# 2-INF-237 Vybrané partie z dátových štruktúr 2-INF-237 Selected Topics in Data Structures

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#### **Succinct data structures**

We usually count memory in **words** of some size  $w \ge \lg n$  each word can hold pointer, index, count, symbol etc.

Now we will count memory in bits

**Lower bound:** to store any  $x \in \mathcal{U}$ , we need at least  $OPT = \lg |\mathcal{U}|$  bits

Compact data structure uses O(OPT) bits

Succinct data structure uses OPT + o(OPT) bits

Leading constant 1 plus some lower-order terms

**Implicit data structure** uses OPT bit plus O(1) words

Uses ordering of elements in an array

Example: binary heap, sorted array

## Succinct structure for binary rank and select

Bit vector A[0..n-1]

rank(i) = number of bits set to 1 in A[0..i]

select(i) = position of the i-th bit set to 1

#### **Example:**

i 0 1 2 3 4 5 6 7  $A[i] \quad 0 \quad 1 \quad 1 \quad 0 \quad 1 \quad 0 \quad 0 \quad 1$   $rank(3) = 2, \ rank(4) = 3$   $select(1) = 1, \ select(3) = 4$ 

#### Goal:

rank, select in O(1) time structure needs n+o(n) bits of memory we will concentrate on rank

### Succinct structure for rank (Jacobson 1989)

- $\bullet \ \, \text{Divide bit vector to super blocks of size } t_1 = \lg^2 n \\$
- Divide each super block to blocks of size  $t_2 = \frac{1}{2} \lg n$
- Keep rank at each super block boundary  $O(\frac{n}{t_1} \cdot \log n) = O(n/\log n) = o(n) \text{ bits}$
- Keep rank within super block at each block boundary  $O(\frac{n}{t_2} \cdot \log t_1) = O(n \log \log n / \log n) = o(n) \text{ bits}$
- Each block stored as a binary number using t<sub>2</sub> bits
   n bits
- For each of  $2^{t_2}$  possible blocks and each query keep the answer  $O(2^{t_2} \cdot t_2 \cdot \log t_2) = O(\sqrt{n} \log n \log \log n) = o(n)$  bits

#### **Succinct structure for rank (Jacobson 1989)**

```
R1: array of ranks at superblock boundaries
   R2: array of ranks at block boundaries within superblocks
   R3: precomputed rank for each block type and each position
   B: bit array
   rank(i) {
2
     superblock = i/t1; //integer division
     block = i/t2;
3
     index = block*t2;
4
5
     type = B[index..index+t2-1];
6
     return R1[superblock]+R2[block]+R3[type, i%t2]
7
```

#### Succinct structure for select

- Let  $t_1 = \lg n \lg \lg n$ ,  $t_2 = (\lg \lg n)^2$ .
- Store select( $t_1 \cdot i$ ) for i = 0, ..., n/t1; this divides bit vector into super-blocks of unequal size.
- $\bullet$  Large super-blocks of size  $\geq t_1^2 :$  store array of indices of 1 bits.
- Small super-block of size  $\leq t_1^2$ : repeat with  $t_1$ : store select( $t_2 \cdot i$ ) within super-block for  $i=0,\ldots,n/t2$ ; this divides small super-blocks into blocks of unequal size.
- ullet Large blocks of size  $\geq t_2^2$ : store relative indices of all 1 bits.
- Small blocks of size <  $t_2^2$ : store as  $t_2^2$ -bit integer, plus a lookup table of all answers.

#### **Succinct data structures**

- Data structure uses OPT + o(OPT) bits of memory and supports fast operations
- Rank and select on a binary vector of length n in O(1) time

#### **Next:**

- Compressed data structures (for rank)
- Wavelet tree for rank over larger alphabet
- Succinct data structure for binary trees

### **Entropy and compression**

Consider alphabet  $\Sigma$  of size  $\sigma$ , probability of  $\alpha \in \Sigma$  is  $p_{\alpha}$ 

Entropy of this distribution is: 
$$-\sum_{\alpha \in \Sigma} p_\alpha \lg p_\alpha$$

#### **Measure of randomness:**

Uniform distribution has entropy  $log_2 \sigma (max)$ 

If  $p_{\alpha} = 1$  for some  $\alpha \in \Sigma$ , then entropy 0 (min)

Lossless **compression** of a text consisting of independent identically distributed random symbols with entropy H, needs roughly H bits per symbol

