

CS5412: REPLICATION, CONSISTENCY AND CLOCKS



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Recall that clouds have tiers

- Up to now our focus has been on client systems and the network, and the way that the cloud has reshaped both
- We looked very superficially at the tiered structure of the cloud itself
 - ▣ Tier 1: Very lightweight, responsive “web page builders” that can also route (or handle) “web services” method invocations. Limited to “soft state”.
 - ▣ Tier 2: (key,value) stores and similar services that support tier 1. Basically, various forms of caches.
 - ▣ Inner tiers: Online services that handle requests not handled in the first tier. These can store persistent files, run transactional services. But we shield them from load.
 - ▣ Back end: Runs offline services that do things like indexing the web overnight for use by tomorrow morning’s tier-1 services.

Replication

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- A central feature of the cloud
- To handle more work, make more copies
 - ▣ In the first tier, which is highly elastic, data center management layer pre-positions inactive copies of virtual machines for the services we might run
 - Exactly like installing a program on some machine
 - ▣ If load surges, creating more instances just entails
 - Running more copies on more nodes
 - Adjusting the load-balancer to spray requests to new nodes
 - ▣ If load drops... just kill the unwanted copies!
 - Little or no warning. Discard any “state” they created locally.

Replication is about keeping copies

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- The term may sound fancier but the meaning isn't
- Whenever we have many copies of something we say that we've replicated that thing
 - ▣ But usually replica does connote "identical"
 - ▣ Instead of *replication* we use the term *redundancy* for things like alternative communication paths (e.g. if we have two distinct TCP connections from some client system to the cloud)
 - ▣ Redundant things might not be identical. Replicated things usually play identical roles and have equivalent data.

Things we can replicate in a cloud

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- Files or other forms of data used to handle requests
 - ▣ If all our first tier systems replicate the data needed for end-user requests, then they can handle all the work!
 - ▣ Two cases to consider: in one the data itself is “write once” like a photo. Either you have a replica, or don’t
 - ▣ In the other the data evolves over time, like the current inventory count for the latest iPad in the Apple store
- Computation
 - ▣ Here we replicate some *request* and then the work of computing the answer can be spread over multiple programs in the cloud
 - ▣ We benefit from parallelism by getting a faster answer
 - ▣ Can also provide fault-tolerance

Many things “map” to replication

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- As we just saw, data (or databases), computation
- Fault-tolerant request processing
- Coordination and synchronization (e.g. “who’s in charge of the air traffic control sector over Paris?”)
- Parameters and configuration data
- Security keys and lists of possible users and the rules for who is permitted to do what
- Membership information in a DHT or some other service that has many participants

So... focus on replication!

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- If we can get replication right, we'll be on the road to a highly assured cloud infrastructure
- Key is to understand what it means to correctly replicate data at cloud scale...
- ... then once we know what we want to do, to find scalable ways to implement needed abstraction(s)

Concept of “consistency”

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- We would say that a replicated entity behaves in a consistent manner if mimics the behavior of a non-replicated entity
 - ▣ E.g. if I ask it some question, and it answers, and then you ask it that question, your answer is either the same or reflects some update to the underlying state
 - ▣ Many copies but acts like just one
- An inconsistent service is one that seems “broken”

Consistency lets us ignore implementation

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A consistent distributed system will often have many components, but users observe behavior indistinguishable from that of a single-component reference system



Reference Model



Implementation

Dangers of Inconsistency

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**My rent check bounced?
That can't be right!**

- Inconsistency causes bugs
 - ▣ Clients would never be able to trust servers... a free-for-all
- Weak or “best effort” consistency?
 - ▣ Common in today’s cloud replication schemes
 - ▣ But strong security guarantees demand consistency
 - ▣ Would you trust a medical electronic-health records system or a bank that used “weak consistency” for better scalability?



Leslie Lamport's insight

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- To formalize notions of consistency, start by formalizing notions of time
- Once we do this we can be rigorous about notions like “before” or “after” or “simultaneously”
 - ▣ If we try to write down conditions for correct replication these kinds of terms often arise



What time is it?

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- In distributed system we need practical ways to deal with time
 - ▣ E.g. we may need to agree that update A occurred before update B
 - ▣ Or offer a “lease” on a resource that expires at time 10:10.0150
 - ▣ Or *guarantee* that a time critical event will reach all interested parties within 100ms

But what does time “mean”?

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- Time on a global clock?
 - ▣ E.g. on Cornell clock tower?
 - ▣ ... or perhaps on a GPS receiver?
- ... or on a machine’s local clock
 - ▣ But was it set accurately?
 - ▣ And could it drift, e.g. run fast or slow?
 - ▣ What about faults, like stuck bits?
- ... or could try to agree on time



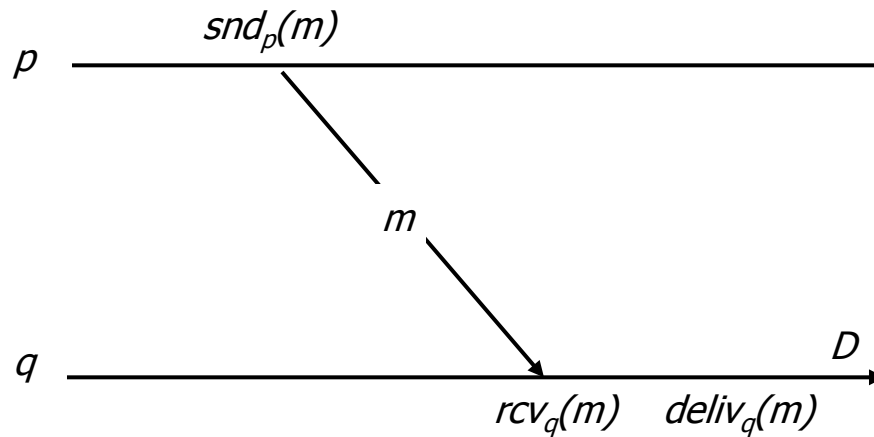
Lamport's approach

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- Leslie Lamport suggested that we should reduce time to its basics
 - ▣ Time lets a system ask “Which came first: event A or event B?”
 - ▣ In effect: time is a means of labeling events so that...
 - If A happened before B, $\text{TIME}(A) < \text{TIME}(B)$
 - If $\text{TIME}(A) < \text{TIME}(B)$, A happened before B

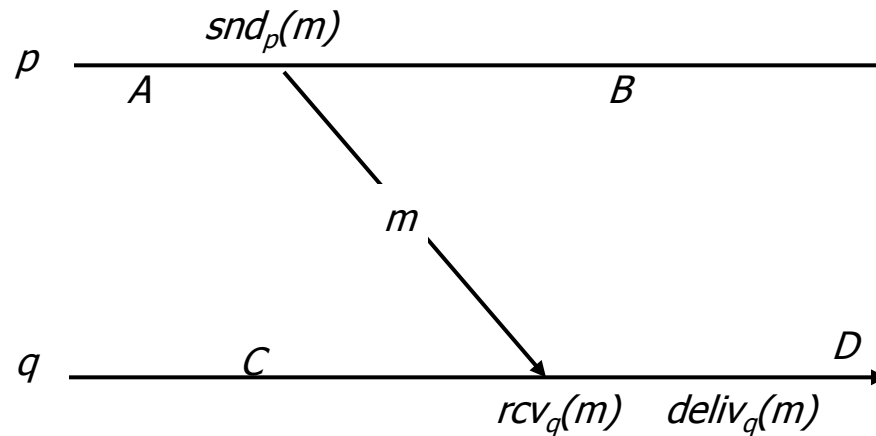
Drawing time-line pictures:

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Drawing time-line pictures:

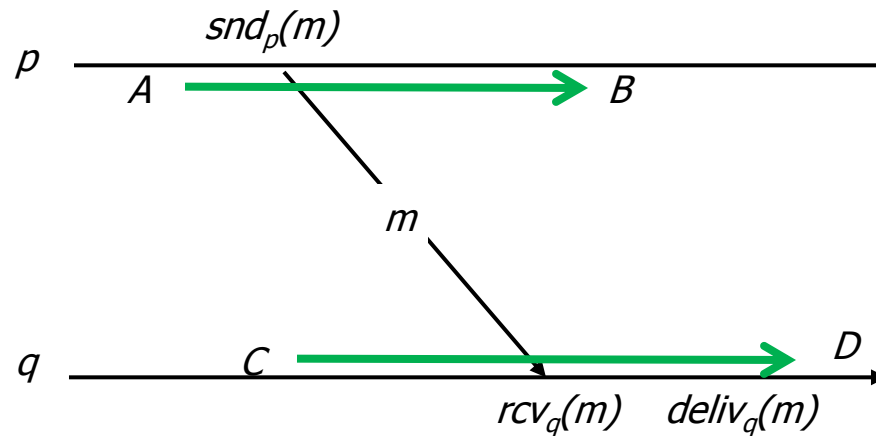
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- A , B , C and D are “events”.
 - ▣ Could be anything meaningful to the application
 - ▣ So are $snd(m)$ and $rcv(m)$ and $deliv(m)$
- What ordering claims are meaningful?

Drawing time-line pictures:

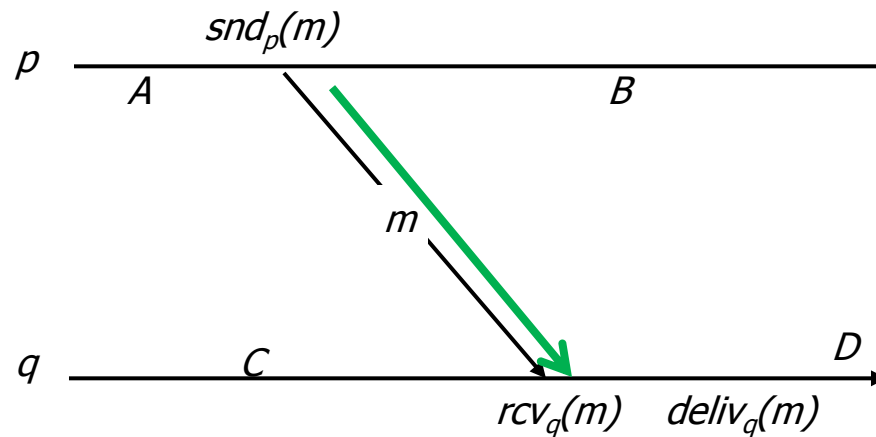
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- A happens before B, and C before D
 - “Local ordering” at a single process
 - Write $A \xrightarrow{p} B$ and $C \xrightarrow{q} D$

Drawing time-line pictures:

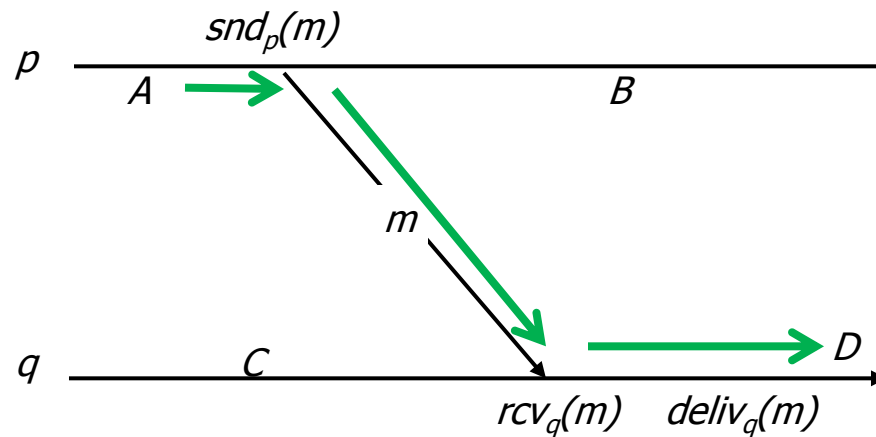
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- $snd_p(m)$ also happens before $rcv_q(m)$
 - “Distributed ordering” introduced by a message
 - Write $snd_p(m) \xrightarrow{M} rcv_q(m)$

Drawing time-line pictures:

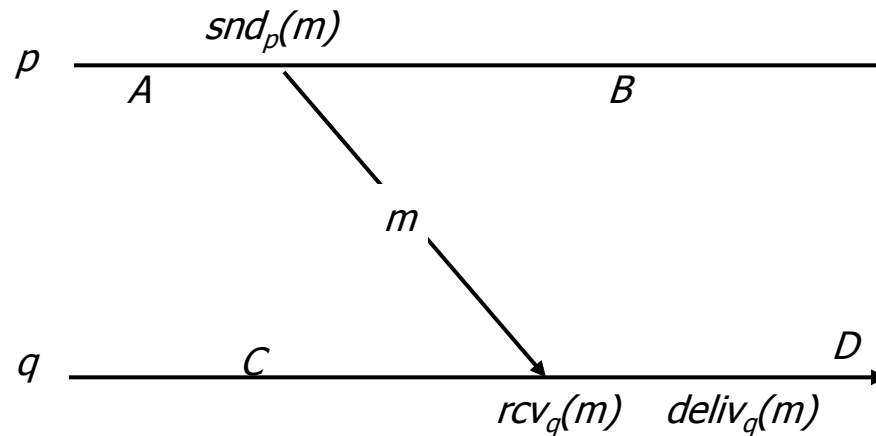
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- A happens before D
 - Transitivity: A happens before $snd_p(m)$, which happens before $rcv_q(m)$, which happens before D

Drawing time-line pictures:

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- B and D are concurrent
 - ▣ Looks like B happens first, but D has no way to know. No information flowed...

