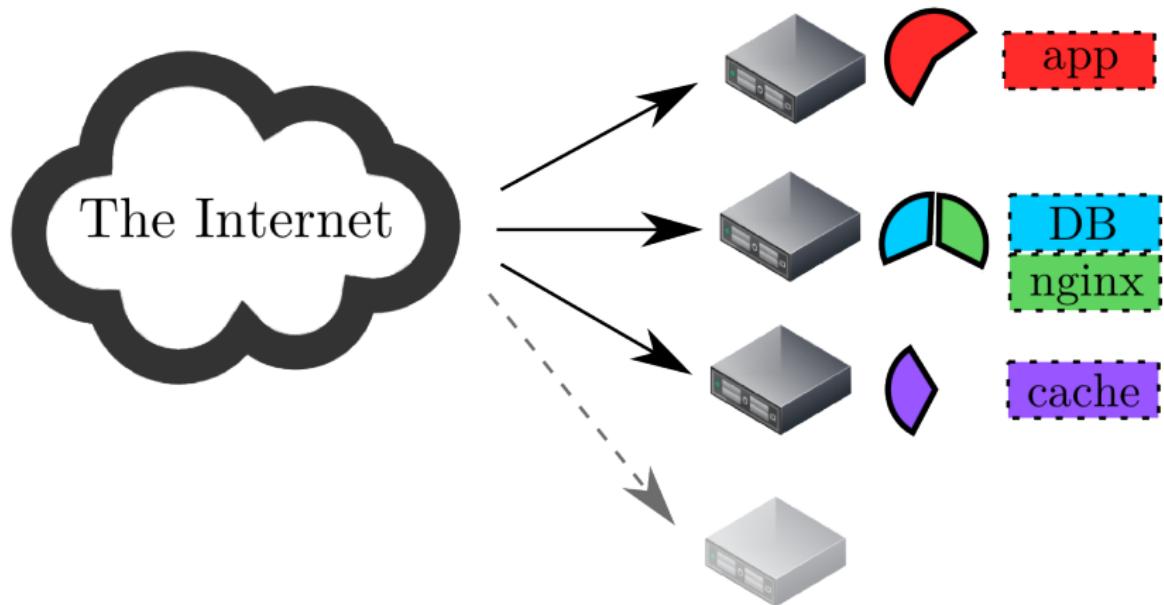


# MESOS

Tomas Barton (@barton\_tomas)

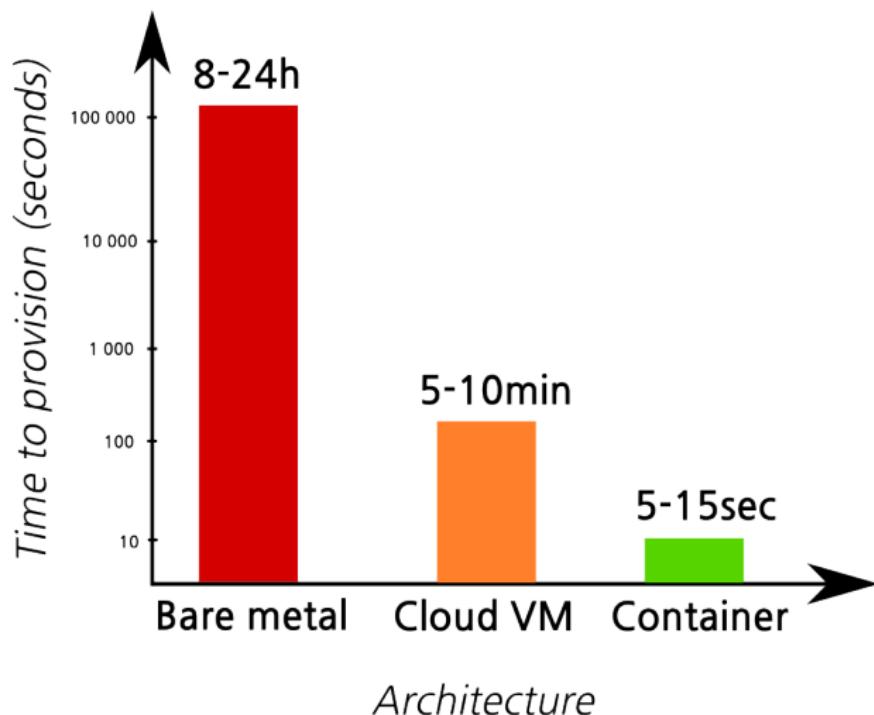
# Load balancing

- one server is not enough



# Time to launch new instance

- new server up and running in a few seconds



# Job allocation problem

- run important jobs first



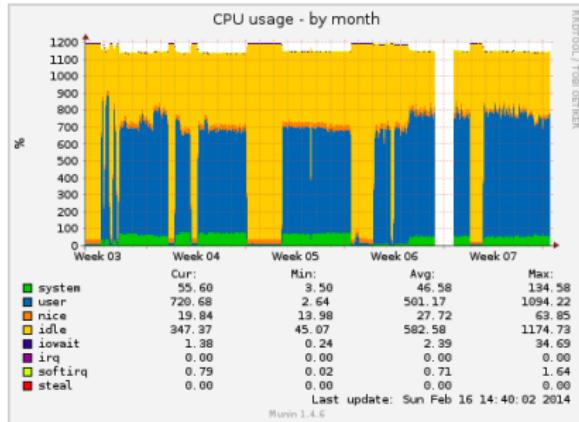
15x service

100x batch job

- how many servers do we need?

