



# Hadoop Infrastructure @Uber Past , Present and Future

Mayank Bansal



# Uber's Mission

“ Transportation as reliable as running water ,  
everywhere, for everyone ”

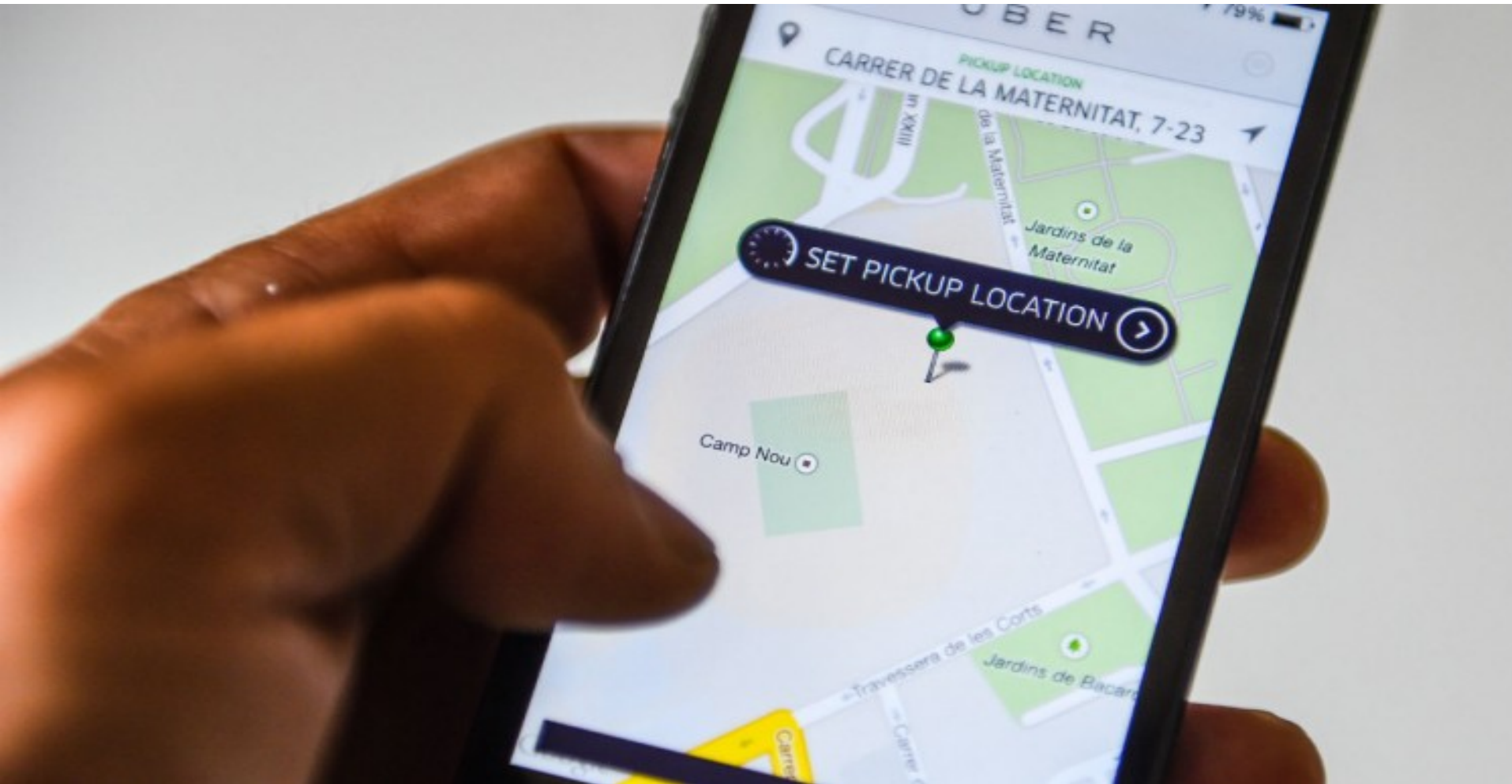
75+ Countries

500+ Cities

And growing...

