Samsung PM9A3 All Flash Reference Platform

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Abstract

In this document, we present an all-flash reference platform utilizing Weka high performance filesystem and Samsung SSD, that can be leveraged by IT strategists to meet the performance challenges faced in today's datacenters. Our performance results show that the Weka high performance filesystem paired with Samsung's latest datacenter NVMe SSD, the PM9A3, delivers exceptional performance for a wide variety of demanding workloads found in today's datacenters.

Weka is a software defined, distributed, parallel file system designed to deliver the highest-performance file services by leveraging NVMe flash. The distributed file system distributes the data across multiple servers and devices, providing high performance access for both throughput intensive and I/O intensive applications. The Weka distributed file system can fully leverage the combination of high performance and enterprise functionality capabilities of Samsung's flagship datacenter SSD offering, PM9A3.

We worked closely with Weka engineering to architect and configure the Weka cluster; tuning the system to achieve the highest performance possible with the given hardware. In order to benchmark the environment, we used the SPECstorage Solution 2020 benchmark tool. This benchmark is designed to simulate application-based workloads and real-world scenarios. The benchmark is capable of simulating workloads of the modern large scale data centers. In this study, the workloads applied include artificial intelligence (AI), genomics, electronic design automation (EDA), and video data acquisition (VDA). Our methodology is to establish the hardware and software testbed environment, run a series of SPECstorage Solution 2020 benchmarks, and tune the system parameters until optimal performance is reached for all workloads that were the focus of this study. The result of this work was a compact, high-density system that achieved the highest ever recorded performance for 4 of the 5 SPECstorage Solution 2020 audited benchmarks. Results are published on SPEC website¹.

1. Introduction

Software Defined Storage continues to gain momentum in the modern datacenter storage market. As datacenter storage infrastructures and technologies evolve, the need for speed and flexibility in the storage system becomes evident. NVMe is at the forefront of these advancements. Weka is a software defined storage system that is designed to meet the needs of today's I/O intensive workloads. It is designed to take advantage of the parallelism provided by NVMe flash. To showcase Samsung's datacenter class NVMe, test their capabilities to power storage systems, and promote NVMe adoption, we chose to architect a compact all flash scale-out reference platform that includes Samsung's newest PM9A3 NVMe devices and Weka's scale out, parallel file system. We put the system to the test by applying realistic workloads that are seen in today's datacenter.

In addition to showcasing Samsung NVMe, we aim to provide IT professionals with a reference architecture, meaning if the same equipment is purchased and configured as described in this work, the system will achieve the same performance. To achieve this, we chose benchmarks provided by the Standard Performance Evaluation Corporation (SPEC) to validate performance. SPEC benchmarks are fully audited by a team of industry experts. All hardware, software, and configuration details must be disclosed in order to be published. This ensures the repeatability of the performance results.

To showcase the solution, we wanted to apply a broad range of common datacenter workloads that are storage intensive. SPECstorage Solution 2020 contains a comprehensive set of workloads that are both storage centric and representative of real-world workloads found in the modern datacenter.

1.1. Weka

WekaFS [2] is a fully-distributed, parallel file system that was written entirely from scratch to deliver the highest-performance file services by leveraging NVMe flash. The software also includes integrated tiering that seamlessly expands the namespace to and from hard disk drive (HDD) object storage, without the need for special data migration software or complex scripts; all data resides in a single namespace for easy access and management.

1.2. SPECstorage Solution 2020 Benchmark

The SPEC benchmark simulates several different workload types that are common among data centers today. The benchmark starts a number of processes on the client hosts that perform file operations resembling the workload under test. Each workload has a unique ratio of types of operations, file layout, and distribution of IO size. The business metric is a standard way to describe the size of workload for any of the workloads as shown in <u>Table 1</u>. As the value of business metric increases, the number of load generating processes will linearly increase.

| Workload | Description | Business Metric |
|------------|---------------------|------------------------|
| VDA | Video data acquisi- | STREAMS |
| | tion | |
| EDA_BLENDE | Electronic design | JOBS |
| D | automation | |
| AI_IMAGE | AI Image pro- | JOBS |
| | cessing | |
| GENOMICS | Genomic processing | JOBS |
| | | |

| Table 1: | Workloads | description |
|----------|-----------|-------------|
|----------|-----------|-------------|

| Workload | Storage target ca- pacity requirements | Client memory re- quirements |
|------------|---|---------------------------------|
| VDA | 24 GiB per | 100 MiB per |
| | STREAM | STREAM |
| | | |
| EDA_BLENDE | 11 GiB per JOB | 520 MiB per JOB |
| D | | |
| AI_IMAGE | 100 GiB per JOB | 1.7 GiB per JOB |
| | | |
| GENOMICS | 3.5 GiB per JOB | 416 MiB per JOB |
| | | |

Table 2: Workloads memory requirements

<u>Table 2</u> shows the amount of data that is created for each business metric. The amount of client memory required per business metric is also described. It is to be noted that as business metric increases, it is uniformly distributed across the number of clients used in the test. There is one client that is designated the Prime Client which coordinates the load among all the other clients. This Prime Client is also the one which the user will start the benchmark program from. A configuration file is passed into the benchmark on runtime. This configuration file describes the workload to be run, the business metric of the tests, and clients to be used for the test.

