

# **Text Indexing**

# Lecture 12: Optimal r-Index

#### Florian Kurpicz

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## Today: OptBWTR

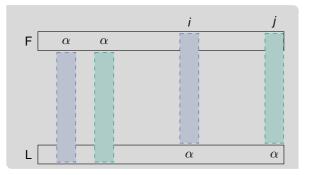
	Time (locate)	Time (count)	Space (words)
r-index [GNP20]	$O( P  \log \log_w(\sigma + n/r) + occ)$ O( P  + occ)	$O( P \log \log_w(\sigma+n/r)) O( P )$	O(r) $O(r \log \log(\sigma + n/r))$
OptBWTR [NT21]	$O( P \log \log_w \sigma + occ)$	$O( P \log \log_w \sigma)$	<i>O</i> ( <i>r</i> )



- characters (w.r.t. text) preserve order in L and F
- LF-mapping returns previous character in text

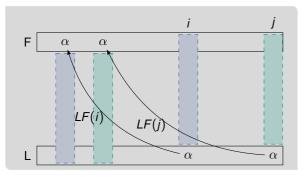


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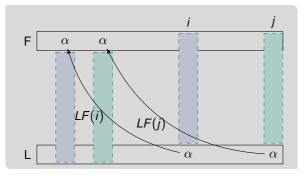


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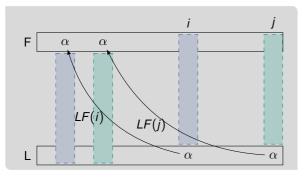
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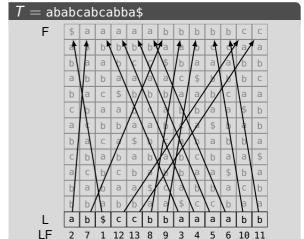


L [	а	b	\$	с	с	b	b	а	а	а	а	b	b	
L														
	b	b	а	b	b	а	а	\$	С	С	b	а	а	
	b	а	b	а	а	\$	С	а	b	b	а	С	b	
	а	С	b	С	b	а	b	b	а	а	\$	b	а	
	С	b	а	b	а	b	а	b	С	b	а	а	\$	
	b	а	С	а	\$	b	С	а	b	а	b	b	а	
	а	С	b	b	а	а	b	С	а	\$	b	а	b	
	С	b	а	а	b	С	а	b	b	а	а	\$	b	
	b	а	С	\$	b	b	b	а	а	b	С	а	а	
	а	b	b	а	а	а	а	С	\$	b	b	b	С	
	b	а	а	b	С	С	\$	b	а	а	а	b	b	
	а	\$	b	b	b	b	а	а	b	С	С	а	а	
F	\$	а	а	а	а	а	b	b	b	b	b	С	С	



- characters (w.r.t. text) preserve order in L and F
- LF-mapping returns previous character in text





## **Recap: Backwards Search in the BWT**



Function BackwardsSearch(P[1..n], C, rank): s = 1, e = nfor i = m 1 do

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

- no access to text or SA required
- no binary search
- existential queries are easy
- counting queries are easy
- reporting queries require additional information
- example on the board



Given a text *T* of length *n* over an alphabet  $\Sigma$  and its *BWT*, the *r*-index of this text consists of the following data structures  $\blacksquare$ 

## Recap: The r-Index [GNP20] (1/3)

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I[i] stores position of i-th run in BWT

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#### Array L'

- L'[i] stores character of i-th run in BWT
- build wavelet tree for L'



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- accumulate for each character by performing exclusive prefix sum over run lengths'



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#### Bit Vector B

 compressed bit vector of length n containing ones at positions where BWT runs start and rank-support



## Recap: The r-Index (2/3)

#### $rank_{\alpha}(BWT, i)$ with r-Index

- compute number *j* of run ( $j = rank_1(B, i)$ )
- compute position k in R ( $k = C'[\alpha]$ )
- compute number  $\ell$  of  $\alpha$  runs before the *j*-th run  $(\ell = rank_{\alpha}(L', j-1))$
- compute number k of αs before the j-th run
   (k = R[k + ℓ])
- compute character  $\beta$  of run ( $\beta = L'[j]$ )
- if  $\alpha \neq \beta$  return *k* () *i* is not in the run
- else return k + i I[j] + 1 is in the run