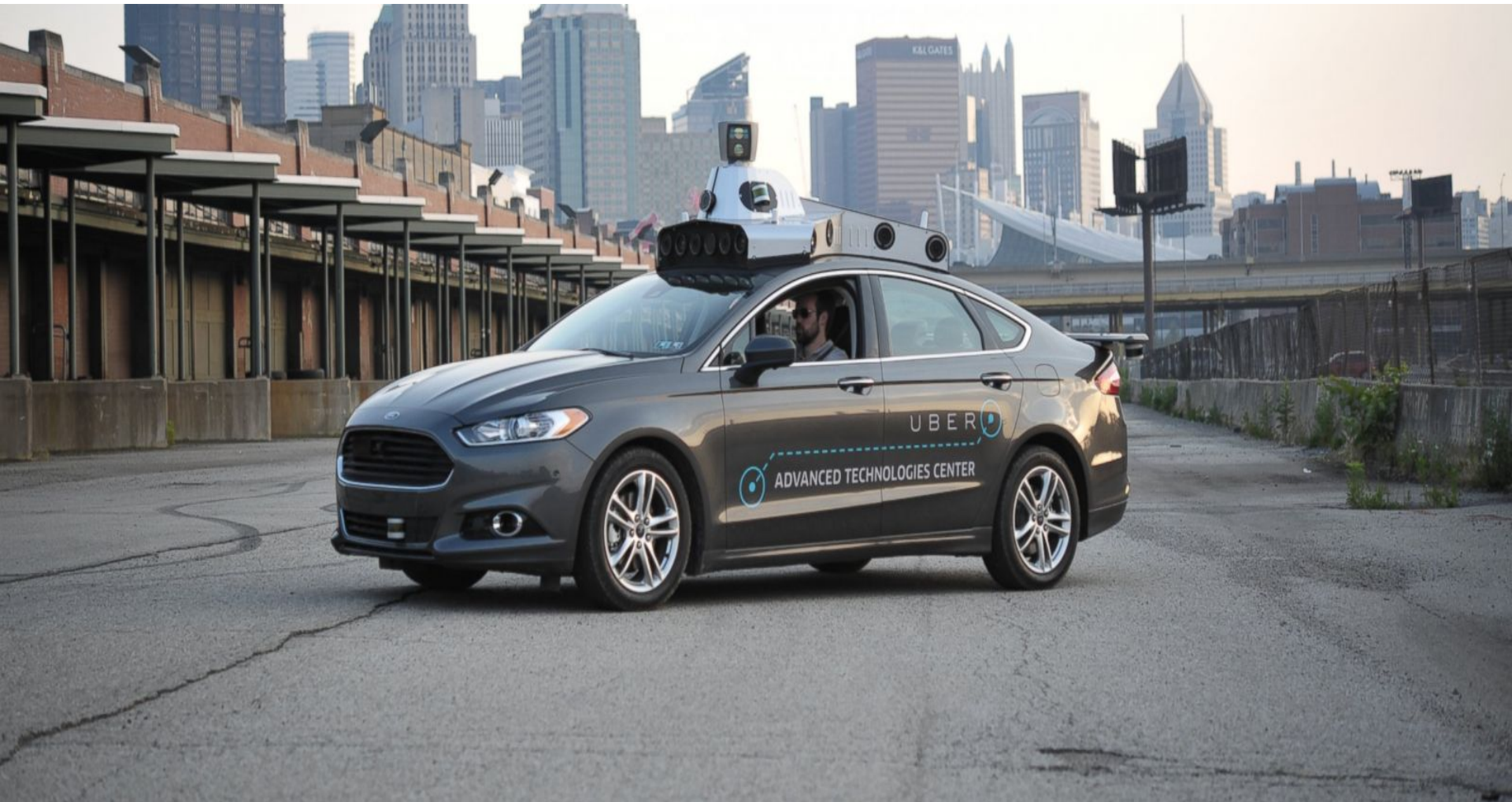


# How Uber works





# How Uber works





# How Uber works



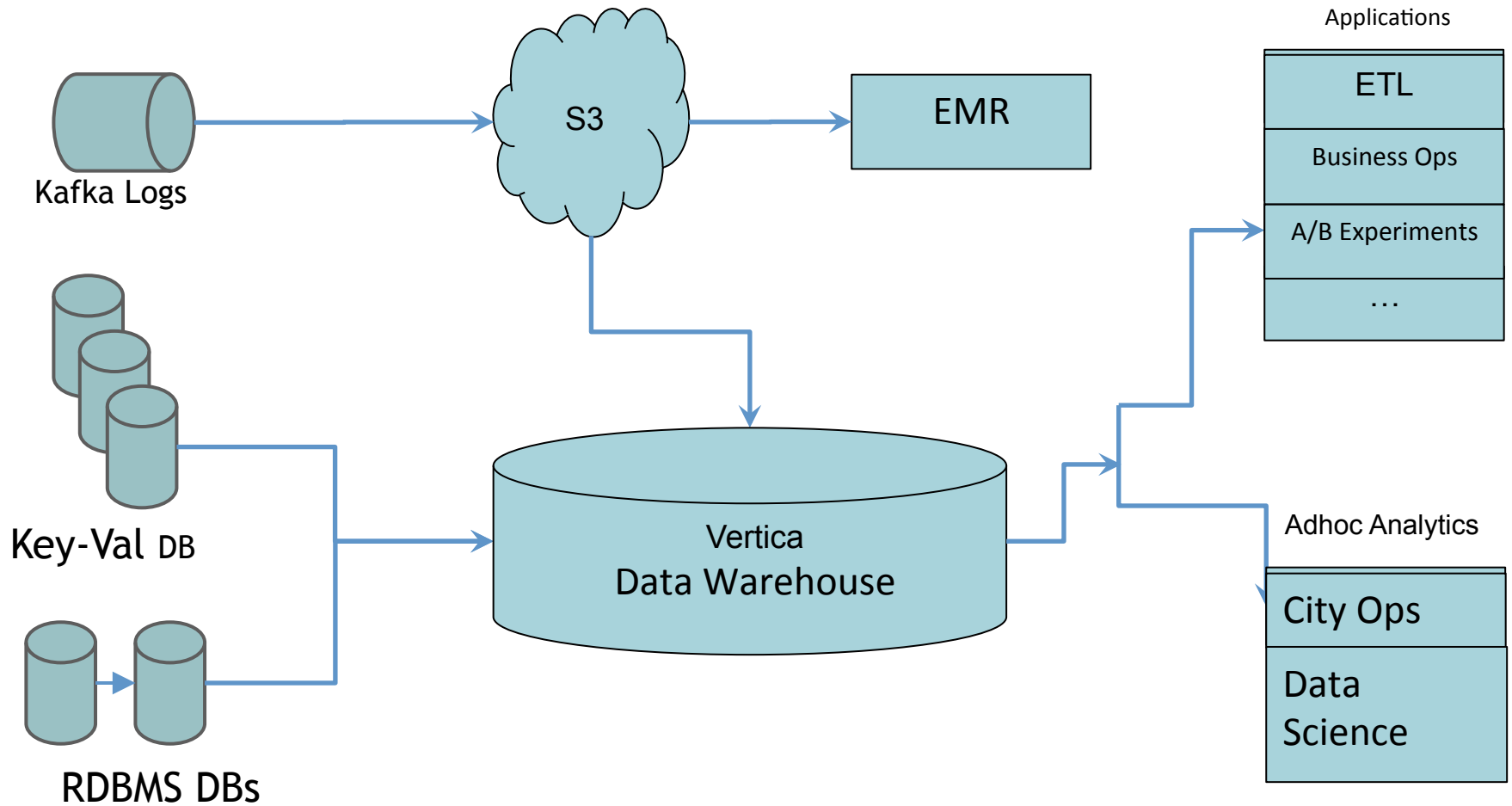


# Data Driven Decisions



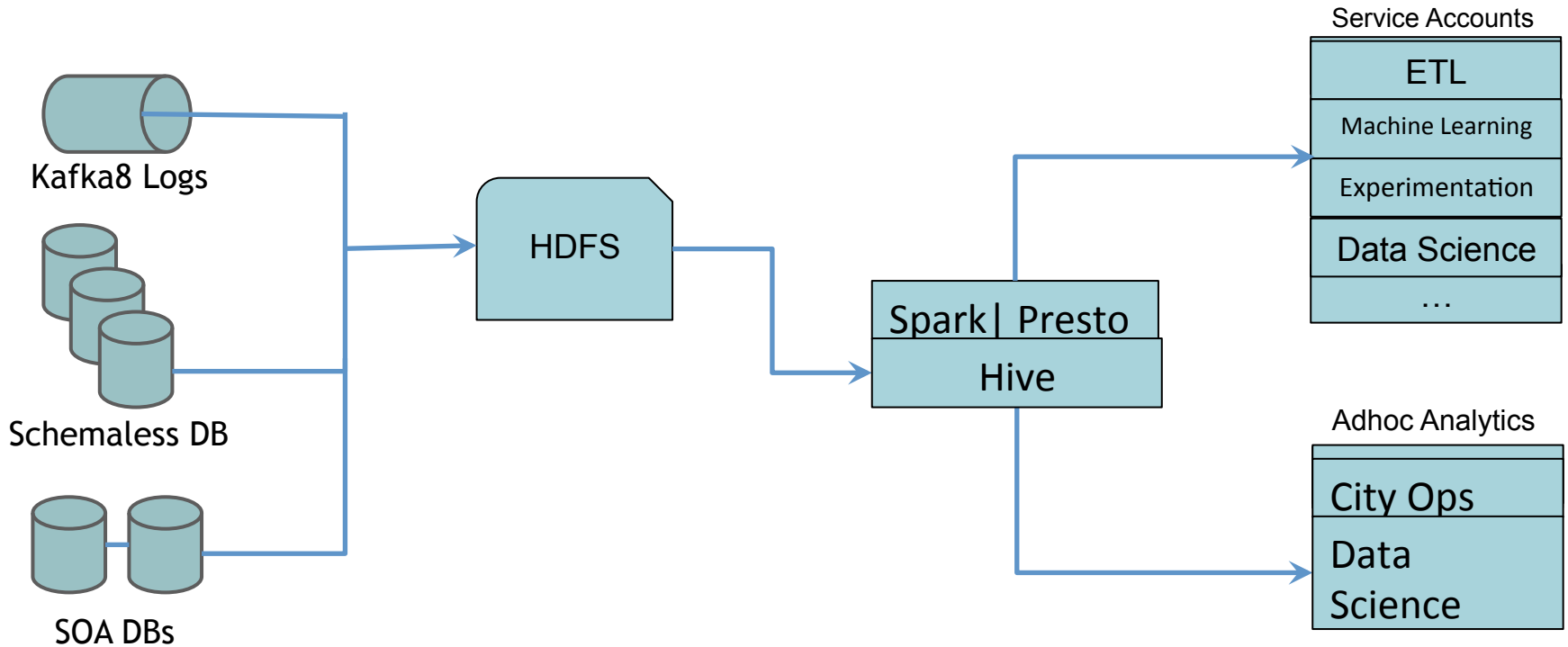


# Data Infra Once Upon a time.. (2014)





# Data Infrastructure Today



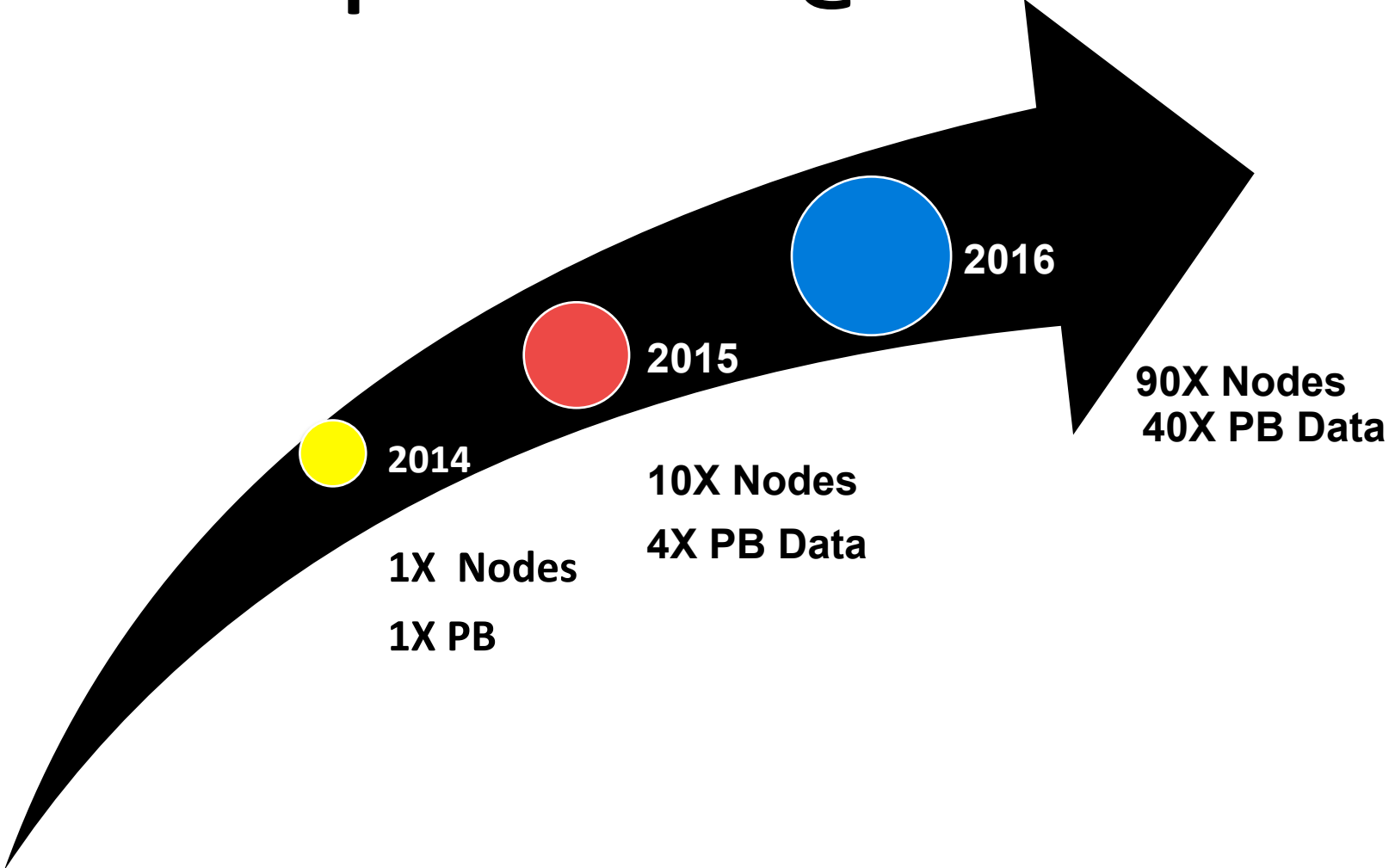


# Few Takeaways ...

- **Strict Schema Management**
  - Because our largest data audience are SQL Savvy! (1000s of Uber Ops!)
  - SQL = Strict Schema
- **Big Data Processing Tools Unlocked - Hive, Presto and Spark**
  - Migrate SQL savvy users from Vertica to Hive & Presto (1000s of Ops & 100s of data scientists & analysts)
  - Spark for more advanced users - 100s of data scientists

