## **Hadoop Virtualization Extensions**



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## **Cloud: Big Shifts in Simplification and Optimization**



1. Reduce the Complexity

to simplify operations and maintenance



2. Dramatically Lower Costs

to redirect investment into value-add opportunities



3. Enable Flexible, Agile IT Service Delivery

to meet and anticipate the needs of the business



## **A Unified Analytics Cloud Significantly Simplifies**







**NoSQL Cluster** 



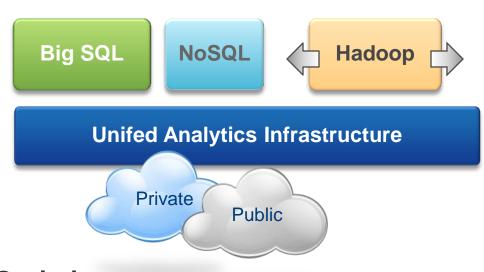
Hadoop Cluster



**Decision Support Cluster** 

## Simplify

- Single Hardware Infrastructure
- Faster/Easier provisioning



## Optimize

- Shared Resources = higher utilization
- Elastic resources = faster on-demand access

## **Unifying the Big Data Platform using Virtualization**



#### Goals

- Make it fast and easy to provision new data clusters on demand
- Allow Mixing of Workloads
- Leverage virtual machines to provide isolation (esp. for Multi-tenant)
- Optimize data performance based on virtual topologies
- Make the system reliable based on virtual topologies

## Leveraging Virtualization

- Elastic scale
- Use high-availability to protect key services, e.g., Hadoop's namenode/job tracker
- Resource controls and sharing: re-use underutilized memory, cpu
- Prioritize Workloads: limit or guarantee resource usage in a mixed environment
   Cloud Infrastructure

Private Public

## VMware is committed to be the Best Virtual platform



#### Performance Studies and Best Practices

- Studies through 2010-2011 of Hadoop 0.20 on vSphere 5
- White paper, including detailed configurations and recommendations

## Making Hadoop run well on vSphere

- Performance optimizations in vSphere releases
- VMware engagement in Hadoop Community effort
- Supporting key partners with their distributions on vSphere
- Contributing enhancements to Hadoop
- Automate Hadoop deployment on vSphere

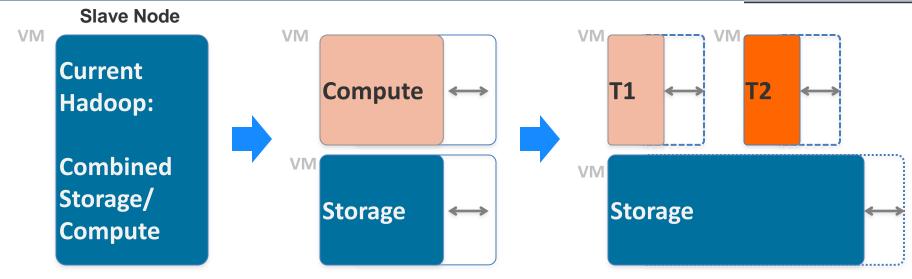
#### Serengeti

## Hadoop Framework Integration

- Spring for Hadoop: Enabling Spring to simplify Map-Reduce Jobs
- Spring Batch: Sophisticated batch management

## **Evolution of Hadoop on VMs**





#### Hadoop in VM

- VM lifecycle determined by Datanode
- Limited elasticity
- Limited to Hadoop Multi-Tenancy

#### **Separate Storage**

- Separate compute from data
- Elastic compute
- Enable shared workloads
- Raise utilization

