# **Simulation-Aided Performance Evaluation of Input/Output Optimizations for Distributed Systems**

**— Masterarbeit —**

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Ich versichere, dass ich diese Masterarbeit selbstständig verfasst, nur die angegebenen Quellen und Hilfsmittel verwendet und die Grundsätze und Empfehlungen "Verantwortung in der Wissenschaft" der Universität Heidelberg beachtet habe.

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## **Abstract**

The performance of parallel cluster file systems suffers from many clients executing a large number of operations in parallel, because the I/O subsystem can be easily overwhelmed by the sheer amount of incoming I/O operations. This, in turn, can slow down the whole distributed system.

Many optimizations exist that try to alleviate this problem. Client-side optimizations do preprocessing to minimize the amount of work the file servers have to do. Server-side optimizations use server-internal knowledge to improve performance.

The PIOsimHD framework contains components to simulate, trace and visualize applications. It is used as a testbed to implement optimizations that could later be implemented in real-life projects.

The main focus of this thesis lies on comparing existing client-side optimizations and newly implemented server-side optimizations like Server-Directed I/O, which provides server-side optimizations for both read and write operations. It chooses the order of I/O operations and tries to aggregate as many operations as possible to decrease the load on the I/O subsystem and improve overall performance. The Interleaved Two-Phase protocol is a modification of ROMIO's Two-Phase protocol, which only accesses contiguous file regions.

HDSunshot is used to visualize and analyze some of the results. It is also used to evaluate different optimization techniques by analyzing the resulting traces.

The results show that client-side optimizations do not necessarily beat server-side optimizations in terms of performance, but suggest that even simple server-side optimizations are good enough for many use cases. Integrating such optimizations into parallel cluster file systems could alleviate the need for sophisticated clientside optimizations. Due to their additional knowledge of internal workflows serverside optimizations may be better suited to provide high performance in general.

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## **Contents**









# <span id="page-7-0"></span>**Chapter 1**

# **Introduction**

In this chapter definitions of parallel cluster file systems and non-contiguous  $I/O<sup>1</sup>$  $I/O<sup>1</sup>$  $I/O<sup>1</sup>$ are given. A special focus lies on the problems these file systems are facing when accessed by large numbers of clients, because the goal of this thesis is to examine possible solutions for these problems. Additionally, storage devices providing the underlying storage for parallel cluster file systems and the simulator software PIOsimHD are introduced.

## <span id="page-7-1"></span>**1.1 Parallel Cluster File Systems**

Cluster file systems are built in such a way that several machines connected by some network make up one file system. Usually every machine is either a data server or a metadata server, that is, it only stores objects of the respective type. It is also possible but unusual that each machine acts as a combined data and metadata server.

Every machine has only direct access to its own storage, so no machine has a total overview of the complete file system. Consequently, either the servers have to communicate with each other or clients must contact multiple servers. In any event data has to be sent across the network, thus introducing an additional delay between the request and response. For Ethernet networks this latency usually lies between 50 µs and 500 µs.

If a client wants to read a file, it first has to figure out on which metadata servers the metadata about this file can be found. Then it must request the data from each data server that holds data of this particular file. In addition to the disk access times of the servers the client has to connect via the network to all those servers. This is expensive — especially for small requests — due to network latency and bandwidth restrictions.

Cluster file systems can be accessed by multiple remote clients simultaneously. Parallel cluster file systems additionally allow clients to access the same file

<span id="page-7-2"></span><sup>1</sup> Input/Output

concurrently. To do this, some form of concurrency control must be in place. This, however, must not be confused with ordinary locking, because it is done above the file system layer. Locking can be used to protect a file against concurrent access, but not the file system itself. Therefore, a mechanism must be implemented at the file system level to keep the clients from corrupting the file system by modifying the same part of it at the same time.

Parallel cluster file systems are designed to handle a large number of clients and deliver high performance. However, due to their distributed design most operations are expensive to perform, which in turn can seriously impact overall performance. For this reason new algorithms to efficiently perform [I/O](#page-116-1) on these file system have emerged and a multitude of optimizations are available to improve performance even further.

Figure [1.1](#page-8-0) shows four clients accessing different blocks of data in a file. All 12 blocks of the file are read, each client reading three blocks of data. However, one client's blocks are spread across the file. Depending on the order of the clients' requests, the file server may need to perform a lot of seeks within the file. This overhead increases with a growing number of clients, to the point where the file server may be busy doing more seeks than actual [I/O.](#page-116-1) This is one of the main problems found in large-scale systems with a lot of clients accessing small portions of a file.

<span id="page-8-0"></span>

Figure 1.1: Multiple Clients Accessing the Same File

For a more in-depth analysis of problems in parallel cluster file systems and possible solutions, see [\[Kuh07\]](#page-97-1).

## <span id="page-9-0"></span>**1.2 Storage Devices**

Storage devices relevant for parallel cluster file systems can be roughly separated into two categories — mechanical ones and non-mechanical ones. Other differences like connection interfaces [\(SCSI](#page-117-0) $^2$  $^2$ , [ATA](#page-116-2) $^3$  $^3$ , [SATA](#page-117-1) $^4$  $^4$ , etc.) and built-in optimizations (Caches, [NCQ](#page-116-3)<sup>[5](#page-9-6)</sup>, etc.) are not important in this regard.  $HDDs<sup>6</sup>$  $HDDs<sup>6</sup>$  $HDDs<sup>6</sup>$  represent the mechanical storage devices, while  ${\rm SSDs}^7$  ${\rm SSDs}^7$  ${\rm SSDs}^7$  ${\rm SSDs}^7$  represent the non-mechanical ones.

Some file system also use  $SANs<sup>8</sup>$  $SANs<sup>8</sup>$  $SANs<sup>8</sup>$  as the underlying storage. However, these  $SANs$ also use [HDDs](#page-116-4) or [SSDs](#page-117-2) to actually store data.

The influence of their unique characteristics on the optimizations examined in this thesis are described in more detail in section [2.2](#page-15-0) (page [16\)](#page-15-0).

### <span id="page-9-1"></span>**1.2.1 Hard Disk Drives**

[HDDs](#page-116-4) consist of multiple rotating platters with magnetic surfaces and read-write heads. To access data on the disk the read-write heads have to move and wait for the platters to rotate to the appropriate position. Since moving the read-write heads is a mechanical operation it is relatively slow to perform. In addition, the platters rotate at a constant speed — usually 7.200 or  $10.000$  [RPM](#page-117-4)<sup>[9](#page-9-10)</sup> —, limiting the minimum latency and maximum throughput. Access times for drive accesses usually lie between 5 ms and 15 ms, depending on the area of the disk that should be accessed. This can cause performance to degrade significantly for random accesses.

Modern [HDDs](#page-116-4) include a random access cache, and operating systems usually have dedicated file system caches to speed up disk operations. Without these caches [HDDs](#page-116-4) would be unusably slow. However, this does not solve the problem where many random read accesses are performed for the first time, that is, where the data is not cached already.

### <span id="page-9-2"></span>**1.2.2 Solid State Drives**

In contrast to [HDDs](#page-116-4), [SSDs](#page-117-2) contain no mechanical parts, but use solid state memory — usually flash memory — in order to store the data. Access times for drive accesses usually lie between  $20 \mu s$  and  $200 \mu s$ , depending on the type of operation. This

<span id="page-9-3"></span><sup>2</sup>Small Computer System Interface

<span id="page-9-4"></span><sup>3</sup>Advanced Technology Attachment

<span id="page-9-5"></span><sup>4</sup>Serial Advanced Technology Attachment

<span id="page-9-6"></span><sup>&</sup>lt;sup>5</sup>Native Command Queuing

<span id="page-9-7"></span><sup>6</sup>Hard Disk Drives

<span id="page-9-8"></span><sup>7</sup>Solid State Drives

<span id="page-9-9"></span><sup>8</sup>Storage Area Networks

<span id="page-9-10"></span><sup>&</sup>lt;sup>9</sup>Revolutions Per Minute

makes them orders of magnitude faster than [HDDs](#page-116-4), especially when many random accesses are involved.

[SSDs](#page-117-2) can only write blocks in the form of so-called erase blocks, that is, the old data has to be read, modified in memory, erased and then written back to the solid state memory. Modern [SSDs](#page-117-2) use erase blocks of  $512$  Ki $B^{10}$  $B^{10}$  $B^{10}$  and more, which can severely impact performance when performing many small write operations. Newer [SSDs](#page-117-2) and  $OS<sup>11</sup>$  $OS<sup>11</sup>$  $OS<sup>11</sup>$  support the TRIM<sup>[12](#page-10-3)</sup> command to mitigate this problem, but this is not supported everywhere. In contrast, reads can be performed with a granularity of 4 [KiB.](#page-116-5) This causes the read and write performances to differ greatly most of the time. For example, current Intel [SSDs](#page-117-2) can read up to 250[MiB](#page-116-7)[13](#page-10-4)/s, but only write 75[MiB/](#page-116-7)s.

Due to their very recent appearance in the mass market [SSDs](#page-117-2) are still significantly more expensive and offer less capacity when compared to traditional [HDDs](#page-116-4). Therefore, [SSDs](#page-117-2) are usually not yet considered when storing large amounts of data, except for workloads involving large amounts of random [I/O](#page-116-1) operations. For example, this includes large database applications.

### <span id="page-10-0"></span>**1.3 Non-Contiguous I/O**

Traditionally, data is accessed in contiguous regions, identified by an offset and a size. Non-contiguous [I/O](#page-116-1) enables applications to read several contiguous regions that may be separated by holes of arbitrary size without actually requesting each of the regions separately. This significantly reduces the complexity needed to handle complex data types in a program. For example, the user can construct a data type for a matrix diagonal and use it like any other data type for [I/O.](#page-116-1) Using non-contiguous [I/O](#page-116-1) to perform such operations may give the underlying file system  $-$  or another layer between the application and the file system  $-$  the opportunity to optimize these kinds of operations by exploiting the fact that several seemingly independent operations are in fact part of one non-contiguous operation. On the other hand, this can increase the complexity needed to do [I/O](#page-116-1) and may require additional optimizations to handle such [I/O](#page-116-1) efficiently. Some simple optimizations are presented in section [2.2](#page-15-0) (page [16\)](#page-15-0).

Figure [1.2](#page-11-3) (page [12\)](#page-11-3) shows a file consisting of 12 blocks and one client accessing the file. The client uses one non-contiguous [I/O](#page-116-1) operation to read eight blocks in three contiguous regions (1–3, 6–7 and 10–12).

<span id="page-10-1"></span> $10$ Kibi Byte

<span id="page-10-2"></span><sup>&</sup>lt;sup>11</sup>Operating Systems

<span id="page-10-3"></span> $12$ For more information see [http://en.wikipedia.org/wiki/TRIM\\_\(SSD\\_command\)](http://en.wikipedia.org/wiki/TRIM_(SSD_command)).

<span id="page-10-4"></span><sup>13</sup>Mebi Byte

<span id="page-11-3"></span>

Figure 1.2: Non-Contiguous I/O

## <span id="page-11-0"></span>**1.4 PIOsimHD**

 $PIOsimHD<sup>14</sup>$  $PIOsimHD<sup>14</sup>$  $PIOsimHD<sup>14</sup>$  $PIOsimHD<sup>14</sup>$  is a framework containing all components necessary to simulate, trace and visualize applications. One of its goals is to allow easy and fast prototyping of new algorithms for [I/O](#page-116-1) optimization. Therefore, all optimizations presented in this thesis are implemented in [PIOsimHD-](#page-116-8)Simulator to evaluate their theoretical benefits.

These optimizations are not dependent on any specific project environment and can serve as a starting point for adoption of promising optimizations into reallife projects. This helps avoiding the overhead of implementing several complex optimization variants in even more complex real-life projects when only the most promising one is really needed.

A more detailed description of [PIOsimHD](#page-116-8) can be found in section [3.1](#page-20-1) (page [21\)](#page-20-1).

## <span id="page-11-1"></span>**1.5 Goals of the Thesis**

The main goal of this thesis is to determine whether server-side optimizations are sufficient to provide acceptable [I/O](#page-116-1) performance for common workloads. Traditionally, client-side [I/O](#page-116-1) libraries provide very sophisticated optimizations to improve performance in distributed systems. However, it is not clear whether this complexity is really needed or if simpler server-side optimizations can provide similar results for many cases.

## <span id="page-11-2"></span>**1.6 Outlook**

Chapter [2](#page-13-0) (page [14\)](#page-13-0) introduces related work and basic concepts that form the basis of the optimizations done in this thesis. Chapter [3](#page-20-0) (page [21\)](#page-20-0) presents the software used to implement and evaluate these optimizations. This chapter also gives an overview of the internal structure of the simulator software [PIOsimHD.](#page-116-8) The

<span id="page-11-4"></span><sup>14</sup>Parallel I/O Simulator

basic design of the optimizations is elaborated in chapter [4](#page-29-0) (page [30\)](#page-29-0). Chapter [5](#page-36-0) (page [37\)](#page-36-0) focuses on the actual implementation of these optimizations. Finally, the benefits of these changes are examined in detail. In chapter [6](#page-60-0) (page [61\)](#page-60-0) the actual impact on performance in terms of throughput is evaluated. Chapter [7](#page-87-0) (page [88\)](#page-87-0) focuses on the visualization of these results. Chapter [8](#page-94-0) (page [95\)](#page-94-0) summarizes and concludes the thesis. Additionally, ideas for future work are proposed.

### **Summary**

The performance of parallel cluster file systems suffers from many clients executing a large number of operations in parallel. Many optimizations exist that try to alleviate this problem. These optimizations should be suitable for both [HDDs](#page-116-4) and [SSDs](#page-117-2), because [HDDs](#page-116-4) are still used for large-scale data storage, but [SSDs](#page-117-2) play an increasingly important role. Non-contiguous [I/O](#page-116-1) can be used as a basis for a multitude of optimizations by providing the file system with additional information. [PIOsimHD](#page-116-8) is used as a testbed to implement optimizations that could later be implemented in real-life projects. The main focus lies on comparing existing client-side optimizations and newly implemented server-side optimizations.

# <span id="page-13-0"></span>**Chapter 2**

# **Related Work and State of the Art**

In this chapter related optimization techniques are presented and the difference between client-side and server-side optimizations is explained. Additionally, simpler optimizations like data sieving, collective [I/O](#page-116-1) and the Two-Phase protocol are explained in more detail. Lastly, the unique characteristics of the storage devices already mentioned in chapter [1](#page-7-0) (page [8\)](#page-7-0) are considered with regard to the presented optimizations.

## <span id="page-13-1"></span>**2.1 Related Work**

A multitude of approaches exist to optimize [I/O](#page-116-1) in distributed systems. They can be basically classified into two categories. Some approaches focus heavily on the client, trying to minimize the work the servers have to do. For example, the clients'  $RAM<sup>1</sup>$  $RAM<sup>1</sup>$  $RAM<sup>1</sup>$  $RAM<sup>1</sup>$  can be used to cache and batch [I/O](#page-116-1) operations to reduce the load on the servers. Other approaches do not do preprocessing on the clients and let the servers handle all the work themselves. The servers can then employ their own optimizations.

Simpler client-side optimizations like data sieving and collective [I/O](#page-116-1) are presented in [\[TGL99\]](#page-98-0), which focuses on their implementation in ROMIO. These optimizations are described in more detail in section [2.2](#page-15-0) (page [16\)](#page-15-0).

In  $[SIC<sup>+</sup>07, SIPC09]$  $[SIC<sup>+</sup>07, SIPC09]$  $[SIC<sup>+</sup>07, SIPC09]$  a refined and extended version of the Two-Phase protocol called Multiple-Phase Collective [I/O](#page-116-1) is presented. The communication phase is split up in several steps, in which pairs of clients communicate with each other in parallel. These multiple steps are used to progressively increase the locality of the data. This increases the performance of the subsequent [I/O](#page-116-1) phase and therefore of the whole application.

File accesses in distributed applications are often non-contiguous. In [\[KRVP07\]](#page-97-2) a method to optimize non-contiguous write operations using log-based storage $^2$  $^2$  is

<span id="page-13-2"></span><sup>1</sup>Random Access Memory

<span id="page-13-3"></span><sup>2</sup>See [http://en.wikipedia.org/wiki/Log-structured\\_file\\_system](http://en.wikipedia.org/wiki/Log-structured_file_system).

presented. This log-based storage always appends new data at the end of the log and thus converts non-contiguous write operations into contiguous ones. Special care must be taken when reading the file, because the log has to be replayed to create a traditional file for reading. Therefore, this optimization is especially useful for write-once or write-mostly cases like log files and snapshots.

Another popular client-side optimization is to use a distributed file cache as presented in  $[PTH^+01, LCCW05, LCC^+07, TLC^+99]$  $[PTH^+01, LCCW05, LCC^+07, TLC^+99]$ . While  $[TLC^+99]$  $[TLC^+99]$  uses a dedicated cache that is accessed via a so-called Distributed-Parallel Storage System master, [\[LCCW05,](#page-98-4) [LCC](#page-98-5)+07] describes a cache built into the [MPI-IO](#page-116-9)<sup>[3](#page-14-0)</sup> library which uses the main memory of all participating clients as a large two-staged write-behind cache. The method in [\[PTH](#page-98-3)<sup>+</sup>01] is geared towards the IBM's [GPFS](#page-116-10)<sup>[4](#page-14-1)</sup> and also uses a cache managed by the participating clients. To avoid concurrent access, each [GPFS](#page-116-10) file block is managed by exactly one client and all access to this block is done via this client. Double buffering is used to improve performance by overlapping communication and [I/O.](#page-116-1)

Parallel cluster file systems usually only offer one consistency policy. In [\[VNS05\]](#page-99-0) a new file system is presented that allows users to specify their applications' consistency needs. For example, temporary files can be stored locally or locking can be disabled when parallel access is ruled out. This allows users to tune the file system itself to deliver maximum performance for their specific workloads.

A technique called super-scalar compression is presented in [\[Zuk05\]](#page-99-1). The main idea is that the [CPU](#page-116-11)<sup>[5](#page-14-2)</sup> only uses part of its processing power when waiting for [I/O](#page-116-1) to complete. Spare [CPU](#page-116-11) power can be used to compress and decompress the file data on demand. When using ultra lightweight compression, this can result in a significant speedup.

In [\[Kot97\]](#page-97-3) an alternative to client-side optimizations — in particular, the Two-Phase protocol — is presented. Disk-directed [I/O](#page-116-1) is used to optimize the data flow on the file server itself, that is, optimizations are no longer done by the clients. This technique has the benefit that the file servers can use information about their physical disk layout to optimize accesses and also avoids the communication and computation overhead of the clients caused by the Two-Phase protocol.

The above optimizations only focus on the file data itself. However, metadata performance also plays an important role in parallel cluster file systems. In [\[DW07,](#page-97-4) [WPBM04,](#page-99-2) [BMLX03,](#page-97-5) [KKL08,](#page-97-6) [KKL09\]](#page-97-7) approaches to speed up metadataheavy operations or for efficient management of file metadata are presented. Even though the focus of this thesis is pure data performance, this aspect of overall performance should be noted for completeness.

<span id="page-14-0"></span><sup>3</sup>Message Passing Interface Input/Output

<span id="page-14-1"></span><sup>4</sup>General Parallel File System

<span id="page-14-2"></span><sup>5</sup>Central Processing Unit

In [\[BDK97\]](#page-97-8) the authors present several components of a simulator framework that is capable of parallel simulation of [MPI-IO](#page-116-9) applications and a parallel file system. In contrast to this design, PIOsimHD does not support parallel simulation, but allows modeling and simulation of all involved components of the distributed system.

### <span id="page-15-0"></span>**2.2 State of the Art**

Some optimizations are of special interest and are therefore presented in detail.

#### <span id="page-15-1"></span>**2.2.1 Data Sieving**

Data sieving is used to optimize non-contiguous [I/O.](#page-116-1) Instead of reading multiple small blocks of data, several such blocks are grouped together and then read as a larger block. On the one hand this avoids unnecessary seeking and can improve performance, while on the other hand this may cause unneeded data to be read and subsequently discarded. Obviously, this is only beneficial if the amount of unneeded data is relatively small.

Figure [2.1](#page-15-3) shows one client accessing three contiguous blocks of data (1–3, 6–7 and 10–12) in a file. The data sieving algorithm may now read just one contiguous block of data  $(1-12)$ , discard the unnecessary parts  $(4-5$  and  $8-9)$  and return the requested blocks to the application.

<span id="page-15-3"></span>

Figure 2.1: Data Sieving

This optimization also relies heavily on the fact that contiguous regions of a file are stored contiguously on disk. If the file is fragmented, this may cause performance degradation. It is also possible to use this technique for write operations. However, this may require read-modify-write operations to be performed, which further reduces the potential benefits. For example, this can happen when the clients do not write the whole contiguous region covered by the data sieving algorithm.

### <span id="page-15-2"></span>**2.2.2 Collective I/O**

Collective [I/O](#page-116-1) can be used to explicitly relate [I/O](#page-116-1) operations performed by multiple clients with each other. For example, when using individual [I/O](#page-116-1) the operations

performed by one client may have already started or even finished by the time the second client's operations are received by the file system. When using collective [I/O](#page-116-1) all operations are available at the same time, allowing the file system to perform optimizations that are impossible to do with individual [I/O.](#page-116-1)

For example, the additional information provided by collective [I/O](#page-116-1) can be used to optimize non-contiguous [I/O](#page-116-1) very well. Multiple non-contiguous accesses can be combined to improve performance, as demonstrated below.

