

# High Throughput Replication with Integrated Membership Management

Pedro Fouto, Nuno Preguiça, João Leitão

**USENIX ATC 2022** 









### Outline

- Motivation and Related Work
- ChainPaxos
  - $\circ$  Writing
  - o Local Linearizable Reads
  - o Reconfiguration
- Evaluation

#### **Pedro Fouto**



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- Building blocks of numerous practical replication systems
- Their performance is critical

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- Two very relevant ones:

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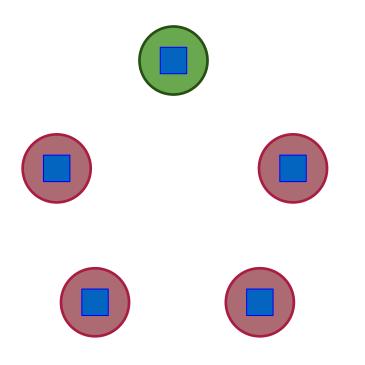
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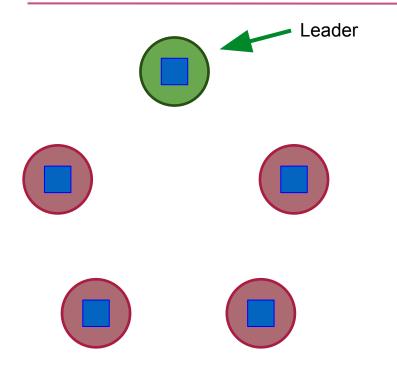
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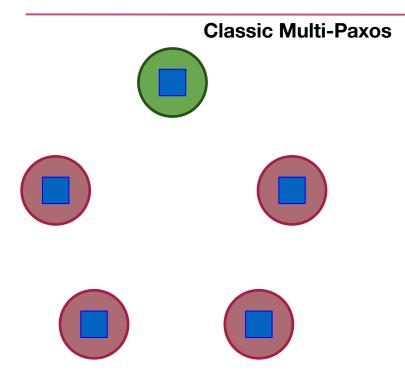
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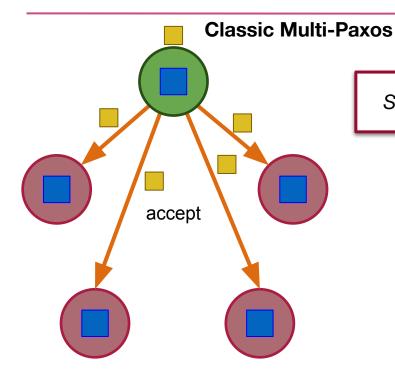
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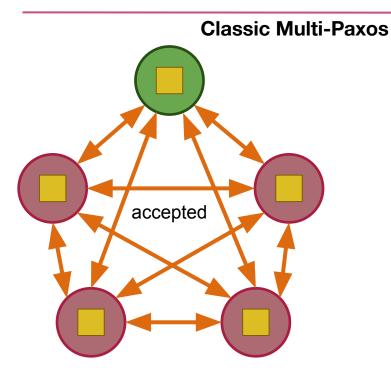




Skipping the first phase

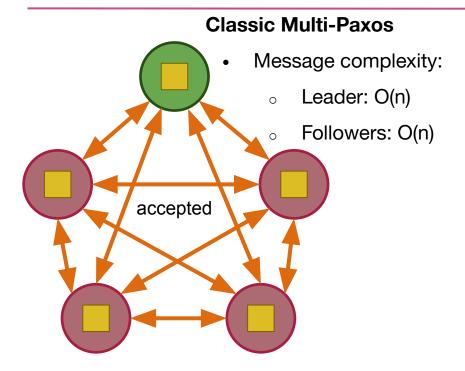
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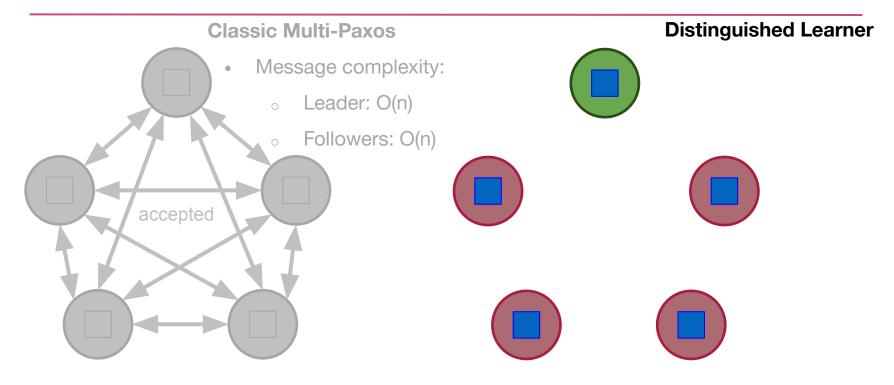
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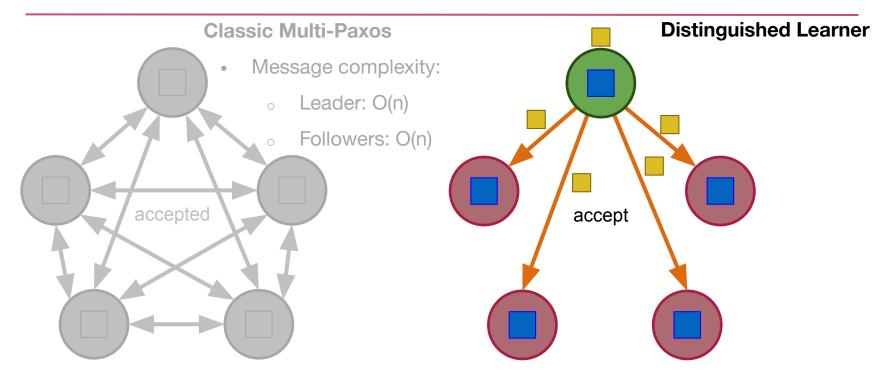
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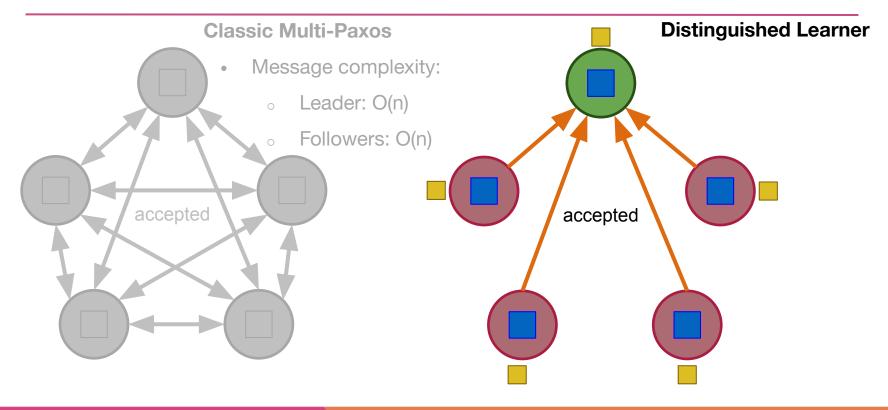
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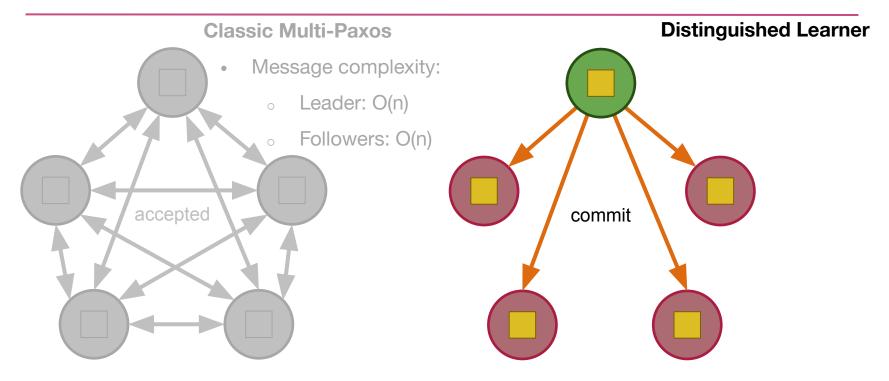
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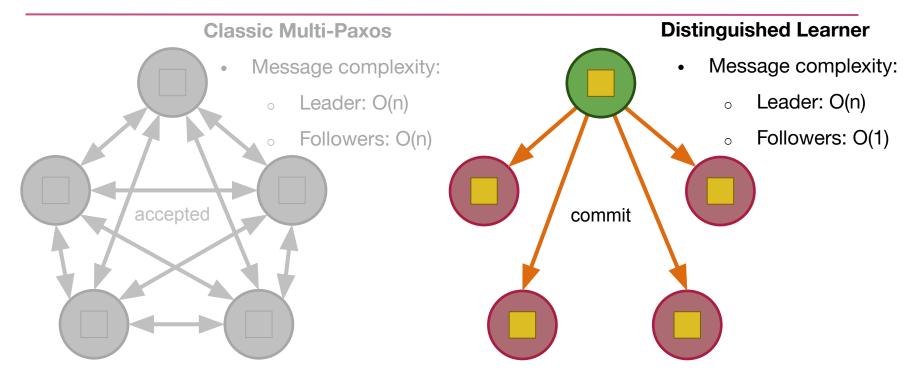
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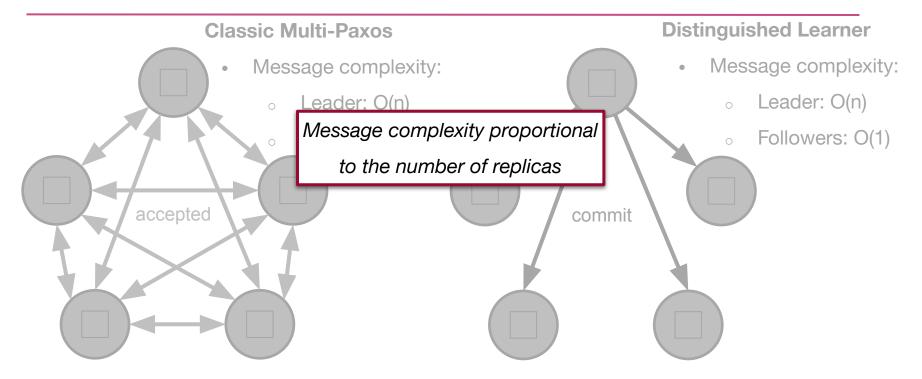
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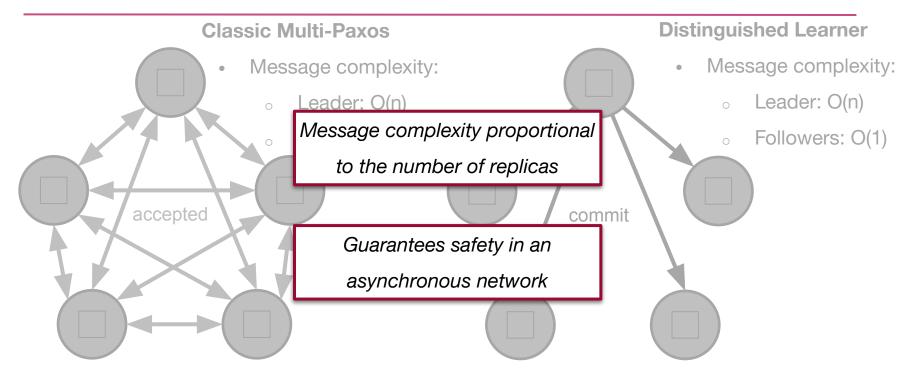
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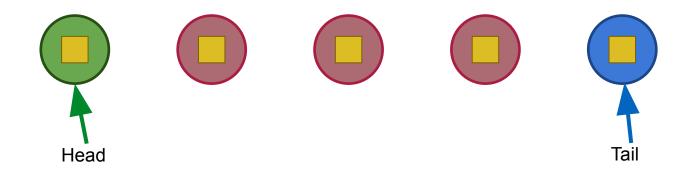
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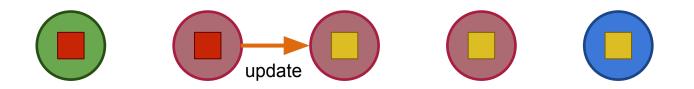
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- Message complexity:
  - All replicas: O(1)





# 

• Message complexity:

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However, it has its limitations...