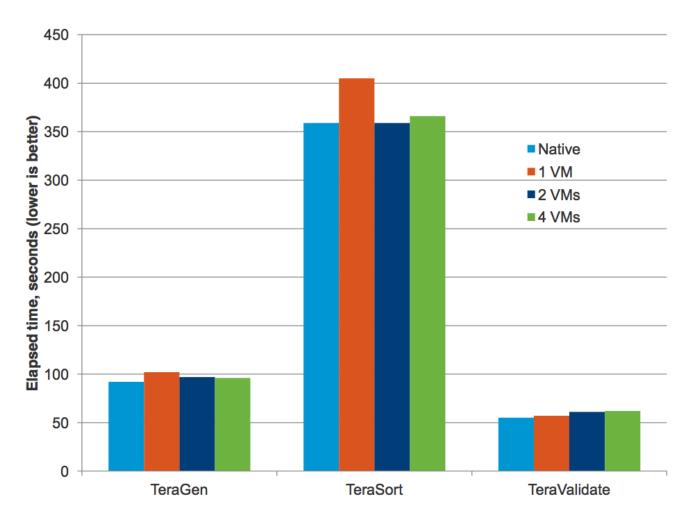
#### **Separate Compute Clusters**

- Separate virtual clusters per tenant
- Stronger VM-grade security and resource isolation
- Enable deployment of multiple Hadoop runtime versions

## **Performance Analysis of Hadoop on Virtualization**



#### Ratio of time taken – Lower is Better



Source: http://www.vmware.com/files/pdf/techpaper/VMW-Hadoop-Performance-vSphere5.pdf

## **Project Serengeti**



- Open source project launched in June, 2012
- Toolkit that leverage virtualization to simplify Hadoop deployment and operations
- To learn more, <u>projectserengeti.org</u>



**Deploy a Hadoop cluster in 10 Minutes** 

**Customize Hadoop cluster** 

**Use Your Favorite Hadoop Distribution** 

One stop command center

## **Project HVE (Hadoop Virtualization Extensions)**



## Open Source project on Hadoop code base

- Deliver patches to Apache Open Source community
- Work with Hadoop distro vendors

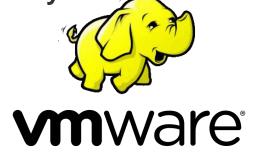
## Refine Hadoop for running on virtualized infrastructure

- Enable multiple-layer network topology
- Enable resource sharing/over-commitment
- Enable compute/data node separation without losing locality

## 100% Contribution back to Apache Hadoop Community

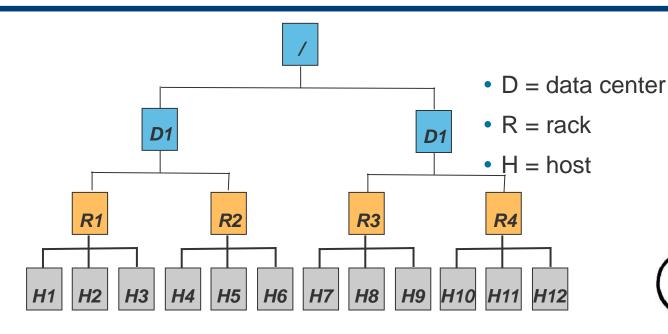
- <a href="http://www.vmware.com/hadoop">http://www.vmware.com/hadoop</a>
- Umbrella JIRA: HADOOP-8468
- Sub JIRAs: HADOOP-8469, HADOOP-8470, HADOOP-8817, HDFS-3495,

HDFS-3498, HDFS-3461, YARN-18, YARN-19, etc.



## **Current Network Topology**



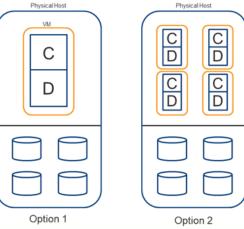


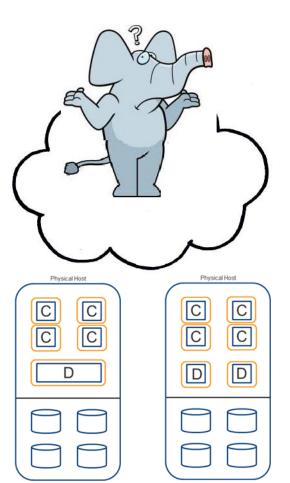
However, you have more choices on

virtualized infrastructure

C = compute node (TaskTracker)

