

# Distributed Systems Consistency & Replication I

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### Last Time

- Logical Clocks
- Vector Clocks
- Consistent Snapshots
- Passive Monitoring
- Active Monitoring

## **Active Monitoring**

- Recall: we used vector clocks so we can construct consistent global states (or cuts) from processes' local histories via passive monitoring
- Remember, there is another type of monitoring – active monitoring
  - Active monitoring is also referred to as constructing a *distributed snapshot*

# Distributed Snapshot Protocol (Chandy and Lamport)

- Monitor  $p_{\theta}$  sends "take snapshot" message to all processes  $p_i$
- If  $p_i$  receives such "take snapshot" message for the first time, it:
  - Records its state
  - Stops doing any activity related to the distributed computation
  - Relays the "take snapshot" message on all of its outgoing channels
  - Starts recording a state of its incoming channels records all messages that have been delivered after the receipt of the first "take snapshot" message

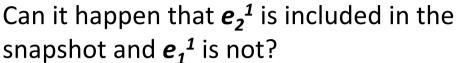
# Distributed Snapshot Protocol (Chandy and Lamport)(cont.)

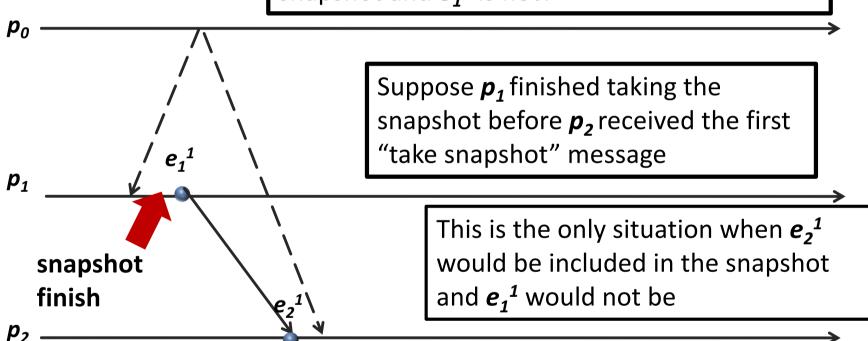
- When  $p_i$  receives a "take snapshot" message from process  $p_j$ , it stops recording the state of the channel between itself and  $p_j$
- When  $p_i$  received "take snapshot" message from all processes and from  $p_o$ , it stops recording the snapshot and sends it to  $p_o$

# Properties of Chandy-Lamport Protocol

- Let's see why this protocol constructs only consistent snapshots, provided that FIFO channels are used
- Recall the key property of a consistent snapshot (i.e., consistent cut):
  - If event  $(e \rightarrow e")$  and e" is included in the snapshot, then e must also be included in that snapshot
- Let's see why this property holds if we use the Chandy-Lamport distributed snapshot protocol

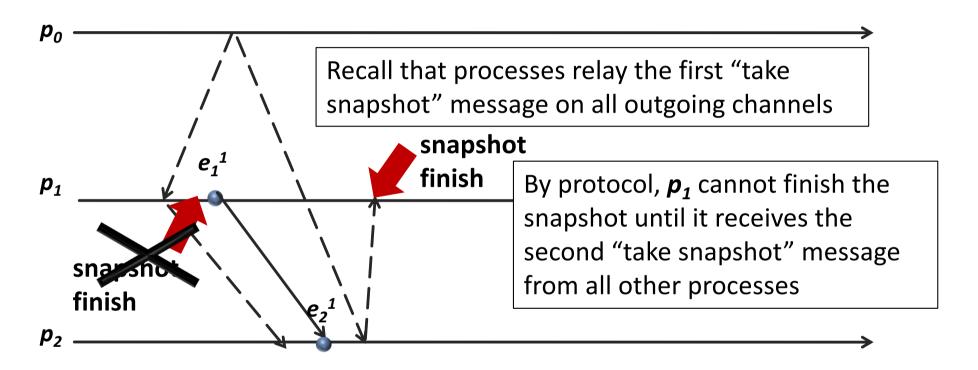
# Properties of Chandy-Lamport Protocol





Let's see why this won't happen

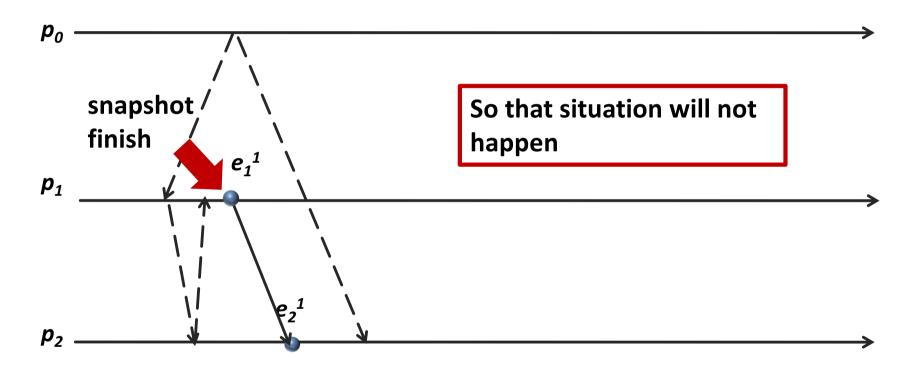
## Chandy-Lamport Protocol: Example 1



So  $p_1$  cannot send  $e_1^1$  and finish taking the snapshot before  $p_2$  received the first "take snapshot" message.

So that situation will not happen

## Chandy-Lamport Protocol: Example 2



But  $p_2$  must stop recording events from  $p_1$  after it receives the "take snapshot" message from  $p_1$ .