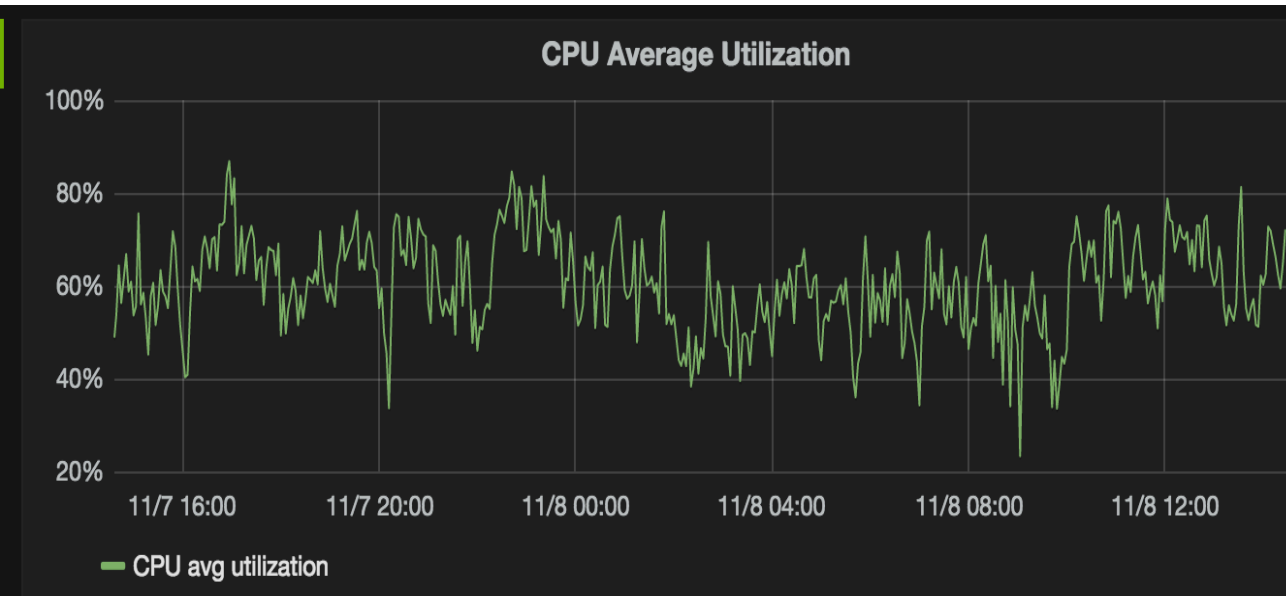


# Hadoop Evolution @ Uber

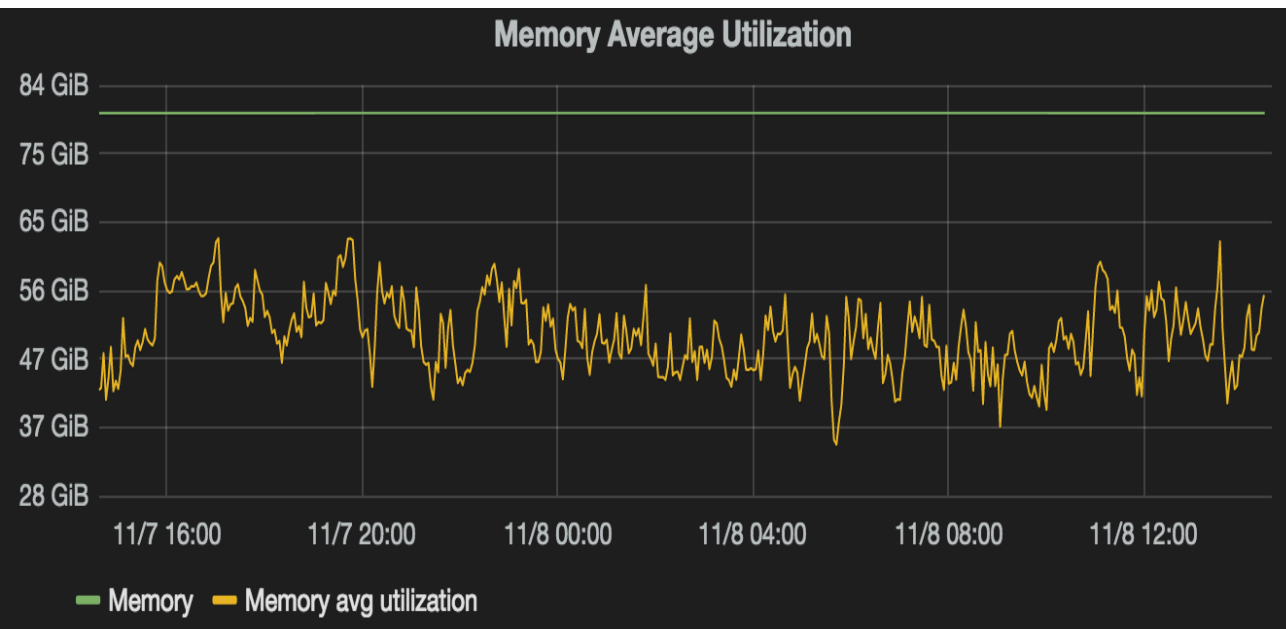




# Hadoop Cluster Utilization



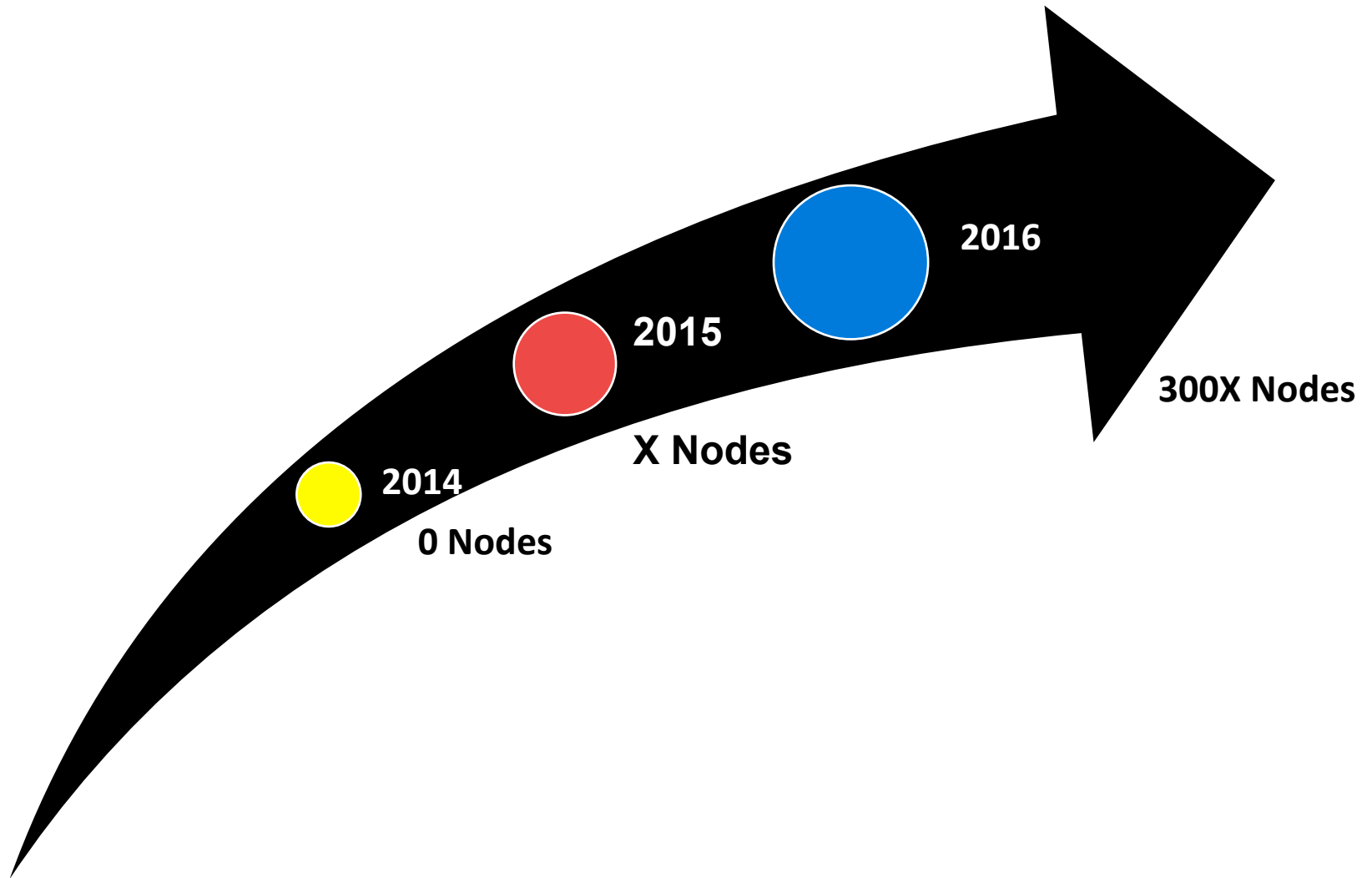
- Over provisioning for the peak loads.



