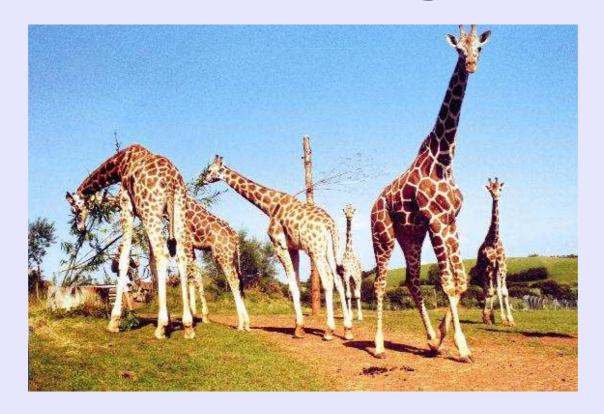
# **Cache-Oblivious String Dictionaries**



Gerth Stølting Brodal
University of Aarhus

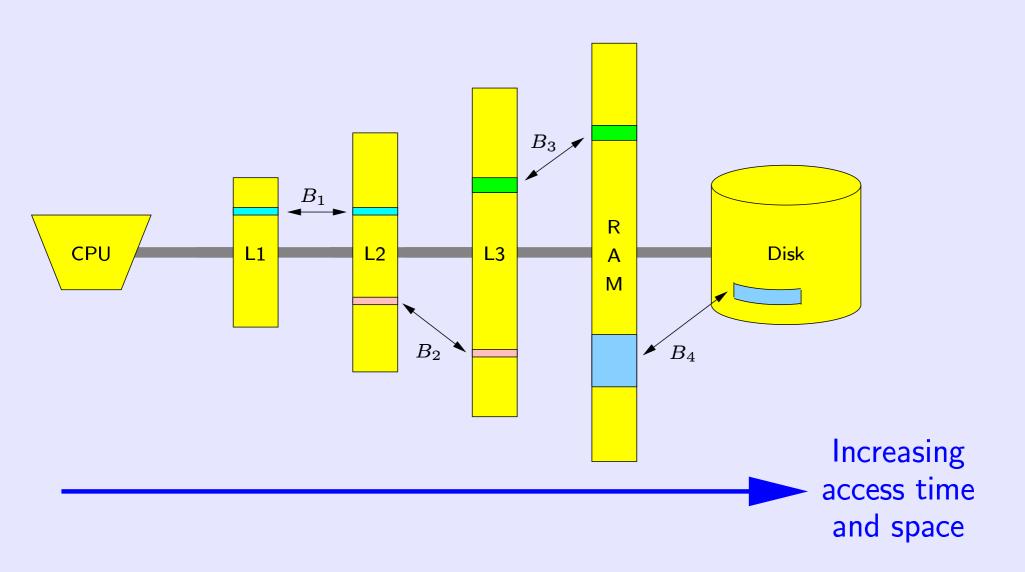
Joint work with Rolf Fagerberg

### **Outline of Talk**

- Cache-oblivious model
- Basic cache-oblivious techniques
- Cache-oblivious string algorithms
- Cache-oblivious string dictionaries
  - Cache-oblivious tries and blind tries

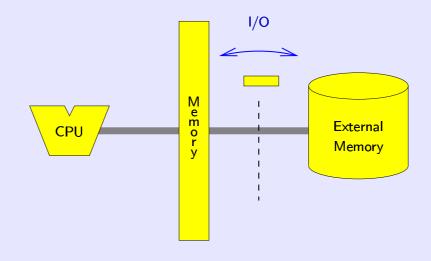
# **Hierarchical Memory Models**

# **Hierarchical Memory**





#### I/O Model



N = problem size

M = memory size

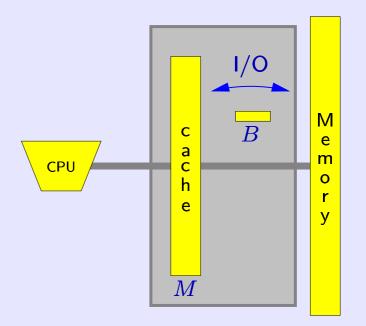
B = I/O block size

- One I/O moves B consecutive records from/to disk
- Complexity measure = number of I/Os

### Ideal Cache Model — no parameters!?

Frigo, Leiserson, Prokop, Ramachandran 1999

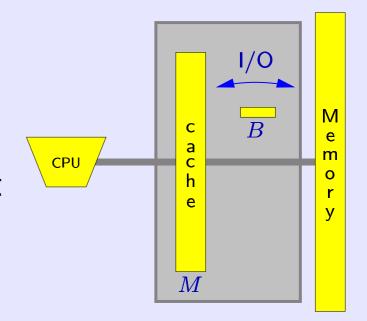
- Program with only one memory
- Analyze in the I/O model for
- Optimal off-line cache replacement strategy arbitrary B and M



