# BFQ, Multiqueue-Deadline, or Kyber? Performance Characterization of Linux Storage Schedulers in the NVMe Era

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This paper won the **best paper award** in ICPE'24.

OLarge Research Massivizing Computer Systems https://atlarge-research.com/









### Background: What has Changed?

1. Huge improvement of storage performance.



2. Improvement of CPU performance stalls.



### Background: What has Changed?



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#### The Linux I/O Schedulers

D2FQ: Device-Direct Fair Queueing for NVMe SSDs Jiwon Woo, Minwoo Ahn, Gyusun Lee, Jinkyu Jeong Sungkyunkwan University Rearchitecting Linux Storage Stack for us Latency and High Throughput Midhul Vuppalapati Rachit Agarwal Jaehyun Hwang Simon Peter Cornell University Cornell University UT Austin Cornell University K2: Work-Constraining Scheduling of  $(\checkmark)$ NVMe-Attached Storage Till Miemietz, Hannes Weisbach Michael Roitzsch, Hermann Härtig Operating Systems Group Barkhausen Institut **Multi-Oueue Fair Oueueing** Mohammad Hedavati Kai Shen Michael L. Scott Mike Marty University of Rochester Google University of Rochester Google e Linux's nered storage -queue storag ges to real conceptually en existing ut it either 17, 19] ric within a few microseconds. GPUs and machine learning ather than accelerators may offload computations that run just a few miit has emerged Modern high-speed devices (e.g., network adapters, storage, t state-ofcroseconds at a time [30]. At the same time, the proliferation and hardware. accelerators) use new host interfaces, which expose multiple ussing on of multicore processors has necessitated architectures tuned software queues directly to the device. These multi-queue in ort for realapplications terfaces allow mutually distrusting applications to access the for independent I/O across multiple hardware threads [4, 36]. Me device le show that it These technological changes have shifted performance botdevice without any cross-core interaction, enabling throughrastructure g Linux, even tlenecks from hardware resources to the software stacks that put in the order of millions of IOP/s on multicore systems. differences os at through. manage them. In response, it is now common to adopt a multi-Unfortunately, while independent device access is scalable, chnologies. w latency and queue architecture in which each hardware thread owns a it also introduces a new problem: unfairness, Mechanisms to control ed even when dedicated I/O queue, directly exposed to the device, giving cause K2 that were used to provide fairness for older devices are no ources at each it an independent path over which to send and receive redifications e kernel stack. longer tenable in the wake of multi-queue design, and straightquests. Examples of this architecture include multi-queue es, but are forward attempts to re-introduce it would require cross-core out any modifisynchronization that undermines the scalability for which SSDs [22, 38, 50] and NICs [42], and software like the ur research rdware, kernel us driving. Windows and Linux NVMe drivers, the Linux multi-queue multiple openes were designed that is needed block laver [5], SCSI multi-queue support [8], and data-plane the level To address these challenges, we present Multi-Queue Fair OSes [4, 36]. A recent study [51] demonstrated up to 8× e-internal Queueing (MQFQ), the first fair, work-conserving scheduler rchitecture for performance improvement for YCSB-on-Cassandra, using ple times. suitable for multi-queue systems. Specifically, we (1) reformuwitch is that ately, read multi-queue NVMe instead of single-queue SATA. late a classical fair queueing algorithm to accommodate multileasures to queue designs, and (2) describe a scalable implementation To support the full bandwidth of modern devices, multiare [8], makes queue I/O systems are designed to incur no cache-coherence that bounds potential unfairness while minimizing synchroreal-time vork switches nization overhead. Our implementation of MOFO in Linux traffic in the common case when sending and receiving ree concept witch adapts 4.15 demonstrates both fairness and high throughout. Evaluaquests. It's easy to see why: a device supporting millions of eduler [20] king literature tion with an NVMe over RDMA fabric (NVMf) device shows IOP/s sees each new request in a fraction of a microsecond-a nd load is essing of inditime interval that allows for fewer than 10 cross-core cache that MOFO can reach up to 3.1 Million IOP/s on a single But instead network concoherence misses, and is comparable to the latency of a single machine-20× higher than the state-of-the-art Linux Budmolements storage stack. inter-processor interrupt (IPI). Serializing requests at such get Fair Queueing. Compared to a system with no fairness. nstraining high speeds is infeasible now, and will only become more MOFO reduces the slowdown caused by an antagonist from e in order so as device speeds continue to increase while single-core 3.78× to 1.33× for the FlashX workload and from 6.57× to ahead of a 1.03× for the Aerospike workload (2× is considered "fair" performance stays relatively flat. As a result, designers have ntation 113 concluded that conventional fair share I/O schedulers including fair queueing approaches [35, 40], which reorder requests ached stor 1 Introduction in a single queue, are unsuited for modern fast devices. n ID. One Recent years have seen the proliferation of very fast devices Unfortunately, by cutting out the OS resource scheduler, s no longer for I/O, networking, and computing acceleration. Commod-

