

# SIMD Acceleration for Index Structures: A Survey

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# Agenda

## Motivation

## SIMD Style Processing

## Surveyed Index Structures

Elf

Seg-Tree/Trie

FAST

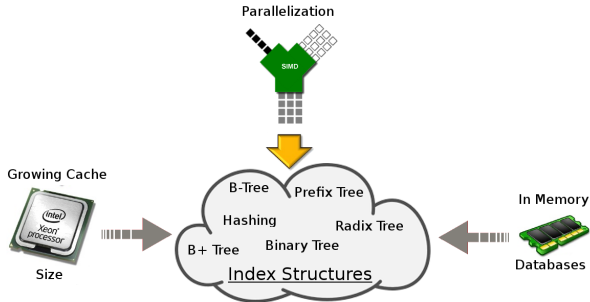
VAST

ART

## Evaluation

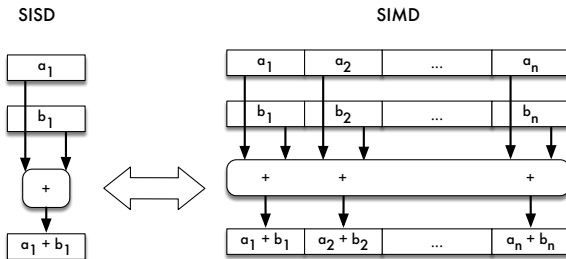
## Conclusion

# Motivation



- What are state-of-the-art index structures?
- Which optimizations do they have in common?

# Single Instruction Multiple Data



- `__m128i _mm_add_epi32 (__m128i a, __m128i b)` Adds 4 signed 32-bit integers in a to 4 signed 32-bit integers in b.

# Surveyed Index Structures

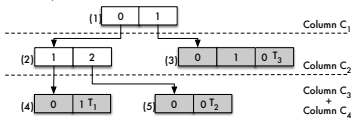
- Elf
- Seg-Tree/Trie
- FAST: Fast Architecture Sensitive Tree
- VAST: Vector-Advanced and Compressed Structure Tree
- ART: Adaptive Radix Tree

# Elf

(a) Input Table

C <sub>1</sub>	C <sub>2</sub>	C <sub>3</sub>	C <sub>4</sub>	Ref
0	1	0	1	T <sub>1</sub>
0	2	0	0	T <sub>2</sub>
1	0	1	0	T <sub>3</sub>

(b) Conceptual Elf



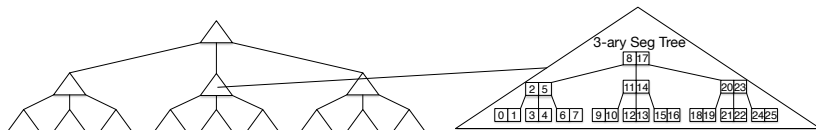
(c) Optimized Memory Layout for Elf

	0	1	2	3	4	5	6	7	8	9
Elf[00]	<sup>(1)</sup> [02]	<sup>(2)</sup> - [12]	1	- [6]	-2	- [9]	<sup>(4)</sup> 0	1	T <sub>1</sub>	<sup>(5)</sup> 0
Elf[10]	0	T <sub>2</sub>	<sup>(3)</sup> 0	1	0	T <sub>3</sub>				
Elf[20]										

- Multi-dimensional index structure for column-wise storage
- Prefix-redundancy elimination on distinct column values
- Linearisation for optimized memory layout

[Broneske et al. ICDE'17]

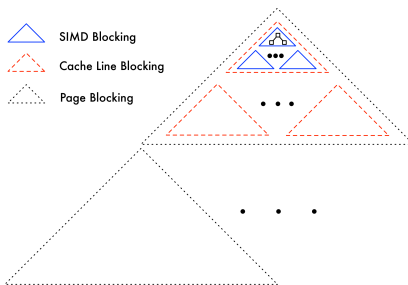
# Seg-Tree/Trie



- Each node is a  $k$ -ary search tree
- Each node is linearised to use  $k$ -ary search
- $k = \frac{|SIMD|}{|Key|}$  partitions,  $k - 1$  separator keys are compared in parallel

[Zeuch et al. EDBT'14]

# Fast Architecture Sensitive Tree



- Based on binary tree
- Hierarchical blocking: SIMD, cache line and page blocks
- Efficient register, cache line and page usage

[Kim et al. SIGMOD'10]

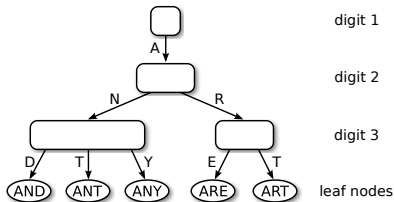


# Vector-Advanced and Compressed Structure Tree

- Extension of FAST
- Decrease branch misses avoiding conditional branches
- Uses key compression
  - Lossy compression for inner nodes
  - Lossfree compression leaf nodes
- Decompression and error correction of lossy compression has less impact compared to the performance increase with SIMD

[Yamamuro et al. EDBT'12]

# Adaptive Radix Tree



- Uses different node types with different number of keys and children
- Due to overfill or underfill of nodes, the node type is changed
- Reduced space consumption due to lazy expansion and path compression

[Leis et al. ICDE'13]

# Evaluation

Considered performance criteria for comparing the surveyed index structures:

- Horizontal Vectorization
- Minimized key size
- Adapted node sizes / types
- Decreased branch misses
- Exploit cache lines using blocking and alignment
- Usage of Compression
- Adapt search algorithm for linearized nodes

# Evaluation

Implementation of the considered performance criteria and their impact:

Criterion	Seg-Tree/ Trie	FAST	ART	VAST	Elf	Impact
Horizontal vectorization	x	x	x	x	-	high
Minimized key size	o	-	x	x	-	high
Adapted node sizes / types	-	x	-	x	-	low
Decreased branch misses	-	x	-	x	-	medium
Exploit cache lines using blocking and alignment	-	x	-	x	x	medium
Usage of Compression	o	-	x	x	x	medium
Adapt search algorithm for linearized nodes	x	-	-	-	x	low

Legend: x = implements the issue; o = partially implements the issue;  
- = does not implement the issue

# Conclusion

How to adapt index structures to modern database systems:

- Compare as many keys as possible in parallel with SIMD
  - Direct performance increase up to a multiple
- Efficient usage of cache line
- Decrease branch misses
- Use compression or/and adapted search algorithms

# Conclusion

How to adapt index structures to modern database systems:

- Compare as many keys as possible in parallel with SIMD
  - Direct performance increase up to a multiple
- Efficient usage of cache line
- Decrease branch misses
- Use compression or/and adapted search algorithms

# Thank you for your attention!

# Sources

- <http://infolab.stanford.edu/~nsample/cs245/handouts/hw2sol/sol2.html>
- <https://www.clker.com/clipart-bosque.html>
- Datenbanken Implementierungstechniken, Ausgabe 3, Saake und Sattler

## Sources

- T. Yamamuro, M. Onizuka, T. Hitaka, and M. Yamamuro “VAST-Tree: A Vector-Advanced and Compressed Structure for Massive Data Tree Traversal” in EDBT, pp. 396-407, 2012.
- S. Zeuch, F. Huber and J.-C. Freytag “Adapting Tree Structures for Processing with SIMD Instructions” in EDBT, 2014.
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