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  - Membership management and reconfiguration

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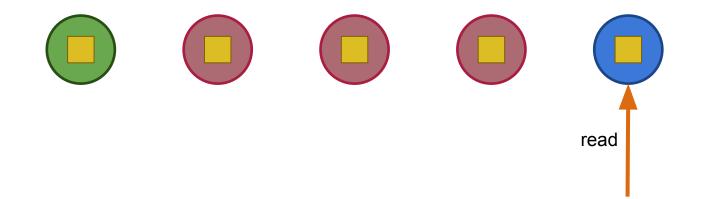
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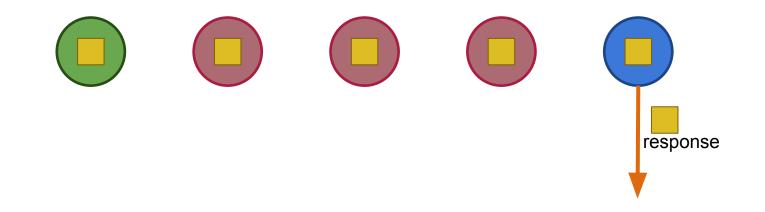
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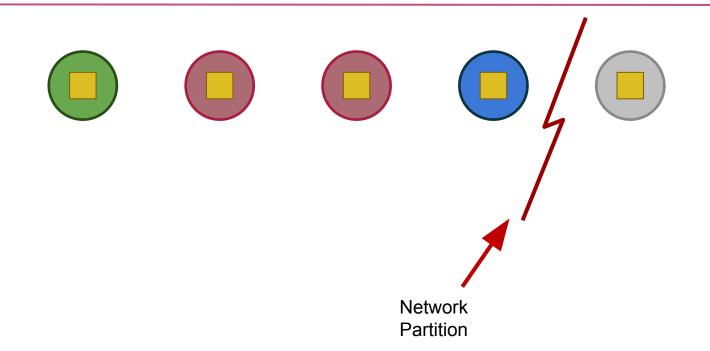
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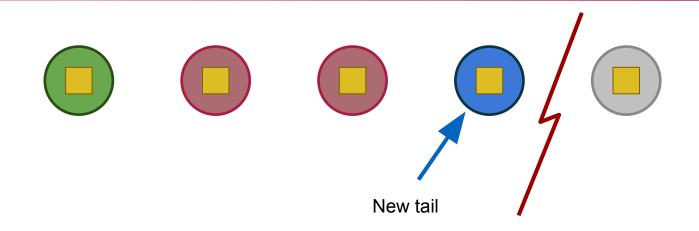
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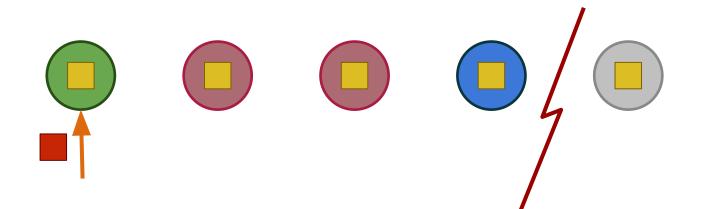
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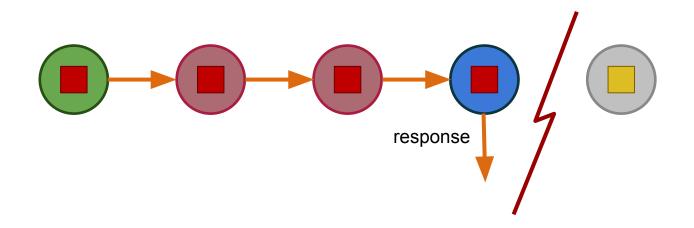
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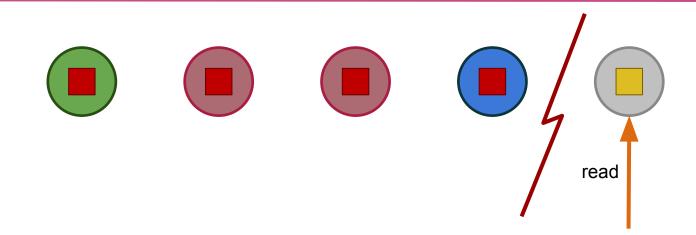
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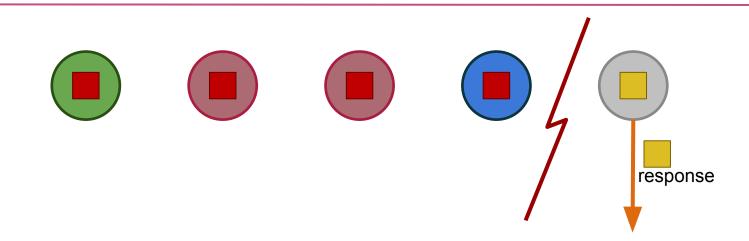
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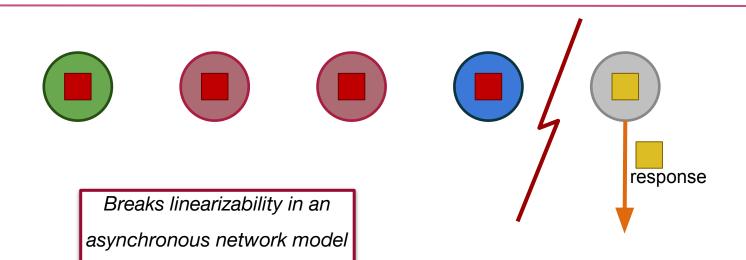
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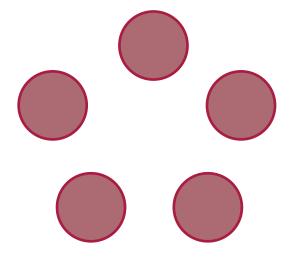


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• **Fault-tolerance** becomes complex

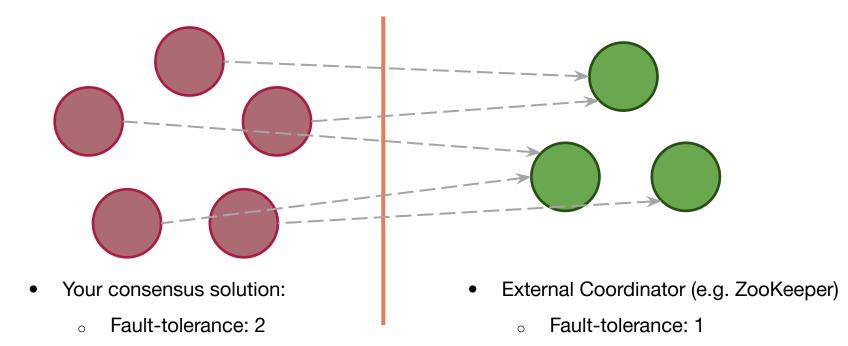




- Your consensus solution:
  - Fault-tolerance: 2

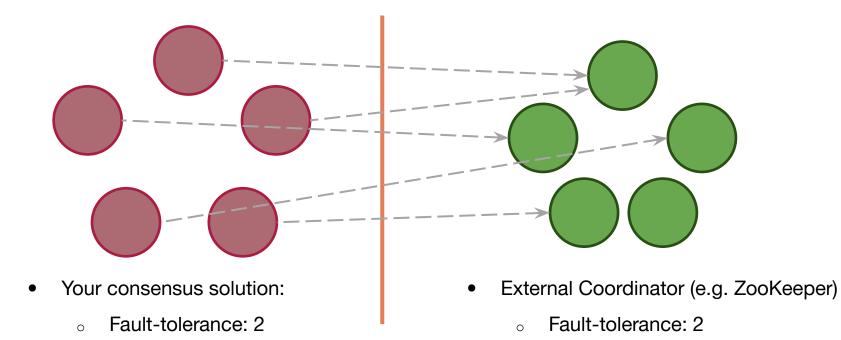
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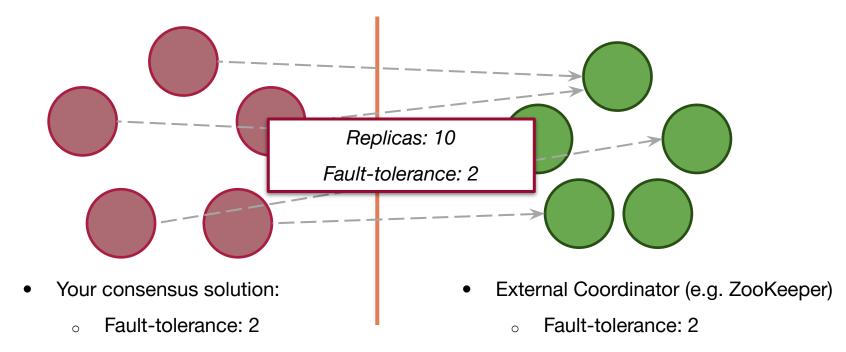
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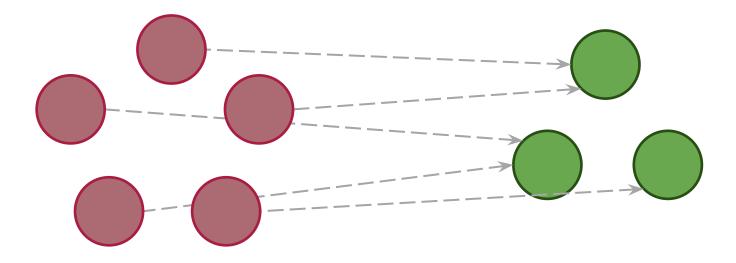
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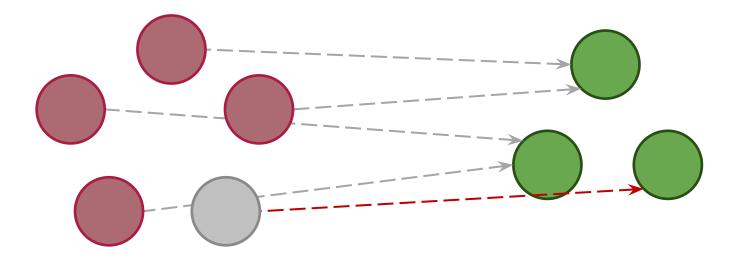
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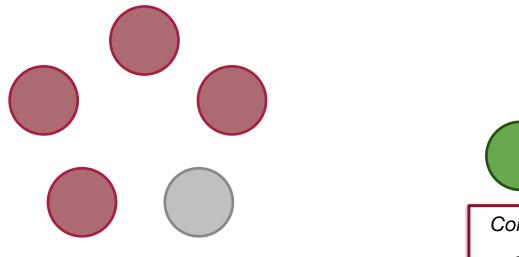
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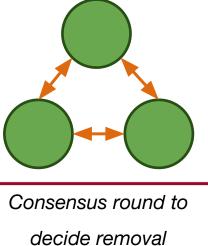




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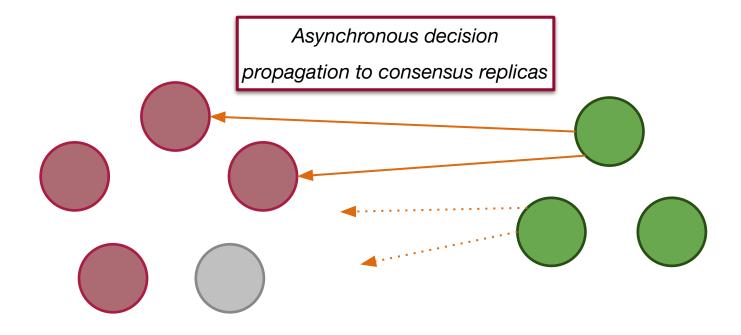






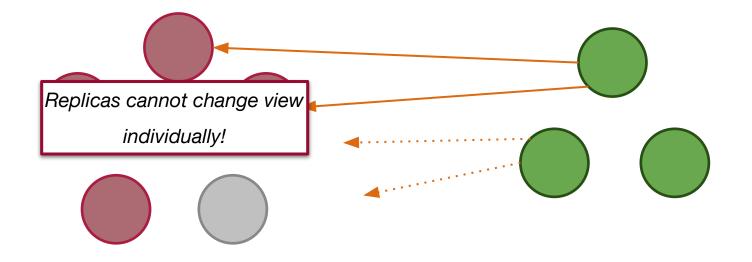
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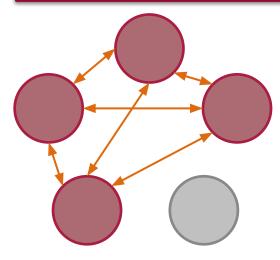


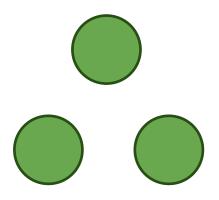
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Another (redundant)

consensus round is required





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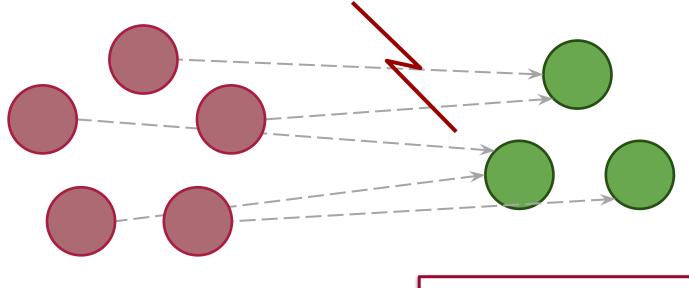
VALINCS

- **Fault-tolerance** becomes complex
- **Complex (and redundant) integration** with consensus
- More vulnerable to partial network partitions<sup>1</sup>

<sup>1</sup>Alfatafta, Mohammed, et al. "Toward a generic fault tolerance technique for partial network partitioning." OSDI 2020.