• D = data node



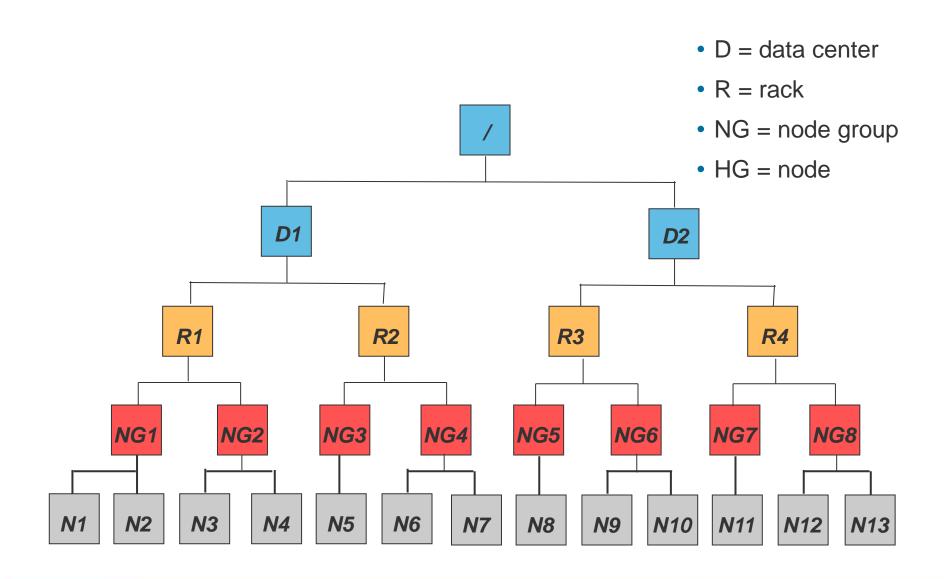


Option 3

Option 4

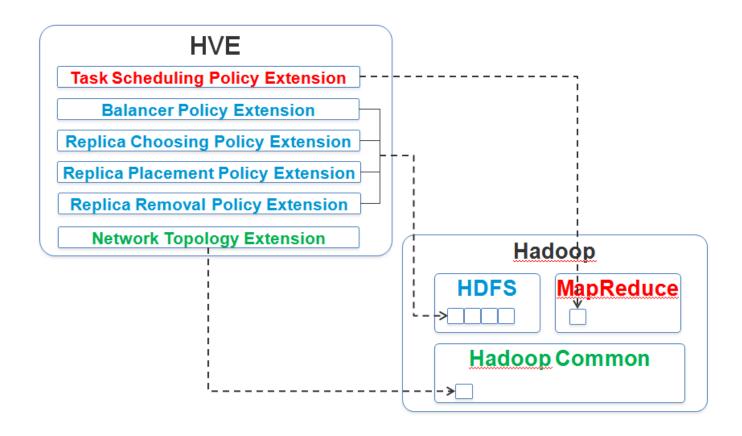
## Additional network topology layer to aware virtualiza





## **High Level View on HVE changes**

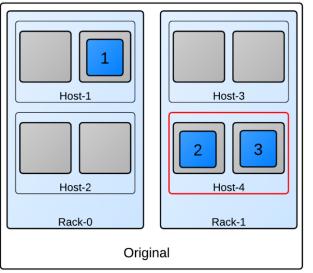


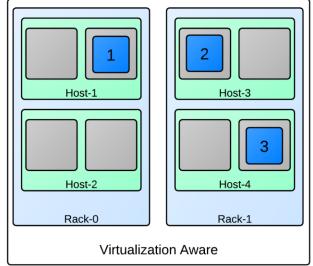


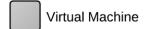
## "Virtualization Aware" Replica Placement Policy



#### **HDFS Write Replication Placement**









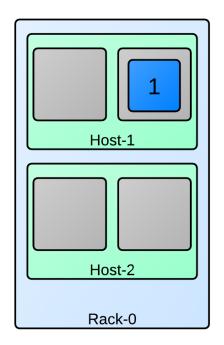
#### **Updated Policies:**

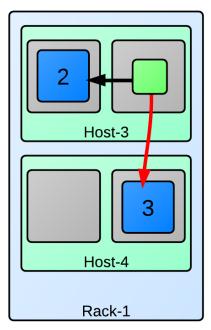
- No replicas are placed on the same node or nodes under the same node group
- 1st replica is on the local node or one of nodes under the same node group of the writer
- 2nd replica is on a remote rack of the 1st replica
- 3rd replica is on the same rack as the 2nd replica
- Remaining replicas are placed randomly across rack to meet minimum restriction.

