



CHALMERS
UNIVERSITY OF TECHNOLOGY



UNIVERSITY OF GOTHENBURG

Performance Evaluation of Serverless Applications and Infrastructures

PhD Defense

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Supported by

WASP

WALLENBERG AI,
AUTONOMOUS SYSTEMS
AND SOFTWARE PROGRAM

Goal of the PhD

To enable reproducible performance evaluation of **serverless** applications and their underlying **cloud infrastructure**.

Progression of Deployment Options

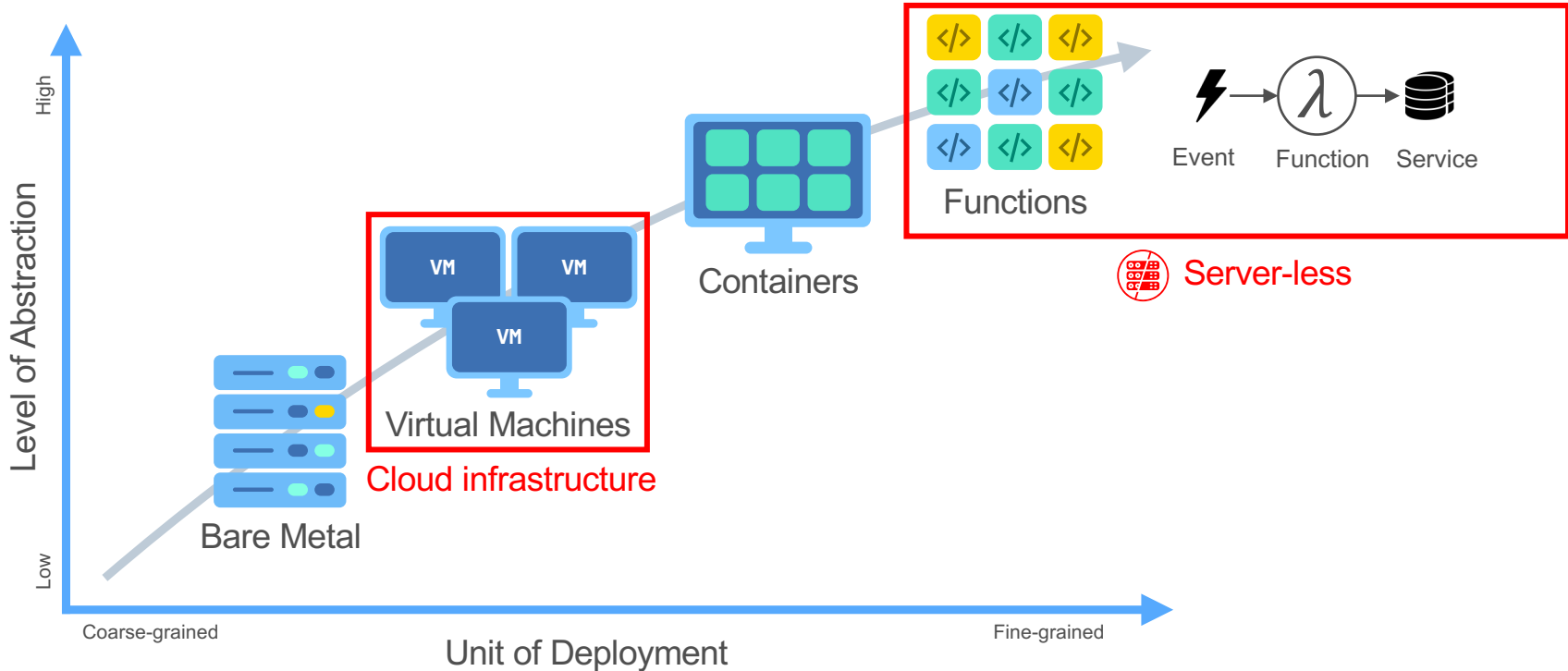
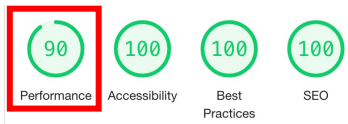
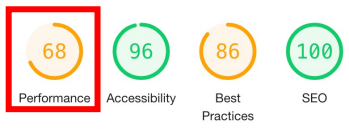


Figure adapted from S. Fink. Serverless – Where Have We Come? Where Are We Going? Keynote at WoSC@CLOUD'18.

