

### **Advanced Data Structures**

Lecture 04: Predecessor and Range Minimum Query Data Structures

Florian Kurpicz



# **PINGO**





https://pingo.scc.kit.edu/267787

# Recap



### Succinct Planar Graphs

- using spanning tree of graph and
- special spanning tree of dual graph
- both represented succinctly
- represent planar graph succinctly
- store whether edge is in spanning tree or not





### Setting

- assume universe  $\mathcal{U} = [0, u)$
- let  $u = 2^w$
- sorted array of *n* integers  $A \subseteq \mathcal{U}$
- $\log n \le w$   $\oplus$  since  $n \le u$





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#### Definition: Predecessor & Successor

- $pred(A, x) = \max\{y \in A : y \le x\}$
- $succ(A, x) = min\{y \in A: y \ge x\}$



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0	-	_	•	_	5	•	_	_	_
0	1	2	4	7	10	20	21	22	32

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# 0 1 2 3 4 5 6 7 8 9 0 1 2 4 7 10 20 21 22 32

• pred(3) = 2

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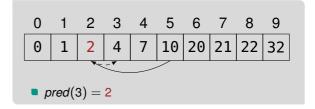
•	•	_		•	5		•	_	•
0	1	2	4	7	10	20	21	22	32

- pred(3) = 2
- *pred*(10) = 10
- *succ*(23) = 32
- in what time and space can we solve this using bit vectors? PINGO





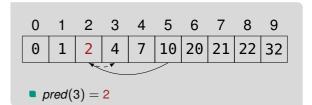
- binary search
- O(log n) query time
- no space overhead







- binary search
- $O(\log n)$  query time
- no space overhead
- using bit vector
- O(1) query time
- u + o(u) bits space



111010010010000000001110000000001

# **Predecessor and Successor: Simple Solutions**



- binary search
- $O(\log n)$  query time
- no space overhead
- using bit vector
- O(1) query time
- u + o(u) bits space

#### Predecessor of x in Bit Vector

- $z = rank_1(x + 2)$
- predecessor is select<sub>1</sub>(z)

0	1	_	3	•		6	•	8	9
0	1	2	4	7	10	20	21	22	32
		*			_				

111010010010000000001110000000001

- $rank_1(21) = 6$
- *select*<sub>1</sub>(6) = 10
- pred(19) = 10

# **Predecessor and Successor: Simple Solutions**



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- $O(\log n)$  query time
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0	•	2	U	4	0	6	•	8	9
0	1	2	4	7	10	20	21	22	32
		*	<u>-</u> ▼		_				

#### 111010010010000000001110000000001

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- *pred*(19) = 10





- *n* integers from universe  $\mathcal{U} = [0, u)$
- split number in upper and lower halves
- upper half: [log n] most significant bits
- lower half:  $\lceil \log u \log n \rceil$  remaining bits





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### **Upper Half**

- monotonous sequence of [log n] bit integers
- not strictly monotonous
- let  $p_0, \ldots, p_{n-1}$  be sequence
- use bit vector of length 2n + 1 bits
- represent  $p_i$  with a 1 at position  $i + p_i$
- rank and select support requires o(n) bits

# Elias-Fano Coding [Eli74; Fan71] (1/3)



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### Lower Half

- store lower half plain using  $\lceil \log \frac{u}{n} \rceil$  bits
- $n \log \lceil \frac{u}{n} \rceil$  bits for lower half

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•	•	_		•	5	•	•	_	•
0	1	2	4	7	10	20	21	22	32

**0**: 000000

**10**: 001010

**1**: 000001

**20**: 010100

2: 000010

**21**: 010101

**4**: 000100

**22**: 010110

**7**: 000111

**30: 100000** 



0	1	2	3	4	5	6	7	8	9
0	1	2	4	7	10	20	21	22	32
• 0	: 000	000			•	10:	0010	10	
<b>1</b>	: 000	001			•	20:	0101	00	
<b>2</b>	: 000	010			•	21:	0101	01	
<b>4</b>	: 000	100			•	22:	0101	10	
<b>7</b>	: 000	<b>1</b> 11			•	30:	1000	00	
					9 <mark>1</mark> 006				



### Access i-th Element

• upper:  $select_1(i) - i$ 

lower: corresponding bits from lower bit vector

0	1	2	3	4	5	6	7	8	9	
0	1	2	4	7	10	20	21	22	32	
• 0	: 000	000			•	10:	0010	10		
<b>1</b>	: 000	001			•	20:	0101	00		
1: 000001       20: 010100         2: 000010       21: 010101										
<b>4</b>	: 000	<b>1</b> 00			•	22:	0101	10		
<b>7</b>	: 000	111			•	30:	1000	00		
7: 000111 30: 100000  upper: 11101101000111000100 lower: 00 01 10 00 11 10 00 01 10 00										



