Data Processing at the Speed of 100 Gbps@Apache Crail (Incubating)

http://crail.incubator.apache.org/

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The Performance Landscape

Trend 1: The I/O performance is increasing dramatically

		2010	2018	2018-
	Storage	100 MB/s (HDDs)	1,000 MB/s (SSDs, NVMe)	10,000 MB/sec (3DXP)
	Network	1 Gbps	10/25/40 Gbps	100/200 Gbps
	CPU	1 x ~3 GHz	n x ~3 GHz	n x ~3 GHz

The Performance Landscape

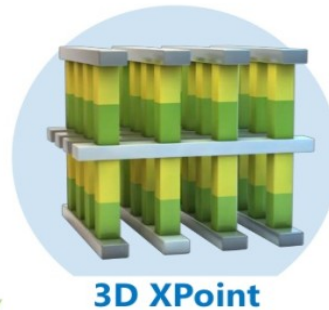*Trend 2: The I/O diversity is increasing dramatically*

The Key Challenge

Given the current hardware performance and diversity landscape, how can we orchestrate data movement at the speed of hardware

in other words:

" Can we feed modern data processing stacks at 100+ Gbps data speeds with 1-10 usec access latencies"
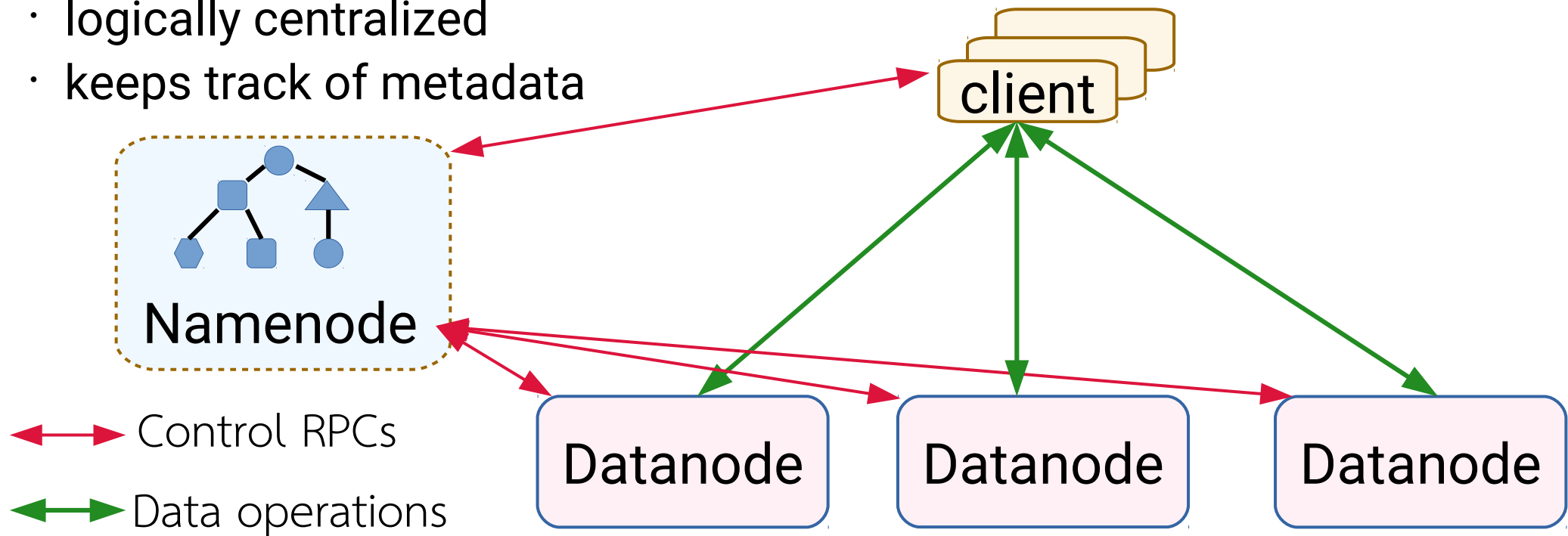
Apache Crail (Incubating) crail

- A distributed data "<u>store</u>" platform designed from scratch to "<u>share</u>" data at the speed of hardware
  - "store": in DRAM/Flash/3DXP, with multiple front-end APIs to storage
  - "share": intermediate data from intra-job (shuffle, broadcast) & inter-job
- Targets to speed-up workloads by accelerating data sharing
- An effort to unify isolated and incompatible efforts to integrate high-performance device in big data frameworks
  - Written in Java8 with multiple client-language support
- Started at IBM Research Lab, Zurich
- Apache Incubator project since November, 2017
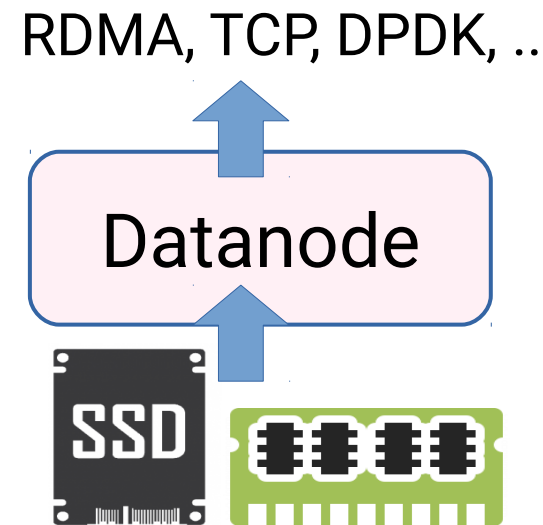
System Overview − Crail Store

- access metadata from the namenode
- access data from datanodes

- logically centralized
- keeps track of metadata

Namenode

client

Control RPCs

Data operations

Datanode   **Datanode**   **Datanode**

- donate storage and network resources to Crail
- mostly dumb/stateless servers

Apache Crail: Datanode

- DataNode is responsible for exposing (storage + networking) resources to the system

  - DRAM + RDMA [1], TCP/Sockets

  - Flash + NVMeF [2]

  - Local DRAM + memcpy

  - Local flash + SPDK

- Accepts client connections and serves data

- Periodic heartbeat pings with the namenode

RDMA, TCP, DPDK, ..

Datanode
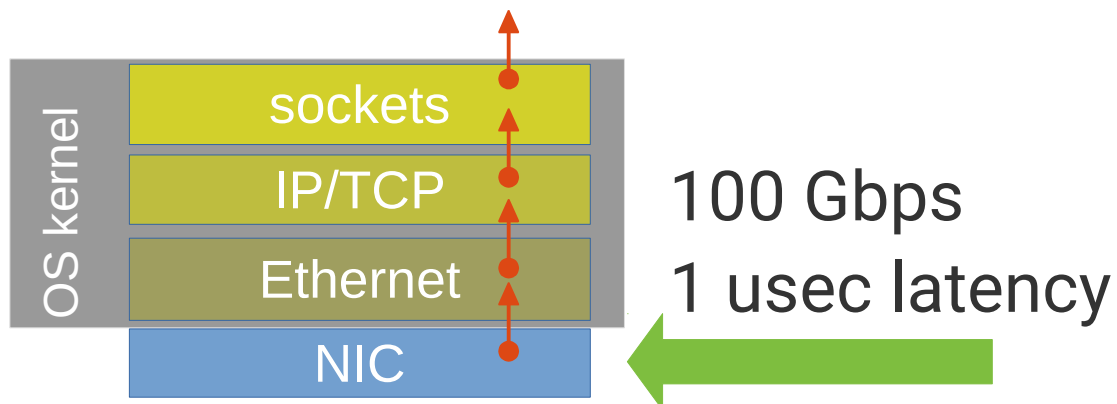
SSD

Apache Crail: Namenode

- Responsible for keeping track of storage resources in the cluster

  - Done by managing them in blocks (e.g., 1MB block size)

- Maintains a hierarchical node tree

  - directory, data files, stream files, multifiles, tables, KV

- Clients connect to the namenode to create new nodes, lookup, read, and write to nodes

  - Allocation policy (different media and node types)

  - A node can contains some blocks from DRAM and flash

Apache Crail: Clients

- Clients read and write data
  - Standalone or a part of a compute framework
  - Single writer, without holes files
  - Distributed clients often implicitly index and synchronize on the file/directory name