Happens before “relation”

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- We say that “A happens before B”, written $A \rightarrow B$, if
 1. $A \rightarrow^P B$ according to the local ordering, or
 2. A is a *snd* and B is a *rcv* and $A \rightarrow^M B$, or
 3. A and B are related under transitive closure of rules (1) and (2)

- Notice that, so far, this is just a mathematical notation, not a “systems tool”
 - Given a trace of what happened in a system we could use these tools to talk about the trace
 - But need a way to “implement” this idea

Logical clocks

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- A simple tool that can capture parts of the happens before relation
- First version: uses just a single integer
 - ▣ Designed for big (64-bit or more) counters
 - ▣ Each process p maintains LT_p , a local counter
 - ▣ A message m will carry LT_m

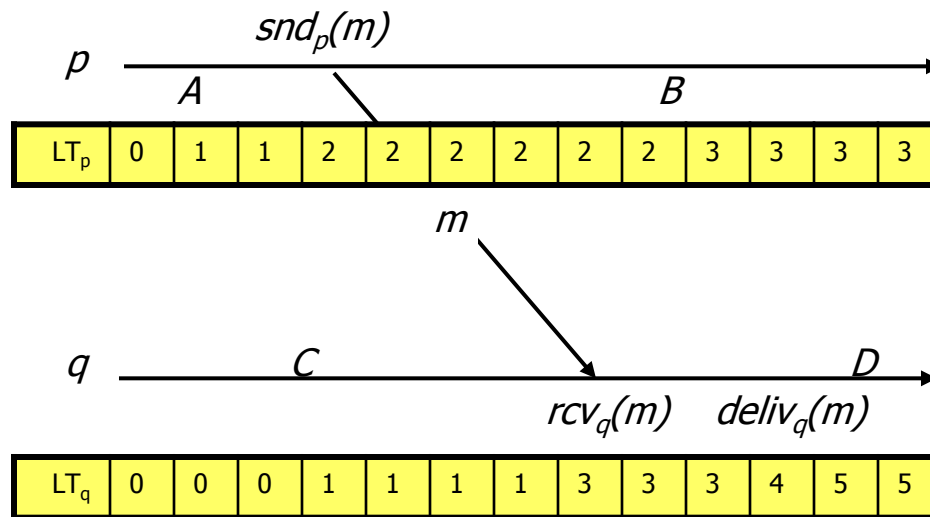
Rules for managing logical clocks

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- When an event happens at a process p it increments LT_p .
 - ▣ Any event that matters to p
 - ▣ Normally, also *snd* and *rcv* events (since we want receive to occur “after” the matching send)
- When p sends m , set
 - ▣ $LT_m = LT_p$
- When q receives m , set
 - ▣ $LT_q = \max(LT_q, LT_m) + 1$

Time-line with LT annotations

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- $LT(A) = 1, LT(snd_p(m)) = 2, LT(m) = 2$
- $LT(rcv_q(m)) = \max(1, 2) + 1 = 3, \text{ etc...}$

Logical clocks

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- If A happens before B, $A \rightarrow B$,
then $LT(A) < LT(B)$
- But converse might not be true:
 - ▣ If $LT(A) < LT(B)$ can't be sure that $A \rightarrow B$
 - ▣ This is because processes that don't communicate still assign timestamps and hence events will “seem” to have an order

Can we do better?

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- One option is to use *vector* clocks
- Here we treat timestamps as a list
 - ▣ One counter for each process
- Rules for managing vector times differ from what did with logical clocks

History of vector clocks?

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- Originated in work at UCLA on file systems that allowed updates from multiple sources concurrently
 - ▣ Jerry Popek's FICUS system
 - ▣ Today version systems (e.g. SVN, CVS) use the idea
- Also gradually adopted in distributed systems
- Most of the “formal” work was done by Fidge and Mattern in Europe, long after idea was in wide use

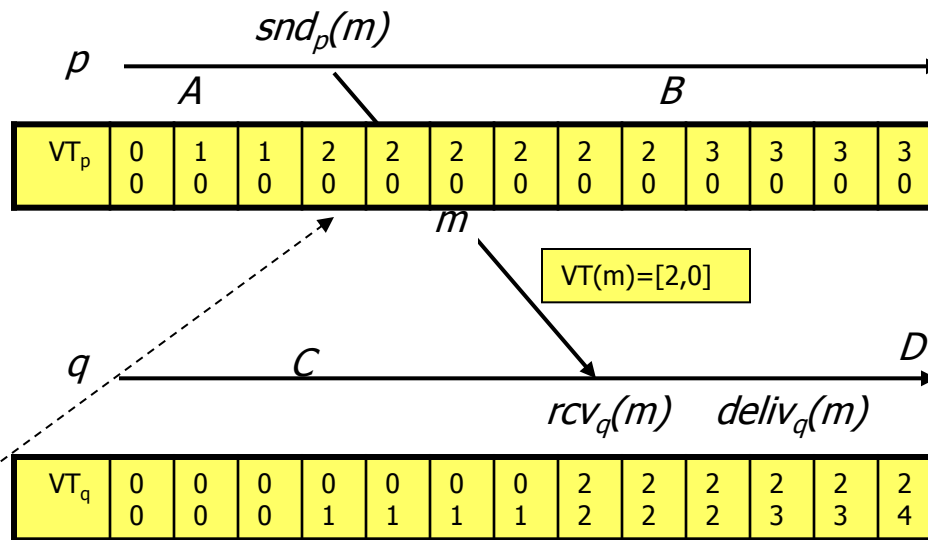
Vector clocks

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- Clock is a vector: e.g. $VT(A)=[1, 0]$
 - We'll just assign p index 0 and q index 1
 - Vector clocks require either agreement on the numbering, or that the actual process id's be included with the vector
- Rules for managing vector clock
 - When event happens at p, increment $VT_p[index_p]$
 - Normally, also increment for snd and rcv events
 - When sending a message, set $VT(m)=VT_p$
 - When receiving, set $VT_q=\max(VT_q, VT(m))$

Time-line with VT annotations

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Could also be $[1,0]$ if we decide not to increment the clock on a snd event. Decision depends on how the timestamps will be used.

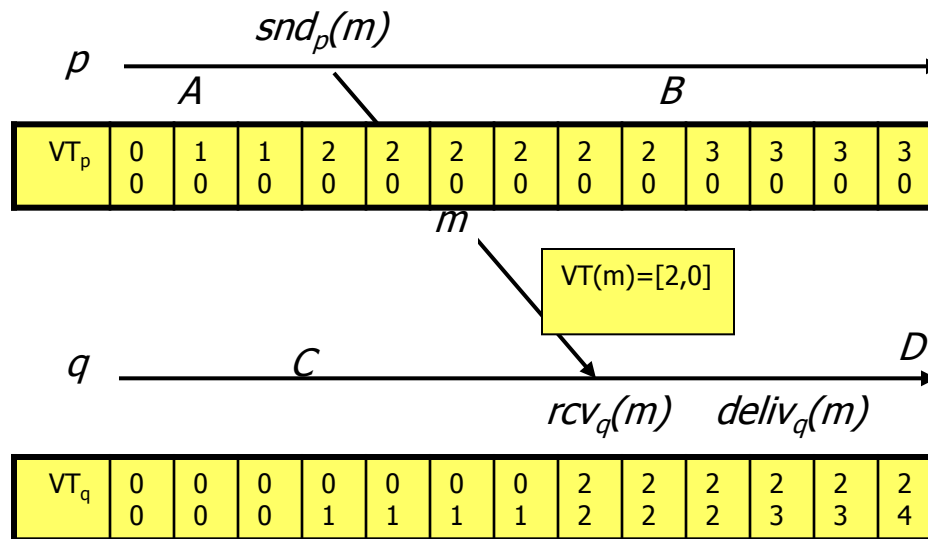
Rules for comparison of VTs

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- We'll say that $VT_A \leq VT_B$ if
 - $\forall i, VT_A[i] \leq VT_B[i]$
- And we'll say that $VT_A < VT_B$ if
 - $VT_A \leq VT_B$ but $VT_A \neq VT_B$
 - That is, for some i , $VT_A[i] < VT_B[i]$
- Examples?
 - $[2,4] \leq [2,4]$
 - $[1,3] < [7,3]$
 - $[1,3]$ is “incomparable” to $[3,1]$

Time-line with VT annotations

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- $VT(A)=[1,0]$. $VT(D)=[2,4]$. So $VT(A) < VT(D)$
- $VT(B)=[3,0]$. So $VT(B)$ and $VT(D)$ are incomparable

Vector time and happens before

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- If $A \rightarrow B$, then $VT(A) < VT(B)$
 - ▣ Write a chain of events from A to B
 - ▣ Step by step the vector clocks get larger
- If $VT(A) < VT(B)$ then $A \rightarrow B$
 - ▣ Two cases: if A and B both happen at same process p, trivial
 - ▣ If A happens at p and B at q, can trace the path back by which q “learned” $VT_A[p]$
- Otherwise A and B happened concurrently

Temporal distortions

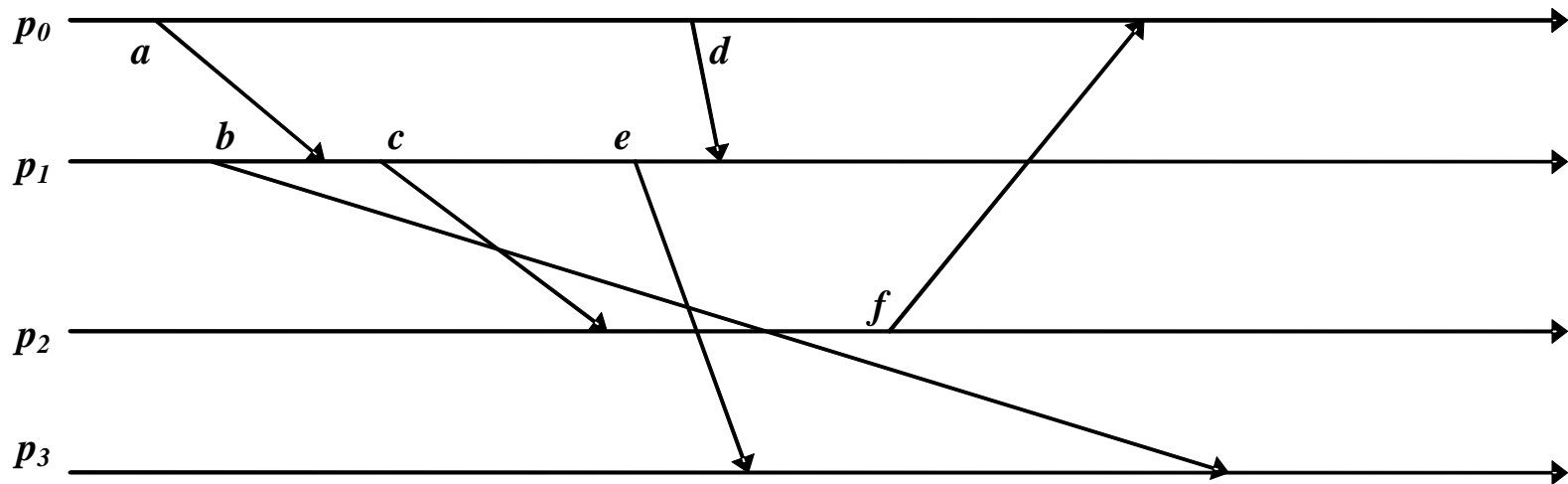
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- Things can be complicated because we can't predict
 - Message delays (they vary constantly)
 - Execution speeds (often a process shares a machine with many other tasks)
 - Timing of external events
- Lamport looked at this question too

Temporal distortions

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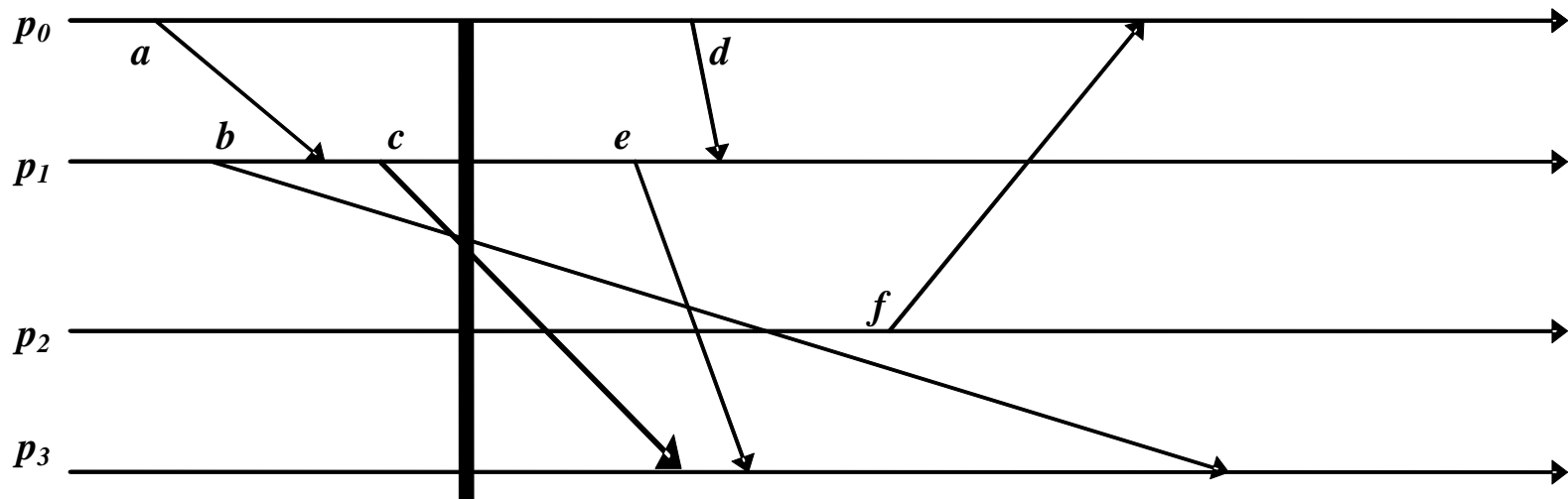
□ What does “now” mean?



