# Intel Optane Pmem Tier in data analytics

Xiaolei Ren Intel DCG Sales TSS

intel

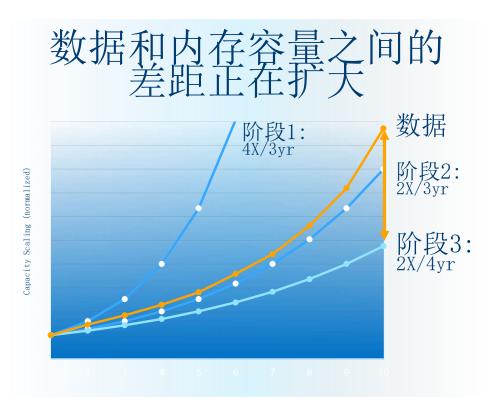
## Agenda

- Intel Optane PMem introduction
- Alluxio introduction and Pmem enabling
- Alluxio performance Result
- Intel Optane Pmem usage in Data Analytics
- Summary

## INTEL OPTANE PERSISTENT MEMORY

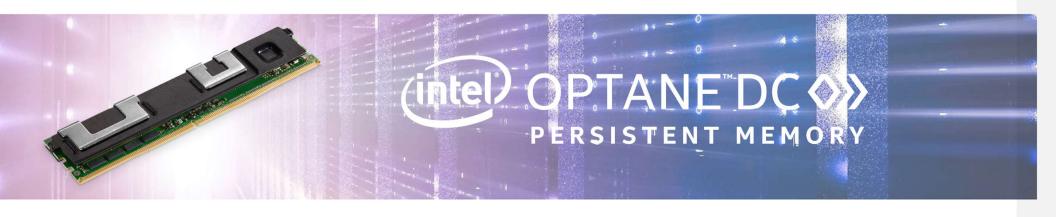
## 内存技术的扩展趋势





## 新硬件给客户带来新价值





## Deliver **performance/TCO**\$ benefits on **large capacity systems**, to support **key workloads** to **save more**, **do more and go faster**

#### 容量大

High capacity enabling systems with >3 TB of memory per CPU socket 128GB, 256GB, 512GB 三种规格

#### 天然的非易失特性

Persistent, with near-memory performance, HW encryption

#### 高性价比

More capacity for your investment.

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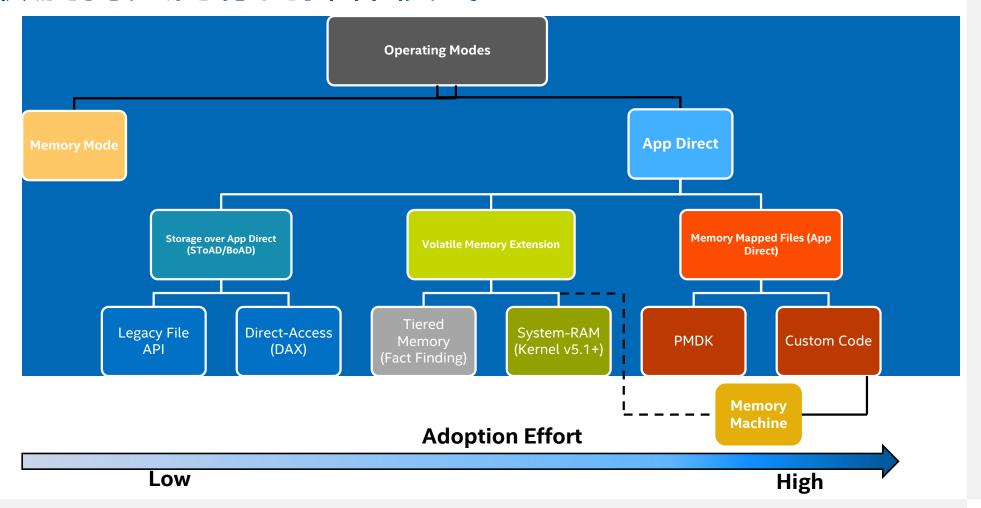
## 英特尔®傲腾™持久内存的定位



