

# Text Indexing

## Lecture 09: LZ Compressed Indexes

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<https://pingo.scc.kit.edu/309703>

## Recap: FM-Index and $r$ -Index

- based on **backwards-search**
- used to answer *rank*-queries on *BWT*

### FM-Index

- build wavelet tree directly on *BWT*
- wavelet tree can be  $H_0$  compressed
- blind to repetitions

### $r$ -Index

- many arrays with  $r$  entries
- build wavelet tree on one of these arrays
- size in numbers of *BWT* runs  $r$

**Function** *BackwardsSearch*( $P[1..n]$ ,  $C$ , *rank*):

```

1  |  $s = 1, e = n$ 
2  | for  $i = m, \dots, 1$  do
3  |   |  $s = C[P[i]] + \text{rank}_{P[i]}(s - 1) + 1$ 
4  |   |  $e = C[P[i]] + \text{rank}_{P[i]}(e)$ 
5  |   | if  $s > e$  then
6  |   |   | return  $\emptyset$ 
7  | return  $[s, e]$ 
  
```

# Different Types of Compression

## Statistical Coding

- based on frequencies of characters
- results in size  $|T| \cdot H_k(T)$ 
  - ⓘ  $k$ -th order empirical entropy
- good if frequencies are skewed

- blind to repetitions

$$|\underbrace{T \dots T}_\ell| \cdot H_k(\underbrace{T \dots T}_\ell) \approx \ell |T| \cdot H_k(T)$$

## LZ-Compression

- references to previous occurrences
- each LZ factor can be encoded in  $O(1)$  space
- good for repetitions
- index in this lecture

## BWT-Compression

- used in powerful index
- theoretical insight in this lecture

# LZ-Compressed Index

## Definition: LZ77 Factorization [ZL77]

Given a text  $T$  of length  $n$  over an alphabet  $\Sigma$ , the **LZ77 factorization** is

- a set of  $z$  factors  $f_1, f_2, \dots, f_z \in \Sigma^+$ , such that
- $T = f_1 f_2 \dots f_z$  and for all  $i \in [1, z]$   $f_i$  is
- single character not occurring in  $f_1 \dots f_{i-1}$  or
- longest substring occurring  $\geq 2$  times in  $f_1 \dots f_i$

$T = \text{abababbbbaba\$}$

- |                |               |
|----------------|---------------|
| ■ $f_1 = a$    | ■ $f_4 = bbb$ |
| ■ $f_2 = b$    | ■ $f_5 = aba$ |
| ■ $f_3 = abab$ | ■ $f_6 = \$$  |

## Now

- LZ-compressed replacement for wavelet trees
- *rank* and *access* queries ⓘ *select* also supported
- LZ-compression better than  $H_k$ -compression

# Block Trees [Bel+21] (1/4)

## Definition: Block Tree (1/4)

Given a text  $T$  of length  $n$  over an alphabet of size  $\sigma$

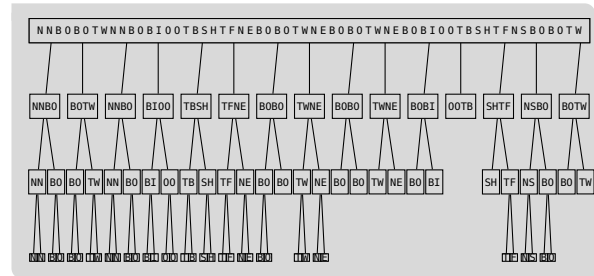
- $\tau, s \in \mathbb{N}$  greater 1
- assume that  $n = s \cdot \tau^h$  for some  $h \in \mathbb{N}$ 
  - ⓘ append  $\$$ s until  $n$  has this form

A **block tree** is a

- perfectly balanced tree with height  $h$
- that may have leaves at higher levels

such that

- the root has  $s$  children,
- each other inner node has  $\tau$  children





# Block Trees (3/4)

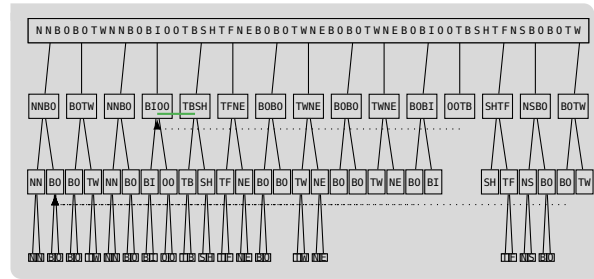
## Definition: Block Tree (3/4)

Let  $\ell_u$  be the level (depth) of node  $u$

- the level of the root is 0

Let  $B_1, B_2, \dots$  be the blocks represented at level  $\ell_u$  from left to right