## Recap: The r-Index (3/3)

#### Lemma: Space Requirements *r*-Index

Given a text *T* of length *n* over an alphabet of size  $\sigma$  that has *r BWT* runs, then its *r*-index requires

#### $O(r \lg n)$ bits

and can answer *rank*-queries on the *BWT* in  $O(\lg \sigma)$ . Given a pattern of length *m*, the *r*-index can answer pattern matching queries in time

 $\textit{O}(m \lg \sigma)$ 



## RLBWT

- partition BWT into r substrings
- $BWT = L_1 L_2 \dots L_r$
- L<sub>i</sub> is maximal repetition of same character
- $\ell_1 = 1$  and  $\ell_i = \ell_{i-1} + |L_{i-1}|$
- $RLBWT = (L_1[1], \ell_1)(L_2[1], \ell_2) \dots (L_r[1], \ell_r)$



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- let  $\delta$  be permutation of [1, r] such that

 $LF(\ell_{\delta[1]}) < LF(\ell_{\delta[2]}) < \cdots < LF(\ell_{\delta[r]})$ 

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#### Lemma: LF and RLBWT

• Let  $\ell_x < i < \ell_{x+1}$  for some  $i \in [1, n]$ , then

 $LF(i) = LF(\ell_x) + (i - \ell_x)$ 

$$LF(\ell_{\delta[i]}) = LF(\ell_{\delta[i-1]}) + |L_{\delta[i-1]}|$$

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T = aba	bc	ab	ca	bb	a\$									
BWT	а	b	\$	с	С	b	b	а	а	а	а	b	b	
	а	b	\$	c <sup>2</sup>		b <sup>2</sup>		$a^4$				b <sup>2</sup>		
LF	2	7	1	12	13	8	9	3	4	5	6	10	11	



## Input and Output Intervals



## $\mathcal{T}=$ ababcabcabba\$





out	1 2	3 4	5 6	78	9	10 11	12 13
-----	-----	-----	-----	----	---	-------	-------

- there are *r* intervals
- represent domain of LF by intervals
- solve LF without predecessor queries () we did not use predecessor queries
- predecessor queries are bottleneck

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## **Disjoint Interval Sequence & Move Query**



#### Definition: Disjoint Interval Sequence

Let  $I = (p_1, q_1), (p_2, q_2), \ldots, (p_k, q_k)$  be a sequence of *k* pairs of integers. We introduce a permutation  $\pi$ of [1, k] and sequence  $d_1, d_2, \ldots, d_k$  for *I*.  $\pi$  satisfies  $q_{\pi[1]} \leq q_{\pi[2]} \leq \cdots \leq q_{\pi[k]}$ , and  $d_i = p_{i+1} - p_i$  for  $i \in [1, k]$ , where  $p_{k+1} = n + 1$ . We call the sequence *I* a disjoint interval sequence if it satisfies the following three conditions:

• 
$$p_1 = 1 < p_2 < \cdots < p_k \le n$$

• 
$$q_{\pi[1]} = 1$$
,

• 
$$q_{\pi[i]} = q_{\pi[i-1]} + d_{\pi[i-1]}$$
 for each  $i \in [2, k]$ .

