

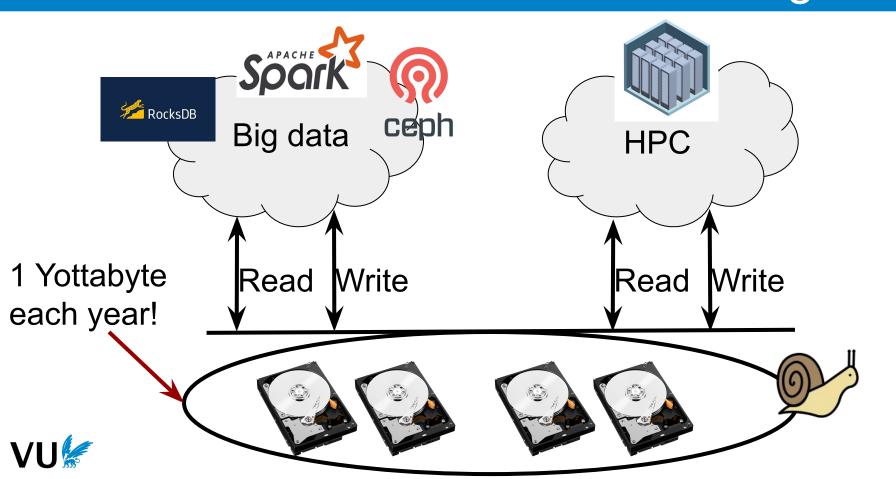
@Large Research Massivizing Computer Systems



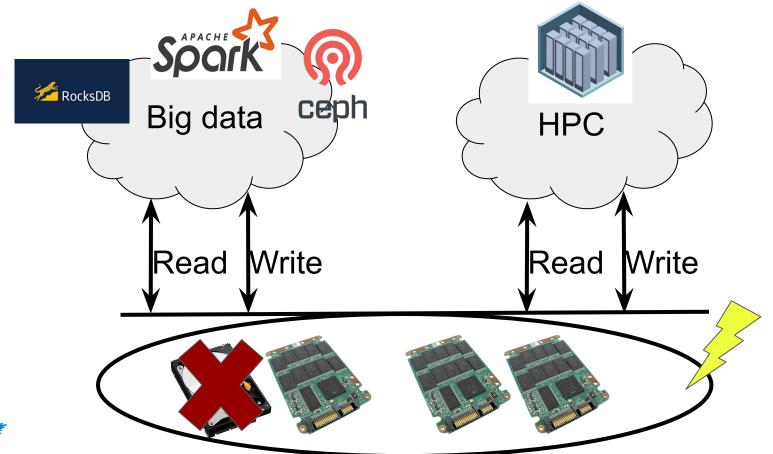
Performance Characterization of NVMe Flash Devices with Zoned Namespaces (ZNS)

Krijn Doekemeijer, Nick Tehrany, Balakrishnan Chandrasekaran, Mattias Bjørling, Animesh Trivedi

The amount of data is ever-increasing



Flash SSDs have become ubiquitous





What we will discuss today

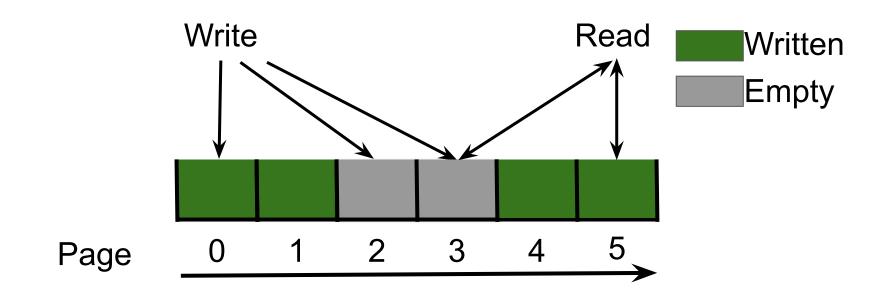
Problem:

- 1. Block interface does not perform for flash
- 2. New ZNS interface promises good performance
- 3. ZNS' performance characteristics are not known...