### Ideal Cache Model — no parameters!?

Frigo, Leiserson, Prokop, Ramachandran 1999

- Program with only one memory
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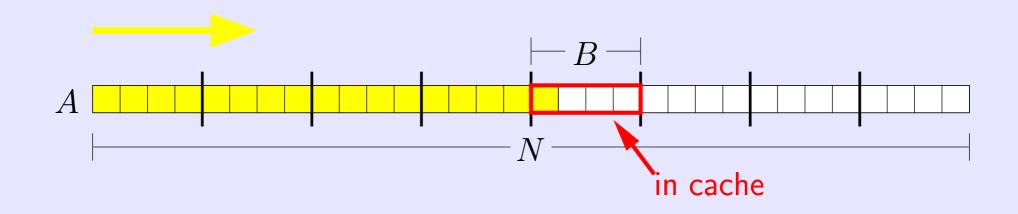


#### Advantages

- Optimal on arbitrary level ⇒ optimal on all levels
- ullet Portability, B and M not hard-wired into algorithm
- $D^{y}_{n}a^{m}ic$  changing M (and B)

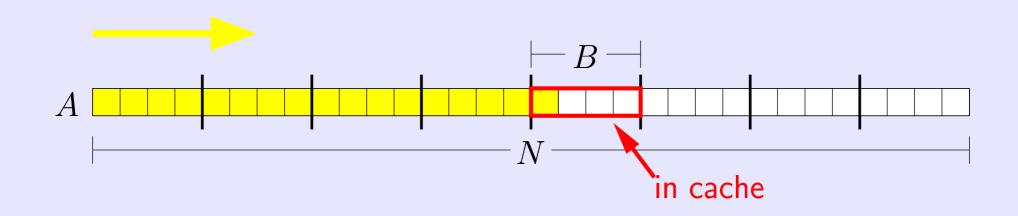
### **Cache-Oblivious Preliminaries**

## **Cache-Oblivious Scanning**



$$O\left(\frac{N}{B}\right)$$
 I/Os

### **Cache-Oblivious Scanning**

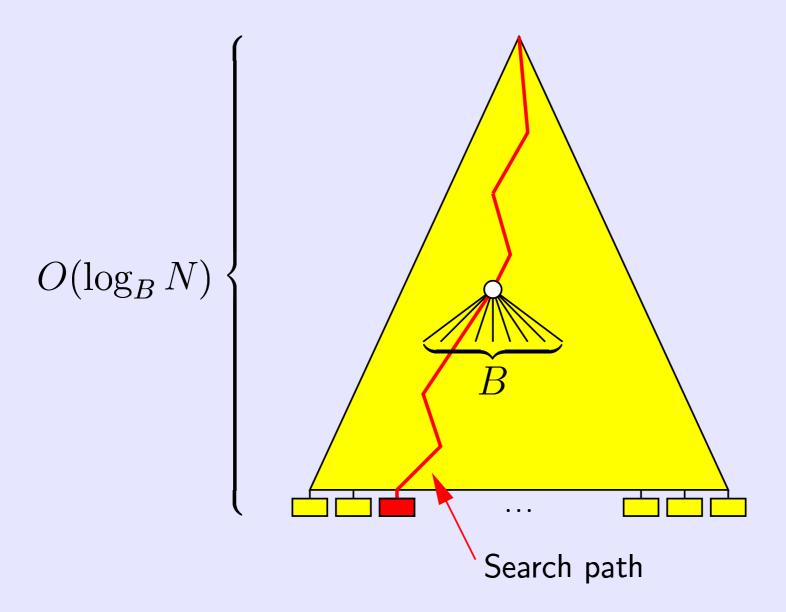


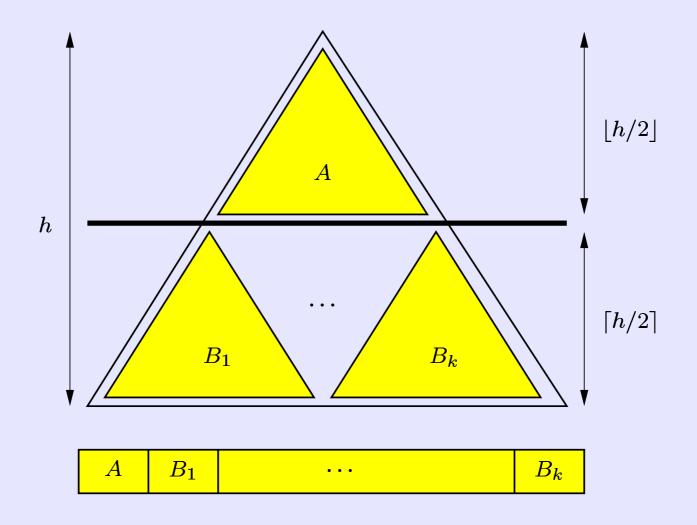
$$O\left(rac{N}{B}
ight)$$
 I/Os

Corollary Cache-oblivious selection requires O(N/B) I/Os

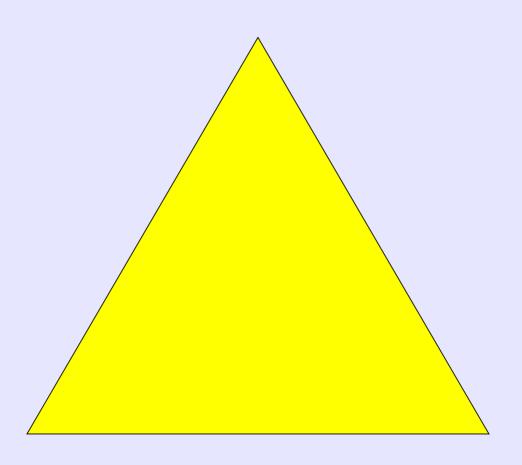
