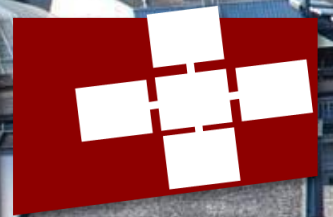


Marcin Copik, Alexandru Calotoiu, Pengyu Zhou, Konstantin Taranov, Torsten Hoefler

FaaSKeeper: Learning from Building Serverless Services with ZooKeeper as an Example

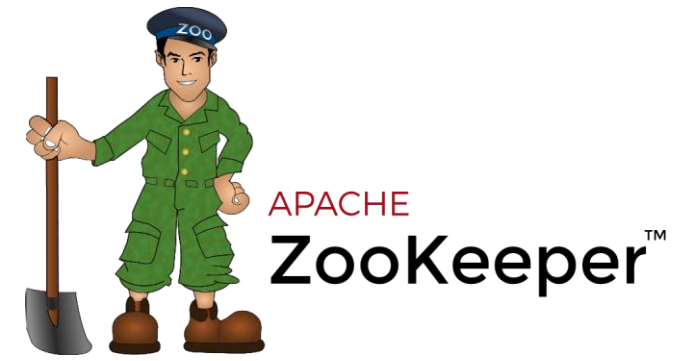


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Pisa, Italy

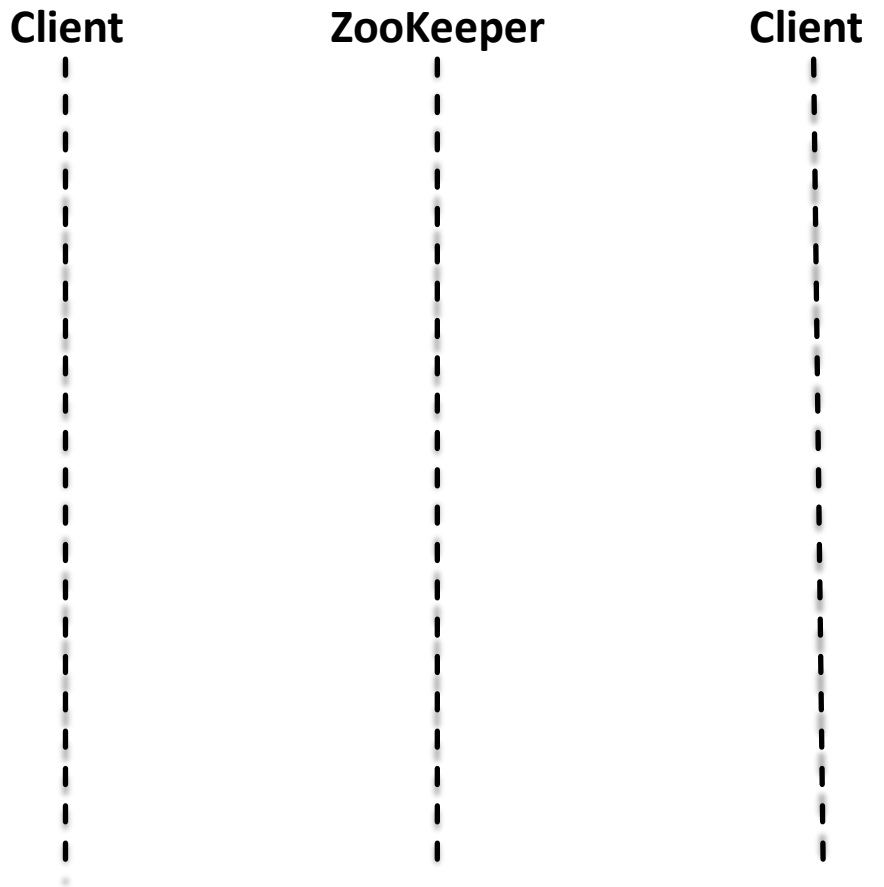
What is ZooKeeper?



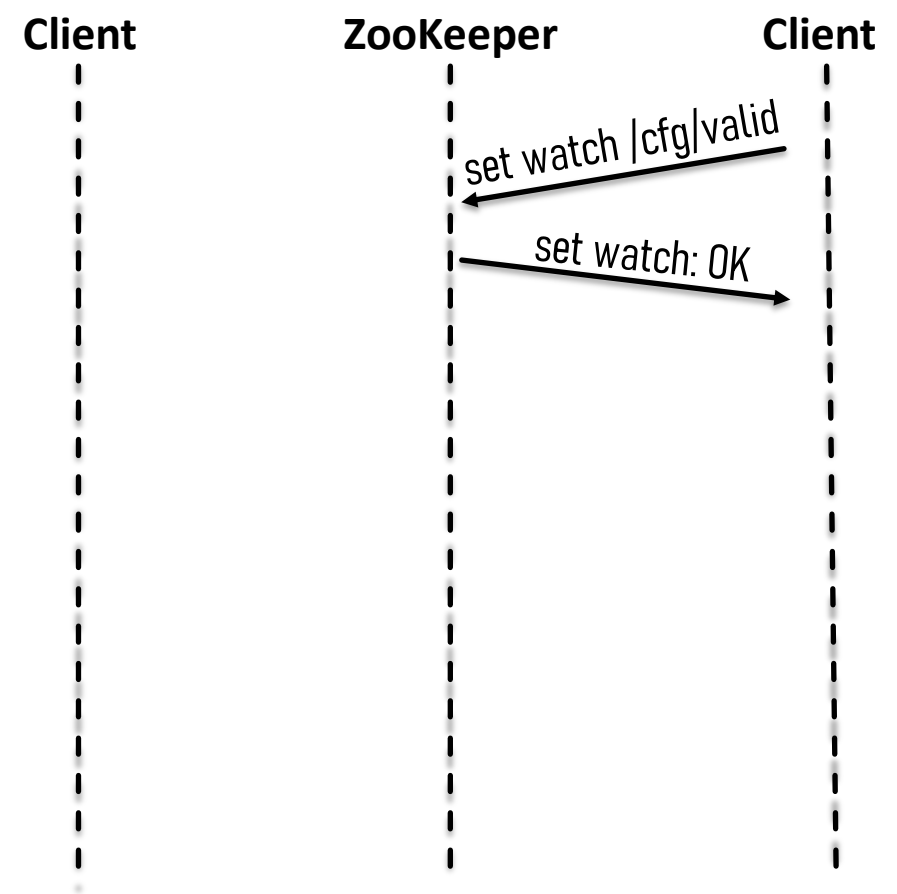
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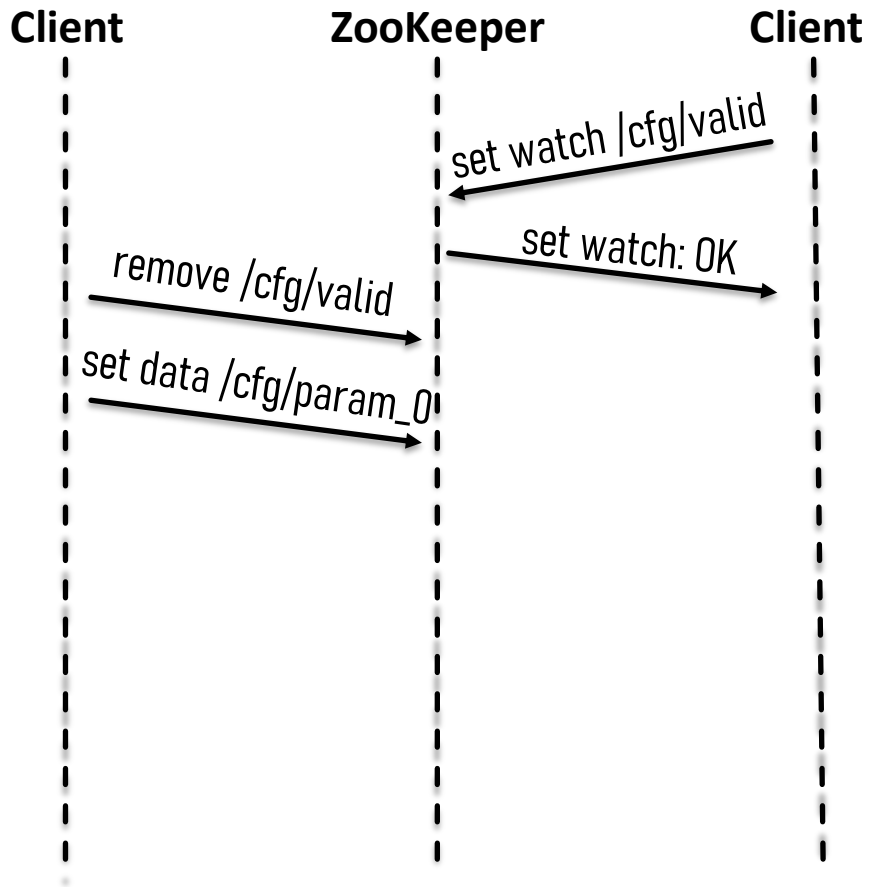
What is ZooKeeper? How it's used in practice?



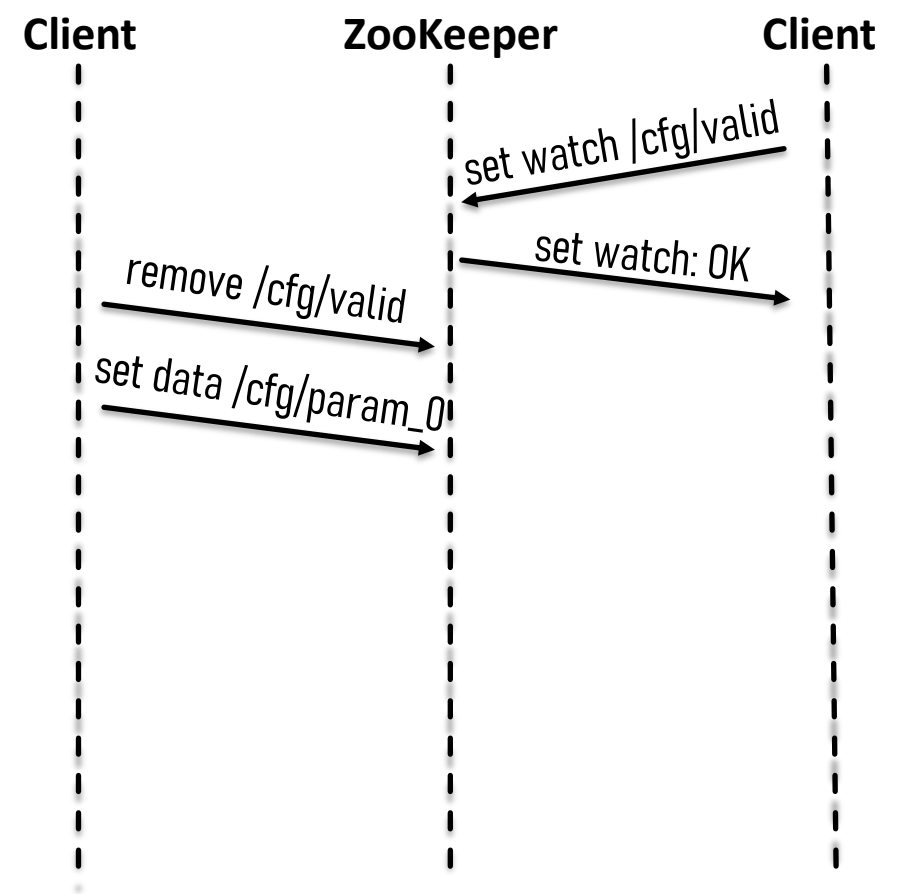
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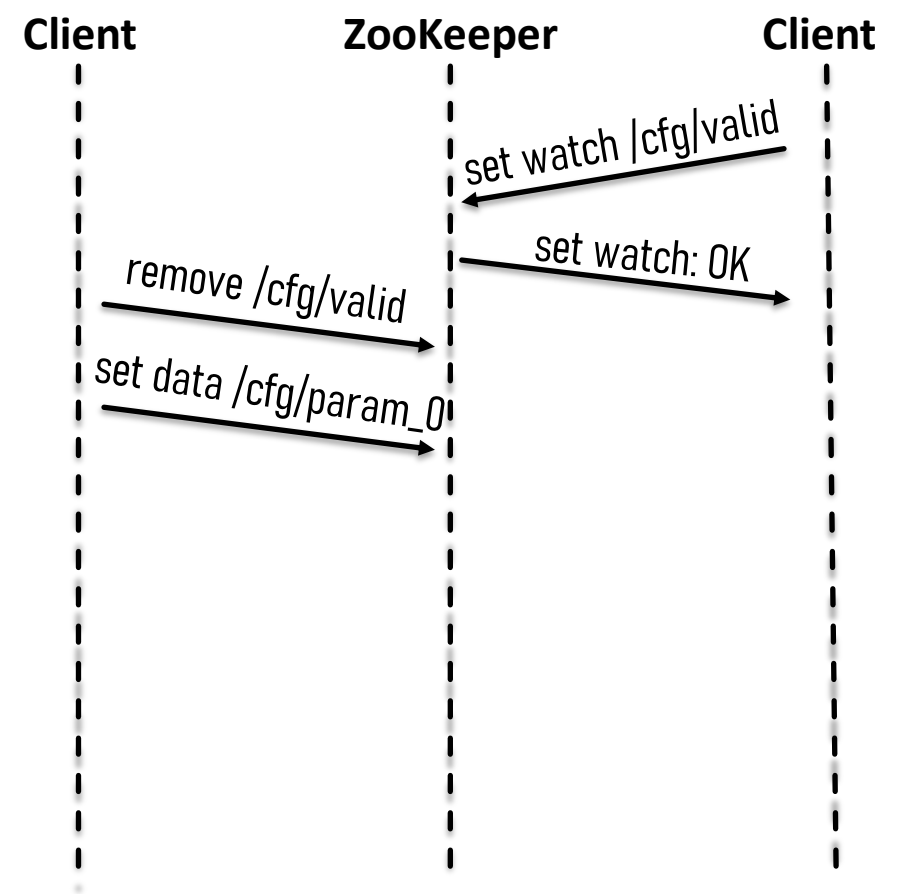


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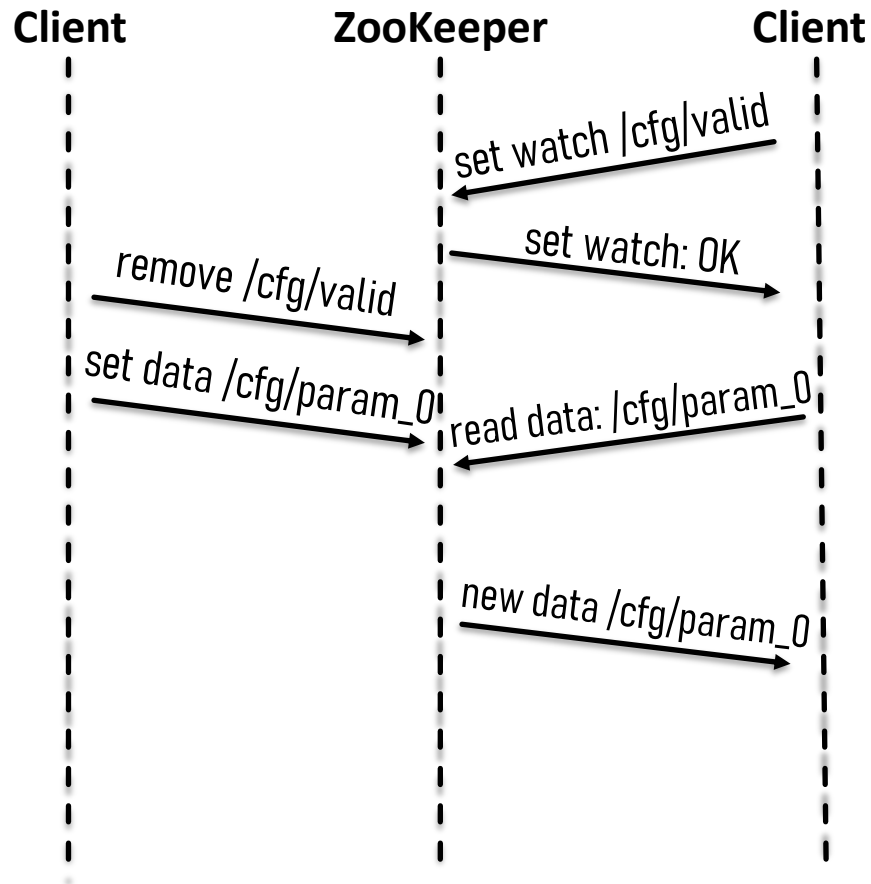
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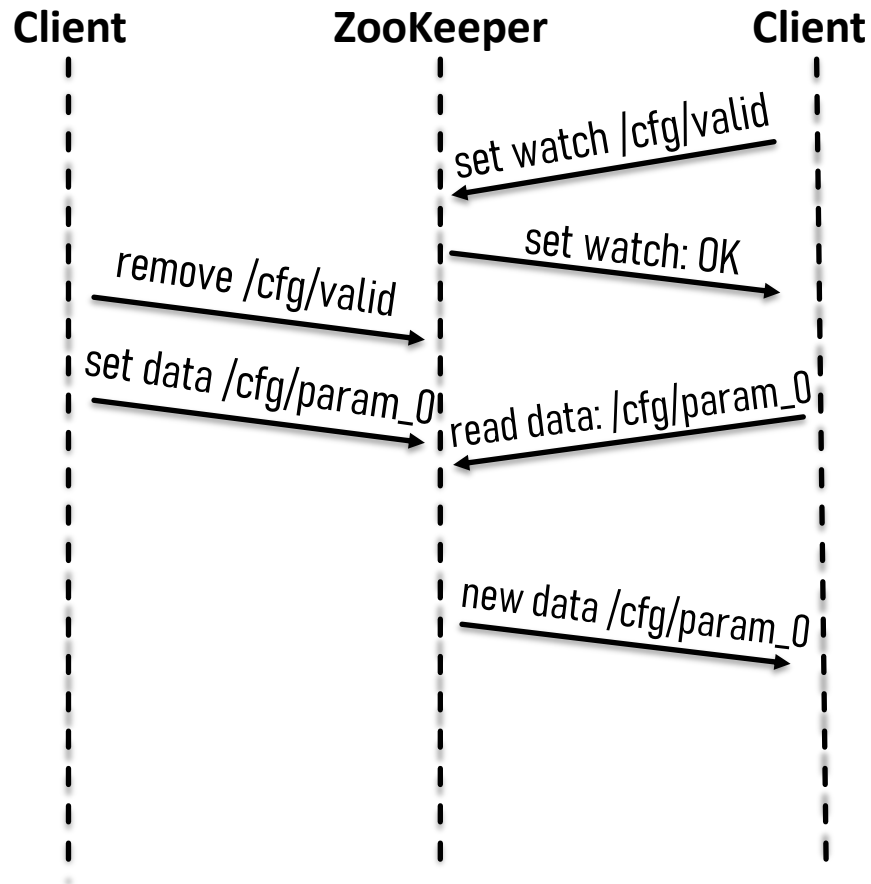
- 1 Atomicity
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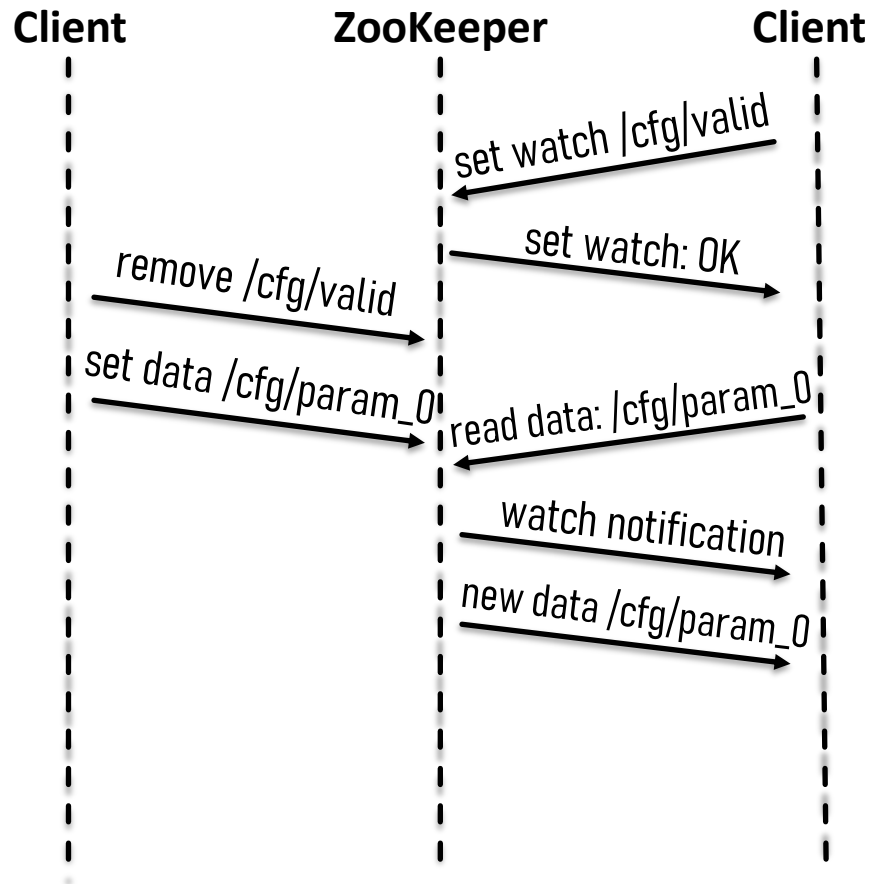
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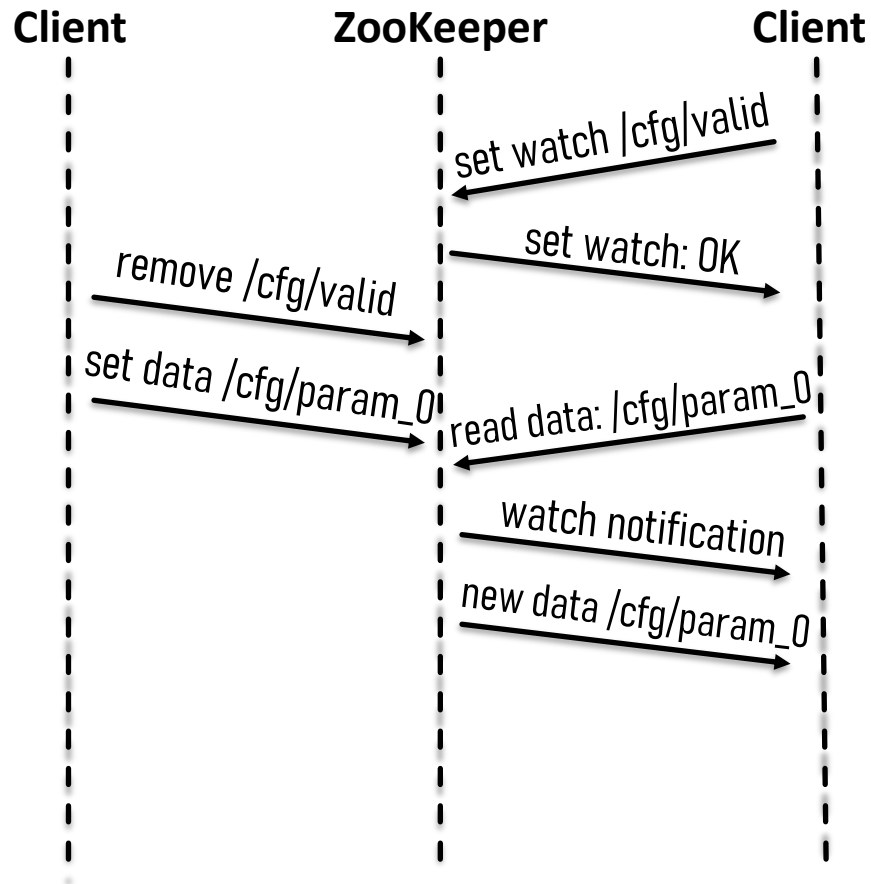
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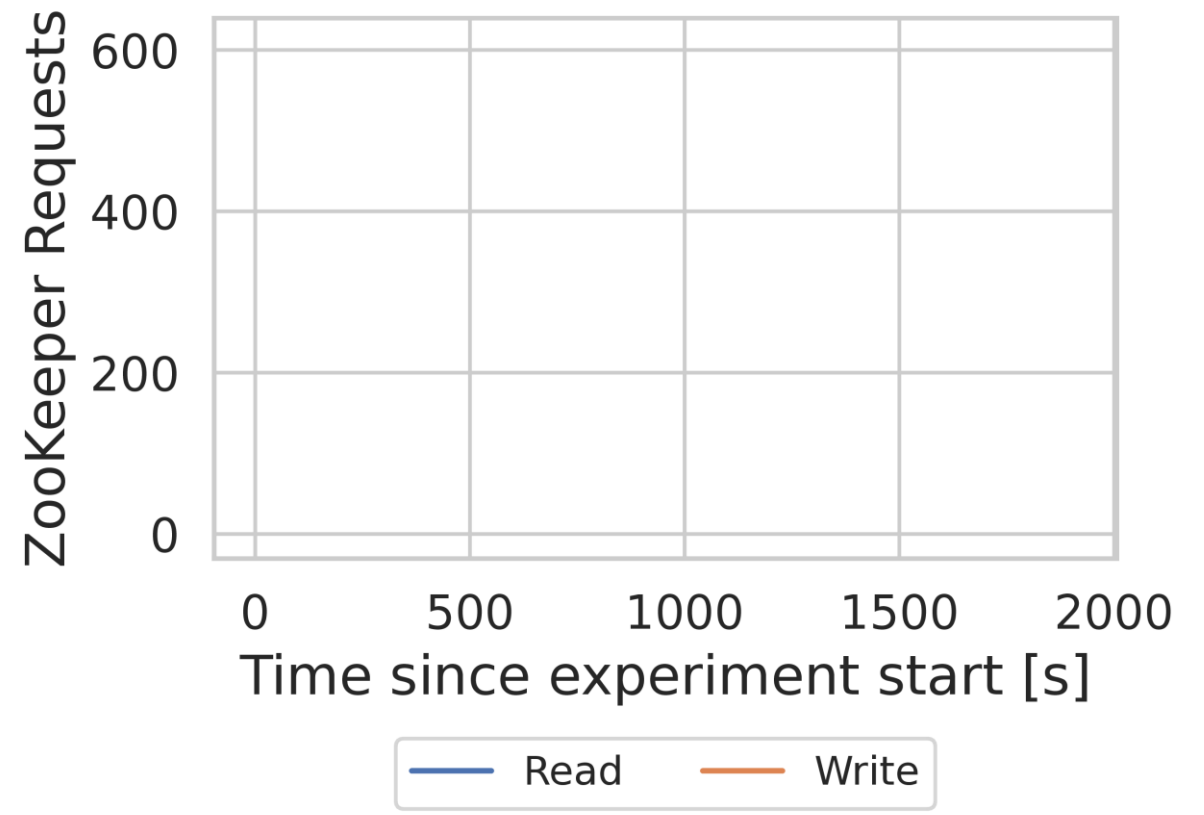
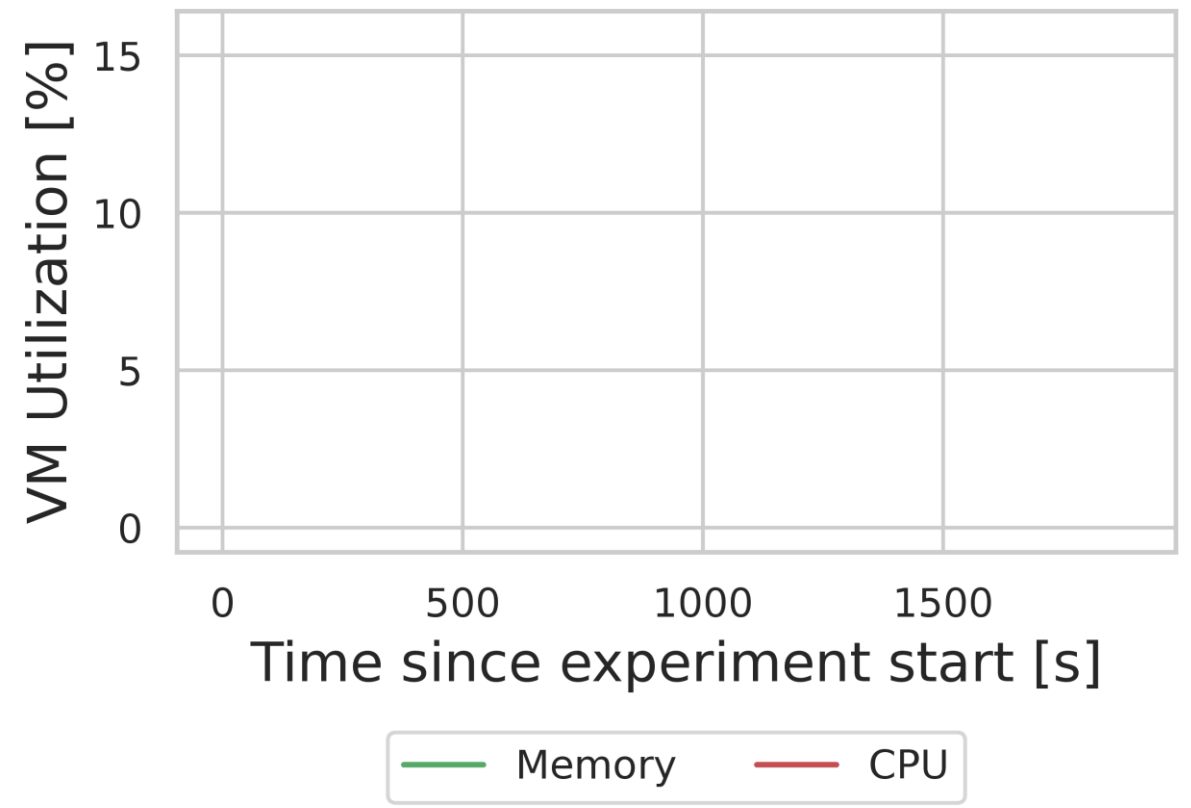
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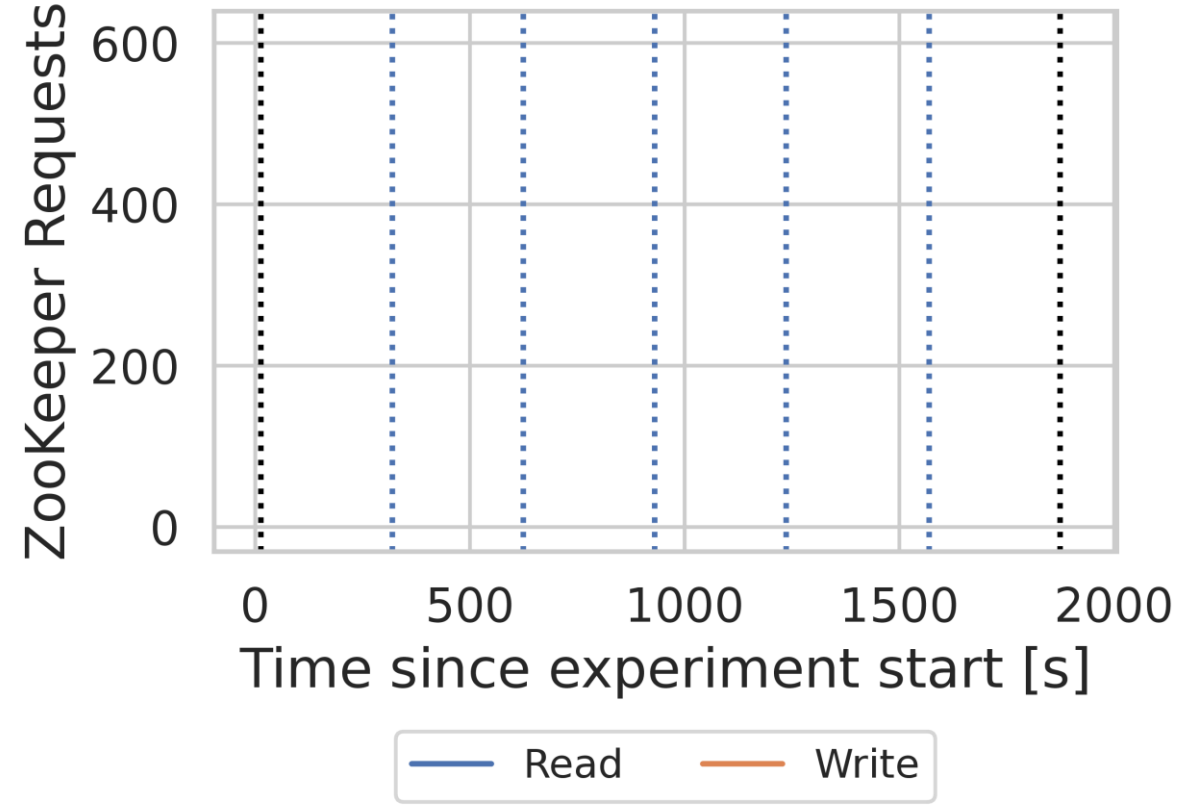
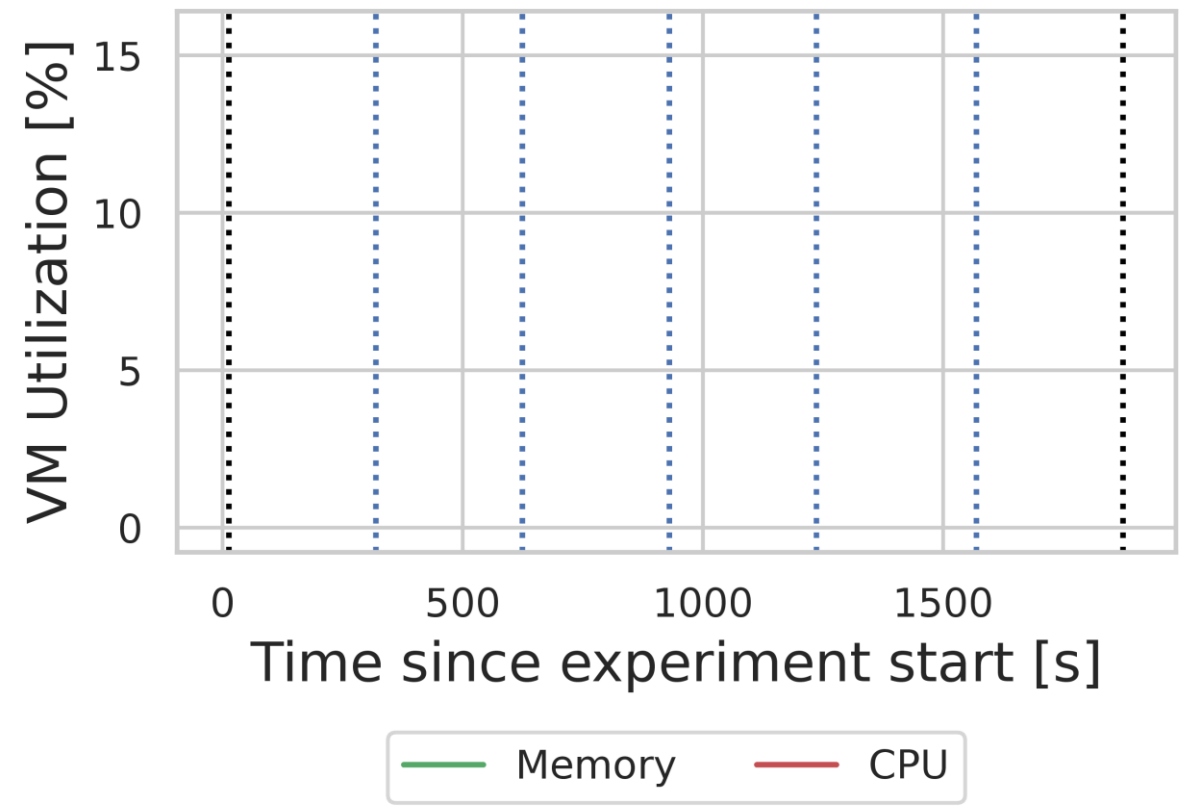


