

A Reliable Memory-Centric Distributed Storage System

Haoyuan (HY) Li, Ali Ghodsi, Matei Zaharia,

Scott Shenker, Ion Stoica

September, 2014, ISTC @ Portland



Intel Science & Technology Center for Cloud Computing



Outline

- Overview
 - Feature 1: Memory Centric Storage Architecture
 - Feature 2: Lineage in Storage

Challenges

Open Source

Future

Outline

- Overview
 - Feature 1: Memory Centric Storage Architecture
 - Feature 2: Lineage in Storage

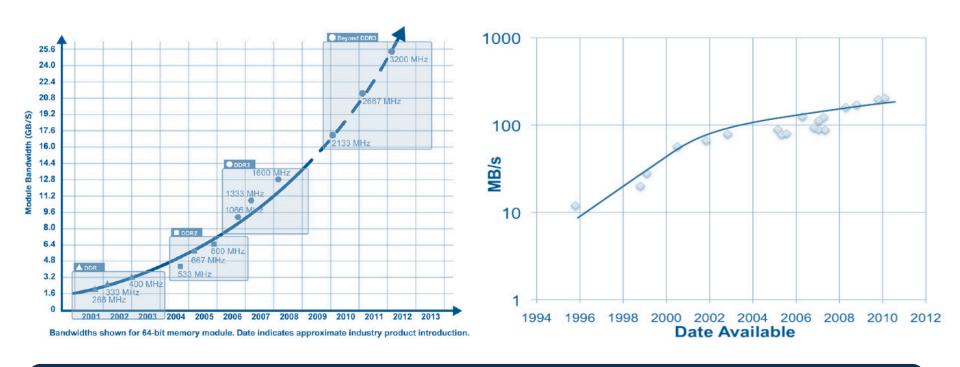
Challenges

Open Source

Future

Memory is King

- RAM throughput increasing exponentially
- Disk throughput increasing slowly



Memory-locality key to interactive response time

Realized by many...

Frameworks already leverage memory



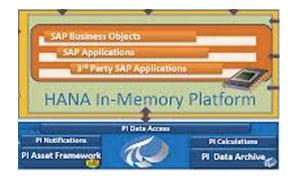


April 7, 2012

Many kinds of memory-centric data management

I'm frequently asked to generalize in some way about in-memory or memorycentric data management. I can start:

The desire for human real-time interactive response naturally leads to

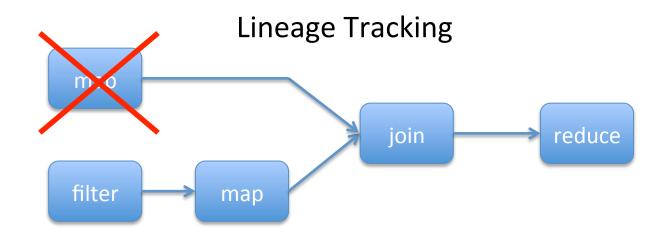




Problem solved?

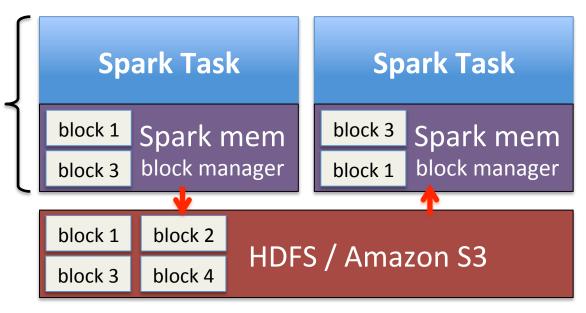
An Example: Spark

- Fast in-memory data processing framework
 - Keep one in-memory copy inside JVM
 - Track lineage of operations used to derive data
 - Upon failure, use lineage to recompute data



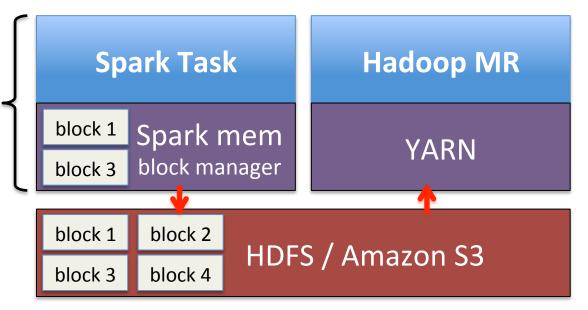
Data Sharing is the bottleneck in analytics pipeline: Slow writes to disk

storage engine & execution engine same process (slow writes)

