



# Distributed Databases I

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## Lecture Objectives





An overview of the distributed database

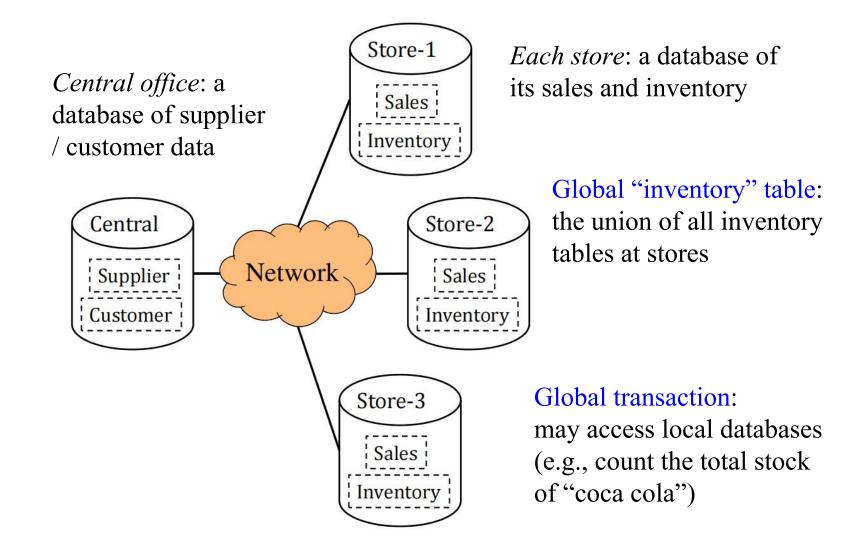
Data replication and fragmentation

The two-phase commit protocol



## Supermarket Chain







## What is a distributed database?



- \*A collection of data with
  - \* *Distribution*: data are spread over different sites (of a network)
  - \*Logical correlation: data belong to the same system; some properties tie them together

Support *global transactions*: accesses data at more than one site

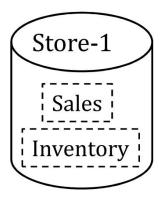


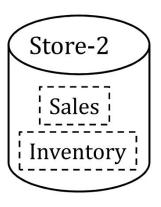
## Why distributed databases?

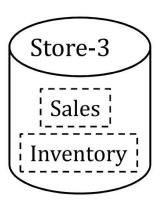


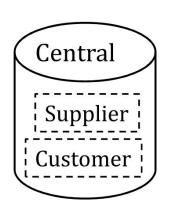
### Management perspectives

- \* Organizational requirement: each division / branch (of the organization) may want to maintain its own DB
- \* Interconnect existing DB's: when multiple DBs already exist in an organization & need for global applications
- \* *Incremental growth*: support smooth incremental growth (e.g., adding a branch) with small impact on existing DBs









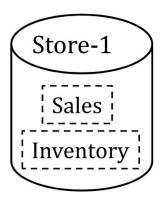


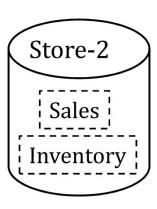
# Why distributed databases?

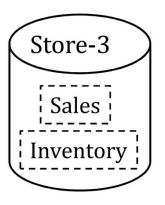


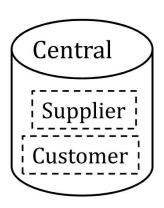
### Technical perspectives

- ❖ Reduced communication overhead: run sub-transactions at different sites ⇒ sites transfer intermediate results (small) rather than entire tables
- \* *Parallel executions*: can execute some transactions in parallel at the participating sites
- \* Reliability and availability: can still run transactions despite failures of some sites





