Cloud and Serverless Computing

DS 5110: Big Data Systems (Spring 2023)

Lecture 7a

Yue Cheng

Some material taken/derived from:

- Berkeley CS 262a (Spring '18) by Ali Ghodsi and Ion Stoica;
- Tyler Harter's HotCloud '18 OpenLambda talk;
- Harvard CS 260r by Eddie Kohler.

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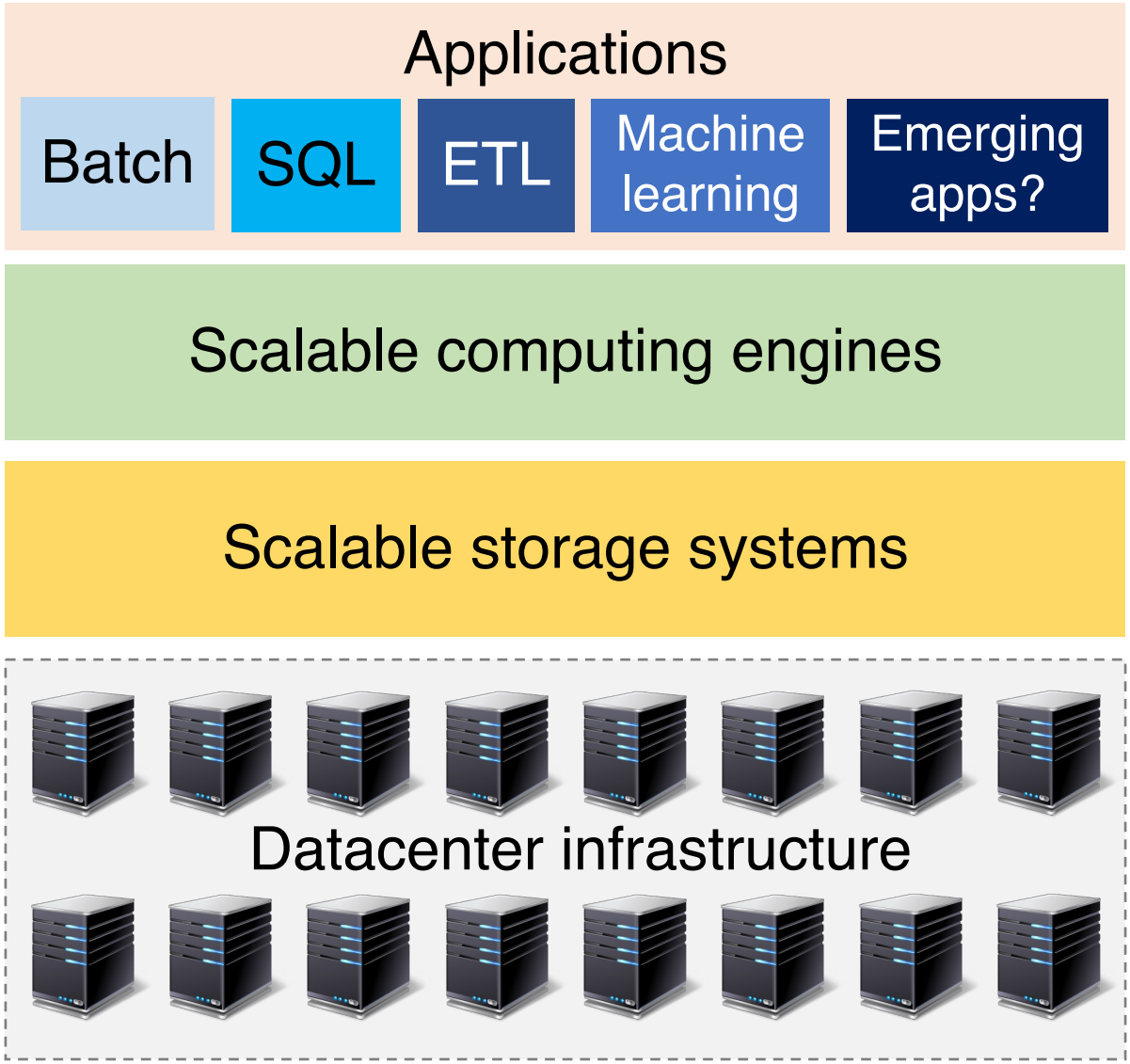
Applications
Batch
SQL
ETL
Machine learning
Emerging apps?
Scalable computing engines
Scalable storage systems
Datacenter infrastructure

Utility computing

"… computing may someday be organized as a public utility just as the telephone system is a public utility… Each subscriber needs to pay only for the capacity he actually uses, but he has access to all programming languages characteristic of a very large system. … Certain subscribers might offer service to other subscribers. … The computer utility could become the basis of a new and important industry."

- John McCarthy, speaking at the MIT Centennial in 1961

Utility computing

- It's the 1960s, good computers are super expensive, almost no one has one
- But the expensive hardware stands idle most of the time
- Want to make the power of good computers available to everyone
- Technical issues around pricing, security, and management

Decline of utility computing

- Good computers get super cheap
- Even small organizations can run their own computing utilities
- Security and management issues are hard to overcome

Rise of cloud computing

- Computing as a utility
  - Outsourced to a third party or internal organization

- Providers do more, tenants do less

When to use the cloud?

- Data
  - Large amounts of data. Can’t store locally
  - Shared data across users
  - Long term storage
- Compute
  - Need lots of CPUs for data processing
  - Varying computing demands (resources)
  - No admin

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Why is there no "cloud button"?

“I hate cloud computing!”

--Yue Cheng, 2023

EC2Instances.info Easy Amazon EC2 Instance Comparison

EC2 | RDS

Region: US East (N. Virginia) - | Cost: Hourly - | Reserved: 1-year - No Upfront - | Columns - | Compare Selected | Clear Filters | CSV