- 1 Atomicity
- 2 Linearized Writes
- 3 Single System Image
- 4 Ordered Notifications

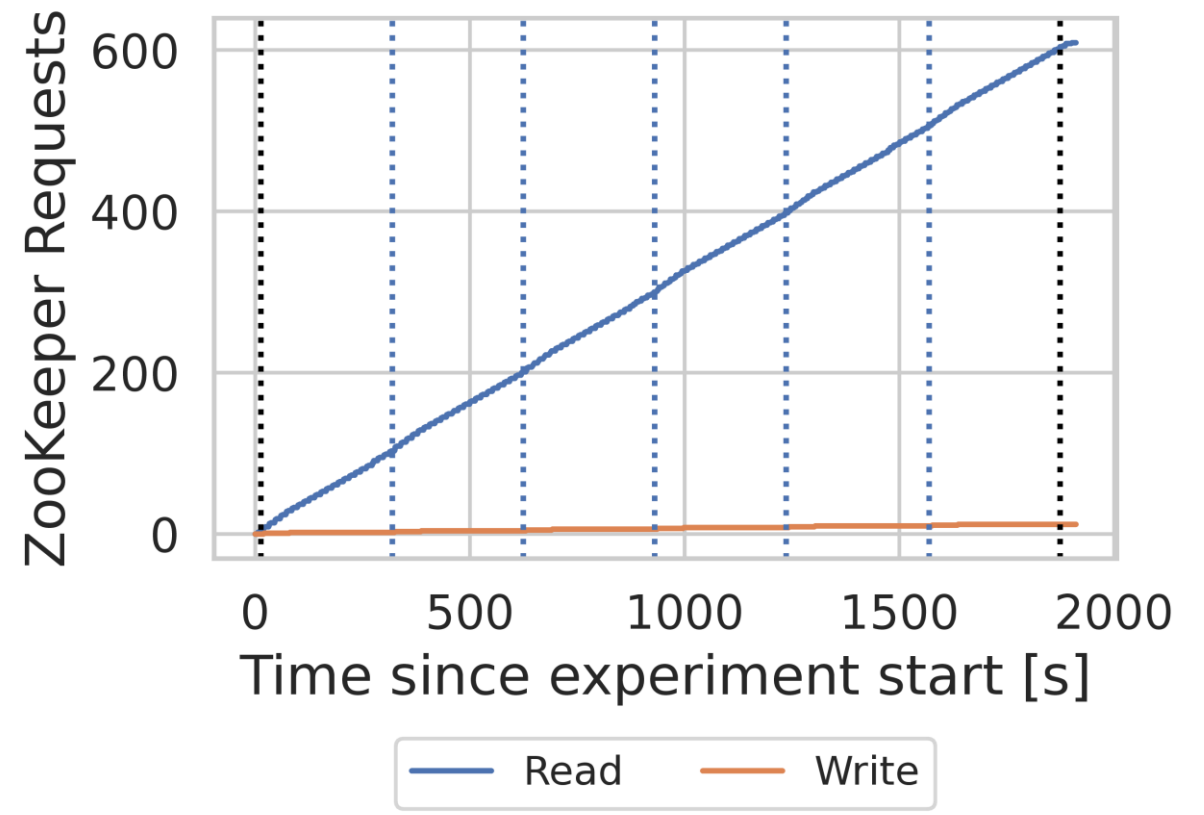
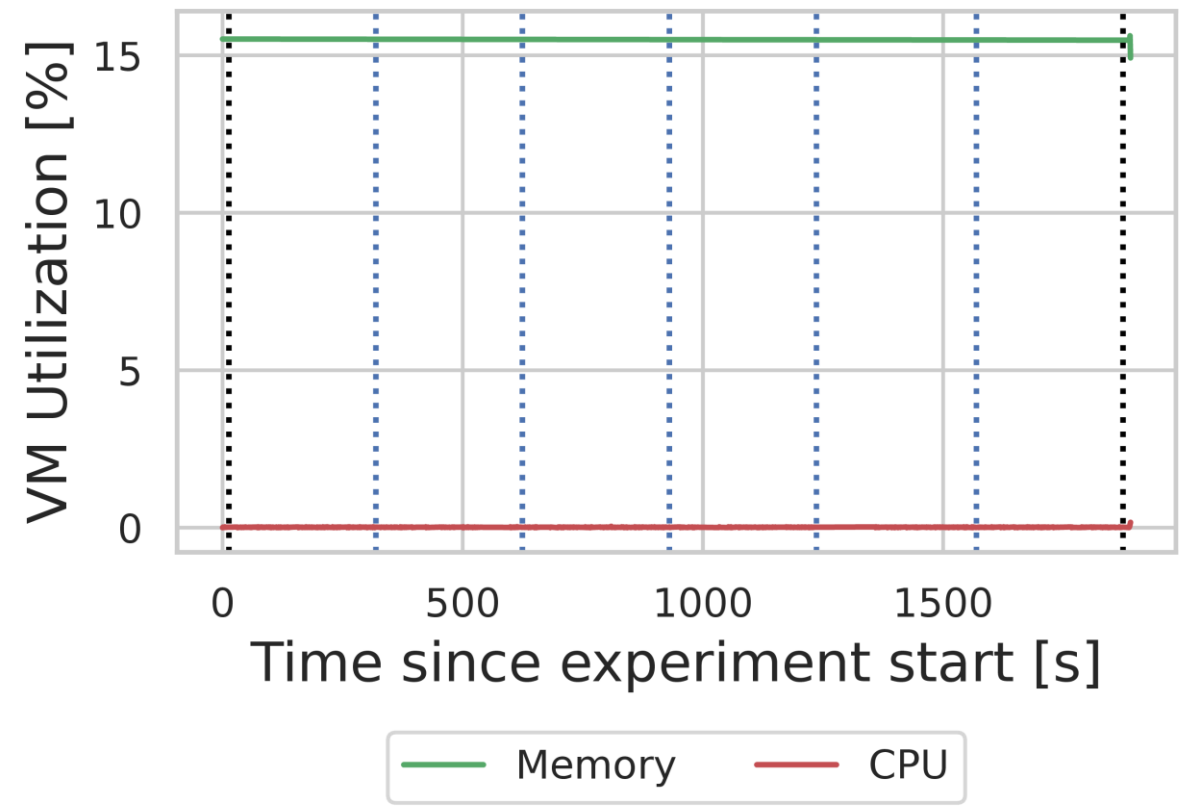
ZooKeeper Utilization in Practice: **APACHE HBASE**



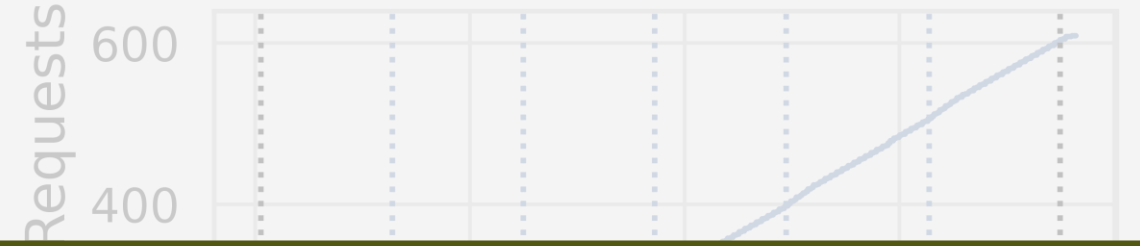
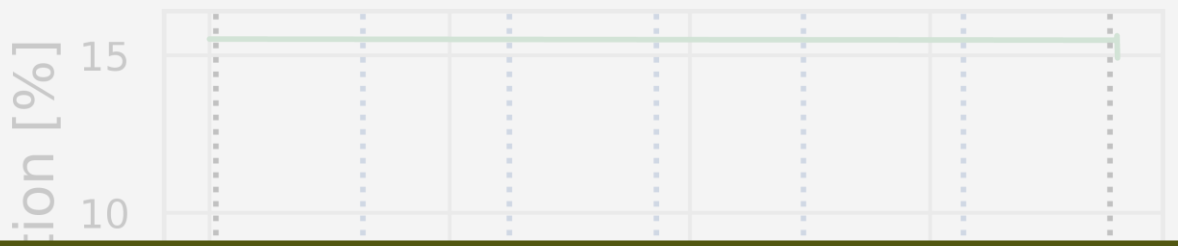
ZooKeeper Utilization in Practice: **APACHE HBASE**



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ZooKeeper Utilization in Practice:



Which programming model fits best infrequent workloads?



— Memory — CPU

— Read — Write

How does Function-as-a-Service (FaaS) work?

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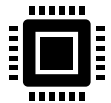

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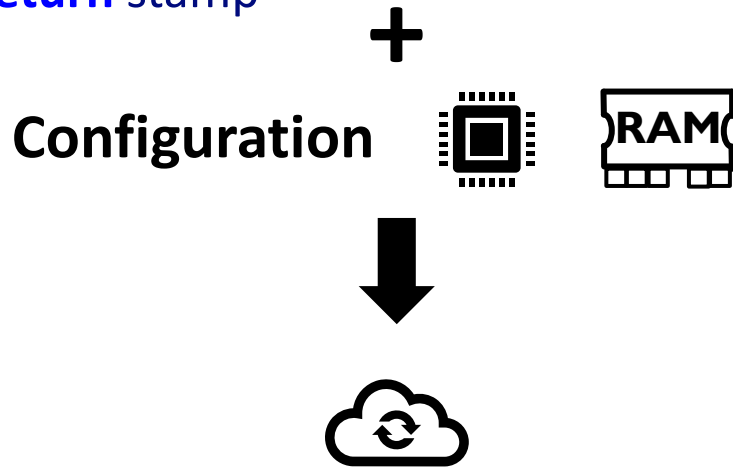
Configuration



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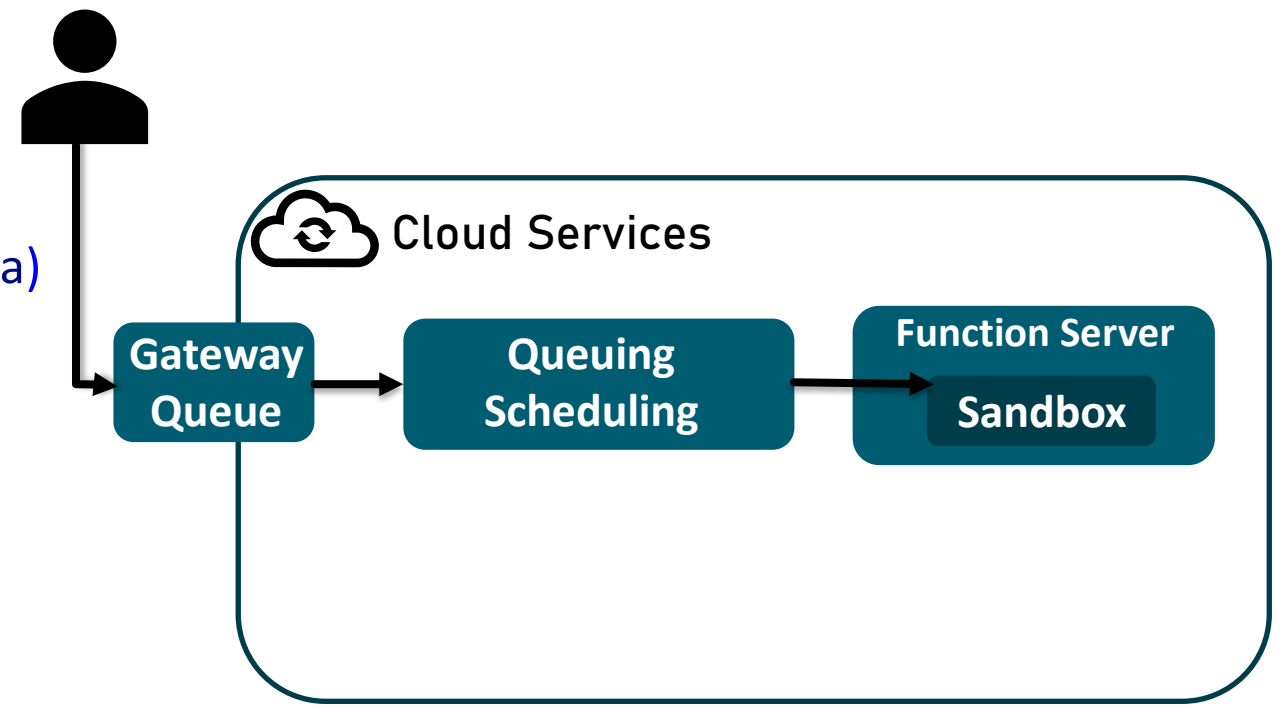
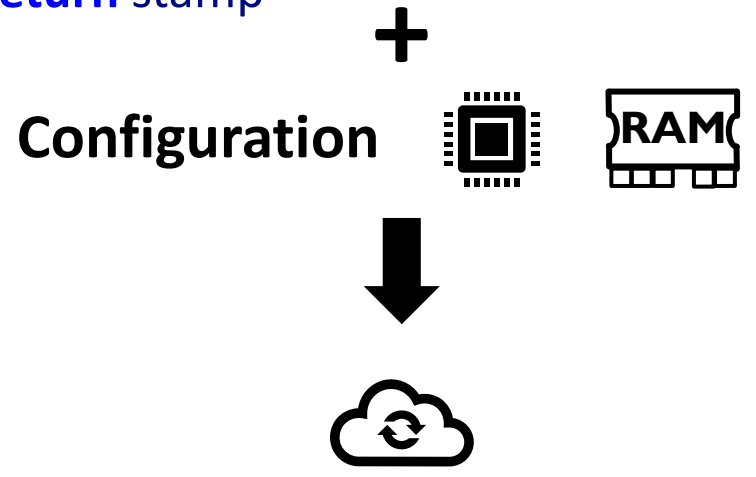
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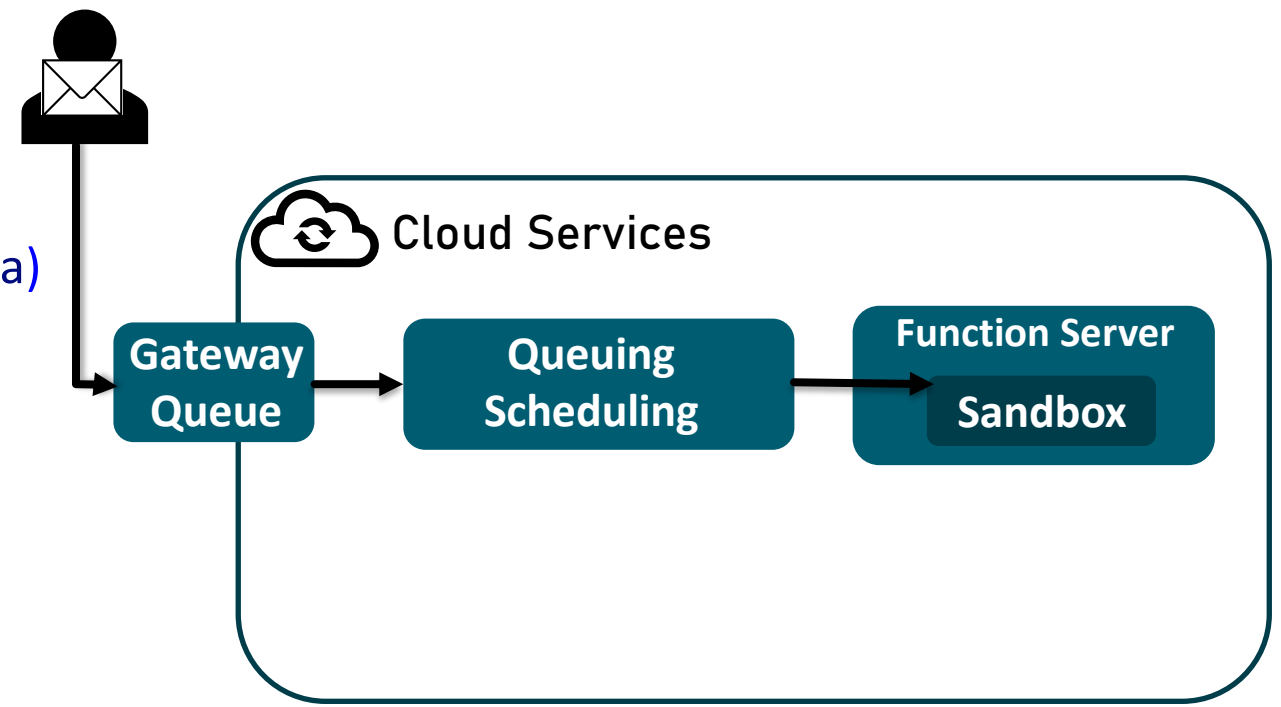
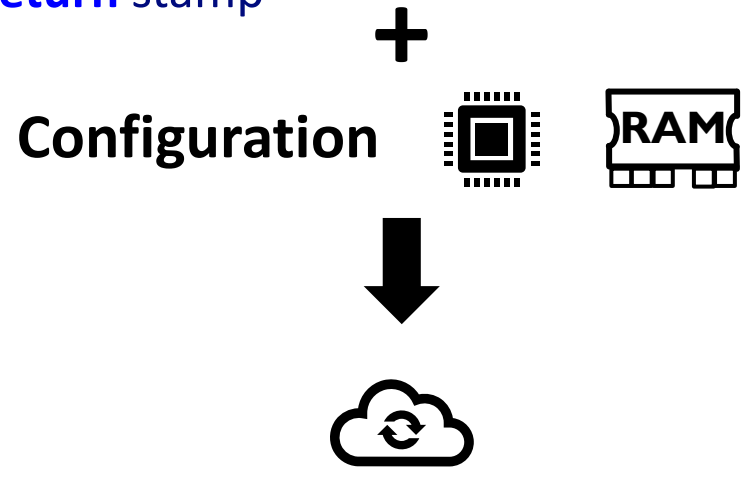
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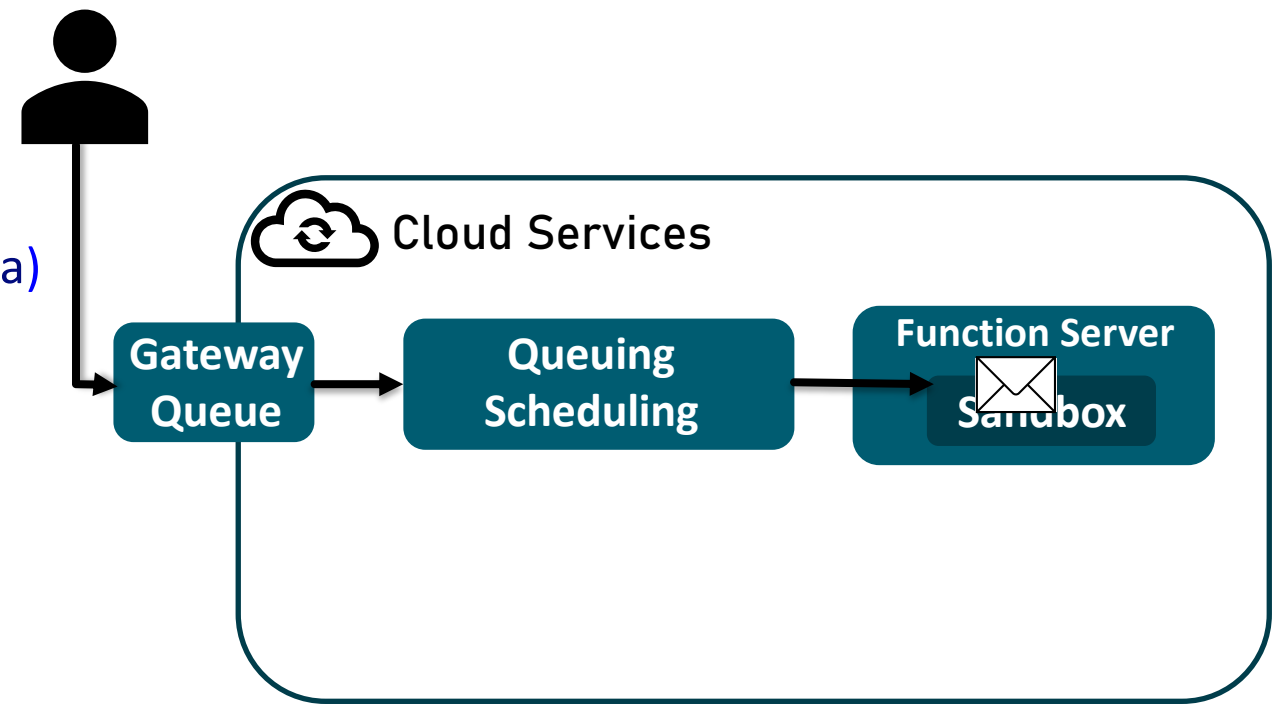
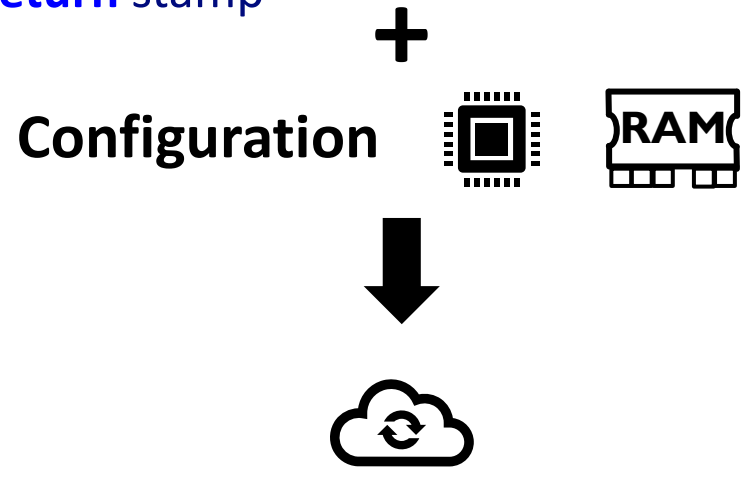
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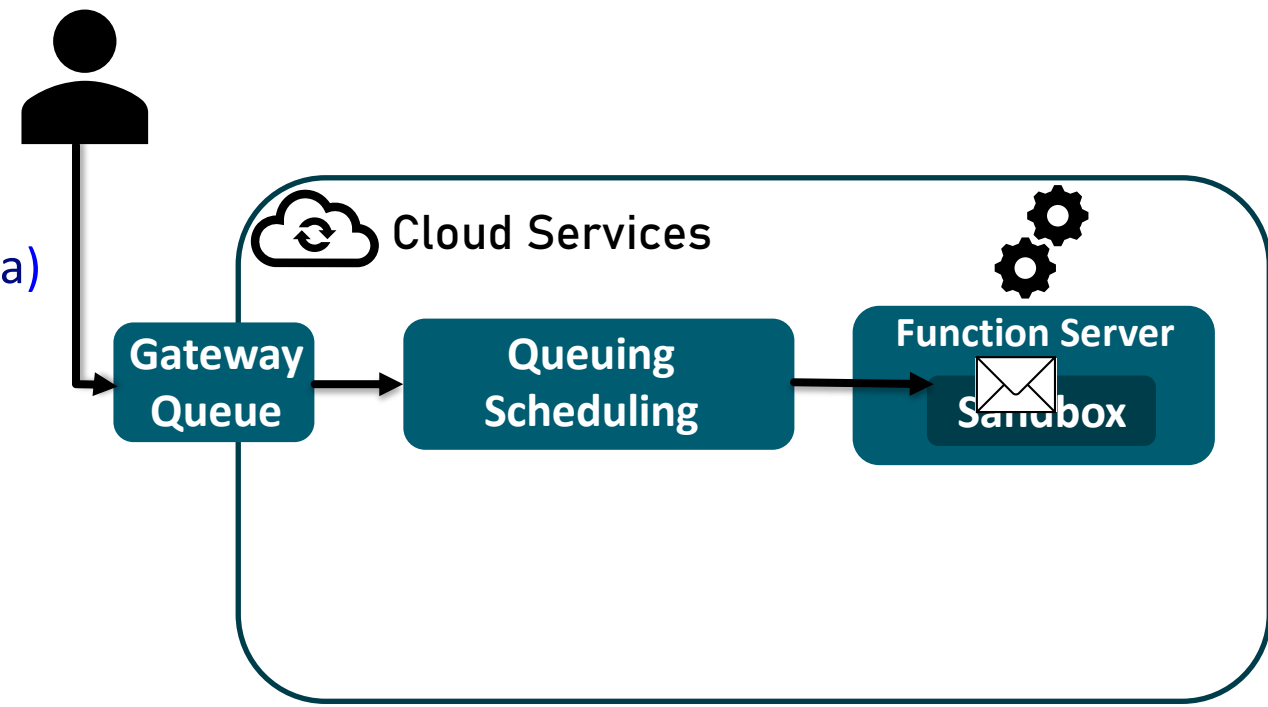
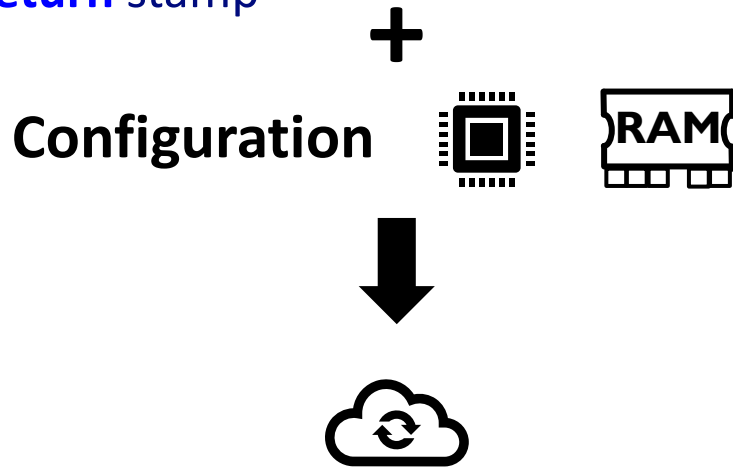
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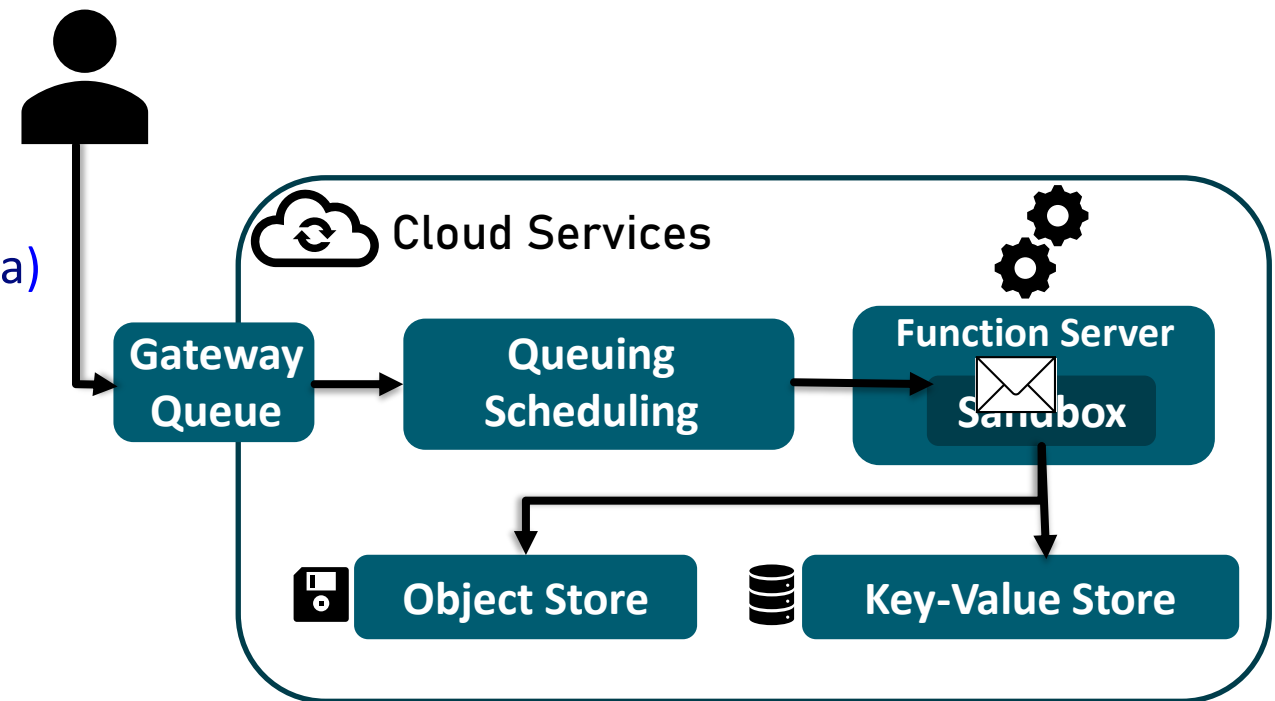
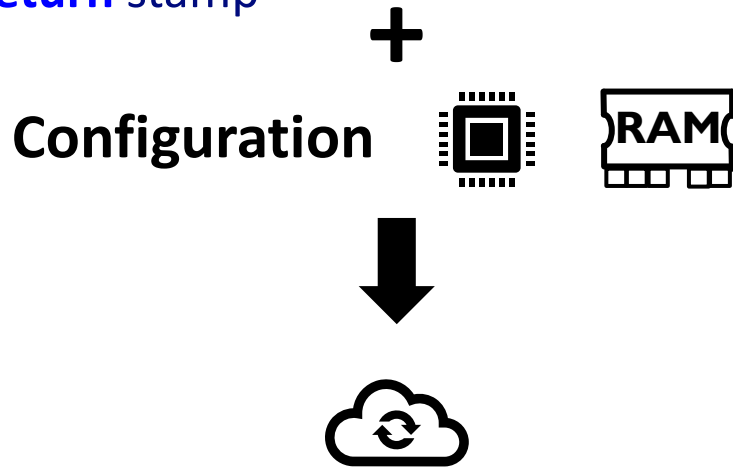
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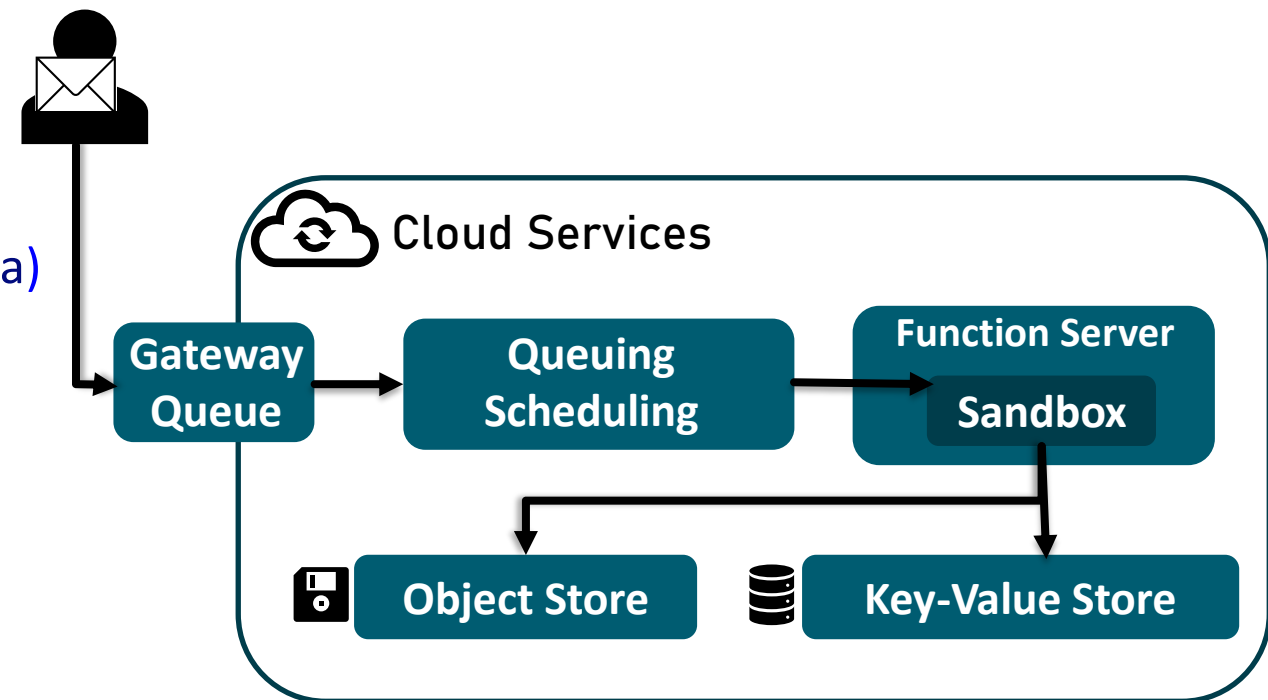
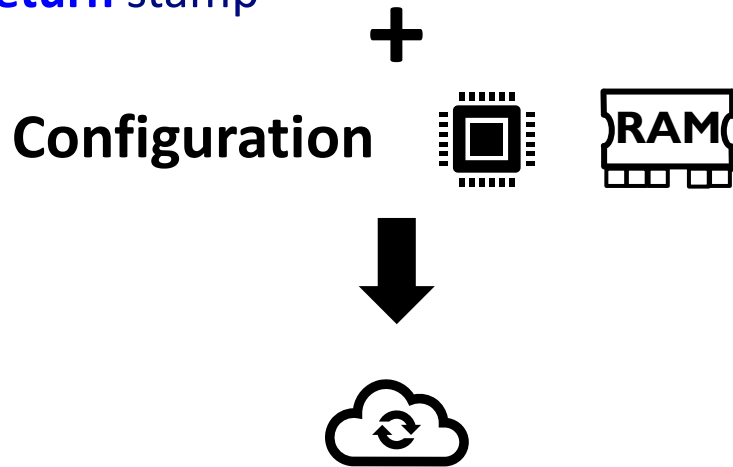
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Serverless ZooKeeper: Why and Why Not?