# Load trends

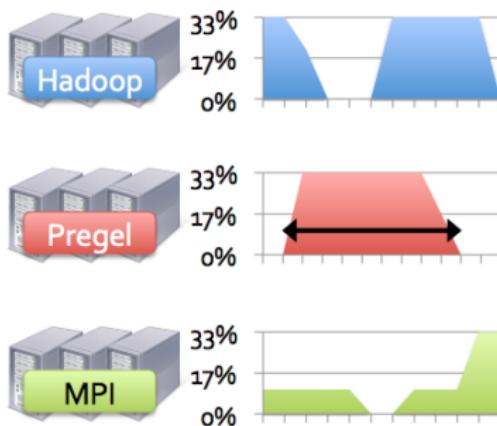
- various load patterns



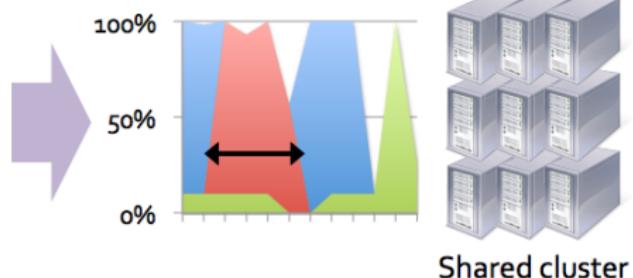
# Goals

- effective usage of resources

Today: static partitioning



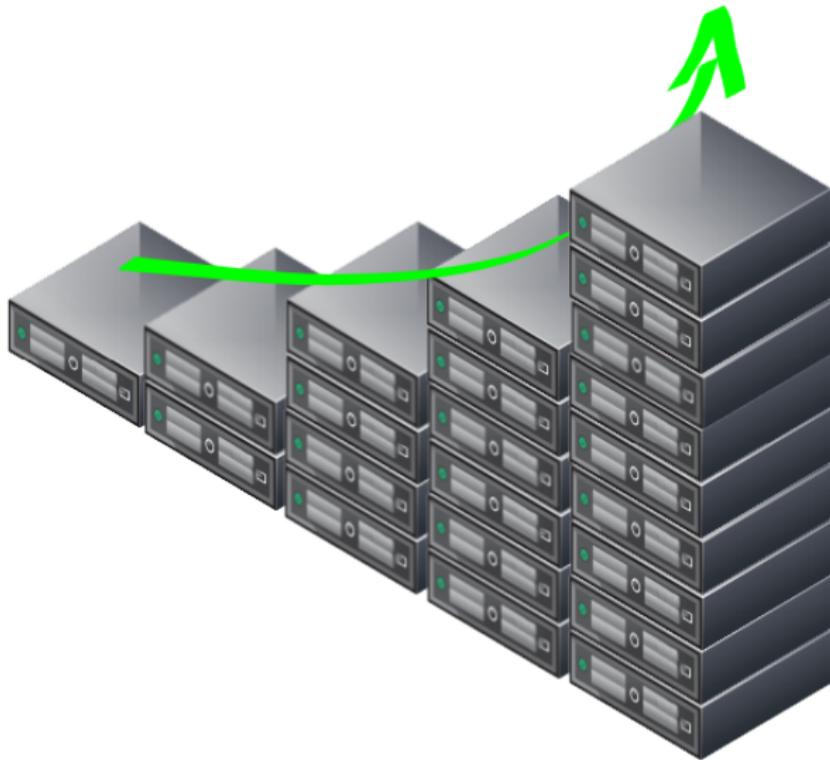
Mesos: dynamic sharing



Shared cluster

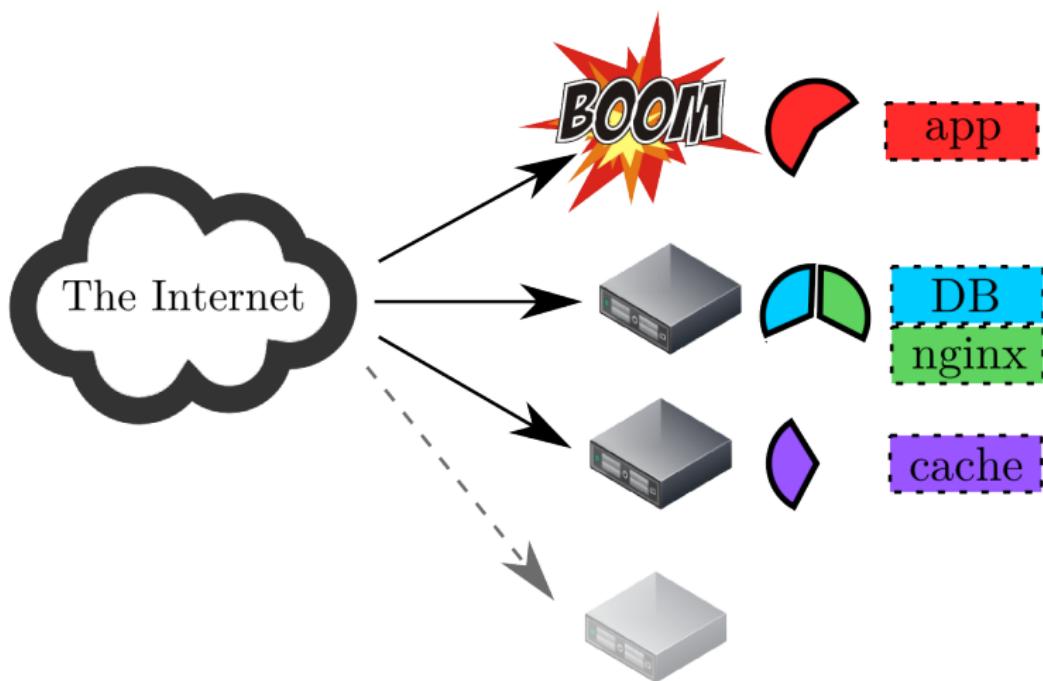
# Goals

- scalable



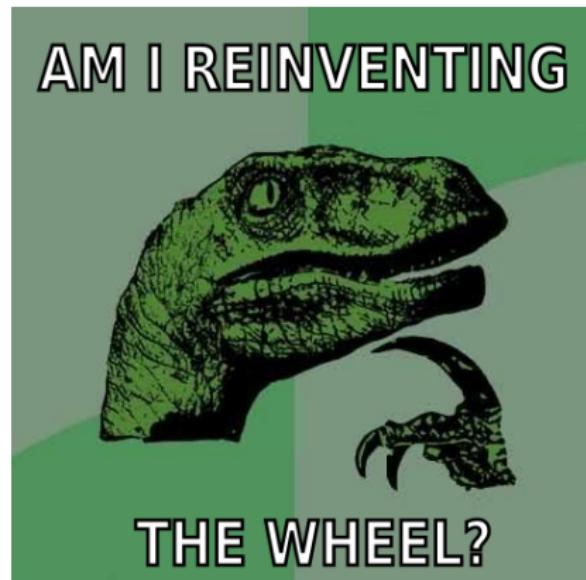
# Goals

- fault tolerant



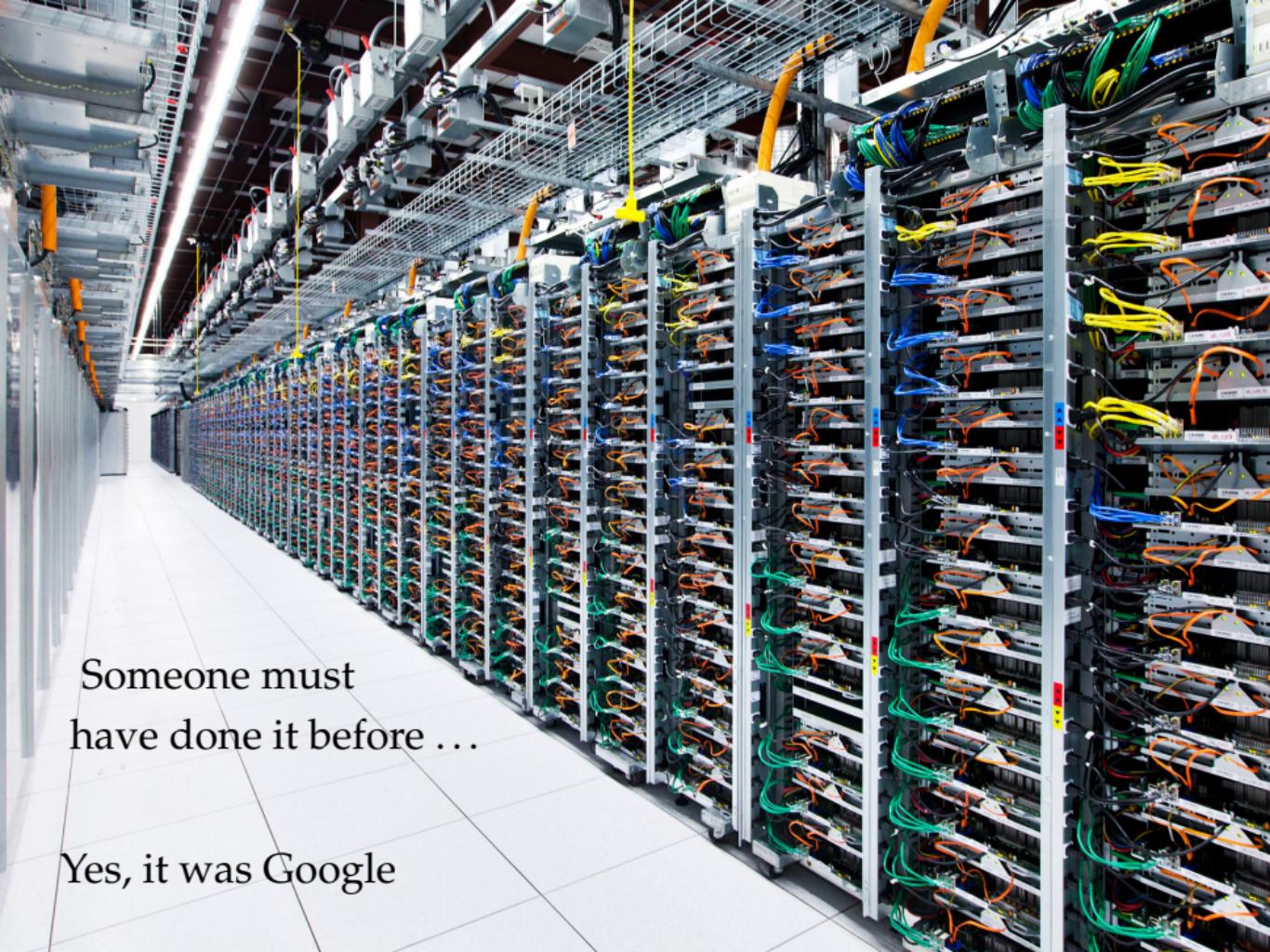
# Infrastructure

- ① scalable
- ② fault-tolerant
- ③ load balancing
- ④ high utilization





Someone must  
have done it before ...



Someone must  
have done it before ...

