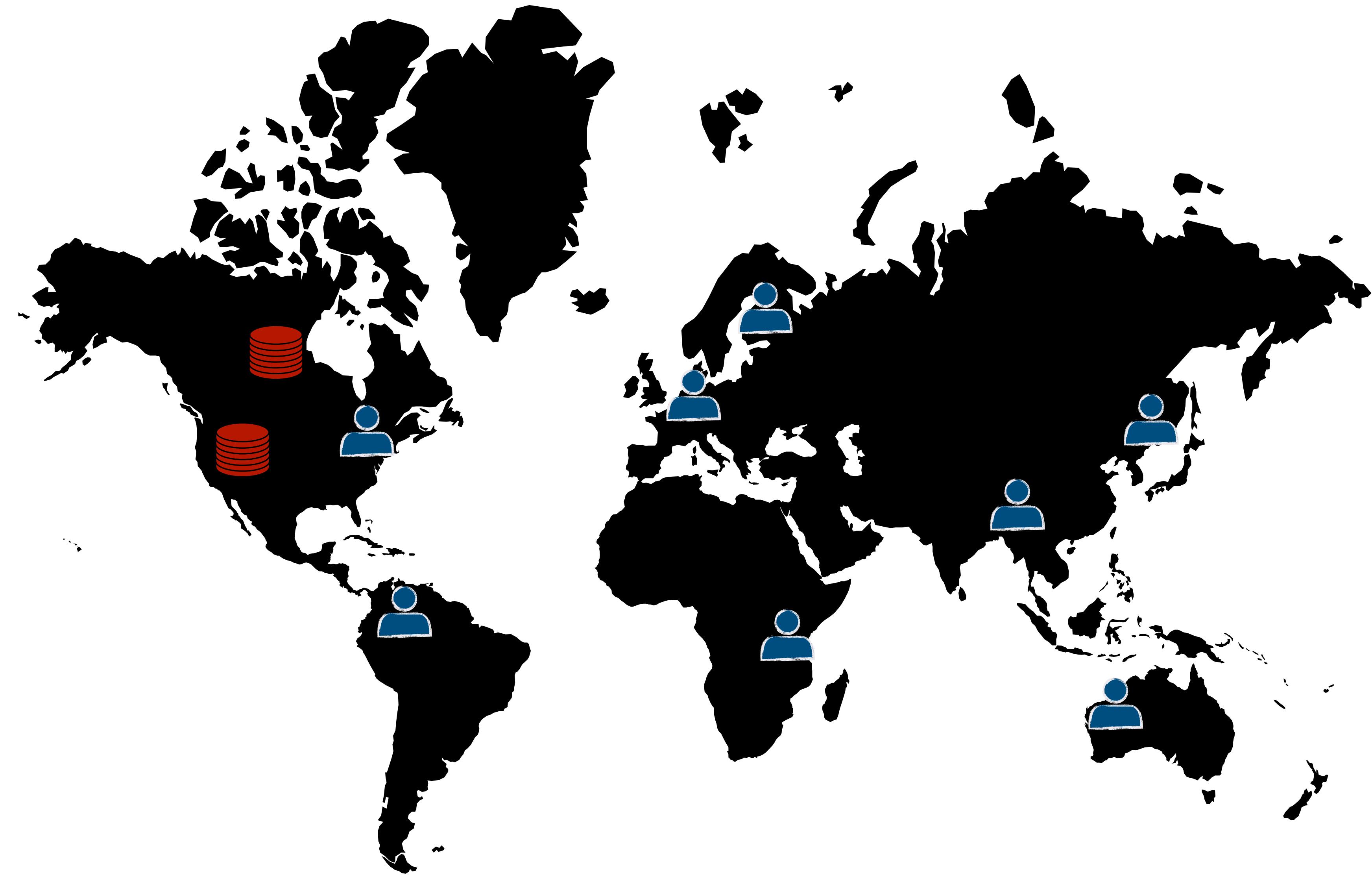


# efficient replication via timestamp stability

**Vitor Enes**, Carlos Baquero, Alexey Gotsman, Pierre Sutra

27 Apr. 2021 @ EuroSys'21

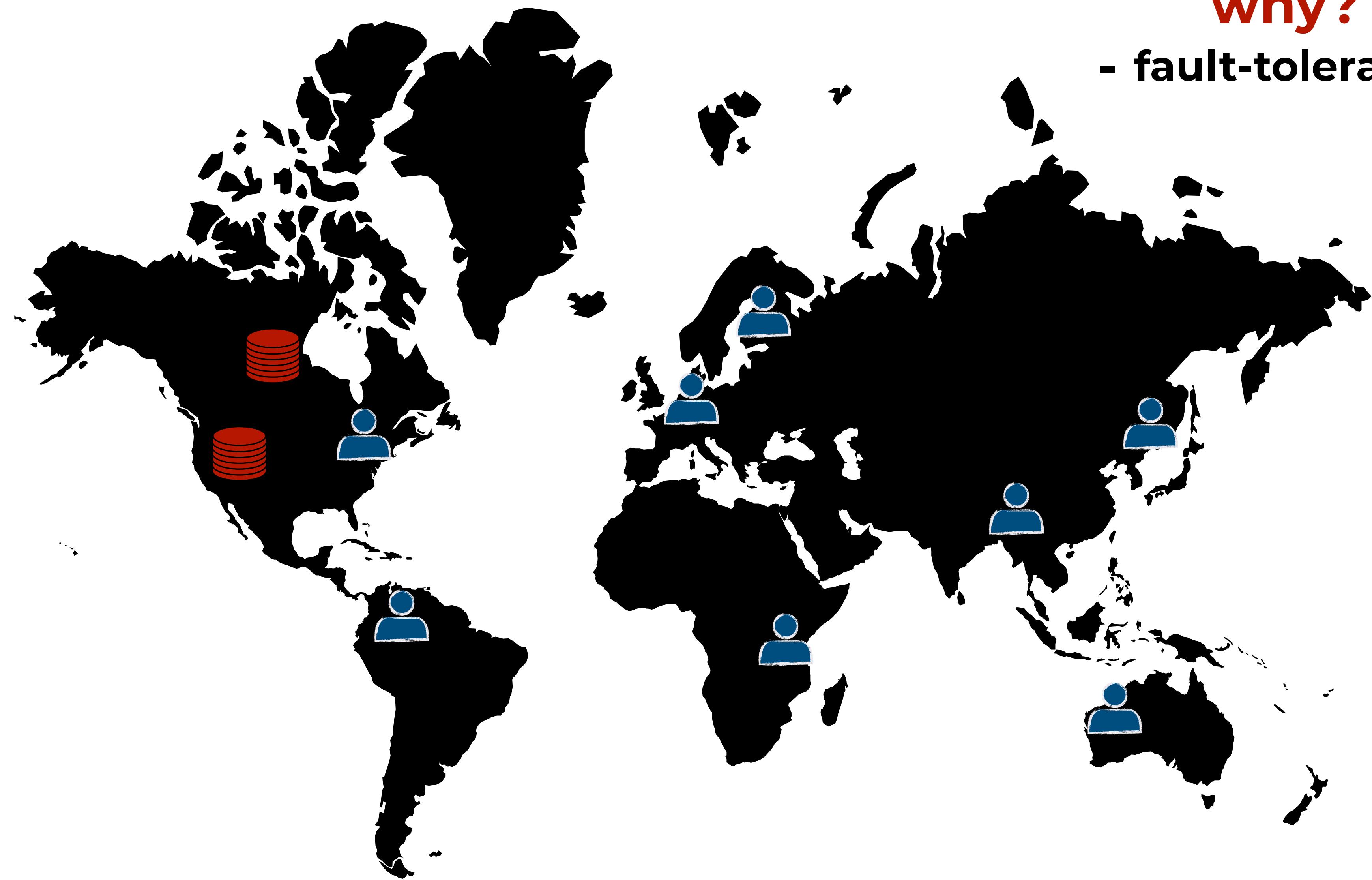
# planet-scale replicated systems



# planet-scale replicated systems

**why?**

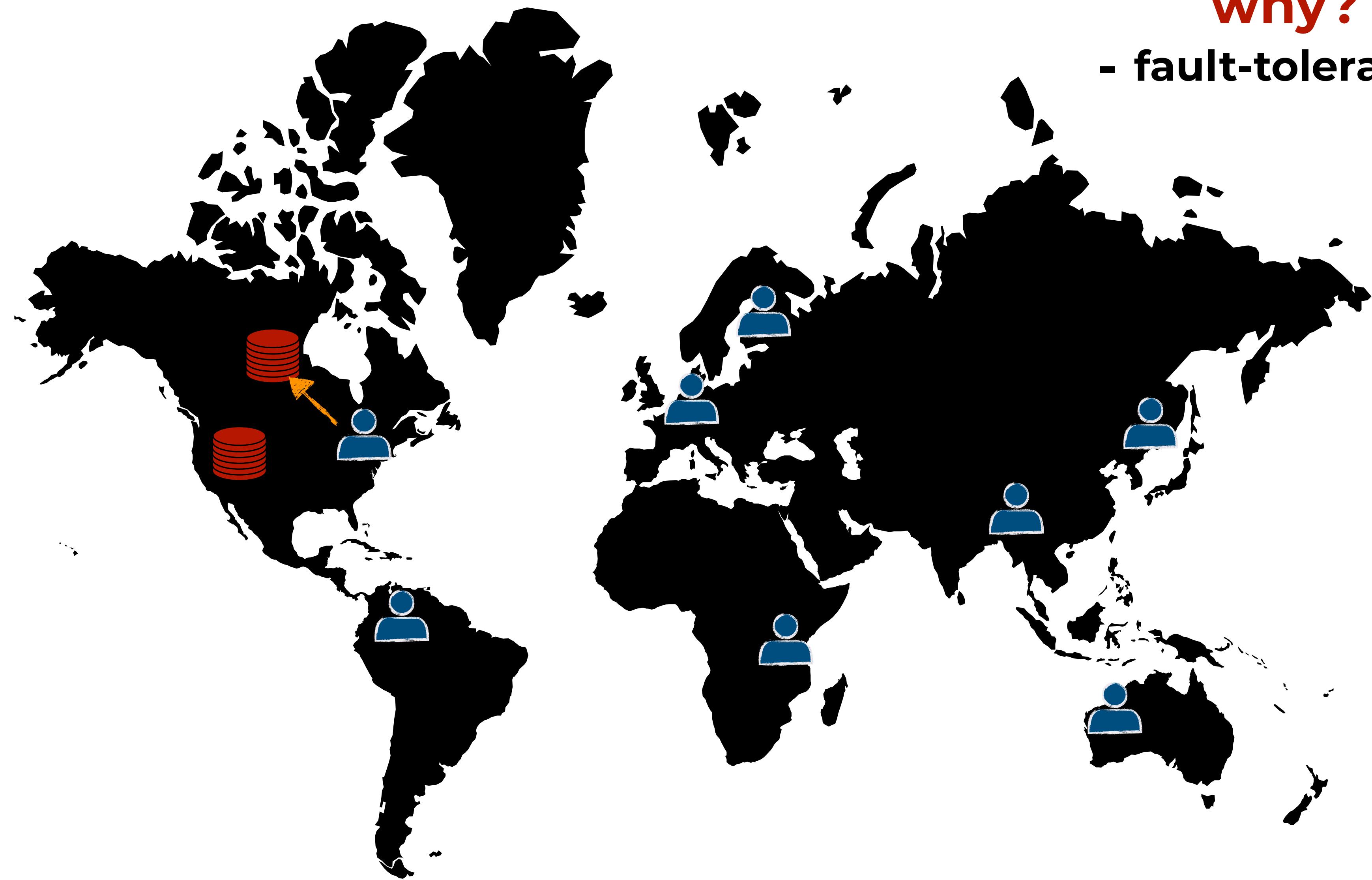
- fault-tolerance



# planet-scale replicated systems

**why?**

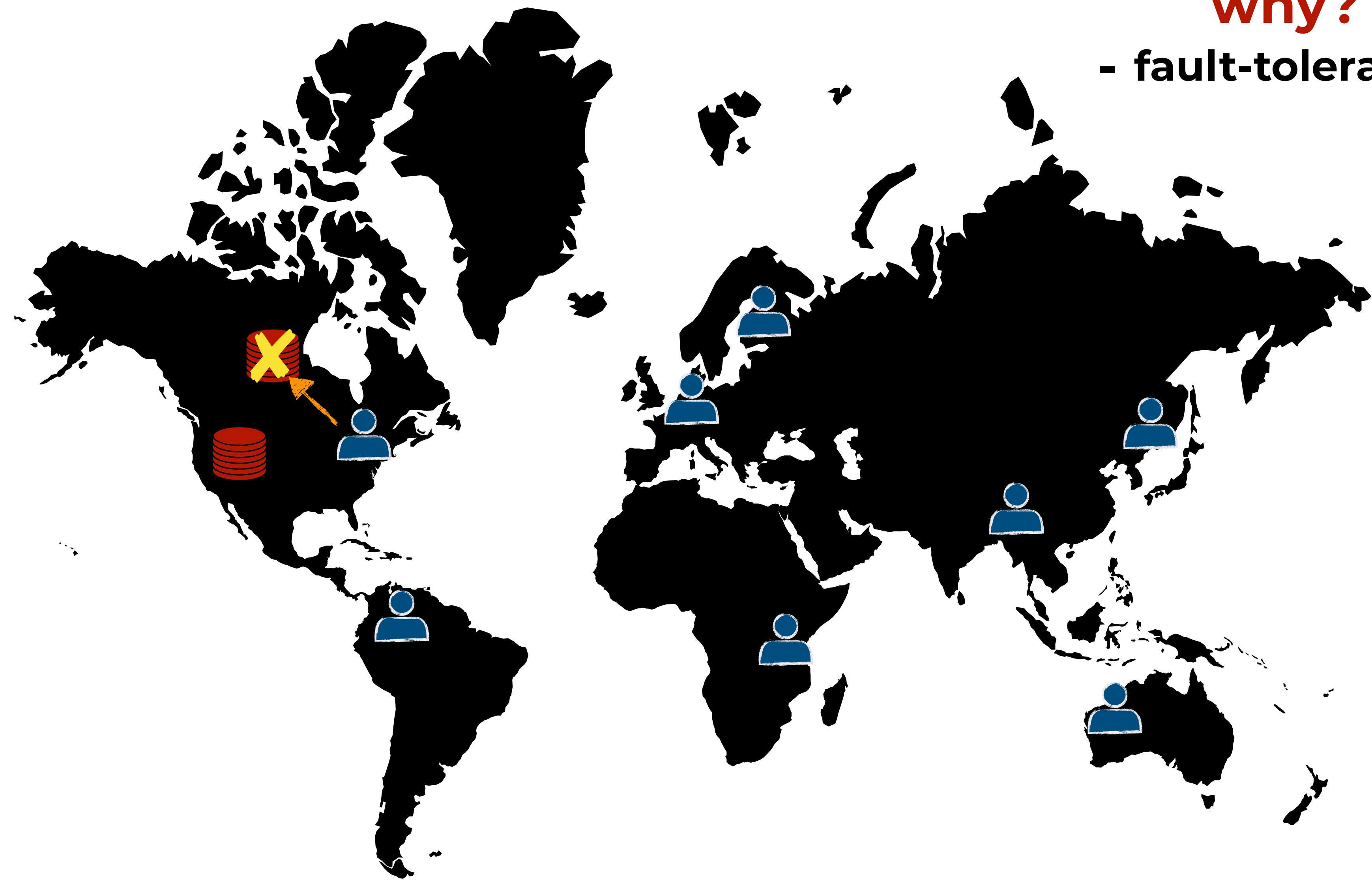
- fault-tolerance



# planet-scale replicated systems

**why?**

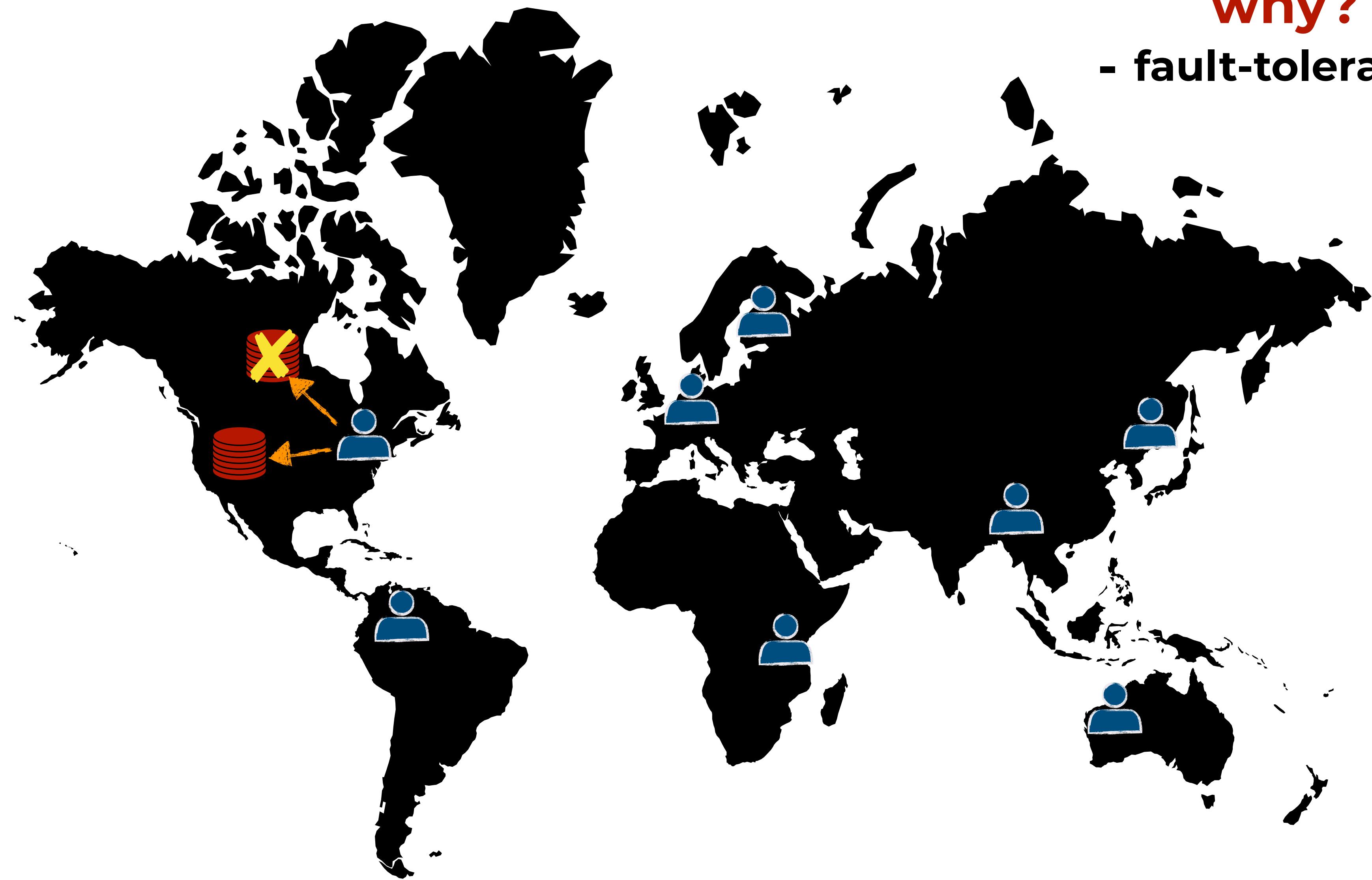
- fault-tolerance



# planet-scale replicated systems

**why?**

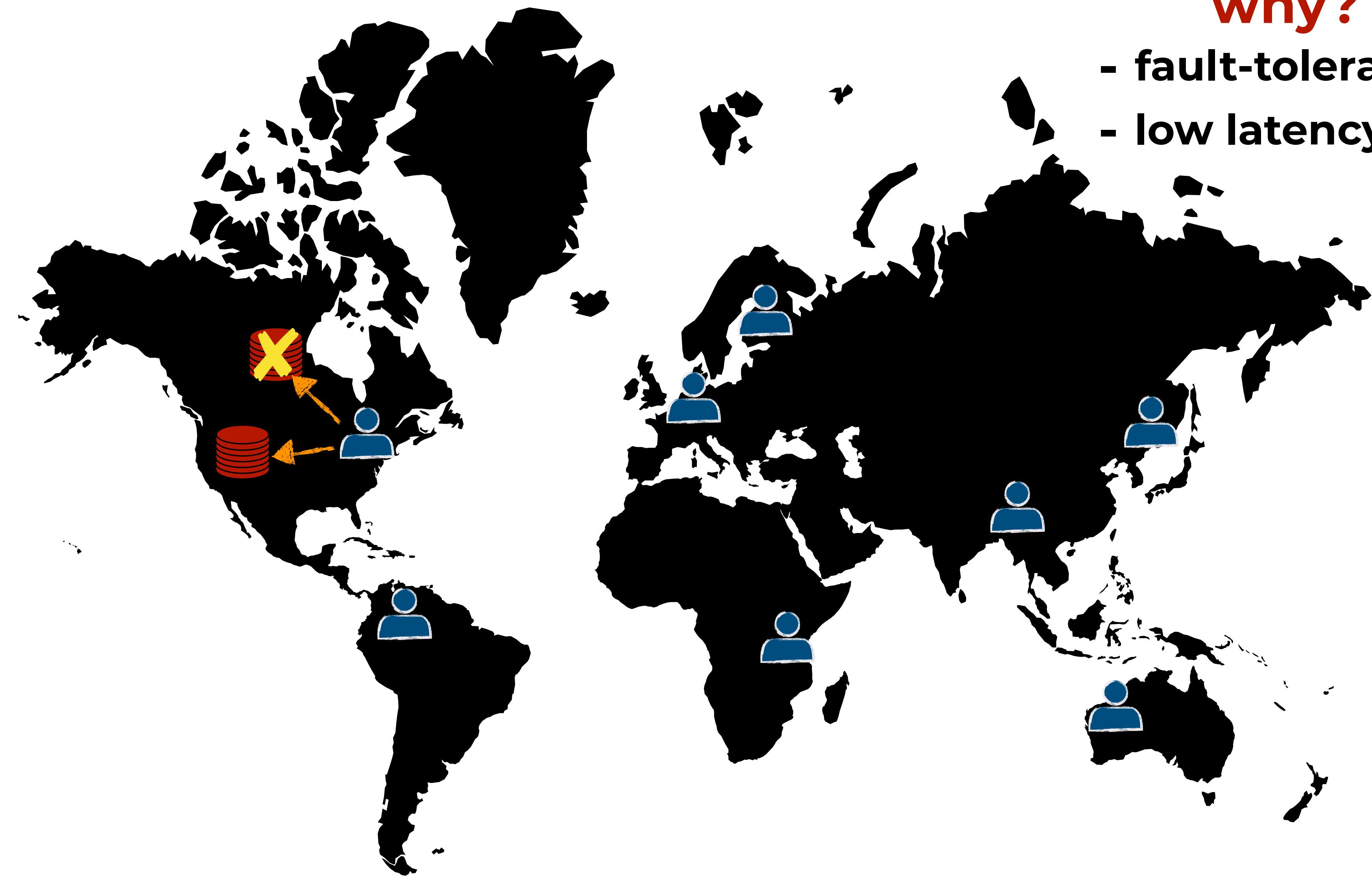
- fault-tolerance



# planet-scale replicated systems

**why?**

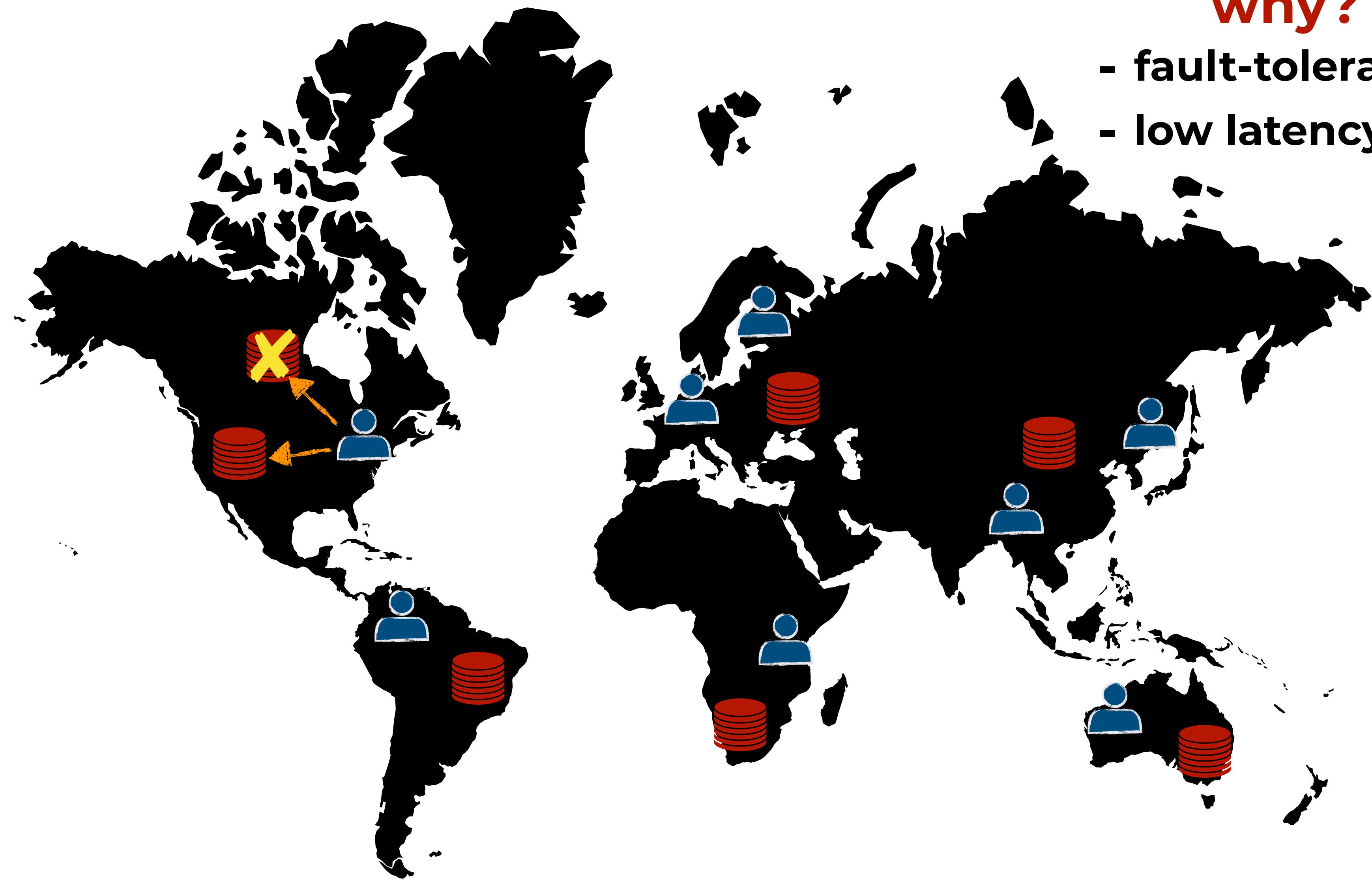
- fault-tolerance
- low latency



# planet-scale replicated systems

**why?**

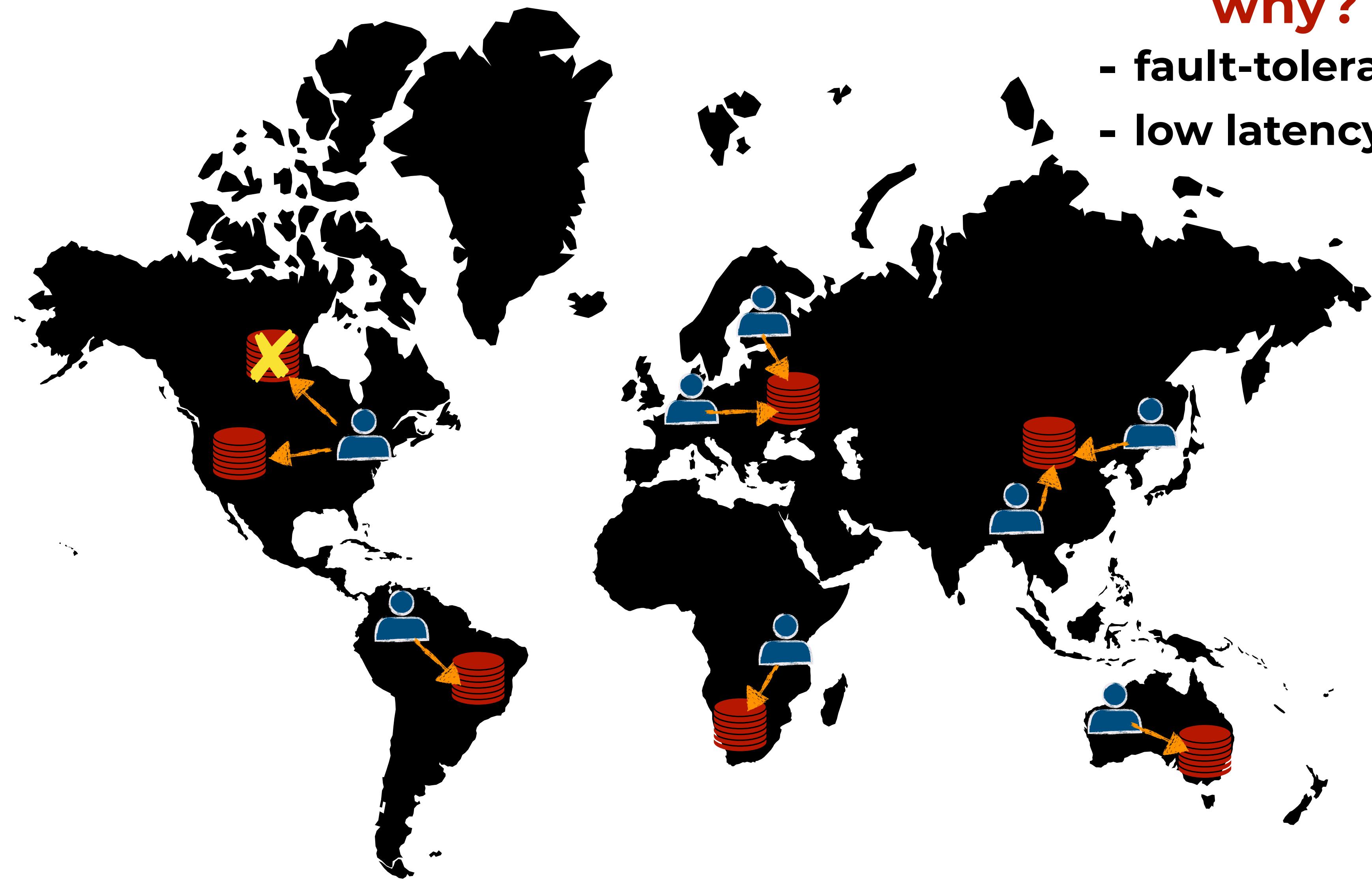
- fault-tolerance
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# planet-scale replicated systems

