
Efficient Synchronization of Linux Memory Regions over a Network: A Comparative Study and Implementation

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Abstract

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1 Introduction

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2 Technology

2.1 The Linux Kernel

The open-source Linux kernel, was created by Linus Torvalds in 1991. Developed primarily in the C programming language, it has recently seen the addition of Rust as an approved language for further expansion and development, esp. of drivers[1]. The powers millions of devices across the globe, including servers, desktop computers, mobile phones, and embedded devices. It serves as an intermediary between hardware and applications, as an abstraction layer that simplifies the interaction between them. It is engineered for compatibility with a wide array of architectures, such as ARM, x86, RISC-V, and others.

The kernel does not function as a standalone operating system. This role is fulfilled by distributions, which build upon the Linux kernel to create fully-fledged operating systems[2]. Distributions supplement the kernel with additional userspace tools, examples being GNU coreutils or BusyBox. Depending on their target audience, they further enhance functionality by integrating desktop environments and other software.

The open-source nature of the Linux kernel makes it especially interesting for academic exploration and usage. It offers transparency, allowing anyone to inspect the source code in depth. Furthermore, it encourages collaboration by enabling anyone to modify and contribute to the source code. This transparency, coupled with the potential for customization and improvement, makes developing for the Linux kernel a good choice for this thesis.

2.2 Linux Kernel Modules

Linux is a extensible, but not a microkernel. Despite it's monolithic nature, it allows for the integration of kernel modules[2]. Kernel modules are small pieces of kernel-level code that can be dynamically incorporated into the kernel, presenting the advantage of extending kernel functionality without necessitating system reboots.

The dynamism of these modules comes from their ability to be loaded and unloaded into the running kernel as per user needs. This functionality aids in keeping the kernel size both manageable and maintainable, thereby promoting efficiency. Kernel modules are traditionally developed using the C programming language, like the kernel itself, ensuring compatibility and consistent performance.

Kernel modules interact with the kernel via APIs (Application Programming Interfaces). Despite their utility, since they run in kernel space, modules do carry a potential risk. If not written with careful attention to detail, they can introduce significant instability into the kernel, negatively affecting the overall system performance and reliability.

Modules can be managed and controlled at different stages, starting from boot time, and be manipulated dynamically when the system is already running. This is facilitated by utilities like `modprobe` and `rmmod`[3].

In the lifecycle of a kernel module, two key functions are of significance: initialization and cleanup. The initialization function is responsible for setting up the module when it's loaded into the kernel. Conversely, the cleanup function is used to safely remove the module from the kernel, freeing up any resources it previously consumed. These lifecycle functions, along with other such hooks, provide a more structured approach to module development.

2.3 UNIX Signals and Handlers

UNIX signals are an integral component of UNIX-like systems, including Linux. They function as software interrupts, notifying a process of significant occurrences, such as exceptions. Signals may be generated from various sources, including the kernel, user input, or other processes, making them a versatile tool for inter-process notifications.

Aside from this notification role, signals also serve as an asynchronous communication mechanism between processes or between the kernel and a process. As such, they have an inherent ability to deliver important notifications without requiring the recipient process to be in a specific state of readiness[4]. Each signal has a default action associated with it, the most common of which are terminating the process or simply ignoring the signal.

To customize how a process should react upon receiving a specific signal, handlers can be utilized. Handlers dictate the course of action a process should take when a signal is received. Using the `sigaction()` function, a handler can be installed for a specific signal, enabling a custom response to that signal such as reloading configuration, cleaning up resources before exiting or enabling verbose logging [5].

It is however important to note that signals are not typically utilized as a primary inter-process communication (IPC) mechanism. This is primarily due to their limitation in carrying additional data. While signals effectively alert a process of an event, they are not designed to convey further information related to that event; consequently, they are best used in scenarios where simple event-based notifications are sufficient, rather than for more complex data exchange requirements.

2.4 Principle of Locality

The principle of locality, or locality of reference, refers to the tendency of a processor in a computer system to recurrently access the same set of memory locations within a brief span of time. This principle forms the basis of a predictable pattern of behavior that is evident across computer systems, and can be divided into two distinct types: temporal locality and spatial locality[6].

Temporal locality revolves around the frequent use of particular data within a limited time period. Essentially, if a memory location is accessed once, it is probable that this same location will be accessed again in the near future. To leverage this pattern and improve performance, computer systems are designed to maintain a copy of this frequently accessed data in a faster memory storage, which in turn, significantly reduces the latency in subsequent references.

Spatial locality, on the other hand, refers to the use of data elements that are stored in nearby locations. That is, once a particular memory location is accessed, the system assumes that other nearby locations are also likely to be accessed shortly. Therefore, to optimize performance, the system tries to anticipate these subsequent accesses by preparing for faster access to these nearby memory locations. Temporal locality is considered a unique instance of spatial locality, demonstrating how the two types are closely interlinked.

A specific instance of spatial locality, termed sequential locality, occurs when the data elements are organized and accessed in a linear sequence. An example of this is when elements in a one-dimensional array are traversed systematically, accessing the elements one by one in their sequential order.

Locality of reference can be instrumental in improving the overall performance of a system. To achieve this, a variety of optimization techniques are deployed, such as caching, which stores copies of frequently accessed data in quick-access memory, and prefetching for memory, which involves loading potential future data into cache before it's actually needed.

2.5 Memory Hierarchy

The memory hierarchy in computers is an organized structure based on factors such as size, speed, cost, and proximity to the Central Processing Unit (CPU). It follows the principle of locality, which suggests that data and instructions that are accessed frequently should be stored as close to the CPU as possible[7]. This principle is crucial primarily due to the limitations of “the speed of the cable”, where both throughput and latency decrease as distance increases due to factors like signal dampening and the finite speed of light.

TODO: Add graphic of the memory hierarchy

At the top of the hierarchy are registers, which are closest to the CPU. They offer very high speed, but provide limited storage space, typically accommodating 32-64 bits of data. These registers are used

by the CPU to perform operations.

Following registers in the hierarchy is cache memory, typically divided into L1, L2, and L3 levels. As the level increases, each layer becomes larger and less expensive. Cache memory serves as a buffer for frequently accessed data, with predictive algorithms typically optimizing its usage.

Main Memory, i.e. Random Access Memory (RAM), provides larger storage capacity than cache but operates at a slower speed. It typically stores running programs and open files.

Below main memory, we find secondary storage devices such as Solid State Drives (SSD) or Hard Disk Drives (HDD). Although slower than RAM, these devices can store larger amounts of data and typically contain the operating system and application binary files. Importantly, they are persistent, meaning they retain data even after power is cut.

Tertiary storage, including optical disks and tape, is slow but very cost-effective. Tape storage can store very large amounts of data for long periods of time. These types of storage are typically used for archiving or physically transporting data, such as importing data from personal infrastructure to a service like AWS[8].

The memory hierarchy is not static but evolves with technological advancements, leading to some blurring of these distinct layers[9]. For instance, Non-Volatile Memory Express (NVMe) storage technologies can rival the speed of RAM while offering greater storage capacities. Similarly, some research, such as the work presented in this thesis, further challenges traditional hierarchies by exposing tertiary or secondary storage with the same interface as main memory.

2.6 Memory Management in Linux

Memory management forms a cornerstone of any operating system, serving as a critical buffer between applications and physical memory. Arguably, it can be considered one of the fundamental purposes of an operating system itself. This system helps maintain system stability and provides security guarantees, such as ensuring that only a specific process can access its allocated memory.

Within the context of the Linux operating system, memory management is divided into two major segments: kernel space and user space.

Kernel space is where the kernel itself and kernel modules operate. The kernel memory module is responsible for managing this segment. Slab allocation is a technique employed in kernel space management; this technique groups objects of the same size into caches, enhancing memory allocation speed and reducing fragmentation of memory[10].

User space is the memory segment where applications and certain drivers store their memory[11]. User space memory management involves a paging system, offering each application its unique private virtual address space.

This virtual address space is divided into units known as pages, each typically 4 KB in size. These pages can be mapped to any location in physical memory, providing flexibility and optimizing memory utilization. The use of this virtual address space further adds a layer of abstraction between the application and the physical memory, enhancing the security and isolation of processes.

2.7 Swap Space

Swap space refers to a designated portion of the secondary storage utilized as virtual memory in a computer system[11]. This feature plays a crucial role in systems that run multiple applications simultaneously. When memory resources are strained, swap space comes into play, relocating inactive parts of the RAM to secondary storage. This action frees up space in primary memory for other processes, enabling smoother operation and preventing a potential system crash.

