

**Bachelorarbeit**

**Data Movement in Heterogeneous  
Memories with Intel Data Streaming  
Accelerator**

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## **Aufgabenstellung für die Anfertigung einer Bachelor-Arbeit**

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Developments in main memory technologies like Non-Volatile RAM (NVRAM), High Bandwidth Memory (HBM), NUMA, or Remote Memory, lead to heterogeneous memory systems that, instead of providing one monolithic main memory, deploy multiple memory devices with different non-functional memory properties. To reach optimal performance on such systems, it becomes increasingly important to move data, ahead of time, to the memory device with non-functional properties tailored for the intended workload, making data movement operations increasingly important for data intensive applications. Unfortunately, while copying, the CPU is mostly busy with waiting for the main memory, and cannot work on other computations. To tackle this problem Intel implements the Intel Data Streaming Accelerator (Intel DSA), an engine to explicitly offload data movement operations from the CPU, in their newly released Intel Xeon CPU Max processors.

The goal of this bachelor thesis is to analyze and characterize the architecture of the Intel DSA and the vendor-provided APIs. The student should benchmark the performance of Intel DSA and compare it to the CPU's performance, concentrating on data transfers between DDR5-DRAM and HBM and between different NUMA nodes. Additionally, the student should find out in what way and to what extent parallel processes copying data interfere with each other. Analyzing the performance information, the thesis should outline a gainful utilization of the Intel DSA and demonstrate its potential by extending the Query-driven Prefetching concept, which aims to speed up database query execution in heterogeneous memory systems.

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## **Statement of Authorship**

I hereby declare that I am the sole author of this master thesis and that I have not used any sources other than those listed in the bibliography and identified as references. I further declare that I have not submitted this thesis at any other institution in order to obtain a degree.

Dresden, 9th January 2024

Anatol Constantin Fürst



## **Abstract**

...abstract ...





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# 1 Introduction

## 1.1 Introduction to Query driven Prefetching

- 

## 1.2 Introduction to Intel Data Streaming Accelerator

- 

## 1.3 Goal Definition

- use DSA to offload asynchronous prefetching tasks
- effect is lower cpu utilization for copy
- this allows to focus on actual pipeline execution





## 2 Technical Background

Intel DSA is a high-performance data copy and transformation accelerator that will be integrated in future Intel® processors, targeted for optimizing streaming data movement and transformation operations common with applications for high-performance storage, networking, persistent memory, and various data processing applications. [1, p. 15]

Introduced with the 4th generation of Intel Xeon Scalable Processors [2], the DSA promises to alleviate the CPU from ‘common storage functions and operations such as data integrity checks and deduplication’ [2]. This chapter will give an overview of the architecture, software and the interaction of these two components. The reader will be familiarized with the setup and equipped with the knowledge to configure the system for a specific use case.

### 2.1 Architecture

To be able to optimally utilize the Hardware, knowledge of its workings is required to make educated decisions. Therefore, this section describes both the workings of the DSA engine itself and the view that is presented through software interfaces. All statements are based on Chapter 3 of the Architecture Specification by Intel [1].

consider adding projected use cases as in the architecture specification here

### 2.1.1 Hardware Architecture

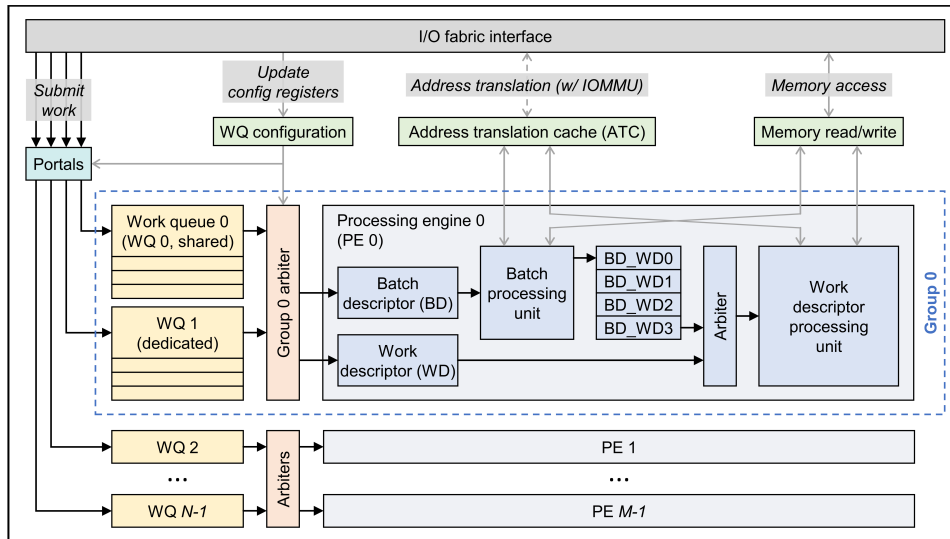


Figure 2.1:  
DSA Internal Architecture Block Diagram  
Taken from Figure 1a of [3]

The accelerator is directly integrated into the Processor and attaches via the I/O fabric interface over which all communication is conducted. Over this interface, it is accessible as a PCIe device. Configuration therefore is done through memory-mapped registers set in the devices Base Address Register (BAR). Through these, the devices layout is defined and memory pages for work submission are set. In a system with multiple processing nodes, there may also be one DSA per node.