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Partition between coordinator

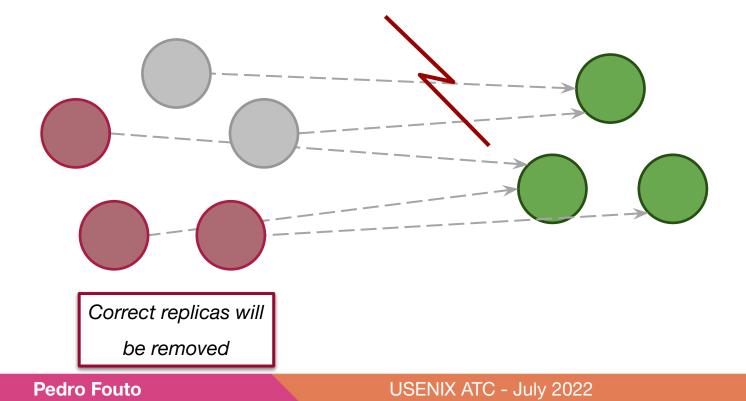
and consensus replicas

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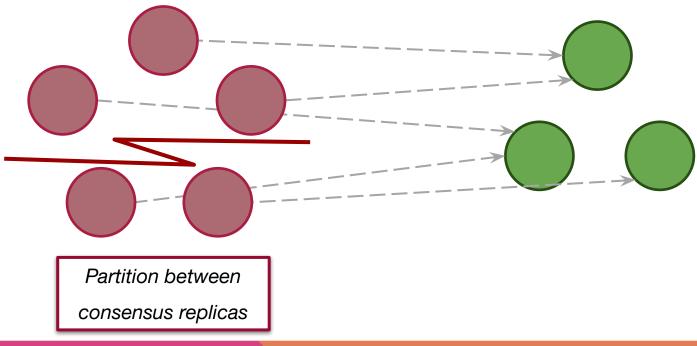
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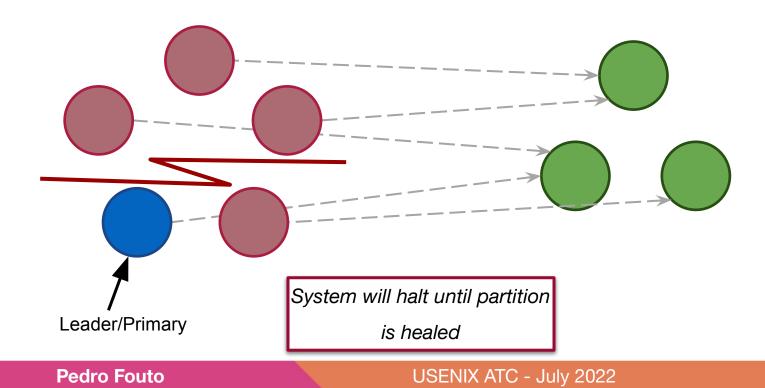






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### Proposal: ChainPaxos

Novel consensus algorithm:

- **Combining** the best properties of Multi-Paxos and Chain Replication
  - Correction in an **asynchronous network**
  - Constant message complexity



### Proposal: ChainPaxos

### Novel consensus algorithm:

- **Combining** the best properties of Multi-Paxos and Chain Replication
  - Correction in an asynchronous network
  - Constant message complexity
- Going beyond existing solutions:
  - **Maximizing throughput** of both read and write operations
  - Providing **local linearizable reads** in any replica
  - Integrated reconfiguration and fault-tolerance



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  - $\circ$  Writing
  - o Local Linearizable Reads
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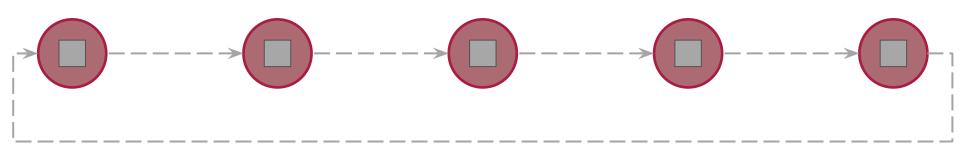
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  - Writing (commits + garbage collection)
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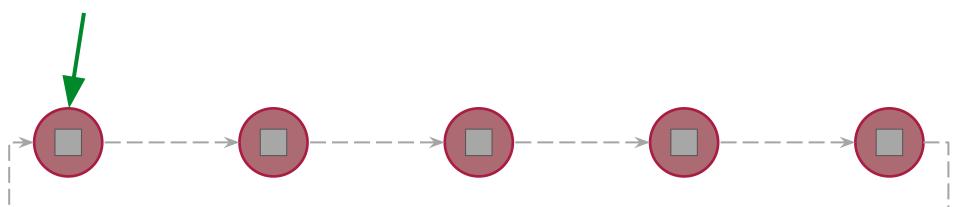
### ChainPaxos: Write Path



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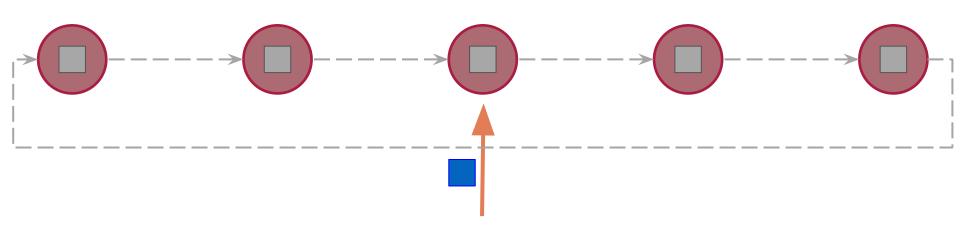


### Leader (regular Multi-Paxos election)



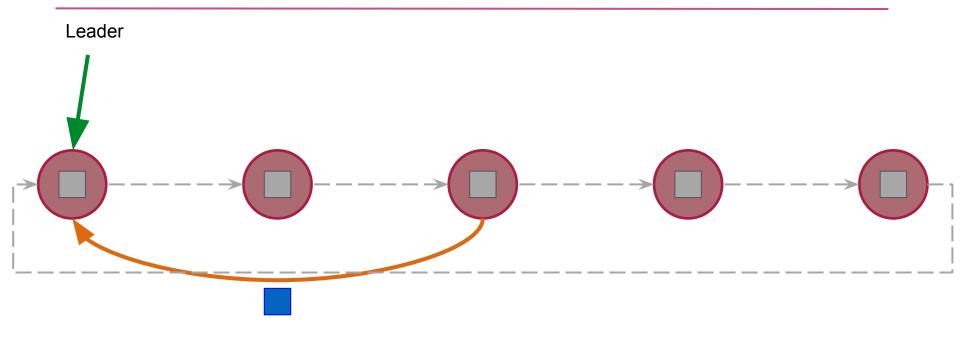
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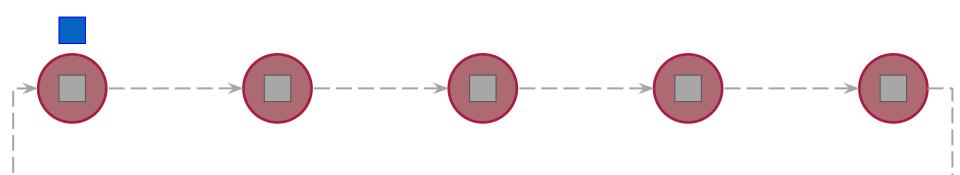
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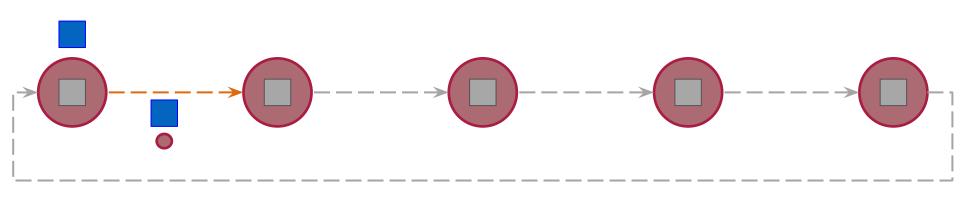
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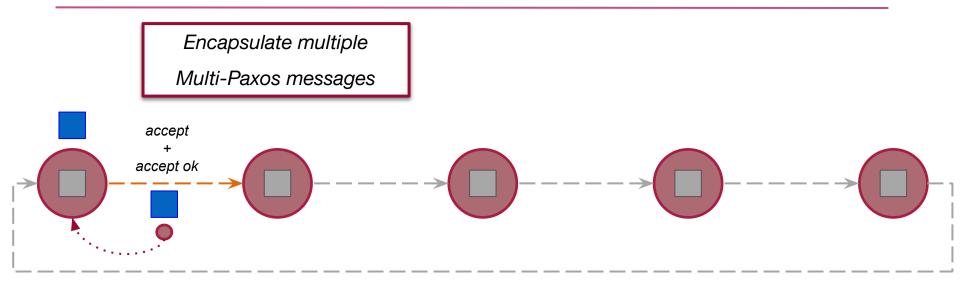
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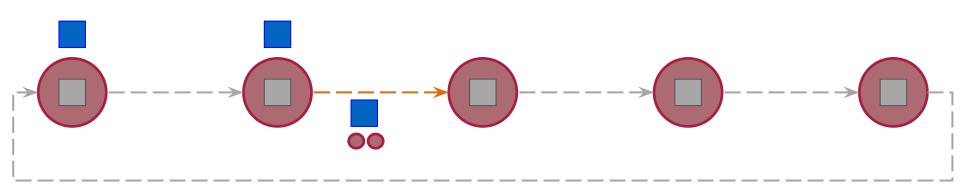
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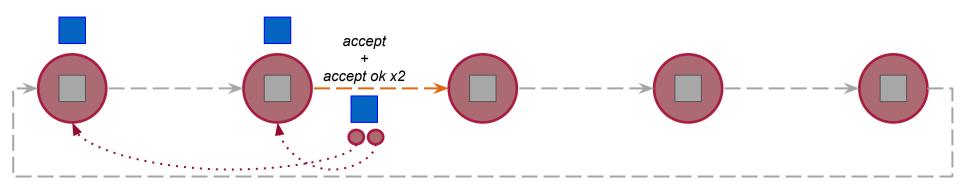
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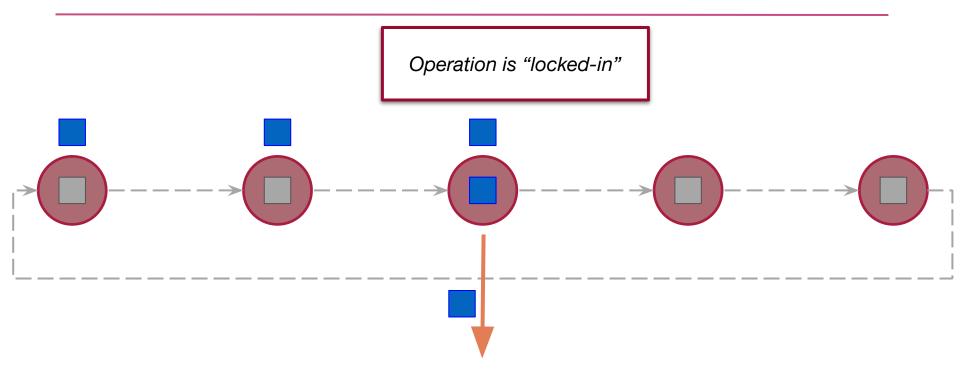
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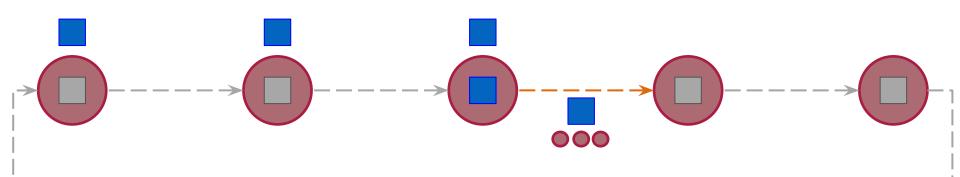
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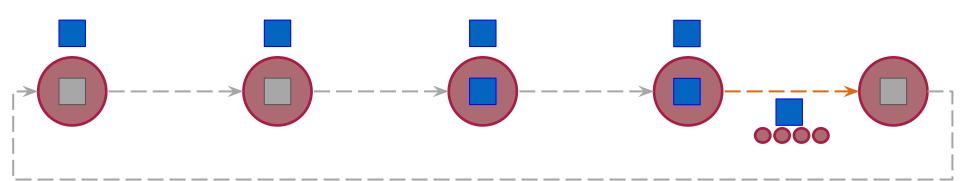
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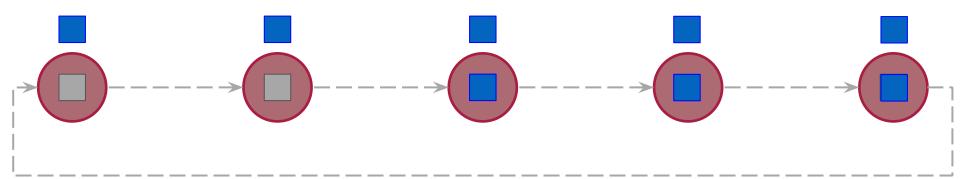
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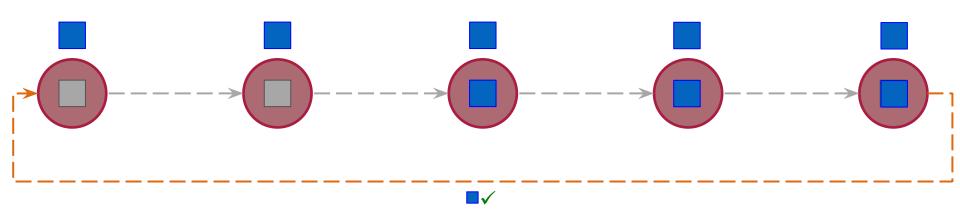