Goal: Infer ZNS performance characteristics

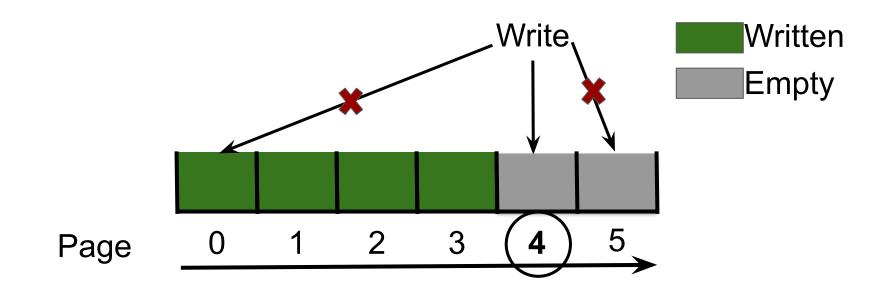


Block interface: Random write/read



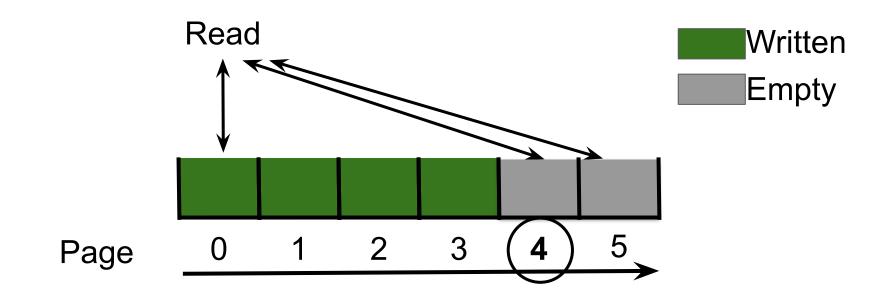


Flash is different: Sequential writes only



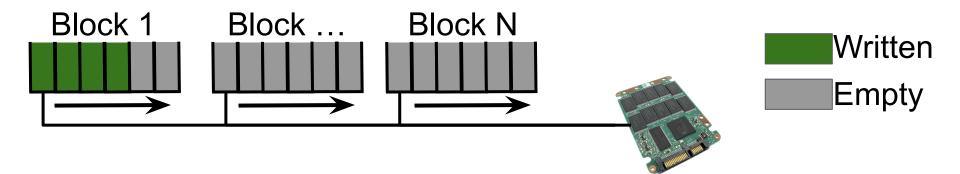


Flash is different: Random reads



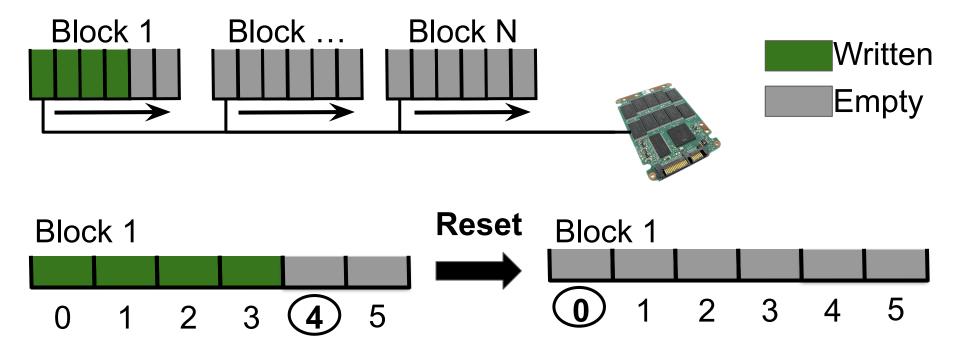


Flash is different: Reset at block level



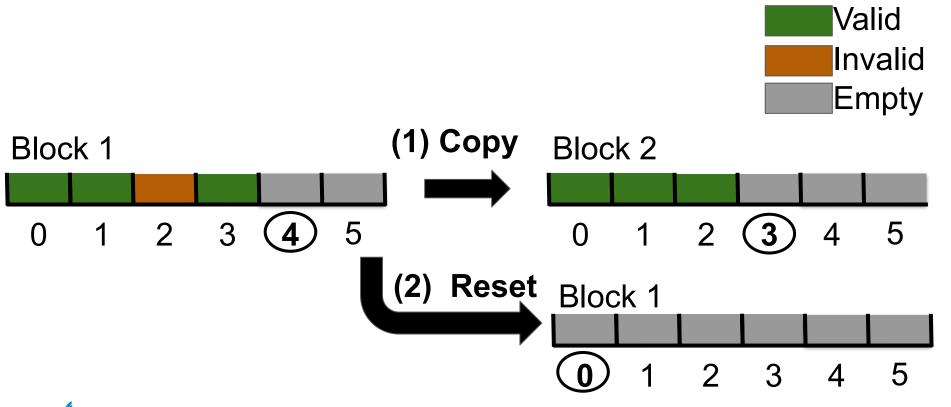


Flash is different: Reset at block level





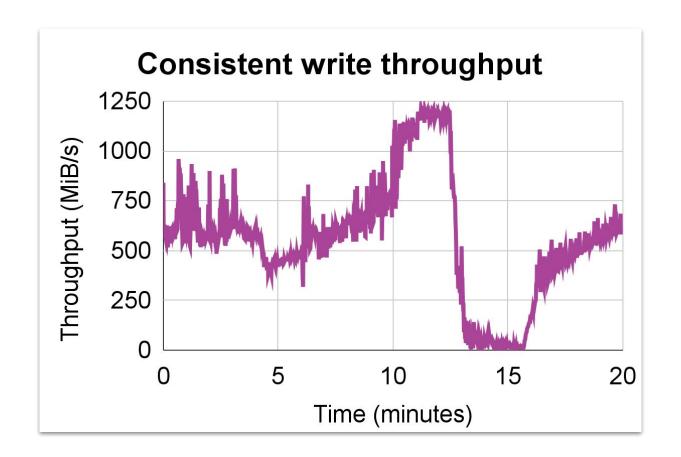
Block interface: Need to migrate data



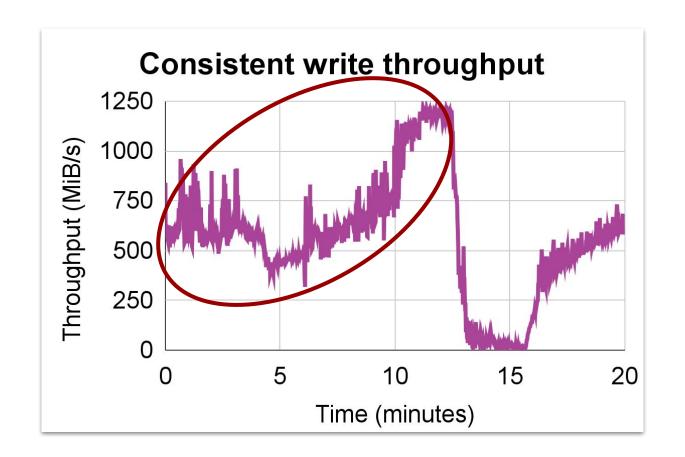


Question?: What happens if we keep writing to the SSD? What about data migration?

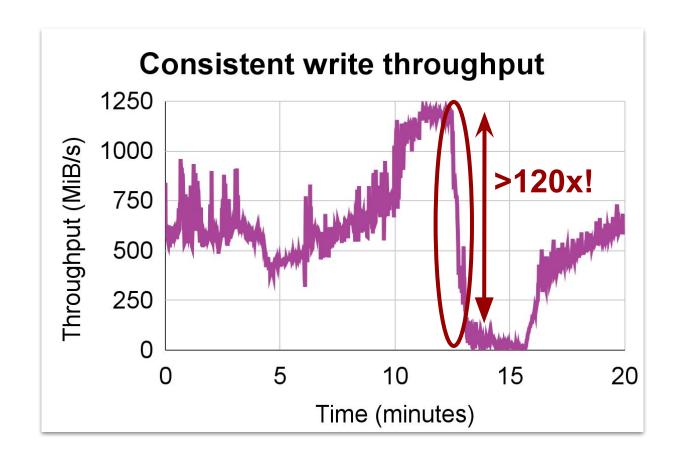




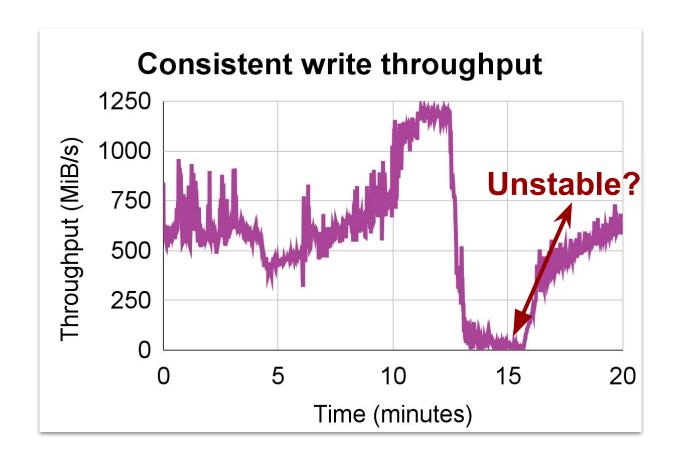










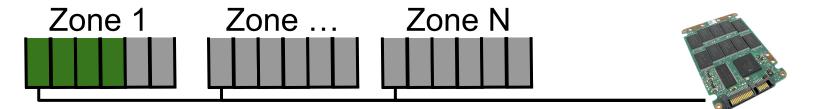




Is there a different interface For flash storage?