To satisfy different use cases, as already mentioned, the layout of the DSA may be software-defined. The structure is made up of three components, namely Work Queue (WQ)s, Engines and Groups. WQs provide the means to submit tasks to the device and will be described in more detail shortly. An Engine is the processing-block that connects to memory and performs the described task. Using Groups, Engines and WQs are tied together. This means, that tasks from one WQ may be processed from multiple Engines and that vice-versa, depending on the configuration. This flexibility is achieved through the Group Arbiter which connects the two components and acts according to the setup.

A WQ is accessible through so-called portals, which are mapped memory regions. Submission of work is done by writing a descriptor to one of these portals. A descriptor is 64 Byte in size and may contain one specific task (task descriptor) or the location of a task array in memory (batch descriptor). Through these portals, the submitted descriptor reaches a queue of which there are two types with different submission methods and use cases. The Shared Work Queue (SWQ) is intended to provide synchronized access to multiple processes and each group may only have one attached. A PCIe Deferrable Memory Write Request (DMR), which guarantees implicit synchronization, is generated

via x86 Instruction ENQCMD and communicates with the device before writing. This results in higher submission cost, compared to the Dedicated Work Queue (DWQ) to which a descriptor is submitted via x86 Instruction MOVDIR64B. The DWQ is therefore more performant but may require access control mechanisms and may only be accessed by one process at a time.

To handle the different descriptors, each Engine has two internal execution paths. One for a task and the other for a batch descriptor. Processing a task descriptor is straightforward, as all information required to complete the operation are contained within. For a batch, the DSA first reads the batch descriptor, then fetches all task descriptors for the batch from memory and processes them. An Engine can also trigger a page fault when trying to access an unloaded page and wait on its completion, if configured to do so. Otherwise, an error will be generated in this scenario.

Ordering of operations is only guaranteed for a configuration with one WQ and one Engine in a Group when submitting exclusively batch or task descriptors but no mixture. Even then, only write-ordering is guaranteed, meaning that ‘reads by a subsequent descriptor can pass writes from a previous descriptor’ [1, p. 30]. A different issue arises, should an operation fail: the DSA will continue to process the following descriptors. Care must therefore be taken with read-after-write scenarios, either by waiting for a successful completion before submitting the dependant, inserting a drain descriptor for tasks or setting the fence flag for a batch. The latter two methods tell the processing engine that all writes must be committed and, in case of the fence in a batch, abort on previous error.

An important aspect of modern computer systems is the separation of address spaces through virtual memory. The DSA must therefore handle address translation, as a process submitting a task will not know the physical location in memory which causes the descriptor to contain virtual values. For this, the Engine communicates with the Input/Output Memory Management Unit (IOMMU) and Address Translation Cache (ATC) to perform this operation. For this, knowledge about the submitting processes is required, and therefore each task descriptor has a field for the Process Address Space ID (PASID) which is filled by the ENQCMD instruction for a SWQ or set statically after a process is attached to a DWQ.

The completion of a descriptor may be signaled through a completion record and interrupt, if configured so. For this, the DSA ‘provides two types of interrupt message storage: (1) an MSI-X table, enumerated through the MSI-X capability; and (2) a device-specific Interrupt Message Storage (IMS) table’ [1, p. 27].

### 2.1.2 Software View

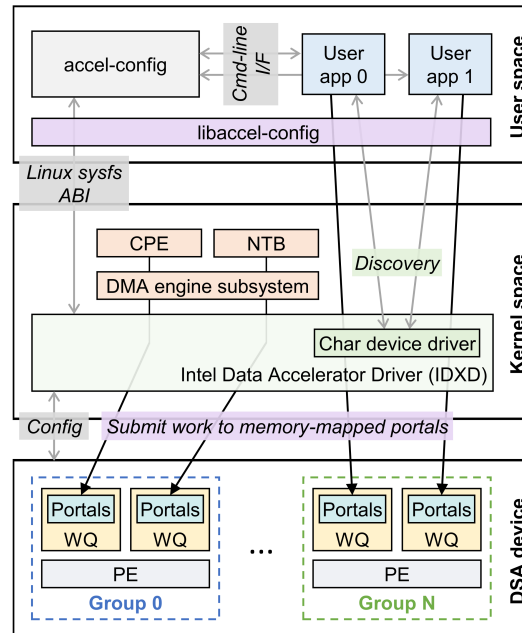


Figure 2.2:  
DSA Software View Block Diagram  
Taken from Figure 1a of [3]

Due to efforts by intel programmers, since Linux Kernel 5.10 [4, Installation Instructinos], there exists a driver for the DSA [5] which has no counterpart in the Windows OS-Family [4, Installation Instructinos], meaning code developed without an alternative path will not work there. To interface with the driver and perform configuration operations, intels libaccel-conf [6] user space toolset may be used which provides a command-line interface and can read configuration files to set up the device as described previously. After successful configuration, each WQ is exposed as a character device by `mmap` of the associated portal [3, p. 3].