In the case of Linux, swap space implementation aligns with a demand paging system. This means that memory is allocated only when required. The swap space in Linux can be a swap partition, which is a distinct area within the secondary storage, or it can take the form of a swap file, which is a standard file that can be expanded or truncated based on need. The usage of swap partitions and files is transparent to the user.

The Linux kernel employs a Least Recently Used (LRU) algorithm to determine which memory pages should be moved to swap space. This algorithm effectively prioritizes pages based on their usage, transferring those that have not been recently used to swap space.

Swap space also plays a significant role in system hibernation. Before the system enters hibernation, the content of RAM is stored in the swap space, where it remains persistent even without power. When the system is resumed, the memory content is read back from swap space, restoring the system to its pre-hibernation state[12].

However, the use of swap space can impact system performance. Since secondary storage devices are usually slower than primary memory, heavy reliance on swap space can cause significant system slowdowns. To mitigate this, Linux allows for the adjustment of “swappiness”, a parameter that controls the system’s propensity to swap memory pages. Adjusting this setting can balance the use of swap space to maintain system performance while still preserving the benefits of virtual memory management.

2.8 Page Faults

Page faults are instances in which a process attempts to access a page that is not currently available in primary memory. This situation triggers the operating system to swap the necessary page from

secondary storage into primary memory. These are significant events in memory management, as they determine how efficiently an operating system utilizes its resources.

Page faults can be broadly categorized into two types: minor and major. Minor page faults occur when the desired page resides in memory but isn't linked to the process that requires it. On the other hand, a major page fault takes place when the page has to be loaded from secondary storage, a process that typically takes more time and resources[3].

To minimize the occurrence of page faults, memory management algorithms such as the aforementioned Least Recently Used (LRU) and the more straightforward clock algorithm are often employed. These algorithms effectively manage the order and priority of memory pages, helping to ensure that frequently used pages are readily available in primary memory.

Handling page faults involves certain techniques to ensure smooth operation. One such technique is prefetching, which anticipates future page requests and proactively loads these pages into memory. Another approach involves page compression, where inactive pages are compressed and stored in memory preemptively[13]. This reduces the likelihood of major page faults by conserving memory space, allowing more pages to reside in primary memory.

In general, handling page faults is a task delegated to the kernel. This critical balance between resource availability and system performance is part of the kernel's memory management duties, ensuring that processes can access the pages they require while maintaining efficient use of system memory.

2.9 mmap

`mmap` is a versatile UNIX system call, used for mapping files or devices into memory, enabling a variety of core tasks like shared memory, file I/O, and fine-grained memory allocation. Due to its powerful nature, it is commonly harnessed in applications like databases.

One standout feature of `mmap` is its ability to create what is essentially a direct memory mapping between a file and a region of memory[14]. This connection means that read operations performed on the mapped memory region directly correspond to reading the file and vice versa, enhancing efficiency by reducing the overhead as the necessity for context switches (compared to i.e. the `read` or `write` system calls) diminishes.

The key advantage that `mmap` provides is the capacity to facilitate zero-copy operations. In practical terms, this signifies data can be accessed directly as if it were positioned in memory, eliminating the need to copy it from the disk first. This direct memory access saves time and reduces processing requirements, offering substantial performance improvements.

`mmap` is also proficient in sharing memory between processes without having to pass through the

kernel with system calls[4]. With this feature, `mmap` can create shared memory spaces where multiple processes can read and write, enhancing interprocess communication and data transfer efficiency.

The potential speed improvement does however come with a notable drawback: It bypasses the file system cache, which can potentially result in stale data when multiple processes are reading and writing simultaneously. This bypass may lead to a scenario where one process modifies data in the `mmap` region, and another process that is not monitoring for changes might remain unaware and continue to work with outdated data.

2.10 `inotify`

The `inotify` is an event-driven notification system of the Linux kernel, designed to monitor the file system for different events, such as modifications and accesses, among others[15]. Its particularly useful because it can be configured to watch only write operations on certain files, i.e. only `write` operations. This level of control can offer considerable benefits in cases where there is a need to focus system resources on certain file system events, and not on others.

Naturally, `inotify` comes with some recognizable advantages. Significantly, it diminishes overhead and resource use when compared to polling strategies. Polling is an operation-heavy approach as it continuously checks the status of the file system, regardless of whether any changes have occurred. In contrast, `inotify` works in a more event-driven way, where it only takes action when a specific event actually occurs. This is usually more efficient, reducing overhead especially where there are infrequent changes to the file system.

Thanks to its efficiency and flexibility, `inotify` has found its utilization across many applications, especially in file synchronization services. In this usecase, the ability to instantly notify the system of file changes aids in instant synchronization of files, demonstrating how critical its role can be in real-time or near real-time systems that are dependent on keeping data up-to-date.

However, as is the case with many system calls, there is a limit to its scalability. `inotify` is constrained by a limit on how many watches can be established. This limitation can pose challenges in intricate systems where there is a high quantity of files or directories to watch for, and might warrant additional management or fallback to heavier polling mechanisms for some parts of the system.

2.11 Linux Kernel Caching

Caching is a key feature of the Linux kernel that work to boost efficiency and performance. Within this framework, there are two broad categories: disk caching and file caching.

Disk caching in Linux is a strategic method that temporarily stores frequently accessed data in RAM. It is implemented through the page cache subsystem, and operates under the assumption that data

situated near data that has already been accessed will be needed soon. By retaining data close to the CPU where it may be swiftly accessed without costly disk reads can greatly reduce overall access time. The data within the cache is also managed using the LRU algorithm, which prunes the least recently used items first when space is needed.

Linux also caches file system metadata in specialized structures known as the `dentry` and `inode` caches. This metadata encompasses varied information such as file names, attributes, and locations. The key benefit of this is that it expedites the resolution of path names and file attributes, such as tracking when files were last changed for polling. Notably, file read/write operations are also channeled through the disk cache, further illustrating the intricate interconnectedness of disk and file caching mechanisms in the Linux Kernel.

While such caching mechanisms can improve performance, they also introduce complexities. One such complexity involves maintaining data consistency between the disk and cache through the process known as writebacks; aggressive writebacks, where data is copied back to disk frequently, can lead to reduced performance, while excessive delays may risk data loss if the system crashes before data has been saved.

Another complexity arises from the necessity to release cached data under memory pressure, known as cache eviction. This requires sophisticated algorithms, such as LRU, to ensure effective utilization of available cache space[3]. Prioritizing what to keep in cache when memory pressure builds does directly impact the overall system performance.

2.12 TCP, UDP and QUIC

TCP (Transmission Control Protocol), UDP (User Datagram Protocol), and QUIC (Quick UDP Internet Connections) are three key communication protocols utilized in the internet today.

TCP has long been the reliable backbone for internet communication due to its connection-oriented nature [16]. It ensures the guaranteed delivery of data packets and their correct order, rendering it a highly dependable means for data transmission. Significantly, TCP incorporates error checking, allowing the detection and subsequent retransmission of lost packets. TCP also includes a congestion control mechanism to manage data transmission seamlessly during high traffic. Due to these features and its long legacy, TCP is widely used to power the majority of the web where reliable, ordered, and error-checked data transmission is required.

UDP is a connectionless protocol that does not make the same guarantees about the reliability or ordered delivery of data packets [17]. This lends UDP a speed advantage over TCP, resulting in less communication overhead. Although it lacks TCP's robustness in handling errors and maintaining data order, UDP finds use in applications where speed and latency take precedence over reliability. This in-

cludes online gaming, video calls, and other real-time communication modes where quick data transmission is crucial even if temporary packet loss occurs.

QUIC, a modern UDP-base transport layer protocol, was originally created by Google and standardized by the IETF in 2021[18]. It aspires to combine the best qualities of TCP and UDP [19]. Unlike raw UDP, QUIC ensures the reliability of data transmission and guarantees the ordered delivery of data packets similarly to TCP, while intending to keep UDP's speed advantages. One of QUIC's standout features is its ability to reduce connection establishment times, which effectively lowers initial latency. It achieves this by merging the typically separate connection and security handshakes, reducing the time taken for a connection to be established. Additionally, QUIC is designed to prevent the issue of "head-of-line blocking", allowing for the independent delivery of separate data streams. This means it can handle the delivery of separate data streams without one stream blocking another, resulting in smoother and more efficient transmission, a feature which is especially important for applications with lots of concurrent transmissions.

