# Serverless Computation with OpenLambda

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compute is evolving



(Containers)

compute is evolving



(Lambdas)

compute is evolving



#### (Lambdas)

prior to the Lambda model, cloud compute was neither elastic nor pay-as-you-go

## Outline

Evolution of compute

#### **Non-conventional virtualization**

Lambda model

Why OpenLambda?

Conclusion

#### How to virtualize compute?

#### Classic web stack



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## 1st generation: virtual machines



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#### advantages:

- very flexible
- use any OS

#### problems:

- interposition
- is RAM used? (ballooning)
- redundancy (e.g., FS journal)

## 2nd generation: containers



#### advantages:

- centralized view
- init H/W once

## Are containers good enough?

## Container case studies

#### Literature: Google Borg

- Internal container platform <sup>[1]</sup>
- 25 second median startup
- 80% of time spent on package installation
- matters for flash crowds, load balance, interactive development, etc

[1] Large-scale cluster management at Google with Borg. http://static.googleusercontent.com/media/research.google.com/en//pubs/archive/43438.pdf

## **Container case studies**

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#### Experimental: Amazon Elastic Beanstalk

- Autoscaling cloud service
- Build applications as containerized servers, service RPCs
- Rules dictate when to start/stop (various factors)

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## Interesting "autoscaling" rule

#### New scheduled action

Name:	(must be unique) Must be from 1 to 255 characters in length.
Instances:	Min Max
	Minimum and Maximum number of instances to run.
Desired capacity:	(Optional) Desired number of instances to run.
Occurrence:	✓ One-time Recurrent
Start time:	2016-04-11T21:00:00Z 🗂 UTC
	The time the action is scheduled to begin.



#### Experiment

Simulate a small short burst

- Maintain **100 concurrent requests**
- Use **200 ms** of compute per request
- Run for **1 minute**

#### Container Case Study: Elastic Beanstalk



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#### Container Case Study: Elastic Beanstalk



**Conclusion**: Elastic Beanstalk does not scale quickly enough to handle load bursts.

#### Container Case Study: Elastic Beanstalk Elastic BS



**Conclusion**: Elastic Beanstalk does not scale quickly enough to handle load bursts.

Why should it take minutes (or even seconds) to execute scripts that are <1000s of LOC?

## 2nd generation: containers



#### advantages:

- centralized view
- init H/W once

#### problems:

- large deployment bundle
- server spinup

#### 2nd generation: containers







serverless computing



decompose application



#### advantages:

- very fast startup
- agile deployment
- share memory

problems:

not flexible

Repeat ElasticBS experiment

- Maintain 100 concurrent requests
- Spin 200 ms per request
- Run for **1 minute**





**Conclusion**: Lambdas are highly elastic



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## Lambda model

Run user handlers in response to events

- web requests (RPC handlers)
- database updates (triggers)
- scheduled events (cron jobs)

Pay per function invocation

- actually pay-as-you-go
- no charge for idle time between calls
- e.g., charge actual\_time \* memory\_cap

# Share everything

Share server pool between customers

- Any worker can execute any handler
- No spinup time
- Less switching

Encourage specific runtime (C#, Node.JS, Python)

- Minimize network copying
- Code will be in resident in memory

















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Many research areas

- Applications, tools, distributed systems, execution engines
- Evaluate ideas by **building**, not just simulating

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First implementations are proprietary



Google Cloud Functions

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AWS Lambda



Google Cloud Functions

© OpenLambda: explore further-reaching techniques

- Goal: enable academic research on Lambdas
- Storage awareness, kernel support, RPC inspection
- . . .

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Other recent open-source implementations





#### Workloads

- Workload studies
- Benchmarks
- Versioning+dependencies
- Code characteristics
- Package management

#### Tools

- Debugging
- Monetary cost optimization
- Porting legacy applications

#### Distributed systems

- Databases
- Load balancing
- Scatter gather patterns
- Sessions and streams

#### Execution engines

- Sandboxing
- Containers
- Just-in-time interpreters







# Understanding Lambda workloads

### **Collaborate** with industry, measurement studies

• e.g., Azure Functions

#### Build LambdaBench

- Everybody joining builds an application
- Ticketing, calendar, autocomplete, OCR, flash card, stock alert, blog, and scientific compute applications

### Trace RPC calls (e.g., AJAX) of existing apps







## **Developer tools**

Portability

• E.g., can Django apps run on Lambdas?

Debugging

• Understand Lambda flows, may be a complex graph

### Optimizing expense

- Hard with containers: how to share 1-hour server time across requests?
- With Lambdas: know cost of every RPC and query
- Show where money is going

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Use deep inspection of RPCs for routing

- Working with gRPC group
- GSOC project (Stephen Sturdevant)

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### Locality factors

- code locality
- data locality
- session locality

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## **Minimizing latency**



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How can we reduce base latency?

# **Execution engine**

Sandboxing

- Process VMs (e.g., JVM): how to mostly initialize?
- Containers: how to speed up **restart** and optimize **pausing**?

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Sandboxing

- Process VMs (e.g., JVM): how to mostly initialize?
- Containers: how to speed up **restart** and optimize **pausing**?
- Language runtimes
  - Challenge: code warms up over time
  - How to share dynamic optimizations?



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Lambdas finally deliver on promises of the cloud

- finally pay-as-you-go
- finally elastic
- will fundamentally change how people build scalable applications

New challenges in every area of systems

• scheduling, isolation, languages, debugging, tools, storage, ...

### Getting involved

- contribute at <u>https://github.com/open-lambda</u>
- site: <u>https://open-lambda.org/</u>



