#### Time, clocks and the ordering of events

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# What is a Distributed System?

#### Distributed System

A distributed system is one in which the failure of a computer you didn't even know existed can render your own computer unusable.

- Leslie Lamport



#### What is a Distributed System?

A set of nodes, connected by a network, which appear to its users as a single coherent system.

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#### • This problem is impossible to solve!

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- Agreement is a core problem.

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- Accomplish tasks like:
  - Data management
  - Resource management
  - Consensus
  - ...
- Must work in difficult settings:
  - Concurrency: uncertainty of timing, order of events and inputs.
  - Fault-tolerance: failure and recovery of machines/processors, of communication channels.

Correctness of Distributed Algorithms

#### Correctness

Always expressed in terms of

- Safety and Liveness
- B. Alpern and F.B. Schneider, Defining Liveness, Technical Report, 1985

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#### Safety

• Properties that state that nothing bad ever happens.

#### Liveness

• Properties that state that something good eventually happens.

Correctness of you in this course :)



- Correctness of you in this course :)
- You should never fail the exam:



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- ► You should never fail the exam: Safety



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- ► You should never fail the exam: Safety
- You should eventually take the exam:



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You should eventually take the exam: Liveness

• Correctness of traffic lights at intersection.



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## More on Safety and Liveness

#### Safety

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#### Liveness

- Often involves the word eventually: some point in future
- Liveness is often just termination

# Modeling Distributed Systems

- Abstraction of relevant system properties.
- ▶ Real world is complex, model simplifies it.
- ► Help solving problems.
- ► Help analyze problems/solutions.

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  - Bunch of nodes/processes
  - Sending messages over a network
  - To solve a common goal (algorithm)



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How do we model this?

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- Like a state machine: a node is in only one state at a time.
- The state of a node: input buffer, output buffer, and other data relevant to algorithm

- This is how computers in a distributed system work:
  - 1 Wait for message.
  - When received message, do some local computation, send some messages.
  - 3 Goto 1

# Single Node to a Distributed System (1/3)

- A configuration is a snapshot of state of all nodes.
  - $C = (s_0, s_1, \cdots, s_{n-1})$  where  $s_i$  is state of process  $p_i$ .
- An initial configuration is a configuration where each s<sub>i</sub> is an initial state.



# Single Node to a Distributed System (2/3)

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- Delivery event of msg m from i to j: del(i, j, m)

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#### An execution is an infinite sequence of

- $config_0$ ,  $event_1$ ,  $config_1$ ,  $event_2$ ,  $config_2$ , ...
- *config*<sub>0</sub> is an initial configuration.
- event could be *comp* or *del*.

## Single Node to a Distributed System (3/3)





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- Informally, in each round:
  - Every process can send a message to each neighbor.
  - · All messages are delivered.
  - Every process computes based on message received.
- Formally, rounds consist of:
  - Deliver event for every message in all outbufs.
  - One computation event on every process.

# Synchronous Systems (2/2)

- Time variance is bounded.
- Execution: bounded execution speed and time.
- Communication: bounded transmission delay.
- Clocks: bounded clock drift (and differences in clocks).

## Asynchronous Systems

- Time variance is not bounded.
- Execution: different steps can have varying duration.
- Communication: transmission delays vary widely.
- Clocks: arbitrary clock drift.

Time, Clock, and Order of Events

## Time

#### Global time

- Astronomical time (based on earth's rotation)
- International Atomic Time (IAT)
- Coordinated Universal Time (UTC)
- Local time
  - Not synchronized to a global source

# **Computer Clocks**

#### Computer clocks

- Crystal oscillates at known frequency
- Oscillations cause timer interrupts
- Timer interrupts update clock

#### Clock skew

- Crystals in different computers run at slightly different rates
- Clocks get out of sync
- Skew: instantaneous difference
- Drift: rate of change of skew

# Synchronizing Computer Clocks

#### Internal synchronization

- Clocks synchronize locally
- Only synchronized with each other
- Berkeley algorithm
- Time server
  - Server that has the correct time
  - Server that calculates the correct time
  - Network Time Protocol (NTP)

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- Events (e.g., state changes) in a single process are ordered.
- Processes need to agree on ordering of causally related events (e.g., message send and receive).

## Causal Order

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  - If a occurs before b on the same process, then  $a \rightarrow b$ .
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- Transitivity: if  $a \rightarrow b$  and  $b \rightarrow c$ , then  $a \rightarrow c$ .

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• concurrent events (a||b): if  $a \not\rightarrow b$  and  $b \not\rightarrow a$ .

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- ▶ If two executions *F* and *E* have the same collection of events, and their causal order is preserved, *F* and *E* are said to be similar executions.
- ► F and E could have different permutation of events as long as causality is preserved.

# Example of Similar Executions

 $\blacktriangleright$  Same color  $\sim$  Causally related



• So causality is all that matters ...

- ► So causality is all that matters ...
- ▶ ... how to locally tell if two events are causally related?

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- Before timestamping a local event  $p_i$  executes  $t_i := t_i + 1$ .
- Whenever a message m is sent from  $p_i$  to  $p_j$ :
  - $p_i$  executes  $t_i := t_i + 1$  and sends  $t_i$  with m.
  - $p_j$  receives  $t_i$  with m and executes  $t_j := max(t_j, t_i) + 1$ .

Example of Lamport Logical Clock



### Lamport Clocks Properties

▶  $a \rightarrow b$  implies t(a) < t(b), where t(a) is Lamport clock of event a.



• t(a) < t(b) does not necessarily imply  $a \rightarrow b$ 

▶ t(E31) < t(E13), but  $E31 \not\rightarrow E13$ 

# Shortcoming of Lamport Clocks

#### Main shortcoming of Lamport's clocks:

- t(a) < t(b) does not necessarily imply  $a \rightarrow b$
- We cannot deduce causal dependencies from time stamps.
- Why?
  - Clocks advance independently or via messages.
  - There is no history as to where advances come from.