**why?**

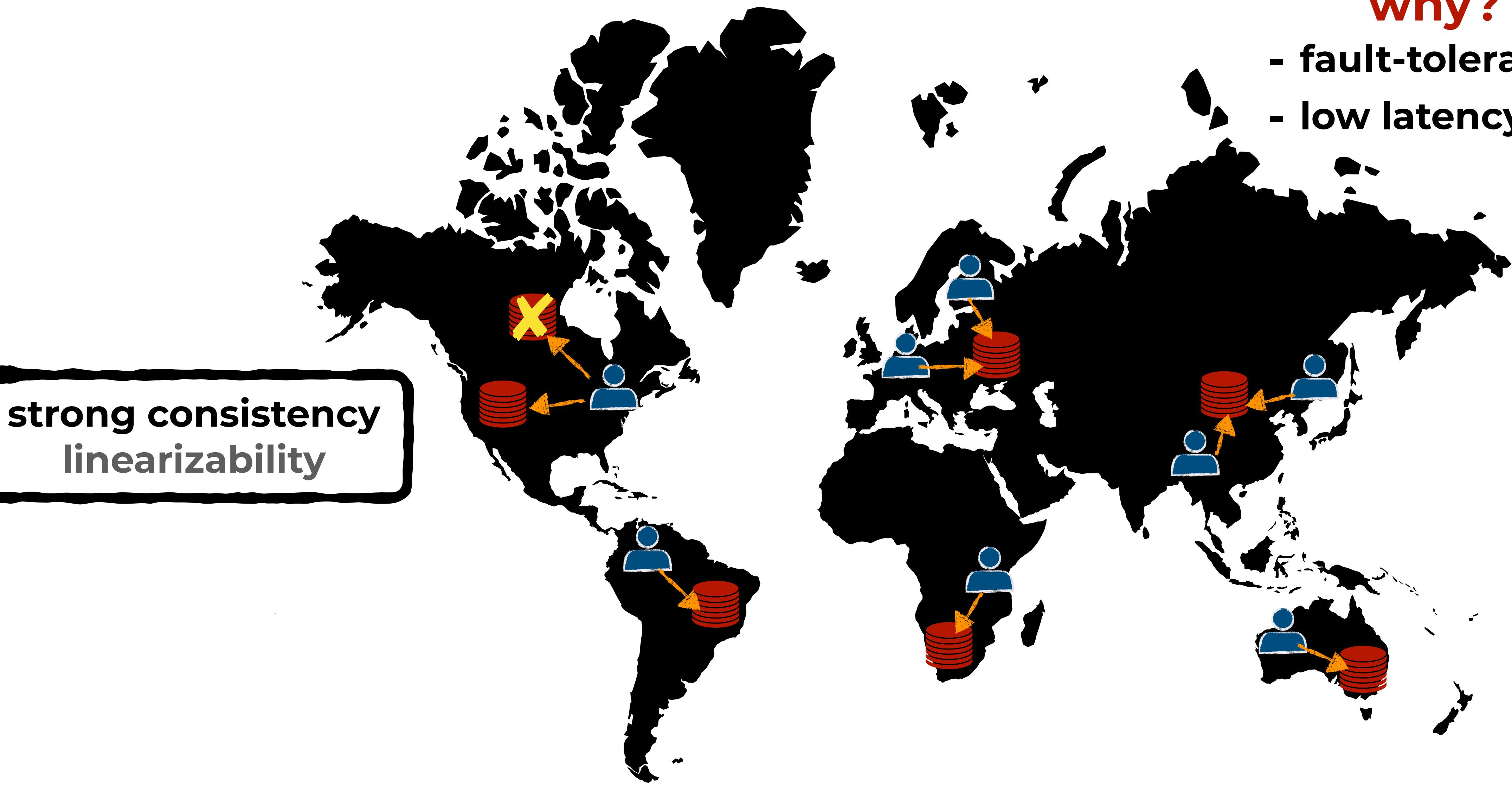
- fault-tolerance
- low latency



# planet-scale replicated systems

**why?**

- fault-tolerance
- low latency



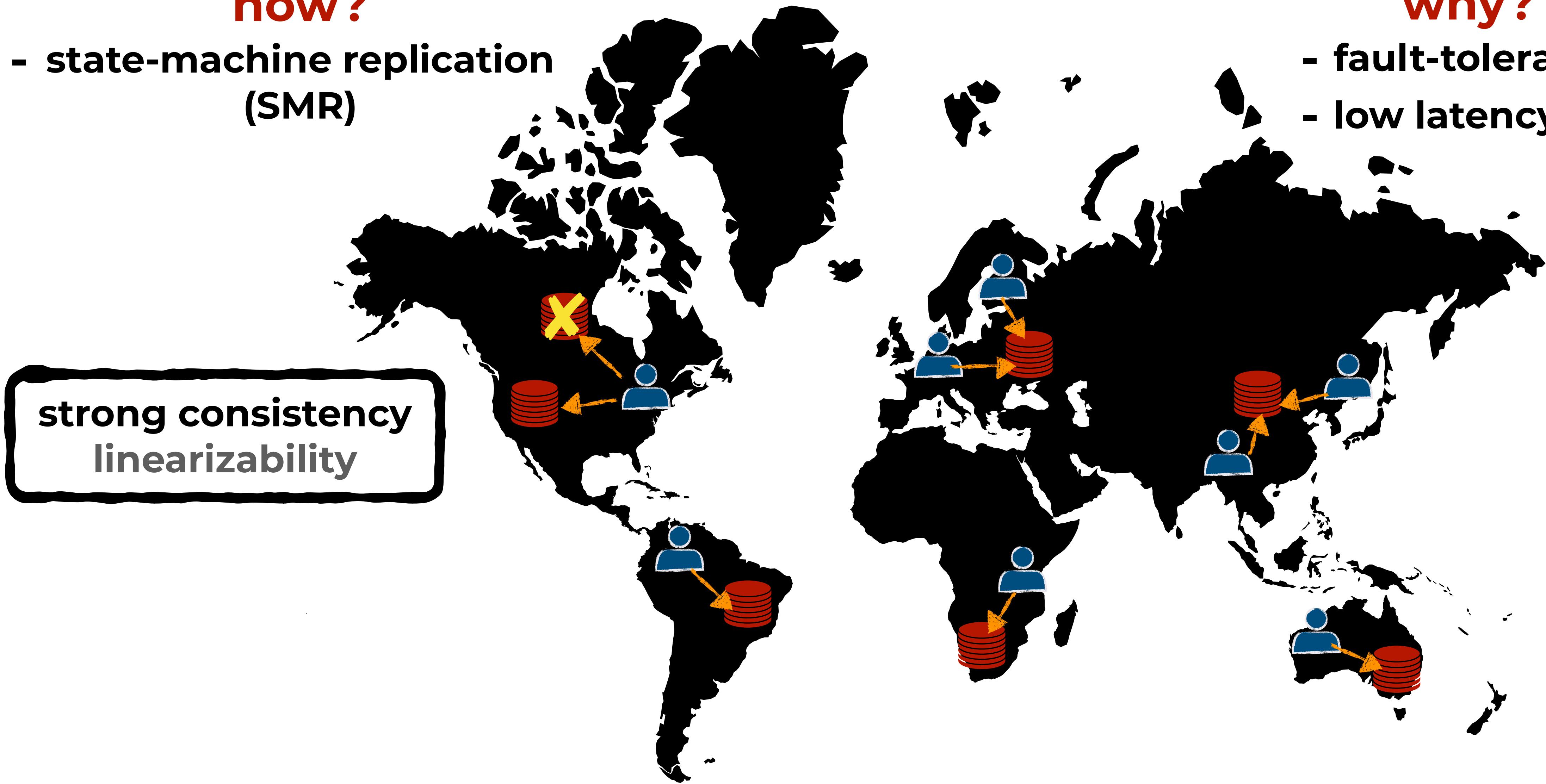
# planet-scale replicated systems

**how?**

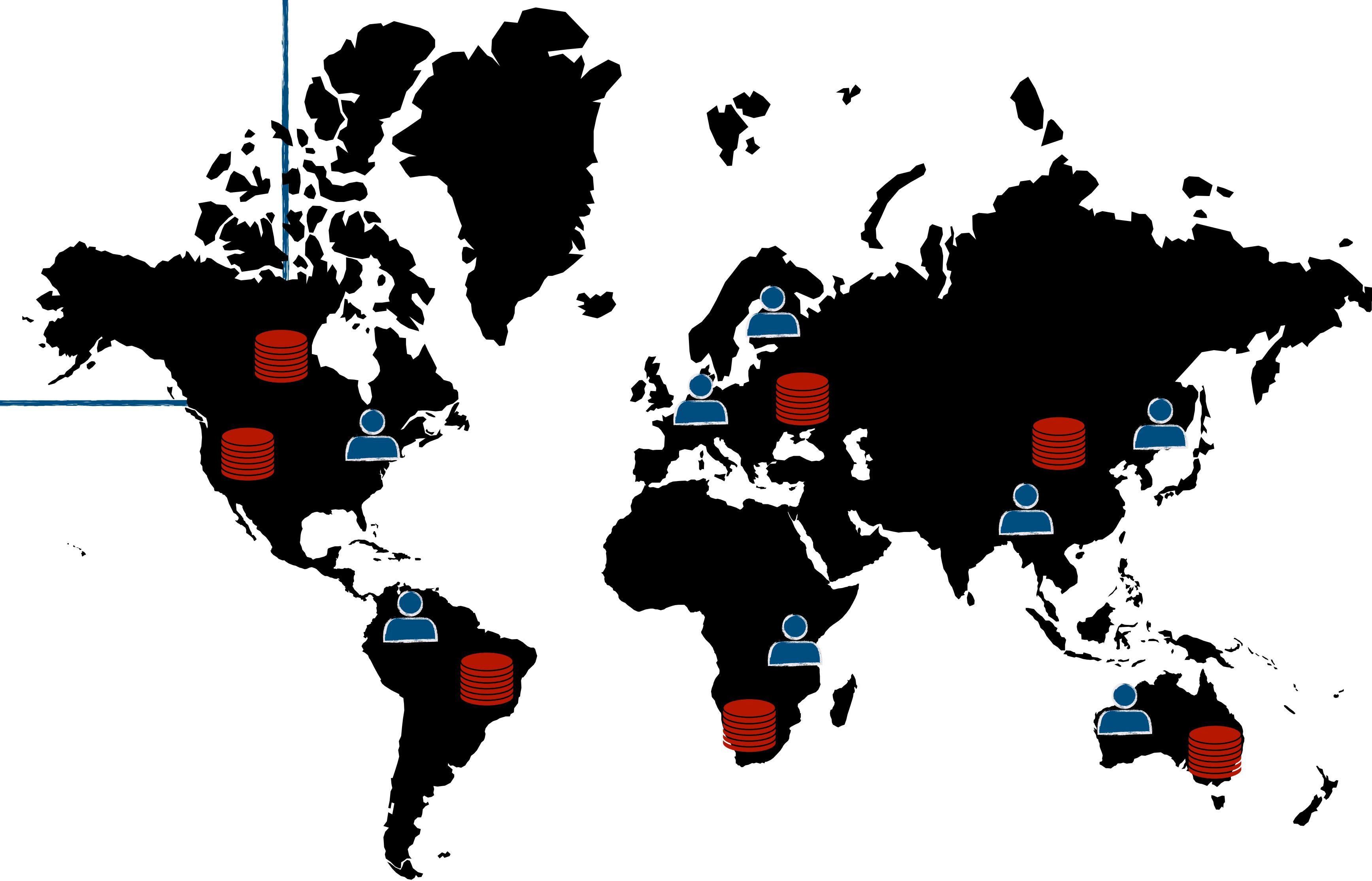
- state-machine replication (SMR)

**why?**

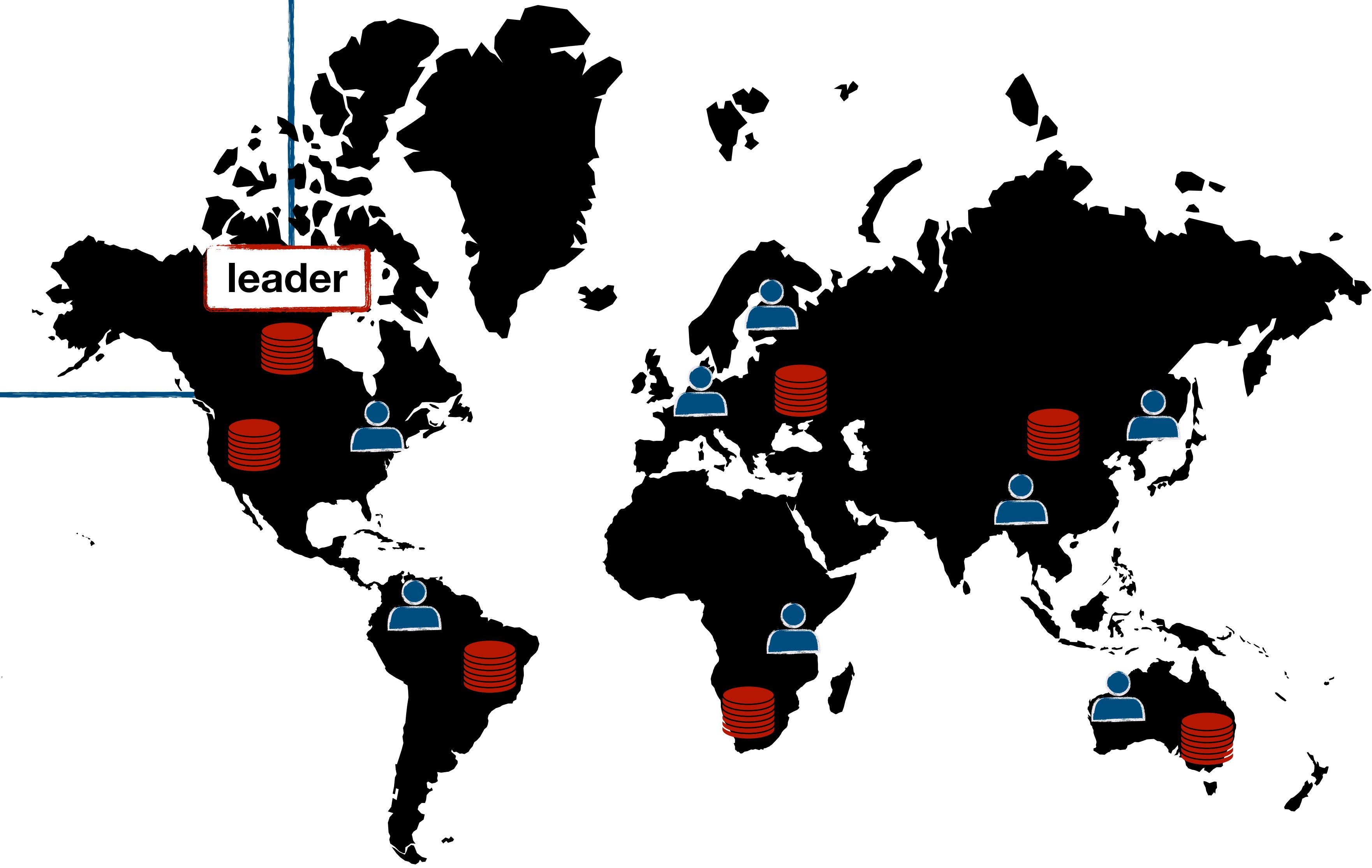
- fault-tolerance
- low latency



# leader-based SMR (e.g. paxos)

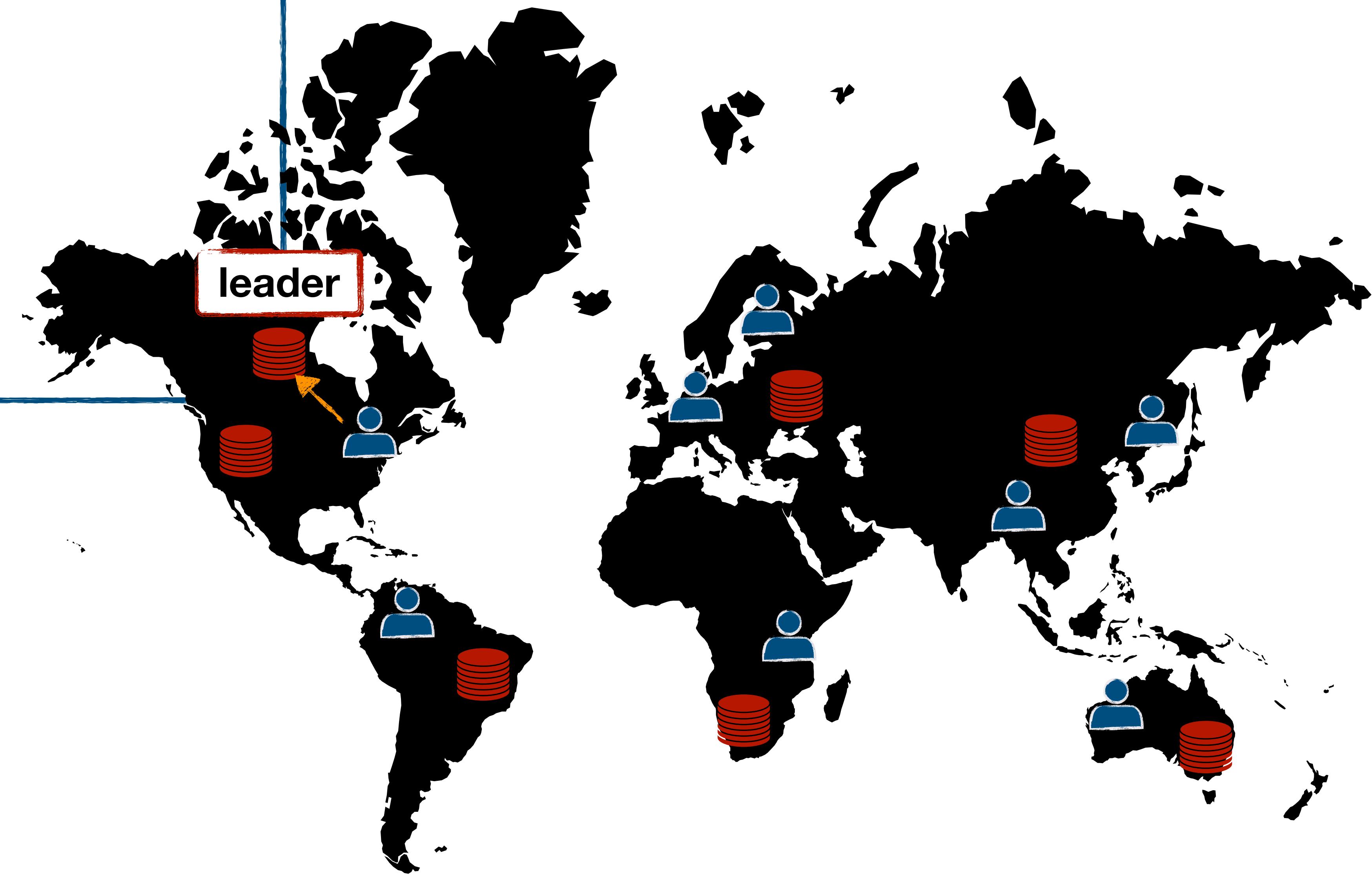


# leader-based SMR (e.g. paxos)



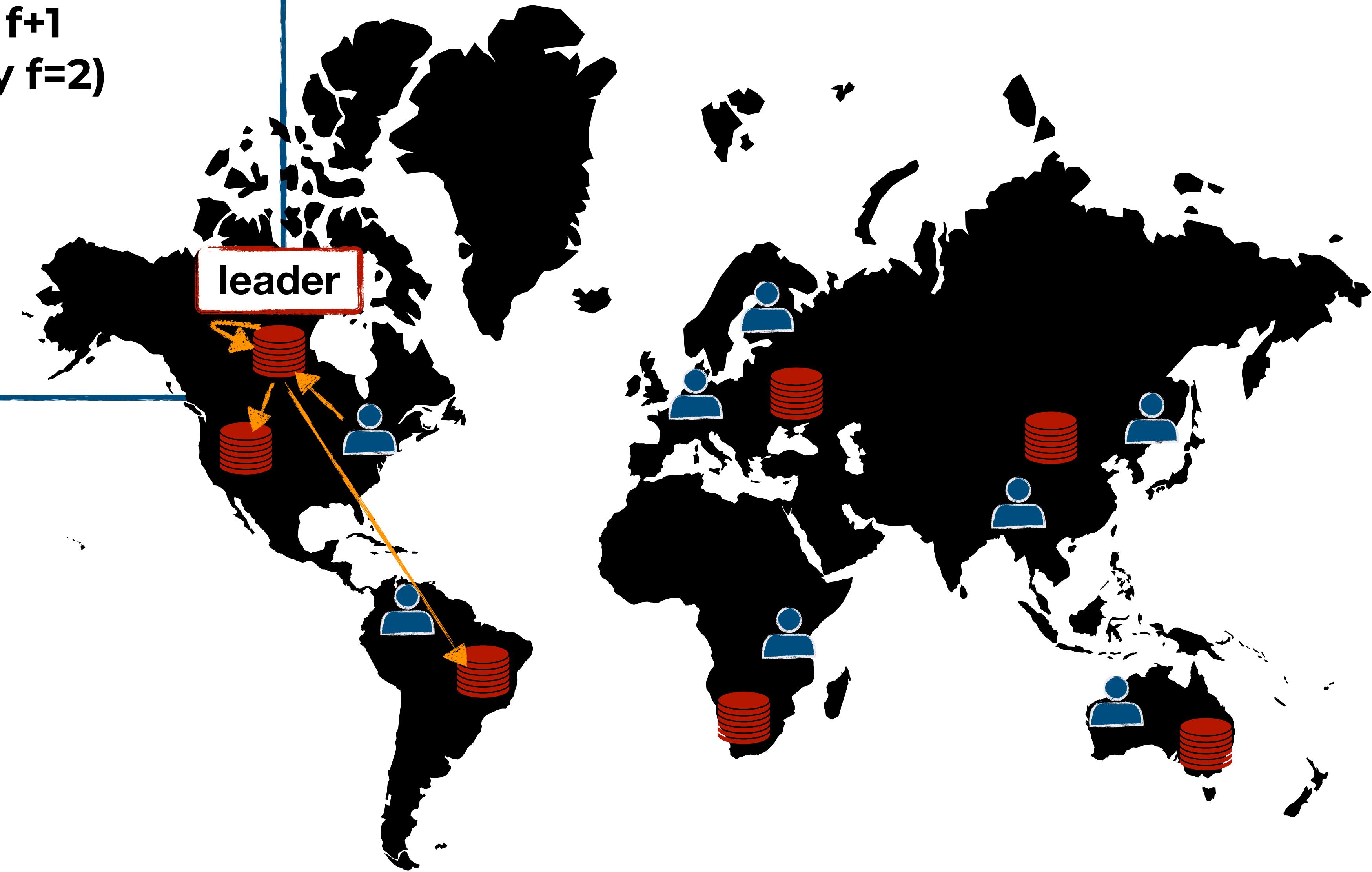
- leader receives command

## leader-based SMR (e.g. paxos)



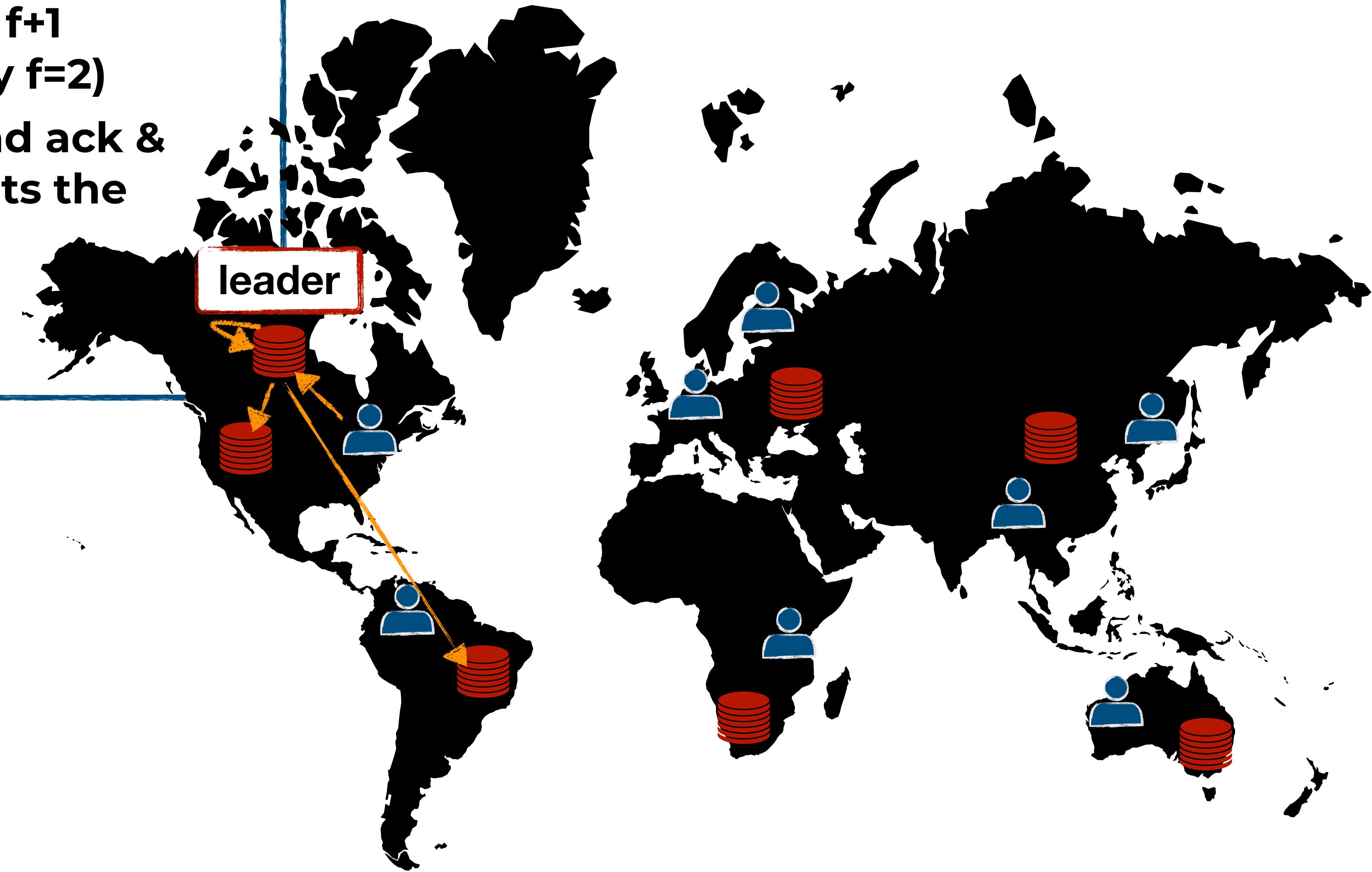
# leader-based SMR (e.g. paxos)

- leader receives command
- forwards it to  $f+1$  acceptors (say  $f=2$ )



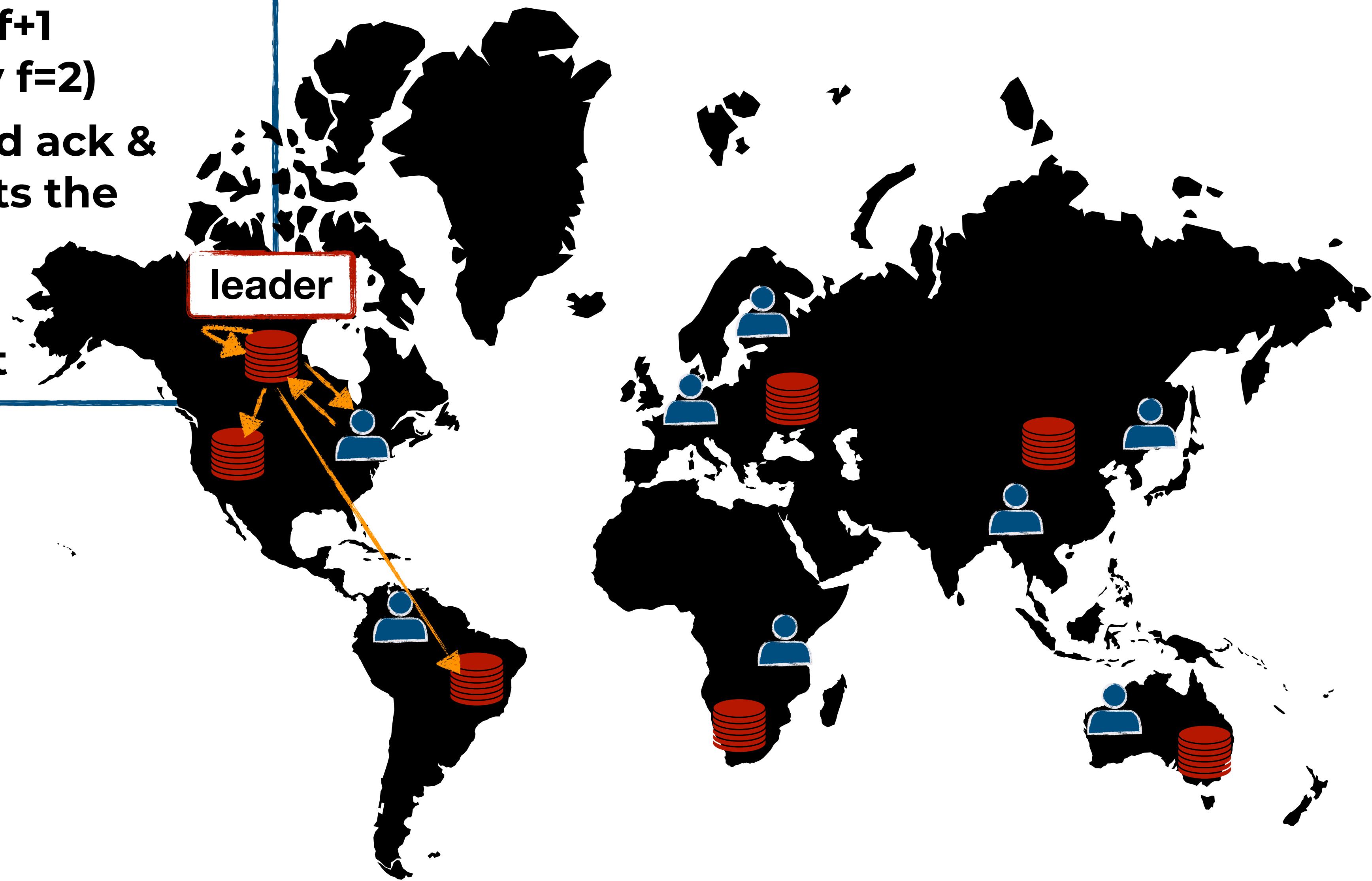
- leader receives command
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- acceptors send ack & leader commits the command

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- leader receives command
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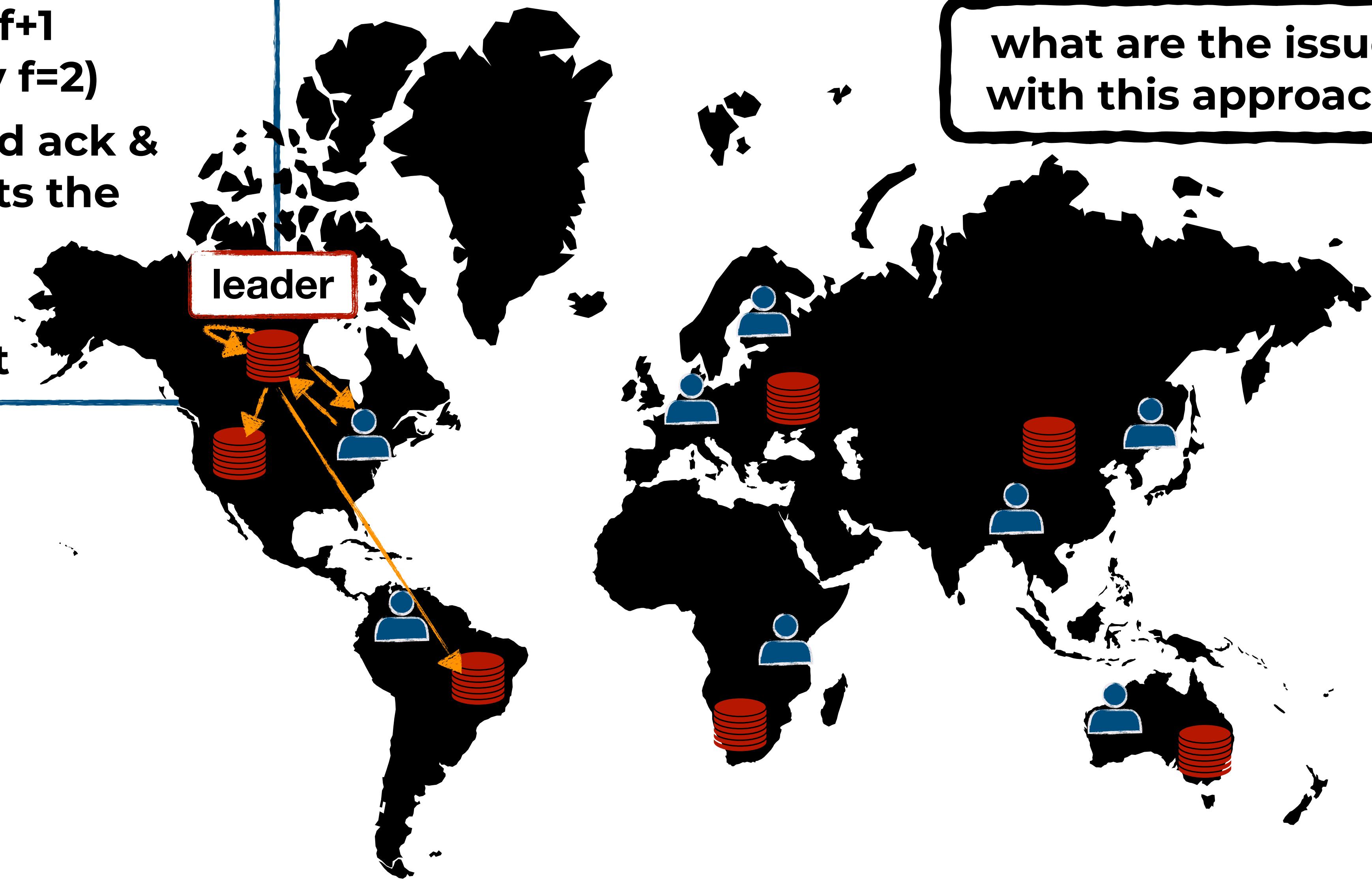
## leader-based SMR (e.g. paxos)



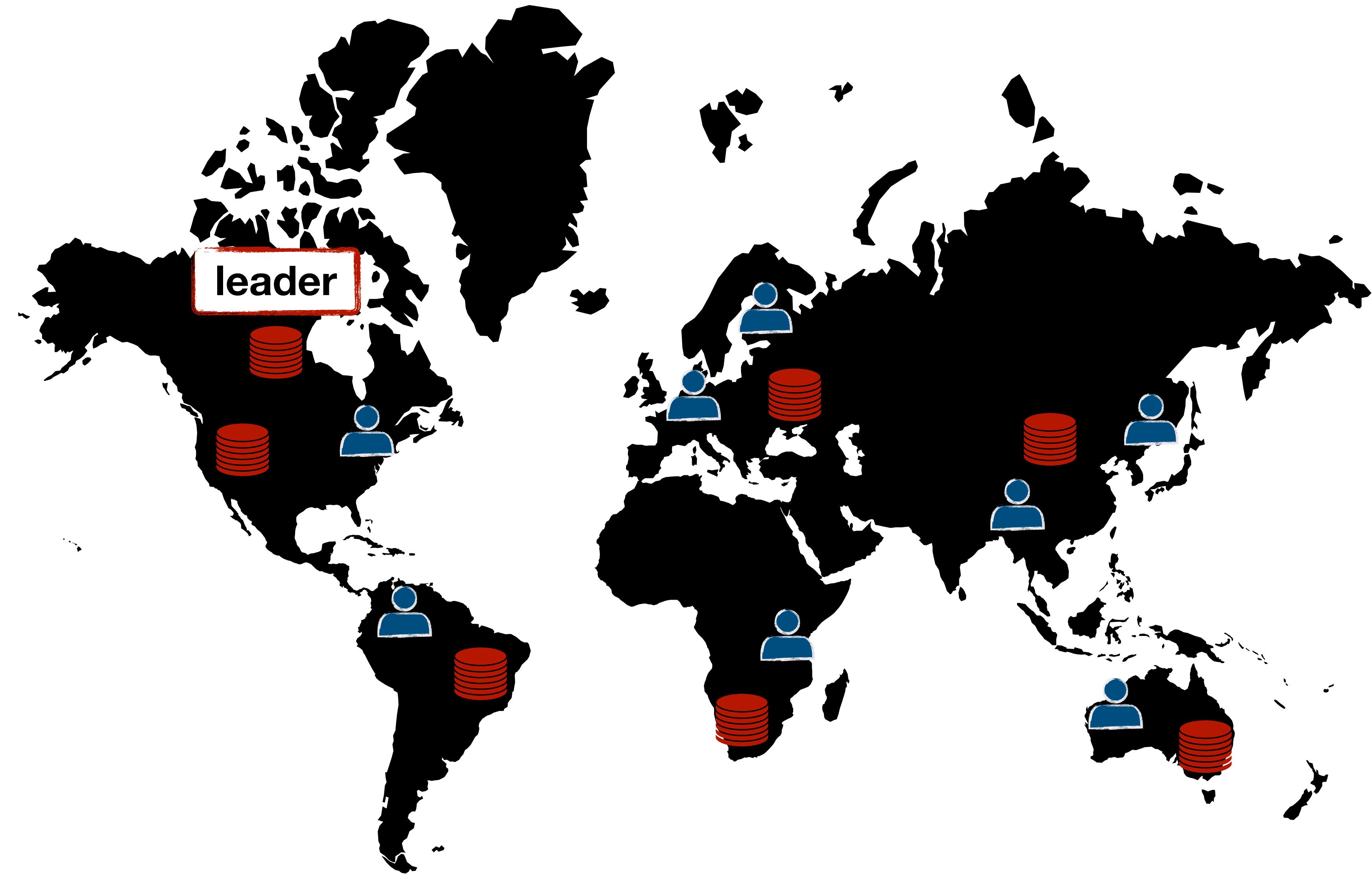
- leader receives command
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## leader-based SMR (e.g. paxos)

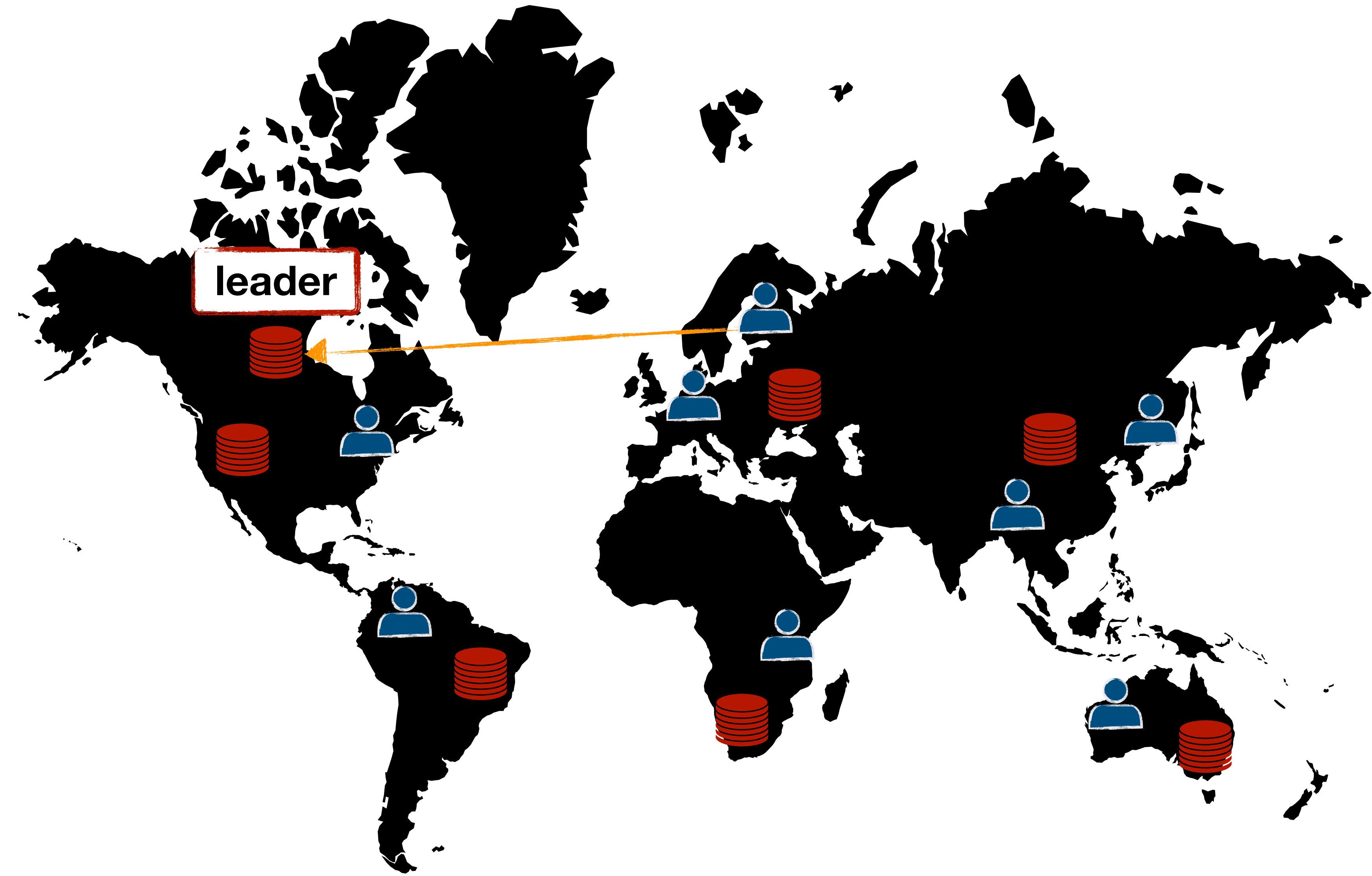
what are the issues with this approach?