direct multi-queue device access undermines the OS's tradiity solid-state disks (e.g., Intel Optane DC P4800X [22] or tional responsibility for fairness and performance isolation. Samsung PM1725a [38]) can perform at or near a million While I/O devices (e.e. SSD firmware, NICs) may multiplex I/O operations per second. System-area networks (e.g., Inhardware queues, their support for fairness is hampered by finiBand) can sustain several million remote operations per their inability to reason in terms of system-level policies for second over a single link [25], RDMA delivers data across fabresource principals (applications, virtual machines, or Linux

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slowdown).

Abstract

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No plug-and-play implementations.

#### The most available I/O schedulers?



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NVMe WRR

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Linux I/O schedulers!

D2FQ: Device-Direct Fair Queueing for NVMe SSDs							
Jiwon Woo, Minwoo Ahn, Gyusun Lee, Jinkyu Jeong Sungkyunkwan University Rearchitecting Linux Storage Stack for µs Latency and High Throughput	No plu						
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None	BFQ						
<ul> <li>Least overhead.</li> </ul>							
• No performance guarantees.							

#### No plug-and-play implementations.

#### he most available I/O schedulers?

Linux I/O schedulers!

#### Kyber

- Designed for fast SSDs.
- Balancing between read and write.

- Fair-share between apps.
- Complex, high overhead.

#### **MQ-Deadline**

- Issues request with increasing sector order.
- Soft latency deadlines.

Setup



#### **Research Questions**

#### **RQ1: Overhead**



### **Research Questions**

#### **RQ1: Overhead**

- Latency?
- Throughput?

### **RQ2: Scalability**



### **Research Questions**

#### **RQ1: Overhead**

- Latency?
- Throughput?

### **RQ2: Scalability**

- L-apps.
- T-apps.
- SSDs.

#### **RQ3: Interference**

• Read L-app + increasing write T-apps.



# RQ1. Overheads

#### **Overhead**



Slightly higher latency, up to 2.7% higher latency.

Significantly lower throughput, up to 36.7% lower.

I/O schedulers  $\rightarrow$  Significantly higher throughput overhead.

# RQ2. Scalability

# Scalability of L-apps



Higher workload  $\rightarrow$  higher overhead.

#### Why?

# Scalability of L-apps: CPU Usage



When CPU bottlenecked  $\rightarrow$  higher latency overheads.

#### Scalability of T-apps: 1 SSD vs. 8 SSDs 1 SSD



Big gap of scalability on throughput between different I/O schedulers.



Big gap of scalability on throughput between different I/O schedulers.

More devices  $\rightarrow$  better scalability.



### Scalability of T-apps: CPU Usage



The scalability issues are caused by high CPU contention.

### Lock Overhead of I/O Schedulers



BFQ and MQ-Deadline  $\rightarrow$  high CPU lock overhead.

Adding devices mitigates the lock overhead.

January, 2024: Identified by the Linux kernel developers<sup>[5][6]</sup>.

# RQ3. Taming I/O Interference

# 1 L-app (R) + Increasing T-apps (W)



# 1 L-app (R) + Increasing T-apps (W)



BFQ and Kyber  $\rightarrow$  low latency for the foreground L-app.

### Conclusions

RQ1: What is the overhead of Linux I/O schedulers?

- Minor latency overhead.
- Significantly throughput overhead.

RQ2: What is the scalability of Linux I/O schedulers?

- Latency  $\rightarrow$  depends on CPU.
- Throughput, BFQ and MQ-DL  $\rightarrow$  high lock contention.
- Throughput, Kyber  $\rightarrow$  good, similar to None.

RQ3: Can the Linux I/O schedulers tame I/O inference?

 Only BFQ and Kyber can provide bounded performance.