- Multiple-client side storage abstractions/interfaces
  - Simple hierarchical file system
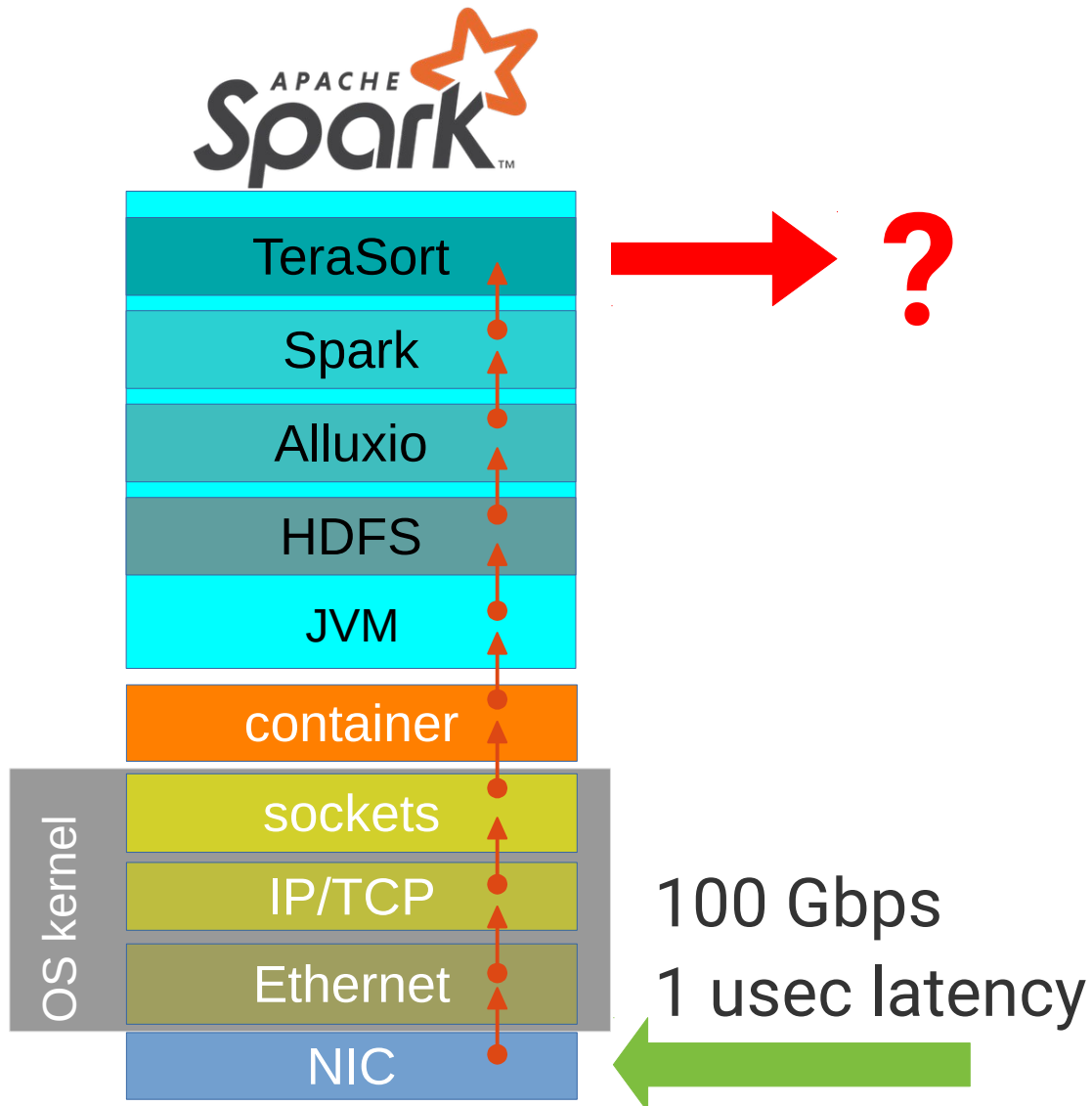 - Key-Value (KV) store
  - HDFS
  - Streaming (WiP)

So where does
the performance come from?

Performance Principles − I

100 Gbps
1 usec latency

Performance Principles − I

APACHE Spark™

TeraSort

Spark

Alluxio

HDFS

JVM

container

OS kernel

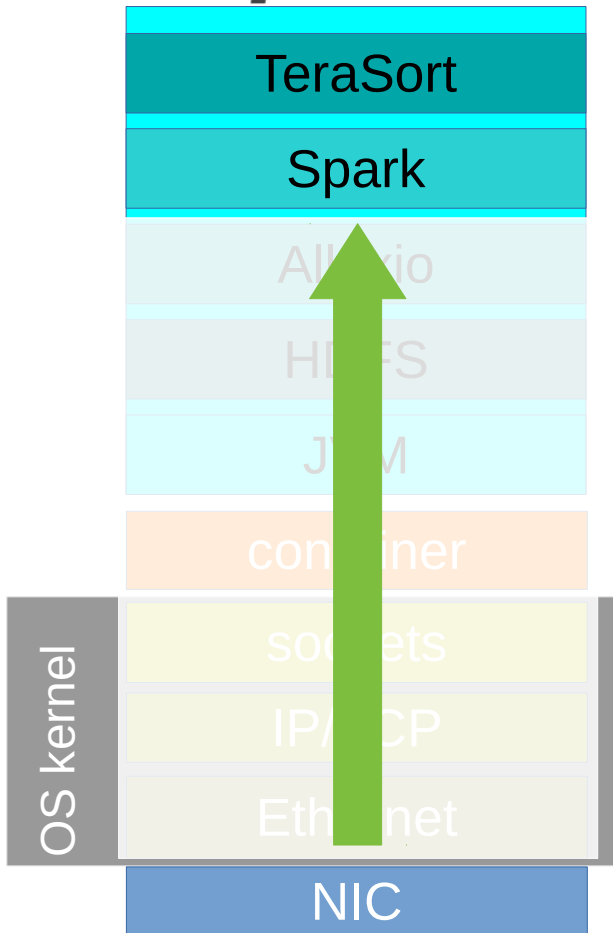sockets
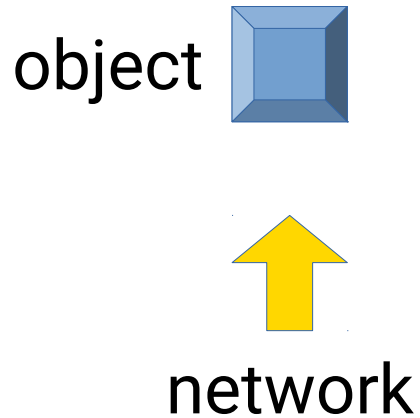
IP/TCP

Ethernet

NIC

?

100 Gbps
1 usec latency

Performance Principles − I

1. Use high-performance user-level I/O

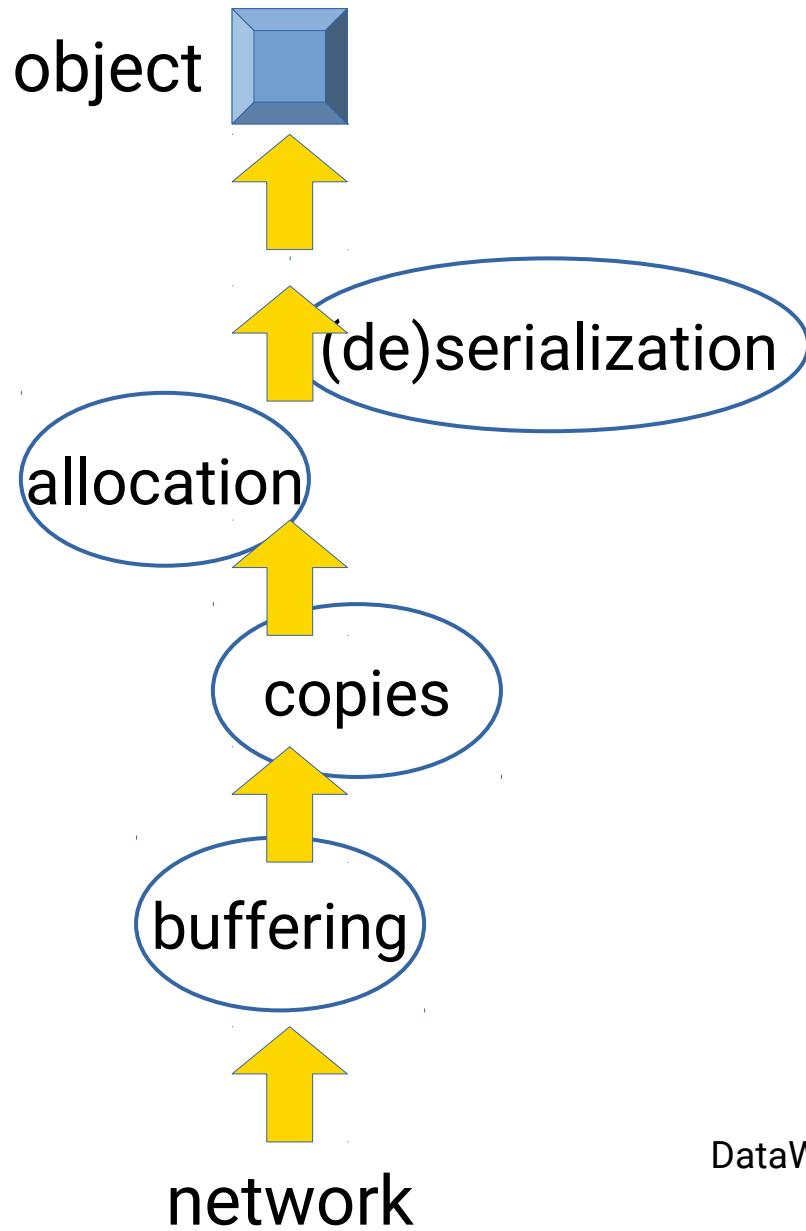RDMA[1], NVMeF[2], SPDK/DPDK in Java
- one-sided RDMA read/write operations