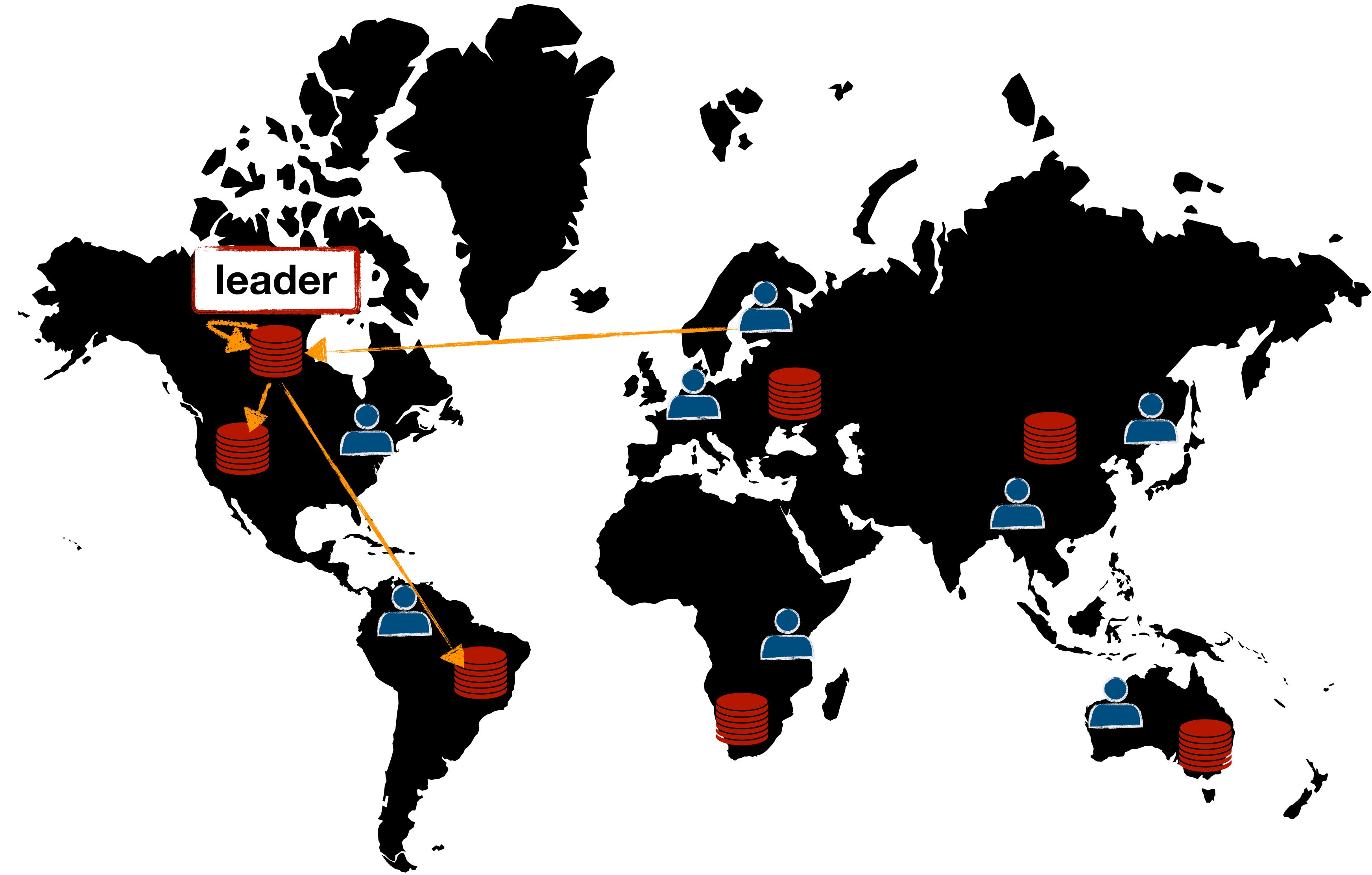
# leader-based SMR pitfalls



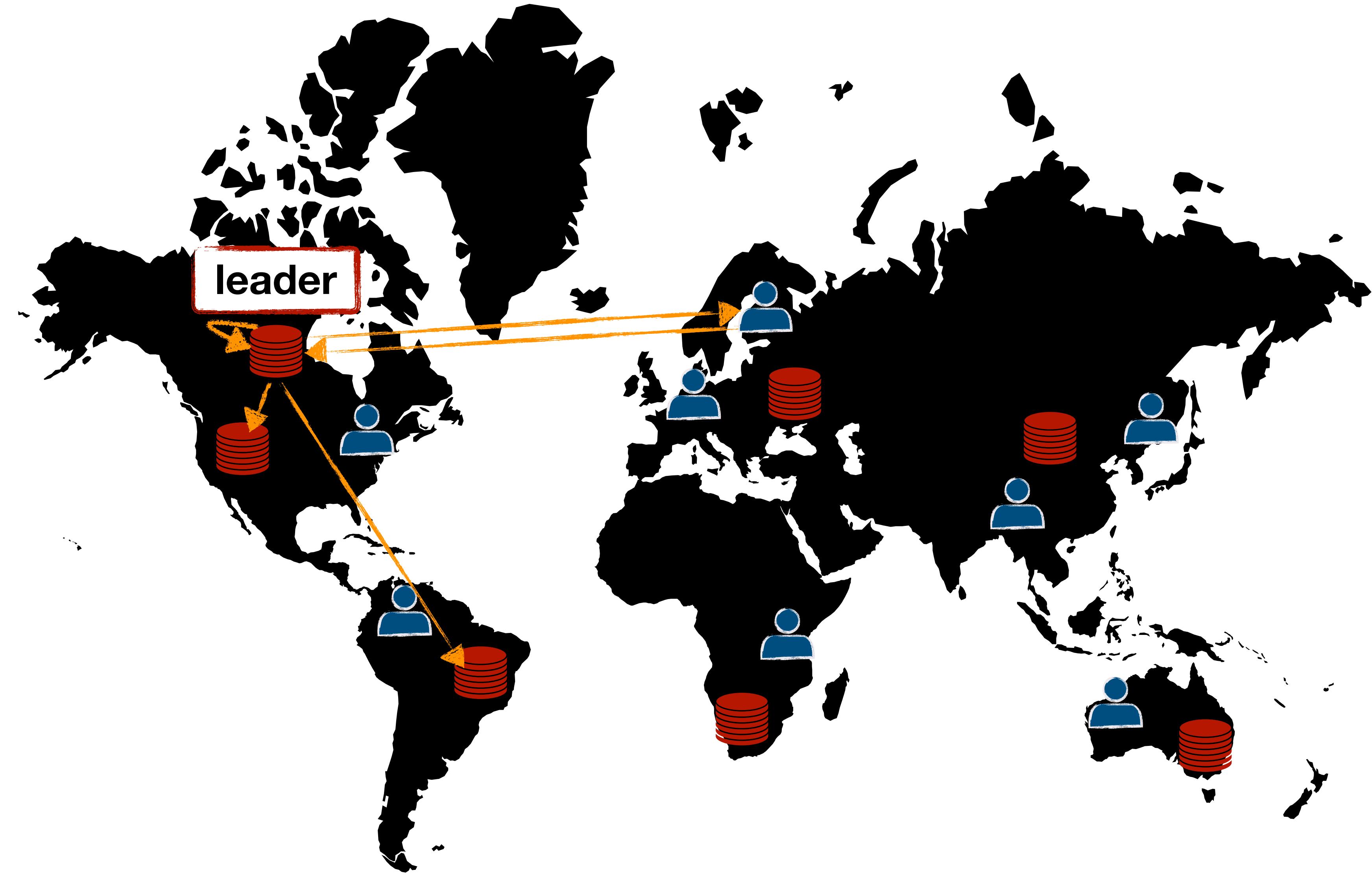
# leader-based SMR pitfalls



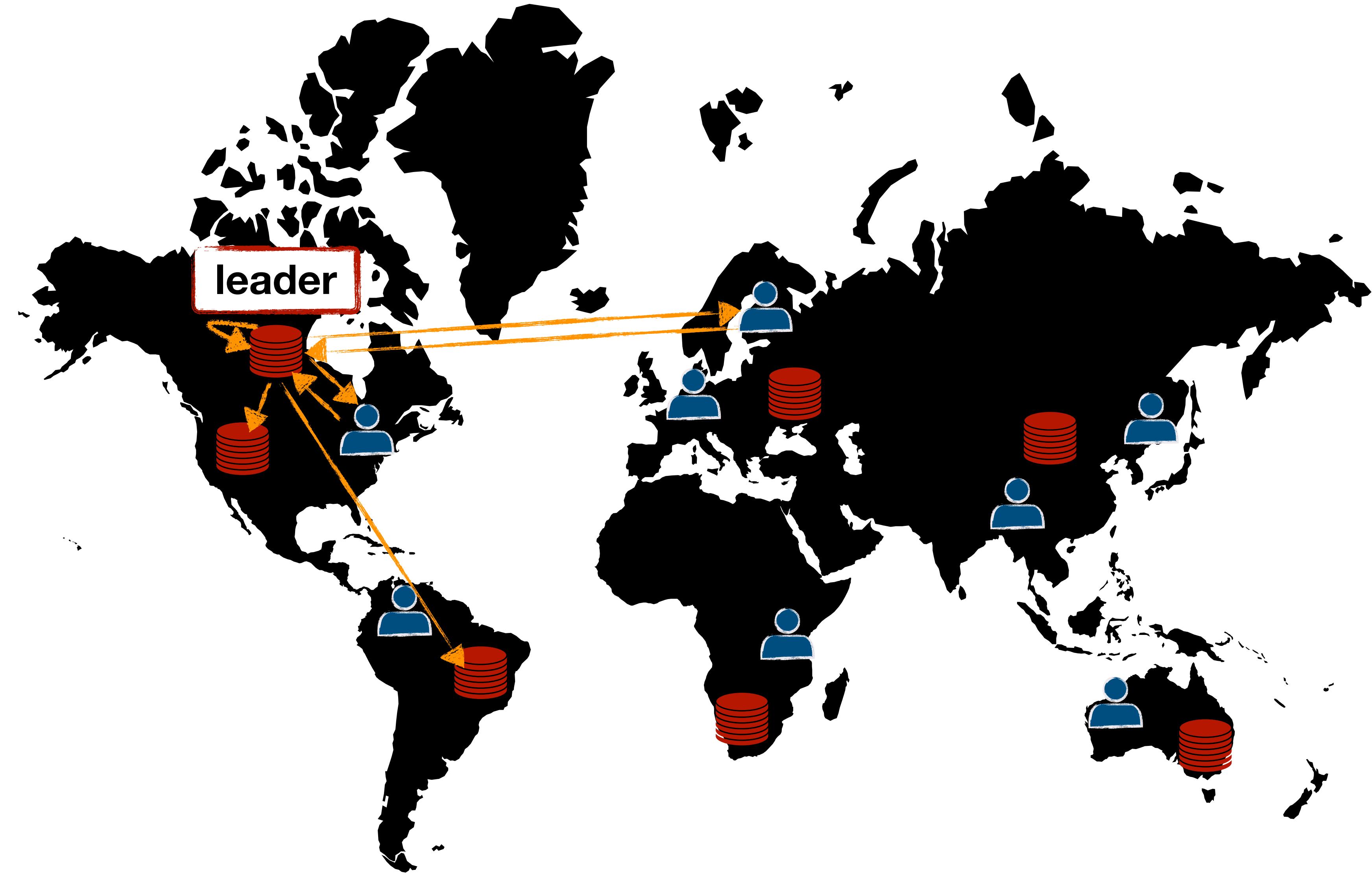
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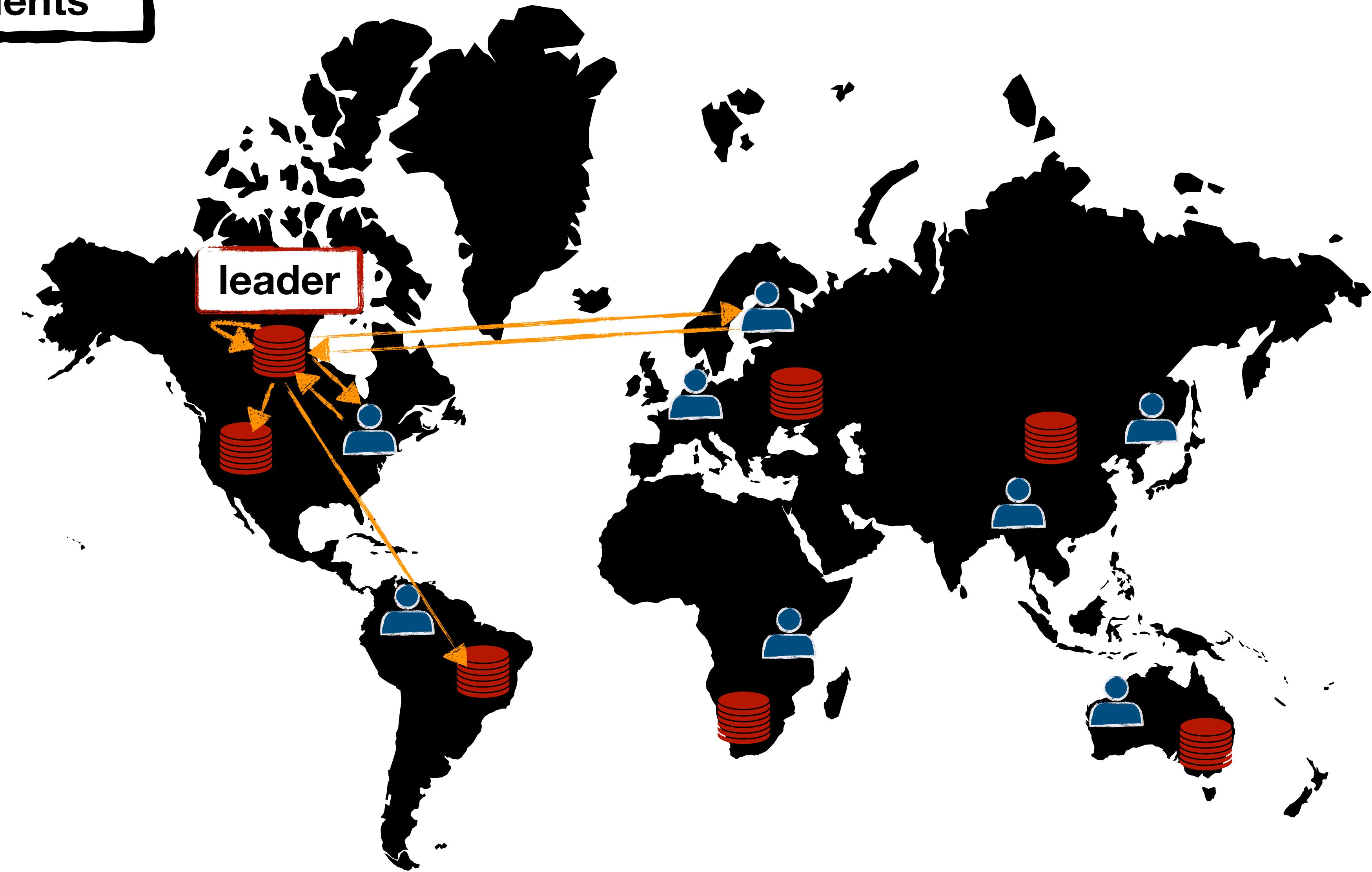


# leader-based SMR pitfalls



# leader-based SMR pitfalls

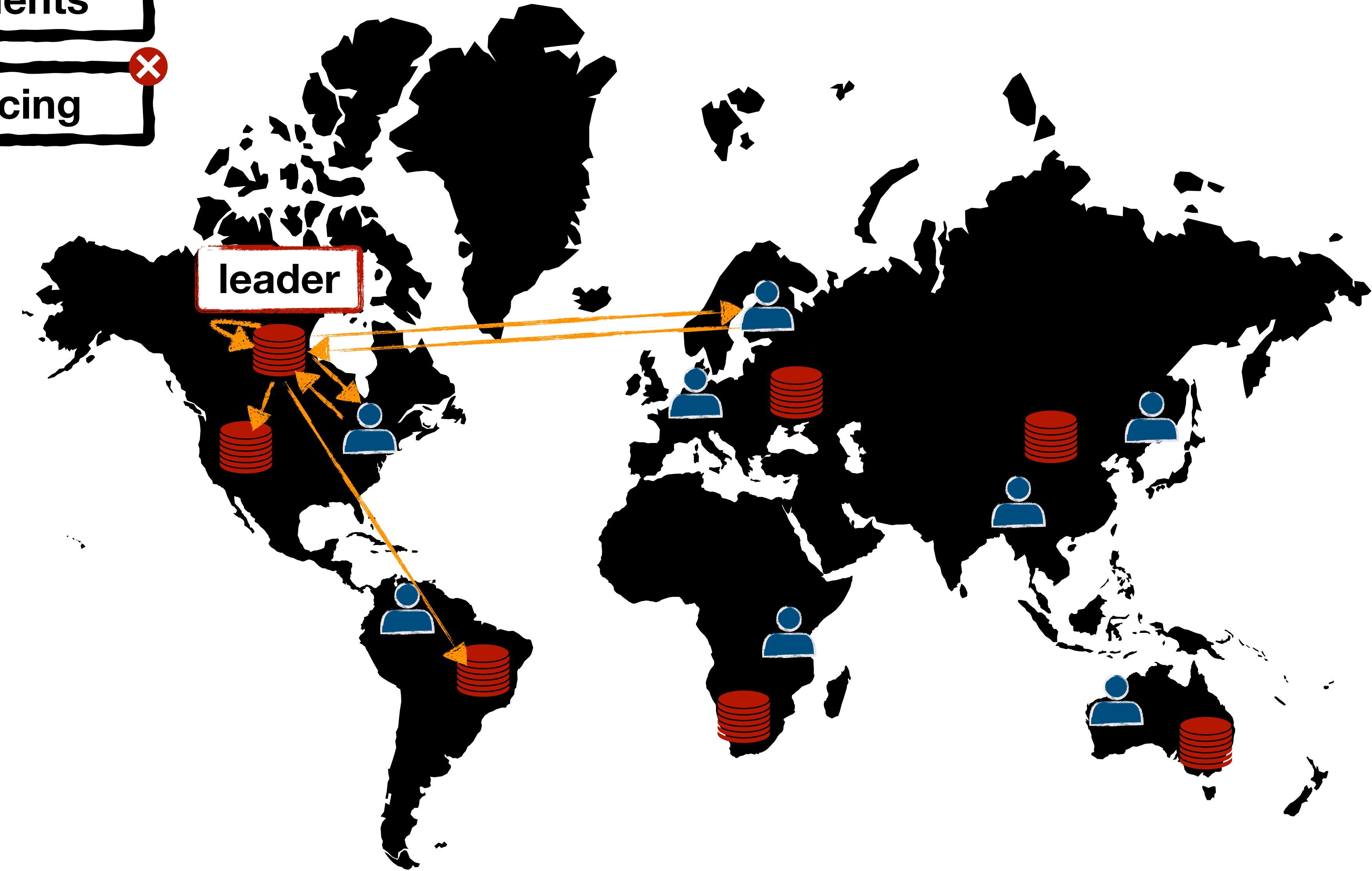
unfairness/high latency  
for faraway clients



# leader-based SMR pitfalls

unfairness/high latency  
for faraway clients

no load balancing

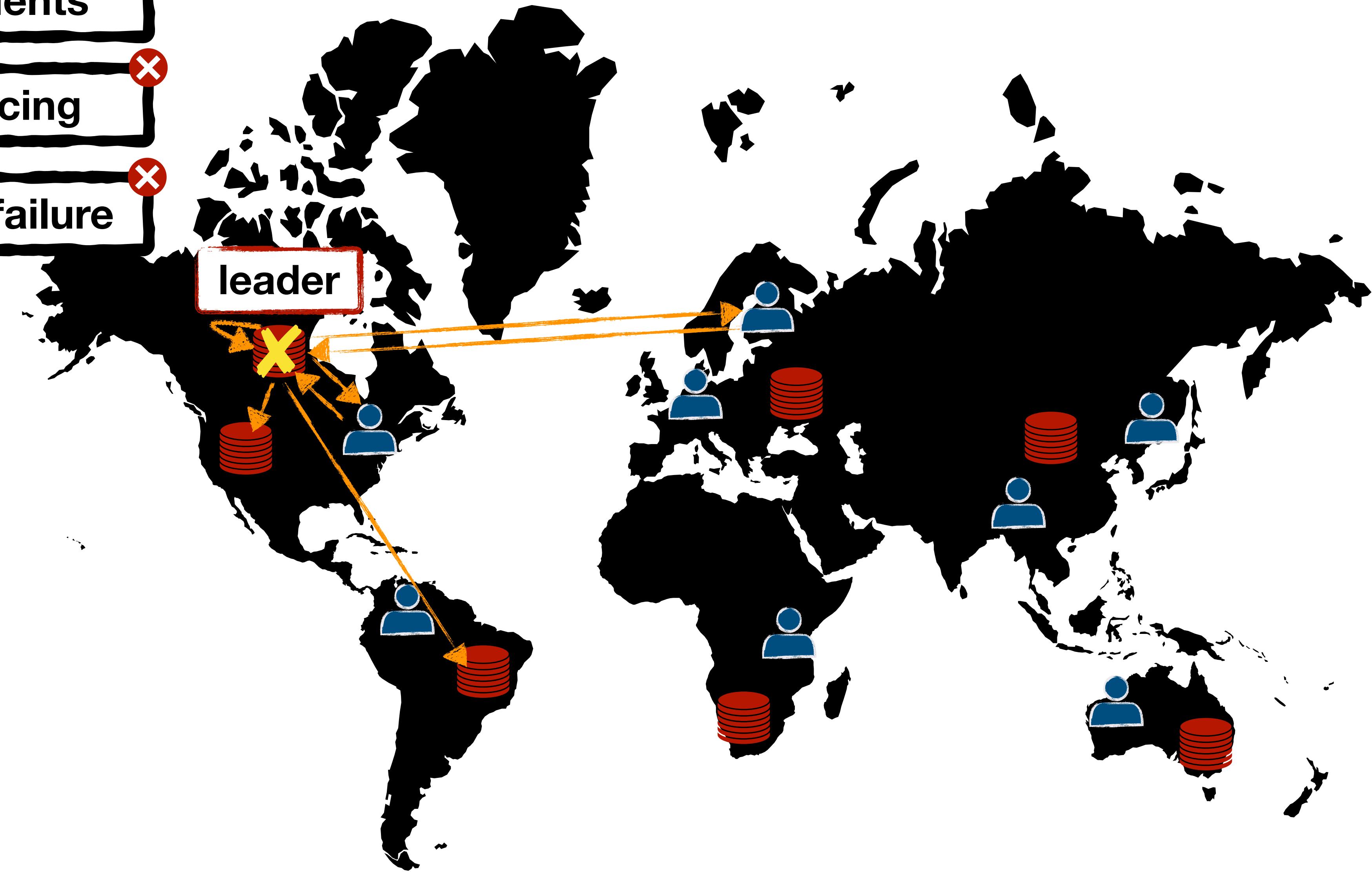


# leader-based SMR pitfalls

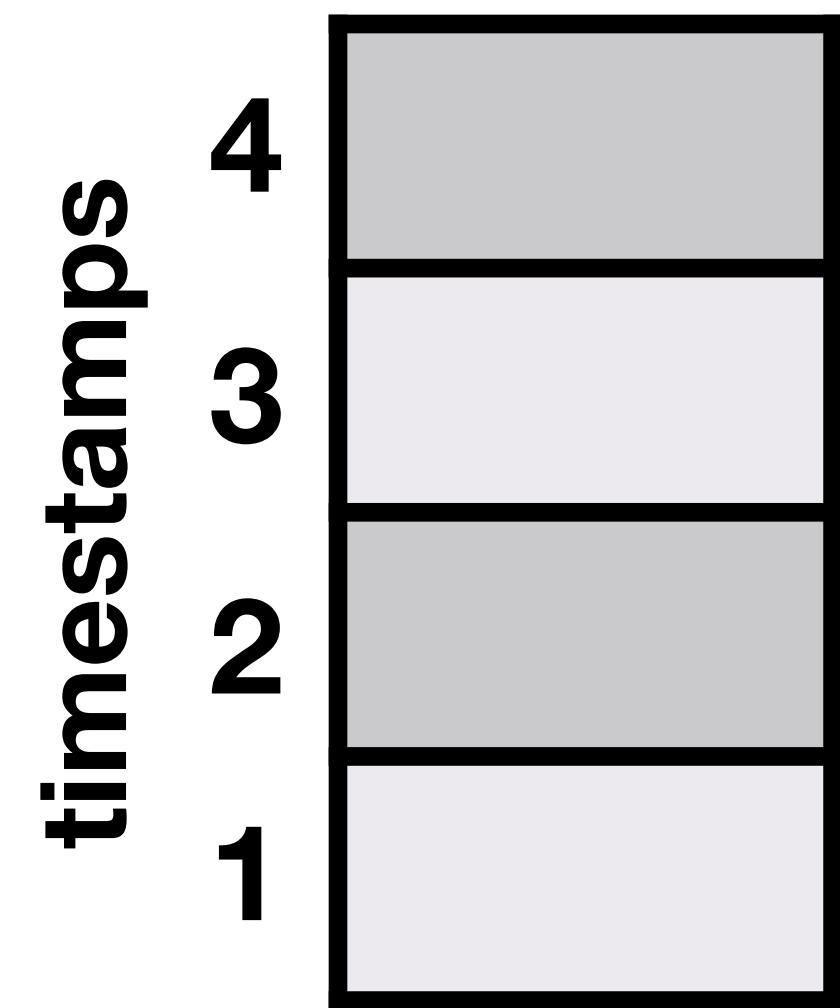
unfairness/high latency  
for faraway clients

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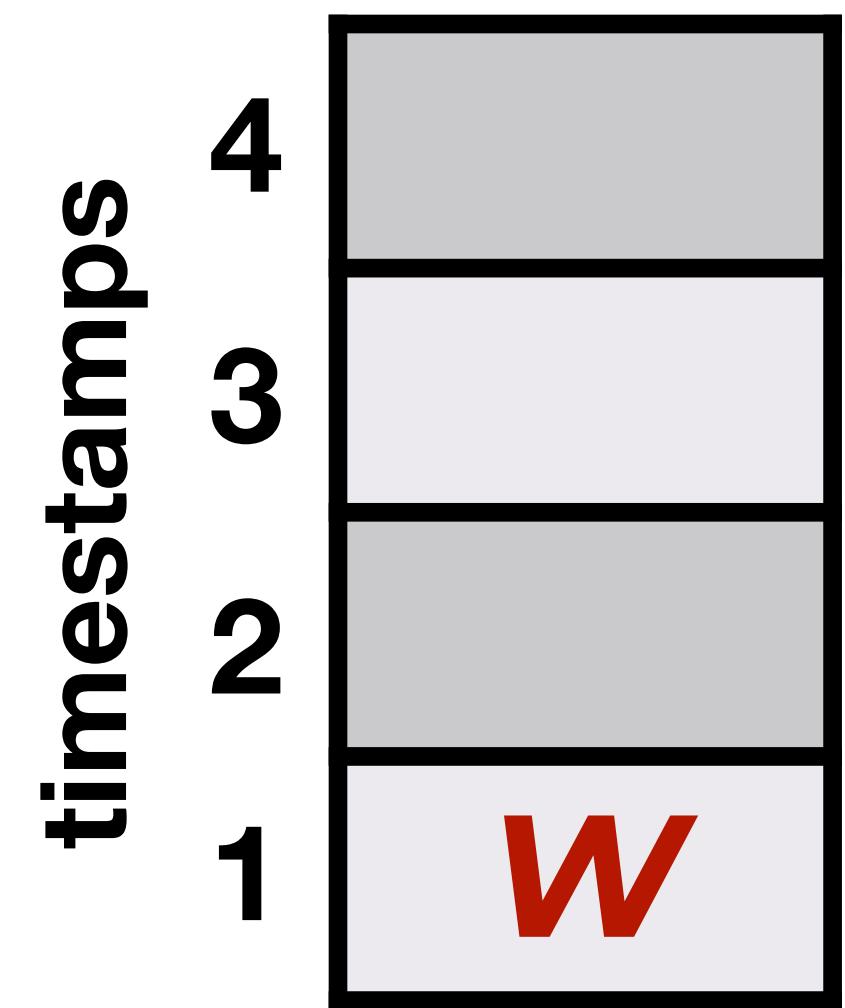
single point of failure