Figure [2.2](#page-16-1) shows two clients each accessing three contiguous blocks (1, 3–4, and 7– 9 and 2, 5–6, and 10–12 respectively) of data in a file. When performing individual [I/O](#page-116-1) the file system may now first serve client 1, followed by client 2. This may cause inefficient execution of both requests — for example, by unnecessarily seeking within the file or by accessing the same set of data twice when using data sieving. When using collective [I/O](#page-116-1) the file system can recognize that both clients' requests access the whole file and use that knowledge to optimize the operation by merging all requests into one larger request.

<span id="page-16-1"></span>

Figure 2.2: Collective I/O

### <span id="page-16-0"></span>**2.2.3 Two-Phase**

The Two-Phase protocol is an optimization for collective [I/O](#page-116-1) implemented in ROMIO. It uses separate communication and [I/O](#page-116-1) phases to optimize [I/O](#page-116-1) accesses of multiple clients, but introduces additional communication overhead. The basic idea is to let the clients do the actual work of optimizing the accesses to ease the load on the file system. While the communication phase is used to share information necessary for meaningful optimizations among the clients, the [I/O](#page-116-1) phase is used to perform the actual [I/O](#page-116-1) as determined in the communication phase. The Two-Phase protocol implemented in ROMIO mainly focuses on making the accesses contiguous.

Figures [2.3a](#page-17-0) (page [18\)](#page-17-0), [2.3b](#page-17-1) (page [18\)](#page-17-1) and [2.3c](#page-17-2) (page [18\)](#page-17-2) show a typical execution of the Two-Phase protocol. Each client wants to access two data blocks spread across the file. The color of the data blocks corresponds to the color of the accessing client. For example, client 1 wants to access data blocks 1 and 3, client 2 wants to access data blocks 2 and 5, and client 3 wants to access data blocks 3 and 6.

<span id="page-17-0"></span>It is important to note that each client communicates with all other clients. For simplicity, these implicit arrows are omitted in the figures.



<span id="page-17-1"></span>

<span id="page-17-2"></span>Figure 2.3: Two-Phase

Figure [2.3a](#page-17-0) shows the communication phase of the Two-Phase protocol. All clients negotiate with each other which file areas have to be accessed. According to

this information the clients decide whether they should continue to perform the Two-Phase protocol or simply access their respective data blocks individually. For example, ROMIO only uses the Two-Phase protocol when the clients' accesses are overlapping. When performing the Two-Phase protocol they split up the file equally into so-called file domains. Each client is then responsible for one file domain. For example, client 1 is responsible for the file domain consisting of the data blocks 1 and 2, client 2 is responsible for the one consisting of the data blocks 3 and 4, and so on.

Figure [2.3b](#page-17-1) (page [18\)](#page-17-1) and [2.3c](#page-17-2) (page [18\)](#page-17-2) show the [I/O](#page-116-1) phase of the Two-Phase protocol. All clients only access data blocks within their respective file domains. When reading, the clients forward the read data to the clients which requested the data in the communication phase. When writing, the clients receive the data from the clients which requested to write the data in the communication phase and write it to the file system. As each client only uses a relatively small amount of main memory as a buffer for the Two-Phase protocol these two steps — communicating with the other clients and accessing the file — can be performed multiple times when needed. For example, figure [2.3b](#page-17-1) (page [18\)](#page-17-1) shows the first iteration of the [I/O](#page-116-1) phase, while figure [2.3c](#page-17-2) (page [18\)](#page-17-2) shows the second iteration.

It is easy to see that splitting the file into file domains and distributing these file domains among the clients leads to non-contiguous accesses in each iteration of the [I/O](#page-116-1) phase. For example, figures [2.3b](#page-17-1) (page [18\)](#page-17-1) and [2.3c](#page-17-2) (page [18\)](#page-17-2) show that the Two-Phase protocol causes the data blocks 1, 3 and 5 to be accessed in iteration 1, while the data blocks 2, 4 and 6 are accessed in iteration 2. This may have a negative effect on performance, depending on the size of the accesses used internally by the Two-Phase protocol. This problem should be negligible with the Two-Phase protocol's default settings. However, due to striping schemes commonly used in parallel cluster file systems this optimization may be ineffective on these file systems, because accesses must be split up according to the stripe size anyway.

## <span id="page-18-0"></span>**2.3 Storage Devices**

All of these optimizations were developed with [HDDs](#page-116-4) as storage devices in mind. Therefore, they may or may not be suited for [SSDs](#page-117-2). The following tries to evaluate their usefulness for both [HDDs](#page-116-4) and [SSDs](#page-117-2).

### <span id="page-18-1"></span>**2.3.1 Hard Disk Drives**

Due to the relatively slow random access times of [HDDs](#page-116-4), it may be highly beneficial to merge multiple non-contiguous operations into contiguous ones, even if this involves reading or writing more data than needed. This is due to the fact that the rotating platters are better suited for accessing large contiguous regions of data. Obviously, this applies to both read and write operations.

However, clients can only use the file's logical layout to perform optimizations and logically contiguous accesses are not necessarily contiguous anymore when they are mapped to the file's physical layout on disk. This is due to the fact that most file systems do not — and usually can not — store files as one contiguous region on disk, because free space fragments over time. This may even cause performance degradation, depending on the file system's fragmentation rate. Server-side optimizations do not suffer from this problem, because they have access to the file's physical layout and can use it to make more appropriate decisions.

#### <span id="page-19-0"></span>**2.3.2 Solid State Drives**

[SSDs](#page-117-2) do not suffer from the problem of slow random accesses. Therefore, it is usually not needed to combine non-contiguous operations when this involves reading or writing additional data.

However, it can be beneficial to combine several operations to use the block sizes used internally by the [SSD.](#page-117-2) For example, performing write operations with the erase block size may save unnecessary read-modify-write overhead. Again, this is more useful when performed on the server, because the file's logical layout usually differs from its physical one and the erase block size may not be available on the clients.

## **Summary**

Many [I/O](#page-116-1) optimizations for distributed systems exist. Client-side optimizations do preprocessing to minimize the amount of work the file servers have to do. Serverside optimizations use the servers' internal knowledge to improve performance. Data sieving can be used to turn non-contiguous [I/O](#page-116-1) into contiguous [I/O,](#page-116-1) while collective [I/O](#page-116-1) provides the file servers with additional information to enable better optimizations. The Two-Phase protocol is an example of a client-side optimization implemented in ROMIO. [I/O](#page-116-1) optimizations should work with both [HDDs](#page-116-4) and [SSDs](#page-117-2).

# <span id="page-20-0"></span>**Chapter 3**

## **Software Environment**

In this chapter an overview of [PIOsimHD](#page-116-8) is given and its components are explained in detail. Its internal architecture is explained with a simple example of a simulated cluster environment. The features of the currently implemented cache layers are explained, because they play an important role in this thesis. Additionally, third-party software used by [PIOsimHD](#page-116-8) is presented briefly.

## <span id="page-20-1"></span>**3.1 PIOsimHD**

[PIOsimHD](#page-116-8) is a framework containing all components necessary to simulate, trace and visualize applications. The PIOsimHD-Model and PIOsimHD-Simulator parts allow simulating arbitrary network topologies, servers and client applications. Simple applications can be implemented directly within PIOsimHD-Simulator for fast testing of new algorithms. PIOsimHD also contains modified versions of MPICH2 and [PVFS](#page-117-6) $^1$  $^1$  to allow tracing of real MPI programs, which can then also be simulated. HDSunshot can display the resulting traces, allowing a detailed visual performance analysis.

Some of its stated goals are:

- Fast and easy prototyping of new algorithms for [I/O](#page-116-1) and [MPI](#page-116-12)[2](#page-20-3) optimization
- Reveal bottlenecks in applications
- Allow better understanding of observed system behavior
- Test applications on different cluster hardware for example, on grids
- Simple yet extensible models which can be selected on demand
- Explicit abstraction from real world complexity
- Usage of common tools to analyze simulation results

<span id="page-20-2"></span><sup>&</sup>lt;sup>1</sup> Parallel Virtual File System

<span id="page-20-3"></span><sup>2</sup>Message Passing Interface

#### <span id="page-21-0"></span>**3.1.1 Architecture**

PIOsimHD-Model and PIOsimHD-Simulator provide the possibility to define arbitrary models. For example, they can be used to model and simulate computer clusters, networks between computers and applications running on them.

Figure  $3.1<sup>3</sup>$  $3.1<sup>3</sup>$  shows the components supported by PIOsimHD-Model and PIOsimHD-Simulator in the form of an exemplary cluster model. The model contains two switches, connecting a total of three nodes. Each switch contains ports which establish connections with the [NIC](#page-116-13)<sup>[4](#page-21-3)</sup> within the nodes. Additionally, switch  $#1$  is connected to switch #2 via an upstream port. Node #1 acts as a server, which in turn contains a cache layer and an [I/O](#page-116-1) subsystem. The cache layer can be used to simulate caches of the operating system and storage devices. The [I/O](#page-116-1) subsystem on the other hand can be used to simulate the actual storage devices. For example, the [I/O](#page-116-1) subsystem could be a [HDD](#page-116-4) or a [SSD.](#page-117-2) Nodes #2 and #3 act as clients, which can host multiple client processes. For example, two client processes of the Jacobi application run on nodes #2 and #3. These two client processes are part of

<span id="page-21-1"></span>

Figure 3.1: Simulator Components

<span id="page-21-2"></span> $3$ The figure is taken from [\[Kun\]](#page-98-7) and modified with the author's permission.

<span id="page-21-3"></span><sup>4</sup>Network Interface Card

the same [MPI](#page-116-12) application and can easily communicate with each other. All clients processes can use node #1's server to store and retrieve data.

The model also allows more complex setups. For example, nodes can be configured to host both client processes and servers. In addition to that, each component can be configured individually. For example, some servers can be configured to use hard disk drives without caches while other servers use solid state drives with elaborate caching mechanisms. Obviously, the same is also true for nodes with client processes.

## <span id="page-22-0"></span>**3.2 PIOsimHD-Model**

[PIOsimHD-](#page-116-8)Model allows modelling of arbitrary components involved in the simulation. For example, [PIOsimHD-](#page-116-8)Model contains models for hardware components — like [HDDs](#page-116-4) and [NICs](#page-116-13) — and software components — like individual [MPI](#page-116-12) commands.

Each command and component model can have multiple implementations, which are actually contained in [PIOsimHD-](#page-116-8)Simulator. For example, an [MPI](#page-116-12) command can be implemented in a non-optimized and in an optimized way. This allows users to easily measure the benefits of certain optimizations.

## <span id="page-22-1"></span>**3.3 PIOsimHD-Simulator**

[PIOsimHD-](#page-116-8)Simulator is the framework's core component, which performs the actual simulation. It also contains implementations for the models defined in [PIOsimHD-](#page-116-8)Model.

The following three important aspects of [PIOsimHD-](#page-116-8)Simulator are elaborated: The cache layers, how network packets are transported within the network and the internal processing of [I/O](#page-116-1) requests. Most of this information can also be found in [\[Kun\]](#page-98-7).

### <span id="page-22-2"></span>**3.3.1 Network Packet Transport**

The network packet transport uses the following design criteria:

- **Efficiency:** It is mandatory that network components can be fully utilized if there are packets to transport.
- **Realism:** The data flow must be somehow realistic. If there is a bottleneck it is not acceptable that all packets queue on this component. In reality,

switched networks use buffers to allow limited queueing of packets. Retransmits occur on packet loss and timeouts force retransmission of lost packets.

- **Simplicity:** Observed behavior should be understandable to some extent.
- **Performance:** The implementation should not heavily impact simulation performance, because usually a large number of events are simulated.

The current design models flow control as follows:

- A network component transmits a number of packets to another one until enough data is sent to compensate the connection latency. Then the component stalls submission and queues further packets to this particular destination.
- Processing of a packet sends a receipt confirmation to the sender and allows transferring packets worth the connection latency of this packet. Therefore, processing of a packet might wake up a cascade of blocked components upstream.
- Once a component finishes processing a packet it is ready to accept new packets. Pending packets should be delivered immediately to avoid starvation of downstream components.
- Each component queues packets using per-target queues, that is, packets for different destinations are managed in different queues. Whenever one destination is stalled another destination might still be ready to receive packets. For example, assuming a complex network topology with network components interconnected at varying speeds, a slow target might get stalled in the intermediate switches. However, other network components with fast interconnects might still be able to receive data. Therefore, the switches must relay their packets to these faster network components.
- [NICs](#page-116-13) must be allowed to block receiving further packets. For example, this is necessary when dealing with [I/O](#page-116-1) operations. Writing data to a file system involves transferring data to servers. If the servers' [I/O](#page-116-1) subsystems are slower than their [NICs](#page-116-13), data could queue up infinitely. Since this is not realistic the [NICs](#page-116-13) must block transmission when there is not enough [RAM](#page-117-5) available.
- Packet size is limited by a so-called network granularity<sup>[5](#page-23-0)</sup> to ensure interleaved processing of packets. Messages are partitioned into the network granularity on the fly. There are two aspects concerning the network granularity's size.

<span id="page-23-0"></span><sup>5</sup>The default network granularity is 100 KiB.

Firstly, smaller packets result in more events in the simulation and consequently increase simulation time, but allow better interleaving of packets from multiple sources on one network component. Bigger packets decrease the simulation effort, but reduce interleaving.

#### <span id="page-24-0"></span>**3.3.2 I/O Request Processing**

From the clients' point of view an [I/O](#page-116-1) request is issued with a list of offset-size pairs — this is called ListIO internally. These lists of non-contiguous operations can be generated automatically by file views.

Each [I/O](#page-116-1) operation issued by a client consists of several discrete steps, which are processed sequentially. In addition to the client an [I/O](#page-116-1) operation may involve multiple servers, including their cache layers, [I/O](#page-116-1) subsystems, [NICs](#page-116-13) and the network. Data flow through the network is detailed above and consequently spared here. The actual processing of an [I/O](#page-116-1) request depends on the request's type, that is, whether a read or write operation is requested.

#### **Read Request**

- 1. The client submits a read request to the [NIC.](#page-116-13)
- 2. The network transmits requests to all servers involved in the [I/O](#page-116-1) operation.
- 3. Each server accepts the request and announces the whole request to its cache layer.
- 4. The cache layer selects an [I/O](#page-116-1) operation to perform next and forwards it to the [I/O](#page-116-1) subsystem. It is important to note that the size of a single contiguous [I/O](#page-116-1) operation is limited by the so-called [I/O](#page-116-1) granularity $^6$  $^6$ .
- 5. Once the [I/O](#page-116-1) subsystem finishes an operation the cache layer is notified and can then issue new operations. Data received from the cache layer is immediately added to the network flow, which might result in new network packets.
- 6. The client's read operation is implicitly finished once all data is received.

#### **Write Request**

- 1. The client submits a write request to the [NIC.](#page-116-13)
- 2. The network transmits requests to all servers involved in the [I/O](#page-116-1) operation.

<span id="page-24-1"></span><sup>6</sup>The default [I/O](#page-116-1) granularity is 10MiB.

- 3. Each server accepts the request and responds with an acknowledgement.
- 4. The client waits for all acknowledgements and starts sending the actual [I/O](#page-116-1) data to all servers as soon as they are received.
- 5. Once the data is received by the server it notifies its cache layer about the request immediately. The cache layer puts the received data into the server's [I/O](#page-116-1) cache and can then submit it to the [I/O](#page-116-1) subsystem. If there is not enough free cache memory remaining the server will block further receives of data. Once the [I/O](#page-116-1) subsystem finishes the job the cache is freed, allowing further requests to get queued. The cache layer can also choose which write operation to perform next, analogous to the read case.
- 6. Once a request is completed the server sends a write completion message to the client.
- 7. The client's write operation is finished once all write completion messages are received.

#### <span id="page-25-0"></span>**3.3.3 Cache Layers**

The following cache layers are currently implemented in [PIOsimHD-](#page-116-8)Simulator.

It is important to note that even though the [I/O](#page-116-1) granularity defaults to 10[MiB,](#page-116-7) [I/O](#page-116-1) operations sent across the network are split up into smaller operations to accommodate the network granularity, which defaults to 100 [KiB.](#page-116-5)

#### **NoCache**

The NoCache cache layer does no caching at all. All incoming [I/O](#page-116-1) operations are forwarded directly to the [I/O](#page-116-1) subsystem. Among other things, this means that write operations take as long as the [I/O](#page-116-1) subsystem needs to actually write out the data to the underlying storage devices. Additionally, read operations are preferred by the NoCache cache layer — and, in fact, by all other cache layers — when possible.

Since the NoCache cache layer does not combine [I/O](#page-116-1) operations the maximum operation size is 100 [KiB](#page-116-5) due to the network granularity.

#### **SimpleWriteBehindCache**

The SimpleWriteBehindCache cache layer does rudimentary caching. Incoming write operations are queued in the server's [RAM](#page-117-5) to be written out in a background thread. This technique is called write-behind. As opposed to the NoCache cache layer this means that write operations do not block the calling client and return

immediately once the data is received by the servers. The actual operation then finishes in the background.

Since the SimpleWriteBehindCache cache layer does not combine [I/O](#page-116-1) operations the maximum operation size is 100 [KiB](#page-116-5) due to the network granularity.

#### **AggregationCache**

The AggregationCache cache layer performs simple write optimizations as well as write-behind. It tries to combine the next [I/O](#page-116-1) operation with as many other queued [I/O](#page-116-1) operations as possible. This is done by performing forward and backward combination by respectively appending and prepending other [I/O](#page-116-1) operations to the current [I/O](#page-116-1) operation. Two [I/O](#page-116-1) operations can be combined when they cover a contiguous region when merged — that is, offset<sub>1</sub> + size<sub>1</sub> = offset<sub>2</sub> or vice versa. However, this can — and should — be changed to also combine overlapping accesses in the future. This minor detail is irrelevant for the benchmarks used in this thesis, because they do not perform any overlapping accesses.<sup>[7](#page-26-1)</sup>

Since the AggregationCache cache layer combines [I/O](#page-116-1) operations the operation size is only limited by the [I/O](#page-116-1) granularity, that is, the maximum operation size is 10[MiB.](#page-116-7)

## <span id="page-26-0"></span>**3.4 HDSunshot**

Figure [3.2](#page-27-0) (page [28\)](#page-27-0) shows HDSunshot, PIOsimHD's trace visualization tool. It is based on Jumpshot $^8$  $^8$ , but adapted to support the HDTraceFormat and featuring many  $UI<sup>9</sup>$  $UI<sup>9</sup>$  $UI<sup>9</sup>$  enhancements. It supports post-mortem performance analysis of traced applications.

HDSunshot consists of the main timeline window and the legend on the left side. The legend allows the user to specify exactly which traced operations should be displayed in the timeline window. The timeline window displays a trace hierarchy on the left side. Applications can be found on the first level, nodes on the second level, ranks on the third level and threads on the fourth level. To the right of the trace hierarchy, the lower part contains a timeline with the traced operations themselves above it. Each traced operation is drawn in a different color to allow for easy differentiation. The bar at the top — below the icons — contains detailed information about the currently selected operation. For example, for read and write operations the amount of accessed data is displayed. Additionally, each operation's duration is displayed there.

<span id="page-26-1"></span> $7$ The random benchmarks can perform overlapping accesses, but this is very unlikely.

<span id="page-26-3"></span><span id="page-26-2"></span><sup>8</sup>See <http://www.mcs.anl.gov/research/projects/perfvis/software/viewers/index.htm>. <sup>9</sup>User Interface

<span id="page-27-0"></span>

#### CHAPTER 3. SOFTWARE ENVIRONMENT

The traces can be generated either by real [MPI](#page-116-12) applications or by simulated ones. This is useful for comparing simulated applications with their real counterparts, which allows easy verification of the simulated results.

## <span id="page-28-0"></span>**3.5 PVFS**

 $PVFS<sup>10</sup>$  $PVFS<sup>10</sup>$  $PVFS<sup>10</sup>$  is a parallel cluster file system, which supports multiple data and metadata servers. To distribute the load, file data is striped across all available data servers with a default stripe size of 64 KiB. The first data server is chosen randomly, then a round-robin scheme is used. However, file metadata is not distributed. The metadata for any file is managed by exactly one metadata server. Which metadata server is responsible is determined by a hashing algorithm.

PVFS offers several features that make it attractive for research:

- Free software, released under the  $GPL^{11}/LGPL^{12}$  $GPL^{11}/LGPL^{12}$  $GPL^{11}/LGPL^{12}$  $GPL^{11}/LGPL^{12}$  $GPL^{11}/LGPL^{12}$  $GPL^{11}/LGPL^{12}$  $GPL^{11}/LGPL^{12}$
- The code base has a manageable size of about  $250\,000\,$  [SLOC](#page-117-8)<sup>[13](#page-28-5)</sup>
- Supports MPICH2
- Easy to install and configure

## <span id="page-28-1"></span>**3.6 MPICH2**

 $MPICH2<sup>14</sup>$  $MPICH2<sup>14</sup>$  $MPICH2<sup>14</sup>$  is a high-performance and widely portable implementation of the [MPI](#page-116-12) standard. It also includes ROMIO to support the [MPI-IO](#page-116-9) part of the [MPI-](#page-116-12)2 standard. ROMIO supports various [I/O](#page-116-1) optimizations, such as data sieving and the Two-Phase protocol.