## "Virtualization Aware" Replica Choosing Policy



#### **HDFS** Read





- Distances for data locality:
  - Node local (0)
  - Node group local (2)
  - Rack local (4)
  - Off rack (6)

Virtual Machine

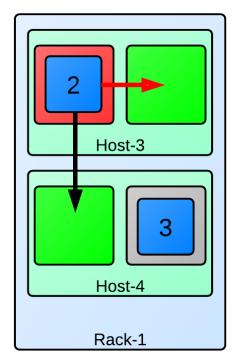
1 Block Replication

HDFS Client

## "Virtualization Aware" Balancer Policy



#### **HDFS Balancer**



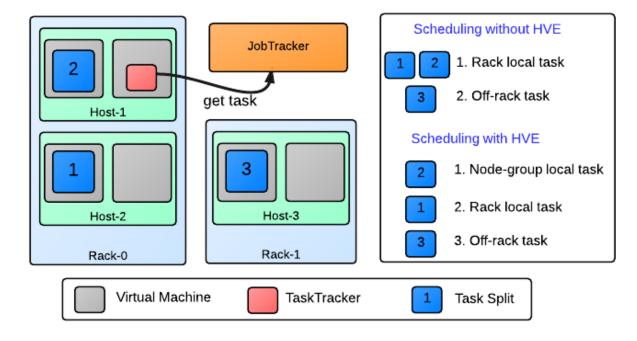
- Datanode
- 1 Block Replication
- Overlimit node
- Underlimit node

- Balancer policies contains two levels choosing policy
  - choosing node pairs of source and target, in sequence of: **local node group**, local rack, off rack
  - choosing blocks to move within node pair, a replica block is not a good candidate if another replica is on the target node or on the same node group of the target node

## "Virtualization Aware" Task Scheduling Policy



#### MapReduce Task Scheduling



Get task split for TaskTracker or NodeManager in following sequences:

- Node local
- Node group local
- Rack local
- Off rack

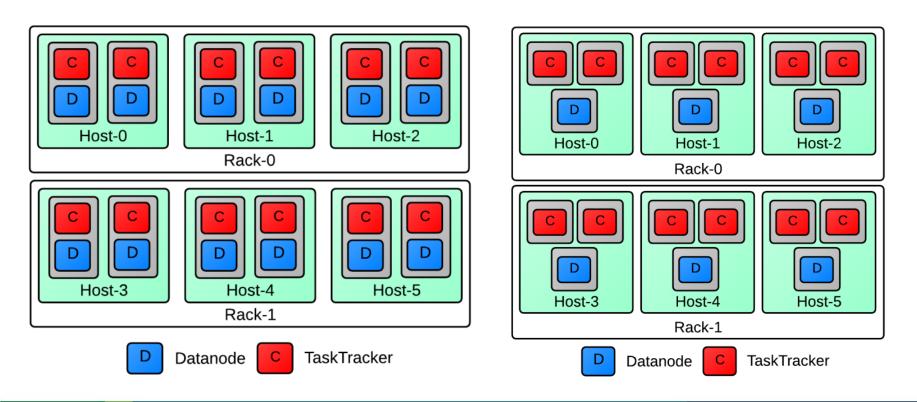
It works well with

- FifoScheduler
- FairScheduler
- Capacity scheduler

## **HVE Topology Benchmark Result**

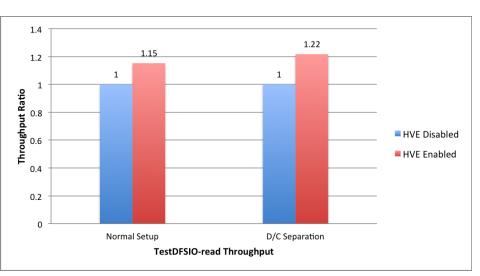


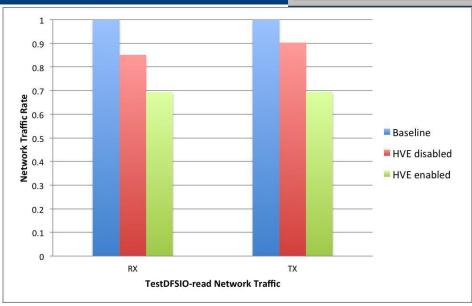
- Integrate HVE with Apache Hadoop 1.0.3
- Cluster Deployments
  - 6 physical nodes
  - 12 virtual nodes (combined case), 18 virtual nodes (d/c separation case)