2.13 Delta Synchronization

Delta synchronization is a technique that allows for efficient synchronization of files between hosts, aiming to transfer only those parts of the file that have undergone changes instead of the entire file in order to reduce network and I/O overhead. Perhaps the most recognized tool employing this method of synchronization is `rsync`, an open-source data synchronization utility in Unix-like operating systems[20].

TODO: Add sequence diagram of the delta sync protocol from <https://blog.acolyer.org/2018/03/02/towards-web-based-delta-synchronization-for-cloud-storage-systems/>

While there are many applications of such an algorithm, it typically starts on file block division, dissecting the file on the destination side into fixed-size blocks. For each of these blocks, a quick albeit weak checksum calculation is performed, and these checksums are transferred to the source system.

The source initiates the same checksum calculation process. These checksums are then compared to those received from the destination (matching block identification). The outcome of this comparison allows the source to detect the blocks which have transformed since the last synchronization.

Once the altered blocks are identified, the source proceeds to send the offset of each block alongside the data of the changed block to the destination. Upon receiving a block, the destination writes it to the specific offset in the file. This process results in the reconstruction of the file in accordance with the modifications undertaken at the source, after which the next synchronization cycle can start.

2.14 File Systems In Userspace (FUSE)

File Systems in Userspace (FUSE) is a software interface that enables the creation of custom file systems in the userspace, as opposed to developing them as kernel modules. This reduces the need for the low-level kernel development skills that are usually associated with creating new file systems.

The FUSE APIs are available on various platforms; though mostly deployed on Linux, it can also be found on macOS and FreeBSD. In FUSE, a userspace program registers itself with the FUSE kernel module and provides callbacks for the file system operations. A simple read-only FUSE can for example implement the following callbacks:

The `getattr` function is responsible for getting the attributes of a file. For a real file system, this would include things like the file's size, its permissions, when it was last accessed or modified, and so forth:

```
1 static int example_getattr(const char *path, struct stat *stbuf,  
2                          struct fuse_file_info *fi);
```

The `readdir` function is used when a process wants to list the files in a directory. It's responsible for filling in the entries for that directory:

```
1 static int example_readdir(const char *path, void *buf, fuse_fill_dir_t  
   filler,  
2                          off_t offset, struct fuse_file_info *fi,  
3                          enum fuse_readdir_flags flags);
```

The `open` function is called when a process opens a file. It's responsible for checking that the operation is permitted (i.e. the file exists and the process has the necessary permissions), and for doing any necessary setup:

```
1 static int example_open(const char *path, struct fuse_file_info *fi);
```

Finally, the `read` function is used when a process wants to read data from a file. It's responsible for copying the requested data into the provided buffer:

```
1 static int example_read(const char *path, char *buf, size_t size, off_t  
   offset, struct fuse_file_info *fi);
```

These callbacks would then be added to the FUSE operations struct and passed to `fuse_main`, which takes care of registering the operations with the FUSE kernel module and mounts the FUSE to a directory. Similarly to this, callbacks for handling writes etc. can be provided to the operation struct for a read-write capable FUSE[21].

When a user then performs a file system operation on a mounted FUSE file system, the kernel module sends a request for executing that operation to the userspace program. This is followed by the user-

space program returning a response, which the FUSE kernel module conveys back to the user. As such, FUSE circumvents the complexity of coding the file system implementation directly in the kernel. This approach enhances safety, preventing entire kernel crashes due to errors within the implementation being limited to user instead of kernel space.

TODO: Add graphic from https://en.wikipedia.org/wiki/Filesystem_in_Userspace#/media/File:FUSE_structure.svg

Another benefit of a file system implemented as a FUSE is its inherent portability. Unlike a file system created as a kernel module, its interaction with the FUSE module rather than the kernel itself creates a stronger contract between the two, and allows shipping the file system as a plain binary instead of a binary kernel module, which typically need to be built from source on the target machine unless they are vendored by a distribution. Despite these benefits of FUSE, there is a noticeable performance overhead associated with it. This is largely due to the context switching between the kernel and the userspace that occurs during its operation[22].

Today, FUSE is widely utilized to mount high-level external services as file systems. For instance, it can be used to mount remote AWS S3 buckets with `s3fs`[23] or to mount a remote system's disk via Secure Shell (SSH) with SSHFS [24].

2.15 Network Block Device (NBD)

Network Block Device (NBD) is a protocol for connecting to a remote Linux block device. It typically works by communicating between a user space-provided server and a Kernel-provided client. Though potentially deployable over Wide Area Networks (WAN), it is primarily designed for Local Area Networks (LAN) or localhost usage. The protocol is divided into two phases: the handshake and the transmission[25].

TODO: Add sequence diagram of the NBD protocol

The NBD protocol involves multiple participants, notably one or several clients, a server, and the concept of an export. It starts with a client establishing a connection with the server. The server reciprocates by delivering a greeting message highlighting various server flags. The client responds by transmitting its own flags along with the name of an export to use; a single NBD server can expose multiple devices.

After receiving this, the server sends the size of the export and other metadata. The client acknowledges this data, completing the handshake. Post handshake, the client and server exchange commands and replies. A command can correspond to any of the basic actions needed to access a block device, for instance read, write or flush. These commands might also contain data such as a chunk for writing, offsets, and lengths among other elements. Replies may contain error messages, success status, or data contingent on the reply type.

While powerful in many regards, NBD has some limitations. Its maximum message size is capped at 32 MB[26], and the maximum block or chunk size supported by the Kernel's NBD client is a mere 4KB[27]. Thus, it might not be the most optimal protocol for WAN usage, especially in scenarios with high latency.

NBD, being a protocol with a long legacy, comes with its own set of operational quirks such as multiple different handshake versions and legacy features. As a result, it is advisable to only implement the latest recommended versions and the foundational feature set when considering it NBD for a narrow usecase.

Despite the simplicity of the protocol, there are certain scenarios where NBD falls short. Compared to FUSE, it has limitations when dealing with backing devices that operate drastically different from random-access storage devices like a tape drive, since it lacks the ability to work with high-level abstractions such as files or directories. For example, it does not support shared access to the same file for multiple clients. However, this shortcoming can be considered as an advantage for narrow usecases like memory synchronization, given that it operates on a block level, where such features are not needed or implemented at a higher layer.

2.16 Virtual Machine Live Migration

Virtual machine live migration involves the shifting of a virtual machine, its state, and its connected devices from one host to another, with the objective to minimize disrupted service by minimizing downtime during data transfer processes.

Algorithms that intent to implement this usecase can be categorized into two broad types: pre-copy migration and post-copy migration.

2.16.1 Pre-Copy

The primary characteristic of pre-copy migration is its “run-while-copy” nature, meaning that the copying of data from the source to the destination occurs concurrently while the VM continues to operate. This method is also applicable in a generic migration context where an application or another data state is being updated.

In the case of a VM, the pre-copy migration procedure starts with transferring the initial state of VM's memory to the destination host. During this operation, if modifications occur to any chunks of data, they are flagged as “dirty”. These modified or “dirty” chunks of data are then transferred to the destination until only a small number remain - an amount small enough to stay within the allowable maximum downtime criteria.

Following this, the VM is suspended at the source, enabling the synchronization of the remaining chunks of data to the destination without having to continue tracking dirty chunks. Once this synchronization process is completed, the VM is resumed at the destination host.

The pre-copy migration process is fairly robust, especially in instances where there might be network disruption during synchronization. This is because of the fact that, at any given point during migration, the VM is readily available in full either at the source or the destination. A limitation to the approach however is that, if the VM or application alters too many chunks on the source during migration, it may not be possible to meet the maximum acceptable downtime criteria. Maximum permissible downtime is also inherently restricted by the available round-trip time (RTT)[28].

2.16.2 Post-Copy

Post-copy migration is an alternative live migration approach. While pre-copy migration operates by copying data before the VM halt, post-copy migration opts for another strategy: it immediately suspends the VM operation on the source and resumes it on the destination – all with only a minimal subset of the VM's data.

During this resumed operation, whenever the VM attempts to access a chunk of data not initially transferred during the move, a page fault arises. A page fault, in this context, is a type of interrupt generated when the VM tries to read or write a chunk that is not currently present on the destination. This triggers the system to retrieve the missing chunk from the source host, enabling the VM to continue its operations[28].

The main advantage of post-copy migration centers around the fact that it eliminates the necessity of re-transmitting chunks of “dirty” or changed data before hitting the maximum tolerable downtime. This process can thus decrease the necessary downtime and also reduces the amount of network traffic between source and destination.

