Distributed Systems: Time

"Time has been invented in the universe so that everything would not happen at once."

"There is no change without the concept of time, and there is no movement without time."

Agenda

Clocks & time in computers

Synchronizing physical clocks

- Logical clocks
 - Lamport clocks
 - Vector clocks

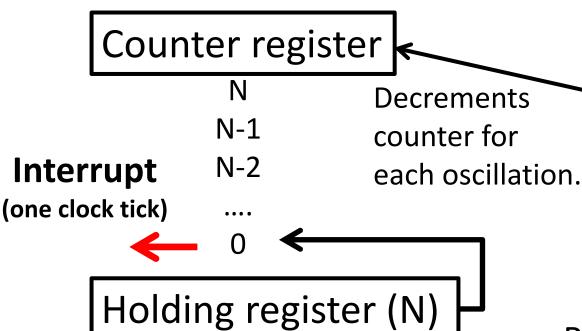
Why is time important?

- In distributed systems, we require...
 - Cooperation between nodes: must agree on certain things
 - High degree of parallelism: nodes should work independently to achieve the most progress
- Time gives us...
 - A point of reference every machine knows how to keep track of...
 - Without explicit communication!
- However...
 - − Time-keeping is not perfect ☺
 - How do we efficiently synchronize time to achieve our goals?

Computer "clocks"

Computer clocks count oscillations of a crystal at a defined frequency

Crystal oscillator (quartz crystal)





frequency often 32.768 kHz (2¹⁵ cycles per sec.)

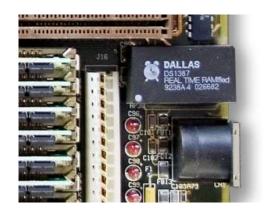
Reload upon interrupt

Real time clock (RTC, CMOSC, HWC)

- RTC is used even when the PC is hibernated or switched off
 - Based on alternative low power source
 - Cheap quartz crystal (<\$1), inaccurate (+/- 1-15 secs/day)
- Referred to as "wall clock" time
 - Synchronizes the system clock when computer on
 - Should not be confused with real-time computing



- IRQ 8
- sysfs interface /sys/class/rtc/rtc0 ... n
 UNIX: cat /sys/class/rtc/rtc0/since_epoch
 /sys/class/rtc/rtc0/wakealarm



Source: Wikipedia

In English: UTC - Coordinated Universal Time

Universal Time Coordinated (UTC)

Temps Universel Coordonné

Universal

- Standard used around world & Internet (e.g., NTP)
- Independent from time zones (UTC 0)
- Converted to local time by adding/subtracting local time zone (EST: UTC-5; CET: UTC+2)

Coordinated

- 400 institutions contribute their estimates of current time (using atomic clocks)
- UTC is built by combining these estimates

Caesium-133 fountain atomic clock in Switzerland

Uncertainty of one second in 30 million Years!

(Probably the ``Rolex`` of atomic clocks ☺)





Atomic clocks

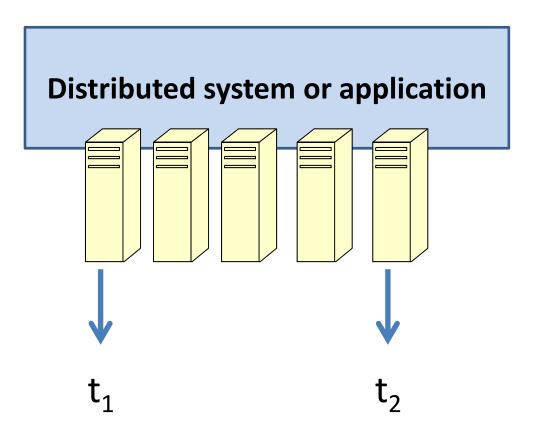


Atomic clock on the market May 11, 2011.
Quoted \$1500 with an accuracy of less than 0.5 micro seconds per day.

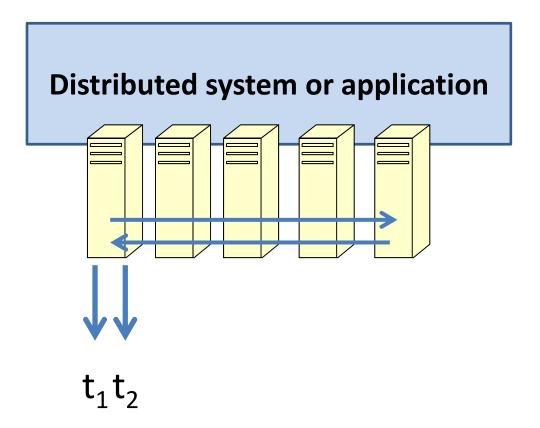


Chip-Scale Atomic Clock. The ultimate in precision--the caesium clock--has been miniaturized By Willie D. Jones Posted 16 Mar 2011.

Measuring latency in distributed systems experiments



Measuring latency in distributed systems experiments



host=node-1 rtt=750(187)ms/0ms delta=0ms/0ms host=node-2 rtt=750(187)ms/0ms delta=0ms/0ms host=node-3 rtt=750(187)ms/0ms delta=0ms/0ms host=node-4 rtt=750(187)ms/0ms delta=0ms/0ms host=node-5 rtt=562(280)ms/0ms delta=0ms/0ms host=node-6 rtt=562(280)ms/0ms delta=0ms/0ms host=node-7 rtt=562(280)ms/0ms delta=0ms/0ms host=node-8 rtt=750(187)ms/0ms delta=0ms/0ms host=node-9 rtt=562(280)ms/0ms delta=0ms/0ms host=node-10 rtt=750(187)ms/0ms delta=0ms/0ms host=node-11 rtt=750(187)ms/0ms delta=0ms/0ms host=node-12 rtt=750(187)ms/0ms delta=0ms/0ms host=node-13 rtt=750(187)ms/0ms delta=0ms/0ms host=node-14 rtt=562(280)ms/0ms delta=0ms/0ms host=node-15 rtt=562(280)ms/0ms delta=0ms/0ms host=node-16 rtt=562(280)ms/0ms delta=0ms/0ms host=node-17 rtt=562(280)ms/0ms delta=0ms/0ms host=node-18 rtt=562(280)ms/0ms delta=0ms/0ms host=node-19 rtt=562(280)ms/0ms delta=0ms/0ms host=node-20 rtt=562(280)ms/0ms delta=0ms/0ms host=node-21 rtt=562(280)ms/0ms delta=0ms/0ms host=node-22 rtt=750(187)ms/0ms delta=0ms/0ms host=node-23 rtt=750(187)ms/0ms delta=0ms/0ms host=node-24 rtt=750(187)ms/0ms delta=0ms/0ms /0ms delta=0ms/0ms

host=node-25 rtt=750(187)ms/0ms delta=1ms/1ms host=node-26 rtt=750(187)ms/0ms delta=0ms/0ms host=node-27 rtt=562(280)ms/0ms delta=0ms/0ms host=node-28 rtt=562(280)ms/0ms delta=0ms/0ms host=node-29 rtt=750(187)ms/0ms delta=0ms/0ms host=node-30 rtt=750(187)ms/0ms delta=-1ms/-1ms host=node-31 rtt=750(187)ms/0ms delta=0ms/0ms host=node-32 rtt=562(280)ms/0ms delta=0ms/0ms host=node-33 rtt=750(187)ms/0ms delta=-1ms/-1ms host=node-34 rtt=750(187)ms/0ms delta=0ms/0ms host=node-35 rtt=750(187)ms/0ms delta=0ms/0ms host=node-36 rtt=750(187)ms/0ms delta=0ms/0ms host=node-37 rtt=750(187)ms/0ms delta=0ms/0ms host=node-38 rtt=750(187)ms/0ms delta=0ms/0ms host=node-39 rtt=562(280)ms/0ms delta=0ms/0ms host=node-40 rtt=750(187)ms/0ms delta=0ms/0ms host=node-41 rtt=750(187)ms/0ms delta=0ms/0ms host=node-42 rtt=562(280)ms/0ms delta=290ms/290ms host=storage-1 rtt=562(280)ms/0ms delta=0ms/0ms host=storage-2 rtt=750(187)ms/0ms delta=0ms/0ms host=storage-3 rtt=750(187)ms/0ms delta=0ms/0ms

host=storage-4 rtt=562(280)ms/0ms delta=0ms/0ms

Software-based clock sync times with 1 millisecond precision

NTP timing statistic for single node (in µs)