<u>Table 3</u> presents the list of notations that are used in the paper. Each workload consists of the subcomponents that are defined by the combination of various parameters corresponding to categories such as file operation distribution, execution, global, content and access patterns, and read-, writetransfer size distributions. Genomics workload has an additional set of parameters for file size distribution category. Further details about the SPECstorage workloads and the start, end bytes for multiple read, write transfer sizes and file size distribution slots can be referred in [1].

1.2.1 AI Image

This workload simulates the AI Tensorflow image processing environments. The original traces were collected using Nvidia DGX systems running COCO, Resenet50, and City-Scape datasets. There are four components which make up this workload, two are the pre-processing phase and the other two are the AI training phase.

- AI_SF: small image file ingest
- AI_TF: tensorflow record creation
- AI_TR: training consumption of tensor flow records
- AI_CP: checkpoint functionality

| Notations | Description |
|------------------|-------------------------------------|
| AI | Artificial intelligence |
| VDA | Video data acquisition |
| EDA | Electronic design automation |
| WL | Workload |
| BM | Business metric |
| ROR | Requested op rate |
| AOR | Achieved Op rate in Ops/s |
| Cl Proc | Number of processes per client |
| CDS | Client Data Set size in MiB |
| SDS | Total Starting Data Set size in MiB |
| MFS | Max File Space in MiB |
| Table 2. List at | functations for moding anginage |

 Table 3: List of notations for reading easiness

JOBS is the business metric for the AI_Image workload (<u>Table 1</u>). AI_SF and AI_TR consists of 37% and 95% read operations, respectively. AI_TF and AI_CP are 100% write workloads. AI_CP occurs infrequently during the typical run of the AI Image workload. Only AI_SF has a separate set of global parameters that consist of 4 processes per BM (JOBS for AI Image workload), a rate of 100 operations per process (henceforth, referred to as oprate), 1 MiB average file size, 3 directories per process, and 200 files per directory. The other salient set of parameter-values for the four subcomponent workloads can be accessed in [<u>1</u>].

1.2.2 Genomics

This workload simulates the genomics pipeline in both commercial and research facilities that perform genetic analysis. Traces were taken during these activities and the original genome data has been sanitized. The I/O behavior was captured in traces and synthesized by the benchmark. JOBS is the business metric for the Genomics workload (<u>Table 1</u>).

The salient set of parameter-value pairs for the Genomics workload are as follows: 70% read, 8% write, 1% unlink, 12% stat, 2% rand read, 1% rand write, 1% create, 4% access, and 1% chmod operations under file operation distribution category. As execution parameters, the workload starts 4 processes per JOB, 250 oprate per process, average file size of 1613 KiB, 2 directories per proc, and 25 files per directory. The other set of parameter-values for the workload can be accessed in [1].

1.2.3 Video Data Acquisition

Video Data Acquisition (VDA) workload simulates the environment where video cameras are streaming and storing data to backend storage. The goal is to provide as many simultaneous streams as possible while maintaining a certain bit rate and meeting the fidelity constraints. The workload is made up of two components, the data stream (VDA1) and the companion application (VDA2). Each stream is about 36 Mib/s bit rate which is high-definition video. STREAMS is the business metric for the VDA workload (Table 1).

The salient set of parameter-value pairs for the VDA workload subcomponents are as follows: The data stream VDA1 workload has 100% write operations with 1 process per STREAM, 9 oprate per process, 1GiB of average file size, 1 directory per process, and 1 file per directory as execution parameters. Further details about the other set of parametervalues for the workload and its subcomponents can be accessed in [1].

1.2.4 Electronic Design Automation

Electronic Design Automation (EDA blended) workload simulates the designing of semiconductor chips. Many software tools are used to design a chip and fabricate it. A large number of small files and low number of large files comprise this dataset. There is a mix of random and sequential IO and two components make up this workload. The EDA_FRONTEND workload represents the EDA frontend processing applications and EDA_BACKEND represents the EDA backend applications that generate final output files. JOBS is the business metric for the EDA_BLENDED workload. Both frontend and backend EDA workloads have different set of configuration parameters as described in [1].

