

# NEAR DATA FILTERS: TAKING ANOTHER BRICK FROM THE MEMORY WALL

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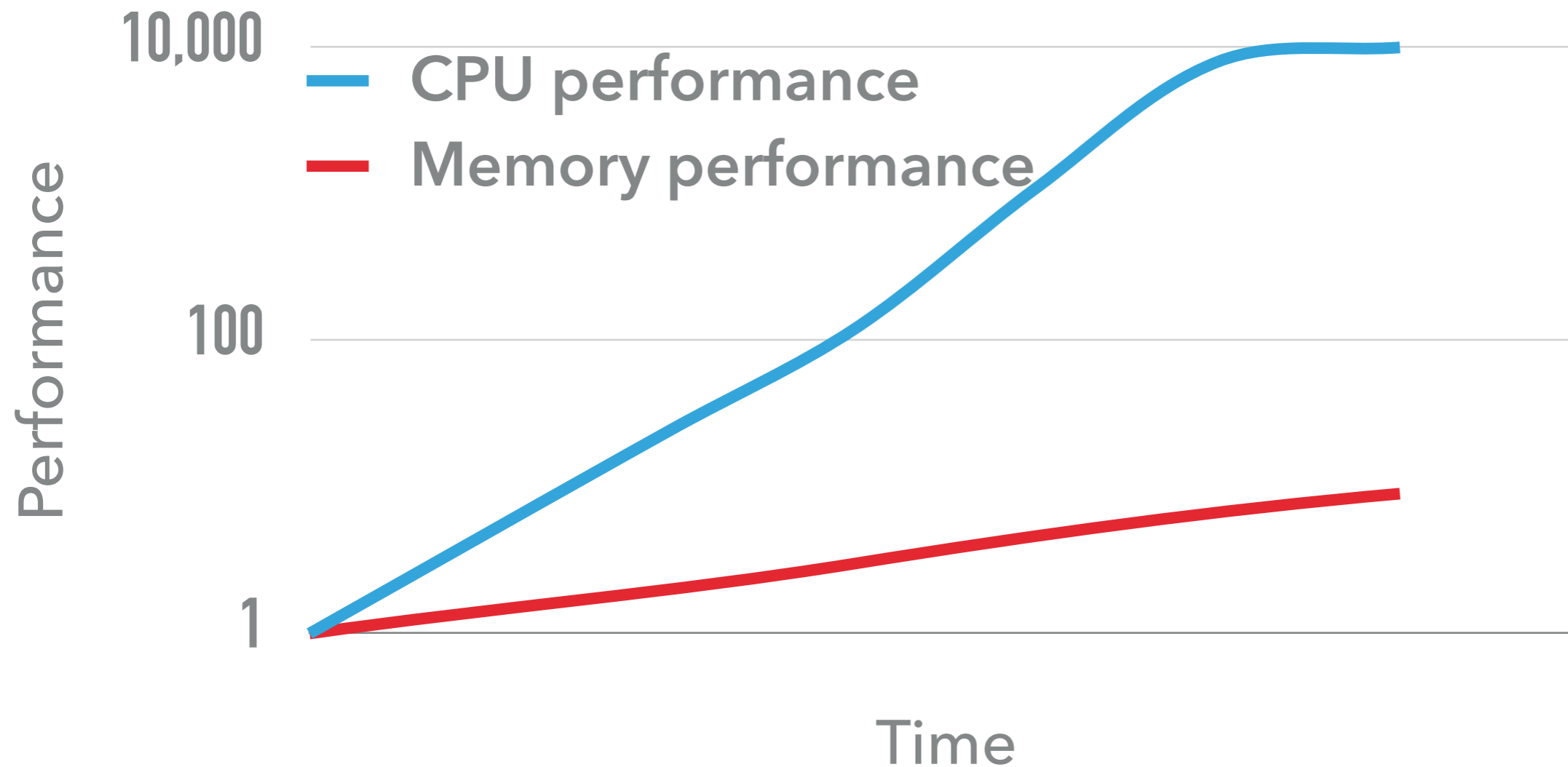
# **INTRODUCTION**

## MEMORY WALL PROBLEM

- ▶ The disparity between CPU performance and main memory latency has grown tightly.

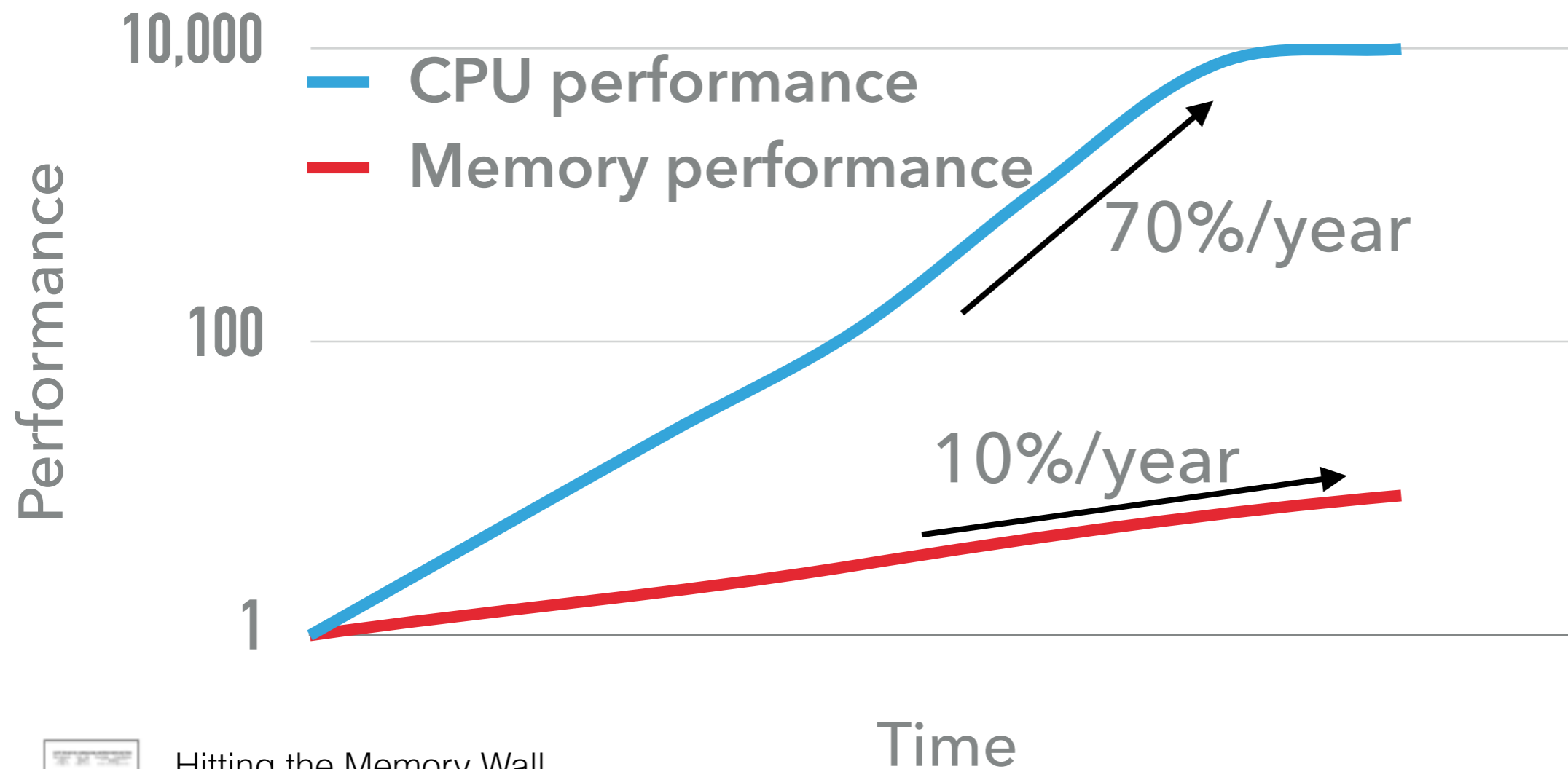
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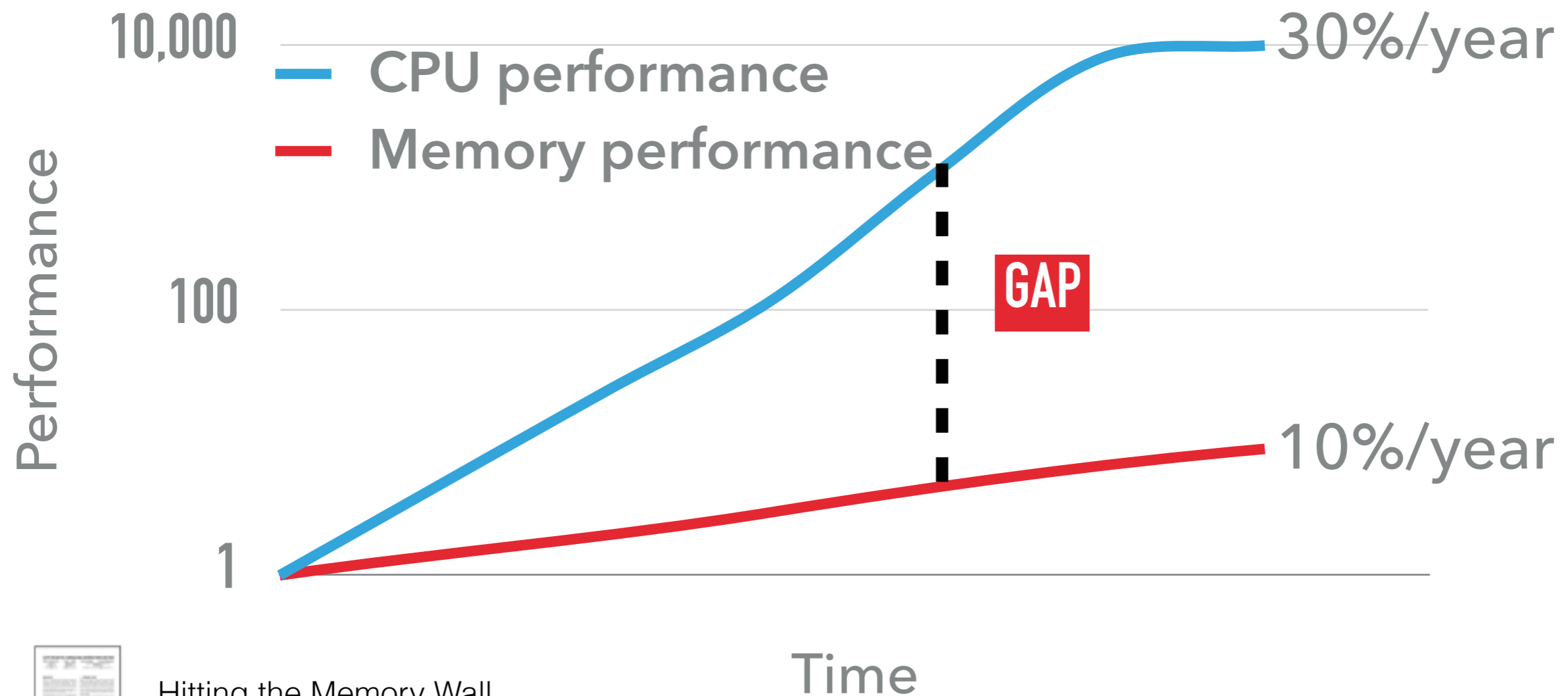
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Hitting the Memory Wall  
W. Wulf and McKee S.A.  
ACM Computer Architecture News, 1994

## MEMORY WALL PROBLEM

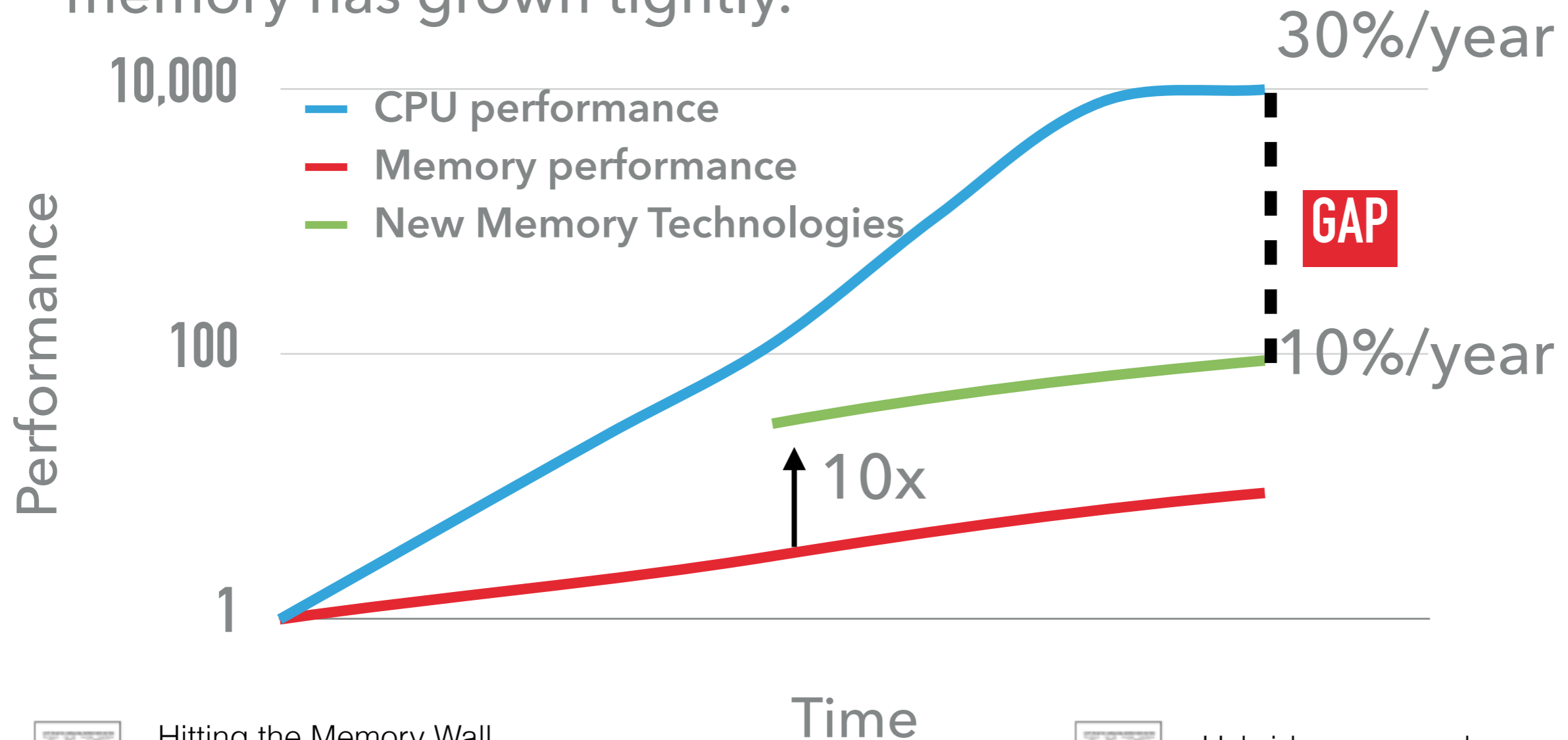
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Hybrid memory cube  
J. Jeddloh and B. Keet.  
Symposium on VLSI (VLSIT), 2012

# QUERY PROCESSING: WHERE DOES TIME GO?

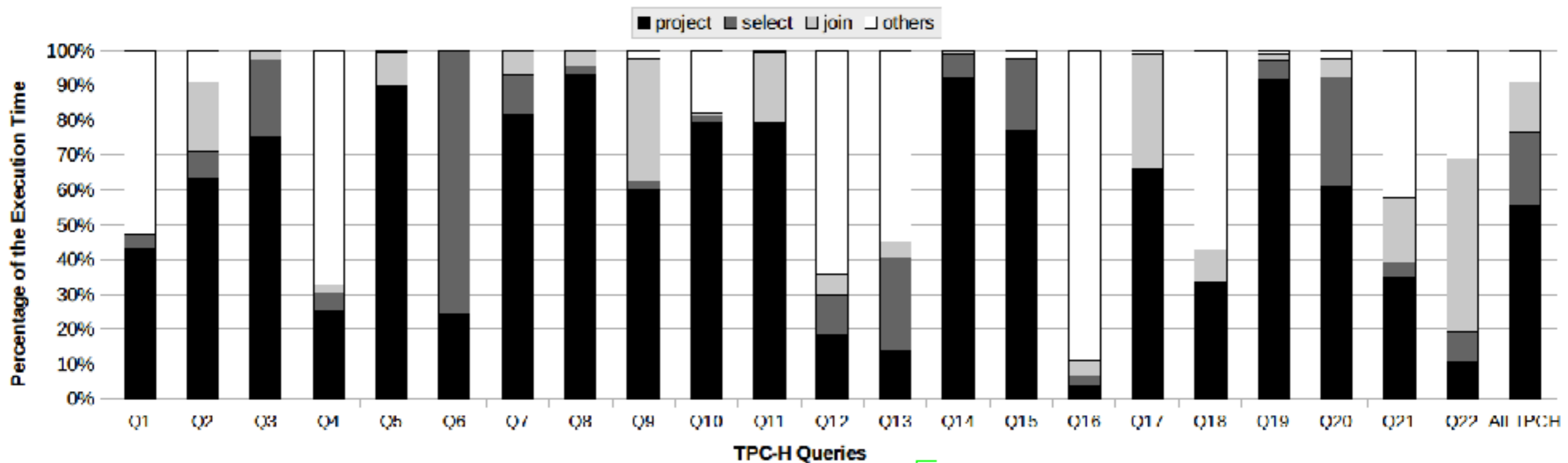


Figure 1: Top time consuming database operators in MonetDB [9] running the 100 GB TPC-H benchmark.