Temporal distortions

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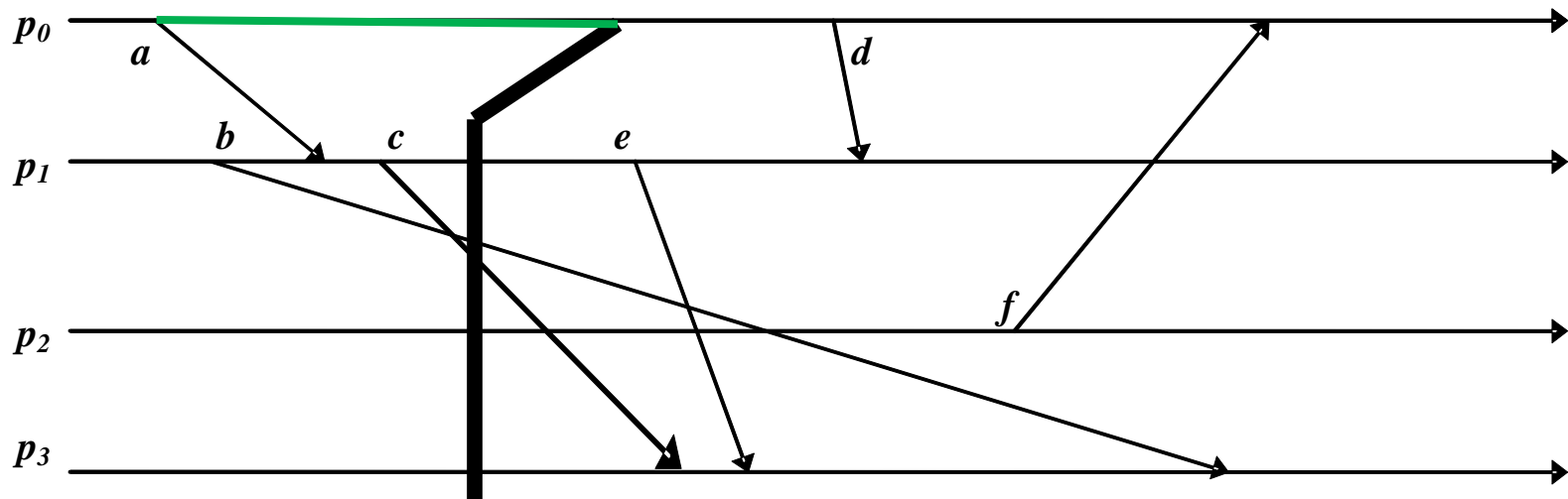
- What does “now” mean?



Temporal distortions

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- Timelines can “stretch”...

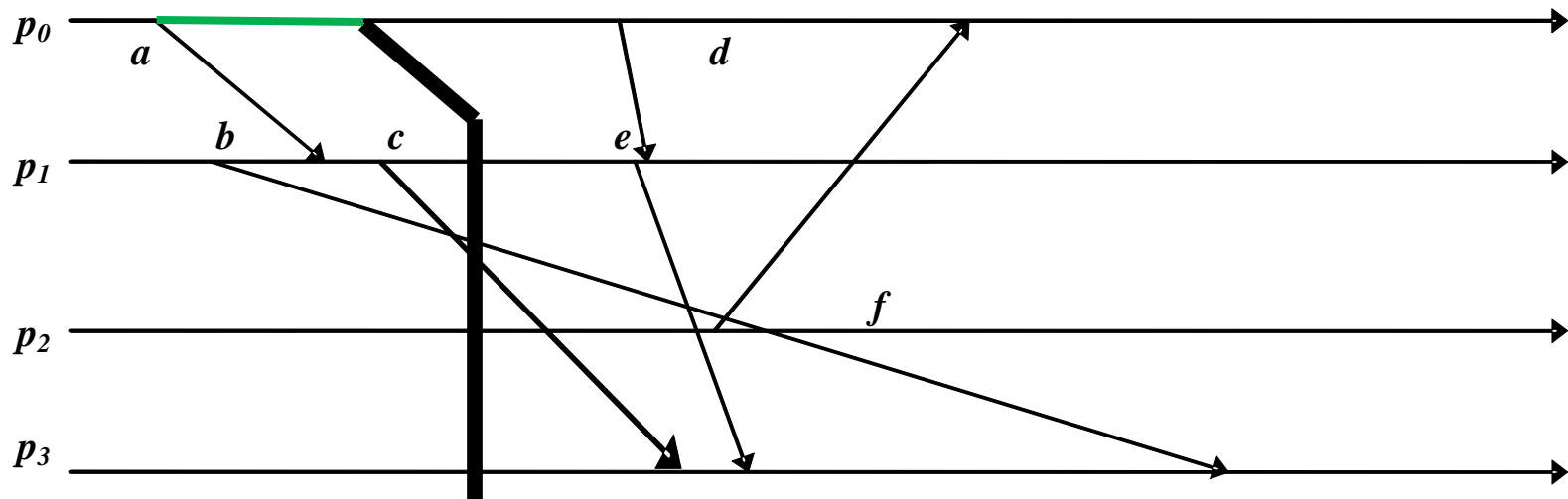


- ... caused by scheduling effects, message delays, message loss...

Temporal distortions

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- Timelines can “shrink”

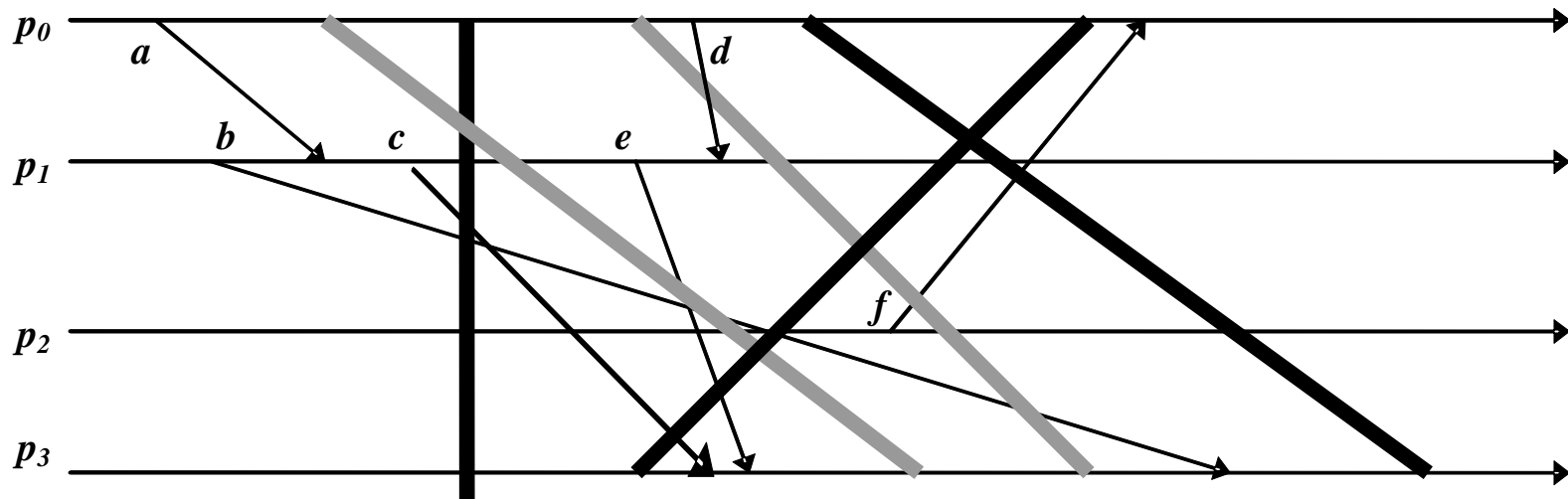


- E.g. something lets a machine speed up

Temporal distortions

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- Cuts represent instants of time.



- But not every “cut” makes sense
 - Black cuts could occur but not gray ones.

Consistent cuts and snapshots

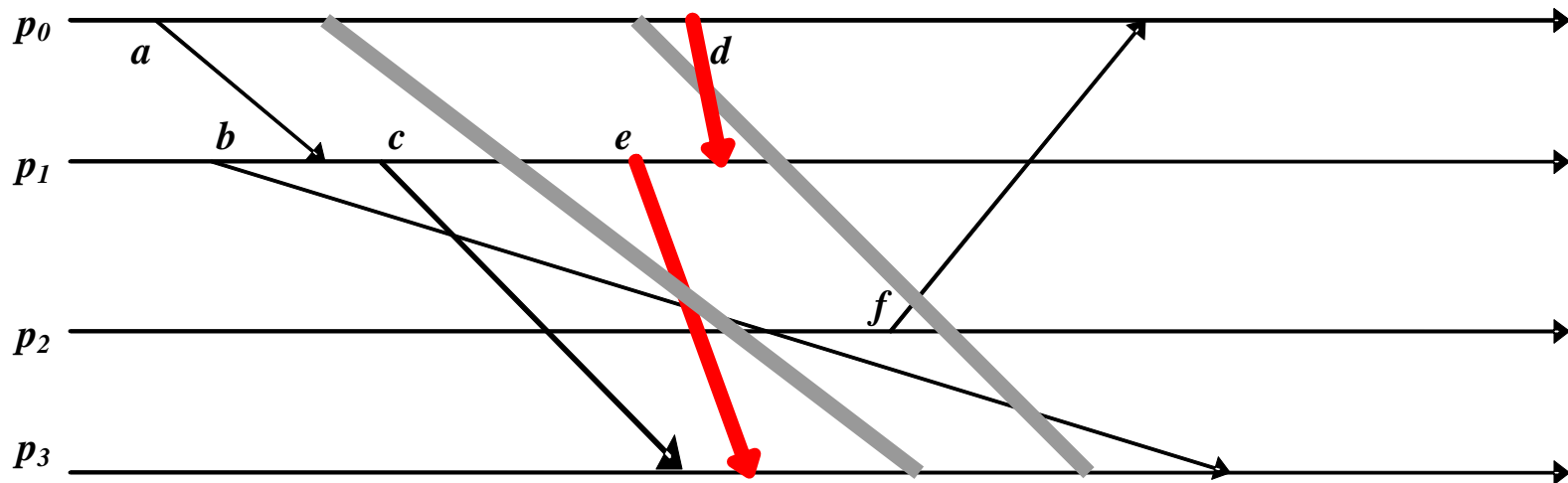
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- Idea is to identify system states that “might” have occurred in real-life
 - ▣ Need to avoid capturing states in which a message is received but nobody is shown as having sent it
 - ▣ This the problem with the gray cuts

Temporal distortions

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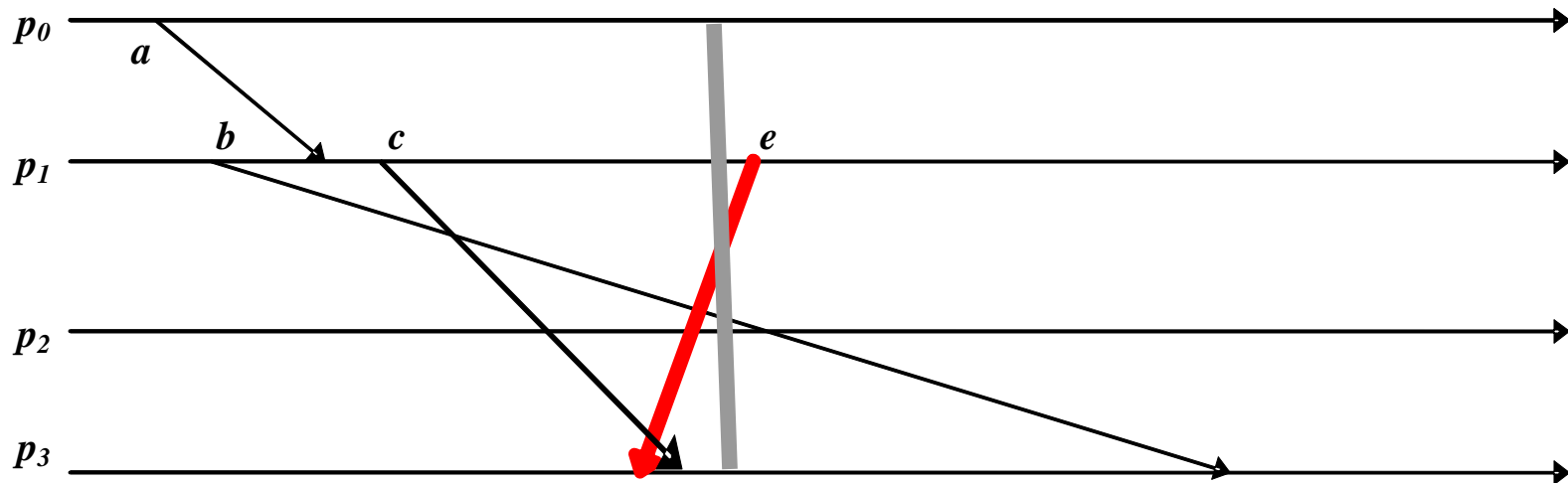
- Red messages cross gray cuts “backwards”



Temporal distortions

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- Red messages cross gray cuts “backwards”



- In a nutshell: the cut includes a message that “was never sent”

Application: Deadlock detection

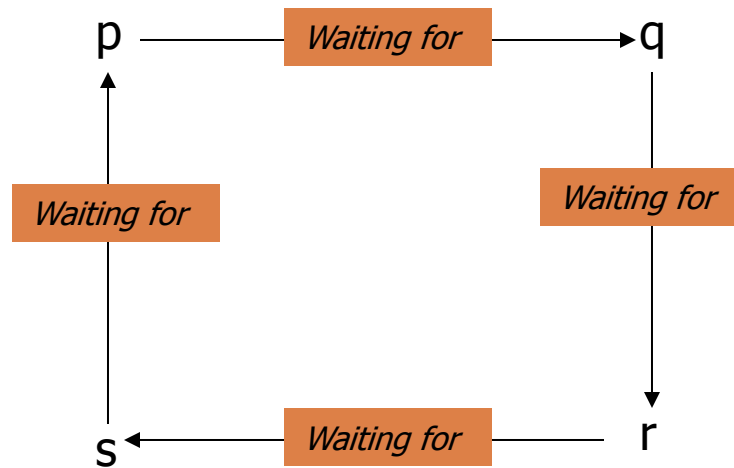
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- p worries: perhaps we have a deadlock
- p is waiting for q, so sends “what’s your state?”
- q, on receipt, is waiting for r, so sends the same question... and r for s.... And s is waiting on p.