### Questions

- Active monitoring vs. passive monitoring?
  - Active monitoring: query the system
- Goal of Chandy and Lamport protocol?
  - Global snapshot

## Summary

- Constructing a consistent global state is difficult in absence of global clocks
- Consistent global states can be constructed using
  - Active monitoring (distributed snapshots)
  - Passive monitoring (local event histories with vector clock timestamps)

## Today...

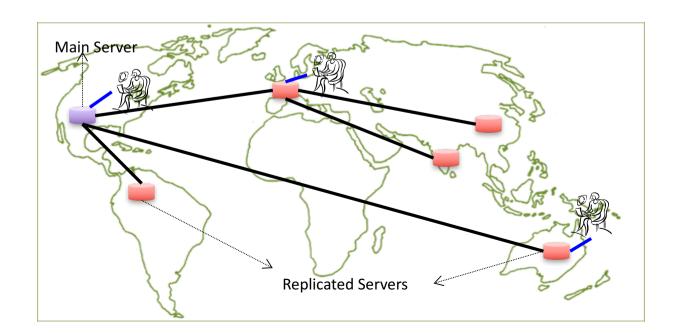
- Consistency and Replication
  - Introduction
  - Data-centric Consistency Models

## Why Replication?

- Replication is the process of maintaining the data at multiple computers
- Replication is necessary for:
  - Improving performance
    - A client can access the replicated copy of the data that is near to its location
  - Increasing the availability of services
    - Replication can mask failures such as server crashes and network disconnection
  - Enhancing the scalability of the system
    - Requests to the data can be distributed to many servers which contain replicated copies of the data
  - Securing against malicious attacks
    - Even if some replicas are malicious, secure data can be guaranteed to the client by relying on the replicated copies at the non-compromised servers

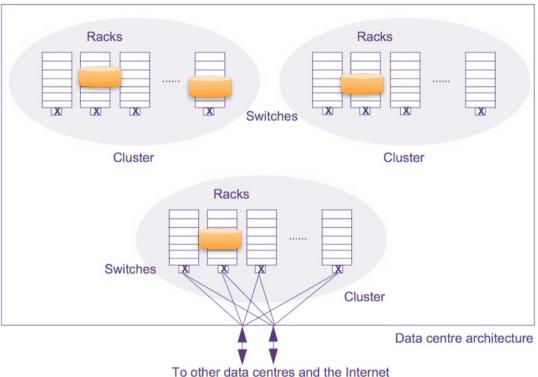
## 1. Replication for Improving Performance

- Example Applications
  - Caching webpages at the client browser
  - Caching IP addresses at clients and DNS Name Servers
  - Caching in Content Delivery Network (CDNs)
    - Commonly accessed contents, such as software and streaming media, are cached at various network locations



## 2. Replication for High-Availability

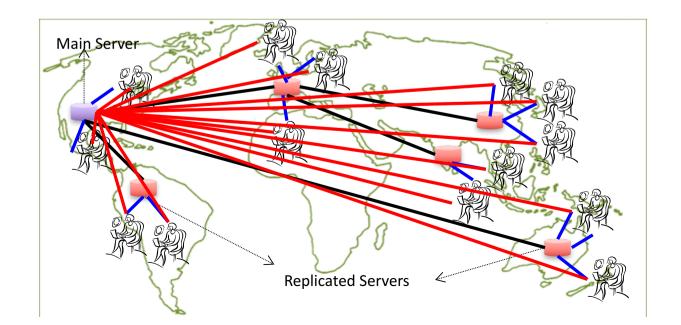
 Availability can be increased by storing the data at replicated locations (instead of storing one copy of the data at a server)



- Example:
   Google File-System and Chubby replicate the data at computers across different racks, clusters and data-centers
  - If one computer or a rack or a cluster crashes, then a replica of the data can still be accessed

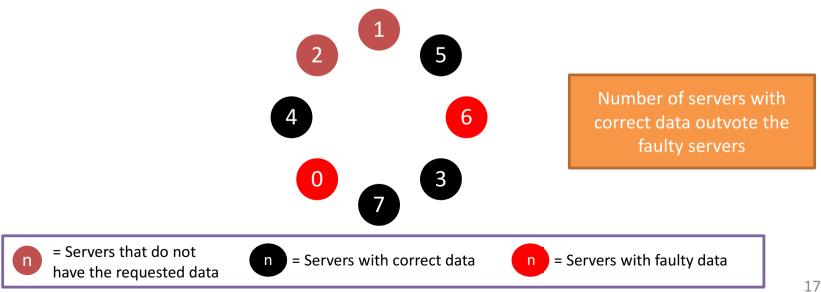
## 3. Replication for Enhancing Scalability

- Distributing the data across replicated servers helps in avoiding bottle-necks at the main server
  - It balances the load between the main and the replicated servers
- Example: Content Delivery Networks decrease the load on main servers of the website



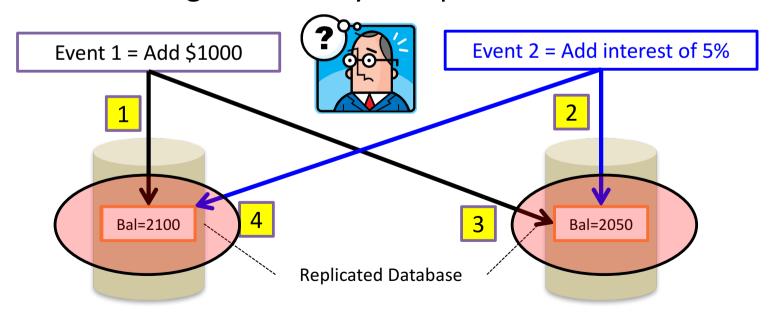
## 4. Replication for Securing Against Malicious Attacks

- If a minority of the servers that hold the data are malicious, the non-malicious servers can outvote the malicious servers, thus providing security.
- The technique can also be used to provide faulttolerance against non-malicious but faulty servers



## Why Consistency?

- In a DS with replicated data, one of the main problems is keeping the data consistent
- An example:
  - In an e-commerce application, the bank database has been replicated across two servers
  - Maintaining consistency of replicated data is a challenge



### Overview of Consistency and Replication

#### Today's lecture

- Consistency Models
  - Data-Centric Consistency Models
  - Client-Centric Consistency Models
- Replica Management
  - When, where and by whom replicas should be placed?
  - Which consistency model to use for keeping replicas consistent?
- Consistency Protocols
  - We study various implementations of consistency models