Filter: Min Memory (GiB): 0 Min vCPUs: 0 Min Storage (GiB): 0

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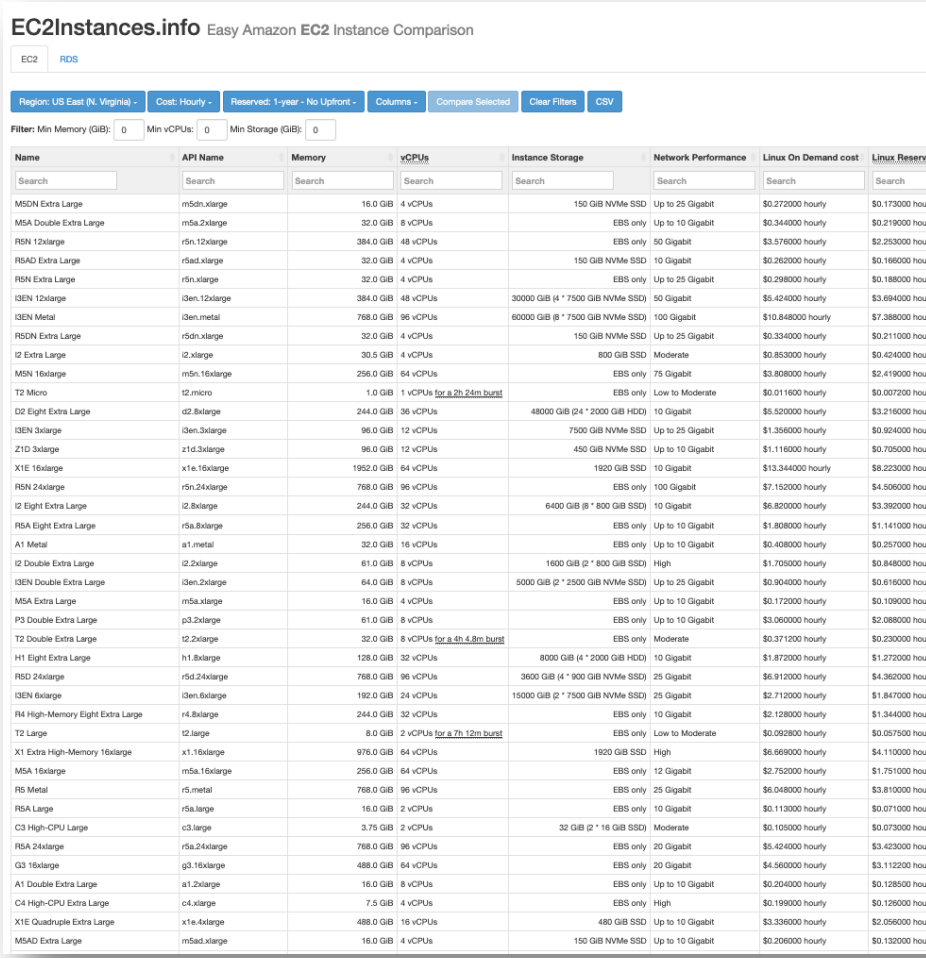
Search	Search	Search	Search	Search	Search	Search	Search	Search	Search
M5DN Extra Large	m5dn.xlarge	16.0 GiB	4 vCPUs	150 GiB NVMe SSD	Up to 25 Gigabit	$0.272000 hourly	$0.173000 hourly	$0.456000 hourly	$0.357000 hourly
M5A Double Extra Large	m5a.2xlarge	32.0 GiB	8 vCPUs	EBS only	Up to 10 Gigabit	$0.344000 hourly	$0.219000 hourly	$0.712000 hourly	$0.587000 hourly
R5N 12xlarge	r5n.12xlarge	384.0 GiB	48 vCPUs	EBS only	50 Gigabit	$3.576000 hourly	$2.253000 hourly	$5.784000 hourly	$4.461000 hourly
R5AD Extra Large	r5ad.xlarge	32.0 GiB	4 vCPUs	150 GiB NVMe SSD	10 Gigabit	$0.262000 hourly	$0.166000 hourly	$0.446000 hourly	$0.350000 hourly
R5N Extra Large	r5n.xlarge	32.0 GiB	4 vCPUs	EBS only	Up to 25 Gigabit	$0.298000 hourly	$0.188000 hourly	$0.482000 hourly	$0.372000 hourly
I3EN 12xlarge	i3en.12xlarge	384.0 GiB	48 vCPUs	30000 GiB (4 * 7500 GiB NVMe SSD)	50 Gigabit	$5.424000 hourly	$3.694000 hourly	$7.632000 hourly	$5.902000 hourly
I3EN Metal	i3en.metal	768.0 GiB	96 vCPUs	60000 GiB (8 * 7500 GiB NVMe SSD)	100 Gigabit	$10.848000 hourly	$7.388000 hourly	$15.264000 hourly	$11.804000 hourly
R5DN Extra Large	r5dn.xlarge	32.0 GiB	4 vCPUs	150 GiB NVMe SSD	Up to 25 Gigabit	$0.334000 hourly	$0.211000 hourly	$0.518000 hourly	$0.395000 hourly
I2 Extra Large	i2.xlarge	30.5 GiB	4 vCPUs	800 GiB SSD	Moderate	$0.853000 hourly	$0.424000 hourly	$0.973000 hourly	$0.565000 hourly
M5N 16xlarge	m5n.16xlarge	256.0 GiB	64 vCPUs	EBS only	75 Gigabit	$3.808000 hourly	$2.419000 hourly	$6.752000 hourly	$5.363000 hourly
T2 Micro	t2.micro	1.0 GiB	1 vCPUs for a 2h 24m burst	EBS only	Low to Moderate	$0.011600 hourly	$0.007200 hourly	$0.016200 hourly	$0.011800 hourly
D2 Eight Extra Large	d2.8xlarge	244.0 GiB	36 vCPUs	48000 GiB (24 * 2000 GiB HDD)	10 Gigabit	$5.520000 hourly	$3.216000 hourly	$6.198000 hourly	$3.300000 hourly
I3EN 3xlarge	i3en.3xlarge	96.0 GiB	12 vCPUs	7500 GiB NVMe SSD	Up to 25 Gigabit	$1.356000 hourly	$0.924000 hourly	$1.908000 hourly	$1.476000 hourly
Z1D 3xlarge	z1d.3xlarge	96.0 GiB	12 vCPUs	450 GiB NVMe SSD	Up to 10 Gigabit	$1.116000 hourly	$0.705000 hourly	$1.668000 hourly	$1.257000 hourly
X1E 16xlarge	x1e.16xlarge	1952.0 GiB	64 vCPUs	1920 GiB SSD	10 Gigabit	$13.344000 hourly	$8.223000 hourly	$16.288000 hourly	$11.167000 hourly
R5N 24xlarge	r5n.24xlarge	768.0 GiB	96 vCPUs	EBS only	100 Gigabit	$7.152000 hourly	$4.506000 hourly	$11.568000 hourly	$8.922000 hourly
I2 Eight Extra Large	i2.8xlarge	244.0 GiB	32 vCPUs	6400 GiB (8 * 800 GiB SSD)	10 Gigabit	$6.820000 hourly	$3.392000 hourly	$7.782000 hourly	$4.521000 hourly
R5A Eight Extra Large	r5a.8xlarge	256.0 GiB	32 vCPUs	EBS only	Up to 10 Gigabit	$1.808000 hourly	$1.141000 hourly	$3.280000 hourly	$2.613000 hourly
A1 Metal	a1.metal	32.0 GiB	16 vCPUs	EBS only	Up to 10 Gigabit	$0.408000 hourly	$0.257000 hourly	unavailable	unavailable
I2 Double Extra Large	i2.2xlarge	61.0 GiB	8 vCPUs	1600 GiB (2 * 800 GiB SSD)	High	$1.705000 hourly	$0.848000 hourly	$1.946000 hourly	$1.131000 hourly
I3EN Double Extra Large	i3en.2xlarge	64.0 GiB	8 vCPUs	5000 GiB (2 * 2500 GiB NVMe SSD)	Up to 25 Gigabit	$0.904000 hourly	$0.616000 hourly	$1.272000 hourly	$0.984000 hourly
M5A Extra Large	m5a.xlarge	16.0 GiB	4 vCPUs	EBS only	Up to 10 Gigabit	$0.172000 hourly	$0.109000 hourly	$0.356000 hourly	$0.293000 hourly
P3 Double Extra Large	p3.2xlarge	61.0 GiB	8 vCPUs	EBS only	Up to 10 Gigabit	$3.060000 hourly	$2.088000 hourly	$3.428000 hourly	$2.456000 hourly
T2 Double Extra Large	t2.2xlarge	32.0 GiB	8 vCPUs for a 4h 4.8m burst	EBS only	Moderate	$0.371200 hourly	$0.230000 hourly	$0.433200 hourly	$0.292000 hourly
H1 Eight Extra Large	h1.8xlarge	128.0 GiB	32 vCPUs	8000 GiB (4 * 2000 GiB HDD)	10 Gigabit	$1.872000 hourly	$1.272000 hourly	$3.344000 hourly	$2.744000 hourly
R5D 24xlarge	r5d.24xlarge	768.0 GiB	96 vCPUs	3600 GiB (4 * 900 GiB NVMe SSD)	25 Gigabit	$6.912000 hourly	$4.362000 hourly	$11.328000 hourly	$8.778000 hourly
I3EN 6xlarge	i3en.6xlarge	192.0 GiB	24 vCPUs	15000 GiB (2 * 7500 GiB NVMe SSD)	25 Gigabit	$2.712000 hourly	$1.847000 hourly	$3.816000 hourly	$2.951000 hourly
R4 High-Memory Eight Extra Large	r4.8xlarge	244.0 GiB	32 vCPUs	EBS only	10 Gigabit	$2.128000 hourly	$1.344000 hourly	$3.600000 hourly	$2.816000 hourly
T2 Large	t2.large	8.0 GiB	2 vCPUs for a 7h 12m burst	EBS only	Low to Moderate	$0.092800 hourly	$0.057500 hourly	$0.120800 hourly	$0.085500 hourly
X1 Extra High-Memory 16xlarge	x1.16xlarge	976.0 GiB	64 vCPUs	1920 GiB SSD	High	$6.669000 hourly	$4.110000 hourly	$9.613000 hourly	$7.054000 hourly
M5A 16xlarge	m5a.16xlarge	256.0 GiB	64 vCPUs	EBS only	12 Gigabit	$2.752000 hourly	$1.751000 hourly	$5.696000 hourly	$4.695000 hourly
R5 Metal	r5.metal	768.0 GiB	96 vCPUs	EBS only	25 Gigabit	$6.048000 hourly	$3.810000 hourly	$10.464000 hourly	$8.226000 hourly
R5A Large	r5a.large	16.0 GiB	2 vCPUs	EBS only	10 Gigabit	$0.113000 hourly	$0.071000 hourly	$0.205000 hourly	$0.163000 hourly
C3 High-CPU Large	c3.large	3.75 GiB	2 vCPUs	32 GiB (2 * 16 GiB SSD)	Moderate	$0.105000 hourly	$0.073000 hourly	$0.188000 hourly	$0.165000 hourly
R5A 24xlarge	r5a.24xlarge	768.0 GiB	96 vCPUs	EBS only	20 Gigabit	$5.424000 hourly	$3.423000 hourly	$9.840000 hourly	$7.839000 hourly
G3 16xlarge	g3.16xlarge	488.0 GiB	64 vCPUs	EBS only	20 Gigabit	$4.560000 hourly	$3.112200 hourly	$7.504000 hourly	$6.056200 hourly
A1 Double Extra Large	a1.2xlarge	16.0 GiB	8 vCPUs	EBS only	Up to 10 Gigabit	$0.204000 hourly	$0.128500 hourly	unavailable	unavailable
C4 High-CPU Extra Large	c4.xlarge	7.5 GiB	4 vCPUs	EBS only	High	$0.199000 hourly	$0.126000 hourly	$0.383000 hourly	$0.310000 hourly
X1E Quadruple Extra Large	x1e.4xlarge	488.0 GiB	16 vCPUs	480 GiB SSD	Up to 10 Gigabit	$3.336000 hourly	$2.056000 hourly	$4.072000 hourly	$2.792000 hourly
M5AD Extra Large	m5ad.xlarge	16.0 GiB	4 vCPUs	150 GiB NVMe SSD	Up to 10 Gigabit	$0.206000 hourly	$0.132000 hourly	$0.390000 hourly	$0.316000 hourly

#thecloudistoodamnhard

- What type of instances?
- How many to spin up?
- What base image?
- What price spot?
- And then wait to start…



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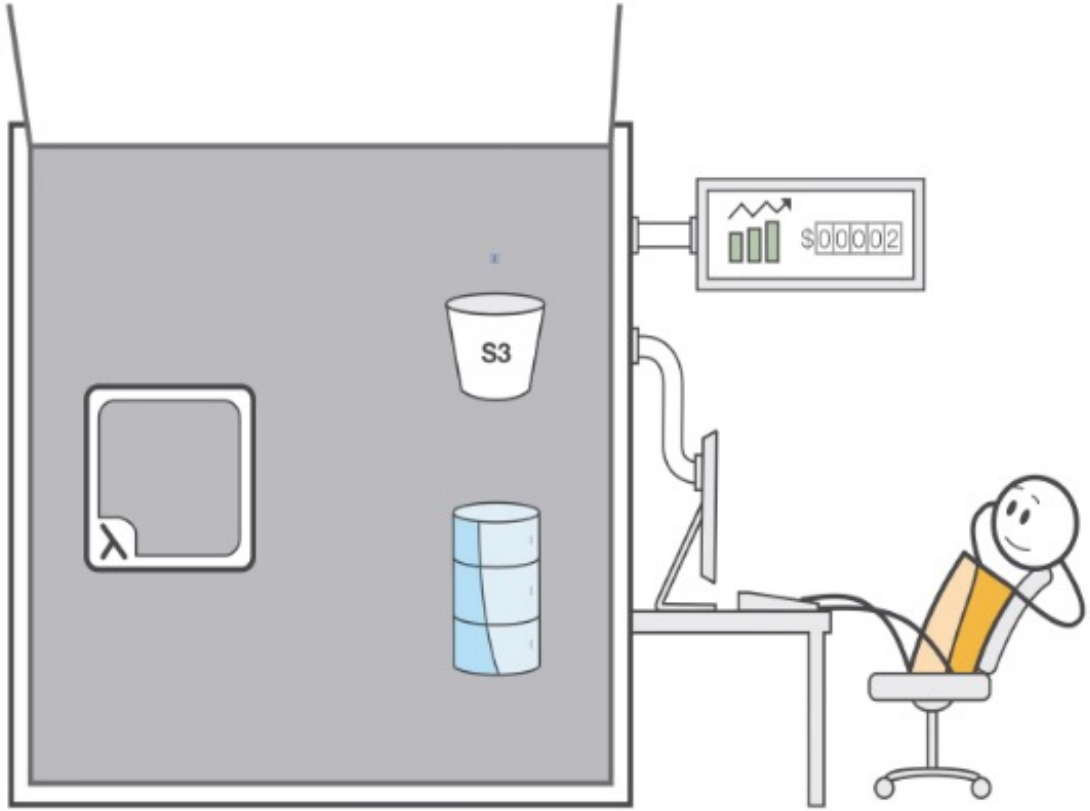
~~Decision paralysis??~~
Go for Serverless Computing!