Suppose we detect this state

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- We see a cycle...



- ... but is it a deadlock?

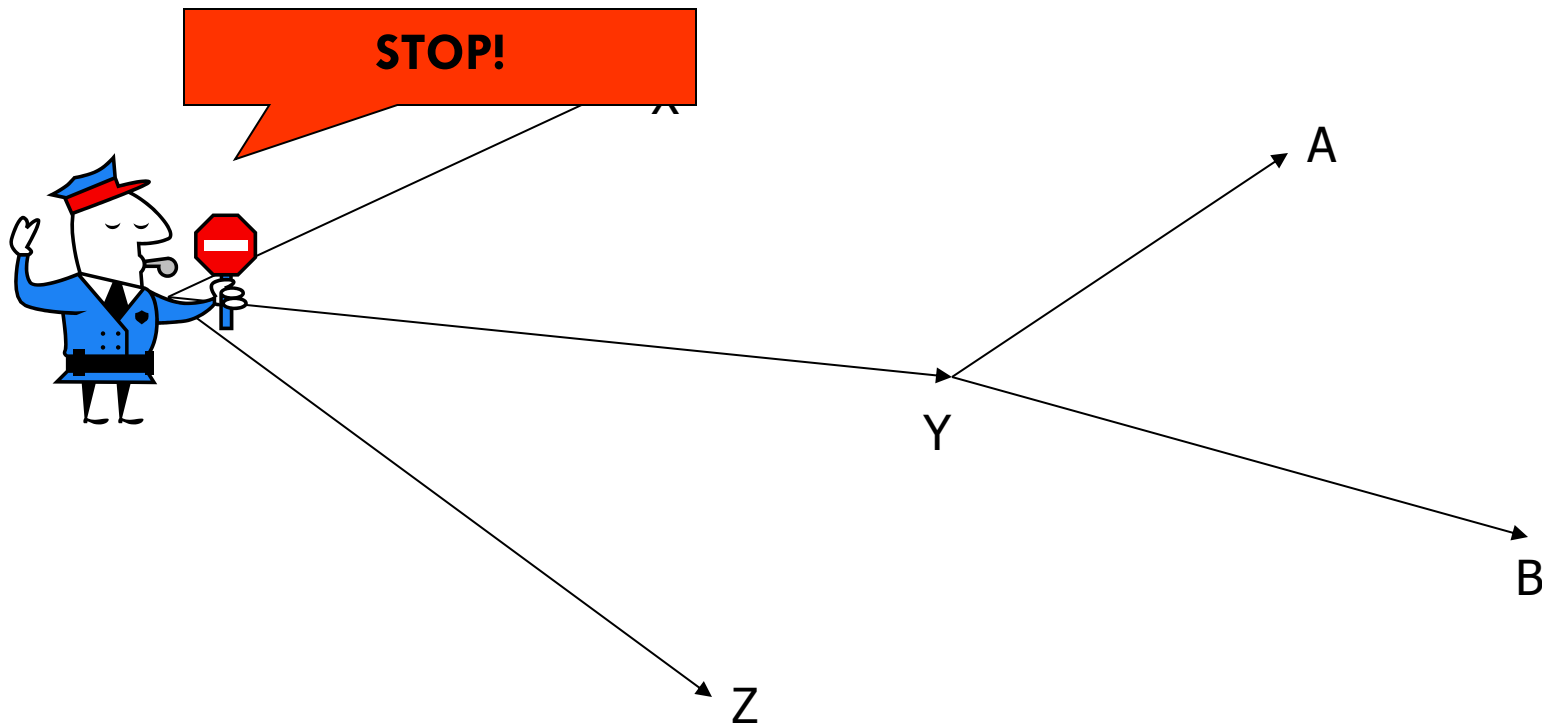
Phantom deadlocks!

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- Suppose system has a *very high rate* of locking.
- Then perhaps a lock release message “passed” a query message
 - ▣ i.e. we see “q waiting for r” and “r waiting for s” but in fact, by the time we checked r, q was no longer waiting!
- In effect: we checked for deadlock on a gray cut – an inconsistent cut.

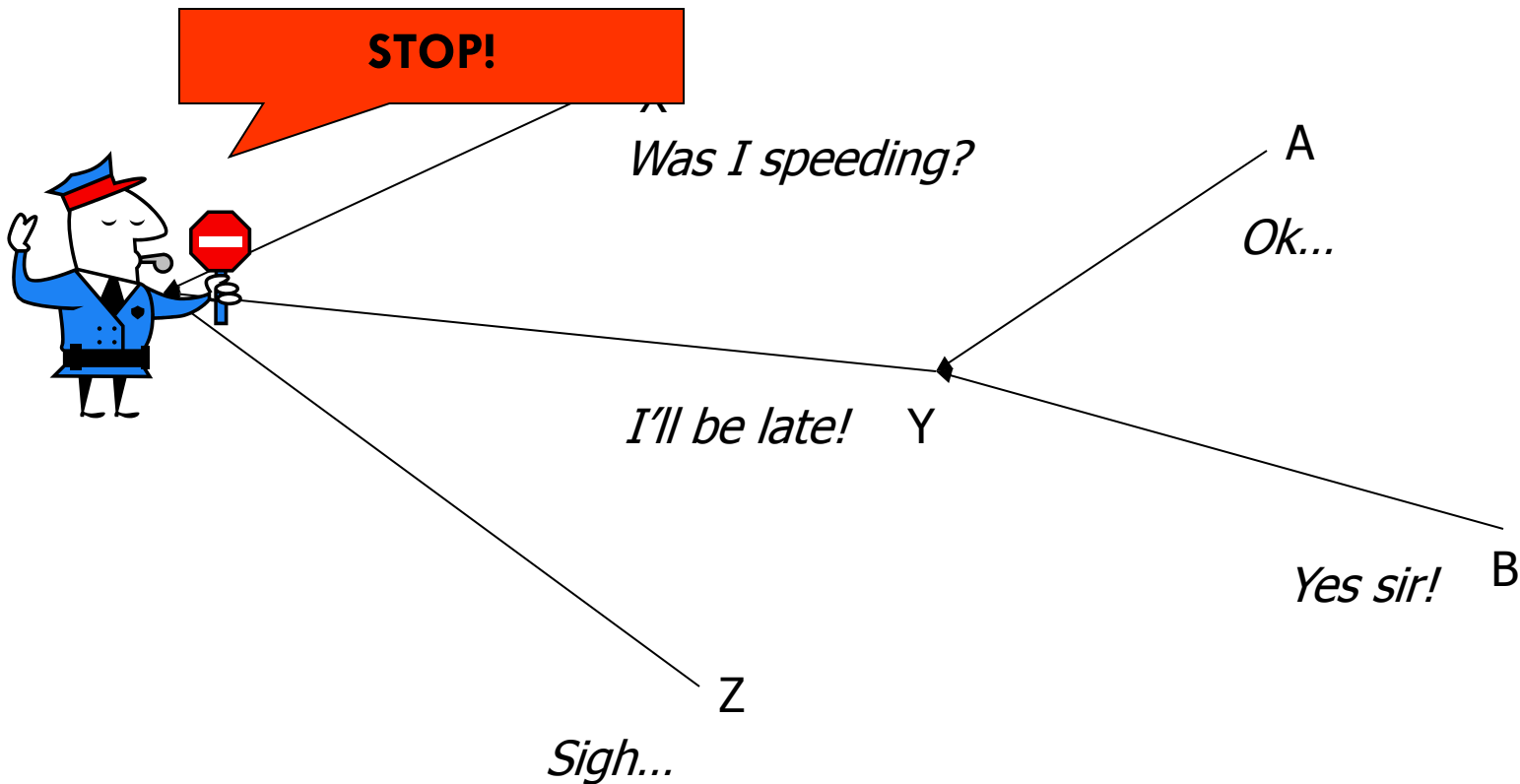
One solution is to “freeze” the system

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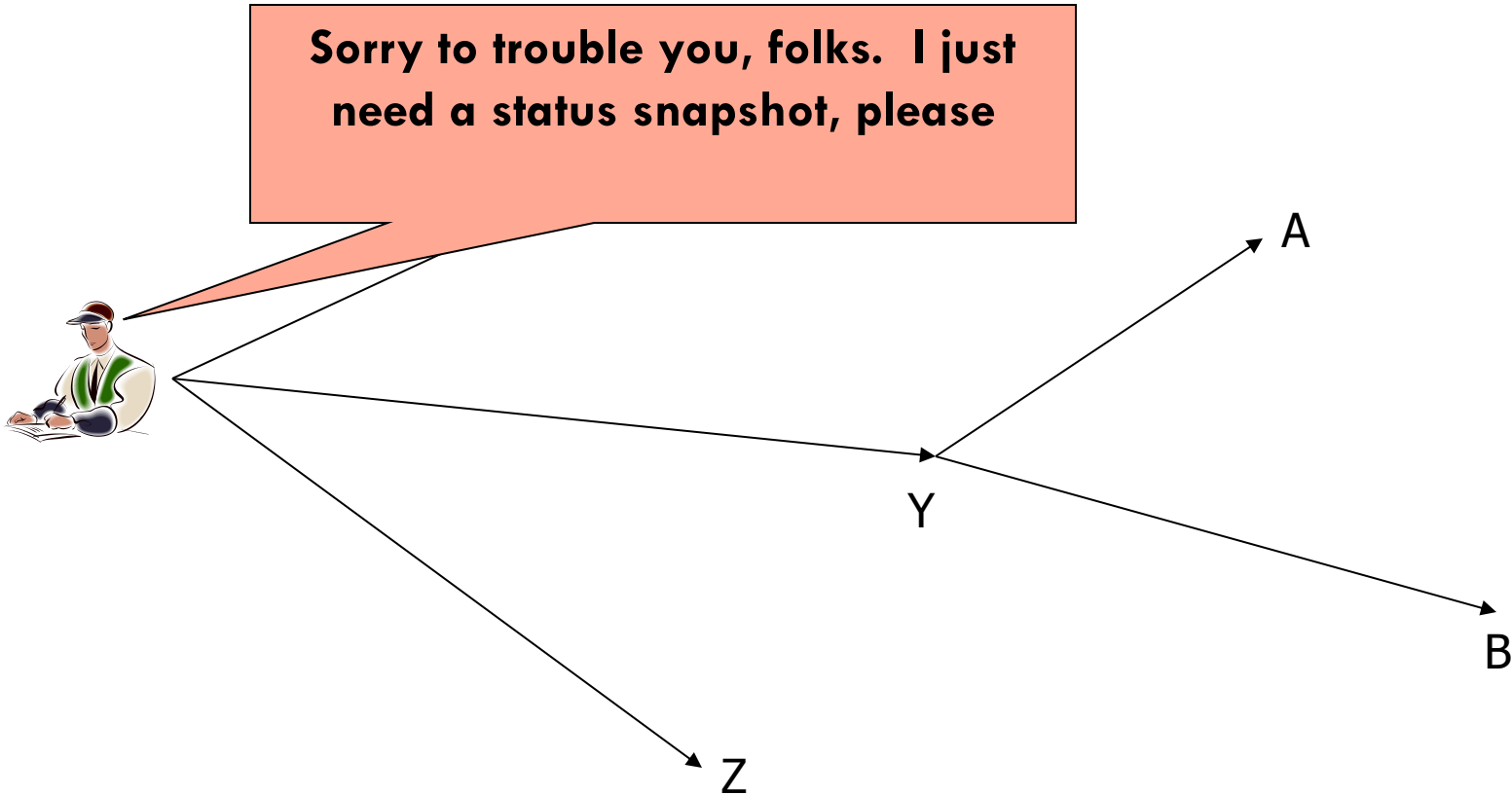
One solution is to “freeze” the system