2. Test Environment

The testbed used for the study is outlined in <u>Table 4</u> and described in the following subsections. <u>Figure 1</u> schematically shows the test bed set up.

| Component | Model | Туре | Details (Model/ Name/ Size/ Ver- sion/ Quantity) |
|------------------------------------|----------------------------|-------|--|
| 8 Compute servers as clients | Dell R7525 [<u>7</u>] | CPU | Dual AMD EPYC 7702 |
| | | RAM | 512 GB |
| | | NIC 1 | 1GbE Management |
| | | NIC I | network |
| | | NIC 2 | 1 ConnectX-6 VP providing 2, 200Gb/s ports |
| | | SW | 8 Weka clients - Weka [2] v3.12.0 client |
| 2 Switches | | | Mellanox SN3700 |

| 6 Storage Servers | Dell R7515 [<u>3</u>] | CPU | AMD EPYC 7702P |
|----------------------|----------------------------|---------|---|
| | | Storage | 15 SSDs - Sam- sung PM9A3 [<u>4]</u> |
| | | RAM | 512 GB |
| | | SW | 6 Weka cluster nodes - WekaFS [2] v3.12.0 |

Table 4: Complete testbed details

2.1. Clients

On each of the client hosts, the Weka filesystem is mounted using wekafs file system type. Each client has 8 cores and 30720 MB of memory dedicated to the wekafs mount. The default mount mode for weka client caching is write-back. This is the default setting used by the majority of weka customers and thus is the basis of our cluster configuration for testing in this work. Readers are directed to WekaFS architectural white paper [2] for additional details about default cache mode for weka clients. Both network ports are specified in the mount command giving 200 Gb/s connection each. Because they are dual port, a single card on each client can theoretically transmit and receive 400 Gb/s. However, the card is inserted in a 16 lane PCIe Gen 4 slot in the server. The theoretical limit of the PCIe Gen4 x16 slot is 256 Gb/s. Weka enables both ports-so the theoretical max transfer speed is 256 Gb/s per client. Although the theoretical limit is 256 Gb/s, after optimizing the networking configuration in the clients, we are able to achieve a maximum throughput of approximately 192 Gb/s.

2.2. Targets

The backend cluster is setup to use all 6 hosts as storage with a WekaFS distributed data protection scheme of 4+2 erasure coding at the target host level [1], removing the hot spares. Each host is running 3 Weka containers. Each of the 3 containers has 5 PM9A3 assigned to them. One container on each host has 19 CPUs and the other two have 17 CPUs. Two CPUs on the container with 19 CPUs are dedicated to handling traffic from the clients. Of the remaining 17 CPU, 5 CPUs are dedicated to the storage device (one CPU per device), and the rest are compute cores. The raw storage with a total of 90 PM9A3s (3.84 TiB raw SSD capacity each) on the backend cluster is 314 TiB (calculated as 15 ×6 ×3.84 × $[10]^{12/240}$ and 4+2 protection leads to 209 TiB [6]. WekaFS, in addition, reserves 10% of the capacity for internal use. Thus, one filesystem was created, utilizing all 188 TiB $(0.9 \times 209 \text{ TiB})$ of usable storage on the backend cluster. The client nodes have one dual ported 200 Gb/s NIC, and each target node has two, dual ported 200 Gb/s NICs in a 16 lane PCIe Gen4 slot (shown in Figure 1). The theoretical maximum throughput of the configuration is 800 Gb/s per target. However as discussed above the limit on the PCIe Gen4 x16 slot is 256 Gb/s per NIC. With two NICs, the theoretical

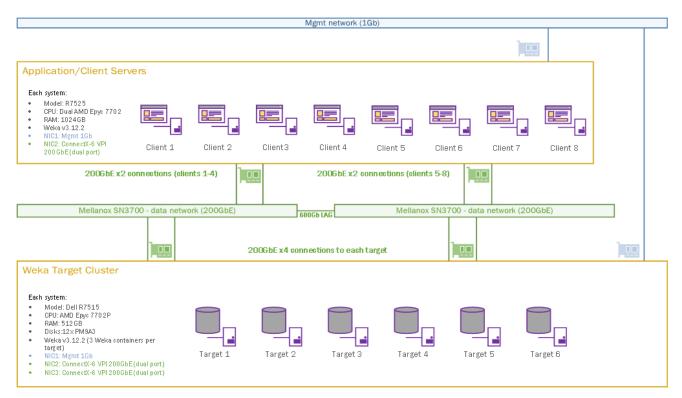


Figure 1: Weka Storage Test Environment

| WL | BM | ROR | AOR | Avg Lat (ms) | Total MBps | Read MBps | Write MBps | Cl Proc | CDS MiB | SDS MiB | MFS MiB |
|--------------|------|---------|------------|--------------------|------------|--------------|---------------|---------|----------|-----------|-----------|
| AI_ Image | 1400 | 609000 | 609005.30 | 3.635 | 136911.98 | 134946.72 | 1965.26 | 2975 | 15457750 | 123662000 | 134904000 |
| VDA | 8000 | 80000 | 80054.74 | 2.668 | 36846.36 | 3089.38 | 33756.98 | 2000 | 22528000 | 180224000 | 196608000 |
| Genomics | 960 | 960000 | 960029.83 | 0.546 | 81531.12 | 56203.12 | 25327.99 | 480 | 415851 | 3326812 | 3629250 |
| EDA | 3300 | 1485000 | 1485083.74 | 1.657 | 23965.24 | 12581.35 | 11383.90 | 2062 | 4558769 | 36470156 | 39785625 |

Table 5: SPECstorage workloads results

maximum throughput of the target node is 512 Gb/s. Furthermore, as discussed earlier the actual throughput we anticipate is slightly lower than the theoretical limit. The PCIe Gen4 x4 PM9A3 has a maximum throughput of 6800 MB/s or 54 Gb/s. However, the limit on the Dell R7515 NVMe slot is 32 Gb/s. Each target has 15x PM9A3 devices, providing a maximum SSD throughput of 480 Gb/s. This is well under the 512 Gb/s network limit. The testbed that we have built, therefore, is storage performance limited.