Yes, it was Google

# Google Research



## 2004 - MapReduce paper

- MapReduce: Simplified Data Processing on Large Clusters  
by Jeffrey Dean and Sanjay Ghemawat from Google Lab

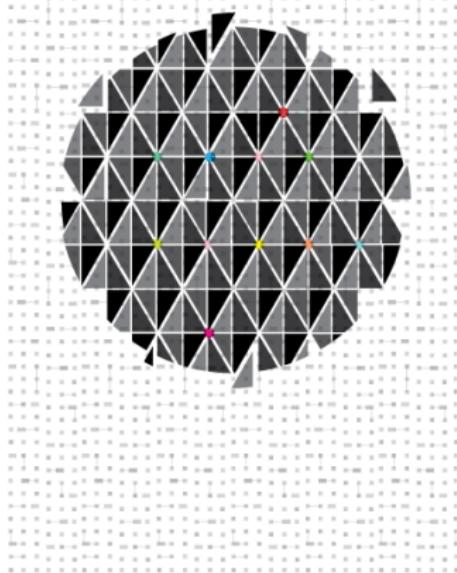
## ⇒ 2005 - Hadoop

- by Doug Cutting and Mike Cafarella



# Google's secret weapon

“I prefer to call it the system that will not be named.”



*John Wilkes*





NOT THIS ONE

# “Borg”

unofficial name

- ✓ distributes jobs between computers
- ✓ saved cost of building at least one entire data center
- centralized, possible bottleneck
- hard to adjust for different job types



# “Borg”

CENSORED

200x – no Borg paper at all

2011 – Mesos: a platform for fine-grained resource sharing  
in the data center.

- Benjamin Hindman, Andy Konwinski, Matei Zaharia,  
Ali Ghodsi, Anthony D. Joseph, Randy Katz, Scott  
Shenker, and Ion Stoica. Berkeley, CA, USA



# The future?

2013 – Omega: flexible, scalable schedulers for large compute clusters

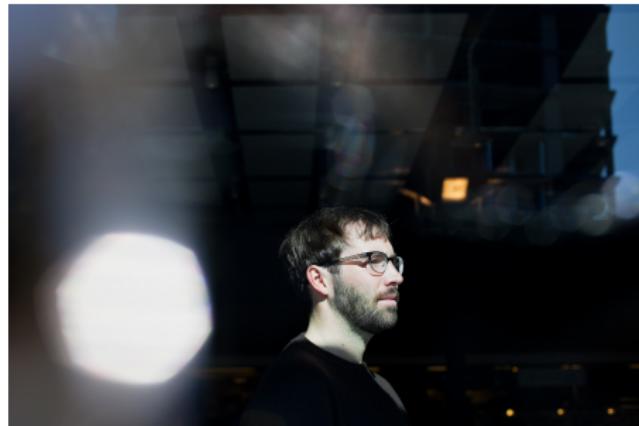
- Malte Schwarzkopf, Andy Konwinski, Michael Abd-El-Malek, John Wilkes (SIGOPS European Conference on Computer Systems (EuroSys), ACM, Prague, Czech Republic (2013), pp. 351-364)



- compares different schedulers
  - monolithic (Borg)
  - Mesos (first public release, version 0.9)
  - Omega (next generation of Borg)

# Benjamin Hindman

- PhD. at UC Berkley
- research on multi-core processors



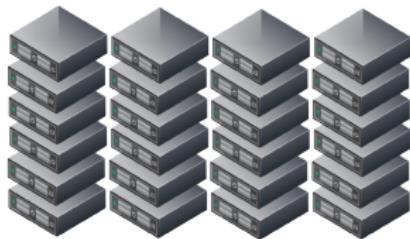
*“Sixty-four cores or 128 cores on a single chip looks a lot like 64 machines or 128 machines in a data center”*



“We wanted people to be able to program for the data center just like they program for their laptop.”

# Evolution of computing

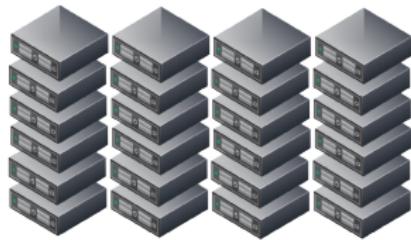
## Datacenter



- low utilization of nodes
- long time to start new node (30 min – 2 h)

# Evolution of computing

**Datacenter**



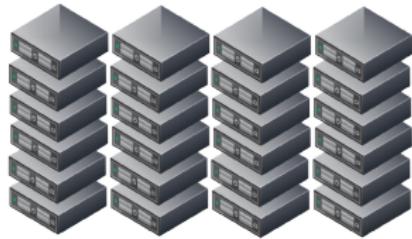
**Virtual Machines**



- even more machnines to manage
- high virtualization costs
- VM licensing

# Evolution of computing

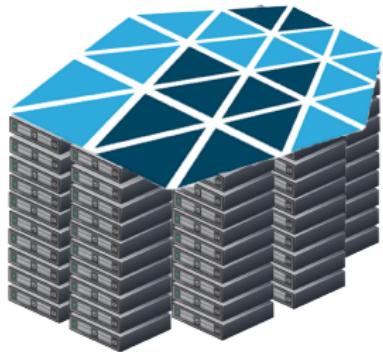
Datacenter



Virtual Machines



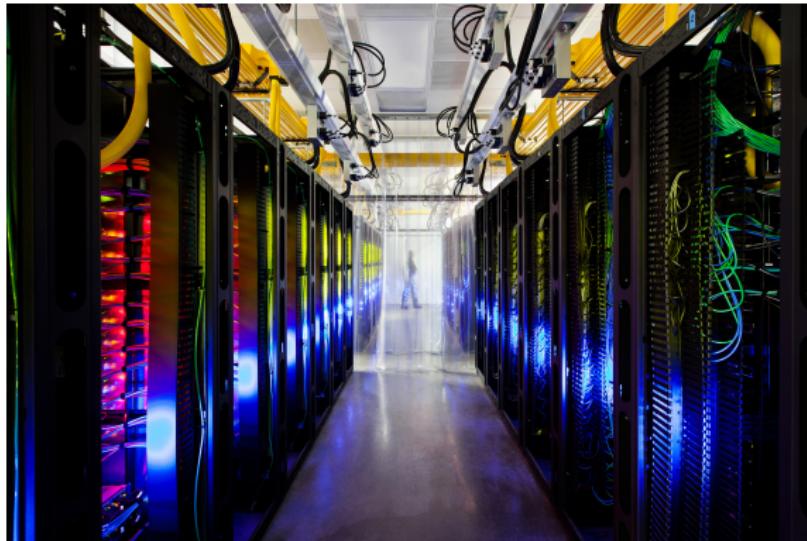
Mesos



- sharing resources
- fault-tolerant

# Supercomputers

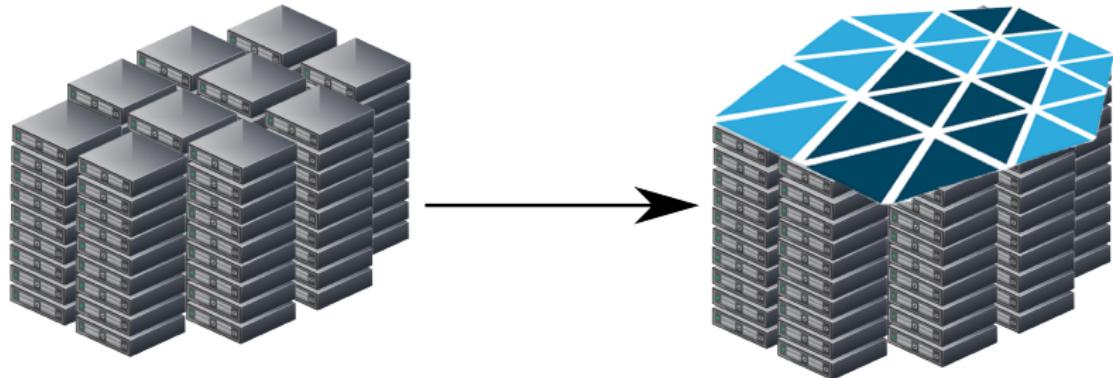
- supercomputers aren't affordable
- single point of failure?



