#### Карра A Programming Framework for Serverless Computing

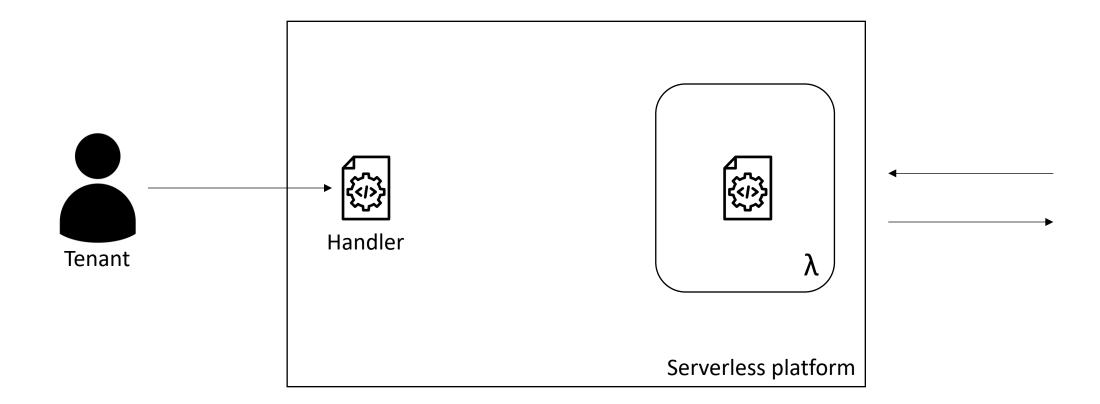
https://kappa.cs.berkeley.edu

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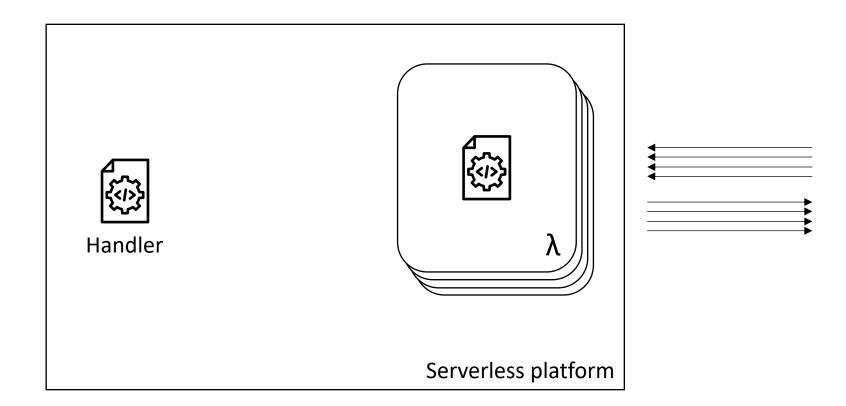




#### Serverless computing



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**Azure Functions** 

Enjoys simpler autoscaling.Free from infra management.

AWS Lambda

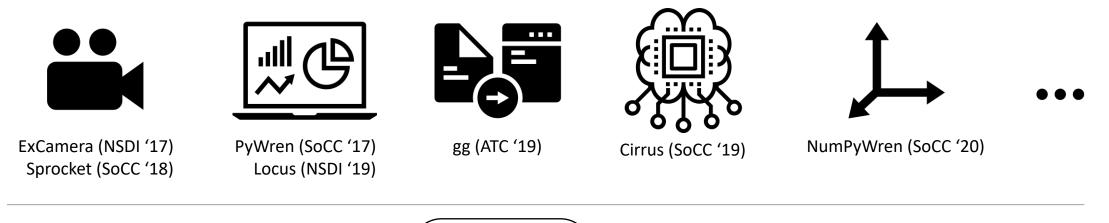
Stateless

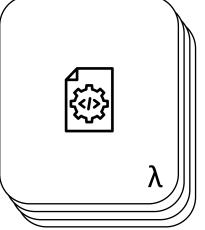
• Short-lived

**V** Flexible resource management.

Google Cloud Functions IBM Cloud Functions

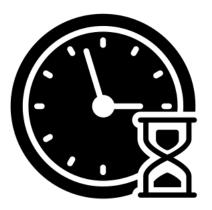
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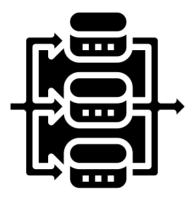