2.3 Switches

The test bed, as seen in figure 1, includes two 32 port switches with each port supporting a full duplex 200 Gb/s of throughput. Of the 64 ports available in the configuration, 16 ports were used for client connections, 24 ports were dedicated for storage nodes and 4 ports were dedicated to inter-switch links (ISLs).

3. Test Results

In an ongoing effort with both Weka and SPEC, we have been tuning the environment and running a series of SPECstorage benchmarking tests after each change. This document will not cover all the tuning that was done in order to achieve the best results. Instead, in the following paragraphs, we will discuss the final rounds of testing and present the best business metric result achieved while running the benchmark. The appendix however consists of the final results of all the business metrics from the benchmark.

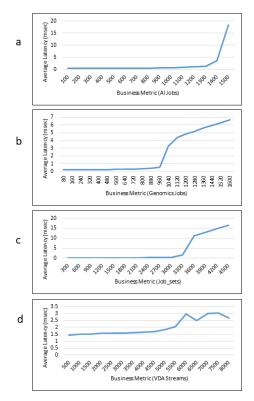


Figure 2: AI_Image, Genomics, EDA_Blended, and VDA SPEC Latency results

3.1. 8x6 Test Environment

The following test results were collected in an 8 by 6 environment, meaning the environment consists of 8 client hosts and 6 target hosts. It is important to note the number of clients used because the workload during the test is spread out across that number of physical machines. <u>Table 5</u> shows the results from the highest business metric achieved from running the AI Image, VDA, Genomics, and EDA workloads with 8 clients for 300 seconds.

AI Image: The average file size was 9952 KiB. The initial file set is equal to the start data set for all the business metrics. With an incremental business metric of 100, we were able to run up to business metric 1400 before failing the test at 1500. Looking at the latency summary (figure 2 a) from the benchmark logs, at business metric 1400, the average latency jumps up from 4ms to 18ms, and the test fails as a result (figure 5 a). We can see from the benchmark logs that the failure at business metric 1500 is due to the operation rate falling below an acceptable threshold. If we observe the CPU utilization (figure 5 b) on the 8 client hosts, we can see that there is a noticeable increase as business metric increases. At the later portions of the timeline, we see CPU utilization on some of

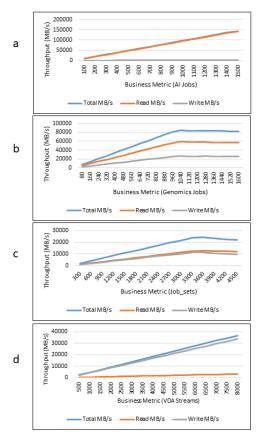


Figure 3: AI_Image, Genomics, EDA_Blended, and VDA SPEC Throughput results

the clients nearly reach a maximum thus implying a CPU bottleneck. The AI Image workload reached a max business metric of 1400 with an average throughput of 137 GB/s (figure 3 a) against the storage system and achieved the oprate of 609K (figure 4 a). The clients hit a CPU bottleneck before the network, memory, or disk space is reached.

Genomics: The average file size was 1613 KiB. The initial file set is equal to the start data set for all the business metrics. An incremental business metric of 80 was used and tests began to fail after business metric 1040. Looking at the latency curve in figure 2 b, we see that average latency is very low until business metric 960. At this point, the latency jumps up to above 6ms and benchmark tests fail. At business metric 1040, the benchmark log fails with the error message as in figure 6 a regarding operation rate threshold. When we observe the client side CPU utilization (figure 6 b), we see that CPU is bottlenecked at business metric of 1040 and afterwards. This is most likely the cause of the failing tests at that point. The Genomics workload reached a maximum throughput of 100 GB/s and achieved the maximum oprate of 1005K (figure 4 b) at a business metric of 1040 from which the tests started failing. A final business metric of 960 was achieved before the CPU became fully utilized.

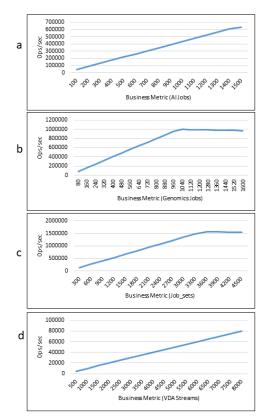


Figure 4: AI_Image, Genomics, EDA_Blended, and VDA SPEC IOPS results

EDA Blended: The average file size was 3424 KiB. The initial file set is equal to the start data set for all the business metrics. An incremental business metric of 300 was used and tests began to fail after a business metric of 3300. The average latency (figure 2 c) reported by the benchmark increases after 3600 business metric to over 10ms and continues up higher in all the failing tests. At business metric 3600, the benchmark test fails with the error about operation rate threshold as shown in figure 5 c. We see that CPU utilization (figure 5 d) on the clients begins to ramp up around the 3600 business metric and is nearly fully utilized on all the later tests. The EDA Blended workload did not see any improvement with the additional clients in the 8 client test. A final business metric of 3300 was achieved with an average throughput of 24 GB/s and the oprate of 1485K achieved on the storage before getting bottlenecked by client side CPU.