NTP timing statistic in microseconds for delay, offset and jitter



Clock skew & drift

 Clock skew: Instantaneous difference between readings of two clocks

 Clock drift: Rate at which clock skew increases between a clock and some reference clock

Synchronization mechanisms

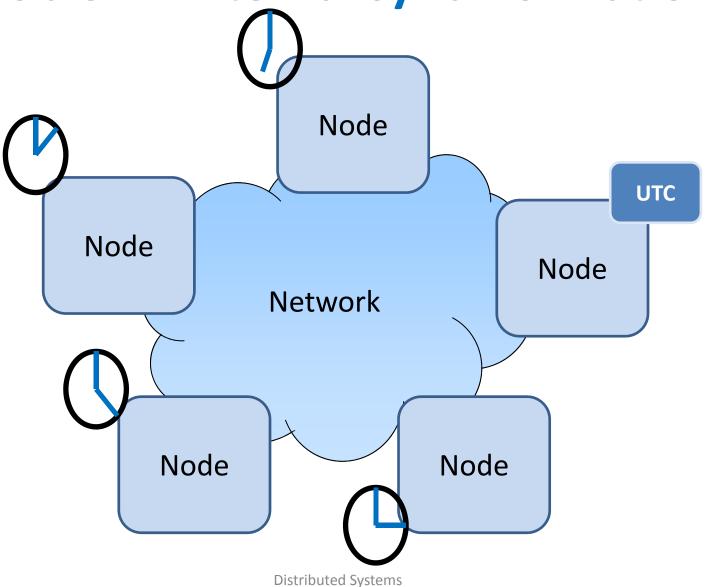
- Hardware support: Radio receivers, GPS receivers, atomic clocks, shared backplane signals
 - Tight synchronization(+/- 10ns for GPS)
 - Negligible overhead
 - CostlyQuartz is good enough



Clock synchronization

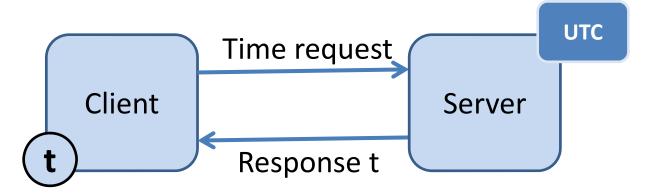
- External synchronization
- Internal synchronization

Problem: External synchronization



Synchronization request and reply

- Request to reference clock source for time
 - Request involves network round trip time (RTT)
 - Response is wrong by the time client receives it



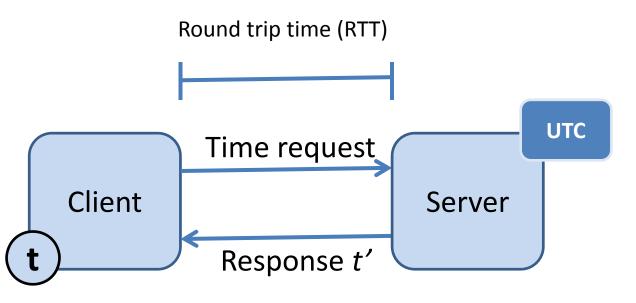
 Client must adjust response based on knowledge of network RTT

Probabilistic clock synchronization Proposed by IBM, 1989

- External clock synchronization
- Time server connected to a time reference source (UTC)
- Transmission time is unbounded, but usually reasonably short
- Synchronization is achieved to the degree that network delays are short compared to desired accuracy
- Primarily intended for operation on LANs

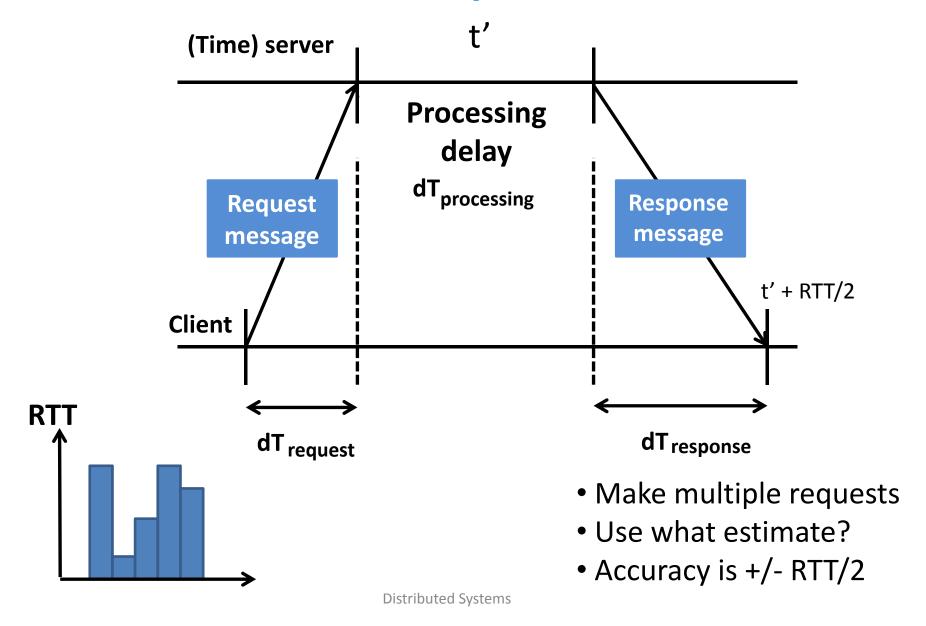
Cristian's algorithm (1989)

- Client measures round trip time for request to server
- Server responds with time value
- Client assumes transmission
 delays
 split equally
- Could factor in time to process request at server

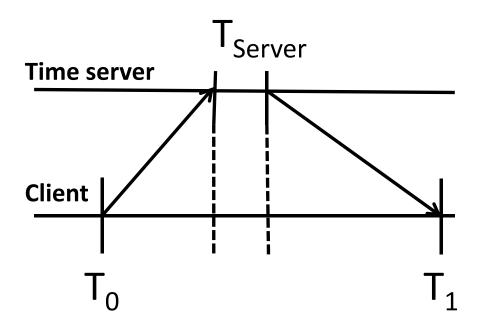


$$t = t' + RTT/2$$

RTT: Accuracy estimation



New time



- Time request at T₀
- Time response at T₁
- Assume network delays are symmetric (RTT/2)
- Estimated overhead due to network delay is (T₁ - T₀)/2
- $T_{new} = T_{server} + (T_1 T_0)/2$