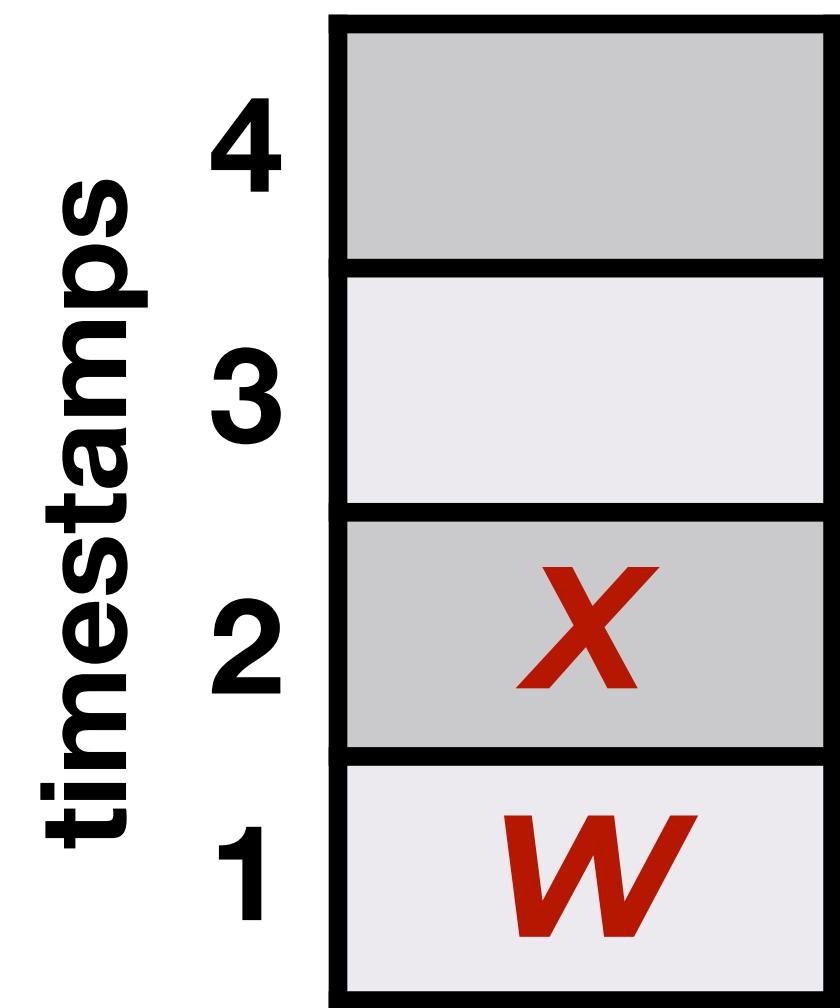
# paxos log



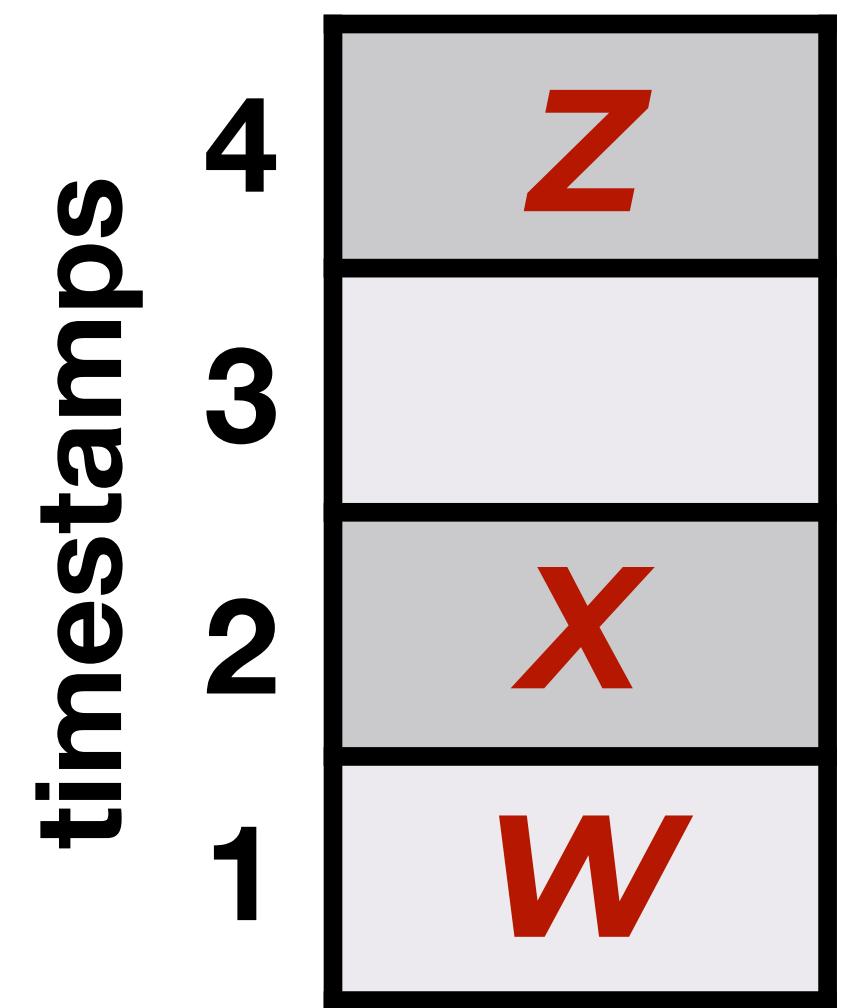
# paxos log



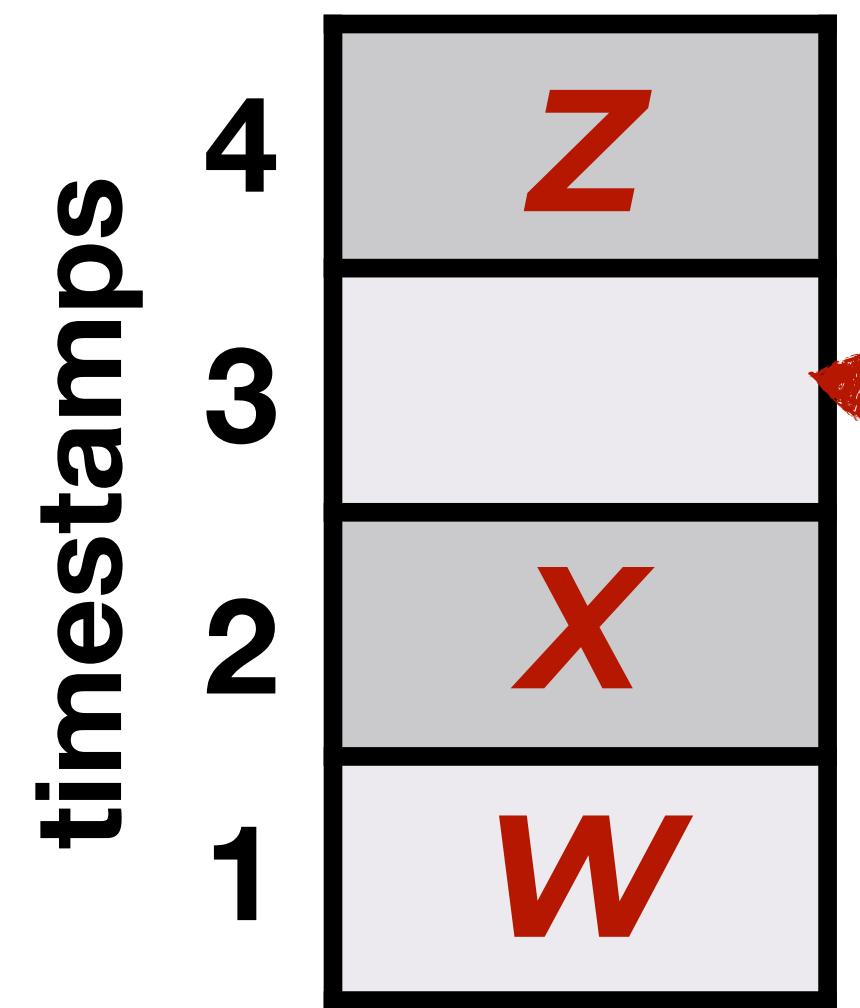
# paxos log



# paxos log



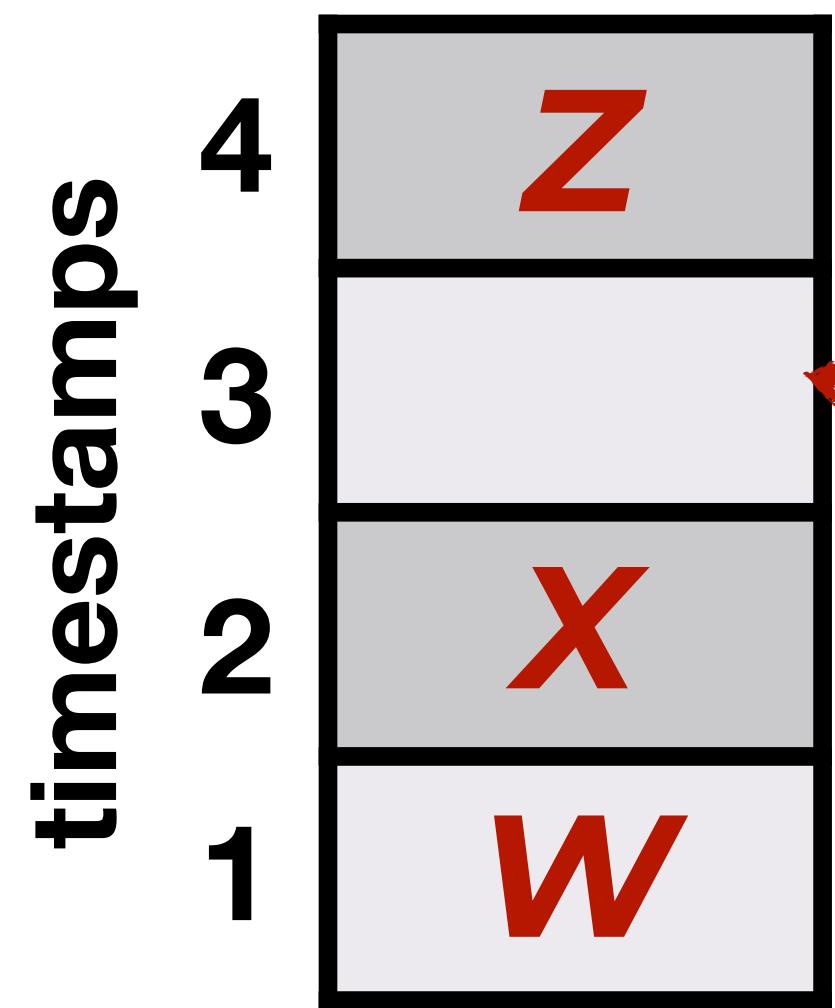
## paxos log



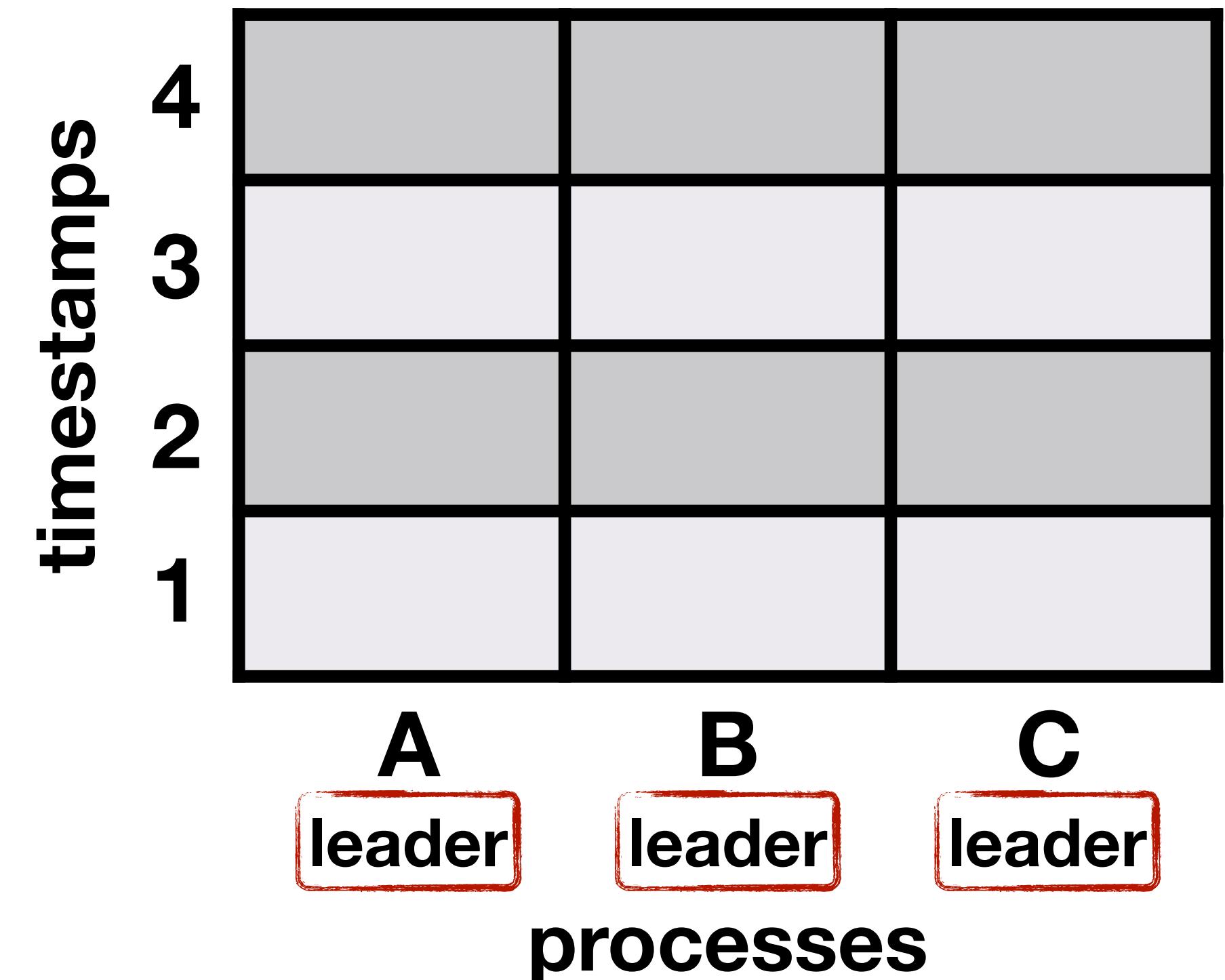
**Z** can't be executed until the command with timestamp 3 is committed

# multi-leader SMR (e.g. mencius)

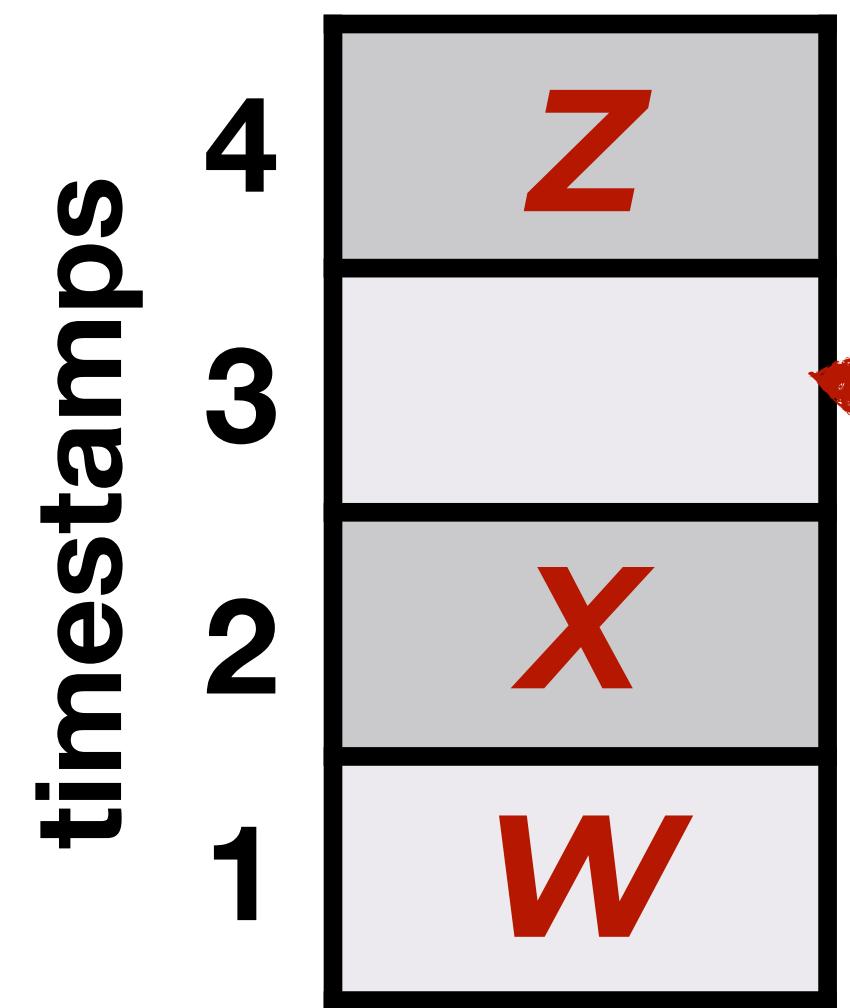
paxos log



Z can't be executed until the command with timestamp 3 is committed

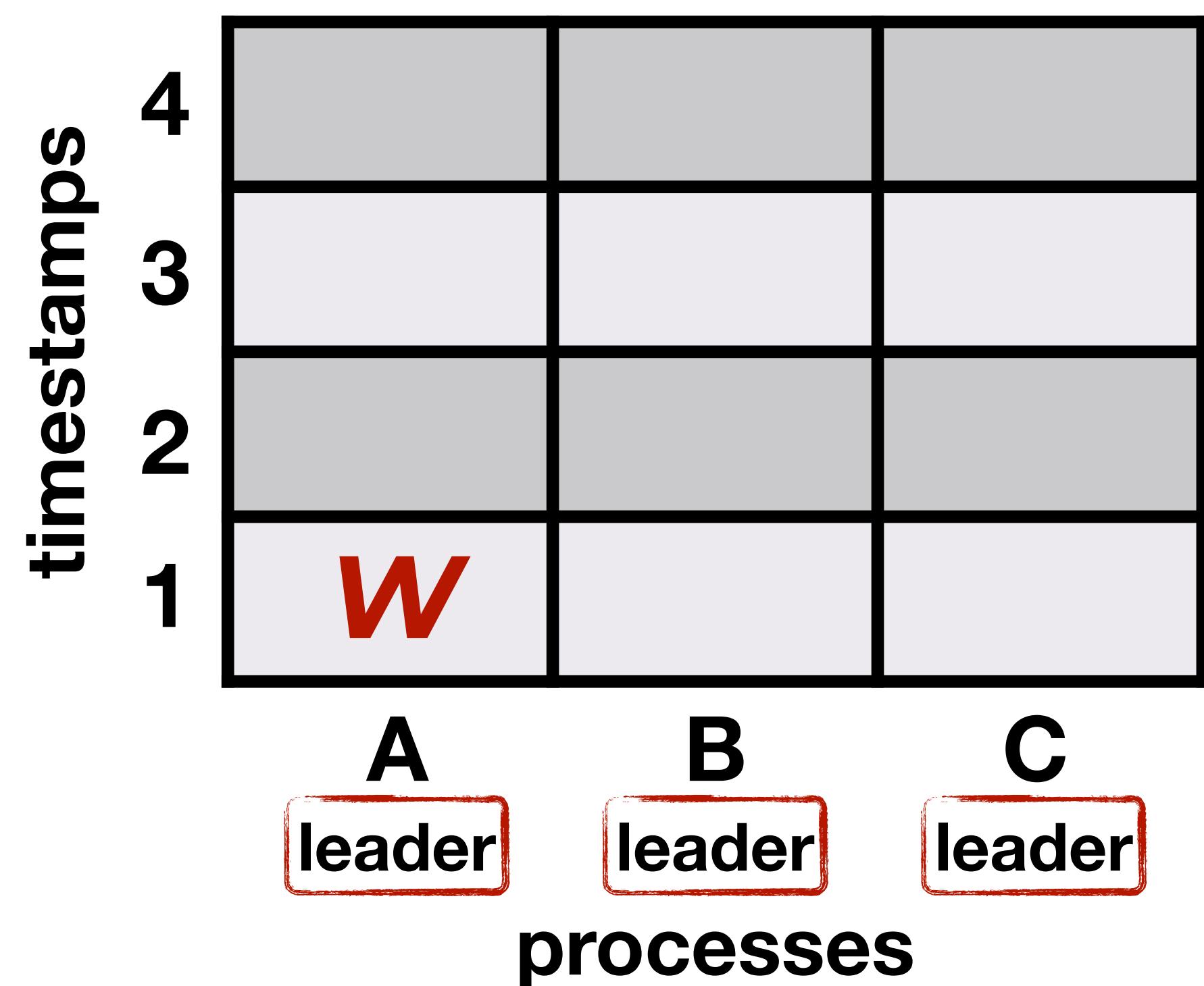


## paxos log

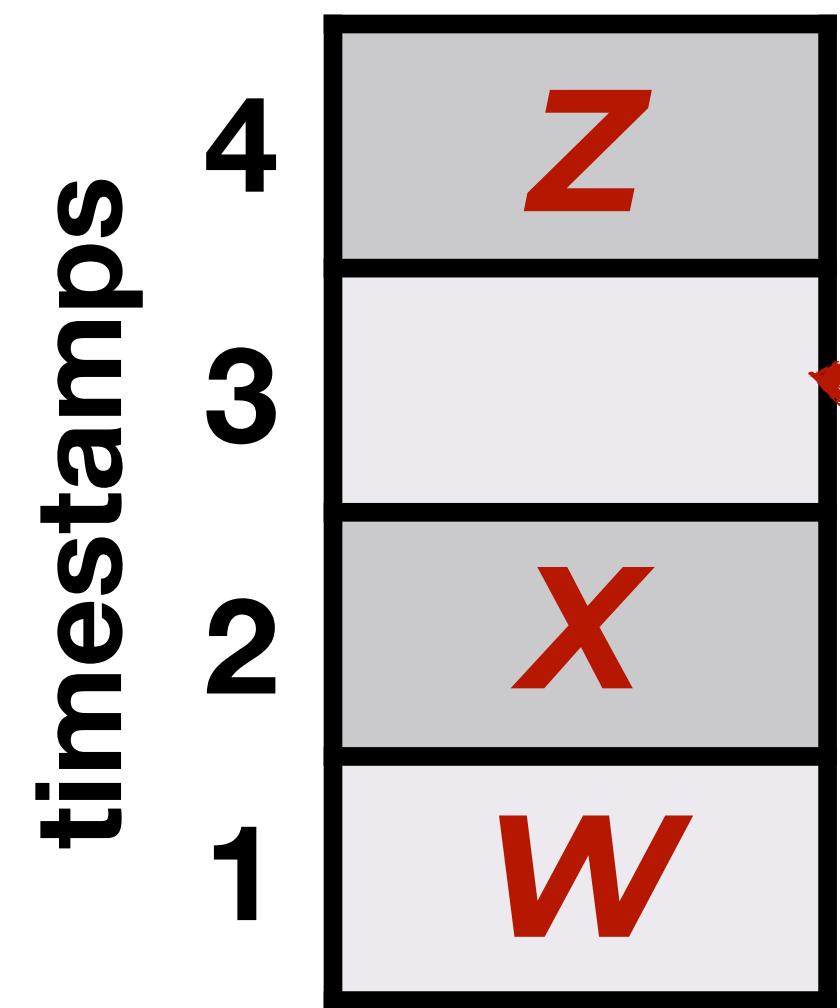


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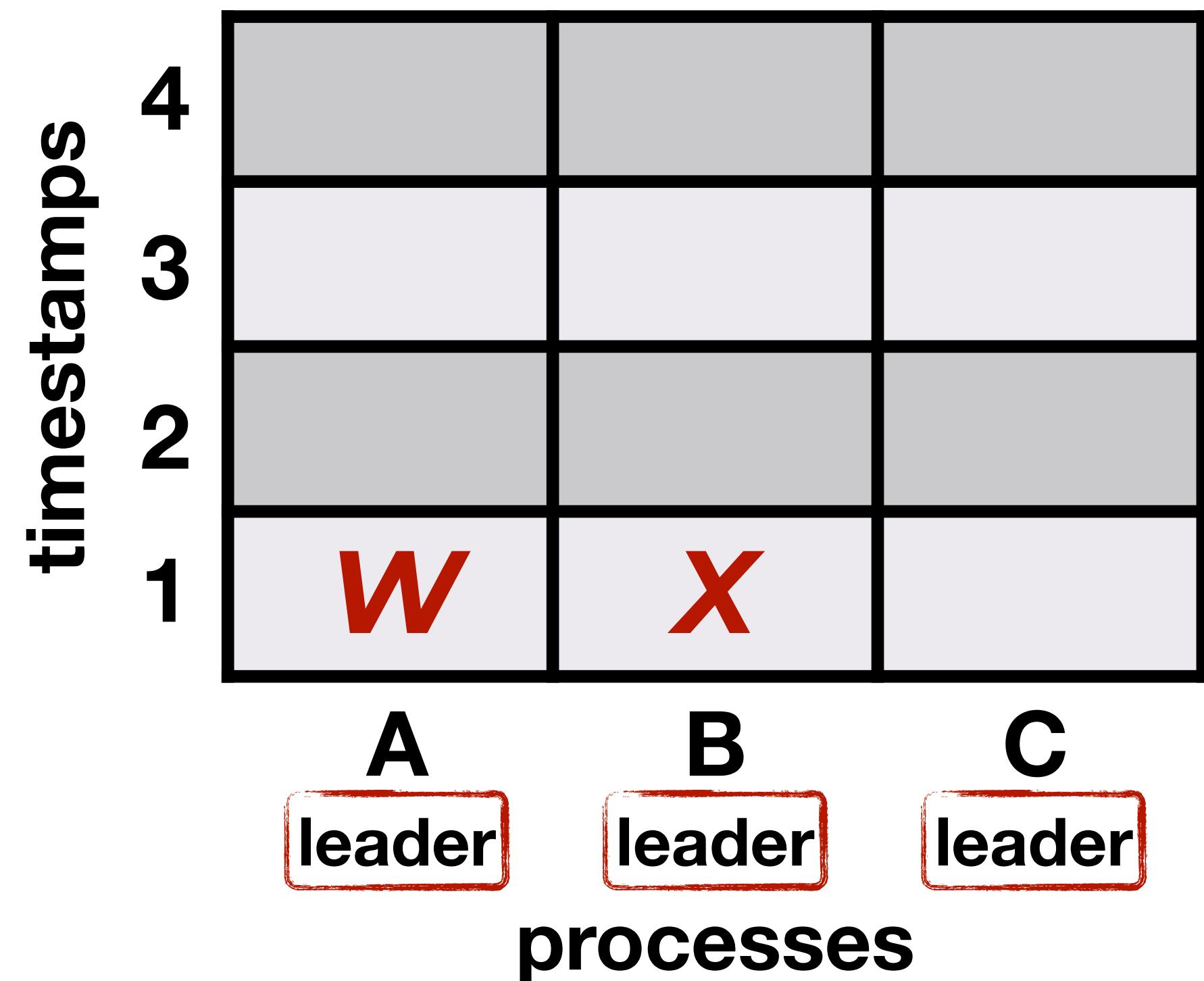


## paxos log



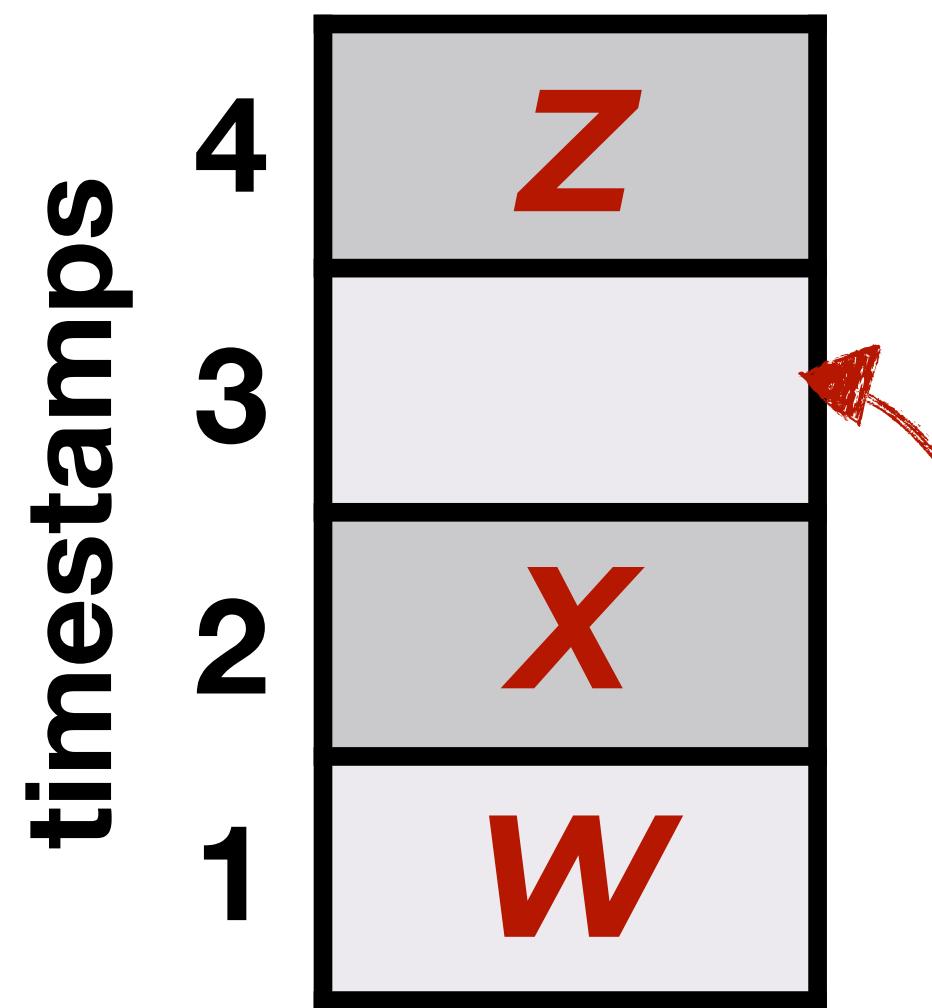
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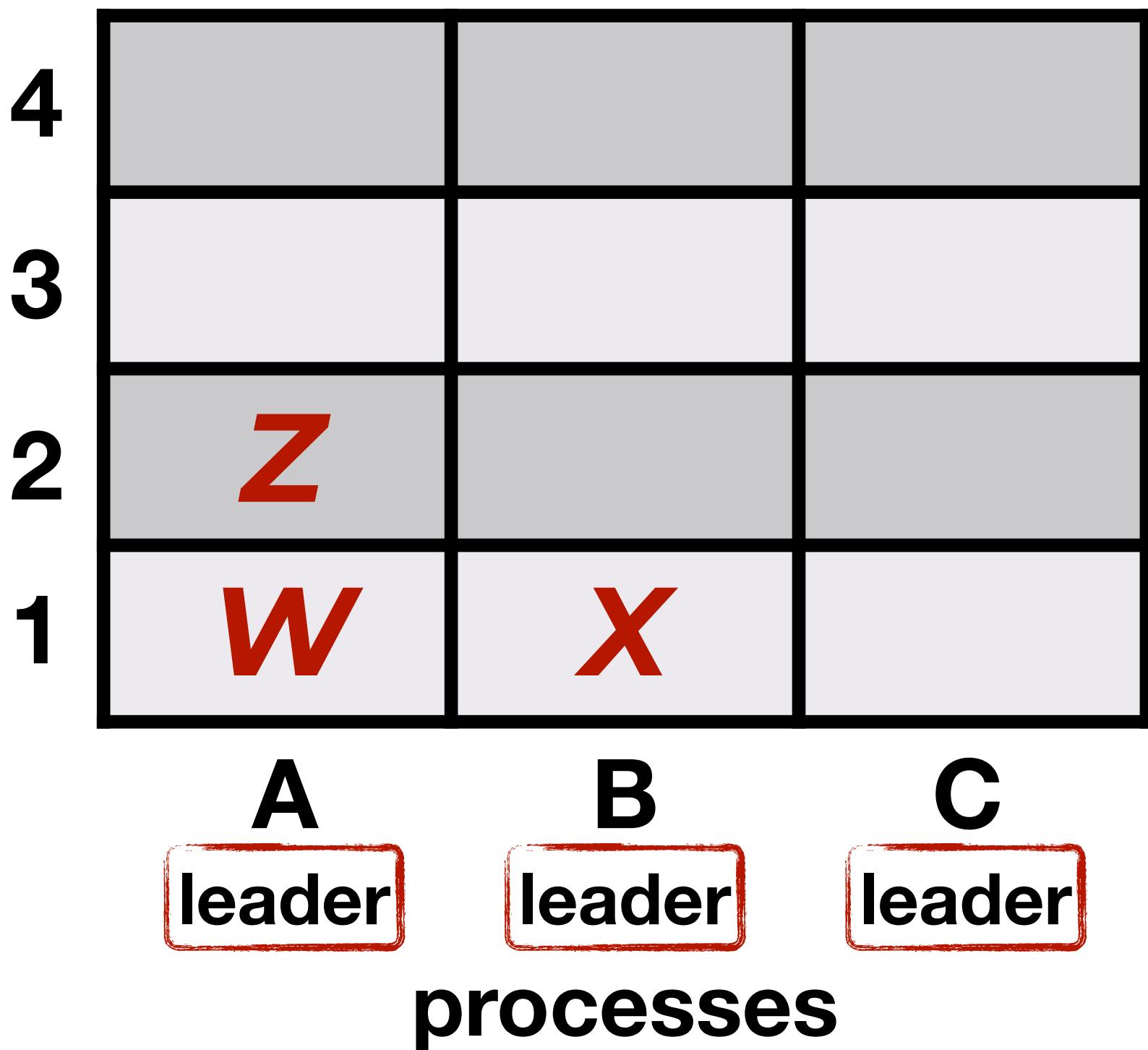
# multi-leader SMR (e.g. mencius)

# paxos log



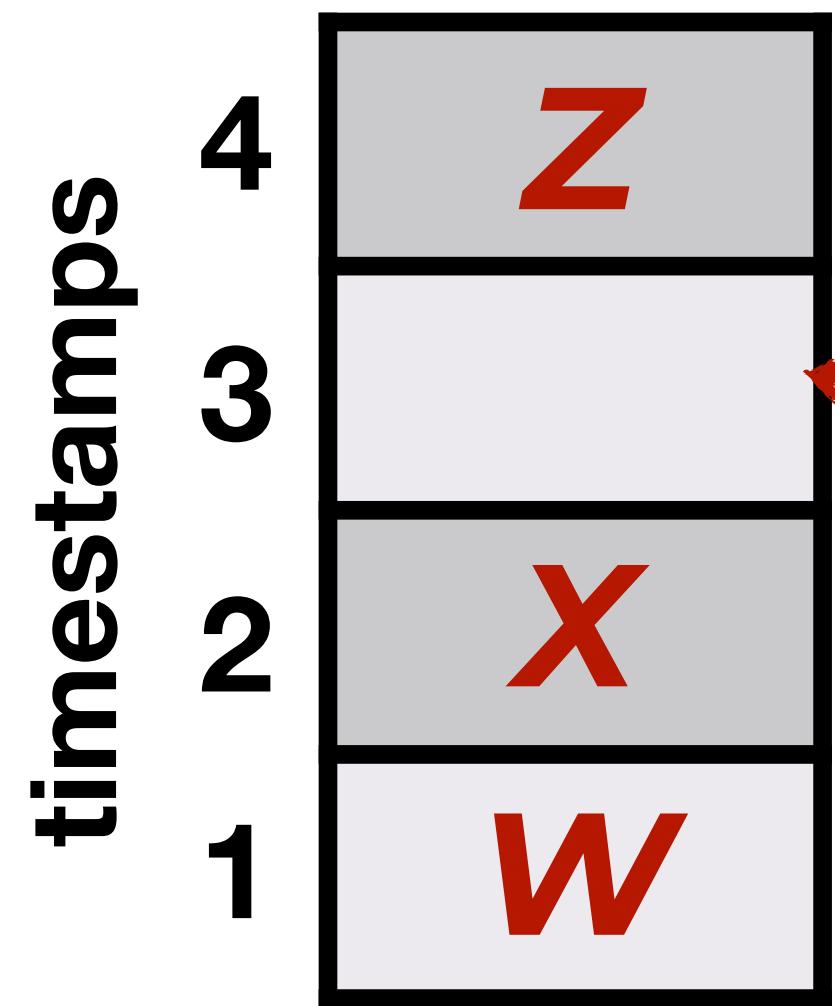
**Z** can't be executed until the command with timestamp 3 is committed