Video Data Acquisition: The average file size was 1048576 KiB. The initial file set is equal to the start data set for all the business metrics. An incremental business metric of 500, and a maximum business metric of 8000 was achieved. If we observe the latency results in figure 2 d across all the business metrics, we see only a small increase in the latency. The latency is well within the acceptable threshold and the environment should support higher business metrics if the storage nodes had higher capacity drives. The achieved throughput,

and oprate are 37 GB/s (figure 3 d) and 80K (figure 4 d) respectively. The observed latency drops from a maximum of 3 ms to 2.7 ms (figure 2 d). The bottleneck preventing larger workloads is the storage capacity of the Weka cluster. The chart in figure 6 c shows the utilization % of the Weka cluster storage devices. You will see the capacity is increasing at a linear rate as business metric increases in subsequent tests until 100% utilization is reached. During the benchmarking, we do not observe any bottlenecks in CPU, memory, or network on either the clients or target nodes. In future work, we will add additional SSDs to the target nodes, in an attempt to reach higher business metrics.

4. Conclusion and Future Work

Samsung PM9A3 NVMe proved to be a highly performant SSD when integrated with Weka's software defined storage solution and put to the test with storage intensive workloads. This reference platform ranked number 1 in performance for 4 of the 5 SPECstorage Solution 2020 benchmarks. The final results for the workloads AI Image, EDA Blended, Genomics, and VDA are published on the SPEC website [5].

Limitations: The performance results for workloads EDA Blended, AI Image, and Genomics hit a client side CPU limitation. The backend storage servers (Weka) are capable of higher workloads if the clients were given more compute resources.

The VDA workload is limited to backend storage space. If more SSDs are provisioned to the Weka cluster, we believe we can test larger business metrics. Each Dell R7515 storage server supports attaching up to 24 NVMe devices; 54 more devices than the current configuration.

As a future work, we intend to conduct performance analysis with S3 and NFS protocols as services on top of the WekaFS file service and observe the impact of such configurations on the SPECstorage workloads.

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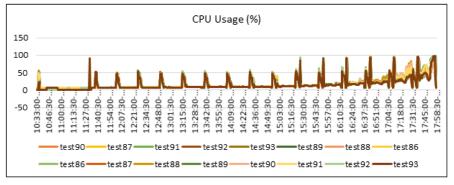
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a. AI IMAGE Failure Message

At load 1500...

[INFO][Wed Feb 16 17:58:33 2022]At least one process fell below the threshold of 75.00% (58.27%) for workload AI_SF [INFO][Wed Feb 16 17:58:33 2022]Failed success criteria





c. EDA Failure Message

At load 3600... [INFO][Wed Feb 16 20:46:03 2022]At least one process fell below the threshold of 75.00% (57.75%) for workload EDA_BACKEND [INFO][Wed Feb 16 20:46:03 2022]At least one process fell below the threshold of 75.00% (64.90%) for workload EDA_FRONTEND [INFO][Wed Feb 16 20:46:03 2022]The average oprate fell below the threshold of 95.00% (90.55%)for workload EDA_BACKEND [INFO][Wed Feb 16 20:46:03 2022]The workload variance between EDA_BACKEND and EDA_FRONTEND exceeded the threshold of+/- 5.00% (9.23%) [INFO][Wed Feb 16 20:46:03 2022]Failed success criteria d. EDA CPU Usage

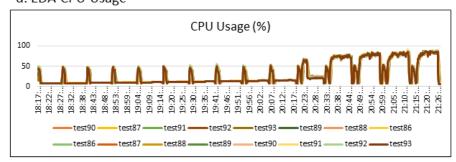
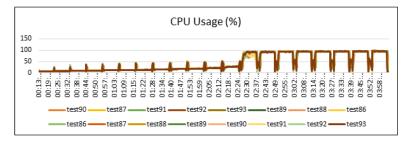


Figure 5: AI Image and EDA_Blended Workloads: Failure Message and CPU Usage

a. GENOMICS Failure Message

At load 1040... [INFO][Thu Feb 17 02:38:00 2022]At least one process fell below the threshold of 75.00% (63.82%) for workload NGS [INFO][Thu Feb 17 02:38:00 2022]Failed success criteria

