

# ByShard: Sharding in Byzantine Environment

By Jelle Hellings and Mohammad Sadoghi

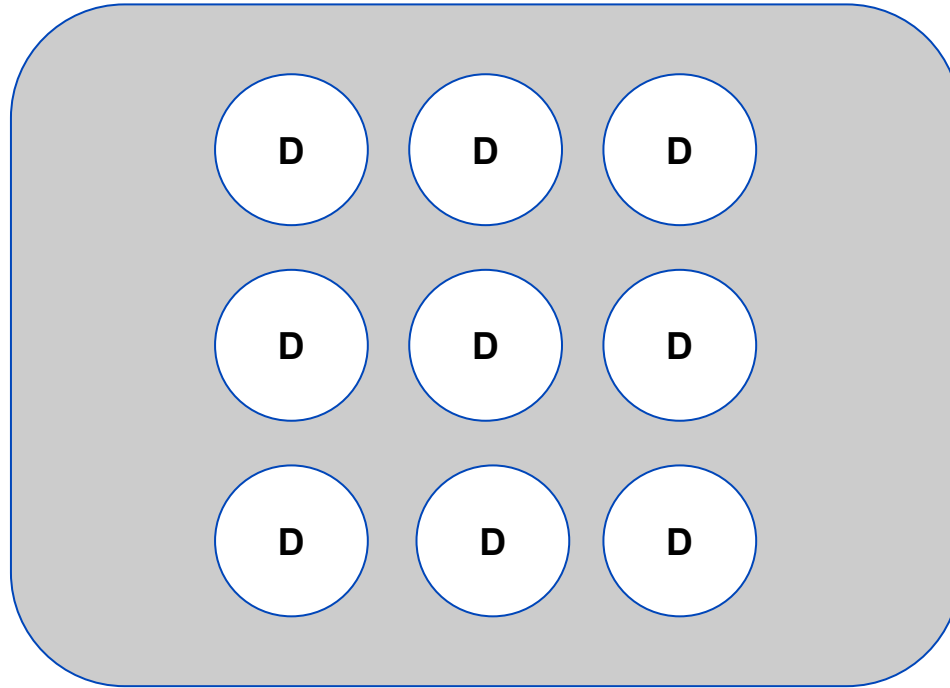
**Presenters: Manjunath Jakaraddi, Rohith Raj Srinivasan, Abrar Syed & Mohammed Asim**

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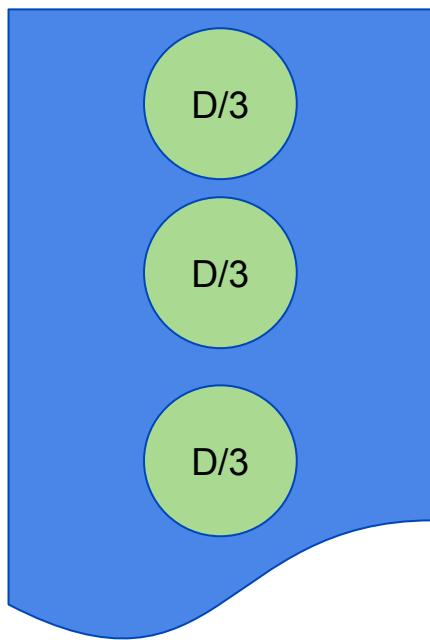
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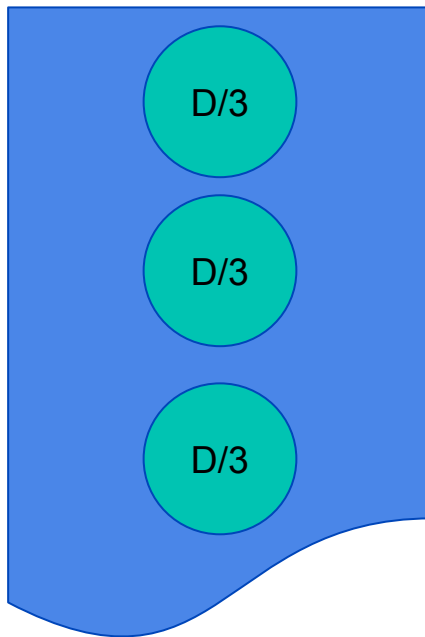
# Typical Blockchain Inspired System