Result accuracy bound

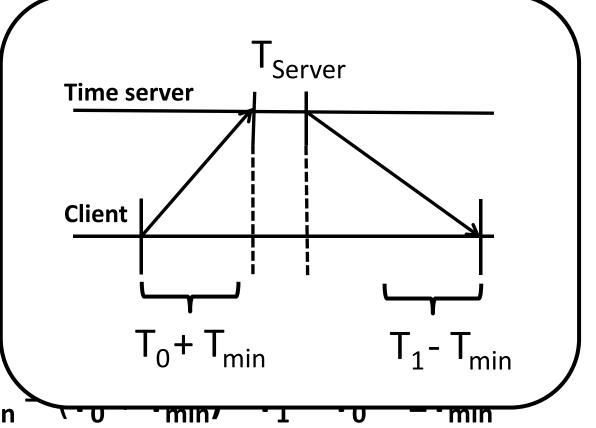
- T_{min} minimum network delay
- T_0 , T_1 as above, assume T_{min} for propagation
- Earliest time server could generate time stamp: T₀ + T_{min}
- Latest time the server could generate the time stamp: $T_1 T_{min}$
- Range: $T_1 T_{min} (T_0 + T_{min}) = T_1 T_0 2T_{min}$
- Accuracy: +/- $| (T_1 T_0)/2 T_{min} |$

Result accuracy bound

- T_{min} minimum
- T_0 , T_1 as above
- Earliest time s
 - stamp: $T_0 + T_{mi}$
- Latest time the

stamp: $T_1 - T_{mi}$

Range: T₁ - T_{min}



• Accuracy: +/- $| (T_1 - T_0)/2 - T_{min} |$

Errors are cumulative

 Say Node A synchronizes time with Node B with an accuracy of +/- 5 ms

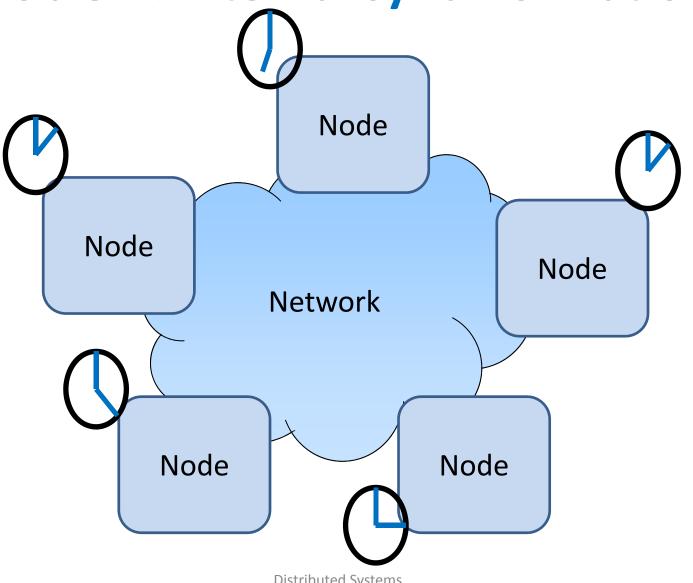
 Node B synchronizes its time with Node C with an accuracy of +/- 7 ms

• Then, the net accuracy at Node A is +/-(5+7)ms = +/- 12 ms

Problems with Cristian's algorithm

- Centralized time server
 - Distribution possible via broadcast to many servers
 - Communication with single server is preferred
 - Simpler approach
 - Better estimates based on series of requests
- Time server is trusted & single point of failure
 - Malicious, failed server would wreak havoc

Problem: Internal synchronization

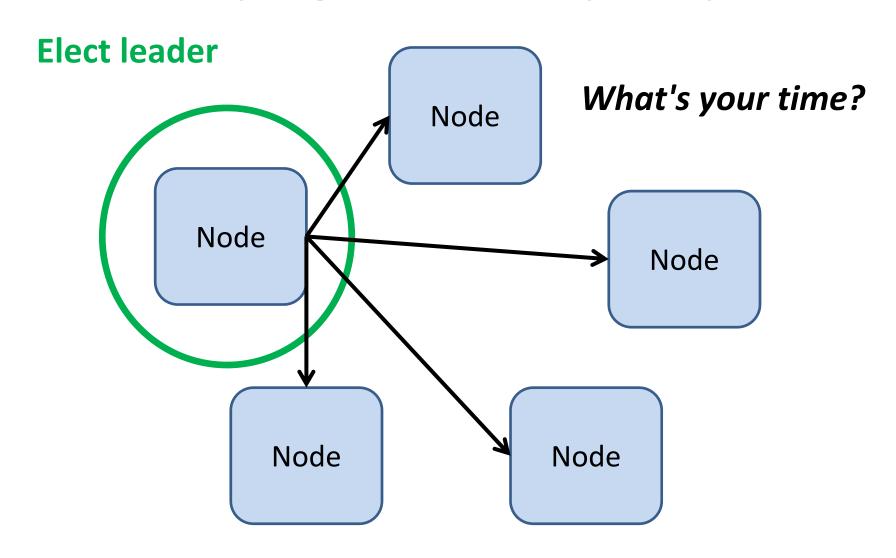


Distributed Systems

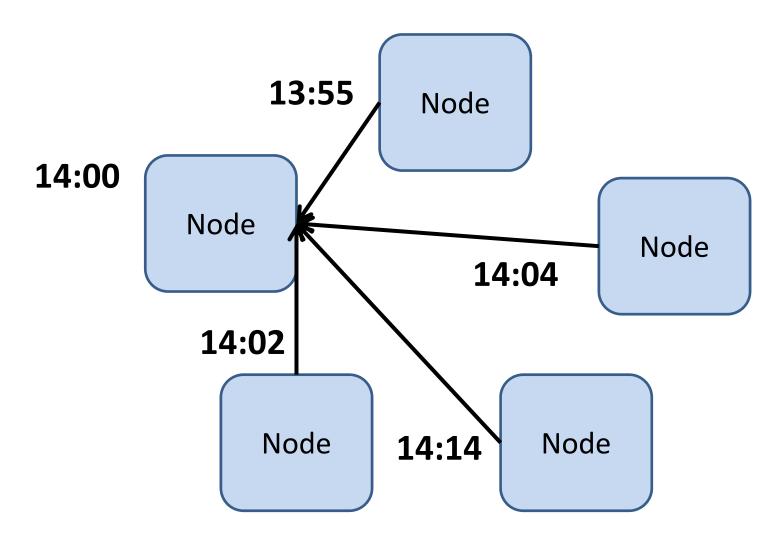
Berkeley algorithm overview

- Clock synchronization algorithm developed in 1989 as part of Berkeley Unix efforts
- Internal synchronization
- Assumes no machine has accurate time source
- Performs internal synchronization to set clocks of all machines to within a bound
- Intended for use in intranets / LANs
- Experimentally: Synchronization of clocks to within 20-25 ms on LAN