400

300

200 100

Throughput (KIOPS)



### Take-Home Messages

- I/O Schedulers can influence the performance significantly. None has the lowest overhead and highest scalability.
   BFQ has the highest overhead and lowest scalability.
- Different schedulers have different locking and scaling overheads.
   BFQ = MQ-Deadline > Kyber > None.
- 3. Use *Kyber* to prioritize *foreground reads with background writes*. HotCloudPerf'24 A Systematic Configuration Space Exploration of the Linux Kyber I/O Scheduler



Paper: <u>https://atlarge-research.com/pdfs/2024-io-schedulers.pdf</u> Source code: <u>https://github.com/ZebinRen/icpe24\_io\_scheduler\_study\_artifact</u>



# Thank you! Questions?



Paper: <u>https://atlarge-research.com/pdfs/2024-io-schedulers.pdf</u> Source code: <u>https://github.com/ZebinRen/icpe24\_io\_scheduler\_study\_artifact</u>



#### Resources

#### Images used:

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[5] <u>https://www.phoronix.com/news/BFQ-IO-Better-Scalability</u>

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#### Resources

#### Linux I/O schedulers

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3. Deadline IO scheduler tunables

https://docs.kernel.org/block/deadline-iosched.html#:~:text=The%20goal%20of%20the%20deadline.value%20in%20units%20of%20milliseconds.

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5. MQ-Deadline Scheduler Optimized For Much Better Scalability

#### New I/O schedulers

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10. Jieun Kim, Dohyun Kim, and Youjip Won Fair I/O Scheduler for Alleviating Read/Write Interference by Forced Unit Access in Flash Memory. HotStorage 2022.

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# **Backup Slides**

CPU or NVMe SSD, What is the Bottleneck?



Multiple I/O requests

Enough CPU resources  $\rightarrow$  4 processes

#### **SSD** Performance



(a) Vary request sizes, 1 SSD.

(b) Vary # processes with 1 SSD. (c) Vary # processes with 8 SSDs.



### L-app Scalability



Figure 2: Intra-process scalability latency CDFs with increasing queue depth (QD); Note the different x-axis scale for (e).



Figure 3: Inter-process scalability latency CDFs with increasing number of L-apps; Note the different x-axis scale for (e).

#### L-app CPU cost



Figure 4: CPU usage for intra/inter-process concurrency.

#### L-app Scalability Heatmap

60	 														
00	256-	10.4	14.9	13.0	12.2	256-	50.2	55.5	54.7	53.2	256	13.9	23.1	13.7	14.7
50-	128-	5.9	7.8	6.8	6.6	128-	23.6	27.3	25.7	25.1	128-	7.0	10.5	7.0	7.0
40.	64	3.6	4.3	3.9	3.8	64-	11.6	13.3	12.5	12.1	64	3.6	4.9	3.5	3.5
40	32-	2.4	2.6	2.5	2.4	32-	5.4	6.3	5.9	5.8	32-	2.3	2.4	2.3	2.3
30-	16-	1.8	1.8	1.8	1.8	16-	2.7	3.1	2.9	2.8	16	1.7	1.7	1.7	1.7
20.	8-	1.5	1.5	1.5	1.5	8-	1.6	1.6	1.6	1.6	8-	1.5	1.5	1.5	1.5
20	4-	1.4	1.4	1.4	1.4	4-	1.4	1.4	1.4	1.4	4	1.3	1.3	1.3	1.3
10-	2-	1.2	1.3	1.2	1.2	2-	1.2	1.3	1.2	1.2	2-	1.1	1.2	1.1	1.1
0.	1-	1.0	1.0	1.0	1.0	1-	1.0	1.1	1.0	1.0	1-	1.0	1.1	1.0	1.0
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(a) 1 core, 1 process y-axis: QD (b) 1 core, QD 1 (c) 10 cores, QD 1 y-axis: # processes y-axis: # processes

#### **SSD Scalability**



Figure 9: T-app inter-process scalability (10 cores, 10 concurrent T-4KiB-apps) with an increasing number of SSDs.

### L-app Interference



Figure 11: L-app tail latency with an increasing number of interfering background applications; *Note: scales differ on the y-axis and they are in Milliseconds!* 

### **T-app Interference**



Figure 12: Read throughput (IOPS) of a T-4KiB-app workload with an increasing number of interfering background T-64KiB-app workload. Note: The y-axis is log-scale.

# 1 T-app (R) + Increasing T-apps (W)



BFQ and Kyber  $\rightarrow$  higher bandwidth for the foreground T-app.