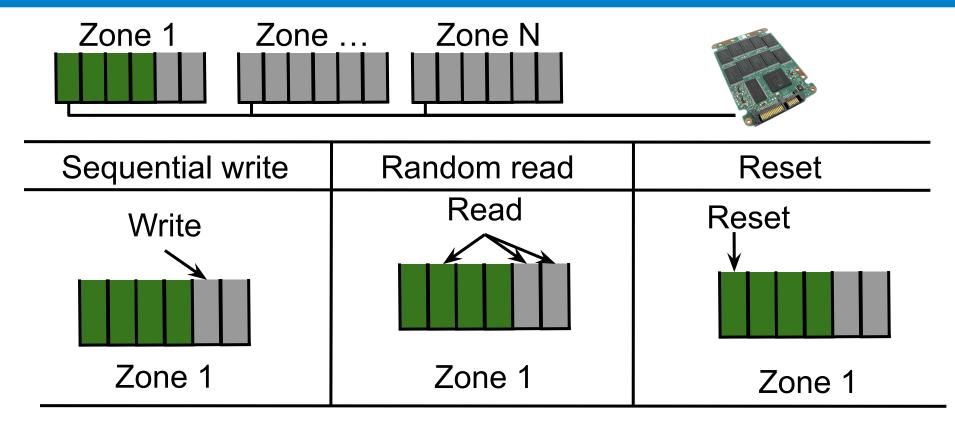


Meet Zoned Namespace SSDs





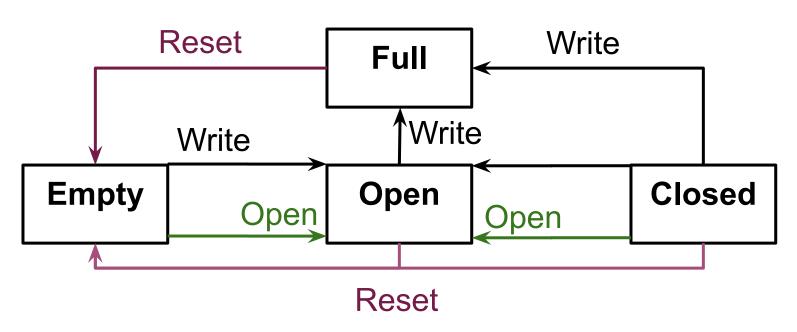
Meet Zoned Namespace SSDs





Zone state complexity

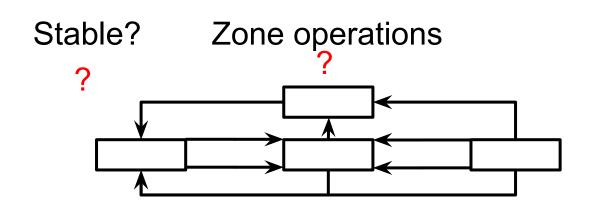
Possible zone states:





Research problem

Write/Read/Reset

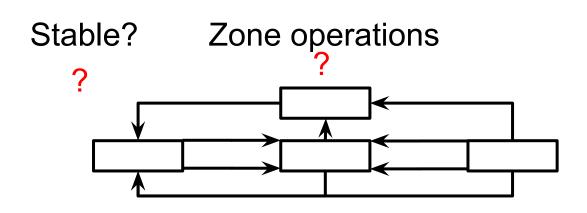




Research problem

Question: What are ZNS performance characteristics?

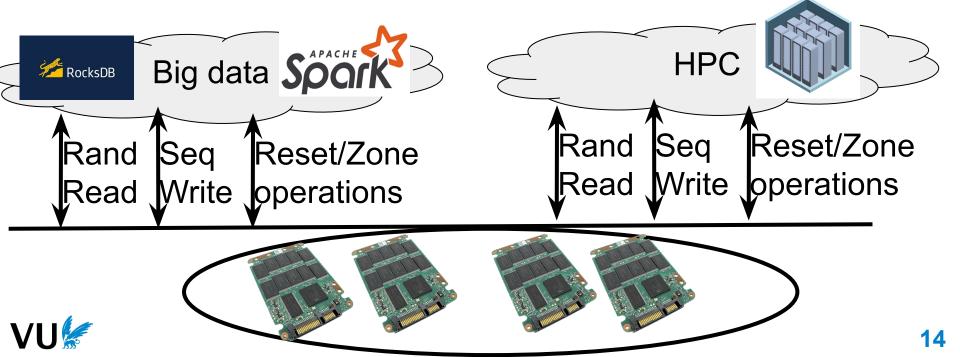
Write/Read/Reset





Research problem

Before we use ZNS we **need** to characterize its performance characteristics



Solution: A characterization framework

Goal: Infer performance characteristics

Microbenchmarks and scalability tests of:

- Appends/writes/reads
- All zone management operations

Interference tests of:

- Writes and reads
- Resets and writes/reads





Solution: A characterization framework

Results:

- 13 Key observations
- 5 Recommendations

We discuss the 4 biggest observations



https://github.com/stonet-research/NVMeBenchmarks



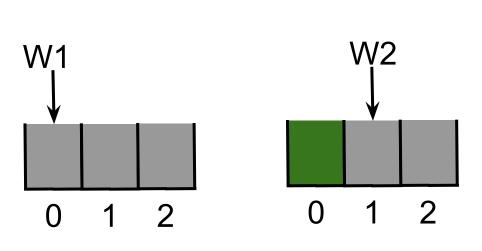


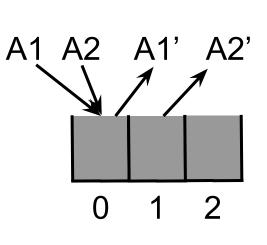
Write operation methods

R1/R4

Sequential write

Appends





Host schedules one-by-one

Device schedules and returns address



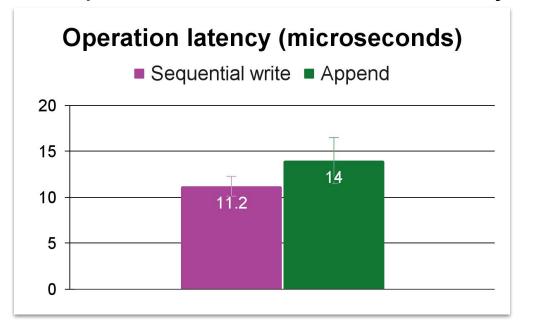
Latency: writes versus appends R1/R4

Motivation: What operation to use for <u>low</u> latency applications?



Latency: writes versus appends R1/R4

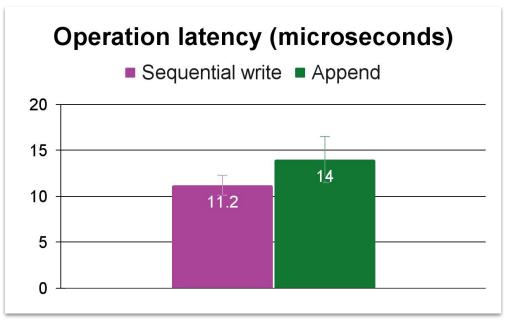
Motivation: What operation to use for <u>low</u> latency applications?





Latency: writes versus appends R1/R4

Motivation: What operation to use for <u>low</u> latency applications?

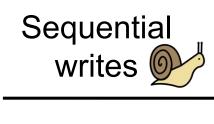


Recommendation: Use writes for lower latency

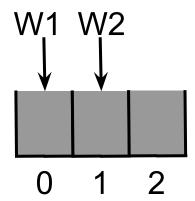


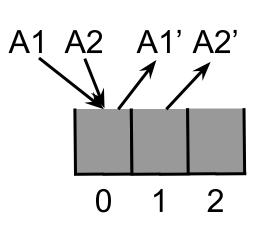
ZNS write parallelism methods

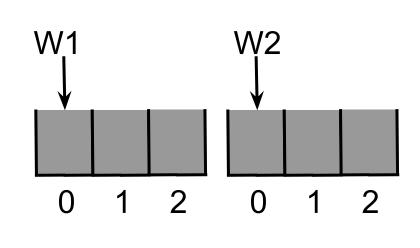




Zone appends Write to multiple zones









Throughput: ZNS writes



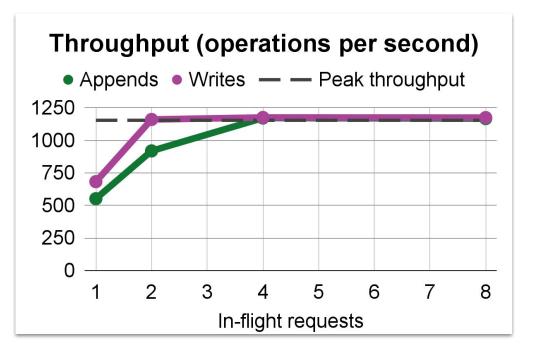
Motivation: What write operation to use for scaling <u>throughput</u>?



Throughput: ZNS writes



Motivation: What write operation to use for scaling throughput?

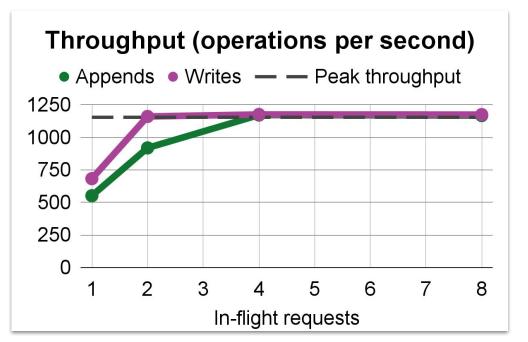




Throughput: ZNS writes



Motivation: What write operation to use for scaling throughput?