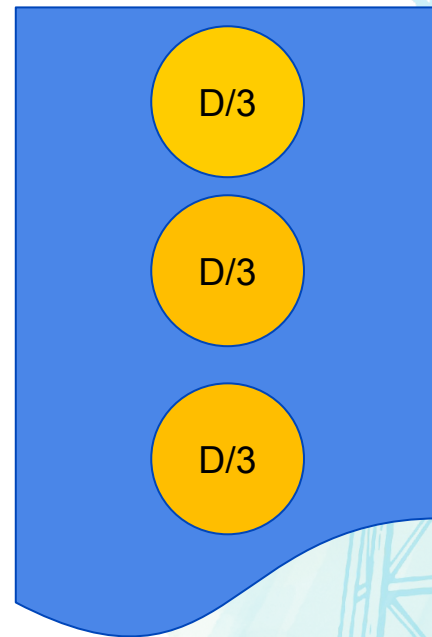
## Data Distribution after Sharding



S1

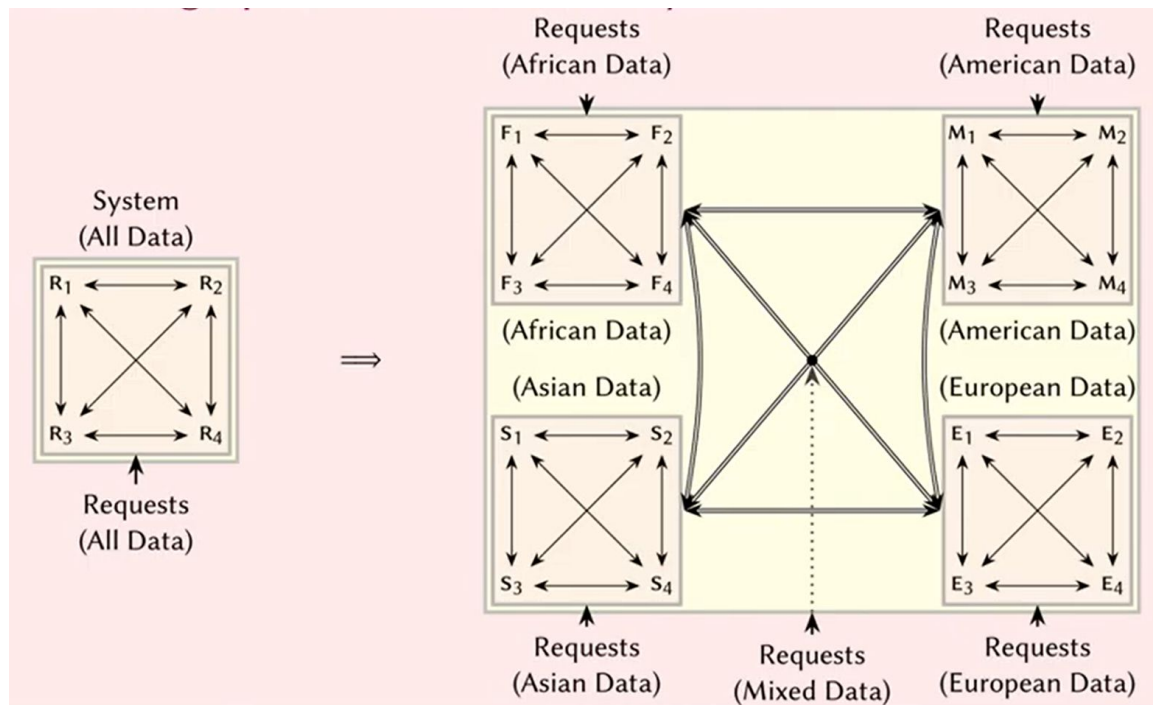


S2

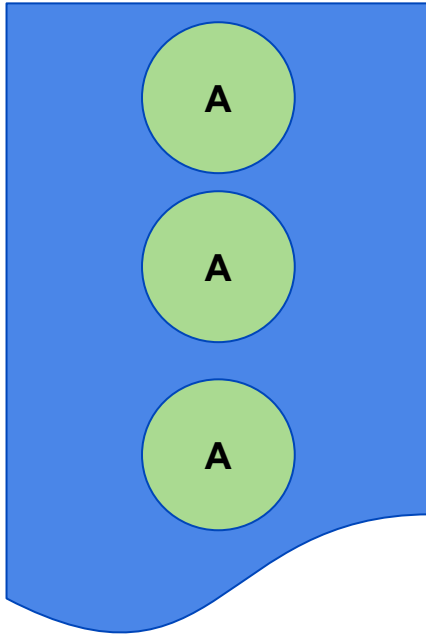


S3

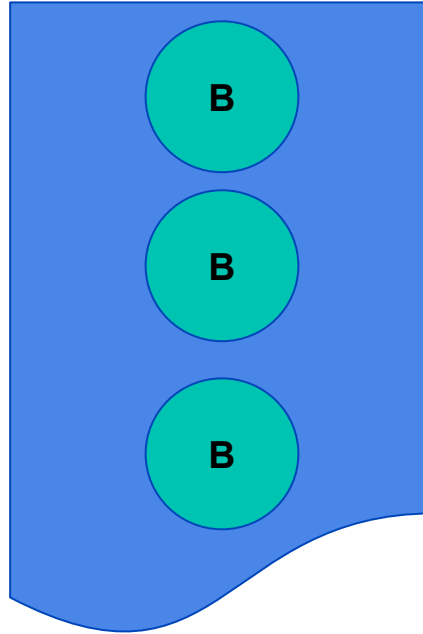
# Sharding



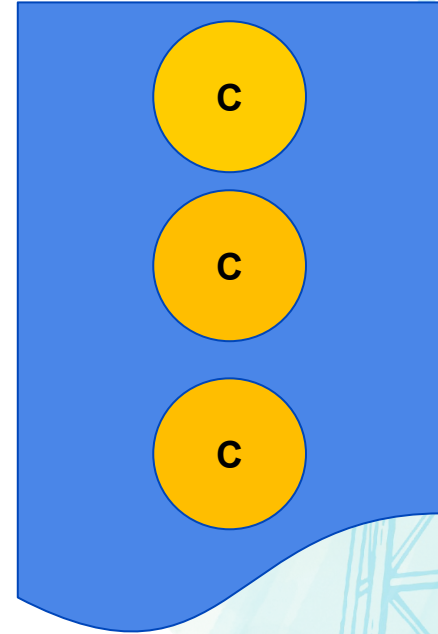
# Merits of Sharding



S1

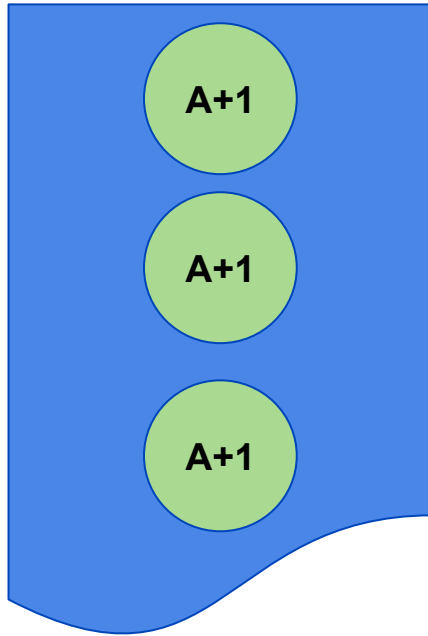


S2

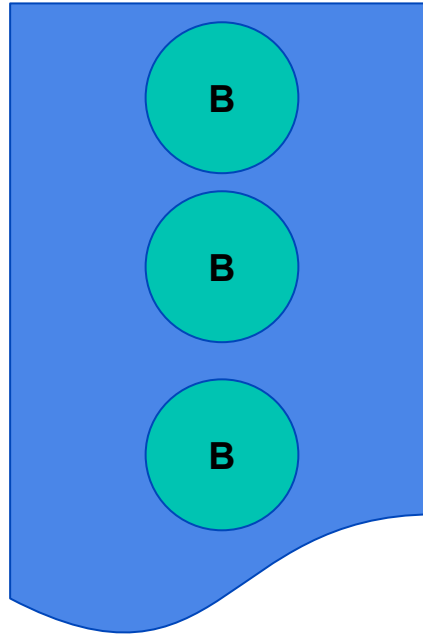


S3

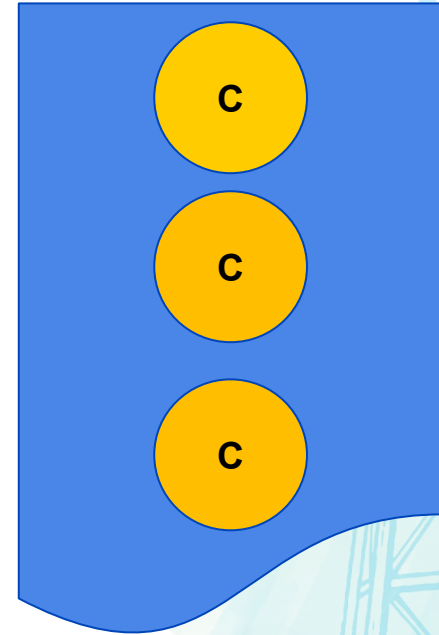
# Merits of Sharding



S1



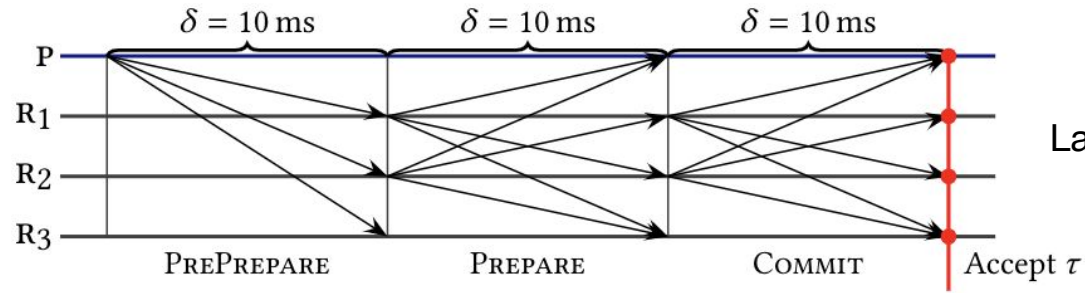
S2



S3



# Latency in PBFT



Latency =  $3\delta = 30 \text{ ms}$



# Cluster Sending Protocol

## Definition

A cluster-sending protocol provides reliable communication between resilient clusters  $S1$  and  $S2$ . To enable  $S1$  to send a value  $v$  to  $S2$ , cluster sending protocols provide the following guarantees:

- (1)  $S1$  is able to send  $v$  to  $S2$  only if there is agreement on sending  $v$  among the non-faulty replicas in  $S1$ ;
- (2) all non-faulty replicas in  $S2$  will receive the value  $v$ ; and
- (3) all non-faulty replicas in  $S1$  obtain confirmation of receipt.

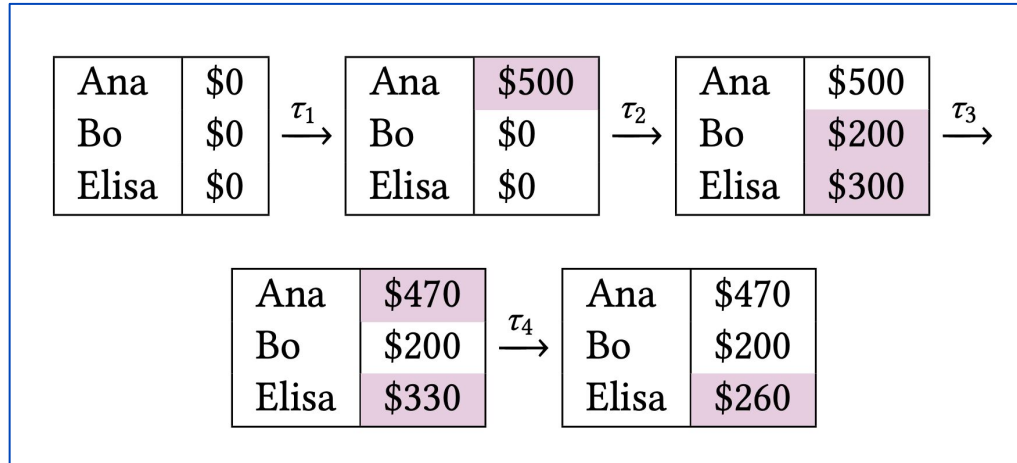
# Banking Example

- Consider a banking system transactions
  - $\tau_1$  = “add \$500 to **Ana**”
  - $\tau_2$  = “add \$200 to **Bo** and \$300 to **Elisa**”
  - $\tau_3$  = “move \$30 from **Ana** to **Elisa**”
  - $\tau_4$  = “remove \$70 from **Elisa**”

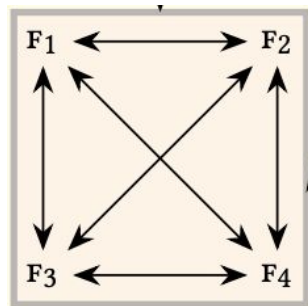
Cite



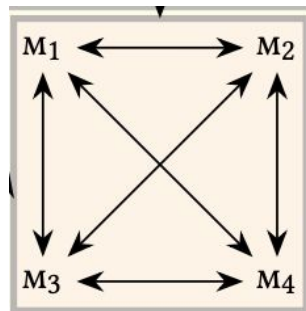
# Banking Example



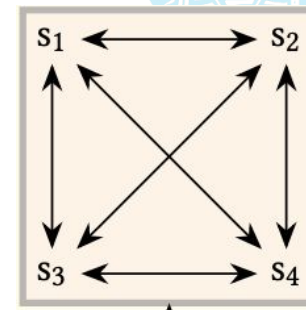
# Multi shard transaction execution in a Byzantine Environment



Shard A



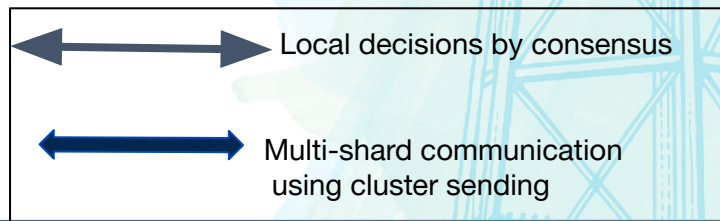
Shard C



Shard B

$$n_s > 3f_s$$

within each shard



# OEM Model

We process multi-shard transaction using the **orchestrate-execute model (OEM)**.

OEM model's components:

- **Orchestration:** replicates transactions among all replicas in all involved shards and reach an atomic decision.
- **Execution:** executes operations of a shard step.



## Multishard Transaction Example

Each of the accounts are in different shards:

**Ana**  $\rightarrow$  **Shard A** ( $S_a$ )

**Bo**  $\rightarrow$  **Shard B** ( $S_b$ )

**Elisa**  $\rightarrow$  **Shard E** ( $S_e$ )

$\tau$  = “if **Ana** has \$500 and **Bo** has \$200, then  
move \$400 from **Ana** to **Elisa**; move \$100 from **Bo** to **Elisa**”

## Multishard Transaction

$\sigma_1 \rightarrow$  “if Ana has \$500, then remove \$400 from Ana;  $\Rightarrow S_b(\sigma_2)$

else  $\Rightarrow$  send failure to  $c$ ”

$\sigma_2 \rightarrow$  “if Bo has \$200, then remove \$100 from Bo;  $\Rightarrow S_e(\sigma_3)$

else  $\Rightarrow S_a(\sigma_4)$ ”

$\sigma_3 \rightarrow$  “add \$500 to Elisa and  $\Rightarrow$  send success to  $c$ ”

$\sigma_4 \rightarrow$  “add \$400 to Ana and  $\Rightarrow$  send failure to  $c$ ”

Where  $\sigma$  is the shard step and  $\Rightarrow$  is the cluster sending step



# Types of Shard Steps

- **Vote Step (  $\sigma_1$  and  $\sigma_2$  )**
  - verifies constraints and vote to commit or not.
- **Commit Step (  $\sigma_3$  )**
  - performs operation to finalize the transaction  $\tau$
- **Abort Step (  $\sigma_4$  )**
  - Abort the operation and rollback all the changes

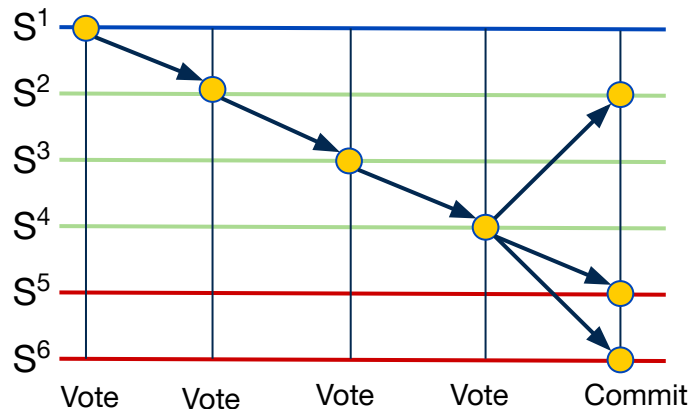


# Types of Orchestration

1. Linear orchestration
2. Centralized orchestration
3. Distributed orchestration



# Linear orchestration



● = Consensus  
→ = Cluster-sending step

$S^1, S^2, S^3, S^4 \rightarrow$  Vote-steps  
 $S^2, S^5, S^6 \rightarrow$  Commit-steps  
 $S^3 \rightarrow$  Abort-step