- Over capacity for anticipation of future growth

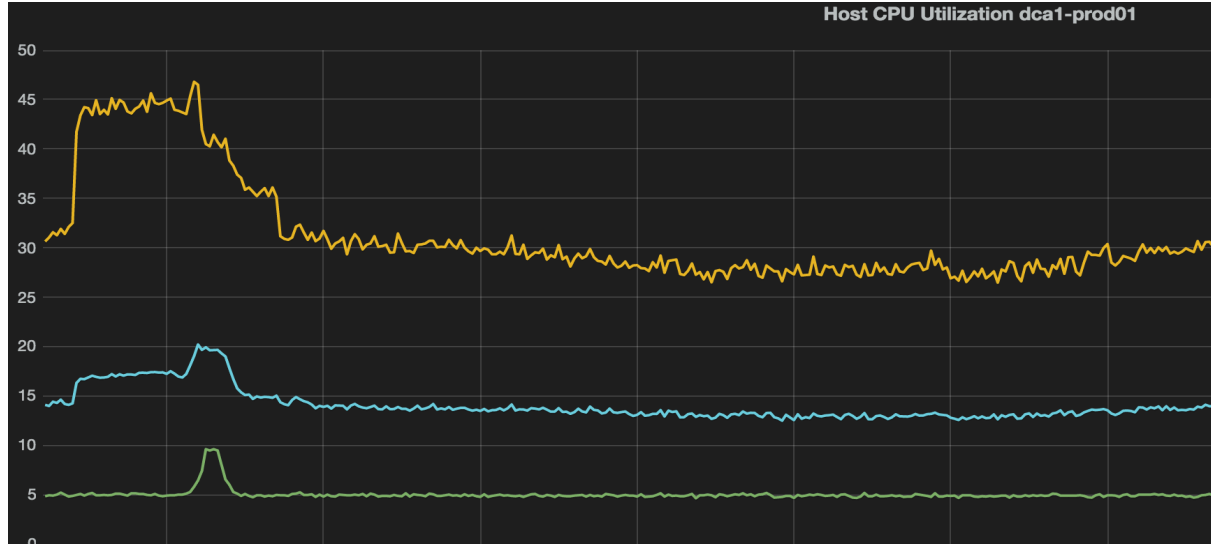


# Mesos Evolution @ Uber





# Mesos Cluster Utilization



- Over provisioning for the peak loads

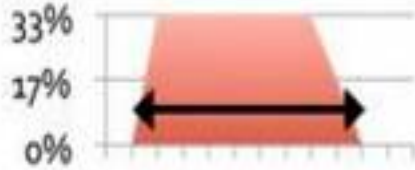


- Over capacity for anticipation of future growth

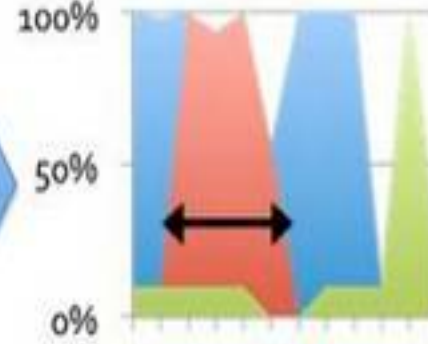


# End Goal

## Today: App Silos



## Mixed Workloads



Shared Cluster



# What we need ?

## GLOBAL VIEW OF RESOURCES





# Available Resource Managers







# Mesos vs YARN

| YARN                                 | MESOS  |
|--------------------------------------|--|
| Single Level Scheduler               | Two Level Scheduler  |
| Use C groups for isolation           | Use C groups for Isolation   |
| CPU, Memory as a resource            | CPU, Memory and Disk as a resource                                 |
| Works well with Hadoop work loads    | Works well with longer running services                            |
| YARN support time based reservations | Mesos does not have support of reservations                        |
| Dominant resource scheduling         | Scheduling is done by frameworks and depends on case to case basis |