## **Disjoint Interval Sequence & Move Query**



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T = aba	abcabca	abba\$		
in	1 2 3	4 5 6	7 8 9 10 11 12 13	
out	1 2 3	4 5 6	7 8 9 10 11 12 13	

### Move Query

move(i, x) = (i', x')

- *i* position in input interval
- x input interval
- i' position in output interval
- x' input interval covering i'

## **Answering Move Query**

- $D_{pair} = (p_i, q_i)$  for every interval
- D<sub>index</sub>[i] index of input interval containing q<sub>i</sub>

example on the board 💷

## **Answering Move Query**

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example on the board 되

- *Move*(i, x) = (i', x')
  - *i* position in input sequence
  - x index of interval containing i

$$\bullet i' = q_x + (i - p_x)$$

- x' initially D<sub>index</sub>[x]
- scan  $D_{pair}$  from x' until  $p'_x \ge l'$
- x' index satisfying condition

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### LF Query

- input: interval containing an integer i
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out	1	2	3	4	5	6	7	8	9	10	11	12	13	
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- 1. move to corresponding output interval

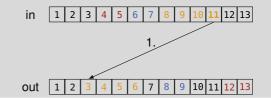
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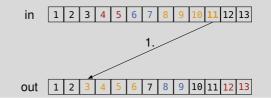




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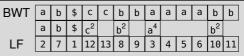


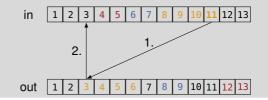




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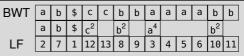


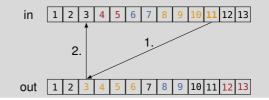




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- input: interval containing an integer i
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- 3. linear search on at most four intervals

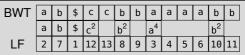


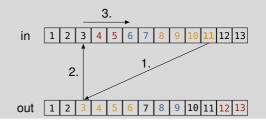




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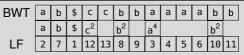


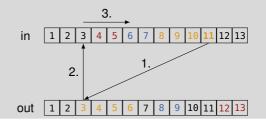




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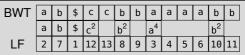


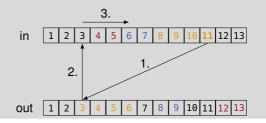
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worst-case intervals

#### T = ababcabcabba





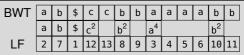
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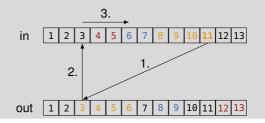


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- worst-case intervals

balance intervals





## Balance the Move Data Structure (1/2)



#### Definition: Permutation Graph

- each interval in the input and output sequence is a node
- each input interval [p<sub>i</sub>, p<sub>i</sub> + d<sub>i</sub> 1] has a single outgoing edge pointing to output interval that contains p<sub>i</sub>
- resulting graph G(I) has k edges
- G(1) is out-balanced if each output interval has at most three incoming edges

${\cal T}=$ ababcabcabba $\$$														
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in	1	2	3	4	5	6	7	8	9	10	11	12	13	
				<b></b>										
	-				-		-	_		10		10	12	
out	11	2	3	4	C	6	7	8	9	110	TT.	12	13	

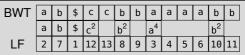
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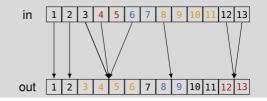


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## Balance Move Data Structure (2/2)

- identify intervals with  $\geq$  5 incoming edges
- split it "equally"
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- each new interval covers at least two input intervals
- number r' of balanced input intervals is k + r
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- r is number of runs in BWT

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#### Lemma: Size of Out-Balanced Sequence

 $k \leq r$  and  $r' \leq 2r$ 

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#### Balance Move Data Structure (2/2)



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- k is number of split operations
- r is number of runs in BWT

Lemma: Size of Out-Balanced Sequence

 $k \leq r$  and  $r' \leq 2r$ 

#### Proof

- output contains at least k big intervals, therefore  $r' \ge 2k$
- r' = r + k, therefore  $2k \le r + k$
- this gives us  $k \leq r$



- r' balanced input & output intervals for LF queries
- rank & select data structure build on the BWT
  - rank in  $O(\log \log_w \sigma)$  time
  - select in O(1) time



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- O(r') = O(r) space
- $O(|P| \log \log_w \sigma)$  running time



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- $O(|P| \log \log_w \sigma)$  running time
- $F(I_{LF})$ : move data structure for *LF*
- L<sub>first</sub>: character of each run
- R(L<sub>first</sub>): rank and select support on L<sub>first</sub>