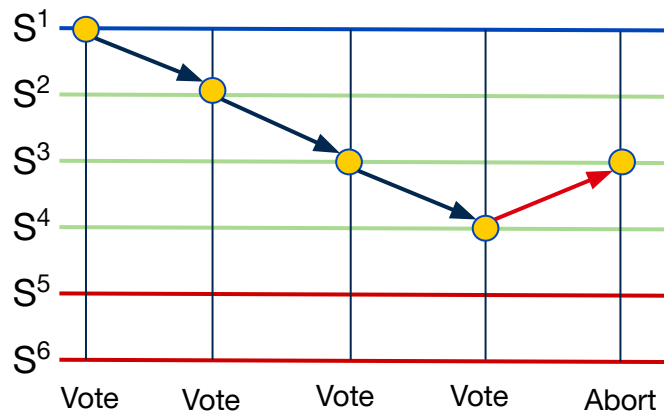
# of steps:

Consecutive consensus steps =  $n_v + 1$

Consensus steps =  $n_v + n_c$

Cluster-sending steps =  $n_v + n_c - 1$

# Linear orchestration



● = Consensus  
→ = Cluster-sending step

$S^1, S^2, S^3, S^4$  → Vote-steps  
 $S^2, S^5, S^6$  → Commit-steps  
 $S^3$  → Abort-step

# of steps:

Consecutive consensus steps =  $n_v + 1$

Consensus steps =  $n_v + n_a$

Cluster-sending steps =  $n_v + n_a - 1$

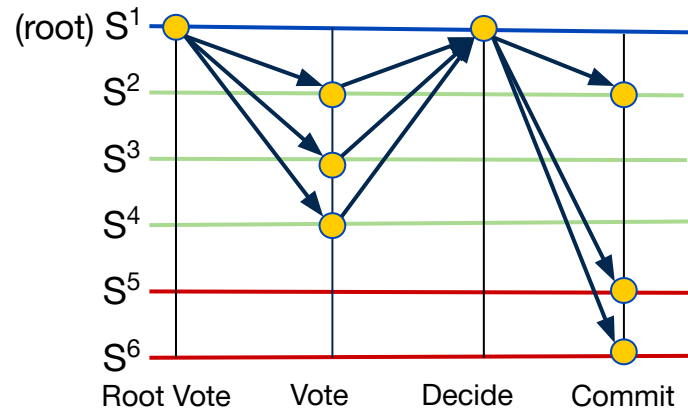
**Merits:**

1. Simplicity
2. Abort-fast ability

**Limitations:**

# Consecutive consensus steps  
(worst-case) =  $|shards(\tau)| + 1$

# Centralized orchestration



● = Consensus  
→ = Cluster-sending step

$S^1, S^2, S^3, S^4$  → Vote-steps  
 $S^2, S^5, S^6$  → Commit-steps  
 $S^3$  → Abort-step

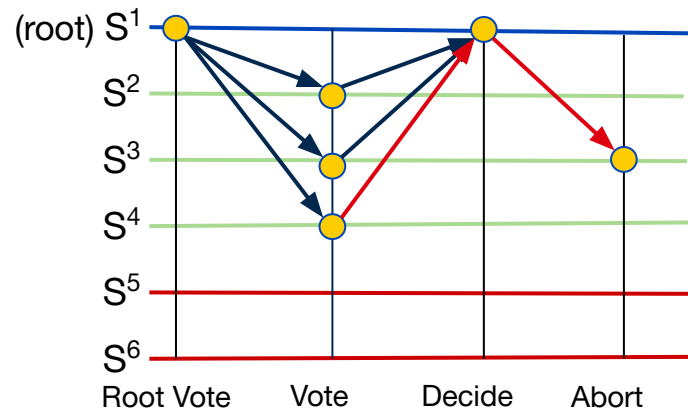
# of steps:

Consecutive consensus steps = 4

Consensus steps =  $1 + (n_v - 1) + 1 + n_c = n_v + n_c + 1$

Cluster-sending steps =  $(n_v - 1) + (n_v - 1) + n_c = 2(n_v - 1) + n_c$

# Centralized orchestration



= Consensus  
 = Cluster-sending step

$S^1, S^2, S^3, S^4$  → Vote-steps  
 $S^2, S^5, S^6$  → Commit-steps  
 $S^3$  → Abort-step

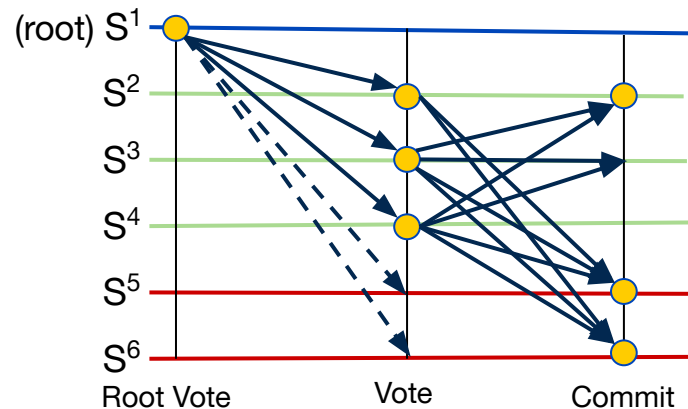
# of steps:

Consecutive consensus steps = 4

Consensus steps =  $1 + (n_v - 1) + 1 + n_a = n_v + n_a + 1$

Cluster-sending steps =  $(n_v - 1) + (n_v - 1) + n_a = 2(n_v - 1) + n_a$

# Distributed orchestration



- = Consensus
- = Cluster-sending step
- - → = Wait step

$S^1, S^2, S^3, S^4 \rightarrow$  Vote-steps  
 $S^2, S^5, S^6 \rightarrow$  Commit-steps  
 $S^3 \rightarrow$  Abort-step

# of steps:

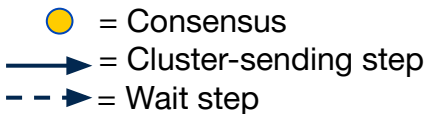
Consecutive consensus steps = 3

Consensus steps =  $1 + (n_v - 1) + n_c = n_v + n_c$

Cluster-sending steps =  $(n_v - 1) + (n_a + n_c) + (n_v - 1)(n_a + n_c)$   
 $= n_v(n_a + n_c) + (n_v - 1)$



## Distributed orchestration



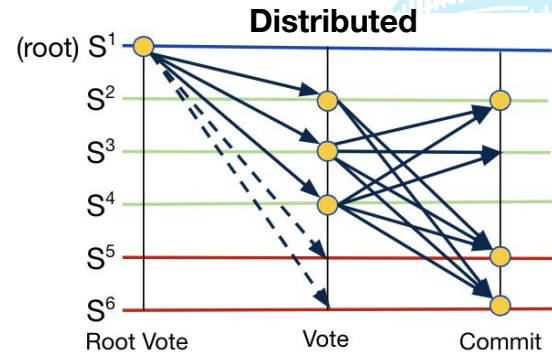
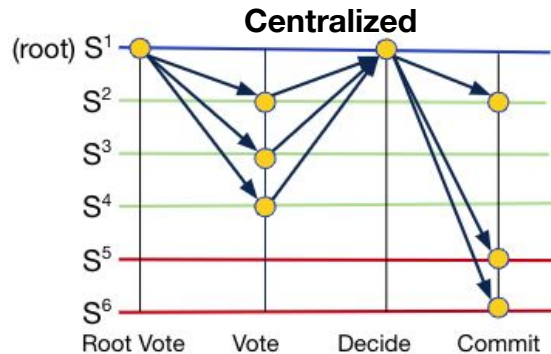
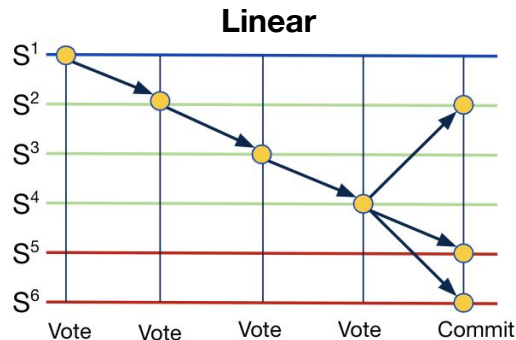
$\mathbf{S}^1, \mathbf{S}^2, \mathbf{S}^3, \mathbf{S}^4 \rightarrow$  Vote-steps  
 $\mathbf{S}^2, \mathbf{S}^5, \mathbf{S}^6 \rightarrow$  Commit-steps  
 $\mathbf{S}^3 \rightarrow$  Abort-step

# of steps:

Consecutive consensus steps = 3

Consensus steps =  $1 + (n_v - 1) + n_a = \mathbf{n_v + n_a}$   
 Cluster-sending steps =  $(n_v - 1) + (n_a + n_c) + (n_v - 1)(n_a + n_c)$   
 =  $\mathbf{n_v(n_a + n_c) + (n_v - 1)}$

# Summary of Orchestration



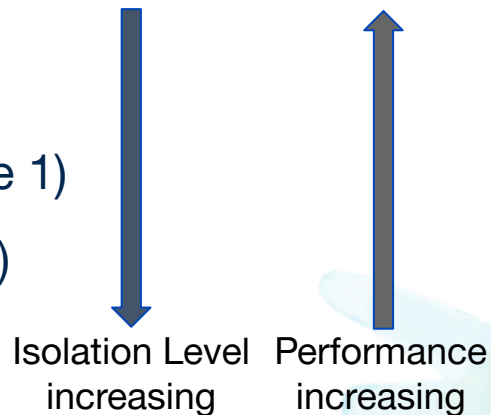
	Linear	Centralized	Distributed
Consecutive consensus steps	$n_v + 1$	4	3
Consensus steps	$n_v + n_c$	$n_v + n_c + 1$	$n_v + n_c$
Cluster-sending steps	$n_v + n_c - 1$	$2(n_v - 1) + n_c$	$n_v(n_a + n_c) + (n_v - 1)$

## Execute

- Single Shard steps are **ordered** via consensus and executed **sequentially** at shard level.
- **Multi-shard transactions** can have several shard steps.
- Transactions can **interleave** while executing.
- Isolation necessary in some form of **concurrency control**.

# Degrees of Isolation

- **Isolation free execution** (Degree 0)
- **Read uncommitted execution** (Degree 1)
- **Read committed execution** (Degree 2)
- **Serializable execution** (Degree 3)



**NOTE:** Stronger Isolation levels prevent more anomalies at the cost of performance.

## Constraint and Modification model

We assume that each transaction  $\tau$  is a pair  $(C, M)$  in which  $C$  is a set of constraints of the form

$\text{CON}(X, y) = \text{“the balance of } X \text{ is at least } y\text{”}$

and  $M$  a set of modifications of the form

$\text{MOD}(X, y) = \text{“add } y \text{ to the balance of } X\text{”}$

The system commits to  $\tau$  only if all constraints in  $C$  hold, in which case all modifications in  $M$  are applied to the system

## Example

Considering the sharded banking example from before. And assuming the system does **not allow negative** accounts balances and consider transactions.

$\tau_1 = \text{Con}(A, 100), \text{Con}(B, 700), \text{Mod}(A, 400), \text{Mod}(B, -400);$

Transfer 400 from B to A if A has 100 and B has 700

$\tau_2 = \text{Con}(A, 500), \text{Mod}(A, -300), \text{Mod}(E, 300);$

Transfer 300 from A to E if A has 500



## Example

Considering the sharded banking example from before. And assuming the system does **not allow negative** accounts balances and consider transactions.