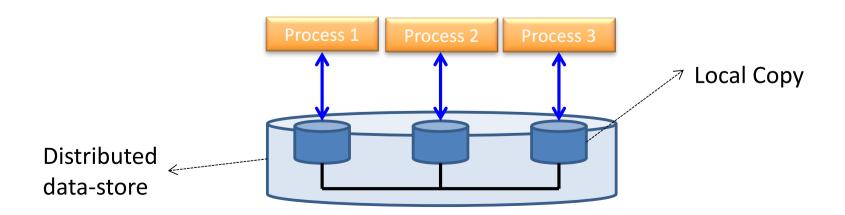
Next lectures

### Overview

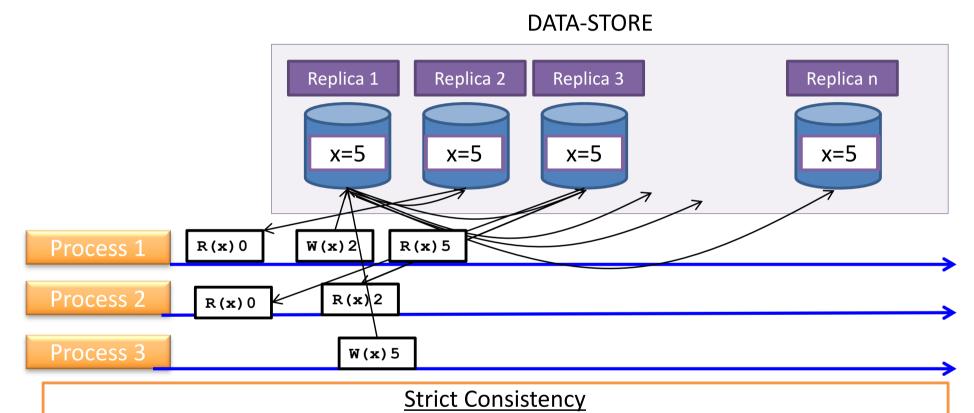
- Consistency Models
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# Introduction to Consistency and Replication

- In a distributed system, shared data is typically stored in distributed shared memory, distributed databases or distributed file systems.
  - The storage can be distributed across multiple computers
  - Simply, we refer to a series of such data storage units as data-stores
- Multiple processes can access shared data by accessing any replica on the data-store
  - Processes generally perform read and write operations on the replicas



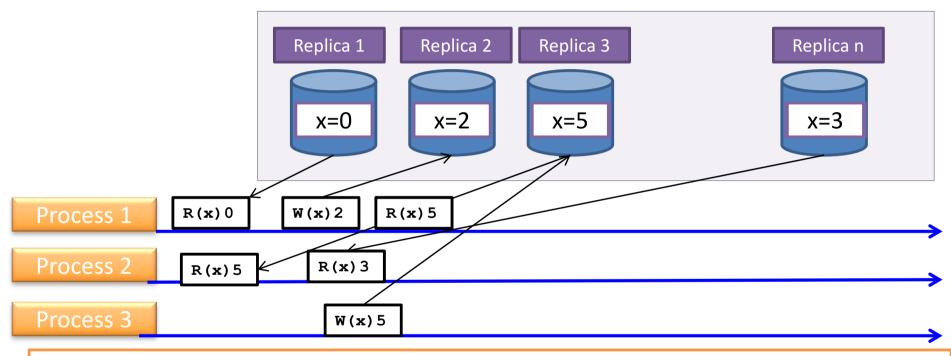
### Maintaining Consistency of Replicated Data



- Data is always fresh
  - After a write operation, the update is propagated to all the replicas
  - A read operation will result in reading the most recent write
- If there are many writes, this leads to large overheads

## Maintaining Consistency of Replicated Data (cont'd)

**DATA-STORE** 

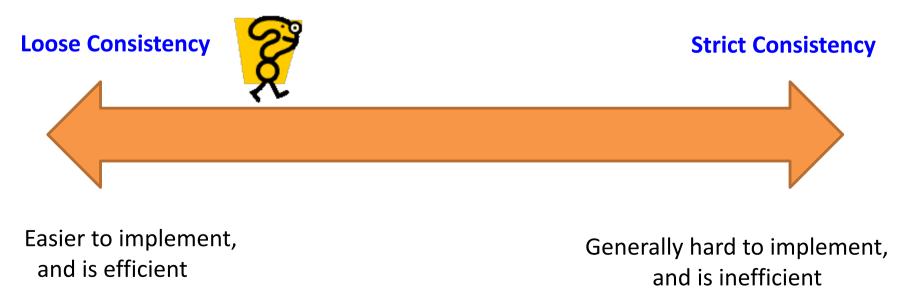


#### **Loose Consistency**

- Data might be stale
  - A read operation may result in reading a value that was written long back
  - Replicas are generally out-of-sync
- The replicas may sync at coarse grained time, thus reducing the overhead

## Trade-offs in Maintaining Consistency

- Maintaining consistency should balance between the strictness of consistency versus efficiency
  - How much consistency to we need?
  - Good-enough consistency depends on your application



## Questions

- Strict consistency vs. loose consistency?
  - Strict consistency: data is always up-to-date
  - Loose consistency: data maybe be outdated
- Which one to implement for
  - a Bank?
  - Facebook?

## **Consistency Model**

- A consistency model is a contract between
  - the process that wants to use the data, and
  - the replicated data repository (or data-store)
- A consistency model states the level of consistency provided by the data-store to the processes while reading and writing the data

## Types of Consistency Models

- Consistency models can be divided into two types:
  - Data-Centric Consistency Models
    - These models define how the data updates are propagated across the replicas to keep them consistent
  - Client-Centric Consistency Models
    - These models assume that clients connect to different replicas at each time
    - The models ensure that whenever a client connects to a replica, the replica is bought up to date with the replica that the client accessed previously

### Overview

- Consistency Models
  - Data-Centric Consistency Models
  - Client-Centric Consistency Models
- Replica Management
- Consistency Protocols

## Data-Centric Consistency Models

- Data-centric Consistency Models describe how the replicated data is kept consistent, and what the process can expect
- Under Data-centric Consistency Models, we study two types of models:
  - Consistency Specification Models:
    - These models enable specifying the consistency levels that are tolerable to the application
  - Models for Consistent Ordering of Operations:
    - These models specify the order in which the data updates are propagated to different replicas