APACHE Spark™

TeraSort

Spark

Alluxio

HDFS

JVM

container

sockets

IP/TCP

Ethernet

OS kernel

NIC

100 Gbps
1 usec latency

Performance Principles – II

object

network

Performance Principles – II

object

(de)serialization

allocation

copies

buffering

network

Performance Principles – II

object

2. Careful software design for the µsec-Era

(de)serialization

allocation
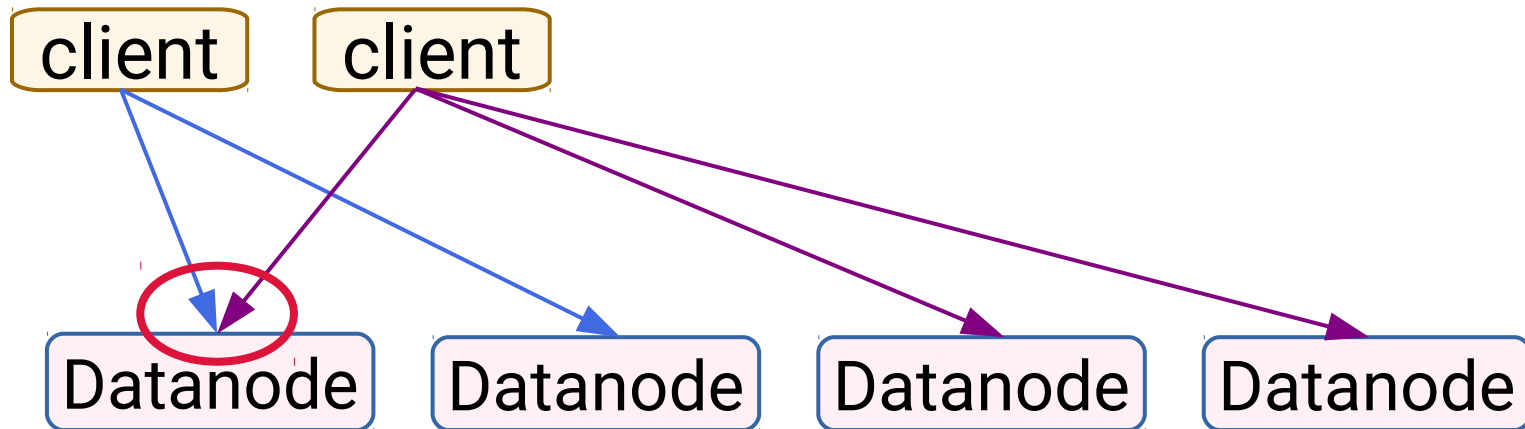
copies

buffering

network

software time budgeting, pre-allocation of buffers, buffer caching, and reusing, ownership, etc.
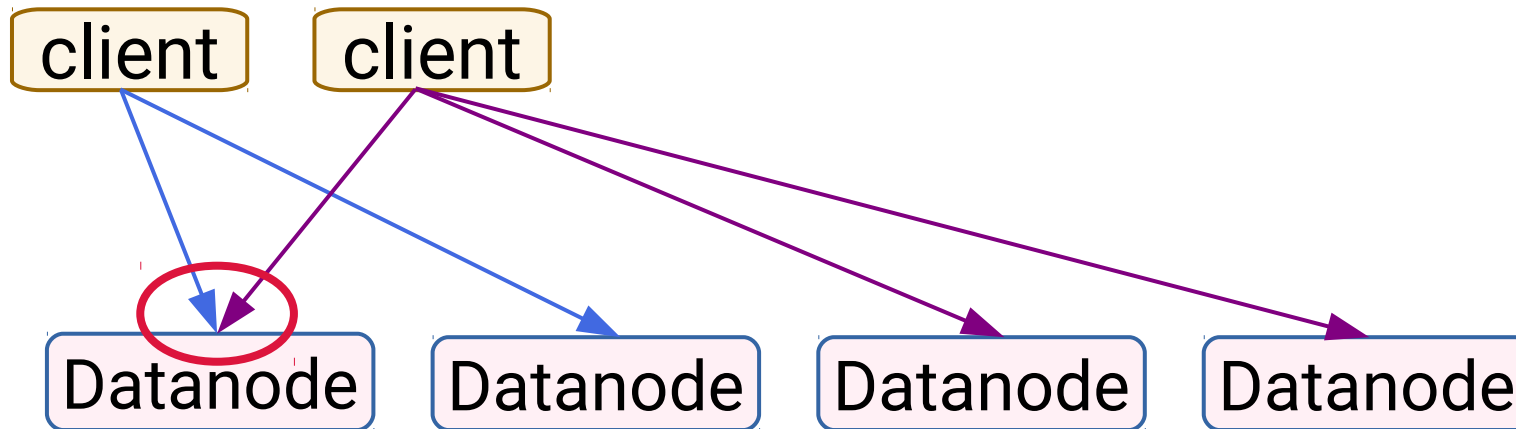
Performance Principles − III

Performance Principles – III

Performance Principles − III

3. Careful data orchestration in the cluster

randomization, async requests, compute-I/O overlap, smart buffering, data allocation policies, etc.

Performance Principle - Recap

1. Use high-performance user-level I/O

2. Careful software design for the μsec-Era

3. Careful data orchestration in the cluster

But what If I don't have … RDMA
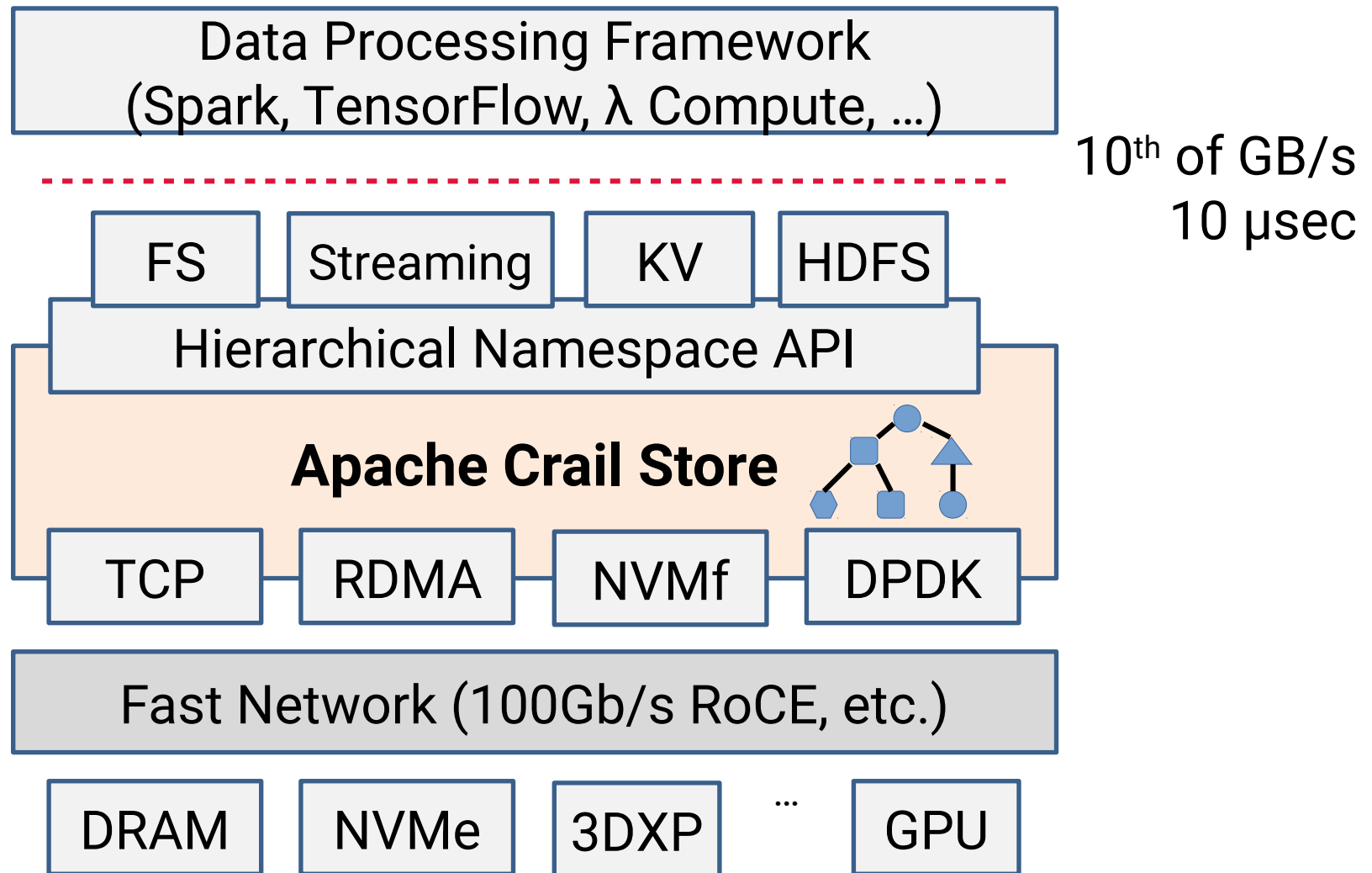
1. Use high-performance user-level I/O ✗