- for any  $i$ ,  $B_i$  and  $B_{i+1}$  are consecutive in  $T$
- if  $B_i B_{i+1}$  are the leftmost occurrence in  $T$ , the nodes representing the blocks are **marked**





# Block Trees (4/4)

## Definition: Block Tree (4/4)

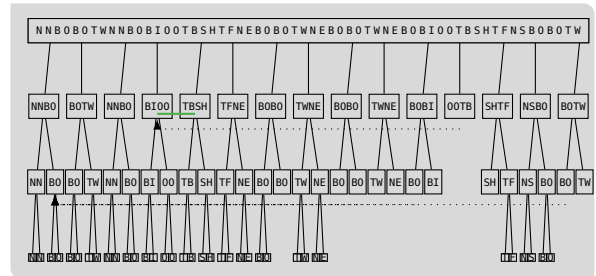
If node  $u$  is marked, then


- it is an internal node
- with  $\tau$  children

otherwise, if node  $u$  is not marked, then

- $u$  is a leaf storing
- pointers to nodes  $v_i, v_{i+1}$  at the same level
  - that represent blocks  $B_i$  and  $B_{i+1}$
  - covering the leftmost occurrence of  $B^u$
- offset to the occurrence of  $B^u$  in  $B_i B_{i+1}$

leaves on last level store text explicitly



- $|B^u| = n / (s\tau^{\ell_u - 1})$
- if  $|B_u|$  is small enough, store text explicitly
  - $|B^u| \in \Theta(\lg_\sigma n)$
-  **PINGO** how many blocks are there per level?

# Block Trees are LZ Compressed (1/2)

## Lemma: Number of Blocks per Level

The number of blocks in any level  $> 0$  in the block tree is at most  $3\tau z$

- $O(\tau z)$  blocks per level
- unmarked block requires  $O(\lg n)$  bits of space
- marked block requires  $O(\tau \lg n)$  bits of space
  - charged to child
- last level has  $O(\tau z)$  blocks with plain text
  - $O(\lg_\sigma n)$  symbols of  $\lceil \lg n \rceil$  bits
  - requiring  $O(\lg \sigma)$  bits per block
- $h = \lg_\tau \frac{n \lg_\sigma n}{s \lg n}$  and  $O(s)$  pointers to top level
- rounding up length adds  $\leq O(\tau)$  blocks per level

## Proof (Sketch)

Let  $\ell > 0$  be a level in the block tree and

- $C = B_{i-1}B_iB_{i+1}$  a concatenation of three consecutive blocks at level  $\ell - 1$
- not containing the end of an LZ factor
- thus a leftwards occurrence in  $T$

$B_{i-1}$  and  $B_{i+1}$  can only be marked if  $B_i$  is marked

- $B_i$  is marked if it contains end of LZ factor
- there are only  $z$  LZ factors

Each marked block results in  $\tau$  children

## Block Trees are LZ Compressed (2/2)

### Lemma: Space Requirements of Block Trees

Given a text  $T$  of length  $n$  over an alphabet of size  $\sigma$  and integers  $s, \tau > 1$ , a block tree of  $T$  has height  $h = \lg_{\tau} \frac{n \lg \sigma}{s \lg n}$ . The block tree requires

$$O\left(\left(s + z_{\tau} \lg_{\tau} \frac{n \lg \sigma}{s \lg n}\right) \lg n\right) \text{ bits of space,}$$

where  $z$  is the number of LZ77 factors of  $T$

- $s = z$  results in a tree of height  $O\left(\lg_{\tau} \frac{n \lg \sigma}{z \lg n}\right)$
- space requirements  $O\left(z_{\tau} \lg_{\tau} \frac{n \lg \sigma}{z \lg n} \lg n\right)$  bits
- however  $z$  not known

# Access Queries in Block Trees


- queries are easy to realize
- if not supported directly, additional information can be stored for blocks


## Access Query

Given position  $i$  return  $T[i]$

- follow nodes that represent block containing  $T[i]$
- if not marked follow pointer and consider offset
- at leaf, if last level, return character
- else, follow pointer and continue

- time  $O(\lg_{\tau} \frac{n \lg \sigma}{s \lg n})$


- example on the board 

-  **PINGO** can we answer rank queries the same way?