**Similar Isolation** (points to 'Use C groups for isolation' in both)

**Scales Better** (points to 'Two Level Scheduler' in Mesos)

**Disk is better** (points to 'CPU, Memory and Disk as a resource' in Mesos)

**Better for batch** (points to 'Dominant resource scheduling' in YARN)

**This is Important** (points to 'Scheduling is done by frameworks and depends on case to case basis' in Mesos)

**Imp for batch SLA's** (points to 'Scheduling is done by frameworks and depends on case to case basis' in Mesos)



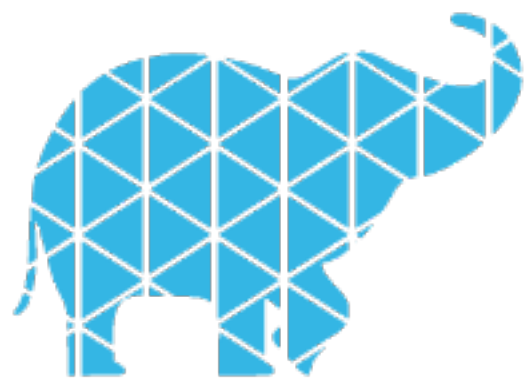
# Let's tied them together

## In a Nutshell

YARN is good for Hadoop

Mesos is good for Longer Running Services





apache<sup>TM</sup>  