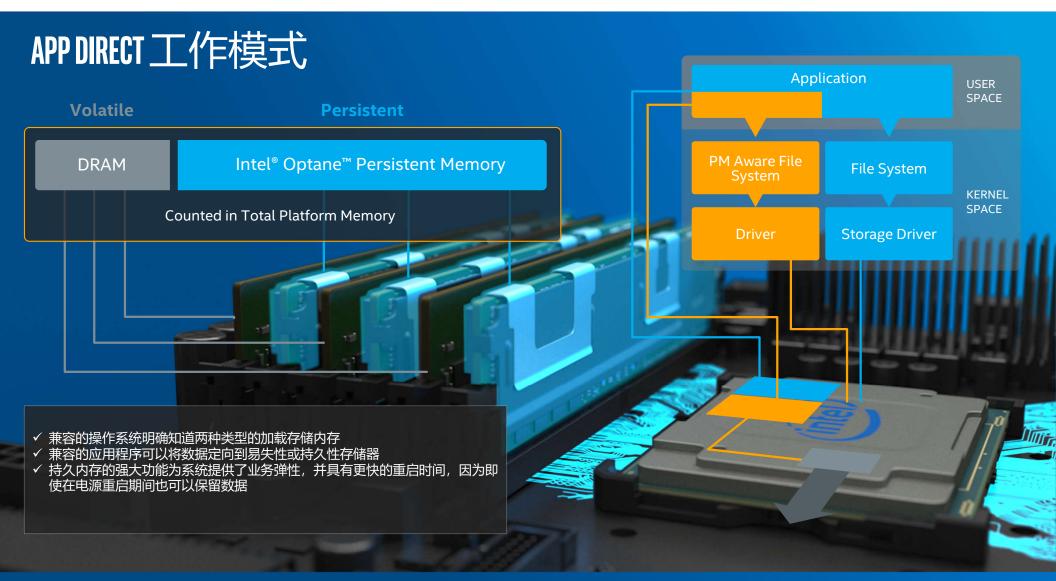


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## 傲腾持久内存的操作模式

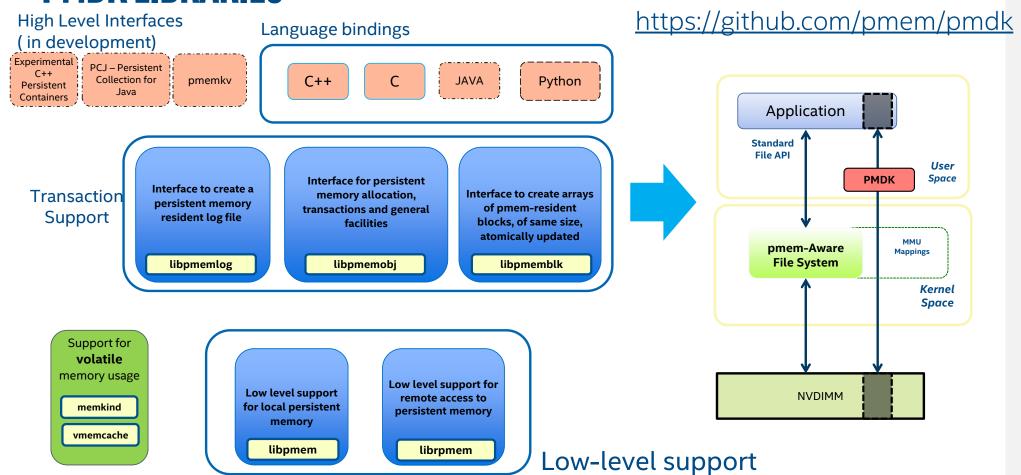




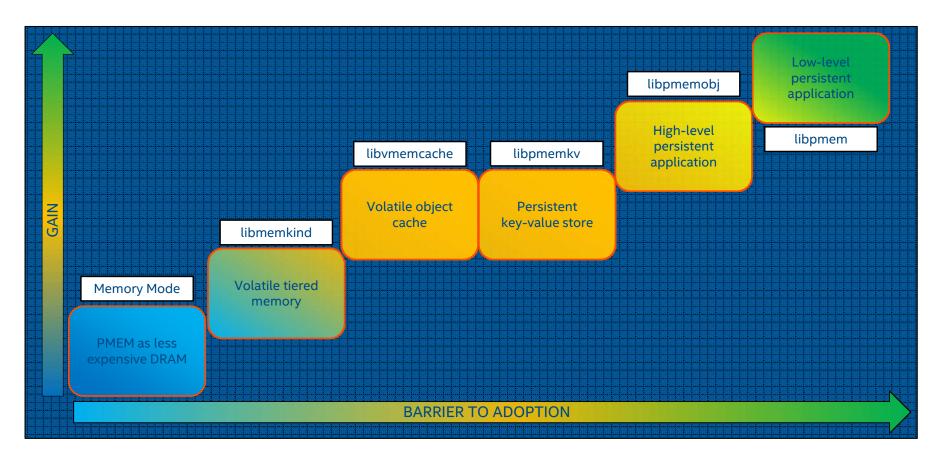


## **PMDK LIBRARIES**

#### http://pmem.io



## **DIFFERENT WAYS TO USE PERSISTENT MEMORY**



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## PERSISTENT MEMORY PROGRAMMING @ INTEL DEVELOPER ZONE

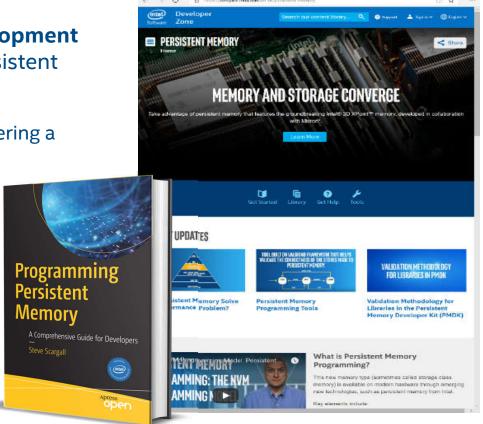
https://software.intel.com/en-us/persistent-memory

Learn how to use the **Persistent Memory Development Kit (PMDK)** to create or update apps to use persistent memory, with:

• 30+ technical articles, webinars and videos covering a broad range of related topics

• Code samples for C/C++, Java and Python

https://www.apress.com/us/book/9781484249314



intel. 1/2

### 傲腾持久内存的适用场景下的用户价值

用户的诉求

内存容量不够

运行低效

系统性能不佳

存储太慢

**USE INTEL® OPTANE™ DC PERSISTENT MEMORY TO...** 

\$降低成本

部分替代DRAM

成本太高

Systems >512GB

改善TCO

纵向扩展太贵

Workloads that need large &/or persistent memory <sup>©</sup>增加负荷

增加内存容量

Large memory or SW license fees per core 合并负荷

High VMs, with low CPU utilization

运行更快

打破1/0瓶颈

High Disk I/O Traffic 高速存储