Hoare 1961 / Blum et al. 1973

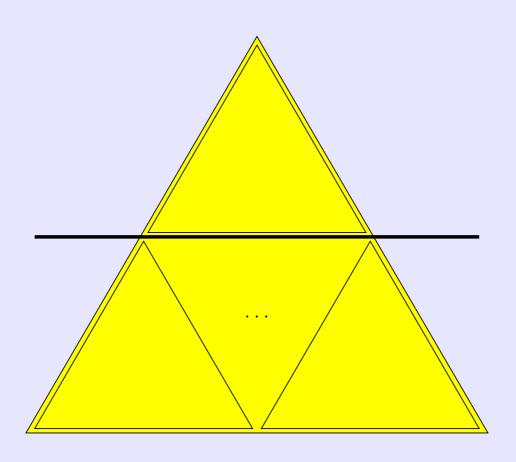
### **Cache-Aware B-trees**

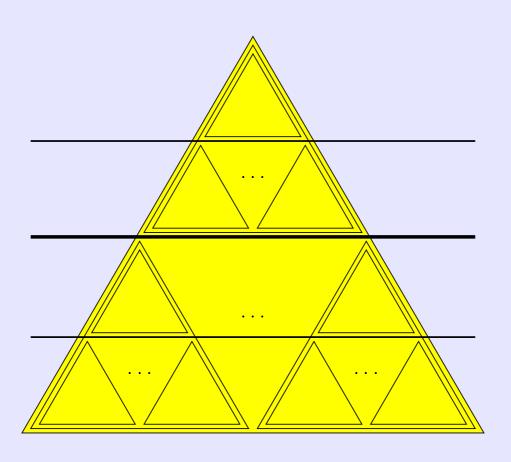


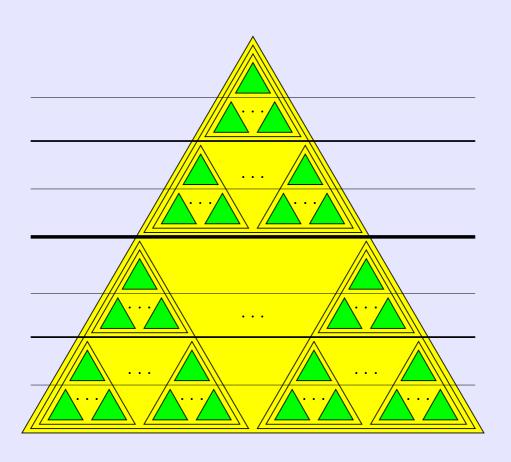


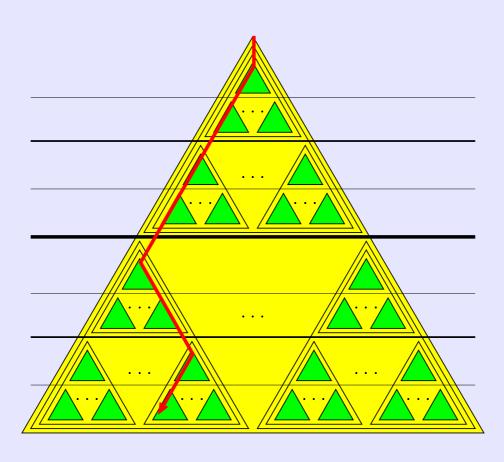
Recursive layout of binary tree  $\equiv$  van Emde Boas layout











- Each green tree has height between  $(\log_2 B)/2$  and  $\log_2 B$
- Searches visit between  $\log_B N$  and  $2\log_B N$  green trees, i.e. perform at most  $4\log_B N$  I/Os (misalignment)

### **Summary Cache-Oblivious Tools**

Scanning: 
$$O(N/B)$$

B-tree searching : 
$$O(\log_B N)$$

Sorting\*: 
$$O\left(\frac{N}{B}\log_{M/B}\frac{N}{B}\right)$$

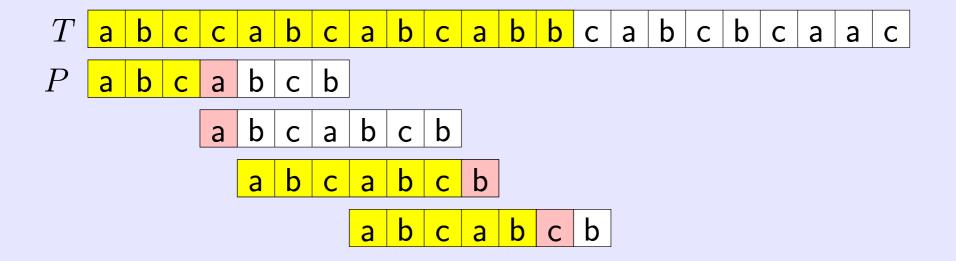
\* requires a tall cache assumption  $M \geq B^{1+\varepsilon}$ 