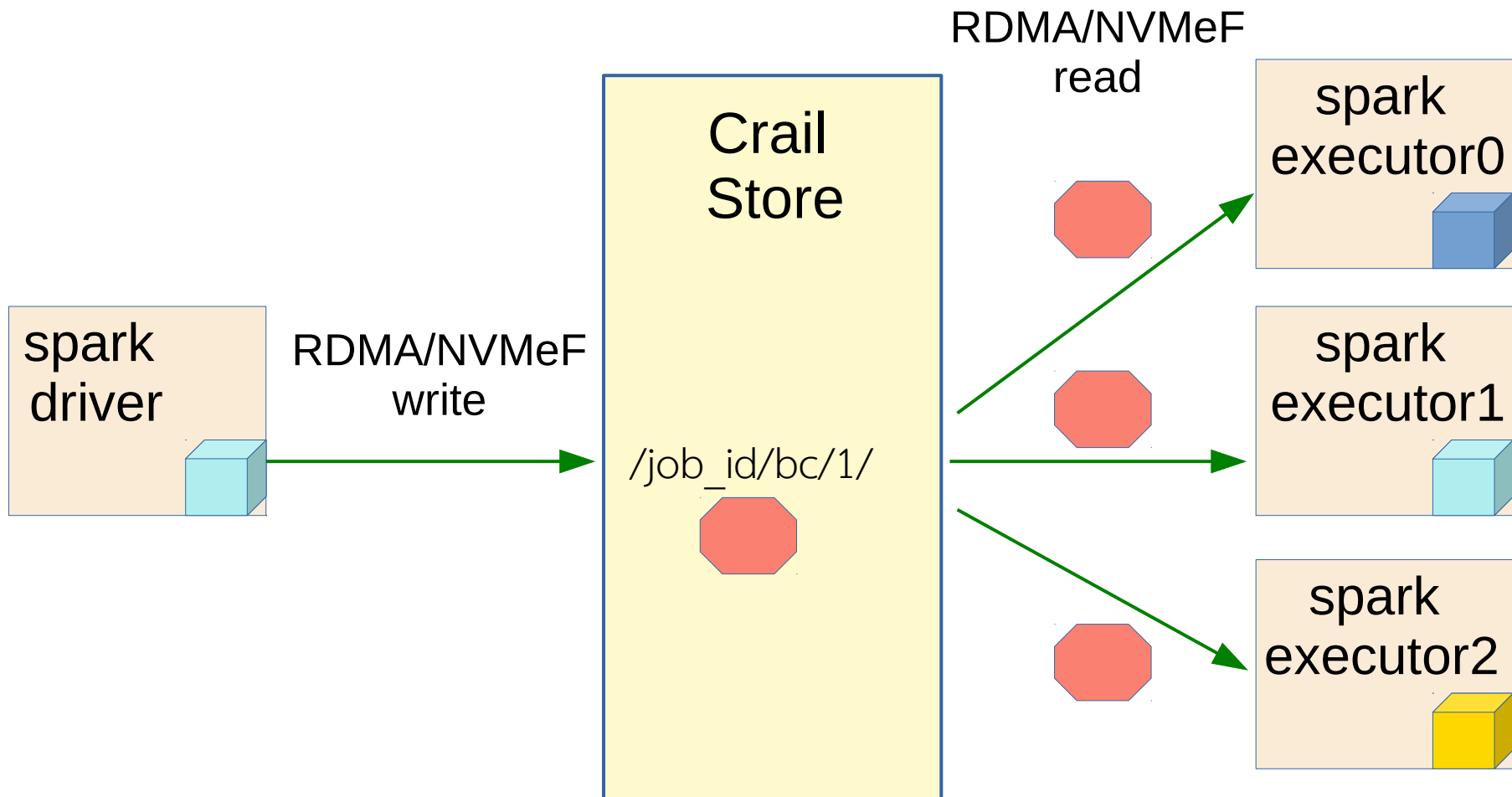**2. Careful software design for the μsec-Era** ✓

3. Careful data orchestration in the cluster ✓

The Full Apache Crail (Incubating) Stack

Data Processing Framework
(Spark, TensorFlow, λ Compute, …)

10th of GB/s
10 μsec

| FS | Streaming | KV | HDFS |

Hierarchical Namespace API

Apache Crail Store

| TCP | RDMA | NVMf | DPDK |

Fast Network (100Gb/s RoCE, etc.)