Berkeley algorithm: Request phase

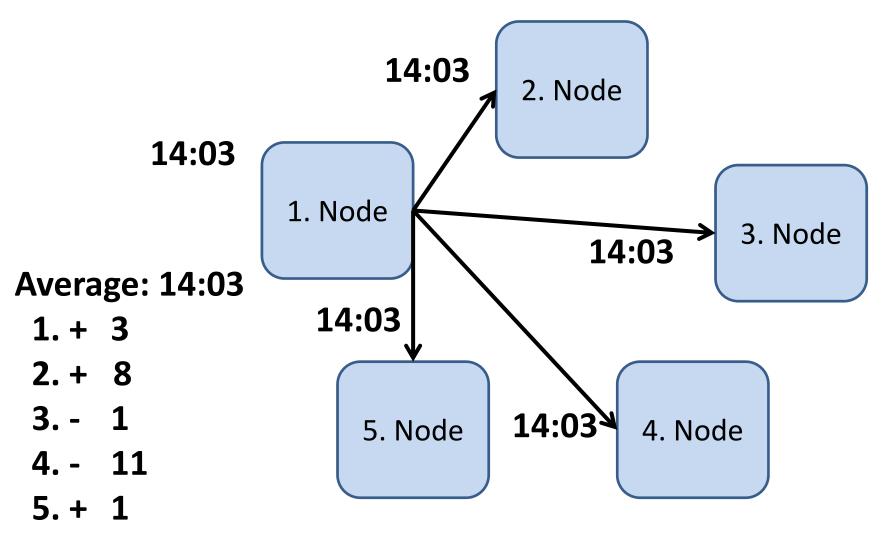


Berkeley algorithm: Reply phase



Distributed Systems

Berkeley algorithm: Clock adjustment



Distributed Systems

Berkeley algorithm: Summary

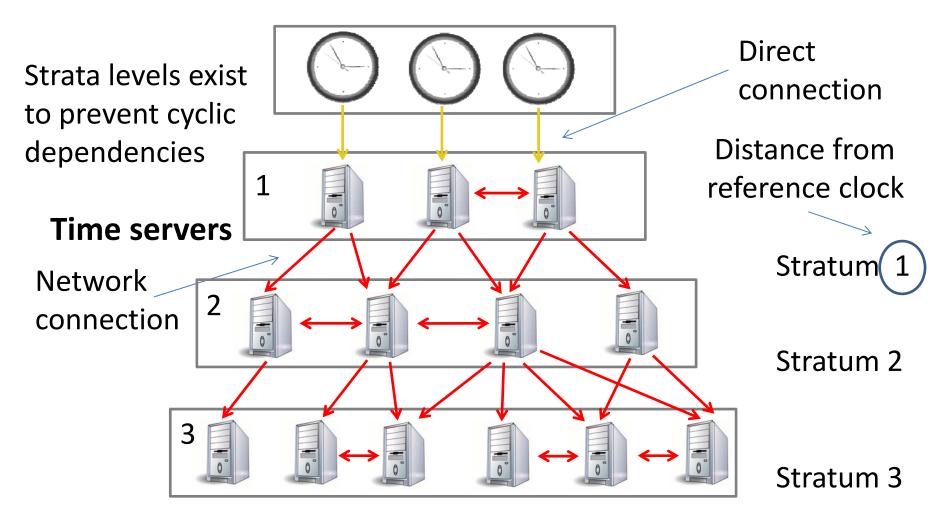
- Leader is chosen (via an election process)
- Leader polls nodes who reply with their time
- Leader observes RTT of messages and estimates time of each node and its own
- Leader averages clock times, ignoring any values it receives far outside values of others (including its own)
- Leader sends out amount (positive or negative) that each node must adjust its clock
- Accuracy originally reported was 20-25 ms (15 nodes)

Network time protocol (NTP) [D. Mills, 1994++]

- Service that provides UTC time over networks
- Hierarchical distributed system which provides scalability, fault-tolerance and security
- Time service and dissemination of time on Internet
- Maintains time to within tens of milliseconds over Internet
- Achieves 1 millisecond accuracy in LANs under ideal conditions
- Supported by daemon (ntpd) in user space (kernel support) via UDP on port 123

NTP: Clock Strata

Reference clock



Up to 16 levels used, more possible (stratum 16 unsynchronized)

CLOCK ADJUSTMENT

Clock adjustment

- Adjusting the clock is not straight forward
 - Set clock = new clock value (strict no-no)
 - Time must increase monotonically
- Can't go back to the past
 - Timestamps are important, can't repeat them
- Time should not show sudden jumps
 - Cannot jump on your way to the future
 - Lose the present time and miss a deadline

Hardware and software clocks

- At real time, t, OS reads time on computer's hardware clock H_i(t)
- Calculates time on its software clock:

$$C_i(t) = a * H_i(t) + b$$
 (for process i)

Monotonicity requirement:

$$t' > t$$
: $C(t') > C(t)$

• Can achieve monotonicity by adjusting a and b in $C_i(t) = a * H_i(t) + b$

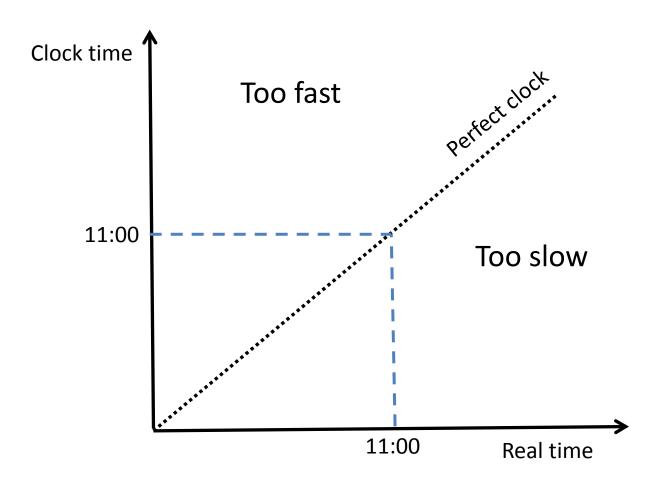
Clock adjustment

 Two parameters are a constant offset and a linear slope:

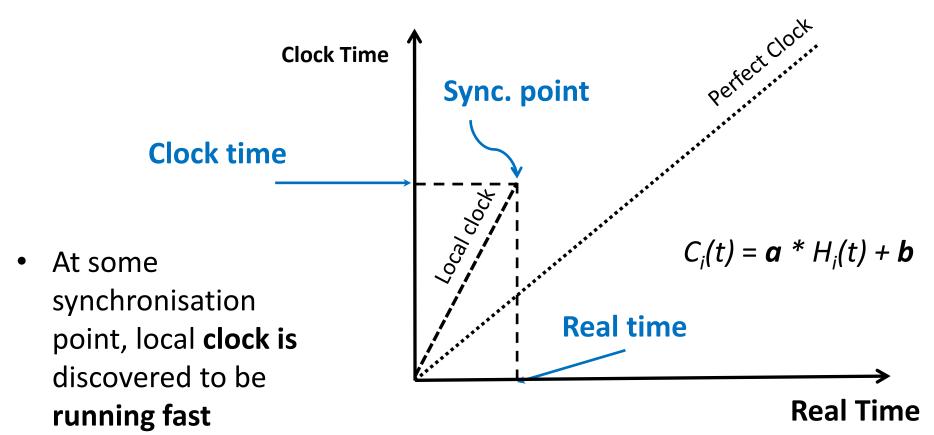
$$-C_i(t) = \mathbf{a} * H_i(t) + \mathbf{b}$$

