ordering, just says that all processes must agree
- Sometimes want FIFO-total ordering (combines the two)


## Causal ordering



- e.g. order of messages in chat app (question $\rightarrow$ answer)
- Same example as before, but causal ordering requires:
(a) everyone must see $\mathrm{m}_{1}$ before $\mathrm{m}_{\mathbf{3}}$ (as with FIFO), and
(b) everyone must see $\mathbf{m}_{1}$ before $\mathbf{m}_{\mathbf{2}}$ (due to happens-before)
- Is this ok?
- No! $\mathbf{m}_{1} \rightarrow \mathbf{m}_{\mathbf{2}}$, but P2 sees $\mathbf{m}_{\mathbf{2}}$ before $\mathbf{m}_{\mathbf{1}}$
- To be correct, must hold back (delay) delivery of $\mathbf{m}_{\mathbf{2}}$ at P2


## Causal order and happens-before

- Happens-before is a strict partial order
- Irreflexive, transitive, asymmetric
- Any linear extension of happens-before is a causal order
- The order is consistent with causality
- For a given partial order, there may be many possible linear extensions
- Concurrent events can be ordered arbitrarily


## Causal order message delivery

- When message $m$ is received, need to decide:
- Does a message $m^{\prime}$ exist that we have not yet received, such that $m^{\prime} \rightarrow m$ ?
- If yes, wait for $m^{\prime}$ to be received and deliver it first
- If no, deliver $m$ to the application now
- Solution: variant of vector clocks
- Increment only on message send, not on every event
- Detects relative ordering of messages, not events
- Gap in number sequence $\Rightarrow$ wait for message


## Implementing causal ordering

- Like FIFO multicast, but with vector clocks instead of sequence numbers

- Some care needed with dynamic groups


## Total ordering

- Sometimes we want all processes to see exactly the same sequence of messages, in the same order
- particularly for state machine replication (see later)
- One option: use a dedicated sequencer process
- Other processes ask for global sequence no. (GSN), and then send with this in packet
- Use FIFO ordering algorithm, but on GSNs
- Problem: what if sequencer crashes/is unreachable?
- Another option: order by Lamport timestamp
- Problem: how do you know if you have seen all messages with timestamp < T?
- Need to wait for $\geq 1$ message with timestamp $\geq$ T from every other process


## Ordering and asynchrony

- FIFO ordering allows quite a lot of asynchrony
- E.g. any process can delay sending a message until it has a batch (to improve performance)
- Or can just tolerate variable and/or long delays
- Causal ordering also allows some asynchrony
- But must be careful queues don't grow too large!
- Performance of total-order multicast not so good:
- Since every message delivery transitively depends on every prior one, delays holds up the entire system
- Instead tend to an (almost) synchronous model, but this performs poorly, particularly over the wide area
- Insight: total order multicast is equivalent to consensus [Chandra and Toueg 1996]


## Summary + next time

- Vector clocks
- Consistent global state + consistent cuts
- Process groups and reliable multicast
- Implementing order
- Distributed mutual exclusion
- Leader elections and distributed consensus
- Distributed transactions and commit protocols
- Replication and consistency