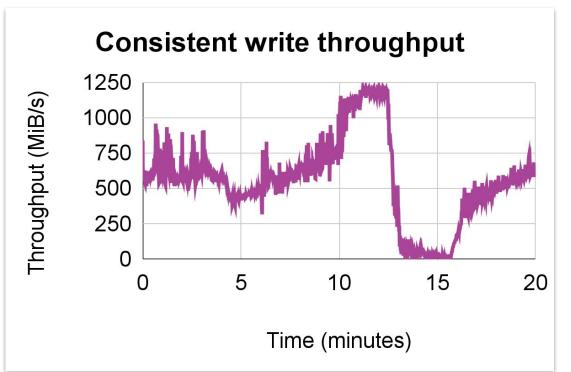


Recommendation: Use <u>appends</u> to scale throughput because of the open zone limit

Predictable performance?

Stable?R3/R4

Question: Does ZNS lead to the same variability as block devices?

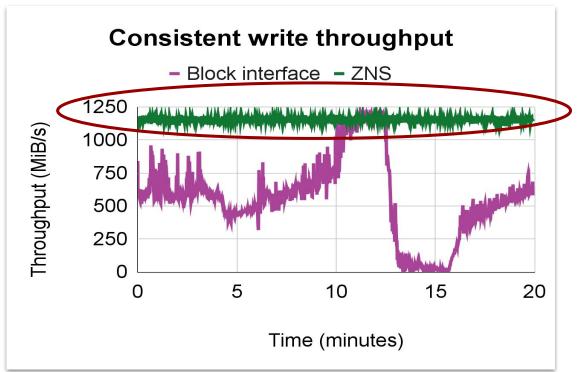




Predictable performance?

Stable?R3/R4

Question: Does ZNS lead to the same variability as block devices? **It does not**



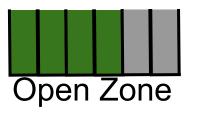


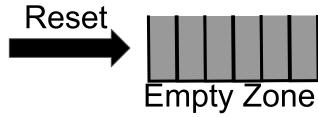
Reset operation latency



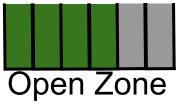
Reset comes in two flavors:

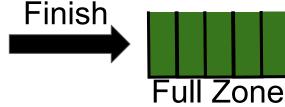
(1) Pure Reset:





(2) Finish:



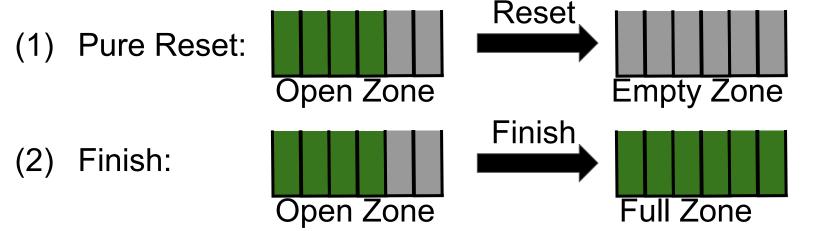




Reset operation latency



Reset comes in two flavors:



Finish is used to prevent reaching the open zone limit

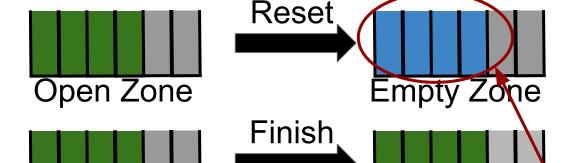




Full Zone

Reset comes in two flavors:

1) Pure Reset:



2) Finish:



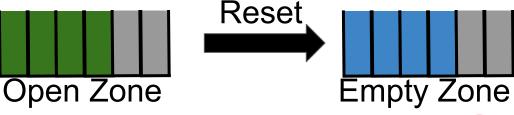
Open Zone





Reset comes in two flavors:

1) Pure Reset:



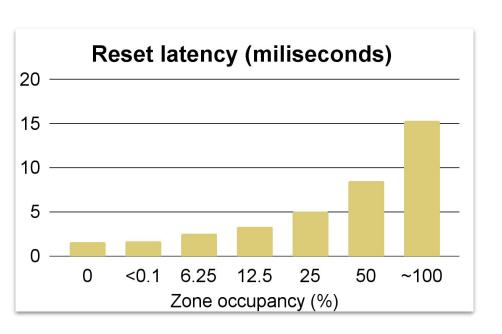
2) Finish:



Important question: does occupancy (% filled) matter?