#### Access i-th Element

- upper: select<sub>1</sub>(i) i
- lower: corresponding bits from lower bit vector

#### Predecessor x

- let x' be  $\lceil \log n \rceil$  MSB of x
- $p = select_0(x')$   $select_0(0)$  returns 0
- scan corresponding values in lower till predecessor is found
- how many elements do we have to scan? **PINGO**

0	1	2	3	4	5	6	7	8	9
0	1	2	4	7	10	20	21	22	32
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<b>-</b> 7	: 000	111			•	30:	1000	000	
		uppe	r: 11	10110	91000	1110	0010	Θ	

lower: 00 01 10 00 11 10 00 01 10 00



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- how many elements do we have to scan?
  PINGO
- scanning O(u/n) elements

0	1	2	3	4	5	6	7	8	9	
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<b>1</b>	: 000	001			•	20:	0101	00		
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7: 000111										





# Lemma: Elias-Fano Coding

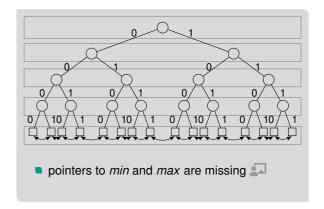
Given an array containing n distinct integers from a universe  $\mathcal{U} = [0, u)$ , the array can be represented using

$$n(2 + \log \lceil \frac{u}{n} \rceil)$$
 bits

while allowing O(1) access time and  $O(\log \frac{u}{n})$  predecessor/successor time

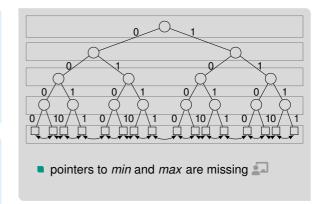


- each number has w bits
- build binary tree where leaves represent numbers
- edges are labeled 0 or 1
- labels on path from root to leaf are value represented in leaf



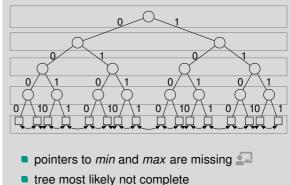


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- edges are labeled 0 or 1
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- store nodes in hash tables with bit prefix as key
- also store pointer to min and max in right and left subtree
- leaves are stored in doubly linked list
- using perfect hashing on each level requires O(wn) space



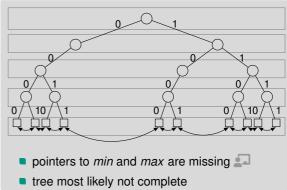


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### x-Fast Tries: Queries



- traversing tree requires O(w) time
- using binary search on levels requires O(log w) time
- if value not found go to *min* or *max* depending on query
- if value is found use doubly linked list to find predecessor or successor
- example on the board



- x-fast trie requires O(wn) space
- group w consecutive objects into one block B<sub>i</sub>
- for each block B<sub>i</sub> choose maximum m<sub>i</sub> as representative
- build x-fast trie for representatives
- store blocks in balanced binary trees

example on the board



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- $\blacksquare$  x-fast trie requires O(n) space
- search in x-fast trie requires  $O(\log w) = O(\log \log n) \text{ time } \bullet \text{ For large } n$
- search in balanced binary tree requires  $O(\log w) = O(\log \log n)$  time

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example on the board 💷

# Dynamic y-Fast Trie

- use cuckoo hashing
- representative does not have to be maximum
- any element separating groups suffices
- merge and split blocks that are too small/too big
- query time only expected

# **Range Minimum Queries**



### Setting

- array of n integers
- not necessarily sorted

### Definition: Range Minimum Queries

Given an array of A of n integers

$$rmq(A, s, e) = \underset{s \le i \le e}{arg \min} A[i]$$

returns the position of minimum in A[s, e]

0	1		_		_	_		_	_
8	2	5	1	9	11	10	20	22	4

- rmq(0,9) = 3
- rmq(0,2) = 1
- rmq(4,8) = 4

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- how much space does a naive O(1)-time solution need PINGO

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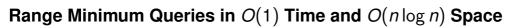
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- naive in *O*(1) time
- how much space does a naive O(1)-time solution need PINGO
- using  $O(n^2)$  space rmq(s, e) = M[s][e]



# Range Minimum Queries in O(1) Time and $O(n \log n)$ Space

- instead of storing all solutions
- store solutions for intervals of length 2<sup>k</sup> for every k
- $\blacksquare M[0..n)[0..\lfloor \log n \rfloor)$





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#### Queries

- query rmq(A, s, e) is answered using two subqueries
- let  $\ell = |log(e-s-1)|$
- $m_1 = rmq(A, s, s + 2^{\ell} 1)$  and  $m_2 = rmq(A, e 2^{\ell} + 1, e)$
- $rmq(A, s, e) = arg min_{m \in \{m_1, m_2\}} A[m]$