## TPC-H Queries - operators breakdown



Monetdb: Two decades of research in column-oriented database architectures

Idreos, S. and Groffen, F. and Nes, N. and Manegold, S. and Mullender, S. and Kersten, M.

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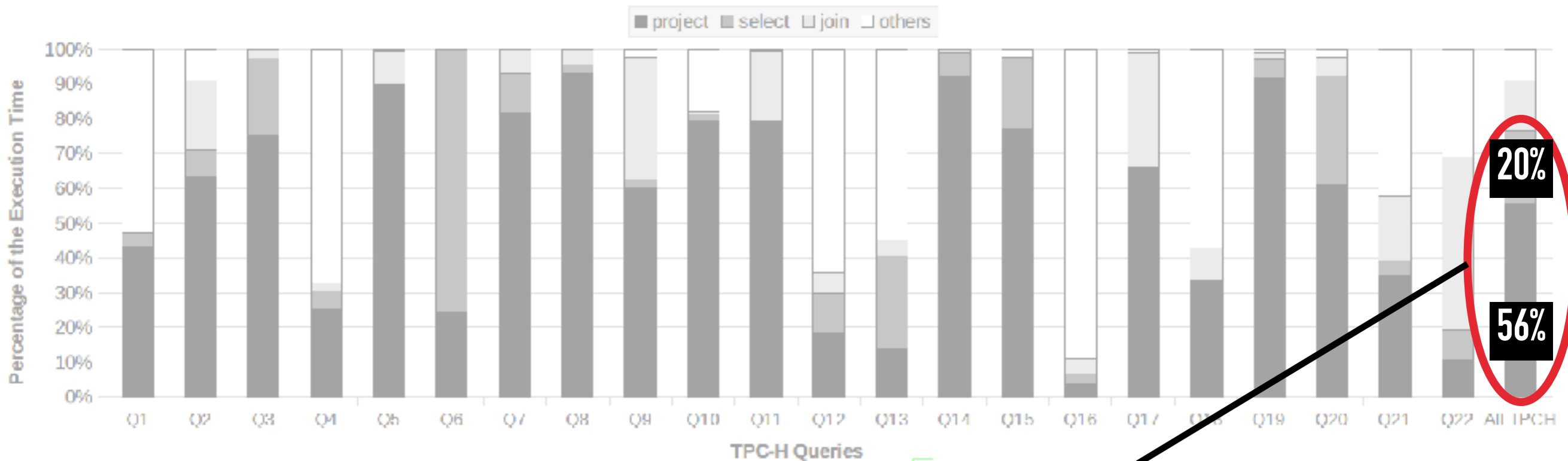


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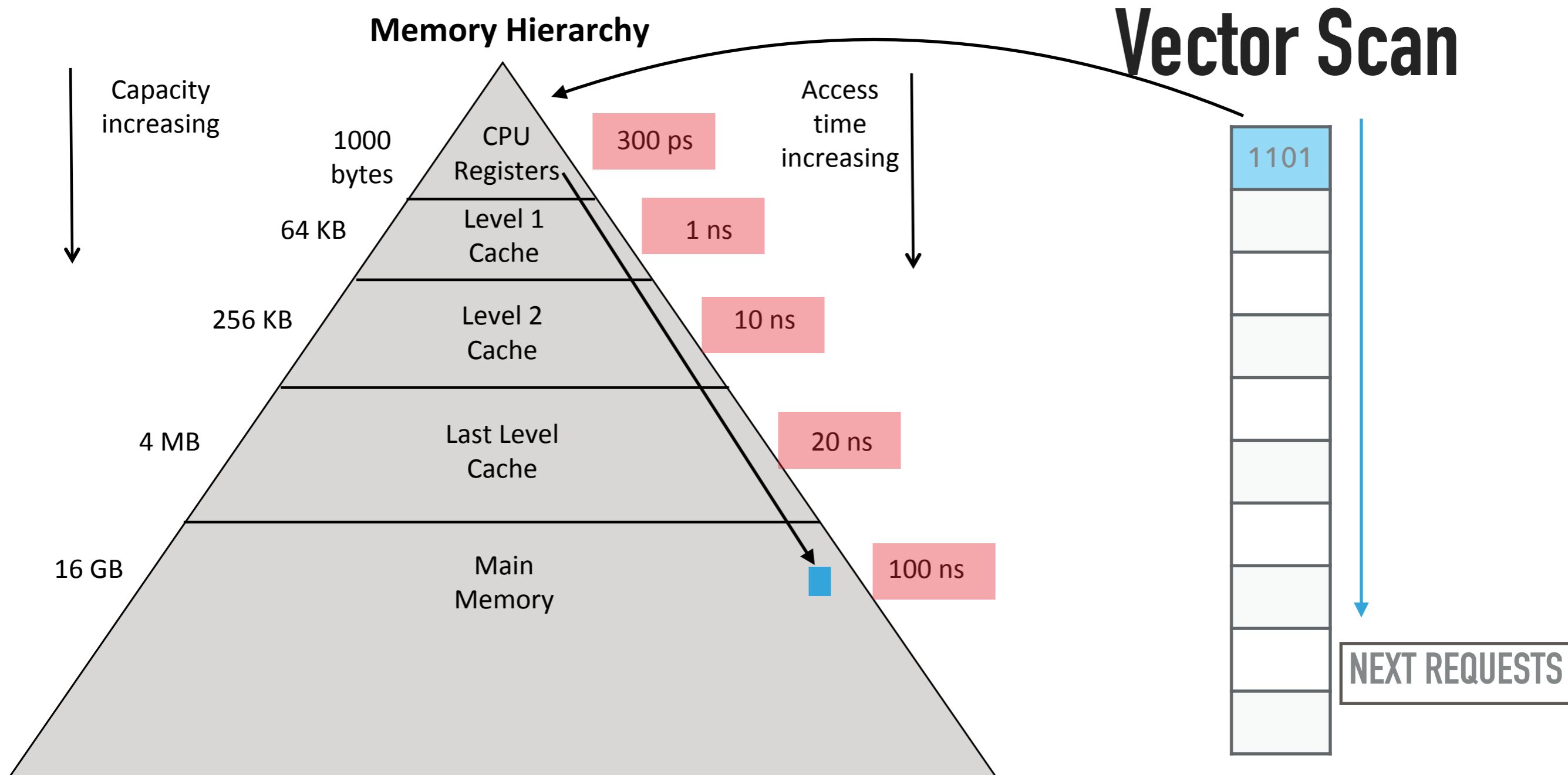
**76% IS SPENT IN SELECTION AND PROJECTION**

## TPC-H Queries - operations breakdown

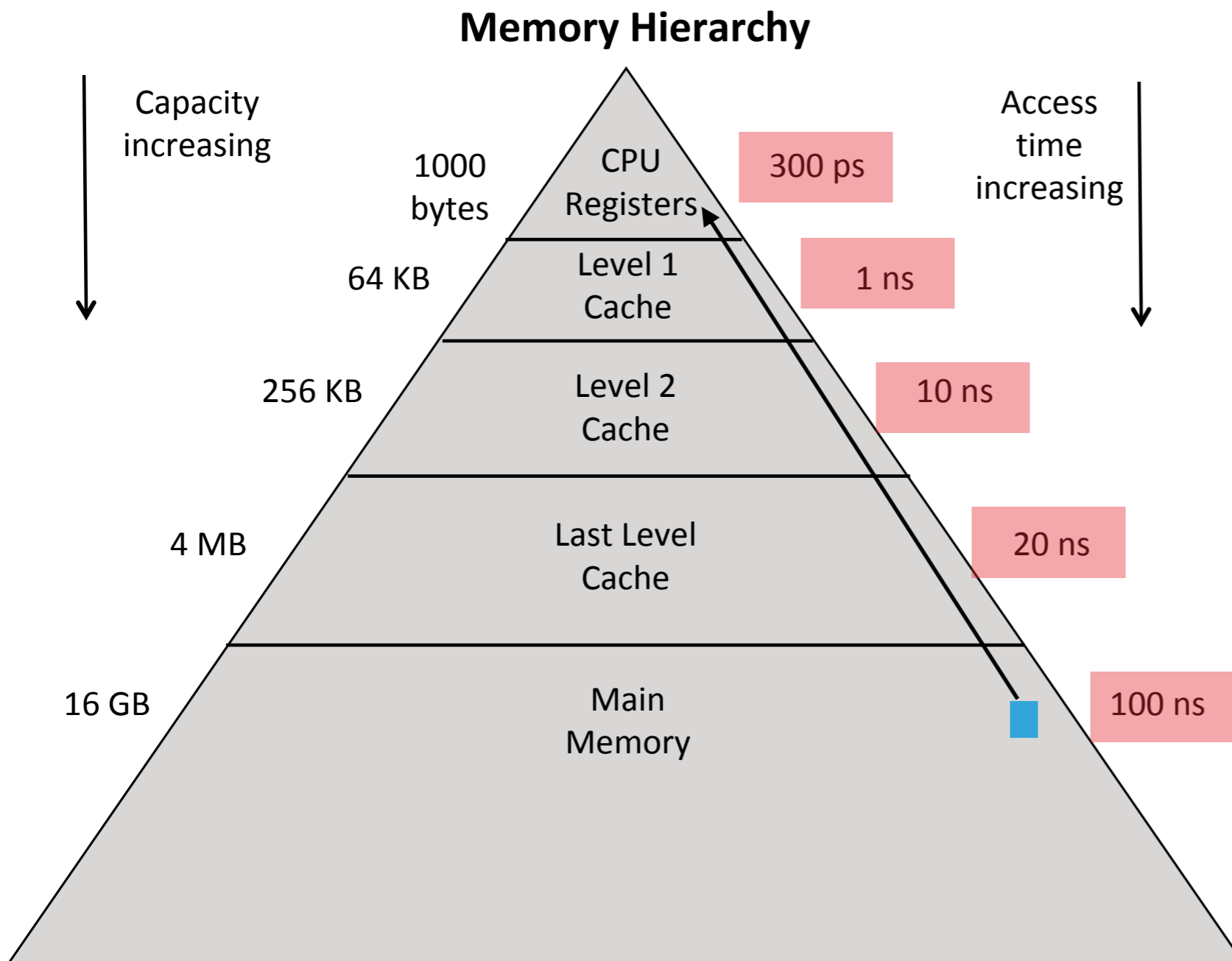


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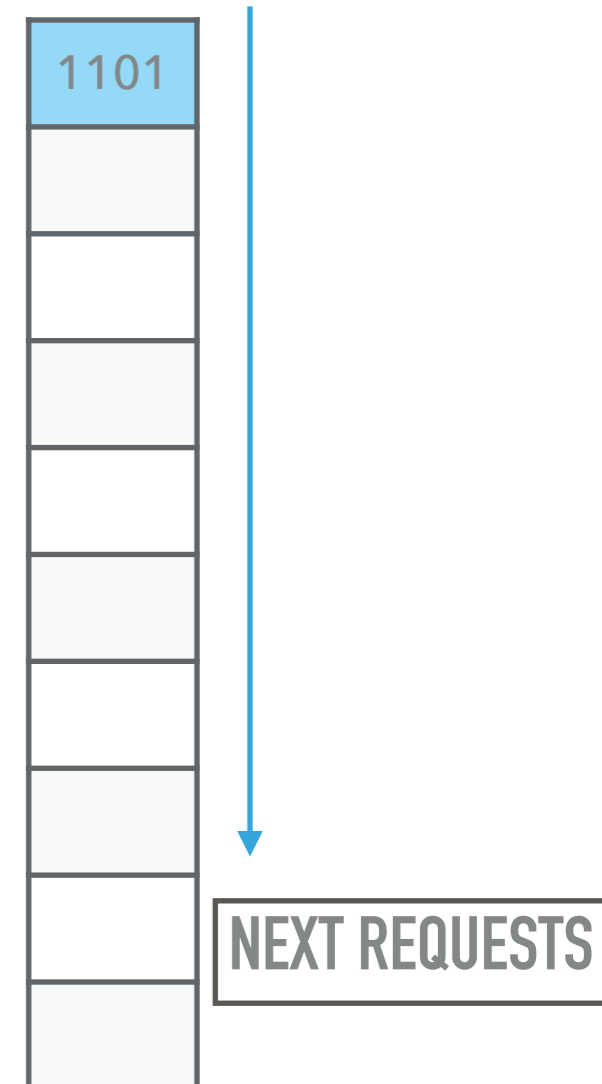
# DATA MOVEMENT IN DATABASE SYSTEMS



# DATA MOVEMENT IN DATABASE SYSTEMS



## Vector Scan



## NEAR-DATA PROCESSING (NDP)

- ▶ Cost of moving data is significant
- ▶ Performs the data processing in the main memory
- ▶ **Reduces energy consumption (data movement)**
- ▶ **Provides faster response time (no cache latency)**
- ▶ **With HMC the execution inside memory became tangible**



