



Extending Hadoop beyond MapReduce

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Bio

- Apache Hadoop since 2006 - committer and PMC member
 - Developed and supported Map Reduce @Yahoo!
 - Core member of design and development team on MR Next Gen
- Apache ZooKeeper since 2008 – committer and current PMC chair
 - Lead Apache ZooKeeper development and support @ Yahoo!
- Co-founder @hortonworks

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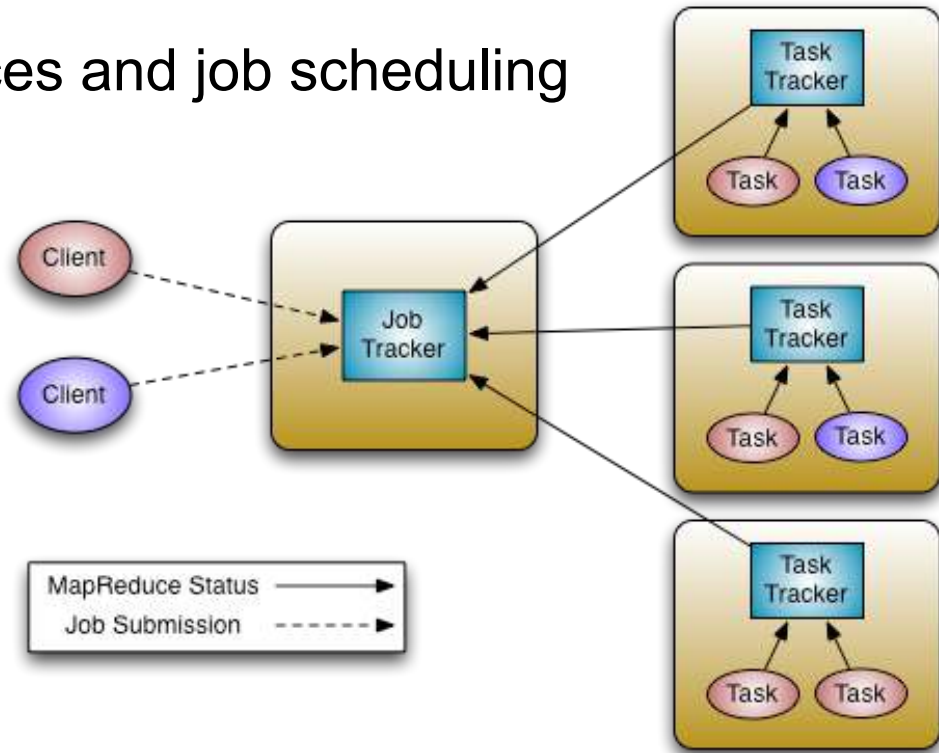
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Agenda

- Overview
- Current Limitations and Requirements
- Architectures
- Improvements and Updates
- Q&A

Hadoop MapReduce Classic

- JobTracker
 - Manages cluster resources and job scheduling
- TaskTracker
 - Per-node agent
 - Manage tasks



Current Limitations

- Hard partition of resources into map and reduce slots
 - Low resource utilization
- Lacks support for alternate paradigms
 - Iterative applications implemented using MapReduce are 10x slower
 - Hacks for the likes of MPI/Graph Processing
- Lack of wire-compatible protocols
 - Client and cluster must be of same version
 - Applications and workflows cannot migrate to different clusters

Current Limitations

- Utilization
- Scalability
 - Maximum Cluster size – 4,000 nodes
 - Maximum concurrent tasks – 40,000
 - Coarse synchronization in JobTracker
- Single point of failure
 - Failure kills all queued and running jobs
 - Jobs need to be re-submitted by users
- Restart is very tricky due to complex state

Requirements

- Reliability
- Availability
- Utilization
- Wire Compatibility
- Agility & Evolution – Ability for customers to control upgrades to the grid software stack.
- Scalability - Clusters of 6,000-10,000 machines
 - Each machine with 16 cores, 48G/96G RAM, 24TB/36TB disks
 - 100,000+ concurrent tasks
 - 10,000 concurrent jobs

Design Centre

- Split up the two major functions of JobTracker
 - Cluster resource management
 - Application life-cycle management
- MapReduce becomes **user-land** library