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Infrequent Use

Benefit from pay-as-you-go billing.

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Complex Data Model

Linearized writes with ordered notifications.

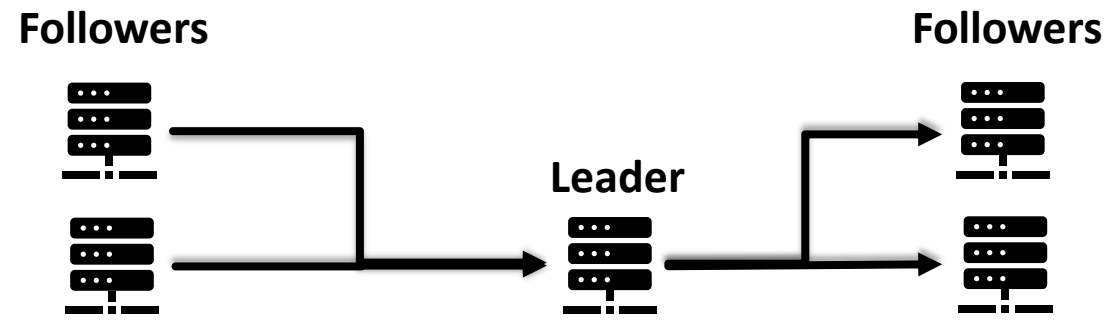
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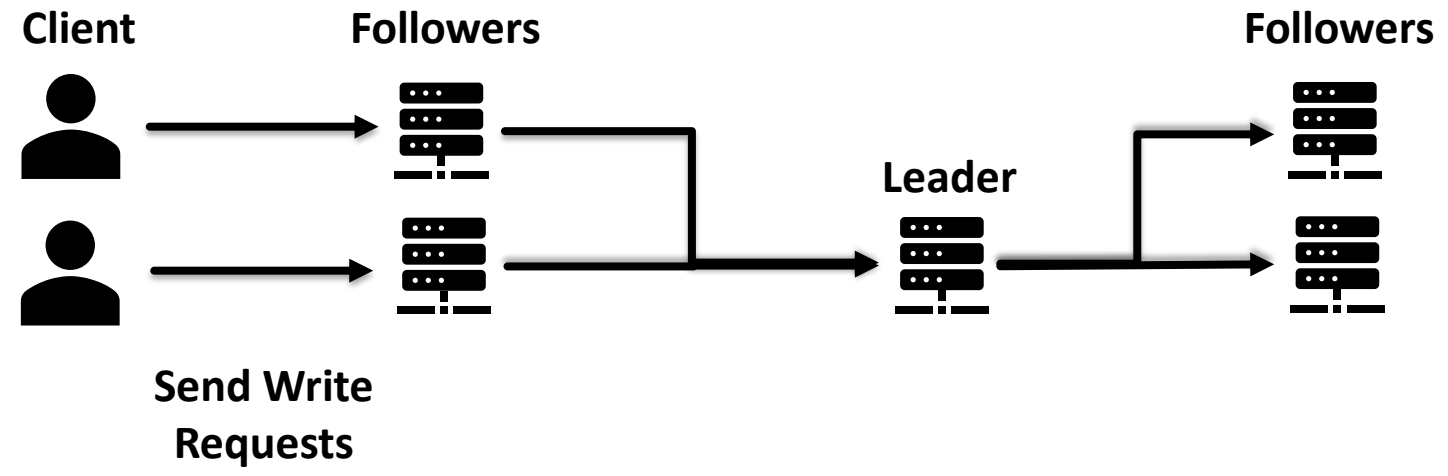
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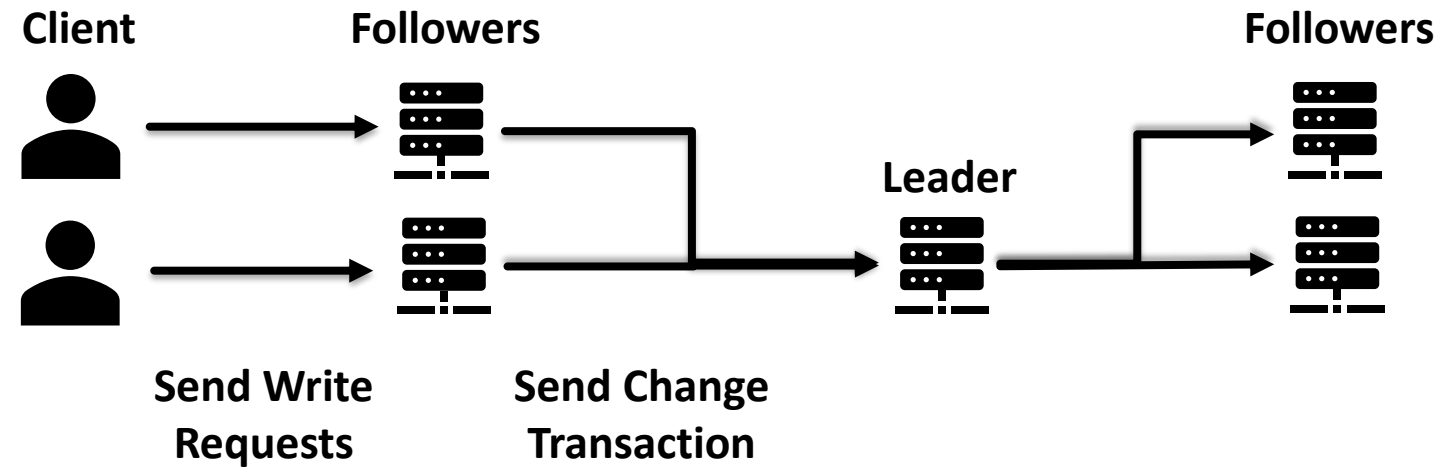
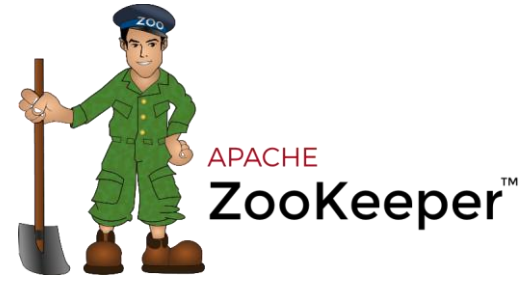
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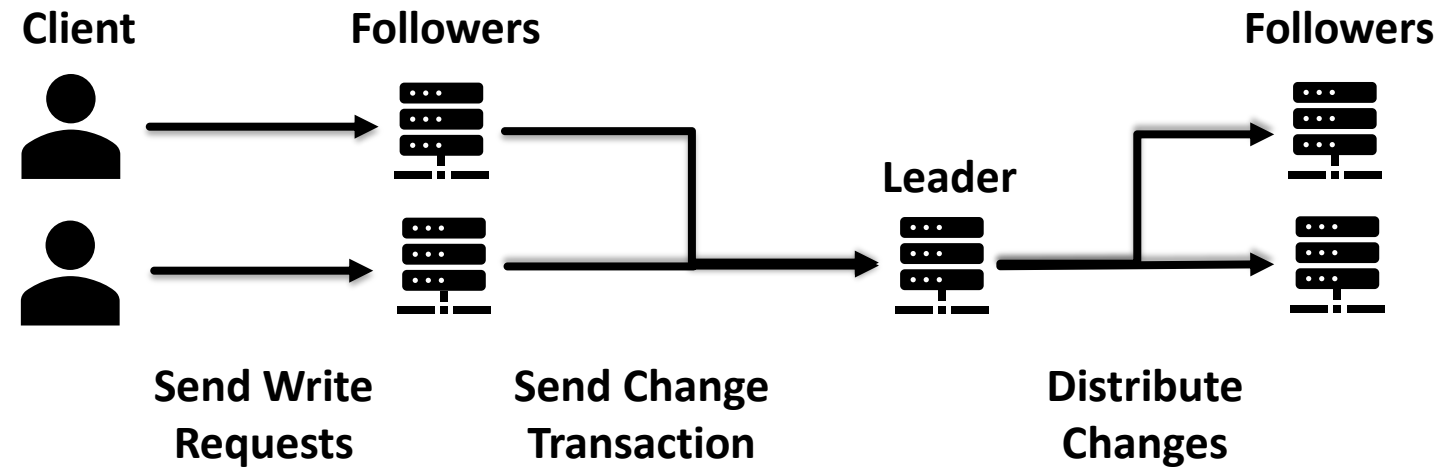
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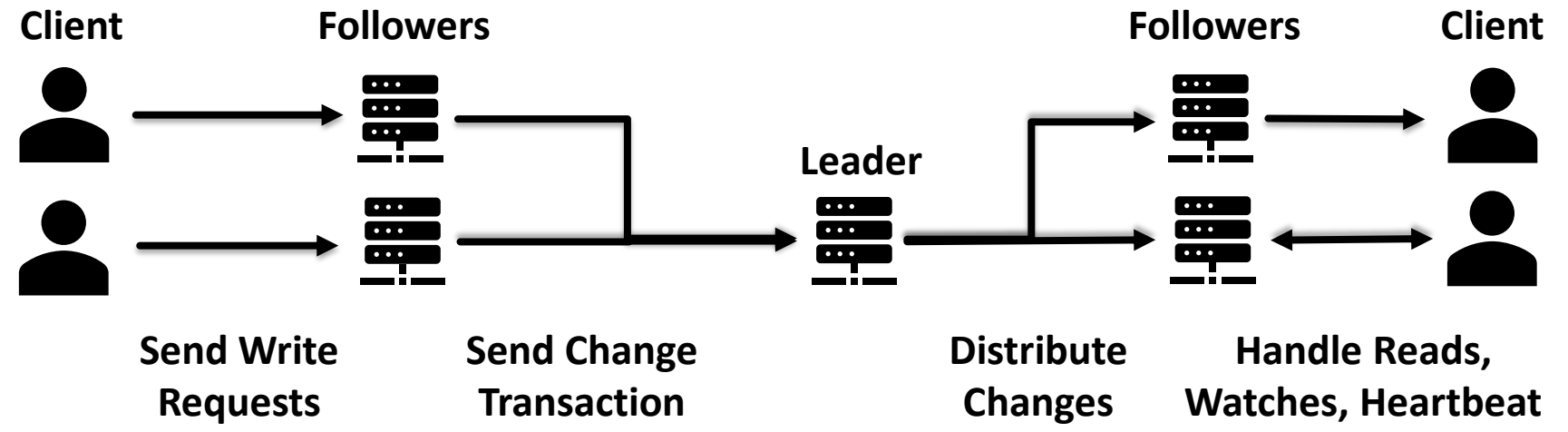
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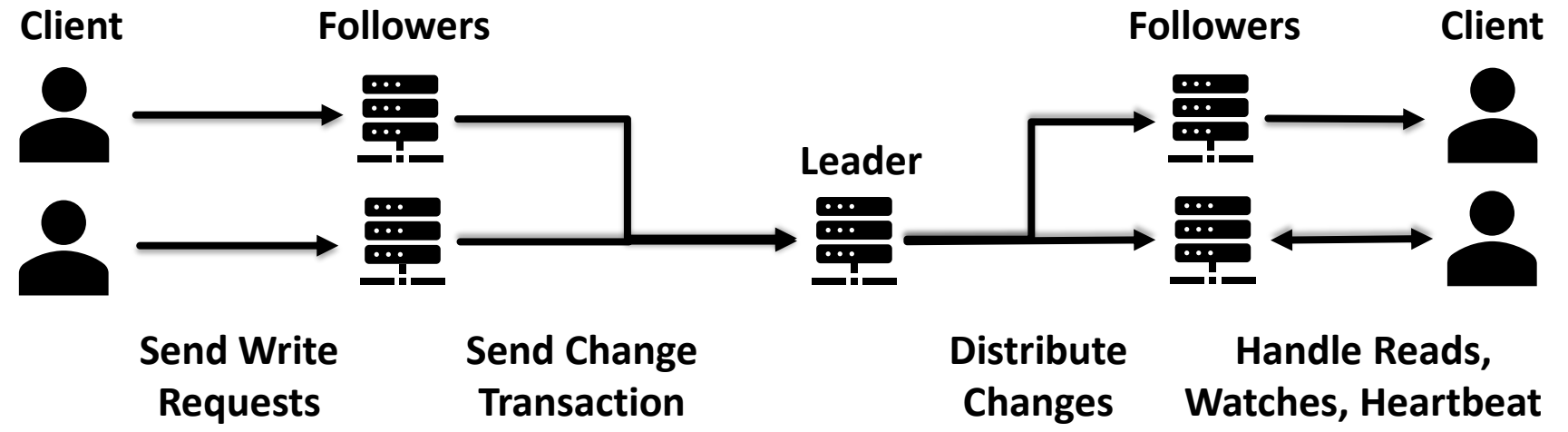
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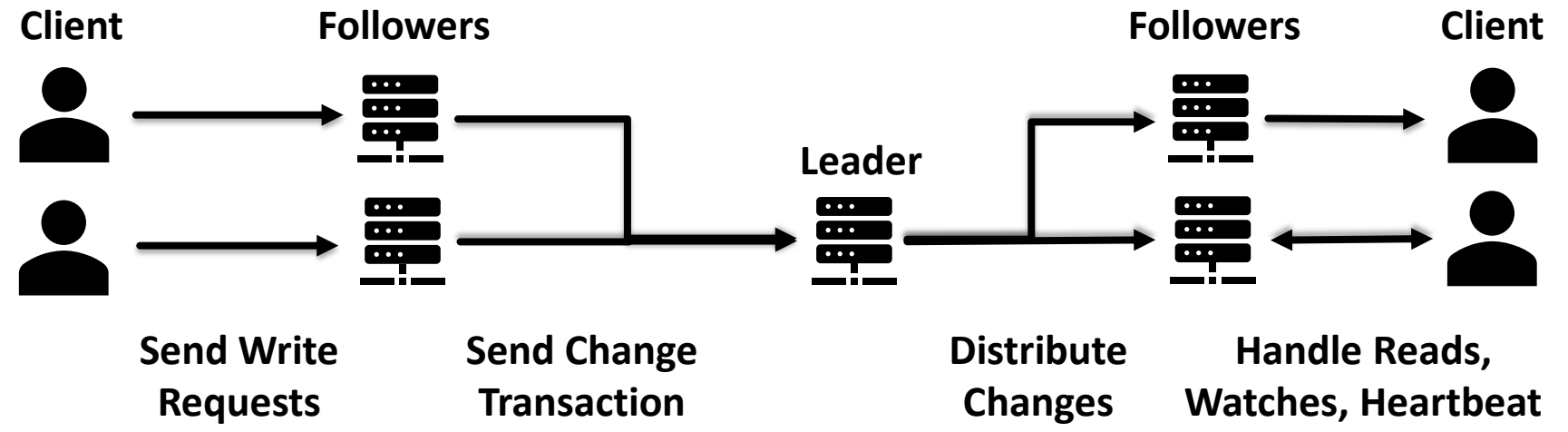
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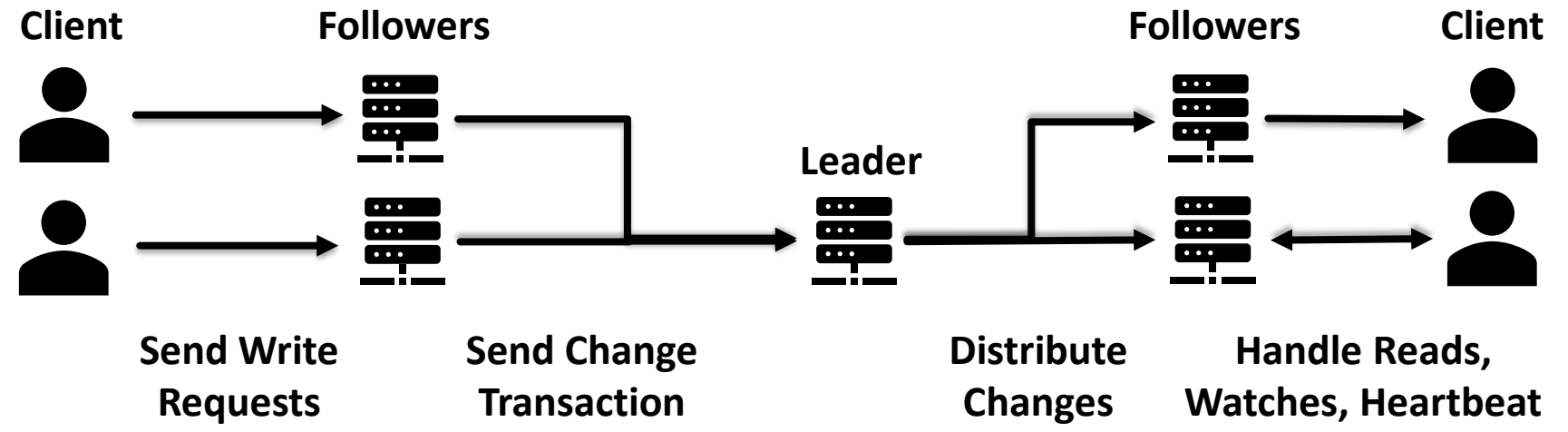
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Cloud-Native



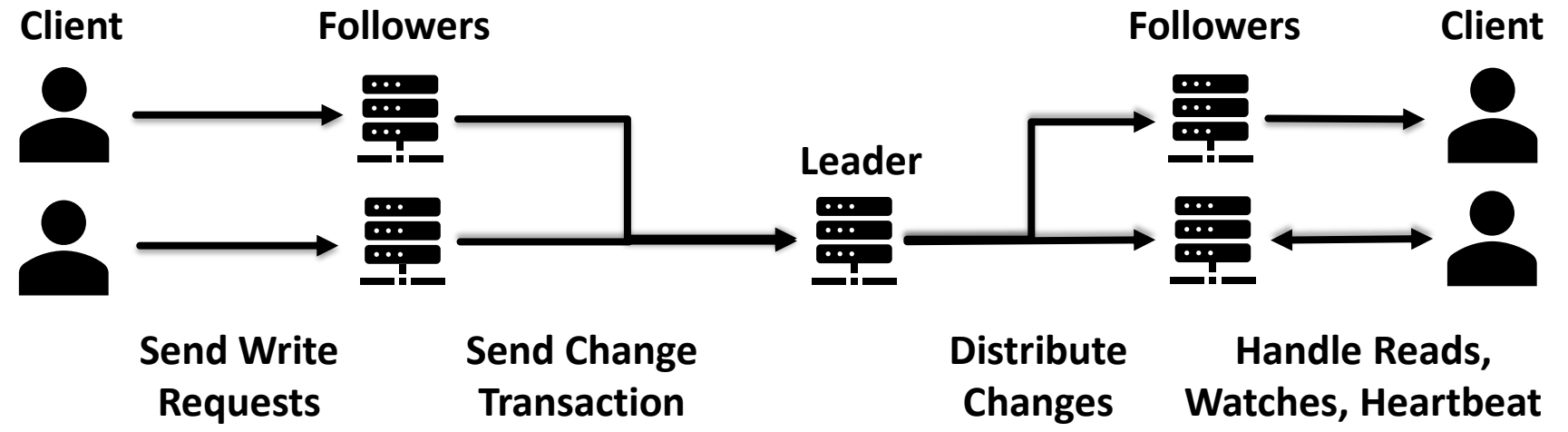
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Cloud-Native

100% Serverless

From ZooKeeper to FaaSKeeper

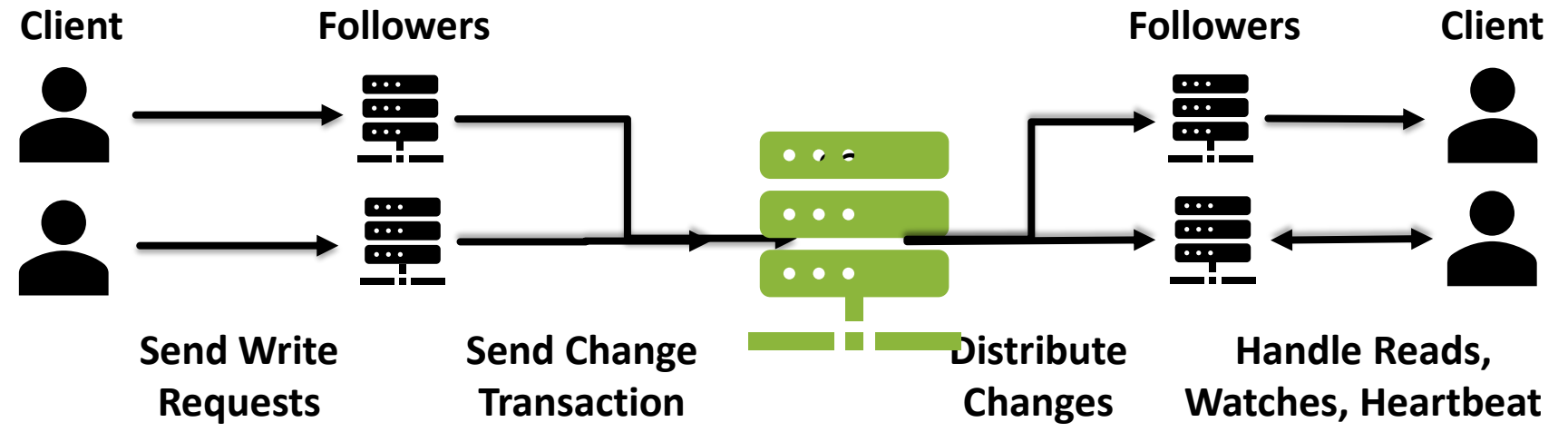


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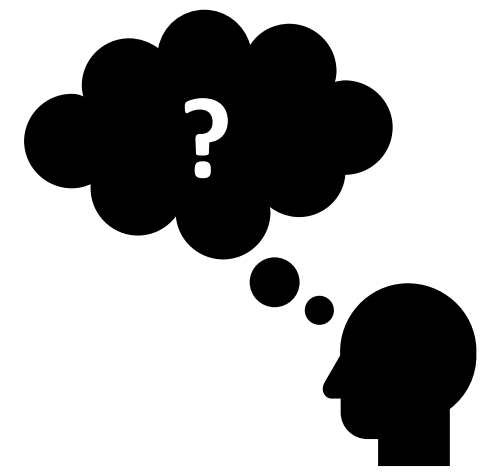


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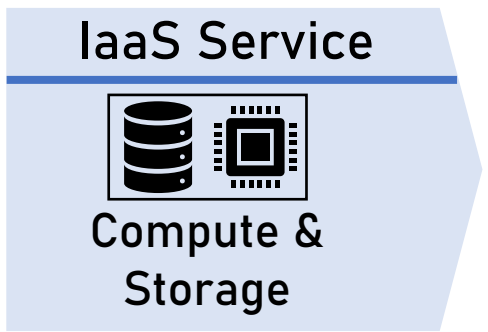


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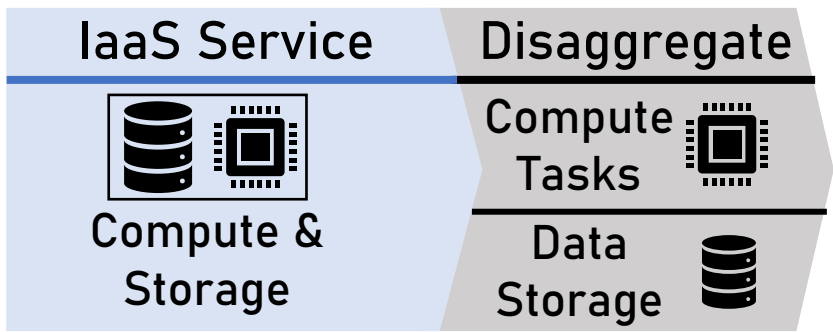
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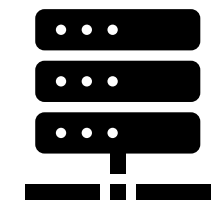