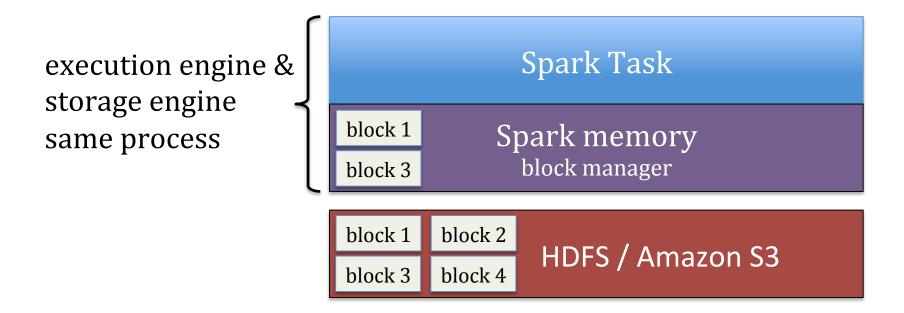


Data Sharing is the bottleneck in analytics pipeline: Slow writes to disk

storage engine & execution engine same process (slow writes)

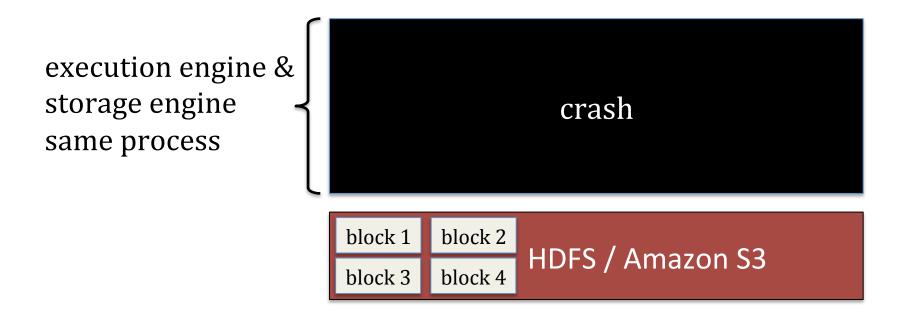


Cache loss when process crashes.



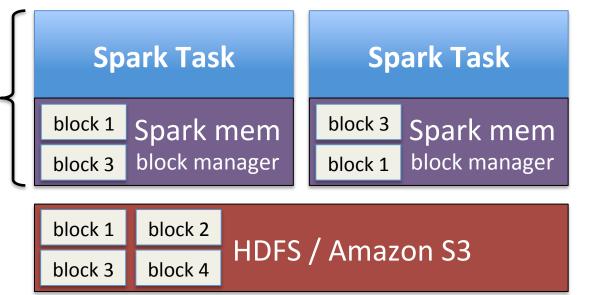
Cache loss when process crashes.

Cache loss when process crashes.



In-memory Data Duplication & Java Garbage Collection

execution engine & storage engine same process (duplication & GC)



Tachyon

Reliable data sharing at **memory-speed within and across** cluster frameworks/jobs

Solution Overview

Basic idea

- Feature 1: memory-centric storage architecture
- Feature 2: push lineage down to storage layer

Facts

- One data copy in memory
- Recomputation for fault-tolerance

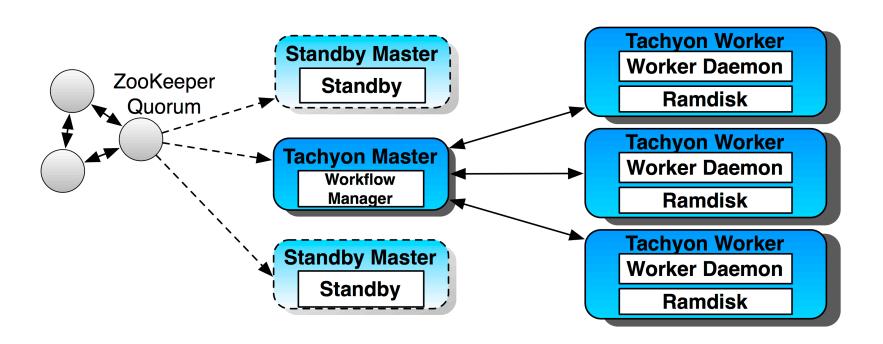
Stack

Computation Frameworks (Spark, MapReduce, Impala, H2O, ...)