## **Summary**

The [PIOsimHD](#page-116-8) framework contains components to simulate, trace and visualize applications. [PIOsimHD-](#page-116-8)Model and [PIOsimHD-](#page-116-8)Simulator allow simulating arbitrary network topologies, servers and client applications. [PIOsimHD-](#page-116-8)Simulator contains several different cache layers which employ varying degrees of caching. MPICH2 and [PVFS](#page-117-6) can be used to trace real [MPI](#page-116-12) applications including [MPI-IO.](#page-116-9) HDSunshot is used to visualize the resulting traces.

<span id="page-28-2"></span><sup>10</sup>PVFS is available at <http://www.pvfs.org/>.

<span id="page-28-3"></span><sup>11</sup>GNU General Public License

<span id="page-28-4"></span><sup>12</sup>GNU Lesser General Public License

<span id="page-28-5"></span><sup>&</sup>lt;sup>13</sup>Source Lines of Code

<span id="page-28-6"></span><sup>14</sup>MPICH2 is available at <http://www.mcs.anl.gov/mpi/mpich/>.

# <span id="page-29-0"></span>**Chapter 4**

# **Design**

In this chapter the design of the optimizations implemented in this thesis — that is, Server-Directed [I/O](#page-116-1) and the Two-Phase protocol — is elaborated. Additionally, an alternative version of the Two-Phase protocol called Interleaved Two-Phase is presented.

## <span id="page-29-1"></span>**4.1 Aggregation Cache**

The AggregationCache cache layer currently only performs very basic optimizations for write operations. When the next operation is processed, all pending operations are examined to find out whether a pending operation can be appended or prepended to the next operation. Apart from this, the AggregationCache always processes operations in the order in which they are received from the clients.

These optimizations are extended to also work for read operations. This is done by simply performing the same examination and merging of operations in the read case.

## <span id="page-29-2"></span>**4.2 Server-Directed I/O**

Libraries for distributed [I/O](#page-116-1) such as ROMIO often use client-side optimizations — such as the Two-Phase protocol — to improve the overall [I/O](#page-116-1) performance. In contrast to this, Server-Directed [I/O](#page-116-1) describes optimization techniques employed on the file server itself. One of the main goals of this thesis is to determine whether server-side optimizations are sufficient to provide acceptable [I/O](#page-116-1) performance. These server-side optimizations are implemented as the Server-Directed [I/O](#page-116-1) cache layer in PIOsimHD.

As mentioned in section [2.3](#page-18-0) (page [19\)](#page-18-0), the main problem with client-side optimizations is the fact that these optimizations usually do not have enough information to efficiently optimize operations. When using server-side optimizations like Server-Directed [I/O](#page-116-1) the servers themselves decide which operations they should perform

next and in which order they should be performed. Since the servers obviously have all information about the underlying storage devices more intelligent decisions can be made.

The main point of Server-Directed [I/O](#page-116-1) is the fact that the servers determine when and how to perform [I/O](#page-116-1) operations, as opposed to the usual approach of servers being simple data stores and the clients handling all [I/O](#page-116-1) decisions. The advantage of this approach is the fact that the servers have access to all pending [I/O](#page-116-1) requests and can use this knowledge, as opposed to the clients which only have access to their current [I/O](#page-116-1) requests. Collective [I/O](#page-116-1) can be used to alleviate this problem to some extent by granting the clients access to the [I/O](#page-116-1) requests of all participating clients. However, this is also different from other server-side optimizations like the existing AggregationCache, because they simply process requests in  $FIFO<sup>1</sup> order$  $FIFO<sup>1</sup> order$  $FIFO<sup>1</sup> order$ and do not perform any reordering.

The actual optimizations are presented below with examples of the read and write optimizations.

### <span id="page-30-0"></span>**4.2.1 Read**

A large number of clients performing many small read operations can easily saturate the [I/O](#page-116-1) system. The optimizations implemented in the Server-Directed [I/O](#page-116-1) cache layer try to satisfy as many clients requests with as little actual [I/O](#page-116-1) requests as possible and to determine the best way of handling these [I/O](#page-116-1) requests.

The main method to do this is to merge multiple client requests into larger contiguous read operations. To be able to perform the merge operations as efficiently as possible all client requests are stored in per-file queues and sorted by the request's offset within the file. The Server-Directed [I/O](#page-116-1) cache layer has access to all pending read requests and can change their order to improve performance.

Figure [4.1](#page-31-1) (page [32\)](#page-31-1) provides an example of the read optimizations performing three client requests as one larger read operation. For example, these three requests could be part of one collective non-contiguous [I/O](#page-116-1) operation or originate from separate clients. The following steps can be seen:

- (a) A new read request (#1) is inserted at offset 128 with size 64. The request is inserted at position 0, because the queue is empty.
- (b) A new read request (#2) is inserted at offset 64 with size 64. The request is inserted at position 0, because its offset is smaller than the offset of request #1.

<span id="page-30-1"></span><sup>1</sup>First In, First Out

- (c) A new read request (#3) is inserted at offset 128 with size 128. The request is inserted at position 2, because its offset is not smaller than the offset of request #2.
- (d) The read requests  $#1, #2$  and  $#3$  are merged together. All three requests can be satisfied by reading the contiguous file region at offset 64 with size 192.

The actual implementation can also merge read requests which are separated by holes of a given size. For simplicity, this case is omitted in this example.

Since there is only one read requests remaining, it is clear which one needs to be processed next.

<span id="page-31-1"></span>

Figure 4.1: Server-Directed I/O — Read Optimizations

#### <span id="page-31-0"></span>**4.2.2 Write**

The write optimizations implemented in the Server-Directed [I/O](#page-116-1) cache layer also try to satisfy as many clients requests with as little actual [I/O](#page-116-1) requests as possible and to determine the best way of handling these [I/O](#page-116-1) requests.

The main method to do this is to discard unnecessary write requests early and merge multiple client requests into larger contiguous write operations. The client requests are stored in the same way as in the read case to allow efficient merge operations. The Server-Directed [I/O](#page-116-1) cache layer can also change the order of pending write requests and delay the actual writing of the data to improve performance.

Figure [4.2](#page-33-0) (page [34\)](#page-33-0) provides an example of the write optimizations performing six client requests as two larger write operations. For example, these six requests could be part of one collective non-contiguous [I/O](#page-116-1) operation or originate from separate clients. The following steps can be seen:

- (a) A new write request (#1) is inserted at offset 128 with size 64. The request is inserted at position 0, because the queue is empty.
- (b) A new write request (#2) is inserted at offset 64 with size 64. The request is inserted at position 0, because its offset is smaller than the offset of request #1.
- (c) A new write request (#3) is inserted at offset 128 with size 128. The request is inserted at position 2, because its offset is not smaller than the offset of request #2.
- (d) The write request #3 overwrites the write request #1. The request would overwrite all the data, therefore the old request can be discarded.
- (e) A new write request (#4) is inserted at offset 256 with size 64. The request is inserted at position 2, because its offset is not smaller than the offset of request #3.
- (f) A new write request (#5) is inserted at offset 384 with size 64. The request is inserted at position 2, because its offset is not smaller than the offset of request #4.
- (g) A new write request (#6) is inserted at offset 448 with size 64. The request is inserted at position 2, because its offset is not smaller than the offset of request #5.
- (h) The write requests #2, #3 and #4 are merged together. The write requests #5 and #6 are merged together. All remaining five requests can be satisfied by writing two contiguous file regions at offset 64 with size 256 and offset 384 with size 128.

The situation presented in step (d) is a special case of a new write request overwriting data of an older write request. In the general case, the old request needs to be truncated or split up if the new request only overwrites part of the old request's data.

Since there are now two write requests remaining, the server can decide which one to process next. Selecting the best request to process can depend on a number of factors, including the offset and size of the request.

<span id="page-33-0"></span>

Figure 4.2: Server-Directed I/O — Write Optimizations

For a more detailed explanation and more information on additional optimizations, see section [5.2](#page-42-0) (page [43\)](#page-42-0).

### <span id="page-34-0"></span>**4.3 Collective I/O**

Collective [I/O](#page-116-1) provides the basis for many client-side optimizations. One of these optimizations is the Two-Phase protocol used by ROMIO.

The simulator does not provide collective read and write operations, therefore they have to be implemented first. This is needed to be able to compare client-side optimizations — such as the Two-Phase protocol — with server-side optimizations like Server-Directed [I/O.](#page-116-1)

#### <span id="page-34-1"></span>**4.3.1 Interleaved Two-Phase**

The internal workings of the Two-Phase protocol are detailed in subsection [2.2.3](#page-16-0) (page [17\)](#page-16-0). It is easy to see that splitting the file into file domains and distributing these file domains among the clients leads to non-contiguous accesses in each iteration of the [I/O](#page-116-1) phase. This can cause performance degradation, because these access patterns can not be optimized easily by the underlying cache layer.

Figure [4.3a](#page-34-2) and [4.3b](#page-34-3) show the [I/O](#page-116-1) phase of the Interleaved Two-Phase protocol. As can be seen, the clients access a contiguous region of data in each iteration. This grants the [I/O](#page-116-1) subsystem more room for optimizations.

<span id="page-34-2"></span>

<span id="page-34-3"></span>Figure 4.3: Interleaved Two-Phase

This modification works exactly like the original Two-Phase protocol, except that accesses are performed in a contiguous fashion to minimize seek operations. This is achieved by not distributing file domains among the clients, but rather dividing the file into chunks of the size of the Two-Phase buffer. The first chunk is then accessed by the first client, the second chunk by the second client, and so on. Consequently, each client accesses one such chunk per iteration. This process is then repeated as necessary until all data is read or written. Since the clients' accesses are interleaved this modification is called the Interleaved Two-Phase protocol.

### **Summary**

Server-Directed [I/O](#page-116-1) provides optimizations for both read and write operations. It tries to aggregate as many operations as possible to decrease the load on the [I/O](#page-116-1) subsystem and improve overall performance. Additionally, it has a full overview of all pending operations and can use this information to select the next operation based on several factors to maximize performance. The Interleaved Two-Phase protocol is a modification of ROMIO's Two-Phase protocol, which only accesses contiguous file regions.
# **Chapter 5**

# **Implementation**

In this chapter an overview of the internal structure of [PIOsimHD-](#page-116-0)Model and [PIOsimHD-](#page-116-0)Simulator is given. This includes the implementation of some example components and commands. Additionally, the actual implementations of the optimizations already presented in chapter [4](#page-29-0) (page [30\)](#page-29-0) — that is, the Server-Directed [I/O](#page-116-1) component and the Two-Phase commands — are explained in detail.

# **5.1 Internals**

[PIOsimHD](#page-116-0) supports arbitrary component and command models and implementations. Example for both are given to explain the workflow needed to extend [PIOsimHD](#page-116-0) with new components and commands, which is needed to integrate Server-Directed [I/O](#page-116-1) and collective [I/O](#page-116-1) into [PIOsimHD.](#page-116-0)

## <span id="page-36-1"></span>**5.1.1 Component Implementations**

The simulator supports implementation of arbitrary components for simulating hardware and software. For example, it is possible to model abstract concepts like servers and physical components like cache layers within the servers.

The following server component model possesses a size attribute. For example, this size could represent the size of the server's main memory or the size of a cache.

Listing [5.1](#page-36-0) shows the Example server component model. This model should be put into the file PIOsimHD-Model/src/de/hd/pvs/piosim/model/components/Example/Example.java. The component model is used to store attributes for this specific component and provides the basis for derived server component models for this server component.

Listing 5.1: Server Component Model Example

```
1 abstract public class Example
```

```
2 extends BasicComponent<Server> {
```

```
3 @Attribute
4 @NotNegativeOrZero
5 long size = 0;
6
7 final public void setSize(long size) {
8 this.size = size:
9 }
10
11 final public int getSize() {
12 return size;
13 }
14
15 @Override
16 final public String getComponentType() {
17 return Example.class.getSimpleName();
18 }
19 |
```
Listing [5.2](#page-37-0) shows the SimpleExample server component model. This model should be put into the file PIOsimHD-Model/src/de/hd/pvs/piosim/model/components/- Example/SimpleExample.java. This server component model simply inherits all attributes of the server component model shown in listing [5.1](#page-36-0) (page [37\)](#page-36-0).

Listing 5.2: Simple Server Component Model Example

```
1 public class SimpleExample
2 extends Example {
3 | }
```
Listing [5.3](#page-37-1) shows the interface used for this server component. This interface should be put into the file PIOsimHD-Simulator/src/de/hd/pvs/piosim/simulator/components/Example/IGExample.java. Interfaces can be used to force all server component implementations to provide a common interface. This makes it possible to provide multiple models for a single component.

Listing 5.3: Server Component Interface Example

```
1 public interface IGExample<Type extends SPassiveComponent>
2 extends IGComponent<Type>
3 \mid \{4 public void example();
5 |}
```
Listing [5.4](#page-38-0) (page [39\)](#page-38-0) shows the SimpleExample server component implementation. This implementation should be put into the file PIOsimHD-Simulator/src/de/hd/ pvs/piosim/simulator/components/Example/GSimpleExample.java. This provides the server component implementation for the server component model shown in listing [5.2.](#page-37-0)

Listing 5.4: Simple Server Component Implementation Example

```
1 public class GSimpleExample
2 extends SPassiveComponent<SimpleExample>
3 implements IGExample<SPassiveComponent<SimpleExample>>
\overline{4}5 @Override
6 public void example() {
7 ...
8 }
9 \vert \}
```
The simulator only uses component implementations specified in the file Model-ToSimulatorMapper.txt. This file can be used to specify multiple component implementations for a single component. For more details on this, see subsection [5.1.2](#page-39-0) (page [40\)](#page-39-0).

Listing [5.5](#page-38-1) shows the file ModelToSimulationMapper.txt. Components themselves are prefixed with +, followed by their respective component implementations. In this case the Example component is implemented by GSimpleExample.

Listing 5.5: Component Mapping

```
1 \# This file describes the existing model component of a given type i
      \hookrightarrow .e. "Node" the available Model implementations and mapping to
      \hookrightarrow the simulation implementation.
2 +ClientProcess
3 |de.hd.pvs.piosim.model.components.ClientProcess.ClientProcess = de.
      \hookrightarrow hd.pvs.piosim.simulator.components.ClientProcess.
      \hookrightarrow GClientProcess
4
5 ...
6
7 +Example
8 \vertde.hd.pvs.piosim.model.components.Example.SimpleExample = de.hd.pvs.
      \hookrightarrow piosim.simulator.components.Example.GSimpleExample
```
### <span id="page-39-0"></span>**5.1.2 Command Implementations**

The simulator supports implementation of arbitrary commands for simulating applications. For example, it is possible to implement simple commands like the  $POSIX<sup>1</sup>$  $POSIX<sup>1</sup>$  $POSIX<sup>1</sup>$  $POSIX<sup>1</sup>$  read() and write() functions, and more complex commands like the [MPI-IO](#page-116-2) functions.

Listing [5.6](#page-39-2) shows the Example command model. This model should be put into the file PIOsimHD-Model/src/de/hd/pvs/piosim/model/program/commands/Example. java. The command model provides a basis for the command implementations, that is, all command implementations get passed an instance of the command model. Models can also have so-called attributes. These attributes can be annotated, which allows them to be automatically populated with values from traces and checked for validity. For example, the Example command model has one attribute called communicator. The NotNull annotation specifies that this attribute must be set, while the Attribute annotation specifies the attribute's name to be cid in traces.



```
1 public class Example
2 extends Command {
3 @NotNull
4 \alphaAttribute(xmlName="cid")
5 protected Communicator communicator;
6
7 public Example() {
8 ...
9 }
10
11 public helloWorld() {
12 ...
13 }
14 |}
```
Listing [5.7](#page-40-0) (page [41\)](#page-40-0) shows the SimpleExample command implementation. This implementation should be put into the file PIOsimHD-Simulator/src/de/hd/pvs/ piosim/simulator/program/Example/SimpleExample.java. The simulator calls the command's process() method, which can be separated into so-called steps. The first step is always CommandProcessing.STEP\_START, while CommandProcessing.STEP\_COMPLETED signifies that the command is finished. Additional steps can be defined at will, for more details see listing [5.8](#page-40-1) (page [41\)](#page-40-1).

<span id="page-39-1"></span><sup>1</sup>Portable Operating System Interface (for Unix)

```
1 public class SimpleExample
2 extends CommandImplementation<Example> {
3 @Override
4 public void process(Example cmd,
5 CommandProcessing OUTresults,
6 GClientProcess client,
7 int step,
8 NetworkJobs compNetJobs) {
9 switch (step) {
10 case (CommandProcessing.STEP_START): {
11 | // Do some work ...
12 cmd.helloWorld();
13 ...
14
15 | OUTresults.setNextStep(CommandProcessing.STEP_COMPLETED);
16
17 return;
18 }
19 }
20
21 return;
22 \mid \}23 |}
```
Listing 5.7: Simple Command Example

The SimpleExample implementation starts with CommandProcessing.STEP\_START, calls the helloWorld() method of the command model cmd and then sets the next step to CommandProcessing.STEP\_COMPLETED with OUTresults.setNextStep(), ending the command's processing.

Listing [5.8](#page-40-1) shows the SophisticatedExample command implementation. This implementation should be put into the file PIOsimHD-Simulator/src/de/hd/pvs/ piosim/simulator/program/Example/SophisticatedExample.java.

Listing 5.8: Sophisticated Command Example

```
1 public class SophisticatedExample
2 extends CommandImplementation<Example> {
3 @Override
4 public void process(Example cmd,
5 | CommandProcessing OUTresults,
6 GClientProcess client,
7 int step,
```
CHAPTER 5. IMPLEMENTATION

```
8 NetworkJobs compNetJobs) {
9
10 final int ANOTHER_STEP = 2;
11
12 switch (step) {
13 case (CommandProcessing.STEP_START): {
14 int rank = client.getModelComponent().getRank();
15
16 // Do some more work ...
17 ...
18
19 OUTresults.setNextStep(ANOTHER_STEP);
20
21 return;
22 }
23 case (ANOTHER_STEP): {
24 // Do even more work ...
25 ...
26
27 | // Call the SimpleExample implementation
28 OUTresults.invokeChildOperation(cmd, CommandProcessing.
           \hookrightarrow STEP_START, de.hd.pvs.piosim.simulator.program.Example.
           ,→ SimpleExample.class);
29
30 | OUTresults.setNextStep(CommandProcessing.STEP_COMPLETED);
31
32 return;
33 }
34 }
35
36 return;
37 \mid \}38 |
```
The SophisticatedExample implementation starts with CommandProcessing. STEP\_START, performs some additional work and then sets the next step to AN-OTHER\_STEP, which is a step specific to the SophisticatedExample command implementation. In the ANOTHER\_STEP step, the implementation then uses OUTresults.invokeChildOperation() to start a nested operation of the SimpleExample command implementation. This in turn executes the SimpleExample's process() method with CommandProcessing.STEP\_START and returns when the processing

would normally end — that is, when CommandProcessing.STEP\_COMPLETED is set. Afterwards, it sets the next step to CommandProcessing.STEP\_COMPLETED, ending the command's processing.

The simulator only uses command implementations specified in the file Command-ToSimulationMapper.txt. This file can be used to specify multiple command implementations for a single command. For example, the SimpleExample and SophisticatedExample command implementations can be used to provide two different command implementations for the Example command.

Listing [5.9](#page-42-0) shows the file CommandToSimulationMapper.txt. Commands themselves are prefixed with +, followed by their respective command implementations. In this case the Example command is implemented by Global.NoOperation, Example.SimpleExample and Example.SophisticatedExample. The last specified command implementation is used by default, but this can be changed at will.

Listing 5.9: Command Mapping

```
1 \# define the command groups and the contained implementations and
       \hookrightarrow the simulator implementations
 2 \mid # each row is either a set of commands which are implemented or the
       \hookrightarrow actual set of implementation classes for these commands.
3
4 \# All undefined operations are mapped to NoOperation:
 5 +NoOperation
6 de.hd.pvs.piosim.simulator.program.Global.NoOperation
 7
8 \mid # Automatically generated within the simulator.
9 +Compute
10 de.hd.pvs.piosim.simulator.program.Global.NoOperation
11 de.hd.pvs.piosim.simulator.program.Compute.Time
12
13 ...
14
15 +de.hd.pvs.piosim.model.program.commands.Example
16 de.hd.pvs.piosim.simulator.program.Global.NoOperation
17 de.hd.pvs.piosim.simulator.program.Example.SimpleExample
18 de.hd.pvs.piosim.simulator.program.Example.SophisticatedExample
```
## **5.2 Server-Directed I/O**

As described in subsection [5.1.1](#page-36-1) (page [37\)](#page-36-1), Server-Directed [I/O](#page-116-1) is implemented as a new server component, namely a new cache layer called ServerDirecte-

dIO. To integrate the Server-Directed [I/O](#page-116-1) cache layer into the existing framework a new model and implementation have to be added. The model is put into the file PIOsimHD-Model/src/de/hd/pvs/piosim/model/components/- ServerCacheLayer/ServerDirectedIO.java and is omitted here, because it is a trivial extension of the existing AggregationCache model. This implementation is put into the file PIOsimHD-Simulator/src/de/hd/pvs/piosim/simulator/components/ServerCacheLayer/GServerDirectedIO.java and is now presented in detail. Lastly, the new implementation needs to be added to the file ModelToSimulationMapper.txt, allowing it to be used as a cache layer.