However, this approach is also not without its drawbacks. Post-copy migration could potentially lead to extended migration times, as a consequence of its “fetch-on-demand” model for retrieving chunks. This model is highly sensitive to network latency and round-trip time (RTT). Unlike the pre-copy model, this also means that the VM is not available in full on either the source or the destination during migration, requiring potential recovery solutions if network connectivity is lost during the migration.

2.16.3 Workload Analysis

Recent studies have explored different strategies to determine the most suitable timing for virtual machine migration. Even though these mostly focus on virtual machines, the methodologies proposed

could be adapted for use with various other applications or migration circumstances, too.

One method[29] proposed identifies cyclical workload patterns of VMs and leverages this knowledge to delay migration when it is beneficial. This is achieved by analyzing recurring patterns that may unnecessarily postpone VM migration, and then constructing a model of optimal cycles within which VMs can be migrated. In the context of VM migration, such cycles could for example be triggered by a large application's garbage collector that results in numerous changes to VM memory.

When migration is proposed, the system verifies whether it is in an optimal cycle for migration. If it is, the migration proceeds; if not, the migration is postponed until the next cycle. The proposed process employs a Bayesian classifier to distinguish between favorable and unfavorable cycles.

Compared to the popular alternative method which usually involves waiting for a significant amount of unchanged chunks to synchronize first, the proposed pattern recognition-based approach potentially offers substantial improvements. The study found that this method yielded an enhancement of up to 74% in terms of live migration time/downtime and a 43% reduction concerning the volume of data transferred over the network.

2.17 Streams and Pipelines

Streams and pipelines are fundamental constructs in computer science, enabling efficient, sequential processing of large datasets without the need for loading an entire dataset into memory. They form the backbone of modular and efficient data processing techniques, with each concept having its unique characteristics and use cases.

A stream represents a continuous sequence of data, serving as a connector between different points in a system. Streams can be either a source or a destination for data. Examples include files, network connections, and standard input/output devices and many others. The power of streams comes from their ability to process data as it becomes available; this aspect allows for minimization of memory consumption, making streams particularly impactful for scenarios involving long-running processes where data is streamed over extended periods of time[30].

Pipelines comprise a series of data processing stages, wherein the output of one stage directly serves as the input to the next. It's this chain of processing stages that forms a "pipeline". Often, these stages can run concurrently; this parallel execution can result in a significant performance improvement due to a higher degree of concurrency.

One of the classic examples of pipelines is the instruction pipeline in CPUs, where different stages of instruction execution - fetch, decode, execute, and writeback - are performed in parallel. This design increases the instruction throughput of the CPU, allowing it to process multiple instructions simultaneously at different stages of the pipeline.

Another familiar implementation is observed in UNIX pipes, a fundamental part of shells such as GNU Bash or POSIX `sh`. Here, the output of a command can be “piped” into another for further processing; for instance, the results from a `curl` command fetching data from an API could be piped into the `jq` tool for JSON manipulation[31].

2.18 gRPC

gRPC is an open-source, high-performance remote procedure call (RPC) framework developed by Google in 2015. It is recognized for its cross-platform compatibility, supporting a variety of languages including Go, Rust, JavaScript and more. gRPC is being maintained by the Cloud Native Computing Foundation (CNCF), which ensures vendor neutrality.

One of the notable features of the gRPC is its usage of HTTP/2 as the transport protocol. This allows it to exploit features of HTTP/2 such as header compression, which minimizes bandwidth usage, and request multiplexing, enabling multiple requests to be sent concurrently over a single connection. In addition to HTTP/2, gRPC utilizes Protocol Buffers (protobuf) as the Interface Definition Language (IDL) and wire format. Protobuf is a compact, high-performance, and language-neutral mechanism for data serialization. This makes it preferable over the more dynamic, but more verbose and slower JSON format often used in REST APIs.

One of the strengths of the gRPC framework is its support for various types of RPCs. Not only does it support unary RPCs where the client sends a single request to the server and receives a single response in return, mirroring the functionality of a traditional function call, but also server-streaming RPCs, wherein the client sends a request, and the server responds with a stream of messages. Conversely, in client-streaming RPCs, the client sends a stream of messages to a server in response to a request. It also supports bidirectional RPCs, wherein both client and server can send messages to each other.

What distinguishes gRPC is its pluggable structure that allows for added functionalities such as load balancing, tracing, health checking, and authentication, which make it a comprehensive solution for developing distributed systems[32].

2.19 Redis

Redis (Remote Dictionary Server) is an in-memory data structure store, primarily utilized as an ephemeral database, cache, and message broker introduced by Salvatore Sanfilippo in 2009. Compared to other key-value stores and NoSQL databases, Redis supports a multitude of data structures, including lists, sets, hashes, and bitmaps, making it a good choice for caching or storing data that does not fit well into a traditional SQL architecture[33].

One of the primary reasons for Redis's speed is its reliance on in-memory data storage rather than on disk, enabling very low-latency reads and writes. While the primary usecase of Redis is in in-memory operations, it also supports persistence by flushing data to disk. This feature broadens the use cases for Redis, allowing it to handle applications that require longer-term data storage in addition to a caching mechanism. In addition to it being mostly in-memory, Redis also supports quick concurrent reads/writes thanks to its non-blocking I/O model, making it a good choice for systems that require the store to be available to many workers or clients.

Redis also includes a publish-subscribe (pub-sub) system. This enables it to function as a message broker, where messages are published to channels and delivered to all the subscribers interested in those channels. This makes it a particularly compelling choice for systems that require both caching and a memory broker, such as queue systems[34].

2.20 S3 and Minio

S3 is a scalable object storage service, especially designed for large-scale applications with frequent reads and writes. It is one of the prominent services offered by Amazon Web Services. S3's design allows for global distribution, which means the data can be stored across multiple geographically diverse servers. This permits fast access times from virtually any location on the globe, crucial for globally distributed services or applications with users spread across different continents.

S3 offers a variety of storage classes for to different needs, i.e. for whether the requirement is for frequent data access, infrequent data retrieval, or long-term archival. This ensures that it can meet a wide array of demands through the same API. S3 also comes equipped with comprehensive security features, including authentication and authorization mechanisms.

Communication with S3 is done through a HTTP API. Users and applications can interact with the stored data - including files and folders - via this API.[35].

Minio is an open-source storage server that is compatible Amazon S3's API. Due to it being written in the Go programming language, Minio is very lightweight and even ships as single static binary. Unlike with AWS S3, which is only offered as a service, Minio's open-source nature means that users have the ability to view, modify, and distribute Minio's source code, allowing community-driven development and innovation.

A critical distinction of Minio is its suitability for on-premises hosting, making it a good fit for organizations with specific security regulations, those preferring to maintain direct control over their data and developers preferring to work on the local system. It also supports horizontal scalability, designed to distribute large quantities of data across multiple nodes, meaning that it can be used in large-scale deployments similarly to AWS S3[36].

2.21 Cassandra and ScyllaDB

Apache Cassandra is a wide-column NoSQL database tailored for large-scale, distributed data management tasks. It blends the distributed nature of Amazon's Dynamo model with the structure of Google's Bigtable model, leading to a highly available database system. It is known for its scalability, designed to handle vast amounts of data spread across numerous servers. Unique to Cassandra is the absence of a single point of failure, thus ensuring continuous availability and robustness, which is critical for systems requiring high uptime.

Cassandra's consistency model is tunable according to needs, ranging from eventual to strong consistency. It distinguishes itself by not employing master nodes due to its usage of a peer-to-peer protocol and a distributed hash ring design. These design choices eradicate the bottleneck and failure risks associated with master nodes[37].

Despite these robust capabilities, Cassandra does come with certain limitations. Under heavy load, it experiences high latency that can negatively affect system performance. Besides this, it also demands complex configuration and fine-tuning to perform optimally.

In response to the perceived shortcomings of Cassandra, ScyllaDB was launched in 2015. It shares design principles with Cassandra, such as compatibility with Cassandra's API and data model, but has architectural differences intended to overcome Cassandra's limitations. It's primarily written in C++, contrary to Cassandra's Java-based code. This contributes to ScyllaDB's shared-nothing architecture, a design that aims to minimize contention and enhance performance.

ScyllaDB was particularly engineered to address one shortcoming of Cassandra - issues around latency, specifically the 99th percentile latency that impacts system reliability and predictability. ScyllaDB's design improvements and performance gains over Cassandra have been endorsed by various benchmarking studies[38].