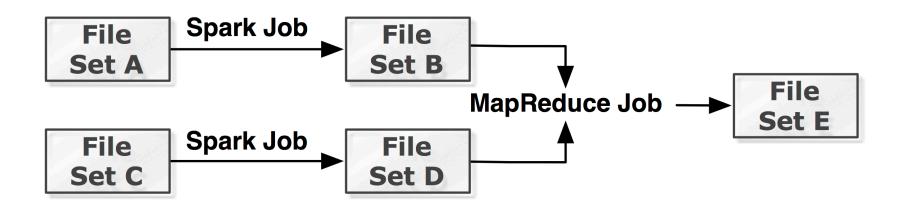
Tachyon

Existing Storage Systems (HDFS, S3, GlusterFS, ...)

Memory-Centric Storage Architecture



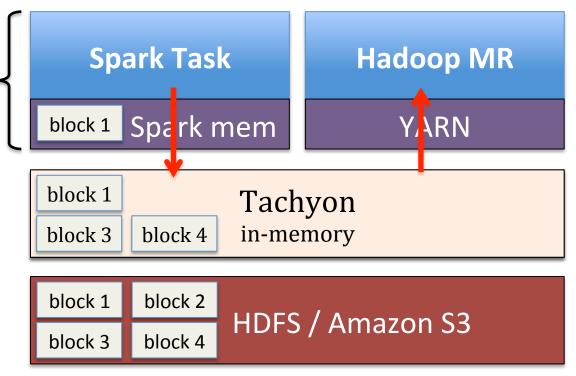
Lineage in Storage



Issue 1 revisited

Memory-speed data sharing among jobs in different frameworks

execution engine & storage engine same process (fast writes)



Issue 2 revisited

Keep in-memory data safe, even when a job crashes.

execution engine & storage engine same process

Spark Task

Spark memory
block manager

block 1 Tachyon
in-memory

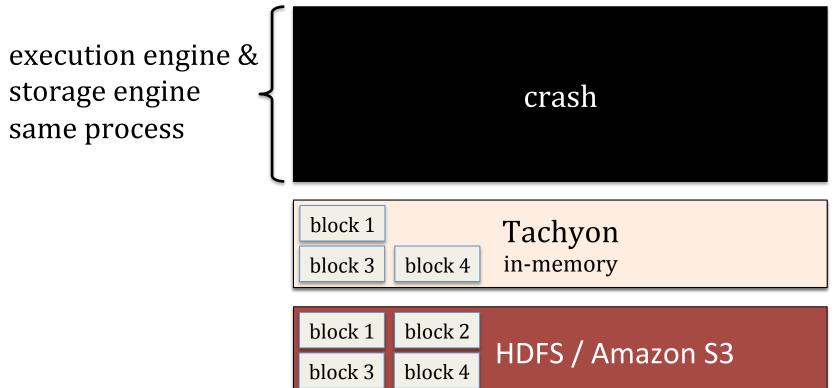
Issue 2 revisited

Keep in-memory data safe, even when a job crashes.

crash execution engine & storage engine Spark memory same process block manager block 1 Tachyon block 3 block 4 in-memory block 1 block 2 HDFS / Amazon S3 block 3 block 4

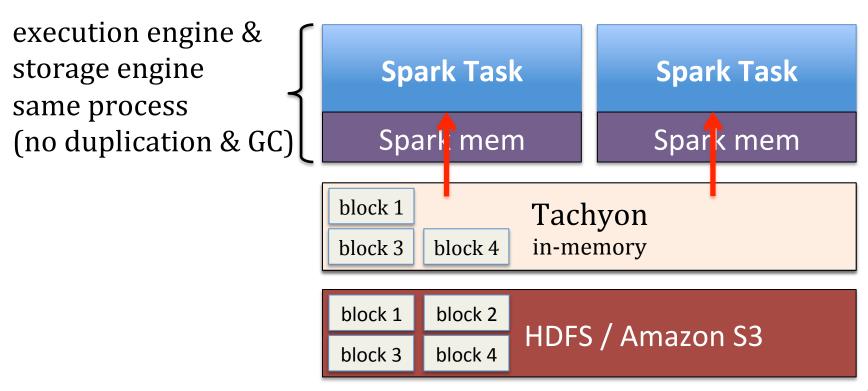
Issue 2 revisited

Keep in-memory data safe, even when a job crashes.