Near-Data Processing: Insights from a MICRO-46 Workshop

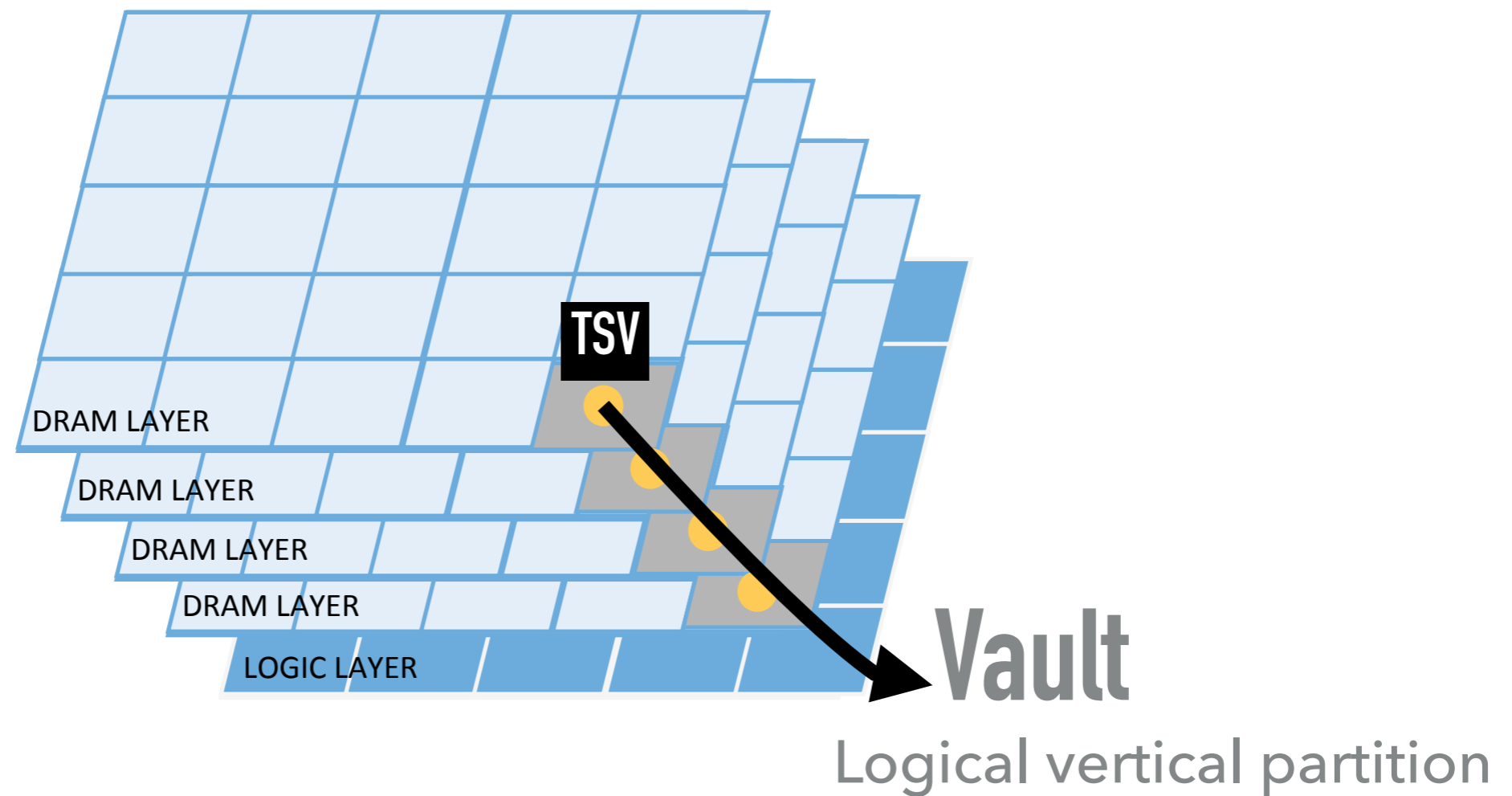
R. Balasubramonian, J. Chang, T. Manning, J. H. Moreno, R. Murphy, R. Nair, and S. Swanson.  
IEEE Micro, 34(4):36–42, 2014



Hybrid memory cube

J. Jeddelloh and B. Keet.  
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## HYBRID MEMORY CUBE (HMC)

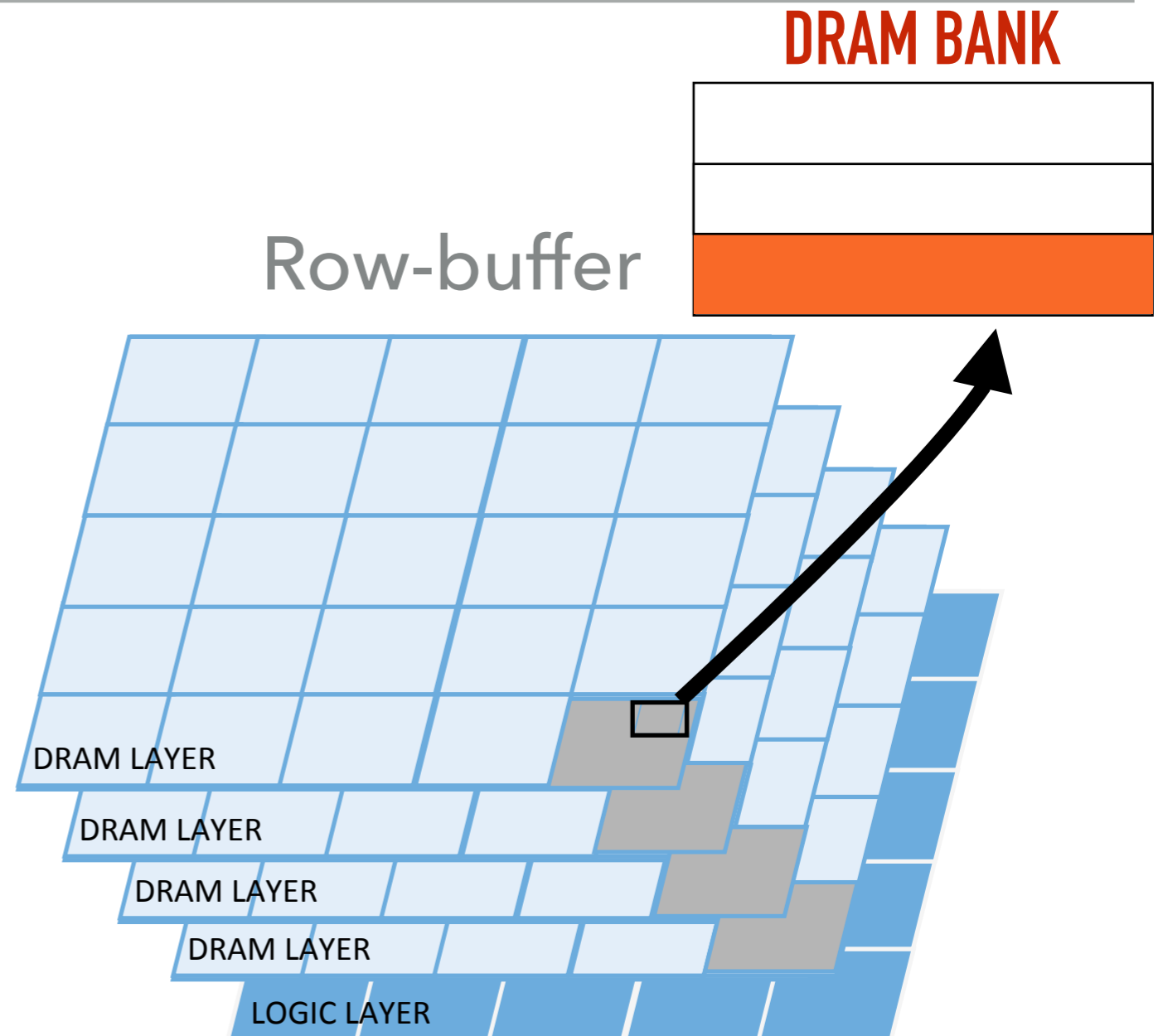


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TSV - THROUGH-SILICON VIAS

## HYBRID MEMORY CUBE (HMC)

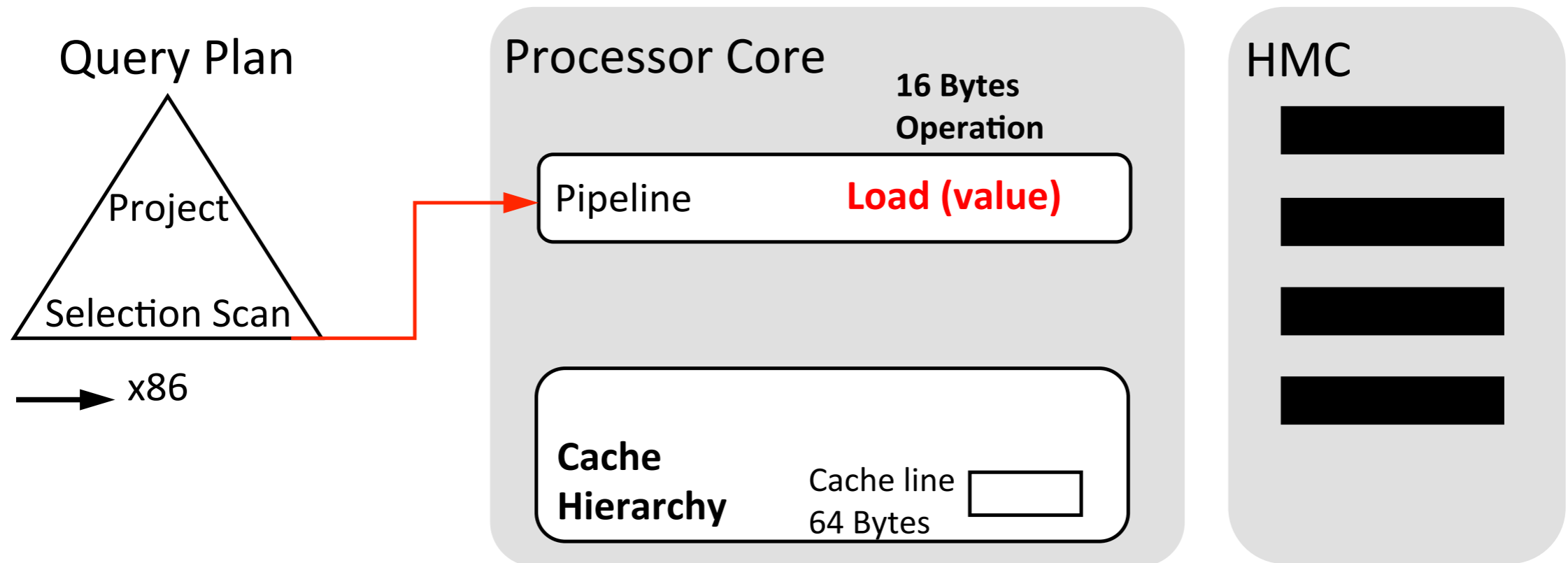
- ▶ Composed of 32 vaults
- ▶ **Bandwidth up to 320GB/s**
- ▶ **Instruction execution (16 bytes at a time)**
- ▶ 256 Bytes of row buffer



1. What happens when database systems run the select scan over the current x86 architecture using the HMC as ordinary DRAM?

Research Question

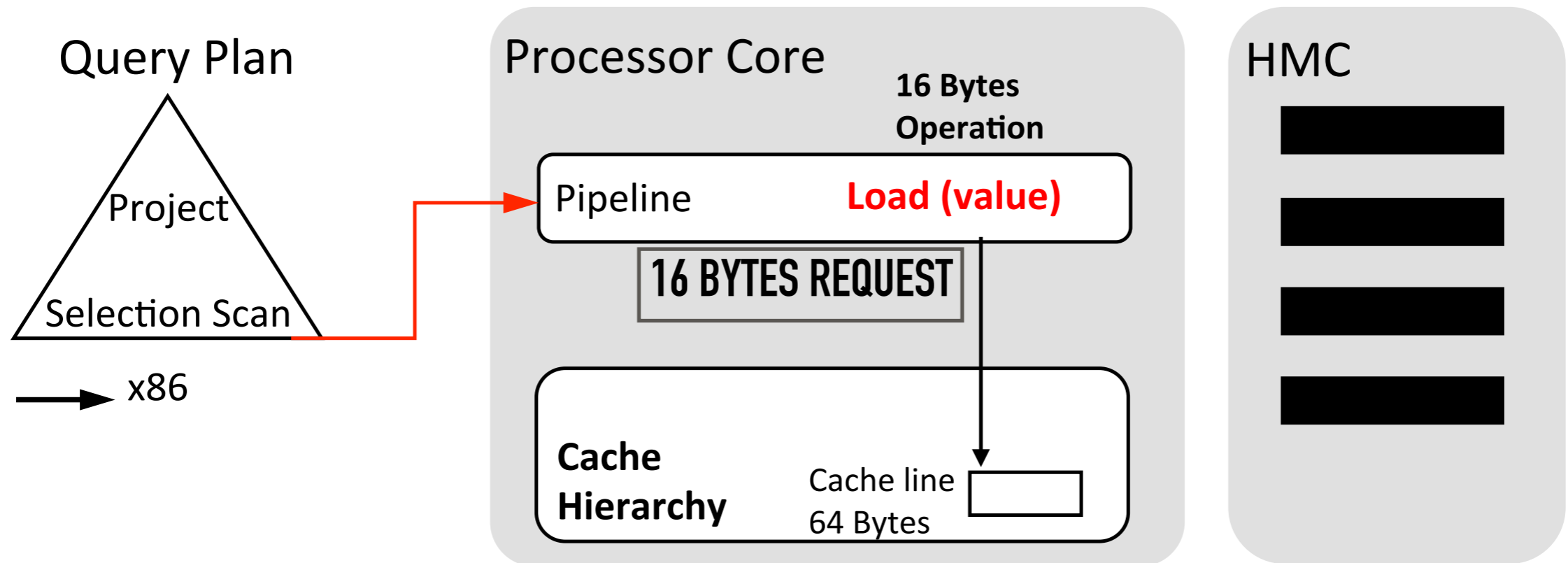
# DATABASE SYSTEMS PREDICATE PROCESSING



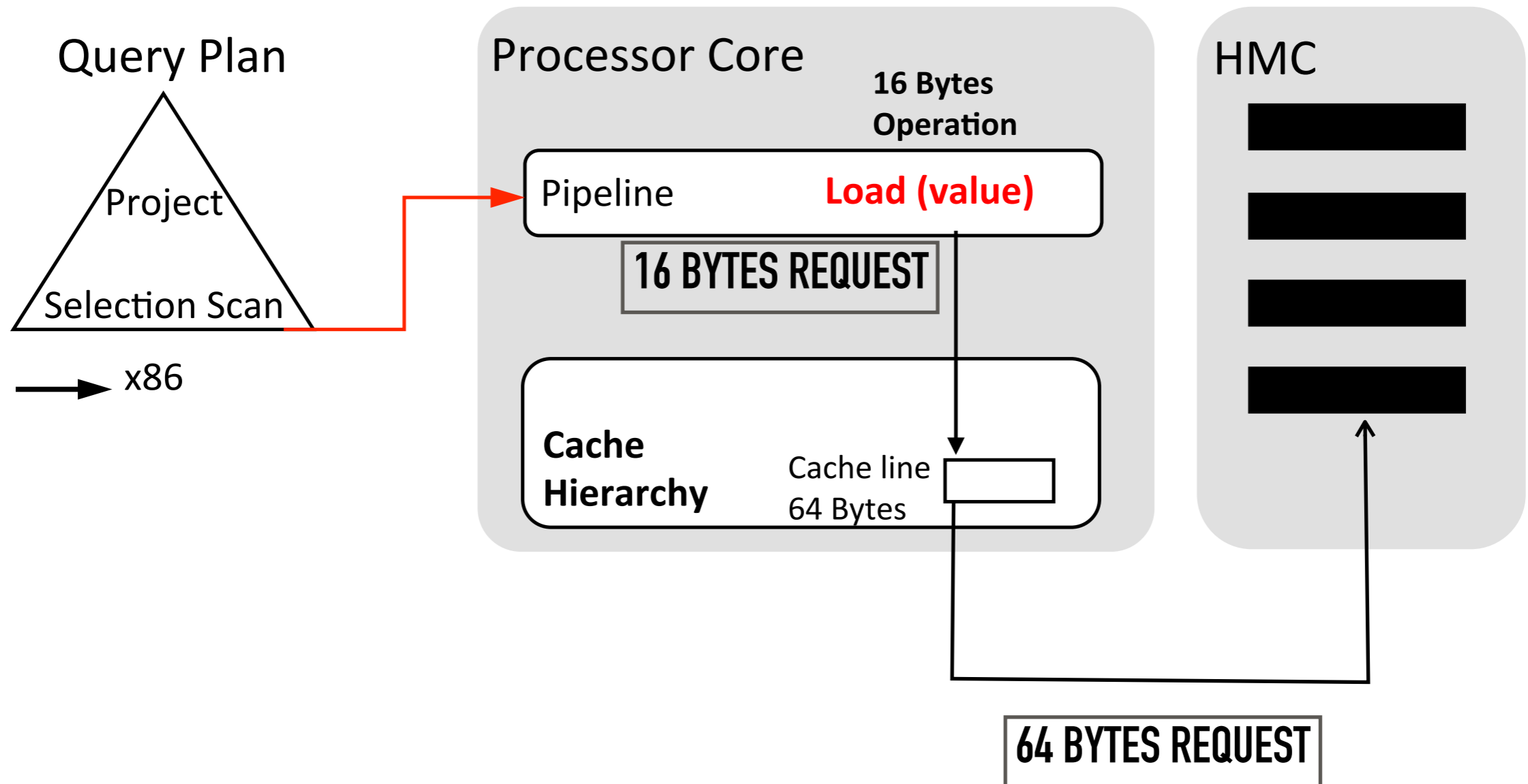
“SELECT <COLUMNS> FROM <TABLES> WHERE <CONDITION> AND/OR <CONDITION>”