Listing [5.10](#page-43-0) shows the Server-Directed [I/O](#page-116-1) class. It is based on the aggregation cache layer, which is basically a simpler version of the Server-Directed [I/O](#page-116-1) cache layer. The aggregation cache layer also tries to combine multiple operations into larger ones, but is less efficient and can not cope as well with multiple files. It also does not perform any optimizations regarding the order in which pending [I/O](#page-116-1) operations are performed.

Listing 5.10: GServerDirectedI0.java — Main Class

```
1 public class GServerDirectedIO extends GAggregationCache {
```
 $2$  ...

 $3 \mid \}$ 

Listing [5.11](#page-43-1) shows the data structures used by the Server-Directed [I/O](#page-116-1) implementation. lastFile and lastOffset are used to store the last accessed file and offset respectively. This information is used to minimize costly seek operations. queuedReadJobs and queuedWriteJobs are used to store per-file queues of outstanding [I/O](#page-116-1) operations in the form of IOJobs. The other cache layers use global queues for all operations. However, per-file queues allow easier and faster merging of [I/O](#page-116-1) operations. Additionally, these queues are sorted by the IOJobs' file offsets.

```
Listing 5.11: GServerDirectedIO.java — Data Structures
```

```
1 MPIFile lastFile = null;
2 long last0ffset = -1;
3
4 HashMap<MPIFile, LinkedList<IOJob>> queuedReadJobs = new HashMap<
      \hookrightarrow MPIFile, LinkedList<I0Job>>();
5 HashMap<MPIFile, LinkedList<IOJob>> queuedWriteJobs = new HashMap<
      \hookrightarrow MPIFile, LinkedList<I0Job>>();
```
Listing [5.12](#page-44-0) (page [45\)](#page-44-0) shows the IOJob interface. An IOJob represents a single [I/O](#page-116-1) operation operating on file at offset with size Bytes of data. IOJobs can either be READ or WRITE operations.

```
1 public class IOJob implements EventData {
2 static public enum IOOperation {
3 READ,
4 WRITE
 5 \mid \}6
 7 final private MPIFile file;
8 final private long size;
9 final private long offset;
10
11 final private IOOperation type;
12
13 public IOJob(MPIFile file, long size, long offset, IOOperation
        \hookrightarrow operation);
14 public IOJob(IOJob oldJob);
15
16 public long detOffset();
17 public long getSize();
18 public IOOperation getType();
19 public MPIFile getFile();
20 |}
```
Listing 5.12: GServerDirectedIO.java - IOJob Interface

Listing [5.13](#page-44-1) shows the getNextSchedulableJob method. As the name suggests, this method returns the next IOJob that should be performed by the [I/O](#page-116-1) subsystem. Currently, read operations are preferred. File systems like  $ZFS<sup>2</sup>$  $ZFS<sup>2</sup>$  $ZFS<sup>2</sup>$  also prioritize read operations to keep the system responsive, but make sure that no starvation of write operations occurs. This functionality is still lacking in the Server-Directed [I/O](#page-116-1) implementation — and in fact all other cache layers —, because there is currently no priority or way to determine how long operations have been waiting in the queue.

```
Listing 5.13: GServerDirectedIO.java — getNextSchedulableJob
```

```
1 @Override
2 protected IOJob getNextSchedulableJob() {
3 IOJob io:
4
5 \mid io = qetJob(I00peration.READ);
6
7 \mid \textbf{if} \text{ (io == null) }
```
<span id="page-44-2"></span><sup>2</sup>Zettabyte File System

```
8 io = qetJob(I00peration.WRITE);
9 }
10
11 return io;
12 }
```
Listing [5.14](#page-45-0) shows the getJob method. This method does the actual work of selecting an IOJob that should be performed next. It uses different strategies to decide which IOJob is best suited for execution.

Listing 5.14: GServerDirectedIO.java — getJob

```
1 private IOJob getJob(IOOperation type) {
2 \mid \ldots3
4 LinkedList<IOJob> list = null;
5 LinkedList<IOJob> lastFileList = null;
6
7 IOJob io = null;
8 IOJob ioClose = null;
9 IOJob ioLarge = null;
10
11 Iterator<IOJob> it = null;
12
13 ...
14
15 for (LinkedList<IOJob> l : queue.values()) {
16 long size = 0;
17 long tmp = \theta;
18
19 it = l.iterator();
20
21 \vert /* Determine the size of the job queue. */
22 while (it.hasNext()) {
23 tmp += it.next().getSize();
24 }
25
26 /* Prefer operating on the last file. */
27 if (l == lastFileList) {
28 tmp *= 10;29 }
30
```

```
31 /* Use the largest job queue. */
32 if (tmp > size) {
33 size = tmp;
34 list = l;
35 }
36 }
37
38 ...
39
40 if (type == I00peration.READ) {
41 list = mergeReadJobs(list);
42 \rightarrow else if (type == I00 peration.WRITE) {
43 list = mergeWriteJobs(list);
44 }
45
46 ...
47
48 while (it.hasNext()) {
49 IOJob cur = it.next();
50
51 if (ioClose == null || (lastOffset >= 0 && Math.abs(cur.
          \hookrightarrow getOffset() - lastOffset) < 5 * 1024 * 1024 && cur.
          \hookrightarrow getOffset() < ioClose.getOffset())) {
52 /* Determine the IOJob closest to the last position. */
53 ioClose = cur;
54 } else if (ioLarge == null || cur.getSize() > ioLarge.getSize())
          \hookrightarrow {
55 /* Determine the largest IOJob. */
56 ioLarge = cur;
57 }
58
59 }
60
61 ...
62 | }
```
The first step is to determine which per-file queue to use. Firstly, queue is set to either queuedReadJobs or queuedWriteJobs, depending on type. Then it computes the total size of all operations in each per-file queue — that is, how much data should be read or written — and uses the largest one. However, the queue of the file that was last accessed is preferred by multiplying its size with a factor of 10.

In the next step the mergeReadJobs or mergeWriteJobs method is used to merge as many IOJobs in the selected queue as possible. These methods try to combine multiple contiguous operations into larger operations. Additionally, the mergeRead-Jobs method supports data sieving, that is, reading more data than is necessary to combine even operations that are non-contiguous. However, data sieving is disabled by default, because it can cause performance degradation in some cases. Therefore, a cost-benefit analysis needs to be done in the future to determine in which cases the data sieving algorithm should be used. The algorithm then needs to be adapted accordingly.

In the last step the actual IOJob is selected. Currently, the closest — in relation to the last access — and the largest IOJobs are considered. In the special case that an IOJob continues the last access — that is, starts at the last accessed offset it can be used immediately, because in this case the underlying storage device does not have to perform any seek operation. This is of course only true for [HDDs](#page-116-3), which are the default storage devices used in PIOsimHD-Simulator for now. Code for this functionality exists, but is disabled at the moment, because tests suggest that this can decrease performance in some cases. Therefore, this special case must be analyzed further.

## **5.2.1 Delayed Writes**

Listing [5.15](#page-47-0) shows the explicit write-behind caching in the getJob() method. Obviously, this only applies to write operations. In the first step the size of all operations in all per-file queues is determined. Then it is checked whether this size exceeds the cacheSize and when the last flush happened.

```
Listing 5.15: GServerDirectedIO.java — Delayed Writes
```

```
1 \mid \ldots2
 3 \text{ if } (type == 100 peration.WRITE) {
4 long tmp = 0;
 5 | Epoch time = getSimulator().getVirtualTime();
 6
 7 for (List<IOJob> l : queue.values()) {
8 it = l.iterator();
9
10 while (it.hasNext()) {
11 \vert tmp += it.next().getSize();
12 }
13 }
14
```

```
15 if (tmp < cacheSize && lastFlush != null && (lastFlush.add(0.33).
         \hookrightarrow compareTo(time) > 0)) {
16 return null;
17 }
18|}
19
20 \vert \ldots
```
Pending operations are only executed whenever the pre-defined cache size is exceeded or the last flush happened more than  $\frac{1}{3}$ s ago. Otherwise, operations are cached and scheduled for later execution. This can significantly reduce the number of total [I/O](#page-116-1) operations, because it allows more efficient merging.

However, to be able to fully utilize this explicit write-behind caching a new flush command must be introduced, because [I/O](#page-116-1) operations can be lost otherwise. For example, [I/O](#page-116-1) operations could still be cached when all clients finish, which causes the simulator to terminate. Pending [I/O](#page-116-1) operations are then lost.

Listing [5.16](#page-48-0) shows the addFlush() method, which is called whenever clients request a flush by sending a RequestFlush. This method first tries to merge all remaining pending [I/O](#page-116-1) operations for this particular file. Afterwards, all merged [I/O](#page-116-1) operations are executed. Flush requests are announced to all cache layers, but currently only the ServerDirectedIO one makes use of it.

Listing 5.16: GServerDirectedIO.java — Flushing

```
1 @Override
2 protected void addFlush(RequestFlush req) {
3 if (queuedWriteJobs.get(req.getFile()) == null) {
4 return;
5 }
6
7 List<IOJob> list;
8 | Iterator<I0Job> it;
9
10 list = mergeWriteJobs(queuedWriteJobs.get(req.getFile()));
11 it = list.iterator();
12
13 while (it.hasNext()) {
14 IOJob io = it.next();
15
16 ioSubsystem.startNewIO(io);
17 | numberOfScheduledIOOperations++;
```

```
18 }
19
20 queuedWriteJobs.get(req.getFile()).clear();
21 \, | \}
```
When this method finishes no more pending write operations for the given file exist. File flushing is currently only triggered by closing a file with the Fileclose command.

## **5.2.2 Performance Considerations**

Both the AggregationCache and ServerDirectedIO cache layers use special data structures and algorithms to enable merging of [I/O](#page-116-1) operations. When implementing these optimizations in real-life file systems, the performance of these algorithms is very important, because the merging is performed each time an [I/O](#page-116-1) operation is forwarded to the [I/O](#page-116-1) subsystem. Therefore, an overview of their algorithmic complexity is given below.

### **Aggregation Cache**

The aggregation cache uses a simple data structure to store all pending [I/O](#page-116-1) operations. This queue is unsorted.

Insertion of a new operation is of order  $O(1)$ , because the new operation can be simply appended to the queue.

However, because the queue is unsorted merging of [I/O](#page-116-1) operations is of order  $O(n^2)$ where  $n$  is the total number of pending [I/O](#page-116-1) operations.

### **Server-Directed I/O**

The Server-Directed [I/O](#page-116-1) cache layer uses per-file data structures to store pending [I/O](#page-116-1) operations for each file individually. Each of the queues is sorted by the operations' offsets.

Insertion of a new operation is of order  $O(m)$  where m is the number of pending [I/O](#page-116-1) operations for the current file. This is achieved by using a linked list and walking the whole queue on each insertion.

Due to the sorted per-file queues merging of [I/O](#page-116-1) operations is of order  $O(m)$  where  $m$  is the number of pending [I/O](#page-116-1) operations for the current file. This is achieved by walking the queue once and merging operations on the fly.

# <span id="page-50-1"></span>**5.3 Collective I/O**

As described in subsection [5.1.2](#page-39-0) (page [40\)](#page-39-0), collective [I/O](#page-116-1) operations for reading and writing are implemented as new commands, namely the Filereadall and Filewriteall commands. To integrate the collective [I/O](#page-116-1) commands into the existing framework new models and implementations have to be added. The models are put into the files PIOsimHD-Model/src/de/hd/pvs/piosim/model/program/commands/Filereadall.java and PIOsimHD-Model/src/de/hd/pvs/piosim/model/ program/commands/Filewriteall.java respectively. The models are again omitted. These implementations are put into the directories PIOsimHD-Simulator/ src/de/hd/pvs/piosim/simulator/program/Filereadall/ and PIOsimHD-Simulator/src/de/hd/pvs/piosim/simulator/program/Filewriteall/ respectively. Both directories contain implementations using individual [I/O](#page-116-1) (Direct.java), the Two-Phase protocol (TwoPhase.java) and the Interleaved Two-Phase protocol (InterleavedTwoPhase.java). Lastly, the new implementations need to be added to the file CommandToSimulationMapper.txt, allowing them to be used as commands.

In order to properly implement collective operations it is necessary to be able to store some kind of meta information about the collective operation. For example, it is necessary to know which clients take part in this particular collective operation. It may also be necessary to store some kind of state information. Since no general solution is readily available, it has to be implemented for the collective operations considered here — that is, Filereadall and Filewriteall. The Filewriteall implementation in TwoPhase. java is used as an example.

Listing [5.17](#page-50-0) shows the data structures used to hold the necessary meta information. sync\_blocked\_clients is used to synchronize all participating clients for the collective operation. meta\_info is used to share meta information among all clients.

```
Listing 5.17: Filewriteall/TwoPhase.java — Data Structures
```

```
1 private static HashMap<FilewriteallWrapper, List<
      \hookrightarrow FilewriteallContainer>> sync_blocked_clients;
2 private static HashMap<Filewriteall, List<FilewriteallContainer>>
      \hookrightarrow meta_info;
```
Listing [5.18](#page-51-0) (page [52\)](#page-51-0) shows the FilewriteallWrapper class used to synchronize all participating clients of a collective operation. It is constructed in such a way that a FilewriteallWrapper instance created for a Filewriteall command is equal to another FilewriteallWrapper instance if and only if both used Filewriteall commands belong to the same collective operation. This is accomplished by overwriting the equals() and hashCode() methods.

Listing 5.18: Filewriteall/TwoPhase.java — FilewriteallWrapper

```
1 final class FilewriteallWrapper {
 2 private Filewriteall command;
 3
4 public FilewriteallWrapper(Filewriteall cmd) {
 5 command = cmd;
6 }
 7
8 @Override
9 public boolean equals(Object obj) {
10 if (obj.getClass() != getClass()) {
11 return false;
12 }
13
14 FilewriteallWrapper compare = (FilewriteallWrapper) obj;
15
16 return (compare.command.getCommunicator() == this.command.
          \hookrightarrow getCommunicator())
17 && (compare.command.getProgram().getApplication() == this.
              \hookrightarrow command.getProgram().getApplication())
18 \& (compare.command.getClass() == this.command.getClass());
19 \mid \}20
21 @Override
22 public int hashCode() {
23 return command.getCommunicator().hashCode() + command.getClass()
          \hookrightarrow .hashCode():
24 }
25 |}
```
By putting all matching commands into the sync\_blocked\_clients structure this class is used to find and collect all participating clients.

Listing [5.19](#page-51-1) shows the FilewriteallContainer class used to provide meta information to the clients during the runtime of the collective operation.

```
Listing 5.19: Filewriteall/TwoPhase.java — FilewriteallContainer
```

```
1 final class FilewriteallContainer {
2 private Filewriteall command;
3 private GClientProcess clientProcess;
4 private CommandProcessing commandProcessing;
5
```

```
6 ...
7
8 public FilewriteallContainer(Filewriteall command, GClientProcess
        \hookrightarrow clientProcess, CommandProcessing commandProcessing) {
9 this.command = command;
10 this.clientProcess = clientProcess;
11 this.commandProcessing = commandProcessing;
12
13 ...
14 }
15
16 public Filewriteall getCommand() {
17 return command;
18 }
19
20 public GClientProcess getClientProcess() {
21 return clientProcess;
22 \mid \}23
24 public CommandProcessing getCommandProcessing() {
25 return commandProcessing;
26 }
27
28 public Integer getRank() {
29 return clientProcess.getModelComponent().getRank();
30 }
31
32 ...
33 |}
```
By putting the meta information of all participating clients into the meta\_info structure, all clients have access to this meta information during the collective operation. It is also possible to access other clients' meta information when necessary.

Additional meta information can be added easily. For example, the Two-Phase operations use it to store the current iteration of the [I/O](#page-116-1) phase.

Listing [5.20](#page-53-0) (page [54\)](#page-53-0) shows the STEP\_START step used to fill the provided data structures. As can be seen, all clients first create FilewriteallWrapper and FilewriteallContainer instances based on the current command. All matching commands are added to the sync\_blocked\_clients structure. Completion is checked by comparing the size of the communicator — that is, the number of participating clients — and the number of collected commands. Afterwards, meta information is stored in the meta\_info structure for each client. Finally, the sync\_ blocked\_clients structure is cleaned up. The meta\_info structure is cleaned up when the clients finish the operation  $-$  that is, in the last step of the process() method.

Listing 5.20: Filewriteall/TwoPhase.java — STEP\_START

```
1 |@Override
2 public void process(Filereadall cmd, CommandProcessing OUTresults,
      ,→ GClientProcess client, int step, NetworkJobs compNetJobs) {
3 ...
4
5 switch (step) {
6 case (CommandProcessing.STEP_START): {
7 FilereadallWrapper wrapper = new FilereadallWrapper(cmd);
8 List<FilereadallContainer> waitingClients = sync_blocked_clients
          \hookrightarrow .get(wrapper);
9 FilereadallContainer container = new FilereadallContainer(cmd,
          \hookrightarrow client, OUTresults):
10
11 ...
12
13 | waitingClients.add(container);
14
15 if (waitingClients.size() < cmd.getCommunicator().getSize()) {
16 ...
17 } else {
18 List<FilereadallContainer> cmds = new ArrayList<
           \hookrightarrow FilereadallContainer>();
19
20 for (FilereadallContainer c : waitingClients) {
21 cmds.add(c);
22 }
23
24 ...
25
26 for (FilereadallContainer c : waitingClients) {
27 meta_info.put(c.getCommand(), cmds);
28 }
29
30 ...
31
```
32 sync\_blocked\_clients.remove(wrapper); 33 } 34 35  $36$  } 37 38 ...  $39$  |}

### **5.3.1 Two-Phase**

The implementation of the Two-Phase protocol described here follows the implementation in ROMIO as closely as possible. However, some differences exist. For example, when using the Two-Phase protocol to perform a collective write operation ROMIO's implementation uses a read-modify-write operation to keep write accesses contiguous. This does not matter for the benchmarks used in chapter [6](#page-60-0) (page [61\)](#page-60-0), because their access patterns are designed in such a way as to result in contiguous accesses when aggregated by the Two-Phase protocol. However, it may degrade performance for non-optimizing cache layers.

The discrete steps in the process() method can be seen as states of a simple state machine<sup>[3](#page-54-0)</sup>. This can be used to illustrate the inner workings of the Two-Phase implementations of the Filereadall and Filewriteall commands. The state machine would then starts in its start state called STEP\_START and would end when it reaches its end state STEP\_COMPLETED.

This is illustrated by state machine figures, which are structured as follows: Arrows show possible transitions between the individual states. The arrow without a previous state signifies the start state, which is called STEP\_START. The end state is called STEP\_COMPLETED and illustrated with a darker background color. The separated area called Direct signifies a nested state machine, that is, the existing Direct state machine is executed in the context of the Two-Phase state machine. This can be used to avoid duplicating existing functionality.

#### **Read**

Figure [5.1](#page-55-0) (page [56\)](#page-55-0) shows the corresponding state machine for the Two-Phase implementation of the Filereadall command, followed by a description of the state machine's individual states.

<span id="page-54-0"></span> $3$ For more information about state machines, see [http://en.wikipedia.org/wiki/](http://en.wikipedia.org/wiki/Finite-state_machine) [Finite-state\\_machine](http://en.wikipedia.org/wiki/Finite-state_machine).

<span id="page-55-0"></span>

Figure 5.1: Two-Phase Read State Machine

**STEP\_START** The purpose of this state is to synchronize all participating clients and set up all required data structures. For more information, see section [5.3](#page-50-1) (page [51\)](#page-50-1).

**CHECK\_TWO\_PHASE** This state is used to check whether the Two-Phase protocol should be used at all. The current way of doing this is to check whether the accesses of the participating clients overlap. Obviously, this requires communication between the clients to exchange their accesses. If they do not, the Two-Phase protocol is not used and a transition to SEND\_REQUEST of the Direct state machine is performed, which simply uses individual [I/O](#page-116-1) operations. Otherwise a transition to TWO\_PHASE is done.

**TWO\_PHASE** This state is used to determine the file region to read. This is done by using the minimum and maximum offsets and reading everything in between. The resulting file region is then distributed evenly across all clients — each client is then responsible for a so-called file domain. Each client then reads as much data as possible — this is limited by an internal Two-Phase buffer size. All clients also tell other clients which data they need from their respective file domains. If there is data remaining to be read a transition to TWO\_PHASE\_RECV is performed. Otherwise a transition to STEP\_COMPLETED is done and the meta information for this operation is cleaned up.

**TWO\_PHASE\_RECV** In this state clients have received the data from their respective file domains. Requested data is then distributed to all other clients, which requested it in the previous state. A transition to TWO\_PHASE is performed.

**STEP\_COMPLETED** This state signals the end of the state machine. All data is read and the Filereadall command is completed.

In the Direct implementation of the Filereadall command each client internally uses individual [I/O](#page-116-1) calls to read their requested data. This implementation is used when the CHECK\_TWO\_PHASE state determines that the Two-Phase protocol should not be used.