Serverless in the Wild



Performance in Serverless

High latency is a problem

[Leitner et al., JSS'19.]

Top 2 non-functional challenge

[Wen et al., ESEC/FSE'21.]

Most popular topic within serverless

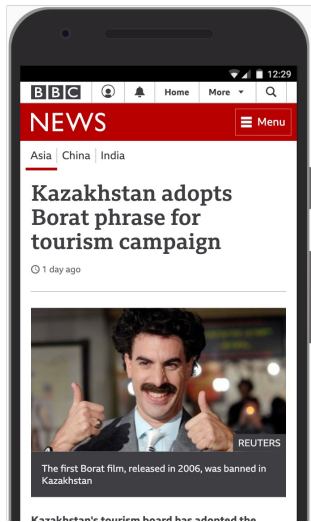
[Yussupov et al., UCC'19.]

→ No consolidated view



Old version

New version



Moving BBC Online to the cloud: <https://medium.com/bbc-design-engineering/moving-bbc-online-to-the-cloud-afdfb7c072ff>

Research Questions

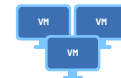
RQ1 What is the current state of serverless applications and their performance?



RQ2 What are the performance challenges of serverless applications?



RQ3 How can limitations of benchmarking cloud infrastructure be addressed?



Contributions Overview

RQ1: Current state of serverless



Paper α (JSS'19)
Performance evaluation
literature review



Paper β (TSE'21)
Application characteristics
sample study

RQ2: Serverless application performance



Paper γ (journal submission)
ServiTrace application
benchmarking suite



Paper δ (conference submission)
CrossFit: Cross-provider
application benchmarking



Paper ϵ (IC2E'22)
TriggerBench: Function
trigger benchmark

RQ3: Limitations of cloud benchmarking



Paper ζ (QUDOS'18)
Integrated micro and
application benchmark suite



Paper η (CLOUD'18)
Application performance
estimation



Paper θ (EMSE'19)
Reliable cloud
benchmarking

RQ1: Current State of Serverless

Literature review [α]



112 serverless performance studies

51 academic

61 grey literature



2016 – 2019

2x studies since



Studies and their design
→ Secondary research

Sample study [β]



89 serverless applications



22 characteristics



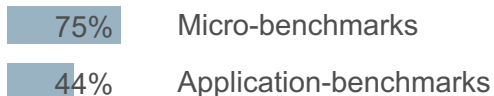
Triangulate with 10 related sources



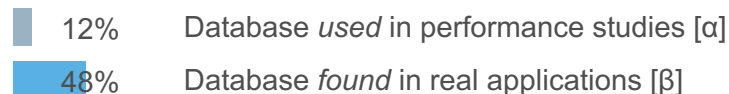
Documentation and code
→ Primary research

RQ1: Current State of Serverless

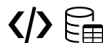
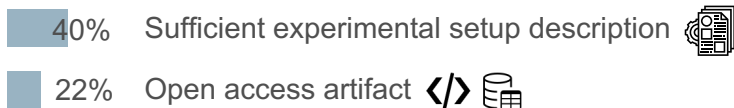
Benchmark Type [α]



External Service



Reproducibility [α]



Workload Burstiness [β]



α Function-as-a-Service Performance Evaluation: A Multivocal Literature Review. JSS'20.

β The State of Serverless Applications: Collection, Characterization, and Community Consensus. TSE'21.