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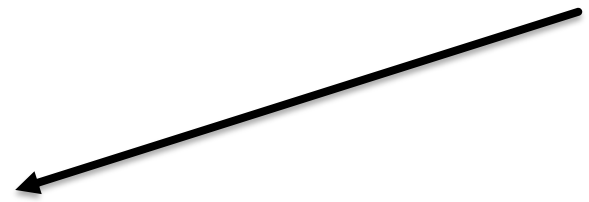
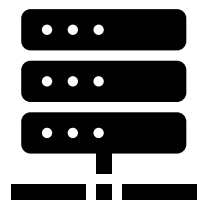


Disaggregate Compute & Storage

Building Serverless Services - Disaggregate

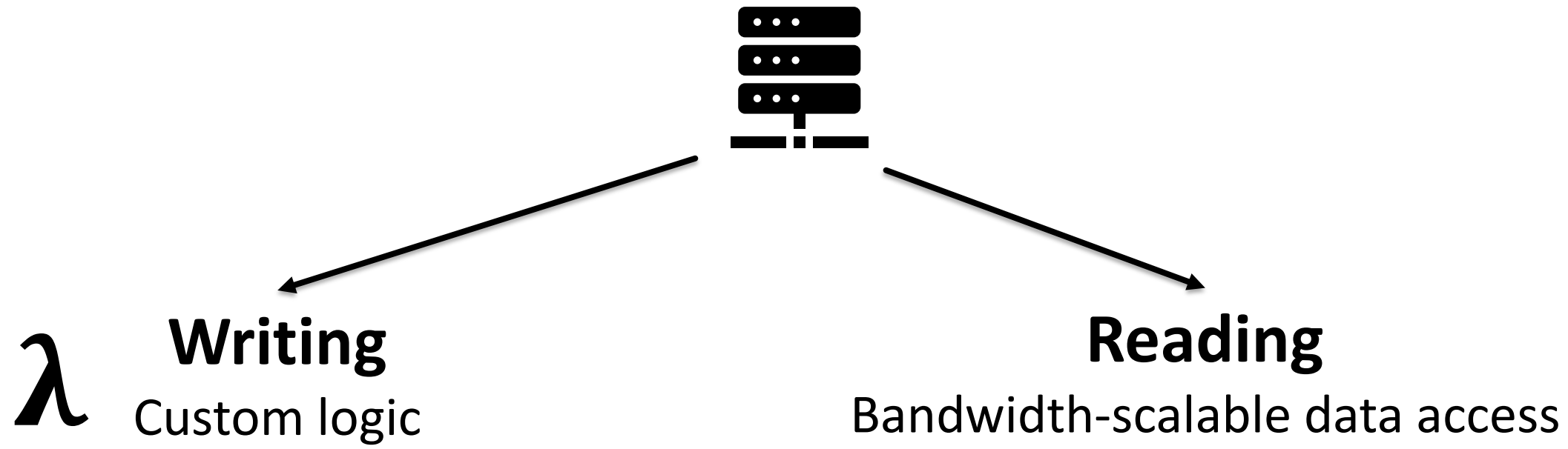


Building Serverless Services - Disaggregate

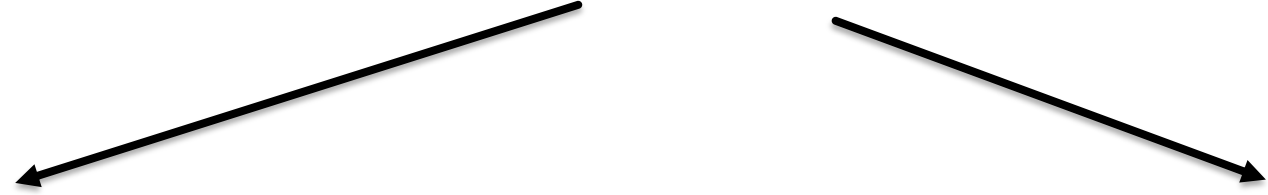
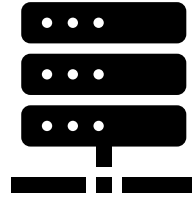


Writing
Custom logic

Building Serverless Services - Disaggregate



Building Serverless Services - Disaggregate



Writing

Custom logic

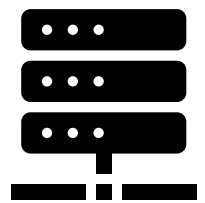
Reading

Bandwidth-scalable data access

10M read requests to DynamoDB: \$2.5



Building Serverless Services - Disaggregate



Writing

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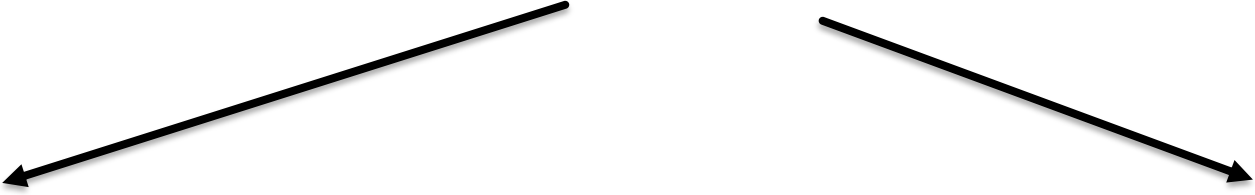
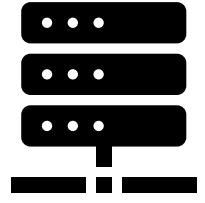
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Building Serverless Services - Disaggregate



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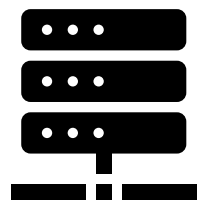
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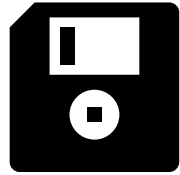


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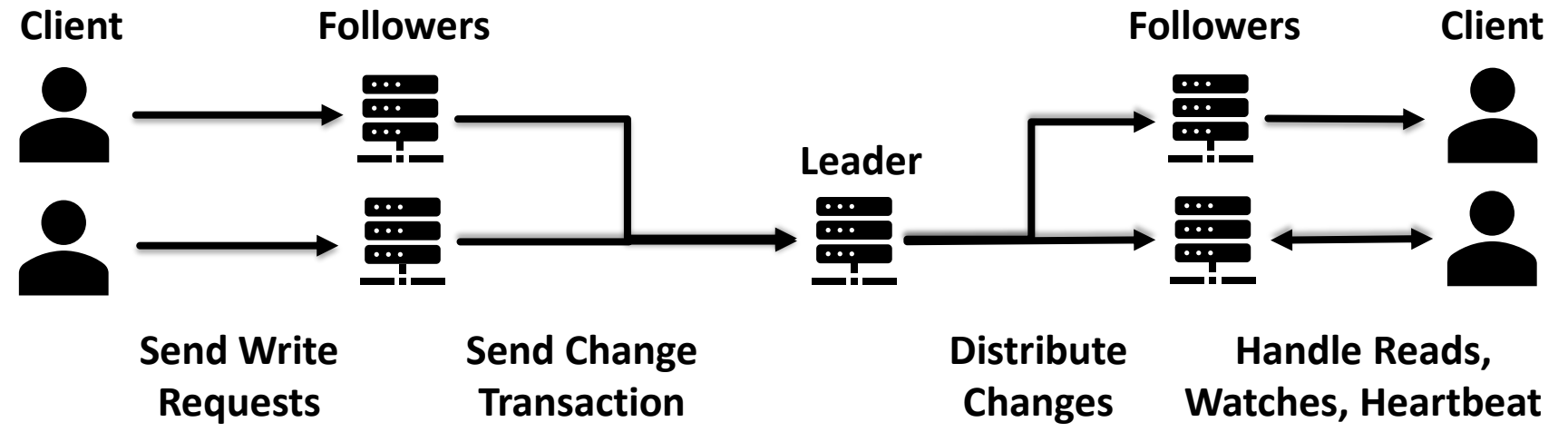
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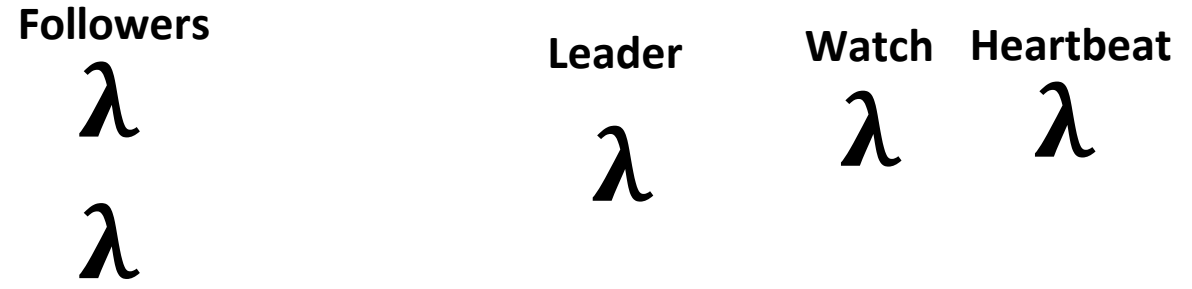
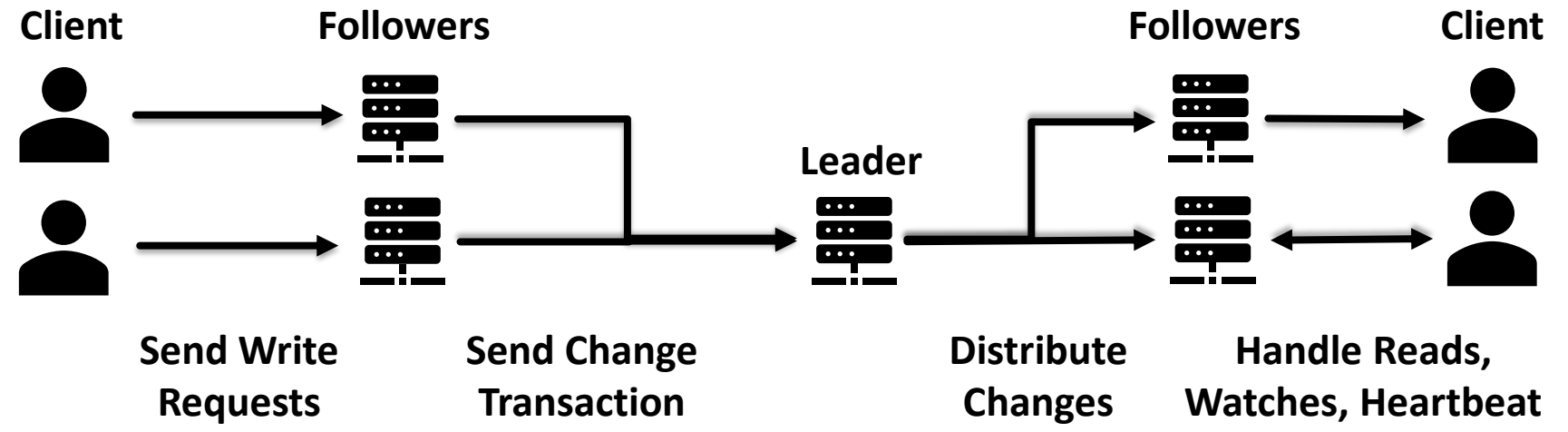
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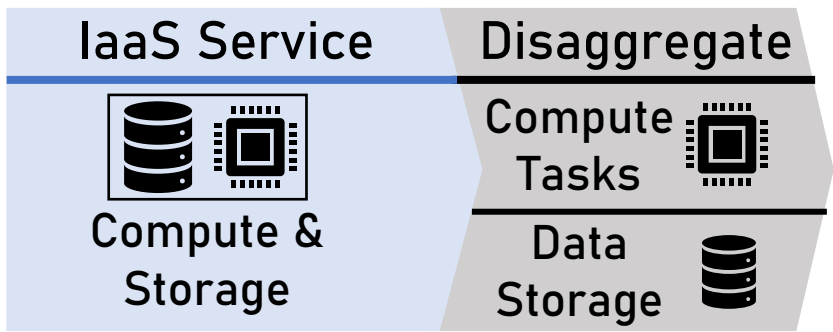
From ZooKeeper to FaaSKeeper



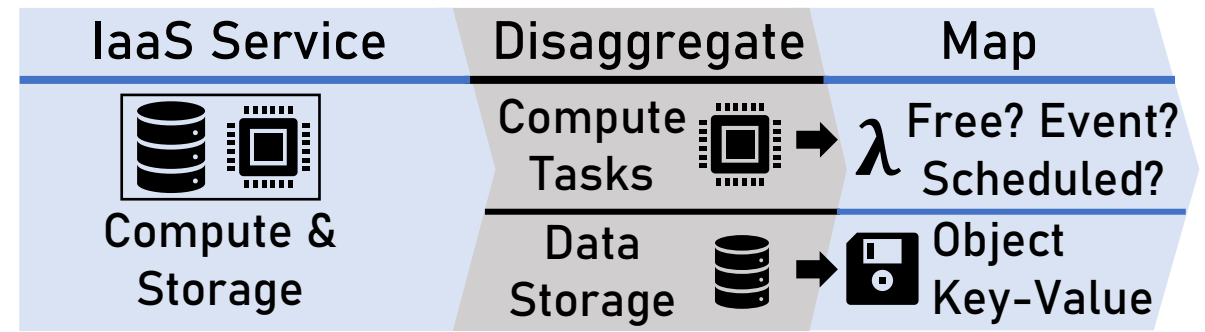
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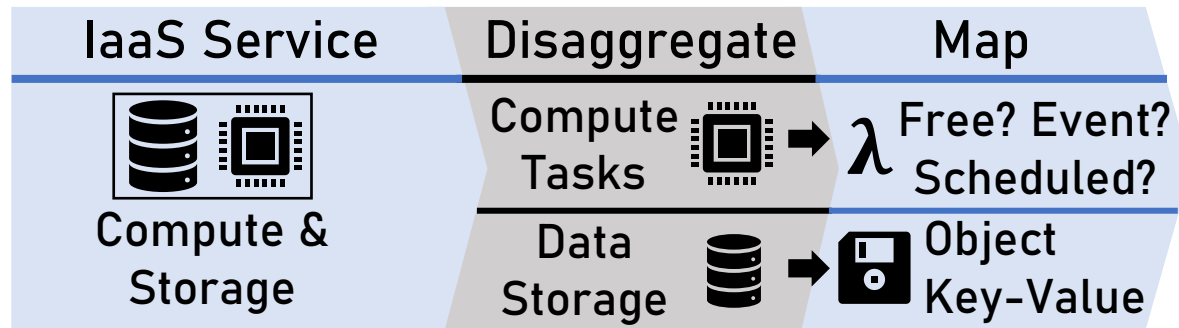
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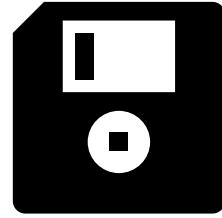


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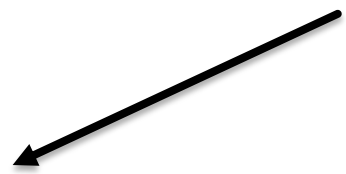
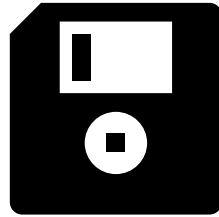


Map to Cloud Services

Building Serverless Services – Map Storage



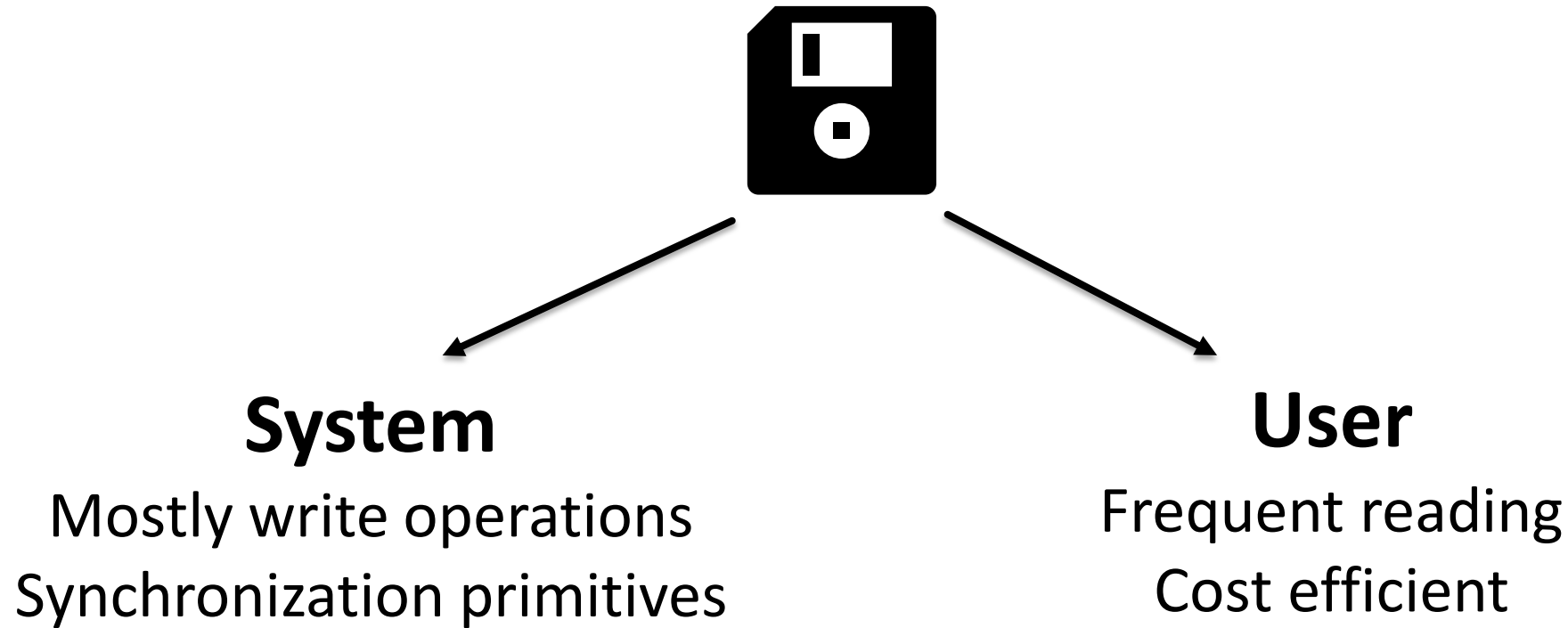
Building Serverless Services – Map Storage



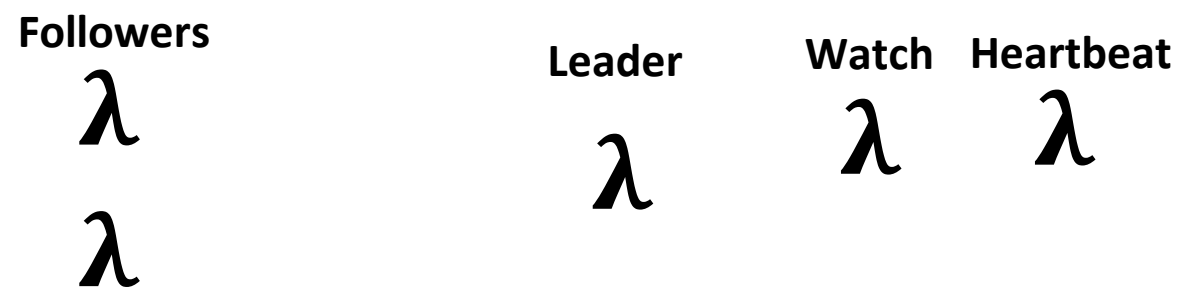
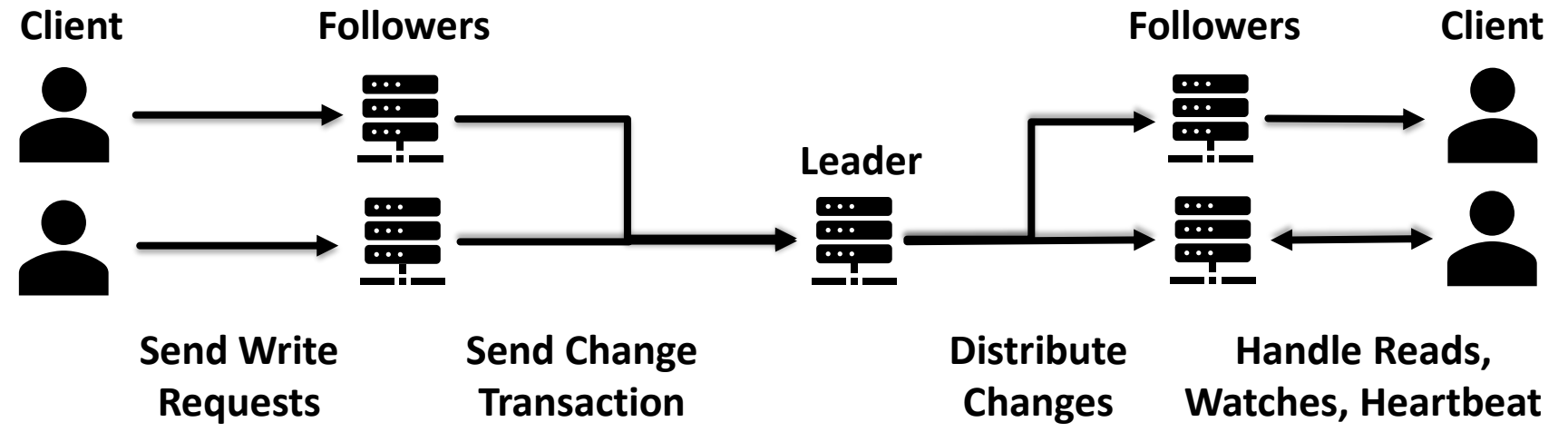
System

Mostly write operations
Synchronization primitives

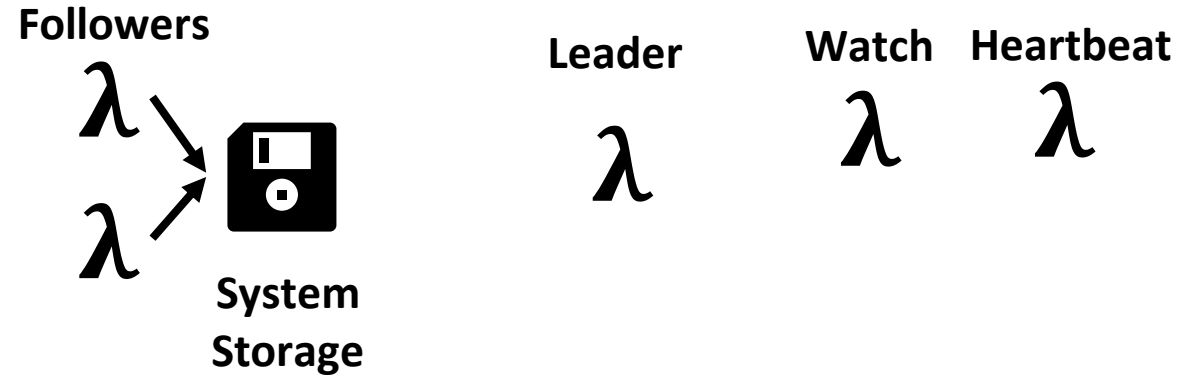
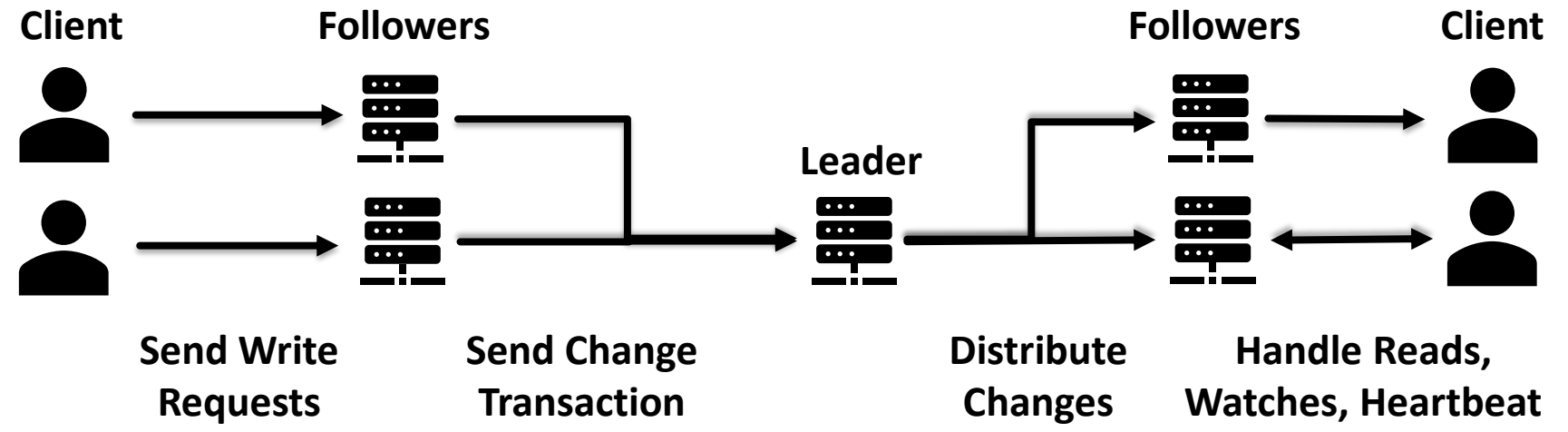
Building Serverless Services – Map Storage



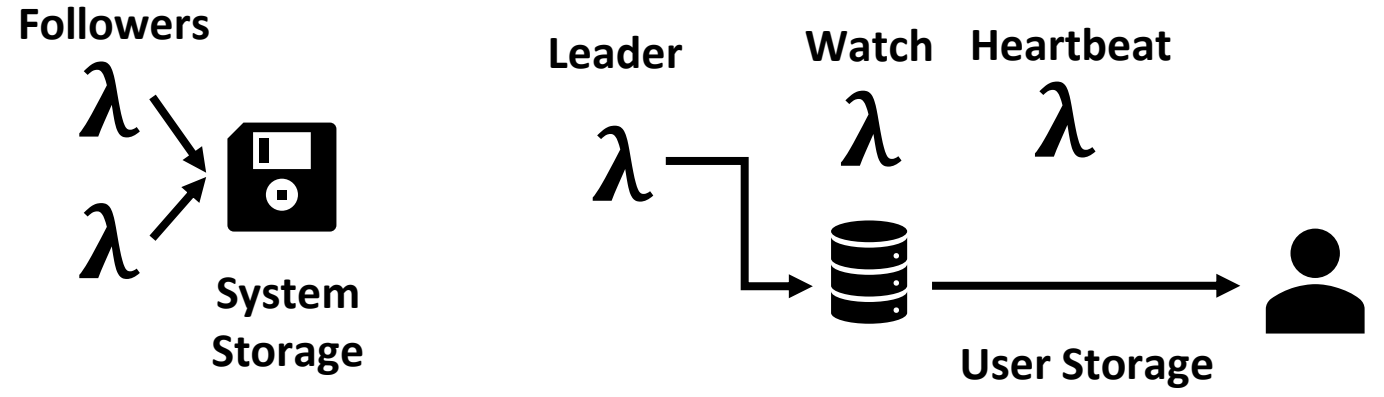
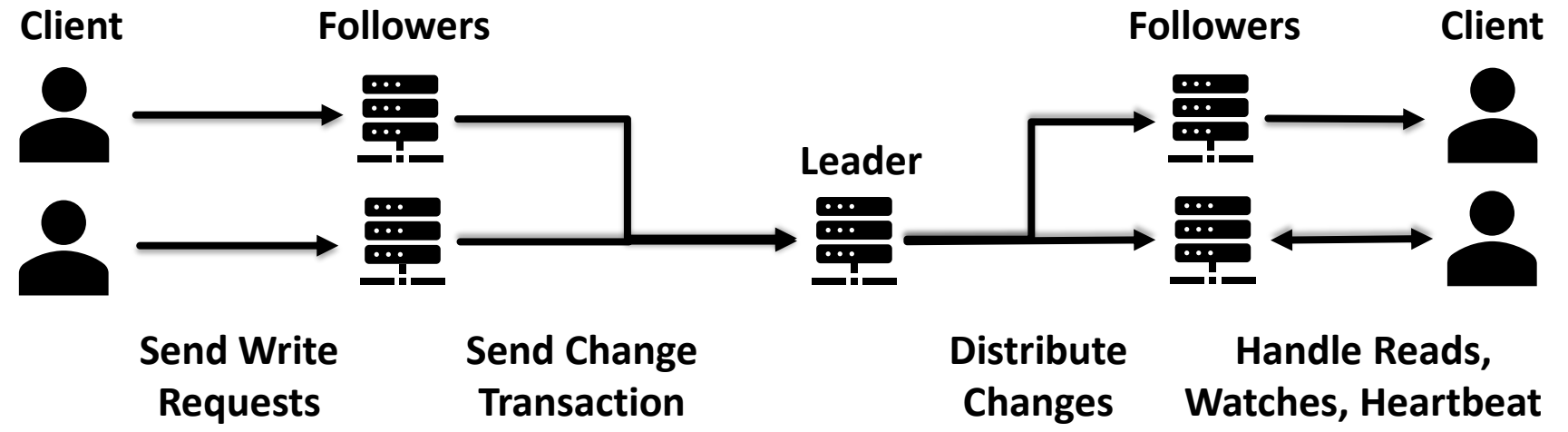
From ZooKeeper to FaaSKeeper