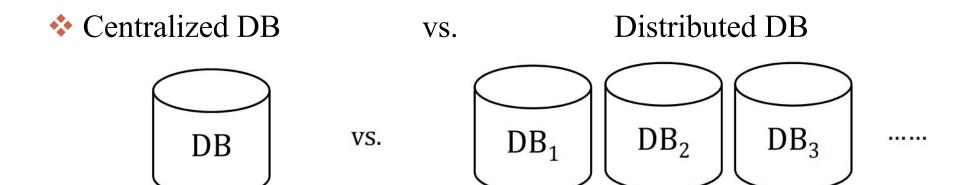






## Recovery Manager (RM)





- Revisit DBMS issues, how to:
  - Store data?
    [study today]
    - By fragmentation, replication
- Ensure ACID properties?
  - Recovery for A, D [study today]
    - By the two-phase commit protocol
  - ❖ Concurrency for I
    [next lecture]
- Process a query fast?
  [next lecture]



## Lecture Objectives



An overview of the distributed database



Data replication and fragmentation

The two-phase commit protocol



## Distributed Data Storage



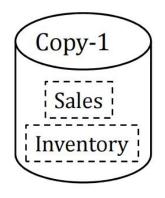
- \* Assume relational data model
- Fragmentation
  - ❖ Relation is partitioned into several fragments stored at different sites
- Replication
  - System stores multiple copies of data at different sites
  - For faster retrieval and fault tolerance
- Replication and fragmentation can be combined
  - Relation is partitioned into several fragments
  - System stores several identical copies of each such fragment

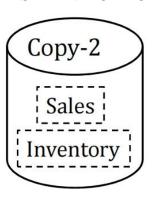


## Data Replication



- A relation (or fragment of a relation) is **replicated** if it is stored redundantly in two or more sites
- How to process queries?
  - Query either copy, OR
  - Query in parallel
- How to process updates?
  - Must update both copies?
    - \* We'll discuss more about this in the next lecture







# Data Replication (Cont.)



- Advantages of Replication
  - \* Availability: even when a site has failure, we can access copies at other sites
  - ❖ Parallelism: queries on r may be processed by several nodes in parallel
  - $\clubsuit$  Reduced data transfer: relation r is available locally at each site containing a replica of r



# Data Replication (Cont.)



- Disadvantages of Replication
  - \* Expensive **updates**: each replica of relation r must be updated
  - **Complex concurrency control**: updates to different replicas may cause inconsistent data
    - Need a concurrency control protocol for distributed DBs: E.g., choose one copy as **primary copy** and apply concurrency control operations on primary copy



## Data Fragmentation



\* Divide relation r into fragments  $r_1, r_2, ..., r_n$  which contain *sufficient* information to reconstruct relation r

Example: relation account with schema

Account = (branch\_name, customer\_number, account\_number, balance)

branch_name	customer_name	account_number	balance
Hillside Hillside Valleyview Valleyview Hillside Valleyview Valleyview	Lowman Camp Camp Kahn Kahn Kahn Green	A-305 A-226 A-177 A-402 A-155 A-408 A-639	500 336 205 10000 62 1123 750



## Partition by Rows



#### Assign each tuple of *r* to one fragment

branch_name	customer_name	account_number	balance
Hillside	Lowman	A-305	500
Hillside	Camp	A-226	336
Hillside	Kahn	A-155	62

$$account_l = \sigma_{branch\_name="Hillside"}(account)$$

branch_name	customer_name	account_number	balance
Valleyview	Camp	A-177	205
Valleyview	Kahn	A-402	10000
Valleyview	Kahn	A-408	1123
Valleyview	Green	A-639	750

$$account_2 = \sigma_{branch\_name="Valleyview"}(account)$$



# Horizontal Fragmentation



branch_name	customer_name	account_number	balance	Hillside
Hillside Hillside Hillside	Lowman Camp Kahn	A-305 A-226 A-155	500 336 62	Account
ассо	$unt_l = \sigma_{branch\_nan}$	ne="Hillside" (accour	$\overline{nt}$	

	200		
branch_name	customer_name	account_number	balance

Valleyview Camp A-177
Valleyview Kahn A-402
Valleyview Kahn A-408
Valleyview Green A-639

balance	Valleyview
205 10000 1123	Account

750

 $account_2 = \sigma_{branch\_name = "Valleyview"}(account)$ 

How to find out the sum of balance efficiently?