TODO: Add graph of the Cassandra vs. ScyllaDB benchmark from the benchmarking study

3 Planning

3.1 Pull-Based Synchronization With `userfaultfd`

`userfaultfd` allows the implementation of a post-copy migration scenario. In this setup, a memory region is created on the destination host. When the migrated application starts to read from this remote region after it was resumed, it triggers a page fault, which we want to resolve by fetching the relevant offset from the remote.

Typically, page faults are resolved by the kernel. While this makes sense for use cases where they can be resolved by loading a local resource into memory, here we want to handle the page faults using a user space program instead. Traditionally, this was possible by registering a signal handler for the `SIGSEGV` handler, and then responding to fault from the program. This however is a fairly complicated and inefficient process. Instead, we can now use the `userfaultfd` system to register a page fault handler directly without having to go through a signal first.

With `userfaultfd`, we first register the memory region that we want to handle page faults in and start a handler in user space that fetches the missing offsets from the source host in-demand whenever a page fault occurs. This handler is connected to the registered region's `userfaultfd` API through a file descriptor. To enable sharing the file descriptor between processes, a UNIX socket can be used.

3.2 Push-Based Synchronization With `mmap` and Hashing

As mentioned before, `mmap` allows mapping a memory region to a file. Similarly to how we used a region registered with `userfaultfd` before to store the state or application that is being migrated, we can use this region to do the same. Because the region is linked to a file, when writes happen to the region, they will also be written to the corresponding file. If we're able to detect these writes and copy the changes to the destination host, we can use this setup to implement a pre-copy migration system.

While writes done to a `mmaped` region are eventually being written back to the underlying file, this is not the case immediately, since the kernel still uses caching on an `mmaped` region in order to speed up reads/writes. As a workaround, we can use the `msync` syscall, which works similarly to the `sync` syscall by flushing any remaining changes from the cache to the backing file.

In order to actually detect the changes to the underlying file, an obvious solution might be to use `inotify`. This however isn't possible for `mmaped` files, as the file corresponds to a memory region, and traditional `write` etc. events are not emitted. Instead of using `inotify` or a similar event-based system to track changes, we can instead use a polling system. This has drawbacks - namely latency and computation load - that were attempted to be worked around in the following implementation, but are inherent to this approach.

3.3 Push-Pull Synchronization with FUSE

Using a file system in user space (FUSE) can serve as the basis for implementing either a pre- or a post-copy live migration system. Similarly to the file-based pre-copy approach, we can use `mmap` to map the migrated resource's memory region to a file. Instead of storing this file on the system's default filesystem however, a custom file system is implemented, which allows dropping the expensive

polling system. Since a custom file system allows us to catch reads (for a post-copy migration scenario, where reads would be responded to by fetching from the remote), writes (for a pre-copy scenario, where writes would be forwarded to the destination) and other operations by the kernel, we no longer need to use `inotify`.

While implementing such a custom file system in the kernel is possible, it is a complex task that requires writing a custom kernel module, using a supported language by the kernel (mostly C or a limited subset of Rust), and in general having significant knowledge of kernel internals. Furthermore, since networking would be required to resolve reads/forward writes from/to the source/destination host, a job that would usually be done by user space applications, a user space component would probably also need to be developed in order to support this part of the synchronization system. Instead of implementing it in the kernel, we can use the FUSE API. This makes it possible to write the entire file system in user space, can significantly reduce the complexity of this approach.

3.4 Mounts with NBD

Another `mmap`-based approach for both pre- and post-copy migration is to `mmap` a block device instead of a file. This block device can be provided through a variety of APIs, for example NBD.

By providing a NBD device through the kernel's NBD client, we can connect the device to a remote NBD server, which in turn hosts the migratable resource as a memory region. Any reads/writes from/to the `mmap`ed memory region are resolved by the NBD device, which forwards it to the client, which then resolves them using the remote server; as such, this approach is less so a synchronization (as the memory region is never actually copied to the destination host), but rather a mount of a remote memory region over the NBD protocol.

From an initial overview, the biggest benefit of `mmap`ing such a block device instead of a file on a custom file system is the reduced complexity. For the narrow usecase of memory synchronization, not all of the features provided by a full file system are required, which means that the implementation of a NBD server and client, as well as the accompanying protocols, is significantly less complex and can also reduce the overhead of the system as a whole.

3.5 Push-Pull Synchronization with Mounts

3.5.1 Overview

This approach also leverages `mmap` and NBD to handle reads and writes to the migratable resource's memory region, similar to the prior approaches, but differs from mounts with NBD in a few significant ways.

Usually, the NBD server and client don't run on the same system, but are instead separated over a network. This network commonly is LAN, and the NBD protocol was designed to access a remote hard drive in this network. As a result of the protocol being designed for this low-latency, high-throughput type of network, there are a few limitations of the NBD protocol when it is being used in a WAN that can not guarantee the same.

While most wire security issues with the protocol can be worked around by simply using TLS, the big issue of its latency sensitivity remains. Usually, individual blocks would only be fetched as they are being accessed, resulting in a ready latency per block that is at least the RTT. In order to work around this issue, instead of directly connecting a NBD client to a remote NBD server, a layer of indirection (called "Mount") is created. This component consists of both a client and a server, both of which are running on the local system instead of being split into a separate remote and local component.

By combining the NBD server and client into this reusable unit, we can connect the server to a new backend component with a protocol which is better suited for WAN usage than NBD. This also allows the implementation of smart, asynchronous background push/pull strategies instead of simply directly writing to/from the network (called "Managed Mounts"). The simplest form of the mount API is the direct mount API; it simply swaps out NBD for a transport-independent RPC framework, but does not do additional optimizations. It has two simple actors: The client and the server. Only unidirectional RPCs from the client to the server are required for this to work, and the required backend service's interface is simple:

```
1 type BackendRemote struct {
2     ReadAt func(context context.Context, length int, off int64) (r
        ReadAtResponse, err error)
3     WriteAt func(context context.Context, p []byte, off int64) (n int,
        err error)
4     Size func(context context.Context) (int64, error)
5     Sync func(context context.Context) error
6 }
```

The protocol is stateless, as there is only a simple remote reader and writer interface; there are no distinct protocol phases, either.

TODO: Add protocol sequence diagram TODO: Add state machine diagram

3.5.2 Chunking

And additional issue that was mentioned before that this approach can approve upon is better chunking support. While it is possible to specify the NBD protocol's chunk size by configuring the NBD client and server, this is limited to only 4KB in the case of Linux's implementation. If the RTT between the backend and the NBD server however is large, it might be preferable to use a much larger chunk size;

this used to not be possible by using NBD directly, but thanks to this layer of indirection it can be implemented.

Similarly to the Linux kernel's NBD client, backends themselves might also have constraints that prevent them from working without a specific chunk size, or otherwise require aligned reads. This is for example the case for tape drives, where reads and writes must occur with a fixed block size and on aligned offsets; furthermore, these linear storage devices work best if chunks are multiple MBs instead KBs.

It is possible to do this chunking in two places: On the mount API's side (meaning the NBD server), or on the (potentially remote) backend's side. While this will be discussed further in the results section, chunking on the backend's side is usually preferred as doing it client-side can significantly increase latency due to a read being required if a non-aligned write occurs, esp. in the case of a WAN deployment with high RTT.

But even if the backend does not require any kind of chunking to be accessed - i.e. if it is a remote file - it might still make sense to limit the maximum supported message size between the NBD server and the backend, simply to prevent DoS attacks that would require the backend to allocate large chunks of memory, were such a limit provided by a chunking system not in place.

3.5.3 Background Pull and Push

A pre-copy migration system for the managed API is realized in the form of pre-emptive pulls that run asynchronously in the background. In order to optimize for sequential locality, a pull priority heuristic was introduced; this is used to determine the order in which chunks should be pulled. Many applications and other migratable resources commonly access certain parts of their memory first, so if a resource should be accessible locally as quickly as possible (so that reads go to the local cache filled by the pre-emptive pulls, instead of having to wait at least one RTT to fetch it from the remote), knowing this access pattern and fetching these sections first can improve latency and throughput significantly.

An example of this can be data that consists of one or multiple headers followed by raw data. If this structure is known, rather than fetching everything linearly in the background, the headers can be fetched first in order to allow for i.e. metadata to be displayed before the rest of the data has been fetched. Similarly so, if a file system is being synchronized, and the superblocks of a file system are being stored in a known pattern or known fixed locations, these can be pulled first, significantly speeding up operations such as directory listings that don't require the actual inode's data to be available.