b. GENOMICS CPU Usage



c. VDA Disk Usage

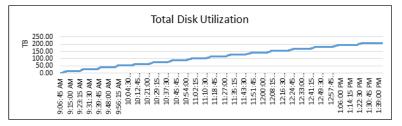


Figure 6: Genomics, and VDA: Failure Message, Disk and CPU Usage

Appendix

1. Workload Results

1.1. AI Image Spec Results

| BM | ROR | AOR | Avg Lat (ms) | Total KBps | Read KBps | Write KBps | Cl Proc | CDS MiB | SDS MiB | MFS MiB |
|------|--------|----------------|--------------------|-----------------|-----------------|-----------------|------------|----------|-----------|-----------|
| 100 | 43500 | 43505.71 5 | 0.473 | 9782168. 632 | 9642471 .317 | 13969 7.315 | 212 | 1104125 | 8833000 | 9636000 |
| 200 | 87000 | 87011.43 7 | 0.48 | 19563861 .53 | 1928204 2.96 | 28181 8.574 | 425 | 2208250 | 17666000 | 19272000 |
| 300 | 130500 | 130517.1 65 | 0.483 | 29338292 .98 | 2891646 7.42 | 42182 5.558 | 637 | 3312375 | 26499000 | 28908000 |
| 400 | 174000 | 174022.8 68 | 0.486 | 39112621 .71 | 3855420 4.66 | 55841 7.057 | 850 | 4416500 | 35332000 | 38544000 |
| 500 | 217500 | 217528.6 01 | 0.489 | 48898814 .26 | 4819517 3.68 | 70364 0.58 | 1062 | 5520625 | 44165000 | 48180000 |
| 600 | 261000 | 261034.2 98 | 0.503 | 58673774 .78 | 5783374 3.26 | 84003 1.517 | 1275 | 6624750 | 52998000 | 57816000 |
| 700 | 304500 | 304540.1 28 | 0.489 | 68453529 .58 | 6747215 7.86 | 98137 1.722 | 1487 | 7728875 | 61831000 | 67452000 |
| 800 | 348000 | 348045.8 34 | 0.541 | 78243400 .41 | 7711791 2.02 | 11254 88.387 | 1700 | 8833000 | 70664000 | 77088000 |
| 900 | 391500 | 391551.5 42 | 0.632 | 88020984 .12 | 8675768 4.99 | 12632 99.13 | 1912 | 9937125 | 79497000 | 86724000 |
| 1000 | 435000 | 435057.1 61 | 0.727 | 97803375 .75 | 9639902 4.92 | 14043 50.824 | 2125 | 11041250 | 88330000 | 96360000 |
| 1100 | 478500 | 478563.0 37 | 0.864 | 10758185 4 | 1060394 88.4 | 15423 65.653 | 2337 | 12145375 | 97163000 | 105996000 |
| 1200 | 522000 | 522068.5 19 | 1.068 | 11735233 0.4 | 1156706 11.3 | 16817 19.13 | 2550 | 13249500 | 105996000 | 115632000 |
| 1300 | 565500 | 565574.3 67 | 1.398 | 12712832 6.9 | 1253093 98.6 | 18189 28.324 | 2762 | 14353625 | 114829000 | 125268000 |
| 1400 | 609000 | 609005.3 01 | 3.635 | 13691197 7.2 | 1349467 19.9 | 19652 57.338 | 2975 | 15457750 | 123662000 | 134904000 |
| 1500 | 652500 | 629039.0 66 | 18.34 9 | 14424465 8.2 | 1421451 11.6 | 20995 46.632 | 3187 | 16561875 | 132495000 | 144540000 |

Table 1: AI Image SPEC results

2.2. Electronic Design Automation Spec Results

| BM | ROR | AOR | Avg Lat (ms) | Total KBps | Read KBps | Write KBps | Cl Proc | CDS MiB | SDS MiB | MFS MiB |
|-----|--------|----------------|--------------------|-----------------|---------------------|-----------------|------------|---------|---------|---------|
| 300 | 135000 | 135007.6 01 | 0.16 | 2178154. 48 | 11440 40.20 4 | 103411 4.275 | 187 | 414433 | 3315468 | 3616875 |
| 600 | 270000 | 270015.1 32 | 0.161 | 4356604. 182 | 22867 06.39 2 | 206989 7.789 | 375 | 828867 | 6630937 | 7233750 |