## Partition by Columns



branch_name	customer_name
Hillside	Lowman
Hillside	Camp
Valleyview	Camp
Valleyview	Kahn
Hillside	Kahn
Valleyview	Kahn
Valleyview	Green

 $deposit_1 = \Pi_{branch\_name, customer\_name}(account)$ 

account_number	balance
A-305	500
A-226	336
A-177	205
A-402	10000
A-155	62
A-408	1123
A-639	750

Account =
(branch\_name,
customer\_number,
account\_number,
balance)

Do we have *sufficient* information to reconstruct the original table?

$$deposit_2 = \Pi_{account\_number, balance}(account)$$



## Vertical Fragmentation



- ❖ Vertical fragmentation: split the schema for relation *r* into several smaller schemas
  - All schemas must contain a common candidate key (or superkey) to ensure lossless join property
  - May need to add a special attribute (tuple-id) to each schema as a candidate key

 $deposit_{l} = \Pi_{branch\_name, \ customer\_name, \ tuple\_id}(account)$ 

tuple\_id branch\_name | customer\_name Lowman Hillside Camp Hillside Valleyview Camp Kahn Valleyview Kahn Hillside Kahn Valleyview Green Valleyview

 $deposit_2 =$ 

 $\Pi_{account\_number, balance, tuple\_id}(account)$ 

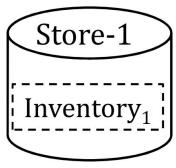
account_ number	balance	tuple_id
A-305	500	1
A-226	336	2
A-177	205	3
A-402	10000	4
A-155	62	5
A-408	1123	6
A-639	750	7

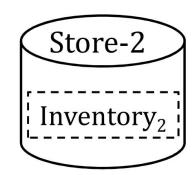


## Another Example

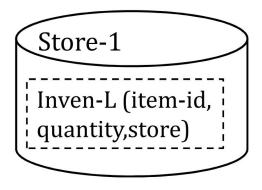


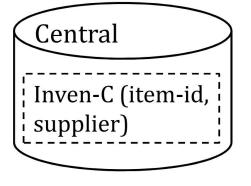
- Example: schema of an inventory relation inventory(item-id, quantity, supplier, store)
- Horizontal Fragmentation





Vertical Fragmentation







## How to Improve Query Performance?

- Store together the tuples that are frequently accessed together
  - E.g., likely to access tuples at the branch "Hillside" together

branch_name	customer_name	account_number	balance	
Hillside	Lowman	A-305	500	
Hillside	Camp	A-226	336	
Hillside	Kahn	A-155	62	

- Store together the attributes that are frequently accessed together
  - E.g., likely to access the attributes account number and balance together

account_ number	balance	tuple_id
A-305 A-226 A-177	500 336 205	1 2 3 



## How to Improve Query Performance?

- Different transactions may access data with different access patterns
- Difficult to decide the fragmentation manually (by DB administrator)
- \*Any automatic method for this problem?
  - First, extract access patterns from transactions
  - \* Then, design the fragmentation accordingly



# Case study



### Use attribute usage to derive a good vertical fragmentation

Attribute usage matrix											Туре	Number of accesses per time period
Attributes 1 2 3 4 5 6 7 8 9 10						-	4 (A) (A) (A) (A) (A) (A)					
T1	1	0	0	0	1	0	1	0	0	0	R	Acc 1 = 25
T2	Ô	ĭ	ĭ	ŏ	ô	ŏ	ō	ĭ	ĩ	ŏ		Acc 2 = 50
T3	ŏ	ô	ō	ĭ	ŏ	ĩ	Õ	Ō	0	1	R R	Acc 3 = 25
T4	ŏ	1	Õ	Ō	Õ	0	1	1	0	0	R	Acc 4 = 35
T5	ĩ	ī	1	0	1	0	1	1	1	0	U	Acc 5 = 25
Т6	1	0	0	0	1	0	0	0	0	0	U	Acc 6 = 25
T7	ō	ŏ	1	0	0	0	0	0	1	0	U	Acc 7 = 25
Т8	0	Õ	1	1	0	1	0	0	1	1	U	Acc 8 = 15