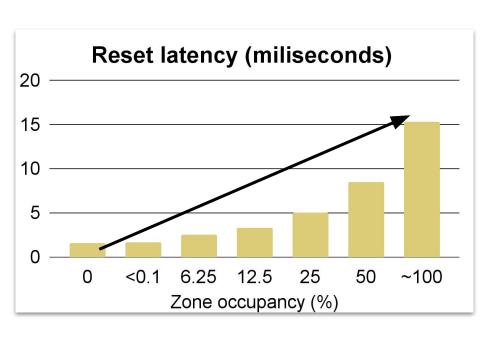


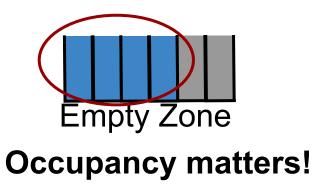






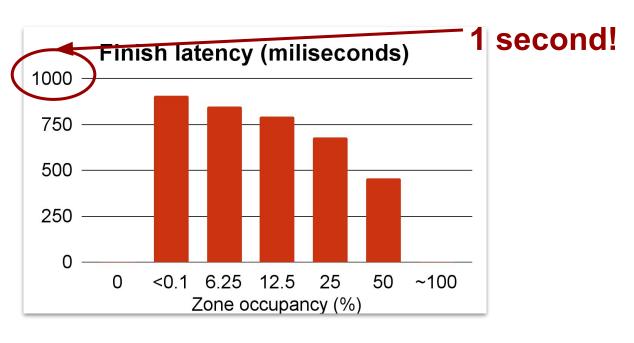






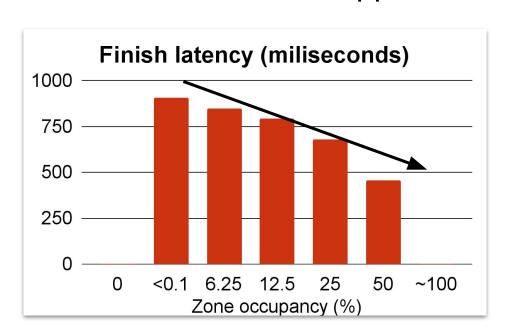


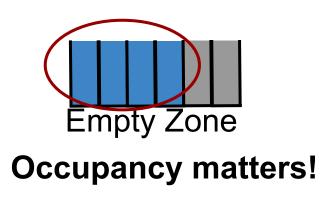






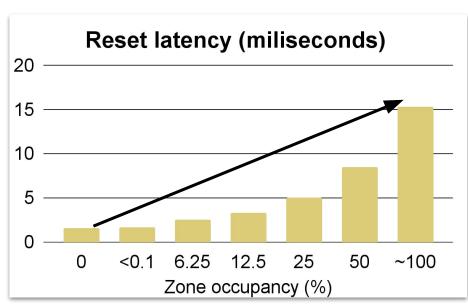


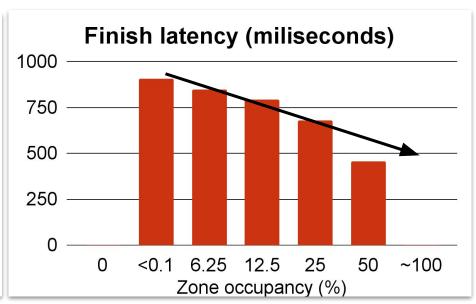








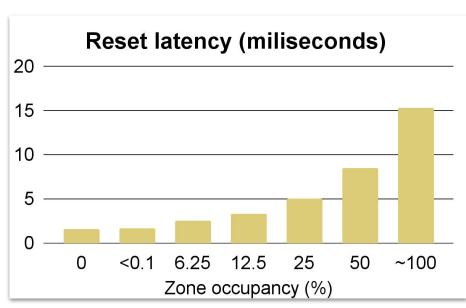


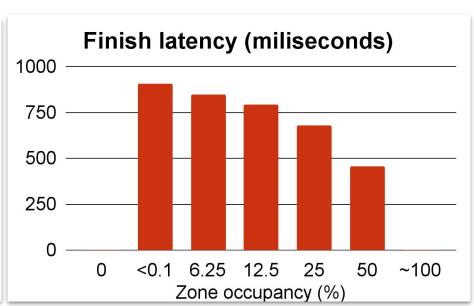






Motivation: Applications have to issue resets



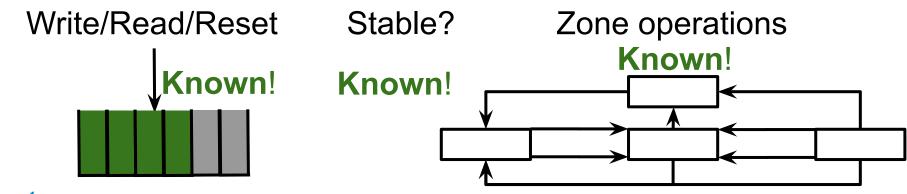


Recommendation: Prevent issuing resets



Conclusion of discussed results

- 1. Low latency: use sequential writes
- 2. High throughput: use appends
- 3. ZNS has latency stability
- 4. ZNS reset operations should be avoided





More details/results in the paper

Performance Characterization of NVMe Flash Devices with Zoned Namespaces (ZNS)

Krijn Doekemeijer*1, Nick Tehrany*1,2, Balakrishnan Chandrasekaran1, Matias Bjørling3, and Animesh Trivedi1 ¹Vrije Universiteit Amsterdam, Amsterdam, the Netherlands ²Delft University of Technology, Delft, the Netherlands

3Western Digital, Copenhagen, Denmark

{k.doekemeijer, n.a.tehrany, b.chandrasekaran, a.trivedi}@vu.nl, matias.bjorling@wdc.com

new advancement in flash storage. ZNS SSDs introduce a new storage abstraction of append-only zones with a set of new I/O (i.e., append) and management (zone state machine transition) commands. With the new abstraction and commands, ZNS SSDs offer more control to the host software stack than a non-zoned SSD for flash management, which is known to be complex (because of garbage collection, scheduling, block allocation, parallelism management, overprovisioning). ZNS SSDs are, consequently, gaining adoption in a variety of applications (e.g., file systems, key-value stores, and databases), particularly latencysensitive big data applications. Despite this enthusiasm, there has with its zoned storage model abstractions and I/O operations. This work addresses this crucial shortcoming. We report on the performance features of a commercially available ZNS SSD (13 key observations), explain how these features can be incorporated into publicly available state-of-the-art ZNS emulators, and recommend guidelines for ZNS SSD application developers. All artifacts (code and data sets) of this study are publicly available at https://github.com/stonet-research/NVMeBenchmarks.

Index Terms-Measurements, NVMe storage, Zoned Names-

I. INTRODUCTION

The emergence of fast flash storage in data centers, HPC, and commodity computing has fundamentally caused changes in every layer of the storage stack, and led to a series of new developments such as a new host interface (NVM Express, NVMe) [1], [2], [3], a high-performance block layer [4], [5], [6], [7], new storage I/O abstractions [8], [9], [10], [11], [12], [13], [14], and re/co-design of storage application stacks [15], [16], [17], [18], [19], [20], [21]. Today, flash-based solidstate drives (SSDs) can support very low latencies (i.e., a few microseconds), and multi GiB/s bandwidth with millions of I/O operations per second [22], [23], [24].

Despite these advancements, the conceptual model of a storage device remains unchanged since the introduction of hard disk drives (HDDs) more than half a century ago. A storage device supports only two necessary operations; write and read data in units of sectors (or blocks) [25]. Data can be read from and written to anywhere on the device, hence

*Equal contributions, joint first authors, Nick was with TU Delft during

Abstract-The recent emergence of NVMe flash devices with supporting random and sequential I/O operations. Though Zoned Namespace support, ZNS SSDs, represents a significant this model works with conventional HDDs, it is not apt for flash-based storage devices as flash internally does not support overwriting data [26], [27], [28]. Flash devices offer the illusion of "overwritable" storage via the flash translation layer (FTL), a software component that runs within the device. The FTL enables easy integration of flash devices (by allowing them to masquerade as fast HDDs), albeit it introduces unpredictability in performance [29], [30], [31], [32], [33], [34] and complicates device lifetime management [35]. These challenges are defined as the unwritten contracts of SSDs [26]. yet to be a systematic characterization of ZNS SSD performance As data centers have largely transitioned to SSDs for fast, reliable storage [36], [37], and modern big data applications have high OoS demands [38], [39], there is a dire need to

Researchers and practitioners advocate for open flash SSD interfaces beyond block I/O [40] to address these challenges. Examples include Open-Channel SSDs (OCSSD) [41], multistream SSDs [9], and, more recently, Zoned Namespaces (ZNS) [11]. The focus of this work is on NVMe devices that support ZNS, which are commercially available today [42], [43]. ZNS promises a low and stable tail latency [11] and a high device longevity, and, hence, addresses the needs of modern big data workloads. There is, unsurprisingly, a rich body of active and recent work on ZNS [44], [11], [45], [46], [47], [48], [49], [50], [51], [52], [53], [54], [55], [56]. Despite this enthusiasm, there has not been a systematic performance and operational characterization of ZNS SSDs. This lack of an extensive performance and operational characterization of ZNS SSDs severely limits the utilization and application of ZNS devices in big data workloads. In this work, we bridge this gap by presenting the performance characterization of a commercially-available NVMe ZNS device.

We complement this characterization of a physical device with an investigation of emulated ZNS devices, since they are widely used in research [51], [57], [58], [55], Emulated devices enable researchers to explore the ZNS design space without being constrained by device-specific characteristics. Such unconstrained explorations are crucial since ZNS is a new interface and the selection of available configurations in a real SSD is, unsurprisingly, quite limited. The research validity of all of these works hinge on an emulator's ability to mimic

Zones of a ZNS device have states (Fig. 1), which dictate the allowed operations on a specific zone. Since each zone operation (e.g., read, write, and append) consumes SSD resources (e.g., internal buffers), there are limits on the number of zones that can be concurrently opened and used. These limits are defined as the maximum open zone limit and maximum active zone limit, respectively. Applications must abide by these constraints, and explicitly manage the zone states and transitions. An application must, for instance, open a zone before it accepts writes or appends. State transitions can be internal to a device and implicit (e.g., a write to an empty zone transitions it to an open zone in Fig. 1), or explicit as a response to a user request.