# timestamps

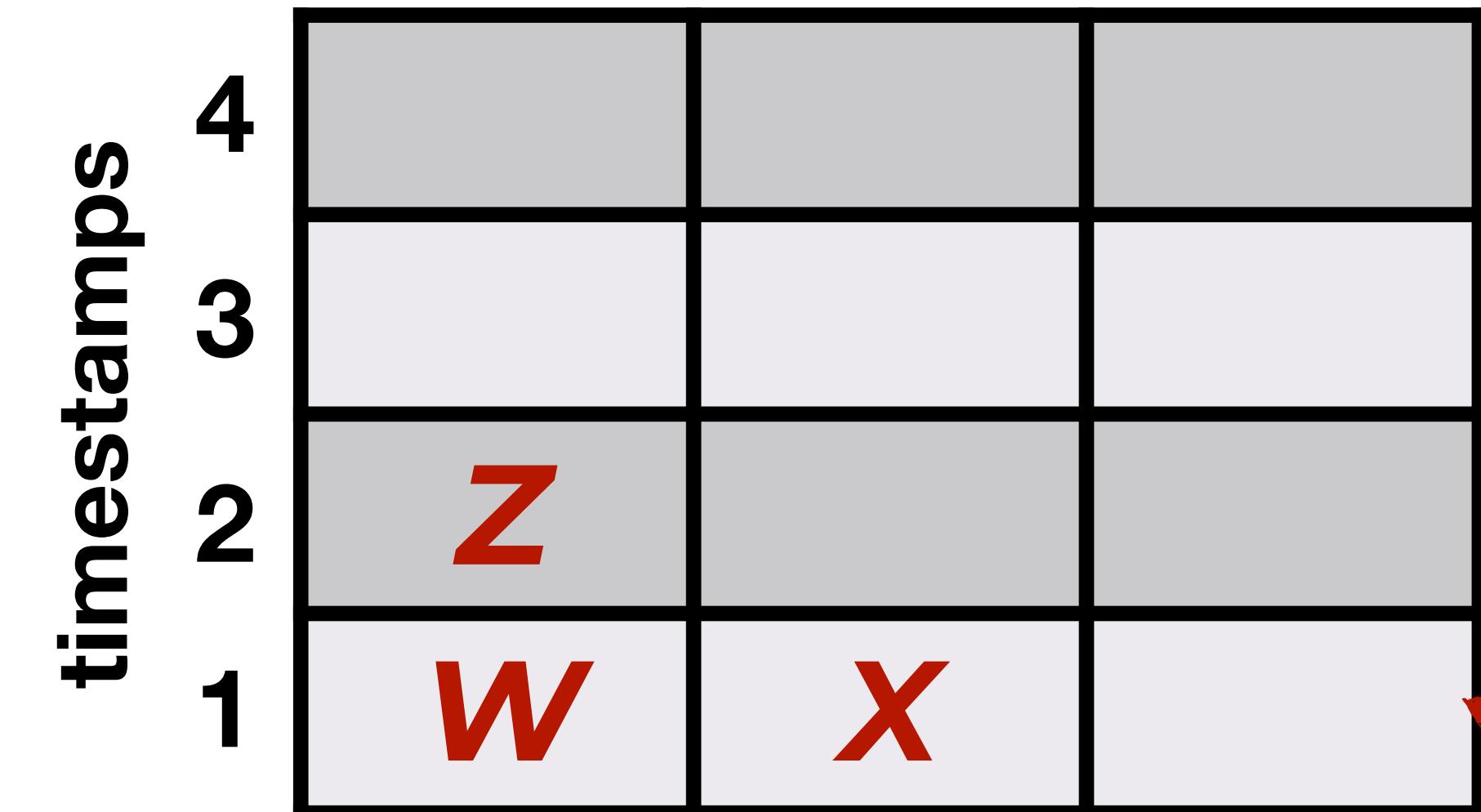


# multi-leader SMR (e.g. mencius)

paxos log



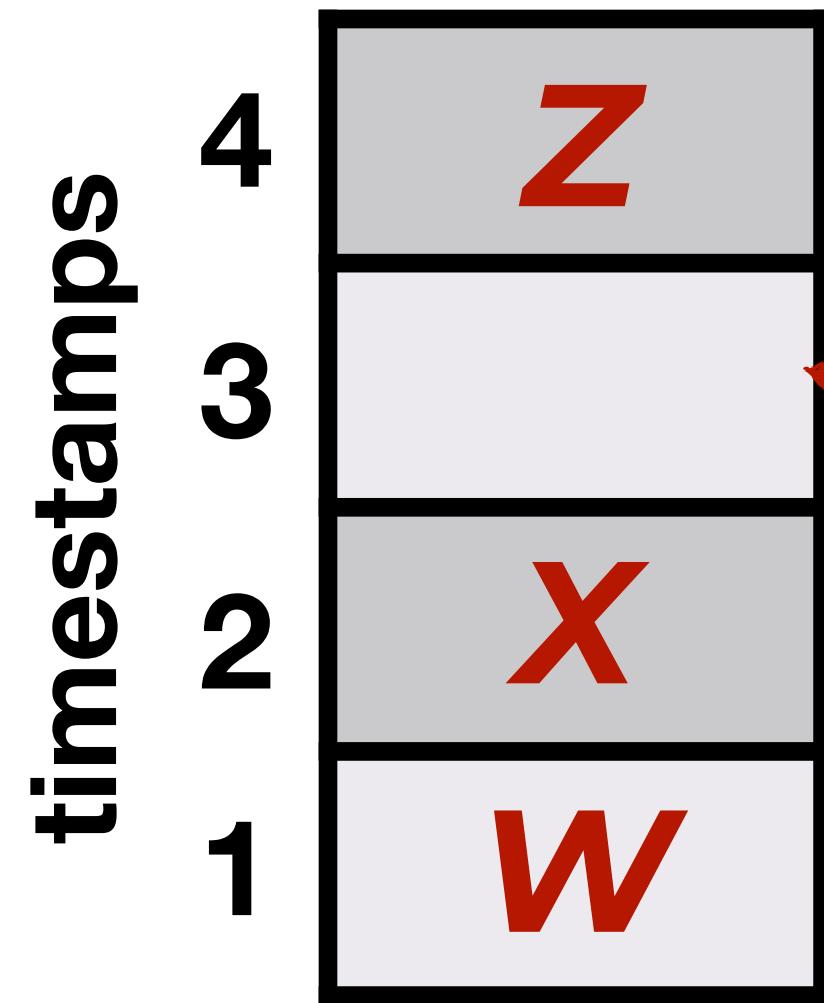
Z can't be executed until the command with timestamp 3 is committed



A  
leader  
B  
leader  
C  
leader  
processes

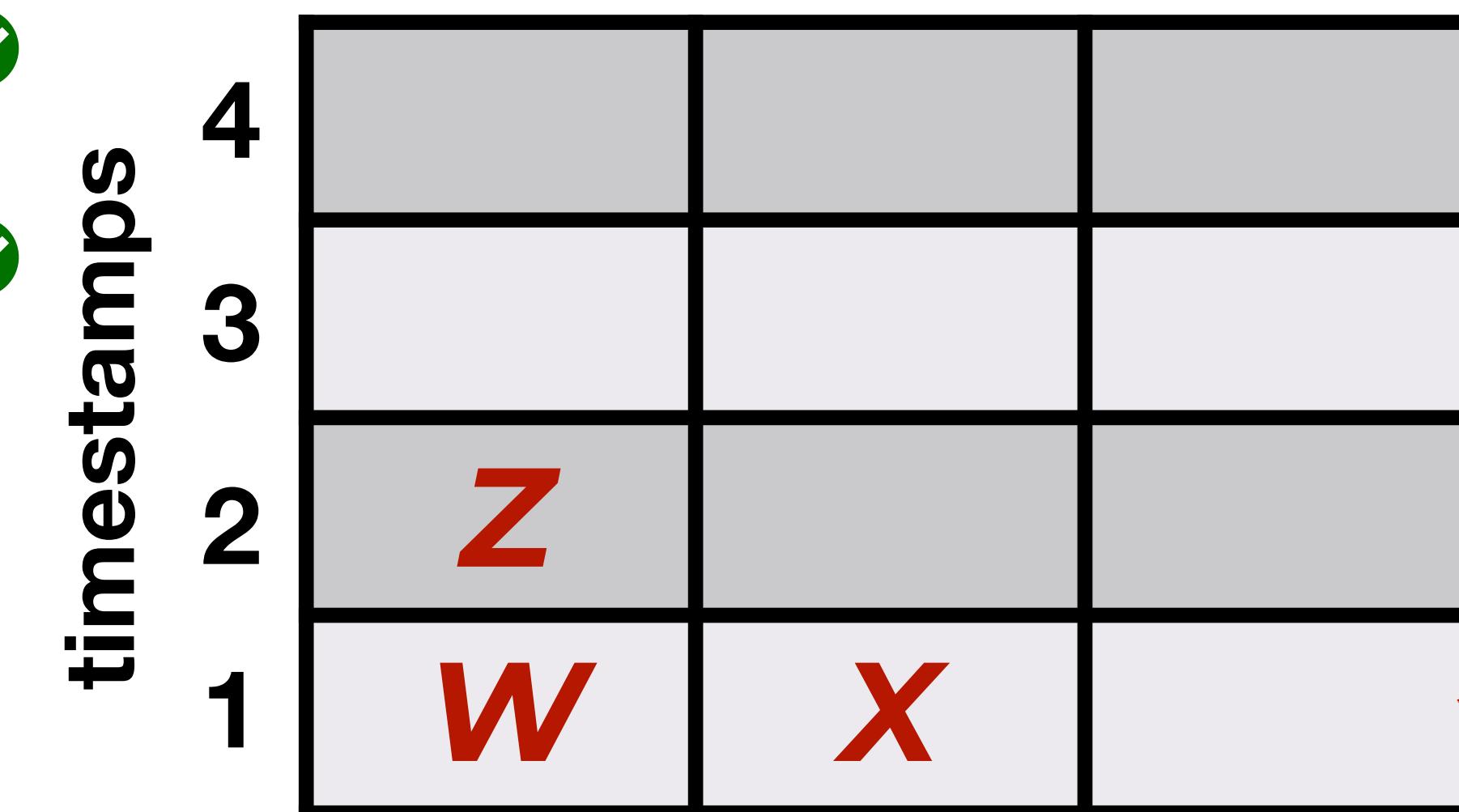
Z can't be executed until the command with timestamp 1 by **leader C** is committed

## paxos log



**Z** can't be executed until the command with timestamp 3 is committed

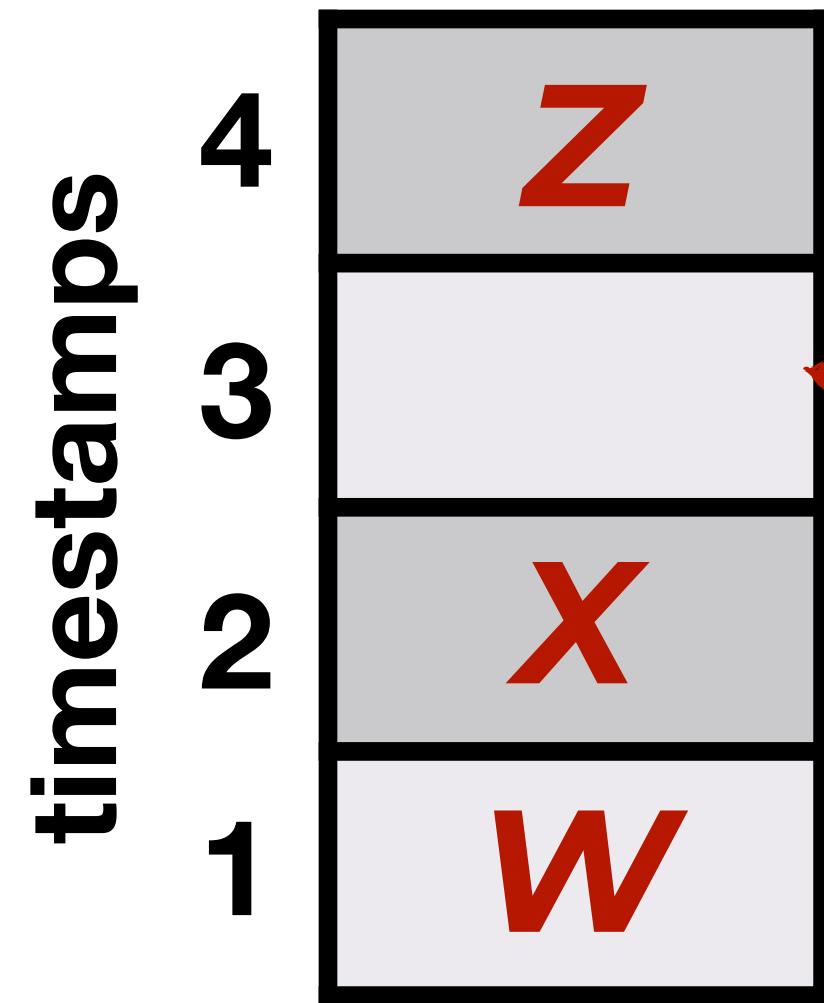
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leader  
B  
leader  
C  
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processes

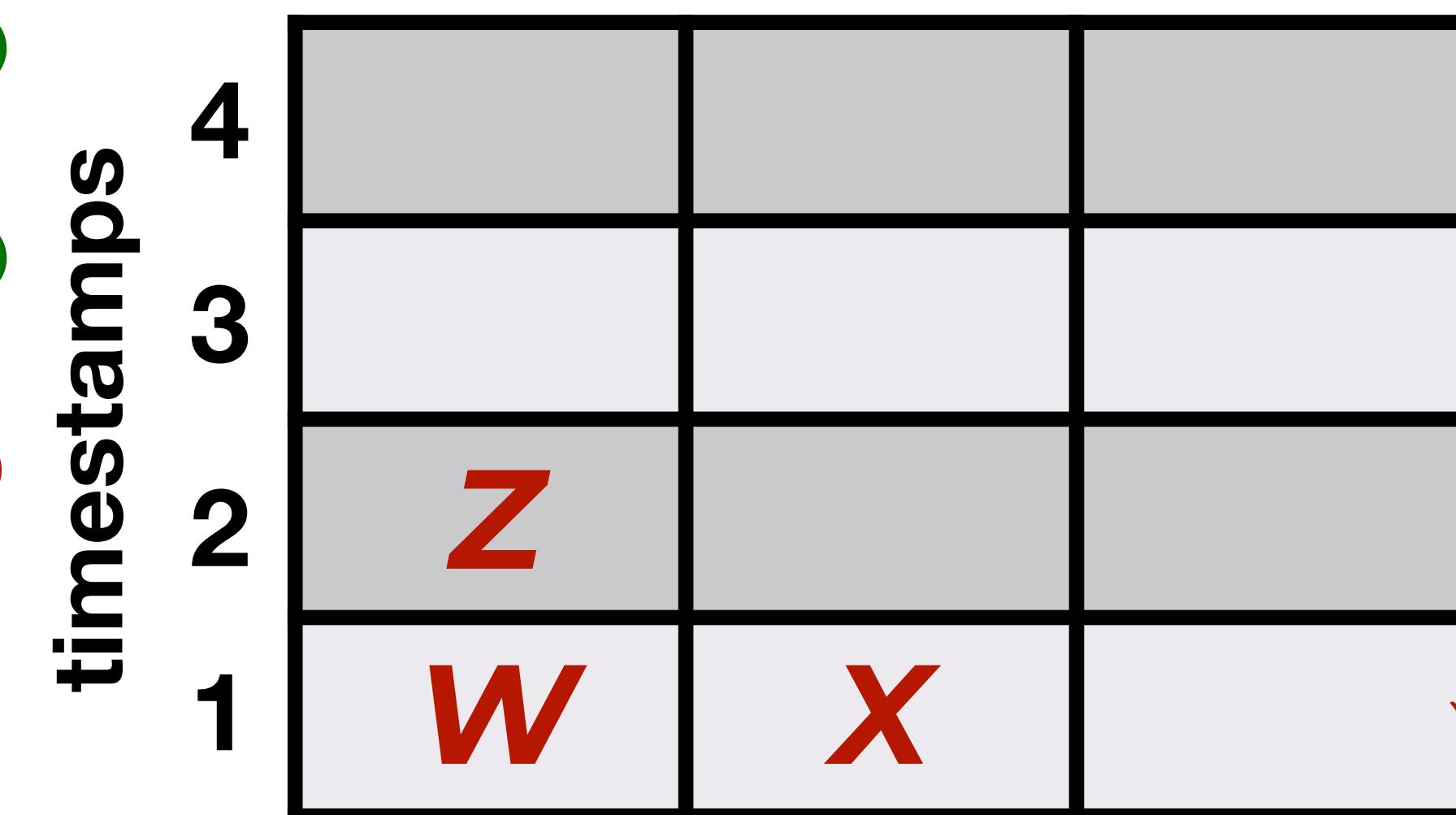
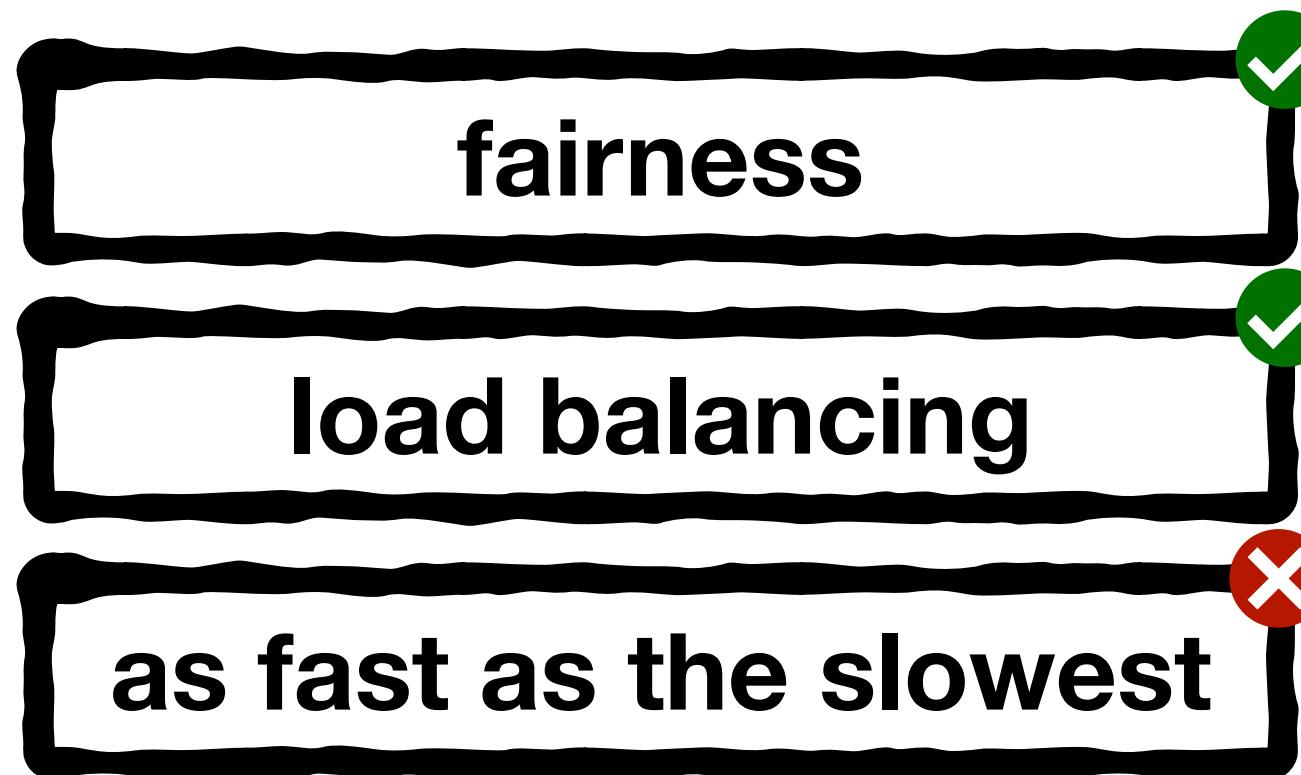
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## paxos log



**Z** can't be executed until the command with timestamp 3 is committed

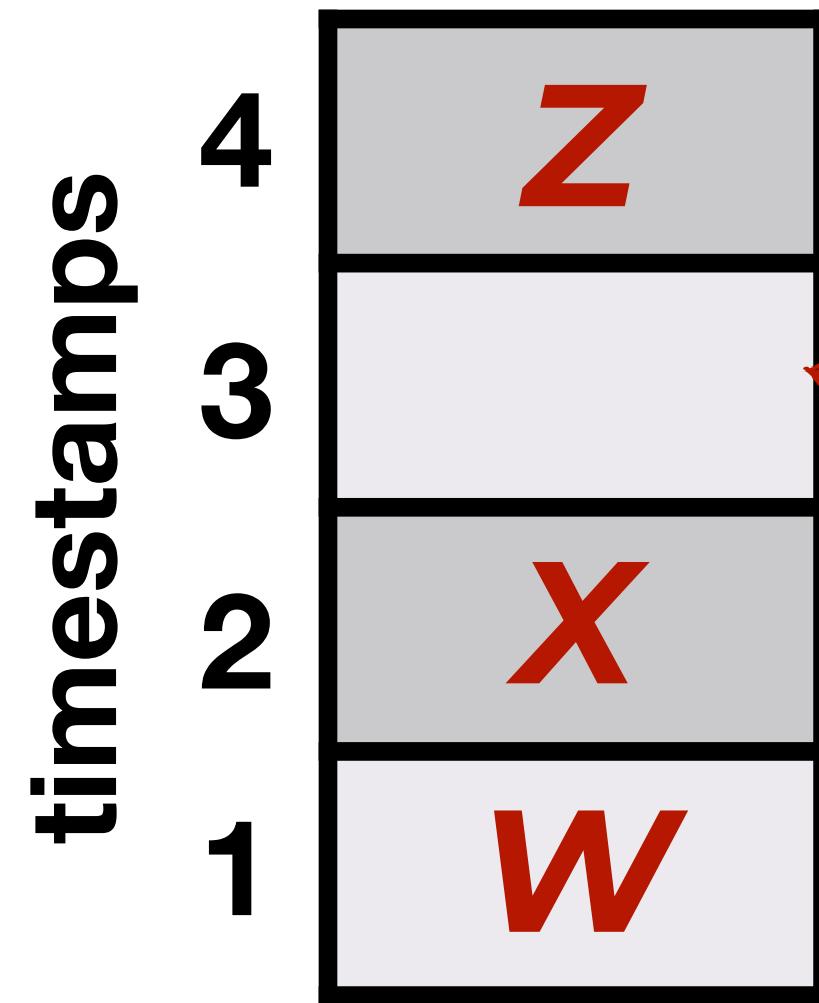
## multi-leader SMR (e.g. mencius)



**A**  
leader  
**B**  
leader  
**C**  
leader  
**processes**

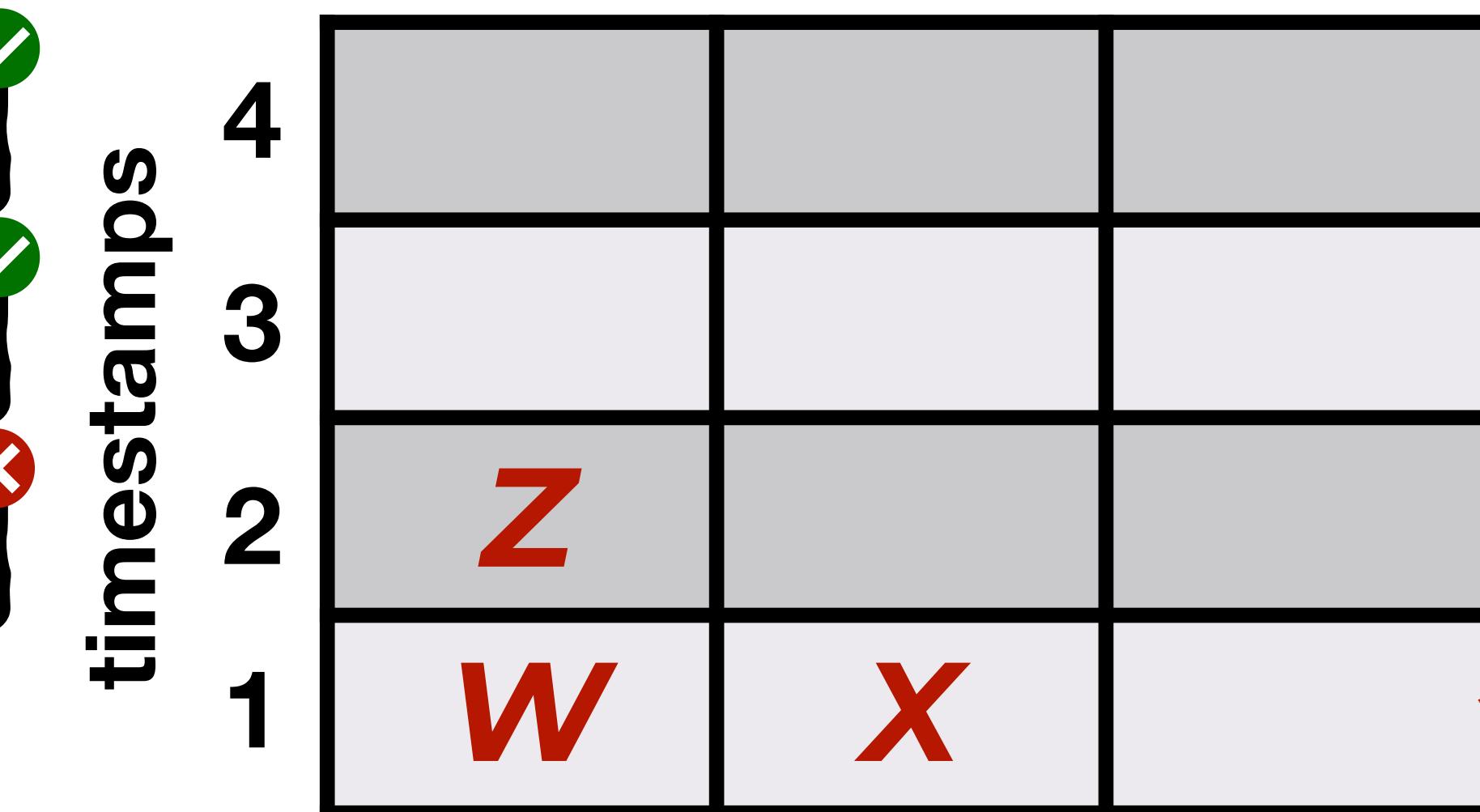
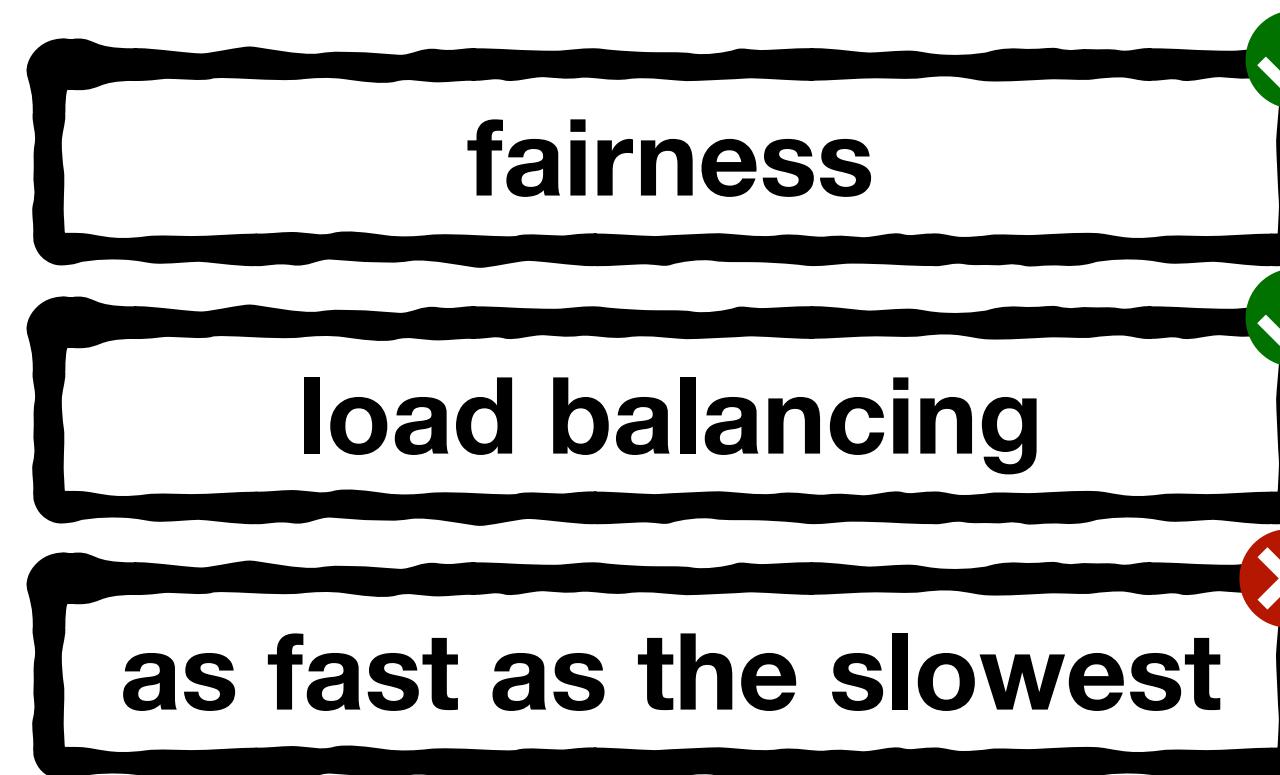
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## paxos log



**Z** can't be executed until the command with timestamp 3 is committed

## multi-leader SMR (e.g. mencius)



A leader  
B leader  
C leader  
processes

**Z** can't be executed until the command with timestamp 1 by **leader C** is committed

*root problem: a command's timestamp is computed by a single process*

# leaderless SMR with **tempo**

# leaderless SMR with tempo

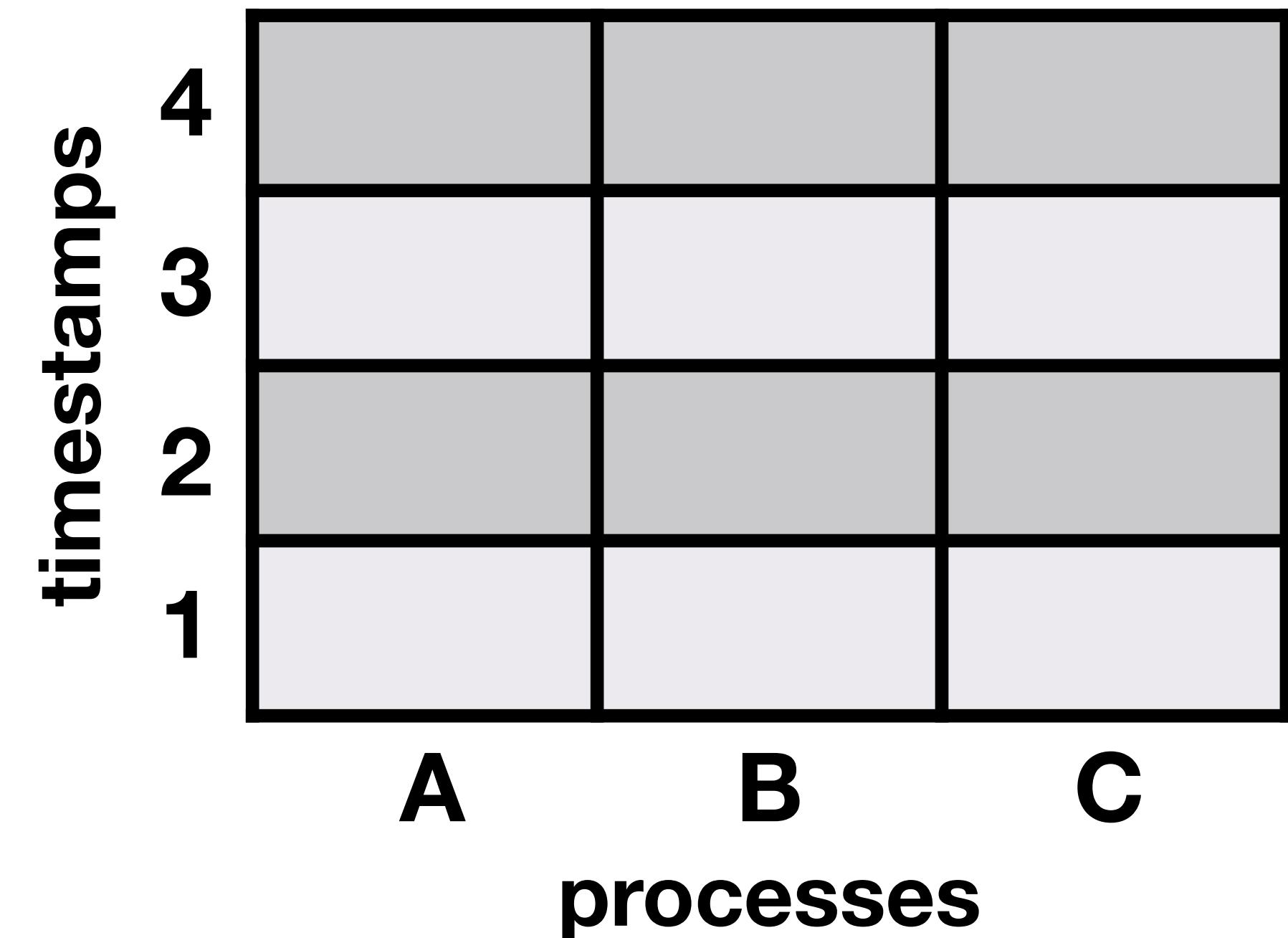
- a **majority** of processes proposes a timestamp for the command

## leaderless SMR with tempo

- a **majority** of processes proposes a timestamp for the command
- the command's timestamp is the **highest proposal**