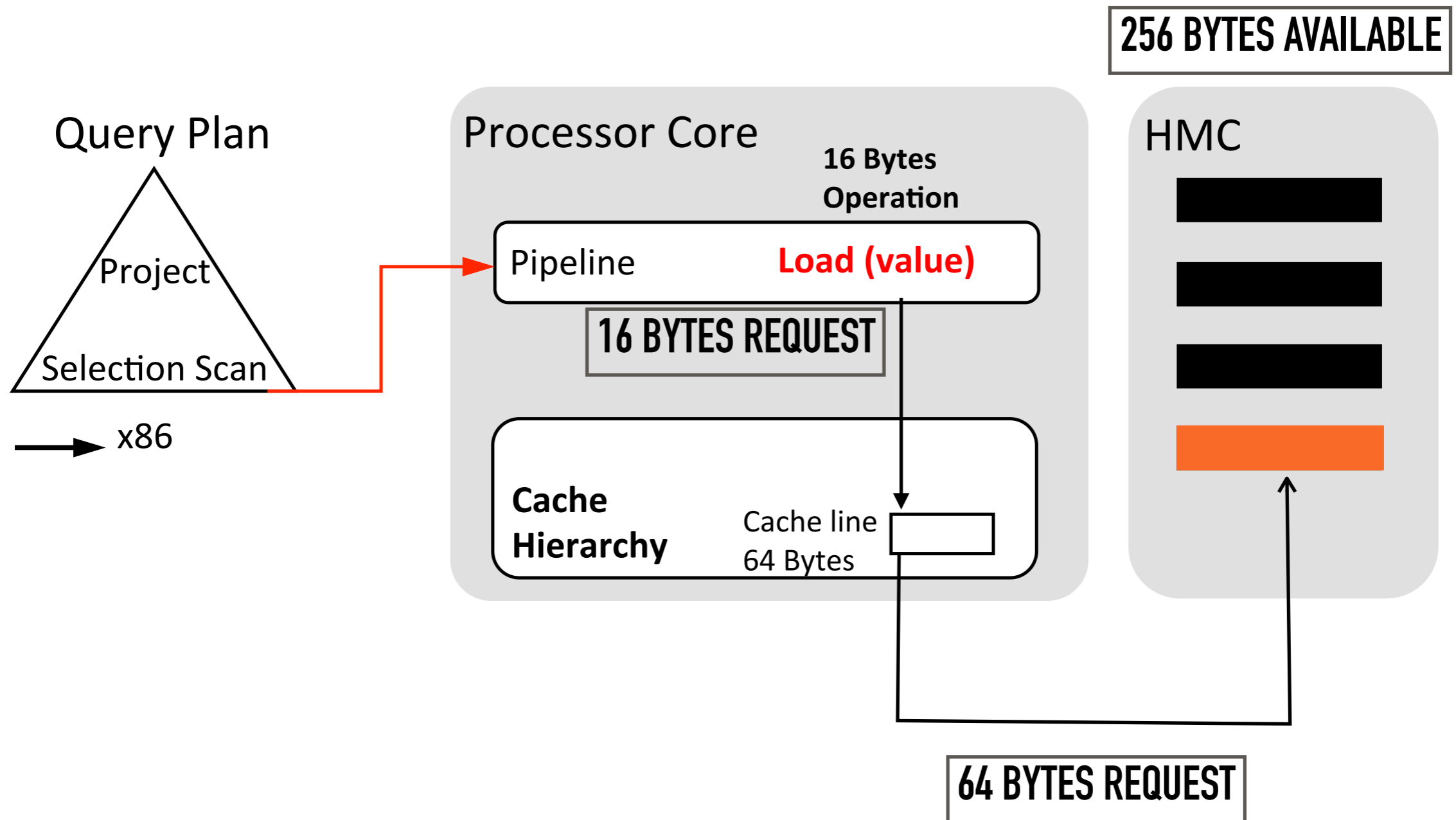
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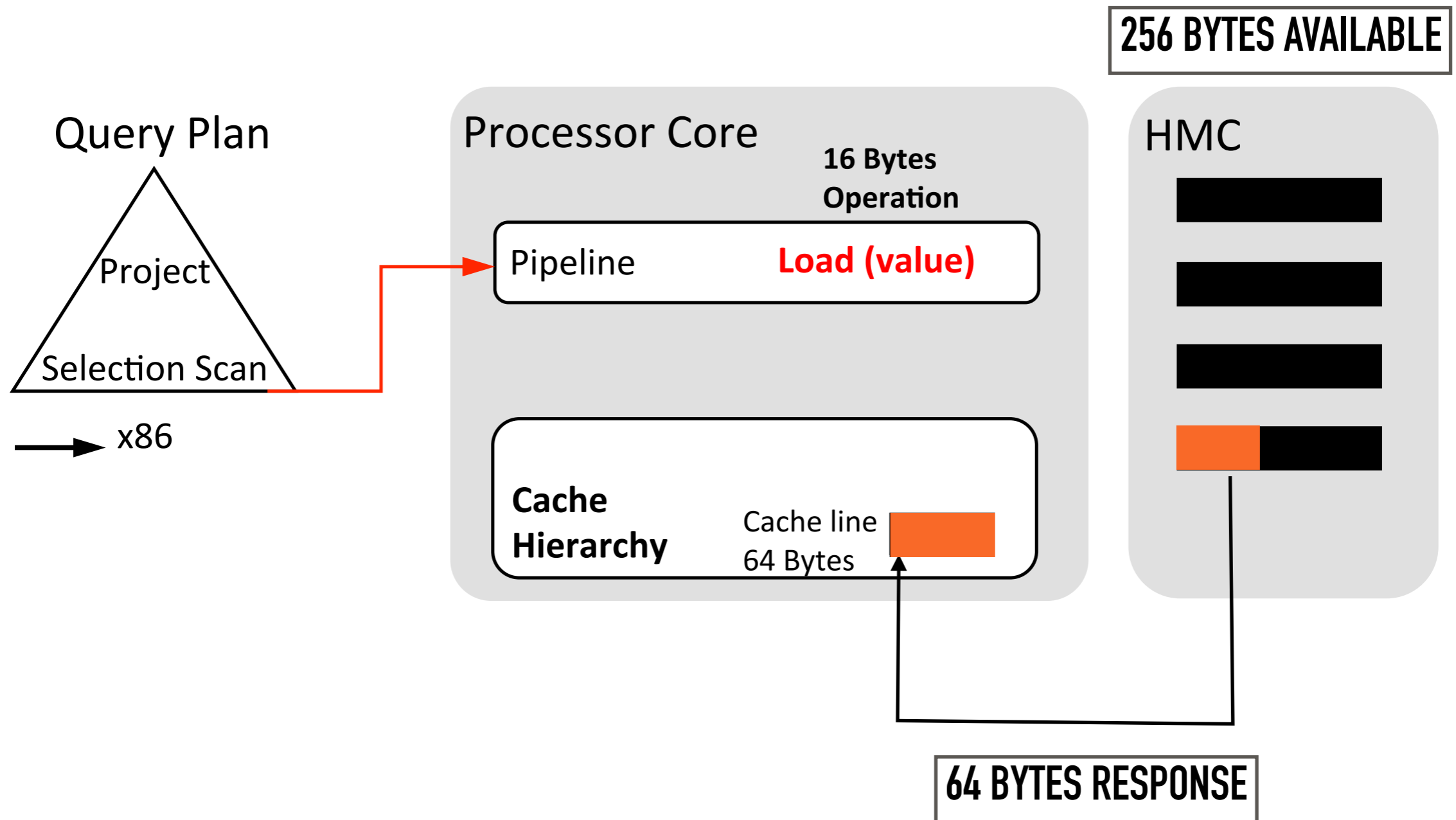
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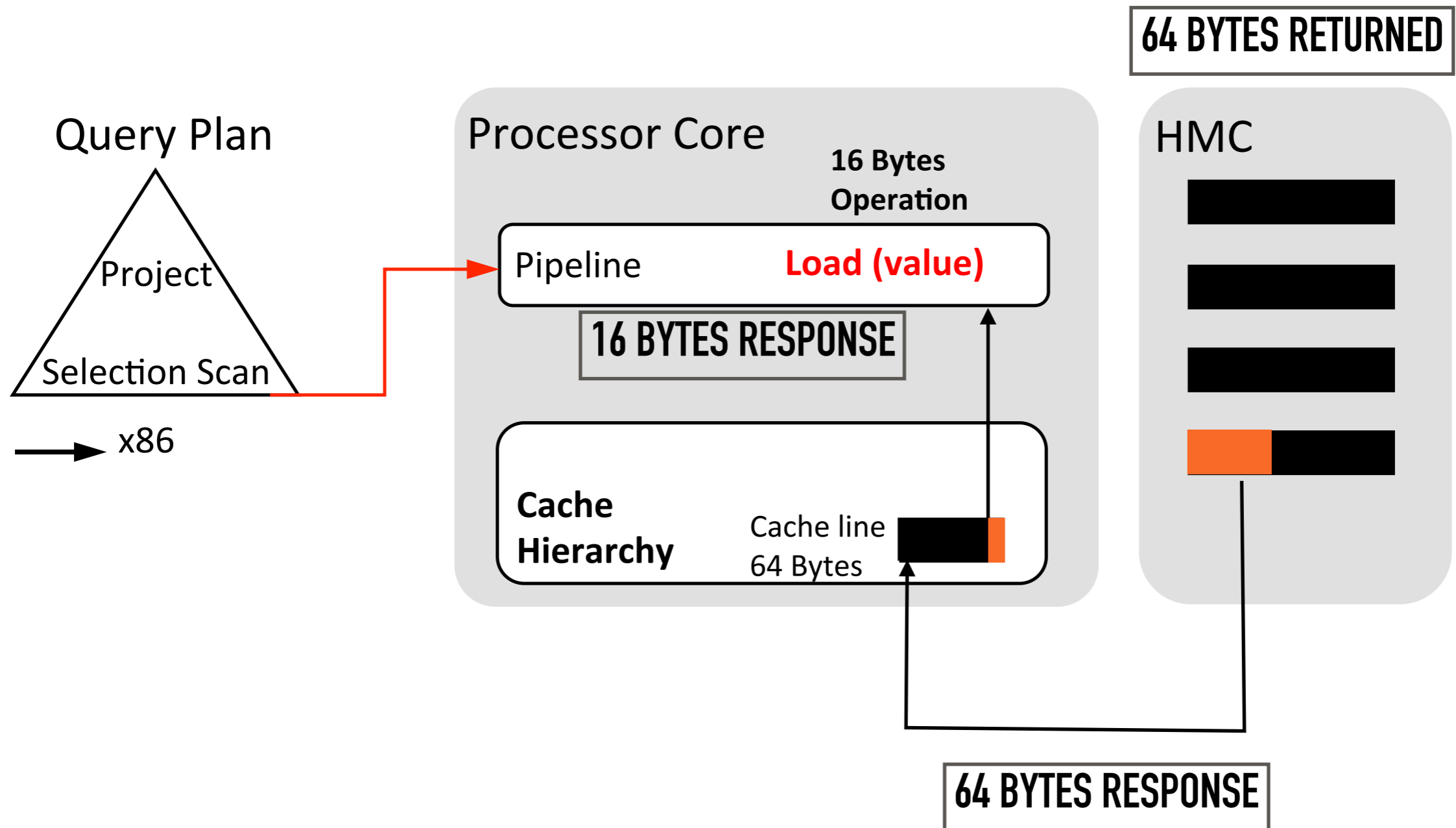
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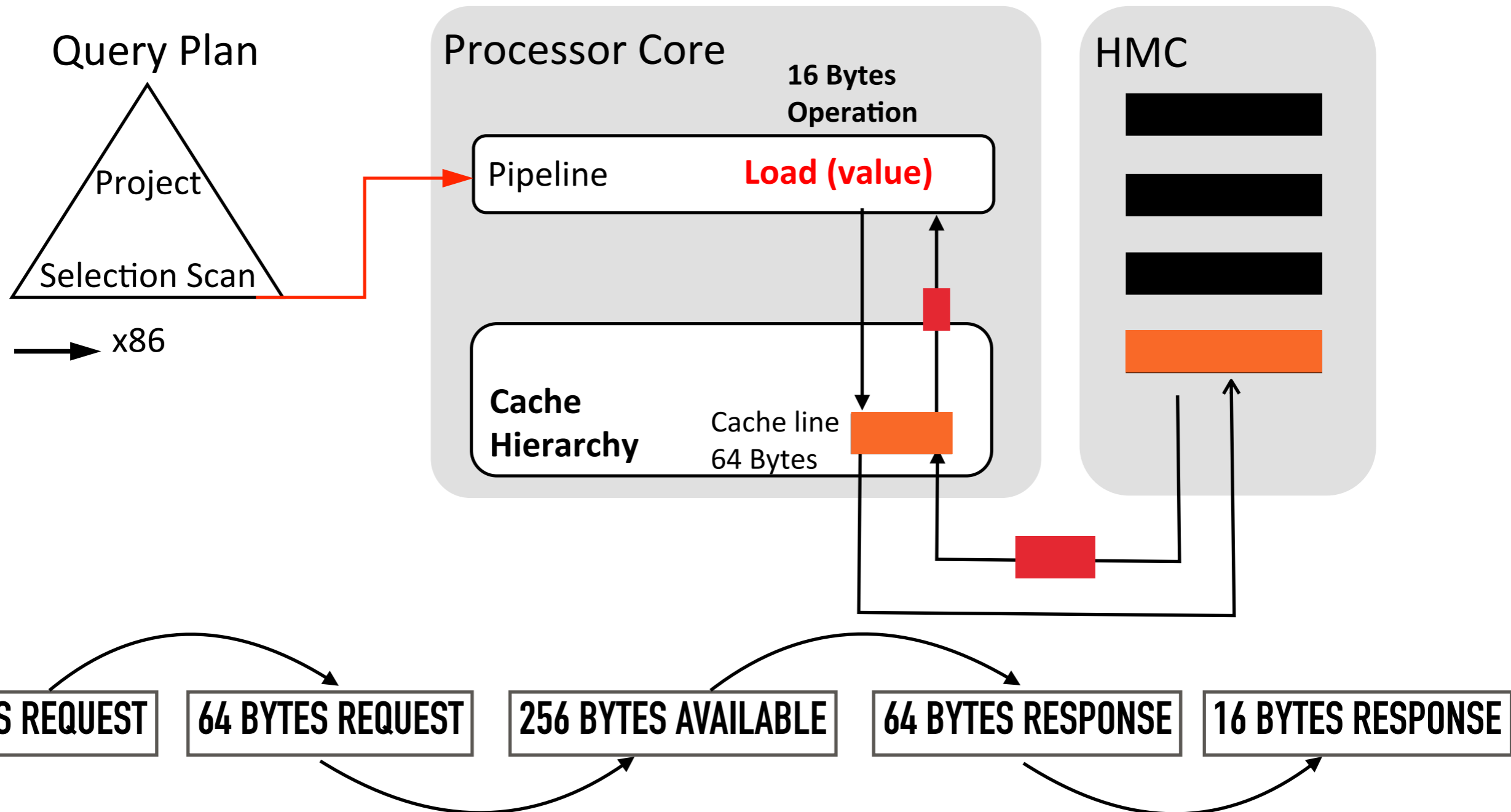