#### Our goal: Make serverless a scalable substrate for general-purpose computing

#### Challenges in general serverless computing

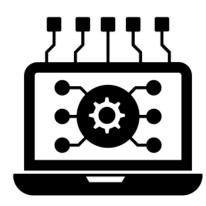




**Computation**: can be long-running. **Serverless**: lambda are time-limited. **Computation**: has diverse concurrency patterns. **Serverless**: lacks concurrency features.

#### Kappa: a Framework for Serverless Computing





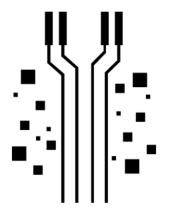


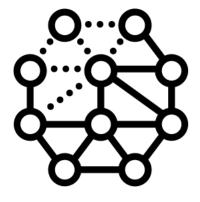
Checkpointing (based on continuations) Concurrency API (futures, message-passing) Fault tolerance (in face of nondeterminism and side effects)

#### Requires no modification to the serverless platform.

#### Kappa enables diverse serverless applications







**Big-data queries** 

Streaming analytics

Web crawling

# Opens up possibility for many more applications on serverless!



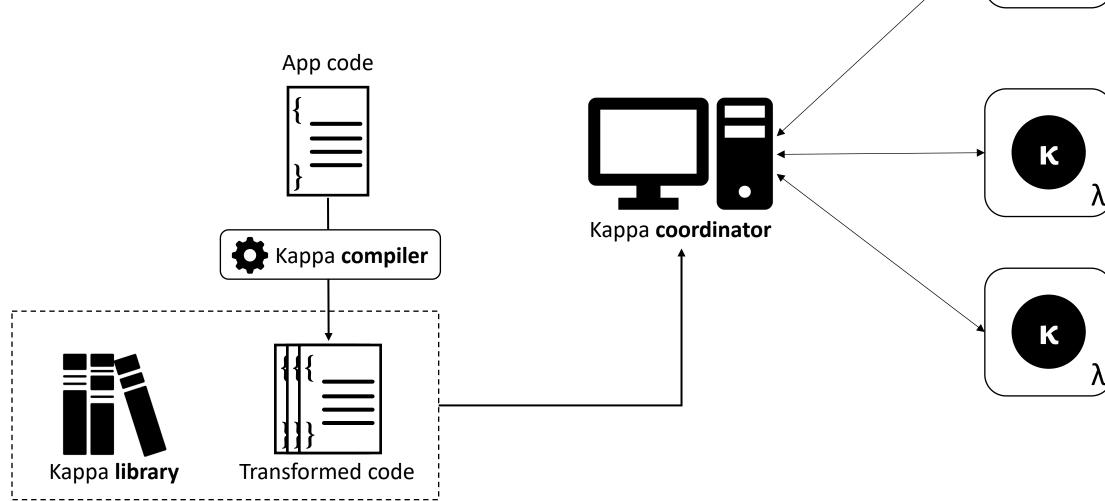
## Kappa Design



Coordinator

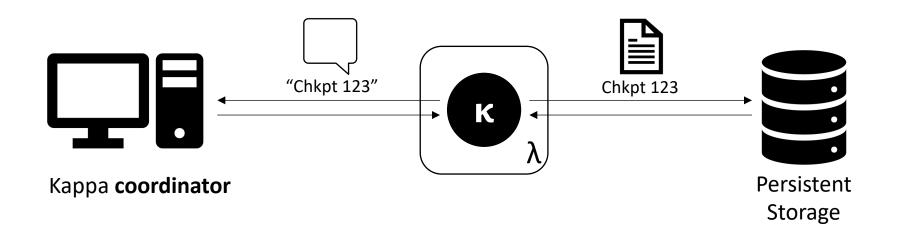
Library

#### Kappa workflow



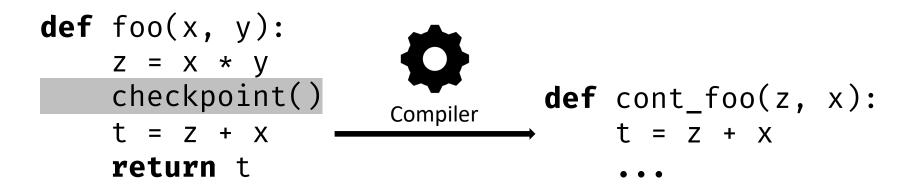
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### Checkpointing