 The "catch up" value for scaling local time down or up in a linear fashion

Perfect time



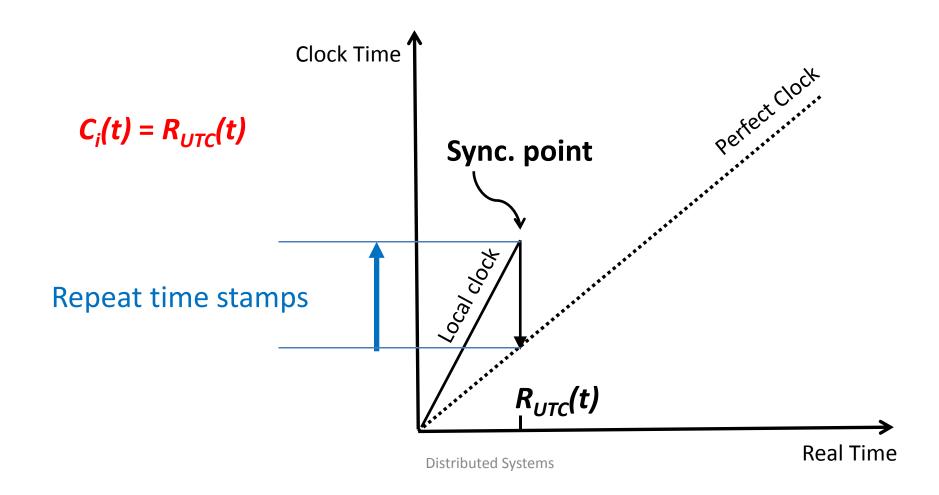
Clock too fast



 True time according to a UTC source, for example

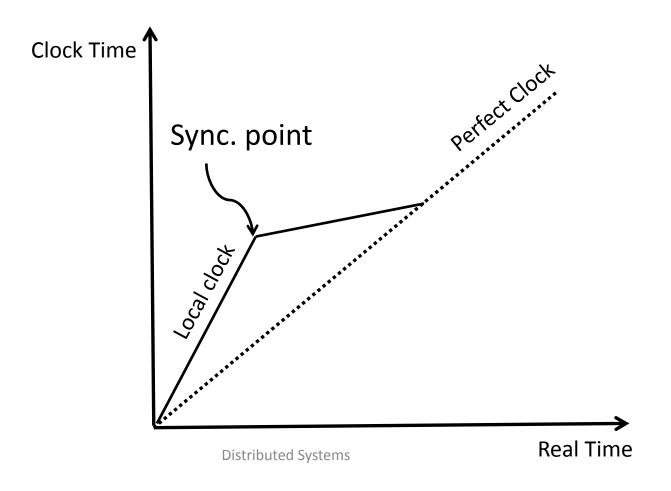
"Catch up" Example: Resock

Can't just set local clock to be equal to "real time"



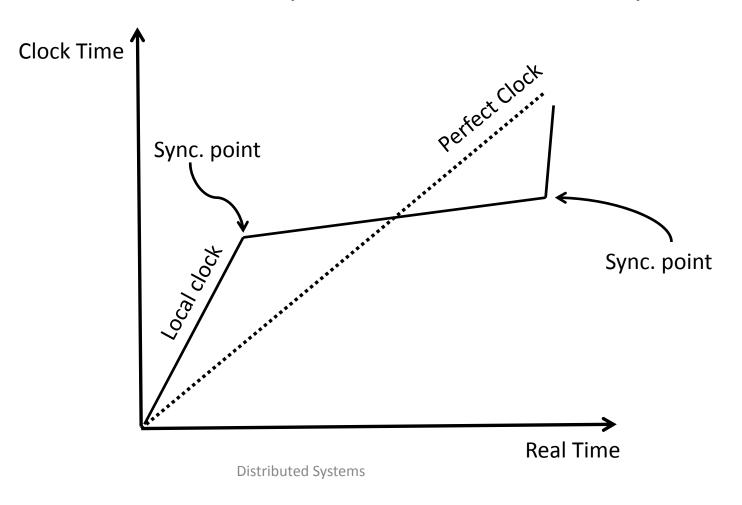
"Catch up" Example: Slow down clock

 Instead, slow down the local clock by not updating the full amount at each clock interrupt



"Catch up" Example: Implications

 Imperfect timing of synchronization points may lead to saw tooth behaviour (too slow, then too fast)



LOGICAL CLOCKS

Events and event ordering

- Often sufficient to know the order of events
 - An event may be an instruction execution, method call, order entry, etc.
 - Events include message send & receive
- Within a single process order determined by instruction execution sequence
- Between two processes on same computer order determined using local physical clock
- Between two different computers order cannot be determined using local physical clocks, since those clocks cannot be synchronized perfectly

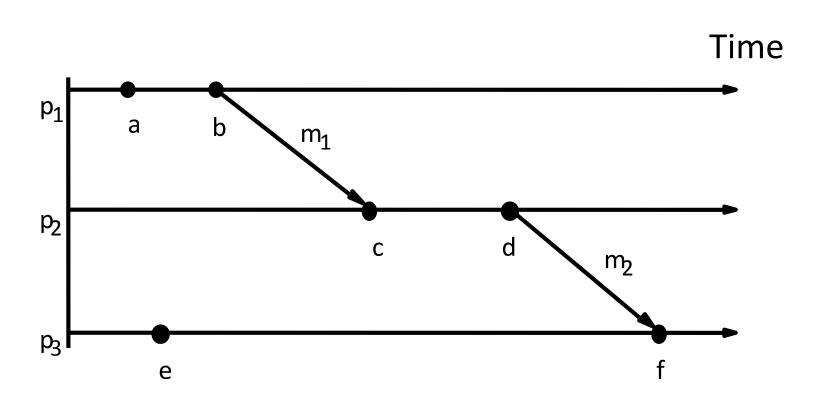
Logical clocks

Key idea is to abandon the idea of physical time

 Only know order of events, not when they happened (or how much time between events)

 Lamport (1978) introduced logical (virtual) time and methods to synchronize logical clocks

Events in a distributed system



The happened-before relation Denoted by "→"

- Describes a (causal) ordering of events
- If a and b are events in the same process and a occurred before b then a → b
- If a is the event of sending a message m in one process and b is the event of receiving m in another process then a → b
- Relation " \rightarrow " is **transitive:** If $a \rightarrow b$ and $b \rightarrow c$ then $a \rightarrow c$
- If neither $a \rightarrow b$ nor $b \rightarrow a$ then **a** and **b** are concurrent, denoted by a | | b
- For any two events a and b, either $a \rightarrow b$, $b \rightarrow a$, or $a \mid b$

Causality of " \rightarrow "-relation

(a.k.a. causality relation)

Intuitively, past events influence future events

 Influence among causally related events is referred to as causal effects

• If $a \rightarrow b$, event a **may** causally effect event b

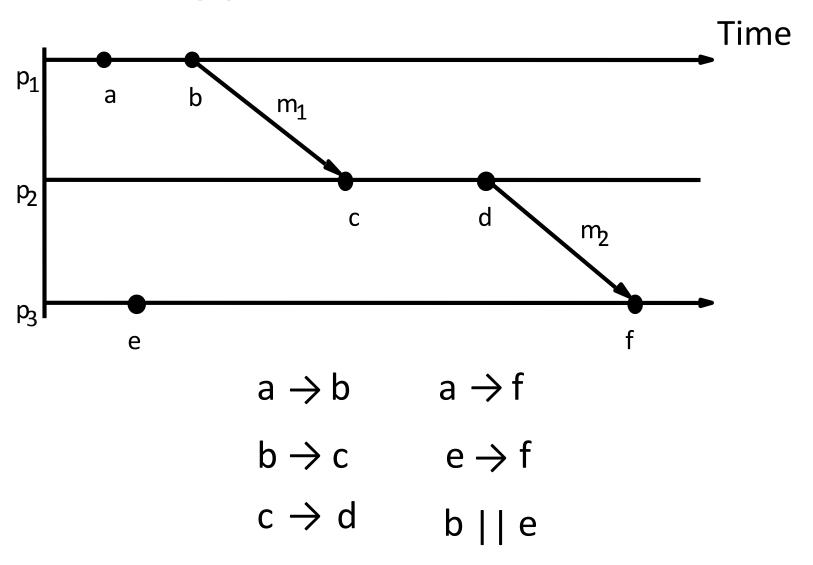
• Concurrent events **do not causally effect** each other (e.g., neither $a \rightarrow b$ nor $b \rightarrow a$)