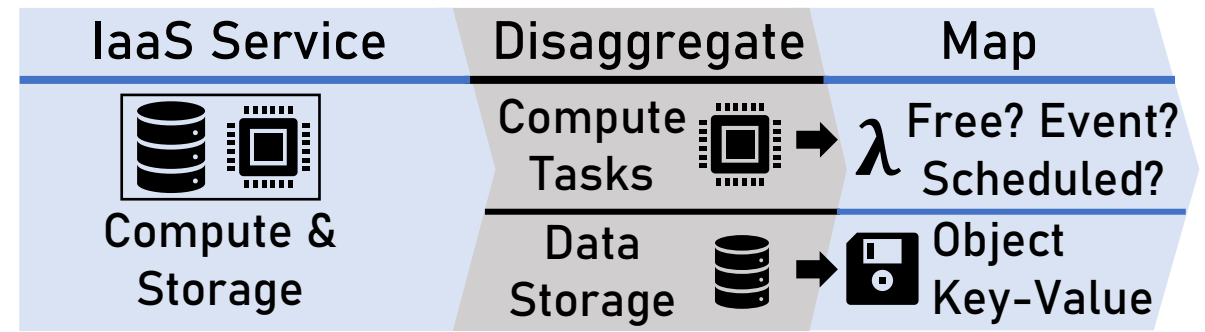
From ZooKeeper to FaaSKeeper



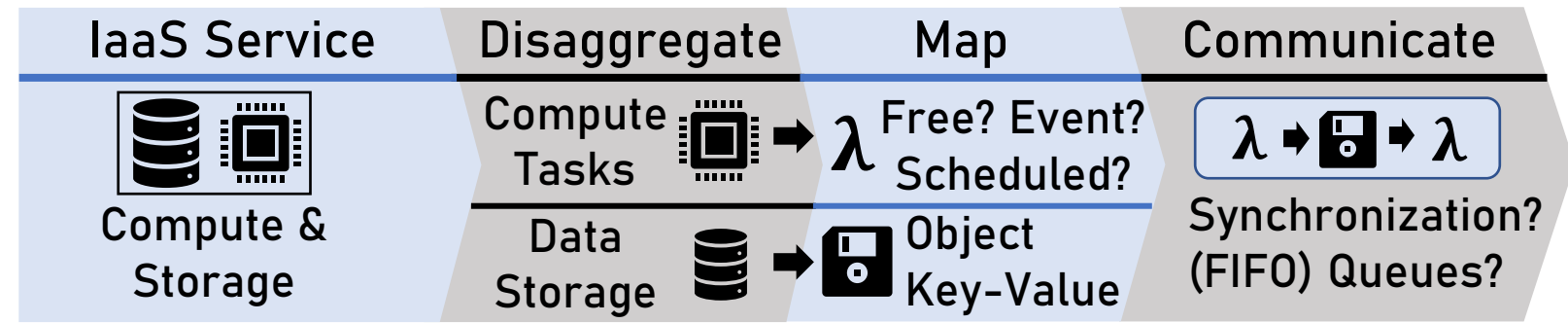
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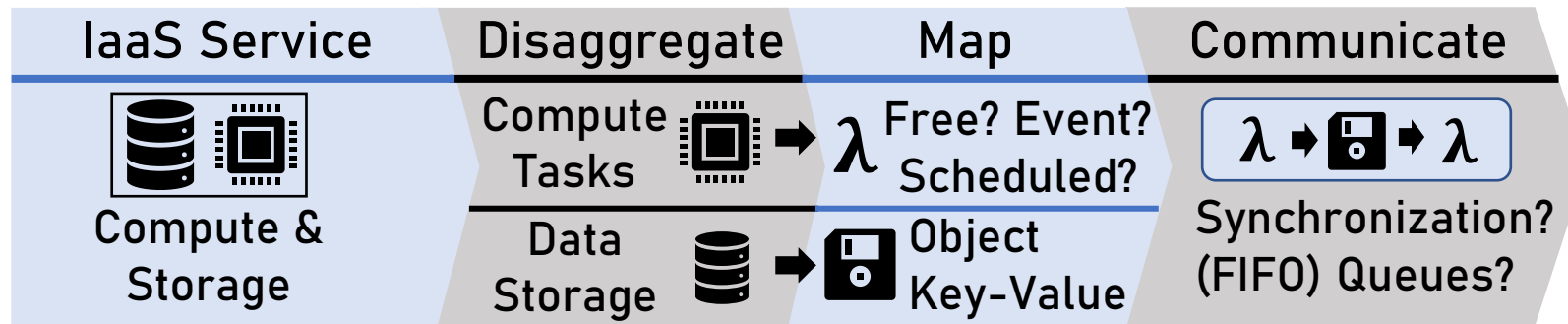
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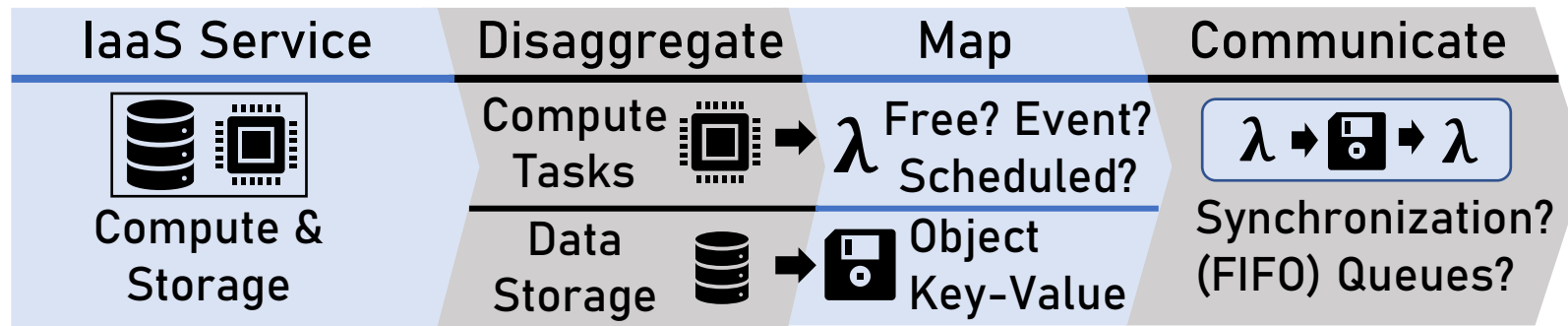


From ZooKeeper to FaaSKeeper



Event Ordering on Client

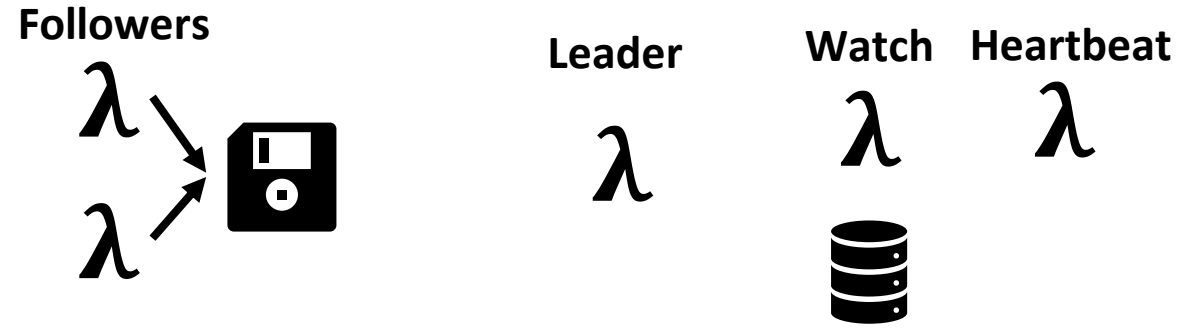
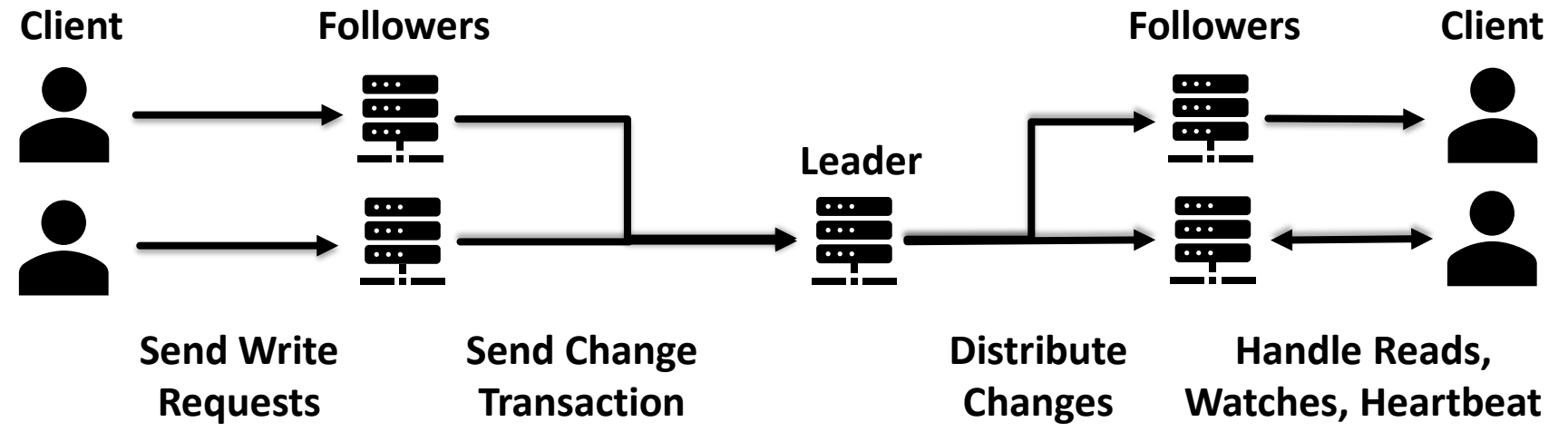
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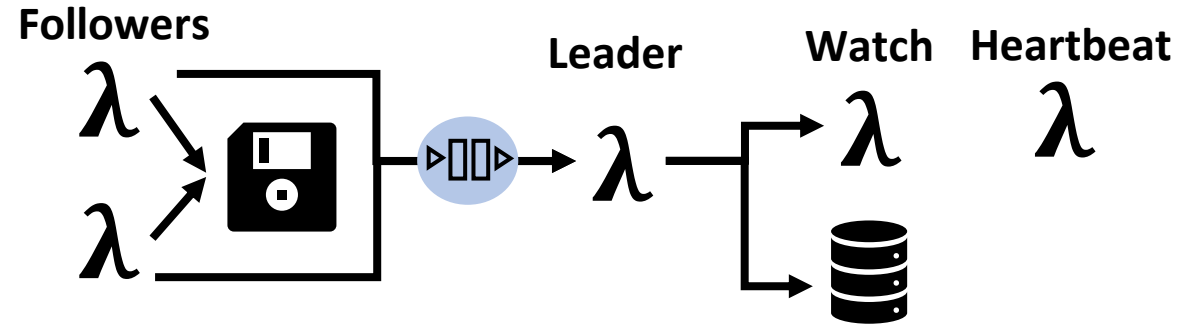
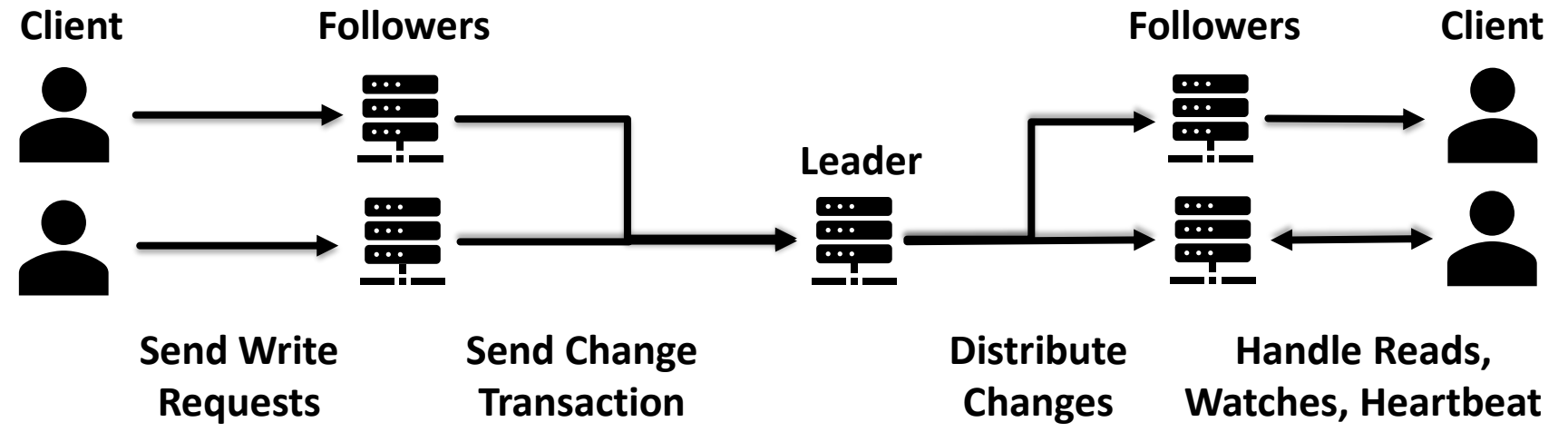
Event Ordering on Client

Epoch Counters for Watches

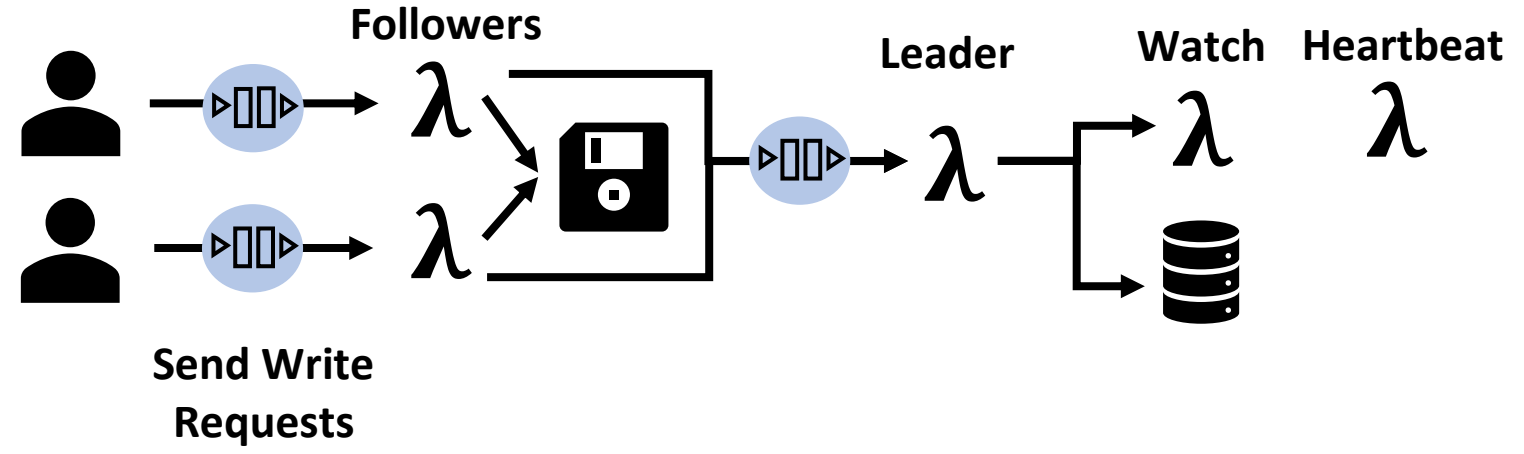
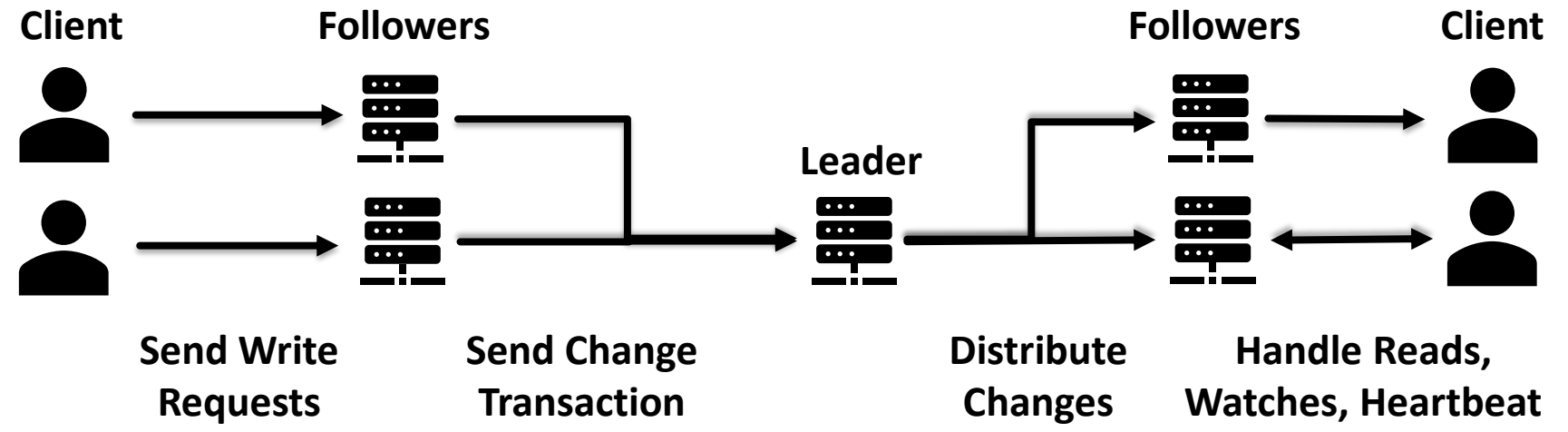
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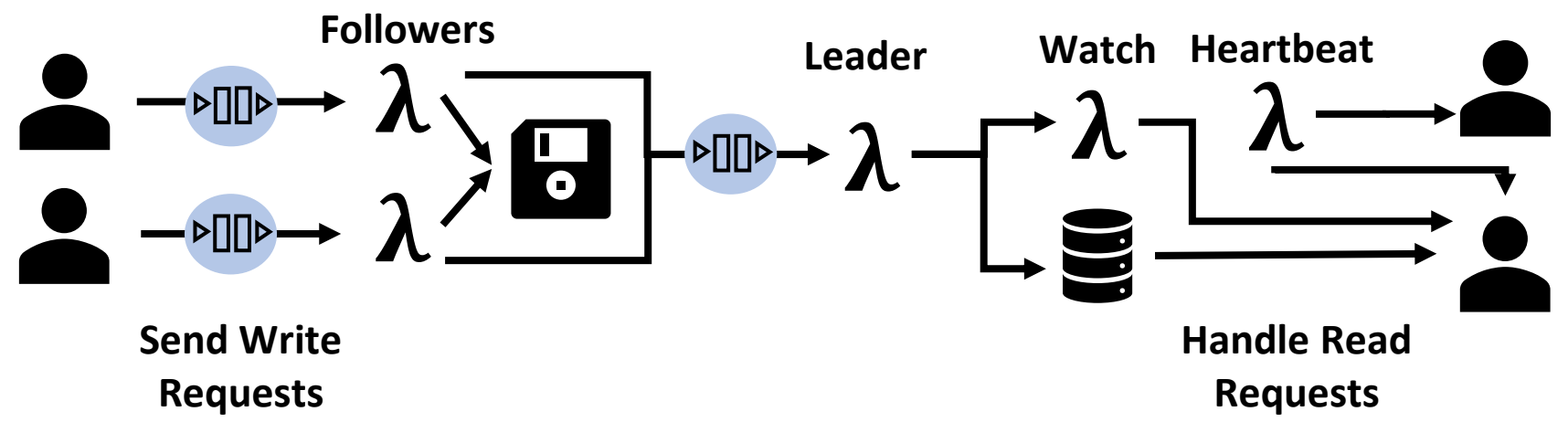
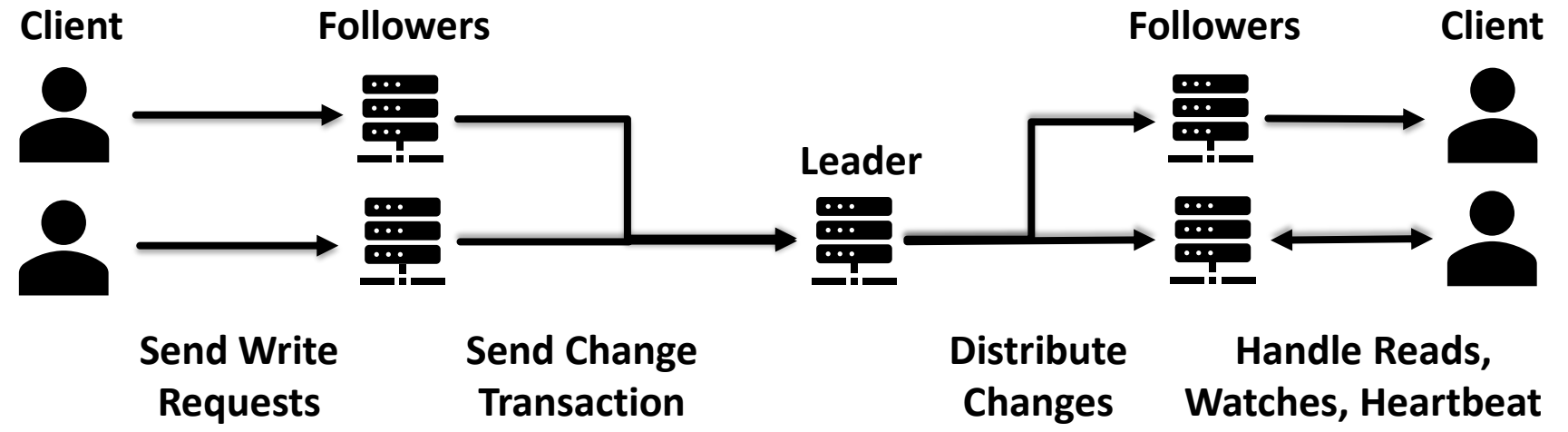
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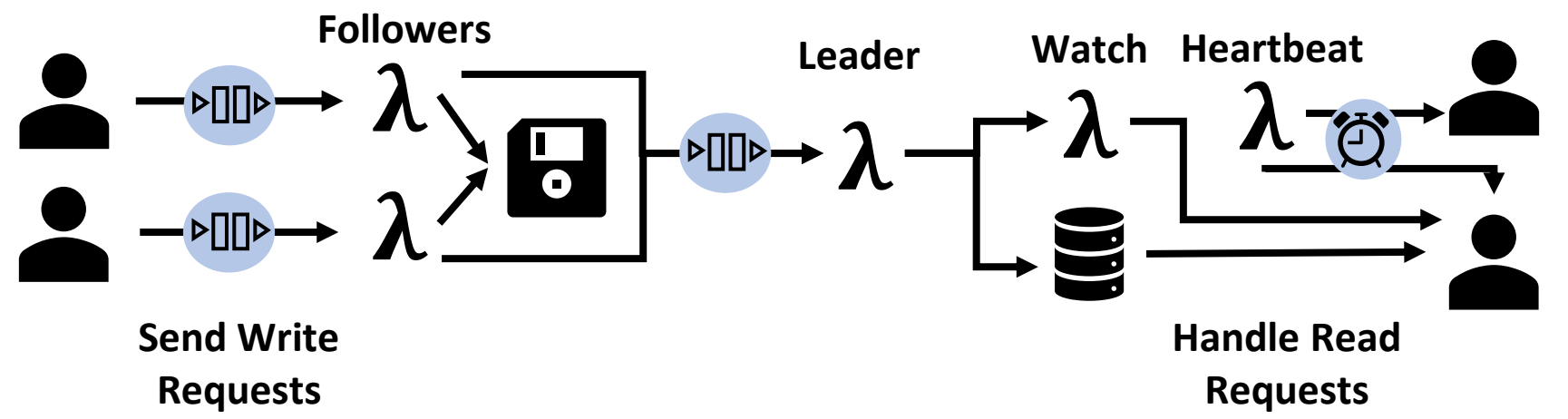
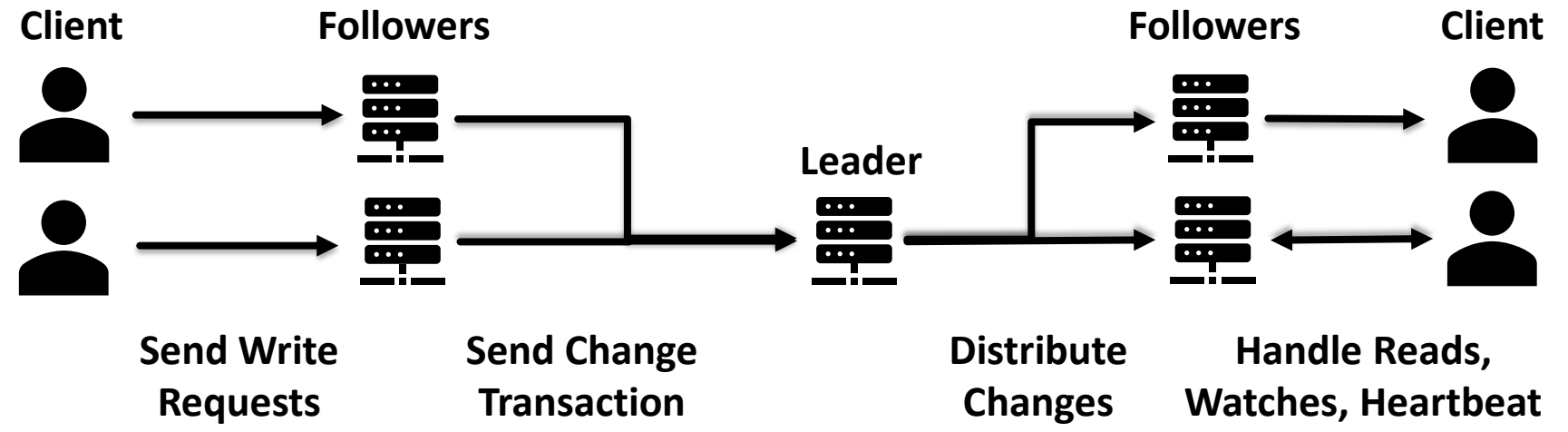
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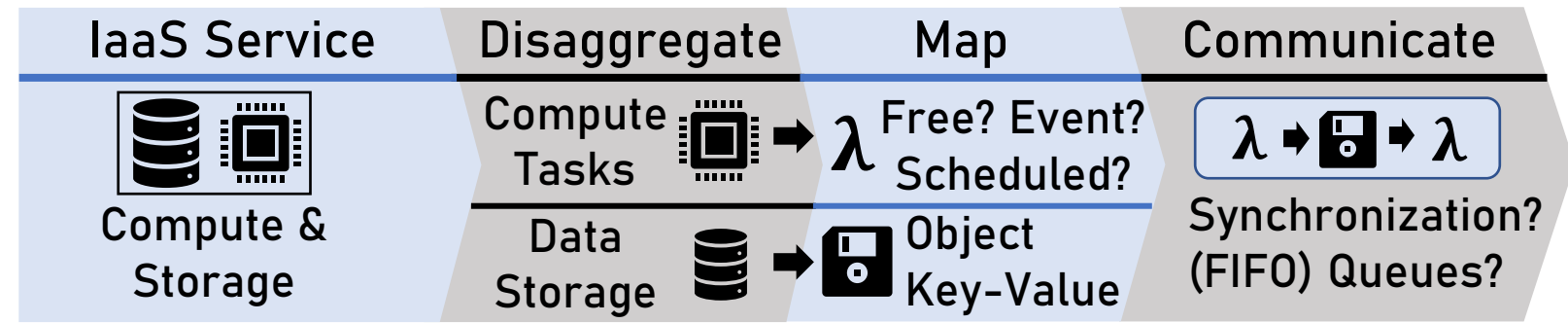
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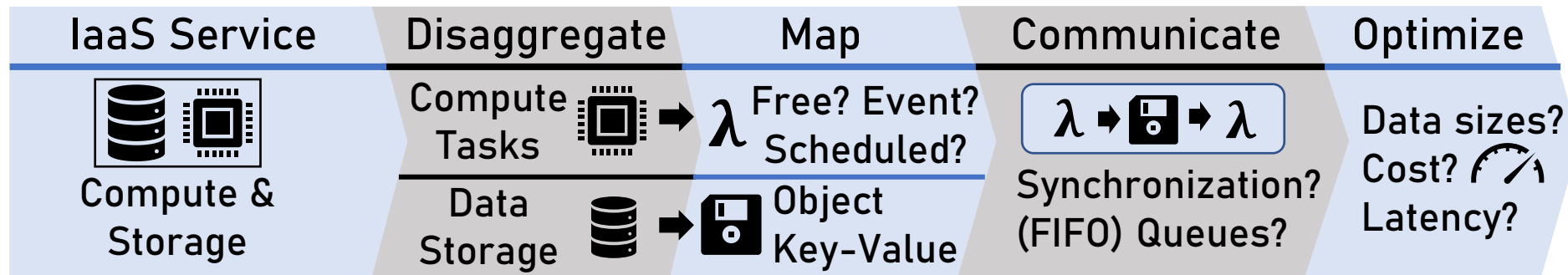
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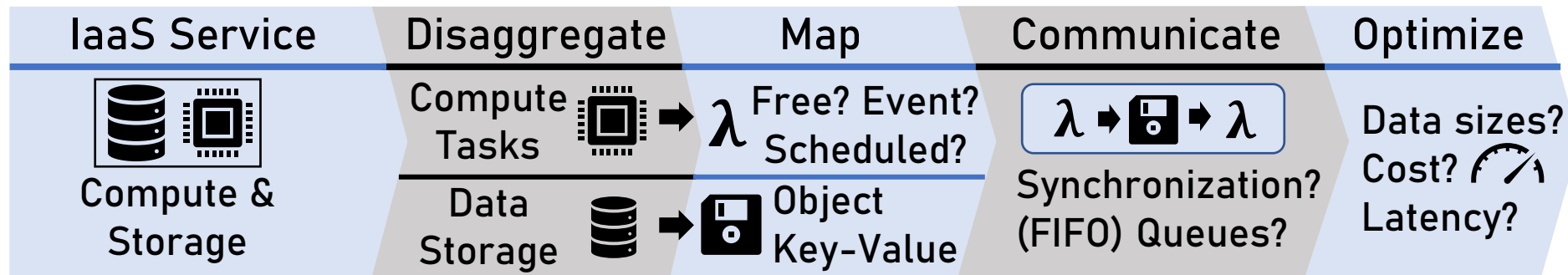
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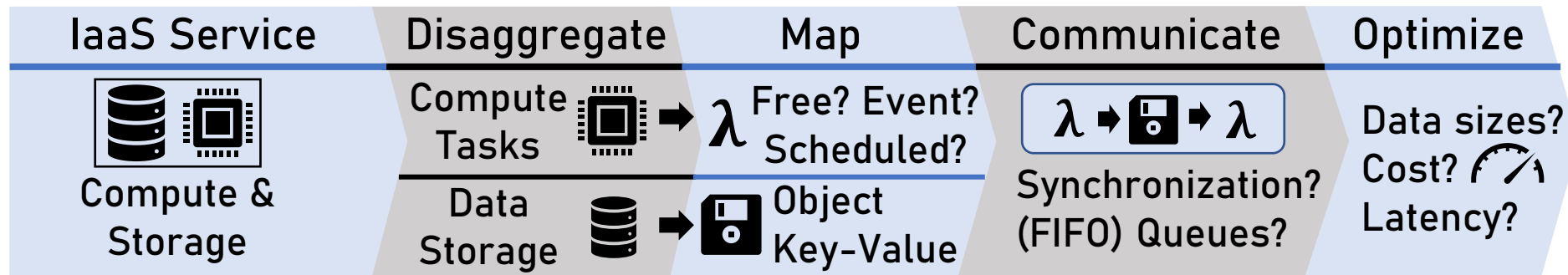


From ZooKeeper to FaaSKeeper



Hybrid Storage

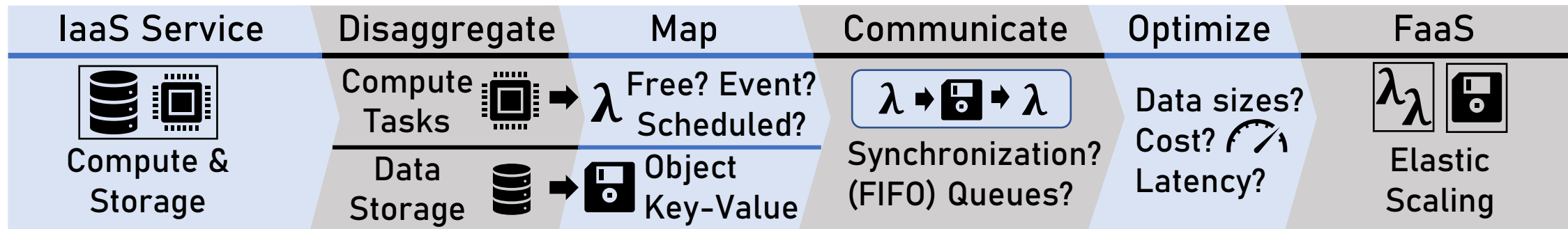
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Hybrid Storage

Decoupled Heartbeats

From ZooKeeper to FaaSKeeper



Hybrid Storage

Decoupled Heartbeats

Consistency Model



Consistency Model



1 Atomicity



Atomic updates to cloud storage

Consistency Model



1 Atomicity

Atomic updates to cloud storage

2 Linearized Writes

Single leader with ordered queues

Consistency Model



- | | | |
|----------|----------------------------|--|
| 1 | Atomicity | Atomic updates to cloud storage |
| 2 | Linearized Writes | Single leader with ordered queues |
| 3 | Single System Image | Strongly consistent cloud storage |

Consistency Model



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| 1 | Atomicity | Atomic updates to cloud storage |
| 2 | Linearized Writes | Single leader with ordered queues |
| 3 | Single System Image | Strongly consistent cloud storage |
| 4 | Ordered Notifications | Watch notifications with epoch counters |

Implementation & Evaluation

Implementation & Evaluation

Proof of Concept Implementation

1,350 LoC for FaaSKeeper

1,400 LoC for client library

Implementation & Evaluation

Proof of Concept Implementation
1,350 LoC for FaaSKeeper
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Implementation & Evaluation

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1,400 LoC for client library



- 1** How does read performance compare to ZooKeeper?
- 2** How does write performance compare to ZooKeeper?