Post-copy migration conversely is implemented using asynchronous background push. This push system is started in parallel with the pull system. It keeps track of which chunks were written to, deduplicates remote writes, and periodically writes back these dirty chunks to the remote backend. This

can significantly improve write performance compared to forwarding writes directly to the remote by being able to catch multiple writes without having to block for at least the RTT until the remote write has finished before continuing to the next write.

For the managed mount API, the pre- and post-copy live migration paradigms are combined to form a hybrid solution. Due to reasons elaborated on in more detail in the discussion section, the managed mount API however is primarily intended for efficiently reading from a remote resource and synching back changes eventually, rather than migrating a resource between two hosts. For the migration use-case, the migration API, which will be introduced in the following section, provides a better solution by building on similar concepts as the managed mounts API.

3.6 Pull-Based Synchronization with Migrations

3.6.1 Overview

Similarly to the managed mount API, this migration API again tracks changes to the memory of the migratable resource using NBD. As mentioned before however, the managed mount API is not optimized for the migration usecase, but rather for efficiently accessing a remote resource. For live migration, one metric is very important: maximum acceptable downtime. This refers to the time that a application, VM etc. must be suspended or otherwise prevented from writing to or reading from the resource that is being synchronized; the higher this value is, the more noticable the downtime becomes.

To improve on this the pull-based migration API, the migration process is split into two distinct phases. This is required due the constraint mentioned earlier; the mount API does not allow for safe concurrent access of a remote resource by two readers or writers at the same time. This poses a significant problem for the migration scenario, as the app that is writing to the source device would need to be suspended before the transfer could even begin, as starting the destination node would already violate the single-reader, single-writer constraint of the mount API. This adds significant latency, and is complicated further by the backend for the managed mount API not exposing a block itself but rather just serving as a remote that can be mounted. The migration API on the other hand doesn't have this hierarchical system; both the source and destination are peers that expose block devices on either end.

3.6.2 Migration Protocol and Critical Phases

The migration protocol that allows for this defines two new actors: The seeder and the leecher. A seeder represents a resource that can be migrated from or a host that exposes a migratable resource, while the leecher represents a client that intents to migrate a resource to itself. The protocol starts by running an application with the application's state on the region `mmap`ed to the seeder's block device,

similarly to the managed mount API. Once a leecher connects to the seeder, the seeder starts tracking any writes to its mount, effectively keeping a list of dirty chunks. Once tracking has started, the leecher starts pulling chunks from the seeder to its local cache. Once it has received a satisfactory level of locally available chunks, it asks the seeder to finalize. This then causes the seeder to suspend the app accessing the memory region on its block device, `msync`/flushes the it, and returns a list of chunks that were changed between the point where it started tracking and the flush has occurred. Upon receiving this list, the leecher marks these chunks are remotes, immediately resumes the application (which is now accessing the leecher's block device), and queues the dirty chunks to be pulled in the background.

TODO: Add protocol sequence diagram TODO: Add state machine diagram

By splitting the migration into these two distinct phases, the overhead of having to start the device can be skipped and additional app initialization that doesn't depend on the app's state (i.e. memory allocation, connecting to databases, loading models etc.) can be performed before the application needs to be suspended. This combines both the pre-copy algorithm (by pulling the chunks from the seeder ahead of time) and the post-copy algorithm (by resolving dirty chunk from the seeder after the VM has been migrated) into one coherent protocol. As will be discussed further in the results section, the maximum tolerable downtime can be drastically reduced, and dirty chunks don't need to be re-transmitted multiple times. Effectively, it allows dropping this downtime to the time it takes to `msync` the seeder's app state, the RTT and, if they are being accessed immediately, how long it takes to fetch the chunks that were written in between the start of it tracking and finalizing. The migration API can use the same preemptive pull system as the managed mount API and benefit from its optimizations, but does not use the background push system.

An interesting question to ask with this two-step migration API is when to start the finalization step. The finalization phase in the protocol is critical, and it is hard or impossible to recover from depending on the specific implementation. While the synchronization itself could be safely recovered from by simply calling `Finalize` multiple times to restart it. But since `Finalize` needs to return a list of dirty chunks, it requires the app on the seeder to be suspended before `Finalize` can return, an operation that might not be idempotent.

4 Implementation

4.1 Userfaults in Go with `userfaultfd`

4.1.1 Registration and Handlers

By listening to page faults, we can know when a process wants to access a specific offset of memory that is not yet available. As mentioned before, we can use this event to then fetch this chunk of memory from the remote, mapping it to the offset on which the page fault occurred, thus effectively only fetching data when it is required. Instead of registering signal handlers, we can use the `userfaultfd` system introduced with Linux 4.3[39] to handle these faults in userspace in a more idiomatic way.

In the Go implementation created for this thesis, `userfaultfd-go`, `userfaultfd` works by first creating a region of memory, e.g. by using `mmap`, which is then registered with the `userfaultfd` API:

```
1 // Creating the `userfaultfd` API
2 uffd, _, errno := syscall.Syscall(constants.NR_userfaultfd, 0, 0, 0)
3
4 uffdioAPI := constants.NewUffdioAPI(
5     constants.UFFD_API,
6     0,
7 )
8 // ...
9
10 // Allocating the region
11 l := int(math.Ceil(float64(length)/float64(pagesize)) * float64(
12     pagesize))
13 b, err := syscall.Mmap(
14     -1,
15     0,
16     l,
17     syscall.PROT_READ|syscall.PROT_WRITE,
18     syscall.MAP_PRIVATE|syscall.MAP_ANONYMOUS,
19 )
20 // ...
21
22 // Registering the region
23 uffdioRegister := constants.NewUffdioRegister(
24     constants.CULong(start),
25     constants.CULong(l),
26     constants.UFFDIO_REGISTER_MODE_MISSING,
27 )
28 // ...
29 syscall.Syscall(
```

```

30     syscall.SYS_IOCTL,
31     uffd,
32     constants.UFFDIO_REGISTER,
33     uintptr(unsafe.Pointer(&uffdioRegister))
34 )

```

This is abstracted into a single `Register(length int)([]byte, UFFD, uintptr, error)` function. Once this region has been registered, the `userfaultfd` API's file descriptor and the offset is passed over a UNIX socket:

```

1  syscall.Sendmsg(int(f.Fd()), nil, syscall.UnixRights(b...), nil, 0)

```

Where it can then be received by the handler:

```

1  buf := make([]byte, syscall.CmsgSpace(num*4)) // See https://github.com
    /ftrvxmtrx/fd/blob/master/fd.go#L51
2  syscall.Recvmsg(int(f.Fd()), nil, buf, 0)
3  // ..
4  msgs, err := syscall.ParseSocketControlMessage(buf)

```

The handler itself receives the address that has triggered the page fault by polling the transferred file descriptor, which is then responded to by fetching the relevant chunk from a provided reader and sending it to the faulting memory region over the same socket:

```

1  // Receiving the page fault address
2  unix.Poll(
3      []unix.PollFd{{
4          Fd:      int32(uffd),
5          Events:  unix.POLLIN,
6      }},
7      -1,
8  )
9  // ...
10 pagefault := (*(constants.UffdPagefault)(unsafe.Pointer(&arg[0])))
11 addr := constants.GetPagefaultAddress(&pagefault)
12
13 // Fetching the missing chunk from the provided backend
14 p := make([]byte, pagesize)
15 n, err := src.ReadAt(p, int64(uintptr(addr)-start))
16
17 // Sending the missing chunk to the faulting memory region's `
    userfaultfd` API:
18 cpy := constants.NewUffdioCopy(
19     p,
20     addr&^constants.CULong(pagesize-1),
21     constants.CULong(pagesize),
22     0,
23     0,
24 )

```

```
25
26 syscall.Syscall(
27     syscall.SYS_IOCTL,
28     uintptr(uffd),
29     constants.UFFDIO_COPY,
30     uintptr(unsafe.Pointer(&cpy)),
31 )
```

Similarly to the registration API, this is also wrapped into a reusable `func Handle(uffd UFFD, start uintptr, src io.ReaderAt) error` function.