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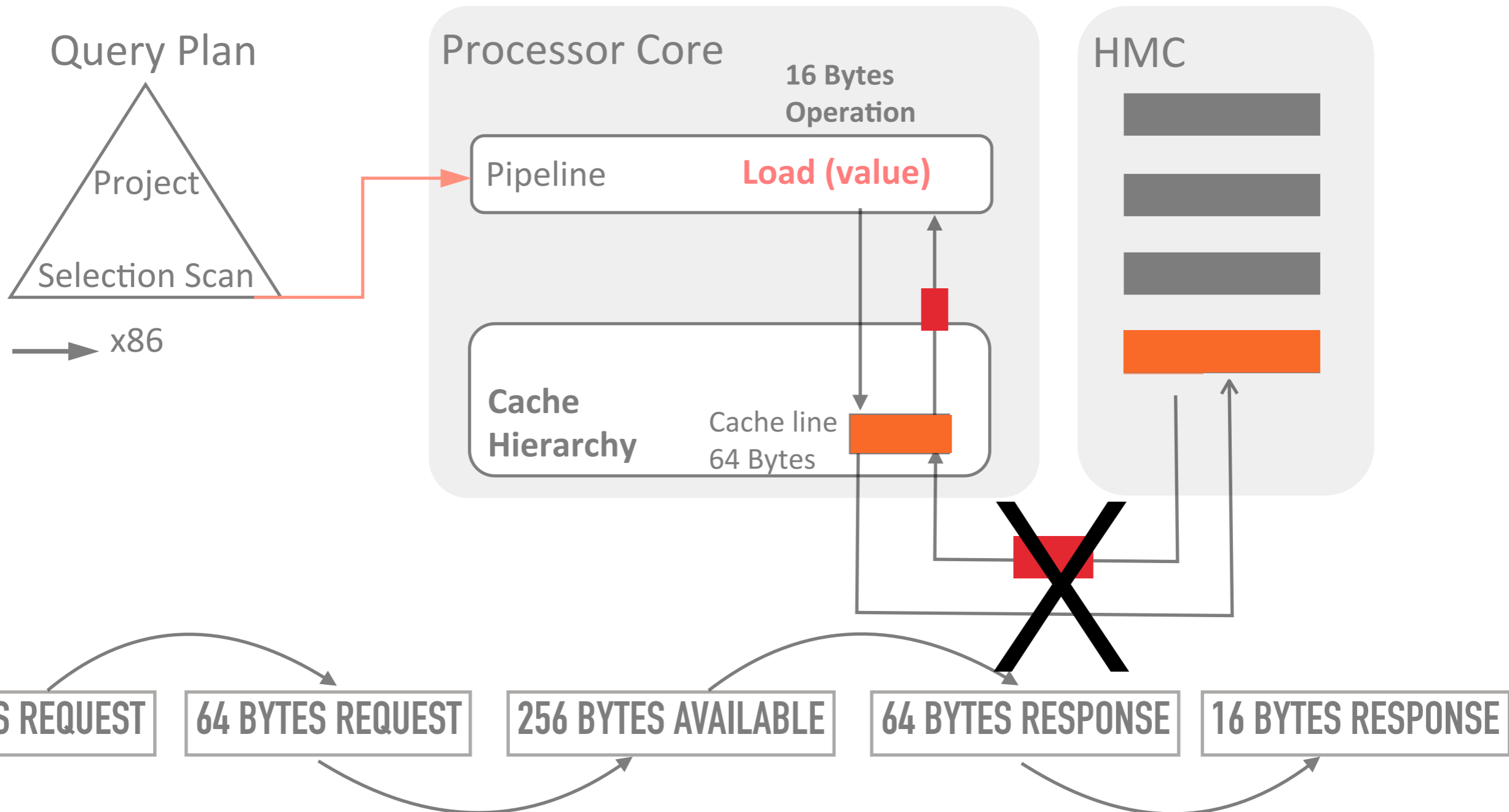
# DATABASE SYSTEMS PREDICATE PROCESSING

## DATA-MOVEMENT



# DATABASE SYSTEMS PREDICATE PROCESSING

## DO MITIGATE DATA-MOVEMENT



## NEAR-DATA FILTERS FOR DATABASE SYSTEMS

- ▶ Allow the execution of filtering inside the HMC
- ▶ Take advantage of the HMC instruction execution and high bandwidth capacity to mitigate the “memory wall”
- ▶ Increase the parallelism of the filtering execution
- ▶ With extensions for the HMC ISA filtering is done by branch-less decisions



Near Data Filters: Taking Another Brick from the Memory Wall

Diego G. Tomé, Tiago R. Kepe, Marco A. Z. Alves, and Eduardo C. Almeida.  
ADMS@VLDB, 2018



Hipe: Hmc Instruction Predication Extension Applied on Database Processing

Diego G. Tomé, Marco A. Z. Alves, and Eduardo C. Almeida.  
DATE, 2018

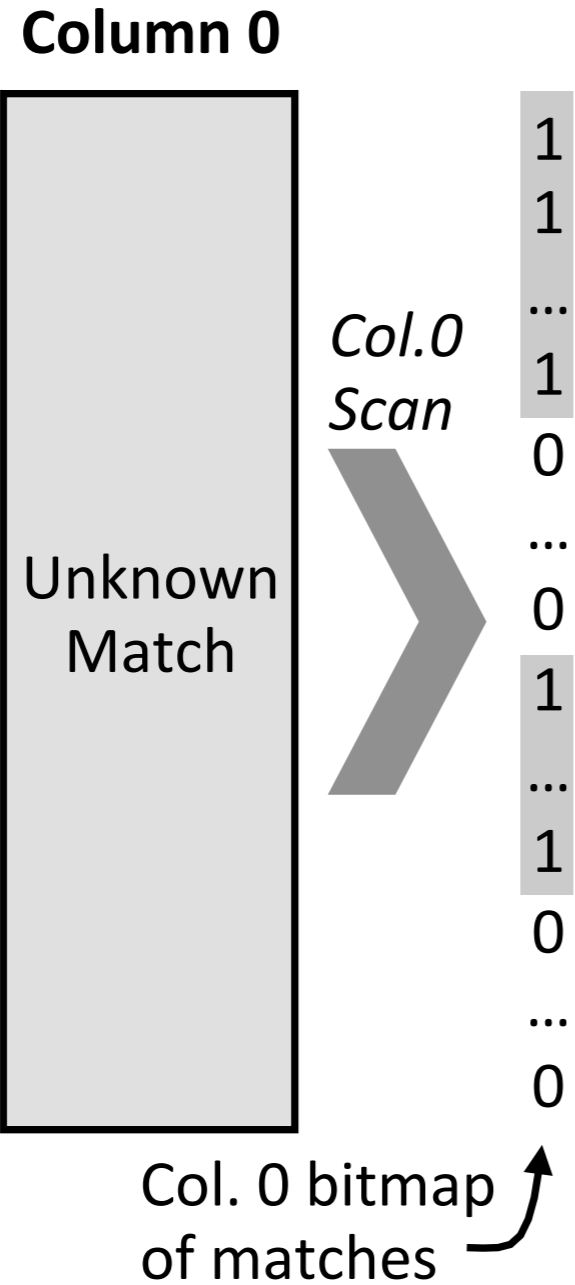


1. What happens when database systems run the select scan over the current x86 architecture using the HMC as ordinary DRAM? **Memory wall is still a problem.**
2. Can we use the current HMC Instruction Set Architecture (ISA) to implement the near-data filter?