Implementation & Evaluation

Proof of Concept Implementation

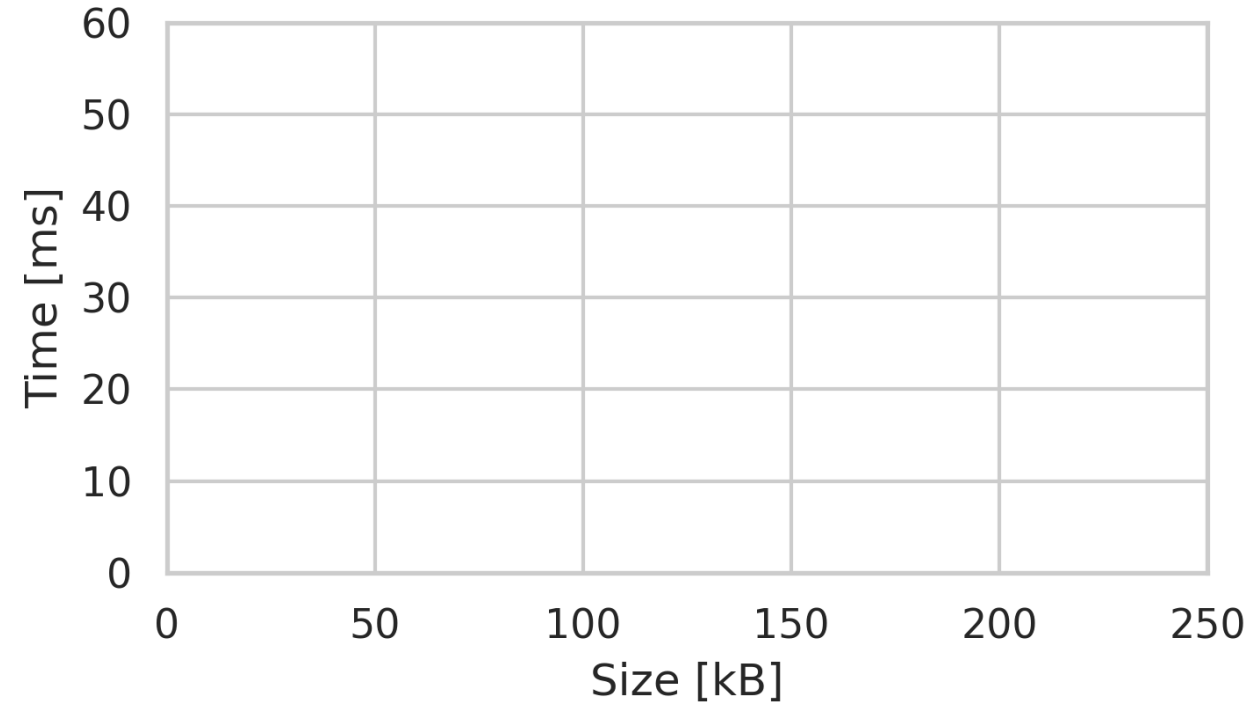
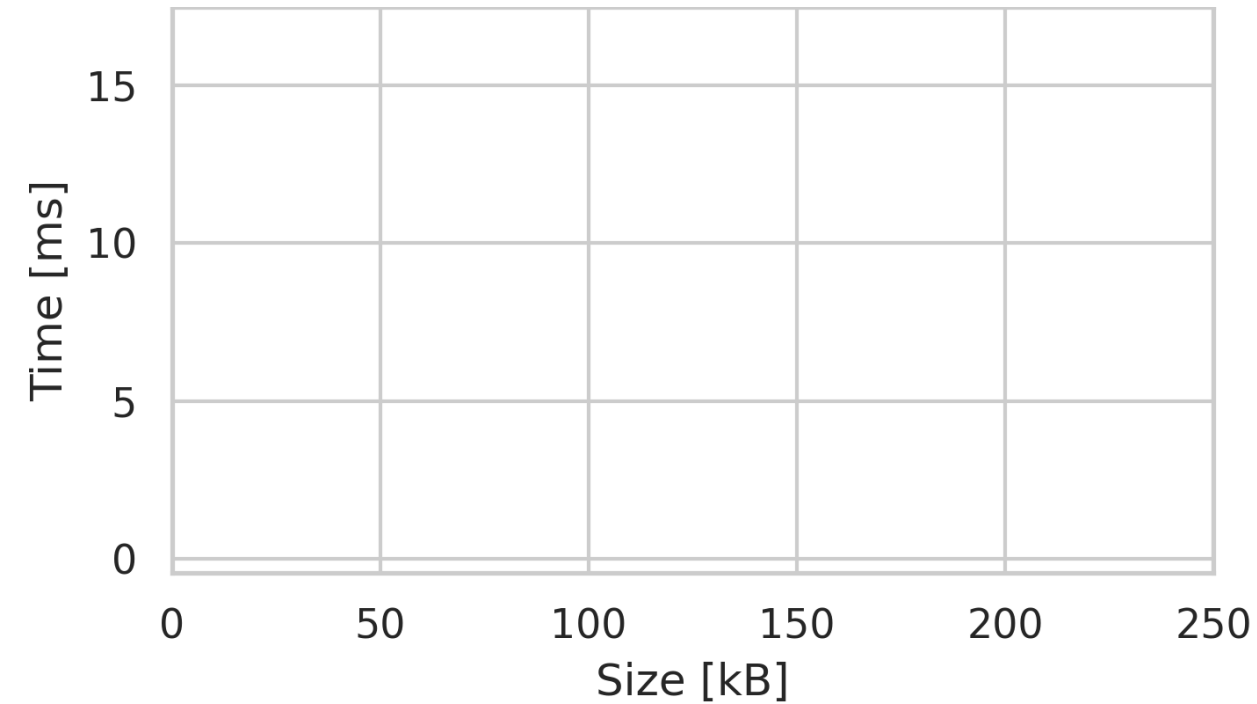
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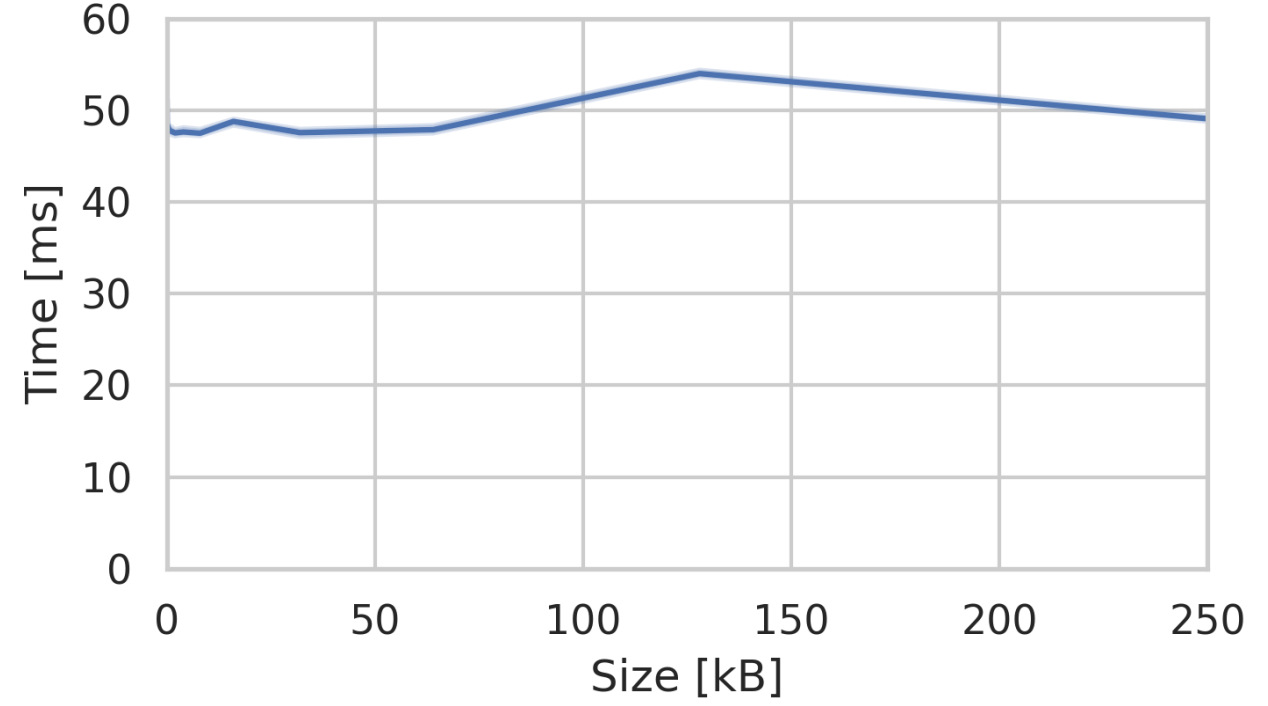
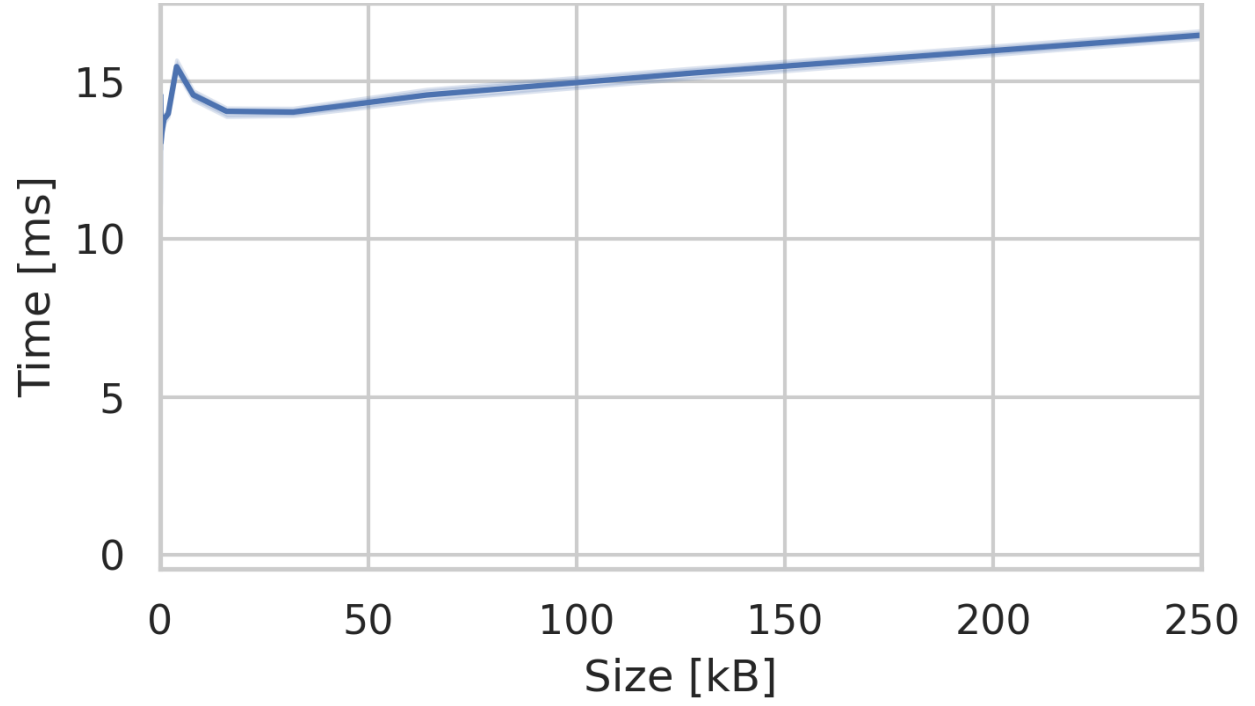


- 1 How does read performance compare to ZooKeeper?
- 2 How does write performance compare to ZooKeeper?
- 3 By how much can FaaSKeeper decrease costs?

Evaluation: Read Performance 1

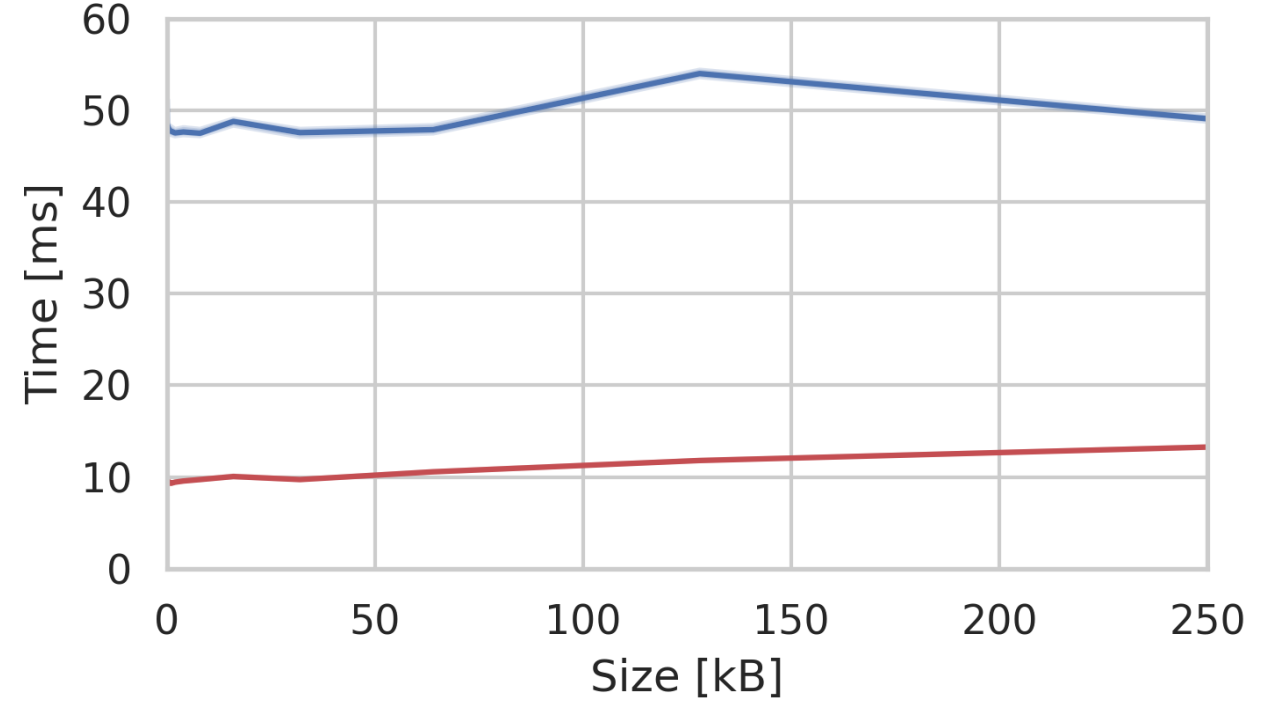
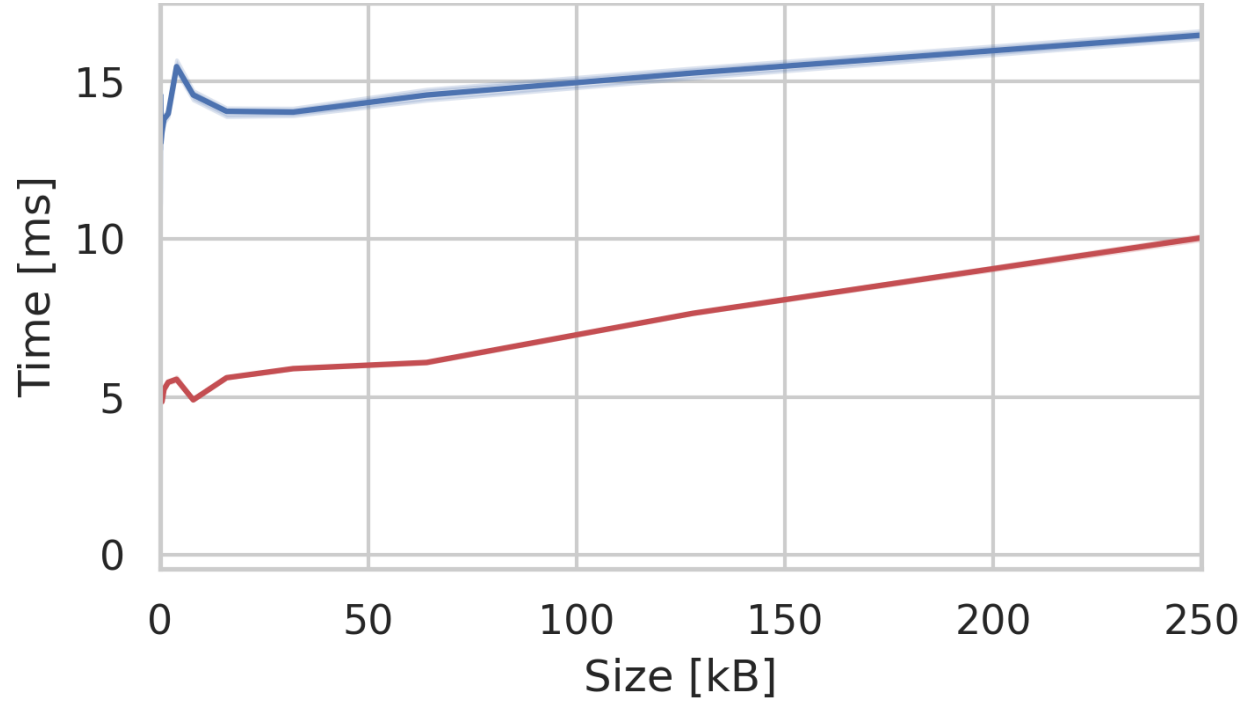


Evaluation: Read Performance 1



FaaSKeeper
Object Storage

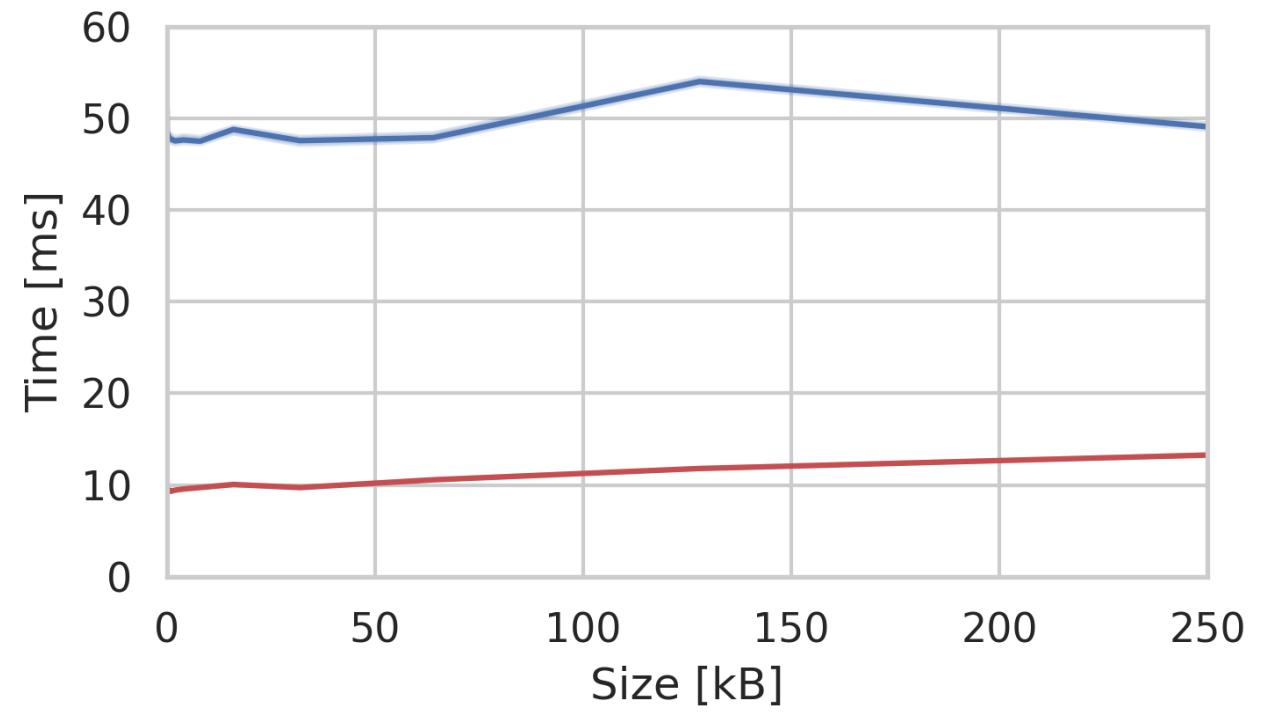
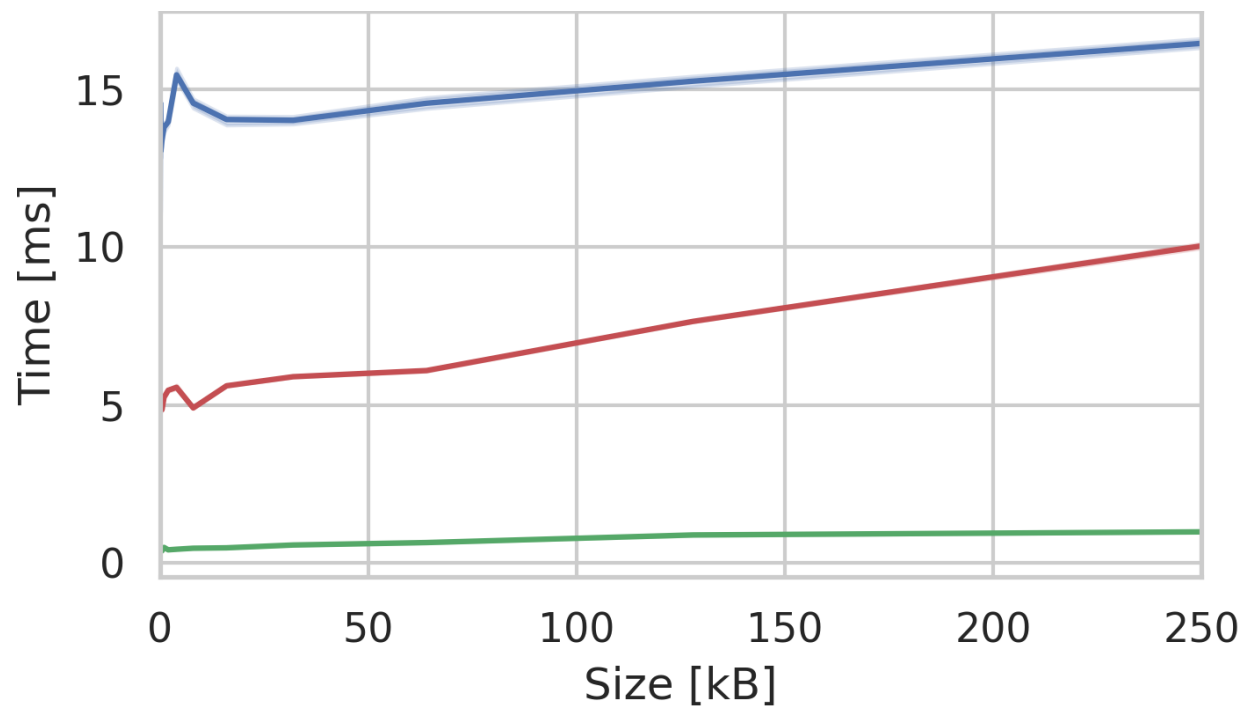
Evaluation: Read Performance 1



**FaaSKeeper
Object Storage**

**FaaSKeeper
Key-Value Storage**

Evaluation: Read Performance 1

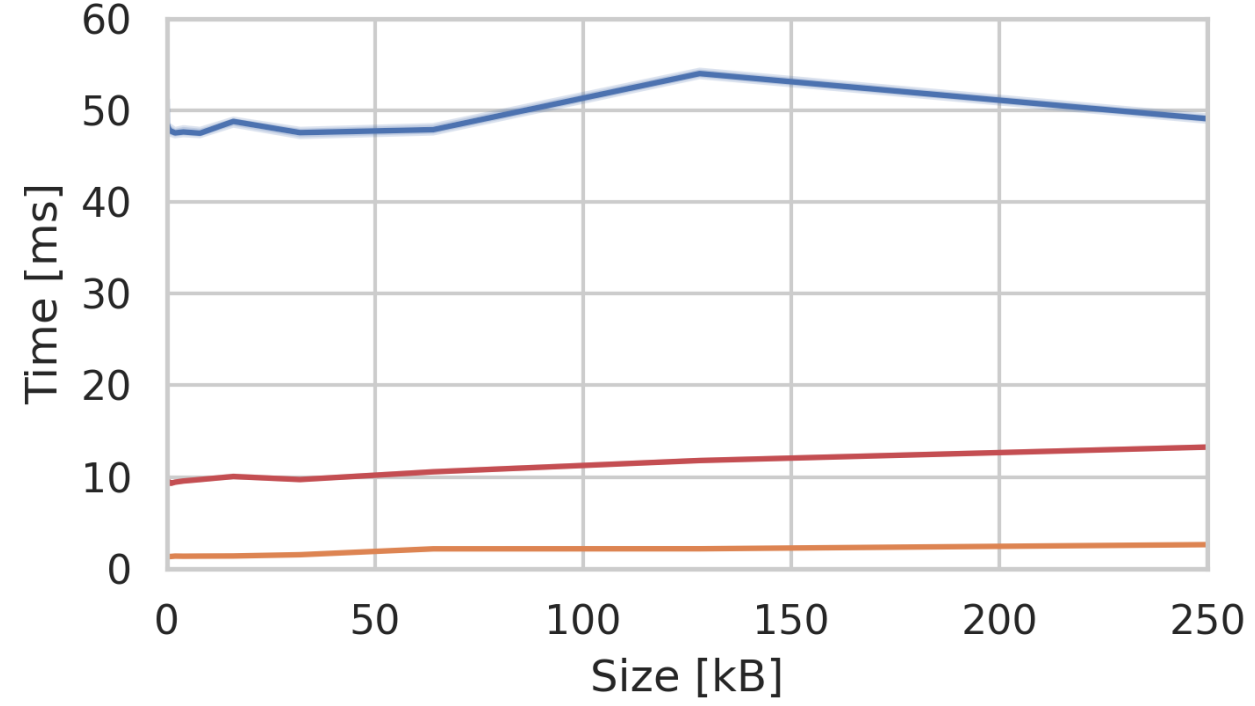
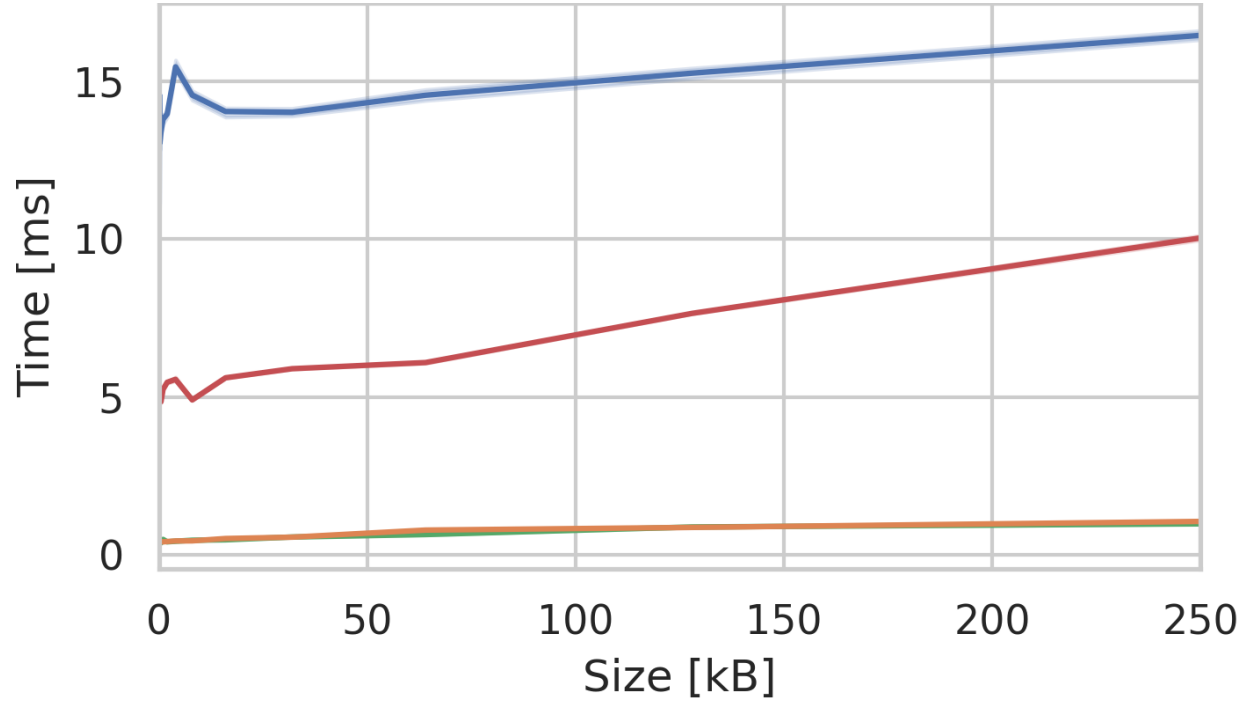