Tiered storage subsystem

## 傲腾持久内存的潜使用场景















#### 云和虚拟化

扩展虚机 内存容量

增加系统 虚机和容器数量

OS 内存扩展

#### 数据库

内存数据库

大容量 数据库缓存层

数据库日志

RDMA 复制

#### 存储

大内存应用 超快存储

Meta-data管理

写缓存

存储缓存层

任务断点检查

**PMoF** 

文件系统交换

#### 大数据分析

堆外内存

实时分析

新兴分析平台

AI 数据分析

#### 电信

**NFVi** 

认知网络

内容分发网络 (CDN)

大数据分析和AI

高性能, 降成本, 数据持久性

#### 云 & laaS

#### 大内存增加虚拟机密度, 降本增效

#### 案例

- 内存增加 改善在虚拟化的多租户环境中运 行的工作负载
- 提高容器应用和云服务能力

#### 内存数据库/ 超融合

大内存增加负荷,降成本提高性能

#### 案例

- SAP HANA, Oracle Exadata, MSFT SQL
- Redis
- · Cassandra, MongoDB

#### 案例

- 企业和云存储的大容量高性能非易失缓存
- 网络存储的本地大容量缓存
- 高性能直连存储

## **ALLUXIO INTRODUCTION AND PMEM ENABLING**

### Data Orchestration for the Cloud

















lava File API

**HDFS** Interface

S3 Interface

**POSIX Interface** 

**REST API** 



ALLUXIO Data Orchestration for the Cloud

**HDFS** Driver

Swift Driver

S3 Driver

**NFS** Driver

























source: Alluxio

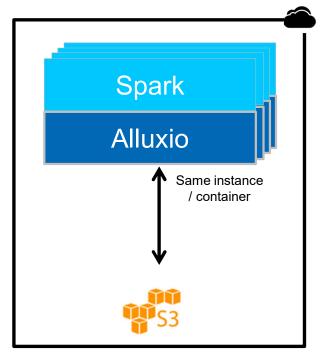
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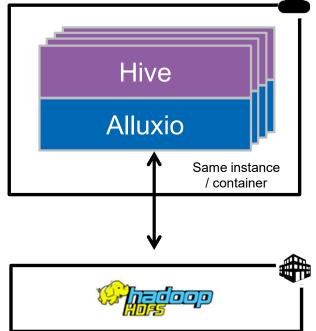
## **USE CASES ALLUXIO ENABLES**

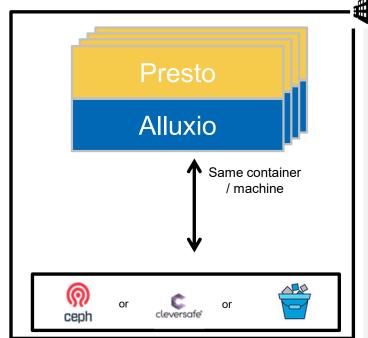
Accelerate big data frameworks on the public cloud