Amazon
Lambda

Google Cloud Functions

Microsoft Azure Functions

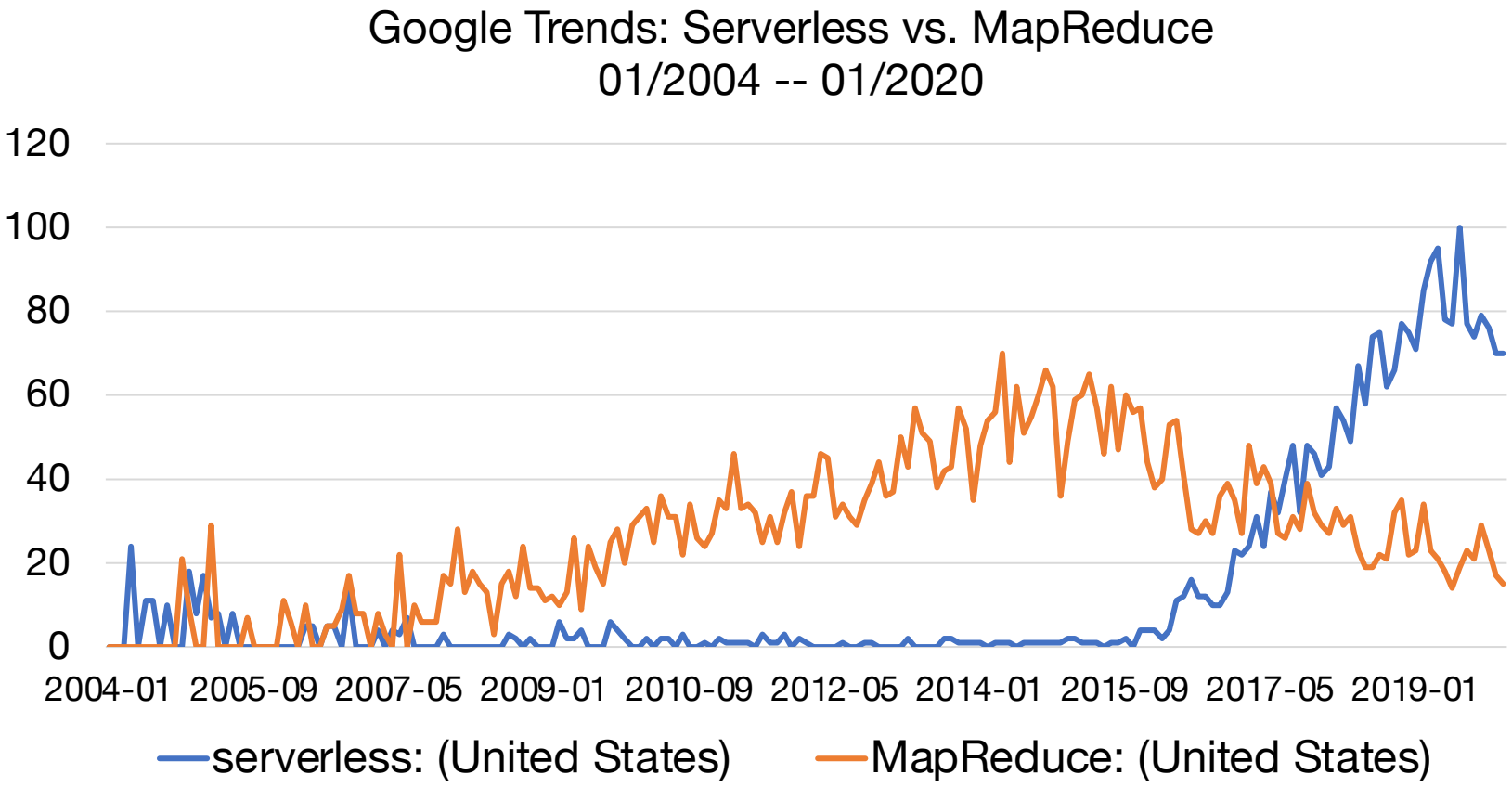


What is serverless computing?

Serverless computing is a programming abstraction that enables users to upload programs, run them at (virtually) any scale, and pay only for the resources used

Who cares?

Serverless computing is rapidly growing in popularity



Who cares?

- Serverless computing is rapidly growing in popularity
- Change the way we write applications and expose new challenges
- Predictions:

  "the future of AWS"

  – Marvin Theimer, VP/Distinguished engineer at AWS

  "will grow to dominate the future of cloud computing"

  – Report "A Berkeley View on Serverless Computing"

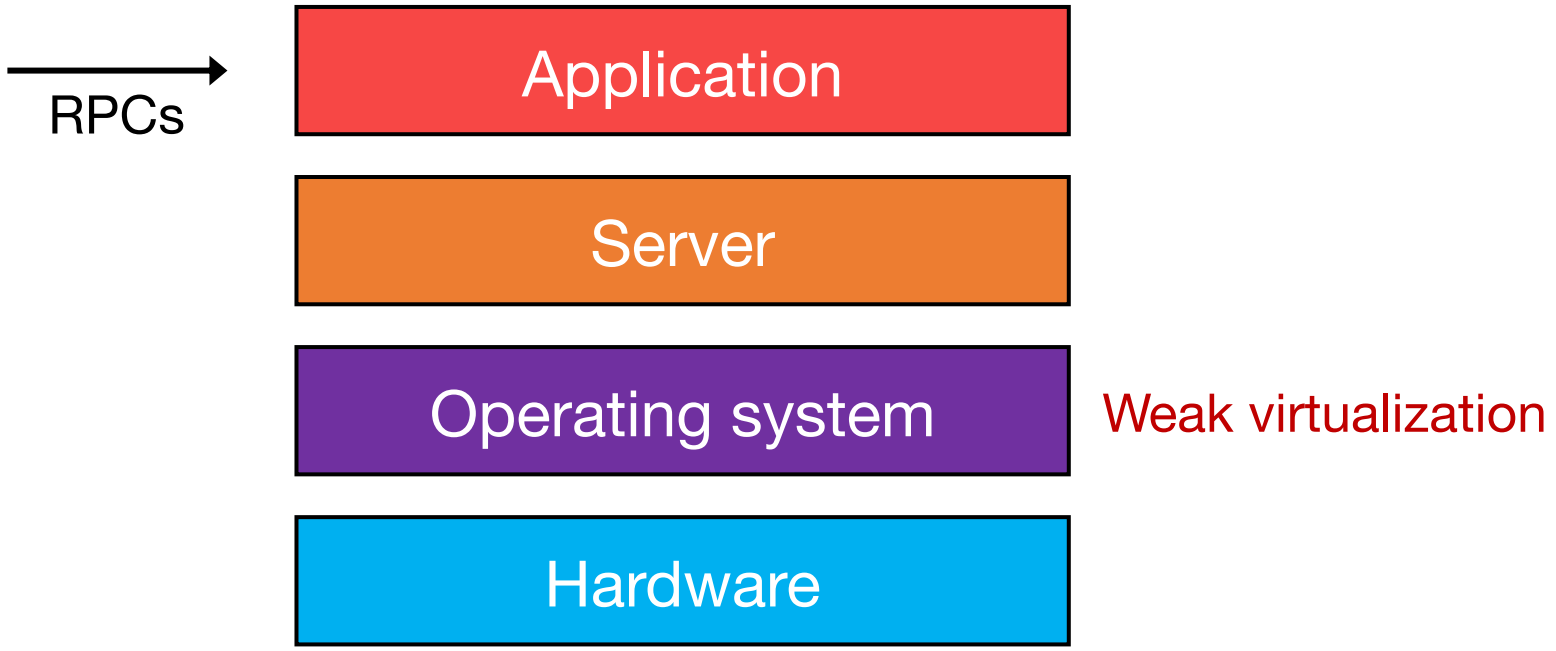
First serverless platform/app

- Google App Engine
  - Fully managed platform as a service (PaaS) for developing and hosting web applications