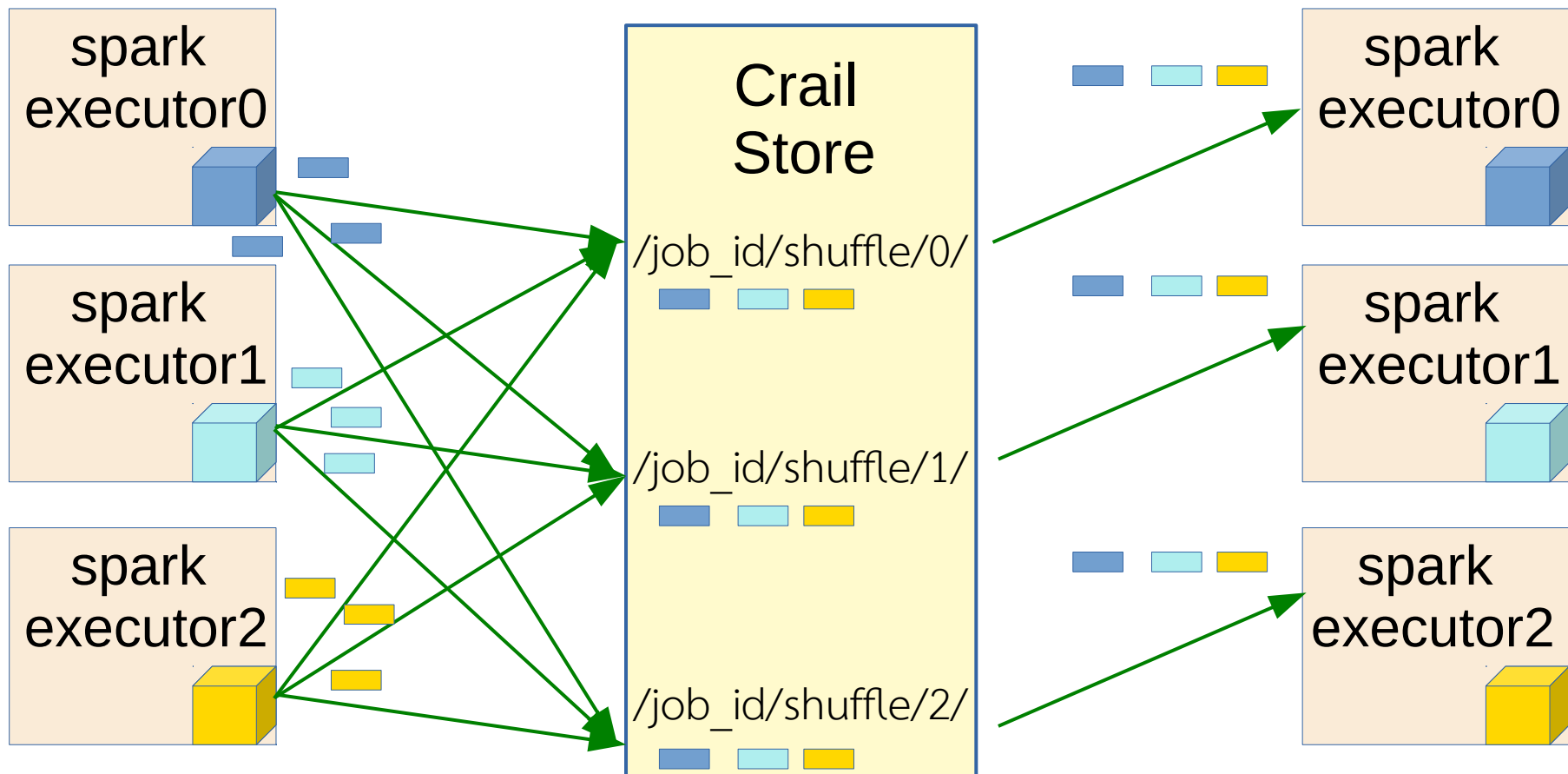| DRAM | NVMe | 3DXP | … | GPU |

Use in Apache Spark − Broadcast

Use in Apache Spark - Shuffle

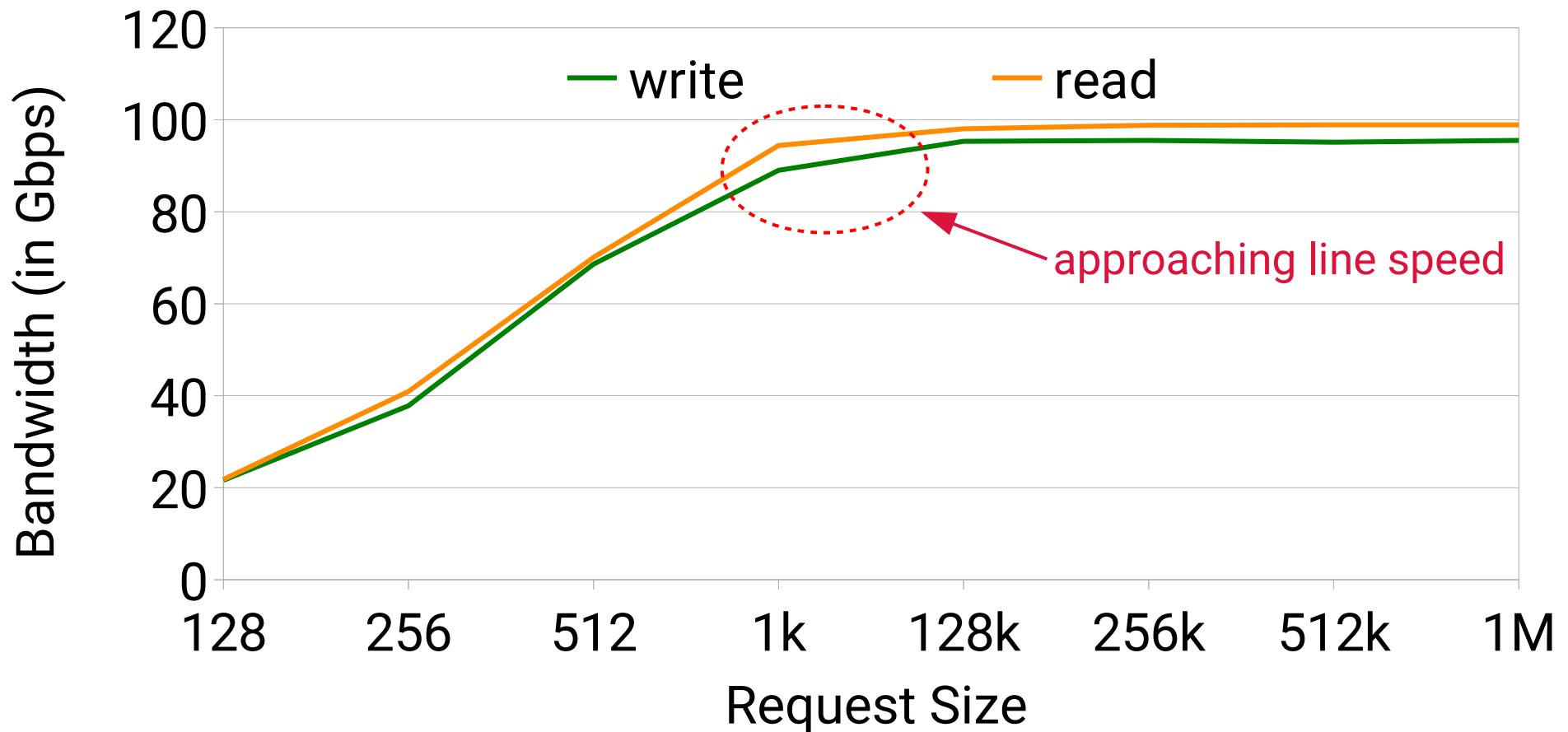Spark Shuffle plugin [4] that write and reads data in Crail

Performance Numbers

- Baseline performance for Apache Crail Store [6]:

  - Latency, bandwidth, and IOPS numbers in *a distributed setting in the JVM*

- Crail + Spark integration, available at [4]

  - Micro-operations: Broadcast and GroupBy

  - Workloads: TeraSort and SQL JOIN

  - Mixed DRAM and Flash setting

- A mix of x86 and POWER8 machines, 100 GbE network, 256GB DRAM DDR3, and NVMe flash
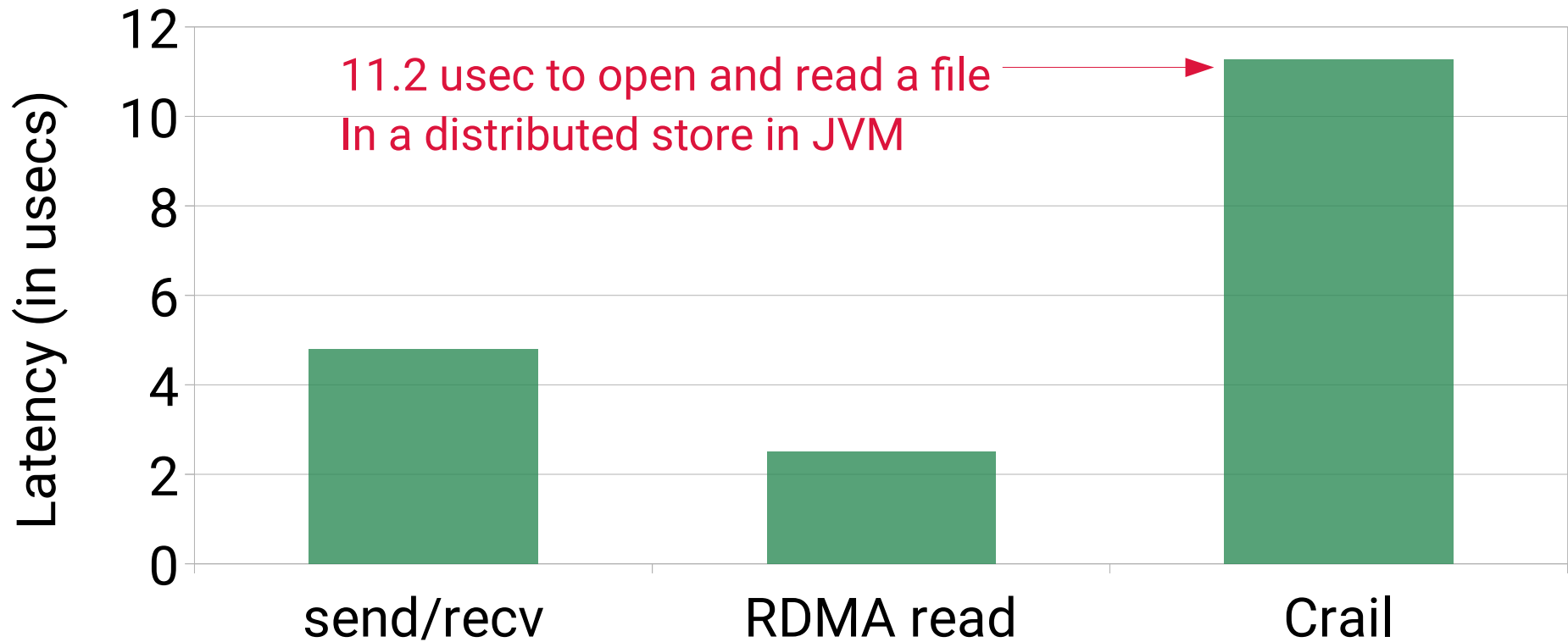
Crail Store − DRAM
"File Read Bandwidth"