ZNS offers several explicit zone management operations. which include open, close and finish. We skip discussing the first two, whose names reveal their functionalities, and focus on the last. The finish operation transforms an summarizes our key findings. open zone directly into a full zone. It releases all resources attached to the zone (to stay within the maximum open zone limit). Then, the device can either fill the zone with data or mark the unused capacity with mapping updates (metadata updates) in the "finished" zone (Fig. 1). Mapping updates would require extra metadata to keep track of partially-filled reset interference (§III-G), since fio does not support them. zones. The finish operation has implications for perfor- We describe our benchmarking platform in detail in Tab. II. mance, and the costs of this operation varies from one ZNS SSD implementation to another

includes operations beyond the simple read and write operations seen in traditional flash storage. It is, therefore, crucial to understand and characterize the performance of these sequentially issues the merged requests. Applications can, operations as they (and their state-machine transitions) are now part of the Linux storage software stack.

C. Software support

version 5.9 [75]. Currently there is a limited number of that we aim to benchmark. We cannot, for instance, issue and applications that use ZNS and most that do, do not use all benchmark append or zone management operations via fio functionalities (e.g., no finish or open). Evaluating these and the Linux I/O stack. In a similar vein, we are restricted applications would limit what ZNS properties we can measure to issuing only one write per zone at a time with SPDK, and, therefore, in our work we use synthetic benchmarks as we since it lacks an I/O scheduler. Second, the selection enables need to understand all of ZNS' facets first. The results of our us to compare the implications of state-of-the-practice-the benchmarks can then be used for application design. Here, we Linux stack-and that of the state-of-the-art-SPDK-for briefly mention a number of prominent ZNS applications in ZNS application development. research to get an overview of what is currently available. Cur-F2FS [76], Btrfs [77] and Ceph [78]. There is also support for benchmarking code to the NUMA node containing the ZNS a swap system known as ZNSwap [49] and a RAID system device. For the Linux storage stack, we use the io_uring as a ZNS-capable file system back-end [11].

III. EXPERIMENTS

In this paper, we characterize the performance and interferavailable ZNS SSDs is limited, therefore, we focus our efforts time each operation takes). We measure ZNS throughput in

TABLE I: Overview of the key insights

Category	Insight
Append vs. write	Write operations have up to 23% lower la- tencies than append operations (§III-C)
Scalability	Prefer intra-zone scalability (§III-D, §III-E)
Zone transitions	Finish is the most expensive operation; it takes up to hundreds of milliseconds (§III-E)
I/O interference	NVMe ZNS offers 3× higher read throughput under concurrent I/O operations than NVMe (§III-F)
I/O & GC interference	Reset latency increases by up to 78% under concurrent I/O operations, but reset opera- tions themselves have no effect on append, read or write operations (§III-G)

on characterizing one SSD model and synthesize the performance questions to ask when evaluating a ZNS SSD. Tab. I

We use fio [80] for generating the workloads and benchmarking the ZNS device. We also employ custom SPDK benchmarks for benchmarking state transitions (§III-E) and

We use two storage stacks for benchmarking: the Linux kernel block layer and the SPDK stack. The Linux block In summary, ZNS devices support a rich I/O interface that layer ships with the mq-deadline scheduler, which buffers multiple write operations to a single zone, merges writes to contiguous LBAs into one or multiple (larger) writes, and hence, issue multiple write operations to a single zone. The SPDK stack, in contrast, is a bare-bones storage stack without any I/O scheduler. The rationale behind our storage stack selection is twofold. First, no storage stack currently ZNS devices are fully supported in Linux since kernel supports all combinations of I/O and management operations

We run experiments for 20 minutes and/or repeat them at rently, applications have access to ZNS-friendly file systems least three times for deriving robust statistics. We pin our known as ZRAID [79] Lastly, KV-store RocksDB has ZenFS engine with submission-queue polling enabled, following the recommended settings [14]

B. Performance metrics

ence properties of the Western Digital Ultrastar DC ZN540 performance of NVMe (ZNS) devices. Two indicators of I/O SSD, a large-zone ZNS SSD, using a series of controlled operation performance are throughput (i.e., the number of benchmarks. As of writing the number of commercially-operations or bytes per second) and operation latency (i.e. the



Take-home messages

ZNS SSDs deliver high-throughput stable performance

- ZNS has a unique performance model
- We synthesize ZNS' performance model





https://github.com/stonet-research/NVMeBenchmarks



Further reading

- 1. Bjørling et al., ZNS: Avoiding the block interface tax for flash-based SSDs, ATC'21
- 2. Shin et al., Exploring Performance Characteristics of ZNS SSDs: Observation and Implication, NVMSA'20
- 3. Bae et al., What You Can't Forget: Exploiting Parallelism for Zoned Namespaces, HotStorage'22
- 4. Im et al., Accelerating RocksDB for SmallZone ZNS SSDs by Parallel I/O Mechanism, Middleware'22
- 5. Jung et al., Preemptive Zone Reset Design within Zoned Namespace SSD Firmware, MDPI'23
- 6. Purandare et al. Append is near: Log-based data management on ZNS SSDs, CIDR'22
- 7. Bjørling et al., Zone Append: A New Way of Writing to Zoned Storage, Vault'20
- 8. Tehrany et al. Understanding (Un)Written Contracts of NVMe ZNS Devices with zns-tools, ArXiv (2023)
- 9. **Tehrany et al.** Understanding NVMe zoned namespace (ZNS) flash SSD storage devices, ArXiv (2023)
- 10. **Doekemeijer et al.** TropoDB: Design, Implementation and Evaluation of an Optimised KV-Store for NVMe Zoned Namespace Devices, MSc thesis (2022)
- 11. Kim et al., Performance Modeling and Practical Use Cases for Black-Box SSDs, TOS'21
- 12. He et al., The Unwritten Contract of Solid State Drives, EuroSys'17
- 13. Chen et al, Understanding Intrinsic Characteristics and System Implications of Flash Memory Based Solid State Drives, SIGMETRICS'09
- 14. Bjørling et al., LightNVM: The Linux ´Open-Channel SSD Subsystem, FAST'17
- 15. Kang et al., The Multi-streamed Solid-State Drive, HotStorage'14

Also check out other research from the AtLarge research team!: https://atlarge-research.com/publications.html



- Backup slides -



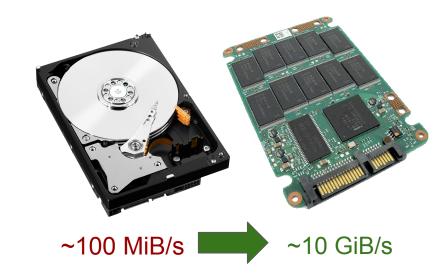
Flash SSDs are ubiquitous

Storage demands

- 1 yottabyte every year by 2030!¹
- Performance SLAs

Why flash SSDs?

- Fast storage
- Block interface requires NO changes to host applications

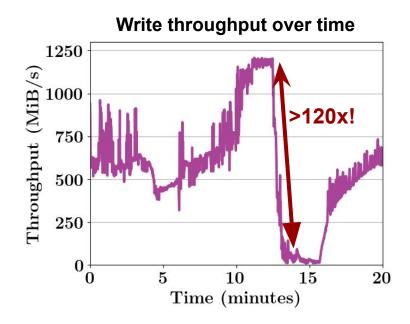




The **problem** of the block interface

Block interface is a **mismatch** for flash

- Requires firmware that runs GC
- Unpredictable GC performance

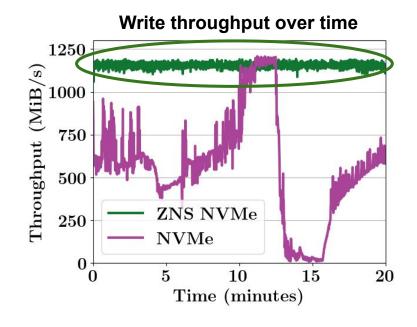




Meet NVMe Zoned NameSpace (ZNS)

ZNS is a **match** for flash

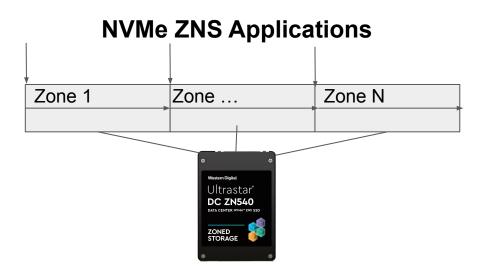
- Application-managed GC
- Applications have to be rewritten





Problem: ZNS is complex and novel

- Device is split in append-only, application-managed zones
- 4 ZNS-unique zone management operations
- New zone append operation
- We do NOT know any performance characteristic!