Need to garbage collect +

execute on the first replicas

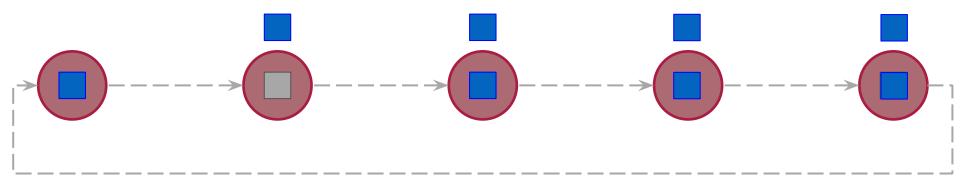
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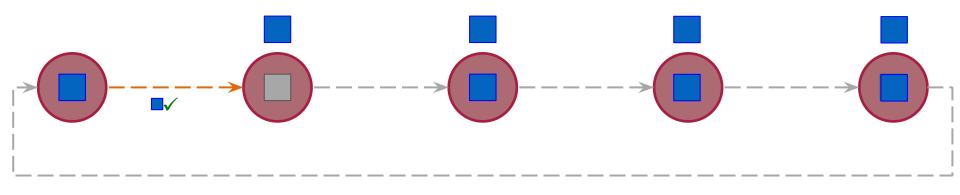
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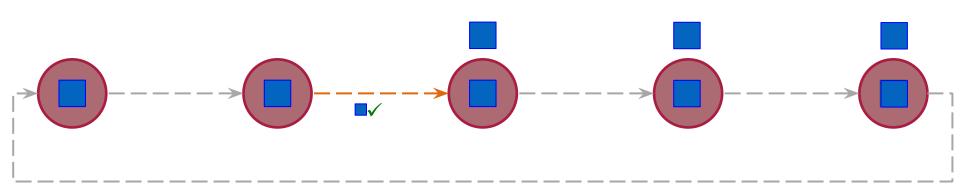
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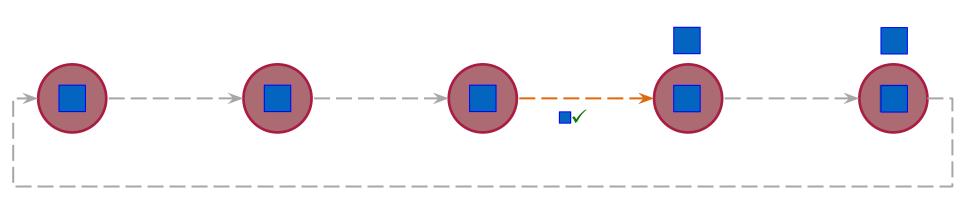
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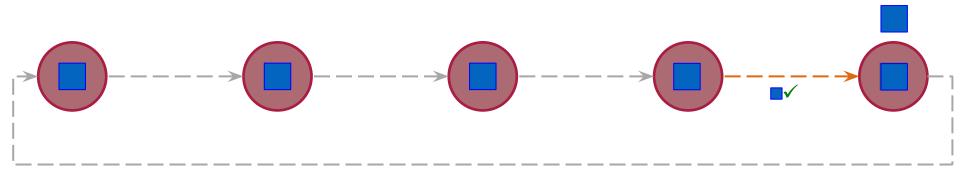
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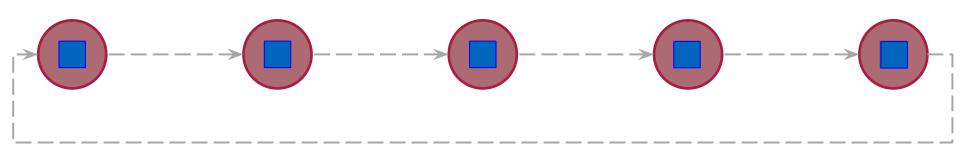
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- The result of a read must contain **all writes that completed** before it started
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### Challenge:

- Read from any replica
- No extra communication steps

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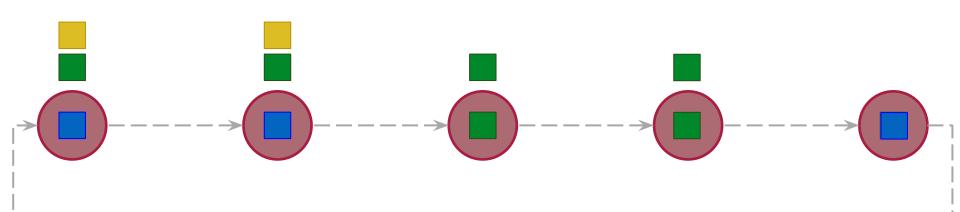
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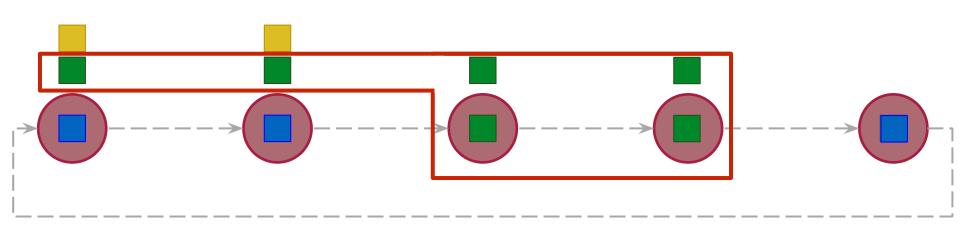
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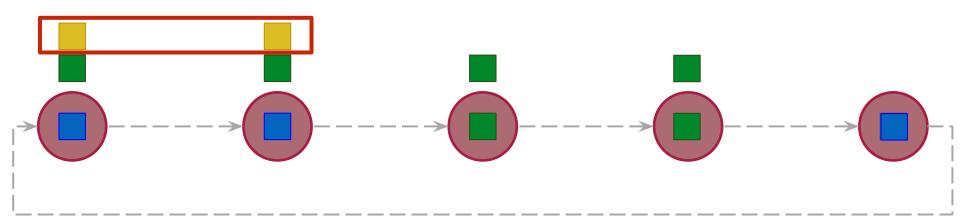
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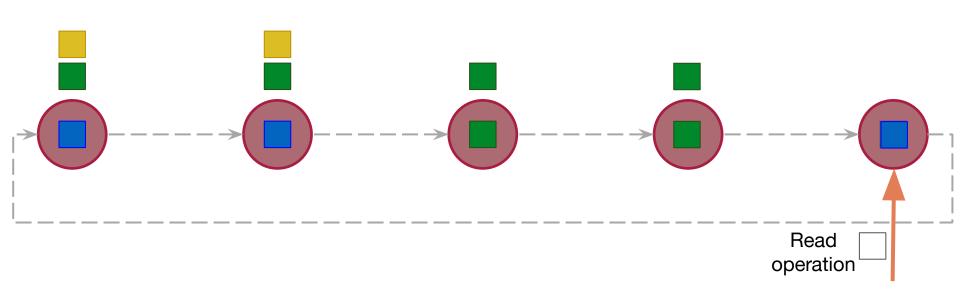


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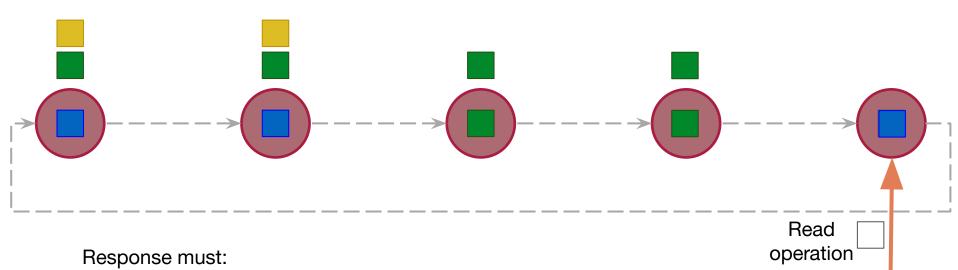


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### Local Linearizable Reads



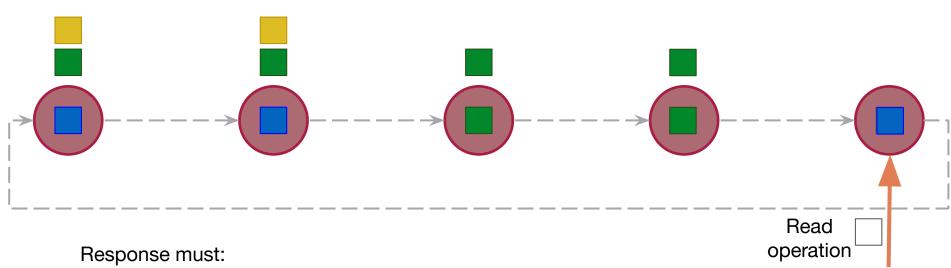




- Contain all completed writes
- Contain all completed reads

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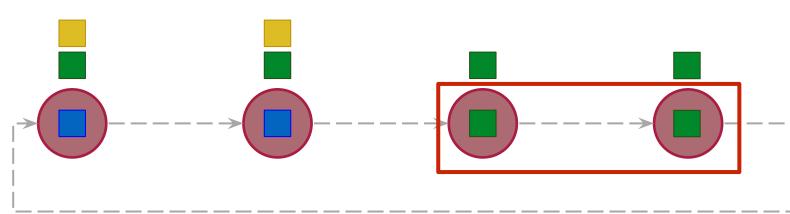


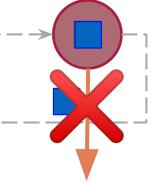


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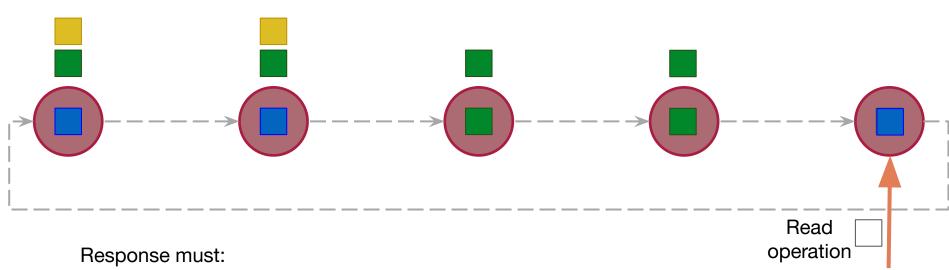


Response must:

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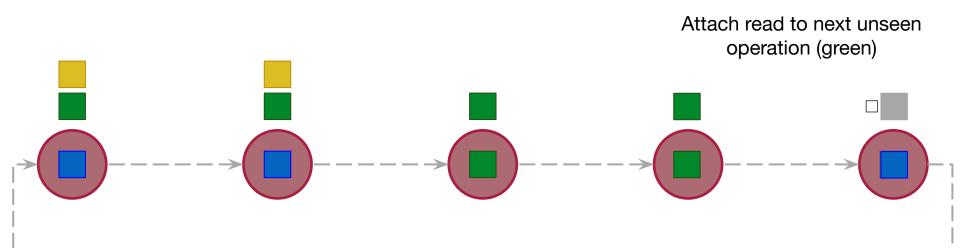




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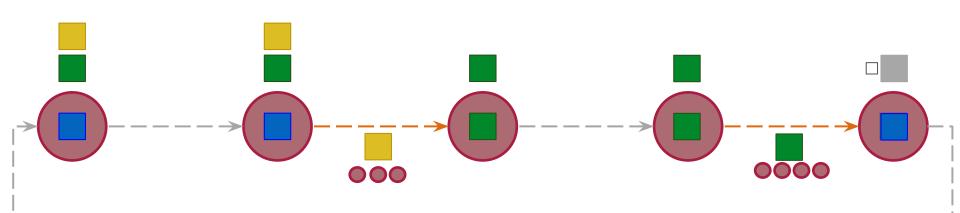
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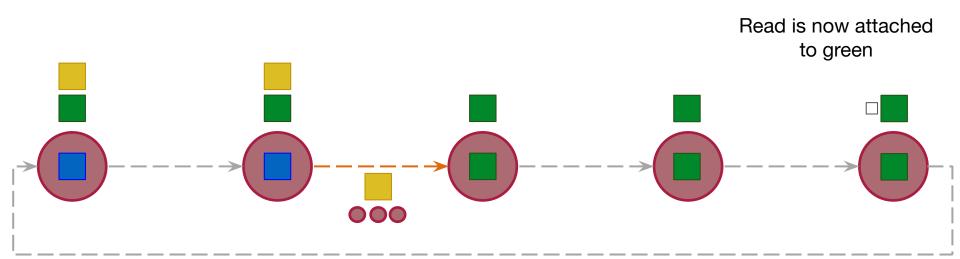
**Pedro Fouto** 