Potential causality of " \rightarrow "-relation

 "→" captures potential flow of information between events

- Information may have flown in ways other than via message passing (not modeled by "→")
- In $a \rightarrow b$, a might or might not have caused b (relation assumes it has, but we don't know for sure)

Happened-before relation



Distributed Systems

Lamport clock (logical clock)

- Implementation of clock that tracks "→" numerically
- Each process P_i has a logical clock C_i (a counter)
- Clock C_i can assign a value C_i(a) to any event a in process P_i
- Value C_i(a) is the timestamp of event a in process P_i
- Timestamps have no relation to physical time, which leads to the term logical clock
- Logical clocks assign monotonically increasing timestamps
- Can be implemented by a simple integer counter

Correctness condition

- Clock condition
 - If a \rightarrow b then C(a) < C(b)
 - But not: If C(a) < C(b) then $a \rightarrow b$
- Correctness conditions
 - For any two events a and b in the same process P_i , if $a \rightarrow b$ then $C_i(a) < C_i(b)$
 - If a is the event of sending a message in process P_i and b is the event of receiving that same message in a different process P_i then $C_i(a) < C_j(b)$

Implementation of logical clocks

 Clock C_i must be incremented before an event occurs in process P_i (before event is executed)

$$- C_i = C_i + d (d > 0, d usually 1)$$

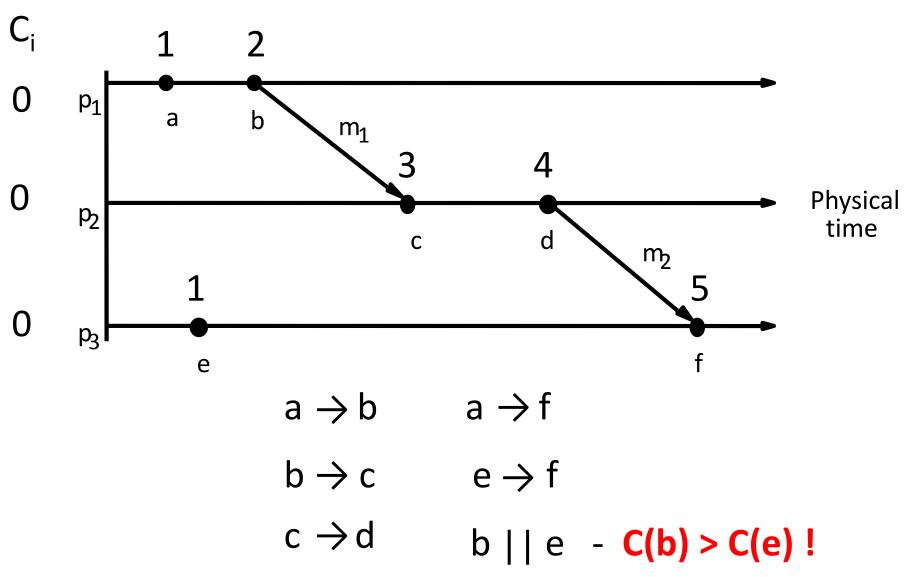
If a is the event of sending a message m in process P_i
 then m is assigned a timestamp

$$-T_m = C_i(a)$$

• When that same message m is received by a different process P_k , C_k is set to a value greater than its present value (prior to the message receipt) and greater than T_m

$$- C_k = max\{C_k, T_m\} + d (d > 0, d usually 1)$$

Logical clock example



Distributed Systems

Induced total order

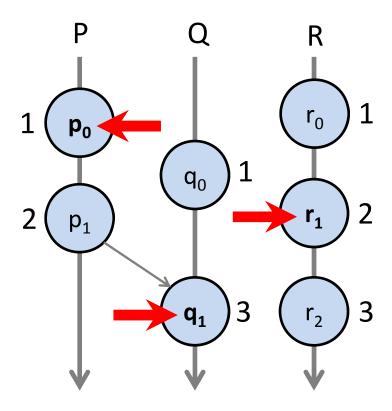
- $C_1(a) = 1$ and $C_3(e) = 1$ can't be ordered according to happened-before relation!
- Happened-before is a unique partial order of events
- Induce a non-unique total order as follows
 - Use logical time stamps to order events
 - Break ties by using an arbitrary total ordering of processes, e.g., $P_1 < P_2$ (process identifiers)

Total order for events

- Let a be an event in P_i and b an event in P_j
 then a ⇒ b if and only if either
 - (i) $C_i(a) < C_i(b)$ or
 - (ii) $C_i(a) = C_j(b)$ and $P_i < P_j$
- Results in total order of all events in system

Limitation of Logical Clocks

- If C(a) < C(b) then
 a may or may not happen-before b
- Example illustrating this limitation
- C($\mathbf{p_0}$) < C($\mathbf{q_1}$) and $\mathbf{p_0} \rightarrow \mathbf{q_1}$ is true
- C($\mathbf{p_0}$) < C($\mathbf{r_1}$) but $\mathbf{p_0} \rightarrow \mathbf{r_1}$ is false



One cannot determine whether two events are causally related from timestamps alone

VECTOR CLOCKS

Vector clocks I

- System with *n* processes
- Each process P_i has a clock C_i, which is an integer vector of length n:

$$C_i = (C_i[1], C_i[2], ..., C_i[n])$$

- C_i(a) is the timestamp (clock value) of event a at process P_i (a vector)
- C_i[i], entry i of C_i, is P_i's logical time
- C_i[i] represents the number of events that process P_i has timestamped

$$P_i : (C_i[1], ..., C_i[i], ..., C_i[n])$$

Vector clocks II

 C_i[k], entry k of C_i (where k≠i), is P_i's "guess" of the logical time at P_k

 C_i[k] is the number of events that have occurred at P_k that P_i has potentially been affected by

$$P_i : (C_i[1], ..., C_i[k], ..., C_i[n])$$

Implementation of vector clocks

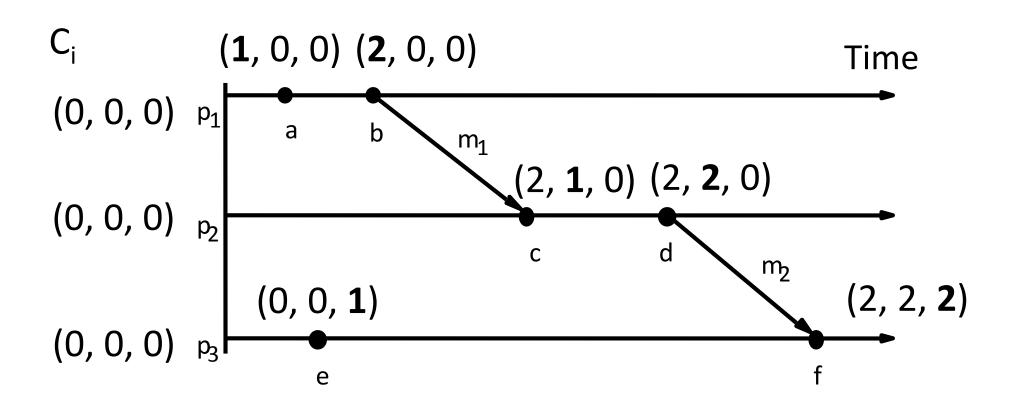
 Clock C_i is incremented before an event occurs in process P_i

$$C_{i}[i] = C_{i}[i] + d (d > 0, d usually 1)$$

- If event a is the event of sending a message m in process P_i, then message m is assigned a vector timestamp T_m = C_i(a)
- When that same message m is received by a different process P_k , C_k is updated as follows:

For all j,
$$C_k[j] = \max\{ C_k[j], T_m[j] \}$$

Vector clock example



Relations for comparing vector clocks

C_a, C_b two vector timestamps

```
• C_a = C_b iff for all i: C_a[i] = C_b[i]
```

•
$$C_a \le C_b$$
 iff for all i : $C_a[i] \le C_b[i]$

•
$$C_a < C_b$$
 iff $C_a \le C_b$, $\exists i : C_a[i] < C_b[i]$

•
$$C_a \mid | C_b \text{ iff } \neg (C_a[i] < C_b[i]) \text{ and } \neg (C_b[i] < C_a[i])$$

Example

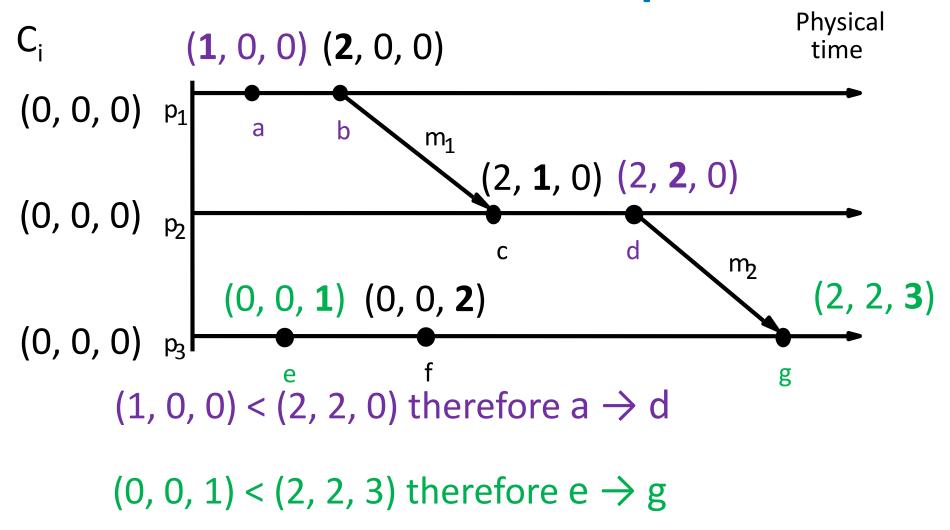
• (1123) = (1123)

• $(1123) \le (1124)$ and $(1123) \le (1123)$

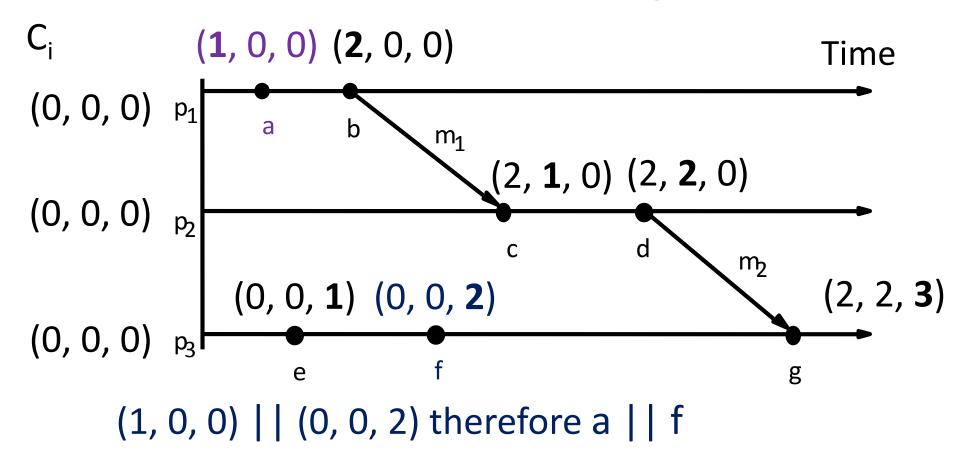
• (1123) < (1124)

(1 1 3 3) | | (1 1 2 4)

Vector clock example



Vector clock example



With Lamport: 1 < 2, but not $a \rightarrow f$?

Properties of vector clocks

 Let a, b be two events with vector time stamps C_a, C_b then:

$$-a \rightarrow b$$
 iff $C_a < C_b$
 $-a \mid \mid b$ iff $C_a \mid \mid C_b$

Versioning data objects

Assume three
servers X, Y, Z, a
data object D
with object
versions
represented by
a vector clock
(X, Y, Z)

Write handled by Server X

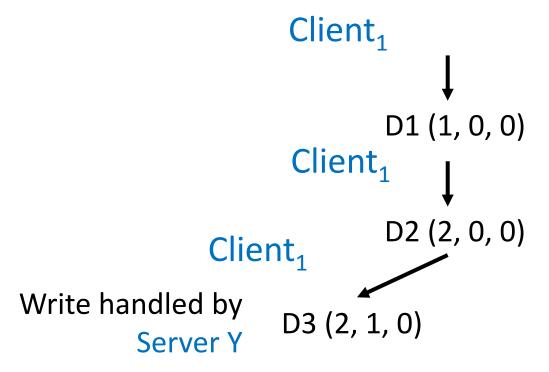
Write handled by Server X (produces a new version D)

Dynamo can **syntactically reconcile** data (overwrite D1 with D2), D2 is a strictly newer version of D1.

Internal to Dynamo, **updates** to data **are replicated** asynchronously to other servers.

There may exist replicas of D1 that have not yet seen D2.