The states of the Direct state machine are as follows:

**SEND\_REQUEST** In this state each client requests the needed data directly from the involved servers. A transition to STEP\_COMPLETED is performed.

#### **Write**

<span id="page-56-0"></span>Figure [5.2](#page-56-0) shows the corresponding state machine for the Two-Phase implementation of the Filewriteall command, followed by a description of the state machine's individual states.



Figure 5.2: Two-Phase Write State Machine

**STEP\_START** The purpose of this state is to synchronize all participating clients and set up all required data structures. For more information, see section [5.3](#page-50-1) (page [51\)](#page-50-1).

**CHECK\_TWO\_PHASE** This state is used to check whether the Two-Phase protocol should be used at all. The current way of doing this is to check whether the accesses of the participating clients overlap. Obviously, this requires communication between the clients to exchange their accesses. If they do not, the Two-Phase protocol is not used and a transition to SEND\_REQUEST of the Direct state machine is performed, which simply uses individual [I/O](#page-116-1) operations. Otherwise a transition to TWO\_PHASE is done.

**TWO\_PHASE** This state is used to determine the file region to write. This is done by using the minimum and maximum offsets. The resulting file region is then distributed evenly across all clients — each client is then responsible for a so-called file domain. Each client then sends as much of their data as possible to the owners of the respective file domains — this is limited by an internal Two-Phase buffer size. If there is data remaining to be written a transition to TWO\_PHASE\_SEND is performed. Otherwise a transition to TWO\_PHASE\_UPDATE is done.

**TWO\_PHASE\_SEND** In this state all file domain owners have received the data to write from the other clients and start write operations on the involved servers. If there is no data to be written a transition to TWO\_PHASE is performed. Otherwise a transition to TWO\_PHASE\_WRITE is done.

**TWO\_PHASE\_WRITE** In this state the servers are ready to receive the file data. Therefore, the actual file data is transferred to them. A transition to TWO\_PHASE is performed.

**TWO\_PHASE\_UPDATE** This state is used to update the file size. Additionally, the meta information for this operation is cleaned up. A transition to STEP\_COMPLETED is performed.

**STEP\_COMPLETED** This state signals the end of the state machine. All data is written and the Filewriteall command is completed.

In the Direct implementation of the Filewriteall command each client internally uses individual [I/O](#page-116-1) calls to write their data. This implementation is used when the CHECK\_TWO\_PHASE state determines that the Two-Phase protocol should not be used.

The states of the Direct state machine are as follows:

**SEND\_REQUEST** In this state each client starts a write operation directly on the involved servers. A transition to RECV\_ACK is performed.

**RECV\_ACK** In this state the servers are ready to receive the file data. Each client transfers the file data directly to them. A transition to UPDATE\_SIZE is performed.

**UPDATE\_SIZE** This state is used to update the file size. A transition to STEP\_- COMPLETED is performed.

### **5.3.2 Interleaved Two-Phase**

The implementation of the Interleaved Two-Phase protocol is a slight modification of the original Two-Phase protocol's implementation as described in subsection [4.3.1](#page-34-0) (page [35\)](#page-34-0). In fact, the steps performed in the process() method are the same and therefore figures [5.1](#page-55-0) (page [56\)](#page-55-0) and [5.2](#page-56-0) (page [57\)](#page-56-0) also apply for the Interleaved Two-Phase protocol. For simplicity's sake only the differences between the two implementations are described here.

#### **Read**

**TWO\_PHASE** This state is used to determine the file region to read. This is done by using the minimum and maximum offsets and reading everything in between. The resulting file region is then partitioned into equally sized chunks — the size of the chunks is determined by the Two-Phase buffer size. Each client is then responsible for exactly one chunk and reads it. All clients also tell other clients which data they need from their respective chunks. If there are chunks remaining to be read a transition to TWO\_PHASE\_RECV is performed. Otherwise a transition to STEP\_COMPLETED is done and the meta information for this operation is cleaned up.

**TWO\_PHASE\_RECV** In this state clients have received the data from their respective chunks. Requested data is then distributed to all other clients, which requested it in the previous state. A transition to TWO\_PHASE is performed.

#### **Write**

**TWO\_PHASE** This state is used to determine the file region to write. This is done by using the minimum and maximum offsets. The resulting file region is then partitioned into equally sized chunks — the size of the chunks is determined by the Two-Phase buffer size. Each client then sends as much of their data as possible to the owners of the respective chunks. If there are chunks remaining to be written a transition to TWO\_PHASE\_SEND is performed. Otherwise a transition to TWO PHASE UPDATE is done.

**TWO\_PHASE\_SEND** In this state all chunk owners have received the data to write from the other clients and start write operations on the involved servers. If there is no data to be written a transition to TWO\_PHASE is performed. Otherwise a transition to TWO\_PHASE\_WRITE is done.

## **Summary**

[PIOsimHD-](#page-116-0)Model and [PIOsimHD-](#page-116-0)Simulator allow the implementation of arbitrary components and commands. Components are used to model real-life hardware components, while commands are used to model [MPI](#page-116-4) commands. It is possible to provide multiple variant implementations for both components and commands. Server-Directed [I/O](#page-116-1) is implemented as a cache layer in [PIOsimHD-](#page-116-0)Model and [PIOsimHD-](#page-116-0)Simulator. It supports delayed writes to allow more extensive optimization of outstanding [I/O](#page-116-1) operations. The Two-Phase protocol as well as the Interleaved Two-Phase protocol are implemented as commands in [PIOsimHD-](#page-116-0)Model and [PIOsimHD-](#page-116-0)Simulator. They contain a framework to manage meta information for collective [I/O.](#page-116-1)

# <span id="page-60-0"></span>**Chapter 6**

# **Evaluation**

This chapter gives an overview of the used benchmarks — both synthetic and reallife — and presents the results obtained with them. The main goal is to determine how client-side and server-side optimizations compare and interact with each other. The synthetic benchmarks consist of tests using random [I/O,](#page-116-1) individual [I/O](#page-116-1) and collective [I/O.](#page-116-1) Additionally, a test designed to simulate database access patterns is used. A parallel partial differential equation solver called partdiff-par is used as a real-life benchmark.

# **6.1 Environment**

It is important to note that all results mentioned in this chapter are measured in a simulated cluster environment within [PIOsimHD-](#page-116-0)Simulator. The following describes how this cluster environment is configured.

## **6.1.1 Cluster Configuration**

All synthetic benchmarks — that is, the random [I/O](#page-116-1) test, the individual [I/O](#page-116-1) tests and the collective [I/O](#page-116-1) tests — used in this evaluation use a standardized cluster configuration to be able to compare the different tests. For an overview of the components below refer to subsection [3.1.1](#page-21-0) (page [22\)](#page-21-0).

The cluster is made up of twenty Nodes. Ten of these Nodes are used as clients, while the other ten are used as servers. Each Node has one [CPU,](#page-116-5) 1 000[MiB](#page-116-6) of [RAM](#page-117-2) and a 1 GBits/s Ethernet [NIC](#page-116-7). The [CPUs](#page-116-5) can calculate 1 000 000 [IPS](#page-116-8)<sup>[1](#page-60-1)</sup> and have an internal data transfer speed of 1000 [MiB/](#page-116-6)s. The NICs can transfer up to 100[MiB/](#page-116-6)s and have a latency of 200 µs. All Nodes are connected to one Switch with a maximum bandwidth of 1 000[MiB/](#page-116-6)s. Additionally, each Node's [I/O](#page-116-1) Subsystem consists of one [HDD](#page-116-3) with a transfer rate of 50[MiB/](#page-116-6)s and 7 200 [RPM.](#page-117-3) The HDDs have an average seek time of 10 ms and a track-to-track seek time of 1 ms. Whenever

<span id="page-60-1"></span><sup>1</sup> Instructions per Second

two subsequent accesses are not more than 5[MiB](#page-116-6) apart the [HDD](#page-116-3) has to perform a track-to-track seek. Otherwise an average seek has to be performed.

The clients' data is striped across the servers with a simple round-robin scheme that works like [RAID](#page-117-4)<sup>[2](#page-61-0)</sup>-0. The striping size is set to 64 [KiB,](#page-116-9) which corresponds to [PVFS'](#page-117-5)s default striping size.

The Cache Layer is varied to compare the NoCache, SimpleWriteBehindCache, AggregationCache and ServerDirectedIO cache layers. No Cache Layer performs any read-ahead or data sieving optimizations.

### **6.1.2 File Layout**

All evaluated synthetic benchmarks — that is, the random [I/O](#page-116-1) test, the individual [I/O](#page-116-1) tests and the collective [I/O](#page-116-1) tests — use a standardized file layout to be able to compare the different tests.

Figure [6.1](#page-61-1) shows the file layout used for this evaluation. The file itself has a size of 1 000[MiB](#page-116-6) and is read or written by ten clients in iterations, advancing through the file with each iteration. Each iteration consists of ten data blocks of the same size. The size of the data blocks can be varied — the tests use data blocks of size 5 [KiB,](#page-116-9) 50 [KiB](#page-116-9) and 512 [KiB.](#page-116-9) A data block size of 512 Bytes causes the simulation to take too long and is therefore omitted. Each data block of an iteration is read or written by a different client, as denoted by the client number within the data block. For example, in each iteration block 1 is written by client 1, block 2 is written by client 2, and so on. The number of iterations is determined by the data block size. Each client reads or writes one data block per iteration.

<span id="page-61-1"></span>

Iteration 1	1	$\overline{2}$	3	4	5	6	7	8	9	10
Iteration 2	1	$\overline{2}$	3	4	5	6	7	8	9	10
Iteration 3	1	2	3	4	5	6	7	8	9	10
	i i i									
Iteration n-2	1	2	3	4	5	6	$\overline{7}$	8	9	10
Iteration n-1	1	$\overline{2}$	3	4	5	6	7	8	9	10
Iteration n	1	$\overline{2}$	3	4	5	6	$\overline{7}$	8	9	10

Figure 6.1: File Layout

<span id="page-61-0"></span><sup>&</sup>lt;sup>2</sup>Redundant Array of Inexpensive Disks or Redundant Array of Independent Disks

# **6.2 Performance Considerations**

The cluster consists of ten clients and ten servers, each capable of transferring 100[MiB/](#page-116-6)s. Since the switch has a throughput of 1 000[MiB/](#page-116-6)s the clients can communicate with the servers at full speed. However, the [HDDs](#page-116-3) have a maximum speed of 50[MiB/](#page-116-6)s, which limits the [I/O](#page-116-1) performance. Therefore, the clients can read or write at most 500[MiB/](#page-116-6)s from or to the file system served by the ten servers. The clients do not perform any computation, therefore this amount of throughput should be achievable. Additionally, all clients and servers have empty caches at the beginning of each test, that is, all data must be read from the underlying storage device. This means that read throughput can not exceed the above number.

The maximum throughput is lower when using the Two-Phase protocol, because it introduces additional communication overhead between the clients. This problem could be alleviated by using overlapping communication and [I/O](#page-116-1) phases, but this is currently not implemented.

[PIOsimHD-](#page-116-0)Simulator splits up write operations into blocks of 100 [KiB,](#page-116-9) which can cause write performance to be worse than the read performance. This is due to the fact that this splitting up causes more — and smaller — operations to be performed when a non-optimizing cache layer is used. However, due to the fact that write operations can be cached for an arbitrary time and then processed in the background there is more room for optimization. Read operations need to be processed as fast as possible, because the clients need the requested data to continue operation. Therefore, when only performing a relatively small number of read operations in parallel read performance is usually much lower than write performance. When many read operations are batched together this gap between read and write performance should shrink.

For a more in-depth analysis of performance factors in distributed systems see [\[Kun07\]](#page-98-0).

# **6.3 Random I/O Test**

The random I/O test uses randomized individual I/O operations. Each client performs a sequence of contiguous read or write operations in a randomized order. To make the different runs of the tests comparable, the randomization is done with a pre-defined random seed — that is, each run yields the same result. The read and writes cases use the same random seeds.

To obtain meaningful results ten runs with different random seeds are performed and the average values over these runs are used for comparison. The standard deviation is not shown in the figures, because it is too small.

Each figure shows per-client throughput, that is, the maximum throughput is 50[MiB/](#page-116-6)s.

Figure [6.2a](#page-63-0) shows the results of the random [I/O](#page-116-1) test when run with a data block size of 5 [KiB.](#page-116-9) In the read case, the NoCache and SimpleWriteBehindCache cache layers have the same performance, because they do not perform any read optimizations. The same is true for all the following tests. The AggregationCache cache layer also delivers the same performance, even though it performs read optimizations. The ServerDirectedIO cache layer is slightly faster. In the write case, the SimpleWriteBehindCache cache layer increases the throughput slightly. The AggregationCache and ServerDirectedIO cache layers increase throughput by factors of 11 and 14 respectively.

Figure [6.2b](#page-64-0) (page [65\)](#page-64-0) shows the results of the random [I/O](#page-116-1) test when run with a data block size of 50 [KiB.](#page-116-9) In the read case, the ServerDirectedIO cache layer again increases performance slightly. In the write case, the SimpleWriteBehind-Cache cache layer increases throughput slightly when compared to the NoCache cache layer. The AggregationCache and ServerDirectedIO cache layers increase throughput by factors of 8 and 9 respectively.

Figure [6.2c](#page-64-1) (page [65\)](#page-64-1) shows the results of the random [I/O](#page-116-1) test when run with a data block size of 512 [KiB.](#page-116-9) In the read case, the ServerDirectedIO cache layer again increases performance slightly. In the write case, the SimpleWriteBehindCache cache layer does not improve performance at all when compared to the NoCache cache layer. The AggregationCache cache layer increases throughput by a factor of 6 while the ServerDirectedIO cache layer increases it by a factor of 7.

<span id="page-63-0"></span>

(a) 5 KiB Data Blocks

Figure 6.2: Random I/O Test

<span id="page-64-1"></span><span id="page-64-0"></span>

Figure 6.2: Random I/O Test

## **Summary**

Overall, the benefits provided by the read optimizations performed by the AggregationCache and ServerDirectedIO cache layers are limited. This is due to the fact that at most ten operations can be combined per iteration. This happens very rarely, because the accesses are spread randomly across the file. However, the ServerDirectedIO cache layer provides slight performance improvements for all block sizes. Improving and enabling the cache layer's data sieving algorithm could provide significant improvements for random read operations.

In the write case, the SimpleWriteBehindCache cache layer provides a slight performance boost except for the largest data block size where it performs the same as the NoCache cache layer. Both the AggregationCache and ServerDirectedIO cache layers provide substantial performance improvements, regardless of the data block size. However, a better speedup is achieved for small block sizes. The

ServerDirectedIO cache layer's performance is always slightly better than the AggregationCache cache layer's performance.

The results look very much alike, regardless of the data block size. This is due to the randomness of the test, which allows almost no optimizations of read operations. Even though the write operations can be optimized better no test reaches the maximum throughput of 50[MiB/](#page-116-6)s.

# **6.4 Individual I/O Test**

The individual I/O test uses individual I/O operations, that is, each client reads or writes its data blocks in an ascending order. A varying number of data blocks are written with one operation. The contiguous test reads or writes only one data block at a time, while the non-contiguous ones read or write multiple data blocks per operation.

## **6.4.1 1 Data Block per Iteration**

This test uses contiguous [I/O,](#page-116-1) that is, only one data block is read or written per iteration.

Figure [6.3a](#page-66-0) (page [67\)](#page-66-0) shows the results of the individual [I/O](#page-116-1) test when run with a data block size of 5 [KiB.](#page-116-9) In the read case, the AggregationCache cache layer decreases performance slightly, while the ServerDirectedIO cache layer delivers the same performance as the NoCache and SimpleWriteBehindCache cache layers. This is due to the fact that  $-$  because of the striping size  $-$  only one server is processing requests at any time. Additionally, the small data block size causes some operations to be finished before the other clients' operations arrive, which makes merging operations impossible. In the write case, the SimpleWriteBehind-Cache cache layer increases the throughput slightly. The AggregationCache and ServerDirectedIO cache layers increase throughput by a factor of 7.

Figure [6.3b](#page-66-1) (page [67\)](#page-66-1) shows the results of the individual [I/O](#page-116-1) test when run with a data block size of 50 [KiB.](#page-116-9) In the read case, both the AggregationCache and ServerDirectedIO cache layers increase performance slightly. This is due to the fact that only one operation is performed on each server, which can not be optimized significantly. In the write case, the SimpleWriteBehindCache cache layer increases throughput only slightly, while the AggregationCache and ServerDirectedIO cache layers increase it by a factor of 6.

Figure [6.3c](#page-67-0) (page [68\)](#page-67-0) shows the results of the individual [I/O](#page-116-1) test when run with a data block size of 512 [KiB.](#page-116-9) In the read case, the AggregationCache and ServerDirectedIO cache layers increase performance tremendously. The AggregationCache cache layer increases throughput by factor of 2, while the ServerDirectedIO cache layer increases it by a factor of 5. This is due to the fact that the larger data block size causes more operations to be performed on each server, which can then be optimized. In the write case, the SimpleWriteBehindCache cache layer offers less improvement than in the previous tests. Both the AggregationCache and ServerDirectedIO cache layers increases throughput by a factor of 5.

<span id="page-66-1"></span><span id="page-66-0"></span>

Figure 6.3: Individual I/O Test — 1 Data Block per Iteration

<span id="page-67-0"></span>

Figure 6.3: Individual I/O Test — 1 Data Block per Iteration

### **Summary**

Overall, the benefits provided by the read optimizations performed by the AggregationCache and ServerDirectedIO cache layers are very dependent on the data block size. There are almost no gains for the smaller data block sizes of 5 and 50 [KiB,](#page-116-9) while a data block size of 512 [KiB](#page-116-9) makes possible tremendous speedups. Preliminary results show that more speedup is also possible for smaller data block sizes when using 100 clients. This is due to the fact that this also increases the amount of concurrent operations, which allows better optimizations to be performed.

In the write case, the SimpleWriteBehindCache cache layer provides only a slight performance boost. Both the AggregationCache and ServerDirectedIO cache layers provide substantial performance improvements, regardless of the data block size.

The ServerDirectedIO cache layer almost reaches the maximum throughput of 50[MiB/](#page-116-6)s for both read and write operations when using a data block size of 512 [KiB.](#page-116-9)

## **6.4.2 100 Data Blocks per Iteration**

This test uses non-contiguous [I/O,](#page-116-1) that is, 100 data blocks are read or written per iteration. This gives more [I/O-](#page-116-1)related information to the cache layers than in the previous test and allows them to optimize accesses better.

Figure [6.4a](#page-68-0) (page [69\)](#page-68-0) shows the results of the individual [I/O](#page-116-1) test when run with a data block size of 5 [KiB.](#page-116-9) In the read case, the AggregationCache cache layer improves performance by a factor of 12, while the ServerDirectedIO cache layer improves it by a factor of 18. In the write case, both the AggregationCache and ServerDirectedIO cache layers increase throughput by a factor of 58.

Figure [6.4b](#page-68-1) shows the results of the individual [I/O](#page-116-1) test when run with a data block size of 50 [KiB.](#page-116-9) In the read case, the AggregationCache cache layer increases performance by a factor of 7, while the ServerDirectedIO cache layer performs slightly worse. In the write case, the AggregationCache and ServerDirectedIO cache layers increase throughput by a factor of 11.

Figure [6.4c](#page-69-0) (page [70\)](#page-69-0) shows the results of the individual [I/O](#page-116-1) test when run with a data block size of 512 [KiB.](#page-116-9) In the read case, the AggregationCache cache layer increases performance by a factor of 5, while the ServerDirectedIO cache layer performs slightly worse. In the write case, the AggregationCache and ServerDirectedIO cache layers increase throughput by a factor of 7.5.

<span id="page-68-1"></span><span id="page-68-0"></span>

Figure 6.4: Individual I/O Test — 100 Data Blocks per Iteration

<span id="page-69-0"></span>

Figure 6.4: Individual I/O Test — 100 Data Blocks per Iteration

### **Summary**

Overall, the benefits provided by the read optimizations performed by the AggregationCache and ServerDirectedIO cache layers are very dependent on the data block size. However, due to the batching of 100 operations the results are 5 to 15 times better than in the contiguous case. The only exception is the test with a data block size of 512 [KiB/](#page-116-9)s.

In the write case, the SimpleWriteBehindCache cache layer provides no performance boost at all. Both the AggregationCache and ServerDirectedIO cache layers provide substantial performance improvements, regardless of the data block size.

Both the AggregationCache and ServerDirectedIO cache layers reach the maximum throughput of 50[MiB/](#page-116-6)s for write operations regardless of the data block size.

## **6.4.3 All Data Blocks per Iteration**

This test uses non-contiguous [I/O,](#page-116-1) that is, all data blocks are read or written in one iteration. This gives all [I/O-](#page-116-1)related information to the cache layers and allows them to optimize accesses better.

Figure [6.5a](#page-70-0) (page [71\)](#page-70-0) shows the results of the individual [I/O](#page-116-1) test when run with a data block size of 5 [KiB.](#page-116-9) In the read case, both the AggregationCache and ServerDirectedIO cache layers improve performance by a factor of 55. The ServerDirectedIO cache layer performs slightly worse than the Aggregation-Cache one. In the write case, both the AggregationCache and ServerDirectedIO cache layers increase throughput by a factor of 60.