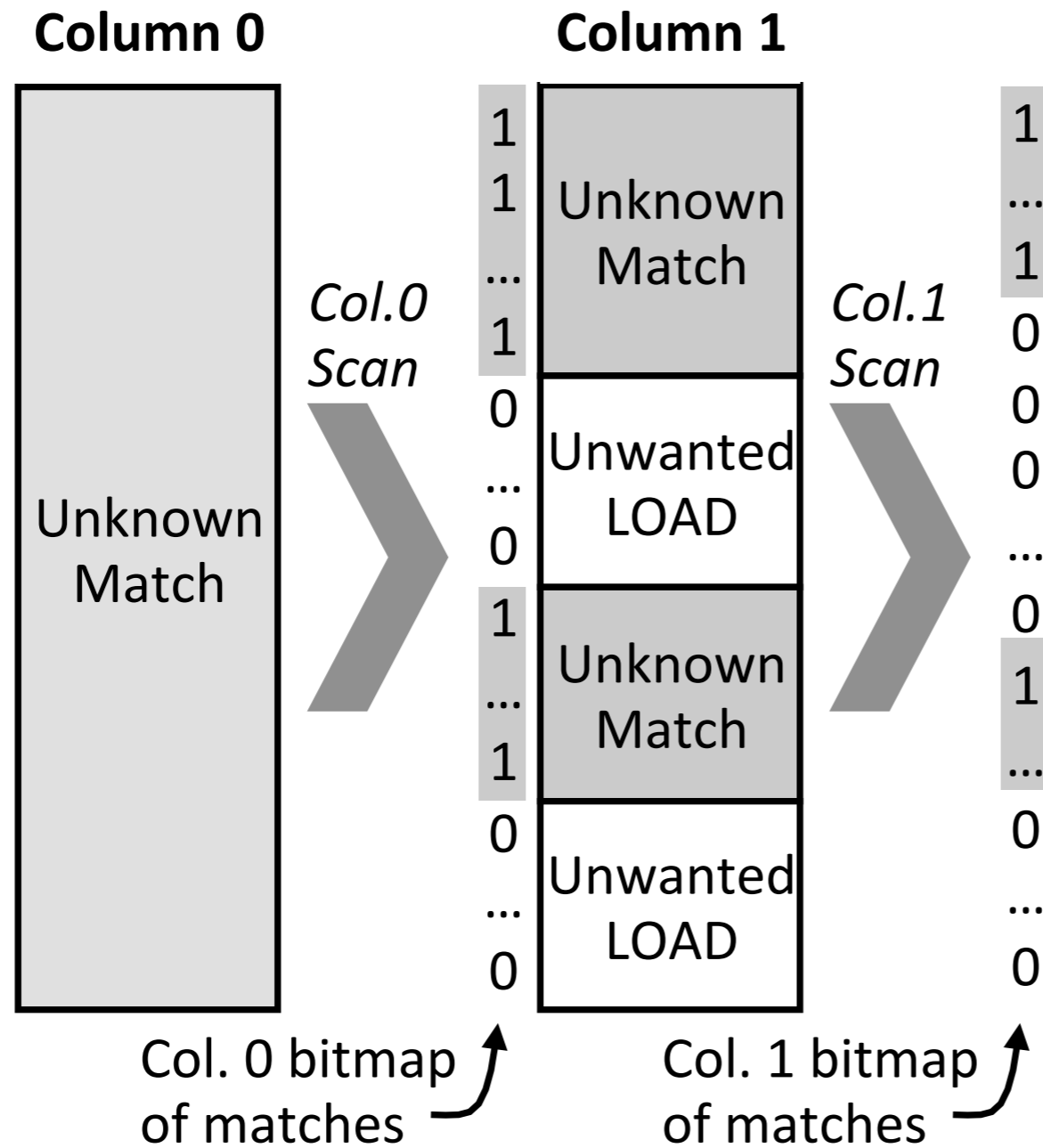
Research Question

# HMC-SCAN LIMITATIONS

```
SELECT COLUMN  
FROM TABLE  
WHERE COLUMN < 10
```

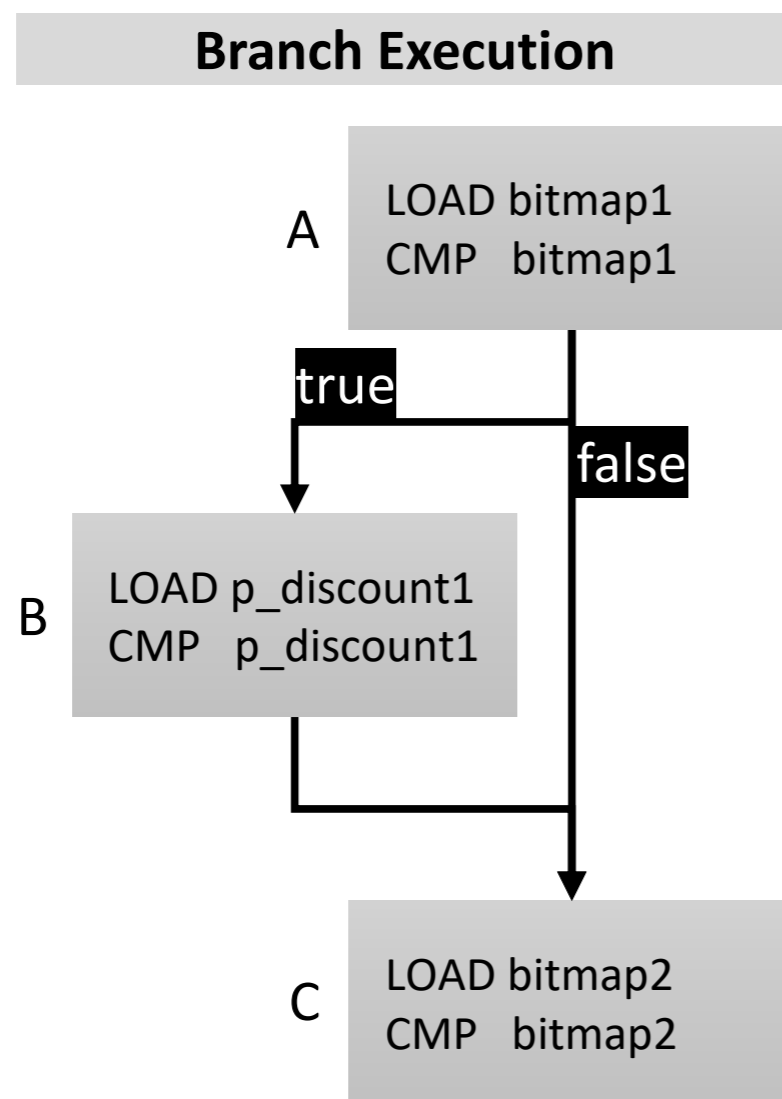


# HMC-SCAN LIMITATIONS

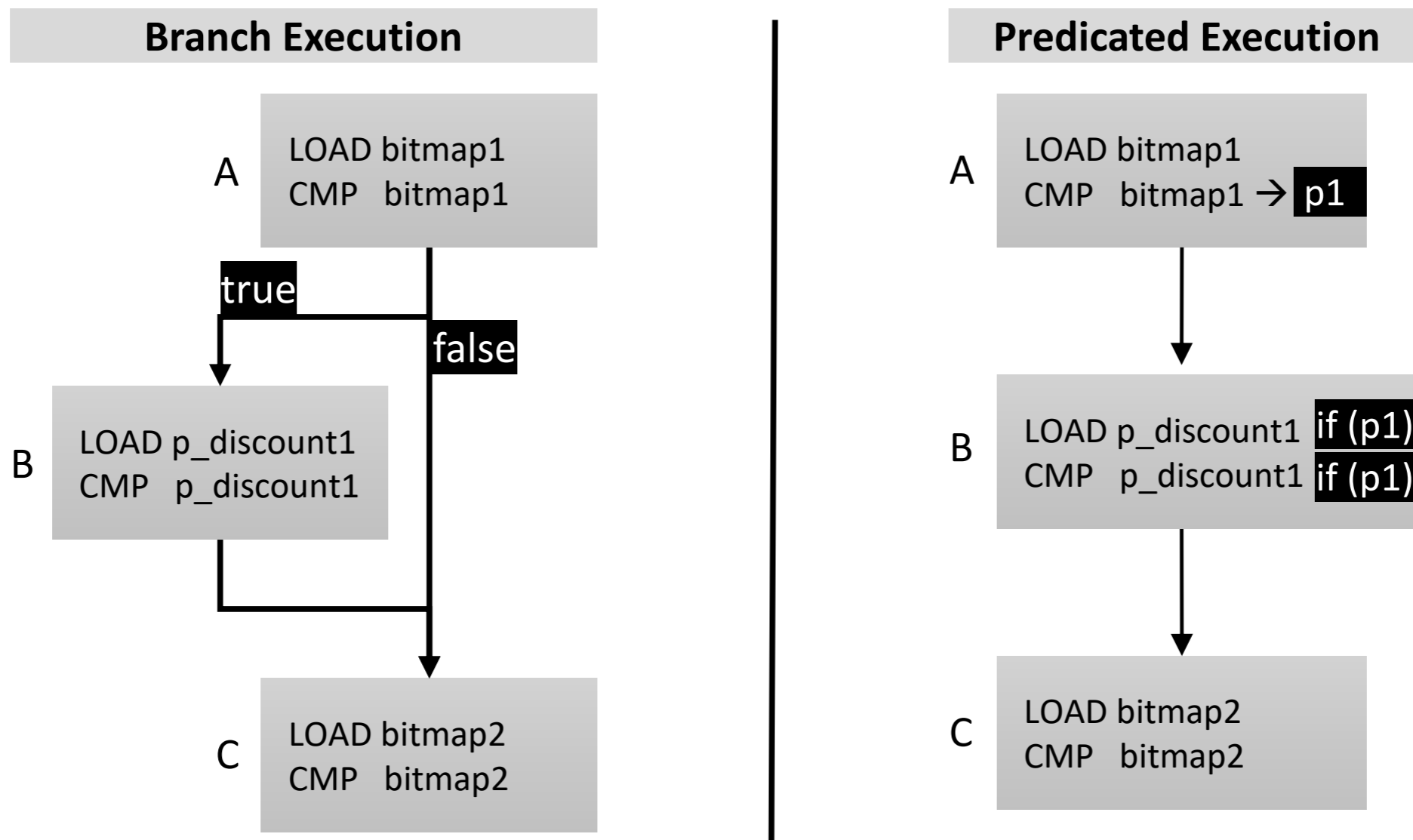


**SELECT COLUMN  
FROM TABLE  
WHERE COLUMN < 10  
AND COLUMN 1 < 10**

# HMC-SCAN LIMITATIONS



# HMC-SCAN LIMITATIONS



3. What are the extensions to the HMC ISA to leverage the full potential of the hardware and reduce the interleaving with x86 instructions?"

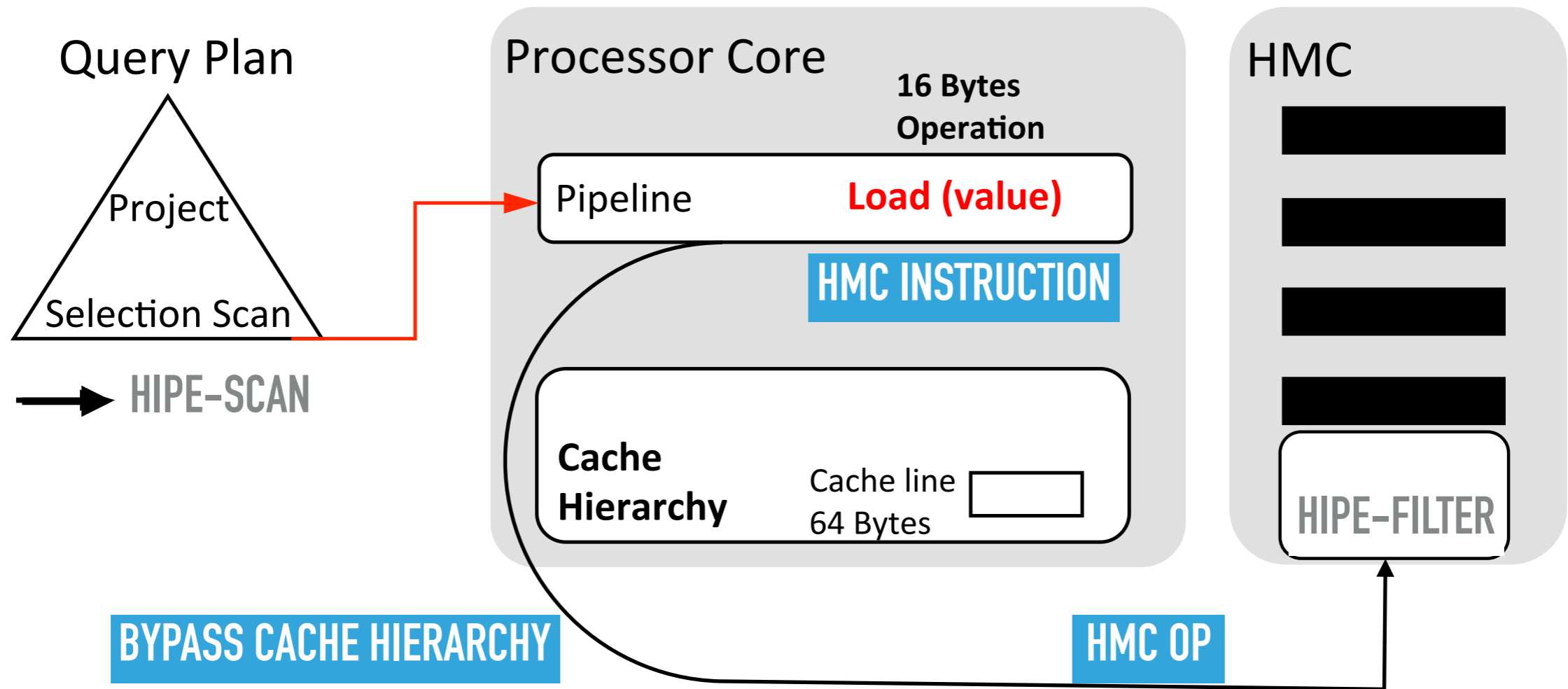
Research Question

## HIPE-FILTER: HMC INSTRUCTION PREDICATION EXTENSION

- ▶ A comparison instruction between address and immediate
- ▶ 32 Vector Functional Units, one per vault
- ▶ Bigger operations, with up to 256 bytes
- ▶ 36 Registers 256 Bytes wide
- ▶ Interleaves x86 with HMC instructions



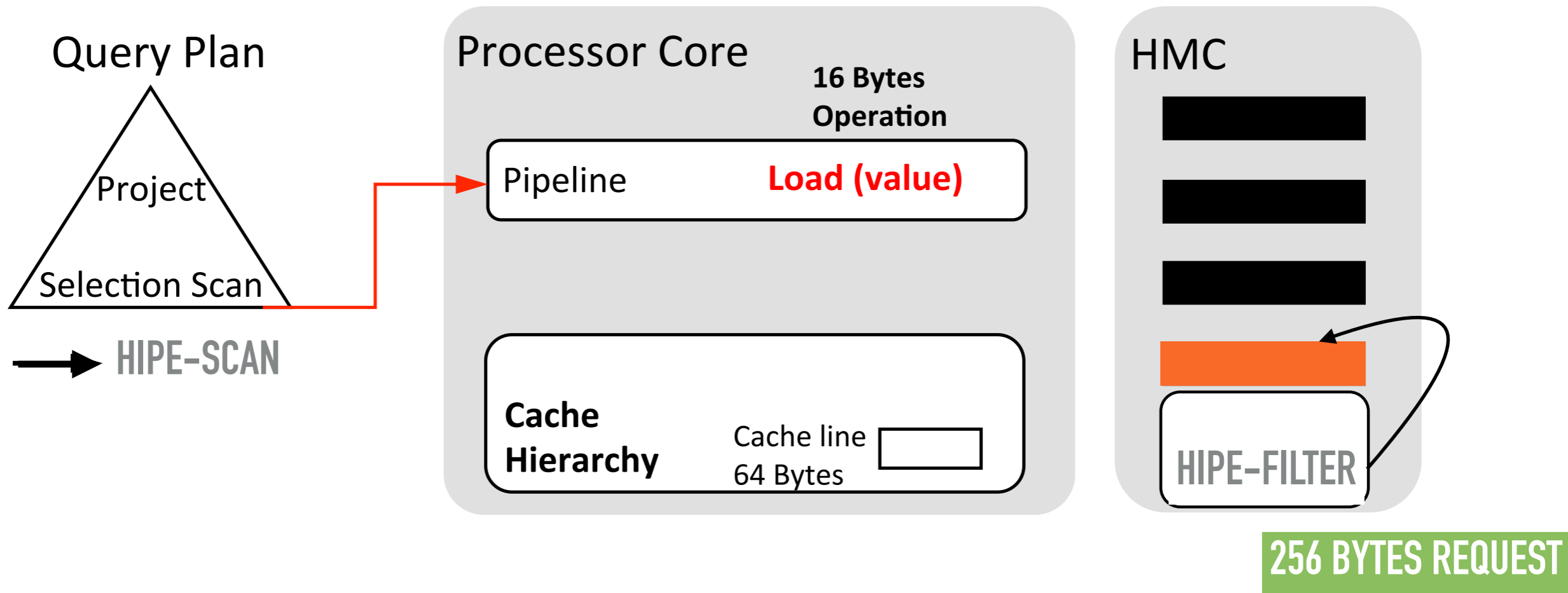
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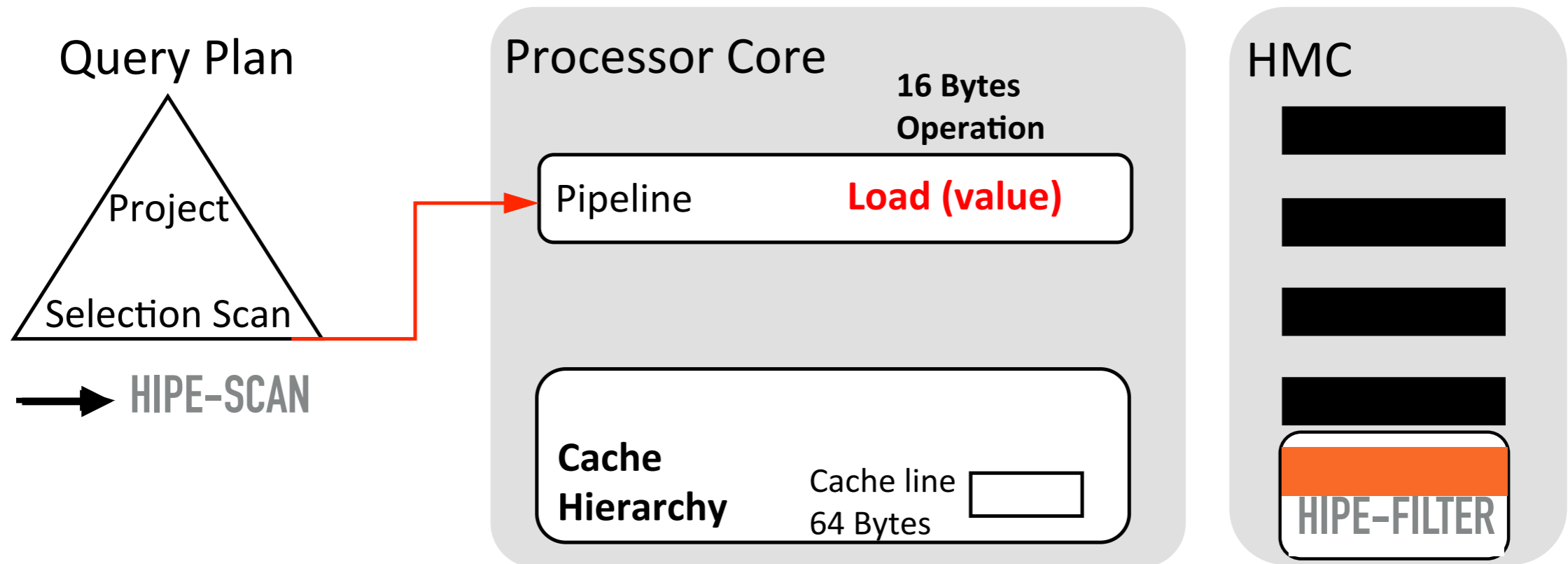
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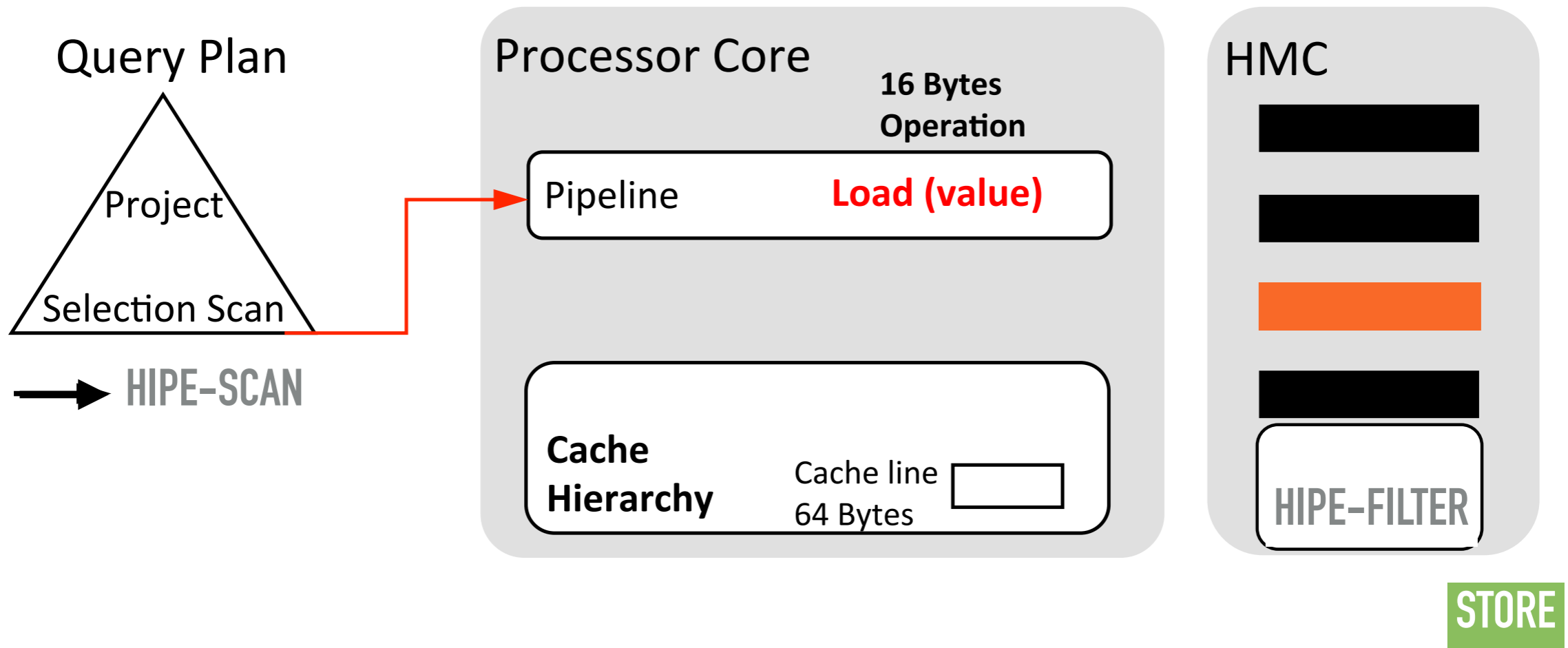