| 900 | 405000 | 405022.8 39 | 0.167 | 6535752. 279 | 34313 34.17 9 | 310441 8.1 | 562 | 1243300 | 9946406 | 10850625 |
|------|-------------|-----------------|------------|-----------------|---------------------|------------------------------|------|---------|----------|----------|
| 1200 | 540000 | 540030.6 89 | 0.177 | 8714324. 103 | 45752 11.00 9 | 413911 3.095 | 750 | 1657734 | 13261875 | 14467500 |
| 1500 | 675000 | 675038.3 08 | 0.189 | 10894274 .12 | 57189 20.23 1 | 517535 3.891 | 937 | 2072167 | 16577343 | 18084375 |
| 1800 | 810000 | 810045.8 66 | 0.205 | 13070278 .21 | 68598 65.72 9 | 621041 2.48 | 1125 | 2486601 | 19892812 | 21701250 |
| 2100 | 945000 | 945053.5 59 | 0.223 | 15248380 .98 | 80061 49.49 9 | 724223 1.481 | 1312 | 2901035 | 23208281 | 25318125 |
| 2400 | 108000 0 | 1080059. 967 | 0.247 | 17425711 .08 | 91491 59.52 5 | 827655 1.55 | 1500 | 3315468 | 26523750 | 28935000 |
| 2700 | 121500 0 | 1215069. 284 | 0.277 | 19605730 .32 | 10293 041.0 1 | 931268 9.303 | 1687 | 3729902 | 29839218 | 32551875 |
| 3000 | 135000 0 | 1350075. 187 | 0.324 | 21782436 .48 | 11438 576.0 1 | 103438 60.47 | 1875 | 4144335 | 33154687 | 36168750 |
| 3300 | 148500 0 | 1485083. 744 | 1.657 | 23965243 .89 | 12581 348.5 3 | 113838 95.36 | 2062 | 4558769 | 36470156 | 39785625 |
| 3600 | 162000 0 | 1557147. 802 | 11.14 3 | 24414445 .88 | 12952 178.2 6 | 114622 67.62 | 2250 | 4973203 | 39785625 | 43402500 |
| 3900 | 175500 0 | 1570177. 614 | 13.07 5 | 23396375 .43 | 12653 345.5 8 | 107430 29.85 | 2437 | 5387636 | 43101093 | 47019375 |
| 4200 | 189000 0 | 1556294. 406 | 14.80 3 | 22663905 .96 | 12363 174.4 1 | 103007 31.55 | 2625 | 5802070 | 46416562 | 50636250 |
| 4500 | 202500 0 | 1537560. 95 | 16.43 9 | 21973854 .37 | 12075 076.8 5 | 989877 7.528 SPEC resu | 2812 | 6216503 | 49732031 | 54253125 |

Table2: EDA SPEC results

2.3. Genomics Spec Results

| BM | ROR | AOR | Avg Lat (ms) | Total KBps | Read KBps | Write KBps | Cl Proc | CDS MiB | SDS MiB | MFS MiB |
|-----|--------|----------------|--------------------|-----------------|-----------------|-----------------|------------|---------|---------|---------|
| 80 | 80000 | 80002.29 | 0.211 | 679313 9.495 | 4682121 .157 | 211101 8.338 | 40 | 34654 | 277234 | 302437 |
| 160 | 160000 | 160004.0 52 | 0.212 | 135886 10.83 | 9368620 .315 | 421999 0.517 | 80 | 69308 | 554468 | 604875 |
| 240 | 240000 | 240006.3 32 | 0.221 | 203793 18.25 | 1405194 5.37 | 632737 2.877 | 120 | 103962 | 831703 | 907312 |
| 320 | 320000 | 320008.2 1 | 0.23 | 271792 02.6 | 1873604 4.91 | 844315 7.69 | 160 | 138617 | 1108937 | 1209750 |

| r | | | | | | | | | | |
|------|-------------|----------------|-------|-----------------|-----------------|-----------------|-----|--------|---------|---------|
| 400 | 400000 | 400010.8 95 | 0.239 | 339767 36.61 | 2341806 4.96 | 105586 71.65 | 200 | 173271 | 1386171 | 1512187 |
| 480 | 480000 | 480012.9 | 0.255 | 407710 62.2 | 2810407 4.32 | 126669 87.88 | 240 | 207925 | 1663406 | 1814625 |
| 560 | 560000 | 560015.1 07 | 0.268 | 475572 71.19 | 3278392 8.2 | 147733 42.99 | 280 | 242580 | 1940640 | 2117062 |
| 640 | 640000 | 640018.0 26 | 0.288 | 543627 74.18 | 3747163 0.09 | 168911 44.1 | 320 | 277234 | 2217875 | 2419500 |
| 720 | 720000 | 720020.9 | 0.32 | 611581 05.89 | 4215569 2.12 | 190024 13.77 | 360 | 311888 | 2495109 | 2721937 |
| 800 | 800000 | 800022.6 04 | 0.353 | 679457 90.38 | 4683298 6.3 | 211128 04.08 | 400 | 346542 | 2772343 | 3024375 |
| 880 | 880000 | 880025.4 36 | 0.417 | 747440 18.85 | 5152437 7.82 | 232196 41.03 | 440 | 381197 | 3049578 | 3326812 |
| 960 | 960000 | 960029.8 27 | 0.546 | 815311 20.47 | 5620312 0.77 | 253279 99.71 | 480 | 415851 | 3326812 | 3629250 |
| 1040 | 104000 0 | 1004657. 76 | 3.252 | 853227 46.66 | 5881858 1.72 | 265041 64.93 | 520 | 450505 | 3604046 | 3931687 |
| 1120 | 112000 0 | 988675.5 53 | 4.379 | 839665 55.69 | 5787950 2.52 | 260870 53.17 | 560 | 485160 | 3881281 | 4234125 |
| 1200 | 120000 0 | 987021.8 28 | 4.869 | 838167 66.84 | 5777093 6.09 | 260458 30.74 | 600 | 519814 | 4158515 | 4536562 |
| 1280 | 128000 0 | 990097.2 88 | 5.2 | 840732 28.64 | 5795094 7.77 | 261222 80.87 | 640 | 554468 | 4435750 | 4839000 |
| 1360 | 136000 0 | 979173.4 29 | 5.608 | 831514 25.51 | 5730954 8.49 | 258418 77.02 | 680 | 589123 | 4712984 | 5141437 |
| 1440 | 144000 0 | 982335.6 09 | 5.944 | 834093 53.45 | 5748938 3.98 | 259199 69.47 | 720 | 623777 | 4990218 | 5443875 |
| 1520 | 152000 0 | 973569.0 91 | 6.305 | 826618 89.82 | 5696679 1.78 | 256950 98.04 | 760 | 658431 | 5267453 | 5746312 |
| 1600 | 160000 0 | 972900.9 19 | 6.663 | 826001 79.28 | 5692661 8.57 | 256735 60.71 | 800 | 693085 | 5544687 | 6048750 |