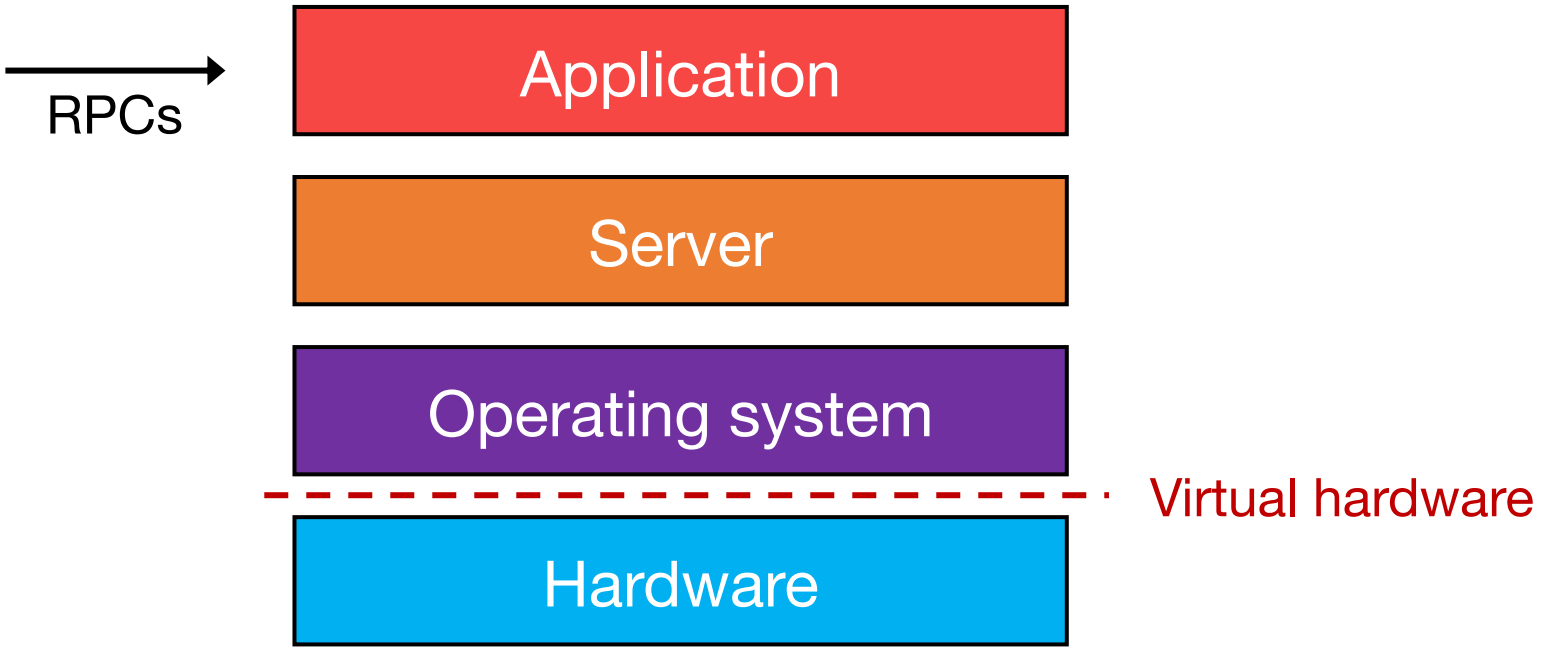
- Google BigQuery
  - Fully managed data warehouse
  - “Arbitrarily” large data and queries
  - Pay per bytes being processed
  - No concept of server or cluster

A virtualization story

Classic cloud app stack



1st generation: virtual machine (VM)



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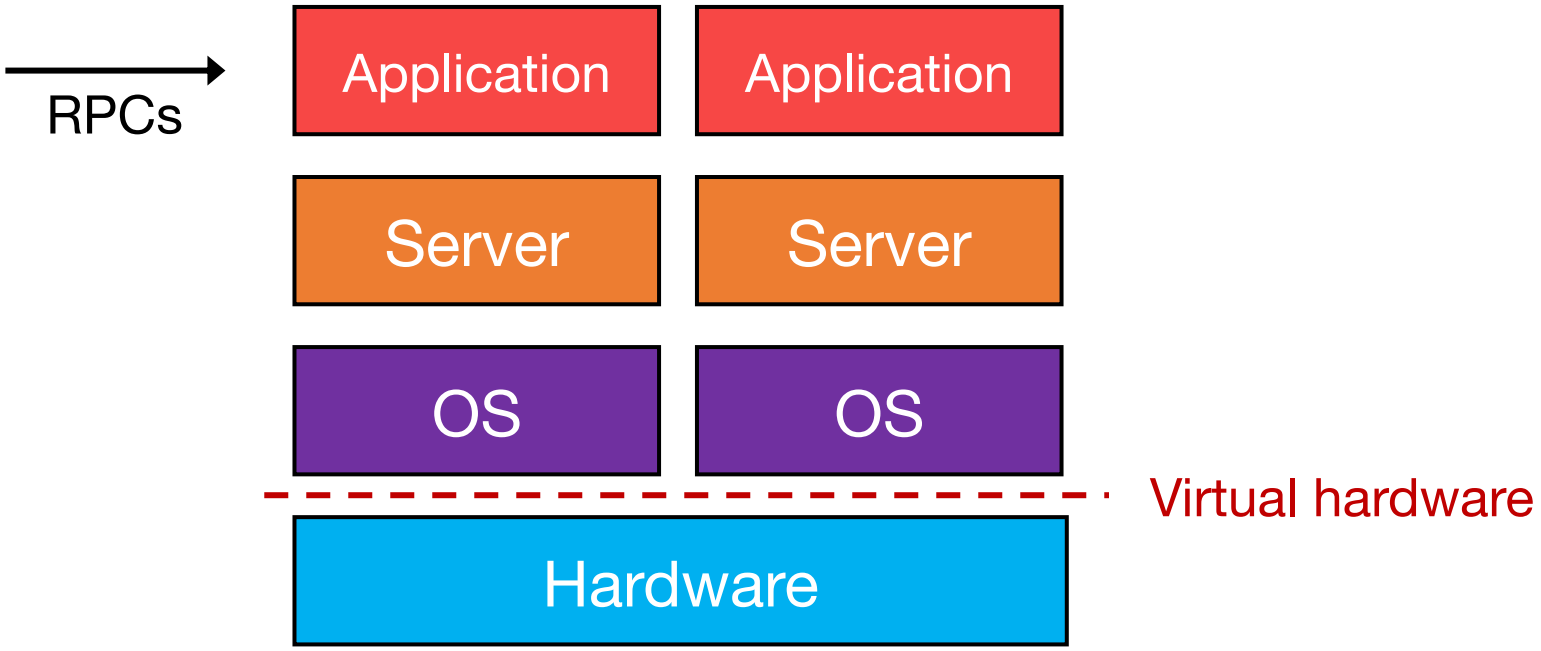
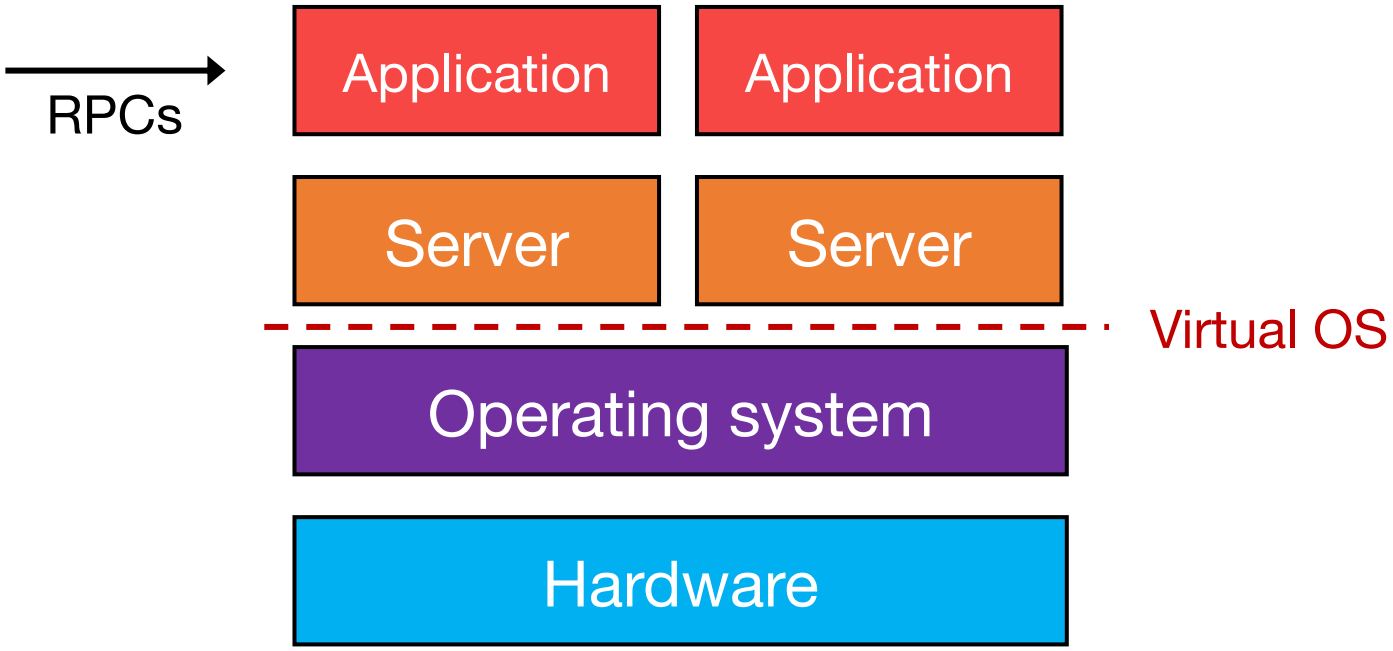
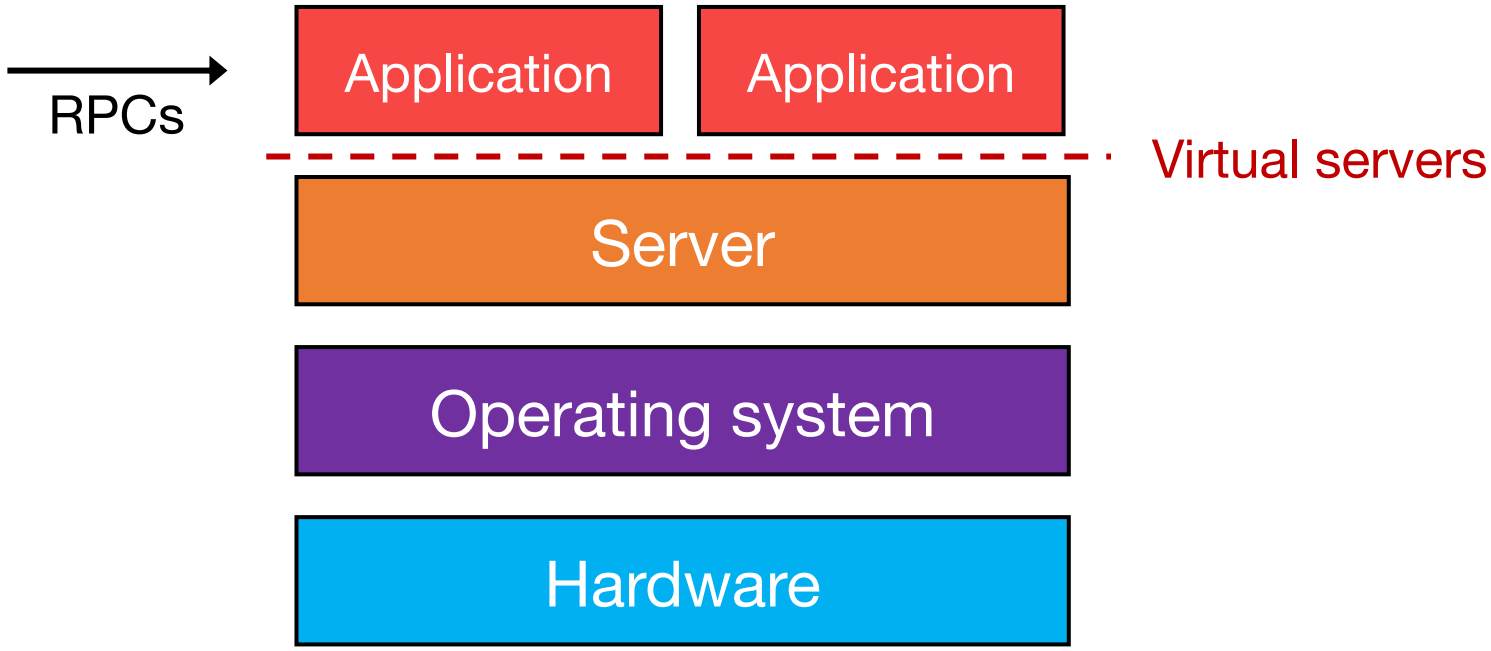


