### PERFORMANCE ANALYSIS OF ARRAY DATABASE SYSTEMS IN NON-UNIFORM MEMORY ARCHITECTURE

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## AGENDA

#### Introduction

- Array database systems
- NUMA architecture
- Array Database Systems in NUMA architecture
- Methodology
  - Thread pinning Strategies
- Experiments
- Conclusion

### **ARRAY DATABASE AND RELATIONAL MODEL**



**MULTIDIMENSIONAL ARRAY MODEL** 

## **ARRAY DATABASE SYSTEMS**



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# NUMA ARCHITECTURE



EXAMPLE OF A NUMA ARCHITECTURE WITH 2-NODES INSPIRED ON INTEL XEON SILVER 4114.



EXAMPLE OF A NUMA ARCHITECTURE WITH 2-NODES INSPIRED ON INTEL XEON SILVER 4114.



EXAMPLE OF A NUMA ARCHITECTURE WITH 2-NODES INSPIRED ON INTEL XEON SILVER 4114.



EXAMPLE OF A NUMA ARCHITECTURE WITH 2-NODES INSPIRED ON INTEL XEON SILVER 4114.



EXEMPLO DE ARQUITETURA NUMA COM 2-SOCKETS INSPIRADA NO INTEL XEON SILVER 4114

**INTRODUCTION** > METHODOLOGY > EXPERIMENTS > CONCLUSION

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# **ARRAY STORED AS A SUBARRAY (CHUNK)**



# **PROCESSING MODEL**



#### EACH DATABASE OPERATION PROCESSES SUBARRAY WITH MULTIPLE THREADS

# THREAD POSITIONING - OPERATION SYSTEM



**MULTIPLE THREADS PROCESS A QUERY OPERATION** 

# THREAD POSITIONING - OPERATION SYSTEM



#### **MULTIPLE THREADS PROCESS A QUERY OPERATION**

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- state-of-the-art strategies
- Petri net
- Random allocation

- COMPACT
  - Same Socket



#### SPARSE

One thread each socket



- SHARED
  - Threads that share data on the same node.





S. Dominico, E. C. de Almeida, J. A. Meira, and M. A. Z. Alves, "An elastic multi-core allocation mechanism for database systems," in IEEE 34th Int. Conf. on Data Eng. (ICDE), 2018, pp. 473–484.

Petri Net



Petri Net





#### RANDOM





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#### RANDOM



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# SETUP

- Subarray: Savime and SciDB
- Server with 2-Sockets Intel Xeon Silver 4114 (20 cores)
- Ubuntu 18.04.01 LTS "Bionic Beaver" (Savime) and Ubuntu 14.04.6 LTS "Trusty Tahr";
- Threads: 20
- I GB: different numbers of chunks
- 50 GB: Selectivity

## PERFORMANCE COMPARISON OF SUBARRAY OPERATOR IN 1 GB DATABASE – SPEEDUP



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## PERFORMANCE COMPARISON OF SUBARRAY OPERATOR IN 1 GB DATABASE – MEMORY ACCESS



#### PERFORMANCE COMPARISON OF SUBARRAY OPERATOR IN A 50 GB DATABASE – SPEEDUP 48% OF POTENTIAL SPEEDUP



## PERFORMANCE COMPARISON OF SUBARRAY OPERATOR IN A 50 GB DATABASE- MEMORY ACCESS



Evaluation of remote and local memory access in *subarray* operation in a 50 GB varying the operator selectivity in the Array database.

INTRODUCTION > METHODOLOGY > EXPERIMENTS > CONCLUSION

**REMOTE ACCESS – 4.1X** 

## PERFORMANCE COMPARISON OF SUBARRAY OPERATOR IN A 50 GB DATABASE- ENERGY COMSUPTION



Fig. 8: Energy consumption in DRAM with 50 GB database using different operator selectivity in the Array database.

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# **CONCLUSION AND FUTURE WORK**

- NUMA architecture affects in performance of subarray operations in array database systems.
- Traditional techniques are still far from the maximum possible gains.
- Static strategies only yield 48% from the potential speedup (and 26% of the energy reduction)
- Opening a new research topic
- Understanding the NUMA effects in other array database operators and designing an array database scheduler that finds the best thread pinning.

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