Frigo, Leiserson, Prokop, Ramachandran 1999 Brodal and Fagerberg 2002, 2003

# **Cache-Oblivious String Algorithms**

# **Knuth-Morris-Pratt String Matching**

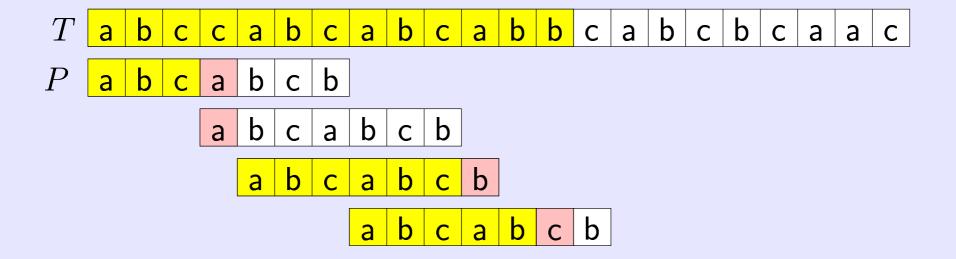
Knuth, Morris, Pratt 1977



- Time O(|T|)
- Scans text left-to-right
- Accesses the pattern (and failure function) like a stack

## **Knuth-Morris-Pratt String Matching**

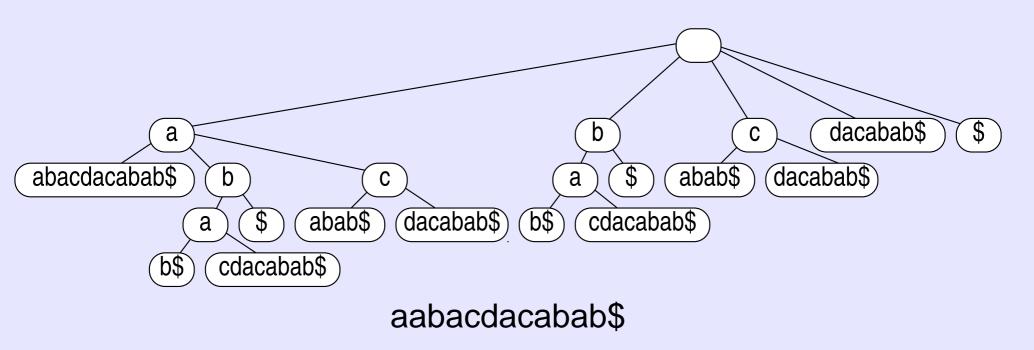
Knuth, Morris, Pratt 1977



- Time O(|T|)
- Scans text left-to-right
- Accesses the pattern (and failure function) like a stack
- KMP is cache-oblivious and uses O(|T|/B) I/Os

### **Suffix Tree/Suffix Array Construction**

Farach et al. 2000

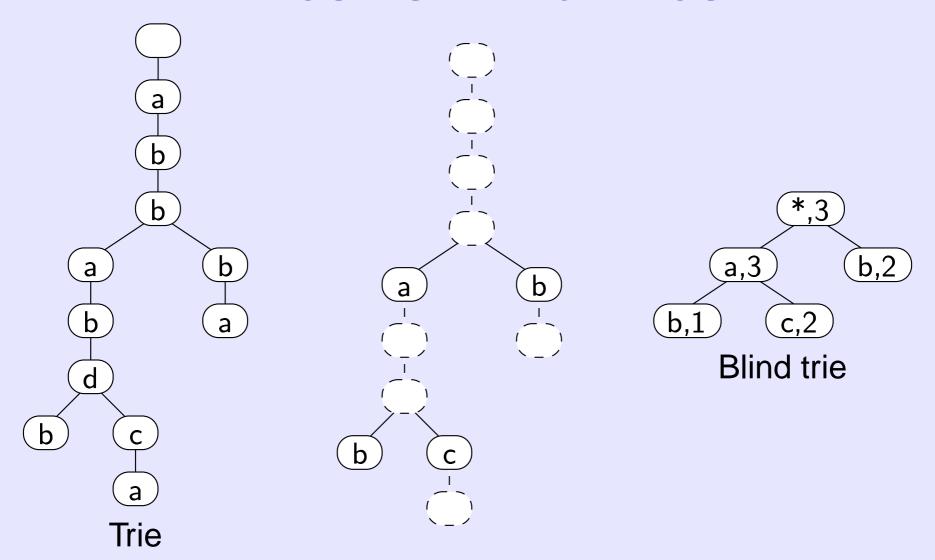


• Reduces to sorting, i.e. Sort(N) I/Os



# **String Dictionaries**

#### **Tries vs Blind Tries**



Searches take O(|P|) time in internal memory for constant sized alphabets and  $O(\log n + |P|)$  time for comparison based alphabets

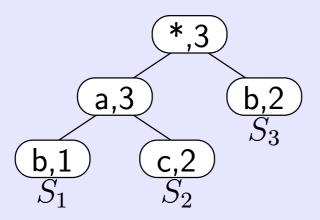
#### The Trouble Starts...