Burst big data workloads in hybrid cloud environments

Dramatically speed-up big data on object stores on premise







source: Alluxio

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## Alluxio – Key innovations

#### **Data Locality**

with Intelligent Multi-tiering

Accelerate big data workloads with transparent tiered local data

source: Alluxio

#### **Data Accessibility**

for popular APIs & API translation

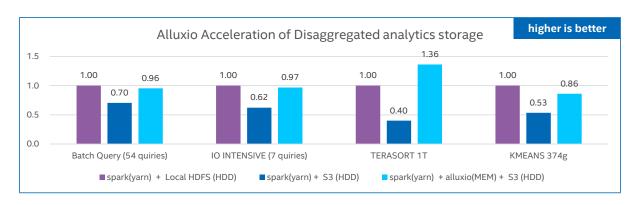
Run Spark, Hive, Presto, ML workloads on your data located anywhere

#### **Data Elasticity**

with a unified namespace

Abstract data silos & storage systems to independently scale data on-demand with compute

## ALLUXIO CACHE PERFORMANCE ACCELERATION FOR COMPUTE AND STORAGE DISAGGREGATED ARCHITECTURE



#### Using Alluxio IMDA as cache:

- For terasort, 3.4x speedup over S3 object storage, 1.36x speedup over local HDFS.
- For TPCDS test, up to 1.56x performance speedup for IO intensive queries, slightly lower than local HDFS.
- For KMeans test, **1.62x** speedup over S3 object storage, 14% lower compared with local HDFS. <a href="https://www.alluxio.io/blog/speeding-big-data-analytics-on-the-cloud-with-in-memory-data-accelerator/">https://www.alluxio.io/blog/speeding-big-data-analytics-on-the-cloud-with-in-memory-data-accelerator/</a>

#### Using Alluxio IMDA cache improved in IO intensive workloads

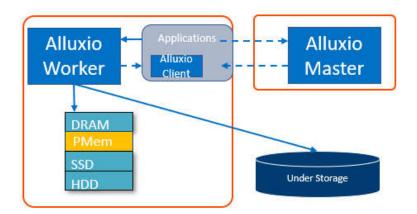
#### **ALLUXIO PMEM TIER ARCHITECTURE DESIGN**

#### Alluxio PMem tier

- A new PMEM tier layer introduced to provide higher performance with lower cost
  - Large Capacity -> Cache more data
  - Higher performance compared with NVMe SSD
  - Deliver dedicated SLA to mission critical applications

#### PMem Mode

- AD mode: Leverage PMDK lib to bypass filesyster overhead and context switches, 90% POC code completed
- SoAD: No code changes, Performance evolution and value proposition working in progress
- 2LM mode: using Alluxio DRAM tier



#### **ALLUXIO & ALLUXIO PMEM TIER**

Alluxio PMem tier demonstrated significant performance speedup over DRAM tier in ISOcost configuration

- PMem tier (SoAD) performance with Decision support workload 4TB (parquet
  - 2.13x speedup over without cache configuration
  - 1.92x speedup over DRAM tier in ISO-cost configuration
- PMem tier (2LM) performance with Decision support workload 4TB (parquet format)
  - 1.24x speedup over without cache configuration
  - 1.12x speedup over DRAM tier in ISO-cost configuration

**GTM** 

- Alluxio Launches Enhanced Hybrid Cloud Solution based on Intel Optane **Persistent Memory**
- Press rlease, blog, white paper, solution brief ready

2nd Gen Intel® Xeon® Scalable processors and Intel® Optane™ persistent memory provide Alluxio with an in-memory acceleration layer, significantly boosting storage capacity and performance for rapid data processing.



persistent memory



over DRAM Cache for 4TB parguet format data, on Decision Support workload with Intel Optane persistent memory

"Together with Intel, we plan to disrupt the advanced analytics and AI status guo with an in-memory data accelerator layer to accelerate intermediate data access and ease data bottlenecks that many of our customers are highlighting as key challenges with their increasing big data requirements."

> Rowan Scranage, VP of Business Development at Alluxio.

Alluxio launch PMem based enhanced hybrid cloud solutions: https://www.alluxio.io/press-releases/alluxio-launches-enhanced-hybrid-cloud-solution-based-on-intel-optane-persistent-memory/

Alluxio blog: https://www.alluxio.io/resources/whitepapers/accelerate-and-scale-big-data-analytics-with-alluxio-and-intel-optane-persistent-memory

White Paper: https://www.alluxio.io/app/uploads/2020/05/Intel-Alluxio-PMem-Whitepaper-200507.pdf

Solution brief: https://www.alluxio.io/app/uploads/2020/04/Alluxio-Intel SolutionsBrief Final1.pdf

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## **ALLUXIO PMEM TIER PERFORMANCE**

### **SYSTEM CONFIG**

#### Red=Required Black=Required if used

Blue=Internal Intel tracking

**SVRINFO**: Tool to capture hardware information and mitigation status; Software details will still need to be entered manually

https://github.intel.com/ssgcce/svrinfo

Attach svrinfo log file: use same name format as presentation.