$\tau_1 = \text{Con}(A, 100), \text{Con}(B, 700), \text{Mod}(A, 400), \text{Mod}(B, -400);$

Transfer 400 from B to A if A has 100 and B has 700

$\tau_2 = \text{Con}(A, 500), \text{Mod}(A, -300), \text{Mod}(E, 300);$

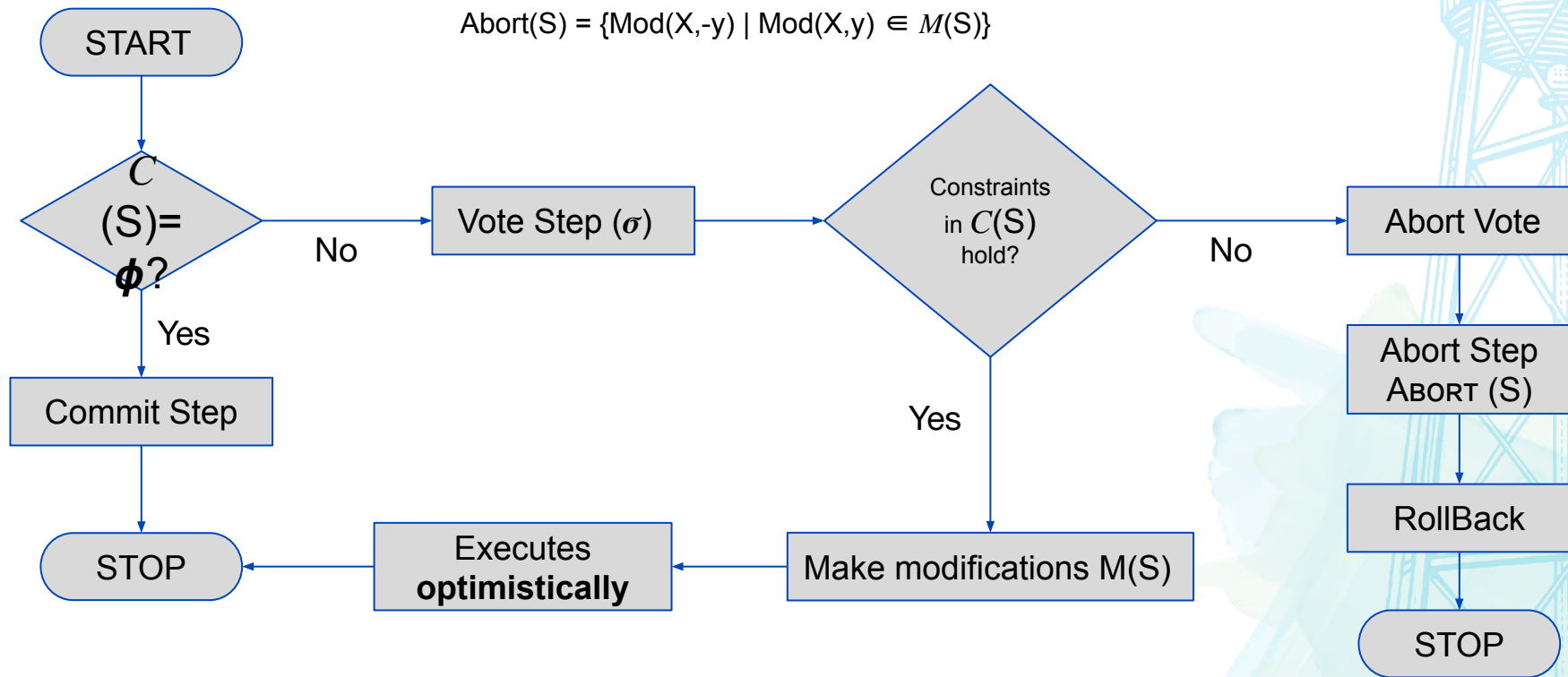
Transfer 300 from A to E if A has 500



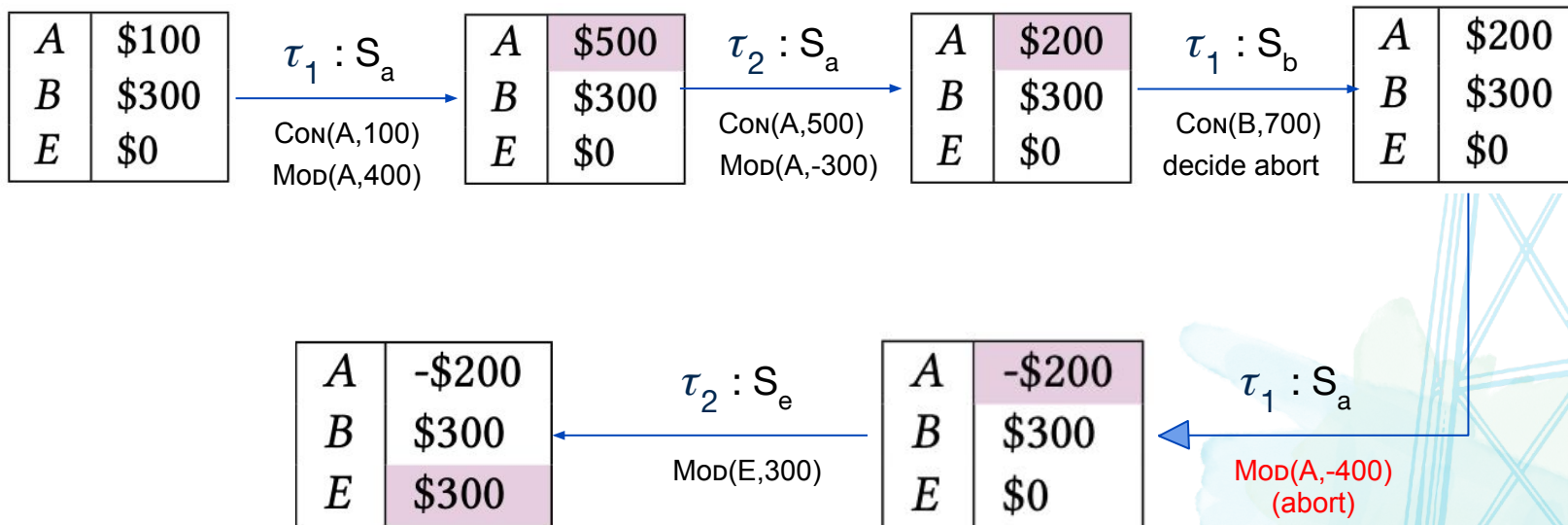
# Isolation free direct execution

Let,  $\tau = (C, M)$   
 $S \in \text{shards}(\tau)$

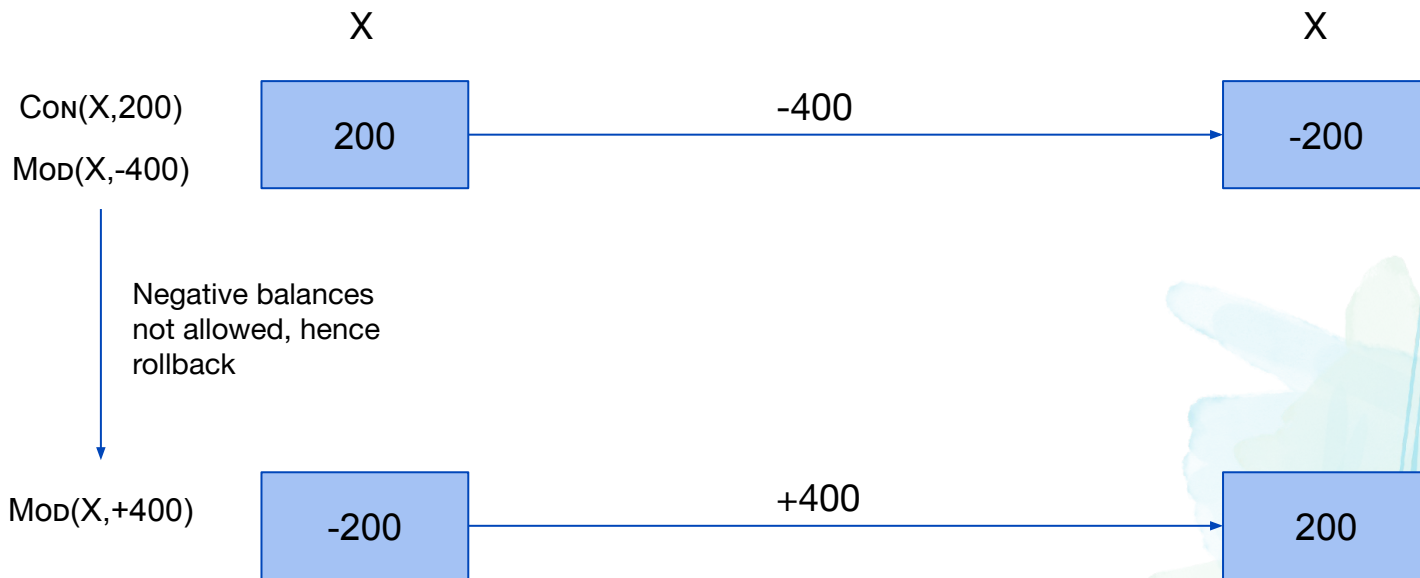
$\text{Abort}(S) = \{\text{Mod}(X, -y) \mid \text{Mod}(X, y) \in M(S)\}$