Goal: use  $-\log_2 p_a$  bit to encode a

Huffman encoding close to that but needs rounding

Arithmetic coding avoids rounding

## Compressed structure for rank (Raman, Raman, Rao 2002)

- Compressed size of bit vector + o(n) bits
- Need to reduce the following part:
   Each block stored as a binary number using t<sub>2</sub> bits
- Blocks with many 0s or many 1s stored using fewer bits
- For each block store the number of 1s (class)  $O(\frac{n}{t_2}\log t_2) = O(n\log\log n/\log n) = o(n) \text{ bits}$
- For a block with x 1s store its signature: index in lexicographic order of all binary strings of size  $t_2$  with x 1s  $\lceil\lg\binom{t_2}{x}\rceil\rceil \leq \lg 2^{t_2} = t_2 \text{ bits} \quad \text{(overall at most } \frac{\mathfrak{n}}{\mathfrak{t}_2}\mathfrak{t}_2 = \mathfrak{n} \text{ bits)}$
- Rearrange the table with answers for all possible blocks of size  $t_2$ Add signature boundaries in compressed bit vector o(n)

## Compressed structure for rank (RRR)

$$t_2 = 3$$

Cl	Sig	Length	Block	Answers		
0	0	0	000	0	0	0
1	0	2	001	0	0	1
	1		010	0	1	1
	2		100	1	1	1
2	0	2	011	0	1	2
	1		101	1	1	2
	2		110	1	2	2
3	0	0	111	1	2	3

Original bits: 000|101|001|111|111

Number of 1s in each block: 00|10|01|11|11

Index of block:  $\epsilon |01|00|\epsilon|\epsilon$ 

Where each block starts (within superblock): 0000|0000|0010|0100|0100

### Compressed structure for rank (RRR)

#### rank(i):

- superblock = i/t1 (integer division)
- block = i/t2
- index = S1[superblock]+S2[block]
- class = C[block]
- length = L[class]
- signature = B[index..index+length-1]
- return R1[superblock]+R2[block]+R3[class, signature, i%t2]

### **Analysis of RRR structure**

- ullet Let S be a string in which  $a\in\Sigma$  occurs  $n_a$  times
- Its entropy is  $H(S) = \sum_{\alpha} \frac{n_{\alpha}}{n} \lg \frac{n}{n_{\alpha}}$
- RRR structure for bit vector B uses nH(B) + o(n) bits

### Stirling's approximation of n!

$$\begin{split} n! &= \sqrt{2\pi n} \left(\frac{n}{e}\right)^n \left(1 + O(1/n)\right) \\ \ln(n!) &= n \ln(n) - n + O(\ln(n)) \end{split}$$

#### **Wavelet tree (Grossi, Gupta, Vitter 2003)**

```
\Sigma_0 = \{\$, .., a\} \quad \Sigma_1 = \{e, m, u\}
       1 2 3 4 5 6 7 8 9 10 11 12 13 14 15 16 17 18 19 20 21 22 23
S[i] e m a . m a m u . m a m
B[i] 1 1 0 0 1 0 0 1 0 1 1 0 1 0 1 0 1
S0 a.a.a.a.$ S1
                             emmmmummmemu
\Sigma_{00} = \{\$\}, \Sigma_{01} = \{., \alpha\}, \quad \Sigma_{010} = \{.\}, \Sigma_{011} = \{\alpha\}
\Sigma_{10} = \{e\}, \Sigma_{11} = \{m, u\}, \quad \Sigma_{110} = \{m\}, \Sigma_{111} = \{u\}
        1 2 3 4 5 6 7 8 9 10 11
S0[i] a . a . a . a . $
B0[i] 1 1 1 1 1 1 1 1 1 0
S00 a.a.a.a. S01 $
```

#### Store

B[i] =110010010110101001001110 B01[i] = 10101011010 B11[i] = 000100001

0 0 1 1 1

#### Combination of RRR structure and wavelet trees

- Store binary rank structures in the wavelet tree for text T overall nH(T) + o(nH(T)) bits
- Instead of wavelet tree, store indicator vector for each  $\alpha \in \Sigma$  overall  $nH(T)+O(n)+o(\sigma n)$  bits O(1) per rank query

## **Dynamic texts (Navarro, Nekrich 2014)**

Access, rank, select

Insert/delete character

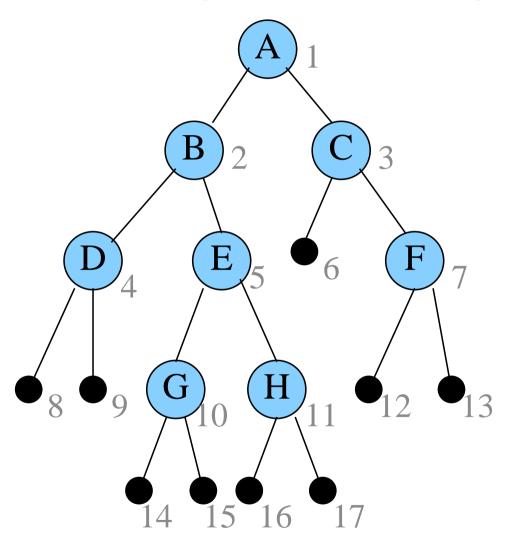
All in  $O(\log n / \log \log n)$  amortized