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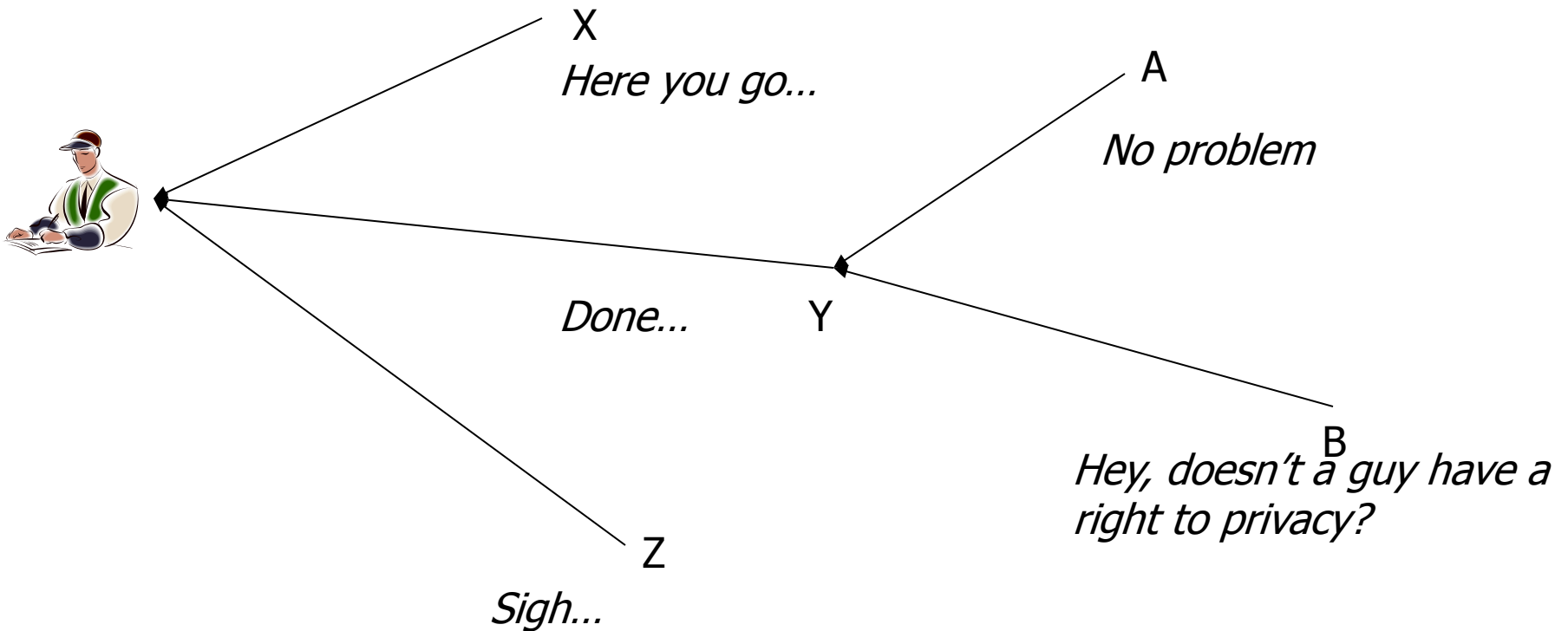
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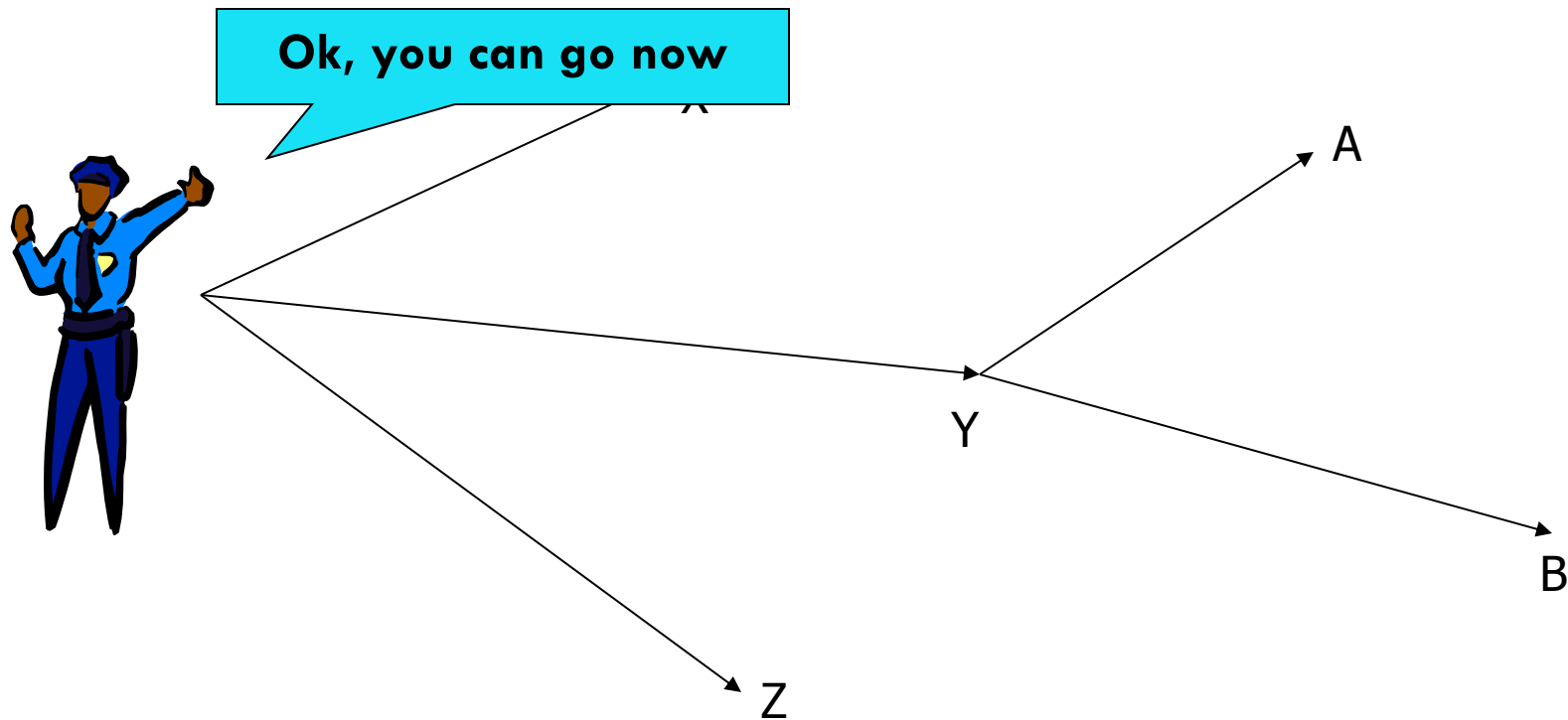
One solution is to “freeze” the system

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One solution is to “freeze” the system

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Why does it work?

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- When we check bank accounts, or check for deadlock, the system is idle
- So if “P is waiting for Q” and “Q is waiting for R” we really mean “simultaneously”
- But to get this guarantee we did something very costly because no new work is being done!

Consistent cuts and snapshots

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- Goal is to draw a line across the system state such that
 - ▣ Every message “received” by a process is shown as having been sent by some other process
 - ▣ Some pending messages might still be in communication channels
- And we want to do this *while running*

Turn idea into an algorithm

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- To start a new snapshot, p_i ...
 - ▣ Builds a message: “ P_i is initiating snapshot k ”.
 - The tuple (p_i, k) uniquely identifies the snapshot
 - ▣ Writes down its own state
 - ▣ Starts recording incoming messages on all channels

Turn idea into an algorithm

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- Now p_i tells its neighbors to start a snapshot
- In general, on first learning about snapshot (p_i, k) , p_x
 - ▣ Writes down its state: p_x 's contribution to the snapshot
 - ▣ Starts “tape recorders” for all communication channels
 - ▣ Forwards the message on all outgoing channels
 - ▣ Stops “tape recorder” for a channel when a snapshot message for (p_i, k) is received on it
- Snapshot consists of all the local state contributions and all the tape-recordings for the channels

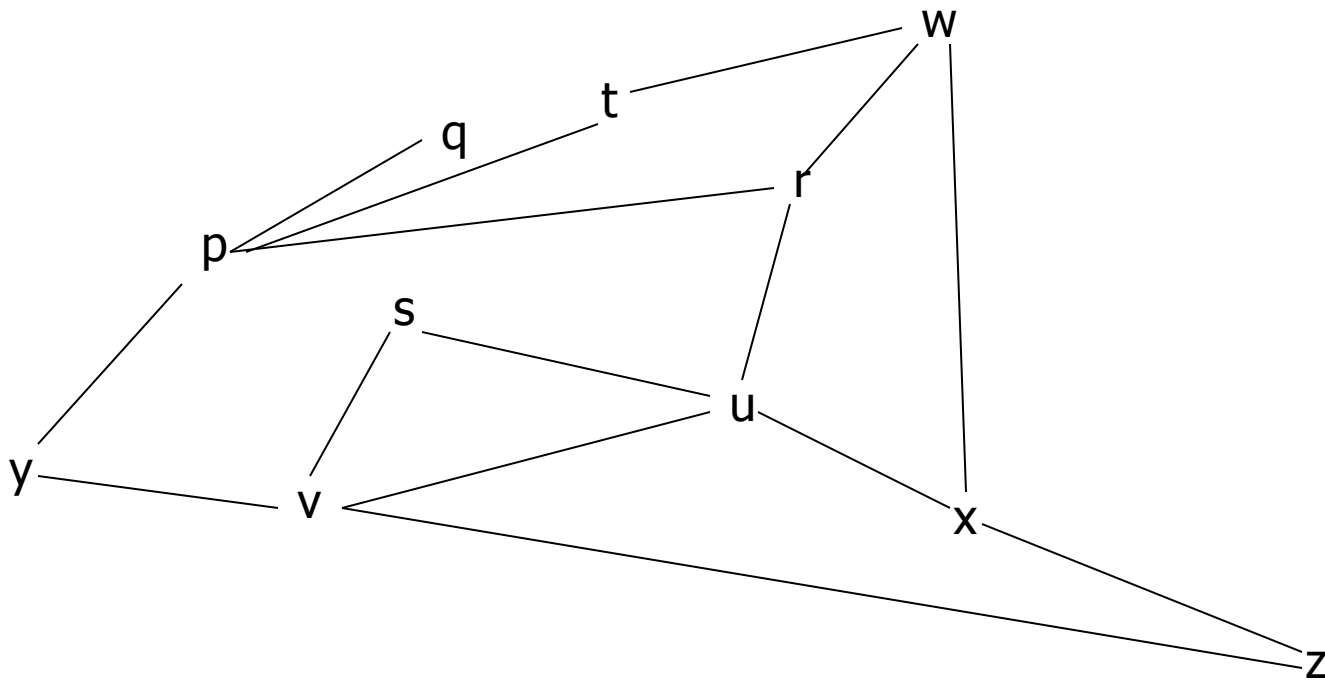
Chandy/Lamport

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- Outgoing wave of requests... incoming wave of snapshots and channel state
- Snapshot ends up accumulating at the initiator, p_i
- Algorithm doesn't tolerate process failures or message failures.

Chandy/Lamport

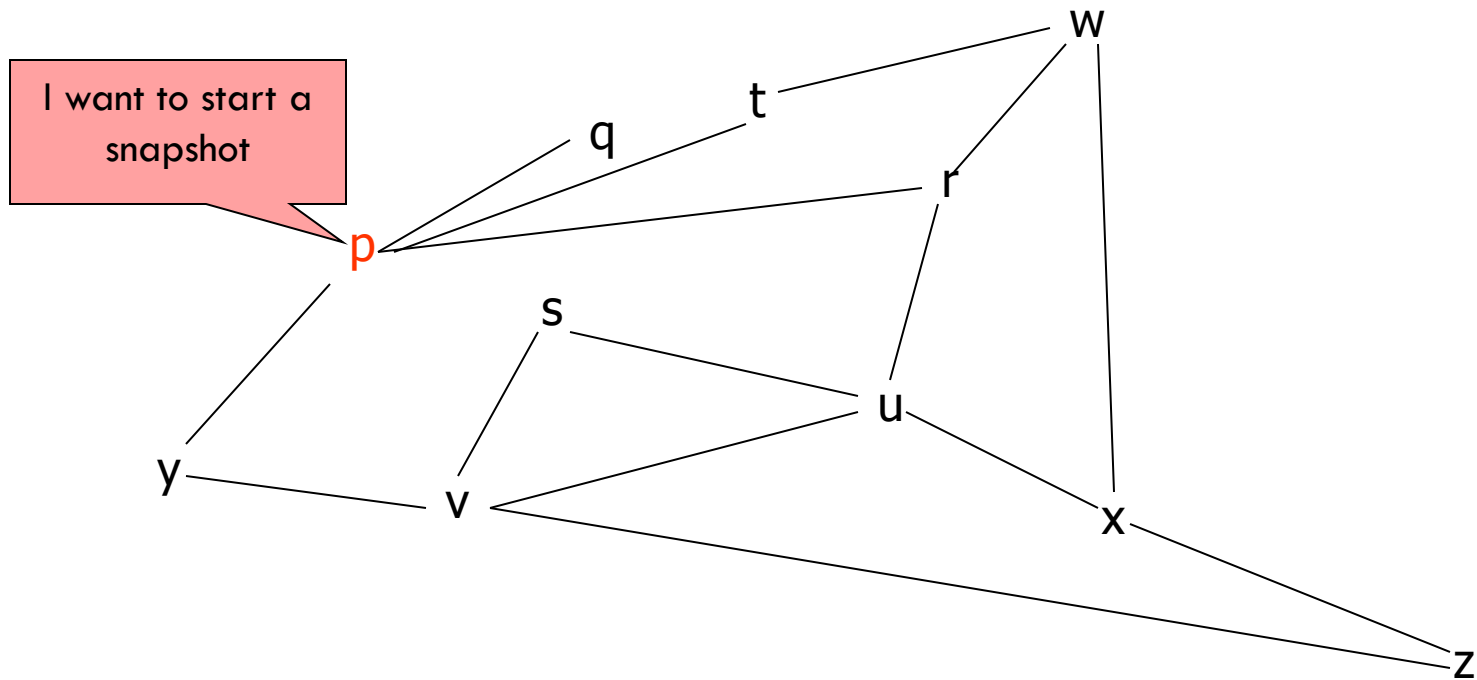
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A network

Chandy/Lamport

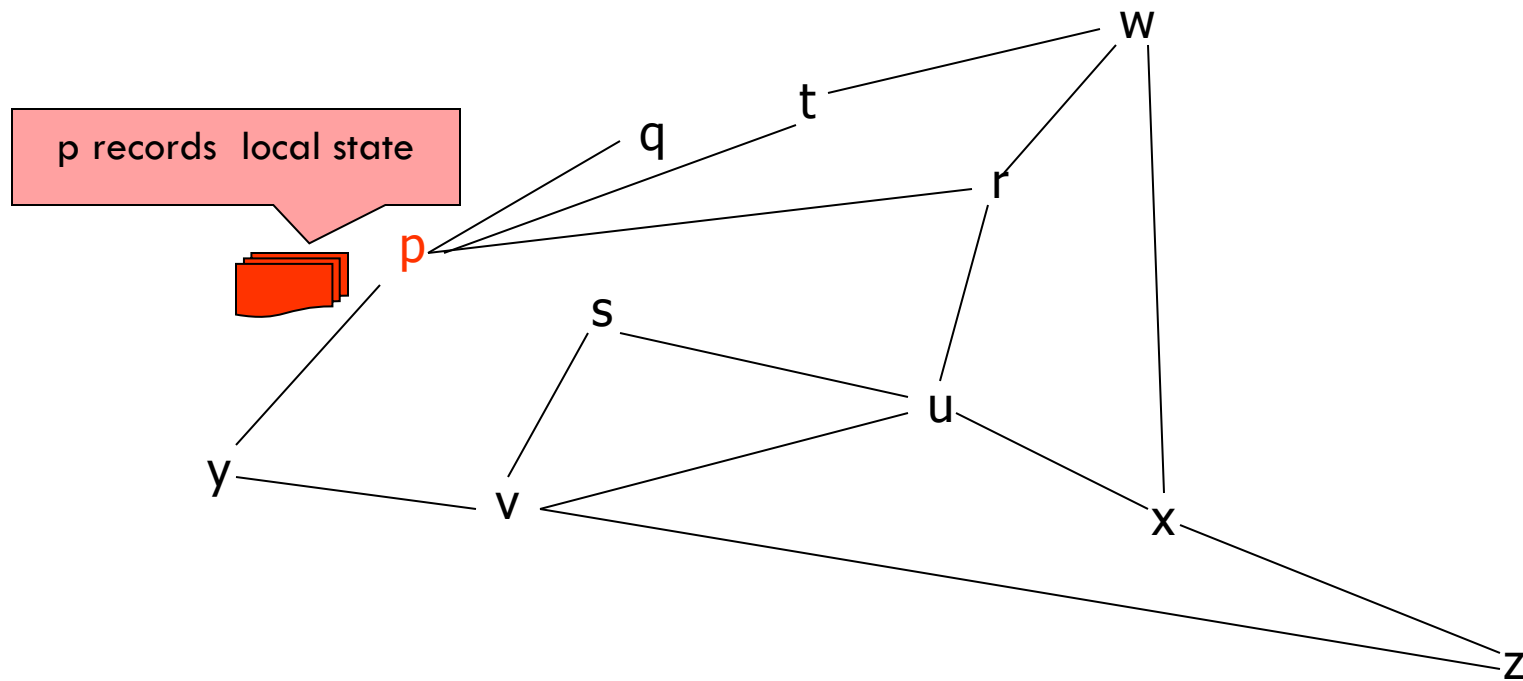
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A network