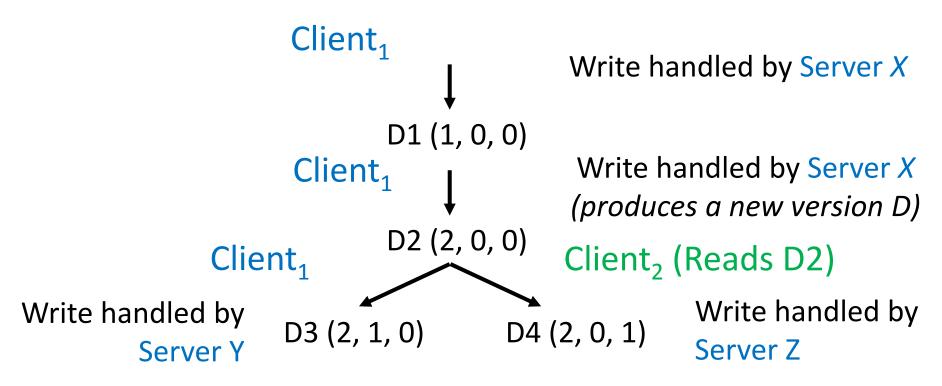
Versioning data objects



Write handled by Server X

Write handled by Server X (produces a new version D)

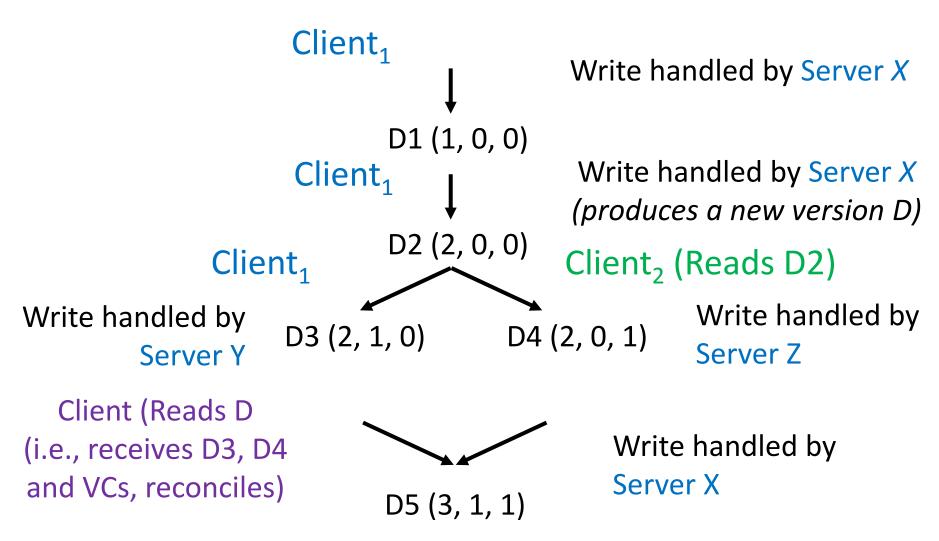
Versioning data objects



Versioning data objects

- A node seeing D1 (1, 0, 0) and D2 (2, 0, 0)
 - $-(1, 0, 0) \le (2, 0, 0)$ (overwrite D1 with D2)
- A node seeing D1 (1, 0, 0), D2 (2, 0, 0) and D4 (2, 0, 1) (or D3 (2, 1, 0))
 - $E.g., (2, 0, 0) \le (2, 0, 1)$ (overwrite D2 with D4)
- A node aware of D3 (2, 1, 0), receiving D4 (2, 0, 1)
 - $-(2, 1, 0) \mid | (2, 0, 1)$ (no causal relation!)
 - Exist changes in D3, D4 that are not reflected in each others' version of the data
 - Both versions must be kept and presented to client for semantic reconciliation

Versioning data objects



Distributed Systems

{}

Add beer

{beer}

Add chips {beer, chips}



Delete beer

Add diapers

{chips, diapers}

Delete chips

Add sausages

{beer, sausages}

Reconciliation is to "merge" shopping carts. {beer, chips, diapers, sausages}

Didn't loose "Add," loose "Delete"!

Distributed Systems

Logical clock summary

- Clocks that are not based on real-time
- Logical time progresses using events
 - Local execution of some code
 - Send/receive messages
- Happened-before relationship
 - Tracks causality between events across processes
- Lamport clock
 - Single counter updated at every event
 - Introduces false positive causality
- Vector clock
 - Size of timestamp is relative to number of processes
 - Can determine causality more accurately than Lamport clock

JSON – FYI (OFFLINE READING)

JavaScript Object Notation (JSON)

- Lightweight data-interchange format
- Easy for humans to read and write
- Easy for machines to parse and generate
- A language-independent text format
- Nowadays, widely supported in libraries for many programming languages

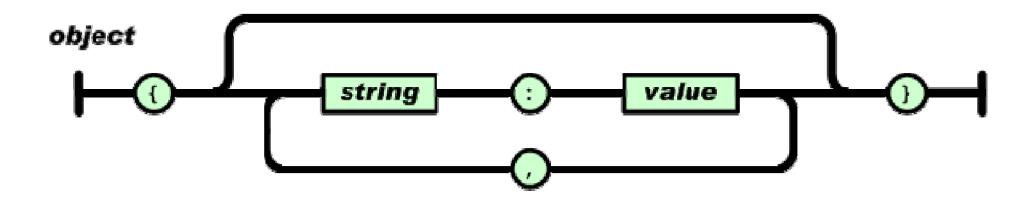
JSON built on two structures

- Collection of name/value pairs
 - E.g., realized as *object*, record, struct, dictionary, hash table, keyed list, or associative array in other programming languages

- Ordered list of values
 - E.g., realized as an array, vector, list, or sequence in other programming languages

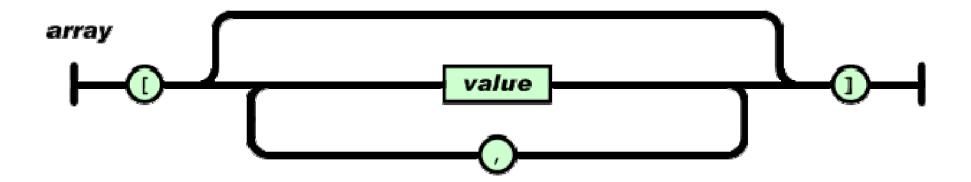
Object

An *object* is an unordered set of name/value pairs.



Array

An *array* is an ordered collection of values.

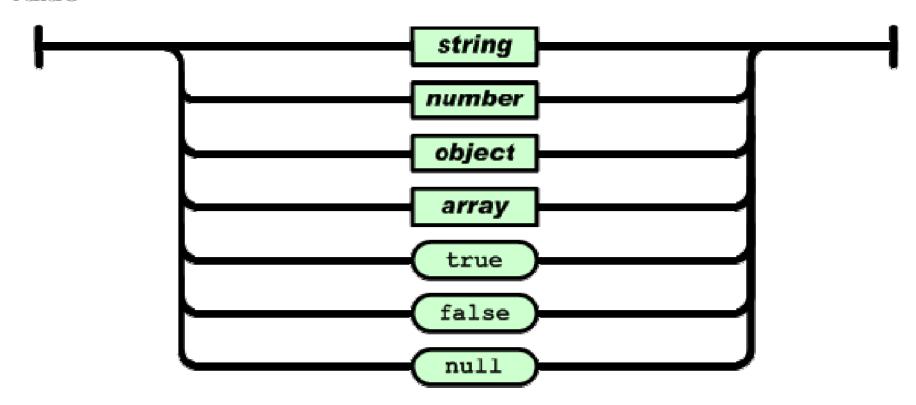


Value

A **value** can be a string, a number, true, false, null, an object, or an array.

These structures can be nested.

value



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Examples

```
{name: "John", age: 31, city: "New York"}
{ "markers":
 [ { "name": "Rixos The Palm Dubai",
    "position": [25.1212, 55.1535] },
  { "name": "Shangri-La Hotel",
   "location": [25.2084, 55.2719] },
  { "name": "Grand Hyatt",
    "location": [25.2285, 55.3273] }
```

Examples

```
{"menu": {
  "id": "file",
  "value": "File",
   "popup": {
      "menuitem": [
         {"value": "New", "onclick": "CreateNewDoc()"},
         {"value": "Open", "onclick": "OpenDoc()"},
         {"value": "Close", "onclick": "CloseDoc()"}
}}}
```