#### Checkpoint construction with continuations

- Language-level mechanism executed entirely in user mode.
- Programmer inserts checkpoint() calls:



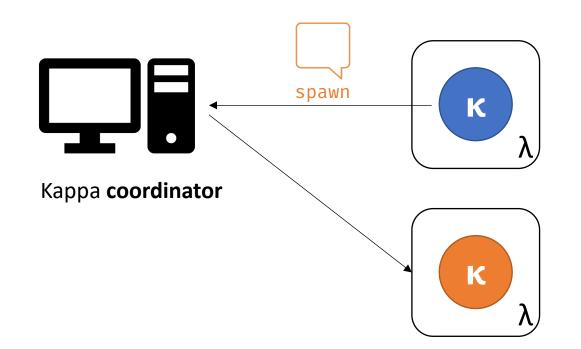
- Checkpoint for this frame looks like:  $\langle \text{cont}_{\text{foo}}, z = 3, x = 4 \rangle$ .
- Supports function calls, conditionals, loops, etc.

#### Concurrency API

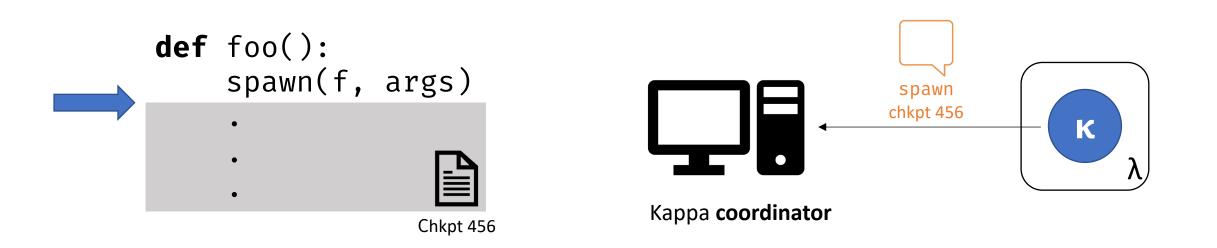
- **spawn** Kappa task to compute in parallel; **wait** for task result.
- FIFO **queue** for communication and synchronization.



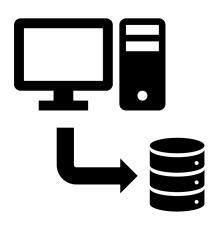
#### Fault tolerance for effectful operations



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#### Other features







Coordinator state persistence

Checkpoint replication

**External services** 

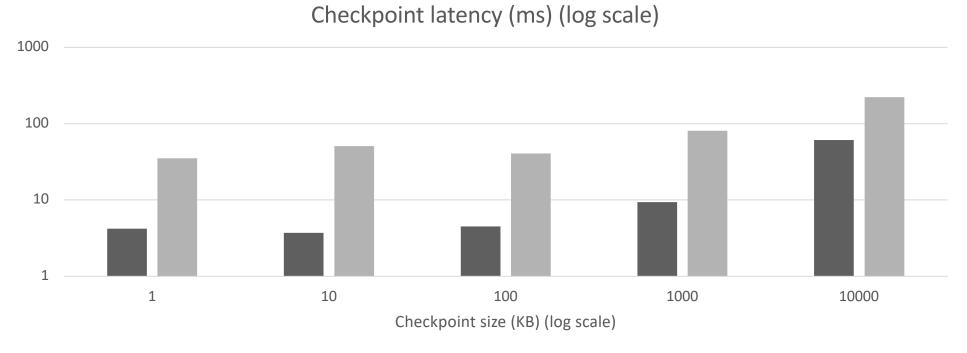
## Evaluation

- How much overhead is added by Kappa's checkpointing?
- Is the Kappa API general enough to support diverse applications on serverless?