### Overview

- Consistency Models
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    - Consistency Specification Models
    - Models for Consistent Ordering of Operations
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## **Consistency Specification Models**

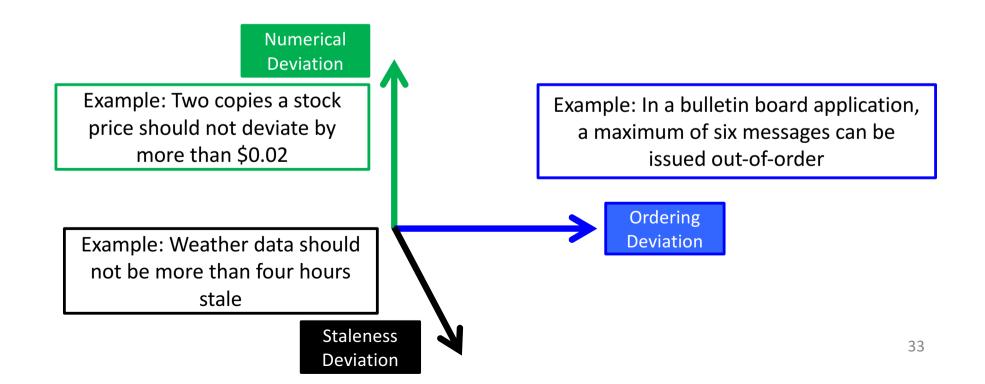
- In replicated data-stores, there should be a mechanism to:
  - Measure how inconsistent the data might be on different replicas
  - How replicas and applications can specify the tolerable inconsistency levels
- Consistency Specification Models enable measuring and specifying the level of inconsistency in a replicated data-store
- We study a Consistency Specification Model called Continuous Consistency Model

## Continuous Consistency Model

- Continuous Consistency Model
  - is used to measure inconsistencies and
  - express what inconsistencies can be expected in the system

## **Continuous Consistency Ranges**

- Level of consistency is defined over three independent axes:
  - Numerical Deviation: Deviation in the numerical values between replicas
  - Order Deviation: Deviation with respect to the ordering of update operations
  - Staleness Deviation: Deviation in the staleness between replicas



## Consistency Unit (Conit)

- Consistency unit (Conit) specifies the data unit over which consistency is measured
  - For example, conit can be defined as a record representing a single stock
- Level of consistency is measured by each replica along the three dimensions
  - Numerical Deviation
    - For a given replica R, how many updates at other replicas are not yet seen at R? What is the effect of the non-propagated updates on local Conit values?
  - Order Deviation
    - For a given replica R, how many local updates are not propagated to other replicas?
  - Staleness Deviation
    - For a given replica R, how long has it been since updates were propagated?

There is one operation at B which is not yet pushed to A with a value difference of x=2,y=0

#### Conit and Consisten

There are no operations at A which are not yet pushed to B

**Assume** 

Order De not prese

able of operations and measures

number of operations in R that are

No operations at
A are not yet
pushed to B

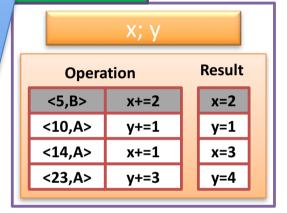
at real Roth oliviation

R is defin One operation olicas that at B was not yet pushed to A

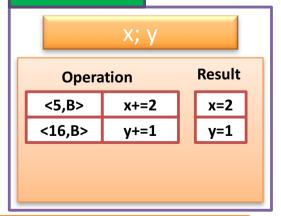
ll variable

| A |   |        |     |        |   |   |        |     |        |
|---|---|--------|-----|--------|---|---|--------|-----|--------|
| X | у |        | Ord | n(w)   | X | у | VC     | Ord | n(w)   |
| 0 | 0 | (0,0)  | 0   | 0(0,0) | 0 | 0 | (0,0)  | 0   | 0(0,0  |
| 0 | 0 | (0,0)  | 0   | 1(2,0) | 2 | 0 | (0,5)  | 1   | 0(0,0) |
| 2 | 0 | (1,5)  | 0   | 0(0,0) | 2 | 0 | (0,5)  | 0   | 0(0,0) |
| 2 | 1 | (10,5) | 1   | 0(0,0) | 2 | 0 | (0,5)  | 0   | 1(0,1) |
| 2 | 1 | (10,5) | 1   | 1(0,1) | 2 | 1 | (0,16) | 1   | 1(0,1) |
| 3 | 1 | (14,5) | 2   | 1(0,1) | 2 | 1 | (0,16) | 1   | 2(1,1) |
| 3 | 4 | (23,5) | 3   | 1(0,1) | 2 | 1 | (0,16) | 1   | 3(1,4) |

#### Replica A



#### Replica B



<5,B> = Operation performed at B when the vector clock was 5

<m,n>

= Uncommitted operation

<m,n> = Committed operation

x;y = A Conit

#### FOR PRINTING – WITHOUT BUBBLES

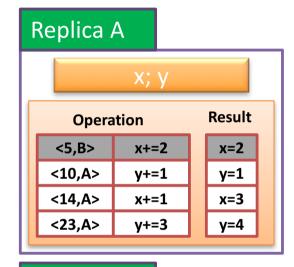
#### Assume a global observer keeps a table of operations and measures

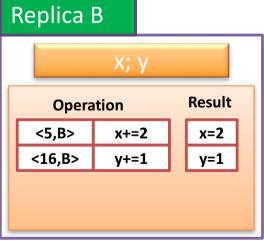
<u>Order Deviation</u> at a replica R is the number of operations in R that are not present at the other replicas

Numerical Deviation at replica R is defined as n(w), where n = # of operations at other replicas that are not yet seen by R, w = weight of the deviation