Additional memory  $o(n\lg\sigma) + O(\sigma\lg n)$ 

## **Succinct binary trees**

- Consider all binary trees with n nodes
- Classical trees with pointers use  $\Omega(n \log n)$  bits
- OPT is cca 2n bits (proof later)
- Goal: Use 2n + o(n) memory, support operations left child, right child, parent in O(1)
- Add n + 1 auxiliary leaves
- Nodes are numbers  $\{1, \ldots, 2n+1\}$  in level order (BFS)

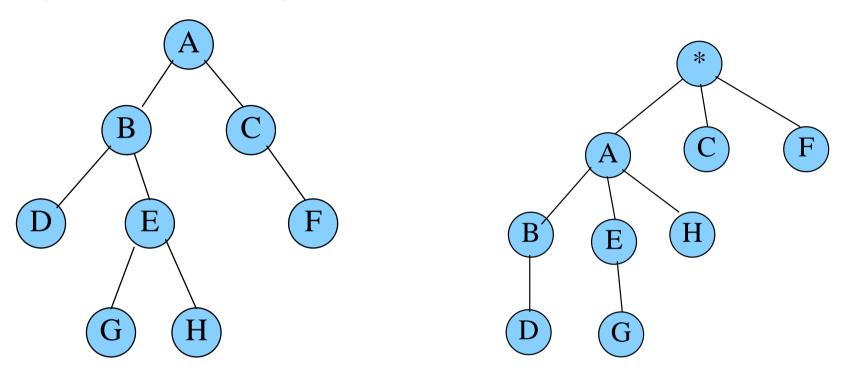
# Succinct binary trees: level order representation



### **Succinct binary trees**

- Consider all binary trees with n nodes
- Goal: Use 2n + o(n) memory, support operations left child, right child, parent in O(1)
- Add n + 1 auxiliary leaves
- Nodes are numbers from {1,...,2n+1}
   Using rank can be mapped to {1,...,n}
   These can be then used as indices to arrays with additional data
- Static trees only, construction requires more memory

## **Equivalence of binary trees and rooted ordered trees**



Rooted ordered tree as a well-parenthesized expression:

((())(())())()

ABDDBEGGEHHACCFF

## Counting well-parenthesized expresions

X(n,m,k): set of all sequences containing n times 1, m times -1 with all prefix sums  $\geq k$ 

Easy: 
$$|X(n, m, -\infty)|$$

Want: 
$$|X(n, n, 0)|$$

Prove: 
$$|X(n, n, -\infty) \setminus X(n, n, 0)| = |X(n - 1, n + 1, -\infty)|$$

Then: 
$$|X(n,n,0)| = {2n \choose n} - {2n \choose n-1} = \frac{(2n)!}{n!n!} - \frac{(2n)!}{(n-1)!(n+1)!}$$

$$=\frac{(2n)!(n+1-n)}{n!(n+1)!}=\binom{2n}{n}/(n+1)$$

#### **Example:**

$$|X(3,3,-\infty) \setminus X(3,3,0)| = |X(2,4,-\infty)| = 15$$

$$|X(3,3,-\infty)| = 20$$

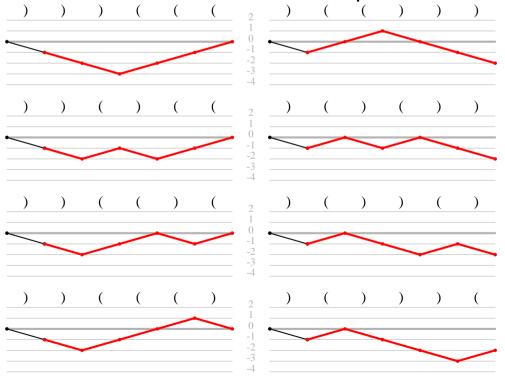
$$|X(3,3,0)| = 20 - 15 = 5 = C_3$$

#### **Counting well-parenthesized expresions**

X(n,m,k): set of all sequences containing n times 1, m times -1 with all prefix sums  $\geq k$ 

$$|X(n,n,-\infty)\setminus X(n,n,0)|=|X(n-1,n+1,-\infty)|$$

Consider n = 3, first four examples out of 15:



#### **Back to trees**

The number of binary trees with n nodes is  $C_n = \binom{2n}{n}/(n+1)$ 

Recall Stirling's approximation of n!:

$$\begin{split} &\ln(n!) = n \ln(n) - n + O(\ln(n)) \\ &\ln(C_n) = \ln((2n)!) - 2 \ln(n!) + O(\log n) \\ &= 2n \ln(2n) - 2n - 2n \ln(n) + 2n + O(\log n) \\ &= 2n \ln(2) + O(\log n) \\ &\lg(C_n) = \ln(C_n) / \ln(2) = 2n + O(\log n) \end{split}$$

Thus OPT for representing binary trees is 2 bits per node