**myriad**



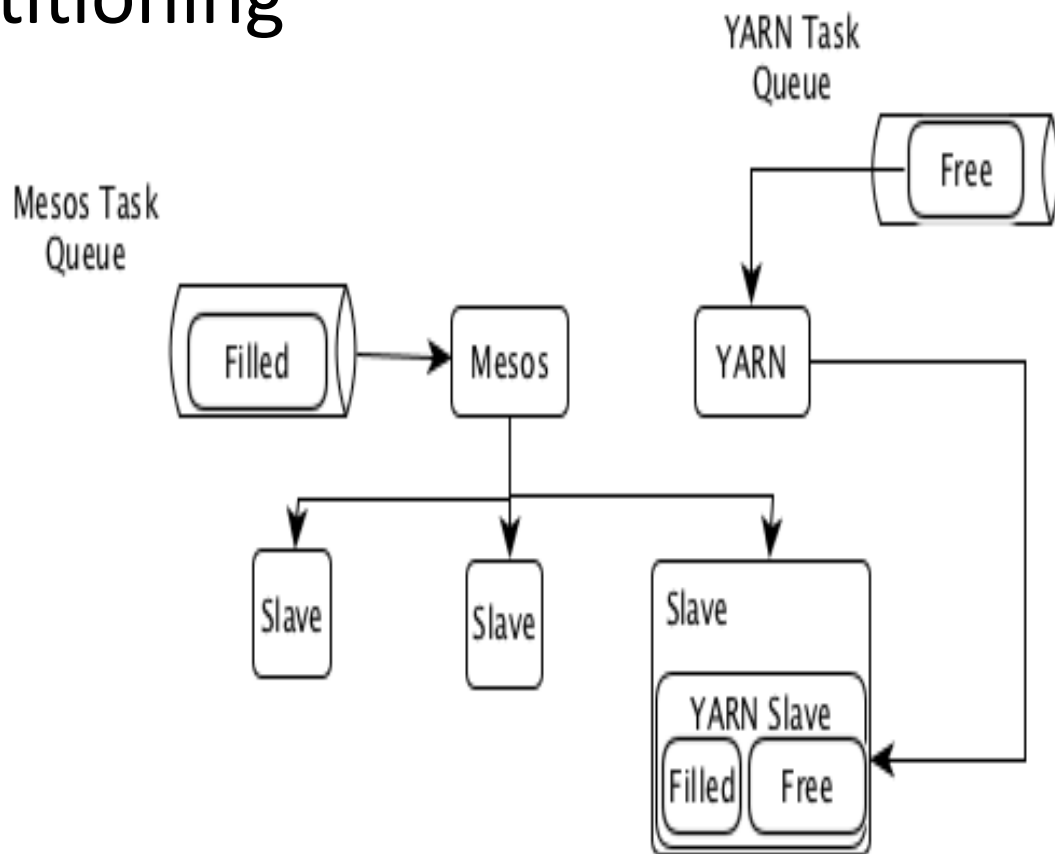
- Myriad is Mesos Framework for Apache YARN
- Mesos manages Data Center resources
- YARN manages Hadoop workloads
- Myriad
  - Gets resources from Mesos
  - Launches Node Managers



# Myriad's Limitations

## Static Resource Partitioning

- YARN will handle resources handed over to it.
- Mesos will work on rest of the resources

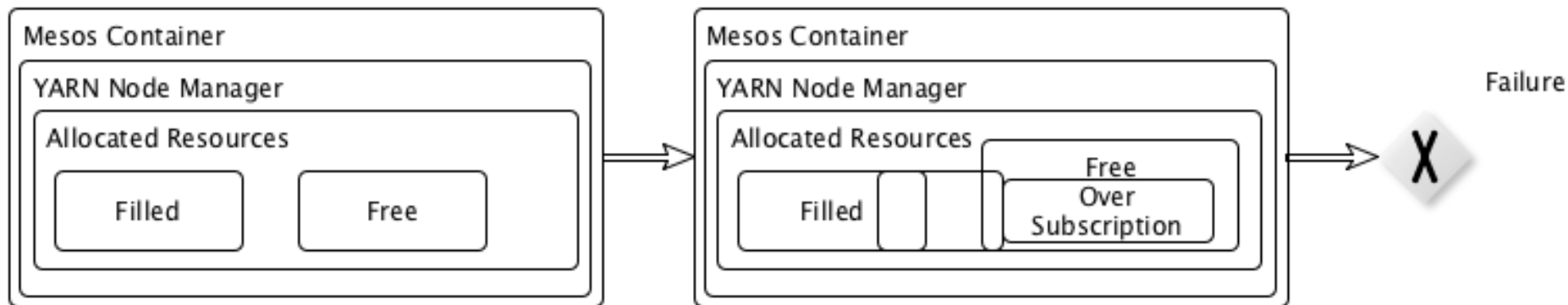




# Myriad's Limitations

## Resource Over Subscription

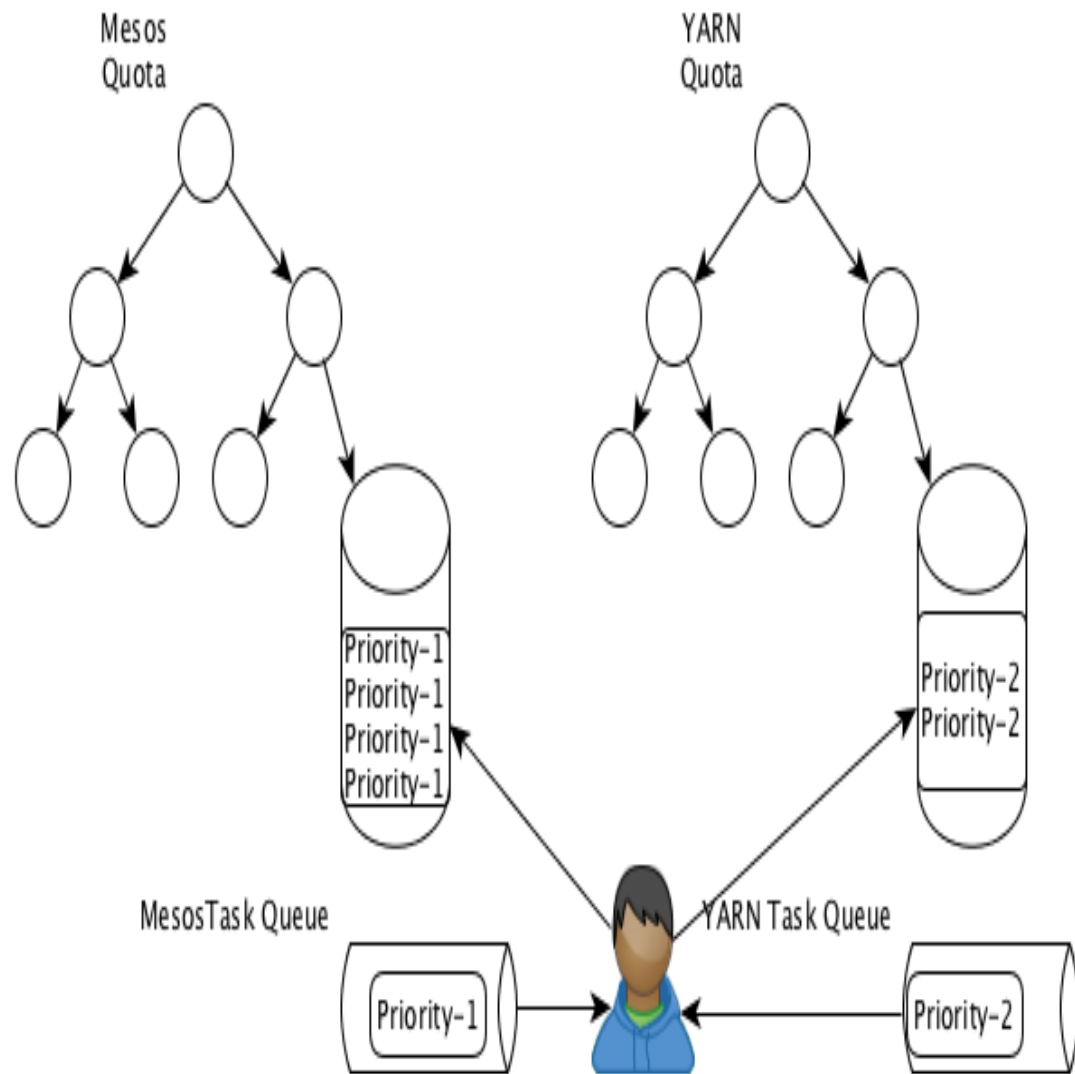
- YARN will never be able to do over subscription.
  - Node Manager will go away
  - Fragmentation of resources
- Mesos over subscription can kill YARN too