Contributions Overview

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RQ2: Serverless Application Performance

RQ3: Limitations of Cloud Benchmarking

Engineering research

Field experiment

① Benchmark design



Benchmarks < 13 apps
50 micro

Languages



② Benchmark execution



Cloud providers



Many dimensions (e.g.,
workloads, repetitions,
instrumentation)

③ Data pre-processing



5 public datasets

Data volume: >200 GB

Data types: execution times,
timestamps, traces




④ Data analysis

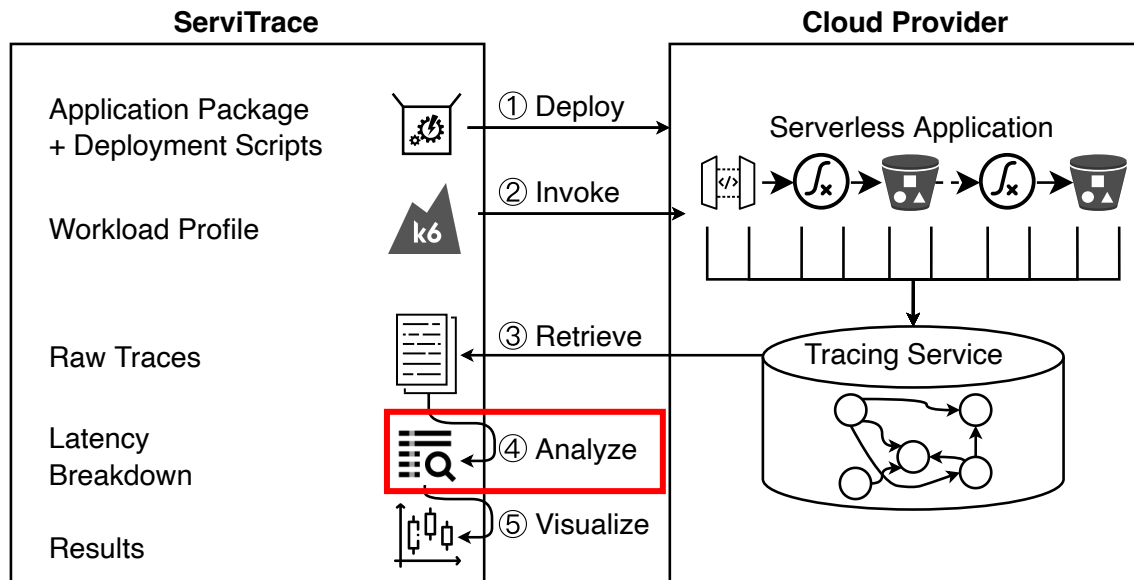


Quantitative
methods
(e.g., violin or
ECDF plots)

RQ2: Serverless Application Performance

ServiTrace [γ]

-  Automates full benchmarking lifecycle
-  10 diverse applications (based on RQ1)
-  Well-tested (unit, integration, 7.5 million traces)