Issue 3 revisited

No in-memory data duplication, much less GC



Outline

- Overview
 - Feature 1: Memory Centric Storage Architecture
 - Feature 2: Lineage in Storage

Challenges

Open Source

Future

Question 1: How long to get missing data back?



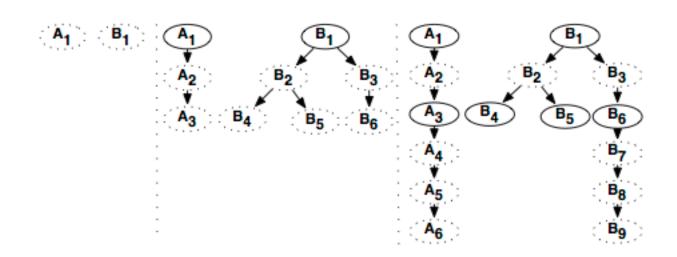
That server contains the data computed last month!



Lineage enables Asynchronous Checkpointing

Edge Algorithm

- Checkpoint leaves
- Checkpoint hot files
- Bounded Recovery Cost



Question 2: How to allocate recomputation resource?

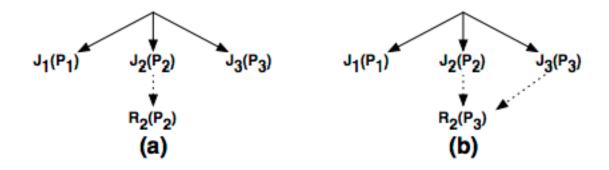


Would recomputation slow down my high priority jobs? Priority Inversion?