#### Experiment setup

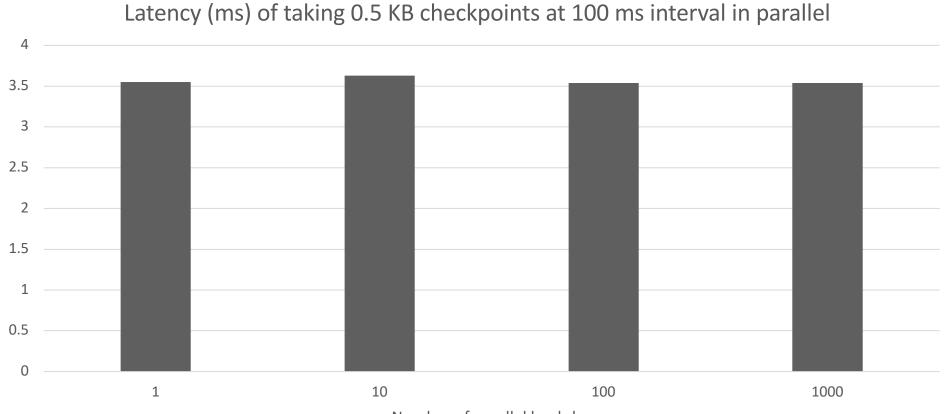
- AWS Lambda with maximum lambda memory (3008 MB).
- Coordinator runs on Amazon EC2 instance (m5.4xlarge).
  - Coordinator state replicated to two Redis instances.
- Checkpoints are stored in Redis (2-way replicated).
  - Unless otherwise specified.

### Checkpointing is fast



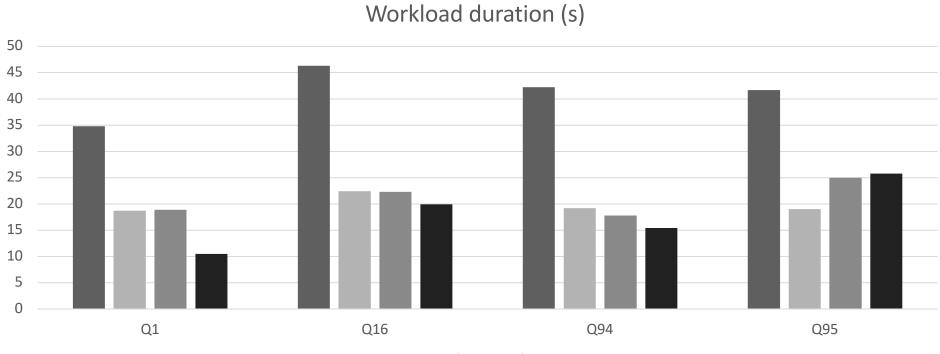
Red is S3

#### Checkpointing is scalable



Number of parallel lambdas

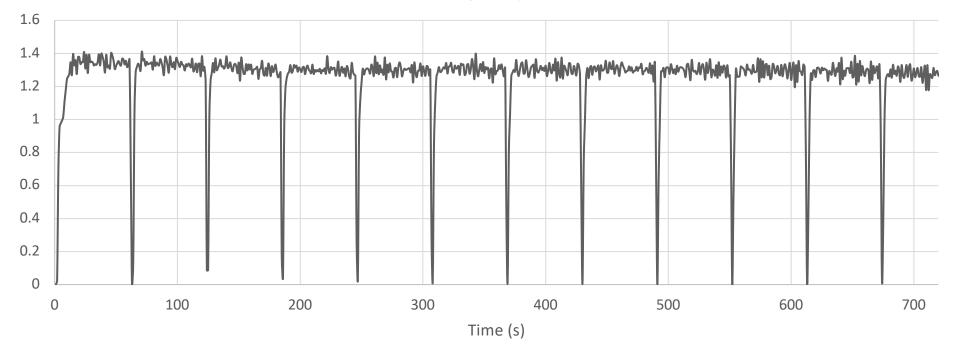
#### **TPC-DS** queries



■ PyWren ■ Spark ■ SparkSQL ■ Kappa

#### Concurrent web crawler

Download goodput (GB/s)



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## Thank you!

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