- Tries cannot be stored cache-aware to support top-down searches in  $O(\log_B N + |P|/B)$  I/Os Demaine et al 2004

- Can construct suffix trees cache-obliviously using  $O(\operatorname{Sort}(N))$  I/Os, but cannot search in it efficiently...

+ Cache-aware string B trees support searches in a set of strings in  $O(\log_B n + |P|/B)$  I/Os Ferragina and Grossi 1999

# **String Dictionary**



$$S_1$$
 abbabdb

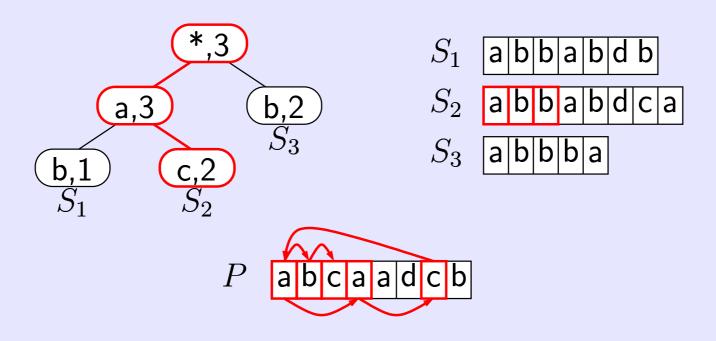
$$S_2$$
 abbabdca

$$S_3$$
 a b b a

$$P$$
 abcaadcb

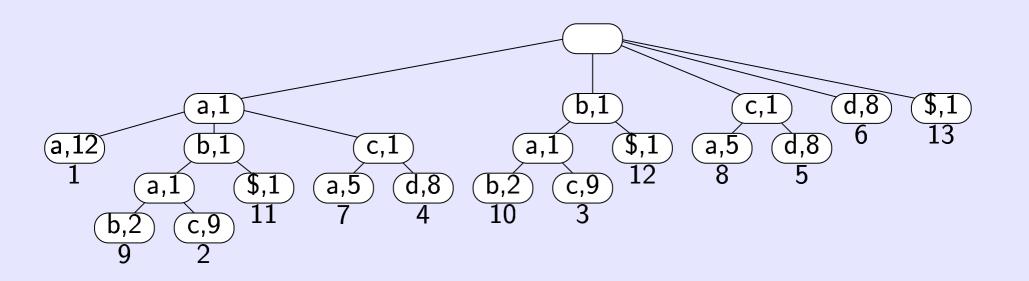
Queries: Search blind trie + Verify one string