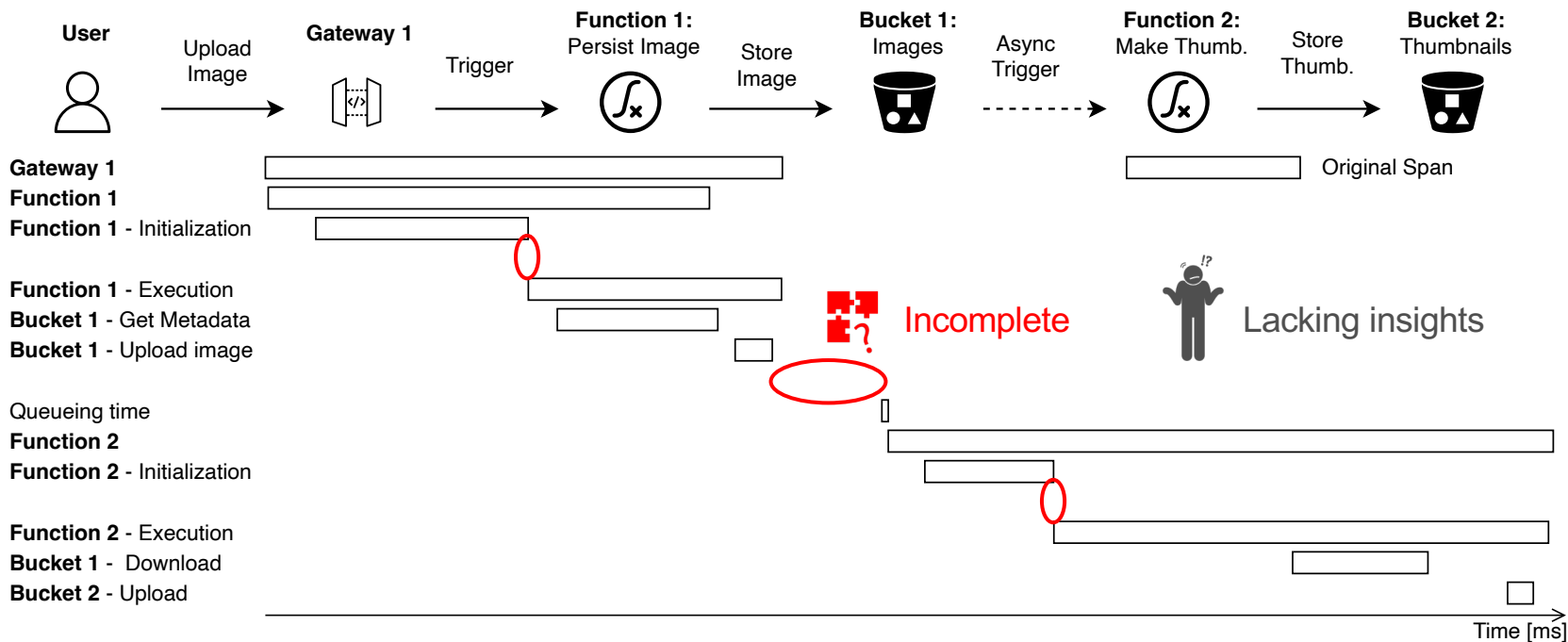


γ Let's Trace It: Fine-Grained Serverless Benchmarking for Synchronous and Asynchronous Applications. Under submission to a journal.