= list of update amount for all variables in a Conit

| Replica A |   |        |     | Replica B |   |   |        |     |        |
|-----------|---|--------|-----|-----------|---|---|--------|-----|--------|
| х         | у | VC     | Ord | n(w)      | x | у | VC     | Ord | n(w)   |
| 0         | 0 | (0,0)  | 0   | 0(0,0)    | 0 | 0 | (0,0)  | 0   | 0(0,0) |
| 0         | 0 | (0,0)  | 0   | 1(2,0)    | 2 | 0 | (0,5)  | 1   | 0(0,0) |
| 2         | 0 | (1,5)  | 0   | 0(0,0)    | 2 | 0 | (0,5)  | 0   | 0(0,0) |
| 2         | 1 | (10,5) | 1   | 0(0,0)    | 2 | 0 | (0,5)  | 0   | 1(0,1) |
| 2         | 1 | (10,5) | 1   | 1(0,1)    | 2 | 1 | (0,16) | 1   | 1(0,1) |
| 3         | 1 | (14,5) | 2   | 1(0,1)    | 2 | 1 | (0,16) | 1   | 2(1,1) |
| 3         | 4 | (23,5) | 3   | 1(0,1)    | 2 | 1 | (0,16) | 1   | 3(1,4) |





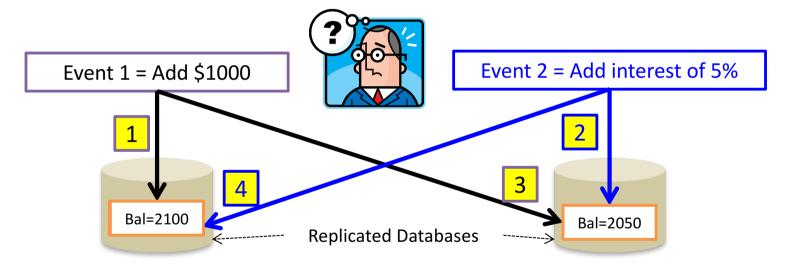


#### Overview

- Consistency Models
  - Data-Centric Consistency Models
    - Continuous Specification Models
    - Models for Consistent Ordering of Operations
  - Client-Centric Consistency Models
- Replica Management
- Consistency Protocols

# Why is Consistent Ordering Required in Replication?

- In several applications, the order or the sequence in which the replicas commit to the data store is critical
- Example:



- Continuous Specification Models defined how inconsistency is measured
  - However, the models did not enforce any order in which the data is committed

# Consistent Ordering of Operations (cont'd)

- Whenever a replica is updated, it propagates the updates to other replicas at some point in time
- Updating different replicas is carried out by passing messages between the replica datastores

 We will study different types of ordering and consistency models arising from these orderings

#### Types of Ordering

- We will study three types of ordering of messages that meet the needs of different applications:
  - Total Ordering
  - Sequential Ordering
    - Sequential Consistency Model
  - Causal Ordering
    - Causal Consistency Model

#### Questions

- How do we measure consistency?
  - Global observer
- Metrics to measure consistency?
  - Numerical Deviation: Deviation in the numerical values between replicas
  - Order Deviation: Deviation with respect to the ordering of update operations
  - Staleness Deviation: Deviation in the staleness between replicas

### Types of Ordering

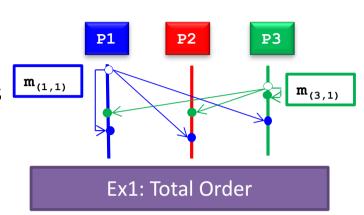
- Total Ordering
- Sequential Ordering
- Causal Ordering

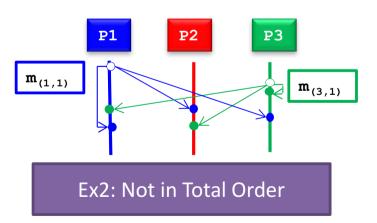
#### **Total Ordering**

#### Total Order

- If process P<sub>i</sub> sends a message m<sub>i</sub> and P<sub>j</sub> sends m<sub>j</sub>, and if one correct process delivers m<sub>i</sub> before m<sub>j</sub> then every correct process delivers m<sub>i</sub> before m<sub>j</sub>
- Messages can contain replica updates, such as passing the read or write operation that needs to be performed at each replica, example:
  - if  $P_1$  issues the operation  $m_{(1,1)}$ : x=x+1; and
  - If  $P_3$  issues  $m_{(3,1)}$ : print(x);
  - Then, at all replicas  $P_1$ ,  $P_2$ ,  $P_3$  execute in the same order, for example:

```
print(x);
x=x+1;
```