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#### Construction

$$M[x][\ell] = rmq(A, x, x + 2^{\ell} - 1)$$

$$= \arg \min\{A[i] : i \in [x, x + 2^{\ell})\}$$

$$= \arg \min\{A[i] : i \in \{rmq(A, x, x + 2^{\ell-1} - 1),$$

$$= rmq(A, x + 2^{\ell-1}, x + 2^{\ell} - 1)\}\}$$

$$= \arg \min\{A[i] : i \in \{M[x][\ell - 1],$$

$$= M[x + 2^{\ell-1}][\ell - 1]\}\}$$

how much time do we need to fill the table?
PINGO

# Range Minimum Queries in O(1) Time and $O(n \log n)$ Space



- instead of storing all solutions
- store solutions for intervals of length 2<sup>k</sup> for every k
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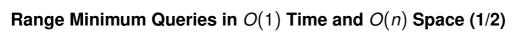
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- how much time do we need to fill the table?
  PINGO
- dynamic programming in  $O(n \log n)$  time





- divide *A* into blocks of size  $s = \frac{\log n}{A}$
- blocks  $B_1, \ldots, B_m$  with  $m = \lceil n/s \rceil$
- query rmq(A, s, e) is answered using at most three subqueries
- one query spanning multiple block
- at most two queries within a block each
- example on the board <a>=</a>

# Range Minimum Queries in O(1) Time and O(n) Space (1/2)



- divide *A* into blocks of size  $s = \frac{\log n}{4}$
- blocks  $B_1, \ldots, B_m$  with  $m = \lceil n/s \rceil$
- query rmq(A, s, e) is answered using at most three subqueries
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- example on the board <a>П</a>

## **Query Spanning Blocks**

- use array B containing minimum within each block
- B has m entries
- use  $O(n \log n)$  data structure for B
- $O(m \log m) = O(\frac{n}{s} \log \frac{n}{s}) = O(\frac{n}{\log n} \log \frac{n}{\log n}) = O(n)$
- use additional array B' storing position of minimum in each block

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- use additional array B' storing position of minimum in each block
- for queries within block use Cartesian trees





#### Definition: Cartesian Tree

Given an array A of length n, a Cartesian tree C(A) of a is a labeled binary tree with

- root r is labeled with  $x = \arg \min\{A[i] : i \in [0, n)\}$
- left and right children of r are Cartesian trees C(A[0,x)) and C(A[x+1,n)) if interval exists





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#### Lemma: Cartesian Tree Construction

A Cartesian tree for an array of size n can be computed in O(n) time

### Proof (Sketch)

- scan array from left to right
- insert each element by
  - following rightmost path from leaf to root till element can be inserted
  - everything below becomes left child of new node
- each node is removed at most once from the rightmost path
- moving subtree to left child in constant time gives O(n) construction time

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- example on the board \_\_\_





## Lemma: Equality of Cartesian Trees

Given two arrays A and B of length n with equal Cartesian trees, then

$$rmq(A, s, e) = rmq(B, s, e)$$

for all 
$$0 \le s < e < n$$





### Lemma: Equality of Cartesian Trees

Given two arrays A and B of length n with equal Cartesian trees, then

$$rmq(A, s, e) = rmq(B, s, e)$$

for all 0 < s < e < n

- proof by induction over the size of the array
- if the array has size one, this is true
- assuming this is correct for arrays of size n, showing this for arrays of size n + 1 uses recursive definition of Cartesian trees



# Range Minimum Queries in O(1) Time and O(n) Space (2/2)

## Query Within a Block

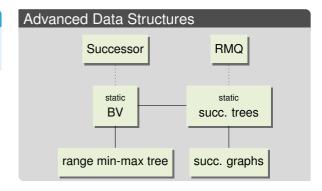
- consider every possible Cartesian tree for arrays of size  $s = \frac{\log n}{4}$
- tree can be represented using 2s + 1 bits
- store bit representation of Cartesian tree for every block
- for every possible Cartesian tree and every start and end position store position of minimum
- $O(2^{2s+1} \cdot s \cdot s \cdot \log s) =$  $O(\sqrt{n}\log^2 n \cdot \log \log n) = O(n)$  space





#### This Lecture

- successor and predecessor data structures
- range minimum query data structures



# Bibliography I



- [Eli74] Peter Elias. "Efficient Storage and Retrieval by Content and Address of Static Files". In: *J. ACM* 21.2 (1974), pages 246–260. DOI: 10.1145/321812.321820.
- [Fan71] Robert Mario Fano. On the Number of Bits Required to Implement an Associative Memory. 1971.
- [Nav16] Gonzalo Navarro. *Compact Data Structures A Practical Approach*. Cambridge University Press, 2016. ISBN: 978-1-10-715238-0.