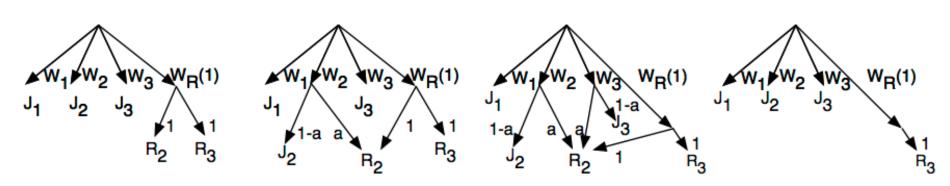


Recomputation Resource Allocation

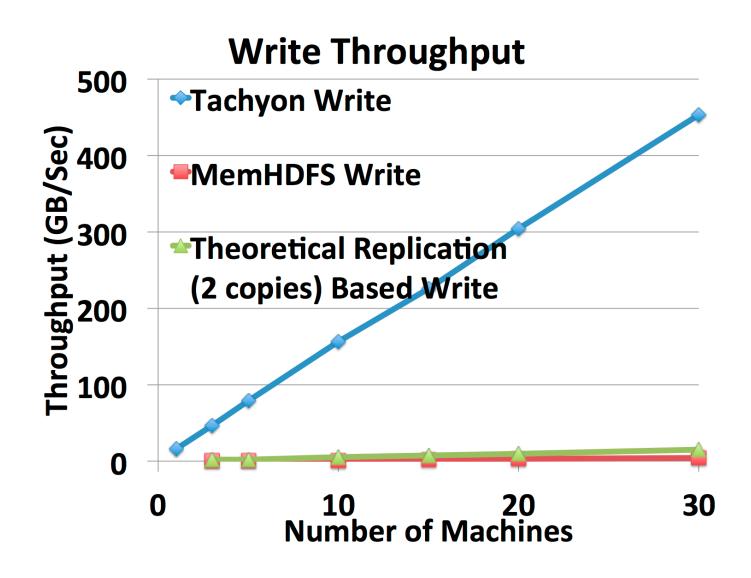
Priority Based Scheduler



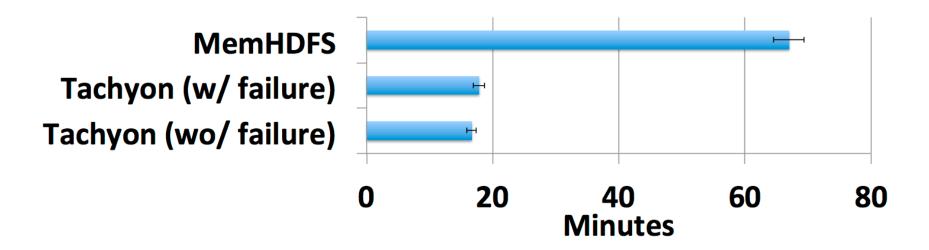
Fair Sharing Based Scheduler



Comparison with in Memory HDFS

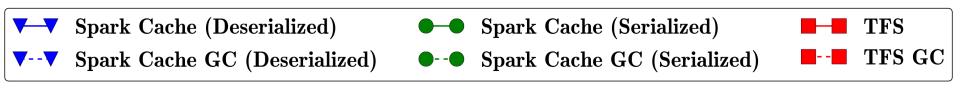


Workflow Improvement

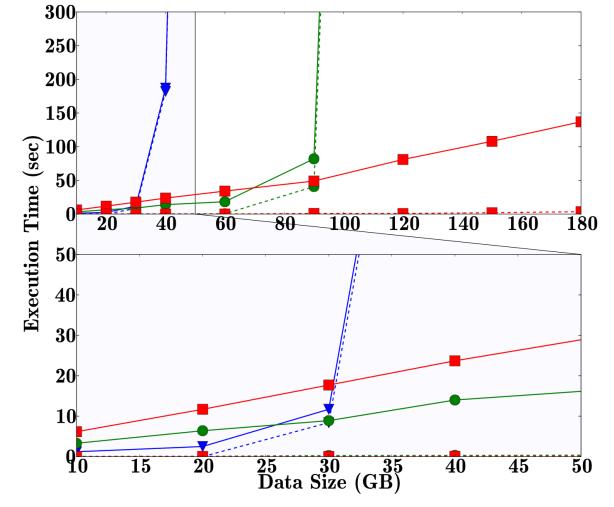


Performance comparison for realistic workflow. The workflow ran 4x faster on Tachyon than on MemHDFS. In case of node failure, applications in Tachyon still finishes 3.8x faster.

Further Improve Spark's Performance



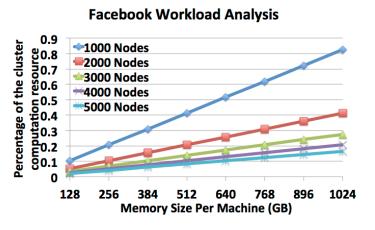


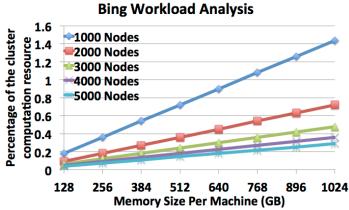


Recomputation Resource Consumption

Bin	Tasks	% of Jobs	
		Facebook	Bing
1	1 - 10	85%	43%
2	11 - 50	4%	8%
3	51 - 150	8%	24%
4	151 - 500	2%	23%
5	> 500	1%	2%







Outline

- Overview
 - Feature 1: Memory Centric Storage Architecture
 - Feature 2: Lineage in Storage