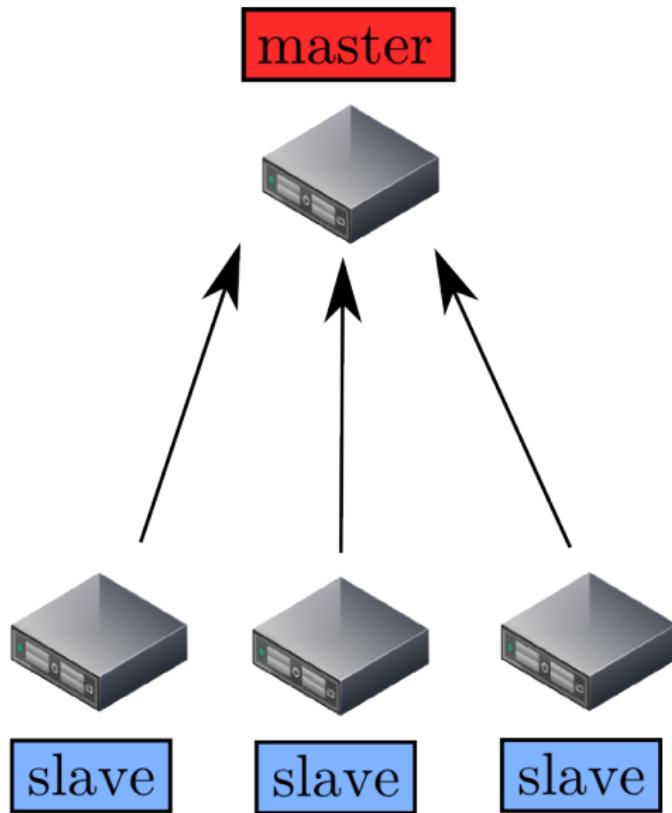
# IaaC

Infrastructure as a computer

- build on commodity hardware



# Scalability



# First Rule of Distributed Computing

*“Everything fails all the time.”*

— Werner Vogels, CTO of Amazon

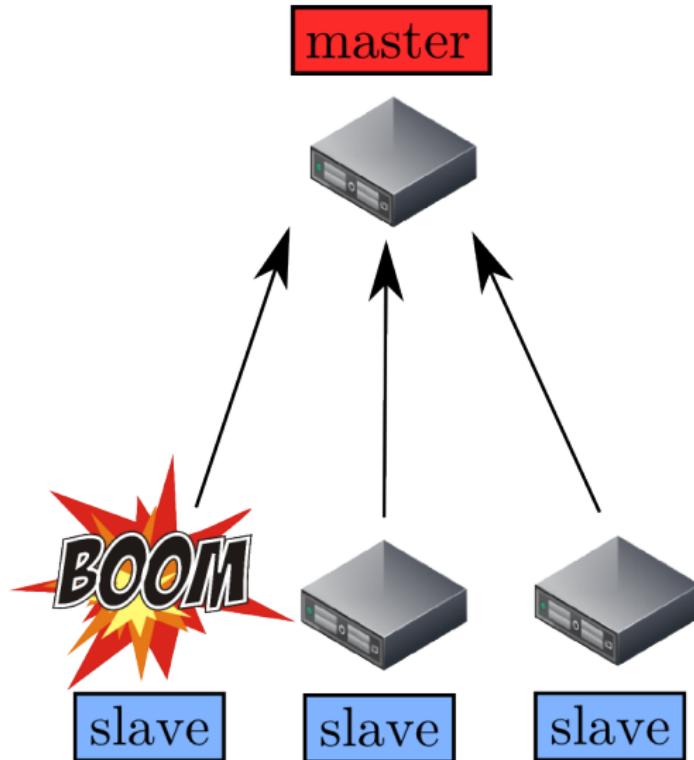


```
[1526689.666251] DR3: 0000000000000000 DR6: 00000000ffff0ff0 DR7: 0000000000000000
[1526689.725426] Process java (pid: 24365, threadinfo ffff8803851e6000, task ff
8803284d8000)
[1526689.784462] Stack:
[1526689.812815] ffff88040e233ec0 0000000000000000 ffff88040e223ed0 ffffffff81
b3567
[1526689.870570] ffff88040e22e8b8 ffffffff81c1af00 ffff88040e223f18 ffffffff81
b3b45
[1526689.929768] ffffffff810b00dc ffff88040e223f38 ffff88040e22e800 0000000000
00000
[1526689.989048] Call Trace:
[1526690.018031] <IRQ>
[1526690.018375] [<fffffff810b3567>] get_posix_clock.isra.0+0x27/0x50
[1526690.075394] [<fffffff810b3b45>] posix_clock_poll+0x35/0x80
[1526690.103702] [<fffffff810b00dc>] ? ktime_get_update_offsets+0x4c/0xd0
[1526690.131720] [<fffffff810841ef>] hrtimer_interrupt+0x6f/0x240
[1526690.159145] [<fffffff816ffd19>] smp_apic_timer_interrupt+0x69/0x99
[1526690.186251] [<fffffff816fec5d>] apic_timer_interrupt+0x6d/0x80
[1526690.212862] <EOI>
[1526690.213208] Code: 6e dd c6 ff 48 83 c4 08 5b 5d c3 0f 1f 80 00 00 00 00 66
66 66 66 90 55 48 89 e5 53 48 89 fb 48 83 ec 08 e8 6a 0a 00 00 48 89 d8 <f0> 48
ff 00 79 05 e8 0c dd c6 ff 48 83 c4 08 5b 5d c3 55 48 8d
[1526690.317237] RIP [<fffffff816f3439>] down_read+0x19/0x2b
[1526690.342569] RSP <ffff88040e223ea0>
[1526690.367420] CR2: 00000000000000f0
[1526690.425275] ---[ end trace fec7704b6488d8b5 ]---
[1526691.430539] Kernel panic - not syncing: Fatal exception in interrupt
```