4.1.2 userfaultfd Backends

Thanks to `userfaultfd` being mostly useful for post-copy migration, the backend can be simplified to a simple pull-only reader interface (`ReadAt(p []byte, off int64) (n int, err error)`). This means that almost any `io.ReaderAt` can be used to provide chunks to a `userfaultfd`-registered memory region, and access to this reader is guaranteed to be aligned to system's page size, which is typically 4KB. By having this simple backend interface, and thus only requiring read-only access, it is possible to implement the migration backend in many different ways. A simple backend can for example return a pattern to the memory region:

```
1 func (a abcReader) ReadAt(p []byte, off int64) (n int, err error) {
2     n = copy(p, bytes.Repeat([]byte{'A' + byte(off%20)}, len(p)))
3
4     return n, nil
5 }
```

In Go specifically, many objects can be exposed as an `io.ReaderAt`, including a file. This makes it possible to simply pass in any file as a backend, essentially mimicking a call to `mmap` with `MAP_SHARED`:

```
1 f, err := os.OpenFile(*file, os.O_RDONLY, os.ModePerm)
2 // ...
3
4 b, uffd, start, err := mapper.Register(int(s.Size()))
5
6 mapper.Handle(uffd, start, f)
```

Similarly so, a remote file, i.e. one that is being stored in S3, can be used as a `userfaultfd` backend as well; here, HTTP range requests allow for fetching only the chunks that are being required by the application accessing the registered memory region, effectively making it possible to map a remote S3 object into memory:

```
1 mc, err := minio.New(*s3Endpoint, /* ... */)
2
```

```
3 f, err := mc.GetObject(ctx, *s3BucketName, *s3ObjectName, minio.  
   GetObjectOptions{})  
4 // ...  
5  
6 b, uffd, start, err := mapper.Register(int(s.Size()))  
7  
8 mapper.Handle(uffd, start, f)
```

4.2 File-Based Synchronization

4.2.1 Caching Restrictions

As mentioned earlier, this approach uses `mmap` to map a memory region to a file. By default however, `mmap` doesn't write back changes to memory; instead, it simply makes the backing file available as a memory region, keeping changes to the region in memory, no matter whether the file was opened as read-only or read-writable. To work around this, Linux provides the `MAP_SHARED` flag; this tells the kernel to eventually write back changes to the memory region to the corresponding regions of the backing file.

Linux caches reads to the backing file similarly to how it does if `read` etc. are being used, meaning that only the first page fault would be responded to by reading from disk; this means that any future changes to the backing file would not be represented in the `mmaped` region, similarly to how `userfaultfd` handles it. The same applies to writes, meaning that in the same way that files need to be `sync`d in order for them to be flushed to disk, `mmaped` regions need to be `msync`d in order to flush changes to the backing file. This is particularly important for a memory usecase, since reading from the backing file without flushing first would result in the synchronization of potentially stale data, and is different to how traditional file synchronization can handle this usecase, where the Linux file cache would respond with the changes if the file is read from disk even if `sync` was not called beforehand. For file I/O, it is possible to skip the kernel cache and read/write directly from/to the disk by passing the `O_DIRECT` flag to `open`, but this flag is ignored by `mmap`.

4.2.2 Detecting File Changes

In order to actually watch for changes, at first glance, the obvious choice would be to use `inotify`, which would allow the registration of `write` or `sync` even handlers to catch writes to the memory region by registering them on the backing file. As mentioned earlier however, Linux doesn't emit these events on `mmaped` files, so an alternative must be used; the best option here is to instead poll for either attribute changes (i.e. the "Last Modified" attribute of the backing file), or by continuously hashing the file to check if it has changed. Hashing continuously with this pollig method can have significant

downsides, especially in a migration scenario, where it raises the guaranteed minimum latency by having to wait for at least the next polling cycle. Hashing the entire file is also an I/O- and CPU-intensive process, because in order to compute the hash, the entire file needs to be read at some point. Within the context of the file-based synchronization approach however, it is the only option available.

To speed up the process of hashing, instead of hashing the entire file, we can instead hash individual chunks of the file, in effect implementing a delta synchronization algorithm. This can be implemented by opening the file multiple times, hashing individual offsets using each of the opened files, and aggregating the chunks that have been changed. When picking algorithms for this chunk-based hashing algorithm, two metrics are of relevance: the algorithm's throughput with which it can calculate hashes, and the prevalence of hash collisions, where two different inputs produce the same hashes, leading to a chunk change not being detected. Furthermore, if the underlying algorithm is CPU- and not I/O-bound, using multiple open files can increase throughput substantially by allowing for better concurrent processing. Not only does this decrease the time spent on each individual hashing iteration of the polling process, but dividing the file into smaller chunks that all have their own hashes to compare with the remote's hashes can also decrease the amount of network traffic that is required to sync the changes, since a small change in the backing file leads to the transfer of a smaller chunk.

4.2.3 Synchronization Protocol

The delta synchronization protocol for this approach is similar to the one used by `rsync`, but simplified. It supports synchronizing multiple files at the same time by using the file names as IDs, and also supports a central forwarding hub instead of requiring peer-to-peer connectivity between all hosts, which also reduces network traffic since this central hub could also be used to forward one stream to all other peers instead of having to send it multiple times. The protocol defines three actors: The multiplexer, file advertiser and file receiver.

TODO: Add sequence diagram for the protocol

4.2.4 Multiplexer Hub

The multiplexer hub accepts mTLS connections from peers. When a peer connects, the client certificate is parsed to read the common name, which is then being used as the synchronization ID. The multiplexer spawns a goroutine to allow for more peers to connection. In the goroutine, it reads the type of the peer. If the type is `src-control`, it starts by reading a file name from the connection, and registers the connection as the one providing a file with this name, after which it broadcasts the file as now being available. For the `dst-control` peer type, it listens to the broadcasted files from

the `src-control` peers, and relays and newly advertised and previously registered file names to the `dst-control` peers so that it can start receiving them:

```
1 case "src-control":
2     // Decoding the file name
3     file := ""
4     utils.DecodeJSONFixedLength(conn, &file)
5     // ...
6
7     syncerSrcControlConns[file] = conn
8
9     syncerSrcControlConnsBroadcaster.Broadcast(file)
10    // ...
11 case "dst-control":
12     var wg sync.WaitGroup
13     wg.Add(1)
14
15     go func() {
16         // Subscription to send all future file names
17         l := syncerSrcControlConnsBroadcaster.Listener(0)
18
19         for file := range l.Ch() {
20             utils.EncodeJSONFixedLength(conn, file)
21             // ...
22         }
23     }()
24
25     // Sending the previously known file names
26     for file := range syncerSrcControlConns {
27         utils.EncodeJSONFixedLength(conn, file)
28         // ...
29     }
30
31     wg.Wait()
```

For the `dst` type, the multiplexer hub decodes a file name from the connection, looks for a corresponding `src-control` peer, and if it has found a matching one, it creates and sends a new ID for this connection to the `src-control` peer. After this, it waits until a `src-control` peer has connected to the hub with this ID as well as a new `src-data` peer by listening for broadcasts of `src-data` peer IDs. After this has occurred, it spawns two new goroutines that copy data to and from this newly created synchronization connection and the connection of the `dst` peer, effectively relaying all packets between the two. For the `src-data` peer type, it decodes the ID for the peer, and broadcasts the ID, which allows the `dst` peer to continue operating:

```
1 case "dst":
2     // Decoding the file name
3     file := ""
4     utils.DecodeJSONFixedLength(conn, &file)
```



```
5
6 // Finding the `src-control` peer
7 controlConn, ok := syncerSrcControlConns[file]
8 // ...
9
10 // Sending the ID and waiting for a data connection
11 id := uuid.NewString()
12 utils.EncodeJSONFixedLength(controlConn, id)
13
14 l := dataConnsBroadcaster.Listener(0)
15
16 var dataConn net.Conn
17 for candidate := range l.Ch() {
18     if candidate.id == id {
19         dataConn = candidate.conn
20
21         l.Close()
22
23         break
24     }
25 }
26
27 // Copying data between both connections
28 go func() {
29     io.Copy(dataConn, conn)
30     // ...
31 }()
32
33 go func() {
34     io.Copy(conn, dataConn)
35     // ...
36 }()
37
38 case "src-data":
39     // Receiving the ID
40     id := ""
41     utils.DecodeJSONFixedLength(conn, &id)
42
43     // Broadcasting the ID
44     dataConnsBroadcaster.Broadcast(connWithID{id, conn})
45     // ...
```