Challenges

Open Source

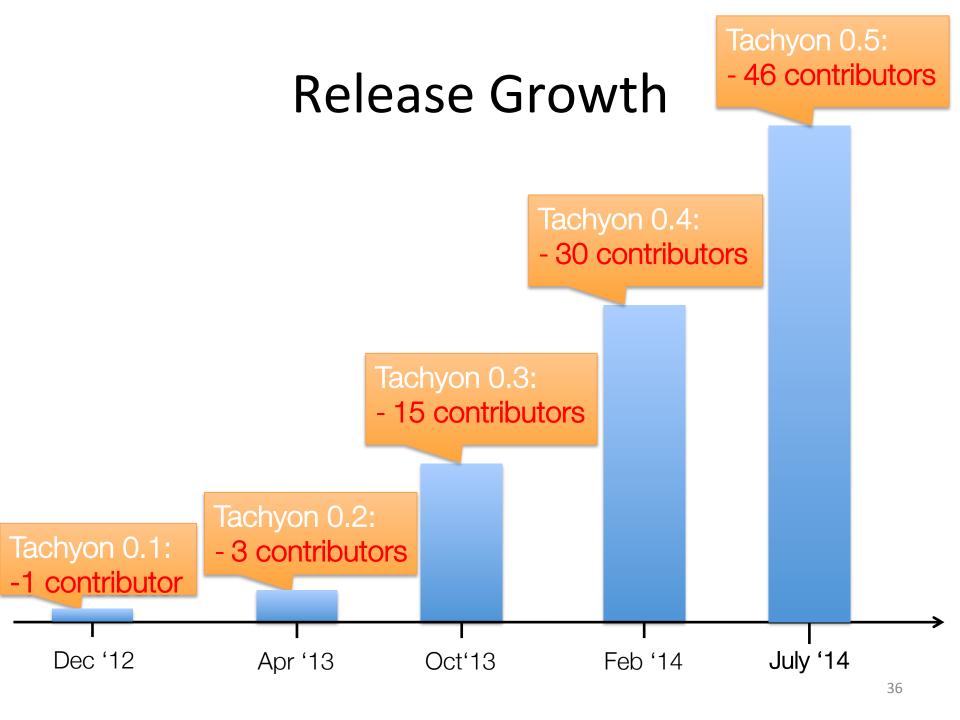
Future



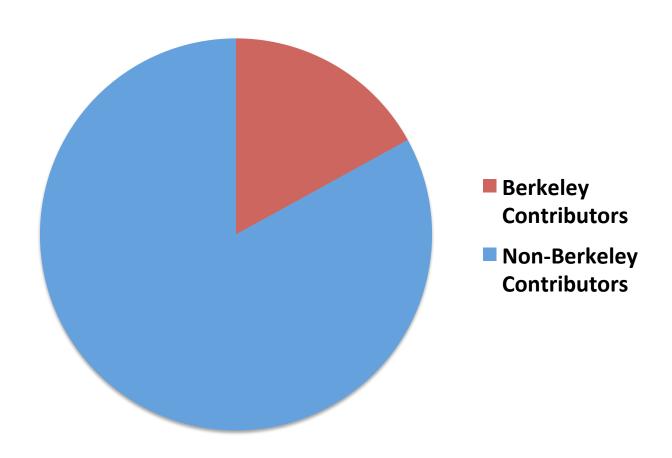
• Apache License 2.0, Version 0.5.0 (July 2014)



- Deployed at tens of companies
- 15+ Companies Contributing
- No code change for Spark and MapReduce applications.



Open Community



Thanks to our Code Contributors!

Aaron Davidson

Achal Soni

Ali Ghodsi

Andrew Ash

Anurag Khandelwal

Aslan Bekirov

Bill Zhao

Brad Childs

Calvin Jia

Chao Chen

Cheng Chang

Cheng Hao

Colin Patrick McCabe

David Capwell

David Zhu

Du Li

Fei Wang

Gerald Zhang

Grace Huang

Haoyuan Li

Henry Saputra

Hobin Yoon

Huamin Chen

Jey Kottalam

Joseph Tang

Juan Zhou

Lukasz Jastrzebski

Manu Goyal

Mark Hamstra

Mingfei Shi

Mubarak Seyed

Nick Lanham

Orcun Simsek

Pengfei Xuan

Qianhao Dong

Qifan Pu

Raymond Liu

Reynold Xin

Robert Metzger

Rong Gu

Sean Zhong

Seonghwan Moon

Shivaram Venkataraman

Srinivas Parayya

Tao Wang

Thu Kyaw

Timothy St. Clair

Vamsi Chitters

Xi Liu

Xiang Zhong

Xiaomin Zhang

Zhao Zhang



























Tachyon is in Fedora 20

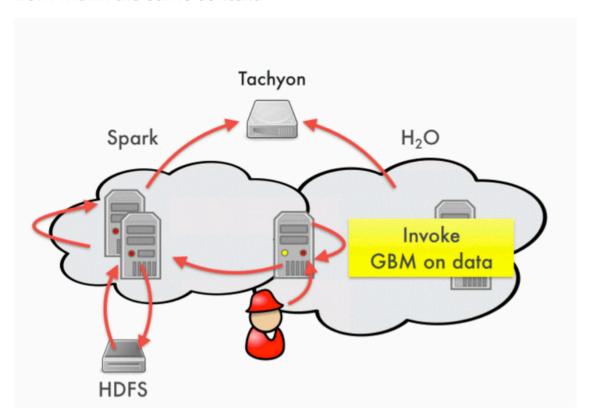
Thanks to Redhat!