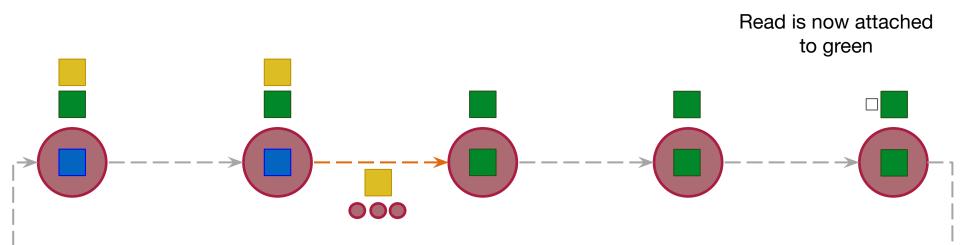
**Pedro Fouto** 





**Pedro Fouto** 

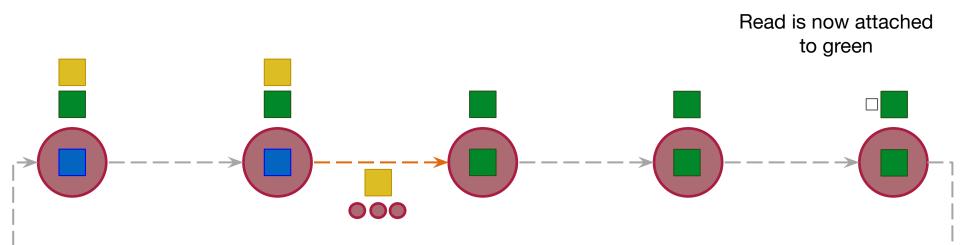




We now wait until the green ack goes around the chain

**Pedro Fouto** 

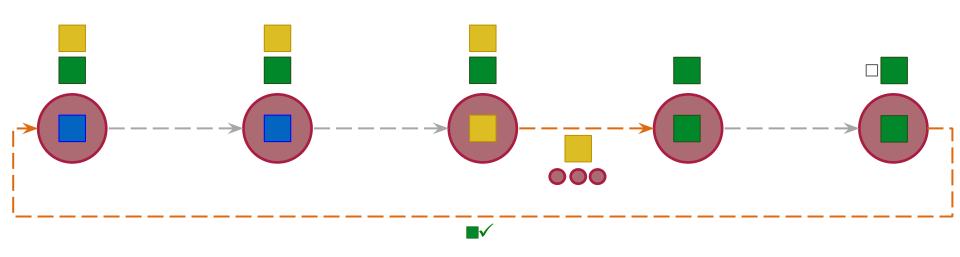




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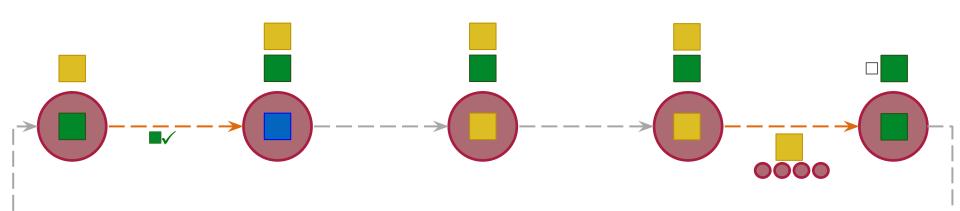
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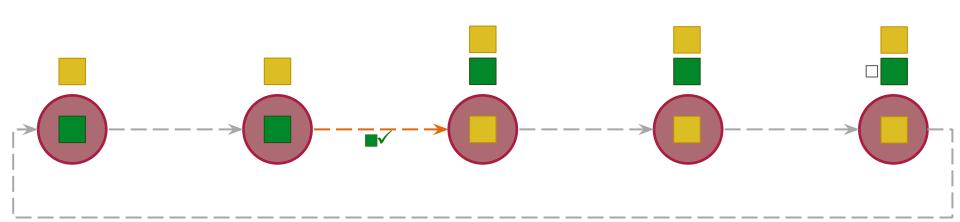
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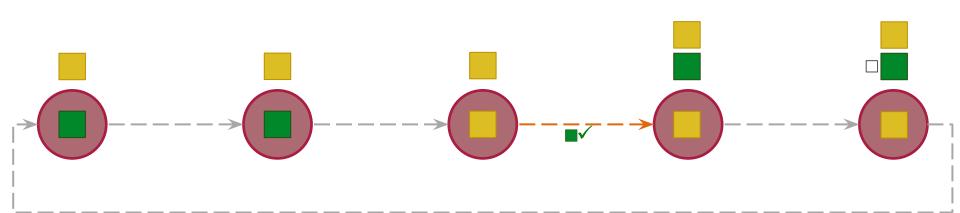
**Pedro Fouto** 





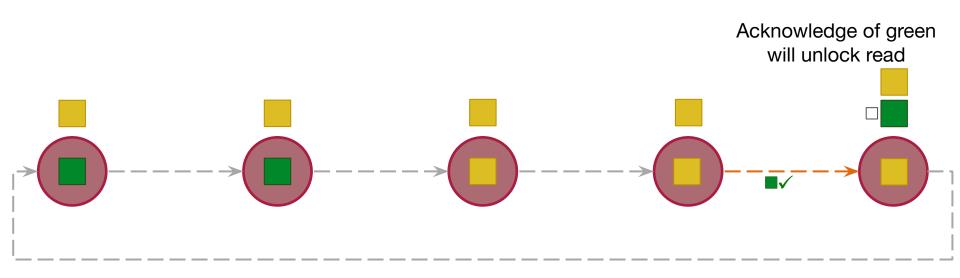
**Pedro Fouto** 





**Pedro Fouto** 



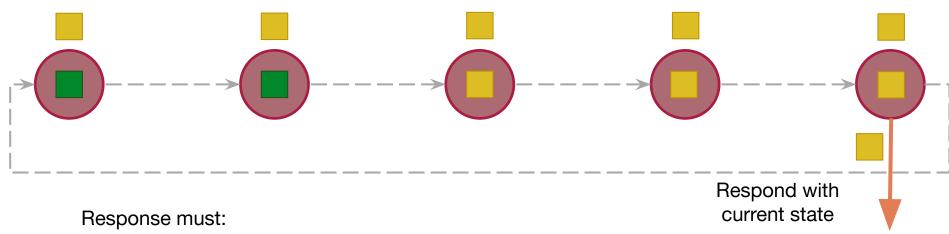


Response must:

- Contain all completed writes (
- Contain all completed reads

#### **Pedro Fouto**

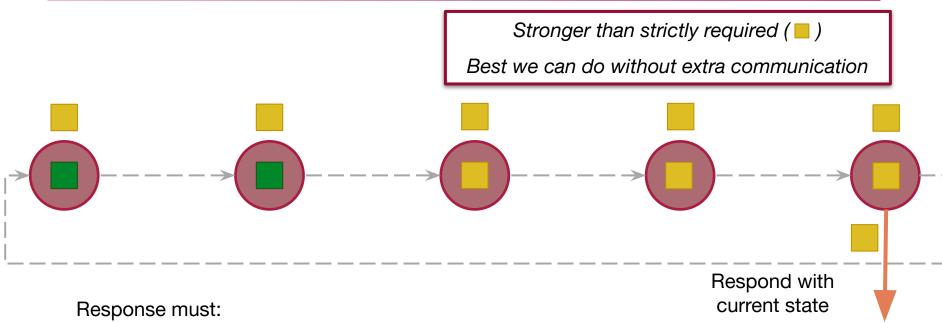




- Contain all completed writes (
  )
- Contain all completed reads

**Pedro Fouto** 

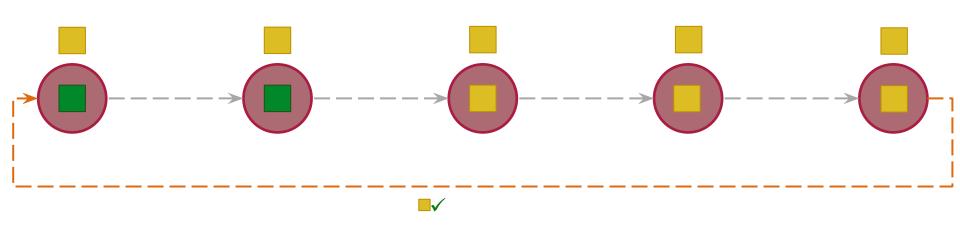




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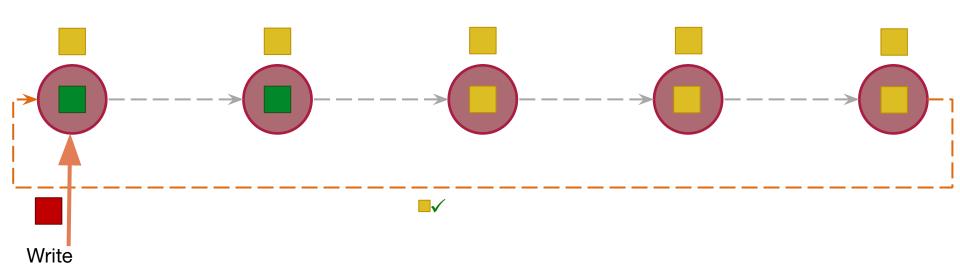
#### Pedro Fouto





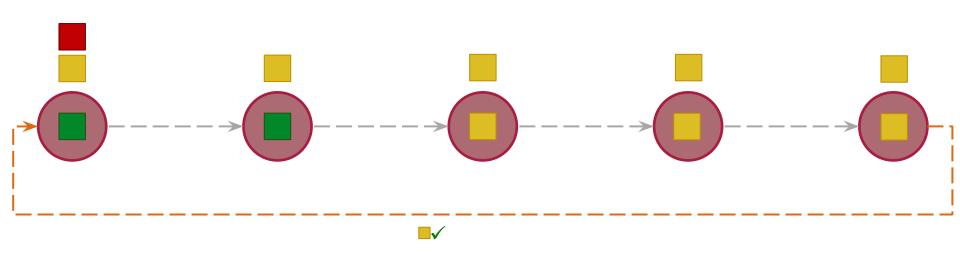
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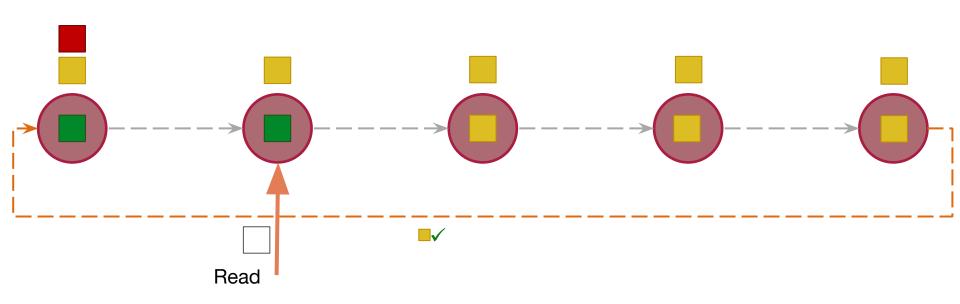
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**Pedro Fouto** 



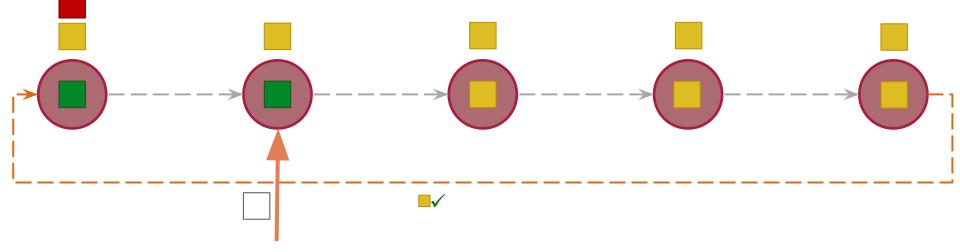


**Pedro Fouto** 



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  )