Crail delivers full hardware bandwidth from DRAM

Crail Store – DRAM
"File Read Latency"

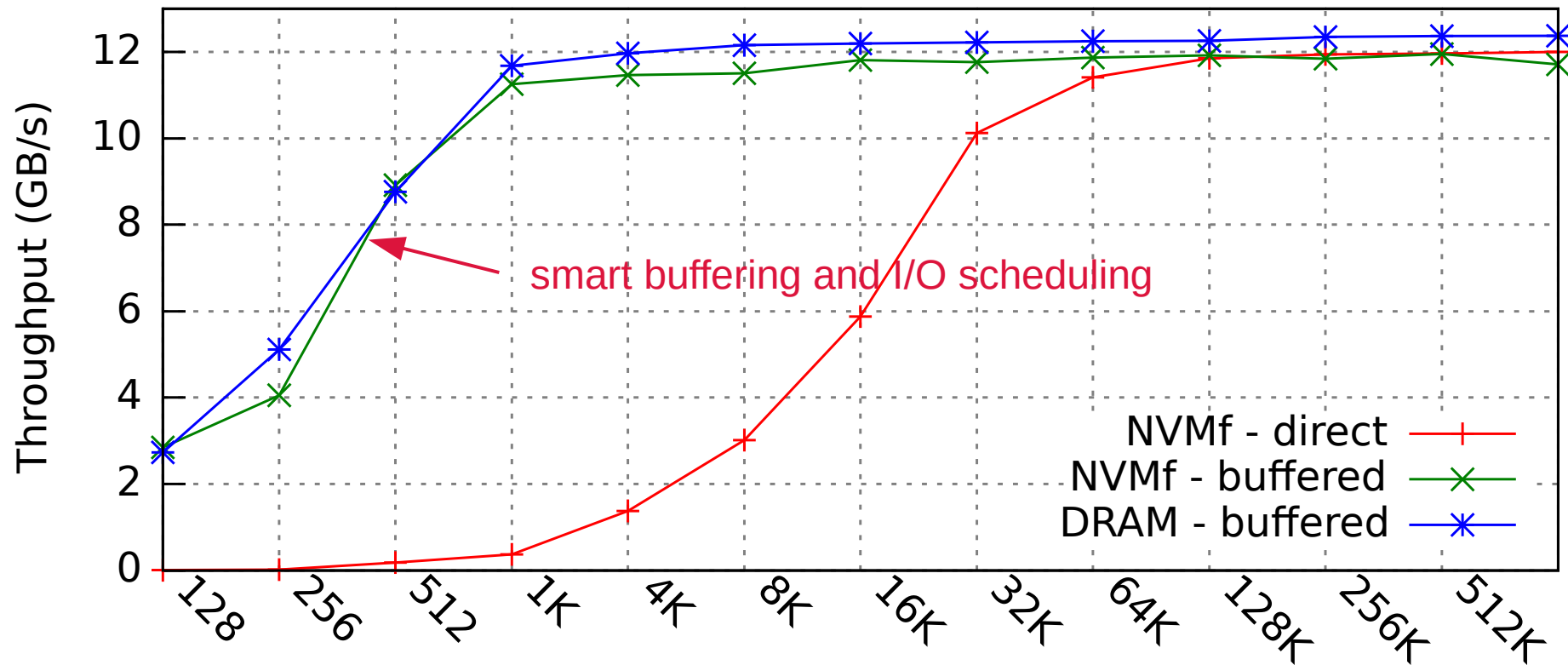

11.2 usec to open and read a file
In a distributed store in JVM

Crail delivers ultra-low file/data access latencies in JVM
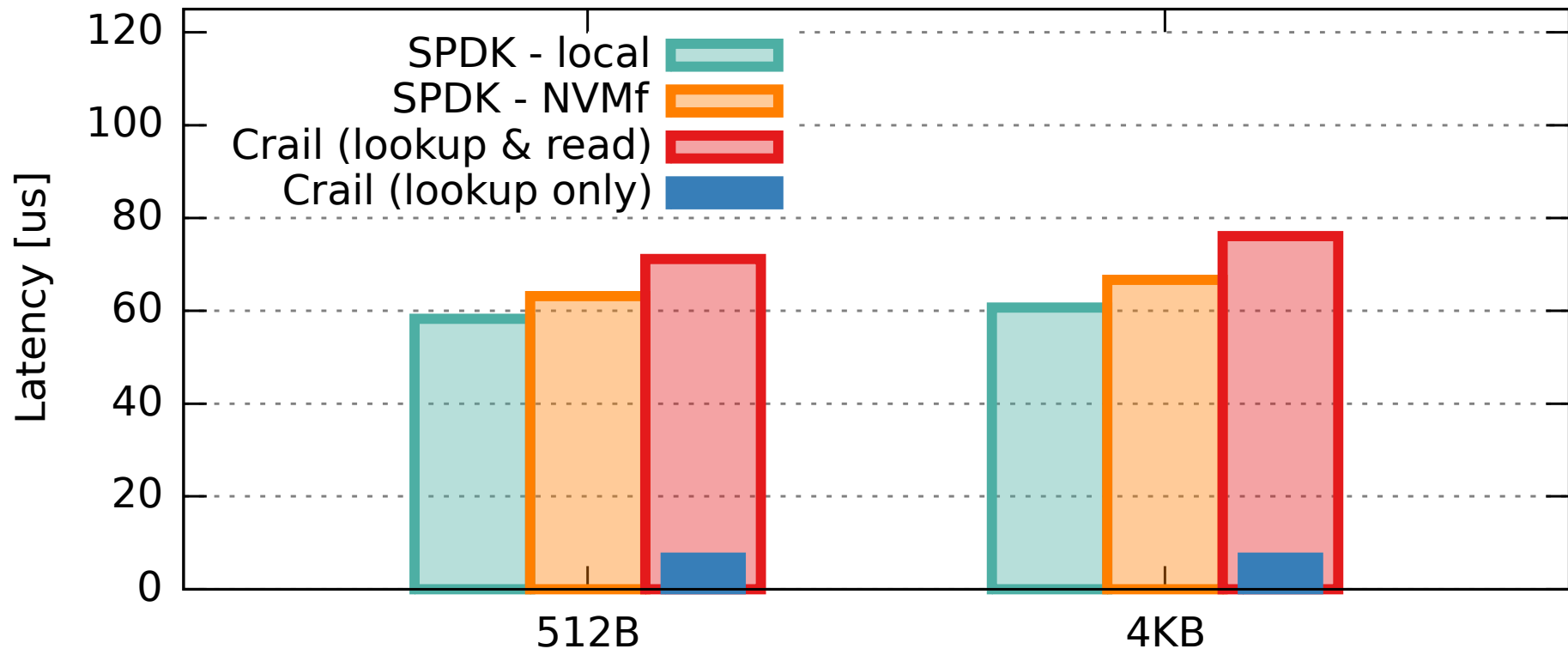
Crail Store − NVMeF
"File Read Bandwidth"