Table 3: Genomics SPEC results

2.4. VDA Spec Results

| BM | ROR | AOR | Avg Lat (ms) | Total KBps | Read KBps | Write KBps | Cl Proc | CDS MiB | SDS MiB | MFS MiB |
|------|-------|---------------|--------------------|-----------------|-----------------|-----------------|------------|------------|----------|----------|
| 500 | 5000 | 5003.372 | 1.423 | 2303210.46 1 | 192929. 207 | 21102 81.254 | 125 | 1408000 | 11264000 | 12288000 |
| 1000 | 10000 | 10006.83 8 | 1.504 | 4601634.06 2 | 385999. 197 | 42156 34.865 | 250 | 2816000 | 22528000 | 24576000 |
| 1500 | 15000 | 15010.26 4 | 1.519 | 6908380.35 7 | 578341. 532 | 63300 38.825 | 375 | 4224000 | 33792000 | 36864000 |
| 2000 | 20000 | 20013.64 8 | 1.565 | 9214477.37 2 | 771203. 875 | 84432 73.497 | 500 | 5632000 | 45056000 | 49152000 |
| 2500 | 25000 | 25017 | 1.583 | 11510404.5 4 | 966031. 114 | 10544 373.43 | 625 | 7040000 | 56320000 | 61440000 |
| 3000 | 30000 | 30020.44 1 | 1.581 | 13823528.6 4 | 116017 2.173 | 12663 356.47 | 750 | 8448000 | 67584000 | 73728000 |
| 3500 | 35000 | 35023.80 1 | 1.612 | 16120545.9 2 | 134998 2.093 | 14770 563.83 | 875 | 9856000 | 78848000 | 86016000 |

| | | | | | | 1 10 - 0 | | | | 1 |
|------|-------|----------------|-------|------------|--------|----------|----------|-----------|-----------|-----------|
| 4000 | 40000 | 40027.33 | 1.643 | 18423030.4 | 154438 | 16878 | 1000 | 11264000 | 90112000 | 98304000 |
| | | 9 | | 3 | 7.277 | 643.15 | | 11204000 | 90112000 | 70504000 |
| 4500 | 45000 | 45030.74 | 1.686 | 20737312.4 | 173881 | 18998 | 1125 | 12672000 | 101376000 | 110592000 |
| | | 8 | | 1 | 2.483 | 499.93 | | 12072000 | 101370000 | 110392000 |
| 5000 | 50000 | 50033.98 | 1.82 | 23038524.1 | 193011 | 21108 | 1250 | 14080000 | 112640000 | 122880000 |
| | | 1 | | 3 | 5.96 | 408.17 | | | | |
| 5500 | 55000 | 55037.39 | 2.04 | 25332750.1 | 212119 | 23211 | 1375 | 15488000 | 123904000 | 135168000 |
| 5500 | | 9 | | 3 | 0.941 | 559.19 | | | | |
| (000 | 60000 | 60041.11 | 2.948 | 27636711.5 | 231541 | 25321 | 1500 | 16896000 | 135168000 | 147456000 |
| 6000 | | 7 | | 2 | 0.487 | 301.03 | | | | |
| (500 | 65000 | 65044.46 | 2.507 | 29932066.5 | 251040 | 27421 | 1625 | 18304000 | 146432000 | 159744000 |
| 6500 | | 1 | | 3 | 7.395 | 659.14 | | | | |
| 7000 | 70000 | 70047.81 3.001 | 2 001 | 32257148.3 | 270364 | 29553 | 1750 | 10712000 | 157606000 | 172022000 |
| 7000 | | | 8 | 4.81 | 503.57 | 1750 | 19712000 | 157696000 | 172032000 | |
| 7500 | 75000 | 75051.30 | 3.027 | 34547198.4 | 289668 | 31650 | 1875 | 21120000 | 168960000 | 184320000 |
| 7500 | | 3 | | 1 | 6.243 | 512.16 | | | | |
| 8000 | 80000 | 80054.74 | 2.668 | 36846363.1 | 308938 | 33756 | 2000 | 22528000 | 180224000 | 196608000 |
| | | 1 | | 6 | 1.841 | 981.31 | | | | |

Table 4: VDA SPEC results