How can we design for ZNS if we do not know its performance model?



Why Cluster?

Convergence of HPC and big data

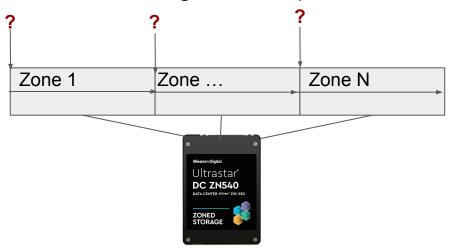
- Performance isolation for HPC
- Cheap, less overprovisioned flash storage for Big Data workloads
- ZNS promises to support both, but we need to model its performance first

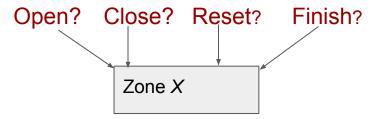




Performance model: What do we need?

- 1. Performance scalability of zones
- 2. Performance of the 4 zone management operations
- 3. I/O request interference
- 4. Zone management request interference

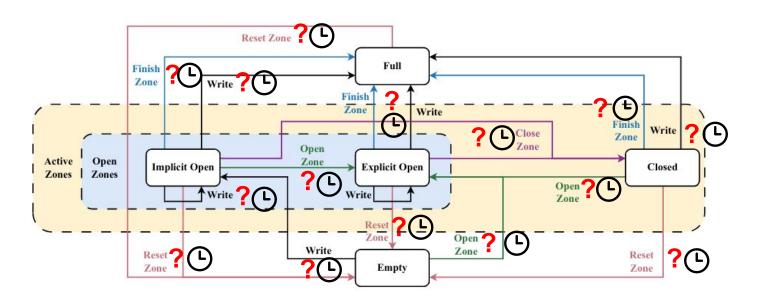






In short, we know none of these...

What is allowed on a zone?





Solution: A characterization framework

- We introduce a characterization framework:
 - Generic to support any ZNS device
 - 13 key observations! (today we discuss only a few)
 - 5 key recommendations!



https://github.com/stonet-research/NVMeBenchmarks

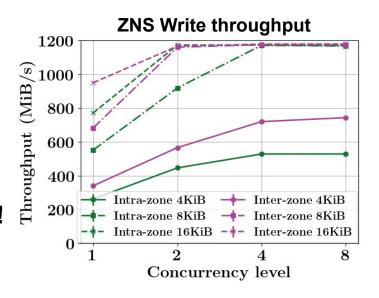




ZNS highlight #1: Write scalability

ZNS Scalability methods:

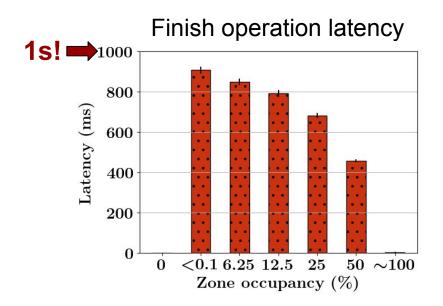
- Intra-zone: issue zone appends to one
- Intra-zone: issue zone appends to one zone
 Inter-zone: write/zone appends to multiple zones concurrently
 Problem: inter-zone is limited by active zones!

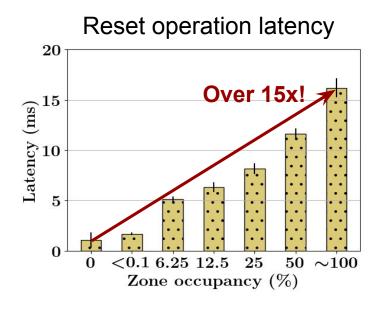




ZNS highlight #2: Zone management

- Expensive operations (writes are in μs)
- Cost depends on zone occupancy







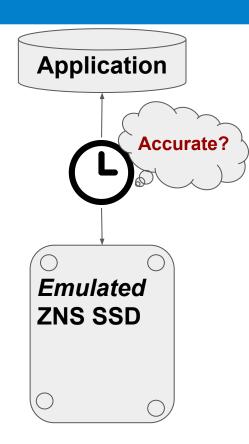
ZNS emulators

Problem:

- Researchers resort to emulators (at least 4 papers)
- Available emulators do not capture our observations
 - Applications are designed wrongly!

Solution:

- Emulators should be changed
- Applications should also be tested on real devices





Application design

We make the following **key recommendations**:

- 1. Use write instead of append for low latency
- Prefer intra-zone scalability
- Avoid finish operations!
- 4. There is no need to account for GC interference
- 5. Resets can be issued with concurrent I/O without performance hiccups



F2FS



What is next?

- Extend to more physical ZNS SSDs
 - Any collaborators?
- Incorporate our findings into emulators
 - We need this for future applications!
- Introduce a ZNS scheduler
- Extend to benchmarking applications



Take-home messages

- Flash SSDs are everywhere
- ZNS enables latency stability for flash SSDs
- ZNS has a unique performance model
- We synthesize this performance model
 - Use this model on your ZNS SSD!
- ZNS emulators are not accurate







Benchmark setup

- raw ZNS command performance
- synthetic/controlled experiments

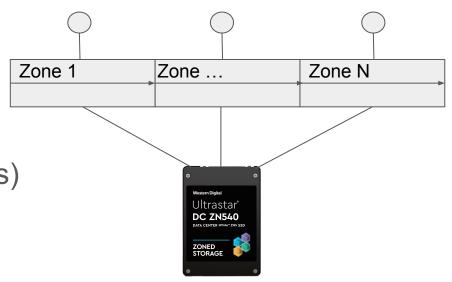
OS configuration	Linux 5.19, Ubuntu 22.04
Workload generator for I/O	fio (3.32, git commit: db7fc8d)
Zone transition benchmarks	Custom benchmarks (C++)
Zone transition interference benchmarks	Custom benchmarks (C++)



ZNS: A new abstraction

A <u>new</u> abstraction:

- Device is divided into zones
 - I/O is issued to zones
 - Append-only (NO overwrites)
 - Zones have state

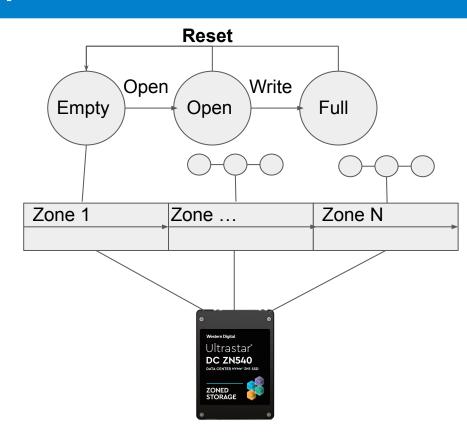




ZNS: A new abstraction

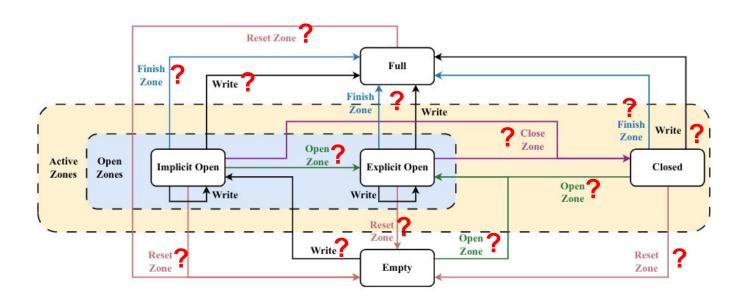
A <u>new</u> abstraction:

- Device is divided into zones
 - Append-only (NO overwrites)
 - Zones have state
- Explicit State management of zones
 - Clients do GC with <u>reset</u> operations
- What is the performance of ZNS?