RQ2: Serverless Application Performance

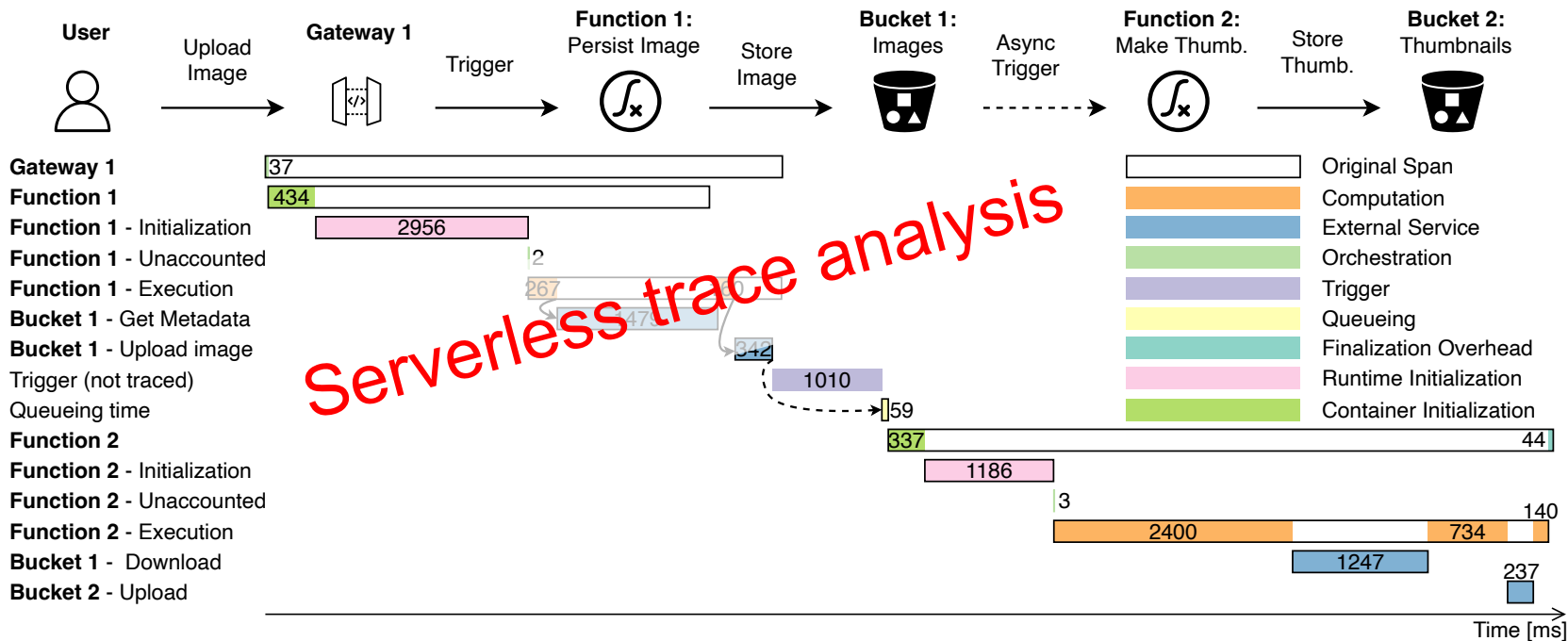


RQ2: Serverless Application Performance



γ Let's Trace It: Fine-Grained Serverless Benchmarking for Synchronous and Asynchronous Applications. Under submission to a journal.

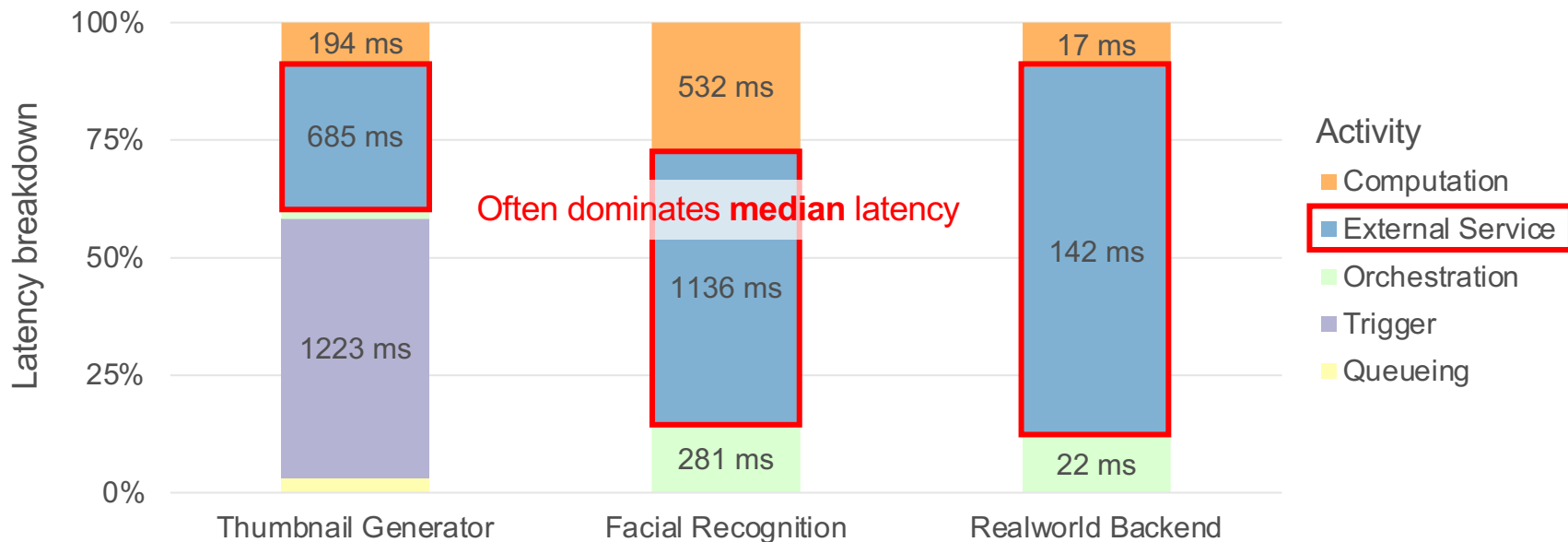
RQ2: Serverless Application Performance



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RQ2: Serverless Application Performance