# **String Dictionary**



Queries: Search blind trie + Verify one string

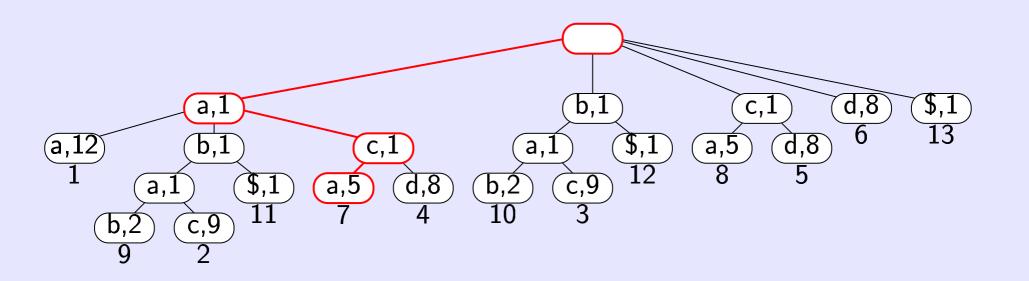
### **Suffix Tree**



$$T$$
 aabacdacabab $\$$  12 ··· 13  $P$  acada

Queries: Search blind trie + Verify one suffix

### **Suffix Tree**

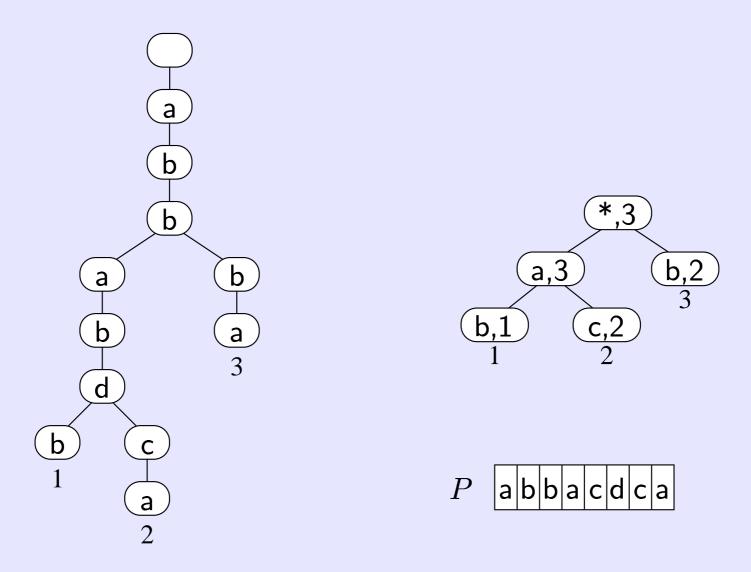


$$T$$
 aabacdacabab $\$$  12 ··· 13

$$P$$
 acada

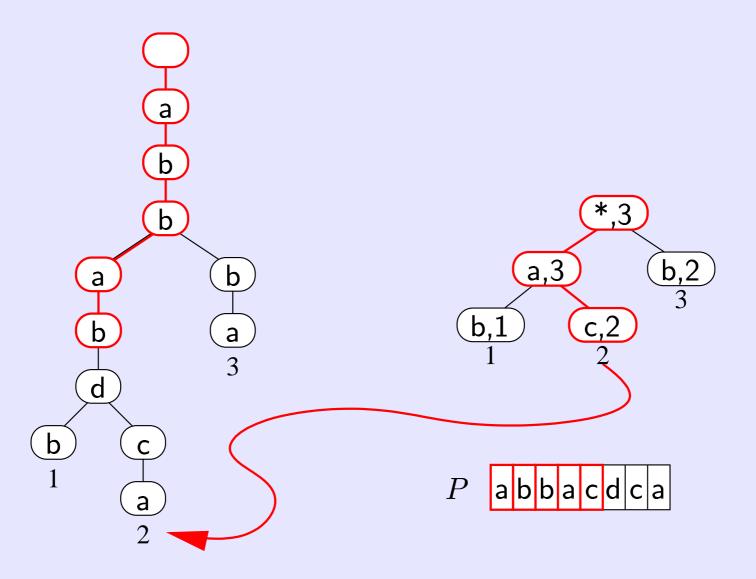
Queries: Search blind trie + Verify one suffix

### **Tries**



Queries: Search blind trie + Verify prefix of one path

### **Tries**



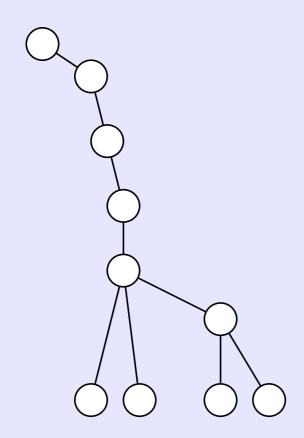
Queries: Search blind trie + Verify prefix of one path

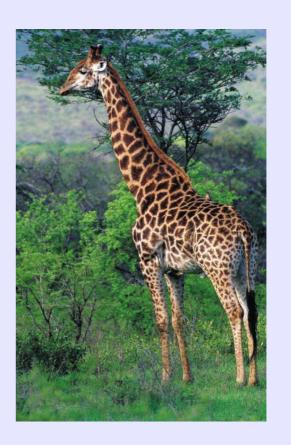
# Verifying a Prefix of a Path in a Tree

### Verifying Paths in Giraffe Trees is Easy

#### **Definition**

A tree is a giraffe tree if all root-to-leaf paths share at least half of the nodes of the tree (long neck)

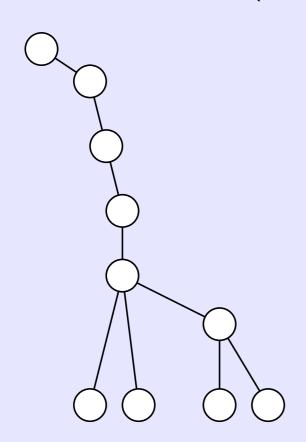


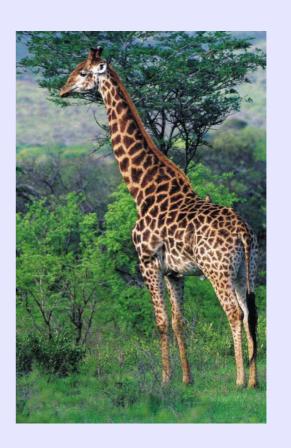


### Verifying Paths in Giraffe Trees is Easy

#### **Definition**

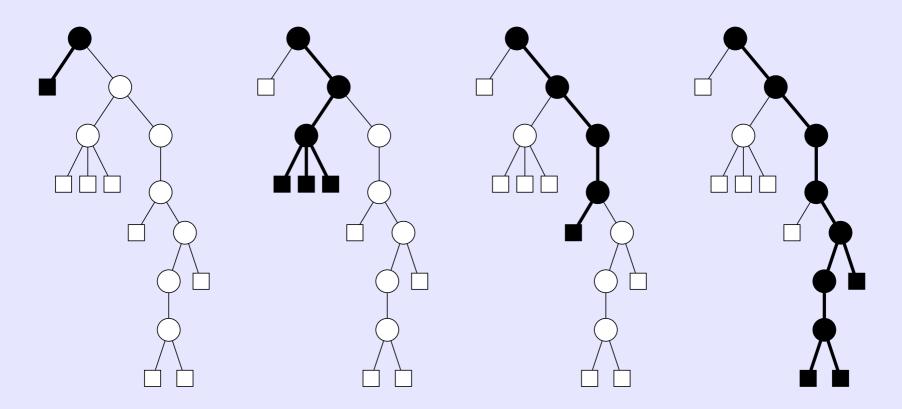
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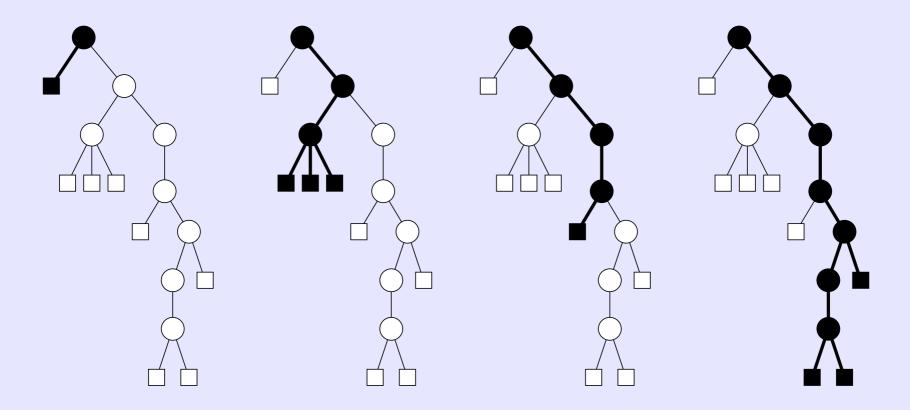