# Rank Queries in Block Trees


- for each block add histogram  $Hist_{B_u}$  for prefix of  $T$  up to block (not containing)
- $O(\sigma(s + z_T \lg_\tau \frac{n \lg n}{s \lg \sigma}) \lg n)$  bits of space


- time  $O(\lg_\tau \frac{n \lg \sigma}{s \lg n})$

- example on the board 

## Rank Query

Given position  $i$  and character  $\alpha$  return  $rank_\alpha(T, i)$

- follow nodes that represent block containing  $T[i]$
- remember  $Hist_{B_u}[\alpha]$
- if not marked follow pointer and consider offset
- at leaf, if last level, compute local rank  binary rank for each character
- else, follow pointer and continue

-  **PINGO** what can be problematic with block tree construction?

# Construction of Block Trees

## $O(n)$ Working Space

- build Aho-Corasick automaton for containing all pairs of consecutive unmarked blocks
- identify unmarked blocks on next level
- $O(n(1 + \lg_{\tau} \frac{z}{s}))$  time and  $O(n)$  space

## Pruning

- size of block tree can be reduced further
- some blocks not necessary
- those blocks can easily be identified

## $O(s + z\tau)$ Working Space

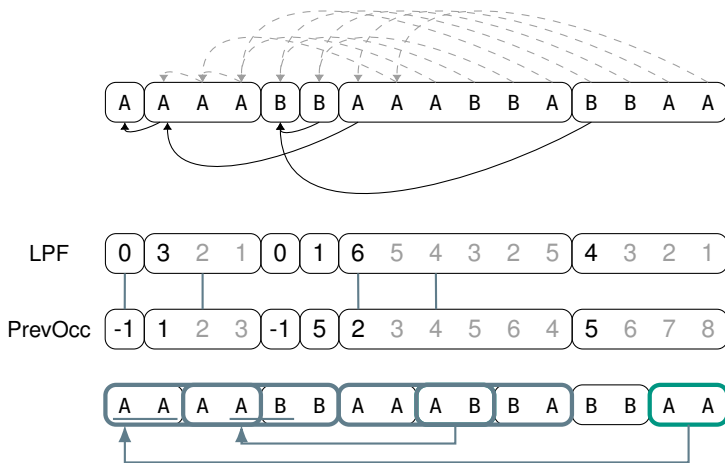
- replace Aho-Corasick automaton with Karp-Rabin fingerprints
- validate if matching fingerprints due to matching strings ⓘ Monte Carlo algorithm
- $O(n(1 + \lg_{\tau} \frac{z}{s}))$  expected time and  $O(n)$  space
- **only expected construction time!**

- queries very fast in practice
- construction very slow in practice
- space-efficient construction of block trees

# State-of-Block-Tree-Construction

Method	Reference	Working Space	Time	
Aho-Corasic	[Bel+21]	$O(n)$	$O(n(1 + \log_{\tau}(z\tau/s)))$	n
Fingerprints	[Bel+21]	$O(s + z\tau \log_{\tau}(\frac{n \log \sigma}{s \log n}))$	$O(n(1 + \log_{\tau}(z\tau/s)))$ expected	y
LPF Array	[KopplKM2023LPFBlockTrees]	$O(n)$	$O(n(1 + \log_{\tau}(z\tau/s)))$	y