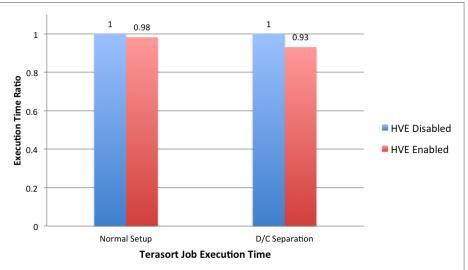


## **HVE Topology Benchmark Result**









Terasort locality	Data Local	Node-group Local	Rack Local
Normal	392	-	8
Normal with HVE	397	2	1
D/C separation	0	-	400
D/C separation with HVE	0	400	0



## **HVE for Resource Elasticity**

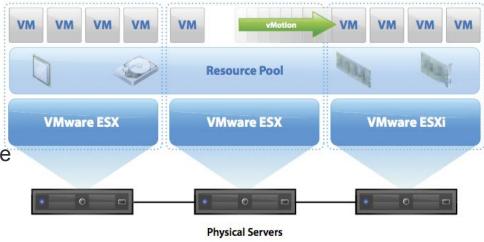


## Resource Elasticity in cloud scenario

- Resource sharing environment
- Different types of workloads: cpu-bound, I/O-bound, etc.
- Different peak time for Apps
- It is a perfect chance to achieve high resource utilization

#### How could we achieve this?

- Art of scheduling
- Schedule Apps (VMs) to Resources
  - DRS, based on vMotion
- Schedule resources to Apps(VMs)
  - Scale up/down per node(VM)'s resource
  - Add more VMs



#### **Elastic Resource on Virtualization**

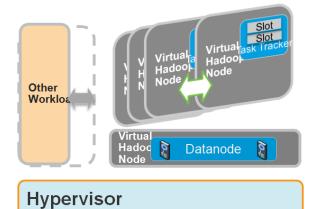


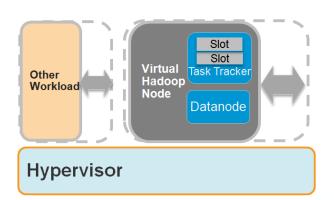
## Schedule resources to Apps

- A policy-based Cloud Apps Resource Manager can monitor resource usage for each App
- Trigger on-demand resource movement among Apps

## Elastic Hadoop cluster

- Horizonal scaling: scale in and out (node number)
  - Data/compute node separation
  - Bring up/down compute nodes
- Vertical scaling: scale up and down (node size)
  - Resource over-commitment
- Mixed





## **Summary**



## Big Data application going to Cloud is under way

Get simplified and optimized

## Hadoop on Virtualization

- Proven performance
- Cloud/Virtualization values apparent for Hadoop use
- Project Serengeti Simplify Hadoop deployment and operations

## Project HVE (Hadoop Virtualization Extensions)

- Enhance Hadoop running on Virtualization by bring more virtualization awareness to Hadoop
  - Virtualization-aware Network Topology
  - Virtualization-aware Resource Scheduling
  - More in future

### References



Hadoop at VMware

www.vmware.com/hadoop

Project Serengeti

projectserengeti.org

## Project HVE

HVE Whitepaper:
 <u>http://serengeti.cloudfoundry.com/pdf/Hadoop%20Virtualization%20Extensions%20WP.p</u>
 <u>df</u>

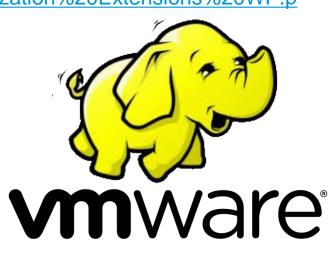
Umbrella Jira:

https://issues.apache.org/jira/browse/HADOOP-8468

## Hadoop on vSphere

- Talks @ Hadoop World, Hadoop Summit
- Performance Paper

http://www.vmware.com/files/pdf/techpaper/VMW-Hadoop-Performance-vSphere5.pdf





## **Q & A**

# Thank you!