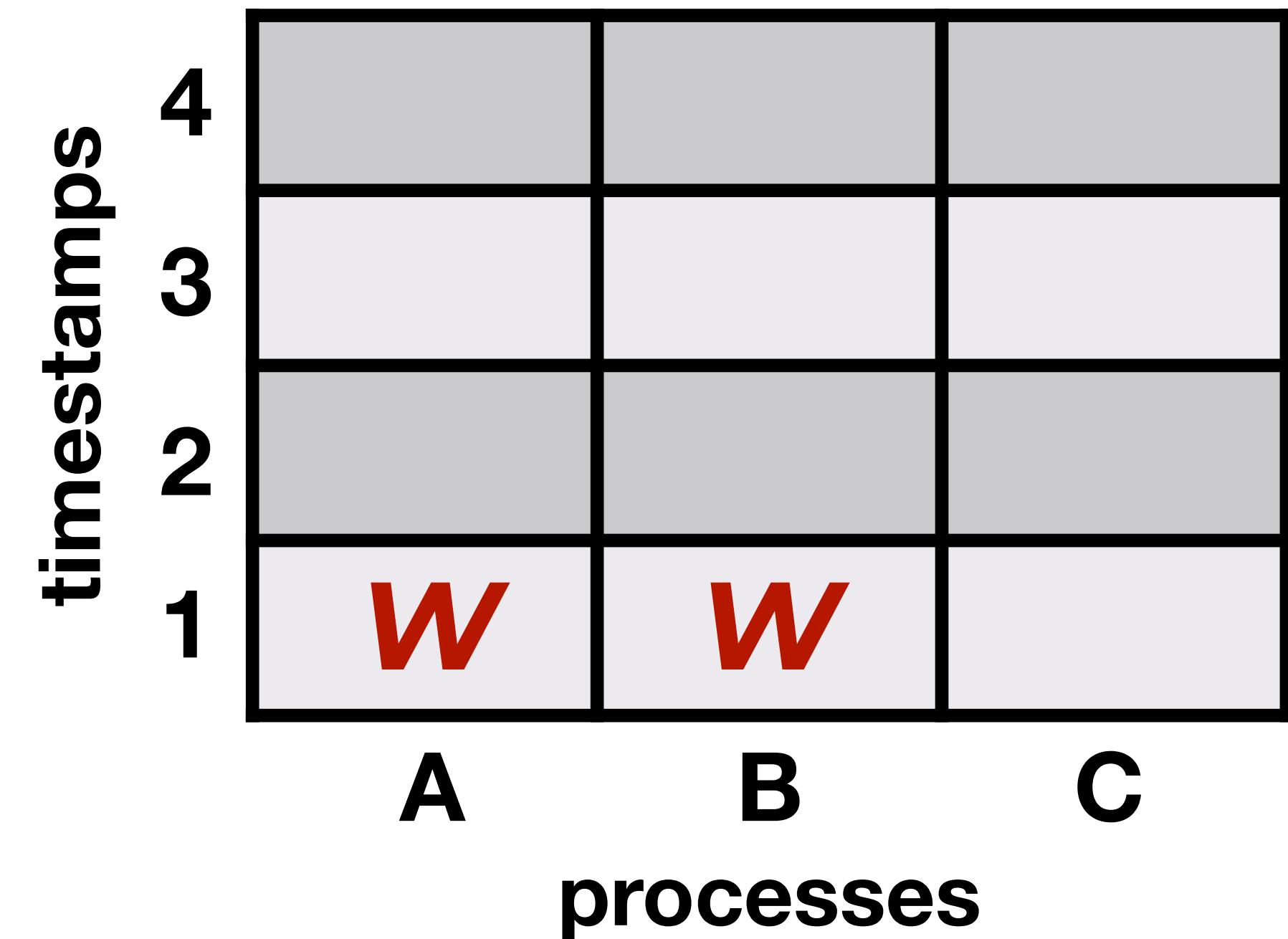
# leaderless SMR with tempo

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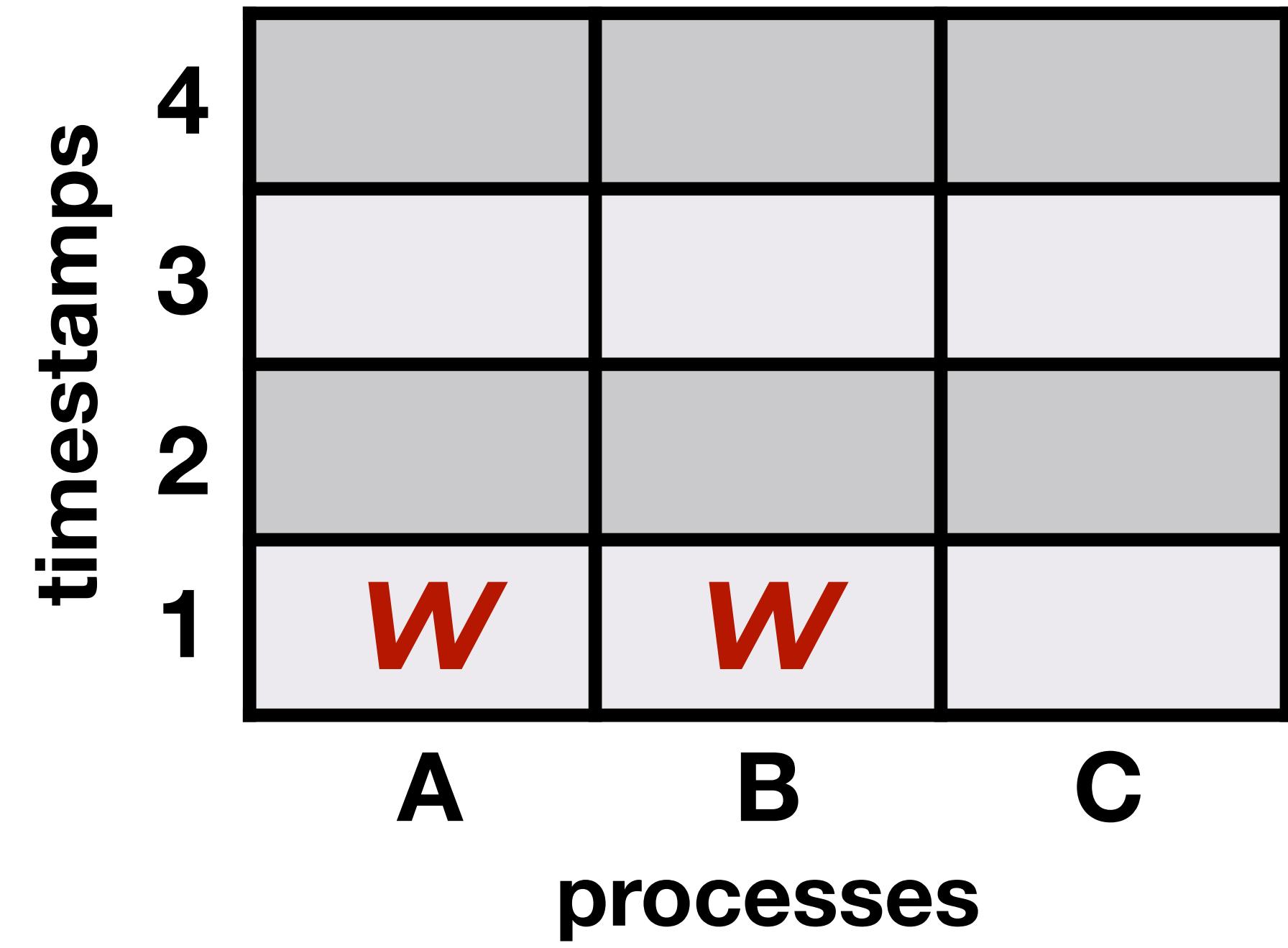
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# leaderless SMR with tempo

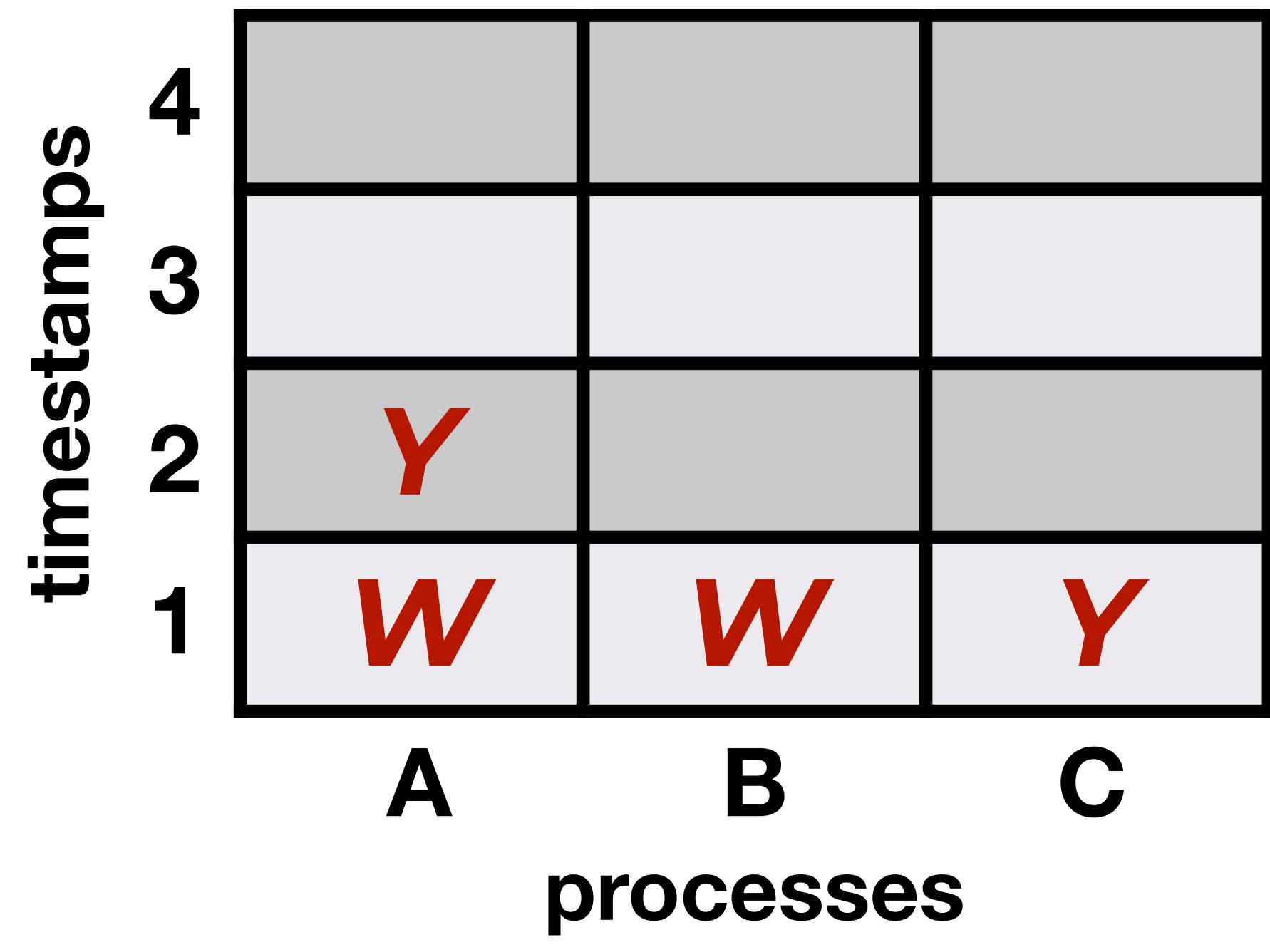
- a **majority** of processes proposes a timestamp for the command
- the command's timestamp is the **highest proposal**



ts[**W**] = 1

# leaderless SMR with tempo

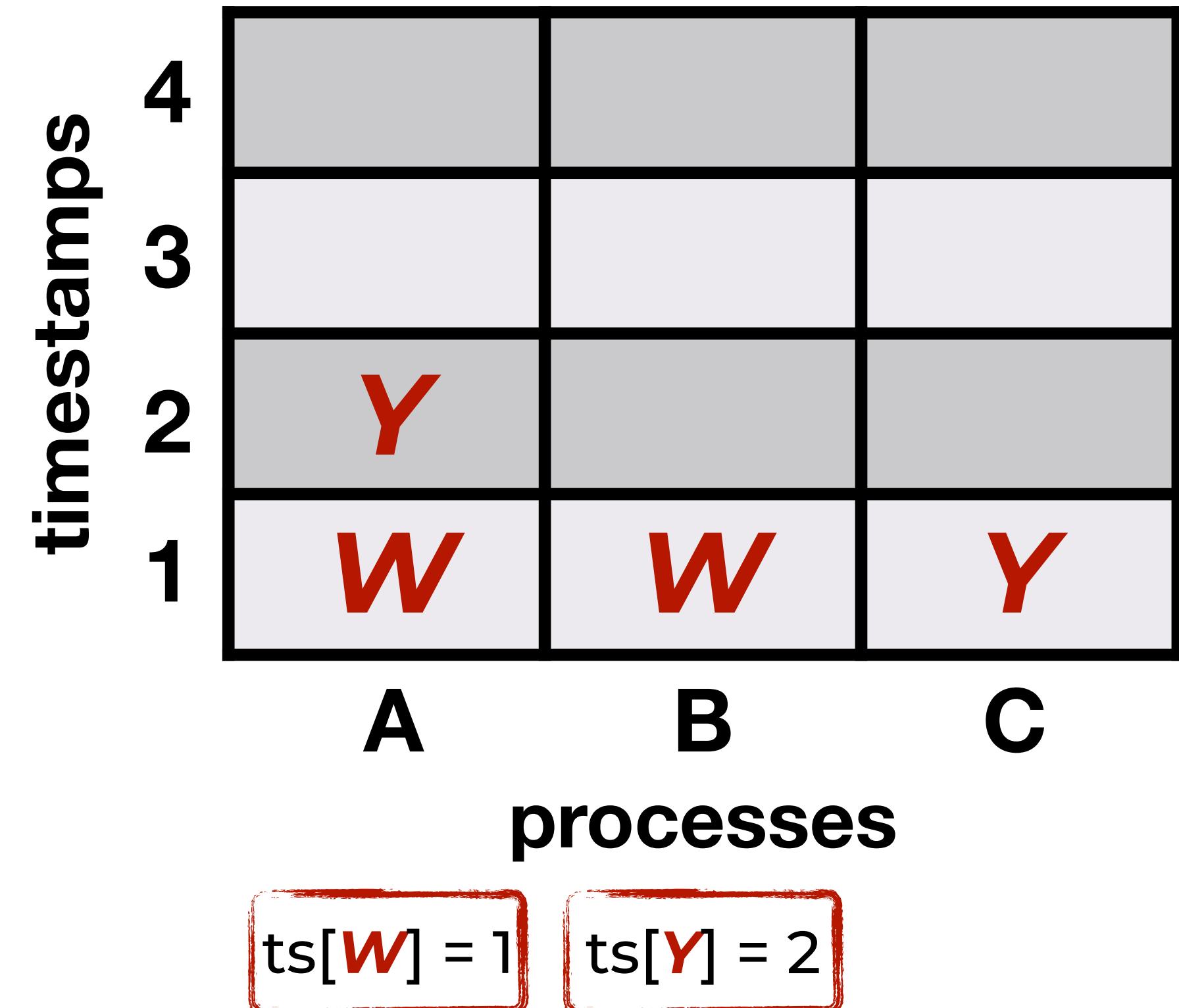
- a **majority** of processes proposes a timestamp for the command
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ts[W] = 1

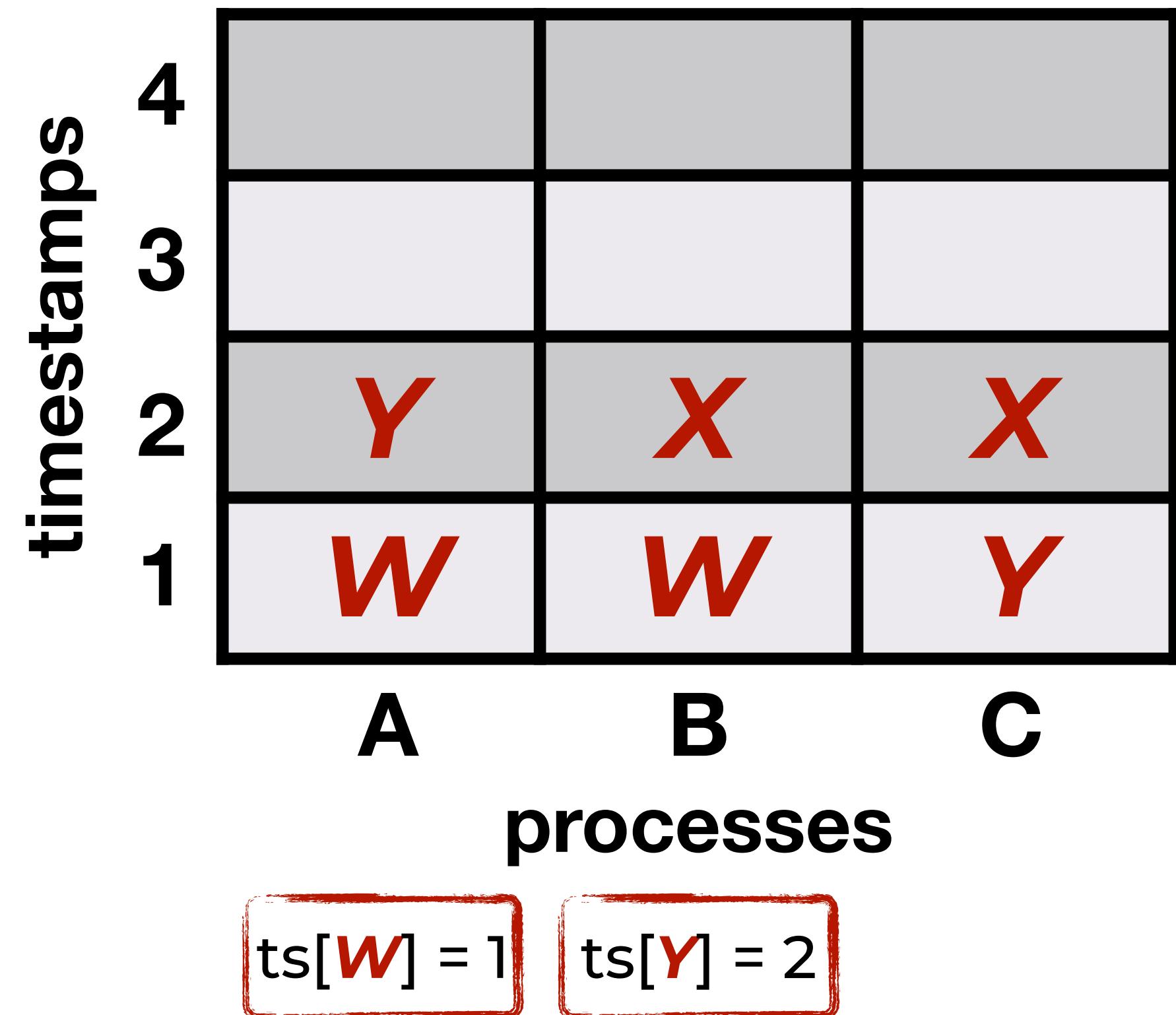
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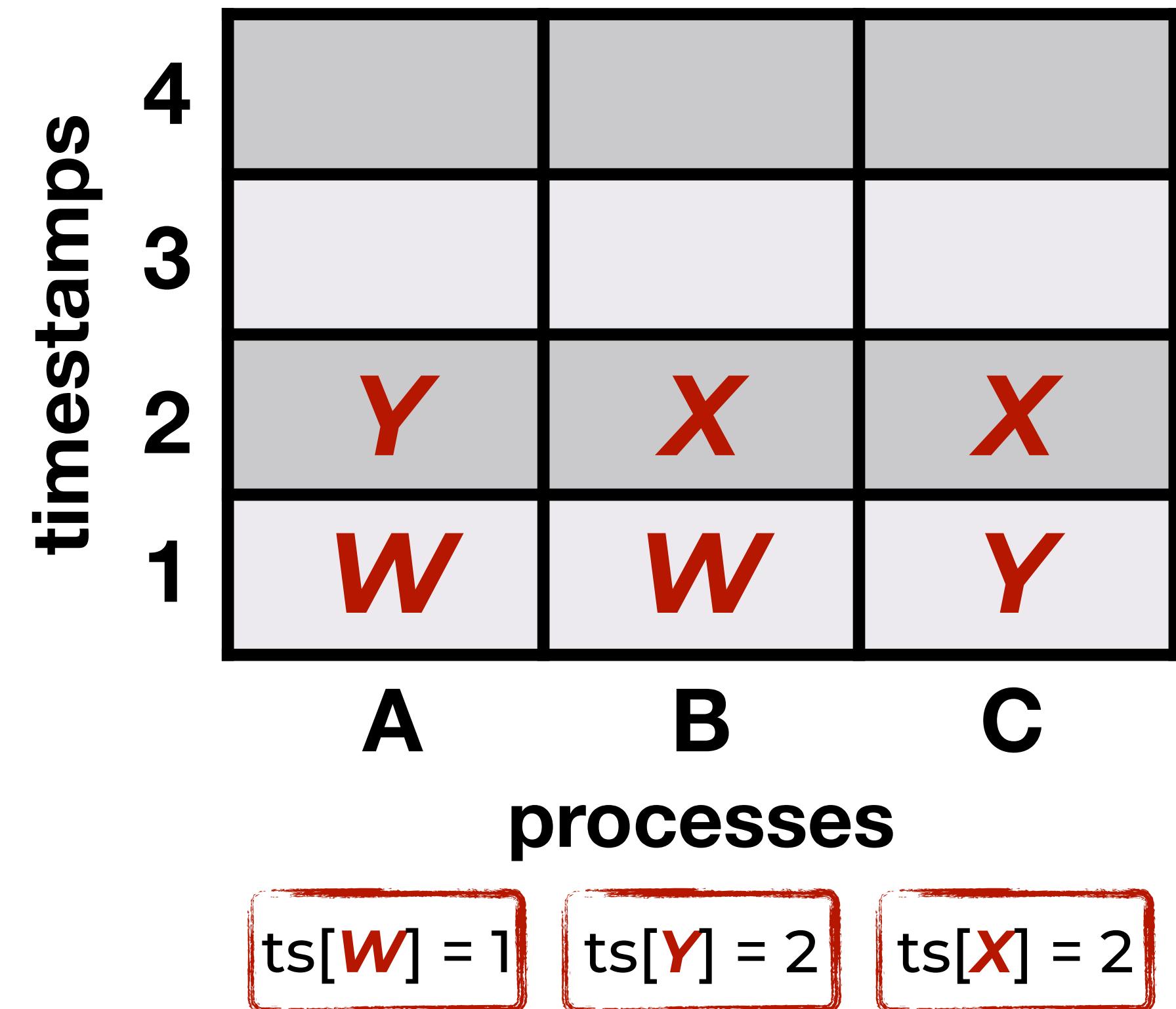
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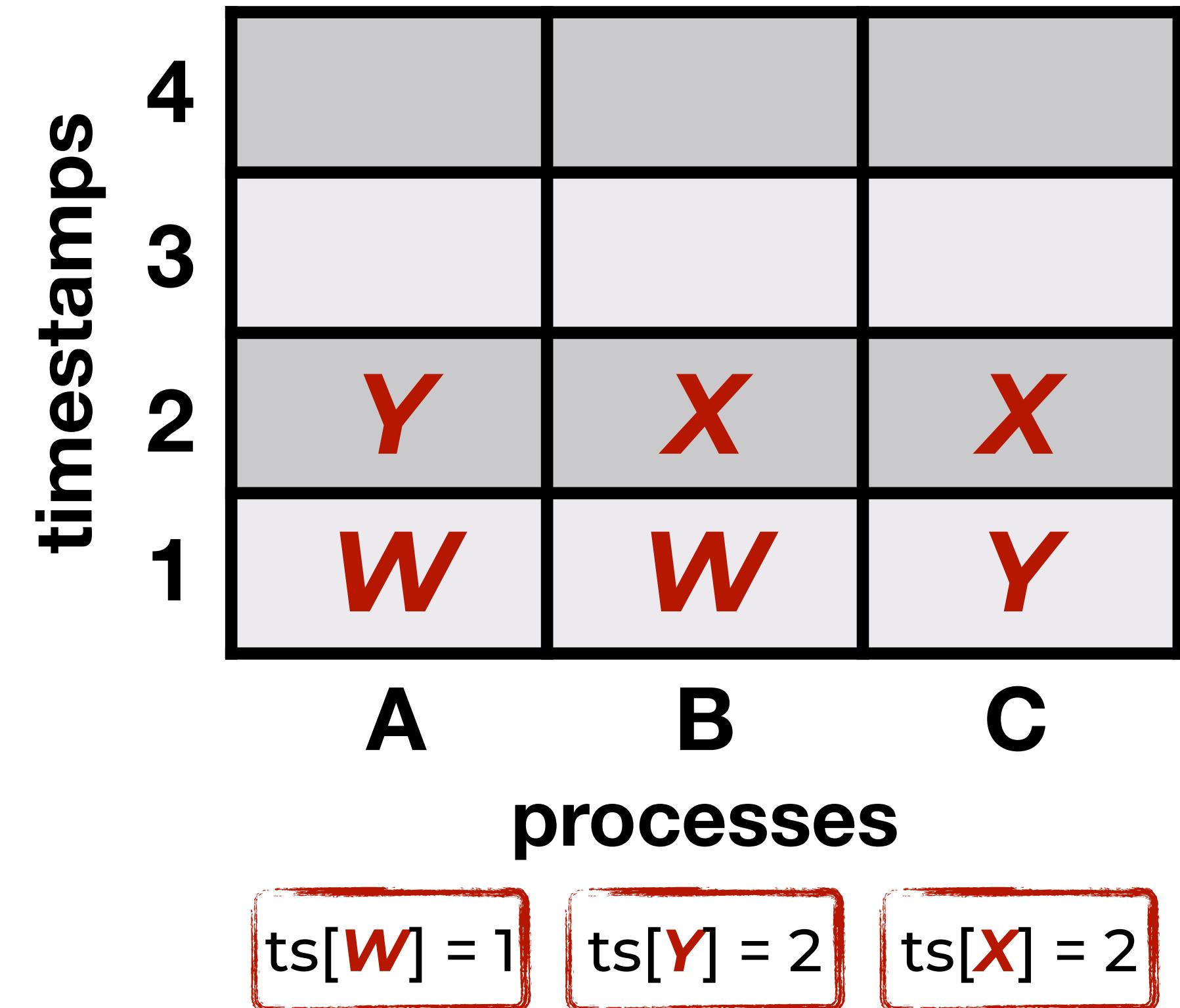
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- the command's timestamp is the **highest proposal**



# leaderless SMR with tempo

- a **majority** of processes proposes a timestamp for the command
- the command's timestamp is the **highest proposal**



**question:** when is it safe to execute a committed command?

## timestamp stability

process  $i$  can only execute command  $c$  after its **timestamp  $t$  is stable**, i.e., every command with a timestamp equal or lower to  $t$  is also committed at  $i$

# timestamp stability

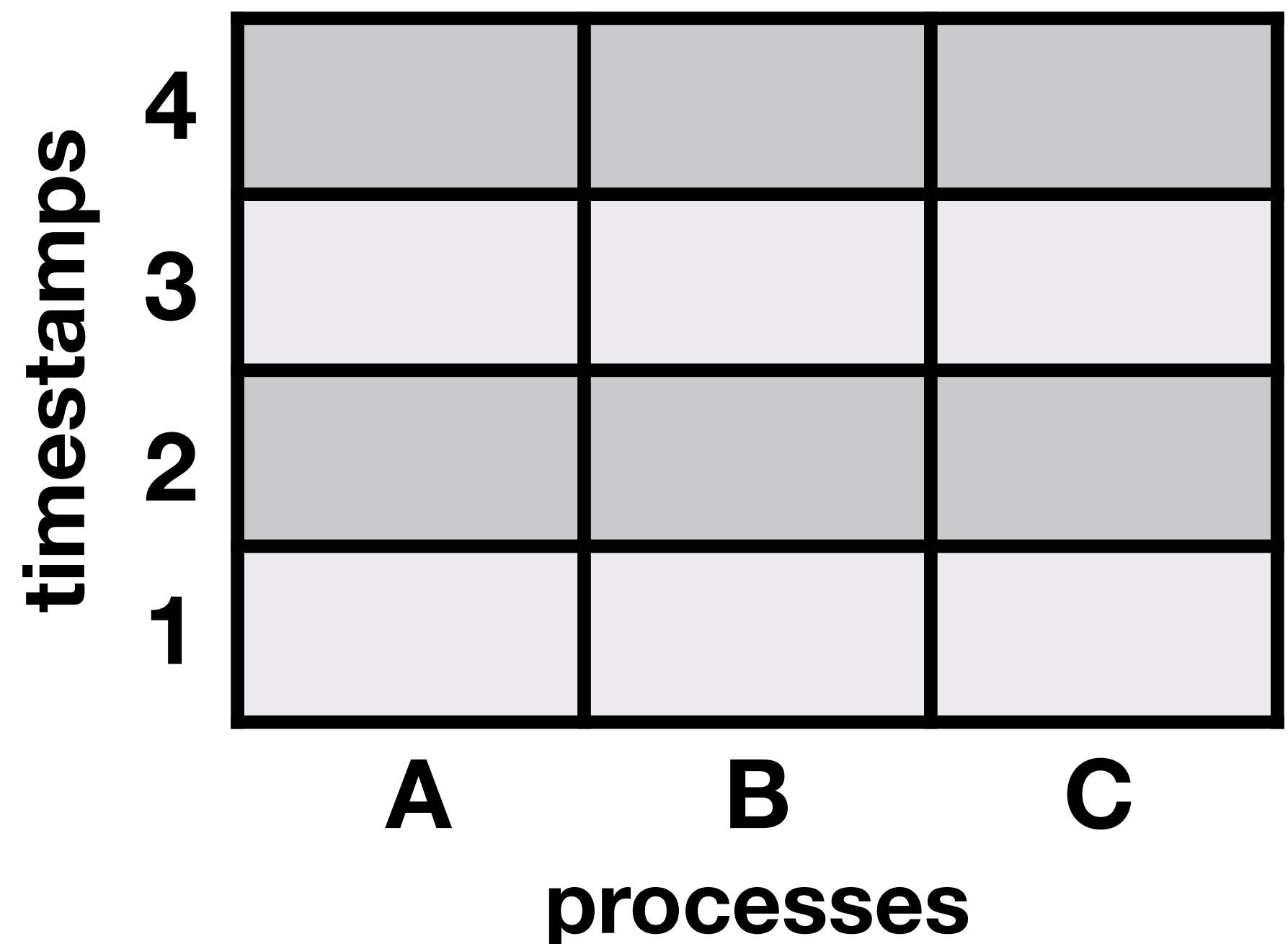
process  $i$  can only execute command  $c$  after its **timestamp  $t$  is stable**, i.e., every command with a timestamp equal or lower to  $t$  is also committed at  $i$

**theorem:** timestamp  $t$  is stable at process  $i$  once it knows *all the proposals up to  $t$  by any majority*

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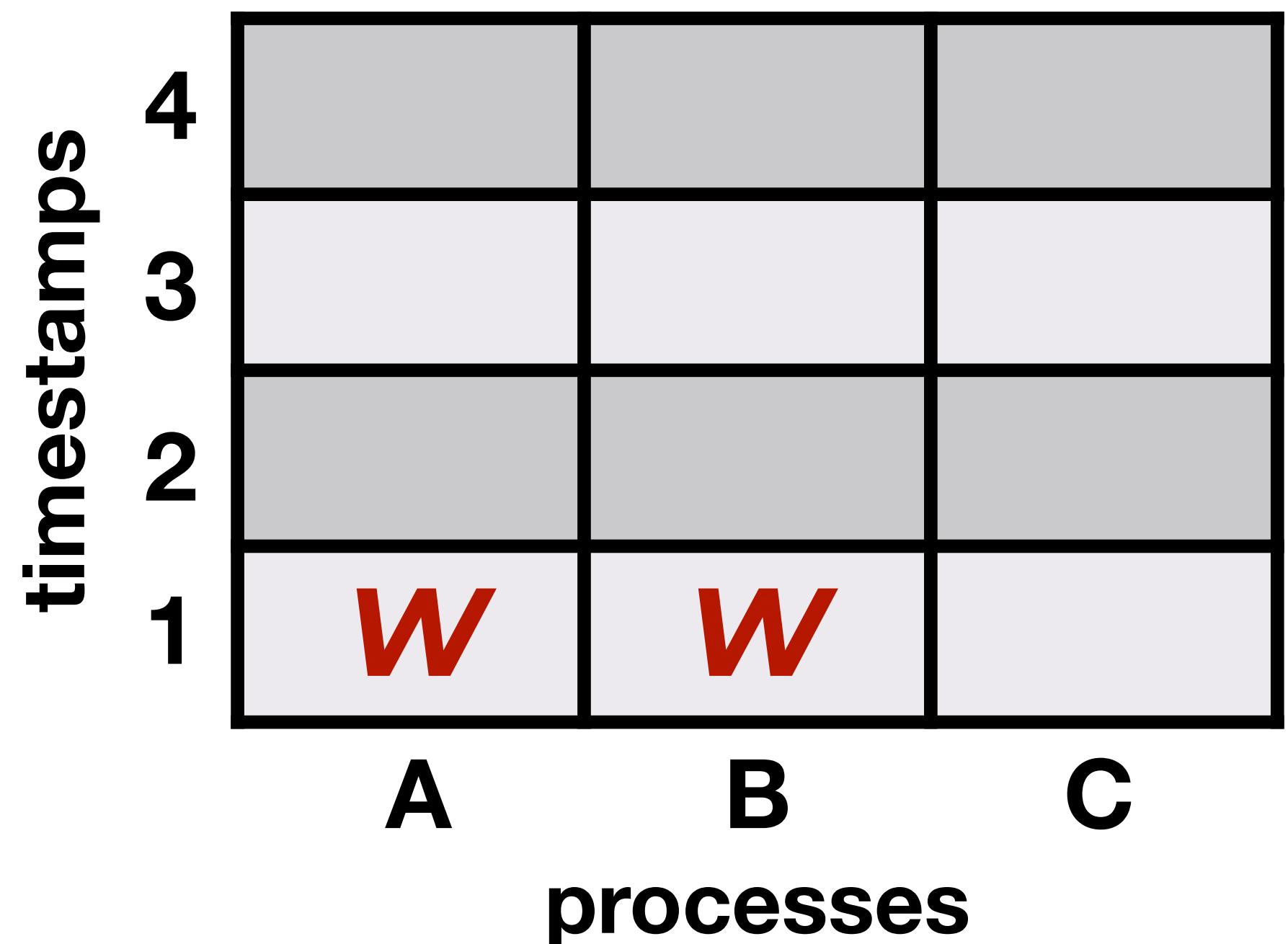
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**theorem:** timestamp  $t$  is stable at process  $i$  once it knows *all the proposals up to  $t$  by any majority*



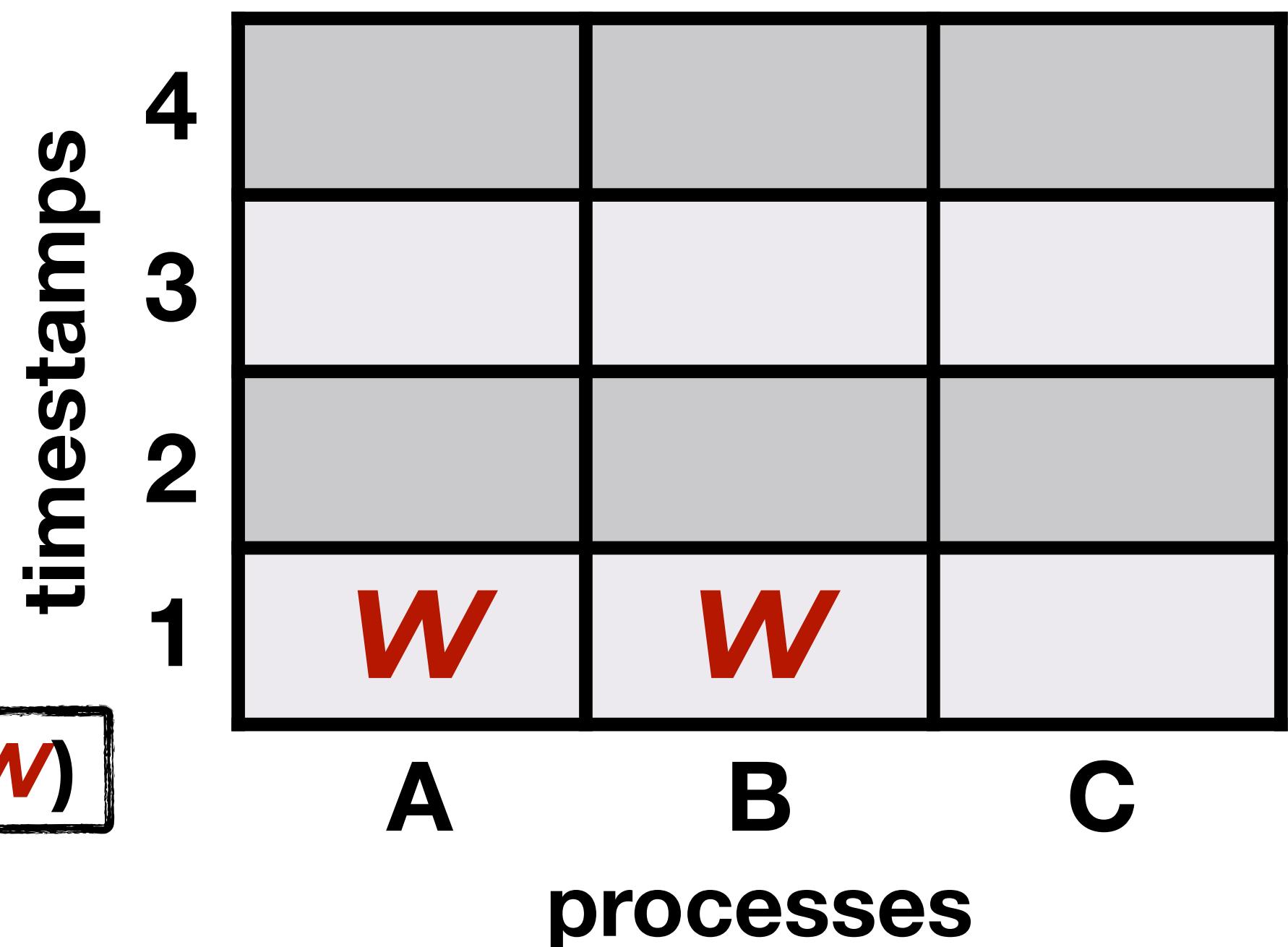
$$\text{ts}[W] = 1$$

# timestamp stability

process  $i$  can only execute command  $c$  after its timestamp  $t$  is stable, i.e., every command with a timestamp equal or lower to  $t$  is also committed at  $i$