Commercially supported by Atigeo and running in dozens of their customers' clusters

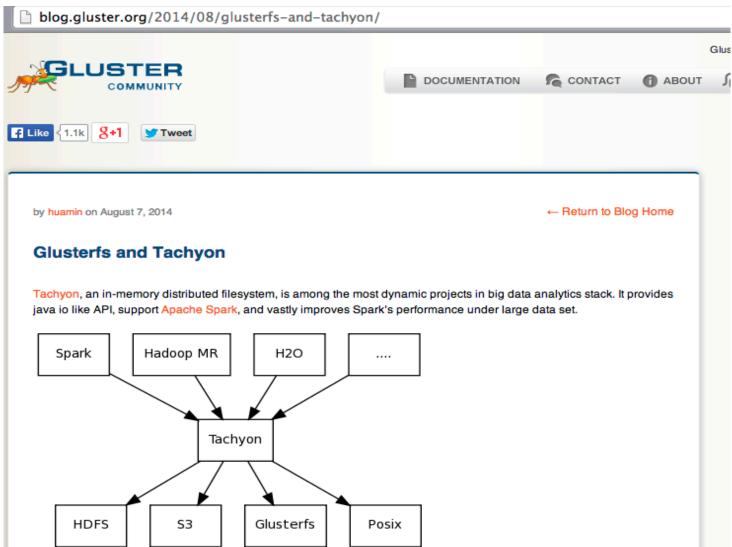
Tachyon is the Default Off-Heap Storage Solution for Spork



Today, data gets parsed and exchanged between Spark and H2O via Tachyon. Users can interactively query big data both via SQL and ML from within the same context.



Reaching wider communities: e.g. GlusterFS



Under Filesystem Choices (Big Data, Cloud, HPC, Enterprise)













Outline

- Overview
 - Feature 1: Memory Centric Storage Architecture
 - Feature 2: Lineage in Storage

Challenges

Open Source

Future

Short Term Roadmap (0.6 Release)

- Ceph Integration (Ceph Community)
- Hierarchical Local Storage (Intel)
- Performance Improvement (Yahoo)
- Multi-tenancy (AMPLab)
- Mesos Integration (Mesos Community)
- Many more from AMPLab and Industry Collaborators.

Features

- Memory Centric Storage Architecture
- Lineage in Storage (alpha)
- Hierarchical Local Storage
- Data Serving
- Scalable metadata management
- Different hardware
- More...
- Your Requirements?

Data Serving: An Example

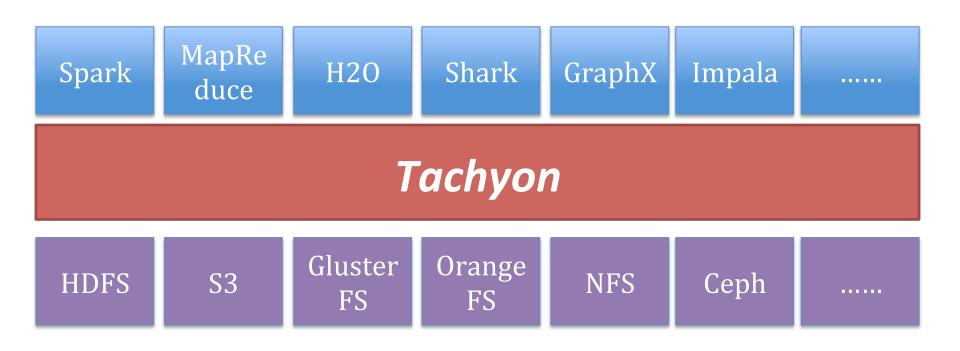
Data Analytics Pipeline: Query the results of batch jobs.

What do we need?

Sequential I/O + Random Access!

Tachyon Goal?

Better Assist Other Components



Welcome Collaboration!

Thanks! Questions?

- More Information:
 - Website: http://tachyon-project.org
 - Github: https://github.com/amplab/tachyon
 - Meetup: http://www.meetup.com/Tachyon
- Email: haoyuan@cs.berkeley.edu