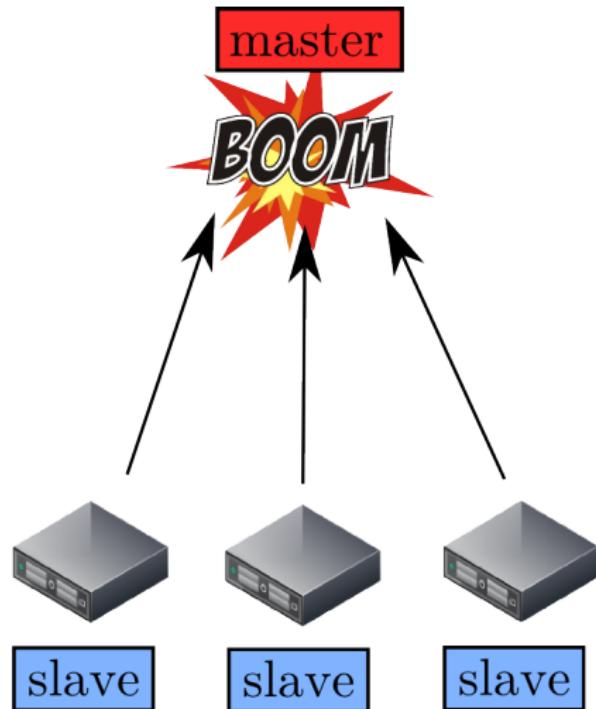
# Slave failure

- no problem



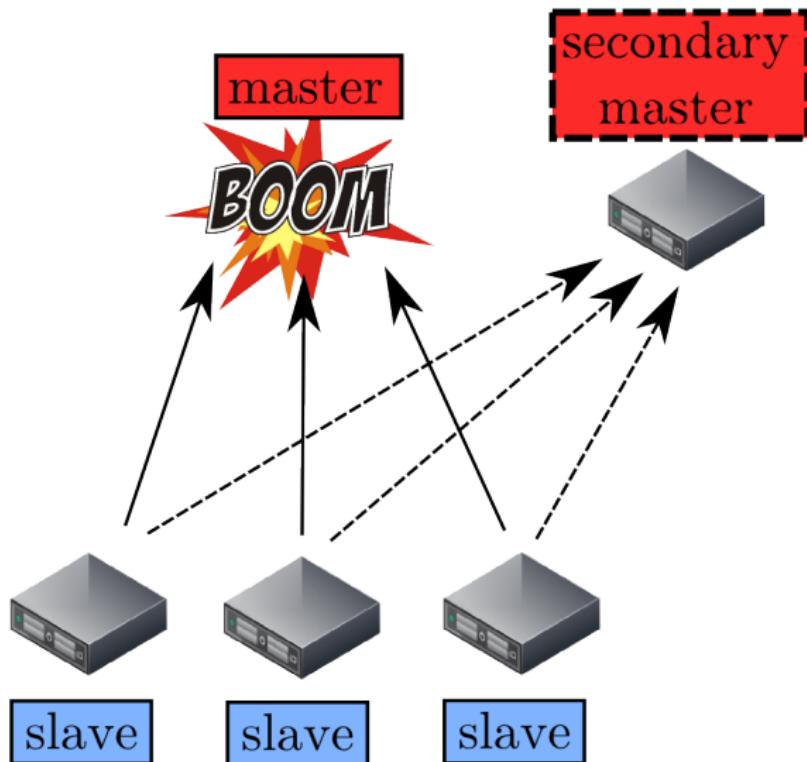
# Master failure

- big problem
- single point of failure

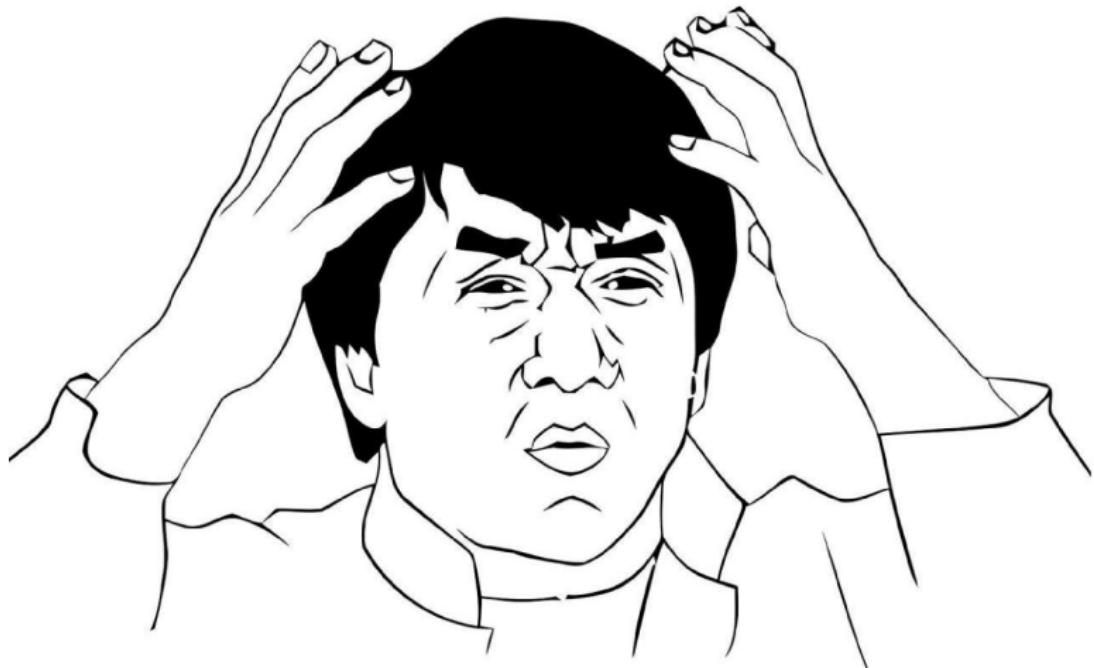


# Master failure – solution

- ok, let's add secondary master

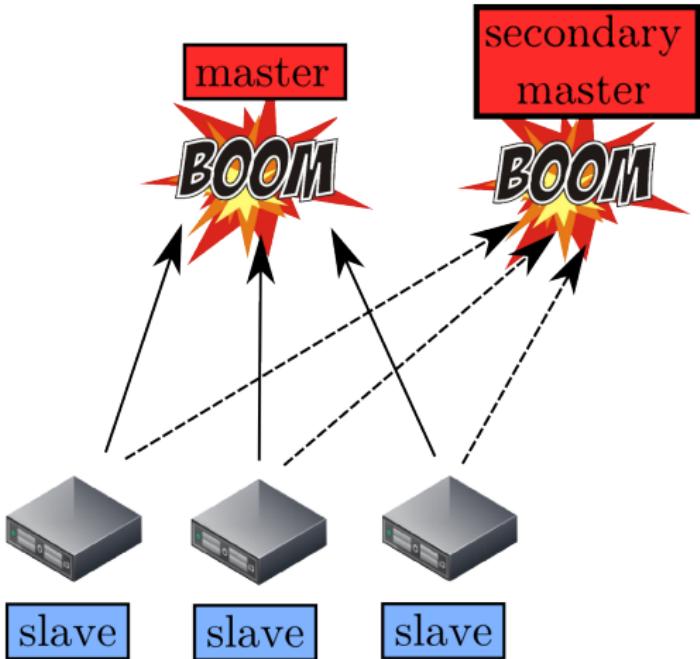


**OMG!**



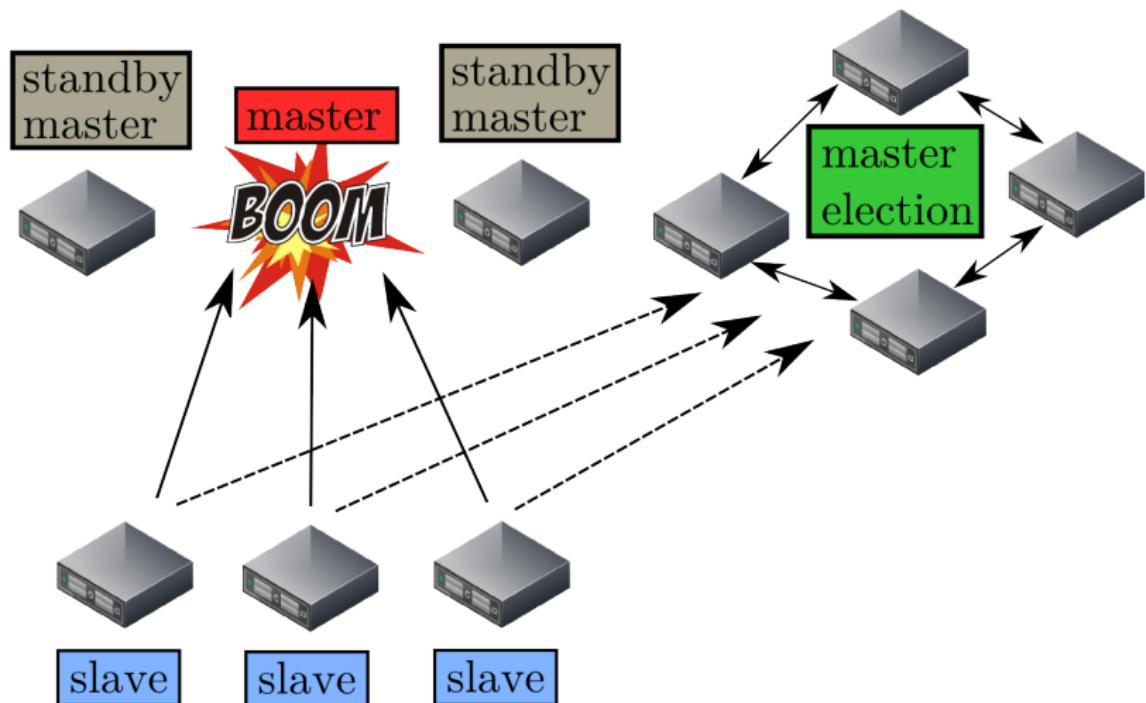
**That's like mid 2000's!**

# Secondary master failure



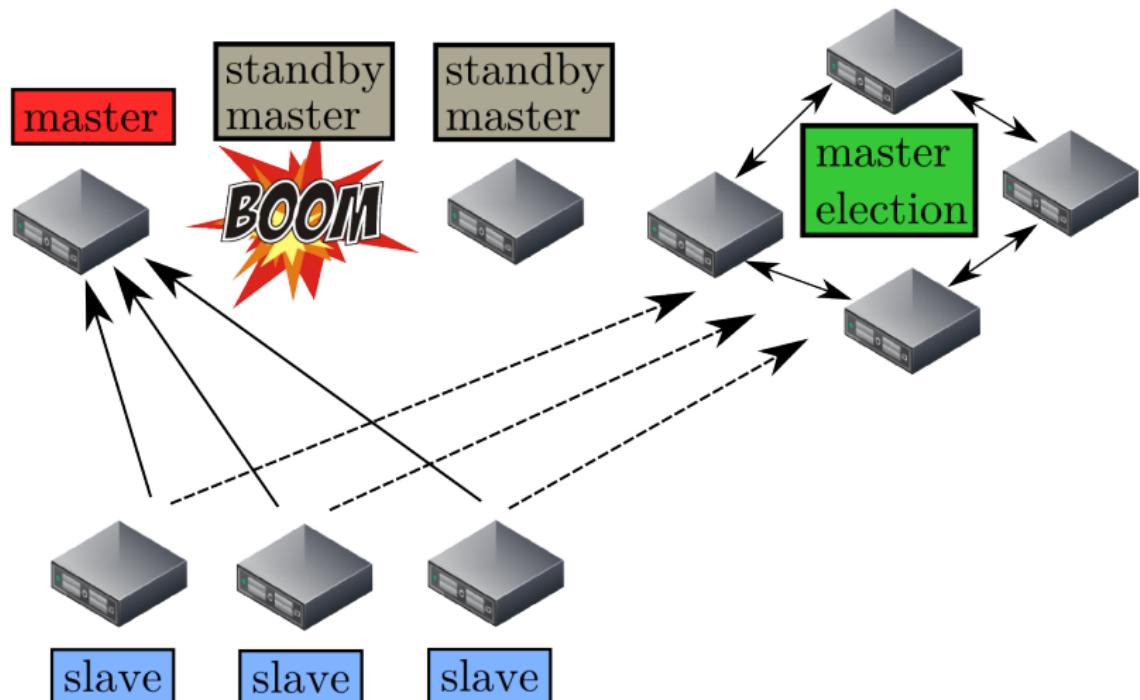
- ✗ not resistant to secondary master failure
- ✗ masters IPs are stored in slave's config
  - will survive just 1 server failure