Given the file permissions, it would now be possible for a process to submit work to the DSA via either `MOVDIR64B` or `ENQCMD` instructions, providing the descriptors by manually configuring them. This, however, is quite cumbersome, which is why Intels Data Mover Library [4] exists. With some limitations (like lacking support for DWQs) this library presents a high-level interface that takes care of creation and submission of descriptors, some error handling and reporting. Thanks to the high-level-view the code may choose a different execution path at runtime which allows the memory operations to either be executed in hardware (on a DSA) or in software (using equivalent instructions provided by the library) which makes code based upon it automatically compatible with systems that do not provide hardware or software support.

- drain descriptor / drain command signals completion of preceding descriptors for fencing in non-batch submissions, in batches the “fence flag” can be used to ensure ordering, failures before a fence will lead to the following descriptors being aborted [1, p. 30], `sfence` or `mfence` should be executed before pushing drain descriptor [1, p. 32]
- cache control flag in descriptor controls whether writes are directed to cache or to memory [1, p. 31] effects on copy from DRAM > HBM unknown

## 2.2 Setup and Configuration

Give the reader the tools to replicate the setup. Also explain why the BIOS-configs are required.

Setup Requirements:

- VT-d enabled
- limit CPUPA to 46 Bits disabled
- IOMMU enabled
- kernel with iommu and idxd driver support
- kernel option `”intel_iommu=on,sm_on”`

## 2.3 Programming Interface

- choice is intel data mover library
- two concepts, state-based for c-api and operation-based c++
- just explain the basics (no code) and refer to dml documentation



## 3 Performance Microbenchmarks

- 

### 3.1 Benchmarking Methodology

- 

### 3.2 Submission Method

- submit cost analysis: best method and for a subset the point at which submit cost < time savings

### 3.3 Multithreaded Submission

- effect of mt-submit, low because SWQ implicitly synchronized, bandwidth is shared

### 3.4 Data Movement from DDR to HBM

- 

### 3.5 Analysis

-





# 4 Design

## 4.1 Detailed Task Description

- give slightly more detailed task Description
- perspective of "what problems have to be solved"
- not "what is query driven prefetching"

## 4.2 Design Choices

- explain the design choices made to solve the problems
- this should go into theoretical details - no code
- when we copy, how we submit, who submits, which DSA are used



# 5 Implementation

...implementation ...



# 6 Evaluation

...evaluation ...



## 7 Conclusion And Outlook

...conclusion ...





# Glossary

## A

### ATC

... desc ...

## B

### BAR

... desc ...

## D

### DMR

... desc ...

### DSA

... desc ...

### DWQ

... desc ...

## E

### Engine

... desc ...

### ENQCMD

... desc ...

## G

### Group

... desc ...

## I

### IOMMU

... desc ...

**M**

**MOVDIR64B**

... desc ...

**P**

**PASID**

... desc ...

**S**

**SWQ**

... desc ...

**W**

**WQ**

... desc ...

# Bibliography

- [1] Intel. ‘Intel® Data Streaming Accelerator Architecture Specification’. (16th Sep. 2022), [Online]. Available: <https://www.intel.com/content/www/us/en/content-details/671116/intel-data-streaming-accelerator-architecture-specification.html> (visited on 15th Nov. 2023).
- [2] —, ‘New intel® xeon® platform includes built-in accelerators for encryption, compression, and data movement’. (Dec. 2022), [Online]. Available: <https://www.intel.com/content/dam/www/central-libraries/us/en/documents/2022-12/storage-engines-4th-gen-xeon-brief.pdf> (visited on 15th Nov. 2023).
- [3] R. K. et al. ‘A Quantitative Analysis and Guideline of Data Streaming Accelerator in Intel® 4th Gen Xeon® Scalable Processors’. (May 2023), [Online]. Available: <https://arxiv.org/pdf/2305.02480.pdf> (visited on 7th Jan. 2024).
- [4] Intel, *Intel Data Mover Library Documentation*, <https://intel.github.io/DML/index.html>. (visited on 7th Jan. 2024).
- [5] —, *Intel IDX Driver for Linux Kernel*, <https://github.com/intel/idx-driver>. (visited on 7th Jan. 2024).
- [6] —, *Intel IDX User Space Application*, <https://github.com/intel/idx-driver>. (visited on 7th Jan. 2024).