#### Note on OS/Kernel for CLX:

CLX hardware mitigations require:

RHEL or CentOS requires 3.10.0-957.el7.x86\_64 or newer kernel. Kernel.org version should be 4.19 or newer. Older kernels will only provide software mitigations which could mean lower performance

	PMem Tier	DRAM tier
Test by	Intel	Intel
Test date	12/06/2019	12/06/2019
SUT Setup		
Platform	S2600WF0	S2600WF0
# Nodes	2 compute, 3 storage	2 compute, 3 storage
# Sockets	2	2
CPU	6240 for compute, 6140 for storage	6240 for compute, 6140 for storage
Cores/socket, Threads/socket	18,36	18/36
Microcode	0x500002C	0x500002C
нт	On	On
Turbo	On	On
BIOS version	SE5C620.86B.0X.02.0094.102720 191711	SE5C620.86B.0X.02.0094.102720 191711
BKC version – E.g. ww47	ww08.2019	ww08.2019
PMem FW version – E.g. 5336	01.02.00.5410	-
System DDR Mem Config: slots / cap / speed	12 slots / 16GB / 2666	24 slots / 32 GB / 2666
System PMem Config: slots / cap /speed	8 slots / 128 GB /2666	-
Total Memory/Node (DDR, PMem)	192GB, 1024GB	768GB, 0
Storage - boot	1x INTEL 400GB SSD (SSDSC2BA400G3) OS Drive	1x INTEL 400GB SSD (SSDSC2BA400G3) OS Drive
Storage - application drives	11x 1TB HDD (ST1000NX0313) OSD for Ceph storage node	11x 1TB HDD (ST1000NX0313) OSD for Ceph storage node

## SOFTWARE/WORKLOAD CONFIGURATION

## Red=Required Black=Required if used Blue=Internal Intel tracking

#### Note on OS/Kernel for CLX:

CLX hardware mitigations require:
RHEL or CentOS requires 3.10.0957.el7.x86\_64 or newer kernel.
Kernel.org version should be 4.19
or newer. Older kernels will only
provide software mitigations
which could mean lower
performance

		Config1 - ISO Cost PMem	Config2 – ISO Cost DRAM	Config3 – Without Alluxio
d	OS	Fedora 29	Feodra 29	Feodra 29
d g	Kernel	5.3.11-100.fc29.x86_64	5.3.11-100.fc29.x86_64	5.3.11-100.fc29.x86_64
5	Workload & version	Decision Support Workloads, 54	Decision Support	Decision Support
<b>:</b> e:		queries	Workloads, 54 queries	Workloads, 54 queries
_	Compiler	gcc 8.2.1	gcc 8.2.1	gcc 8.2.1
l.	Libraries	N/A	N/A	N/A
9	Other SW	Hadoop 3.1.2	Hadoop 3.1.2	Hadoop 3.1.2
y S	Other SW	Hive 3.1.1	Hive 3.1.1	Hive 3.1.1
r	Other SW	Spark 2.3.0	Spark 2.3.0	Spark 2.3.0
е	Other SW	Alluxio 2.0.0	Alluxio 2.0.0	Alluxio 2.0.0
	Mitigation log attached (required for each config)	Yes	Yes	Yes
	AEP mode: ex. 2LM or AD-volatile (replace DDR) or AD-persistent (replace NVME)	SoAD/2LM	N/A	N/A
	Run Method: ex. cold (fresh-boot), warm (post-boot after few back to back iterations)	Warm	Warm	Warm
	Iterations and result choice (median, average, min, max)	3 runs, median	3 runs, median	3 runs, median
	Dataset size	Decision support (54 SQL queries): 4TB parquet format	Decision support (54 SQL queries): 4TB parquet format	Decision support (54 SQL queries): 4TB parquet format

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## Why 54 queries

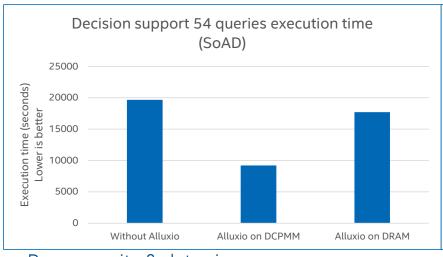
- The query was carefully selected based on previous joint work with Redhat and Silicon Valley Data Science to simulate common operations against object storage.
- https://www.redhat.com/en/blog/why-spark-ceph-part-1-3