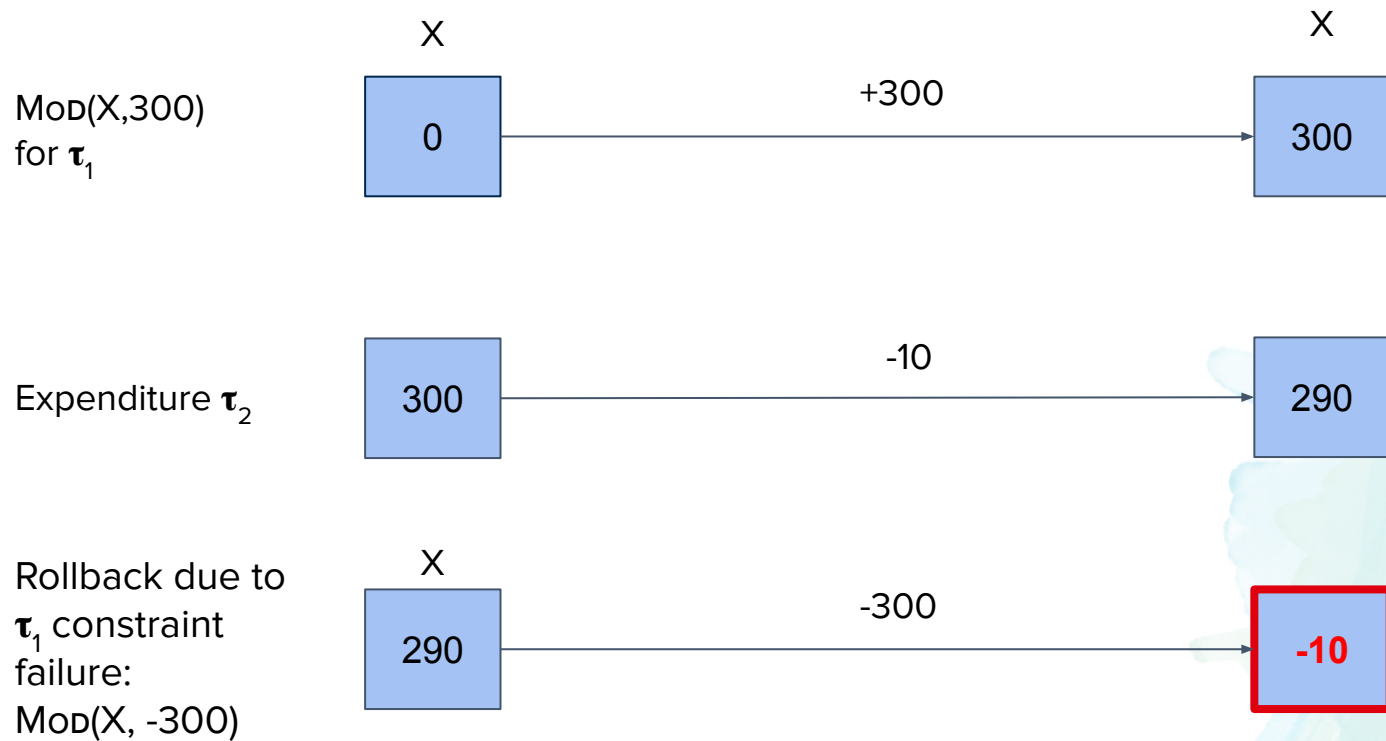
# Example



# Safe Transaction



# Unsafe Transaction



# Safe Isolation Free Execution

- **Safe modifications** are executed as part of **Vote step**
- **Unsafe modifications** are executed as part of **Commit Step**



# Lock Based Execution

- if  $\tau'$  where,  $\tau' \neq \tau$ , holds a write lock on  $D$ , then  $\tau$  cannot obtain any locks on  $D$ .
- if  $\tau'$  where,  $\tau' \neq \tau$ , holds a read lock on  $D$ , then  $\tau$  cannot obtain a write lock on  $D$ , but can obtain a read lock on  $D$ .
- **Several transactions can hold a read lock on  $D$  at the same time, but write locks are exclusive.**

## Lock Based Execution

- Let  $\tau$  = “if Ana has \$500 and Bo has \$300 then move \$200 from Ana to Ben”.
- Assume shards are ordered as  $S_a, \dots, S_z$ , accounts are ordered on account holder name.
- Write lock on the account of Ana in  $S_a$ , write lock on the account of Ben in  $S_b$ , read lock on the account of Bo in  $S_b$ .

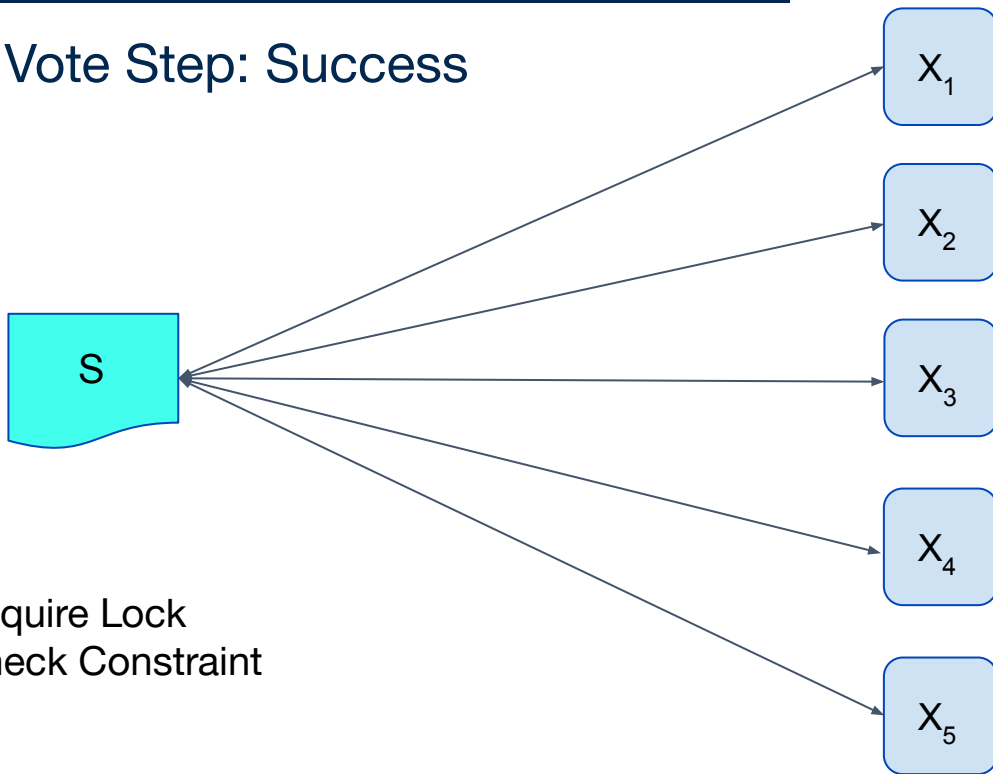


# Lock Based Execution

- Let  $\tau = (C, M)$  be a transaction, let  $S \in \text{shards}(\tau)$ , and  
 $\text{Accounts}(S) = \{X \mid \text{CON}(X, y) \in C(S) \vee \text{MOD}(X, y) \in M(S)\}$
- Steps involved:
  - Vote-step
  - Commit Step
  - Release step