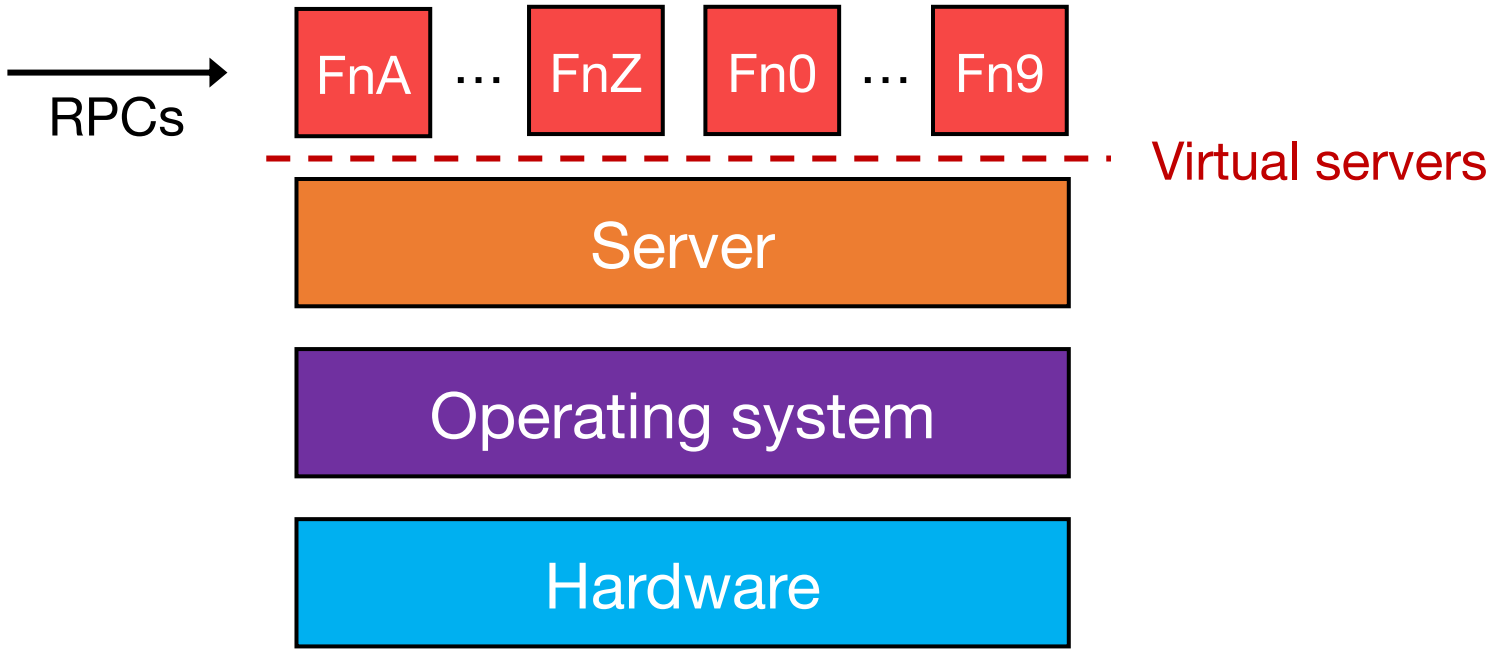
2nd generation: containers



3rd generation: serverless functions



3rd generation: serverless functions



Tradeoff

Serverless functions
(AWS Lambdas)
Containers
VMs
Isolation??
Flexibility
Overhead
(resources, startup, …)

Core capability

1. (Provider) Manage a set of user-defined functions

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5. Send the event to the function instance

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5. Send the event to the function instance
6. Wait for a response

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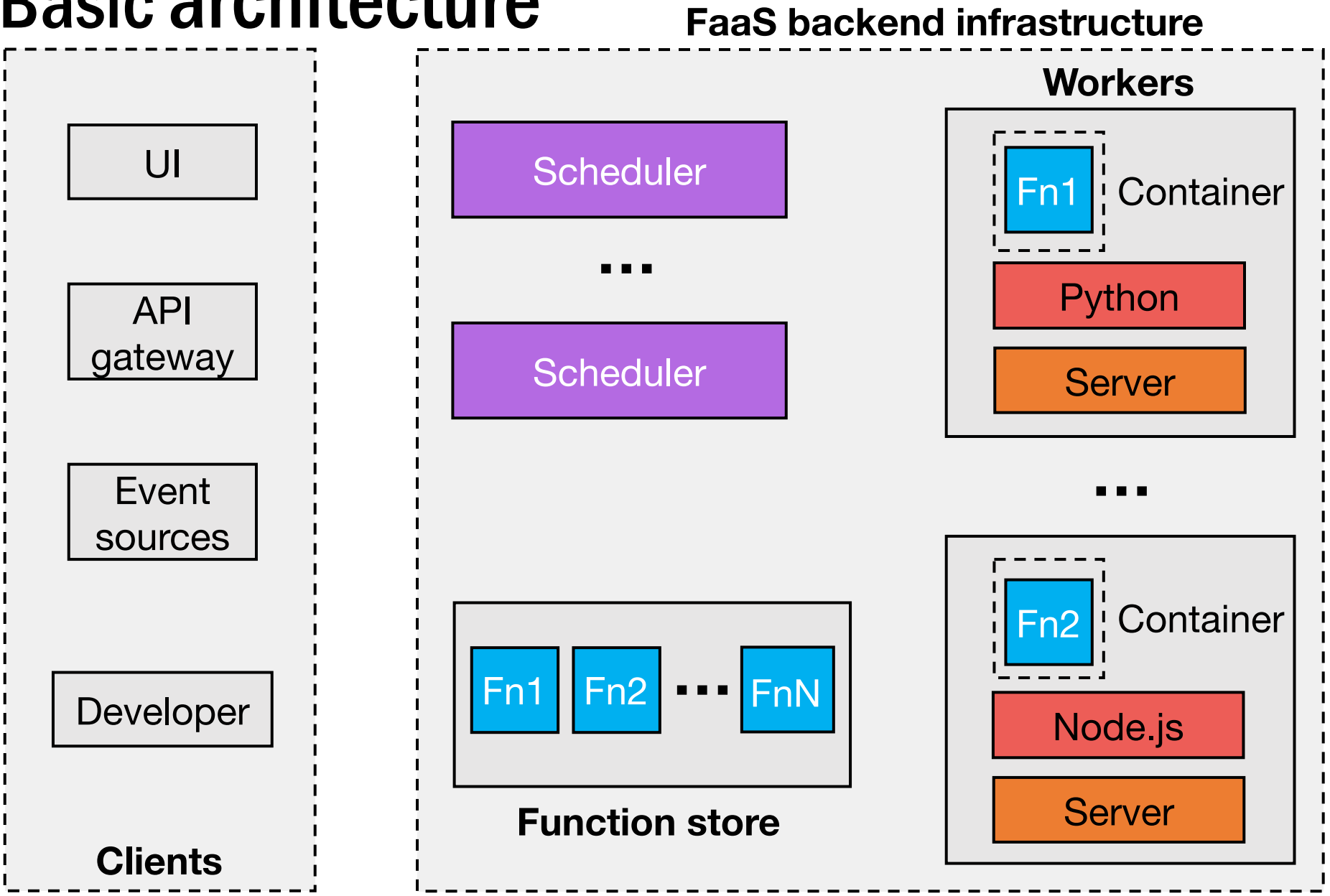
2. Take an event sent over HTTP or received from an event source
3. Determine function(s) to which to dispatch the event
4. Find an existing instance of function or create a new one
5. Send the event to the function instance
6. Wait for a response
7. Gather execution logs
8. Make the response available to the user
9. Stop the function when it is no longer needed