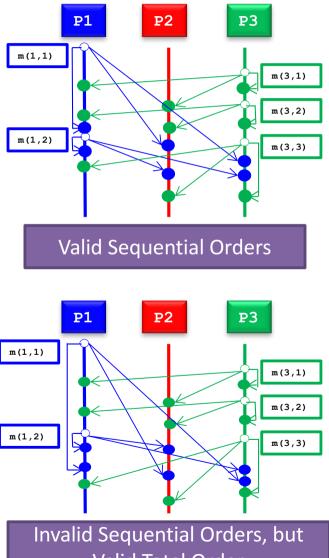


### Types of Ordering

- Total Ordering
- Sequential Ordering
- Causal Ordering

#### Sequential Ordering

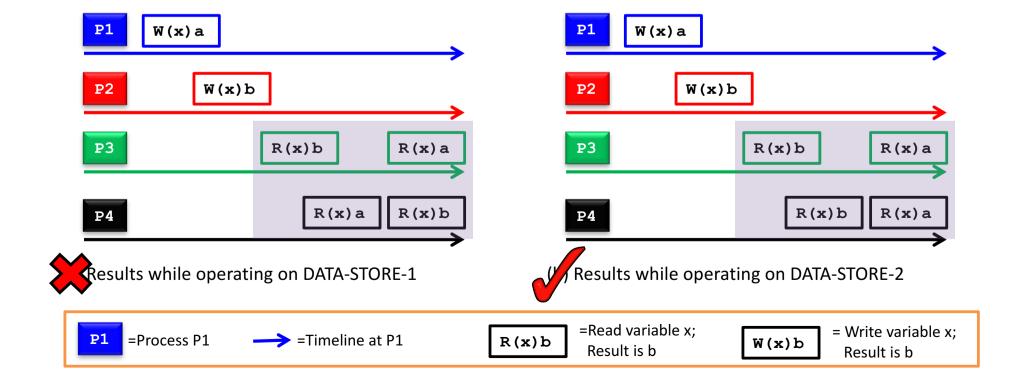
- + If a process **Pi** sends a sequence of messages  $\mathbf{m}_{(i,1)},....,\mathbf{m}_{(i,ni)}$ , and
- + Process **Pj** sends a sequence of messages  $\mathbf{m}_{(j,1)},...,\mathbf{m}_{(j,nj)},$
- + Then,:
  - + At any process, the set of messages received are in the same sequential order
  - Messages from each individual process appear in this sequence in the order sent by the sender
    - + At every process, **m**<sub>i,1</sub> should be delivered before  $m_{i,2}$ , which is delivered before  $m_{i,3}$ and so on...
    - + At every process,  $\mathbf{m}_{\mathbf{j},\mathbf{1}}$  should be delivered before  $m_{j,2}$ , which is delivered before  $m_{i,3}$ and so on...



Valid Total Order

#### Sequential Consistency Model

- Sequential Consistency Model enforces that all the update operations are executed at the replicas in a sequential order
  - "all read operations should see writes in the same order"
- Consider a data-store with variable x (Initialized to NULL)
  - In the two data-stores below, identify the sequentially consistent data-store



#### Sequential Consistency (cont'd)

- Consider three processes  $P_1$ ,  $P_2$  and  $P_3$  executing multiple instructions on three shared variables x, y and z
  - Assume that x, y and z are set to zero at start

- There are many valid sequences in which operations can be executed at the replica respecting sequential consistency
  - Identify the output?

Output

```
x = 1
                   x = 1
                                                       y = 1
print (y,z)
                  y = 1
                                     print (x,y)
                                                       z = 1
y = 1
                  print (x,z)
                                     print (x,z)
                                                       print (x,y)
                  print (y,z)
                                                       print (x,z)
print (x,z)
                                     v = 1
                                                       x = 1
z = 1
                   z = 1
                                     x = 1
print (x,y)
                  print (x,y)
                                     print (y,z)
                                                       print (y,z)
   001011
                      101011
                                         000111
                                                           010111
```

### Sequential Cons

http://olafland.polldaddy.com/s/seqcons

- Consider three processes  $P_1$ ,  $P_2$  are three shared variables x, y and z
  - Assume that x, y and z are set to ;

- There are many valid sequences in the replica respecting sequential cc
  - Identify the output?
  - Which ones brakes the seq. order?

```
x = 1
print (y,z)
y = 1
print (x,z)
z = 1
print (x,y)
```

```
Output 001011
```

```
x = 1
y = 1
print (x,z)
print (y,z)
z = 1
print (x,y)
```

```
z = 1
print (x,y)
print (x,z)
y = 1
x = 1
print (y,z)
```

```
y = 1
z = 1
print (x,y)
print (x,z)
x = 1
print (y,z)
```





http://olafland.polldaddy.com/s/seqcons

### Sequential Consistency (cont'd)

- Consider three processes  $P_1$ ,  $P_2$  and  $P_3$  executing multiple instructions on three shared variables  $\mathbf{x}$ ,  $\mathbf{y}$  and  $\mathbf{z}$ 
  - Assume that x, y and z are set to zero at start

- There are many valid sequences in which operations can be executed at the replica respecting sequential consistency
  - Identify the output?

Output

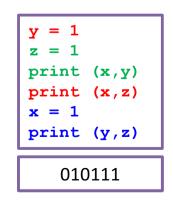
— Which ones brakes the seq. order?

```
x = 1
print (y,z)
y = 1
print (x,z)
z = 1
print (x,y)

x = 1
y = 1
print (x,z)
print (x,z)
z = 1
print (x,y)

101011
```

```
z = 1
print (x,y)
print (x,z)
y = 1
x = 1
print (y,z)
```

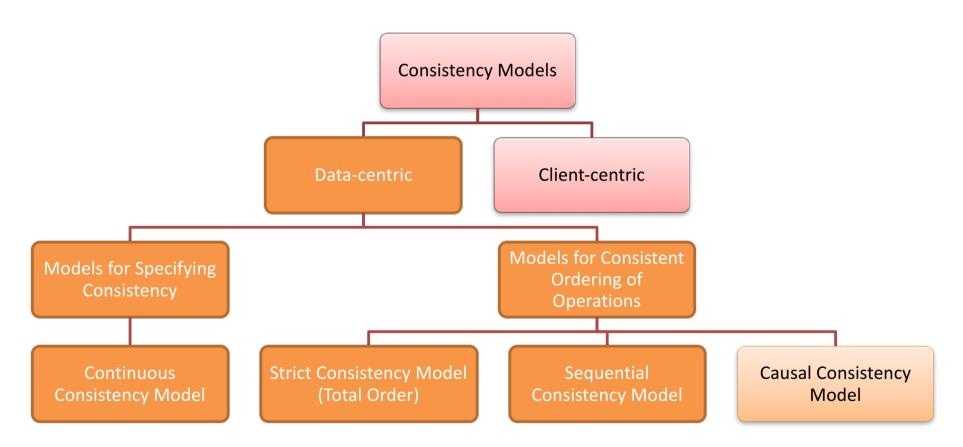


## Implications of Adopting Sequential Consistency Model for Applications

- There might be several different sequentially consistent combinations of ordering
  - Number of combinations for a total of n instructions = O(n!)
- The contract between the process and the distributed datastore is that the process must accept all of the sequential orderings as valid results
  - A process that works for some of the sequential orderings and does not work correctly for others is INCORRECT

#### Recap: Consistency Models

 A consistency model states the level of consistency provided by the datastore to the processes while reading and writing the data



#### Questions

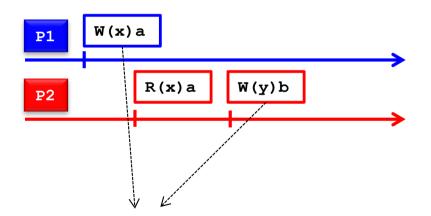
- Total Order?
  - Same order on all nodes
- Sequential Ordering?
  - At any process, the set of messages received are in the same sequential order
  - Messages from each individual process appear in this sequence in the order sent by the sender