## Lock Based Execution

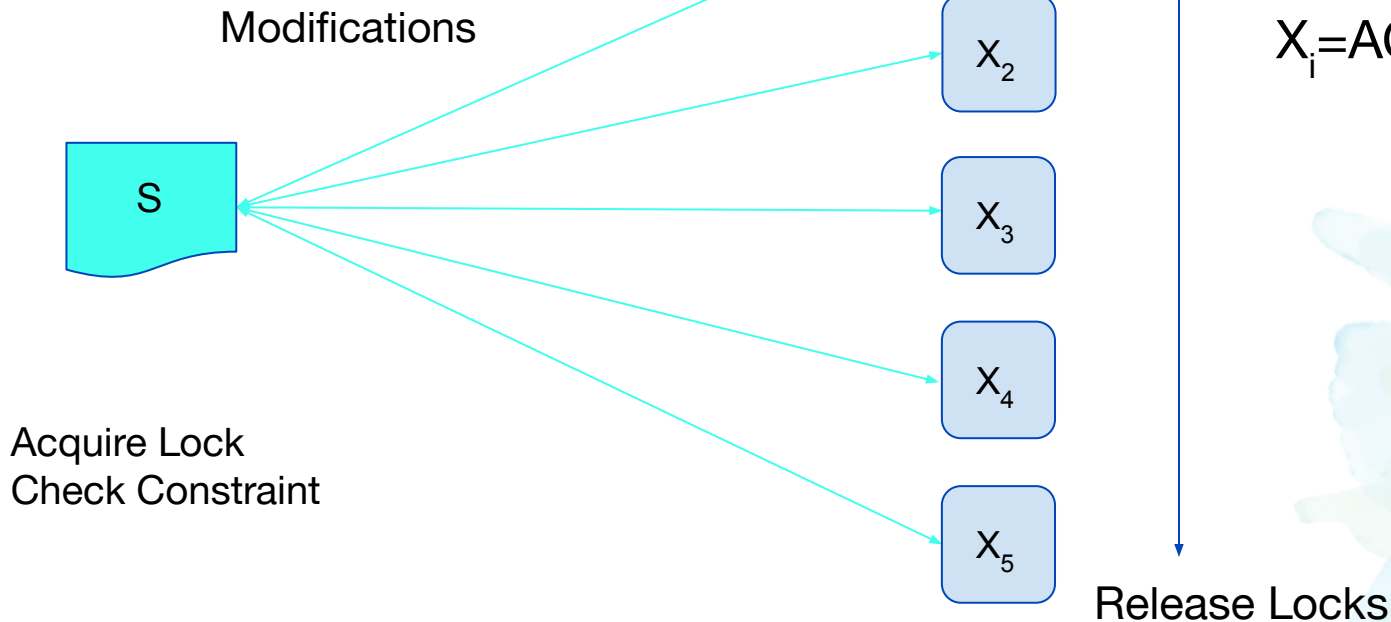
- Vote Step: Success



$\tau = (C, M)$   
 $S = \text{shards}(\tau)$   
 $X_i = \text{ACCOUNTS}(S)$

# Lock Based Execution

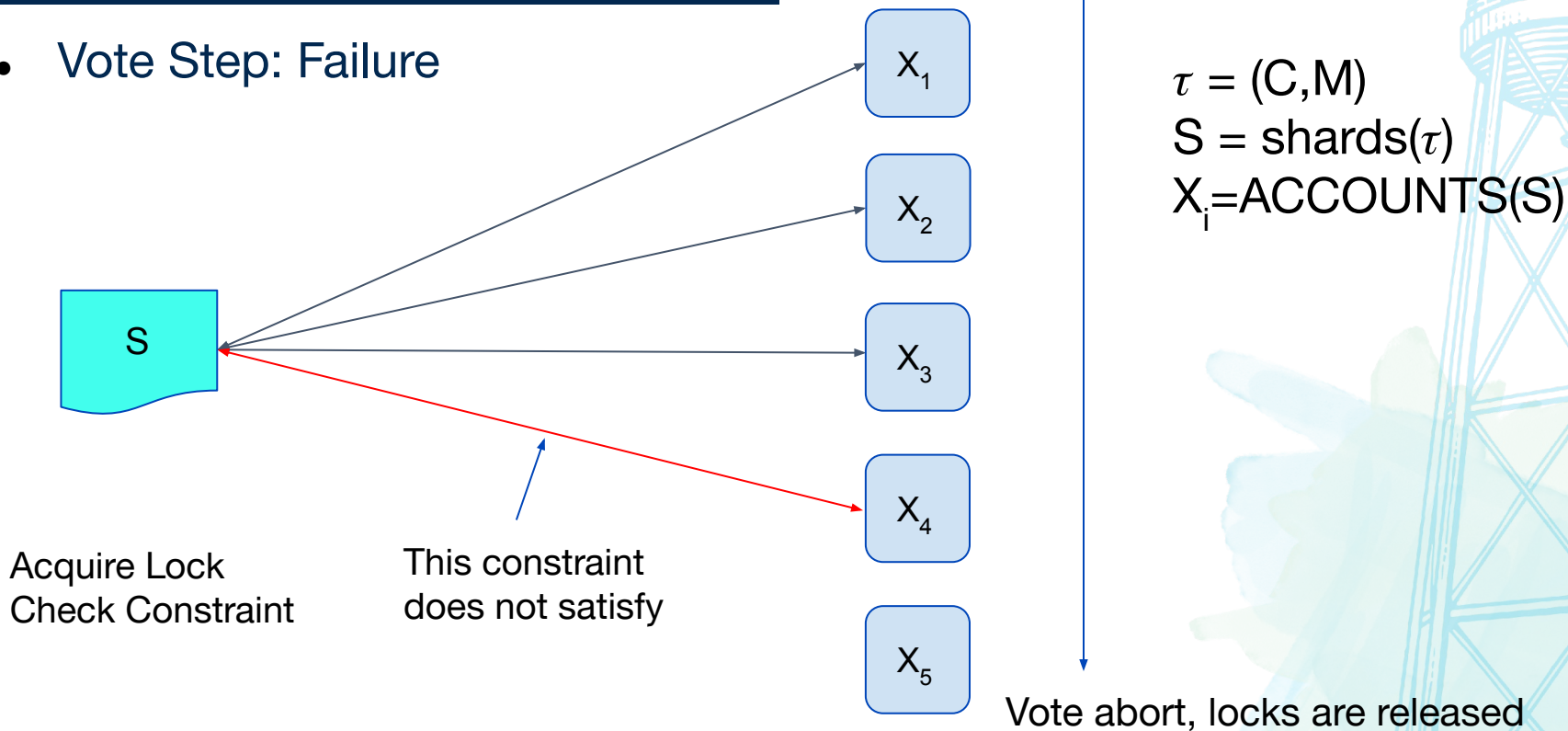
- Vote Step: Success



$\tau = (C, M)$   
 $S = \text{shards}(\tau)$   
 $X_i = \text{ACCOUNTS}(S)$

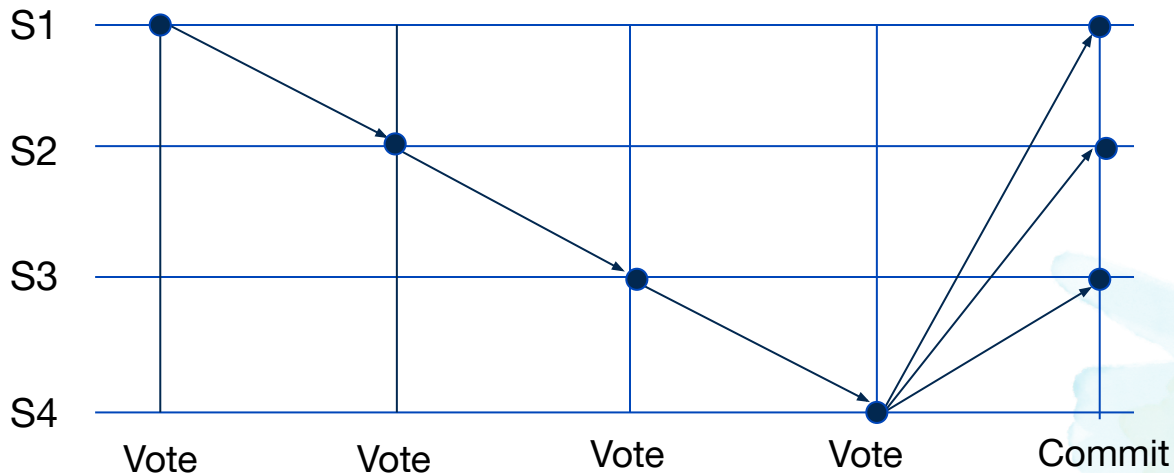
# Lock Based Execution

- Vote Step: Failure



# Lock Based Execution

Transaction  $\tau$  with  $n = |\text{shards}(\tau)|$

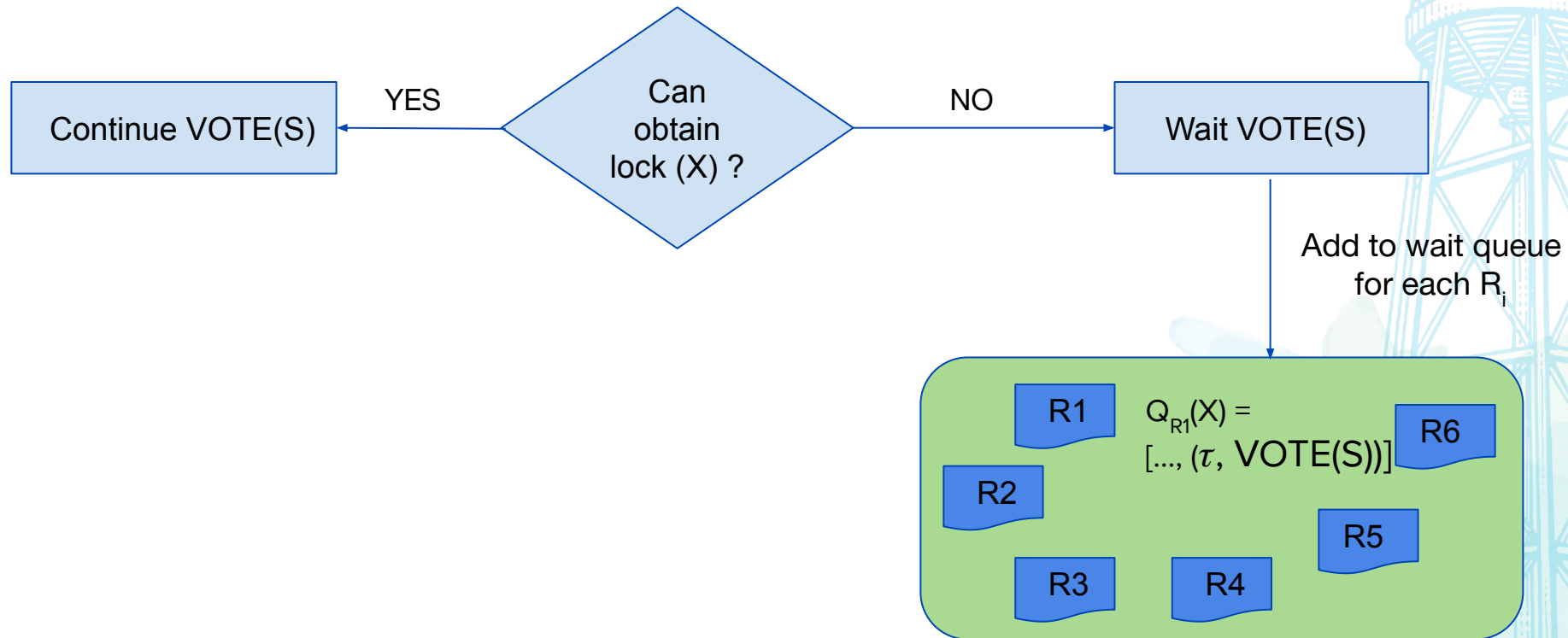


● = Consensus step  
→ = Cluster-sending step

Consensus Steps =  $n + (n-1) = 2n - 1$

Cluster-sending steps =  $(n-1) + (n-1) = 2n - 2$

# Lock Based Execution



# Protocols




















We have **18 different protocols** that emerge from different configurations of the below three parameters:

- Linear, Centralized, and Distributed Orchestration
- Four Isolation Degrees in Execution
- Blocking and Non-blocking locks





# Protocols

	Isolation-Free execution		Lock-based execution						
	(write uncommitted)		Read Uncommitted		Read Committed		Serializable		
	<i>unsafe</i>	<i>safe</i>	<i>blocking</i>	<i>non-blocking</i>	<i>blocking</i>	<i>non-blocking</i>	<i>blocking</i>	<i>non-blocking</i>	
Linear	 LIF <sub>U</sub>	 LIF <sub>S</sub>	 LRUB	 LRUNB	 LRCB	 LRCNB	 LSB	 LSNB	 AHL <span>⎛reference committee⎞</span>
Centralized	 CIF <sub>U</sub>	 CIF <sub>S</sub>		 CRUNB		 CRCNB		 CSNB	
Distributed	 DIF <sub>U</sub>	 DIF <sub>S</sub>		 DRUNB		 DRCNB		 DSNB	

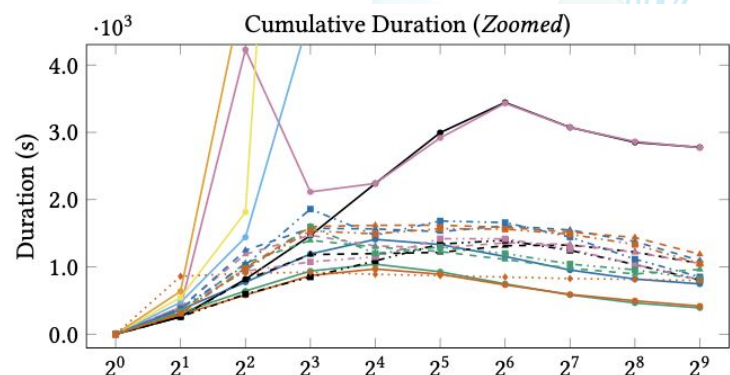
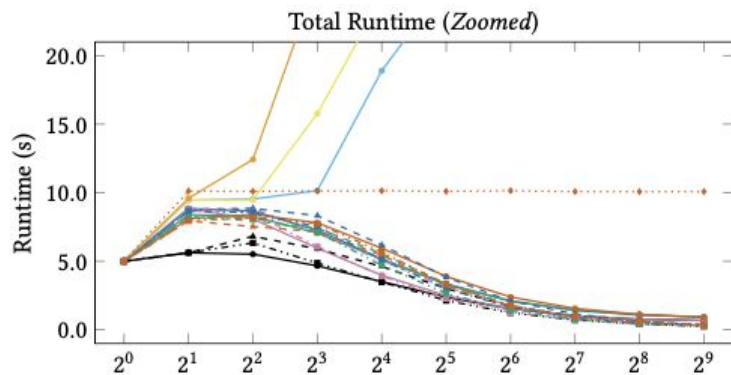
## Experimental Setup

- Workload of 5000 transactions
- Each transaction affects 16 distinct accounts
  - Putting constraints on 8 accounts (read operations)
  - Removing balance from 4 accounts (write operations)
  - Adding balance to 4 accounts (write operations)
- Each account on each shard
  - Initial balance of 2000
  - Add or remove 500 balance per modification
- 64 shards and 8192 active accounts (128/shard)



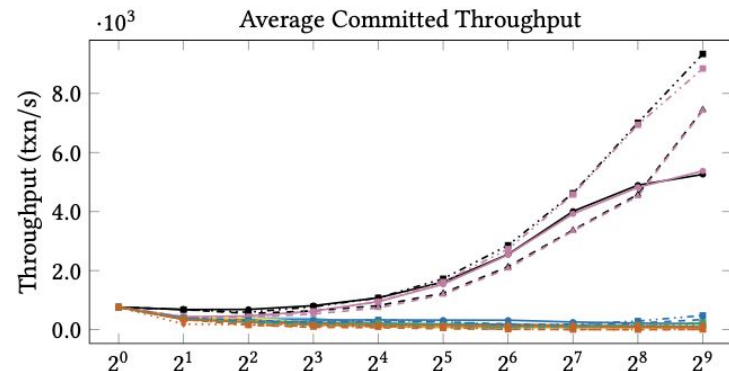
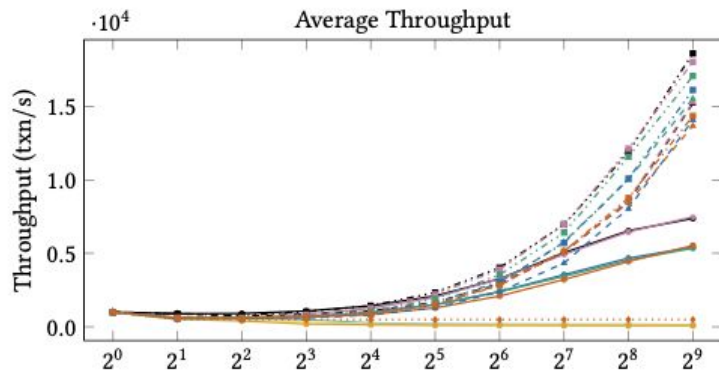
# Performance Evaluation: Results : Scalability