Basic architecture



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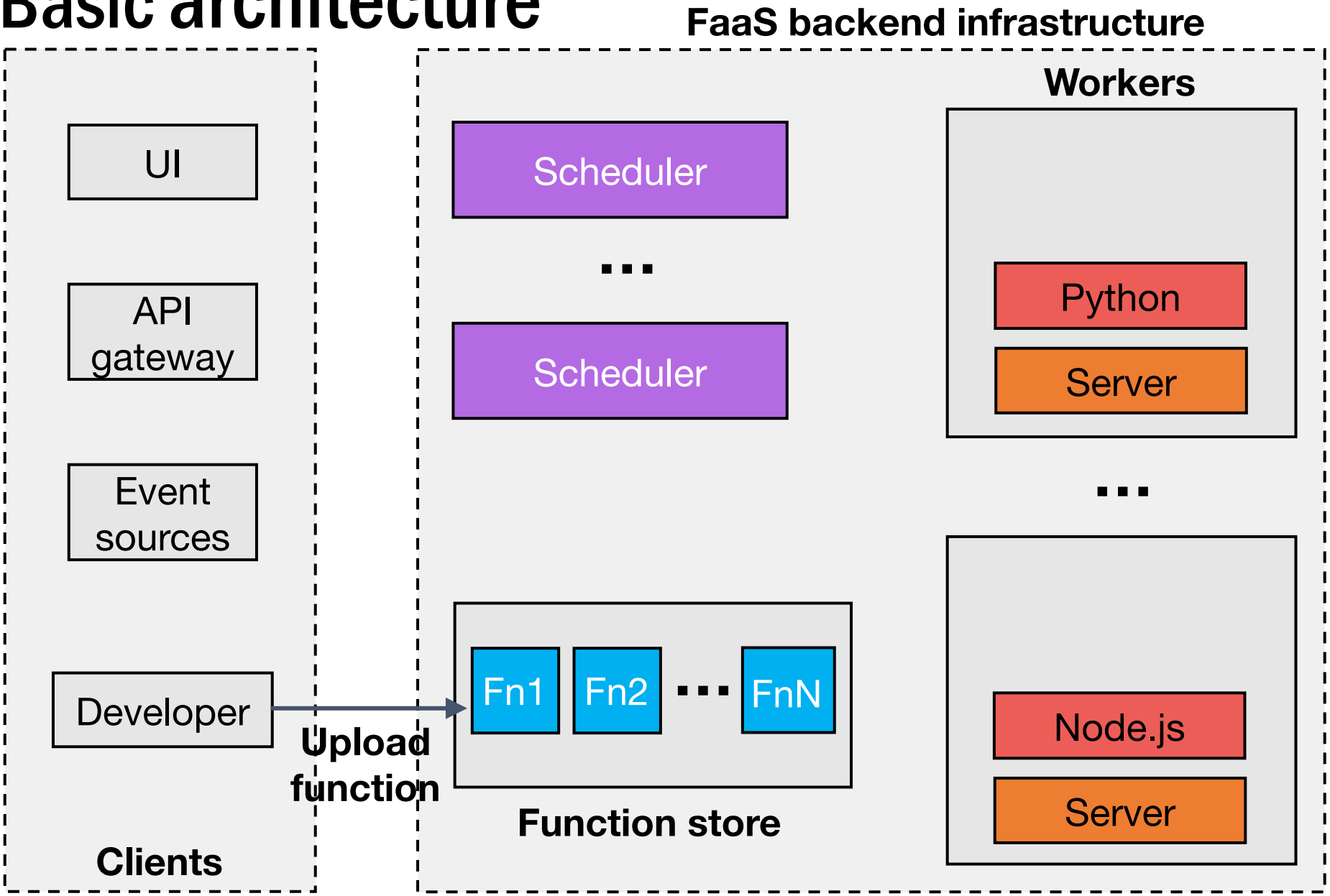
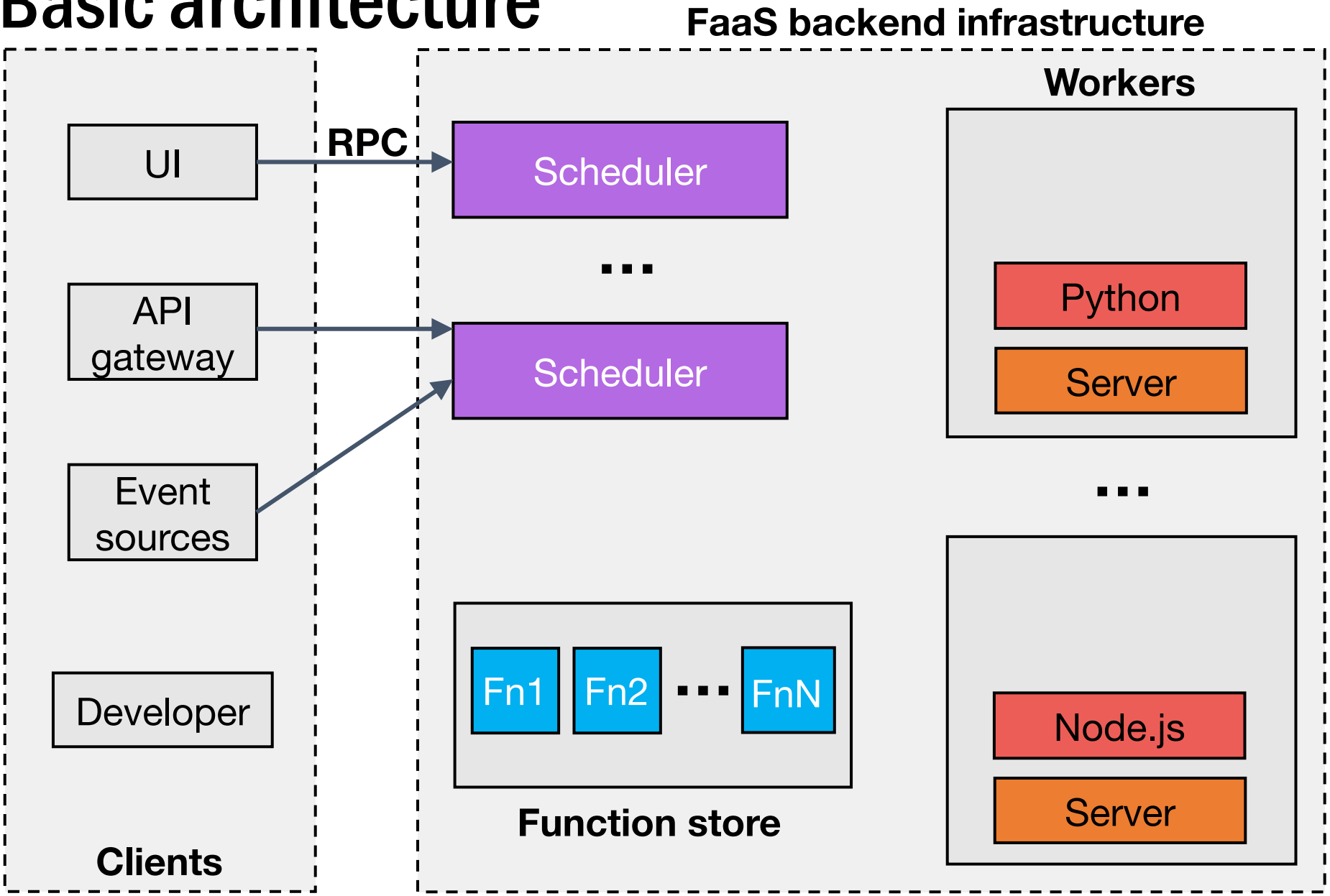


Basic architecture



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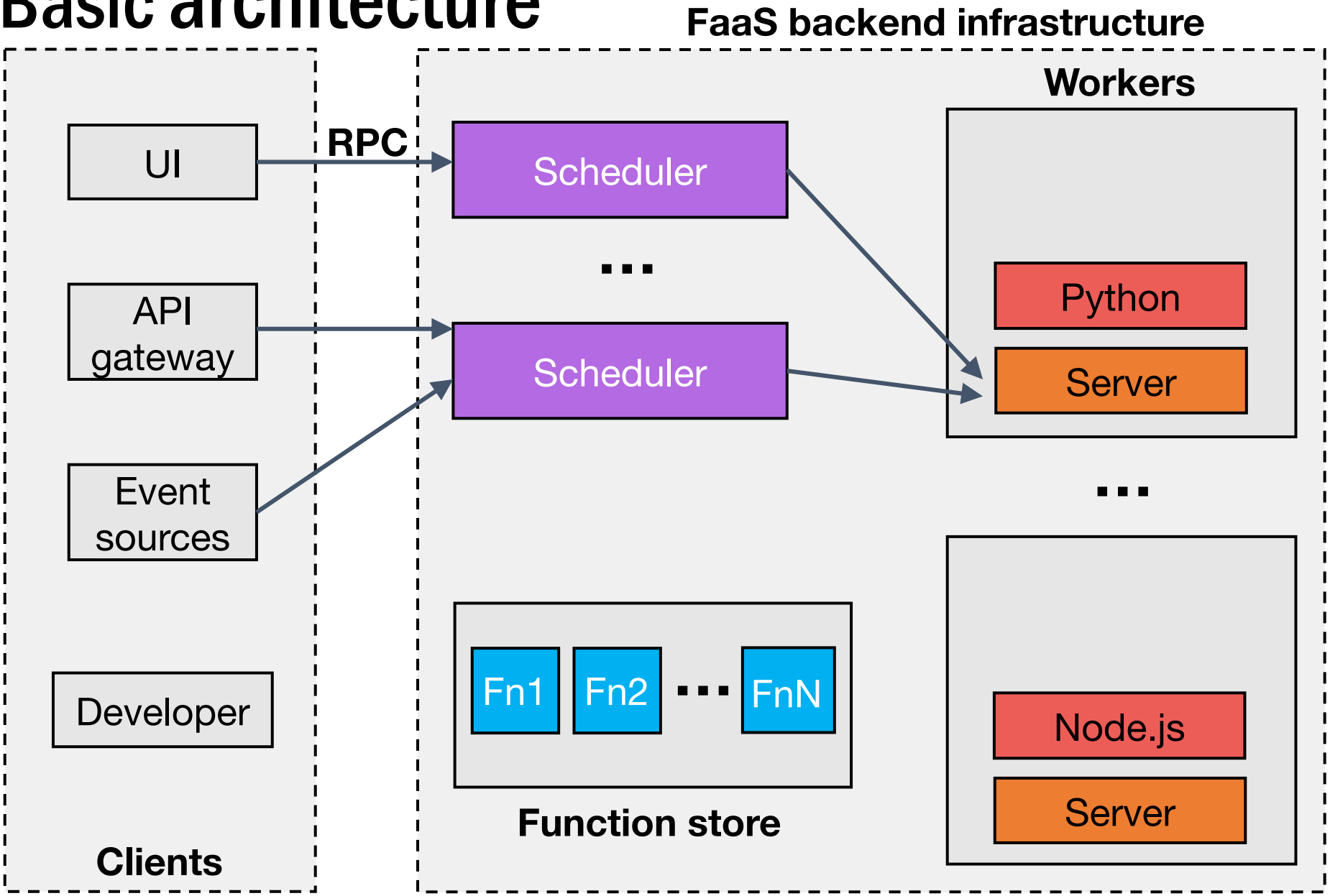