#### Causality (Recap)

- Causal relation between two events
  - If a and b are two events such that a happened-before b or a→b, and
  - If the (logical) time when event a and b is received at a process P<sub>i</sub> is denoted by C<sub>i</sub>(a) and C<sub>i</sub>(b)
  - Then, if we can infer that  $a \rightarrow b$  by observing that  $C_i(a) < C_i(b)$ , then **a** and **b** are causally related
- How can we implement causality?
  - Logical Clocks or Vector Clocks (see prev. lectures)

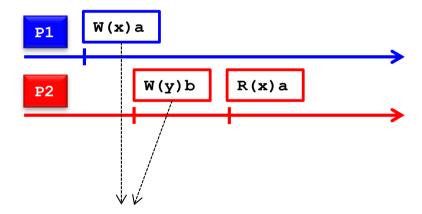
#### Causal vs. Concurrent events

Consider an interaction between processes P<sub>1</sub> and P<sub>2</sub> operating on replicated data x and y



Events are causally related Events are not concurrent

Computation of y at P<sub>2</sub> may have depended on value of x written by P<sub>1</sub>
 (As P<sub>2</sub> reads x before writing y)



Events are not causally related Events are concurrent

 Computation of y at P<sub>2</sub> does not depend on value of x written by P<sub>1</sub>

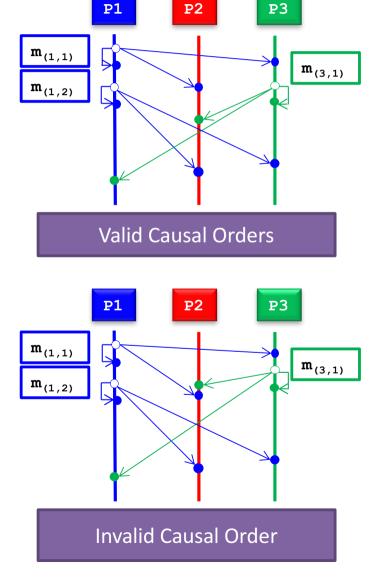
#### Causal Ordering

#### Causal Order

If process P<sub>i</sub> sends a message m<sub>i</sub> and P<sub>j</sub> sends m<sub>j</sub>, and if m<sub>i</sub> → m<sub>j</sub> (operator '→' is happened-before relation) then any correct process that delivers m<sub>j</sub> will deliver m<sub>i</sub> before m<sub>i</sub>

#### Drawback:

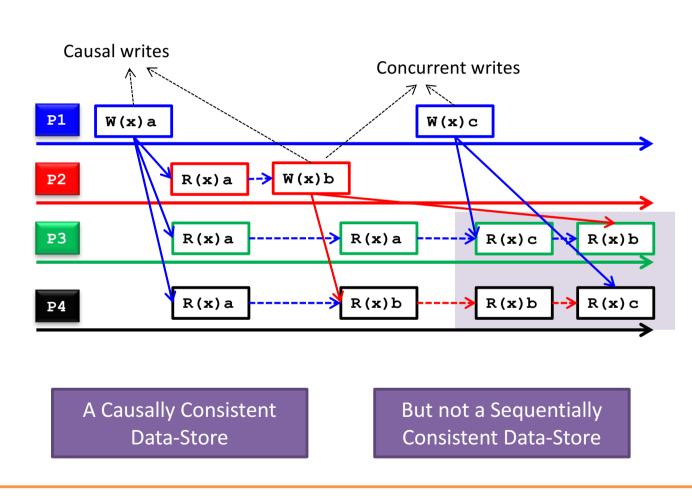
The happened-before relation between m<sub>i</sub> and m<sub>j</sub> should be induced before communication



#### Causal Consistency Model

- A data-store is causally consistent if:
  - Writes that are potentially causally related must be seen by all the processes in the same order
  - Concurrent writes may be seen in a different order on different machines

#### Example of a Causally Consistent Datastore



P1 =Process P1

=Timeline at P1

R(x)b =Read Resul

=Read variable x; Result is b W(x)b = Write variable x;
Result is b

#### Causally Consistent Data-Store?

http://olafland.polldaddy.com/s/causcons

| P1: W(x)a |       |       | W(x)c |       |       |  |
|-----------|-------|-------|-------|-------|-------|--|
| P2:       | R(x)a | W(x)b |       |       |       |  |
| P3:       | R(x)a |       |       | R(x)c | R(x)b |  |
| P4:       | R(x)a |       |       | R(x)b | R(x)c |  |

| <b>D</b> 1 | • | W( | v          | a |
|------------|---|----|------------|---|
| 1 1        | • |    | ( <b>^</b> | ļ |

| P2: | R(x)a | W(x)b |       |       |
|-----|-------|-------|-------|-------|
| P3: |       |       | R(x)b | R(x)a |
| P4· |       |       | R(x)a | R(x)b |

P1: W(x)a

| P2: | W(x)b |       |       |
|-----|-------|-------|-------|
| P3: |       | R(x)b | R(x)a |
| P4: |       | R(x)a | R(x)b |





http://olafland.polldaddy.com/s/causcons

#### Causally Consistent Data-Store?

| P1: W(x)a |       |       | W(x)c |       |       |
|-----------|-------|-------|-------|-------|-------|
| P2:       | R(x)a | W(x)b |       |       |       |
| P3:       | R(x)a |       |       | R(x)c | R(x)b |
| P4:       | R(x)a |       |       | R(x)b | R(x)c |

This sequence is allowed with a causally-consistent store, but not with sequentially consistent store.