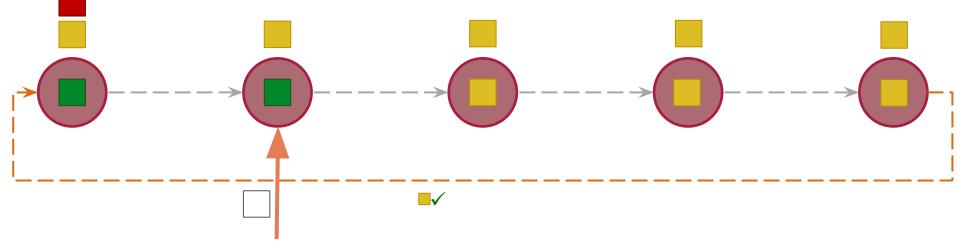


**Pedro Fouto** 



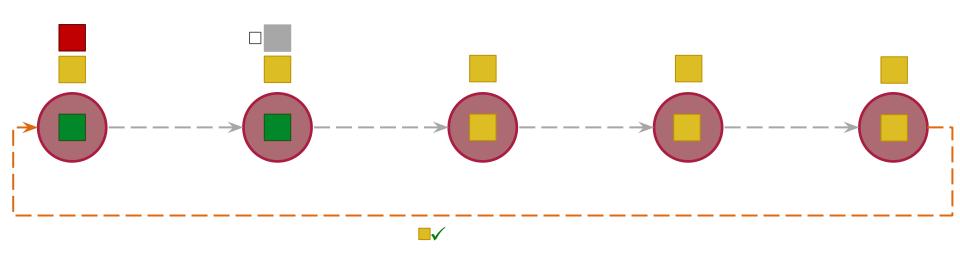
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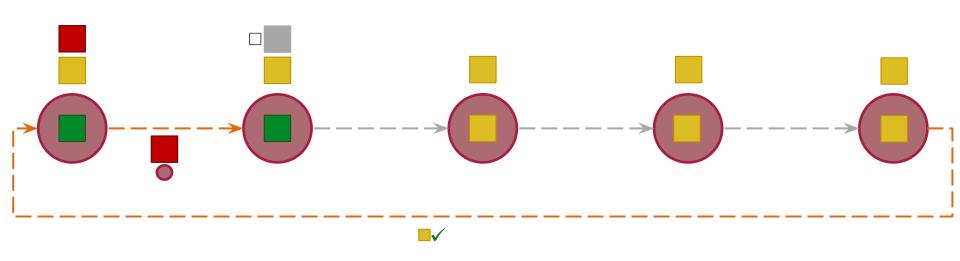
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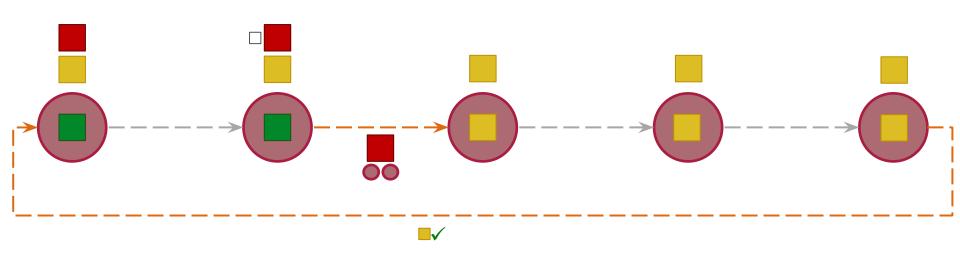
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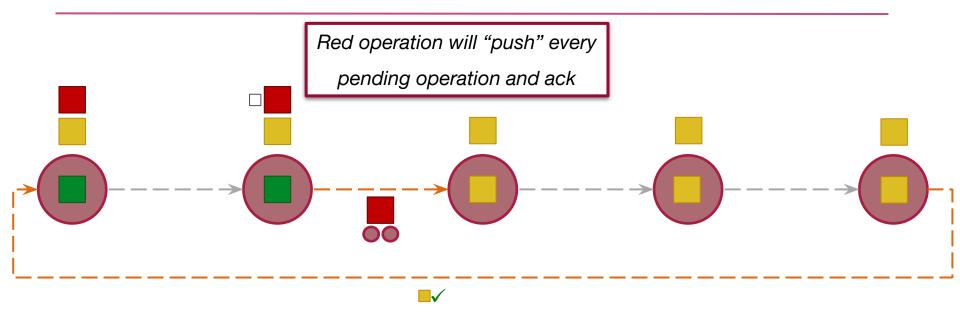
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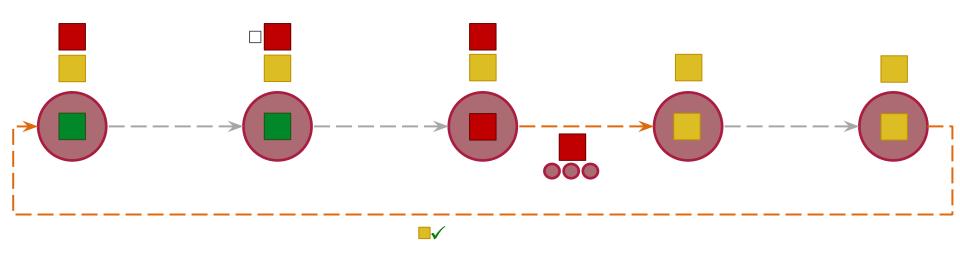
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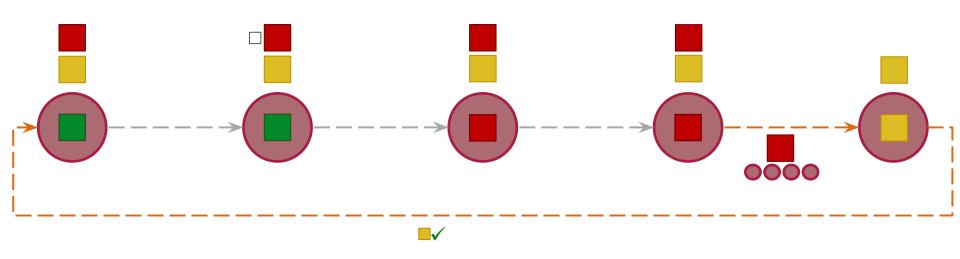
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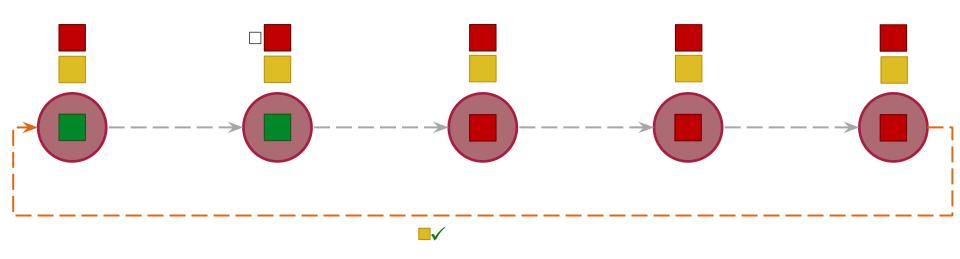
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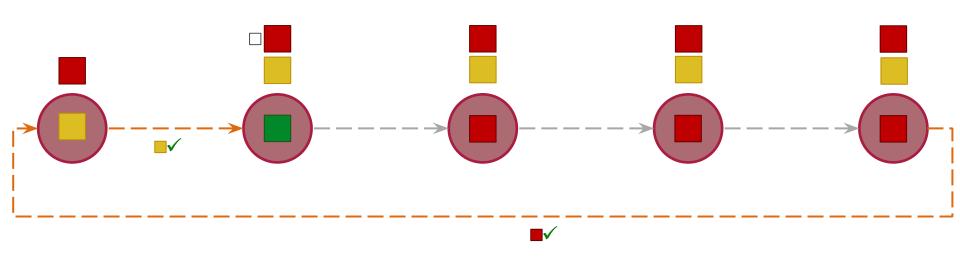
**Pedro Fouto** 





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#### Response must:

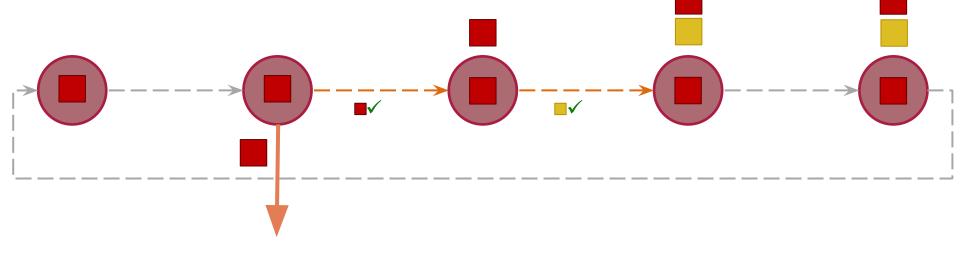
- Contain all completed writes
- Contain all completed reads (
  )

**Pedro Fouto** 



#### Response must:

- Contain all completed writes
- Contain all completed reads (
  )



**Pedro Fouto** 

# Local Linearizable Reads: Summary

- Read is dilated to guarantee linearizability:
  - Ensures all previously **completed reads and writes** are visible
- No additional communication steps are required
  - More **conservative** than required, but **unavoidable without coordination**
- Only possible due to chain topology

OVALINCS

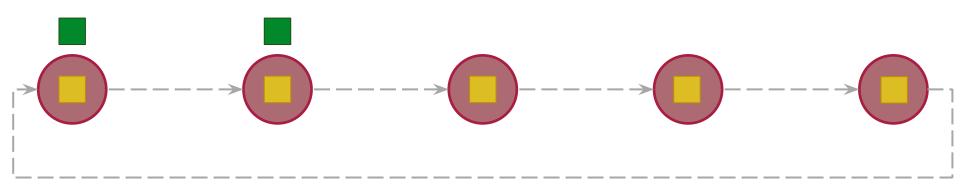


# Outline

- Motivation and Related Work
- ChainPaxos
  - $\circ$  Writing
  - Local Linearizable Reads
  - o Reconfiguration
- Evaluation

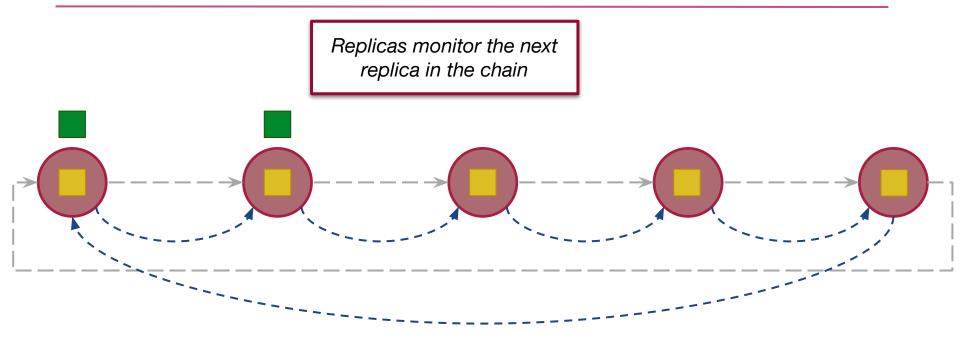
#### **Pedro Fouto**





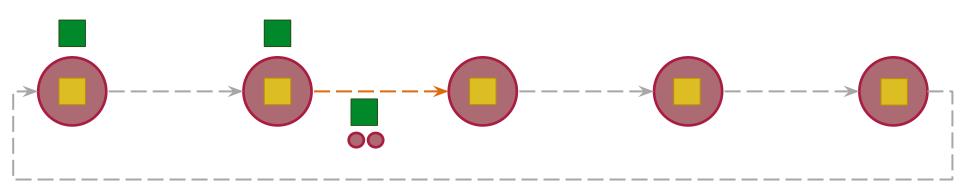
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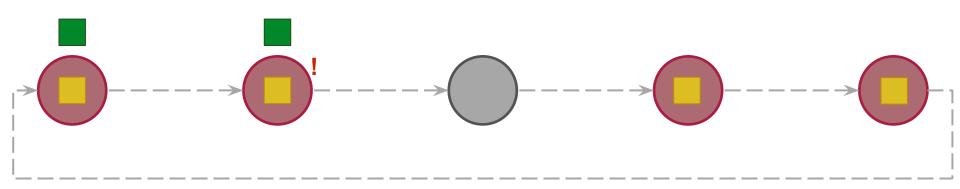
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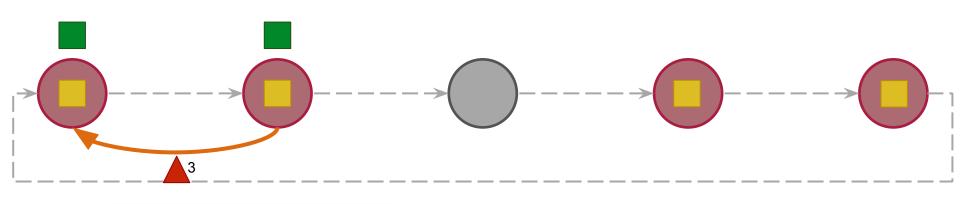
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**Pedro Fouto** 

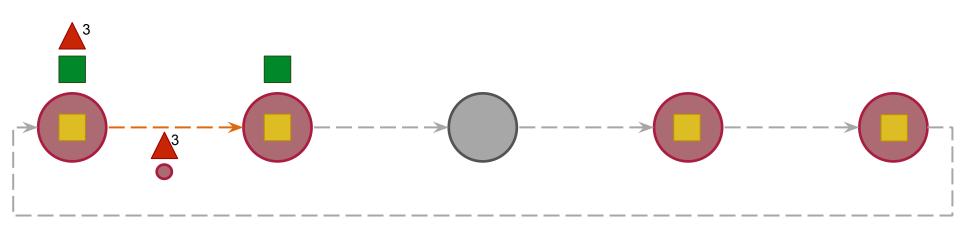




Removal requests are handled like regular operations

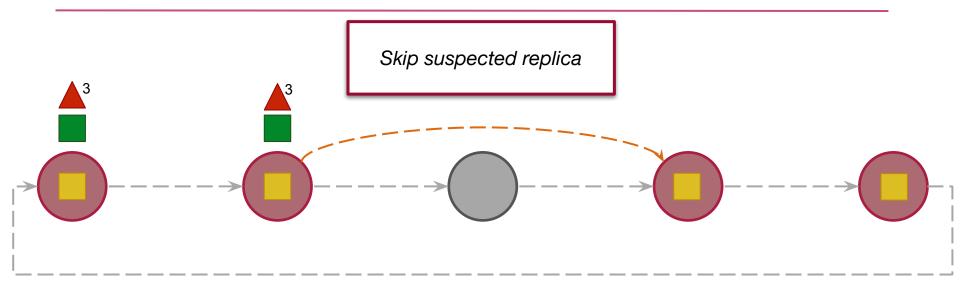
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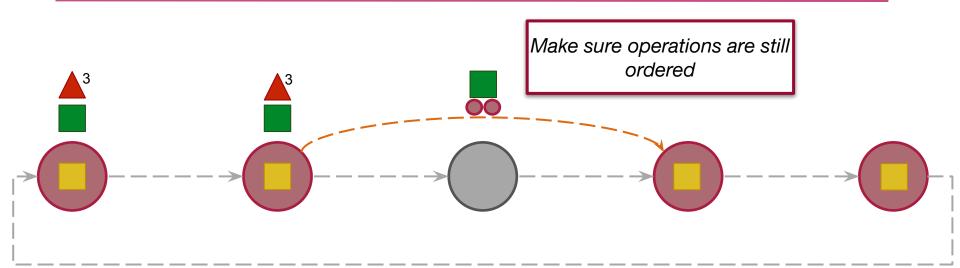