# Leader election



- ✓ in case of master failure new one is elected

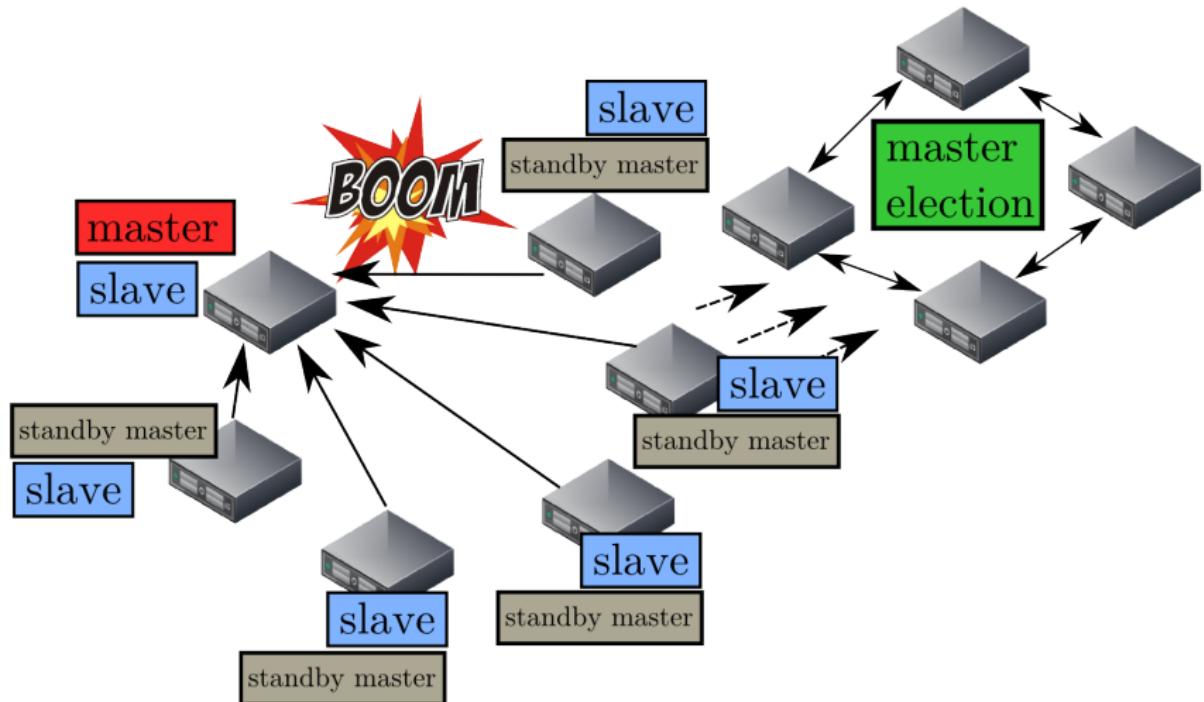
# Leader election



- ✓ in case of master failure new one is elected

# Leader election

- you might think of the system like this:

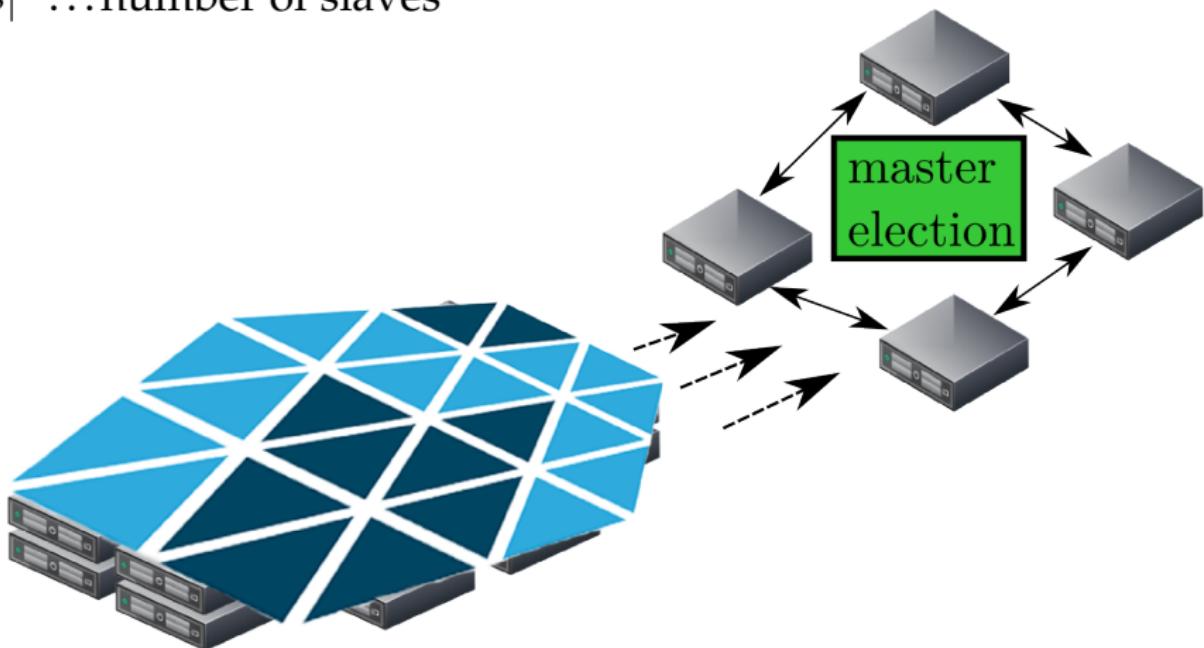


# Mesos scheme

- usually 4-6 standby masters are enough
- tolerant to  $|m|$  failures,  $|s| \gg |m|$

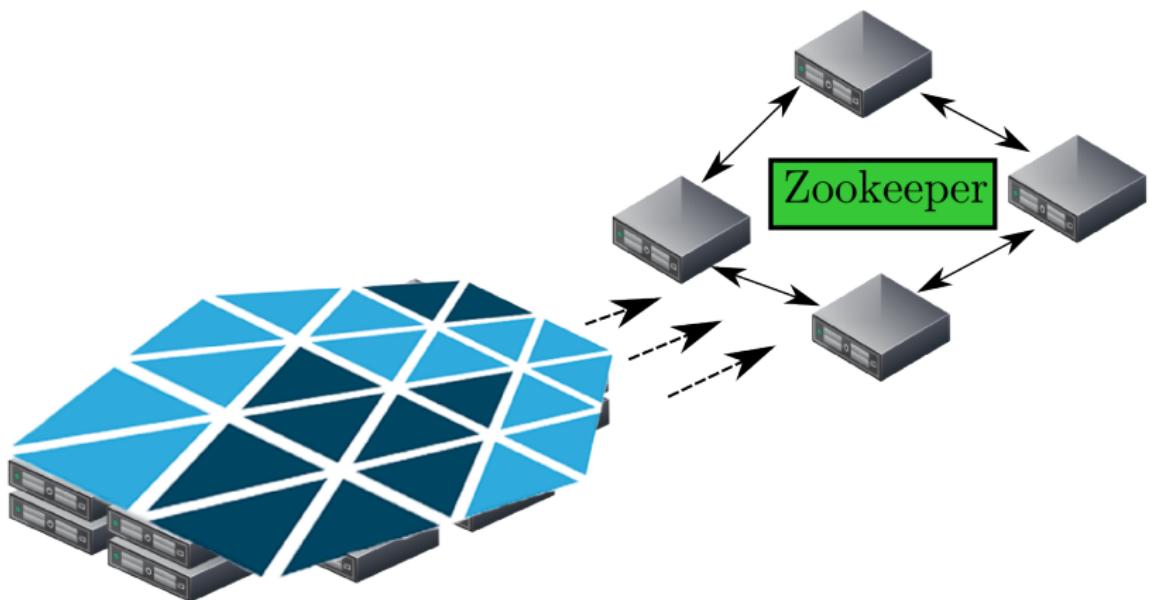
$|m|$  ... number of standby masters

$|s|$  ... number of slaves



# Mesos scheme

- each slave obtain master's IP from Zookeeper
- e.g. zk://192.168.1.1:2181/mesos



# Common delusion

- ① Network is reliable
- ② Latency is zero
- ③ Transport cost is zero
- ④ The Network is homogeneous

# Cloud Computing

*design your application for failure*

- split application into multiple components
- every component must have redundancy
- no common points of failure



“If I seen further than  
others it is by standing  
upon the shoulders of  
giants.”