**theorem:** timestamp  $t$  is stable at process  $i$  once it knows all the proposals up to  $t$  by any majority

# execute(**W**)



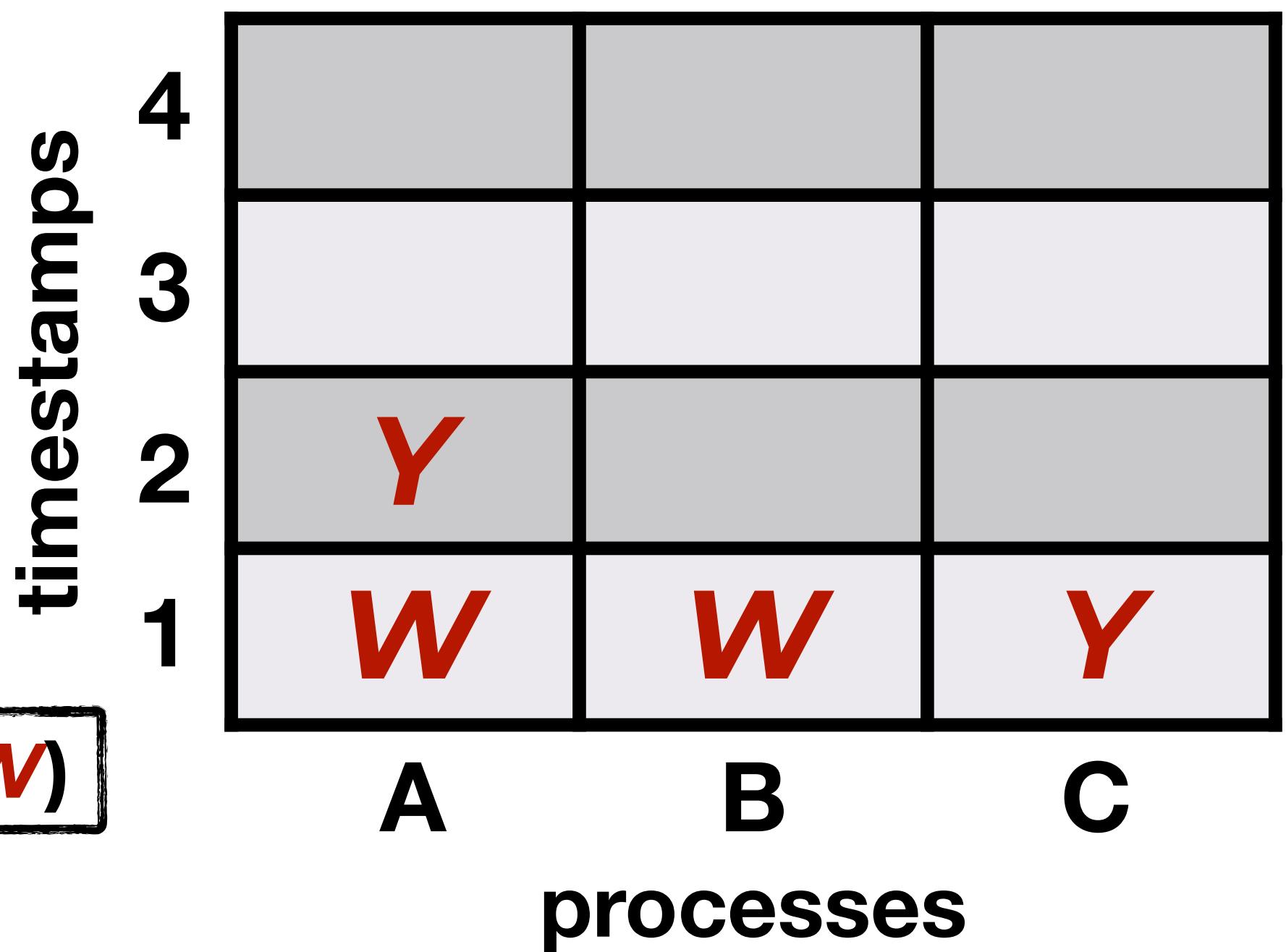
ts[W] =

# timestamp stability

process  $i$  can only execute command  $c$  after its **timestamp  $t$  is stable**, i.e., every command with a timestamp equal or lower to  $t$  is also committed at  $i$

**theorem:** timestamp  $t$  is stable at process  $i$  once it knows *all the proposals up to  $t$  by any majority*

execute(**W**)



$$\text{ts}[W] = 1$$

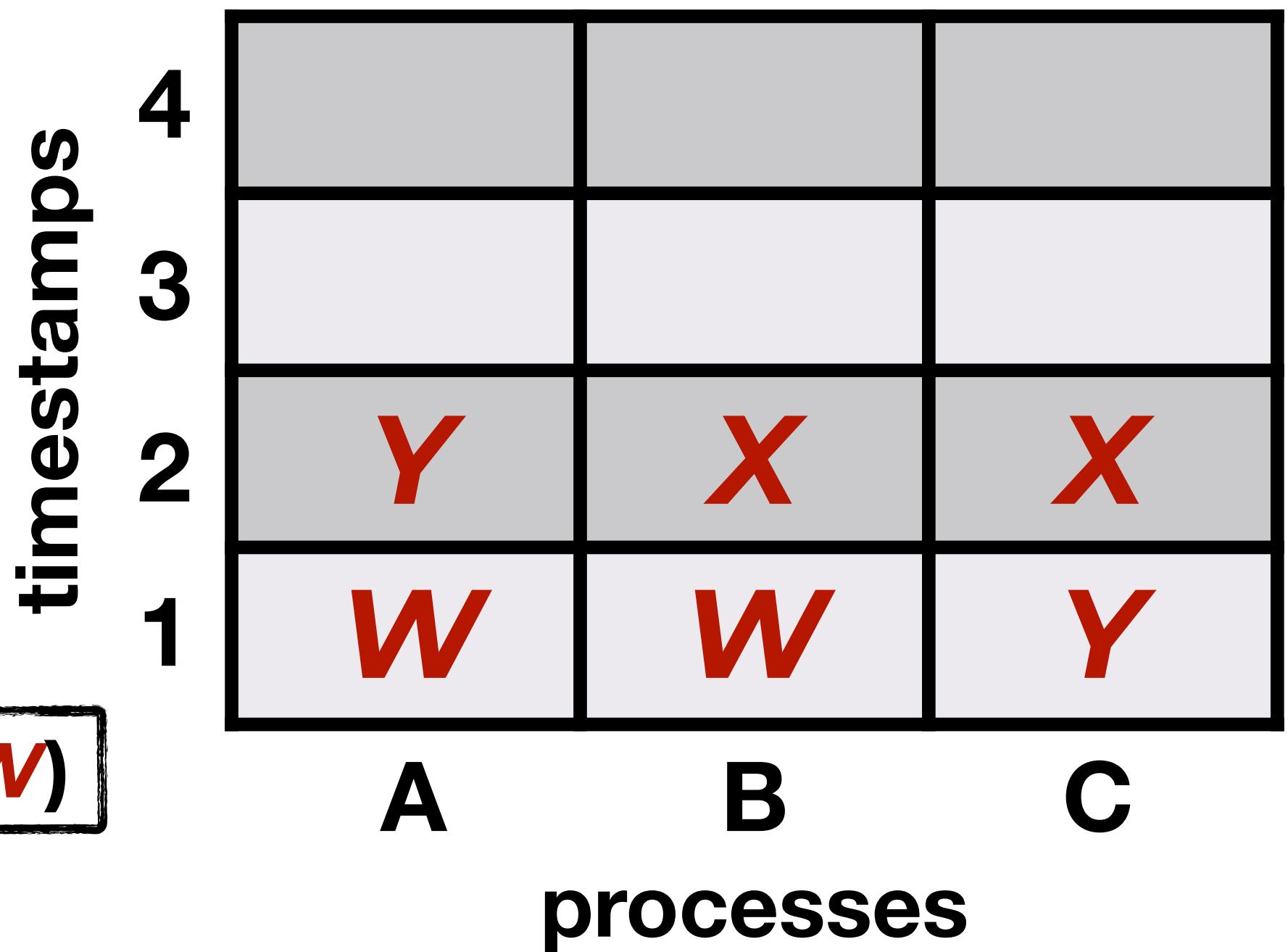
$$\text{ts}[Y] = 2$$

# timestamp stability

process  $i$  can only execute command  $c$  after its **timestamp  $t$  is stable**, i.e., every command with a timestamp equal or lower to  $t$  is also committed at  $i$

**theorem:** timestamp  $t$  is stable at process  $i$  once it knows *all the proposals up to  $t$  by any majority*

execute(**W**)



$$\text{ts}[W] = 1$$

$$\text{ts}[Y] = 2$$

$$\text{ts}[X] = 2$$

# timestamp stability

process  $i$  can only execute command  $c$  after its **timestamp  $t$  is stable**, i.e., every command with a timestamp equal or lower to  $t$  is also committed at  $i$

**theorem:** timestamp  $t$  is stable at process  $i$  once it knows *all the proposals up to  $t$  by any majority*

execute(**W**)

execute(**X**) ; execute(**Y**)  
since **X < Y**

	processes		
timestamps	A	B	C
4			
3			
2	<b>Y</b>	<b>X</b>	<b>X</b>
1	<b>W</b>	<b>W</b>	<b>Y</b>

ts[**W**] = 1

ts[**Y**] = 2

ts[**X**] = 2

# timestamp stability vs explicit dependencies

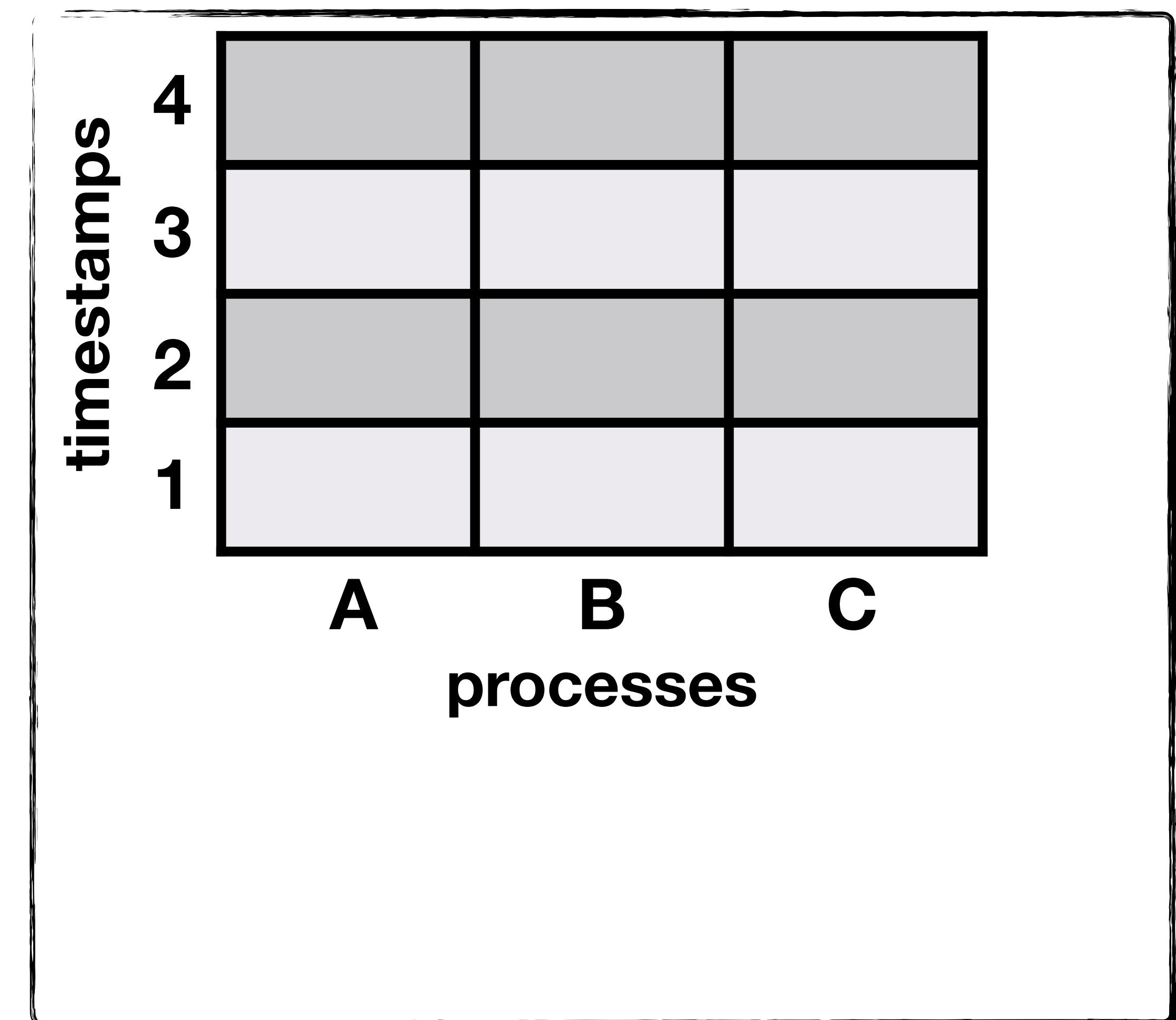
**command arrival order:**

- **W X Z** at A
- **Y W** at B
- **Z Y** at C

# timestamp stability vs explicit dependencies

**command arrival order:**

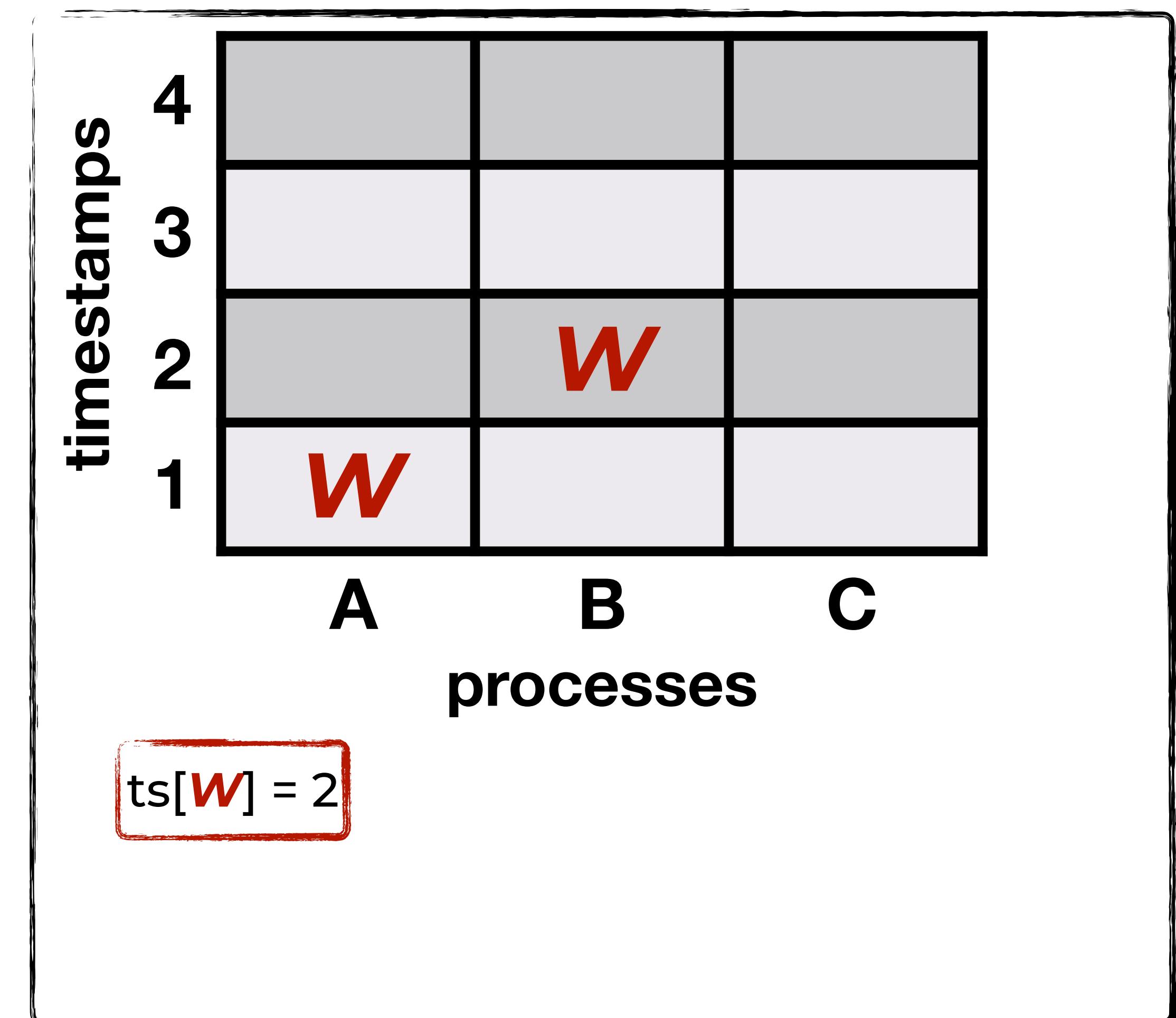
- $W X Z$  at A
- $Y W$  at B
- $Z Y$  at C



# timestamp stability vs explicit dependencies

**command arrival order:**

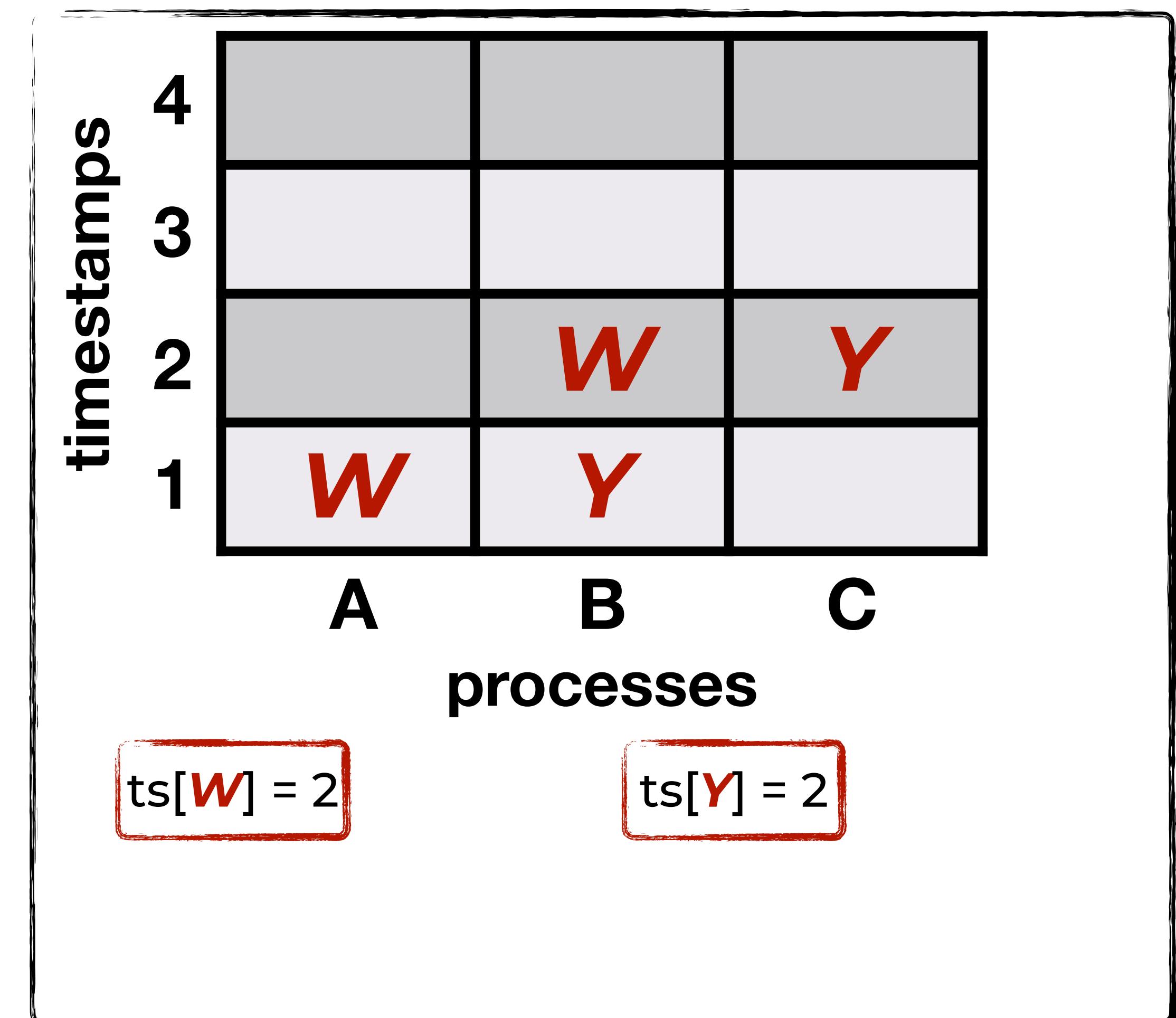
- **WXZ** at A
- **YW** at B
- **ZY** at C



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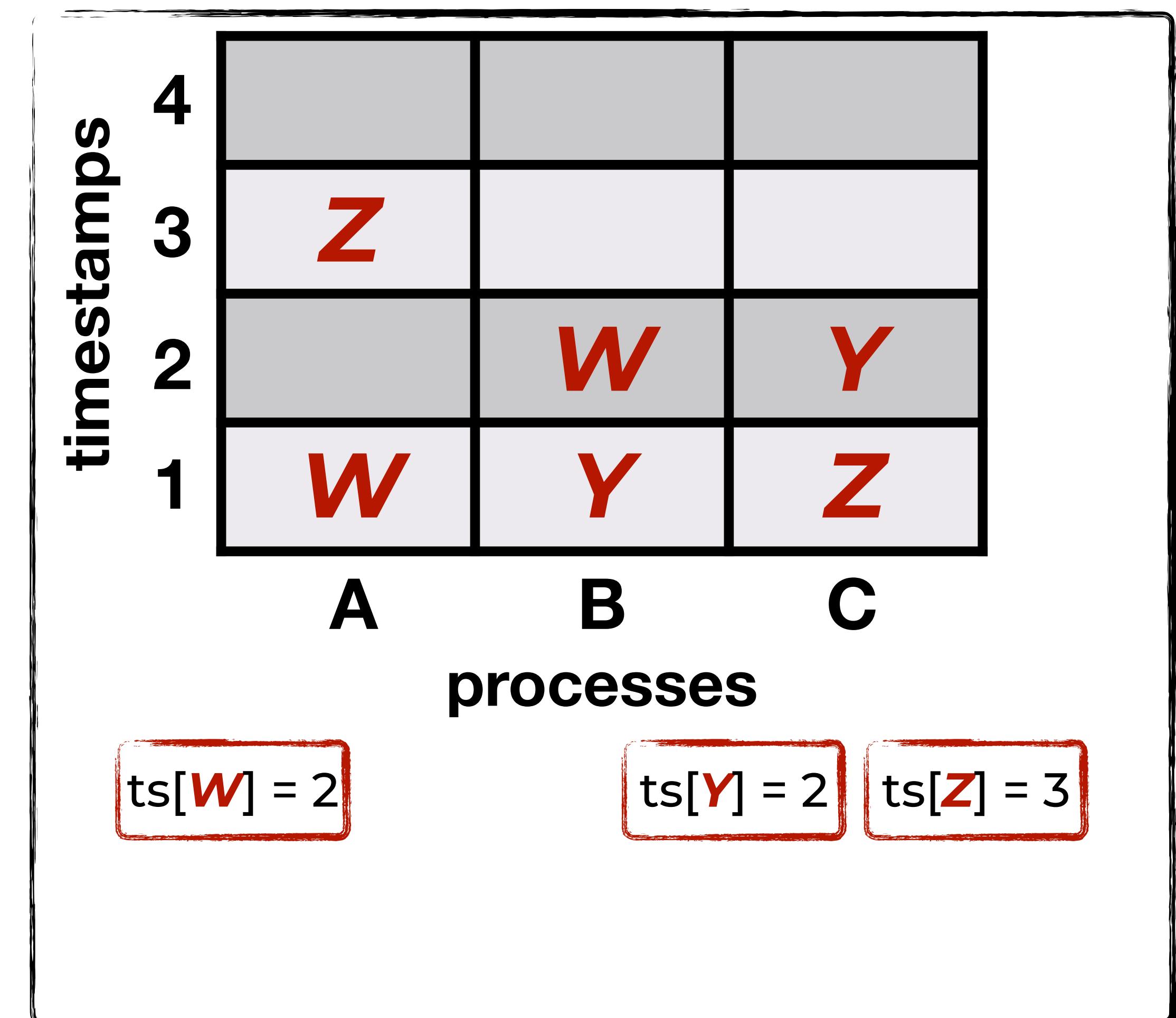
- $W X Z$  at A
- $Y W$  at B
- $Z Y$  at C



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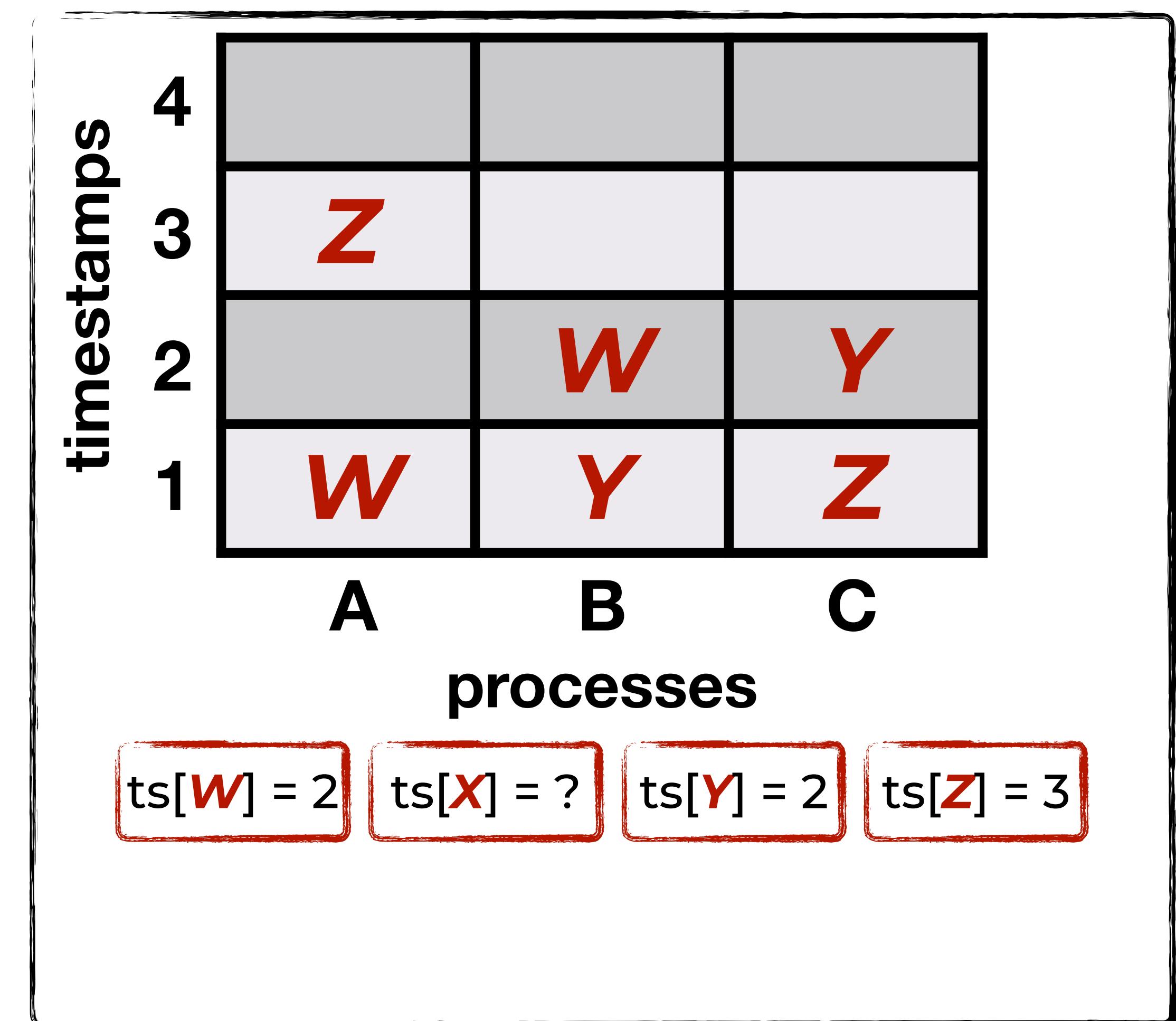
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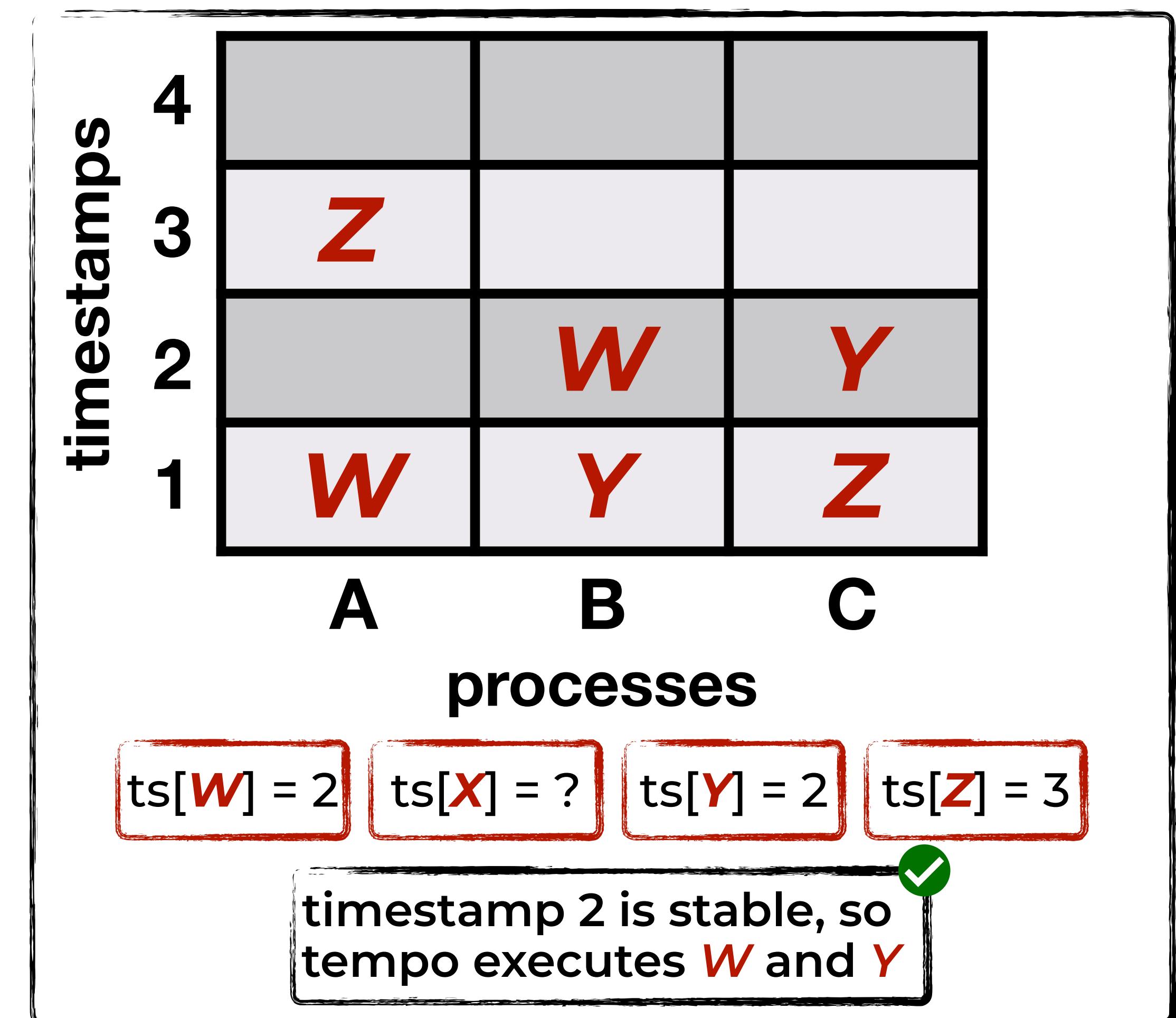
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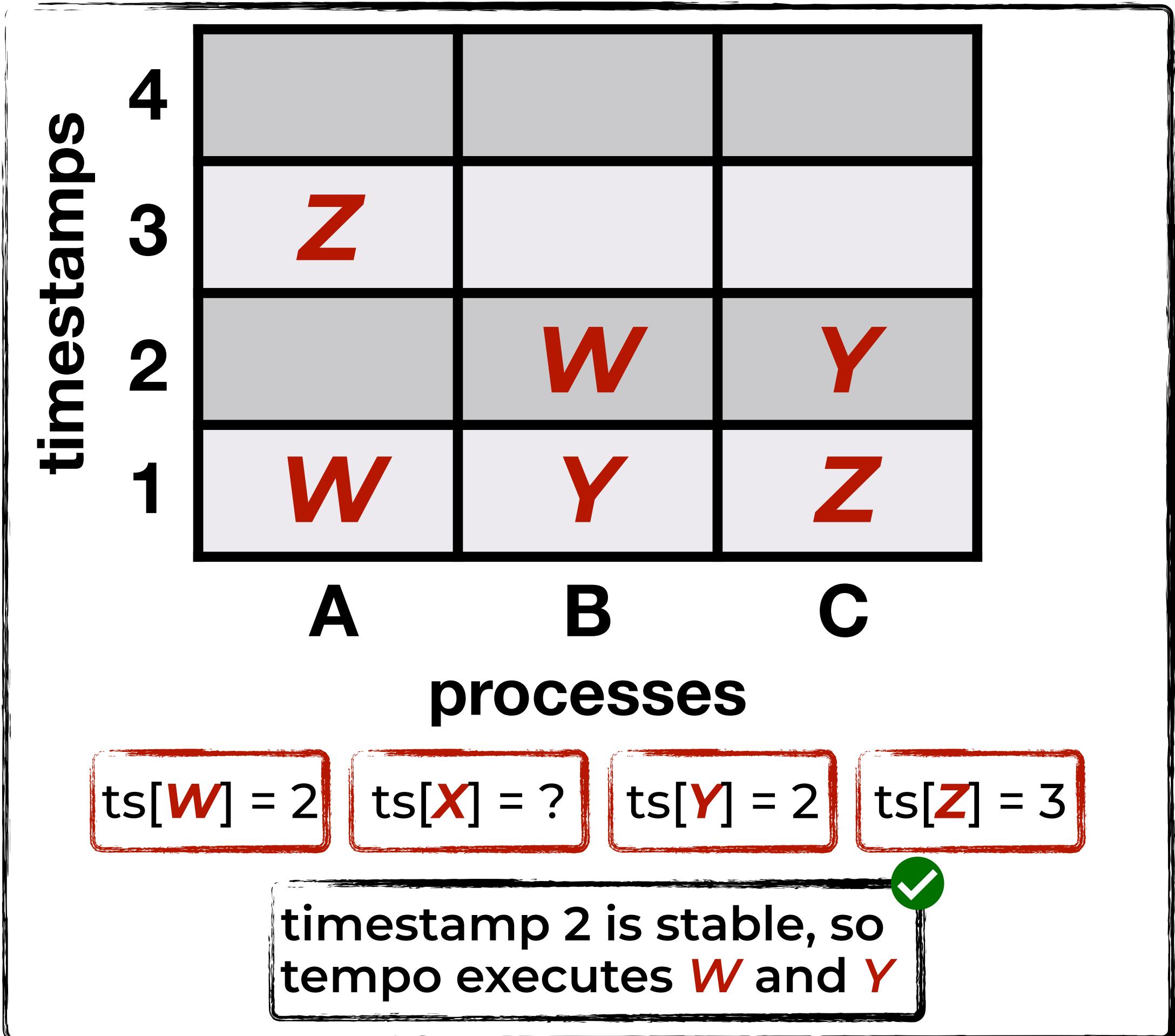