**Pedro Fouto** 

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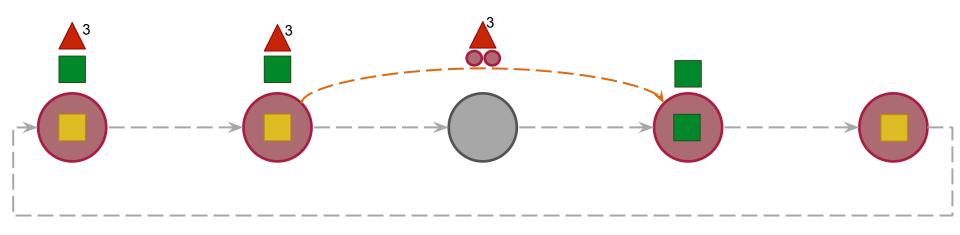




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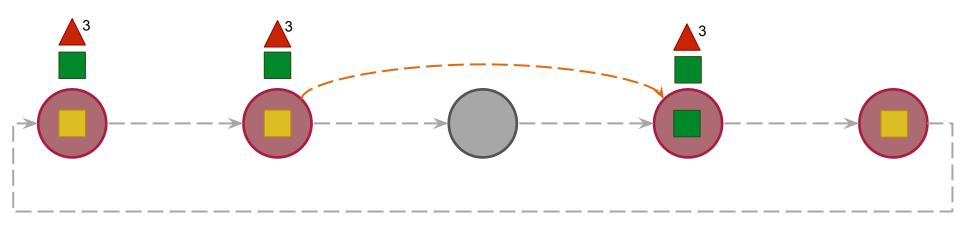
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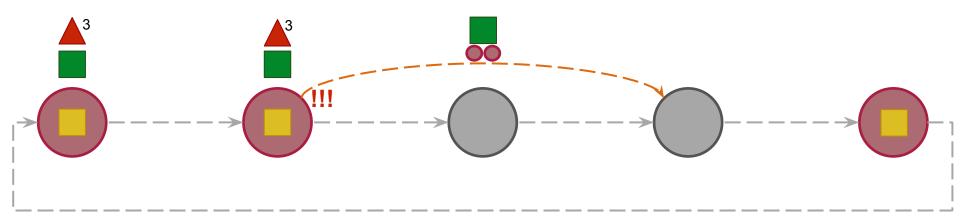
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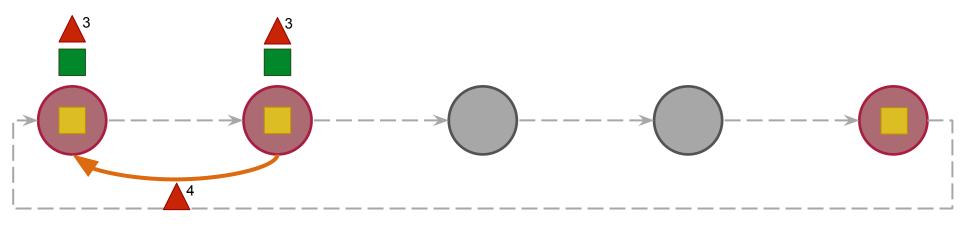
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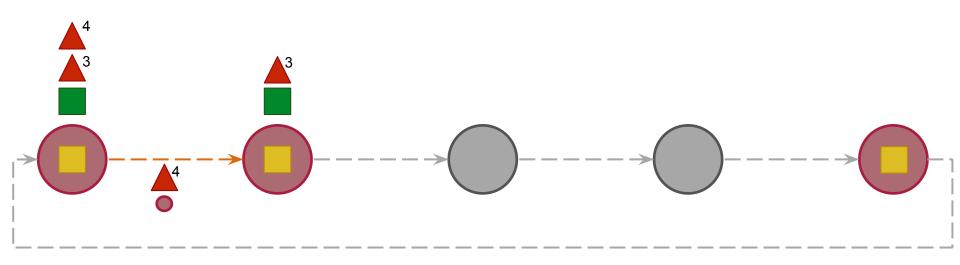
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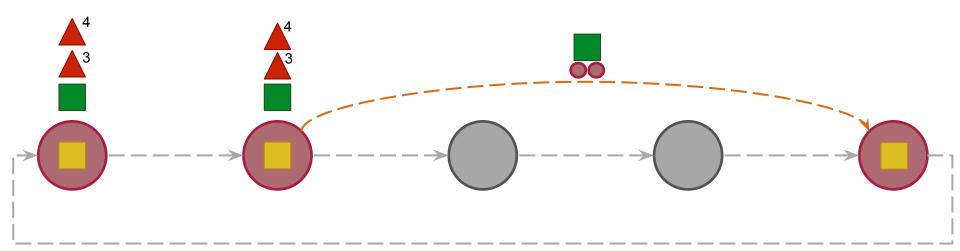
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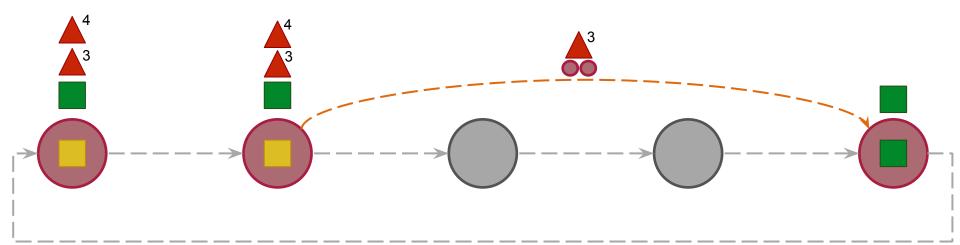
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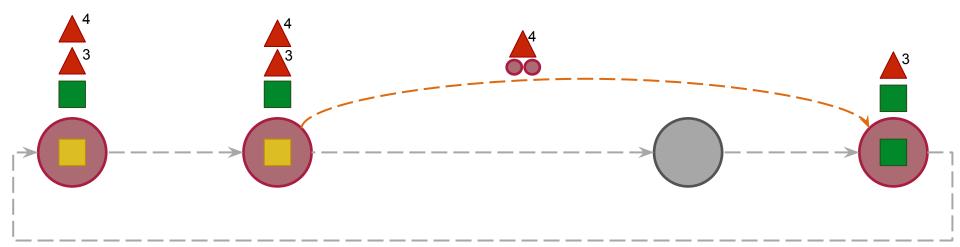
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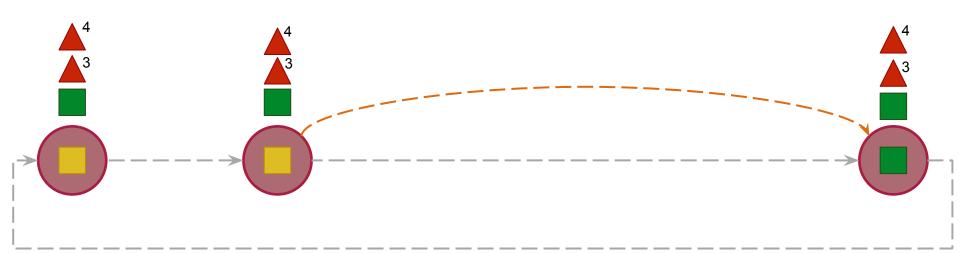
**Pedro Fouto** 





**Pedro Fouto** 





**Pedro Fouto** 



## ChainPaxos: Summary

- Aggregates Multi-Paxos messages for correction
- **Minimizes communication cost** for write operations
- Provides local linearizable reads in any replica
  - o With no additional communication
- Integrated reconfiguration and fault-tolerance
  - o Avoiding external coordination services



## Outline

- Motivation and Related Work
- ChainPaxos
  - Writing
  - o Local Linearizable Reads
  - Reconfiguration
- Evaluation

#### **Pedro Fouto**



### **Evaluation:** Goals

- How does ChainPaxos' **performance** compare against the state-of-the-art?
- What is the **latency overhead** of the chain?
- How much do local reads improve on the performance?
- Is ChainPaxos adequate to be used in a practical setting?



Compare with state-of-the-art





#### Compare with state-of-the-art

- Implemented a replicated key-value store
- Compared ChainPaxos against:
  - **MultiPaxos** (multiple variants)
  - Chain Replication
  - **EPaxos** (with and without conflicts)
  - (U-)RingPaxos



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#### Evaluate a more realistic scenario

#### **Pedro Fouto**



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- Integrated ChainPaxos in Zookeeper
- Replaced ZAB (ZooKeeper's atomic broadcast) with ChainPaxos

#### **Pedro Fouto**



## Evaluation: Methodology

Using Grid5000 testbed

Emulating clients with YCSB





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Measured:

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- Latency (as perceived by clients)



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Using Grid5000 testbed

Emulating clients with YCSB

Measured:

- Throughput (operations per second)
- Latency (as perceived by clients)

Varying:

- Number of consensus replicas (3, 5, 7)
- Load on the system (YCSB clients)
- Workload (read/write ratio)



#### Compare with state-of-the-art

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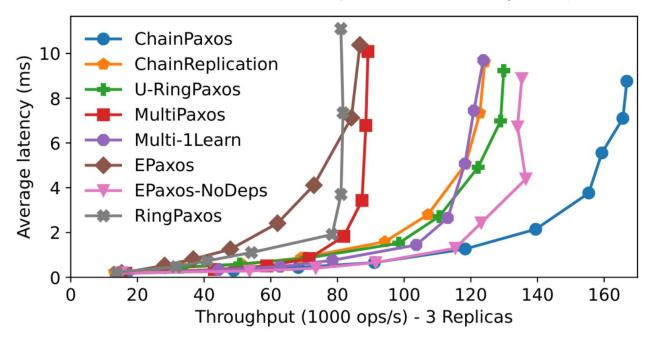


How does ChainPaxos' **performance** compare against the state-of-the-art?





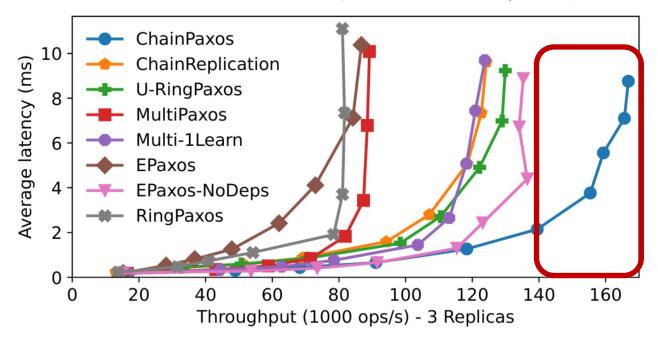
How does ChainPaxos' **performance** compare against the state-of-the-art?



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How does ChainPaxos' **performance** compare against the state-of-the-art?



Minimizing the number of messages maximizes throughput

**Pedro Fouto** 

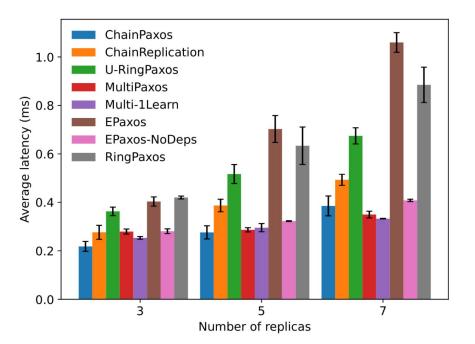


What is the latency overhead of the chain?





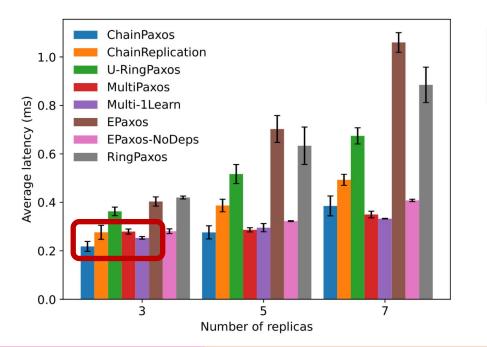
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**Pedro Fouto** 



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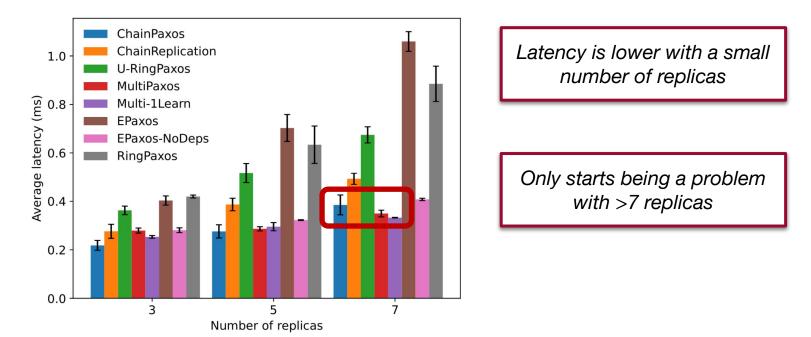


Latency is lower with a small number of replicas

#### **Pedro Fouto**



What is the latency overhead of the chain?



**Pedro Fouto** 

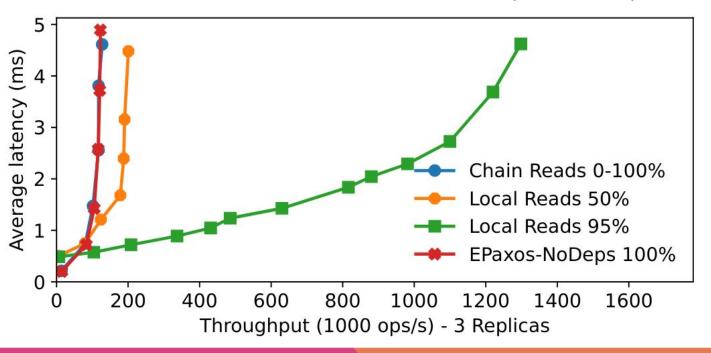


How much do local reads improve on the performance?