Figure [6.5b](#page-70-1) (page [71\)](#page-70-1) shows the results of the individual [I/O](#page-116-1) test when run with a data block size of 50 [KiB.](#page-116-9) In the read case, both the AggregationCache and ServerDirectedIO cache layers improve performance by a factor of 10.5. The ServerDirectedIO cache layer performs slightly worse than the Aggregation-Cache one. In the write case, both the AggregationCache and ServerDirectedIO cache layers increase throughput by a factor of 13.

Figure [6.5c](#page-71-0) (page [72\)](#page-71-0) shows the results of the individual [I/O](#page-116-1) test when run with a data block size of 512 [KiB.](#page-116-9) In the read case, both the AggregationCache and ServerDirectedIO cache layers improve performance by a factor of 5. The ServerDirectedIO cache layer performs slightly worse than the Aggregation-Cache one. In the write case, both the AggregationCache and ServerDirectedIO cache layers increase throughput by a factor of 7.5.

<span id="page-70-1"></span><span id="page-70-0"></span>

Figure 6.5: Individual I/O Test — All Data Blocks per Iteration

<span id="page-71-0"></span>

Figure 6.5: Individual I/O Test — All Data Blocks per Iteration

### **Summary**

In the read case, both the AggregationCache and ServerDirectedIO cache layers provide substantial performance improvements, regardless of the data block size.

In the write case, the SimpleWriteBehindCache cache layer provides no performance boost at all. Both the AggregationCache and ServerDirectedIO cache layers provide substantial performance improvements, regardless of the data block size.

Both the AggregationCache and ServerDirectedIO cache layers reach the maximum throughput of 50[MiB/](#page-116-6)s for write operations regardless of the data block size. For read operations the throughput is slightly worse, but still unaffected by the data block size.

# **6.5 Collective I/O Test**

The collective I/O test uses collective I/O operations. Each clients performs only one collective read or write operation, accessing all data blocks at once. It is done this way to ensure that the Two-Phase algorithm needs to do actual work.

## **6.5.1 Two-Phase**

Due to each client performing only one collective read or write operation, each client is responsible for a contiguous region of data blocks. In the read case each clients reads its data blocks from disk — or rather as many data blocks as fit into the Two-Phase buffer — and then sends the data blocks to the corresponding
clients. In the write case all clients send their data blocks to the corresponding client which in turn writes them to disk.

The main question is which throughput the collective [I/O](#page-116-0) operations can deliver with optimizing cache layers — that is, the AggregationCache and ServerDirectedIO cache layers.

Figure [6.6a](#page-72-0) shows the results of the collective [I/O](#page-116-0) test when run with a data block size of 5 [KiB](#page-116-1) using the original Two-Phase protocol. In the read case, all cache layers deliver the same performance, except for the ServerDirectedIO cache layer, which performs slightly worse. They reach a throughput of about 17[MiB/](#page-116-2)s. In the write case, both the AggregationCache and ServerDirectedIO cache layers do not reach the maximum throughput of 50[MiB/](#page-116-2)s. This is due to the fact that the Two-Phase protocol introduces additional network overhead. The ServerDirectedIO cache layer performs slightly worse than the AggregationCache one. Both reach a throughput of about 36[MiB/](#page-116-2)s.

Figure [6.6b](#page-73-0) (page [74\)](#page-73-0) shows the results of the collective [I/O](#page-116-0) test when run with a data block size of 50 [KiB](#page-116-1) using the original Two-Phase protocol. The figure basically looks like the previous one, with the exception of increased write performance for the non-optimizing cache layers. This is due to the larger data block size. However, the ServerDirectedIO cache layer performs worse than in figure [6.6a.](#page-72-0)

Figure [6.6c](#page-73-1) (page [74\)](#page-73-1) shows the results of the collective [I/O](#page-116-0) test when run with a data block size of 512 [KiB](#page-116-1) using the original Two-Phase protocol. The figure basically looks like the previous one, with the exception of increased write performance for the non-optimizing cache layers. This is due to the larger data block size. However, the ServerDirectedIO cache layer performs worse than in figure [6.6b](#page-73-0) (page [74\)](#page-73-0).

<span id="page-72-0"></span>

(a) 5 KiB Data Blocks

Figure 6.6: Two-Phase I/O Test

<span id="page-73-1"></span><span id="page-73-0"></span>

Figure 6.6: Two-Phase I/O Test

### **Summary**

In the read case, all cache layers provide the same performance. The throughput is about 16.5[MiB/](#page-116-2)s, which is significantly worse and not even half the performance delivered in the individual [I/O](#page-116-0) test.

In the write case, the performance of the non-optimizing cache layers — that is, the NoCache and SimpleWriteBehindCache cache layers — is not as good as it could be, because the current Two-Phase implementation issues too many separate [I/O](#page-116-0) requests instead of combining them. Both the AggregationCache and SimpleWriteBehindCache cache layers provide a throughput of about 35[MiB/](#page-116-2)s. This is higher than the throughput in the read case, because the servers perform write-behind. This allows overlapping the Two-Phase communication with actual [I/O](#page-116-0) on the servers. However, the maximum throughput of 50[MiB/](#page-116-2)s is still not reached.

### <span id="page-74-0"></span>**6.5.2 Interleaved Two-Phase**

This test uses the Interleaved Two-Phase protocol. In the read case each clients reads as many data blocks as fit into the Two-Phase buffer and then sends the data blocks to the corresponding clients. In the write case all clients send their data blocks to the corresponding client which in turn writes them to disk.

The main question is how the Interleaved Two-Phase protocol compares to the original Two-Phase protocol and whether any performance gains are possible.

Figure [6.7a](#page-75-0) (page [76\)](#page-75-0) shows the results of the collective [I/O](#page-116-0) test when run with a data block size of 5 [KiB](#page-116-1) using the Interleaved Two-Phase protocol. In the read case, both the AggregationCache and ServerDirectedIO cache layers improve performance slightly. This is due to the fact that the Interleaved Two-Phase protocol uses a contiguous access pattern which can be optimized better. They reach throughputs of about 21.5[MiB/](#page-116-2)s and 24[MiB/](#page-116-2)s respectively. In the write case, both the AggregationCache and ServerDirectedIO cache layers do not reach the maximum throughput of 50[MiB/](#page-116-2)s, if even by a small amount. This is due to the fact that the Two-Phase protocol introduces additional network overhead. The ServerDirectedIO cache layer performs slightly better than the AggregationCache one. Both reach a throughput of about 45[MiB/](#page-116-2)s.

Figure [6.7b](#page-75-1) (page [76\)](#page-75-1) shows the results of the collective [I/O](#page-116-0) test when run with a data block size of 50 [KiB](#page-116-1) using the Interleaved Two-Phase protocol. The figure basically looks like the previous one, with the exception of increased write performance for the non-optimizing cache layers. This is due to the larger data block size. However, in the read case, the ServerDirectedIO cache layer performs slightly worse than the AggregationCache this time.

Figure [6.7c](#page-75-2) (page [76\)](#page-75-2) shows the results of the collective [I/O](#page-116-0) test when run with a data block size of 512 [KiB](#page-116-1) using the Interleaved Two-Phase protocol. The figure basically looks like the previous one, with the exception of increased write performance for the non-optimizing cache layers. This is due to the larger data block size. Additionally, both the AggregationCache and ServerDirectedIO cache layers' read performance is worse than in the previous cases.

<span id="page-75-1"></span><span id="page-75-0"></span>

<span id="page-75-2"></span>Figure 6.7: Interleaved Two-Phase I/O Test

#### **Summary**

In the read case, slight performance improvements are possible with both the AggregationCache and ServerDirectedIO cache layers. The throughput is about 24[MiB/](#page-116-2)s, which is significantly worse and about half the performance delivered in the individual [I/O](#page-116-0) test. This results is better than the one obtained with the original Two-Phase protocol.

In the write case, the Interleaved Two-Phase protocol suffers from the same problem as the original one when using non-optimizing cache layers. Both the AggregationCache and SimpleWriteBehindCache cache layers provide a throughput of about 45[MiB/](#page-116-2)s. This is higher than the throughput in the read case, because the servers perform write-behind. This allows overlapping the Two-Phase communication with actual [I/O](#page-116-0) on the servers. Even though the maximum throughput of 50[MiB/](#page-116-2)s is still not reached this result is better than the one obtained with the original Two-Phase protocol.

The Interleaved Two-Phase protocol delivers a better performance than the original one in all cases. This is due to the changes done to the access pattern used internally. Since the Interleaved Two-Phase protocol keeps accesses contiguous the cache layers can optimize the accesses better. For a visualization of the inner workings of the Interleaved Two-Phase protocol refer to section [7.2](#page-91-0) (page [92\)](#page-91-0).

## <span id="page-76-0"></span>**6.6 Individual and Collective I/O Comparison**

The following figures give an overview of the results obtained so far. The results are summarizes and compared with each other.

Figure [6.8a](#page-77-0) (page [78\)](#page-77-0) shows all results obtained for read operations with a data block size of 5 [KiB.](#page-116-1) As can be seen, performance suffers when using non-optimizing cache layers or too few operations per iteration. Batching operations results in performance gains. However, the maximum performance is only obtained when batching all operations. This is due to the fact that read operations must be processed when the clients request them and can not be postponed. Individual [I/O](#page-116-0) operations with the AggregationCache and ServerDirectedIO cache layers beat both Two-Phase implementations.

Figure [6.8b](#page-77-1) (page [78\)](#page-77-1) shows all results obtained for write operations with a data block size of 5 [KiB.](#page-116-1) As can be seen, performance suffers when using non-optimizing cache layers or too few operations per iteration. In contrast to read operations less batching is required to obtain the maximum performance. This is due to the fact that write operations can be postponed and processed in the background. The Two-Phase implementations do not perform well when used with non-optimizing cache layers, because write operations are not performed in large contiguous regions

internally — in contrast to the read case. However, this is a minor implementation detail and even using the optimizing cache layers delivers worse performance than the test with individual [I/O](#page-116-0) operations.

<span id="page-77-1"></span><span id="page-77-0"></span>

Figure 6.8: Summary — 5 KiB Data Blocks

Figure [6.9a](#page-78-0) (page [79\)](#page-78-0) shows all results obtained for read operations with a data block size of 50 [KiB.](#page-116-1) The results look like the ones in figure [6.8a](#page-77-0) except for the fact that better performance is achieved when using non-optimizing cache layers. This is due to the larger data block size.

Figure [6.9b](#page-78-1) (page [79\)](#page-78-1) shows all results obtained for write operations with a data block size of 50 [KiB.](#page-116-1) The results look like the ones in figure [6.8b](#page-77-1) except for the fact that better performance is achieved when using non-optimizing cache layers. This is due to the larger data block size.

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<span id="page-78-1"></span><span id="page-78-0"></span>

Figure 6.9: Summary — 50 KiB Data Blocks

Figure [6.10a](#page-79-0) (page [80\)](#page-79-0) shows all results obtained for read operations with a data block size of 512 [KiB.](#page-116-1) The results look like the ones in figure [6.9a](#page-78-0) except for the higher performance with non-optimizing cache layers, which is due to the larger data block size. The ServerDirectedIO cache layer almost delivers the maximum performance in all tests using individual [I/O](#page-116-0) operations.

Figure [6.10b](#page-79-1) (page [80\)](#page-79-1) shows all results obtained for write operations with a data block size of 512 [KiB.](#page-116-1) The results look like the ones in figure [6.9b](#page-78-1) except for the higher performance with non-optimizing cache layers, which is due to the larger data block size. The ServerDirectedIO cache layer delivers the maximum performance in all tests using individual [I/O](#page-116-0) operations.

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<span id="page-79-1"></span><span id="page-79-0"></span>

Figure 6.10: Summary — 512 KiB Data Blocks

In conclusion, it is easy to see that the server-side optimizations deliver better performance than the client-side optimizations in all cases. Apart from that, the Interleaved Two-Phase protocol clearly outperforms its unmodified version, if even by a relatively small amount. However, to obtain satisfactory performance it is necessary to batch operations or use large operations. Batching operations is only necessary when using small operations, while large operations deliver good performance even when performed individually.

# **6.7 Database I/O Test**

The database [I/O](#page-116-0) tests simulates the load concurrent clients put on a database. It does not use the file layout specified in [6.1.2](#page-61-0) (page [62\)](#page-61-0). The test uses ten files that are each 1 250 000 [KiB](#page-116-1) in size. Each client performs ten iterations and uses a data block size of 512 Bytes. In each iteration 1 250 [KiB](#page-116-1) of data are accessed. In

total, the clients access 125 000 [KiB](#page-116-1) of data, that is, 1% of the total amount of data. Accesses are performed in blocks. Each block starts at a random offset and has a random size of at most 50 [KiB.](#page-116-1) To make the different runs of the tests comparable, the randomization is done with a pre-defined random seed. All cases use the same random seeds. The database [I/O](#page-116-0) test consists of cases for read-only, write-only and read-write accesses.

To obtain meaningful results ten runs with different random seeds are performed and the average values over these runs are used for comparison. The standard deviation is not shown in the figures, because it is too small.

Figure [6.11a](#page-81-0) (page [82\)](#page-81-0) shows the results of the database [I/O](#page-116-0) test when run with a data block size of 512 Bytes using contiguous [I/O](#page-116-0) operations. The Aggregation-Cache cache layer also delivers the same performance, even though it performs read optimizations. The ServerDirectedIO cache layer is slightly slower. In the write and read-write cases, the SimpleWriteBehindCache and AggregationCache cache layers increase the throughput slightly. The ServerDirectedIO cache layer increases throughput further, if even by a small amount in the read-write case.

Figure [6.11b](#page-81-1) (page [82\)](#page-81-1) shows the results of the random [I/O](#page-116-0) test when run with a data block size of 512 Bytes using non-contiguous [I/O](#page-116-0) operations to batch ten operations. In the read case, the ServerDirectedIO cache layer again decreases performance slightly. In the write and read-write cases, the SimpleWriteBehindCache and AggregationCache cache layers increase throughput slightly. The ServerDirectedIO cache layer increases throughput further.

Figure [6.11c](#page-81-2) (page [82\)](#page-81-2) shows the results of the database [I/O](#page-116-0) test when run with a data block size of 512 Bytes using non-contiguous [I/O](#page-116-0) operations to batch all operations. In the read case, only the ServerDirectedIO cache layer again increases performance slightly. In the write case, the SimpleWriteBehindCache cache layer does not improve performance at all when compared to the NoCache cache layer. The AggregationCache and ServerDirectedIO cache layers both increase throughput slightly with the ServerDirectedIO cache layer being somewhat faster.

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<span id="page-81-0"></span>

(a) 1 Data Block per Iteration

<span id="page-81-2"></span><span id="page-81-1"></span>

(c) All Data Blocks per Iteration

Cache

I/O

Behind Cache

Figure 6.11: Database I/O Test

### **Summary**

Overall, the benefits provided by the read optimizations performed by the AggregationCache and ServerDirectedIO cache layers are limited. Batching operations does not significantly change this. This is due to the fact that the read operations are spread randomly across the file.

In the write and read-write cases, the SimpleWriteBehindCache cache layer provides a slight performance boost except when all operations are performed as a single non-contiguous [I/O](#page-116-0) operation. Both the AggregationCache and ServerDirectedIO cache layers provide substantial performance improvements. The ServerDirectedIO cache layer's performance is always slightly better than the AggregationCache cache layer's performance.

## <span id="page-82-0"></span>**6.8 Parallel Partial Differential Equation Solver**

partdiff-par is a parallel partial differential equation solver using the Jacobi method. It uses [MPI](#page-116-3) to parallelize the computation. Additionally, [MPI-IO](#page-116-4) is used to write periodic checkpoints, which allow resuming the computation. A visualization file can be used to observe the convergence behavior during the application's runtime. Consequently, this application only performs write operations.

The partdiff-par application is used as a real-life benchmark to evaluate the different cache layers. For this purpose it was traced using the [PIOsimHD](#page-116-5) framework using the included versions of MPICH2 and [PVFS.](#page-117-0) The evaluation is done with five application processes and five file servers. The real application has a runtime of about 3.99 s. However, this runtime can not be directly compared to the simulated results, because of differences between the real and simulated hardware environment.

The results below show the application's runtime with varying cache layers. Additionally, internal statistics of the cache layers are presented. For example, the total number of [I/O](#page-116-0) operations (Accesses) is shown. These operations are split up into operations that do not require any seeks at all (No Seek), operations that only require fast seeks — that is, track-to-track seeks —  $(Fast)$  and operations that do require slow seeks — that is, average seeks — (Slow). The total amount of data accessed per server is also shown.

## **6.8.1 No Cache**

Table [6.1](#page-83-0) (page [84\)](#page-83-0) shows the results obtained when using no cache layer. Apart from the application's runtime one of the most interesting statistics is the number of [I/O](#page-116-0) operations. Since this test uses no cache layer at all, no merging of operations



can occur. Therefore, the number of operations in this test are suited perfectly to be used as a basis for comparison with the other cache layers.

<span id="page-83-0"></span>Table 6.1: partdiff-par — No Cache

### **6.8.2 Simple Write-Behind Cache**

Table [6.2](#page-83-1) shows the results obtained when using the simple write-behind cache layer. This cache layer already decreases the application's runtime significantly. However, the total number of [I/O](#page-116-0) operations basically stays the same, because this cache layer does not perform explicit merging of operations.



<span id="page-83-1"></span>Table 6.2: partdiff-par — Simple Write-Behind Cache

### **6.8.3 Aggregation Cache**

Table [6.3](#page-84-0) (page [85\)](#page-84-0) shows the results obtained when using the aggregation cache layer. This cache layers decreases the application's runtime again, but not as drastically as the simple write-behind cache layer. However, the number of total [I/O](#page-116-0) operations decreases significantly. This is due to the fact that this cache layer performs explicit merging of operations.



<span id="page-84-0"></span>Table 6.3: partdiff-par — Aggregation Cache

### **6.8.4 Server-Directed I/O**

The Server-Directed [I/O](#page-116-0) cache layer is the only cache layer with a differing total amount of data access per server. This is due to the fact that this cache layer does not keep duplicate data in its internal queue for write operations. Whenever a newly arrived operation overwrites old data, this old data is purged from the queue. The partdiff-par application overwrites part of its visualization file in each iteration. This is the reason for the decreased amount of data.

#### **Without Delayed Writes**

Table [6.4](#page-84-1) shows the results obtained when using the Server-Directed [I/O](#page-116-0) cache layer without delayed writes. This cache layer does not decrease the application's runtime. The reason for this is the fact that application runtime is dominated by its computation in this case. This is analyzed in detail in section [7.1](#page-87-0) (page [88\)](#page-87-0). However, the total number of operations is decreased slightly.



<span id="page-84-1"></span>Table 6.4: partdiff-par — Server-Directed I/O (Without Delayed Writes)

#### **With Delayed Writes**

Table [6.5](#page-85-0) (page [86\)](#page-85-0) shows the results obtained when using the Server-Directed [I/O](#page-116-0) cache layer with delayed writes. As can be seen, delayed writes significantly decrease the number of total operations. This is due to the fact that the write operations are held in memory for a longer time period, which makes it possible to merge more of these operations. Even though delayed writes do not decrease the execution time of the partdiff-par application the reduction of write operations can have advantageous effects in larger systems. For example, [NCQ](#page-116-6) provides an operation queue which is used to speed up disk accesses $^3$  $^3$ . However, this queue is limited to 32 entries. Therefore, reducing the number of operations can increase performance by allowing the underlying storage device to perform additional optimizations.



<span id="page-85-0"></span>Table 6.5: partdiff-par — Server-Directed I/O (With Delayed Writes)

### **6.8.5 Cache Layer Comparison**

Figure [6.12](#page-86-0) (page [87\)](#page-86-0) gives an overview of the results obtained with the partdiffpar application when simulated with the various cache layers. As can be seen, the SimpleWriteBehindCache improves performance by a factor of 1.6. Both the AggregationCache and ServerDirectedIO cache layers improve performance by a factor of 2.7. No further improvements are possible, because the partdiff-par application's runtime is already dominated by computation when using these cache layers. Due to the additional computation and communication overhead the overall throughput is lower than in the previous tests. For a visualization of these results see section [7.2](#page-91-0) (page [92\)](#page-91-0).

<span id="page-85-1"></span><sup>3</sup>For more information see [http://en.wikipedia.org/wiki/Native\\_Command\\_Queuing](http://en.wikipedia.org/wiki/Native_Command_Queuing).

<span id="page-86-0"></span>

Figure 6.12: partdiff-par — Cache Layer Comparison

## **Summary**

Random [I/O](#page-116-0) operations are hard to optimize, because it is rarely possible to merge those operations. The results obtained in this chapter show that the server-side optimizations deliver better performance than the client-side optimizations in all tested cases. The Interleaved Two-Phase protocol outperforms the original Two-Phase protocol, if even by a relatively small amount. Obtaining satisfactory performance is possible by either batching smaller operations or using larger operations. Delayed writes can be used to reduce the number of [I/O](#page-116-0) operations the [I/O](#page-116-0) subsystem has to perform.