# Vector Clocks

- ► At each process, maintain a clock for every other process.
  - Each clock  $V_i$  is a vector of size N.
  - $V_i[j]$  contains process  $p_i$ s knowledge about process  $p_j$ 's clock.
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- Before pi timestamps an event:  $V_i[i] := V_i[i] + 1$ .
- ▶ Whenever a message *m* is sent from *p<sub>i</sub>* to *p<sub>j</sub>*:
  - $p_i$  executes  $V_i[i] := V_i[i] + 1$  and sends  $V_i$  with m.
  - $p_j$  receives  $V_i$  with m and merges the vector clocks  $V_i$  and  $V_j$ :

$$V_j[k] = \begin{cases} max(V_j[k], V_i[k]) + 1 & \text{if } j = k \\ max(V_j[k], V_i[k]) & \text{otherwise} \end{cases}$$

#### Example of Vector Clock



# Comparing Vector Clocks

- $\blacktriangleright \ V = V' \text{ iff } V[i] = V'[i] \text{ for } i \in \{1, \cdots, N\}$
- $V \leq V'$  iff  $V[i] \leq V'[i]$  for  $i \in \{1, \cdots, N\}$
- $\blacktriangleright \ V || V' \text{ iff } V \leq V' \wedge V' \leq V$

## Vector Clocks Properties

- $a \rightarrow b$  implies V(a) < V(b)
- V(a) < V(b) implies  $a \rightarrow b$



# Logical Clock vs. Vector Clock

#### Logical clock

- If  $a \to b$  then t(a) < t(b)
- Vector clock
  - If  $a \to b$  then V(a) < V(b)
  - If V(a) < V(b) then  $a \rightarrow b$
  - Sending extra information: vector with size N, for N processes.

**Global State** 

### **Global State**

- Determining global properties
- Distributed checkpoint
  - What is a correct state of the system to save?
- Distributed garbage collection
  - Do any references exist to a given object?

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- May be finite or infinite.
- Each event  $e_i^j$  is either a local event or a communication event.



- ▶  $s_i^k$  denotes the local state of process  $p_i$  after execution of event  $e_i^k$ .
- The local state  $s_i^k$  records all events included in the history  $h_i^k$ .

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- The local state  $s_i^k$  records all events included in the history  $h_i^k$ .
- ► The global state, S, of a distributed computation is an N-tuple of local states (s<sub>1</sub>, s<sub>2</sub>, · · · , s<sub>N</sub>), one for each process.

•  $h_i^{c_i}$  is history of  $p_i$  up to and including event  $e_i^{c_i}$ , called partial history.

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- Each cut C has a corresponding global state:  $S = (s_1, s_2, \cdots, s_N)$ .

# Consistent Cuts (1/2)

▶ A cut C is consistent, if for all events e and e'  $(e' \in C) \land (e \to e') \Rightarrow e \in C$
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• A global state is **consistent** if it corresponds to a consistent cut.

#### **Possible Solutions**

- Coordinated blocking
- Coordinated non-blocking

#### Coordinated Blocking

- At barrier, all processes take their checkpoints.
- Bulk-Synchronous Parallel (BSP)



#### Coordinated Non-Blocking

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## Coordinated Non-Blocking

- Processes must be coordinated, but do we really need to block?
- Chandy and Lamport's snapshot

#### Chandy and Lamport's Snapshot

- Determines a consistent global state.
- Takes care of messages that are in transit.





#### Model of a Distributed System

- Process: one process initiates taking of global snapshot
- ► Channels: directed, FIFO, reliable
- Process graph: fixed topology, strongly connected component

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- The algorithm terminates after each process has received a marker on all of its incoming channels.
- All the local snapshots get disseminated to all other processes and all the processes can determine the global state.

#### ► Marker Sending Rule for process *p<sub>i</sub>*:

- Process  $p_i$  records its state.
- For each outgoing channel c on which a marker has not been sent,  $p_i$  sends a marker along c before  $p_i$  sends further messages along c.

- ► Marker Receiving Rule for process p<sub>j</sub> on receiving a marker along channel c:
  - If  $p_j$  has not recorded its state, it records the state of channel c as the empty set, and follows the Marker Sending Rule.
  - Otherwise, it records the state of c as the set of messages received along c after  $p_j$ 's state was recorded and before  $p_j$  received the marker along c.

# Correctness of the Algorithm (1/2)

- Condition 1: any message that is sent by a process before recording its snapshot, must be recorded in the cut.
- When a process  $p_j$  receives message  $m_{ij}$  from  $p_i$  that precedes the marker on channel  $c_{ij}$ , it acts as follows: if process  $p_j$  has not taken its snapshot yet, then it includes  $m_{ij}$  in its recorded snapshot. Otherwise, it records  $m_{ij}$  in the state of the channel  $c_{ij}$ . Thus, condition Condition 1 is satisfied.

# Correctness of the Algorithm (2/2)

- Condition 2: any message that is sent by a process after recording its snapshot, must not be recorded in the cut.
- Due to FIFO property of channels, it follows that no message sent after the marker on that channel is recorded in the channel state. Thus, condition Condition 2 is satisfied.



- Correctness of distributed algorithms: safety + liveness
- Casual order
- Logical clock and Vector clock
- Global state: Chandy and Lamport's algorithm

- L. Lamport, Time, clocks, and the ordering of events in a distributed system. ACM Communications, 1978
- K.M. Chandy and L. Lamport, Distributed snapshots: determining global states of distributed systems. ACM Transactions on Computer Systems, 1985.
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# Questions?

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