ZNS is complex!



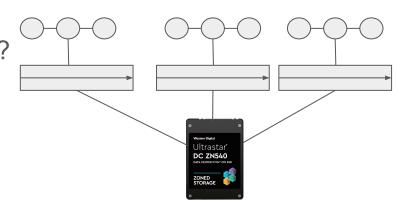


What do we need to know?

What are the ZNS performance characteristics?

- How do we scale I/O and how scalable is ZNS?
- How expensive are zone transition operations?
- Does ZNS suffer from I/O interference?

We can **not** optimize for ZNS if we do not know its performance characteristics!





What we measured

What we measured (a lot):

- Scalability: Inter- and intra-zone scalability
- Scalability: Impact of request size
- **Zone transition overhead:** All zone transitions (reset, open, finish, close)
- Interference: Interference of reads/writes and zone transitions/writes/reads

We have 11 key observations, we will explain 3 of them (they are essential!):

- 1. Scalability: Prefer Intra-zone scaling
- 2. **Zone transition overhead:** Finish operations are the most expensive operations
- 3. **Zone transition overhead:** Zone occupancy influences transition overhead



ZNS write Scalability: how?

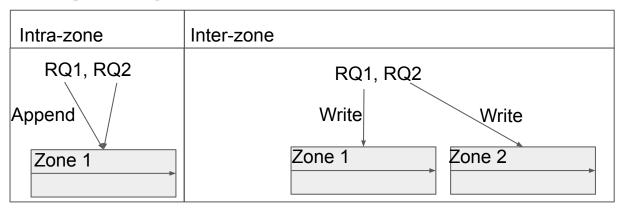
ZNS does not allow multiple writes to 1 zone!

Method 1. Intra-zone:

- Append, let the device reorder
 - Applications need to be rewritten...
- Merge, merge multiple "writes" on host

Method 2. Inter-zone:

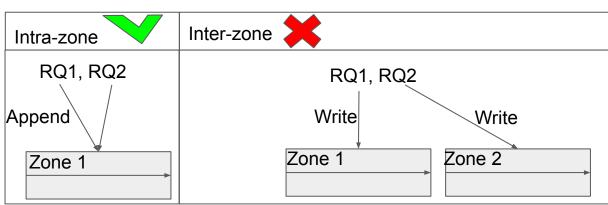
- Concurrent zones
 - Limit "max open zones"

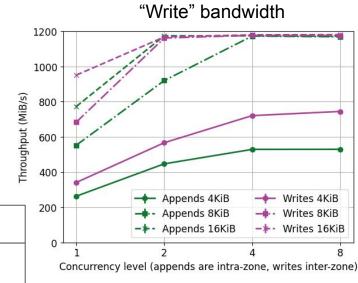




ZNS Scalability: bandwidth

- Both intra- and inter-zone reach device limit
 - Intra is appends, inter is concurrent zone writes
- Request size is very important
- Intra is preferable!
 - No max zone reached
 - Zones are shared between tenants... (Multi-tenancy)

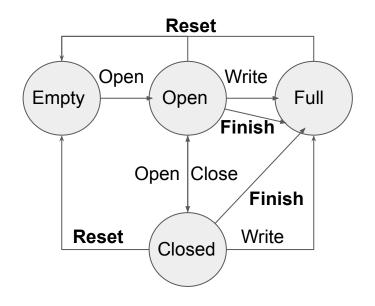






ZNS: State transitions

- Applications issue all transitions
 - Zones need to be opened to accept I/O
 - Zones are limited
- We evaluate all transition latencies
 - o In isolation, one-by-one
 - Measure submission to completion
 - We fill zones for a percentage (1, ..., 100%)
 - Repeated at least a thousand times
- Important observations:
 - Finish and Reset are expensive
 - Called regularly
 - These are not **negligible!**





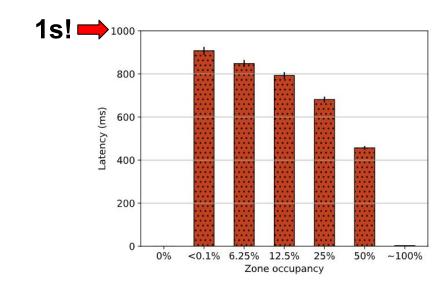
State transitions #1: finish operation

What are finish operations for?:

- Open zones to full zones
- Ensures max open zones is not reached

Results/recommendations:

- The most expensive operation!
- Avoid finishing zones
- Do not finish "empty" zones
- Prefer intra-zone scalability





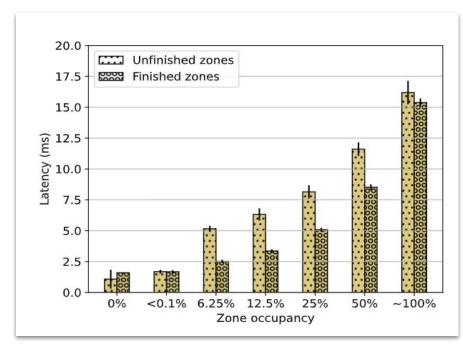
State transitions #2: reset operation

What are reset operations for:

Zone garbage collection

Results/recommendations:

- Reset latency correlates with zone occupancy
- Resets are not free
- Resets should be scheduled on zone occupancy





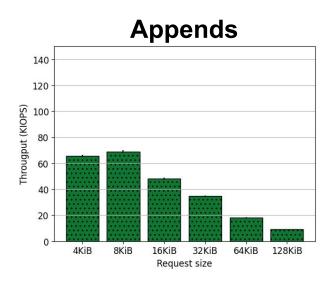
Other results/conclusions...

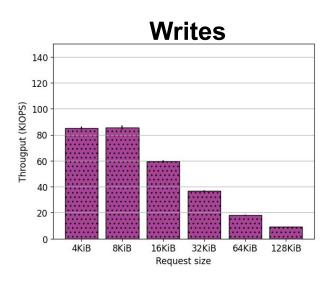
Please read the paper for more:

- The impact of I/O size...
- Open/close zone performance...
- I/O interference effects...
- ZNS-aware applications (and how to design them)
- ..



Observation: Request size always matters!







Scalability #1: intra-zone

Method 1. Writes with scheduler:

- NVMe operation
- One write to one zone allowed?
- Merge I/O on host

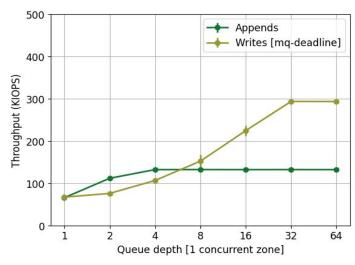
Method 2. Appends:

- ZNS-specific operation!
- Multiple appends to one zone allowed!

Results/recommendations:

- Prefer appends at low depth
- Use large requests

4KiB "Write" throughput





Scalability #2: inter-zone

Zone parallelism

- We can issue I/O to concurrent zones
- Limited by "max active zone" constraint

Results/recommendations:

Writes have better inter-zone scalability

4KiB "Write" throughput