Chandy/Lamport

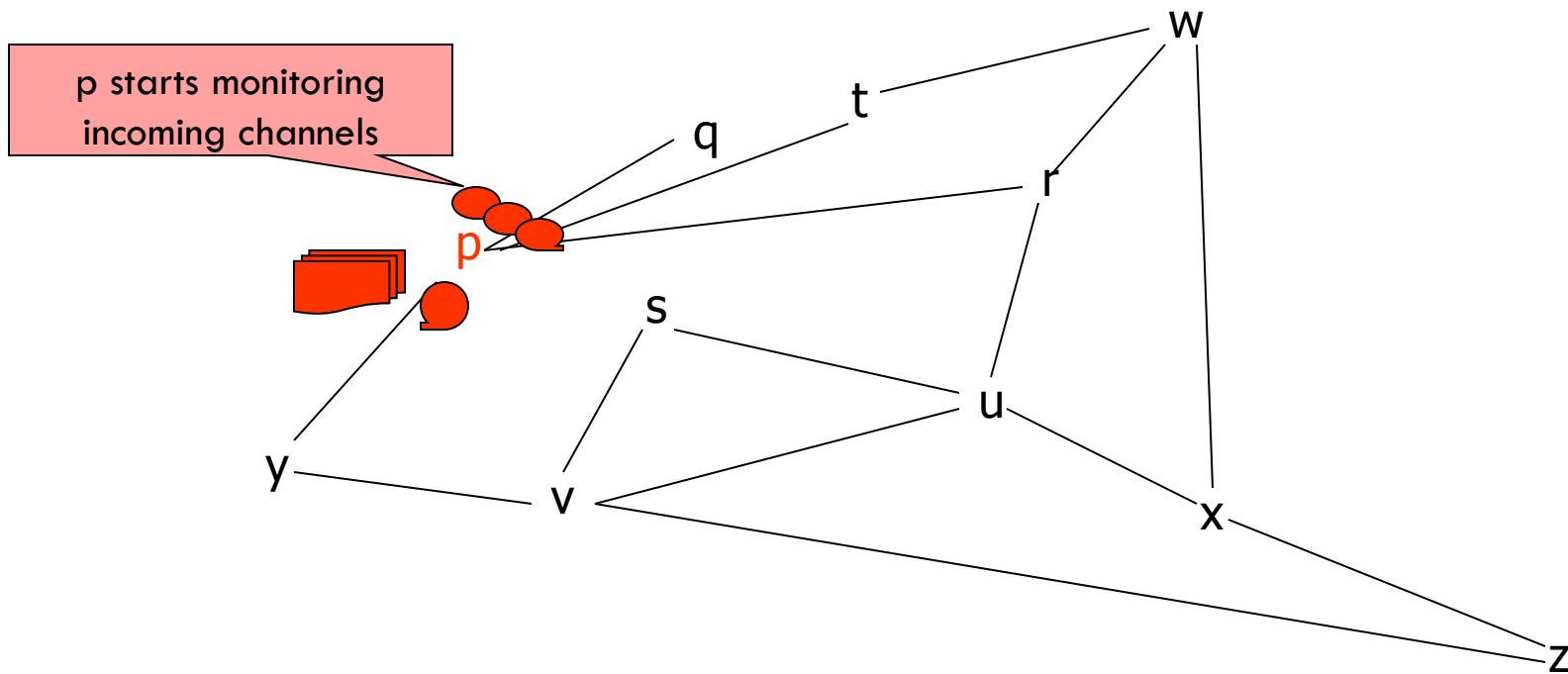
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A network

Chandy/Lampport

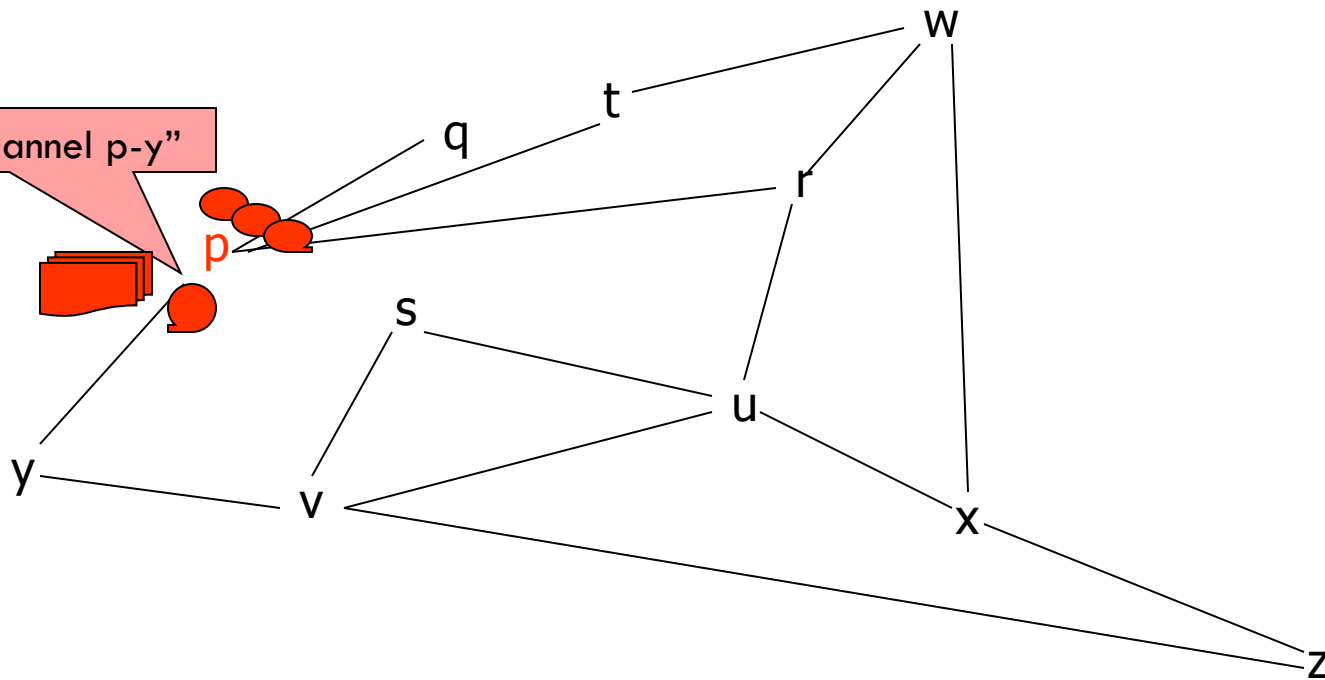
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A network

Chandy/Lamport

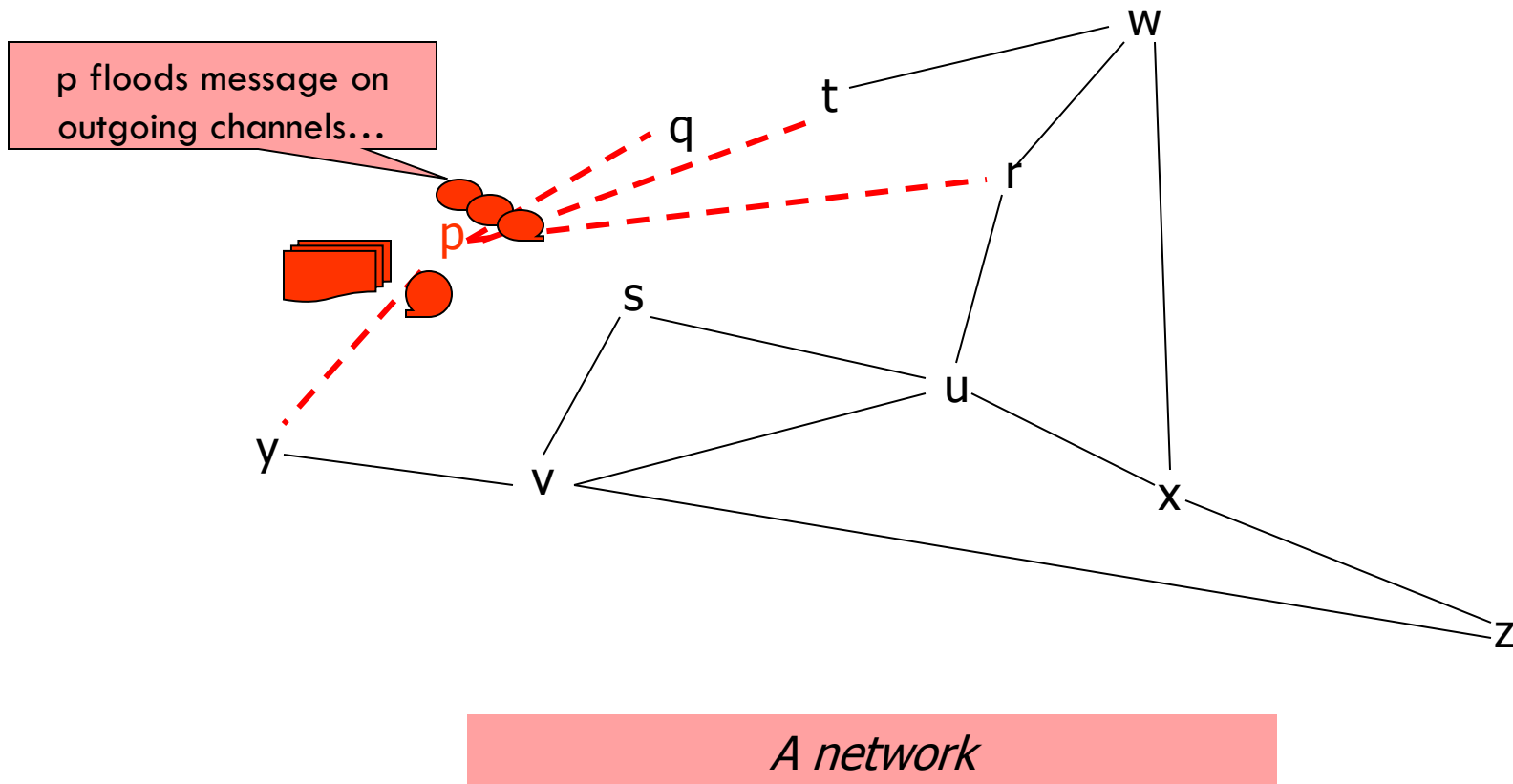
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A network