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- current interval is [b, e] for P[i + 1..m]
- look if P[i] occurs in [b, e]
  - $rank(L_{first}, c, j) rank(L_{first}) \ge 1$
- find b̂, ê marking first/last occurrence of P[i] in
   [b, e]
  - $\hat{b} = select(L_{first}, c, rank(L_{first}, c, i 1) + 1)$
  - $\hat{e} = select(L_{first}, c, rank(L_{first}, c, j))$
- use move data structure to find new b, e for P[i..m]

#### $\boldsymbol{\Phi}$ and Its Inverse



• use  $\Phi^{-1}$  to compute *occs* of *SA*[*b*..*b* + *occ* - 1]

• 
$$\Phi^{-1}(SA[i]) = SA[i+1]$$

• 
$$SA[b..b + occ - 1] =$$
  
 $SA[b], \Phi^{-1}(SA[b]), \Phi^{-1}(\Phi^{-1}(SA[b])), \Phi^{-1}(\Phi^{-1}(\Phi^{-1}(SA[b]))), ...$ 

T = ababcabcabba\$BWT а b \$ С С b а al а b la bl b  $c^2$ b<sup>2</sup> ia⁴ b<sup>2</sup> \$ а b LF 2 5 6 13 8 9 3 4 101 SA 13 12 9 6 3 2 10 8 7 4  $\Phi^{-1}$ 9 10 11 8 13 3 5 6 2 4 in 1 2 3 4 5 6 7 12 13 out 7 8 9 10 11 12 1

## $\boldsymbol{\Phi}$ and Its Inverse



- use  $\Phi^{-1}$  to compute *occ*s of *SA*[*b*..*b* + *occ* 1]
- $\Phi^{-1}(SA[i]) = SA[i+1]$
- SA[b..b + occ 1] = $SA[b], \Phi^{-1}(SA[b]), \Phi^{-1}(\Phi^{-1}(SA[b])), \Phi^{-1}(\Phi^{-1}(\Phi^{-1}(SA[b]))), ...$
- Φ<sup>-1</sup> can be represented by *r* input & output intervals [GNP20]
- use move data structure on balanced intervals
- keep track of SA[b]

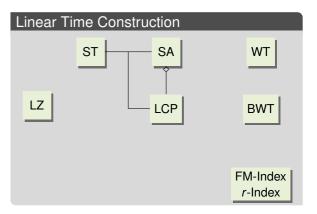
$\mathcal{T}=ababcabcabba$															
E	BWT	a	b	\$	С	С	b	b	а	а	а	а	b	b	
		а	b	\$	c <sup>2</sup>		b <sup>2</sup>		$a^4$						
	LF	2	7	1	12	13	8	9	3	4	5	6	10	11	
	SA	13	12	1	9	6	3	11	2	10	7	4	8	5	
(	$\Phi^{-1}$	9	10	11	8	13	3	4	5	6	7	2	1	12	
	in	1	2	3	4	5	6	7	8	9	10	11	12	13	
			2	5	+	5	0	/	0	3	10	11	12	1.2	

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## **Conclusion and Outlook**

#### This Lecture

- move data structure
- optimal O(r) space full-text index



## **Conclusion and Outlook**



#### This Lecture

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#### Next Lecture

- Iongest common extension queries
- BIG Recap

## Linear Time Construction ST SA WT LΖ BWT LCP FM-Index *r*-Index

## **Conclusion and Outlook**



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#### Project

- "RESULT" is a string literal in the output
- SA/LCP can be discarded, tests would be appreciated

## Linear Time Construction ST SA WT LΖ LCP BWT FM-Index r-Index

## **Bibliography I**



- [GNP20] Travis Gagie, Gonzalo Navarro, and Nicola Prezza. "Fully Functional Suffix Trees and Optimal Text Searching in BWT-Runs Bounded Space". In: *J. ACM* 67.1 (2020), 2:1–2:54. DOI: 10.1145/3375890.
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