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epaxos / atlas:



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command arrival order:

- $W X Z$  at A
- $Y W$  at B
- $Z Y$  at C

epaxos / atlas:

$W \rightarrow Y$

→ “depends on”

dep[ $W$ ] = { $Y$ }

processes				
A	B	C		
timestamps	1	2	3	4
$W$	$Y$	$Z$		
	$W$		$Y$	$Z$
			$Z$	

ts[ $W$ ] = 2   ts[ $X$ ] = ?   ts[ $Y$ ] = 2   ts[ $Z$ ] = 3

timestamp 2 is stable, so tempo executes  $W$  and  $Y$

# timestamp stability vs explicit dependencies

command arrival order:

- $W X Z$  at A
- $Y W$  at B
- $Z Y$  at C

epaxos / atlas:

$W \rightarrow Y \rightarrow Z$

→ “depends on”

$\text{dep}[W] = \{Y\}$

$\text{dep}[Y] = \{Z\}$

processes				
A	B	C		
timestamps	1	2	3	4
$W$	$Y$	$Z$		
	$W$		$Y$	
		$W$		
			$Z$	
				$Z$

$\text{ts}[W] = 2$     $\text{ts}[X] = ?$     $\text{ts}[Y] = 2$     $\text{ts}[Z] = 3$

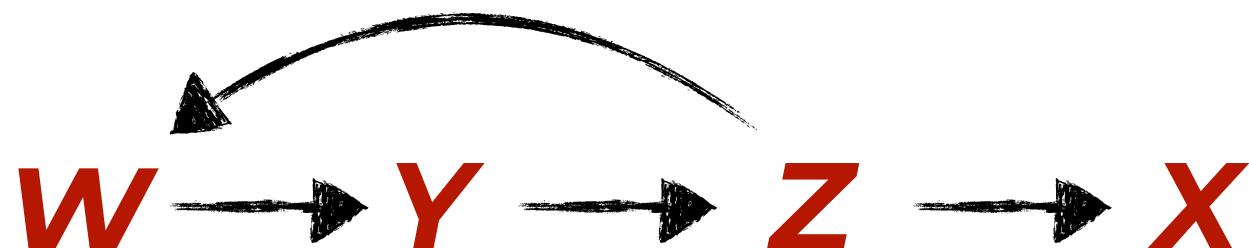
timestamp 2 is stable, so  
tempo executes  $W$  and  $Y$

# timestamp stability vs explicit dependencies

command arrival order:

- $W X Z$  at A
- $Y W$  at B
- $Z Y$  at C

epaxos / atlas:



→ “depends on”

$$\text{dep}[W] = \{Y\}$$

$$\text{dep}[Y] = \{Z\}$$

$$\text{dep}[Z] = \{W, X\}$$

	A	B	C
4			
3	Z		
2		W	Y
1	W	Y	Z

processes

$$\text{ts}[W] = 2$$

$$\text{ts}[X] = ?$$

$$\text{ts}[Y] = 2$$

$$\text{ts}[Z] = 3$$

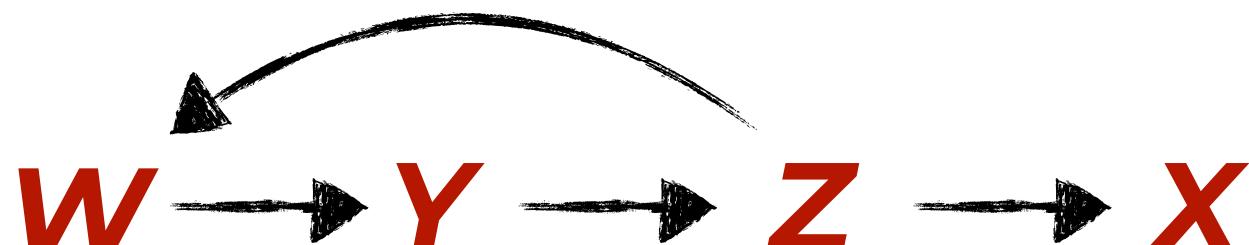
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# timestamp stability vs explicit dependencies

command arrival order:

- $W X Z$  at A
- $Y W$  at B
- $Z Y$  at C

epaxos / atlas:



→ “depends on”

$$\text{dep}[W] = \{Y\}$$

$$\text{dep}[Y] = \{Z\}$$

$$\text{dep}[X] = ?$$

$$\text{dep}[Z] = \{W, X\}$$

timestamps

4		
3	<b>Z</b>	
2		<b>W</b>
1	<b>W</b>	<b>Y</b>
		<b>Z</b>

A      B      C

processes

$$\text{ts}[W] = 2$$

$$\text{ts}[X] = ?$$

$$\text{ts}[Y] = 2$$

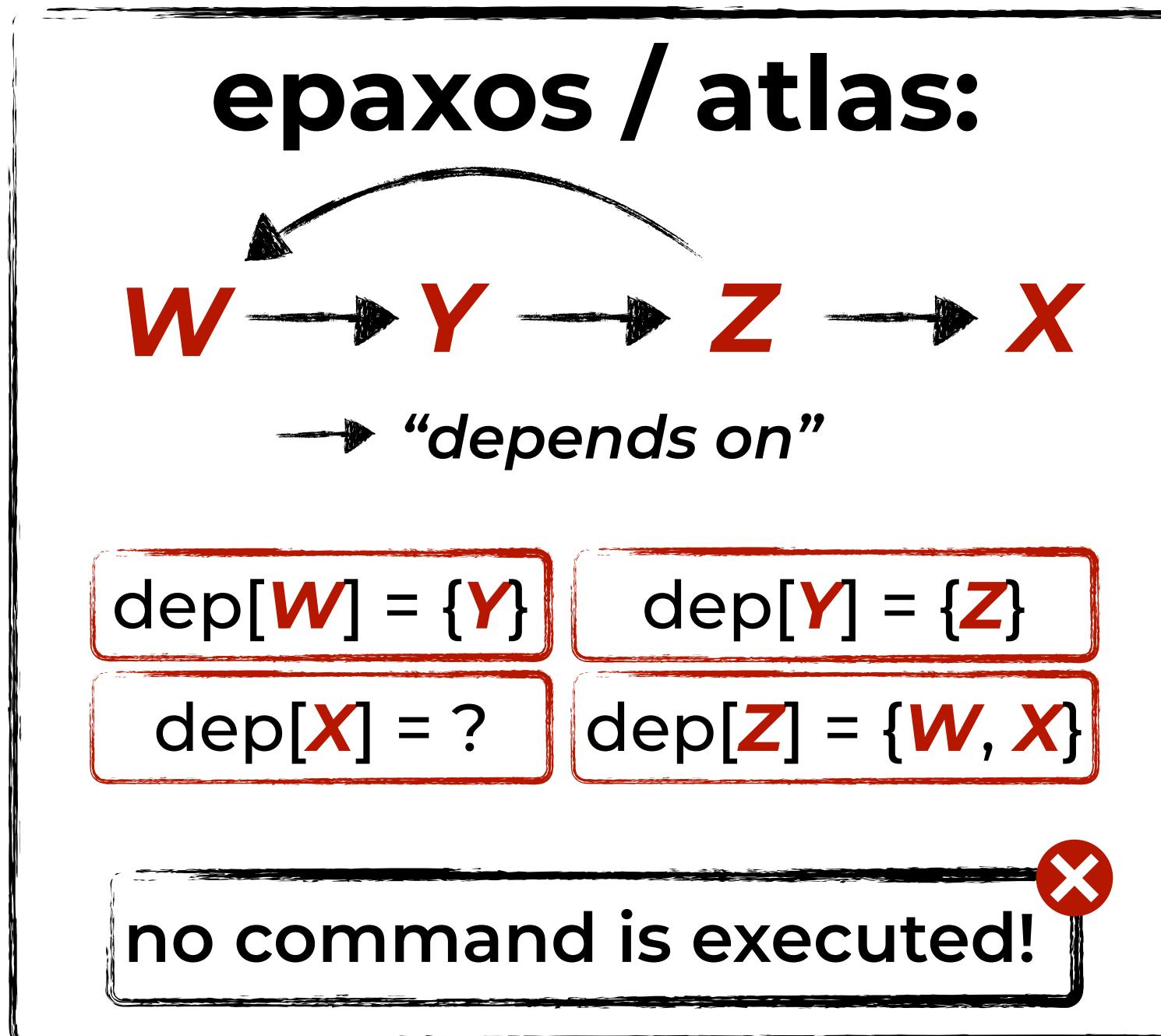
$$\text{ts}[Z] = 3$$

timestamp 2 is stable, so  
tempo executes **W** and **Y**

# timestamp stability vs explicit dependencies

## command arrival order:

- $W X Z$  at A
- $Y W$  at B
- $Z Y$  at C



timestamps

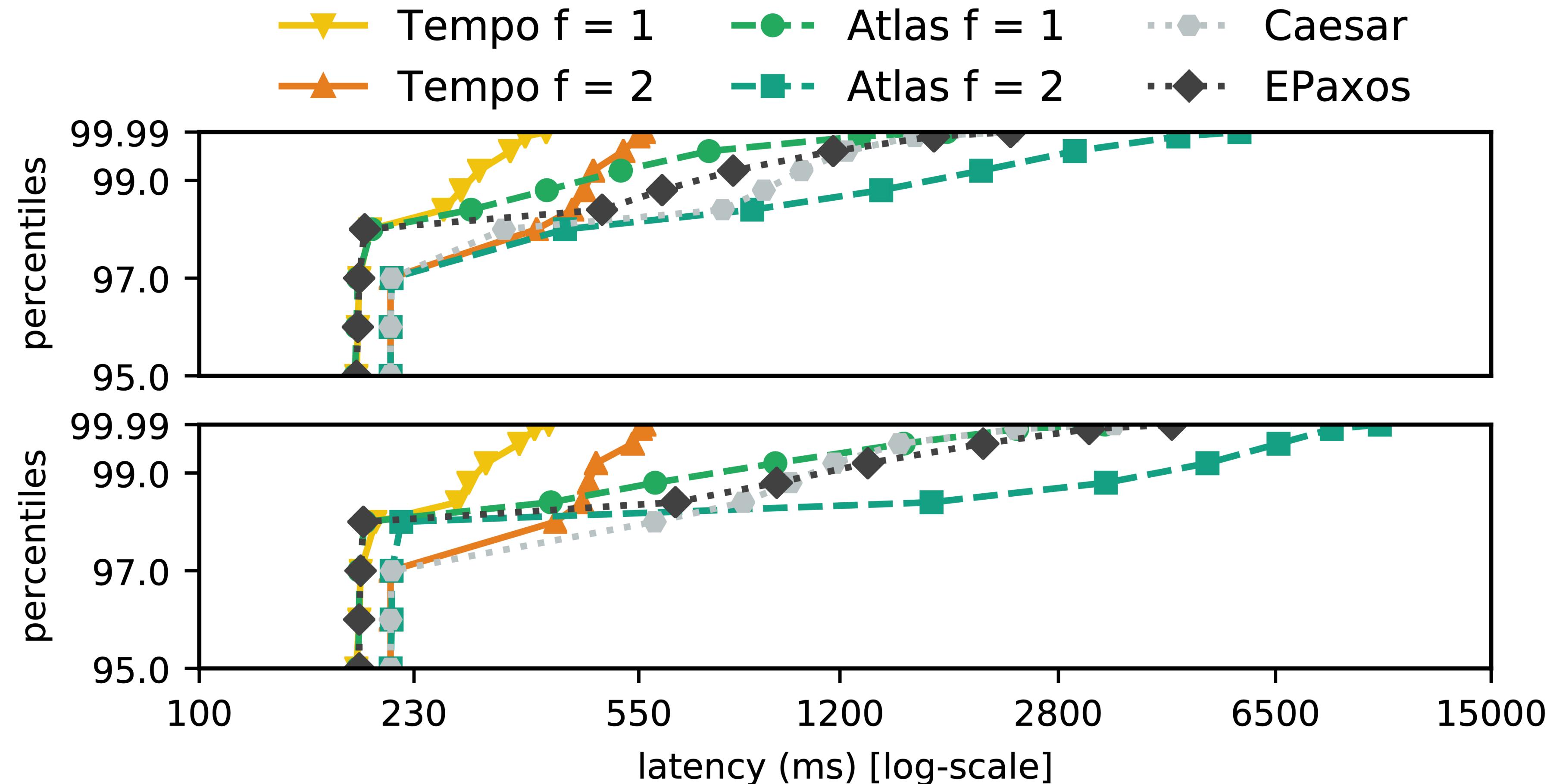
			4
			3
	<b>Z</b>		
			2
		<b>W</b>	<b>Y</b>
	<b>W</b>	<b>Y</b>	<b>Z</b>
A	B	C	

processes

$\text{ts}[W] = 2$     $\text{ts}[X] = ?$     $\text{ts}[Y] = 2$     $\text{ts}[Z] = 3$

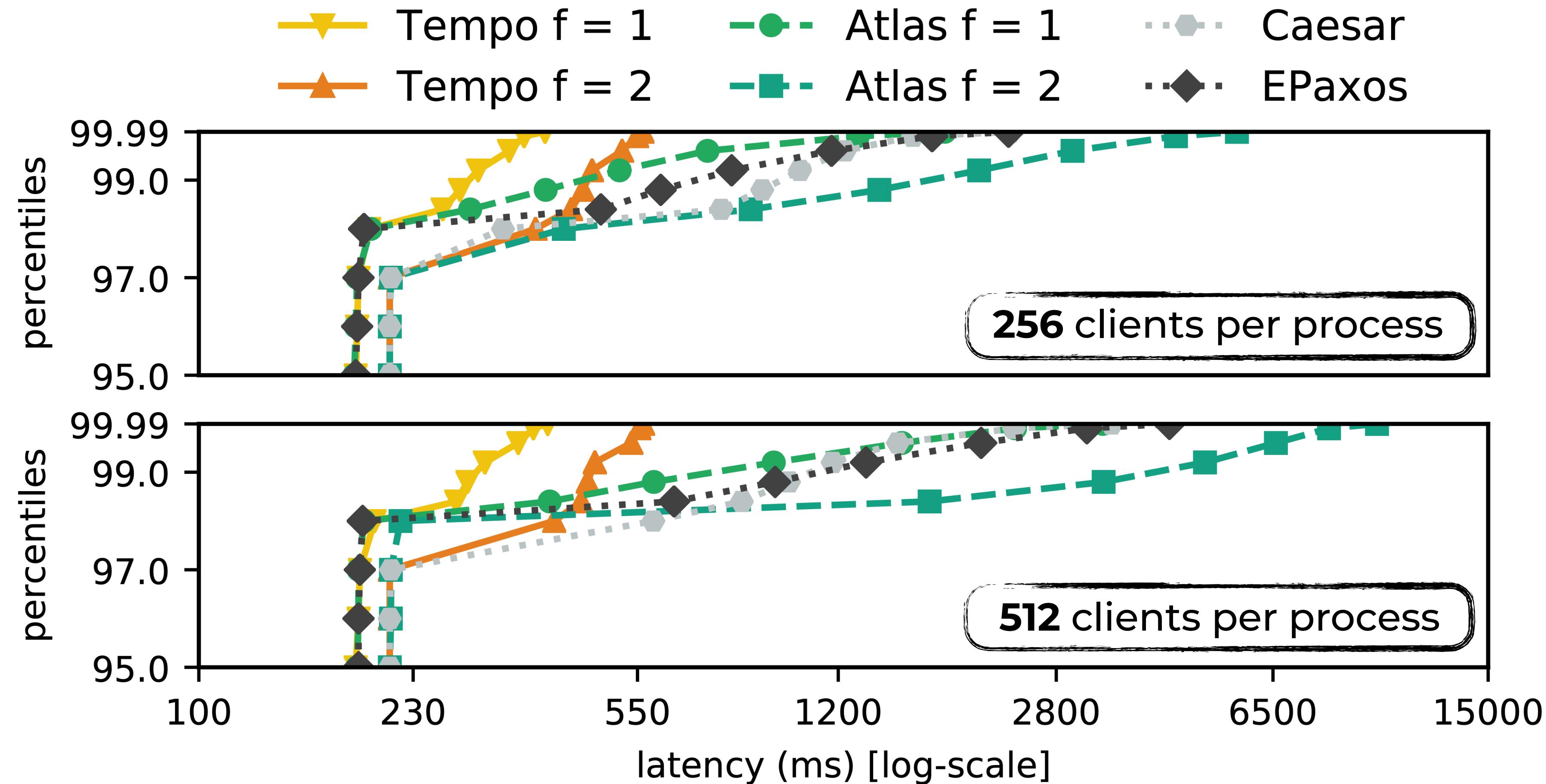
**timestamp 2 is stable, so tempo executes  $W$  and  $Y$**  ✓

# tempo provides predictable latency



left is better  
↗

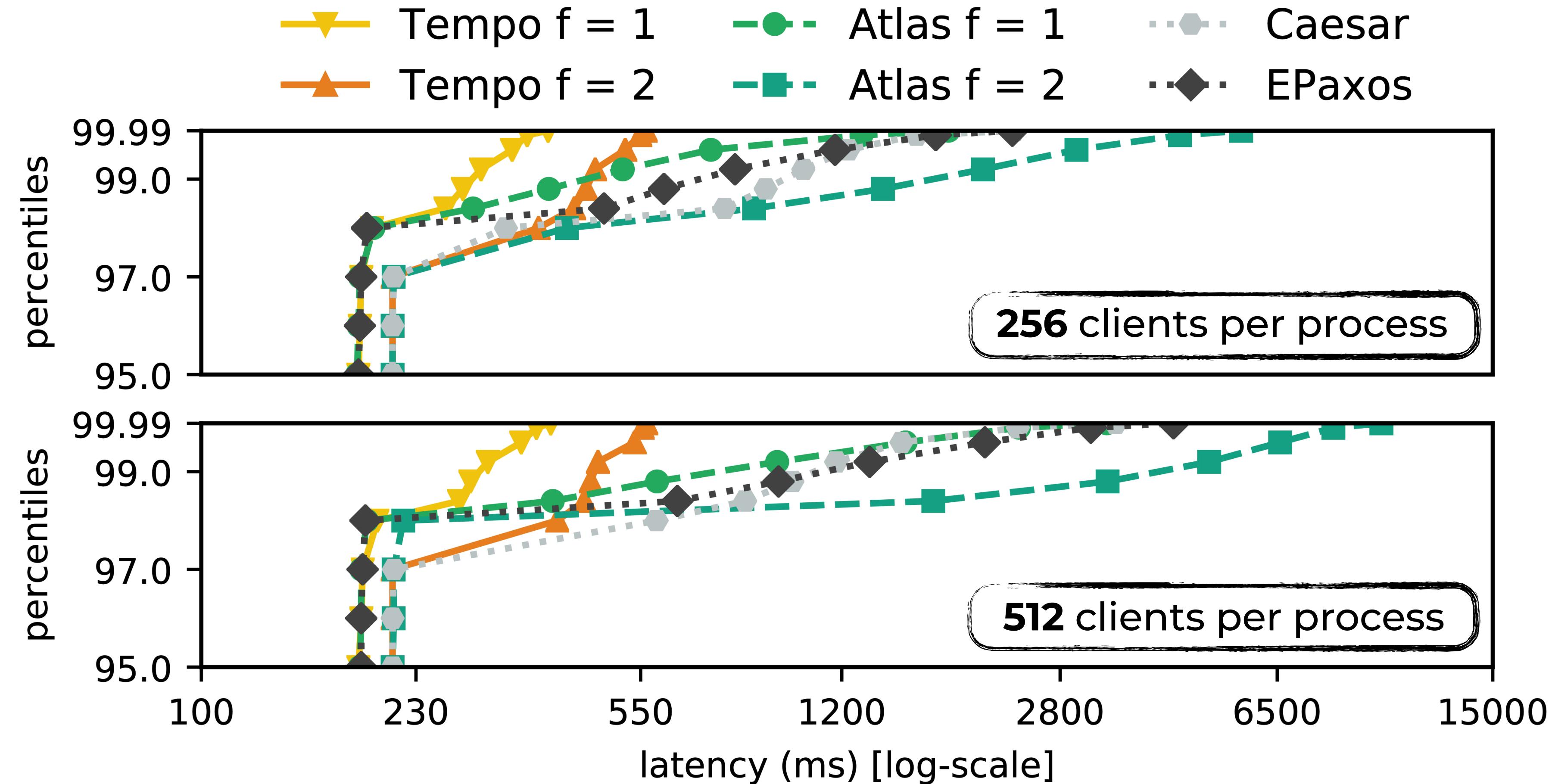
# tempo provides predictable latency



left is better  
↙

# tempo provides predictable latency

	99.9th	
	256	512
atlas f=1	1.3s	2.4s
epaxos	1.7s	3.1s
caesar	1.6s	2.4s
tempo f=1	354ms	367ms



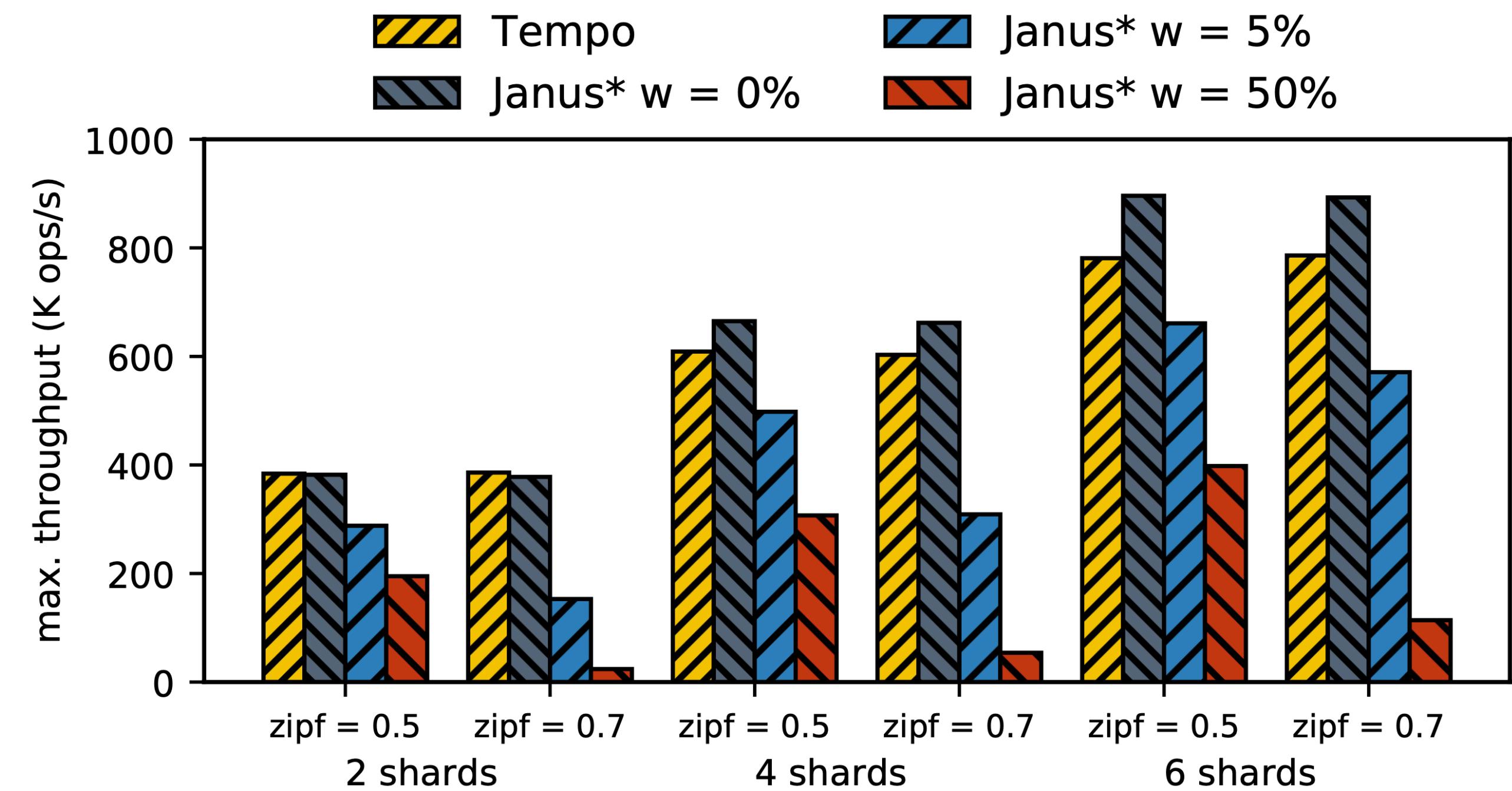
left is better  
←

# more in the paper

- **simple generalization to partial replication**

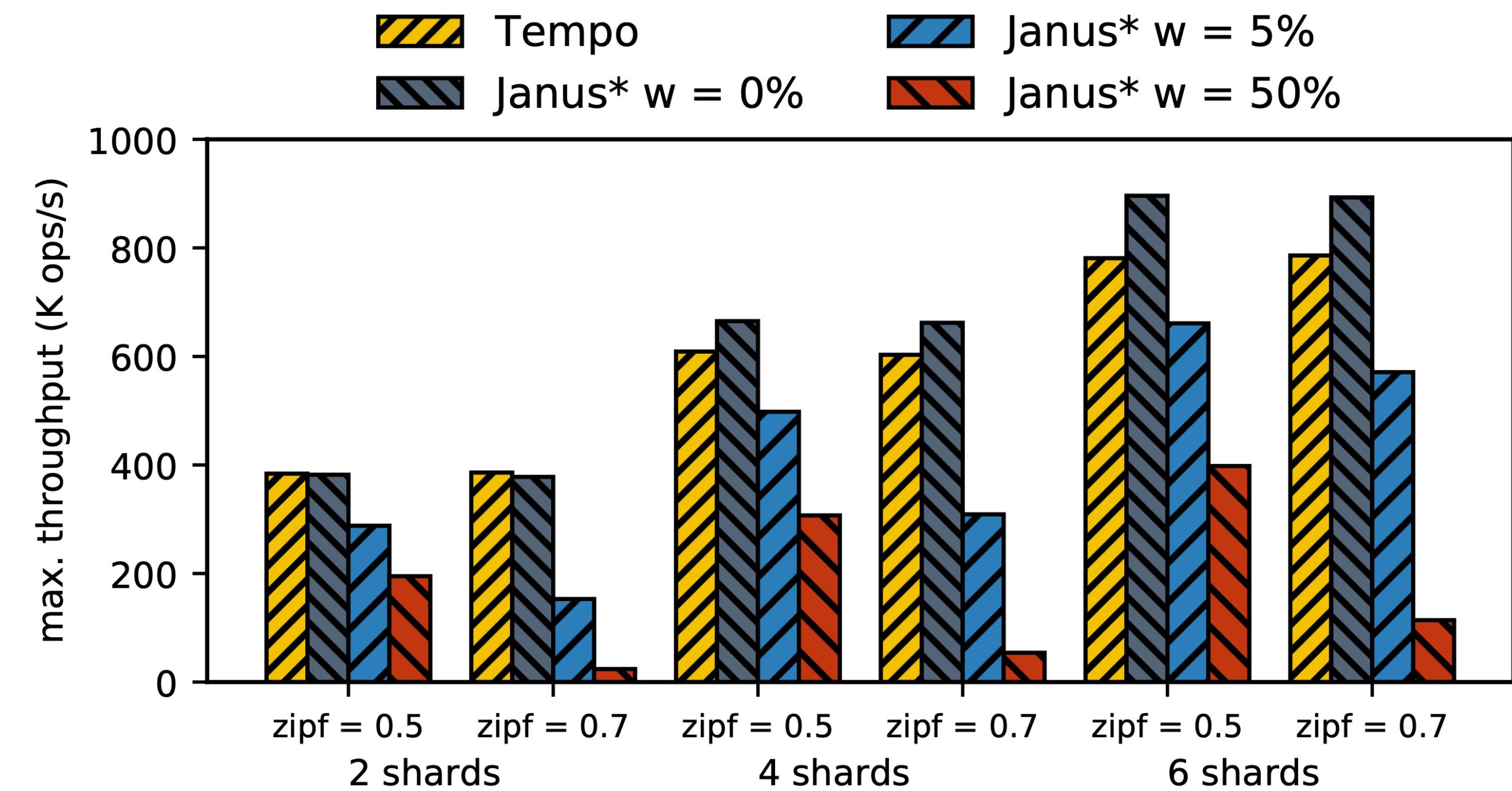
# more in the paper

- **simple generalization to partial replication**



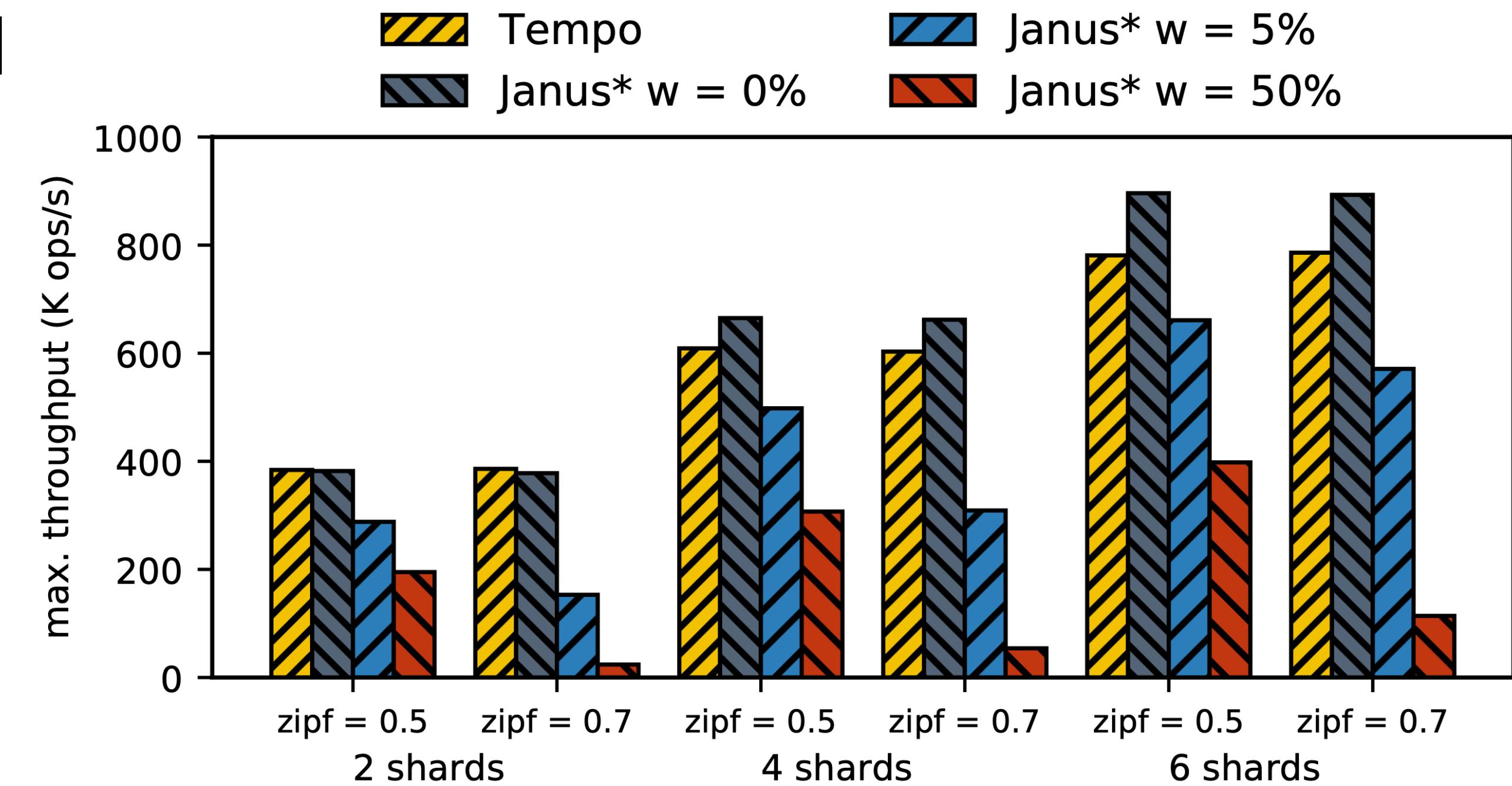
# more in the paper

- **simple generalization to partial replication**
- **permissive fast-path condition**
- **simple recovery mechanism**



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- **simple generalization to partial replication**
- **permissive fast-path condition**
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evaluation framework  
[github.com/vitoresenesduarte/fantoch](https://github.com/vitoresenesduarte/fantoch)

# summary

- tempo guarantees **progress under a synchronous network** without the need to contact all replicas

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- tempo guarantees **progress under a synchronous network** without the need to contact all replicas
- tempo provides **predictable performance** even in contended workloads
- tempo handles both **full and partial replication** scenarios
  - timestamping and stability detection are **fully decentralized**

# efficient replication via timestamp stability

**Vitor Enes**, Carlos Baquero, Alexey Gotsman, Pierre Sutra

27 Apr. 2021 @ EuroSys'21

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