Note:  $W_1(x)a \rightarrow W_2(x)b$ , but not  $W_2(x)b \rightarrow W_1(x)c$ 

| P1: W(x)a |       |       |       |       |
|-----------|-------|-------|-------|-------|
| P2:       | R(x)a | W(x)b |       |       |
| P3:       |       |       | R(x)b | R(x)a |
| P4:       |       |       | R(x)a | R(x)b |

A violation of a causally-consistent store.

| P1: W(x)a |       |       |       |
|-----------|-------|-------|-------|
| P2:       | W(x)b |       |       |
| P3:       |       | R(x)b | R(x)a |
| P4:       |       | R(x)a | R(x)b |

A correct sequence of events in a causally consistent store.

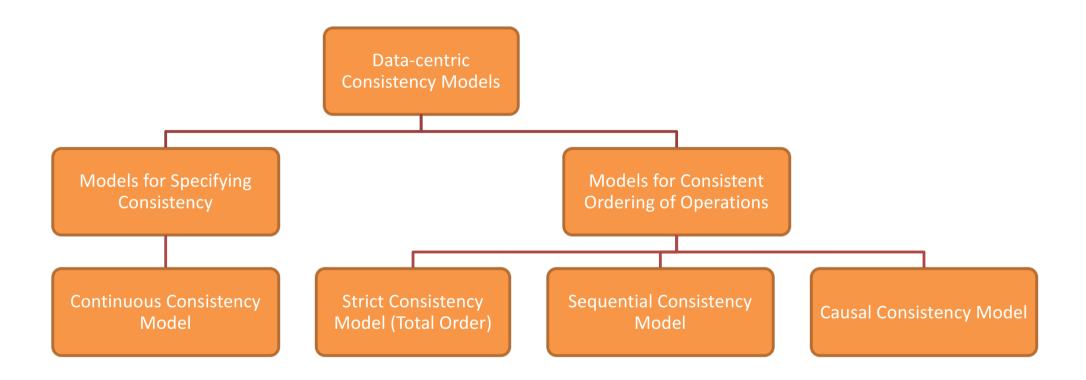
## Implications of adopting a Causally Consistent Data-store for Applications

- Processes have to keep track of which processes have seen which writes
- This requires maintaining a dependency graph between write and read operations
  - Vector clocks provide a way to maintain causal consistentcy

#### Summary

- Total Order?
  - Same order on all nodes
- Sequential Ordering?
  - Same order as sent by the sender
- Causal Order
  - Same order on all nodes only for causally related msg.

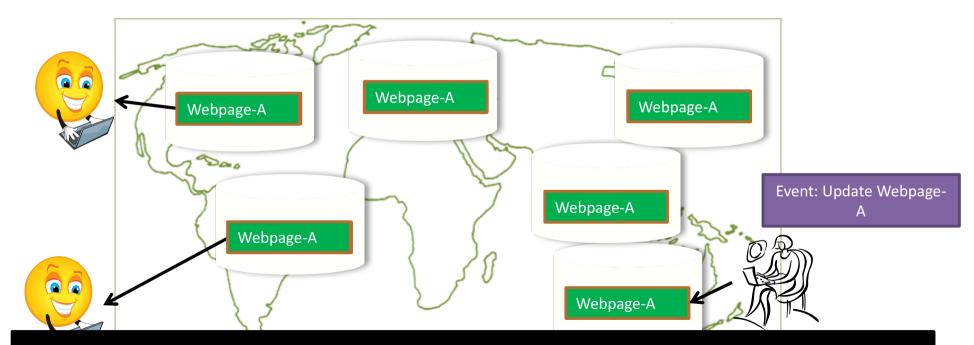
# Topics Covered in Data-centric Consistency Models



But, is Data-centric Consistency Model good for all applications?

## Applications that can use Data-centric Models

- Data-centric models are applicable when many processes are concurrently updating the data-store
- But, do all applications need all replicas to be consistent?

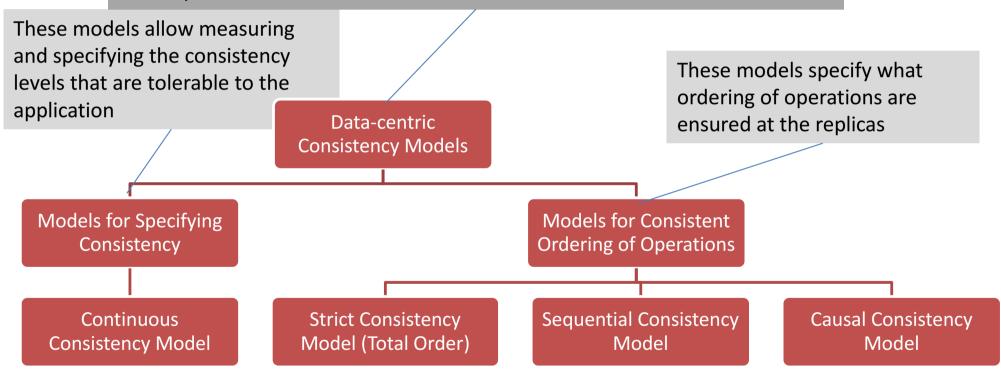


Data-Centric Consistency Model is too strict when

- One client process updates the data
- Other processes read the data, and are OK with reasonably stale data

#### Summary of Data-Centric Consistency Models

Data-centric consistency models describe how the replicated data is kept consistent across different data-stores, and what the process can expect from the data-store



Data-centric models are too strict when:

- most operations are read operations
- updates are generally triggered from one client process

#### Summary

- Replication is necessary for improving performance, scalability and availability, and for providing fault-tolerance
- Replicated data-stores should be designed after carefully evaluating the trade-off between tolerable data inconsistency and efficiency
- Consistency Models describe the contract between the data-store and process about what form of consistency to expect from the system
- Data-centric consistency models:
  - Continuous Consistency Models provide mechanisms to measure and specify inconsistencies
  - Consistency Models can be defined based on the type of ordering of operations that the replica guarantees the application

#### **Next Classes**

- Consistency Models
  - Client-Centric Consistency Models
- Replica Management
  - Replica management studies:
    - when, where and by whom replicas should be placed
    - which consistency model to use for keeping replicas consistent
- Consistency Protocols
  - We study selected implementations of consistency models

## Questions?

#### In part, inspired from / based on slides from

- Vinay Kolar
- A. S. Tanenbaum, M. v. Steen