4.2.5 File Advertisement

The file advertisement system connects to the multiplexer hub and registers itself a `src-control` peer, after which it sends the advertised file name. It starts a loop that handles `dst` peer types, which, as mentioned earlier, send an ID. Once such an ID is received, it spawns a new goroutine, which connects to the hub again and registers itself as a `src-data` peer, and sends the ID it has received earlier

to allow connecting it to the matching `dst` peer:

```
1 // ...
2 f, err := os.OpenFile(src, os.O_RDONLY, os.ModePerm)
3
4 utils.EncodeJSONFixedLength(dataConn, "src-data")
5
6 utils.EncodeJSONFixedLength(dataConn, id)
7 // ...
```

After this initial handshake is complete, the main synchronization loop is started, which initiates the file transmission to the `dst` peer through the multiplexer hub. In order to allow for termination, it checks if the `syncStopped` flag has been set by a context cancellation which case it returns:

```
1 syncStopped := false
2 go func() {
3     <-ctx.Done() // Context is supplied by the caller
4
5     syncStopped = true
6 }()
```

If this is not the case, it waits for the specified polling interval, after which it restarts the transmission:

```
1 done := false
2 for {
3     if done {
4         // ...
5         return
6     }
7
8     if syncStopped {
9         // Finish the synchronization
10        SendFile(parallel, f, src, blocksize, dataConn, verbose)
11        // ...
12        done = true
13    }
14
15    // Start the synchronization
16    SendFile(parallel, f, src, blocksize, dataConn, verbose)
17
18    // Wait until the next polling cycle starts
19    time.Sleep(pollDuration)
20 }
```

4.2.6 File Receiver

The file receiver also connects to the multiplexer hub, this time registering itself as a `dst-control` peer. After it has received a file name from the multiplexer hub, it connects to the multiplexer hub again - this time registering itself as a `dst` peer, which creates leading directories, opens up the destination file and registers itself:

```
1 // Connection and registration
2 syncerConn, err := d.DialContext(ctx, "tcp", syncerRaddr)
3 // ...
4 utils.EncodeJSONFixedLength(syncerConn, "dst-control")
5
6 for {
7     file := ""
8     utils.DecodeJSONFixedLength(syncerConn, &file)
9
10    go func() {
11        // Connection and registration
12        dataConn, err := d.DialContext(ctx, "tcp", syncerRaddr)
13        // ..
14        utils.EncodeJSONFixedLength(dataConn, "dst")
15
16        // Destination directory and file setup
17        dst := getDstPath(file)
18        os.MkdirAll(filepath.Dir(dst), os.ModePerm)
19
20        f, err := os.OpenFile(dst, os.O_WRONLY|os.O_CREATE, os.ModePerm)
21        // ...
22    }()
23 }
```

The file name is now sent to the multiplexer again, causing it to look for a peer that advertises the requested file. If such a peer is found, it starts the file receiver process in a loop, exiting only once the file has been completely synced:

```
1 // Sending the file name
2 utils.EncodeJSONFixedLength(dataConn, file)
3
4 for {
5     // Receiving one set of delta changes
6     ReceiveFile(parallel, f, dst, blocksize, dataConn, verbose)
7
8     // Termination
9     if once(file) {
10        return
11    }
12 }
```

4.2.7 File Transmission

This component does the actual transmission in each iteration of the delta synchronization algorithm. It receives the remote hashes from the multiplexer hub, calculates the matching local hashes and compares them, which it sends the hashes that don't match back to the file receiver via the multiplexer hub:

```
1 // Receiving remote hashes
2 remoteHashes := []string{}
3 utils.DecodeJSONFixedLength(conn, &remoteHashes)
4 // ...
5
6 // Calculating the hashes
7 localHashes, cutoff, err := GetHashesForBlocks(parallel, path,
8     blocksize)
9
10 // Comparing the hashes
11 blocksToSend := []int64{}
12 for i, localHash := range localHashes {
13     j := int64(i)
14
15     if len(remoteHashes) <= i {
16         blocksToSend = append(blocksToSend, j)
17         continue
18     }
19
20     if localHash != remoteHashes[i] {
21         blocksToSend = append(blocksToSend, j)
22         continue
23     }
24 }
25 }
26
27 // Sending the non-matching hashes
28 utils.EncodeJSONFixedLength(conn, blocksToSend)
```

If the remote has sent less hashes than were calculated locally, it asks the remote to truncate it's file to the size of the local file that is being synchronized, after which it sends the updated data for the file in the order that the changed hashes were sent:

```
1 // Local file is empty, truncate remote file to zero
2 if len(remoteHashes) > 0 && len(localHashes) <= 0 {
3     utils.EncodeJSONFixedLength(conn, -1)
4
5     return // ...
6 }
7
8 // Grow/shrink remote file
```

```

9  utils.EncodeJSONFixedLength(conn, cutoff)
10
11 // Read changed chunks from file and copy them to the remote connection
12 for i, blockToSend := range blocksToSend {
13     backset := int64(0)
14     if i == len(blocksToSend)-1 {
15         backset = cutoff
16     }
17
18     b := make([]byte, blocksize-backset)
19     file.ReadAt(b, blockToSend*(blocksize))
20
21     m, err := conn.Write(b)
22     // ...
23 }

```

4.2.8 Hash Calculation

The hash calculation implements the concurrent hashing of both the file transmitter and receiver. It uses a semaphore to limit the amount of concurrent access to the file that is being hashed, and a wait group to detect that the calculation has finished:

```

1  // The lock and semaphore
2  var wg sync.WaitGroup
3  wg.Add(int(blocks))
4
5  lock := semaphore.NewWeighted(parallel)
6
7  // ...
8
9  // Concurrent hash calculation
10 for i := int64(0); i < blocks; i++ {
11     j := i
12
13     go calculateHash(j)
14 }
15 wg.Wait()

```

Worker goroutines acquire a lock of this semaphore and calculate a CRC32 hash, which is a weak but fast hashing algorithm. For easier transmission, the hashes are hex-encoded and collected:

```

1  calculateHash := func(j int64) {
2      _ = lock.Acquire(context.Background(), 1)
3      // ...
4
5      checkFile, err := os.Open(file)
6
7

```

```
8 // Hash calculation of the specific chunk
9 hash := crc32.NewIEEE()
10 io.CopyN(hash, io.NewSectionReader(checkFile, j*(blocksize),
    blocksize), blocksize)
11 // ...
12
13 // Hash encoding
14 hashes[j] = hex.EncodeToString(hash.Sum(nil))
15 // ...
16 }
```

4.2.9 File Reception

This is the receiving component of one delta synchronization iteration. It starts by calculating hashes for the existing local copy of the file, which it then sends to the remote before it waits to receive the remote's hashes and potential truncation request:

```
1 // Local hash calculation
2 localHashes, _, err := GetHashesForBlocks(parallel, path, blocksize)
3
4 // Sending the hashes to the remote
5 utils.EncodeJSONFixedLength(conn, localHashes)
6
7 // Receiving the remote hashes and the truncation request
8 blocksToFetch := []int64{}
9 utils.DecodeJSONFixedLength(conn, &blocksToFetch)
10 // ...
11
12 cutoff := int64(0)
13 utils.DecodeJSONFixedLength(conn, &cutoff)
```

If the remote detected that the file needs to be cleared (by sending a negative cutoff value), the receiver truncates the file; similarly so, if it has detected that the file has grown or shrunk since the last synchronization cycle, it shortens or extends it, after which the chunks are read from the connection and written to the local file:

```
1 // Clearing the file
2 if cutoff == -1 {
3     file.Truncate(0)
4
5     return nil
6 }
7
8 /// ...
9
10 // Shrinking or growing the file
11 s, err := os.Stat(path)
```

```
12
13 newSize := (((blocksToFetch[len(blocksToFetch)-1] + 1) * blocksize) -
    cutoff)
14 diff := s.Size() - newSize
15
16 if diff > 0 {
17     // If the file on the server got smaller, truncate the local file
    accordingly
18     file.Truncate(newSize)
19 } else {
20     // If the file on the server grew, grow the local file accordingly
21     file.Seek(0, 2)
22
23     io.CopyN(file, nopReader{}, -diff)
24 }
25
26 for i, blockToFetch := range blocksToFetch {
27     backset := int64(0)
28     if i == len(blocksToFetch)-1 {
29         backset = cutoff
30     }
31
32     // Receiving the chunk
33     b := make([]byte, blocksize-backset)
34     io.ReadFull(conn, b)
35
36     // Writing the chunk to the local file
37     file.WriteAt(b, blockToFetch*(blocksize))
38 }
```

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