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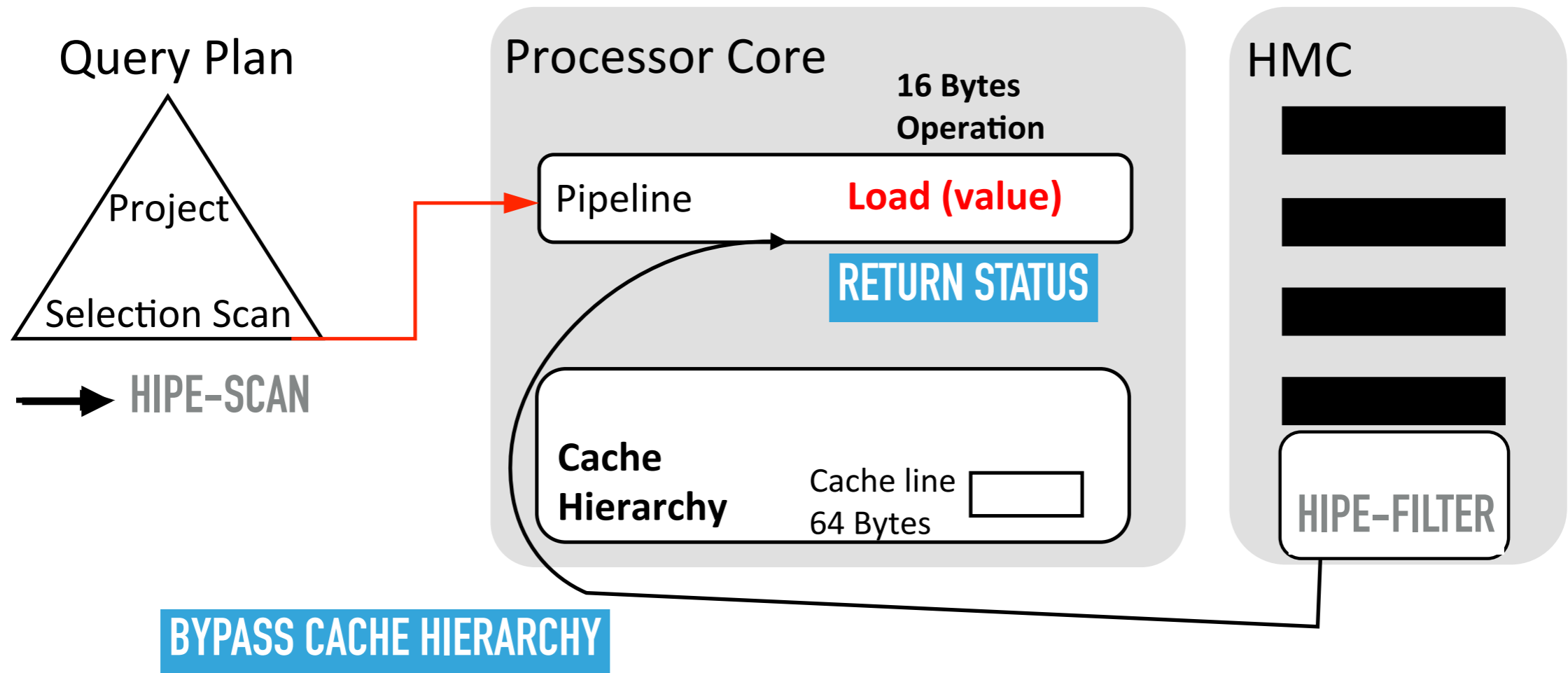


256 BYTES OPERATION

# DATABASE SYSTEMS PREDICATE PROCESSING

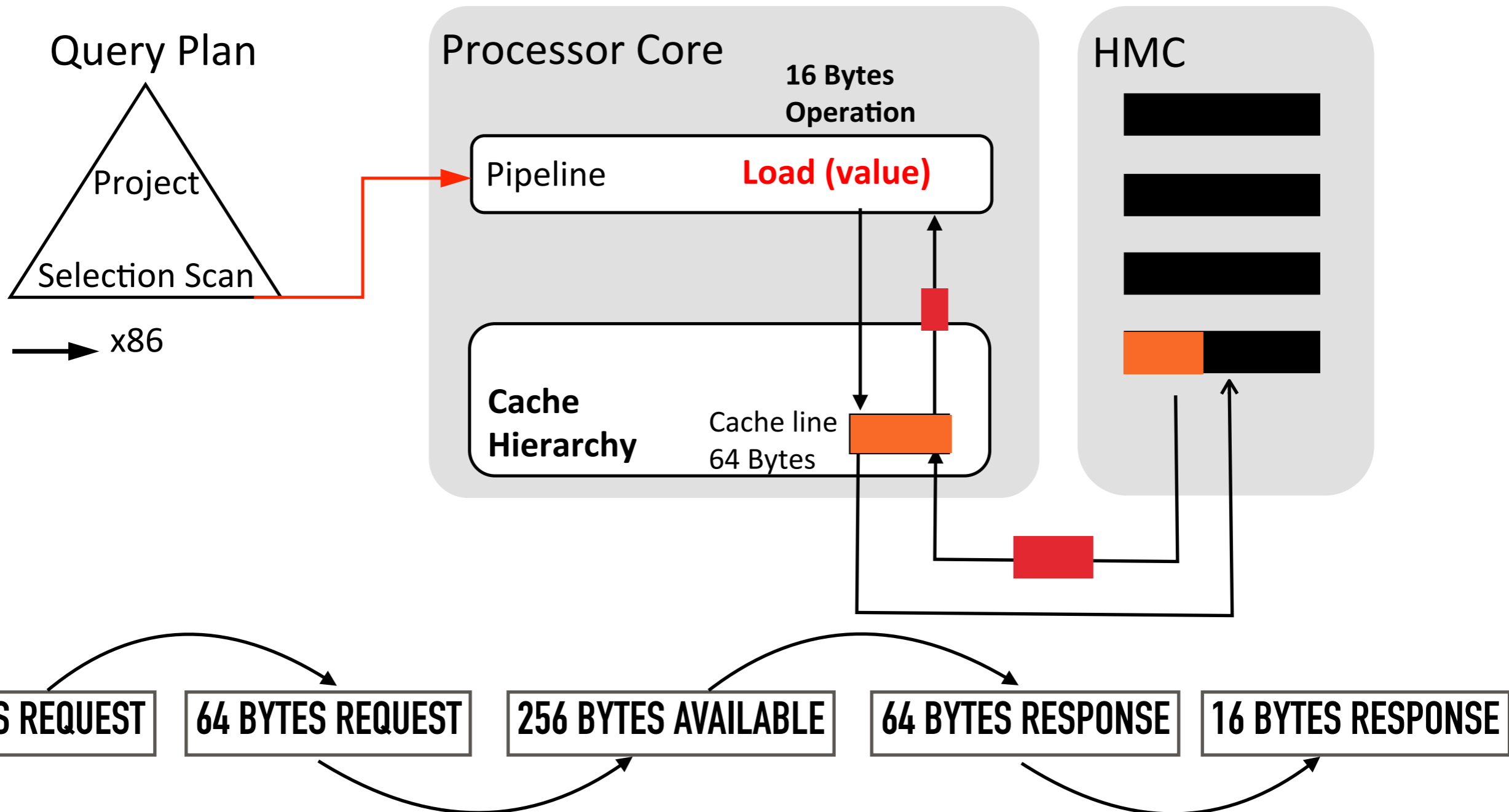


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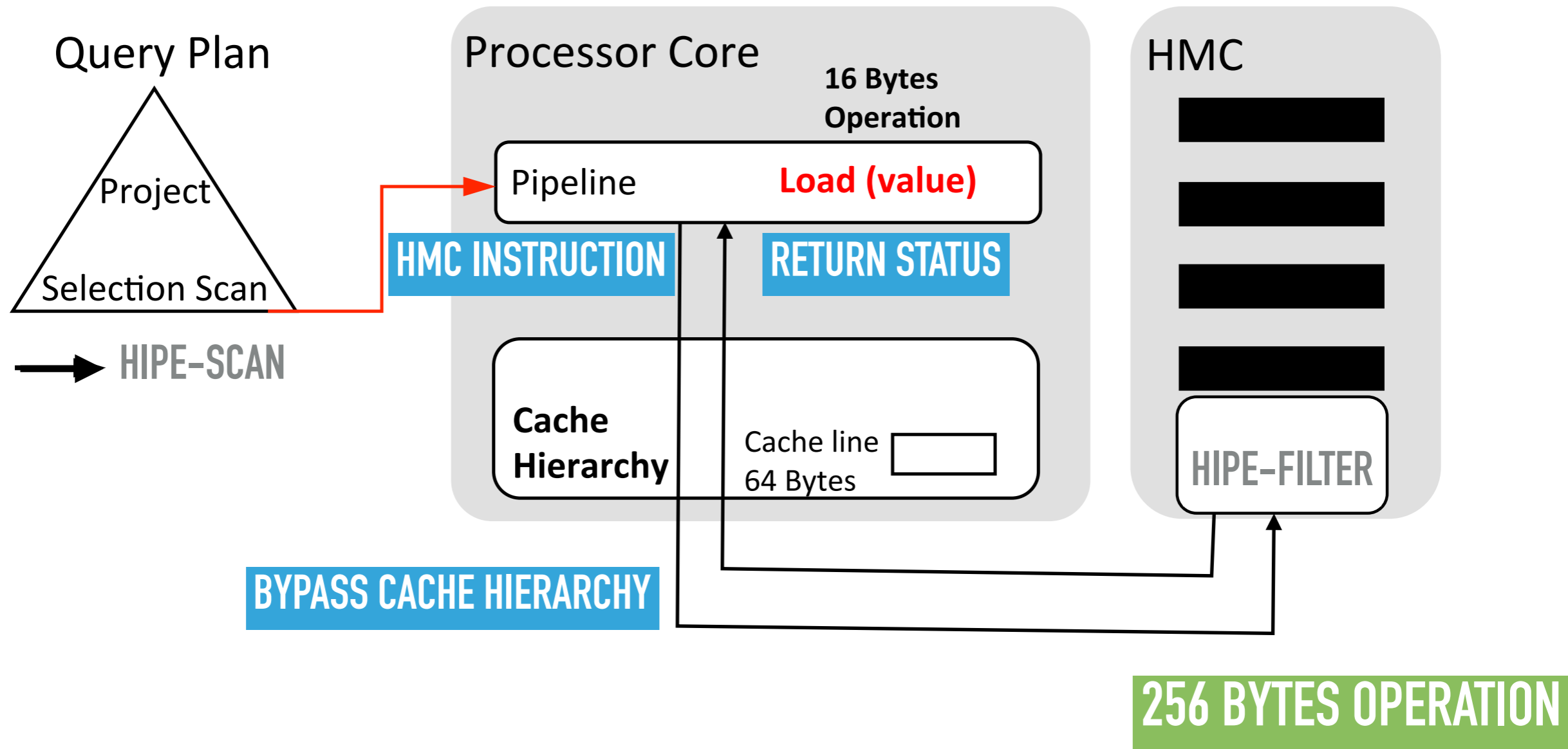
# DATABASE SYSTEMS PREDICATE PROCESSING

## DATA-MOVEMENT



# DATABASE SYSTEMS PREDICATE PROCESSING

## NEAR-MEMORY OPERATIONS



## NEAR-DATA FILTERS BENEFITS

- ▶ Reduce cache pollution
- ▶ No Cache latency
- ▶ Mitigate DRAM operations (signals)

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**EXPERIMENTS**



## METHODOLOGY AND SETUP

- ▶ Using a cycle-accurate simulator to evaluate
- ▶ Dataset 1GB from TPC-H for OLAP scenario
- ▶ Micro-benchmark TPC-H Query 06



Sinuca: A validated micro-architecture simulator.

M. A. Z. Alves, C. Villavieja, M. Diener, F. B. Moreira, and P. O. A. Navaux.

IEEE 17th International Conference on High Performance Computing and Communications, 2015

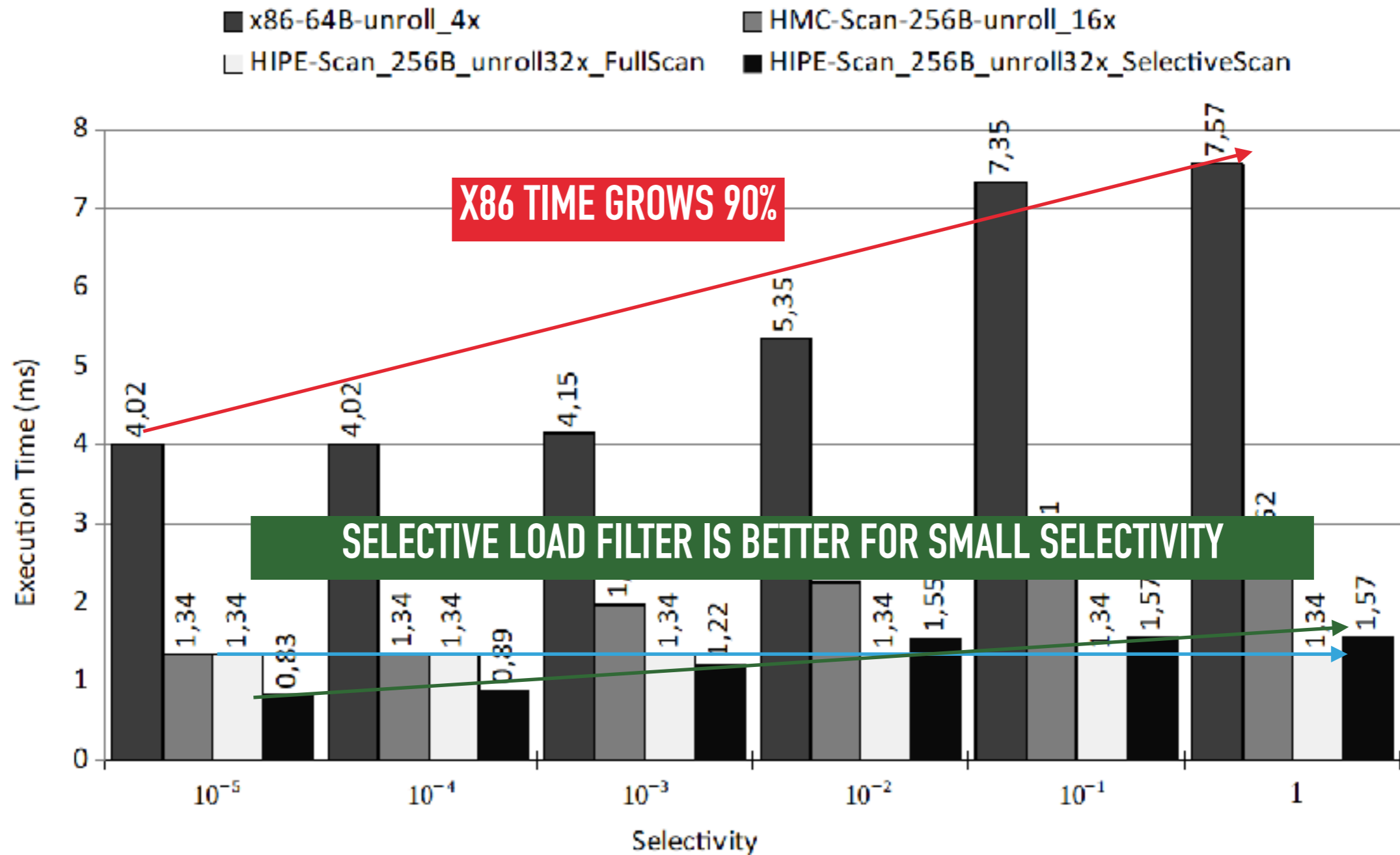


Figure 10: Evaluating execution time of TPC-II Q6 varying the selectivity factor in the different hardware architectures.