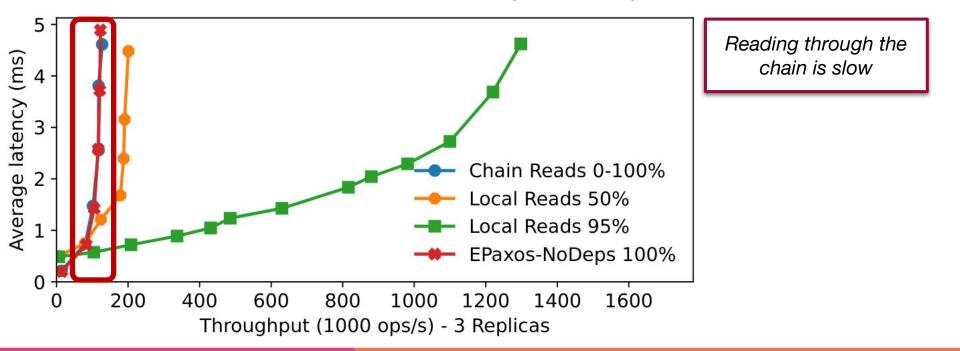
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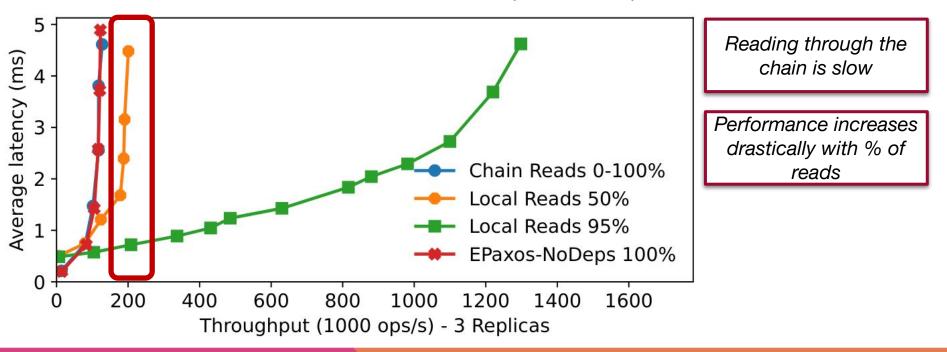
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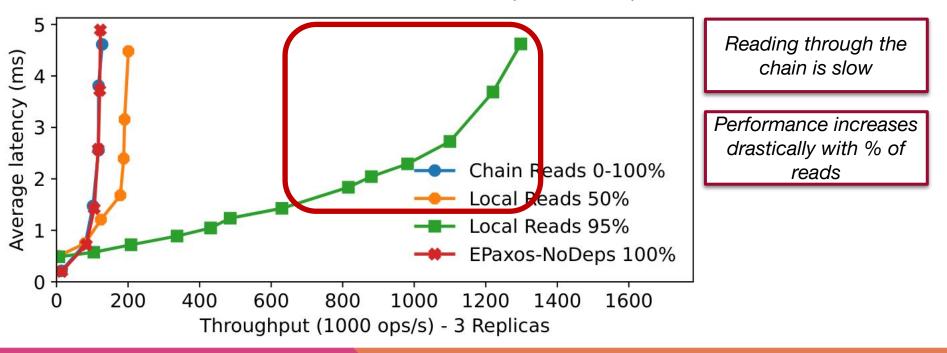
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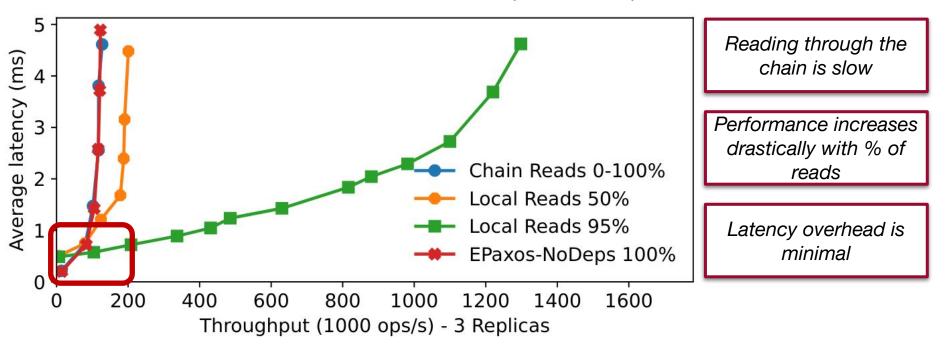
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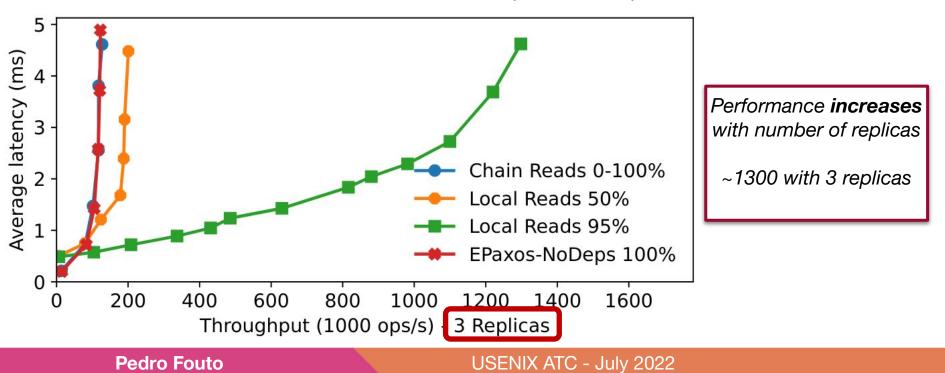
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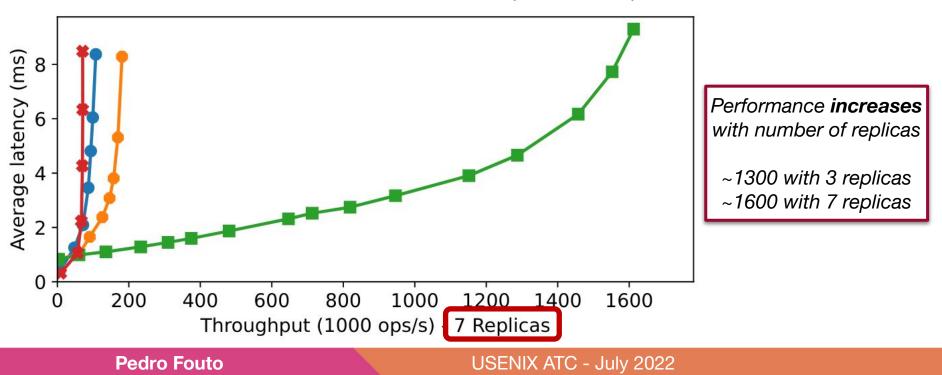


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#### Evaluate a more realistic scenario

USENIX ATC - July 2022

- Integrated ChainPaxos in Zookeeper
- Replaced ZAB (ZooKeeper's atomic broadcast) with ChainPaxos

#### **Pedro Fouto**

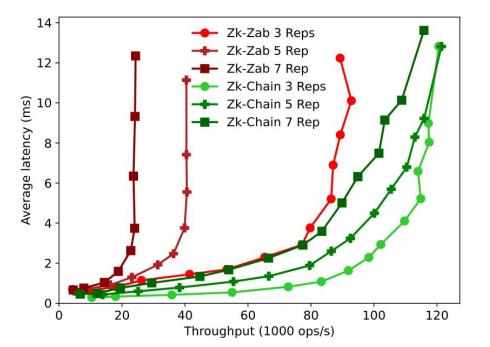


Is ChainPaxos adequate to be **used in a practical setting**?





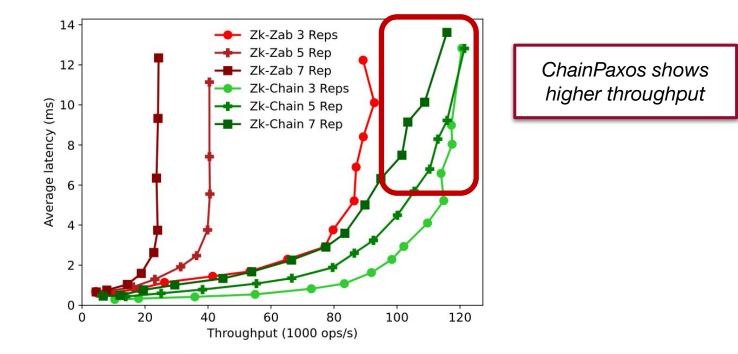
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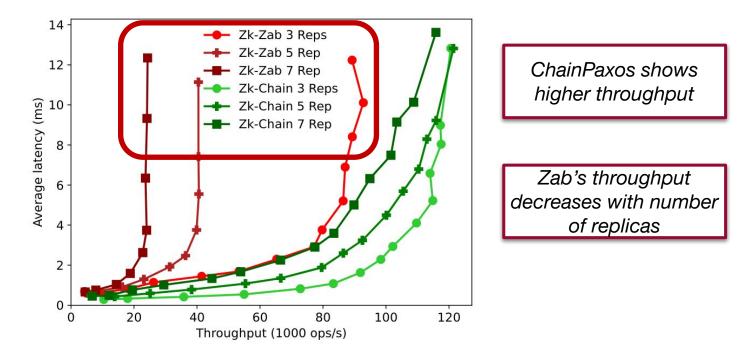
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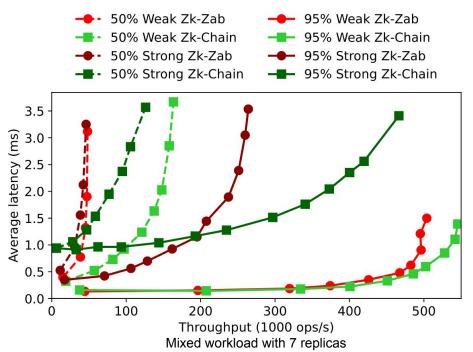
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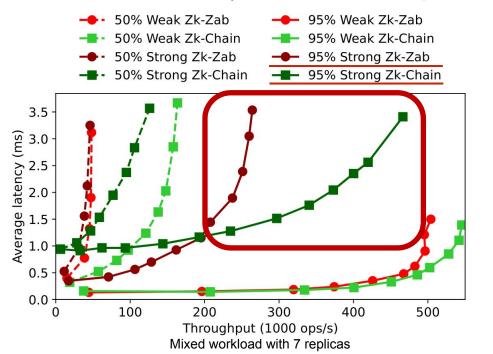
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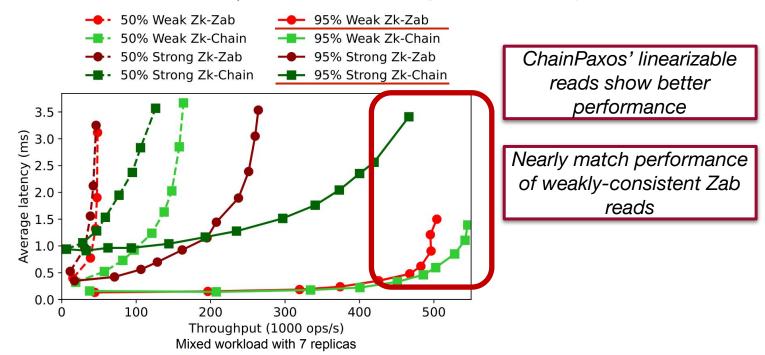


ChainPaxos' linearizable reads show better performance

**Pedro Fouto** 



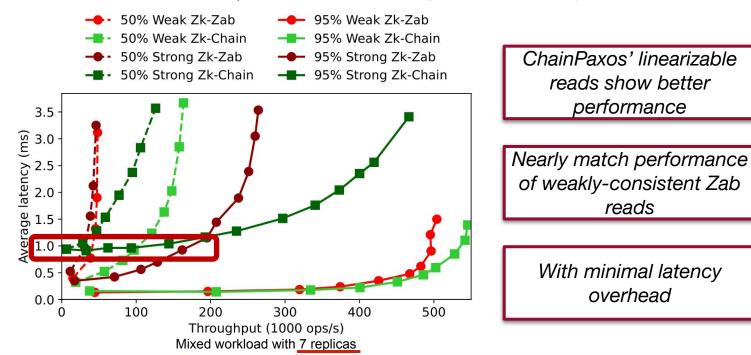
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**Pedro Fouto** 



#### Is ChainPaxos adequate to be used in a practical setting?



**Pedro Fouto** 



### Recap: ChainPaxos

#### Novel consensus algorithm:

- **Combining** the best properties of Multi-Paxos and Chain Replication
  - Correction in an asynchronous network
  - Constant message complexity
- Going beyond existing solutions:
  - **Maximizing throughput** of both read and write operations
  - Providing **local linearizable reads** in any replica
  - Integrated reconfiguration and fault-tolerance



# High Throughput Replication with Integrated Membership Management

Pedro Fouto, Nuno Preguiça, João Leitão

**USENIX ATC 2022** 