# Our Algorithm (Marking of Nodes)

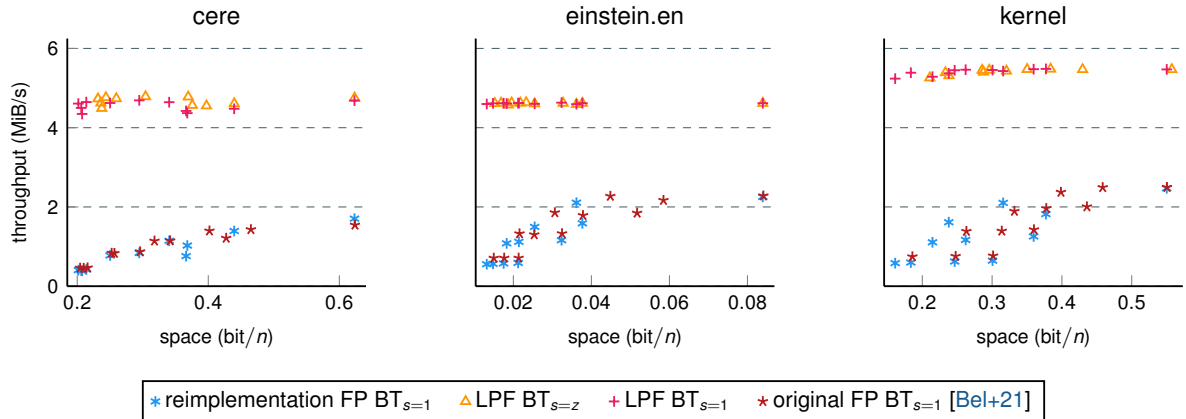




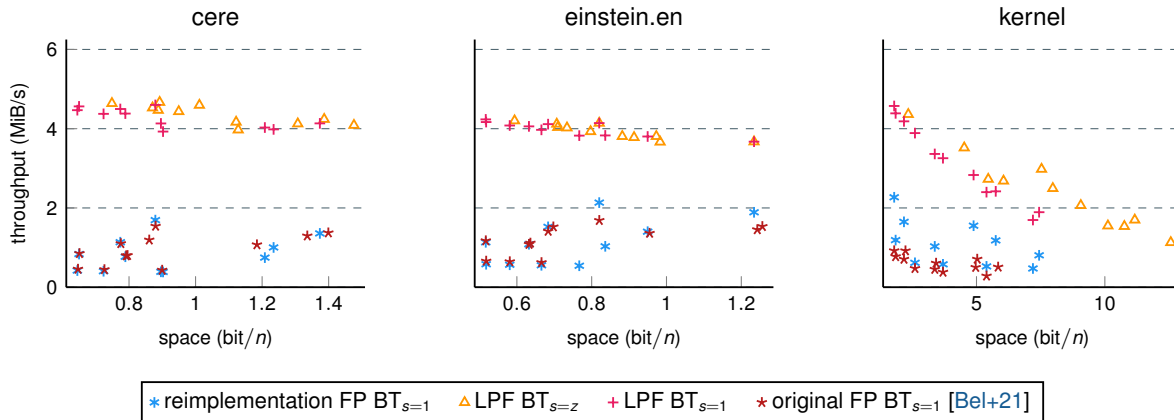
# Experimental Evaluation

- highly tuned implementation
- tree consists only of bit and compact vectors
- tuning parameter
  - degree root  $s = \{1, z\}$  (only we have  $s = z$ )
  - degree other nodes  $\tau = \{2, 4, 8, 16\}$
  - number characters in leaves  $b = \{2, 4, 8, 16\}$
- original FP BT [Bel+21]
- our reimplement of the original FP BT
- our LPF BT construction with  $s = 1$  and  $s = z$
- dynamic programming variants
- parallelization
- no comparison with wavelet trees (faster)
  
- repetitive instances from P&C corpus
- non-repetitive instances from P&C corpus

# Highly Repetitive Inputs (Access Only)



# Highly Repetitive Inputs (with Rank and Select Support)



# Conclusion and Outlook

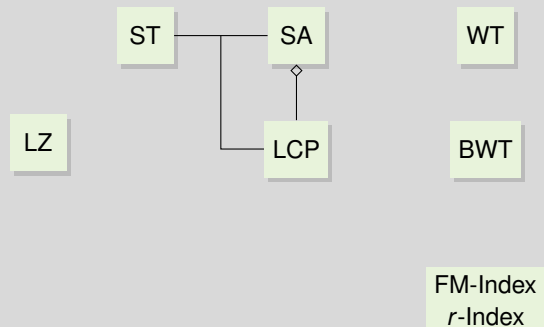
## This Lecture

- block trees
- efficient block tree construction
- linear time block tree construction

## Next Lecture

- move data structure and relation of BWT runs and LZ factors

## Linear Time Construction



# Bibliography I

- [Bel+21] Djamel Belazzougui, Manuel Cáceres, Travis Gagie, Pawel Gawrychowski, Juha Kärkkäinen, Gonzalo Navarro, Alberto Ordóñez Pereira, Simon J. Puglisi, and Yasuo Tabei. “Block Trees”. In: *J. Comput. Syst. Sci.* 117 (2021), pages 1–22. DOI: [10.1016/j.jcss.2020.11.002](https://doi.org/10.1016/j.jcss.2020.11.002).
- [BW94] Michael Burrows and David J. Wheeler. *A Block-Sorting Lossless Data Compression Algorithm*. Technical report. 1994.
- [KK20] Dominik Kempa and Tomasz Kociumaka. “Resolution of the Burrows-Wheeler Transform Conjecture”. In: *FOCS*. IEEE, 2020, pages 1002–1013. DOI: [10.1109/FOCS46700.2020.00097](https://doi.org/10.1109/FOCS46700.2020.00097).
- [ZL77] Jacob Ziv and Abraham Lempel. “A Universal Algorithm for Sequential Data Compression”. In: *IEEE Trans. Inf. Theory* 23.3 (1977), pages 337–343. DOI: [10.1109/TIT.1977.1055714](https://doi.org/10.1109/TIT.1977.1055714).