	Fig. 1		Attribute usage matrix						
1	2	3	4	5	6	7	8	9	10
75	25	25	0	75	0	50	25	25	0
25	110	75	0	25	0	60			0
		115	15	25	15	25	75	115	15
				0	40	0	0	15	40
75						50	25	25	0
					40			15	40
		25							0
25				25	Ō				0
25									15
0	ő	15	40	ő	40	-0	0	15	40
	1 75 25 25 0 75 0 50 25 25 0	1 2  75 25 25 110 25 75 0 0 75 25 0 0 50 60 25 110 25 75	1 2 3  75 25 25 25 110 75 25 75 115 0 0 15 75 25 25 0 0 15 50 60 25 25 110 75 25 75 115	1 2 3 4  75 25 25 0  25 110 75 0  25 75 115 15  0 0 15 40  75 25 25 0  0 0 15 40  50 60 25 0  25 110 75 0  25 75 115 15	1 2 3 4 5  75 25 25 0 75  25 110 75 0 25  25 75 115 15 25  0 0 15 40 0  75 25 25 0 75  0 0 15 40 0  50 60 25 0 50  25 110 75 0 25  25 75 115 15 25	1 2 3 4 5 6  75 25 25 0 75 0 25 110 75 0 25 0 25 75 115 15 25 15 0 0 15 40 0 40 75 25 25 0 75 0 0 0 15 40 0 40 50 60 25 0 50 0 25 110 75 0 25 0 25 75 115 15 25 15	1 2 3 4 5 6 7  75 25 25 0 75 0 50  25 110 75 0 25 0 60  25 75 115 15 25 15 25  0 0 15 40 0 40 0  75 25 25 0 75 0 50  0 0 15 40 0 40 0  50 60 25 0 50 0 85  25 110 75 0 25 0 60  25 75 115 15 25 15 25	1     2     3     4     5     6     7     8       75     25     25     0     75     0     50     25       25     110     75     0     25     0     60     110       25     75     115     15     25     15     25     75       0     0     15     40     0     40     0     0       75     25     25     0     75     0     50     25       0     0     15     40     0     40     0     0     0       50     60     25     0     50     0     85     60       25     110     75     0     25     0     60     110       25     75     115     15     25     15     25     75	1     2     3     4     5     6     7     8     9       75     25     25     0     75     0     50     25     25       25     110     75     0     25     0     60     110     75       25     75     115     15     25     15     25     75     115       0     0     15     40     0     40     0     0     15       75     25     25     0     75     0     50     25     25       0     0     15     40     0     40     0     0     15       50     60     25     0     50     0     85     60     25       25     110     75     0     25     0     60     110     75       25     75     115     15     25     15     25     75     115

Example adapted from the paper: "Vertical Partionining for Database Design: A Graphical Algorithm". SIGMOD 1989.

Fig.2 Attribute affinity (AA) matrix



## Advantages of Fragmentation



#### Horizontal:

Allows parallel processing (on fragments with different tuples)

#### Vertical:

- Allows parallel processing (on fragments with different attributes)
- Tuple-id attribute allows efficient joining of vertical fragments
- Vertical and horizontal fragmentation can be mixed
  - Fragments may be further fragmented to an arbitrary depth





An overview of the distributed database

Data replication and fragmentation



The two-phase commit protocol

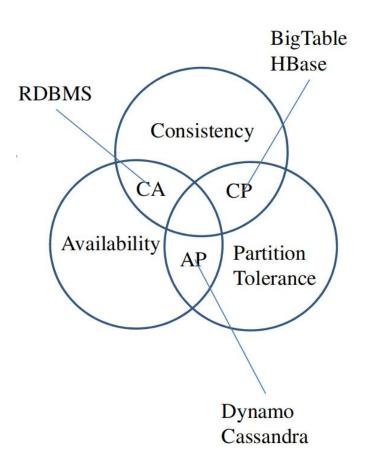
This protocol aims to achieve the properties 'A' and 'D' Don't confuse it with the 2PL protocol (for property 'I')