# **Chapter 7**

# **Visualization**

This chapter presents the possibility to visualize application traces with HDSunshot. Traces generated by the partdiff-par benchmark and collective [I/O](#page-116-0) test from chapter [6](#page-60-0) (page [61\)](#page-60-0) are used as examples. Traces of a real partdiff-par application run and its simulated counterpart are compared. The simulated application run uses different cache layers to show their effects on the underlying [I/O](#page-116-0) subsystem. Additionally, the traces of the collective [I/O](#page-116-0) test are shown to demonstrate the Interleaved Two-Phase protocol.

## <span id="page-87-0"></span>**7.1 Parallel Partial Differential Equation Solver**

The partdiff-par application from section [6.8](#page-82-0) (page [83\)](#page-82-0) is used to demonstrate [PIOsimHD'](#page-116-5)s ability to compare traces of real-life applications with those of simulated applications. Additionally, the simulated partdiff-par application is run with varying cache layers to visualize their effects on the application's behavior and runtime.

## **7.1.1 Real Application Run**

Figure [7.1](#page-88-0) (page [89\)](#page-88-0) shows the traces of the real partdiff-par application visualized with HDSunshot. The figure contains a screenshot of just the timeline window, all other parts of HDSunshot are excluded to save space. The five timelines represent the five clients executing the partdiff-par application. The [PVFS](#page-117-0) servers are not traced and are therefore not available in this figure. Each timeline contains a multitude of blocks that represent the different operations the clients perform internally. The colors on the client timelines have the following meanings:

- **Yellow:** The clients communicate with each other.
- **Orange:** The clients perform an [I/O](#page-116-0) operation.

#### <span id="page-88-0"></span> $\frac{1}{1.00}$  $\frac{1}{0.80}$  $\frac{1}{2.00}$  $0.40$  $\frac{1}{1.20}$  $\frac{1}{1.60}$  $\frac{1}{2.40}$  $\frac{1}{2.80}$  $\frac{1}{3.20}$  $\frac{1}{3.60}$

Figure 7.1: Real Application Run

## <span id="page-88-1"></span>**7.1.2 Simulated Application Run**

The following figures show the visualized traces of a simulated run of the partdiffpar application. The figures themselves are structured as follows: The first five timelines show the clients' activities, while the last five timelines show the servers' activities. The colors on the client timelines have the following meanings:

- **Turquoise:** The clients communicate with each other.
- **Blue:** The clients perform an [I/O](#page-116-0) operation.

The colors on the server timelines have the following meanings:

- **Green:** The [I/O](#page-116-0) subsystem performed an [I/O](#page-116-0) operation without seeking.
- **Yellow:** The [I/O](#page-116-0) subsystem performed an [I/O](#page-116-0) operation with a fast seek.
- **Red:** The [I/O](#page-116-0) subsystem performed an [I/O](#page-116-0) operation with a slow seek.

More information about the different operation types can be found in subsection [6.1.1](#page-60-1) (page [61\)](#page-60-1).

#### **No Cache**

Figure [7.2](#page-89-0) (page [90\)](#page-89-0) shows the visualized traces of the simulated partdiff-par application as simulated with the NoCache cache layer. Since no caching is used the clients have to wait for each write operation to finish before continuing. Therefore, the client timelines contain many long write operations. The server timelines contain many write operations with relatively large gaps between them. This is due to the fact that there are no cached operations that could be executed while the clients are computing.

<span id="page-89-0"></span>

Figure 7.2: Simulated Application Run — No Cache

#### **Simple Write-Behind Cache**

Figure [7.3](#page-89-1) shows the visualized traces of the simulated partdiff-par application as simulated with the SimpleWriteBehindCache cache layer. The clients do not have to wait for the actual write operations to finish before continuing and can compute without interruption. This also means that the servers can perform the write operations without waiting for new operations from the clients. As can be seen, the clients finish long before the servers. This means that the servers can not execute the write operations fast enough and therefore slow down the whole application.

<span id="page-89-1"></span>

Figure 7.3: Simulated Application Run — Simple Write-Behind Cache

In this case the application user would not realize this inefficiency, because it is hidden by the cache layer performing write-behind. Once the cache is full the application's performance degrades, because old operations need to be finished before it is possible to accept new ones.

### **Aggregation Cache**

Figure [7.4](#page-90-0) (page [91\)](#page-90-0) shows the visualized traces of the simulated partdiff-par application as simulated with the AggregationCache cache layer. As can be seen, the servers do not cause a longer runtime as opposed to the SimpleWriteBehind-Cache cache layer. Additionally, there are gaps between the write operations on the server timelines. This suggests that the clients' computation takes longer than the servers' [I/O](#page-116-0) operations, that is, the application's total runtime can not be improved further by speeding up the [I/O](#page-116-0) operations.

<span id="page-90-0"></span>

Figure 7.4: Simulated Application Run — Aggregation Cache

### **Server-Directed I/O**

Figures [7.5a](#page-91-1) (page [92\)](#page-91-1) and [7.5b](#page-91-2) (page [92\)](#page-91-2) show the visualized traces of the simulated partdiff-par application as simulated with the ServerDirectedIO cache layer.

The ServerDirectedIO cache layer in figure [7.5a](#page-91-1) (page [92\)](#page-91-1) is configured to not use delayed writes. Overall, the figure basically looks like figure [7.4.](#page-90-0) No further improvements are possible without the use of more advanced techniques.

The ServerDirectedIO cache layer in figure [7.5a](#page-91-1) (page [92\)](#page-91-1) is configured to use delayed writes. Using delayed writes leads to less and larger write operations. This can be seen in the form of larger continuous write operations and gaps in the server timelines. However, this does not reduce the application's runtime, because it is already at its minimum, dictated by the clients' computation time.

<span id="page-91-2"></span><span id="page-91-1"></span>

Figure 7.5: Simulated Application Run — Server-Directed I/O

## <span id="page-91-0"></span>**7.2 Interleaved Two-Phase**

The following figures show the visualized traces of the Interleaved Two-Phase protocol. The used application is equal to the one used in subsection [6.5.2](#page-74-0) (page [75\)](#page-74-0), except for the fact that only five clients and server are used. It uses the ServerDirectedIO cache layer, a data block size of 512 [KiB](#page-116-1) and a file size of 1 000[MiB.](#page-116-2)

The figures are structured as follows: Each of the ten timelines is split into three subtimelines. The first one shows the operations on the respective node. For the clients this only shows the collective [I/O](#page-116-0) operations, because they do not perform any other operations. The server subtimeline shows the actual [I/O](#page-116-0) operations performed by the [I/O](#page-116-0) subsystem. The colors on the server subtimeline mean the same as in subsection [7.1.2](#page-88-1) (page [89\)](#page-88-1). The second subtimeline shows received data and the third one shows sent data. The server timelines are actually split into four subtimelines, but the first one is always empty and ignored here. The first five

timelines show the clients' activities, while the last five timelines show the servers' activities. Additionally, the first three iterations are pointed out by dashed lines with the appropriate iteration number. For example, #1 signifies the end of the first iteration, and so on.

Figure [7.6a](#page-92-0) shows the Interleaved Two-Phase protocol used for read operations. The 25 iterations can be seen clearly by looking at the server timelines. Since the Two-Phase buffer is set to 8 [MiB,](#page-116-2) each server reads  $25 \cdot 8 = 200$  MiB, resulting in the 1 000[MiB](#page-116-2) being read completely by the five servers. Overall, there are a lot of gaps where both the clients and servers are idle, because the clients have to wait for the servers to read and send back the requested data and the servers can not do any work while waiting for the clients. Due to this the whole application takes about 8 s to complete.

<span id="page-92-0"></span>

Figure 7.6: Interleaved Two-Phase

Figure [7.6b](#page-93-0) (page [94\)](#page-93-0) shows the Interleaved Two-Phase protocol used for write operations. This time, the 25 iterations are not as clearly visible when looking at the servers' [I/O](#page-116-0) activity, because the servers continually write out data. Looking at the servers' receive subtimelines is useful here. As can be seen, the clients finish before the servers, because the clients finish as soon as the last iteration is sent to the servers. Overall, there are almost no gaps, because the clients do not have to wait for the servers and the servers can simply write out the data in the background. Due to this the application runtime is almost halved.

<span id="page-93-0"></span>

Figure 7.6: Interleaved Two-Phase Visualization

## **Summary**

HDSunshot can be used to visualize traces produced by [PIOsimHD](#page-116-5) and to compare traces of real-life applications with their simulated counterparts. It is also possible to evaluate different optimization techniques by analyzing the resulting traces with HDSunshot. Additionally, [PIOsimHD](#page-116-5) allows users to obtain traces of the data flow within the network, as opposed to existing tracing mechanisms.

# **Chapter 8**

# **Summary, Conclusion and Future Work**

This chapter summarizes and concludes the thesis. Additionally, work that may prove useful to be done in the future is presented. This mainly includes missing functionality in [PIOsimHD](#page-116-5) and the optimizations implemented in this thesis.

# **8.1 Summary and Conclusion**

The main focus of this thesis is to compare existing client-side optimizations and the newly implemented server-side optimizations like Server-Directed [I/O.](#page-116-0) Additionally, a modification of the Two-Phase protocol called Interleaved Two-Phase is proposed.

The results from section [6.6](#page-76-0) (page [77\)](#page-76-0) show that client-side optimizations like the Two-Phase protocol do not necessarily beat server-side optimizations in terms of performance. In fact, the server-side optimizations found in the AggregationCache and ServerDirectedIO cache layers deliver better performance in all comparable tests.

The results also suggest that even simple server-side optimizations like those in the AggregationCache cache layer are good enough for many use cases.

Integrating such optimizations into parallel cluster file systems could alleviate the need for sophisticated client-side optimizations. Additionally, due to their additional knowledge of internal workflows server-side optimizations may be better suited to provide high performance in general.

Modifications of the Two-Phase protocol also promise better performance. An example of a straightforward modification of the original Two-Phase protocol is the so-called Interleaved Two-Phase protocol. The Interleaved Two-Phase protocol beats its unmodified counterpart in all tests, but still performs worse than the server-side optimizations.

Visualizing the application traces is useful to comprehend the inner workings of distributed systems and the influence of [I/O](#page-116-0) optimizations.

# **8.2 Future Work**

Even though the implementation of Server-Directed [I/O](#page-116-0) is promising a lot of work remains to be done, both for the Server-Directed [I/O](#page-116-0) cache layer and [PIOsimHD](#page-116-5) itself. The following is a list of features that would be interesting to implement.

At the moment the Server-Directed [I/O](#page-116-0) cache layer does not influence the order in which the clients send their data. Clients first announce their write operations and then send their data when this announcement is acknowledged. This could be used to further increase performance, because data could be received in the order in which it is needed, avoiding needless buffering. For completeness this should be implemented.

Server-Directed [I/O](#page-116-0) should make better use of the read optimization's data sieving support. For example, the maximum hole size could be dynamically determined by either using the respective sizes of the involved read requests, or by estimating the number of potential merge operations that can be performed with a given hole size. A static hole size often delivers greatly varying performance, depending on the use case. For this reason this particular optimization is disabled for now.

The cache layers do not cope well with memory exhaustion at the moment. For example, too many write operations could fill up the whole main memory, causing read operations to be deferred. This can also be potentially used to starve read operations by sending many large write operations. This situation gets worse when the [I/O](#page-116-0) subsystem is slower than the network and large files are processed.

The Aggregation and Server-Directed [I/O](#page-116-0) cache layers are currently too slow to be used with massive amounts of operations. For example, using a data block size of 512 Bytes and reading or writing a 1 000[MiB](#page-116-2) file takes too long. This is mostly due to their inefficient handling of their internal operation queues. However, several starting points exist to improve their performance. This should be done to allow simulation of larger long-running applications with huge numbers of simulation events.

[PIOsimHD-](#page-116-5)Simulator should support priorities for read and write operations. The cache layers could use this information to make sure that no operation waits in the queue for too long. For example, this could be solved by raising the priority based on the time an operation has been waiting. This should be a relatively easy to achieve by extending the IOJob interface.

The implementation of the Two-Phase protocol could be optimized to use double buffering. Currently the Two-Phase buffer is first filled with data and then this data is distributed to the other clients or written to disk. This could be optimized by using two Two-Phase buffers in an alternating fashion, that is, the second buffer could already be filled while the data of the first buffer is still being sent. Depending on the workload and hardware characteristics this could potentially double the performance.

Additionally, it may prove useful to improve the logic used to decide whether to make use of the Two-Phase protocol when performing collective [I/O.](#page-116-0) For example, this new logic could also use information about the underlying [I/O](#page-116-0) subsystem. This could be integrated into the new Interleaved Two-Phase protocol.

A component simulating the [RAM](#page-117-1) of the nodes is missing in [PIOsimHD.](#page-116-5) For example, the latency caused by [RAM](#page-117-1) accesses is currently not simulated at all. Additionally, this would make it possible to implement a real read cache in the cache layers themselves.

[PIOsimHD](#page-116-5) currently only includes a component for simulating a simple abstraction of [SSDs](#page-117-2). However, current [SSDs](#page-117-2) are very complex. For example, read and write operations use different block sizes and write operations need to consider the erase block size, because this can have a significant impact on performance.

Additional benchmarks using [SSDs](#page-117-2) as the underlying [I/O](#page-116-0) subsystem would be interesting to perform. It would be especially interesting to see a comparison of how the different optimizations behave when using [HDDs](#page-116-7) and [SSDs](#page-117-2) respectively.

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# **Appendices**

# **Appendix A**

# **Used Tools**

- TeX Live<sup>[1](#page-101-0)</sup>
	- **–** T<sub>E</sub>X distribution used to compile the L<sup>A</sup>T<sub>E</sub>X sources.
- BibTe $X^2$  $X^2$ 
	- **–** Reference management software used to organize the bibliography.
- $Vim<sup>3</sup>$  $Vim<sup>3</sup>$  $Vim<sup>3</sup>$ 
	- **–** Advanced text editor used to write the L<sup>A</sup>T<sub>E</sub>X sources.
- VIM-L<sup>A</sup>T<sub>E</sub>X<sup>[4](#page-101-3)</sup>
	- **–** Vim addon providing LATEX support.
- OpenOffice.org<sup>[5](#page-101-4)</sup> Draw
	- **–** Drawing application used to produce the figures.
- $\cdot$  unoconv $^{6}$  $^{6}$  $^{6}$ 
	- **–** Conversion application used to automatically convert OpenOffice.org drawings to  $PDF<sup>7</sup>$  $PDF<sup>7</sup>$  $PDF<sup>7</sup>$ .
- Graphviz $8$ 
	- **–** Graph visualization software used to produce state machine figures.
- Git $9$ 
	- **–** Distributed version control system used to manage the L<sup>A</sup>T<sub>E</sub>X sources.

<span id="page-101-1"></span><sup>2</sup>BibTeX is part of TeX Live.

<span id="page-101-0"></span><sup>1</sup>TeX Live is available at <http://www.tug.org/texlive/>.

<span id="page-101-2"></span> $3$ Vim is available at <http://www.vim.org/>.

<span id="page-101-3"></span> $4$ VIM-LAT<sub>E</sub>X is available at <http://vim-latex.sourceforge.net/>.

<span id="page-101-4"></span><sup>5</sup>OpenOffice.org is available at <http://www.openoffice.org/>.

<span id="page-101-5"></span> $6$ unoconv is available at <http://dag.wieers.com/home-made/unoconv/>.

<span id="page-101-6"></span><sup>7</sup>Portable Document Format

<span id="page-101-7"></span><sup>8</sup>Graphviz is available at <http://www.graphviz.org/>.

<span id="page-101-8"></span><sup>9</sup>Git is available at <http://git-scm.com/>.

# **Appendix B**

# **Usage Instructions**

## **B.1 Source Code Repository**

### **B.1.1 Setup**

**Cloning** The git svn clone command clones the given [SVN](#page-117-3)<sup>[1](#page-102-0)</sup> repository and converts it into a  $\mathrm{Git}^2$  $\mathrm{Git}^2$  repository.

```
$ git svn clone \
 svn+ssh://user@pvs-cluster.informatik.uni-heidelberg.de\
 /home/sighpio/PIOsimHD
```
**.gitignore** The .gitignore file causes Git to ignore certain files.

Listing [B.1](#page-102-2) shows the .gitignore file for the [PIOsimHD](#page-116-5) repository. It causes Git to ignore all trace files produced by [PIOsimHD-](#page-116-5)Simulator.

Listing B.1: PIOsimHD-Simulator/.gitignore

<span id="page-102-2"></span> $1$  | run-trace\*

### **B.1.2 Committing and Updating**

**Committing Locally** The git add -i command is used to add changes to Git's index. The git commit command creates a commit containing these changes.

```
$ git add -i
$ git commit
```
<span id="page-102-0"></span><sup>&</sup>lt;sup>1</sup>Subversion

<span id="page-102-1"></span><sup>2</sup>Git is available at <http://git-scm.com/>.

**Committing Remotely** The git svn dcommit command puts the local Git commit into the [SVN](#page-117-3) repository. The git stash commands are needed, because git svn dcommit needs a clean working tree.

\$ git stash \$ git svn dcommit \$ git stash pop

**Updating** The git svn rebase command updates the repository to the current [SVN](#page-117-3) revision. The git stash commands are needed, because git svn rebase needs a clean working tree.

```
$ git stash
$ git svn rebase
$ git stash pop
```
## **B.2 PIOsimHD-Simulator**

### **partdiff-par**

Executing CommandLineInterface.java with the following arguments runs the partdiff-par benchmark from section [6.8](#page-82-0) (page [83\)](#page-82-0).

Listing [B.2](#page-103-0) shows CommandLineInterface arguments used to simulate a run of the partdiff-par application.

```
Listing B.2: CommandLineInterface Arguments
```
<span id="page-103-0"></span>1  $-i$  ../HDTraceFormat/Example/partdiff-mpi-io-synced/pvs-cluster-model ,→ .xml --load-program-on-demand

# **B.3 HDTrace**

## **B.3.1 Setup**

### **MPD**

[MPD](#page-116-9) $^3$  $^3$  is a daemon that allows [MPI](#page-116-3) applications to be distributed and executed on several machines — a so-called [MPD](#page-116-9) ring.

<span id="page-103-1"></span><sup>3</sup>Multi-Purpose Daemon

**Configuration** The .mpd.conf file contains the [MPD](#page-116-9) password.

```
$ touch .mpd.conf
$ chmod 600 .mpd.conf
$ echo 'MPD_SECRETWORD=42' > .mpd.conf
```
**Participating Machines** The mpd.hosts file contains the hostnames of all machines participating in the [MPD](#page-116-9) ring.

```
$ echo 'node01' > mpd.hosts
$ echo 'node02' >> mpd.hosts
$ echo 'node03' >> mpd.hosts
```
#### **HDTrace**

The module command loads all configuration settings — like environment variables — to use the [PIOsimHD](#page-116-5) framework for tracing.

\$ module load hdtrace/1.0

#### **B.3.2 Compiling and Executing**

**Compiling** The following commands compile the b\_eff\_io benchmark application using the mpicc compiler.

\$ tar xf b\_eff\_io\_v2.1.tar.gz \$ cd b\_eff\_io \$ mpicc -lm -o b\_eff\_io b\_eff\_io.c

**Executing** The mpdboot command starts a [MPD](#page-116-9) ring. The mpirun command starts the b\_eff\_io application on the [MPD](#page-116-9) ring.

```
$ mpdboot -n 3 -f mpd.hosts
$ mpirun -n 3 ./b_eff_io
```
**Cleanup** The mpdallexit command shuts down the [MPD](#page-116-9) ring.

\$ mpdallexit

# **Appendix C**

# **Evaluation Results**

It is important to note that these results represent the aggregated throughput. The figures in chapter [6](#page-60-0) (page [61\)](#page-60-0) use per-client throughput. Therefore, the results below must be divided by 10 when comparing them with the figures.