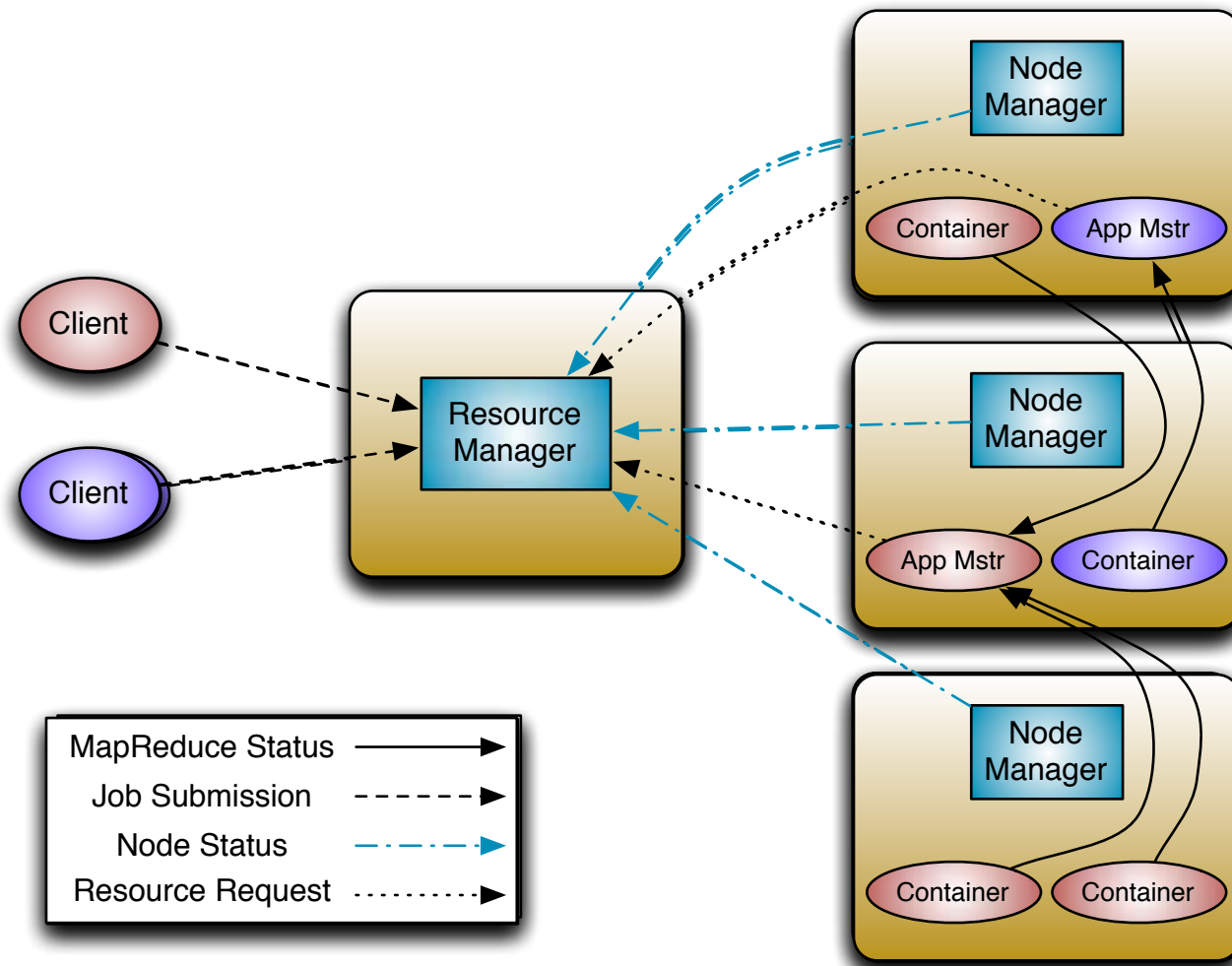
Architecture

- Application
 - Application is a job submitted to the framework
 - Example – Map Reduce Job
- Container
 - Basic unit of allocation
 - Example – container A = 2GB, 1CPU
 - Replaces the fixed map/reduce slots

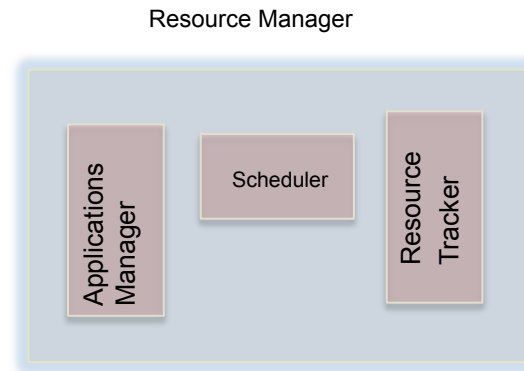
Architecture

- Resource Manager
 - Global resource scheduler
 - Hierarchical queues
- Node Manager
 - Per-machine agent
 - Manages the life-cycle of container
 - Container resource monitoring
- Application Master
 - Per-application
 - Manages application scheduling and task execution
 - E.g. MapReduce Application Master