# Lock in the I/O Schedulers In block/mq-deadline.c

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```
struct deadline data {
         /*
                                                  826
                                                         */
          * run time data
                                                 827
                                                        static void dd_insert_requests(struct blk_mg_hw_ctx *hctx,
                                                 828
                                                                                      struct list_head *list, bool at_head)
          */
                                                 829
                                                        {
                                                 830
                                                                struct request queue *q = hctx->queue;
         struct dd_per_prio per_prio[DD_
                                                 831
                                                                struct deadline data *dd = q->elevator->elevator data;
                                                 832
         /* Data direction of latest dis
                                                                spin lock(&dd->lock);
                                                 833
                                                  834
         enum dd data dir last dir;
                                                                WHILE (: LISC_Empty(LISC/)
                                                  835
                                                                       struct request *rq;
         unsigned int batching;
                                                  836
         unsigned int starved;
         /*
          * settings that change how the
          */
         int fifo expire[DD DIR COUNT];
                                                       static struct request *dd_dispatch_request(struct blk_mq_hw_ctx *hctx)
                                                 572
                                                 573
                                                       {
         int fifo batch:
                                                 574
                                                               struct deadline data *dd = hctx->queue->elevator->elevator data;
         int writes starved;
                                                 575
                                                               const unsigned long now = jiffies;
         int front_merges;
                                                 576
                                                               struct request *rq;
         u32 async depth;
                                                 577
                                                               enum dd_prio prio;
                                                 578
         int prio aging expire;
                                                 579
                                                               spin lock(&dd->lock);
                                                 580
                                                              rg = dd dispatch prio aged requests(dd, now);
         spinlock t lock;
                                                 581
                                                              if (ra)
                                                 582
                                                                      goto unlock;
         SPINLOCK_L ZONE_LOCK,
                                                                                                                      40
};
```

# Lock in the I/O Schedulers Reduced lock contention

#### Dispatch

```
/* Maps an I/O priority class to a deadline scheduler priority. */
@@ -600,6 +607,15 @@ static struct request *dd_dispatch_request(struct blk_mg_hw_ctx *hctx)
        struct request *ra;
        enum dd_prio prio;
        /*
         * If someone else is already dispatching, skip this one. This will
         * defer the next dispatch event to when something completes, and could
         * potentially lower the queue depth for contended cases.
         */
        if (test_bit(DD_DISPATCHING, &dd->run_state) ||
            test_and_set_bit(DD_DISPATCHING, &dd->run_state))
                return NULL:
        spin_lock(&dd->lock);
        rg = dd_dispatch_prio_aged_requests(dd, now);
        if (ra)
@@ -616,6 +632,7 @@ static struct request *dd_dispatch_request(struct blk_mg_hw_ctx *hctx)
```

# Lock in the I/O Schedulers Reduced lock contention

#### Insertion

```
+/*
+ * If we can grab the dd->lock, then just return and do the insertion as per
+ * usual. If not, add to one of our internal buckets, and afterwards recheck
+ * if if we should retry.
+ */
+static bool dd_insert_to_bucket(struct deadline_data *dd,
                                struct list_head *list, int *sea)
       acquires(&dd->lock)
       struct dd_bucket_list *bucket;
       int next sea:
       *seg = atomic read(&dd->insert seg);
       if (spin_trylock(&dd->lock))
                return false:
       if (!test_bit(DD_INSERTING, &dd->run state)) {
                spin lock(&dd->lock);
                return false;
        3
       *seg = atomic_inc_return(&dd->insert_seg);
        bucket = &dd->bucket lists[get cpu() & DD CPU BUCKETS MASK];
        spin_lock(&bucket->lock);
        list_splice_init(list, &bucket->list);
       spin_unlock(&bucket->lock);
        put cpu();
```

# Lock in the I/O Schedulers Reduced lock contention

Results

Device	QD	Jobs	IOPS	Lock contention
null_blk nvme0n1	4 4	32 32 32	1090K 1070K	92% 94%

With that	in place,	the same	test case	now does:	
Device	QD	Jobs	IOPS	Contention	Diff
null_blk nvme0n1	4 4 4	32 32 32	2250K 2560K	28% 23%	+106% +112%

https://lore.kernel.org/linux-block/20240118180541.930783-1-axboe@kernel.dk/?s=09

### Who Are We/Am I?