**FaaSKeeper
Object Storage**

**FaaSKeeper
Key-Value Storage**

**FaaSKeeper
Redis**

Evaluation: Read Performance 1



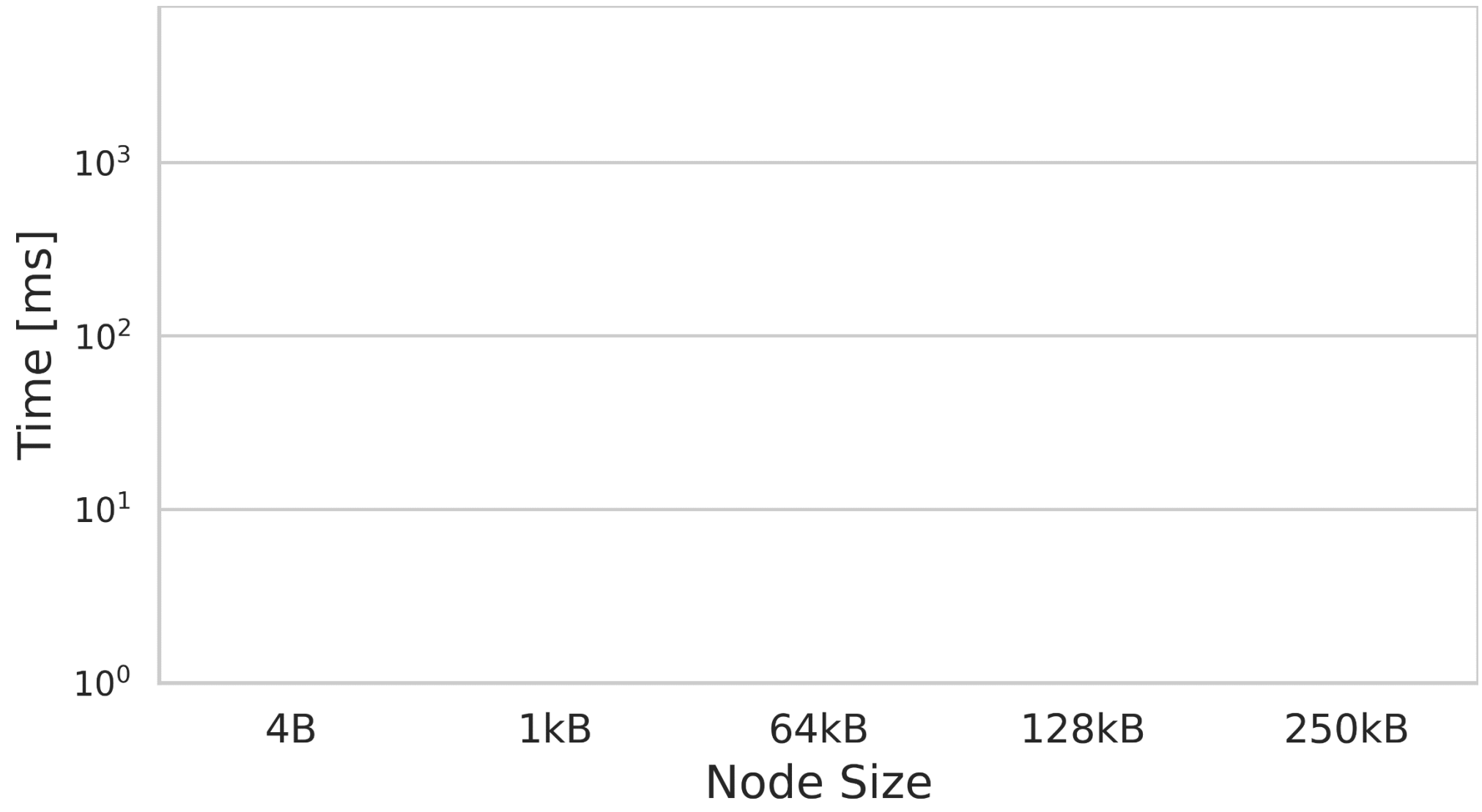
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Key-Value Storage**

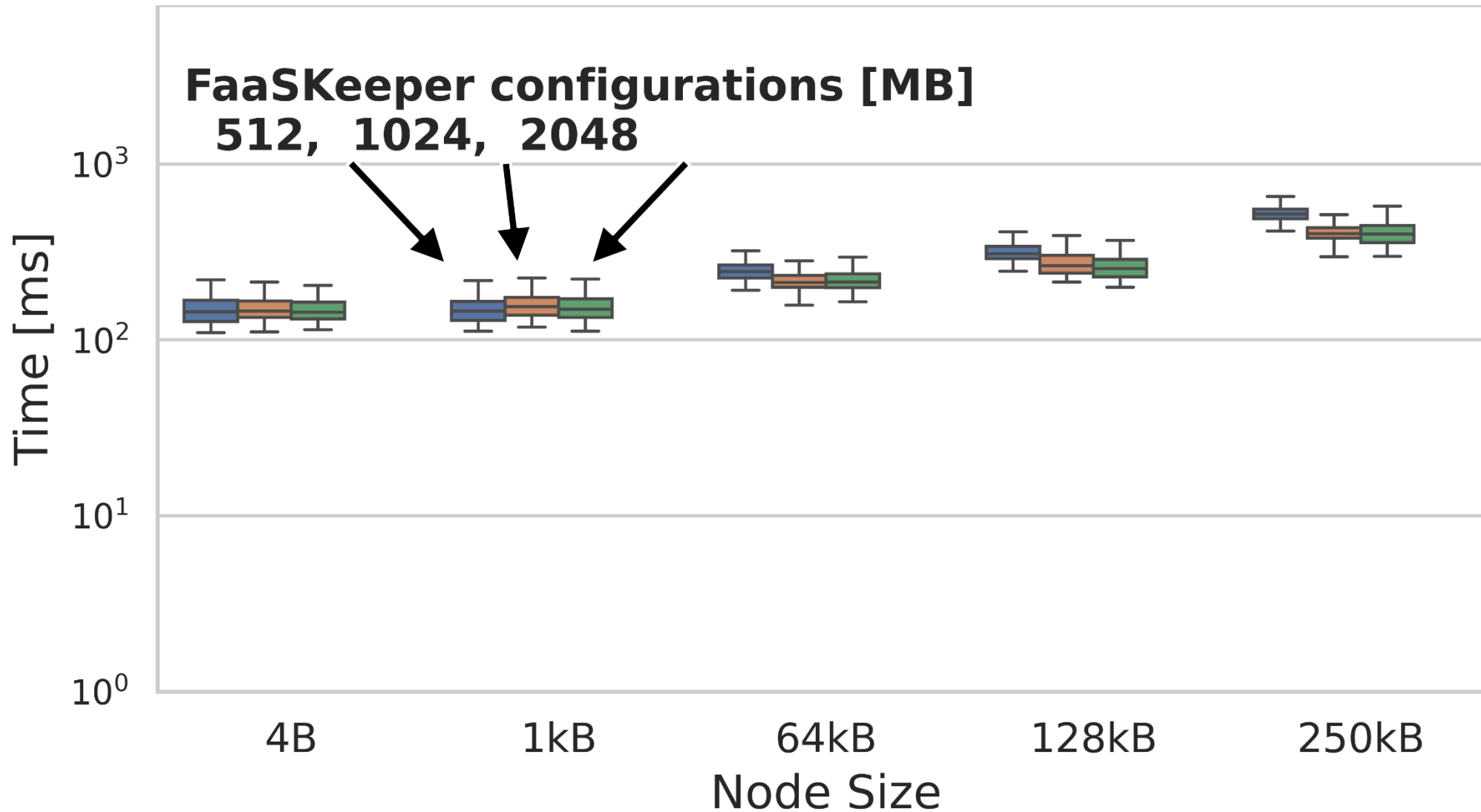
**FaaSKeeper
Redis**

ZooKeeper

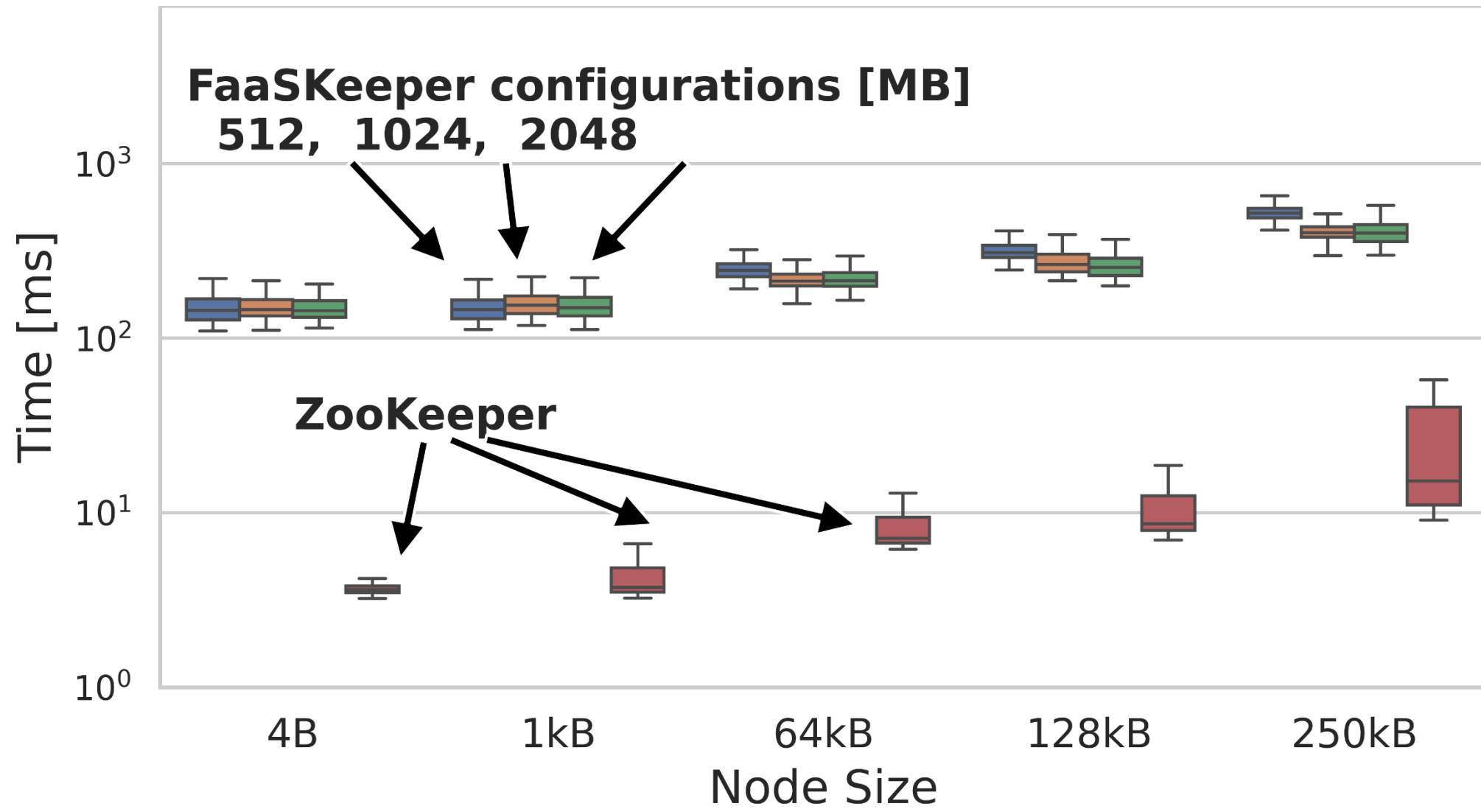
Evaluation: Write Performance 2



Evaluation: Write Performance 2



Evaluation: Write Performance 2



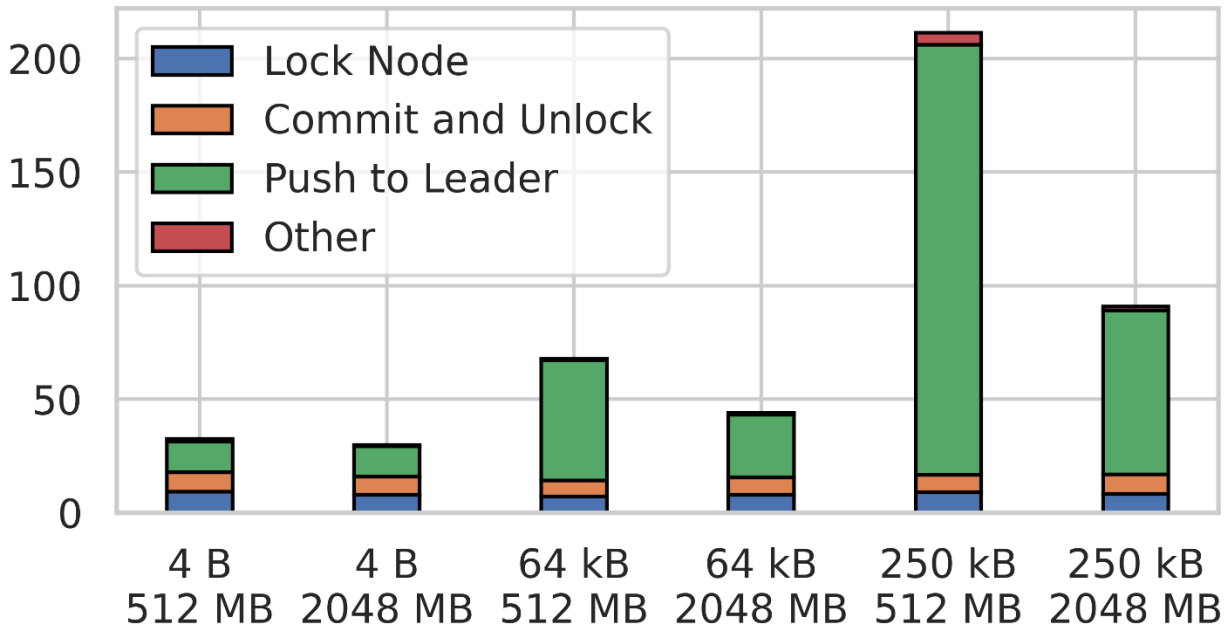
Evaluation: Write Performance 2

Follower Function

Leader Function

Evaluation: Write Performance 2

Follower Function

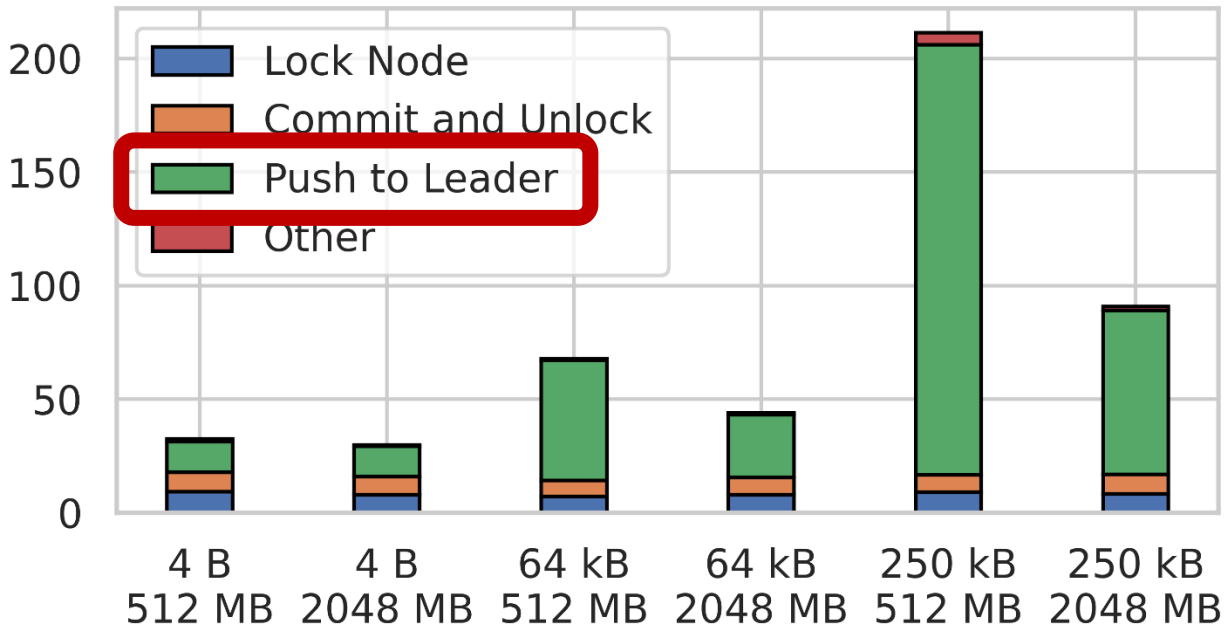


Leader Function

Evaluation: Write Performance 2

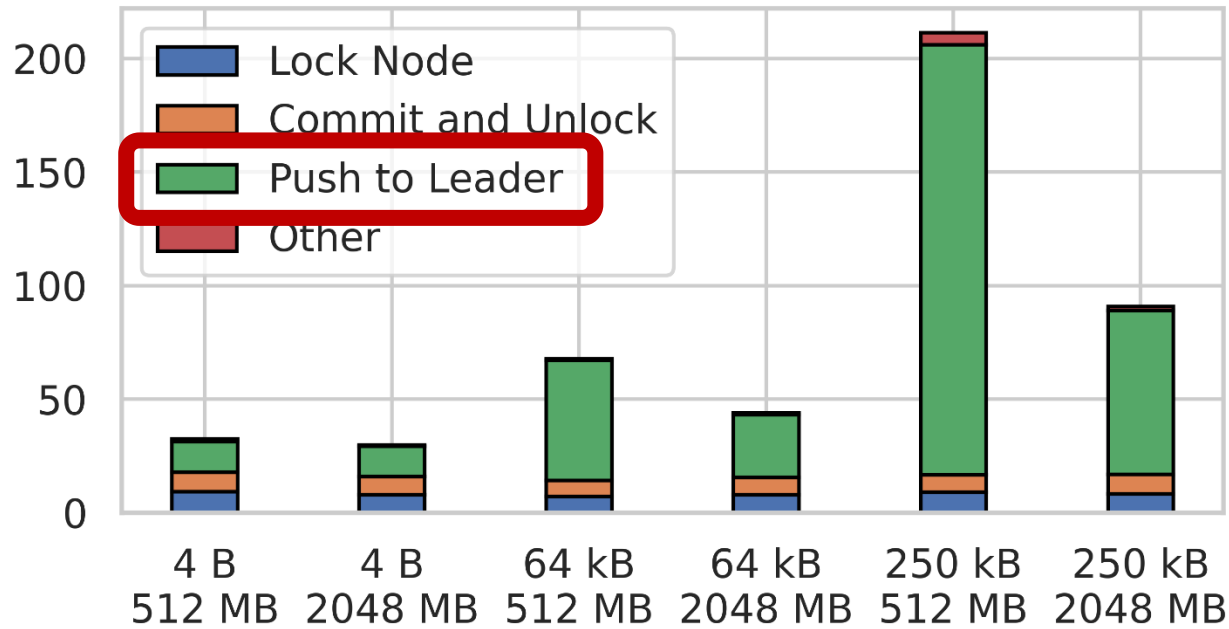
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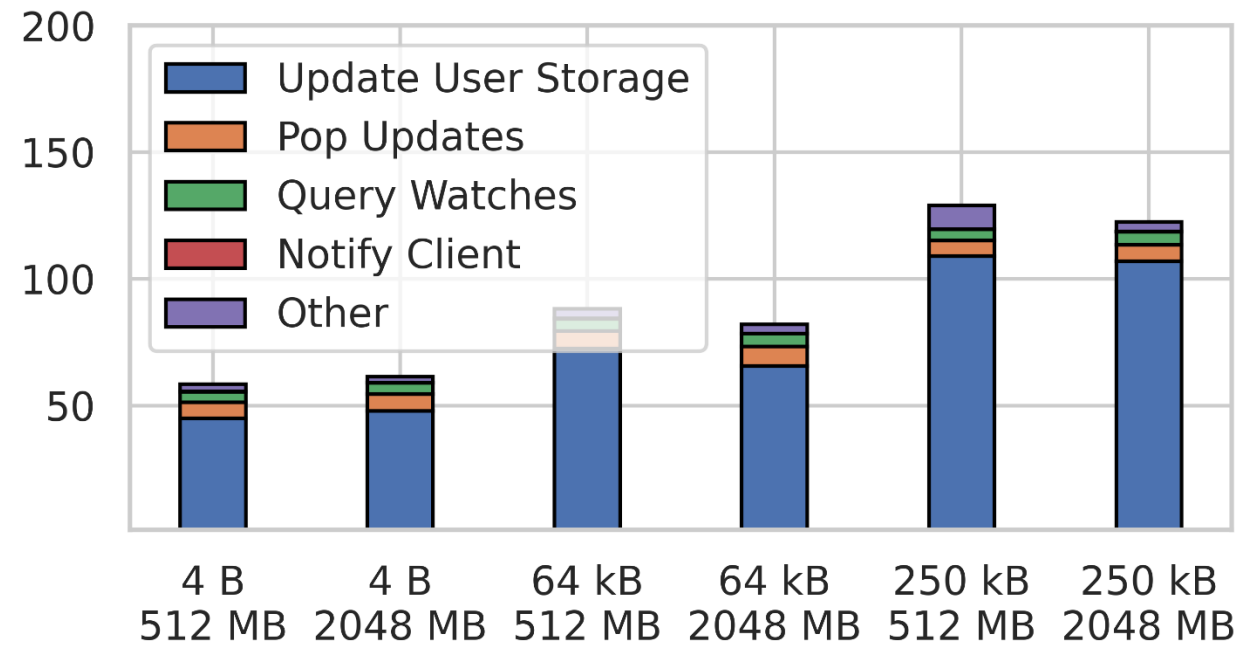


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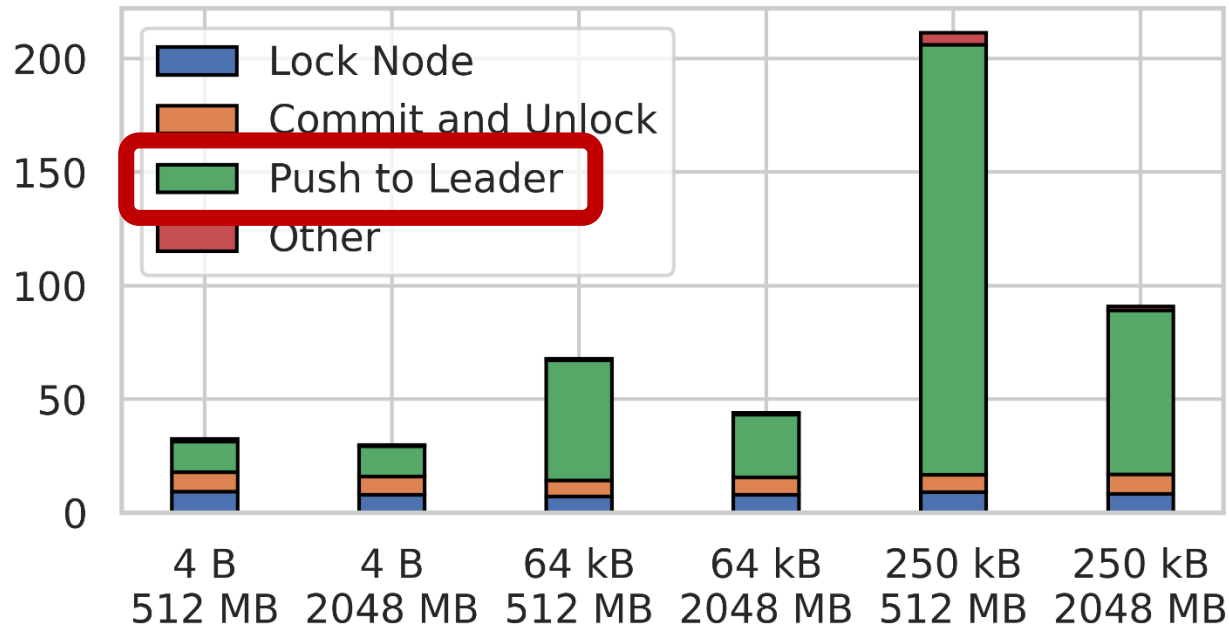


Leader Function

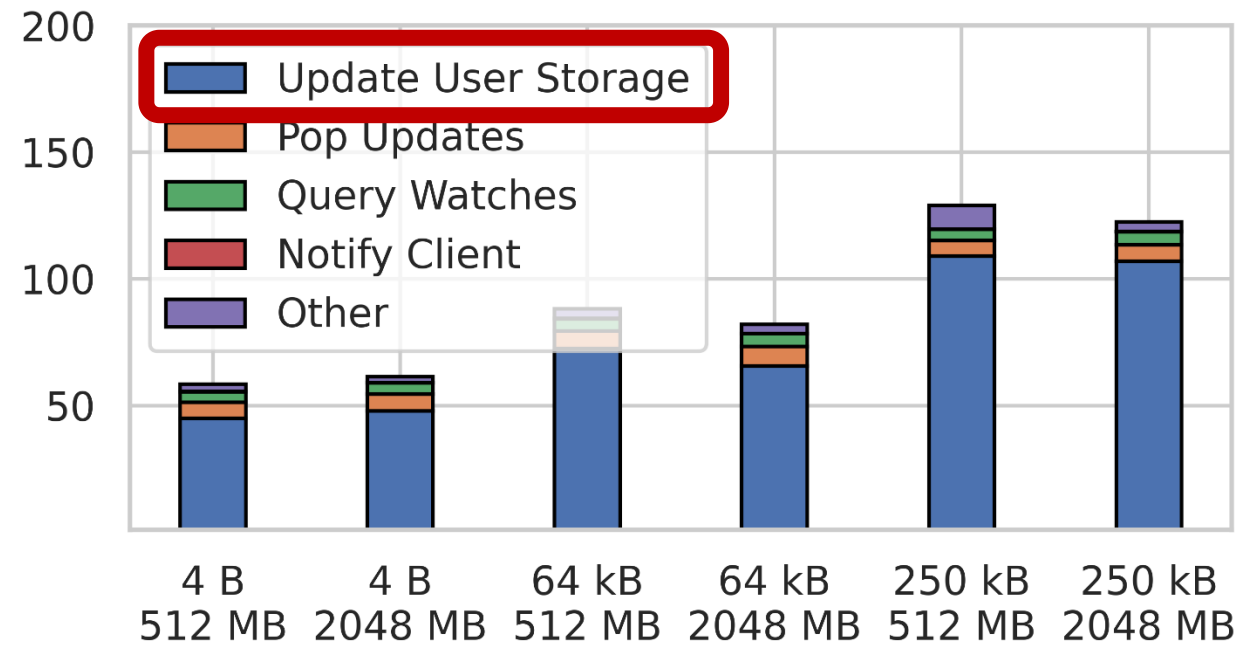


Evaluation: Write Performance 2

Follower Function



Leader Function



Evaluation: Cost Efficiency

3

Cost ratio of ZooKeeper and FaaSKeeper, 90% reads.

Cost ratio of ZooKeeper and FaaSKeeper, 80% reads.

ZooKeeper – constant cost for VMs.
FaaSKeeper – pay per each request.

Set node data of 1 kB, no watches, single request per invocation.

Evaluation: Cost Efficiency

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100K 500K 1M 2M 5M
Requests per day.