Architecture



Architecture – Resource Manager



- Applications Manager
 - Responsible for launching and monitoring Application Masters (per Application process)
 - Restarts an Application Master on failure
- Scheduler
 - Responsible for allocating resources to the Application
- Resource Tracker
 - Responsible for managing the nodes in the cluster

Improvements vis-à-vis classic MapReduce

- Utilization
 - Generic resource model
 - Memory
 - CPU
 - Disk b/q
 - Network b/w
 - Remove fixed partition of map and reduce slot
- Scalability
 - Application life-cycle management is very expensive
 - Partition resource management and application life-cycle management
 - Application management is distributed
 - Hardware trends - Currently run clusters of 4,000 machines
 - 6,000 2012 machines > 12,000 2009 machines
 - <16+ cores, 48/96G, 24TB> v/s <8 cores, 16G, 4TB>

Improvements vis-à-vis classic MapReduce

- Fault Tolerance and Availability
 - Resource Manager
 - No single point of failure – state saved in ZooKeeper (coming soon)
 - Application Masters are restarted automatically on RM restart
 - Application Master
 - Optional failover via application-specific checkpoint
 - MapReduce applications pick up where they left off via state saved in HDFS
- Wire Compatibility
 - Protocols are wire-compatible
 - Old clients can talk to new servers
 - Rolling upgrades

Improvements vis-à-vis classic MapReduce

- Innovation and Agility
 - MapReduce now becomes a user-land library
 - Multiple versions of MapReduce can run in the same cluster (a la Apache Pig)
 - Faster deployment cycles for improvements
 - Customers upgrade MapReduce versions on their schedule
 - Users can customize MapReduce

Improvements vis-à-vis classic MapReduce

- Support for programming paradigms other than MapReduce
 - MPI
 - Master-Worker
 - Machine Learning
 - Iterative processing
 - Enabled by allowing the use of paradigm-specific application master
 - Run all on the same Hadoop cluster

Is it released?

- Available in 0.23.1 release
- Coming soon 0.23.2 release

Any Performance Gains?

- 2x+ across the board
- MapReduce
 - Unlock lots of improvements from Terasort record (Owen/Arun, 2009)
 - Shuffle 30%+
 - Small Jobs – Uber AM
 - Re-use task slots (container reuse)

[More details: http://hortonworks.com/delivering-on-hadoop-next-benchmarking-performance/](http://hortonworks.com/delivering-on-hadoop-next-benchmarking-performance/)

Testing?

- Testing, *lots* of it
- Benchmarks (every release should be at least as good as the last one)
- Integration testing
 - HBase
 - Pig
 - Hive
 - Oozie
- Functional tests
 - Nightly
 - Over 1000 functional tests for Map-Reduce alone
 - Several hundred for Pig/Hive etc.
- Deployment discipline

Benchmarks

- Benchmark every part of the HDFS & MR pipeline
 - HDFS read/write throughput
 - NN operations
 - Scan, Shuffle, Sort
- GridMixv3
 - Run production *traces* in test clusters
 - Thousands of jobs
 - Stress mode v/s Replay mode

Deployment

- Alpha/Test (early UAT) in November 2011
 - Small scale (500-800 nodes)
- Alpha in February 2012
 - Majority of users
 - ~1000 nodes per cluster, > 2,000 nodes in all
- Beta
 - *Misnomer*: 10s of PB of storage
 - Significantly wide variety of applications and load
 - 4000+ nodes per cluster, > 15000 nodes in all
 - Q2, 2012
- Production
 - Well, it's production
 - Mid-to-late Q2 2012

Questions?

hadoop-0.23.1 (alpha release):

<http://hadoop.apache.org/common/releases.html>

Release Documentation:

<http://hadoop.apache.org/common/docs/r0.23.1/>

Hortonworks website:

<http://hortonworks.com/>

Other Resources

- **Hadoop Summit**

- June 13-14
- San Jose, California
- www.Hadoopsummit.org



- **Hadoop Training and Certification**

- Developing Solutions Using Apache Hadoop
- Administering Apache Hadoop
- <http://hortonworks.com/training/>



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- <http://hortonworks.com/webinars/>

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Thank You

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