	Isolation-Free execution				Lock-based execution							
	(write uncommitted)		Read Uncommitted		Read Committed		Serializable		AHL (reference committee)			
	<i>unsafe</i>	<i>safe</i>	<i>blocking</i>	<i>non-blocking</i>	<i>blocking</i>	<i>non-blocking</i>	<i>blocking</i>	<i>non-blocking</i>				
Linear	—●— LIF <sub>U</sub>	—●— LIF <sub>S</sub>	—●— LR <sub>U</sub> <sub>B</sub>	—●— LR <sub>U</sub> <sub>NB</sub>	—●— LRC <sub>B</sub>	—●— LRC <sub>NB</sub>	—●— LS <sub>B</sub>	—●— LS <sub>NB</sub>				
Centralized	-▲- CIF <sub>U</sub>	-▲- CIF <sub>S</sub>	-▲- CR <sub>U</sub> <sub>NB</sub>	-▲- CR <sub>U</sub> <sub>NB</sub>	-▲- CRC <sub>NB</sub>	-▲- CRC <sub>NB</sub>	-▲- CS <sub>NB</sub>	-▲- CS <sub>NB</sub>				
Distributed	-■- DIF <sub>U</sub>	-■- DIF <sub>S</sub>	-■- DR <sub>U</sub> <sub>NB</sub>	-■- DR <sub>U</sub> <sub>NB</sub>	-■- DRC <sub>NB</sub>	-■- DRC <sub>NB</sub>	-■- DS <sub>NB</sub>	-■- DS <sub>NB</sub>				



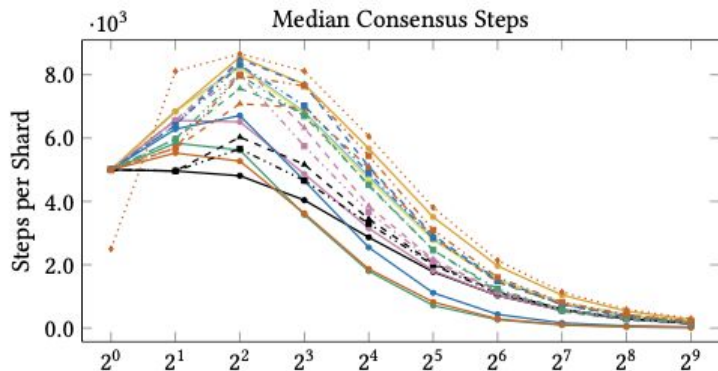
# Performance Evaluation: Results : Scalability

	Isolation-Free execution		Lock-based execution						AHL (reference committee)
	(write uncommitted)		Read Uncommitted		Read Committed		Serializable		
	<i>unsafe</i>	<i>safe</i>	<i>blocking</i>	<i>non-blocking</i>	<i>blocking</i>	<i>non-blocking</i>	<i>blocking</i>	<i>non-blocking</i>	
Linear	—●— LIF <sub>U</sub>	—●— LIF <sub>S</sub>	—●— LR <sub>UB</sub>	—●— LR <sub>UNB</sub>	—●— LR <sub>CB</sub>	—●— LR <sub>CNB</sub>	—●— LS <sub>B</sub>	—●— LS <sub>NB</sub>	
Centralized	-▲- CIF <sub>U</sub>	-▲- CIF <sub>S</sub>	-▲- CR <sub>UNB</sub>	-▲- CR <sub>UNB</sub>	-▲- CR <sub>CNB</sub>	-▲- CR <sub>CNB</sub>	-▲- CS <sub>NB</sub>	-▲- CS <sub>NB</sub>	
Distributed	-■- DIF <sub>U</sub>	-■- DIF <sub>S</sub>	-■- DR <sub>UNB</sub>	-■- DR <sub>UNB</sub>	-■- DR <sub>CNB</sub>	-■- DR <sub>CNB</sub>	-■- DS <sub>NB</sub>	-■- DS <sub>NB</sub>	



# Performance Evaluation: Results : Scalability

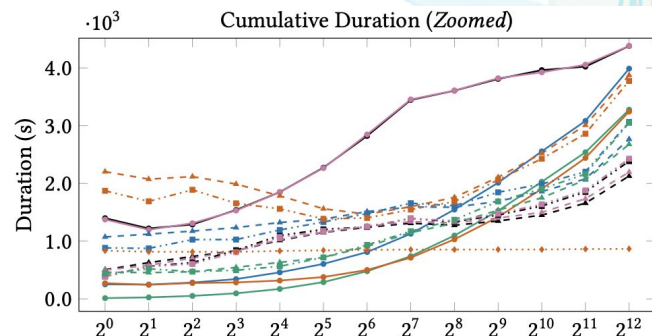
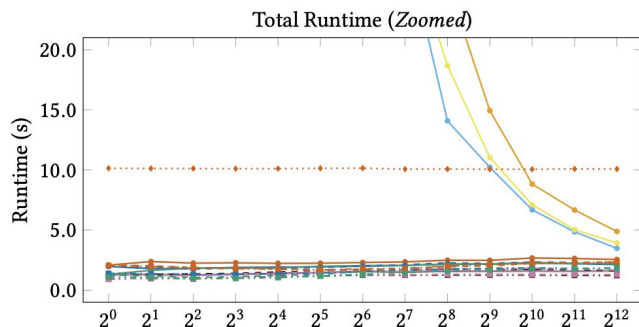
	Isolation-Free execution		Lock-based execution						AHL (reference committee)
	(write uncommitted)		Read Uncommitted		Read Committed		Serializable		
	<i>unsafe</i>	<i>safe</i>	<i>blocking</i>	<i>non-blocking</i>	<i>blocking</i>	<i>non-blocking</i>	<i>blocking</i>	<i>non-blocking</i>	
Linear	—●— LIFU	—●— LIFs	—●— LRUB	—●— LRUNB	—●— LRCB	—●— LRCNB	—●— LSB	—●— LSNB	
Centralized	-▲- CIFU	-▲- CIFs	-▲- CRUNB	-▲- CRUNB	-▲- CRCNB	-▲- CRCNB	-▲- CSNB	-▲- CSNB	
Distributed	-■- DIFU	-■- DIFs	-■- DRUNB	-■- DRUNB	-■- DRCNB	-■- DRCNB	-■- DSNB	-■- DSNB	





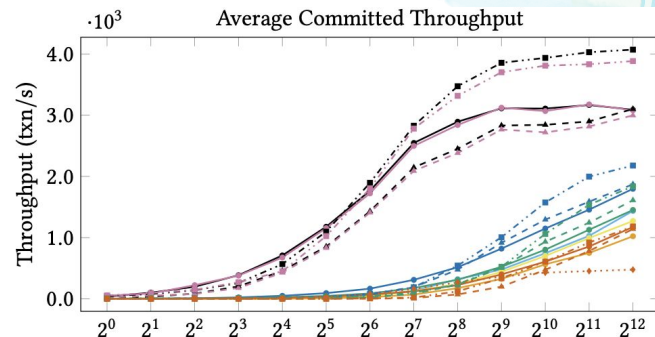
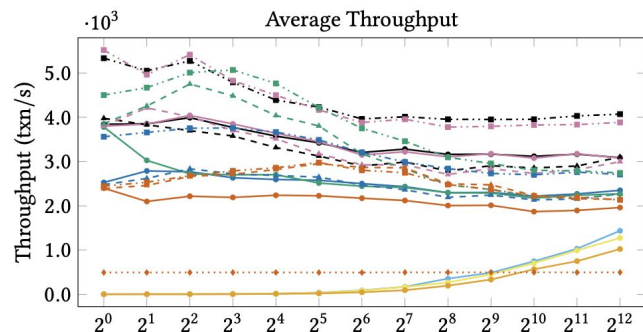
# Performance Evaluation: Results : Contention

	Isolation-Free execution		Lock-based execution						
	(write uncommitted)		Read Uncommitted		Read Committed		Serializable		
	<i>unsafe</i>	<i>safe</i>	<i>blocking</i>	<i>non-blocking</i>	<i>blocking</i>	<i>non-blocking</i>	<i>blocking</i>	<i>non-blocking</i>	
Linear	—●— LIF <sub>U</sub>	—●— LIF <sub>S</sub>	—●— LR <sub>U</sub> <sub>B</sub>	—●— LR <sub>U</sub> <sub>NB</sub>	—●— LR <sub>C</sub> <sub>B</sub>	—●— LR <sub>C</sub> <sub>NB</sub>	—●— LS <sub>B</sub>	—●— LS <sub>NB</sub>	AHL (reference committee)
Centralized	-▲- CIF <sub>U</sub>	-▲- CIF <sub>S</sub>	-▲- CR <sub>U</sub> <sub>NB</sub>	-▲- CR <sub>U</sub> <sub>NB</sub>	-▲- CRC <sub>NB</sub>	-▲- CRC <sub>NB</sub>	-▲- CS <sub>NB</sub>	-▲- CS <sub>NB</sub>	
Distributed	-■- DIF <sub>U</sub>	-■- DIF <sub>S</sub>	-■- DR <sub>U</sub> <sub>NB</sub>	-■- DR <sub>U</sub> <sub>NB</sub>	-■- DRC <sub>NB</sub>	-■- DRC <sub>NB</sub>	-■- DS <sub>NB</sub>	-■- DS <sub>NB</sub>	



# Performance Evaluation: Results : Contention

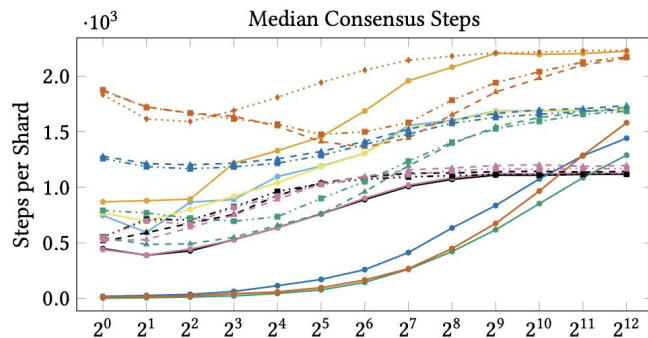
	Isolation-Free execution				Lock-based execution					
	(write uncommitted)		Read Uncommitted		Read Committed		Serializable			
	<i>unsafe</i>	<i>safe</i>	<i>blocking</i>	<i>non-blocking</i>	<i>blocking</i>	<i>non-blocking</i>	<i>blocking</i>	<i>non-blocking</i>		
Linear	—●— LIFu	—●— LIFs	—●— LRUB	—●— LRUNB	—●— LRCB	—●— LRCNB	—●— LSB	—●— LSNB		
Centralized	-▲- CIFu	-▲- CIFs	-▲- CRUB	-▲- CRUNB	-▲- CRCB	-▲- CRCNB	-▲- CSNB	-▲- CSNB		
Distributed	-■- DIFu	-■- DIFs	-■- DRUB	-■- DRUNB	-■- DRCB	-■- DRCNB	-■- DSNB	-■- DSNB	—◆— AHL (reference committee)	