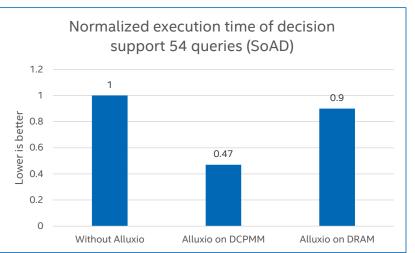
Figure 1: Analytics tools tested with shared Ceph object store In addition to running simplistic tests like TestDFSIO, we wanted to run analytics jobs which were representative of real-world workloads. To do that, we based our tests on the TPC-DS benchmark for ingest, transformation, and query jobs. TPC-DS generates synthetic data sets and provides a set of sample queries intended to model the analytics environment of a large retail company with sales operations from stores, catalogs, and the web. Its schema has 10s of tables, with billions of records in some tables. It defines 99 pre-configured queries, from which we selected the 54 most IO-intensive for out tests. With partners in industry, we also supplemented the TPC-DS data set with simulated click-stream logs, 10x larger than the TPC-DS data set size, and added SparkSQL jobs to join these logs with TPC-DS web sales data.

In summary, we ran the following directly against a Ceph object store:

- Bulk Ingest (bulk load jobs simulating high volume streaming ingest at 1PB+/day)
- Ingest (MapReduce jobs)
- Transformation (Hive or SparkSQL jobs which convert plain text data into Parquet or ORC columnar. compressed formats)
- Query (Hive or SparkSQL jobs frequently run in batch/non-interactive mode, as these tools automatically restart failed jobs)
- Interactive Query (Impala or Presto jobs)
- Merge/join (Hive or SparkSQL jobs joining semi-structured click-stream data with structured web sales data)

### **ALLUXIO PMEM TIER PERFORMANCE OVERVIEW (SOAD)**

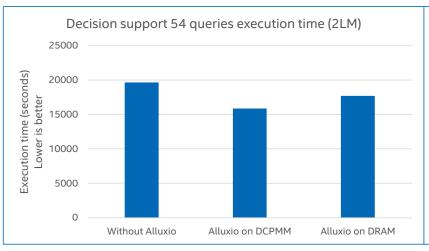


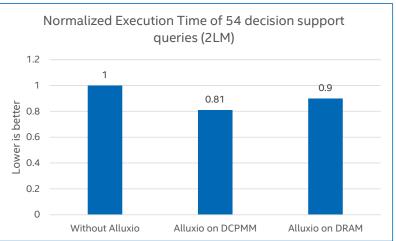


- Raw capacity & data size
  - Alluxio: 900GB \* 2 , DRAM 560GB \* 2
  - 4TB parquet: 1547GB
- Alluxio PMem tier (SoAD) performance with decision support workload on 4TB parquet data
  - 2.13x speedup over without cache configuration
  - 1.92x speedup over DRAM tier in ISO-cost configuration.

Performance results are based on testing as of 12/06/2019 and may not reflect all publicly available security updates. See configuration disclosure on slide for details. No product can be absolutely secure. For more complete information about performance and benchmark results, visit www.intel.com/benchmarks. Configurations refer to page 31

### **ALLUXIO PMEM TIER PERFORMANCE OVERVIEW (2LM)**



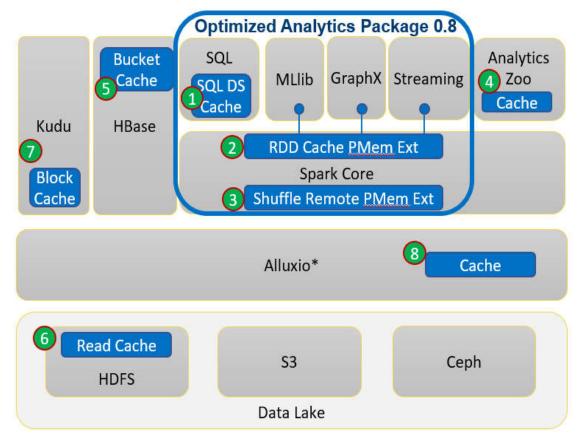


- Raw capacity & data size
  - Alluxio: 768GB \* 2 , DRAM 560GB \* 2
  - 4TB parquet: 1547GB
- Alluxio PMem tier (2LM) performance with decision support workload on 4TB parquet data
  - 1.24x speedup over without cache configuration
  - 1.12x speedup over DRAM tier in ISO-cost configuration.