*Sir Isaac Newton*

# ZooKeeper



# ZooKeeper



# ZooKeeper



YAHOO!



# ZooKeeper



- not a key-value storage
- not a filesystem
- 1 MB item limit

# Frameworks

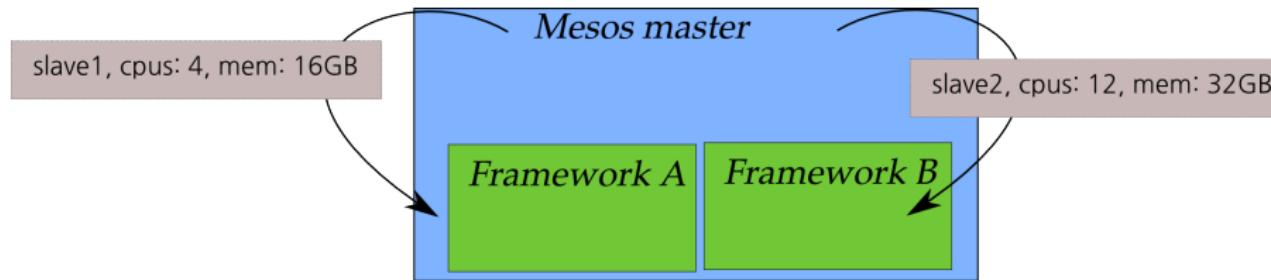
- **framework** – application running on Mesos

two components:

- ❶ scheduler
- ❷ executor

# Scheduling

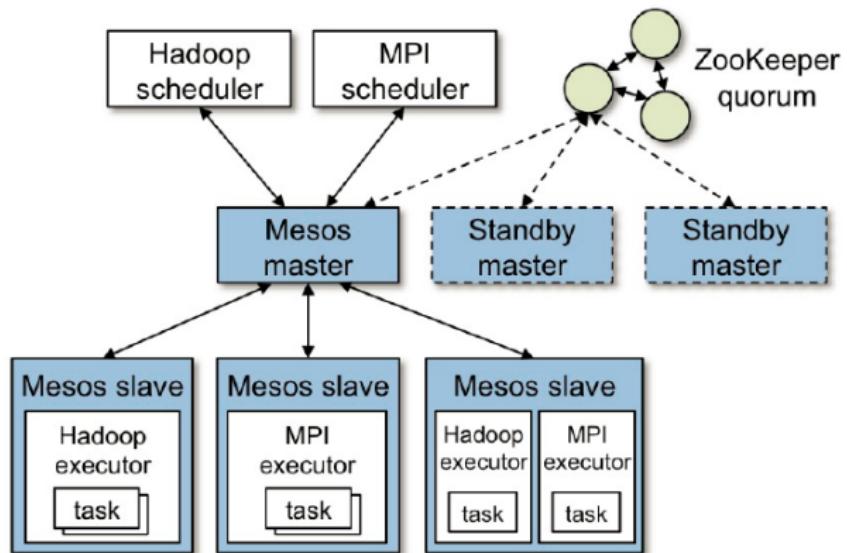
- two levels scheduler



- Dominant Resource Fairness

# Mesos architecture

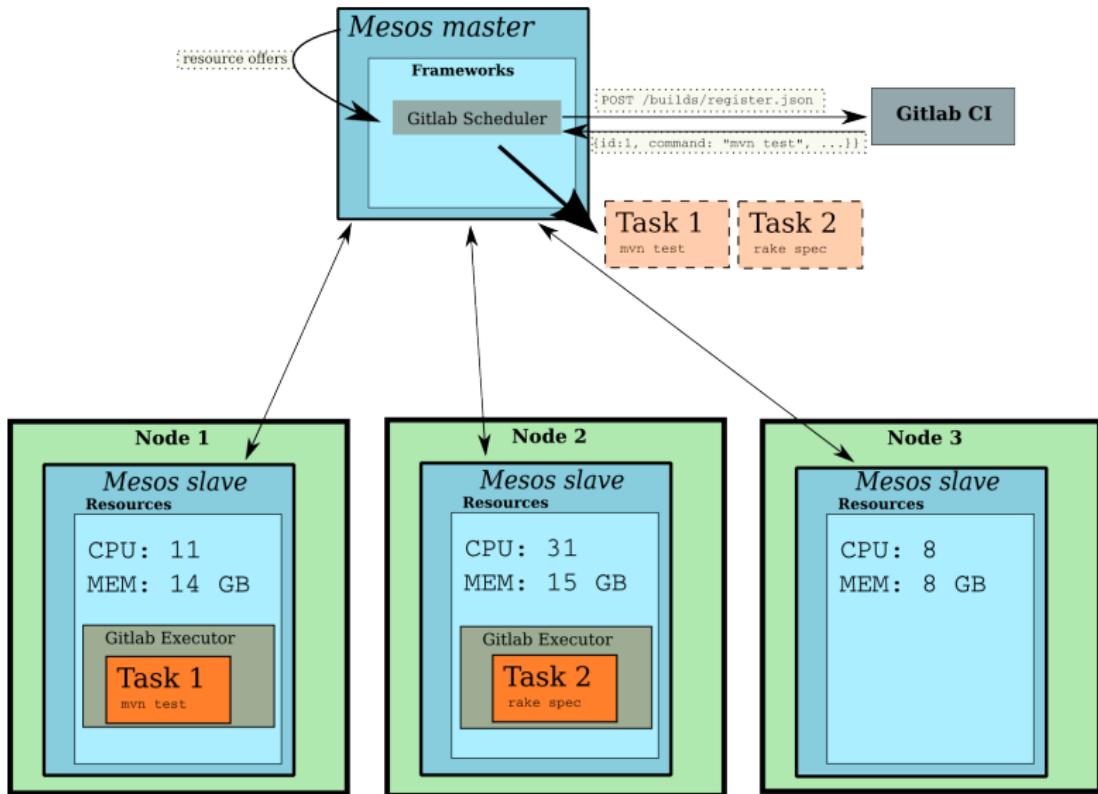
- fault tolerant
- scalable

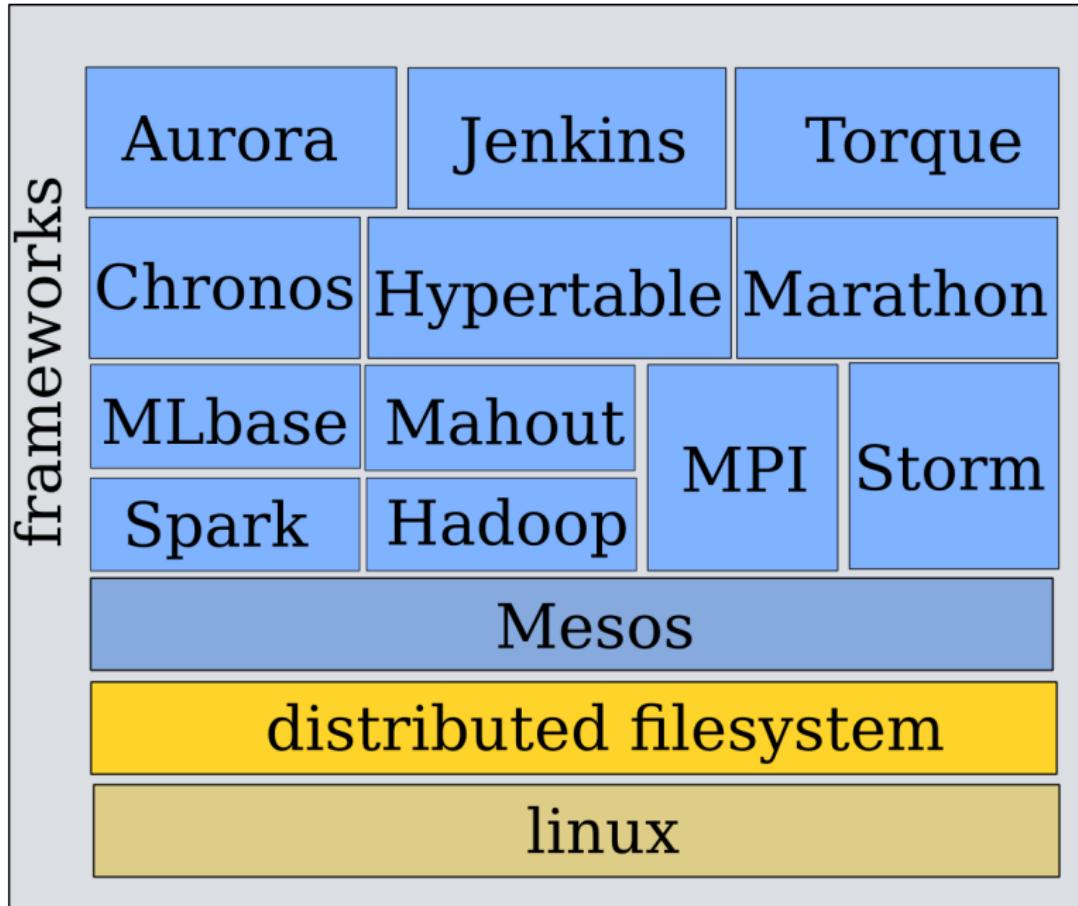


# Isolation

- using cgroups
- isolates:
  - CPU
  - memory
  - I/O
  - network

# Example usage – GitLab CI





# AirBnB

Mesos Home Dashboard Frameworks Slaves

aircluster h1

Cluster: aircluster h1  
Server:  
Built: 3 weeks ago by  
Started: 3 days ago  
ID: ...19231

LOG

## Slaves

Activated 173

Deactivated 0

## Tasks

Staged 37,555

Started 0

Finished 31,048

Killed 5,643

Failed 457

Lost 94

## Resources

CPU<sup>s</sup> Mem

Total 5,158 9618 GB

Used 4,935.100 8470 GB

Offered 62.200 173 GB

Idle 160.700 974 GB

## Active Frameworks (see all)

ID	User	Name	Active Tasks	CPU <sup>s</sup>	Mem	Max Share	Registered	Re-Registered
...	root	chronos1373749407345	12	55.400	106 GB	1.101%	2 days ago	
...4952-0007	mapred	Hadoop: (RPC port: 54311, WebUI port: 50030)	185	4,920.600	8452 GB	95.397%	2 days ago	
...23629-0002	root	Storm!!!	9	21.300	86 GB	0.890%	2 days ago	

## Active Slaves (see all)

ID	Host	CPU <sup>s</sup>	Mem	Disk	Registered
...19231-99		32	56 GB	593 GB	2 days ago
...19231-98		32	56 GB	597 GB	2 days ago
...19231-97		32	56 GB	590 GB	2 days ago
...19231-96		32	56 GB	590 GB	2 days ago
...19231-95		32	56 GB	484 GB	2 days ago
...19231-94		32	56 GB	588 GB	2 days ago
...19231-93		32	56 GB	592 GB	2 days ago
...19231-92		32	56 GB	573 GB	2 days ago
...19231-91		32	56 GB	586 GB	2 days ago
...19231-90		32	56 GB	595 GB	2 days ago
...19231-89		32	56 GB	570 GB	2 days ago
...19231-88		32	56 GB	597 GB	2 days ago
...19231-87		32	56 GB	587 GB	2 days ago
...19231-86		32	56 GB	590 GB	2 days ago
...19231-85		32	56 GB	596 GB	2 days ago
...19231-83		32	56 GB	595 GB	2 days ago

# Any web application can run on Mesos

The screenshot shows the Marathon web interface at `localhost:8080`. The main view lists several applications:

- app\_12
- app\_15
- app\_2
- app\_26
- app\_29
- app\_29asdf
- app\_35
- app\_41
- eat-apples
- parent

A modal window is open for the "parent" application, displaying its configuration and instance details:

**parent**

ID	Hosts	Ports	CPUs	Instances
parent_5-1389222699093	naboo	31028	0.1	2
parent_1-1389222680078	naboo	31055	0.1	3
parent_0-1388718294859	naboo	31001	0.1	2
parent_7-1389222709102	naboo	31023	0.1	4
parent_6-1389222704097	naboo	31135	0.1	1
parent_2-1389222685082	naboo	31002	0.1	5
parent_4-1389222693088	naboo	31296	0.1	8
parent_3-1389222688084	naboo	31366	0.3	8

At the bottom of the modal are three buttons: **DESTROY**, **SUSPEND**, and **SCALE**.

# Distributed cron

**CHRONOS**

hostings

**256** TOTAL JOBS

**16** FAILED JOBS

NAME	GRAPH	LAST
create_airbed_dump_table_hostings	L3	success
create_airbed3_dump_table-hostings_first...	L3	success
create_airbed_dump_table_hostings_with_...	L3	success
create_airbed_dump_table_collection_host...	L3	success
create_omg_table-affiliate_events_hostings	L3	success
hostings_summary	L3	success
daily_gibson-import_airbed3_hostings	L3	success
db_export-airbed hostings	L3	success
hostings_summary_2_quality_score	L3	success
hostings_summary_1_pre	L3	success
hostings_impressions_normalize	L3	success
hostings_impressions_normalize_prepare	L3	success
daily-update_hostings_summary_history	L3	success
hostings_earnings_summary#async	L3	success
daily-create_hostings_history	L3	success
daily-update_hostings_history	L3	success
daily-create_hostings_summary_history	L3	success

Create  Cancel

NAME: **Steve\_Jobs**

COMMAND:  
`echo 'FOO' >> /tmp/steve.txt`

PARENTS: Choose parents...

OWNER: `steam@airbnb.com`

SCHEDULE:  T 11:44:03 Z/ P T24H

EPSILON: PT15M

EXECUTOR: /custom/execu



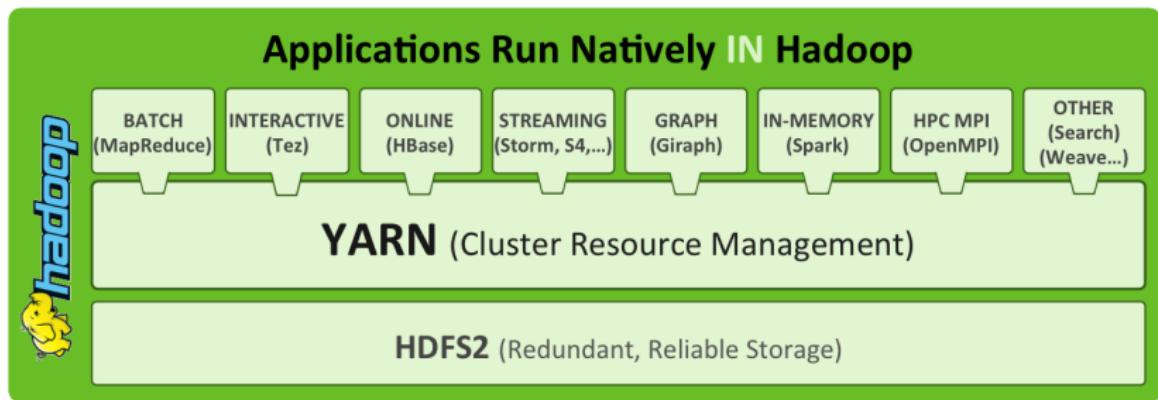
NAME: **daily\_gibson-default\_data\_cooked\_table\_import**

COMMAND:

# YARN

Alternative to Mesos

- Yet Another Resource Negotiator



# Where to get Mesos?

- tarball – <http://mesos.apache.org>
- deb, rpm – <http://mesosphere.io/downloads/>
- custom package – <https://github.com/deric/mesos-deb-packaging>



- AWS instance in few seconds –  
<https://elastic.mesosphere.io/>

# Configuration management

- automatic server configuration
- portable
- should work on most Linux distributions (currently Debian, Ubuntu)
- <https://github.com/deric/puppet-mesos>



01000110 Fakulta  
01001001 Informačních  
01010100 Technologií



DATA SCIENCE LABORATORY

Thank you for attention!

[tomas.barton@fit.cvut.cz](mailto:tomas.barton@fit.cvut.cz)

# Resources

- Containers – Not Virtual Machines – Are the Future Cloud
- Managing Twitter clusters with Mesos
- Return of the Borg: How Twitter Rebuilt Google's Secret Weapon
- Mesos: A Platform for Fine-Grained Resource Sharing in the Data Center, Hindman, Benjamin and Konwinski, Andrew and Zaharia, Matei and Ghodsi, Ali and Joseph, Anthony D. and Katz, Randy H. and Shenker, Scott and Stoica, Ion; EECS Department, University of California, Berkeley 2010