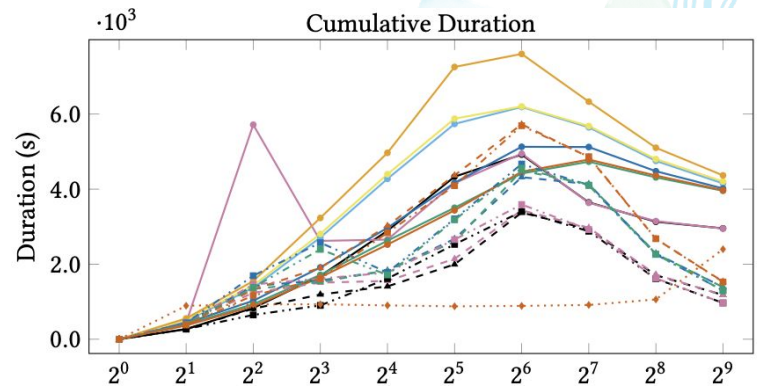
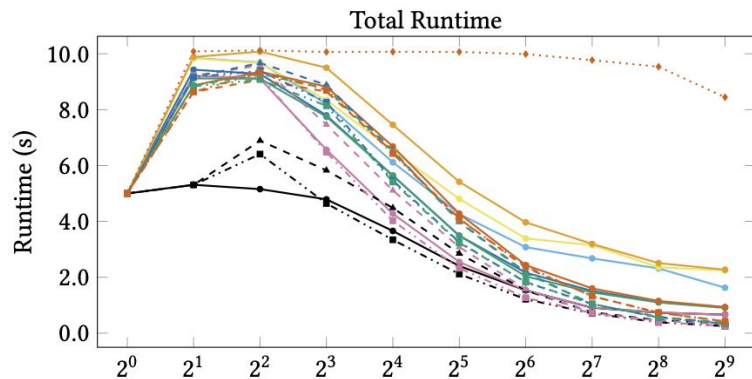
# Performance Evaluation: Results : Contention

	Isolation-Free execution (write uncommitted)		Lock-based execution					
			Read Uncommitted		Read Committed		Serializable	
	<i>unsafe</i>	<i>safe</i>	<i>blocking</i>	<i>non-blocking</i>	<i>blocking</i>	<i>non-blocking</i>	<i>blocking</i>	<i>non-blocking</i>
Linear	—●— LIF <sub>U</sub>	—●— LIF <sub>S</sub>	—●— LR <sub>U</sub> B	—●— LR <sub>U</sub> NB	—●— LR <sub>C</sub> B	—●— LR <sub>C</sub> NB	—●— LS <sub>B</sub>	—●— LS <sub>NB</sub>
Centralized	-▲- CIF <sub>U</sub>	-▲- CIF <sub>S</sub>	-▲- CR <sub>U</sub> NB	-▲- CR <sub>U</sub> NB	-▲- CRC <sub>B</sub>	-▲- CRC <sub>NB</sub>	-▲- CS <sub>NB</sub>	-▲- CS <sub>NB</sub>
Distributed	-■- DIF <sub>U</sub>	-■- DIF <sub>S</sub>	-■- DR <sub>U</sub> NB	-■- DR <sub>U</sub> NB	-■- DRC <sub>NB</sub>	-■- DRC <sub>NB</sub>	-■- DS <sub>NB</sub>	-■- DS <sub>NB</sub>
								—◆— AHL (reference committee)



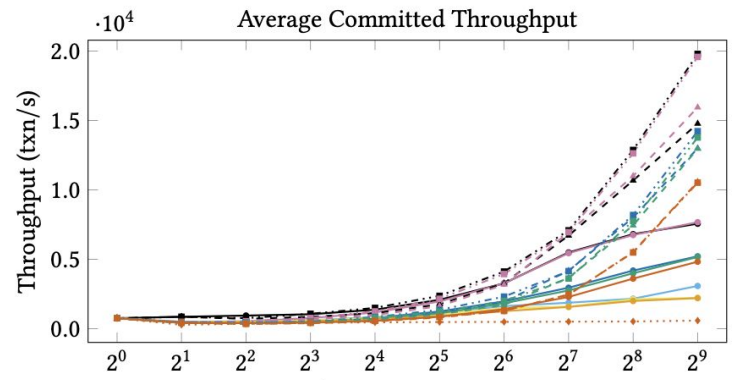
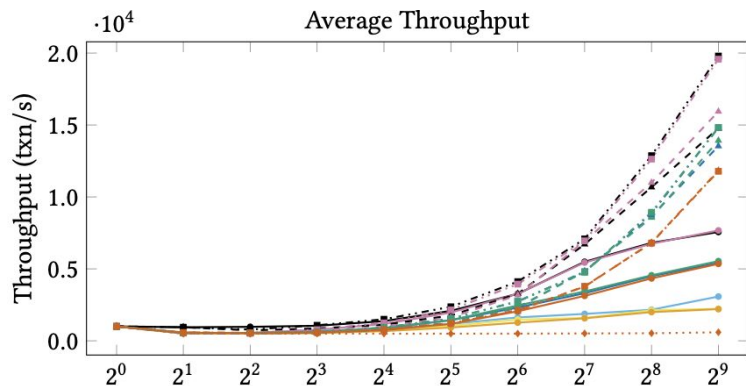
# Performance Evaluation: Results : Factor-Scalability

	Isolation-Free execution				Lock-based execution							
	(write uncommitted)		Read Uncommitted		Read Committed		Serializable		blocking	non-blocking	blocking	non-blocking
	<i>unsafe</i>	<i>safe</i>	<i>blocking</i>	<i>non-blocking</i>	<i>blocking</i>	<i>non-blocking</i>	<i>blocking</i>	<i>non-blocking</i>				
Linear	—●— LIFu	—●— LIFs	—●— LRU <sub>B</sub>	—●— LRU <sub>NB</sub>	—●— LRC <sub>B</sub>	—●— LRC <sub>NB</sub>	—●— LS <sub>B</sub>	—●— LS <sub>NB</sub>	—◆— AHL (reference committee)			
Centralized	-▲- CIFu	-▲- CIFs		-▲- CRU <sub>NB</sub>		-▲- CRC <sub>NB</sub>		-▲- CS <sub>NB</sub>				
Distributed	-■- DIFu	-■- DIFs		-■- DRU <sub>NB</sub>		-■- DRC <sub>NB</sub>		-■- DS <sub>NB</sub>				



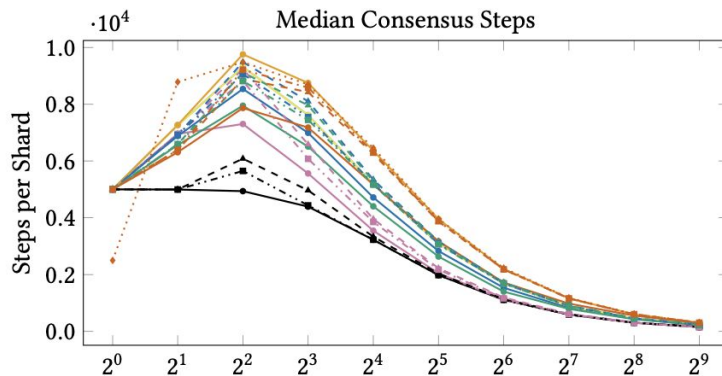
# Performance Evaluation: Results : Factor-Scalability

	Isolation-Free execution		Lock-based execution						
	(write uncommitted)		Read Uncommitted		Read Committed		Serializable		
	<i>unsafe</i>	<i>safe</i>	<i>blocking</i>	<i>non-blocking</i>	<i>blocking</i>	<i>non-blocking</i>	<i>blocking</i>	<i>non-blocking</i>	
Linear	—●— LIF <sub>U</sub>	—●— LIF <sub>S</sub>	—●— LR <sub>UB</sub>	—●— LR <sub>UNB</sub>	—●— LR <sub>CB</sub>	—●— LR <sub>CNB</sub>	—●— LS <sub>B</sub>	—●— LS <sub>NB</sub>	AHL (reference committee)
Centralized	-▲- CIF <sub>U</sub>	-▲- CIF <sub>S</sub>	-▲- CR <sub>UB</sub>	-▲- CR <sub>UNB</sub>	-▲- CRC <sub>B</sub>	-▲- CRC <sub>NB</sub>	-▲- CS <sub>NB</sub>	-▲- CS <sub>NB</sub>	
Distributed	-■- DIF <sub>U</sub>	-■- DIF <sub>S</sub>	-■- DR <sub>UB</sub>	-■- DR <sub>UNB</sub>	-■- DRC <sub>B</sub>	-■- DRC <sub>NB</sub>	-■- DS <sub>NB</sub>	-■- DS <sub>NB</sub>	



# Performance Evaluation: Results : Factor-Scalability

	Isolation-Free execution		Lock-based execution						AHL (reference committee)
	(write uncommitted)		Read Uncommitted		Read Committed		Serializable		
	<i>unsafe</i>	<i>safe</i>	<i>blocking</i>	<i>non-blocking</i>	<i>blocking</i>	<i>non-blocking</i>	<i>blocking</i>	<i>non-blocking</i>	
Linear	—●— LIF <sub>U</sub>	—●— LIF <sub>S</sub>	—●— LR <sub>U</sub> <sub>B</sub>	—●— LR <sub>U</sub> <sub>NB</sub>	—●— LRC <sub>B</sub>	—●— LRC <sub>NB</sub>	—●— LS <sub>B</sub>	—●— LS <sub>NB</sub>	
Centralized	-▲- CIF <sub>U</sub>	-▲- CIF <sub>S</sub>	-▲- CR <sub>U</sub> <sub>NB</sub>	-▲- CR <sub>U</sub> <sub>NB</sub>	-▲- CRC <sub>NB</sub>	-▲- CRC <sub>NB</sub>	-▲- CS <sub>NB</sub>	-▲- CS <sub>NB</sub>	
Distributed	-■- DIF <sub>U</sub>	-■- DIF <sub>S</sub>	-■- DR <sub>U</sub> <sub>NB</sub>	-■- DR <sub>U</sub> <sub>NB</sub>	-■- DRC <sub>NB</sub>	-■- DRC <sub>NB</sub>	-■- DS <sub>NB</sub>	-■- DS <sub>NB</sub>	



**THANK YOU!**