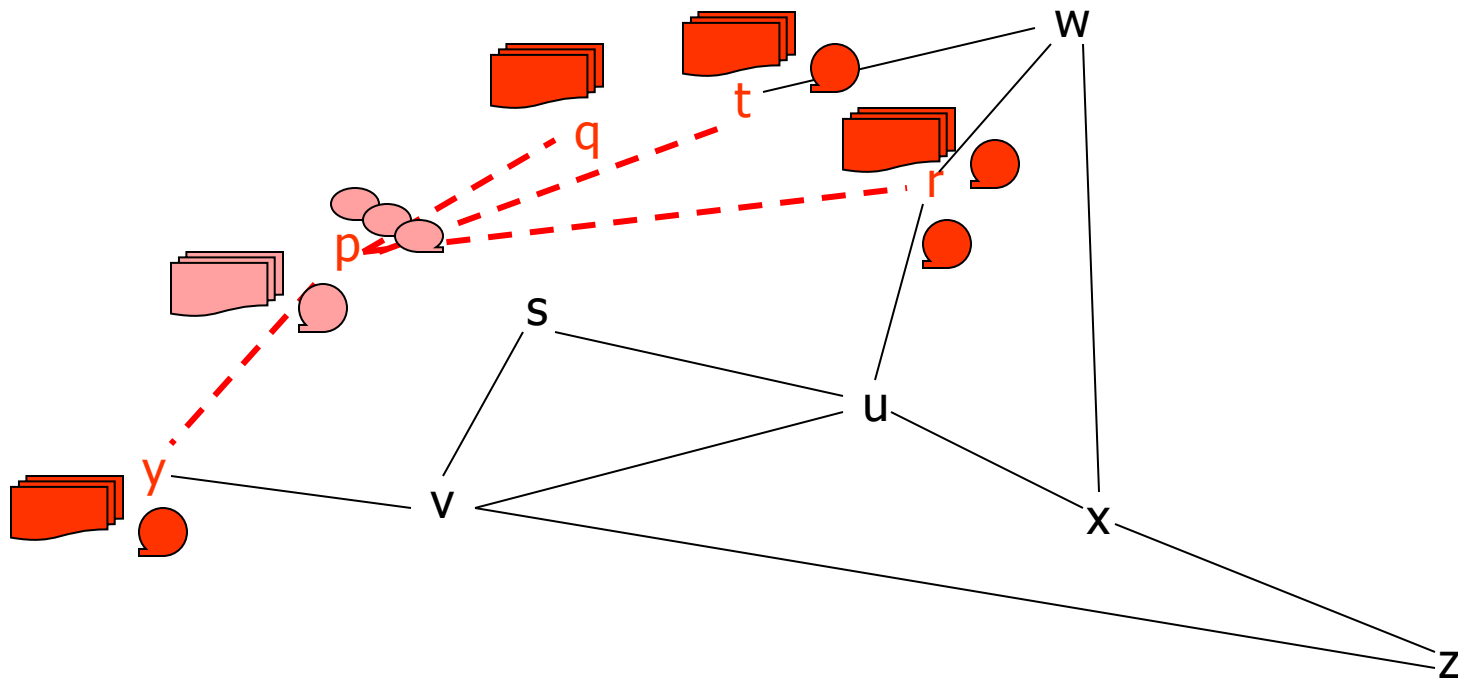
Chandy/Lampport

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Chandy/Lamport

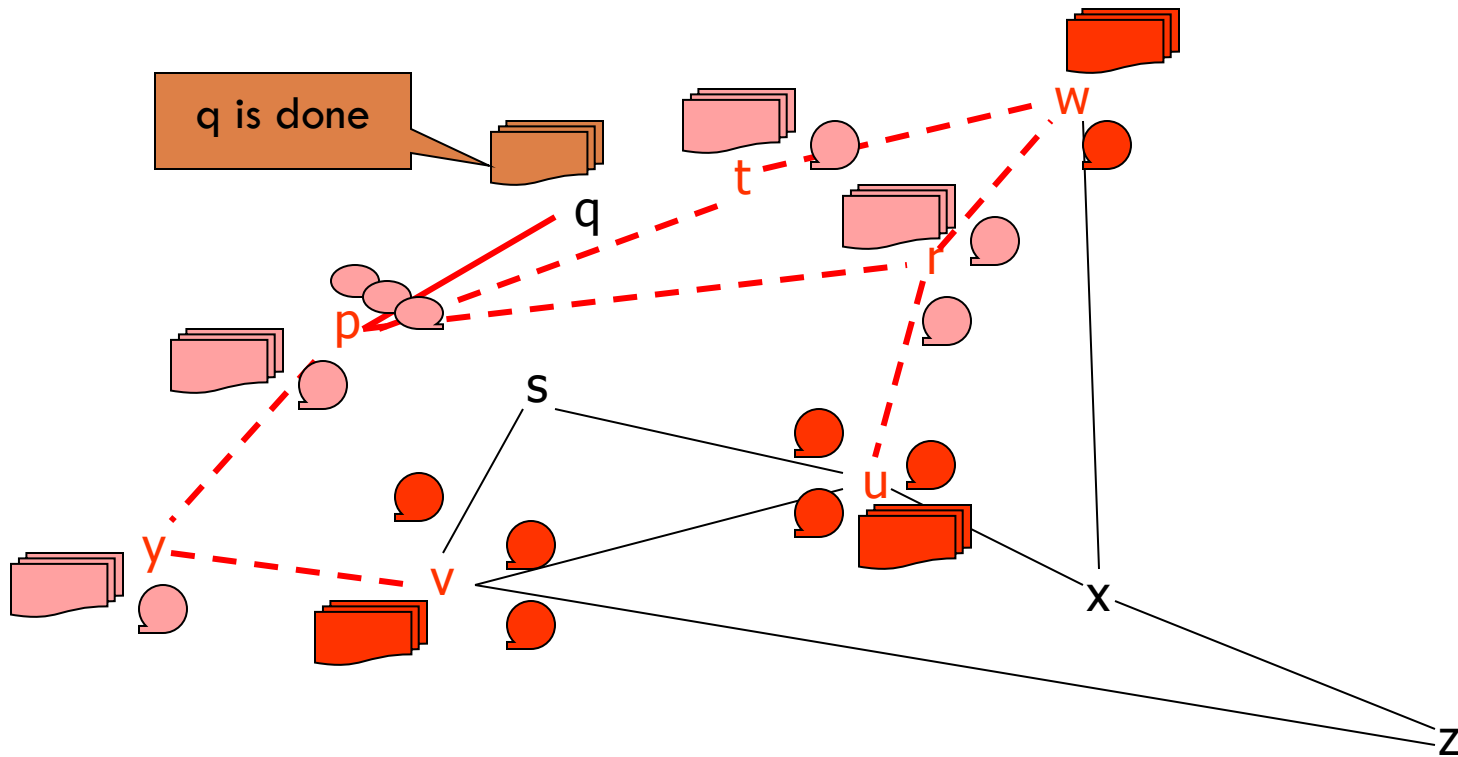
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A network

Chandy/Lamport

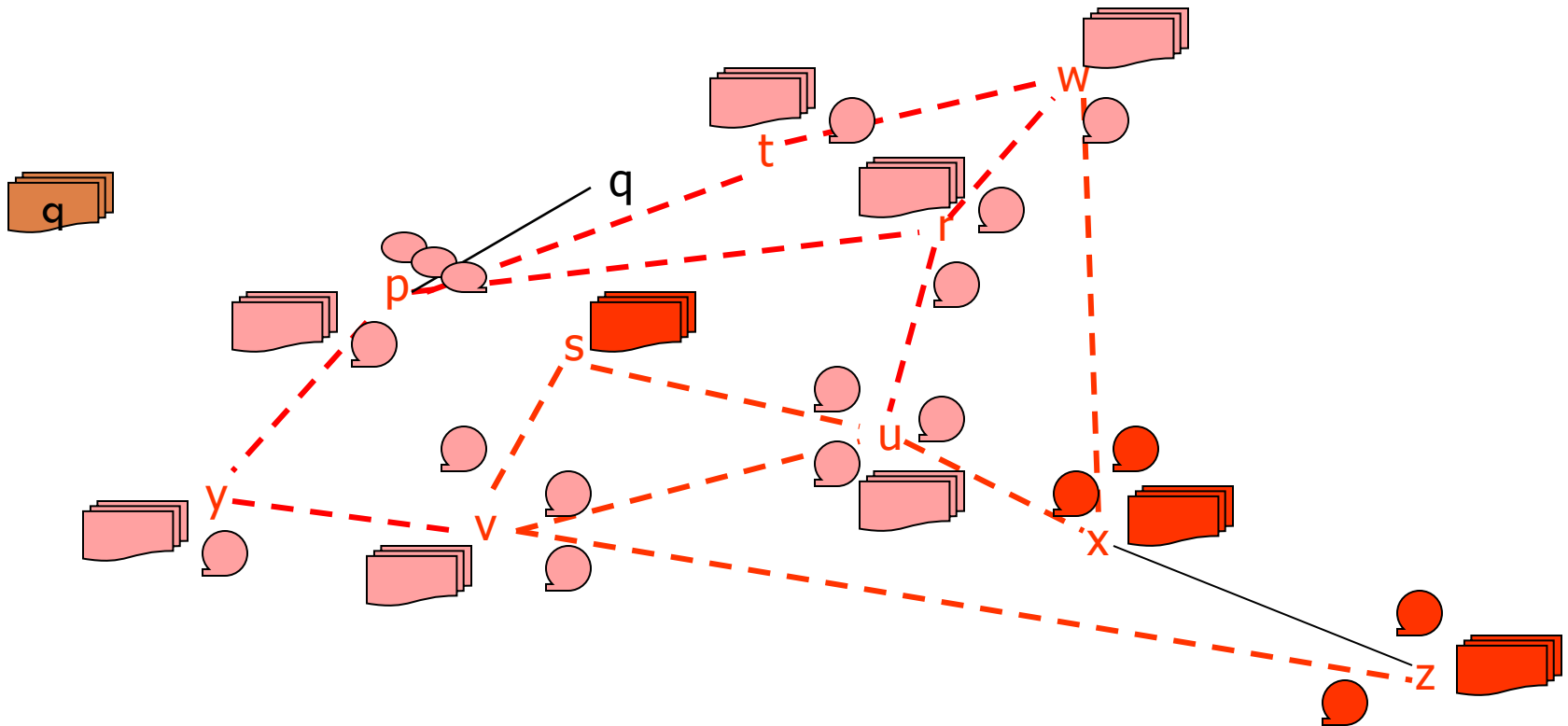
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A network

Chandy/Lamport

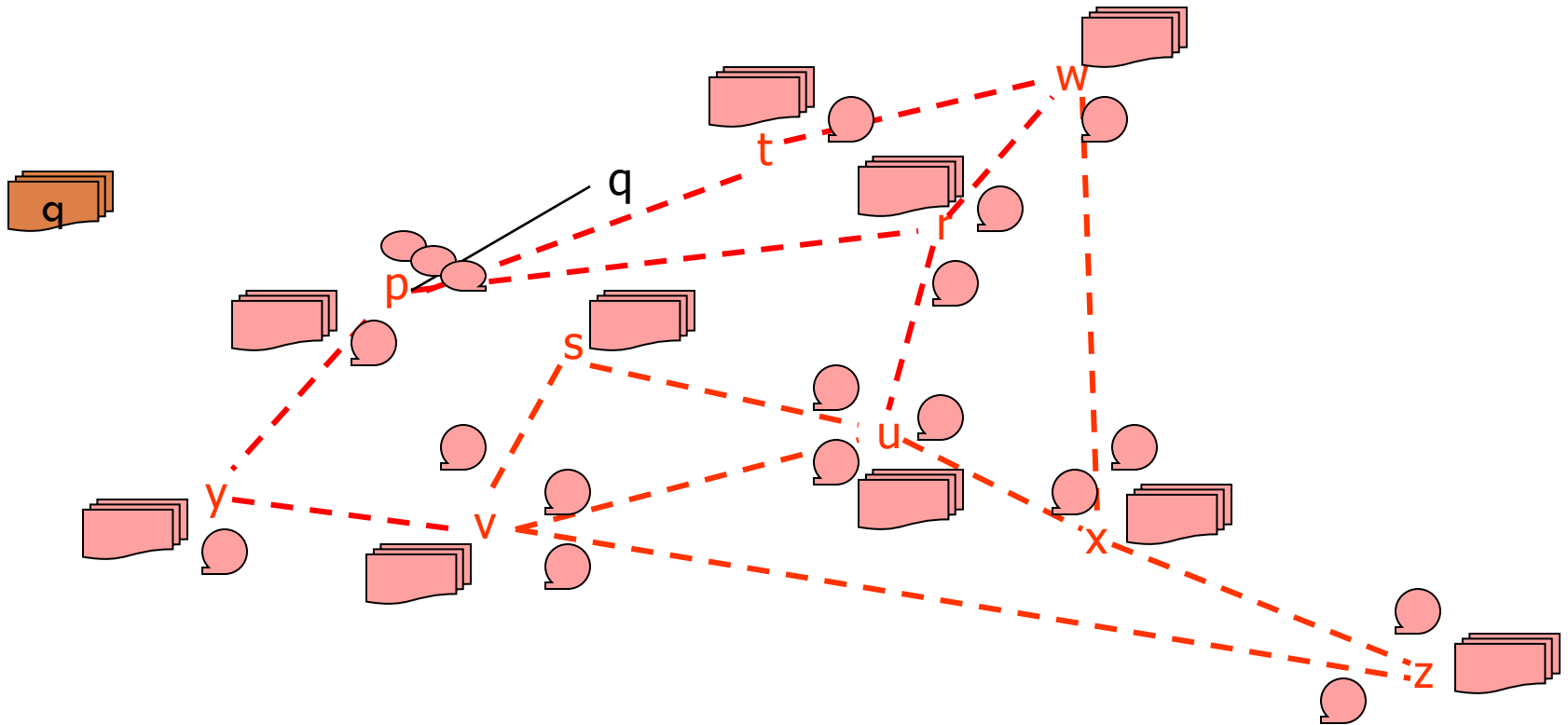
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A network

Chandy/Lamport

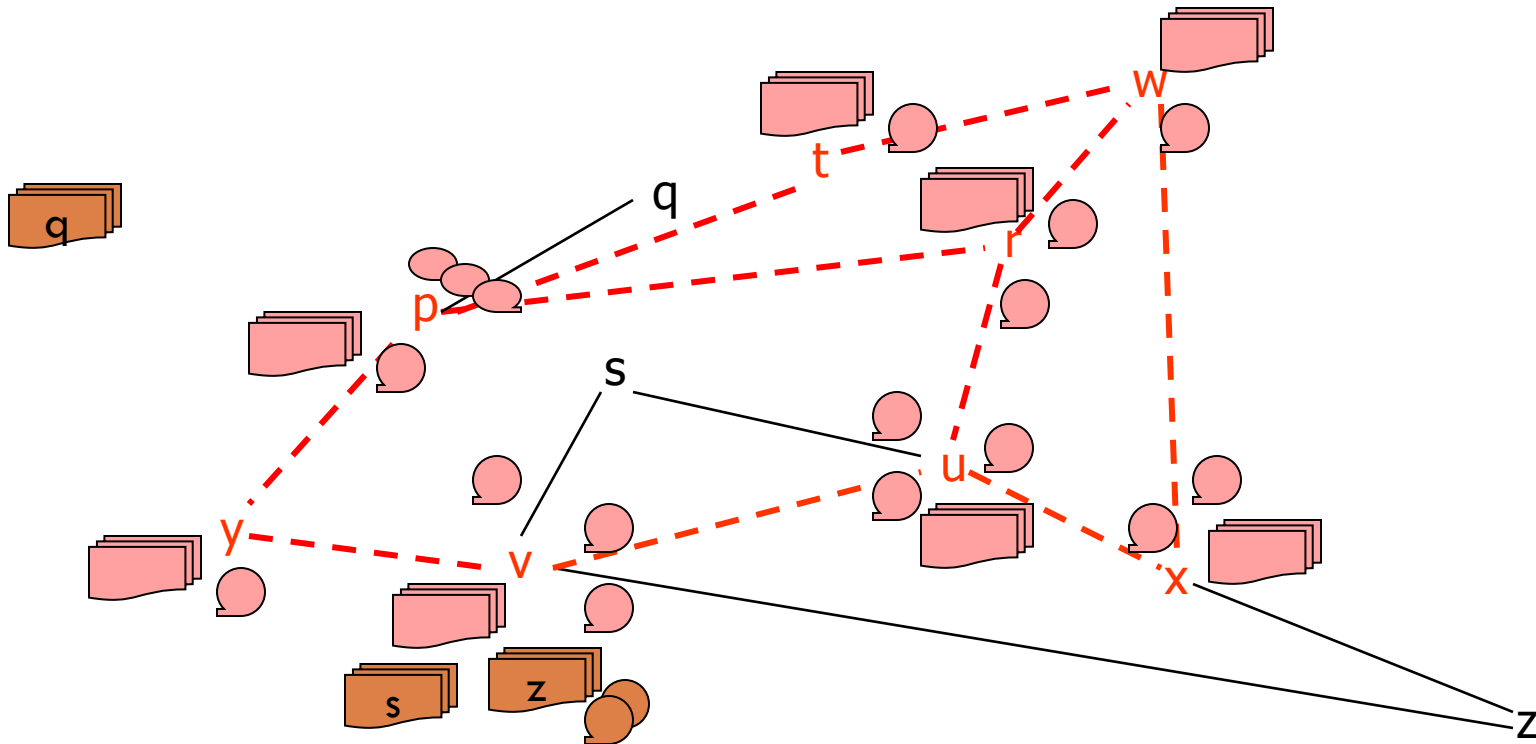
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A network