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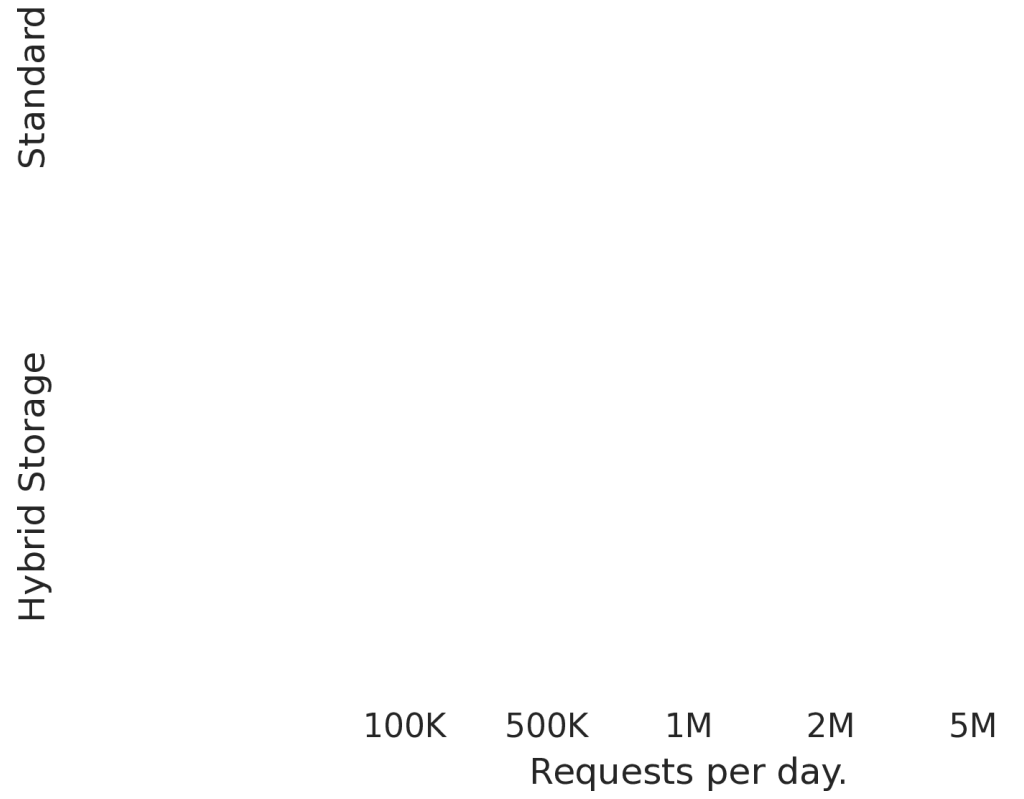
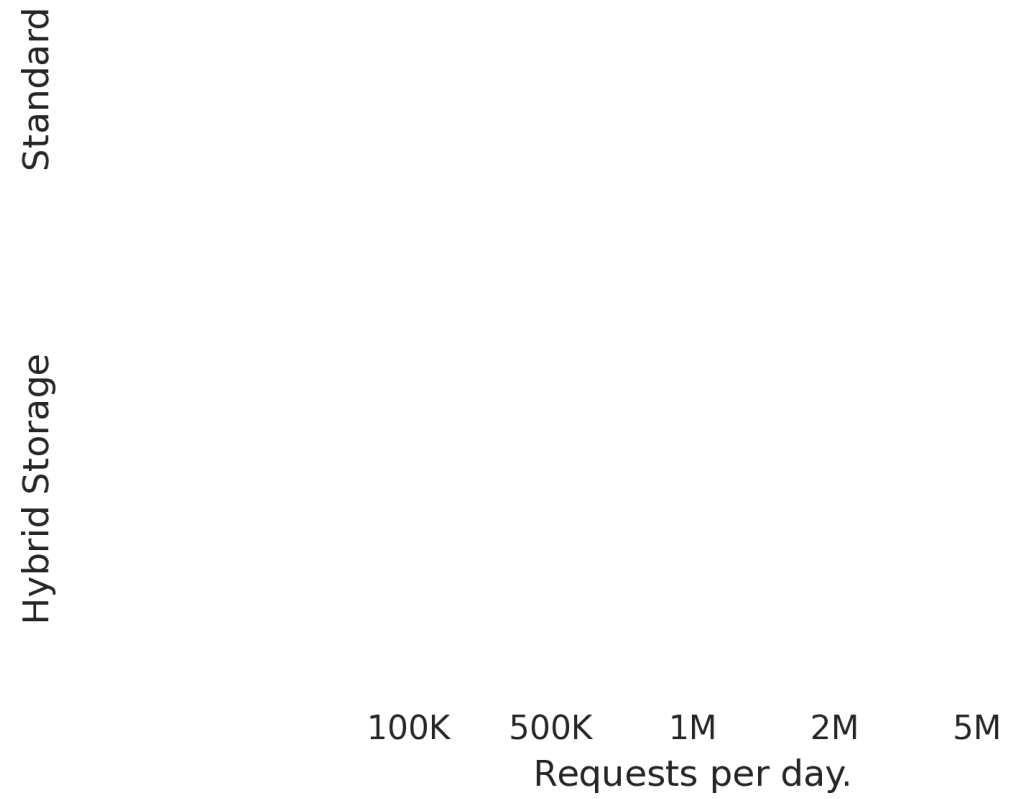
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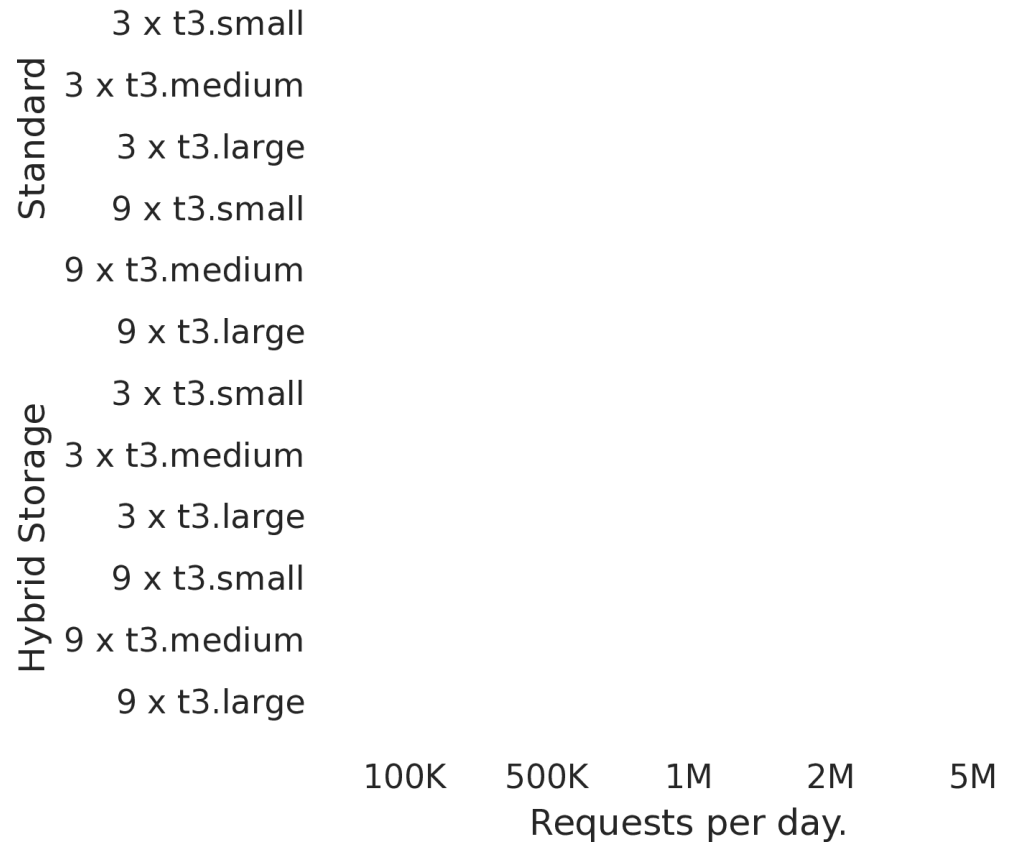
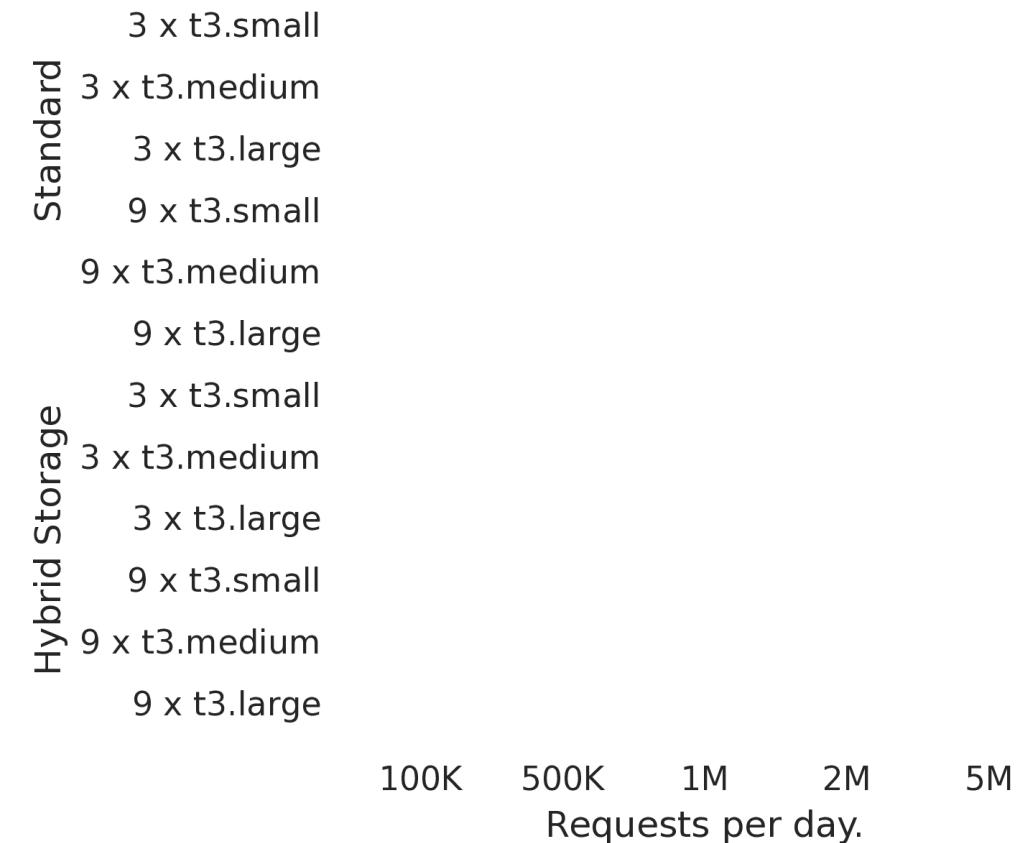
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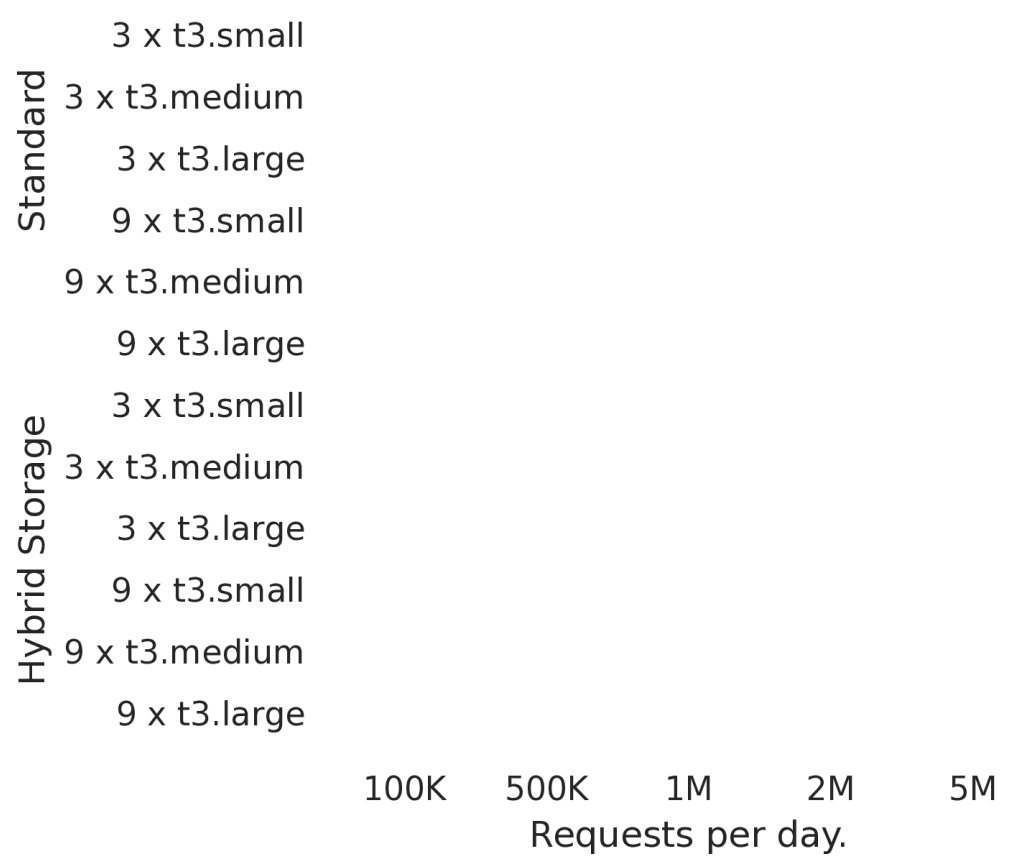
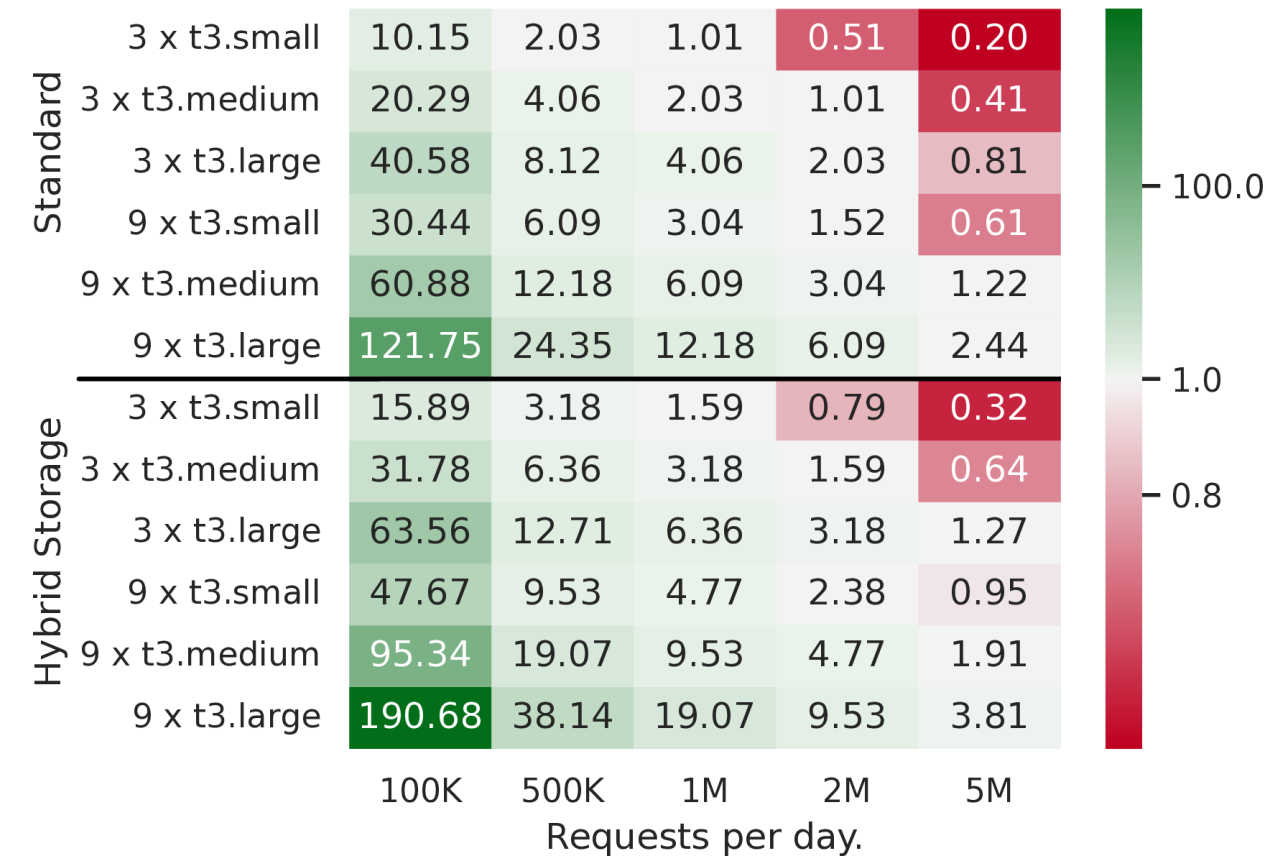
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	VM Config	Requests per day					Color Scale
		100K	500K	1M	2M	5M	
Standard	3 x t3.small	10.15	2.03	1.01	0.51	0.20	
	3 x t3.medium	20.29	4.06	2.03	1.01	0.41	
	3 x t3.large	40.58	8.12	4.06	2.03	0.81	
	9 x t3.small	30.44	6.09	3.04	1.52	0.61	
	9 x t3.medium	60.88	12.18	6.09	3.04	1.22	
	9 x t3.large	121.75	24.35	12.18	6.09	2.44	
Hybrid Storage	3 x t3.small	15.89	3.18	1.59	0.79	0.32	
	3 x t3.medium	31.78	6.36	3.18	1.59	0.64	
	3 x t3.large	63.56	12.71	6.36	3.18	1.27	
	9 x t3.small	47.67	9.53	4.77	2.38	0.95	
	9 x t3.medium	95.34	19.07	9.53	4.77	1.91	
	9 x t3.large	190.68	38.14	19.07	9.53	3.81	

	VM Config	Requests per day					Color Scale
		100K	500K	1M	2M	5M	
Standard	3 x t3.small	5.87	1.17	0.59	0.29	0.12	
	3 x t3.medium	11.74	2.35	1.17	0.59	0.23	
	3 x t3.large	23.47	4.69	2.35	1.17	0.47	
	9 x t3.small	17.60	3.52	1.76	0.88	0.35	
	9 x t3.medium	35.21	7.04	3.52	1.76	0.70	
	9 x t3.large	70.42	14.08	7.04	3.52	1.41	
Hybrid Storage	3 x t3.small	9.16	1.83	0.92	0.46	0.18	
	3 x t3.medium	18.32	3.66	1.83	0.92	0.37	
	3 x t3.large	36.64	7.33	3.66	1.83	0.73	
	9 x t3.small	27.48	5.50	2.75	1.37	0.55	
	9 x t3.medium	54.96	10.99	5.50	2.75	1.10	
	9 x t3.large	109.92	21.98	10.99	5.50	2.20	

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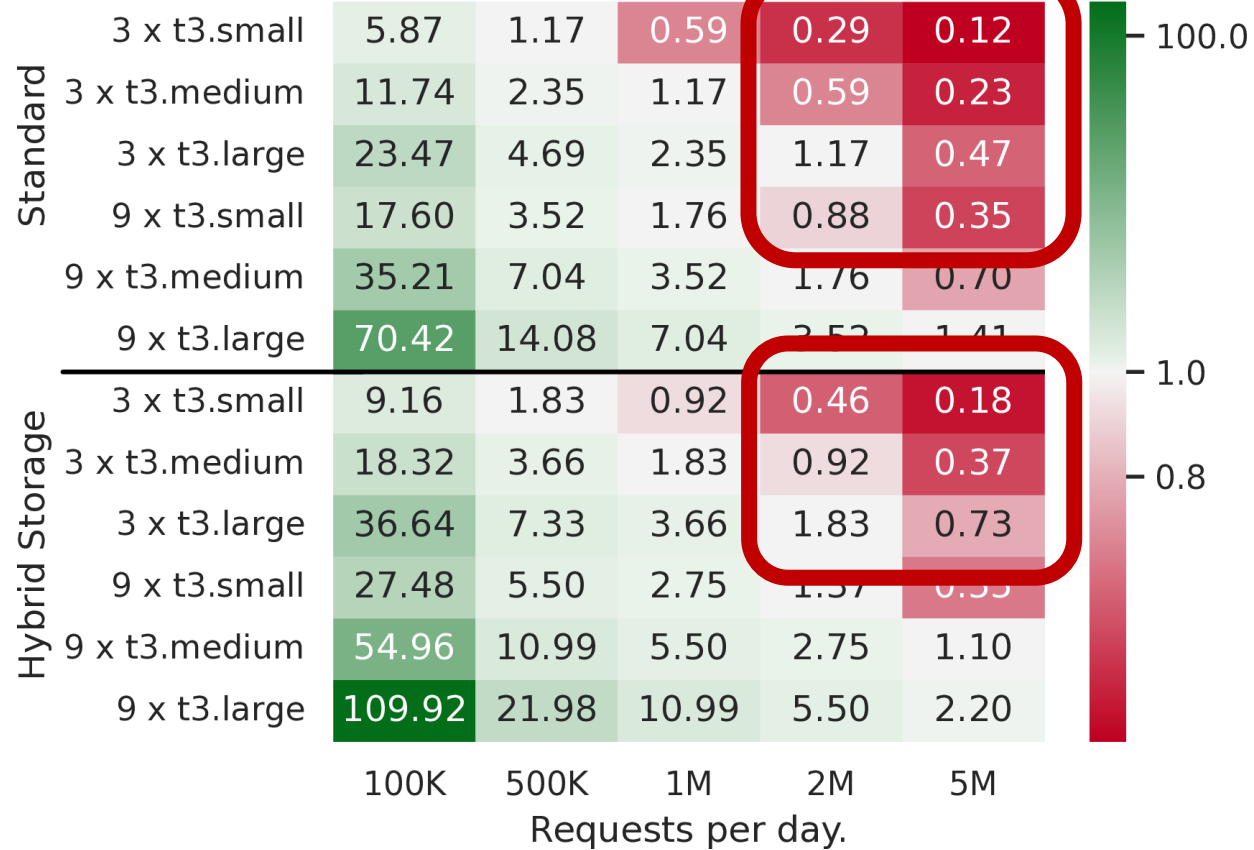
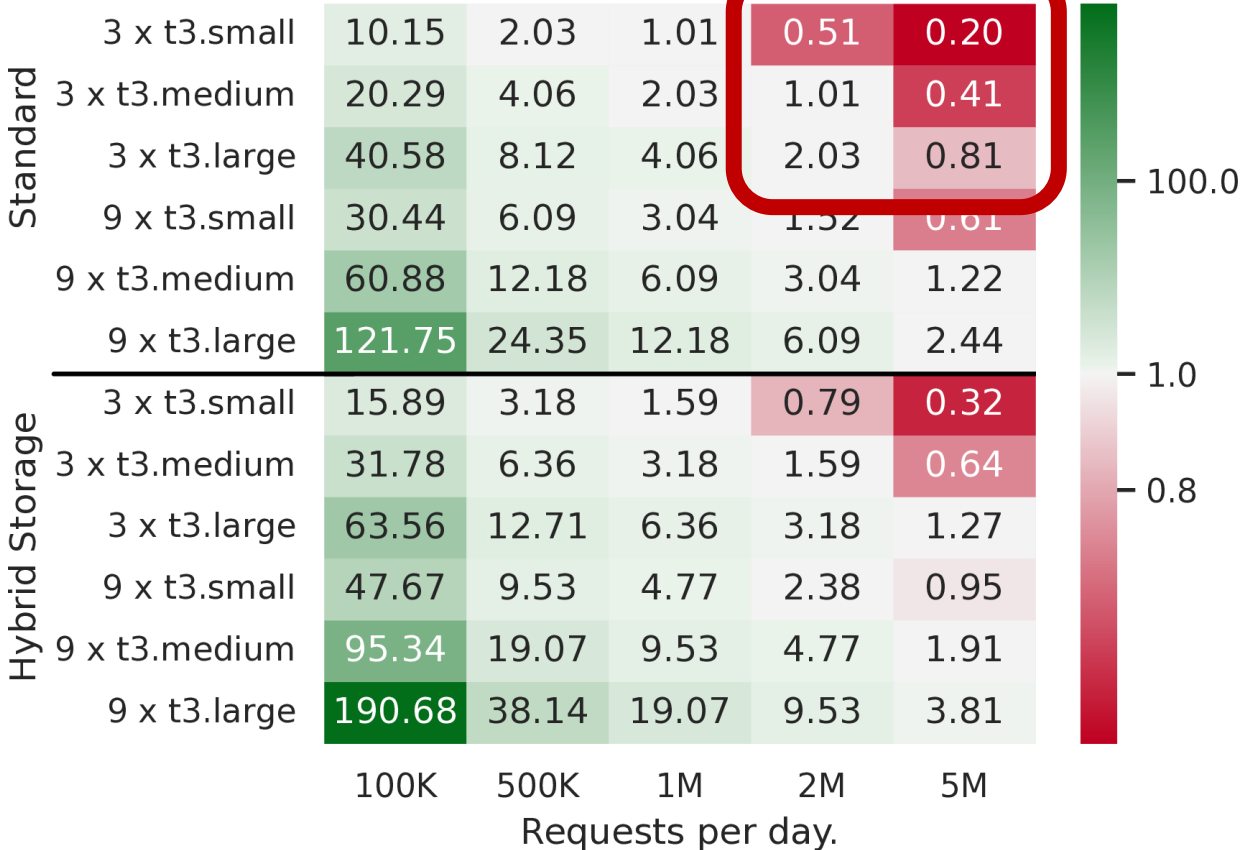
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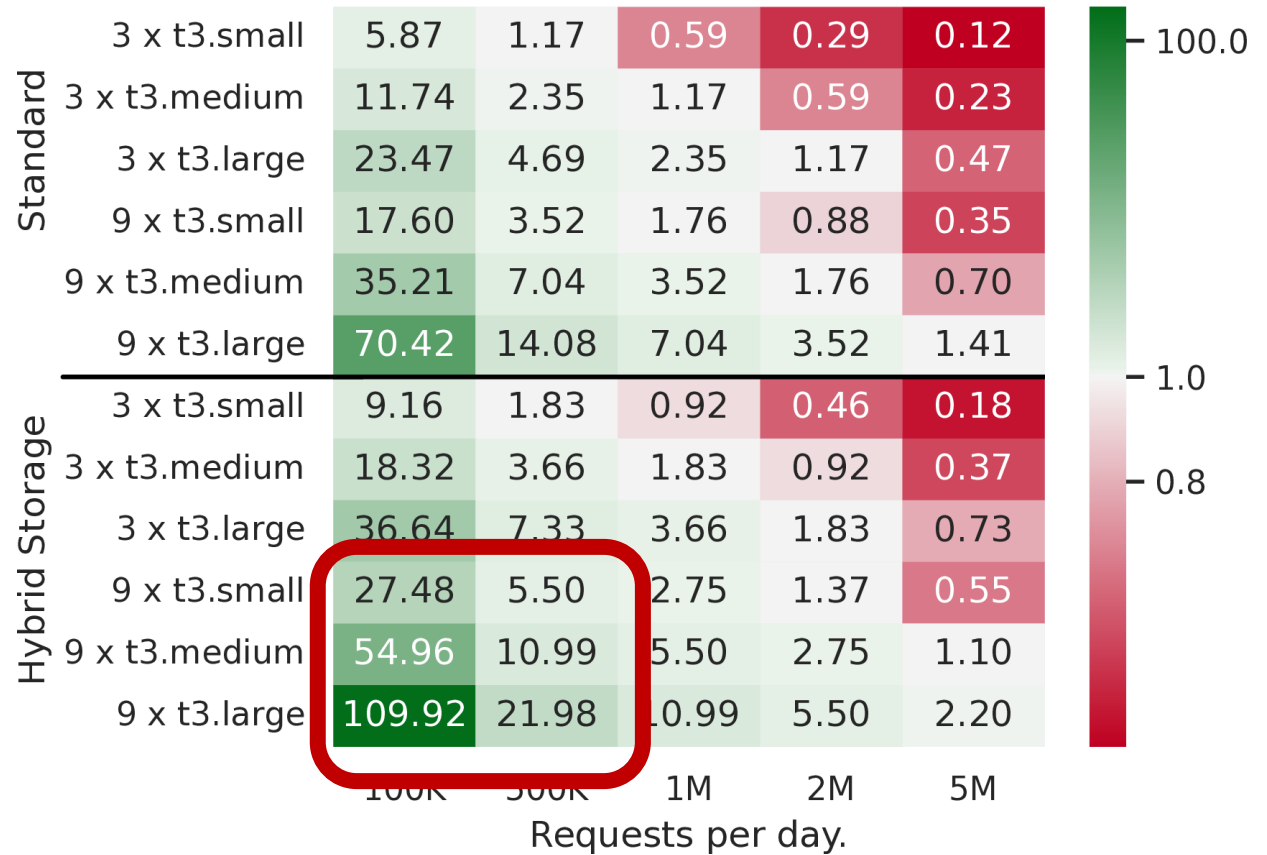
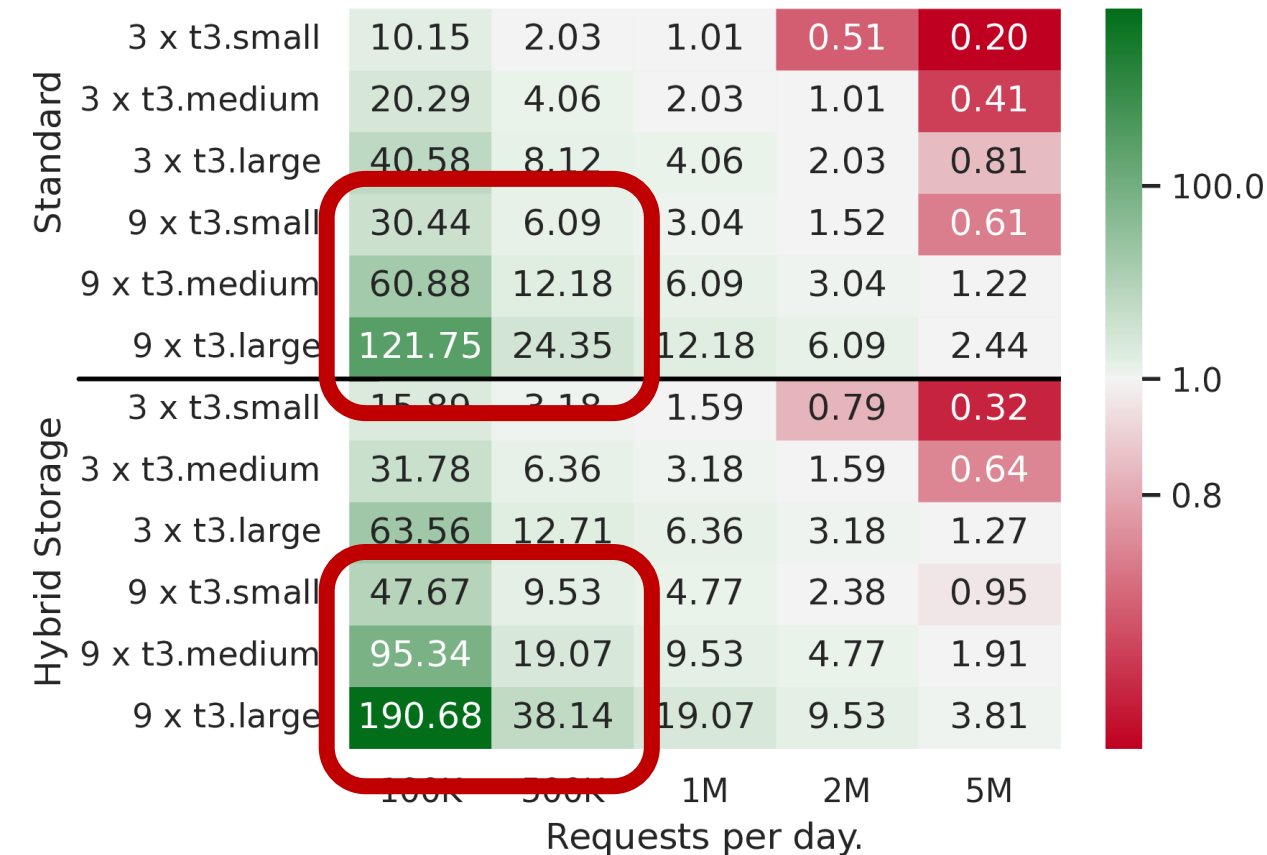
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spcl/FaaSKeeper



spcl/FaaSKeeper-Python

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2024 Program | Scalable Parallel Computing Laboratory

Contributor
Syed Mujtaba

Using serverless ZooKeeper in Apache projects




Mentors	Organization	Technologies
Marcin Copik	Scalable Parallel Computing Laboratory	python, java, aws, ZooKeeper, AWS Lambda

Topics
cloud, distributed systems, high performance computing, Serverless

Conclusions



More of SPCL's research:

-  youtube.com/@spcl **180+ Talks**
-  twitter.com/spcl_eth **1.4K+ Followers**
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Paper



Projects



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Paper



Projects



Conclusions



What is ZooKeeper?

From ZooKeeper to FaaSKEEPER

Send Write Requests Send Change Transaction Distribute Changes Handle Reads, Watches, Heartbeat

Cloud-Native

100% Serverless

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What is ZooKeeper?

APACHE ZooKeeper™

From ZooKeeper to FaaSKeeper

Client → Followers → Leader → Followers → Client

Send Write Requests → Send Change Transaction → Distribute Changes → Handle Reads, Watches, Heartbeat

Cloud-Native

100% Serverless

From Design to the Cloud

System Concept	AWS	Google Cloud
Functions	Lambda	Cloud Function
Object Storage	S3	Storage
Key-Value Storage	DynamoDB	Datastore
Concurrency Primitives	Update Expressions	Transactions
Queue	SQS	Pub/Sub

Proof of Concept Implementation

1,350 LoC for FaaSKeeper
1,400 LoC for client library

FaaSKeeper written in Python

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	9 x t3.small	17.60	3.52	1.76	0.88	0.35
	9 x t3.medium	35.21	7.04	3.52	1.76	0.70
	9 x t3.large	70.42	14.08	7.04	3.52	1.41
Hybrid Storage	3 x t3.small	9.16	1.83	0.92	0.46	0.18
	3 x t3.medium	18.32	3.66	1.83	0.92	0.37
	3 x t3.large	36.64	7.33	3.66	1.83	0.73
	9 x t3.small	27.48	5.50	2.75	1.37	0.55
	9 x t3.medium	54.96	10.99	5.50	2.75	1.10
	9 x t3.large	109.92	21.98	10.99	5.50	2.20

ZooKeeper – constant cost for VMs.
FaaSKEEPER – pay per each request.

Paper

Projects