# Myriad's Limitations

- No Global Quota Enforcement
- No Global Priorities





# Myriad's Limitations

- Elastic Resource Management
- Bin Packing
- Stability
- Long List ...





# Unified Scheduler



**UBER**

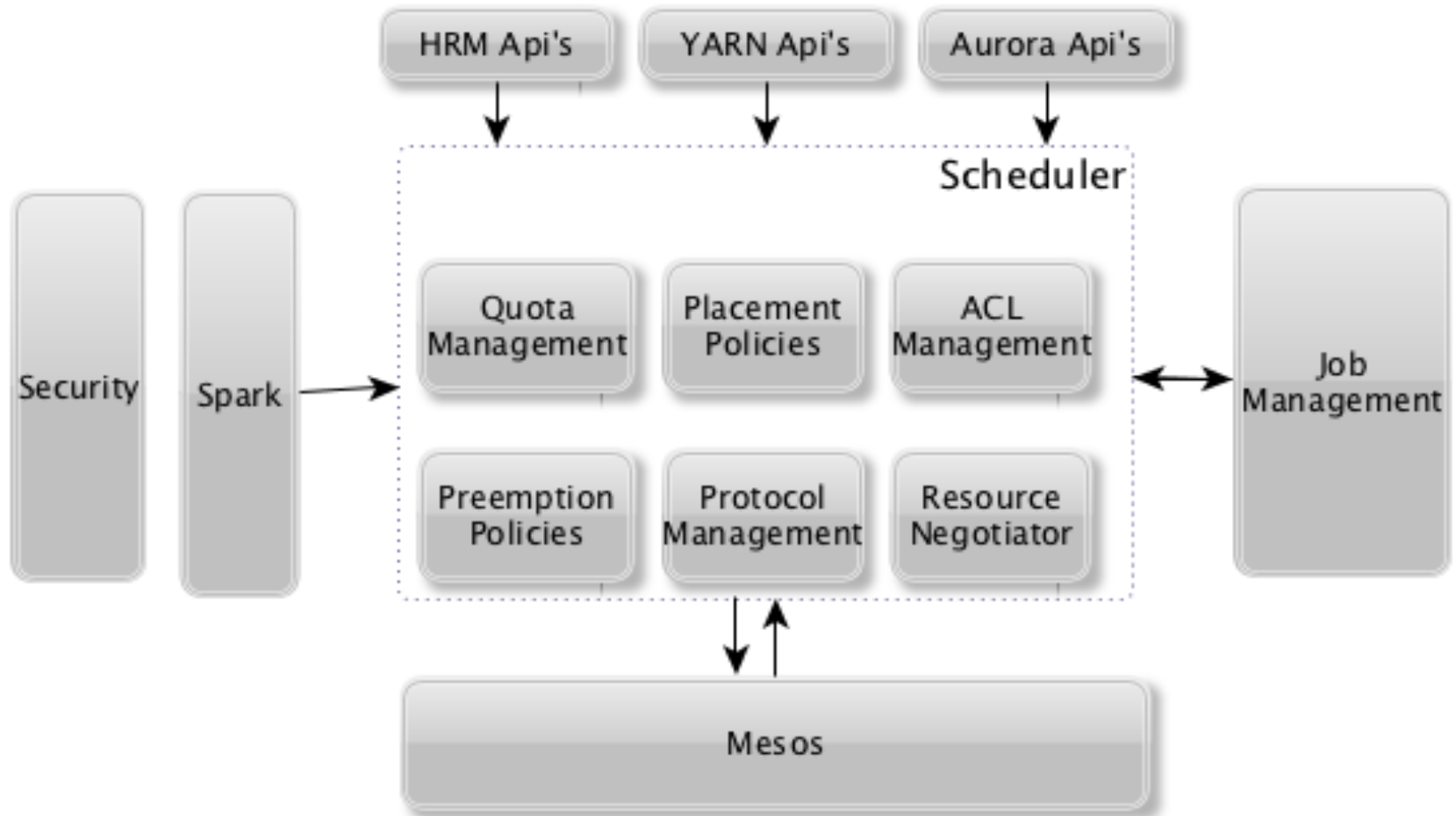


# High Level Characteristics

- Global Quota Management
- Central Scheduling policies
- Over subscription for both Online and Batch
- Isolation and bin packing
- SLA guarantees at Global Level



# Unified Scheduler





# Few Takeaways ...

- We need one scheduling layer across all workloads
- Partitioning resources are not good
  - At least can save 30% resources
- Stability and simplicity wins in Production
  - Multi Level of resource Management and scheduling will not be scalable



*Yes* We're  
**HIRING**





# Questions?

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Thank You !!!