• A prefix of length p of a path in a giraffe tree using a BFS layout can be traversed in O(p/B) I/Os

### **Giraffe Cover of a Tree**



#### Giraffe Cover of a Tree



- Uses space O(N) and can be constructed greedily from left-to-right using O(N/B) I/Os by an Euler traversal of T
- BFS layout of each giraffe
- A prefix of length p of a path in a known giraffe can be traversed in O(p/B) I/Os

### Summary so far...

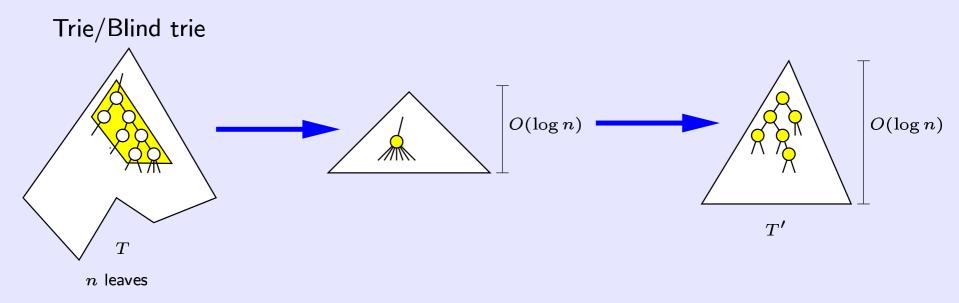
String dictionary search

Suffix tree search

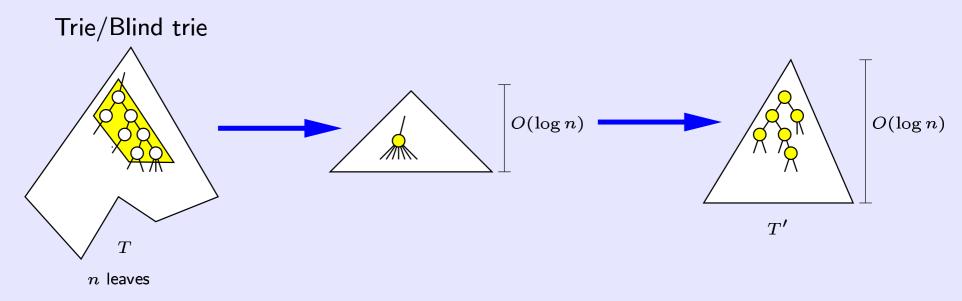
Trie search

reduce to blind trie search

Query : Blind trie search + 
$$O\left(1 + \frac{|P|}{B}\right)$$
 I/Os

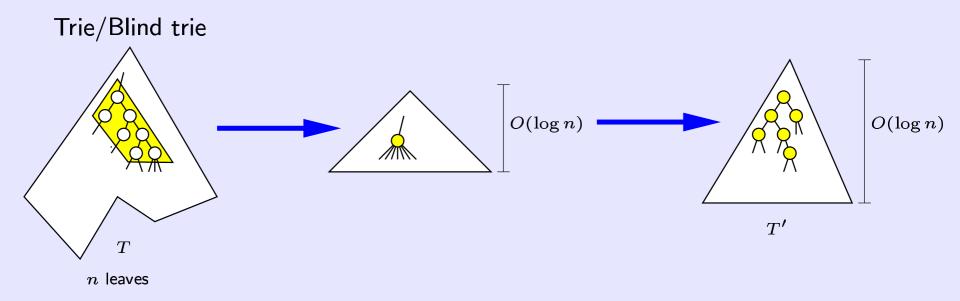


- ullet Partition input trie T into components (generalization of heavy paths)
- T' = collapse components in T into high degree nodes and replace by weight balanced trees
- Apply van Emde Boas layout out to T'