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## INTEL OPTANE PMEM USAGE IN DATA ANALYTICS

## PMEM USAGE IN BIG DATA ANALYTICS STACK



- PMEM as Spark SQL data source cache, requiring to use Intel's Optimized Analytics Package (OAP) for Spark.
- PMEM as another layer of storage media for RDD persistence
- PMEM as more efficient storage for shuffle data (i.e., intermediate results)
- 4 PMEM as data cache for Intel Analytics Zoo on Spark.
- 6 PMEM as Hbase Bucket cache, speedup random read
- PMEM as HDFS read cache, replace DRAM cache
- PMEM as Kudu block cache, reduce DRAM footprint
- R PMEM as Alluxio Pmem tier cache, reduce cost
- Ready for Adoption
  - 6 ♣ Adopted by Cloudera in CDP

## IA OPTIMIZATION - READY FOR ADOPTION

HW	OPTIMIZATION	WORKLOAD	COMPARISON BETWEEN WHICH 2	PERFORMANCE GAIN
PMEM 1	Spark SQL Data Source Cache	TPC-DS	AEP compared with DRAM under ISO Cost $\sqrt{}$	8x performance with 3TB data scale for 9 I/O intensive 2.01 performance with 10TB data scale for 91 queries. <u>User Guide</u> . <u>Blog</u> . <u>Blog</u>
PMEM 2	Spark RDD Cache PMem Ext	KMeans	AEP compared with DRAM under ISO cost $$	1.34X performance. <u>User Guide</u>
PMEM 3	Spark Shuffle Remote PMem Ext	TeraSort	AEP compared with HDD and Optane SSD $\sqrt{}$	22.7x faster than Spark in PMEM compared that with HDD as shuffle device 2000x latency reduction of PMEM compared that with Optane SSD. User Guide
РМЕМ 4	Analytics Zoo	Inceptionv1 Training	AEP compared with DRAM under ISO Capacity $\sqrt{}$	No performance degradation under ISO-Capacity
РМЕМ 5	Hbase off heap read/write optimization (HDP/CDH 6.0)	HBase Performance Evaluation Tool	With/Without optimization √	Query speed up by 30% by serving data directly from off-heap buckets out of BC without the need for copying.
РМЕМ 5	Hbase off heap read/write optimization (HDP/CDH 6.0)	HBase Performance Evaluation Tool	With/Without optimization √	Query speed up by 30% by serving data directly from off-heap buckets out of BC without the need for copying.
РМЕМ 6	HDFS Cache (Hadoop 3.1.4, 3.2.2,3.3.0)	DFSIO TPC-DS	AEP compared with DRAM under ISO Cost √	<ul> <li>TPC-DS 1TB data scale</li> <li>7.45x speedup compared to no cache (HDD).</li> <li>2.84x speedup compared to DRAM cache (partial cache, Text format). User Guide. Blog</li> </ul>
РМЕМ 7	KUDU optimization on AEP (CDH 6.2)	YCSB	AEP compared with DRAM under ISO cost $$	1.66x improvement in throughput & 1.9X improvement in read latency over DRAM. User Guide. Blog
PMEM 8	Alluxio PMEM Tier	TPC-DS	AEP compared with DRAM under ISO Cost √	1.92x speedup over DRAM tier in ISO-cost configuration

intel.

# 

## Yarn&Spark Configuration

Key	Value	Description
yarn.resourcemanager.scheduler.class	org.apache.hadoop.yarn.server.resourcema	
	nager.scheduler.fair.FairScheduler	
yarn.nodemanager.resource.memory-mb	204800	
yarn.nodemanager.vmem-check-enabled	false	
yarn.scheduler.maximum-allocation-vcores	72	Must be greater than spark_exec_nums * spark_exec_cores
yarn.nodemanager.resource.cpu-vcores	72	
yarn.scheduler.minimum-allocation-mb	1024	

Key	Value	Description
spark.executor.instances	12	Total spark exec number, each node has 6 executors
spark.executor.cores	10	Per exec core number
spark.driver.memory	10g	
spark.executor.memory	24g	Spark exec mem total is 24+5 = 29G
spark.executor.memoryOverhead	5g	