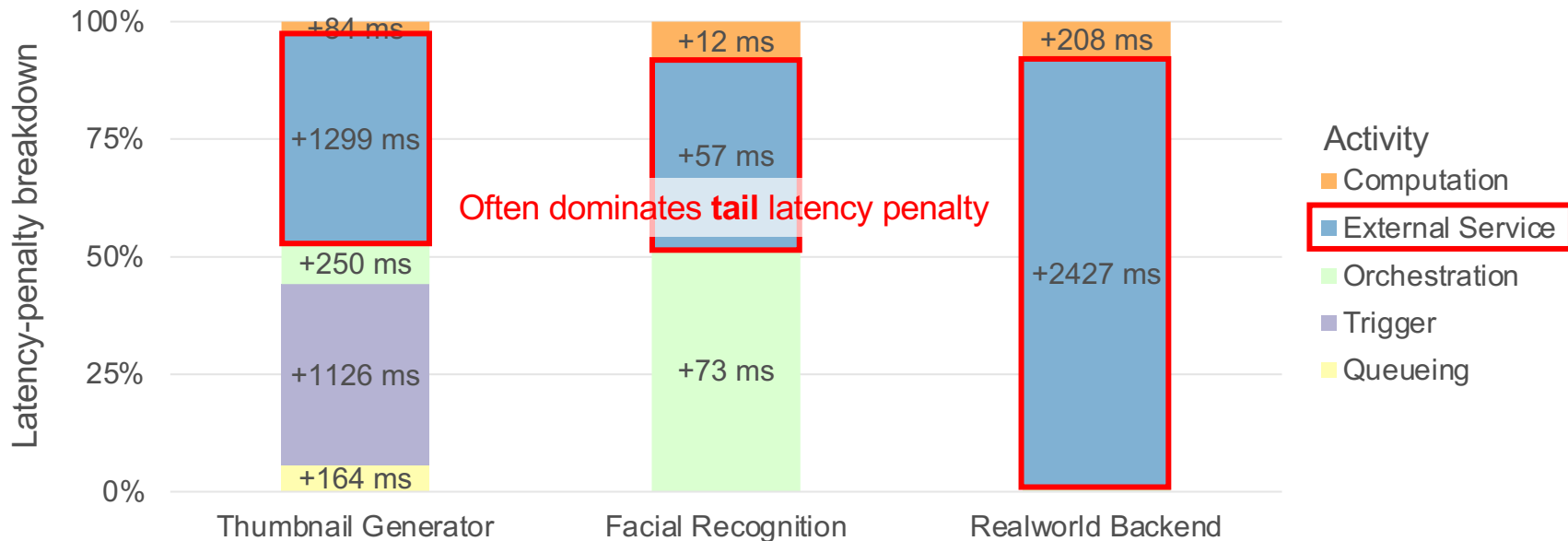
Median Latency (50th percentile)



Let's Trace It: Fine-Grained Serverless Benchmarking for Synchronous and Asynchronous Applications. Under submission to a journal.

RQ2: Serverless Application Performance

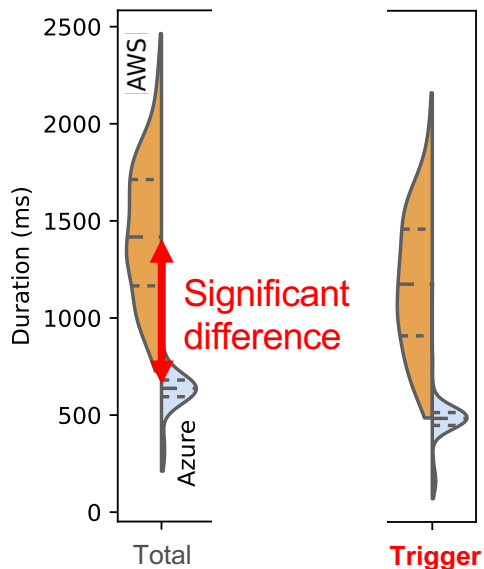
Tail Latency (99th percentile)



γ Let's Trace It: Fine-Grained Serverless Benchmarking for Synchronous and Asynchronous Applications. Under submission to a journal.