# **C.1 Random I/O Test**

```
NoCache
 5120 READ 1048576000 B, 480.43993272859996 s (0.40954037050021325 s)
 5120 READ 2.0814256515286353 MB/s
 5120 WRITE 1048576000 B, 379.74895692810003 s (0.5796268021213603 s)
 5120 WRITE 2.6333186220952163 MB/s
 51200 READ 1048576000 B, 70.3209508305 s (0.2461663978933605 s)
 51200 READ 14.22051306459688 MB/s
 51200 WRITE 1048576000 B, 62.064023903499994 s (0.33664790269020894 s)
 51200 WRITE 16.112393897547573 MB/s
 524288 READ 1048576000 B, 23.3586019284 s (0.05966495834943108 s)
 524288 READ 42.81078135862977 MB/s
 524288 WRITE 1048576000 B, 23.391223519500002 s (0.04309578760319361 s)
 524288 WRITE 42.75107709378066 MB/s
SimpleWriteBehindCache
 5120 READ 1048576000 B, 480.43993272859996 s (0.40954037050021325 s)
 5120 READ 2.0814256515286353 MB/s
 5120 WRITE 1048576000 B, 300.2951743493 s (0.26085124337011006 s)
 5120 WRITE 3.330056842128309 MB/s
 51200 READ 1048576000 B, 70.3209508305 s (0.2461663978933605 s)
 51200 READ 14.22051306459688 MB/s
 51200 WRITE 1048576000 B, 53.18417199830001 s (0.23894914448050142 s)
 51200 WRITE 18.802586604750832 MB/s
 524288 READ 1048576000 B, 23.3586019284 s (0.05966495834943108 s)
 524288 READ 42.81078135862977 MB/s
 524288 WRITE 1048576000 B, 23.372220795599997 s (0.09325321500748063 s)
```

```
524288 WRITE 42.785835746864834 MB/s
AggregationCache
  5120 READ 1048576000 B, 480.2652491281 s (0.5114650114861422 s)
  5120 READ 2.0821827142718634 MB/s
  5120 WRITE 1048576000 B, 35.0486731206 s (0.0809730654070207 s)
  5120 WRITE 28.531750590359607 MB/s
  51200 READ 1048576000 B, 70.14761168519999 s (0.2261228904126729 s)
  51200 READ 14.2556528437159 MB/s
  51200 WRITE 1048576000 B, 7.8072400707 s (0.04723829342018465 s)
  51200 WRITE 128.08623674234468 MB/s
  524288 READ 1048576000 B, 23.2630255663 s (0.09417641088986031 s)
  524288 READ 42.98666986157857 MB/s
  524288 WRITE 1048576000 B, 4.0203020197 s (0.03879319908671092 s)
  524288 WRITE 248.73753143417352 MB/s
ServerDirectedIO
  5120 READ 1048576000 B, 470.54163953590006 s (1.0166849689938773 s)
  5120 READ 2.125210429806616 MB/s
  5120 WRITE 1048576000 B, 28.2049480228 s (0.15768397860774702 s)
  5120 WRITE 35.45477194964625 MB/s
  51200 READ 1048576000 B, 69.24346647129998 s (0.1613120203687557 s)
  51200 READ 14.441795752881317 MB/s
  51200 WRITE 1048576000 B, 6.839998547799999 s (0.05849529045609294 s)
  51200 WRITE 146.19886144882847 MB/s
  524288 READ 1048576000 B, 23.068002521300002 s (0.17455843410094402 s)
  524288 READ 43.35009063210579 MB/s
  524288 WRITE 1048576000 B, 3.5731329932 s (0.02568778555751315 s)
  524288 WRITE 279.86643707443625 MB/s
```
## **C.2 Individual I/O Test**

#### **C.2.1 Contiguous Access — 1 Operation**

```
NoCache
 5120 READ 1048576000 B, 146.027949339 s
 5120 READ 6.848004128843353 MB/s
 5120 WRITE 1048576000 B, 119.094858293 s
 5120 WRITE 8.39666812096771 MB/s
 51200 READ 1048576000 B, 21.773296 s
 51200 READ 45.92781910465003 MB/s
 51200 WRITE 1048576000 B, 21.45670225 s
 51200 WRITE 46.60548430735669 MB/s
```

```
524288 READ 1048576000 B, 10.278591798 s
  524288 READ 97.28959177020525 MB/s
  524288 WRITE 1048576000 B, 10.280323109 s
  524288 WRITE 97.27320721316056 MB/s
SimpleWriteBehindCache
  5120 READ 1048576000 B, 146.027949339 s
  5120 READ 6.848004128843353 MB/s
  5120 WRITE 1048576000 B, 92.950948768 s
  5120 WRITE 10.758362483162383 MB/s
  51200 READ 1048576000 B, 21.773296 s
  51200 READ 45.92781910465003 MB/s
  51200 WRITE 1048576000 B, 14.580759687 s
  51200 WRITE 68.5835320975481 MB/s
  524288 READ 1048576000 B, 10.278591798 s
  524288 READ 97.28959177020525 MB/s
  524288 WRITE 1048576000 B, 9.931221594 s
  524288 WRITE 100.69254728986768 MB/s
AggregationCache
  5120 READ 1048576000 B, 154.06681688 s
  5120 READ 6.490690339756178 MB/s
  5120 WRITE 1048576000 B, 18.541083015 s
  5120 WRITE 53.93428200450781 MB/s
  51200 READ 1048576000 B, 20.305640744 s
  51200 READ 49.24739941020991 MB/s
  51200 WRITE 1048576000 B, 3.505185092 s
  51200 WRITE 285.29163902994253 MB/s
  524288 READ 1048576000 B, 4.885013716 s
  524288 READ 204.7077159117643 MB/s
  524288 WRITE 1048576000 B, 2.027372673 s
  524288 WRITE 493.24922512655377 MB/s
ServerDirectedIO
  5120 READ 1048576000 B, 146.10821002 s
  5120 READ 6.844242358886713 MB/s
  5120 WRITE 1048576000 B, 18.546249682 s
  5120 WRITE 53.9192568387854 MB/s
  51200 READ 1048576000 B, 19.433986418 s
  51200 READ 51.45624672629119 MB/s
  51200 WRITE 1048576000 B, 3.508523379 s
  51200 WRITE 285.02018997092165 MB/s
  524288 READ 1048576000 B, 2.043356537 s
  524288 READ 489.3908536726402 MB/s
```
524288 WRITE 1048576000 B, 2.027372673 s 524288 WRITE 493.24922512655377 MB/s

#### **C.2.2 Non-Contiguous Access — 100 Operations**

```
NoCache
  5120 READ 1048576000 B, 117.746240842 s
  5120 READ 8.492840135269105 MB/s
  5120 WRITE 1048576000 B, 117.887454933 s
  5120 WRITE 8.482666799180105 MB/s
  51200 READ 1048576000 B, 21.85244504 s
  51200 READ 45.761469628205965 MB/s
  51200 WRITE 1048576000 B, 26.261753244 s
  51200 WRITE 38.078188866863606 MB/s
  524288 READ 1048576000 B, 10.414065977 s
  524288 READ 96.02397394145105 MB/s
  524288 WRITE 1048576000 B, 15.241344531 s
  524288 WRITE 65.61100944644737 MB/s
SimpleWriteBehindCache
  5120 READ 1048576000 B, 117.746240842 s
  5120 READ 8.492840135269105 MB/s
  5120 WRITE 1048576000 B, 117.861254075 s
  5120 WRITE 8.484552517688794 MB/s
  51200 READ 1048576000 B, 21.85244504 s
  51200 READ 45.761469628205965 MB/s
  51200 WRITE 1048576000 B, 27.254636535 s
  51200 WRITE 36.69100480264394 MB/s
  524288 READ 1048576000 B, 10.414065977 s
  524288 READ 96.02397394145105 MB/s
  524288 WRITE 1048576000 B, 15.241344531 s
  524288 WRITE 65.61100944644737 MB/s
AggregationCache
  5120 READ 1048576000 B, 9.751169836 s
  5120 READ 102.5517980733076 MB/s
  5120 WRITE 1048576000 B, 2.030927439 s
  5120 WRITE 492.3858828222764 MB/s
  51200 READ 1048576000 B, 3.120902 s
  51200 READ 320.4201862153954 MB/s
  51200 WRITE 1048576000 B, 2.082627976 s
  51200 WRITE 480.16256937095903 MB/s
  524288 READ 1048576000 B, 2.231920598 s
  524288 READ 448.04461274119217 MB/s
```

```
524288 WRITE 1048576000 B, 2.043116687 s
 524288 WRITE 489.448305308663 MB/s
ServerDirectedIO
 5120 READ 1048576000 B, 6.476519658 s
 5120 READ 154.4039164252005 MB/s
 5120 WRITE 1048576000 B, 2.030927439 s
 5120 WRITE 492.3858828222764 MB/s
 51200 READ 1048576000 B, 3.402955863 s
 51200 READ 293.8621716704881 MB/s
 51200 WRITE 1048576000 B, 2.082627976 s
 51200 WRITE 480.16256937095903 MB/s
 524288 READ 1048576000 B, 2.255097161 s
 524288 READ 443.4398735868924 MB/s
 524288 WRITE 1048576000 B, 2.030179569 s
 524288 WRITE 492.5672661027553 MB/s
```
#### **C.2.3 Non-Contiguous Access — All Operations**

```
NoCache
  5120 READ 1048576000 B, 117.828092033 s
  5120 READ 8.48694044642538 MB/s
  5120 WRITE 1048576000 B, 122.735387396 s
  5120 WRITE 8.147609432099209 MB/s
  51200 READ 1048576000 B, 21.934033634 s
  51200 READ 45.59124950232125 MB/s
  51200 WRITE 1048576000 B, 26.504183134 s
  51200 WRITE 37.72989323776531 MB/s
  524288 READ 1048576000 B, 10.351081997 s
  524288 READ 96.60825798595981 MB/s
  524288 WRITE 1048576000 B, 15.240600495 s
  524288 WRITE 65.6142125323783 MB/s
SimpleWriteBehindCache
  5120 READ 1048576000 B, 117.828092033 s
  5120 READ 8.48694044642538 MB/s
  5120 WRITE 1048576000 B, 122.908887398 s
  5120 WRITE 8.136108146206132 MB/s
  51200 READ 1048576000 B, 21.934033634 s
  51200 READ 45.59124950232125 MB/s
  51200 WRITE 1048576000 B, 26.504183135 s
  51200 WRITE 37.729893236341766 MB/s
  524288 READ 1048576000 B, 10.351081997 s
  524288 READ 96.60825798595981 MB/s
```

```
524288 WRITE 1048576000 B, 15.240600495 s
  524288 WRITE 65.6142125323783 MB/s
AggregationCache
  5120 READ 1048576000 B, 2.125372651 s
  5120 READ 470.505724974627 MB/s
  5120 WRITE 1048576000 B, 2.036433315 s
  5120 WRITE 491.05462606321584 MB/s
  51200 READ 1048576000 B, 2.123721621 s
  51200 READ 470.87150693937394 MB/s
  51200 WRITE 1048576000 B, 2.031638057 s
  51200 WRITE 492.2136581142022 MB/s
  524288 READ 1048576000 B, 2.134629005 s
  524288 READ 468.4654793210777 MB/s
  524288 WRITE 1048576000 B, 2.043177719 s
  524288 WRITE 489.4336849412364 MB/s
ServerDirectedIO
  5120 READ 1048576000 B, 2.1351463649999998 s
  5120 READ 468.3519670558979 MB/s
  5120 WRITE 1048576000 B, 2.036433315 s
  5120 WRITE 491.05462606321584 MB/s
  51200 READ 1048576000 B, 2.132903426 s
  51200 READ 468.84448110028967 MB/s
  51200 WRITE 1048576000 B, 2.031638059 s
  51200 WRITE 492.2136576296536 MB/s
  524288 READ 1048576000 B, 2.1398960750000002 s
  524288 READ 467.3124137582242 MB/s
  524288 WRITE 1048576000 B, 2.029435533 s
  524288 WRITE 492.7478521684088 MB/s
```
## **C.3 Collective I/O Test**

### **C.3.1 Two-Phase**

```
NoCache
  5120 READ 1048576000 B, 5.867568858 s
  5120 READ 170.4283365395147 MB/s
  5120 WRITE 1048576000 B, 135.350505283 s
  5120 WRITE 7.388225096826439 MB/s
  51200 READ 1048576000 B, 5.839443908 s
  51200 READ 171.24918327068895 MB/s
  51200 WRITE 1048576000 B, 38.019368463 s
```

```
51200 WRITE 26.302383243771875 MB/s
  524288 READ 1048576000 B, 5.474242602 s
  524288 READ 182.67367245190277 MB/s
  524288 WRITE 1048576000 B, 25.231989084 s
  524288 WRITE 39.63223020868045 MB/s
SimpleWriteBehindCache
  5120 READ 1048576000 B, 5.867568858 s
  5120 READ 170.4283365395147 MB/s
  5120 WRITE 1048576000 B, 132.031460822 s
  5120 WRITE 7.573952403269728 MB/s
  51200 READ 1048576000 B, 5.839443908 s
  51200 READ 171.24918327068895 MB/s
  51200 WRITE 1048576000 B, 36.212464892 s
  51200 WRITE 27.61480067657362 MB/s
  524288 READ 1048576000 B, 5.474242602 s
  524288 READ 182.67367245190277 MB/s
  524288 WRITE 1048576000 B, 23.777266643 s
  524288 WRITE 42.05697883673264 MB/s
AggregationCache
  5120 READ 1048576000 B, 5.867568858 s
  5120 READ 170.4283365395147 MB/s
  5120 WRITE 1048576000 B, 2.775984705 s
  5120 WRITE 360.2325323330627 MB/s
  51200 READ 1048576000 B, 5.839443908 s
  51200 READ 171.24918327068895 MB/s
  51200 WRITE 1048576000 B, 2.769466451 s
  51200 WRITE 361.08038053283497 MB/s
  524288 READ 1048576000 B, 5.474242602 s
  524288 READ 182.67367245190277 MB/s
  524288 WRITE 1048576000 B, 2.8463754249999997 s
  524288 WRITE 351.32400006580303 MB/s
ServerDirectedIO
  5120 READ 1048576000 B, 5.88493782 s
  5120 READ 169.9253298142749 MB/s
  5120 WRITE 1048576000 B, 2.789814135 s
  5120 WRITE 358.44681817844474 MB/s
  51200 READ 1048576000 B, 5.851306495 s
  51200 READ 170.90200297224388 MB/s
  51200 WRITE 1048576000 B, 2.8092997889999998 s
  51200 WRITE 355.9605863053728 MB/s
  524288 READ 1048576000 B, 5.596070551 s
```
524288 READ 178.69681786290258 MB/s 524288 WRITE 1048576000 B, 2.918934791 s 524288 WRITE 342.59072970157354 MB/s

### **C.3.2 Interleaved Two-Phase**

```
NoCache
  5120 READ 1048576000 B, 4.782318441 s
  5120 READ 209.10359950662266 MB/s
  5120 WRITE 1048576000 B, 124.214700582 s
  5120 WRITE 8.050576906876273 MB/s
  51200 READ 1048576000 B, 4.842799575 s
  51200 READ 206.49213012289488 MB/s
  51200 WRITE 1048576000 B, 29.233955314 s
  51200 WRITE 34.206797857459435 MB/s
  524288 READ 1048576000 B, 4.566702312 s
  524288 READ 218.97639295915639 MB/s
  524288 WRITE 1048576000 B, 17.016398263 s
  524288 WRITE 58.76684269751568 MB/s
SimpleWriteBehindCache
  5120 READ 1048576000 B, 4.782318441 s
  5120 READ 209.10359950662266 MB/s
  5120 WRITE 1048576000 B, 123.464284581 s
  5120 WRITE 8.099508318488168 MB/s
  51200 READ 1048576000 B, 4.842799575 s
  51200 READ 206.49213012289488 MB/s
  51200 WRITE 1048576000 B, 27.969692393 s
  51200 WRITE 35.752985265231985 MB/s
  524288 READ 1048576000 B, 4.566702312 s
  524288 READ 218.97639295915639 MB/s
  524288 WRITE 1048576000 B, 15.838040735 s
  524288 WRITE 63.13912287080628 MB/s
AggregationCache
  5120 READ 1048576000 B, 4.665140413 s
  5120 READ 214.35582029071932 MB/s
  5120 WRITE 1048576000 B, 2.251897167 s
  5120 WRITE 444.0700111240914 MB/s
  51200 READ 1048576000 B, 4.180562118 s
  51200 READ 239.20228231853292 MB/s
  51200 WRITE 1048576000 B, 2.248735177 s
  51200 WRITE 444.6944265505213 MB/s
  524288 READ 1048576000 B, 4.331482415 s
```

```
524288 READ 230.8678425051392 MB/s
 524288 WRITE 1048576000 B, 2.207208941 s
 524288 WRITE 453.0608686040113 MB/s
ServerDirectedIO
 5120 READ 1048576000 B, 4.148568066 s
 5120 READ 241.04702733350308 MB/s
 5120 WRITE 1048576000 B, 2.195084736 s
 5120 WRITE 455.56327899316227 MB/s
 51200 READ 1048576000 B, 4.21927462 s
 51200 READ 237.00756411062903 MB/s
 51200 WRITE 1048576000 B, 2.186729407 s
 51200 WRITE 457.30395210256575 MB/s
 524288 READ 1048576000 B, 4.497086945 s
 524288 READ 222.36616997406082 MB/s
 524288 WRITE 1048576000 B, 2.164988756 s
 524288 WRITE 461.8961633073719 MB/s
```
### **C.4 Database I/O Test**

#### **C.4.1 Contiguous Access — 1 Operation**

```
NoCache
  512 READ 128000000 B, 15.248816146100001 s (0.20380218337377867 s)
  512 READ 8.005232100015869 MB/s
  512 WRITE 128000000 B, 12.7023798924 s (0.14625509091076325 s)
  512 WRITE 9.610034775690835 MB/s
  512 RW 128000000 B, 13.2885156322 s (0.15308890506887798 s)
  512 RW 9.186151100594406 MB/s
SimpleWriteBehindCache
  512 READ 128000000 B, 15.248816146100001 s (0.20380218337377867 s)
  512 READ 8.005232100015869 MB/s
  512 WRITE 128000000 B, 10.6350764841 s (0.26458582784259627 s)
  512 WRITE 11.478085059613962 MB/s
  512 RW 128000000 B, 10.5406452184 s (0.16086971773060044 s)
  512 RW 11.580914637645822 MB/s
AggregationCache
  512 READ 128000000 B, 15.248816146100001 s (0.20380218337377867 s)
  512 READ 8.005232100015869 MB/s
  512 WRITE 128000000 B, 10.615109818500002 s (0.26506907738117447 s)
  512 WRITE 11.49967495270336 MB/s
  512 RW 128000000 B, 10.5381344951 s (0.1632812950770421 s)
```
512 RW 11.583673804577082 MB/s ServerDirectedIO 512 READ 128000000 B, 15.3814292401 s (0.15593419792632227 s) 512 READ 7.936213897584876 MB/s 512 WRITE 128000000 B, 8.783565597 s (0.3087759709139298 s) 512 WRITE 13.897580789024076 MB/s 512 RW 128000000 B, 10.185301735499998 s (0.14414745586564162 s) 512 RW 11.984948082051842 MB/s **C.4.2 Non-Contiguous Access — 10 Operations** NoCache 512 READ 128000000 B, 1.1791882332999999 s (0.04768848491539928 s) 512 READ 103.52063313791889 MB/s 512 WRITE 128000000 B, 1.1786016051999997 s (0.04364732414330116 s) 512 WRITE 103.57215870182495 MB/s 512 RW 128000000 B, 1.1935244082 s (0.04876219865044266 s) 512 RW 102.27718148144027 MB/s SimpleWriteBehindCache 512 READ 128000000 B, 1.1791882332999999 s (0.04768848491539928 s) 512 READ 103.52063313791889 MB/s 512 WRITE 128000000 B, 1.1790767756 s (0.04043855024574582 s) 512 WRITE 103.53041890582719 MB/s 512 RW 128000000 B, 1.1769992763 s (0.04505433253442518 s) 512 RW 103.71315850230486 MB/s AggregationCache 512 READ 128000000 B, 1.1791882332999999 s (0.04768848491539928 s) 512 READ 103.52063313791889 MB/s 512 WRITE 128000000 B, 1.1755616720000002 s (0.04262144657833614 s) 512 WRITE 103.83999020002072 MB/s 512 RW 128000000 B, 1.1769992763 s (0.04505433253442518 s) 512 RW 103.71315850230486 MB/s ServerDirectedIO 512 READ 128000000 B, 1.2360401953 s (0.05519337068379282 s) 512 READ 98.75917705926403 MB/s 512 WRITE 128000000 B, 1.1049812159 s (0.040050454423372725 s) 512 WRITE 110.47274898747895 MB/s 512 RW 128000000 B, 1.1411116579000002 s (0.03621351549579512 s) 512 RW 106.97490614077792 MB/s

### **C.4.3 Non-Contiguous Access — All Operations**

NoCache 512 READ 128000000 B, 1.1543980794000002 s (0.0394784391535595 s) 512 READ 105.74368987468014 MB/s 512 WRITE 128000000 B, 1.2848065985 s (0.04108401400612664 s) 512 WRITE 95.01065190863433 MB/s 512 RW 128000000 B, 1.2361368582 s (0.06623419477593881 s) 512 RW 98.75145433148285 MB/s SimpleWriteBehindCache 512 READ 128000000 B, 1.1543980794000002 s (0.0394784391535595 s) 512 READ 105.74368987468014 MB/s 512 WRITE 128000000 B, 1.2828997951 s (0.04004674110205048 s) 512 WRITE 95.15186842046757 MB/s 512 RW 128000000 B, 1.2378648553 s (0.0662451082669207 s) 512 RW 98.61360226631196 MB/s AggregationCache 512 READ 128000000 B, 1.1543980794000002 s (0.0394784391535595 s) 512 READ 105.74368987468014 MB/s 512 WRITE 128000000 B, 1.1627331322 s (0.04246794069729553 s) 512 WRITE 104.9856662027266 MB/s 512 RW 128000000 B, 1.1596055462000003 s (0.05061499832368804 s) 512 RW 105.26882429979875 MB/s ServerDirectedIO 512 READ 128000000 B, 1.1086887981 s (0.03897905988644655 s) 512 READ 110.10331547427583 MB/s 512 WRITE 128000000 B, 1.1100156154999998 s (0.036601560409424215 s) 512 WRITE 109.97170742054305 MB/s 512 RW 128000000 B, 1.1253318360000002 s (0.051472910533868585 s) 512 RW 108.47494809522121 MB/s

# **List of Acronyms**





# **List of Figures**







## **List of Tables**



# **List of Listings**