Chandy/Lampport

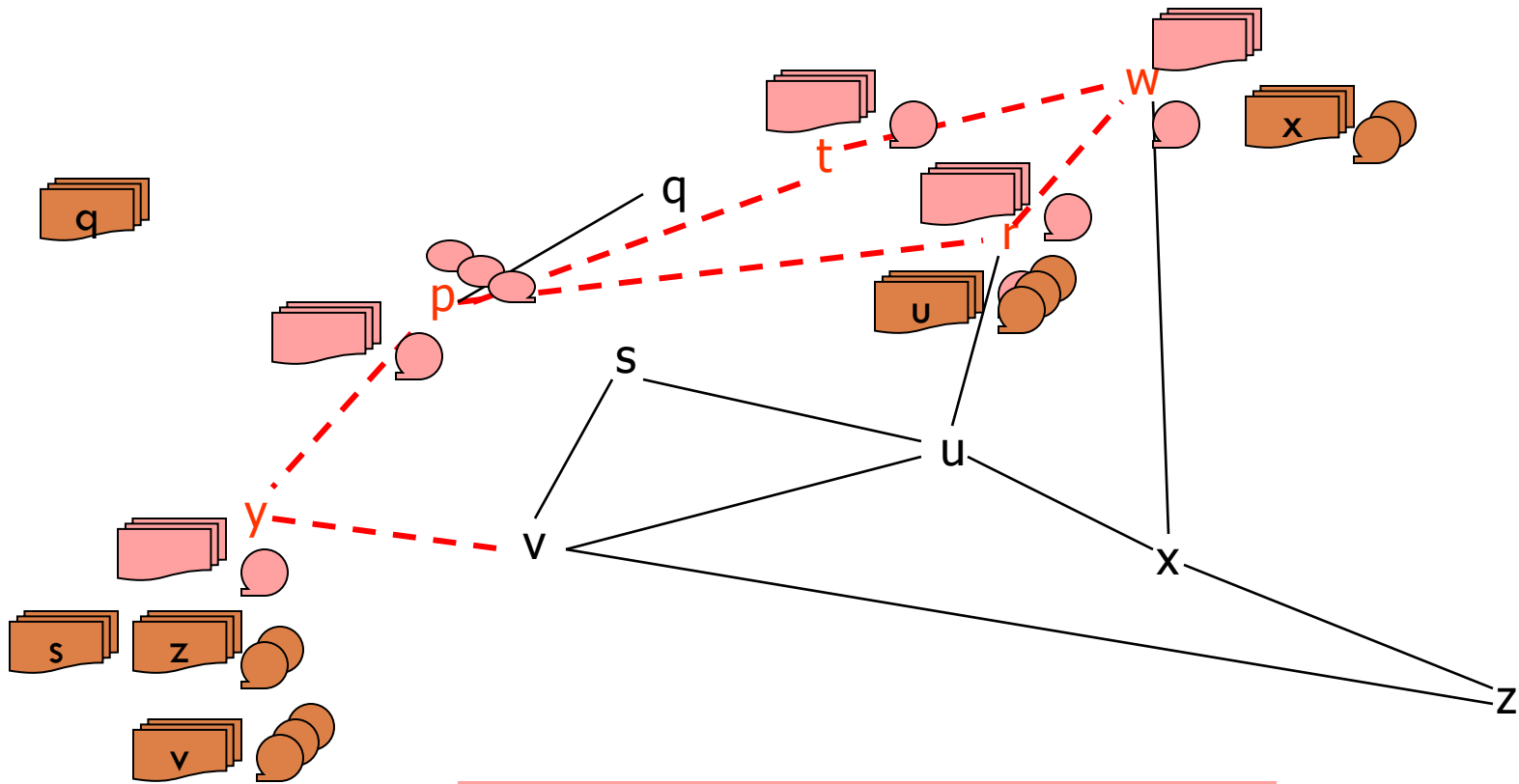
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A network

Chandy/Lampport

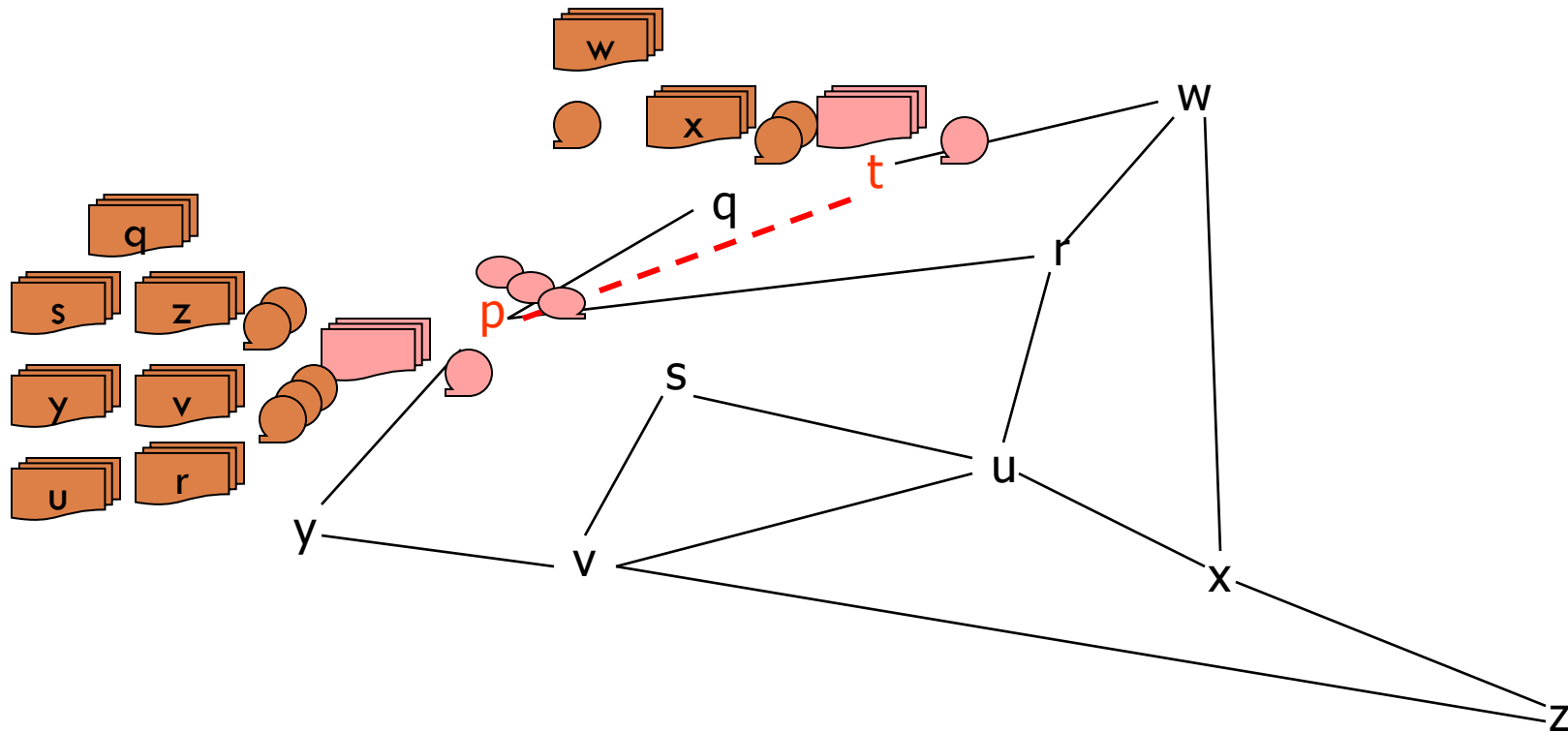
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A network

Chandy/Lamport

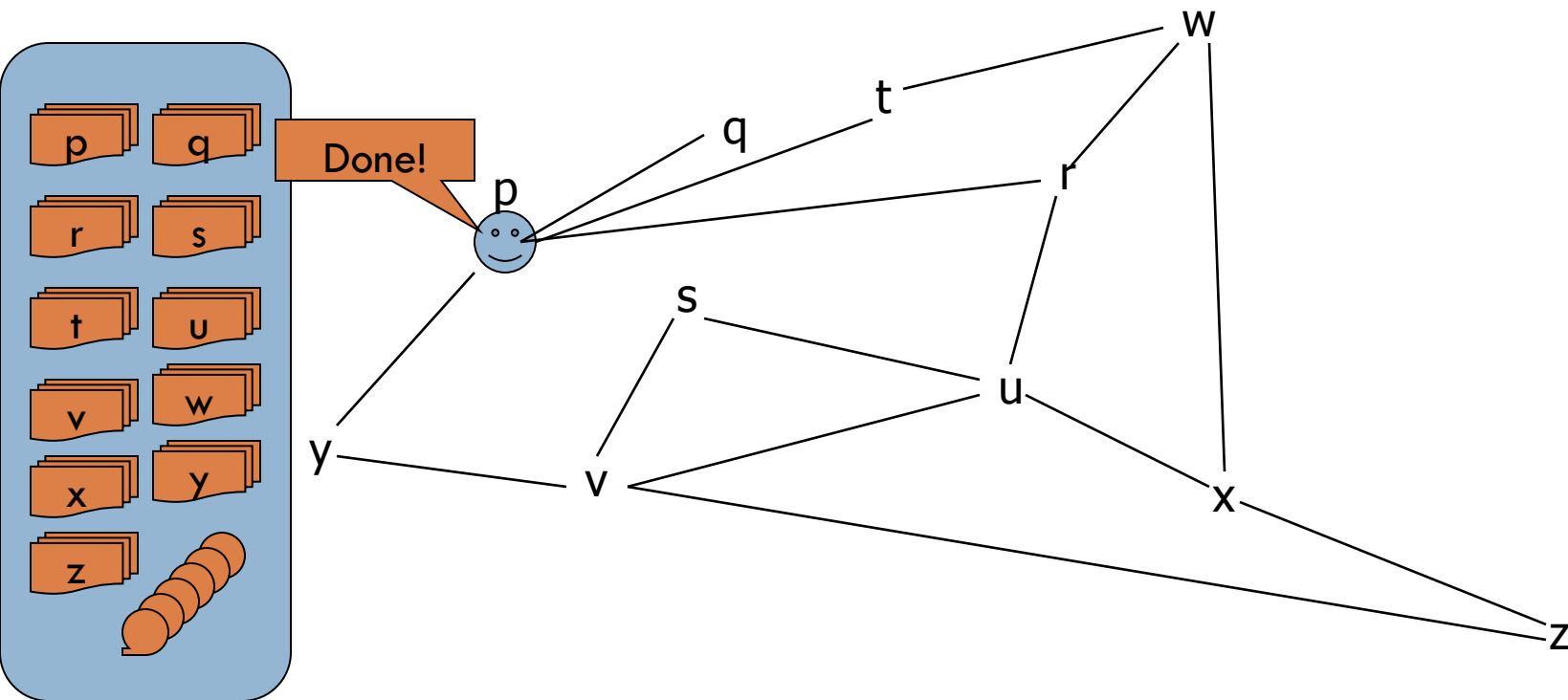
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A network

Chandy/Lamport

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A snapshot of a network

Chandy/Lampport “snapshot”

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- Once we collect the state snapshots plus the channel contents we have a consistent cut from the system
 - ▣ It “could” have occurred as a concurrent instant in the system execution (although in fact, it obviously didn’t)
 - ▣ Processing such a snapshot requires understanding the state in this form
 - ▣ But many algorithms use this *pattern* of messages without necessarily writing down the whole state or logging all the messages in the channels

Relation to vector time?

- In book the connection of consistent cuts to notion of logical time is explored
 - ▣ A consistent cut is a snapshot taken at a set of concurrent points in a system trace
 - ▣ In effect, all the members of the system concurrently write down their states
 - ▣ We can restate Chandy/Lamport to implement it precisely in this manner!
- But out of time today, so we'll leave that for you to read about in Chapter 10 of the text

Conclusions

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- By formalizing notion of time we can build tools for thinking about fancier ideas such as consistency of replicated data
- Today we looked more closely at time than at consistency.
 - ▣ We introduced idea of consistency to motivate need to look closely at time
 - ▣ But didn't tie the logical or vector timestamp ideas back to implementation of replicated data
- Next lectures will make this connection explicit