## TPC-H query 06 Select scan - Performance

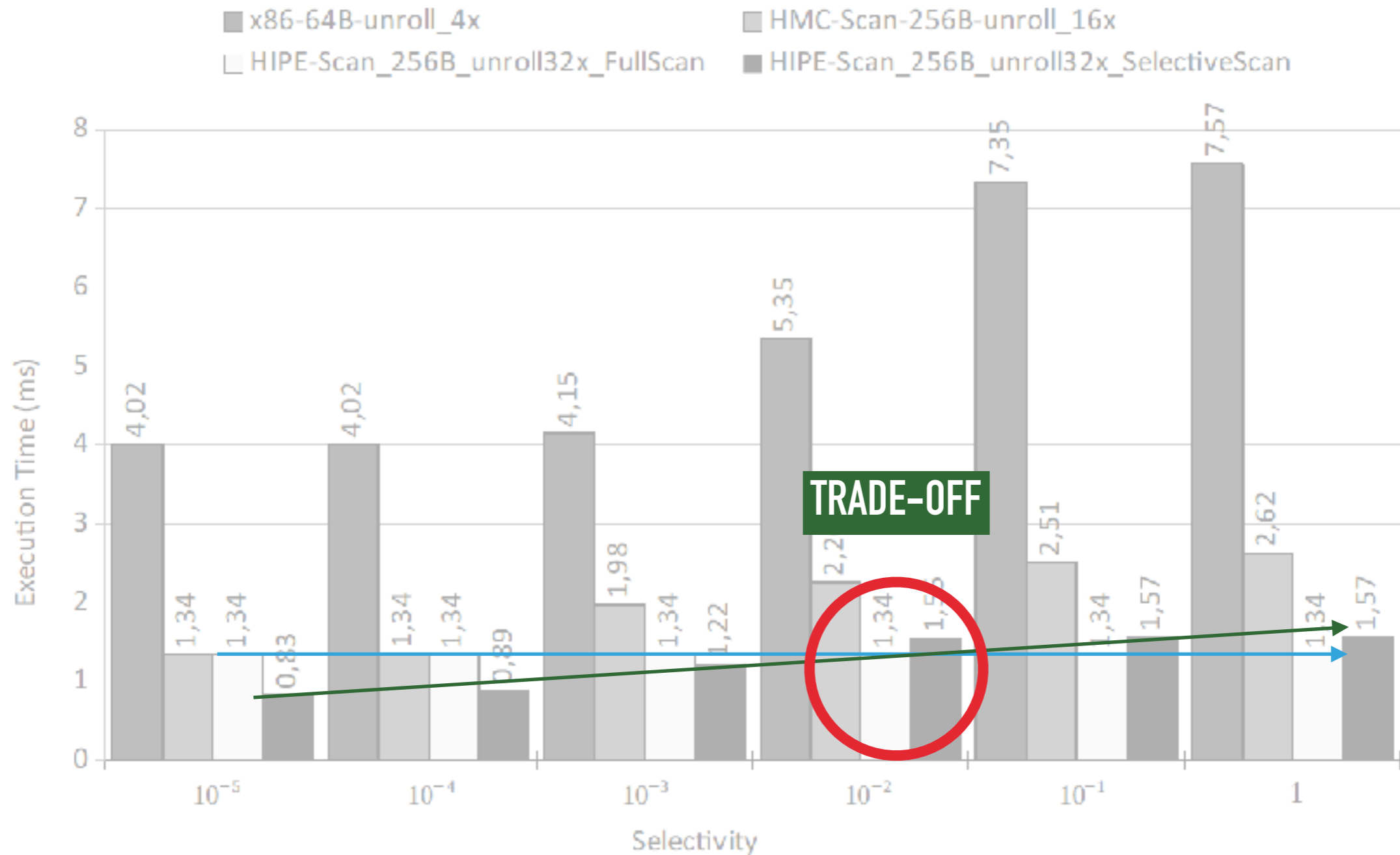


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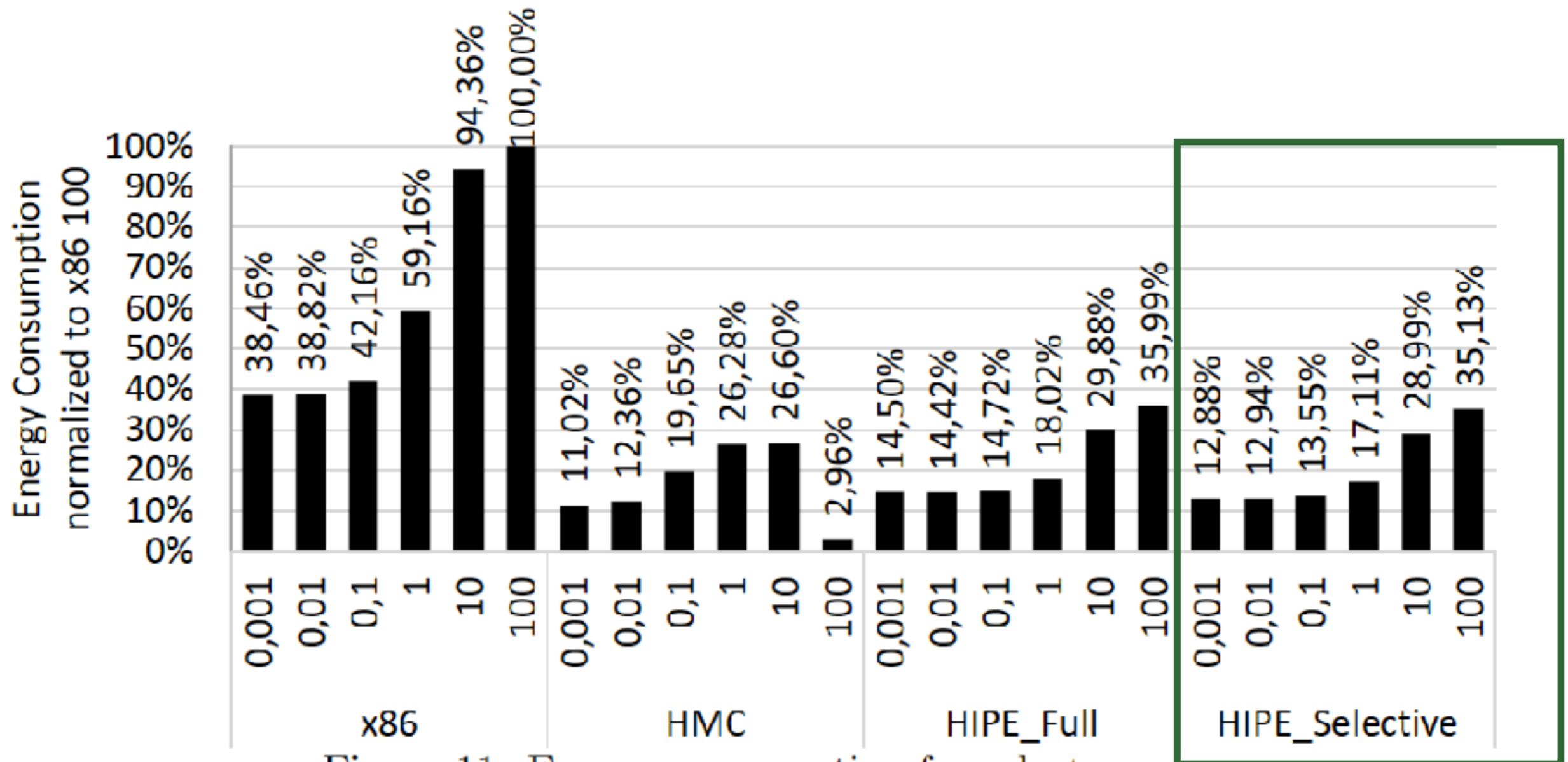


Figure 11: Energy consumption for select scan.

**SELECTIVE LOAD FILTER IS 3X MORE EFFICIENT IN ENERGY CONSUMPTION**

TPC-H query 06 Select scan - Energy

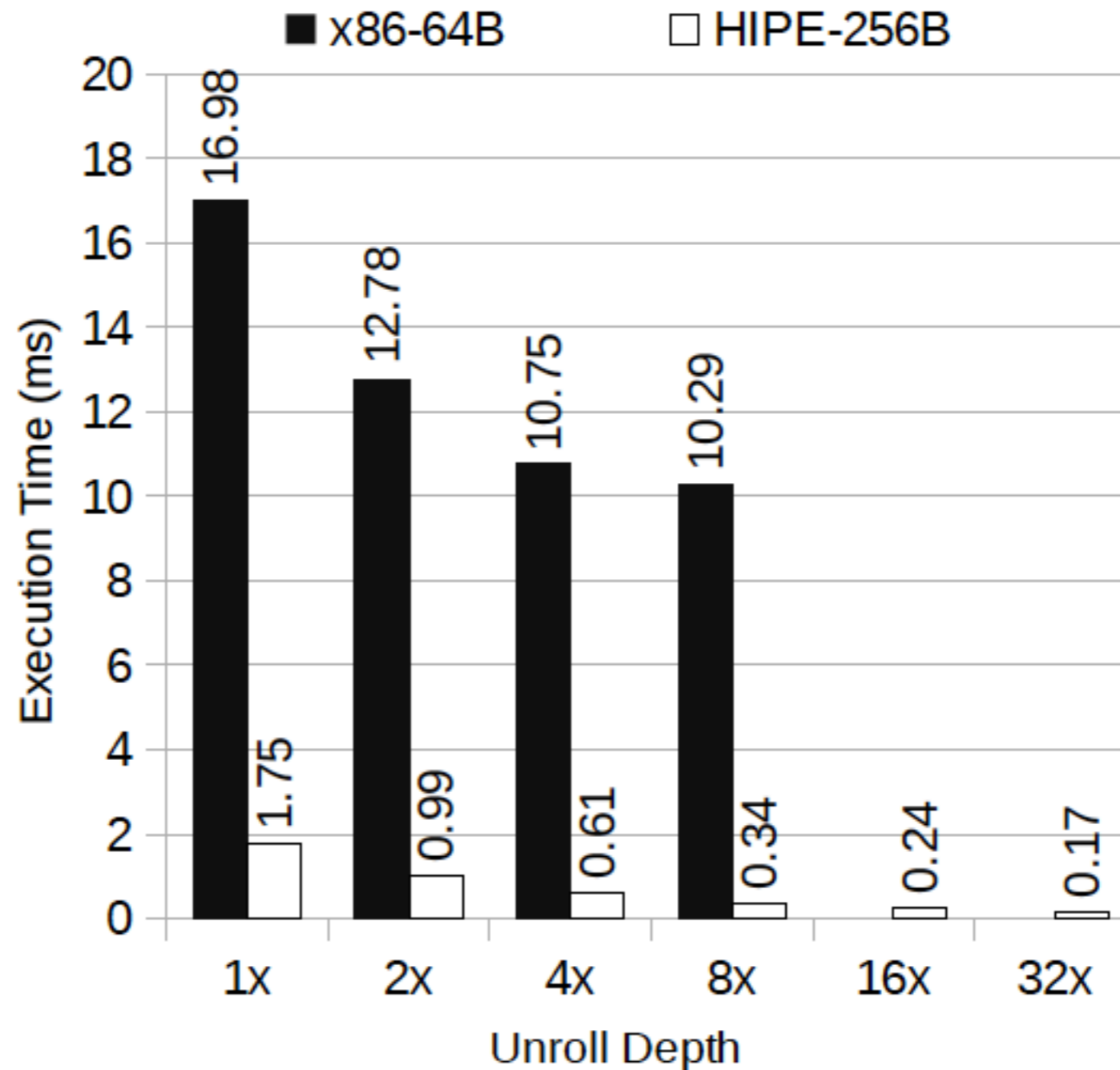


Figure 13: Execution time using the HIPE-Filters in the column projection varying the loop unroll depth.

TPC-H query 06 Projection

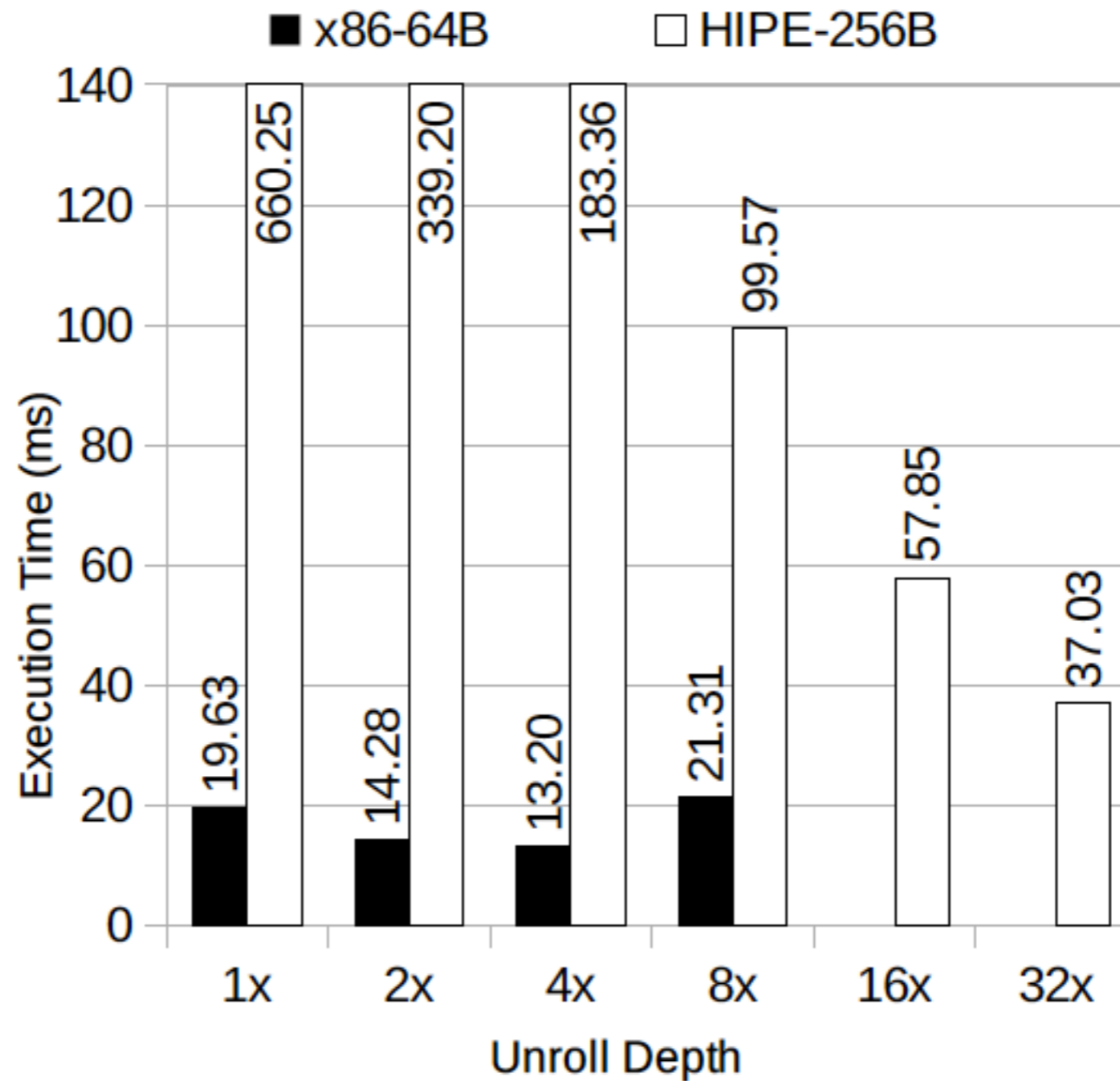


Figure 12: Execution time using the HIPE-Filters in the Nested-Loop join varying the loop unroll depth.

Nested-Loop Join

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2. Can we use the current HMC Instruction Set Architecture (ISA) to implement the near-data select scan? **Yes, but it is not suitable to mitigate the memory wall.**
3. What are the extensions to the HMC ISA to leverage the full potential of the hardware to mitigate the memory wall and reduce the interleaving with x86 instructions?  
**Branch-less near data filters**

# Research Questions

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**CONCLUSION**



## CONCLUSION

- ▶ With the usage of the HMC as ordinary DRAM the memory wall is still a problem
- ▶ Performing filtering operations inside the HMC improves performance for OLAP
- ▶ Near-data processing is suitable for OLAP mitigating the memory wall for DBMSs
- ▶ The correct filter algorithm on different selectivity factors may have great impact on performance.