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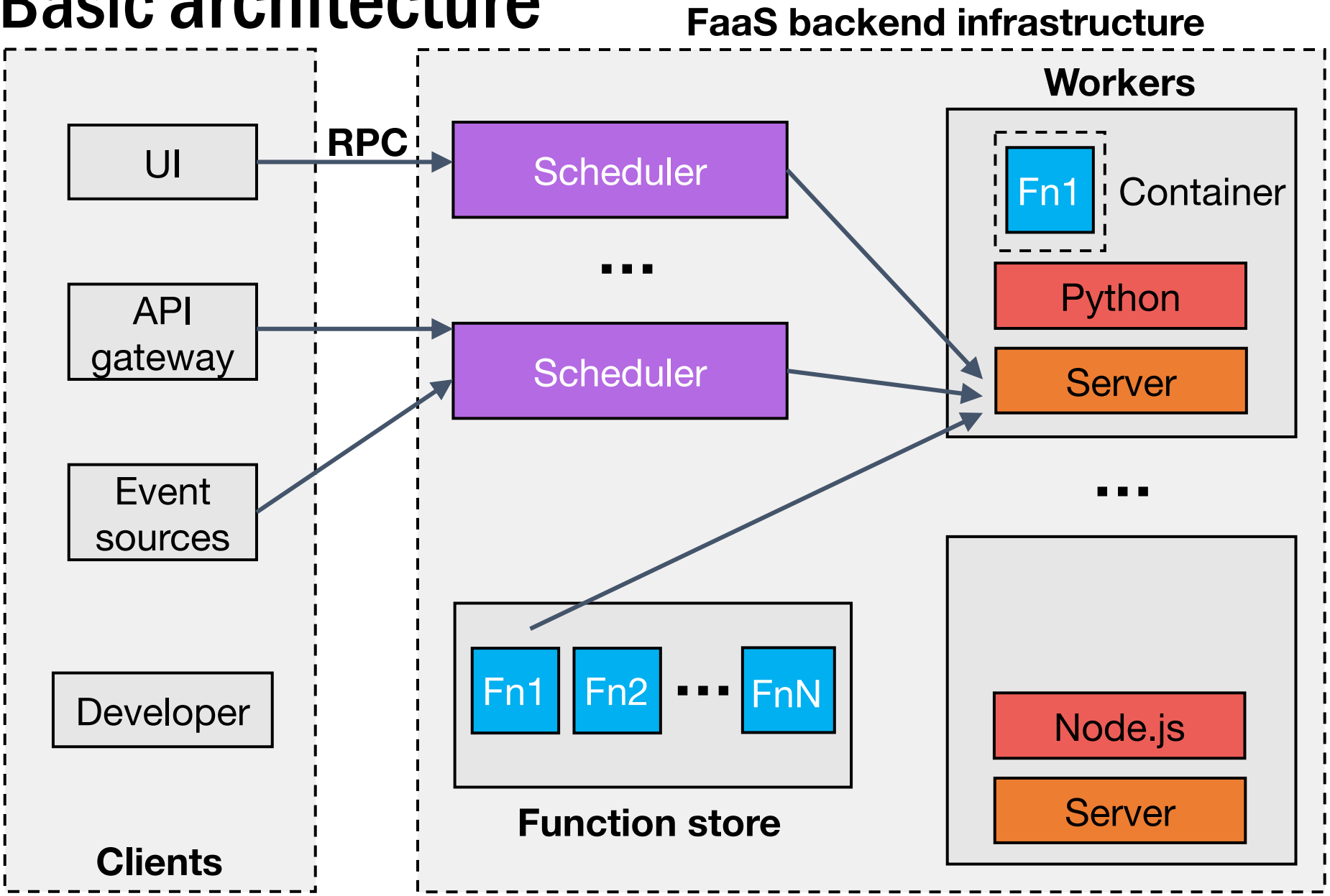
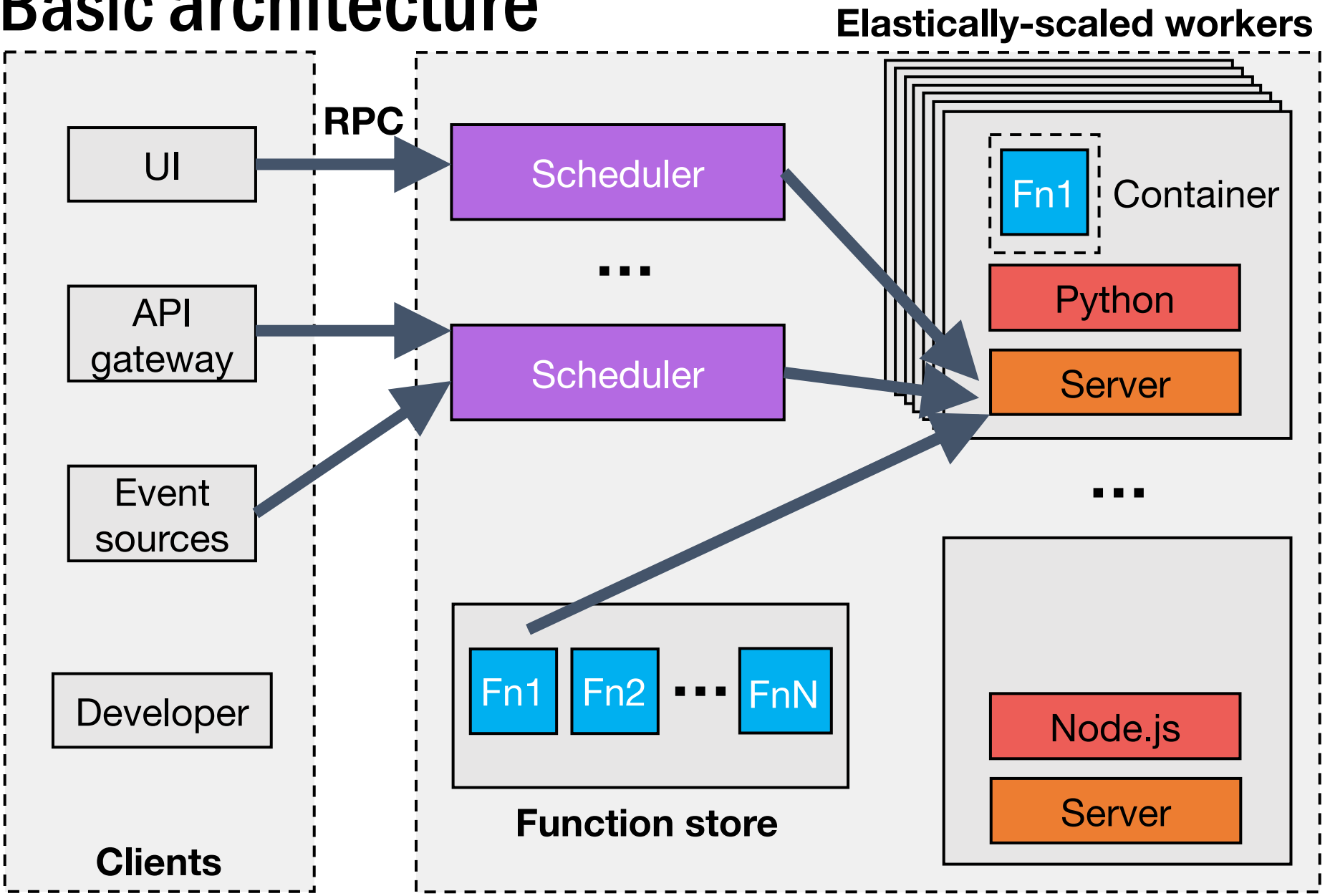


Basic architecture



AWS Lambda

- Lambda functions: typically read/write data from/to S3
  - ~~300 seconds~~ 900 seconds (15 minutes)
  - ~~single-core~~ ~~two-core~~ up to six cores
  - ~~1.5 GB~~ 3 GB memory
  - 512 MB of /tmp file system
  - Python, Java, Node.js, Go, …
  - Pricing:
    - Fine-grained billing: 1-millisecond billed duration
    - $0.20 per 1M requests (invocations)
    - $0.0000166667 for every GB-second
    - 6,000 1 GB Lambda functions for one second: 10¢

AWS Lambda demo

Why is serverless computing desirable?

- Zero administration overhead
  - No need to handle server provisioning, failure, etc.
- Auto-scaling
  - Spin up / tear down functions quickly based on load
- Pay-per-use
  - Only pay for the resources used (CPU-mem bundle)

Limitations

- Question: Can developers really focus on the function development now?

Limitations

- Question: Can developers really focus on the function development now?
  - In some sense, **yes ?**
  - Tradeoff: but typically requires:
    - extra work
    - slow performance

What's missing?

- No good way of managing state
  - Rely on cloud storage for state sharing but cloud storage is slow

- Active research area
  - InfiniCache: https://github.com/ds2-lab/infinicache
  - Pocket: https://www.usenix.org/conference/osdi18/presentation/klimovic

What's missing?