## **CAP Theorem**



- Hard to achieve all three properties together
  - C: Consistency
    - All users can access the up-to-date copy of the data
  - ❖ A: Availability
    - The system can work properly even with node failures
  - P: Partitioning tolerance
    - The system can work properly even with network/message failures

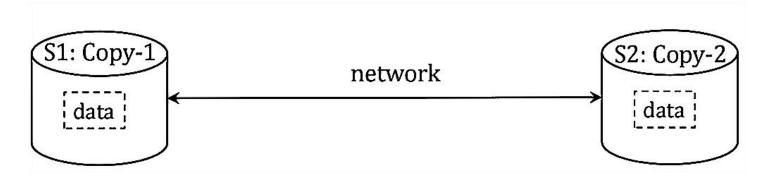




### **CAP Theorem**



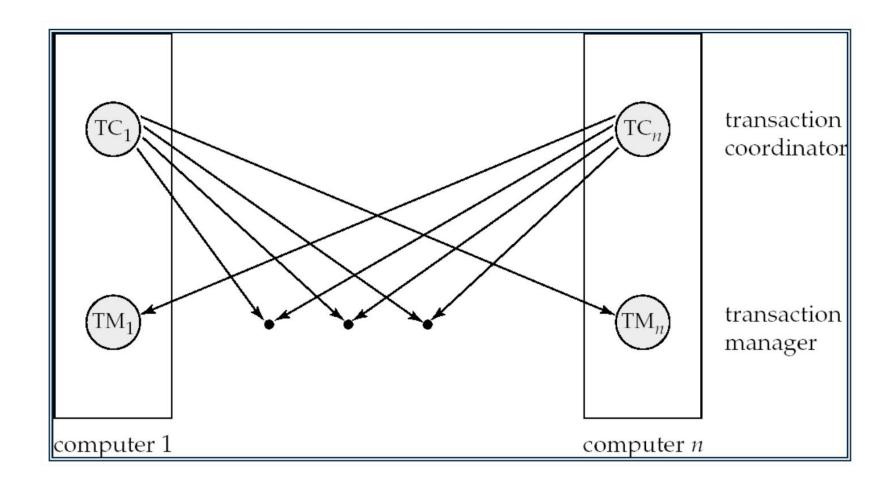
- \* Example: consider replicated data at two sites
  - \* Consistency: When we update data in S1, need to replicate this update in S2
  - Availability: When a site is running, we can query/update data from it (via network)
  - ❖ Partition tolerance: If the network fails, we can still query/update the local site
- When the network fails
  - ❖ Allow both sites available → data may not be up-to-date
  - ❖ Keep consistency → cannot make both sites available





### Transaction System Architecture







## Distributed Transactions



- Transaction may access data at several sites
- \* Each site has a local transaction manager to:
  - Maintain a log for recovery purposes
  - ❖ Participate in the concurrent execution of transactions at that site
- \* Each site has a transaction coordinator to:
  - Start the execution of **global transactions** that originate at the site
  - Distribute sub-transactions to appropriate sites
  - ❖ Coordinate the termination of each transaction that originates at the site, which may result in: commit the transaction at all sites / abort ..... at all sites



## System Failure Modes



- \* Failures unique to distributed systems:
  - Message loss
    - Handled by network protocols (e.g., TCP-IP)
- Communication link failure
  - Handled by network protocols, by routing messages via alternative links
- Site failure
- Network partition
  - ❖ It happens when the network is split into subsystems that lack connection
    - Note: a subsystem may consist of a single node



## **Commit Protocols**



- \* Commit protocols ensure **atomicity** across sites
  - \* a transaction (which executes at multiple sites) must either be committed at all sites, OR aborted at all sites.