## Alluxio configurations

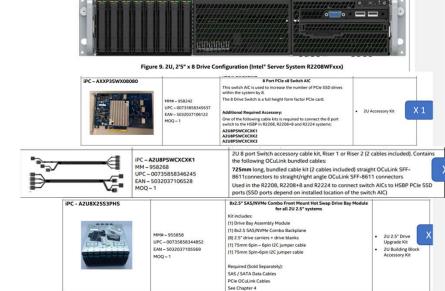
alluxio (PMem SoAD)		alluxio (PMem 2LM)		alluxio (DRAM)	
alluxio.worker.tieredstore.levels	1	alluxio.worker.tieredstore.levels	1	alluxio.worker.tieredstore.levels	1
alluxio.worker.ieredstore.level0.alias	SSD	alluxio.worker.ieredstore.level0.alias	MEM	alluxio.worker.ieredstore.level0.alias	MEM
alluxio.underfs.s3a.list.objects.v1	TRUE	alluxio.underfs.s3a.list.objects.v1	TRUE	alluxio.underfs.s3a.list.objects.v1	TRUE
alluxio.underfs.s3.threads.max	80	alluxio.underfs.s3.threads.max	80	alluxio.underfs.s3.threads.max	80
alluxio.underfs.s3.request.timeout	0	alluxio.underfs.s3.request.timeout	0	alluxio.underfs.s3.request.timeout	0
alluxio.worker.tieredstore.level0.dirs.path	/mnt/pmem1	alluxio.worker.tieredstore.level0.dirs.path	/mnt/ramdisk	alluxio.worker.tieredstore.level0.dirs.path	/mnt/ramdisk
alluxio.worker.tieredstore.level0.dirs.quota	450G,450G	alluxio.worker.tieredstore.level0.dirs.quota	786G	alluxio.worker.tieredstore.level0.dirs.quota	560G
alluxio.user.ufs.block.read.location.policy	alluxio.client.b lock.policy.Det erministicHas hPolicy	alluxio.user.ufs.block.read.location.policy	alluxio.client.b lock.policy.Det erministicHash Policy	alluxio.user.ufs.block.read.location.policy	alluxio.client.bl ock.policy.Det erministicHash Policy
alluxio.worker.network.async.cache.manager.t hreads.max	<u>-</u>	alluxio.worker.network.async.cache.manag er.threads.max	32	alluxio.worker.network.async.cache.manag er.threads.max	32
alluxio.worker.network.block.reader.threads. max	8192	alluxio.worker.network.block.reader.thread s.max	8192	alluxio.worker.network.block.reader.threa ds.max	8192
alluxio.user.file.passive.cache.enabled	false	alluxio.user.file.passive.cache.enabled	false	alluxio.user.file.passive.cache.enabled	false

## Comparison w/ NVMe

- Alluxio was typically deployed in data center for:
  - Simplify Hadoop for the hybrid cloud by making on-prem HDFS accessible to any compute in the cloud.
  - Get in-memory data access for Spark, Presto, or any analytics framework on AWS, Google Cloud Platform, or Microsoft Azure.
  - · And the disaggregated environment evolving with diskless trend
  - Most of Alluxio customer is actually deployed w/ DRAM only

#### NVMe challenges

- Not enough PCIe slots, a PCIe raiser & NVMe combo hot swap bay module will be required
- Not enough performance, NVMe BW will be limited by PCIe riser



Micro workloads tests (fio)	Bandwidth	Comments
NVMe	7GB/s	Fio, 4x P4610
PMem numa binding_	42GB	Fio, via libpmemengine, 8x 128GB PMem
PMem non_numa	17GB	Fio, via libpmemengine
PMem snoopy_mode	42GB/s	Fio, via libpmemengine

### Alluxio PMem tier SoAD mode configuration

Alluxio on PMem (SoAD)

```
alluxio.worker.tieredstore.levels=1
alluxio.worker.tieredstore.level0.alias=SSD
alluxio.worker.tieredstore.level0.dirs.path=/mnt/pmem0, /mnt/pmem1
alluxio.worker.tieredstore.level0.dirs.quota=450G,450G
```

Alluxio on DRAM

```
alluxio.worker.tieredstore.levels=1
alluxio.worker.tieredstore.level0.alias=MEM
alluxio.worker.tieredstore.level0.dirs.path=/mnt/ramdisk
alluxio.worker.tieredstore.level0.dirs.quota=560G
Alluxio on PMem (21 M)
```

```
alluxio.worker.tieredstore.levels=1
alluxio.worker.tieredstore.level0.alias=MEM
alluxio.worker.tieredstore.level0.dirs.path=/mnt/ramdisk
alluxio.worker.tieredstore.level0.dirs.quota=786G
```

Department or Event Name Intel Confidential

## Alluxio enabling trouble-shooting

- Alluxio can't be started using PMem
  - Set alluxio, worker, tiered store, level 0, alias to SSD
  - Or, use ramdisk to launch Alluxio and redirect ramdisk to PMem
- Ceph rgw domain name can't resolved
  - alluxio.master.mount.table.root.option.alluxio.underfs.s3.disable.dns.buckets=true
- Switch hive table location is too time-consuming using official recomme way
  - Use hive `metatool` to do the trick

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