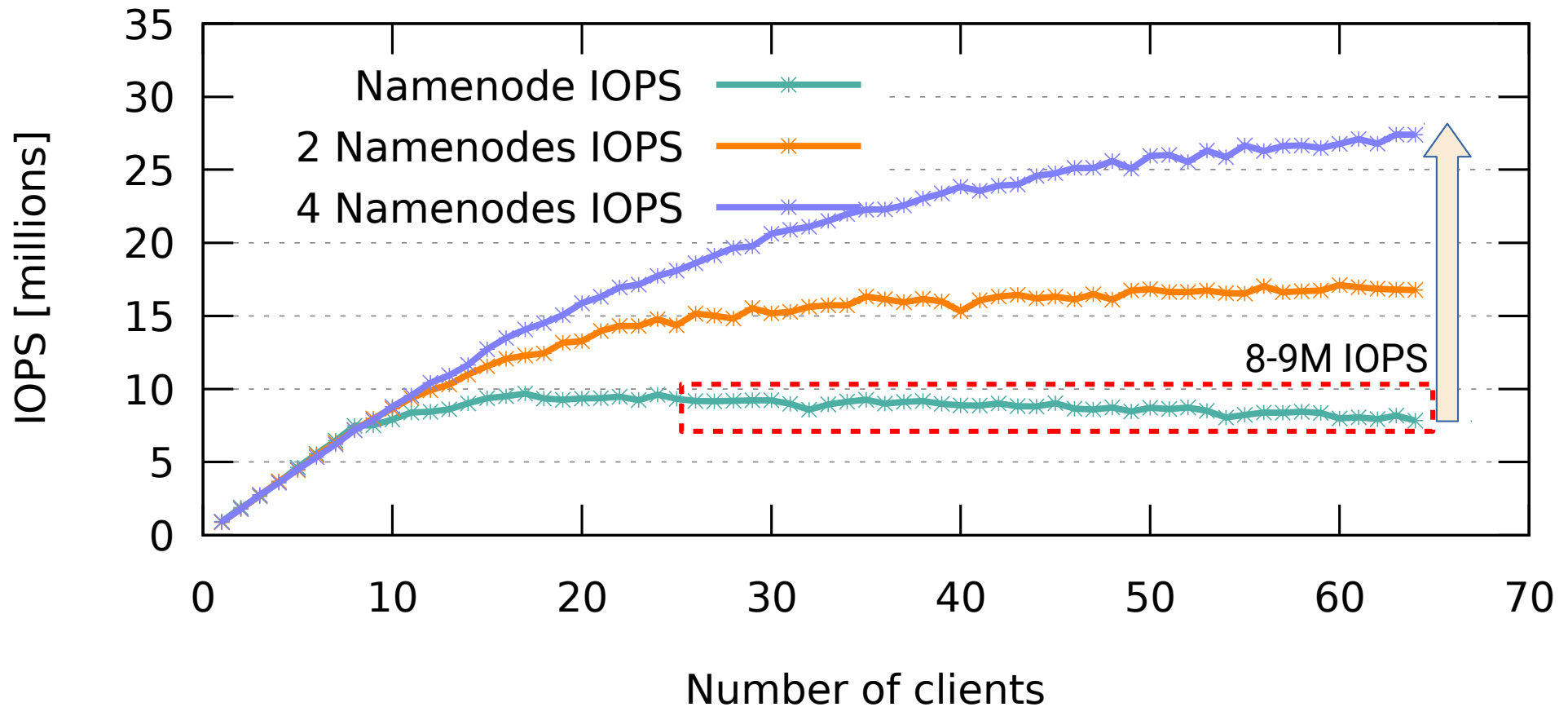Crail delivers full hardware bandwidth from remote NVMe flash

Crail Store − NVMeF
"File Read Latency"

Crail delivers native NVMe access performance in JVM

Crail Store − Metadata IOPS
”getFile operation”

Legend:
- Namenode IOPS
- 2 Namenodes IOPS
- 4 Namenodes IOPS

8-9M IOPS

Y-axis: IOPS [millions]
X-axis: Number of clients

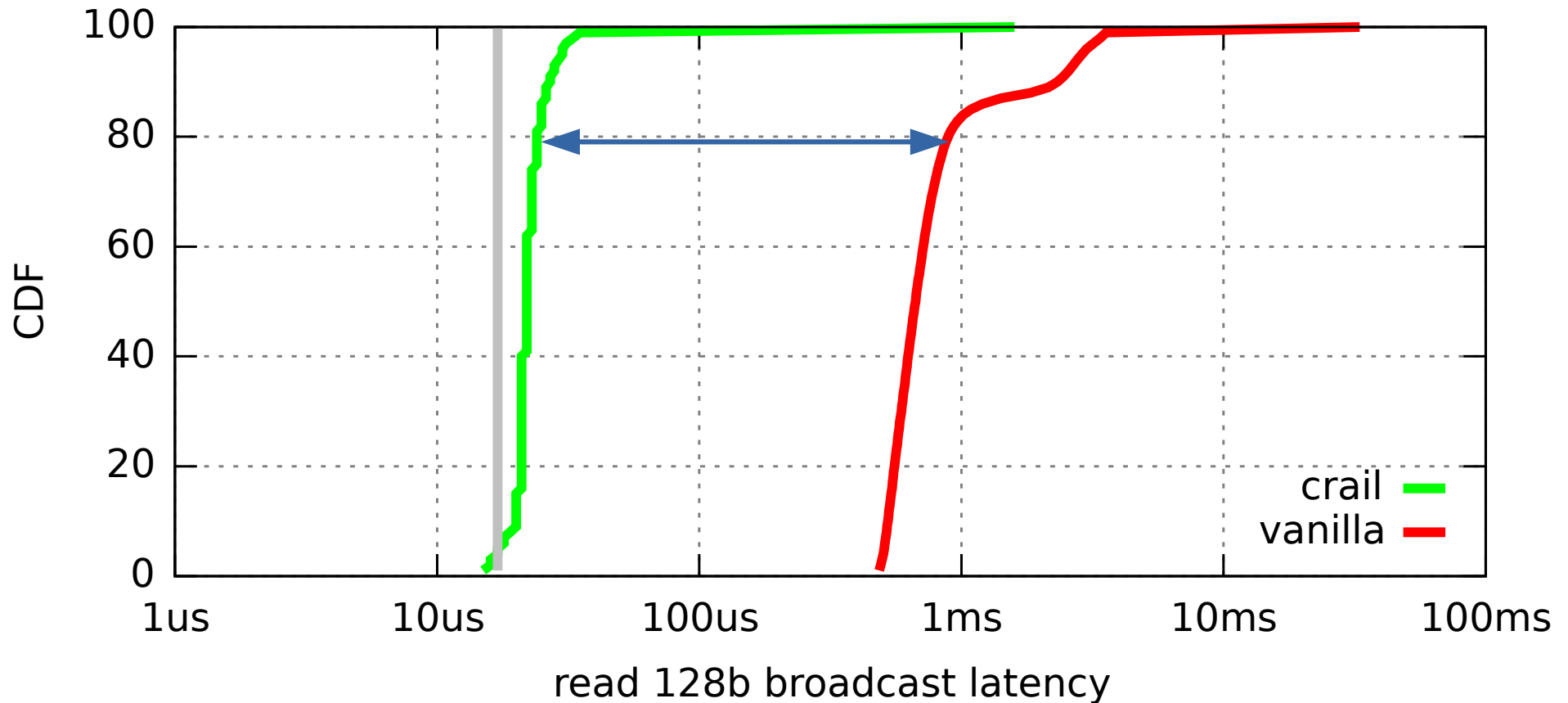**Crail offers (almost) linear scalability with Namenode ops**

How does data processing-level performance look like?

Apache Spark – TeraSort & SQL JOIN

Apache Spark Broadcast Module

Apache Spark Shuffle Module

Apache Crail Store (Incubating)