**not acceptable** to have a transaction committed at one site and aborted at another

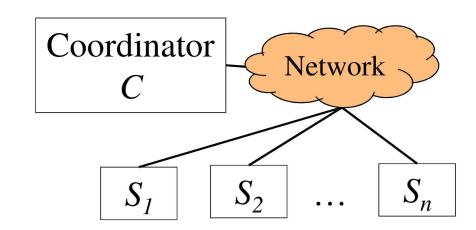
- \* The two-phase commit (2PC) protocol is widely used
  - It ensures atomicity property despite network / site failures
  - Suppose that each site uses recovery protocol to ensure subtransaction atomicity



# Two-phase commit: Notations



❖ *T*: a global transaction



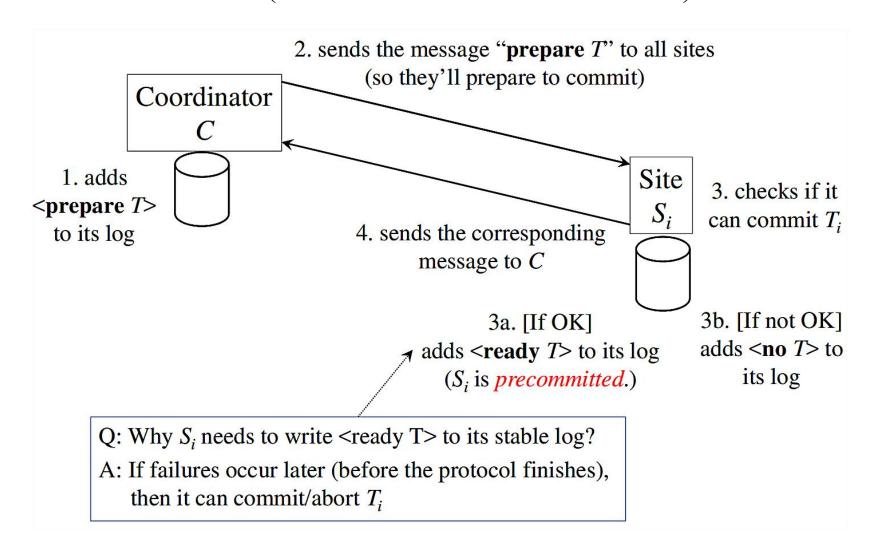
- $T_1$ ,  $T_2$ , ...,  $T_n$ : sub-transactions of T
  - $\bullet$  Ti will be executed at participant sites  $S_i$
- $\bullet$  C: the coordinator of T
  - ❖ This site monitors the sub-transactions and decides whether *T* should commit or not



## Phase I: Obtain a Decision



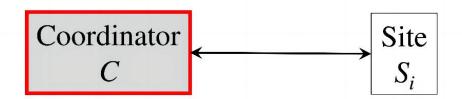
#### (when all sub-transactions finish)





# Phase II: Record the Decision





#### Cases for the coordinator *C*

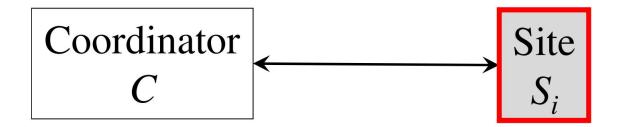
#### Actions for C

(1): received a " <b>ready</b> <i>T</i> " from all sites	<u>decides to commit T</u>				
	• adds <b><commit< b=""> <i>T</i>&gt; to its log</commit<></b>				
	• sends the message " <b>commit</b> <i>T</i> " to all sites				
(2): received an " <b>abort</b> <i>T</i> " from some sites	<u>decides to abort T</u>				
(3): not heard from some site $S_i$	• adds < <b>abort</b> <i>T</i> > to its log				
after a certain timeout period	• sends the message " <b>abort</b> <i>T</i> " to all sites				
[ $C$ assumes $S_i$ is down]					