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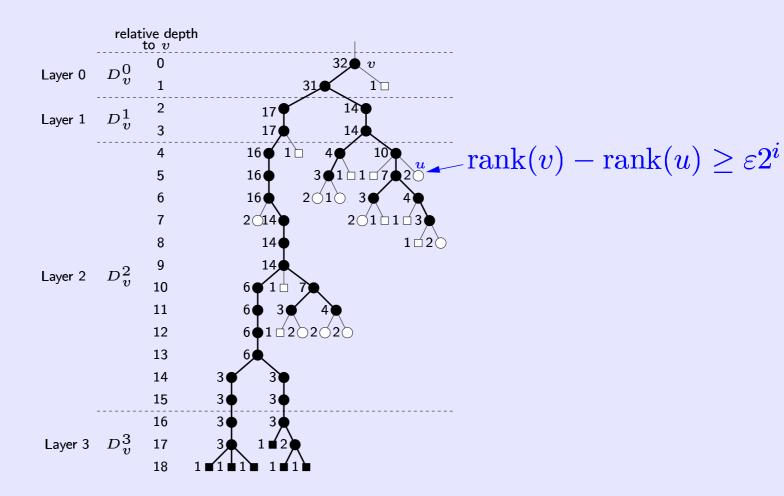
Search:  $O(\log_B n)$  I/O



- ullet Partition input trie T into components (generalization of heavy paths)
- T' = collapse components in T into high degree nodes and replace by weight balanced trees
- Apply van Emde Boas layout out to T'

Search:  $O(\log_B n)$  I/O — ignoring searching inside components

### **Decomposition into Components**



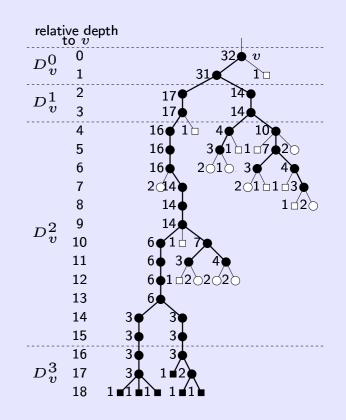
$$D_v^0 = \{ u \in T_v \mid \operatorname{rank}(u) = \operatorname{rank}(v) \land \operatorname{depth}(u) - \operatorname{depth}(v) < 2^{2^0} \}$$

$$D_v^i = \{ u \in T_v \mid \operatorname{rank}(v) - \operatorname{rank}(u) < \varepsilon 2^i \}$$

$$\wedge 2^{2^{i-1}} \leq \operatorname{depth}(u) - \operatorname{depth}(v) < 2^{2^i} \}$$

# **Storing and Searching Components**

- Store each layer  $D_v^i$  separately
- Make a giraf-decomposition of  $D_v^i$
- For  $D_v^i$  have a blind trie of size  $O(2^{\varepsilon 2^i})$  (using BFS layout) to select the right giraffe-tree
- Search:  $D_v^i$  search the blind trie + search in one giraffe-tree
- Distribute  $D_v^0, D_v^1, D_v^2, \dots$  in the van Emde Boas layout of T'



#### Analysis:

- Search in blind trie for  $D_v^{i+1}$  dominated by the matched characters in  $D_v^i$
- Space in van Emde Boas layout for a subtree of size k becomes  $O(k^3)$

#### **Cache-Oblivious Tries**

There exists a cache-oblivious trie supporting prefix queries in

$$O(\log_B |n| + |P|/B)$$
 I/Os,

where P is the query string, and n is the number of leaves in the trie.

It can be constructed in  $O(\operatorname{Sort}(N))$  time, where N is the total number of characters in the input.

The space required is O(N).

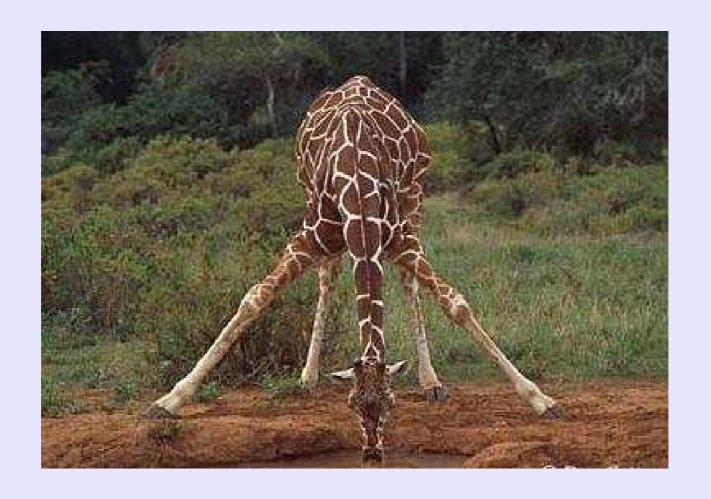
The structure assumes  $M \geq B^{2+\delta}$ .

#### Conclusion

- A string dictionary (trie data structure) was presented that supports queries in  $O(\log_B n + |P|/B)$  I/Os. The data structure uses O(N) space and can be constructed using  $O(\operatorname{Sort}(N))$  I/Os.
- Lookahead in the query string is crucial (both cache-aware and cache-oblivious)
- A giraffe cover is a simple construction allowing topdown path traversals in a tree using O(|P|/B) I/Os

### **Open problems**

- Prove a lower bound trade-off between the number of I/Os required for a query and the lookahead used
- Implementation: compare with string B-trees, tries, ternary trees, different trie layouts, ...



# The End