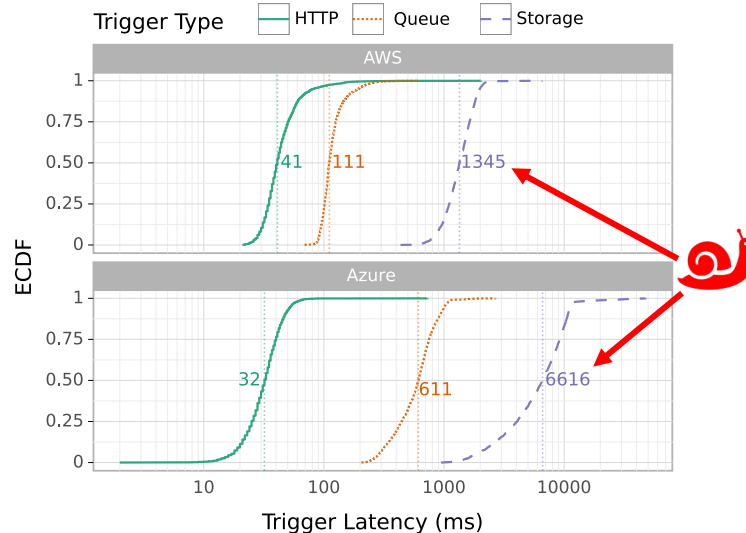
RQ2: Serverless Application Performance

CrossFit [δ]: Cross-provider application insights



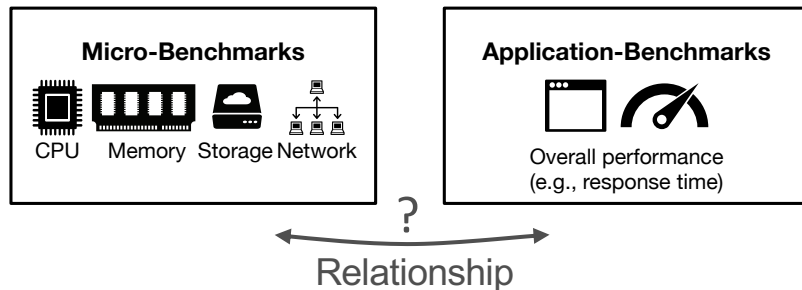
δ CrossFit: Fine-grained Benchmarking of Serverless Application Performance across Cloud Providers. Under submission to a conference.

TriggerBench [ϵ]: Latency of trigger types

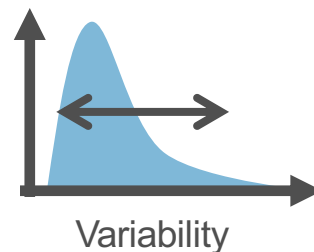


ϵ TriggerBench: A Performance Benchmark for Serverless Function Triggers. IC2E'22. To appear as short paper.

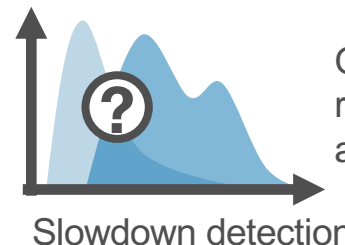
RQ3: Limitations of Cloud Benchmarking



- **Selected** micro-benchmarks are better application performance predictors than static baselines.



Depends on benchmark and environment



Often possible with repetitions within and across virtual machines

Results Summary

RQ1: Current state of serverless

Synthetic micro-benchmarks have been studied extensively but we need more realistic application-benchmarks that integrate with external services.

RQ2: Serverless application performance

External service calls and trigger-based function coordination are often slow and suffer from long tail latency.

RQ3: Limitations of cloud benchmarking

Only selected micro-benchmarks are suitable for application performance estimation and repetitions at different levels should be used for reliable performance testing.

Take-Away



Enables reproducible performance
evaluation of serverless applications and
their underlying cloud infrastructure.



Conclusions



Design better cloud performance studies



Improve the performance of serverless applications



All artefacts are available



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