## Phase II: Record the Decision





### For each participant $S_i$

- Received "**commit** *T* ":
  - $\diamond$  it adds <**commit** T> to its log and commits  $T_i$  locally
- Received "abort T":
  - $\diamond$  it adds <**abort** T> to its log and aborts  $T_i$  locally

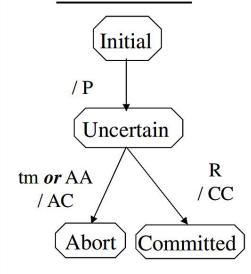


## State Diagram

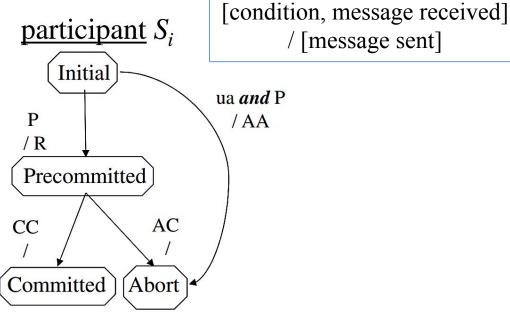


Format

#### coordinator C



### participant $S_i$



#### **Conditions:**

- ua = unilateral abort
- tm = timeout

#### Messages:

- P = "prepare T"
- R = "ready T"
- AA = "abort T" answer
- AC = "abort T" command
- CC = "commit T" comman





- No failure → 2PC ensures that either all sub-transactions commit or all of them abort
- $\Rightarrow$  Site / network failure  $\Rightarrow$  need to make sure that the site's recovery is consistent with the global decision for T
- \* Types of failure:
  - ❖ (1) a site failure
  - \* (2) a coordinator failure
  - ❖ (3) network partition failure



## (1) Site Failure

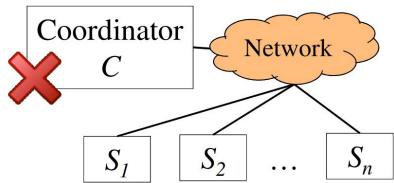


- \* When a site  $S_i$  recovers after a failure, it checks its log for entries for T. If it finds:
  - $\diamond$  < commit T>: T has committed, redo  $T_i$
  - $\diamond$  <abord T>: T has been aborted, undo  $T_i$
  - $\bullet$  <**no** T>:  $S_i$  has not received the decision from C yet, but the decision must be to abort T, so **undo**  $T_i$
  - $extrm{ < ready } T >: S_i extrm{ does not know the decision. It asks } C extrm{ to determine whether } T extrm{ has committed or aborted.}$
  - None of the above: C could not have decided to commit T. It would be safe to abort  $T_i$  (so **undo**  $T_i$ )



## (2) Coordinator Failure





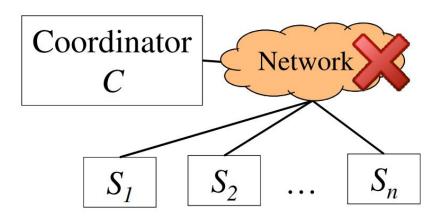
- ❖ If the coordinator fails and all the "living" participants are precommitted (<ready T> logged), no one knows the final decision until the coordinator recovers.
  - All "living" participants are blocked
  - \* This is the *blocking problem* of 2PC
- \* The blocking problem of 2PC is undesirable
  - \* sub-transactions are holding locks on data items
  - \* cause severe blocking to other transactions in the system



## (3) Network Partition Failure



- When a network partition occurs, a participant cannot communicate with the coordinator
  - ❖ In that case, the separated participant assumes the coordinator fails, and
  - \* The coordinator assumes that the separated participant fails
- So all sites execute the same 2PC protocol







- An overview of the distributed database
- Data replication and fragmentation
- The two-phase commit protocol

### Readings after the class

Chapters 3 and 12.4 in the book Ozsu, and Valuriez. Principles of Distributed Database System, 3rd Ed, Springer, 2011 (free online)





# 谢谢!