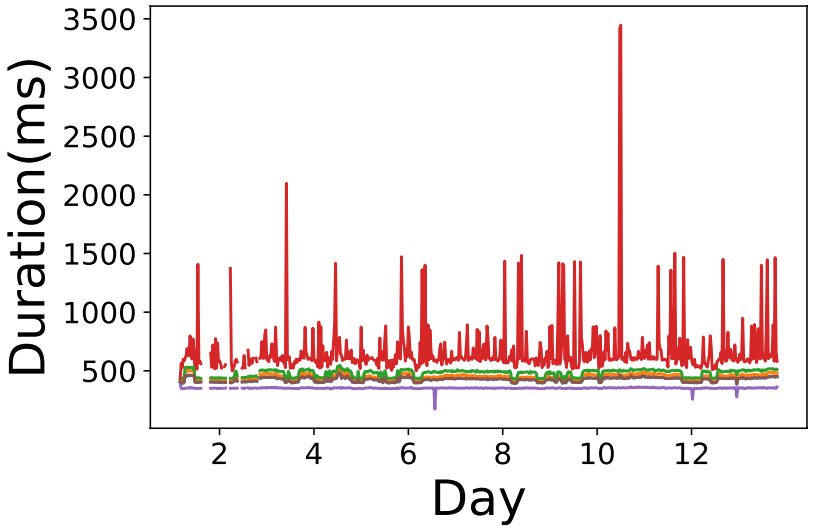
- Inflexible and poor resource configuration
  - Impossible to run large code, e.g., TensorFlow
  - Unfriendly to resource-intensive code, e.g., ML/DL

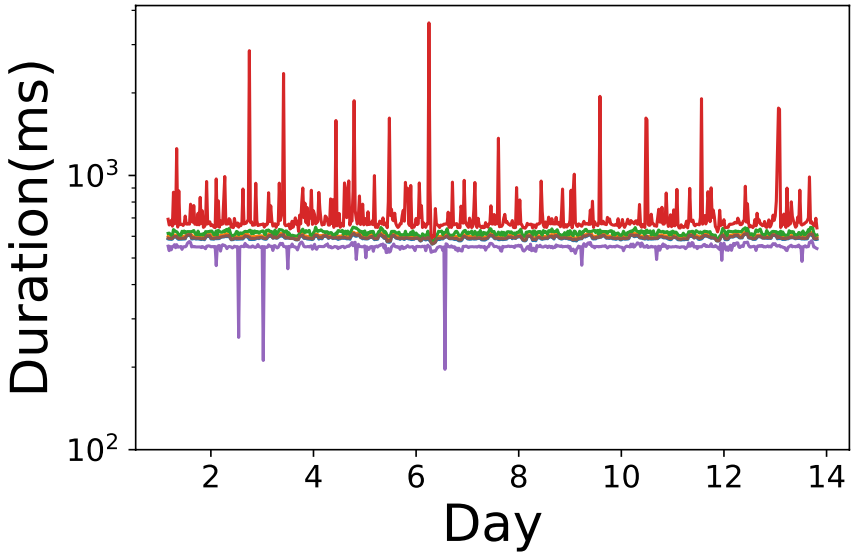
- Active research area
  - FaaSNet: https://www.usenix.org/conference/atc21/presentation/wang-ao

What's missing?

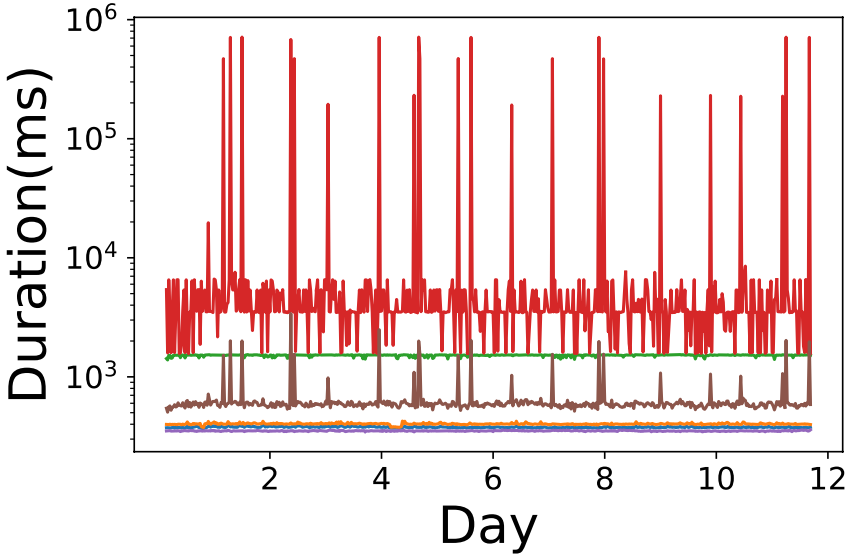
- Unpredictable performance

Google Cloud Functions





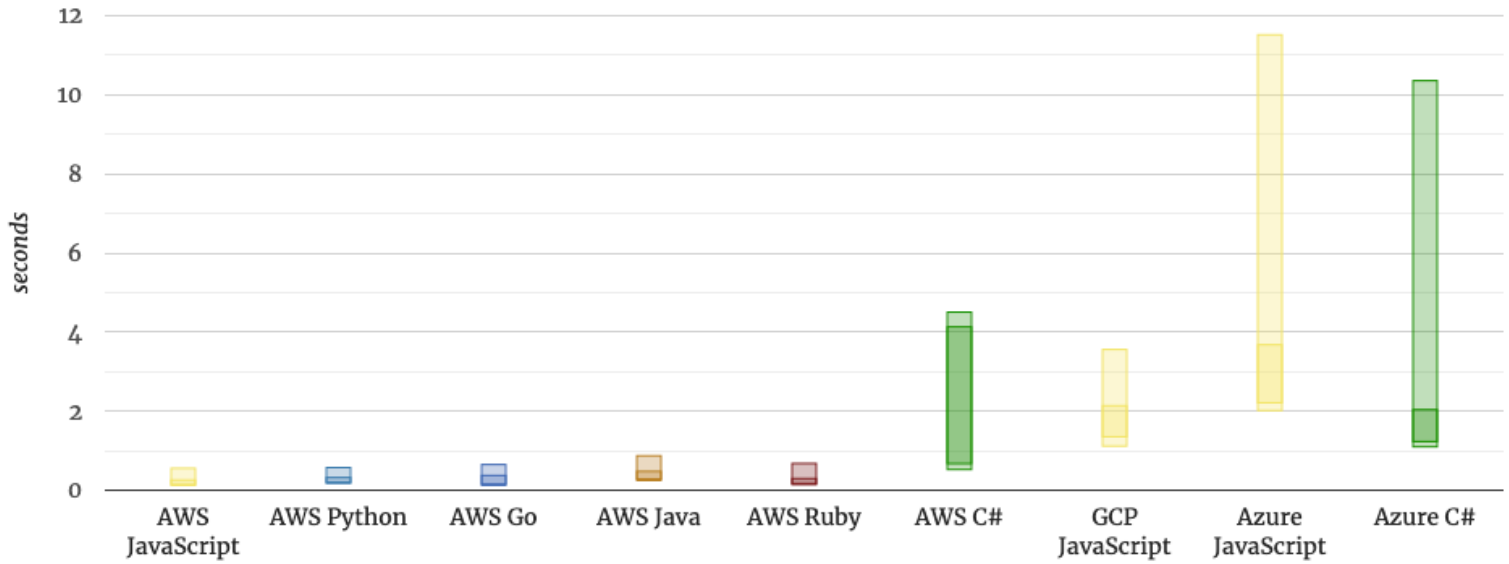
AWS Lambda



Azure Cloud Functions

What's missing?

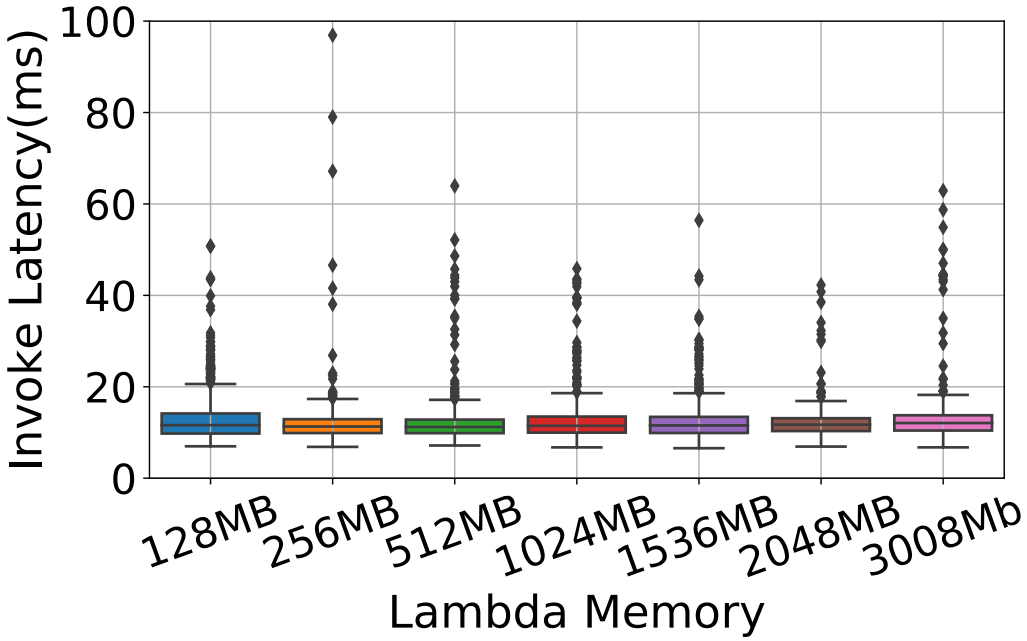
- Unpredictable performance
- Long cold startup latencies



* Blog: Comparison of Cold Starts in Serverless Functions across AWS, Azure, and GCP, Mikhail Shilkov

What's missing?

- Unpredictable performance
- Long cold startup latencies
- High HTTP invocation cost



Next steps

- Next week: Two FaaS applications that aim to address those limitations
  - Wukong: A high-performance serverless parallel framework
  - InfiniCache: A cost-efficient serverless storage system
  - Paper evaluation forms posted on Ed

- Project checkpoint #1 due this Friday