Crail Workload - Spark - Broadcast

read 128b broadcast latency

Crail offers 10-100x performance gains for Spark Broadcasts

Crail Workload - Spark - GroupBy

Groupby Spark/Crail

Groupby Vanilla Spark

Crail offers 2-5x performance gains for Spark Shuffle
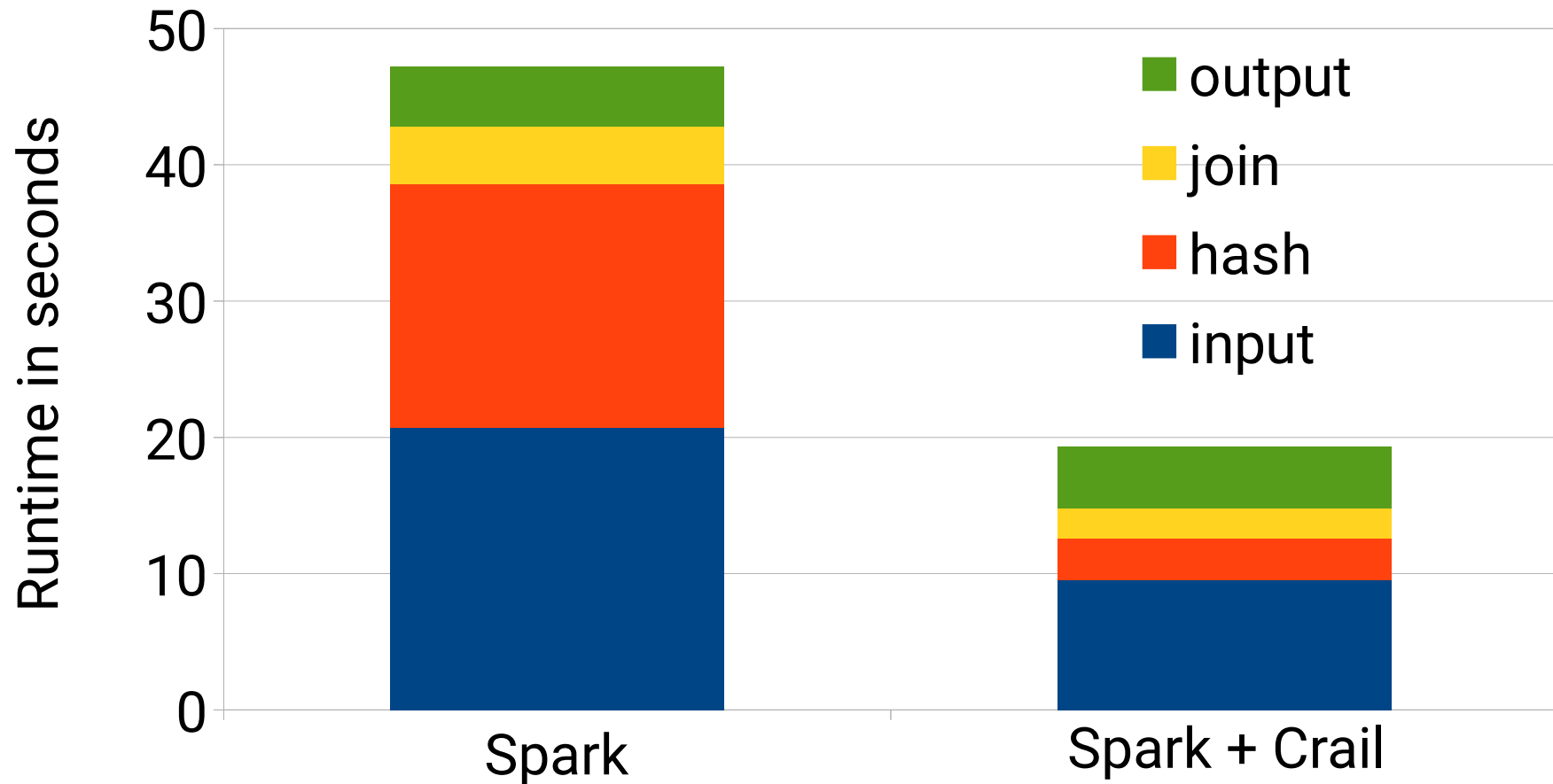
Crail Workload - Spark - TeraSort

Crail offers 6x performance gains for Spark TeraSort [7]

Crail Workload - Spark - TeraSort

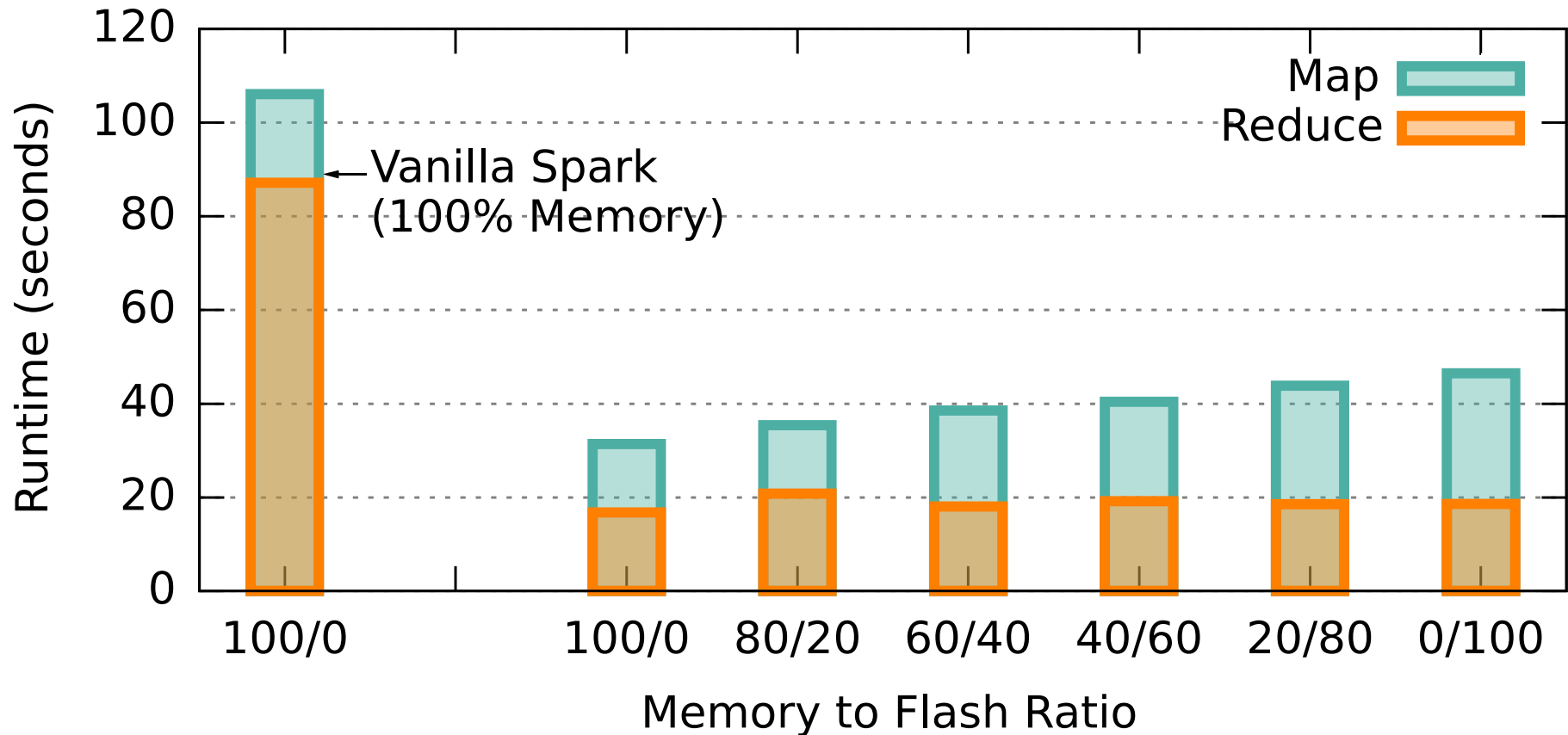# Crail Workload - Spark - EquiJoin

Runtime in seconds

- output
- join
- hash
- input

Spark   Spark + Crail

Crail offers 2x performance gains for SQL JOIN

Crail Store − Flash Disaggregation

Crail offers the possibility for storage dis-aggregation

Current Status and Future Plans

- Apache Incubator project since November, 2017

    - First source release (tag: 0db64fd), a few weeks ago

- Plenty of opportunities

    - Multiple languages support (C++ (WiP), Python, Rust, _your_fav_language_)

    - Multiple frameworks integration (Flink, Hadoop, λ compute, TensorFlow, SnapML[5], _your_fav_framework_here_)

    - Multiple datanode (network and storage) integration

    - Automated testing and packaging framework

    - Deploying in the cloud/containerization

    - JVM Optimizations

    - And all the fun stuff that you know and love about Apache projects !

Thanks to

Patrick Stuedi, Jonas Pfefferle, Michael Kaufmann, Adrian Schuepbach, Bernard Metzler

Thank you !

See you all at the mailing list :)

- Website: http://crail.incubator.apache.org/

- Blog: http://crail.incubator.apache.org/blog/

- Mailings list: dev@crail.incubator.apache.org

- JIRA: https://issues.apache.org/jira/browse/CRAIL

- Slack: https://the-asf.slack.com/messages/C8VDLDWMV

References

[1] DiSNI: Direct Storage and Networking Interface, https://github.com/zrlio/disni

[2] jNVMf: A NVMe over Fabrics library for Java, https://github.com/zrlio/jNVMf

[3] *Crail: A High-Performance I/O Architecture for Distributed Data Processing*", in the IEEE Bulletin of the Technical Committee on Data Engineering, Special Issue on Distributed Data Management with RDMA, Volume 40, pages 40-52, March, 2017. http://sites.computer.org/debull/A17mar/p38.pdf

[4] Crail I/O accleration plugins for Apache Spark, https://github.com/zrlio/crail-spark-io

[5] Snap machine learning (SnapML), https://www.zurich.ibm.com/snapml/

[6] Apache Crail (Incubating) performance blogs
- Part I: DRAM, http://crail.incubator.apache.org/blog/2017/08/crail-memory.html
- Part II: NVMeF, http://crail.incubator.apache.org/blog/2017/08/crail-nvme-fabrics-v1.html
- Part III: Metadata, http://crail.incubator.apache.org/blog/2017/11/crail-metadata.html

[7] Sorting on a 100Gbit/s Cluster using Spark/Crail, http://crail.incubator.apache.org/blog/2017/01/sorting.html

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