

ALGORITHMICS\$APPLIED
APPLIEDALGORITHMICS\$
CS\$APPLIEDALGORITHMICS\$
DALGORITHMICS\$APPLIE
EDALGORITHMICS\$APPLI
GORITHMICS\$APPLIEDAL
HMICS\$APPLIEDALGORIT
ICS\$APPLIEDALGORITHM
IEDALGORITHMICS\$APPL
ITMICS\$APPLIEDALGOR
LGORITHMICS\$APPL
LIEDALGORITHMICS\$AP
MICS\$APPLIEDALGO
RITHMICS\$APPLIEDALG
PLIEDALGORITHMICS\$A
RITHMICS\$APPLIEDALGO
S\$APPLIEDALGORITHMIC
THMICS\$APPLIEDALGORI

9 Range-Minimum Queries

25 April 2022

Sebastian Wild

Learning Outcomes

1. Know the *RMQ problem* and its *connection* to longest common extensions in strings.
2. Know and understand trivial RMQ solutions and *sparse tables*.
3. Know and understand the *Cartesian trees* data structure.
4. Know and understand the *exhaustive-tabulation technique* for RMQ with linear-time preprocessing.

Unit 9: Range-Minimum Queries



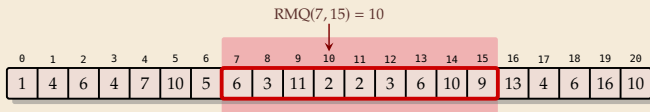
9 Range-Minimum Queries

- 9.1 Introduction
- 9.2 RMQ, LCP, LCE, LCA — WTF?
- 9.3 Trivial Solutions & Sparse Tables
- 9.4 Cartesian Trees
- 9.5 Exhaustive Tabulation

9.1 Introduction

Range-minimum queries (RMQ)

- ▶ **Given:** Static array $A[0..n)$ of numbers
array/numbers don't change
- ▶ **Goal:** Find minimum in a range;
 A known in advance and can be preprocessed



- ▶ **Nitpicks:**
 - ▶ Report index of minimum, not its value
 - ▶ Report leftmost position in case of ties

Clicker Question



Given the array from the slides, what is $\text{RMQ}_A(1, 6)$

0	1	2	3	4	5	6	7	8	9	10	11	12	13	14	15	16	17	18	19	20
1	4	6	4	7	10	5	6	3	11	2	2	3	6	10	9	13	4	6	16	10

sli.do/comp526

Rules of the Game

- ▶ comparison-based \rightsquigarrow values don't matter, only relative order
- ▶ Two main quantities of interest:
 1. **Preprocessing time:** Running time $P(n)$ of the preprocessing step \rightsquigarrow space usage $\leq P(n)$
 2. **Query time:** Running time $Q(n)$ of one query (using precomputed data)
- ▶ Write $\langle P(n), Q(n) \rangle$ **time solution** for short

Clicker Question



What do you think, what running times can we achieve? For a $\langle P(n), Q(n) \rangle$ time solution, enter " $\langle P(n), Q(n) \rangle$ ".

sli.do/comp526

9.2 RMQ, LCP, LCE, LCA — WTF?

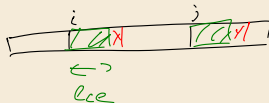
Recall Unit 6

Application 4: Longest Common Extensions

- ▶ We implicitly used a special case of a more general, versatile idea:

The *longest common extension (LCE)* data structure:

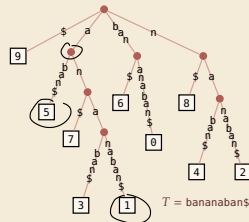
- ▶ **Given:** String $T[0..n-1]$
- ▶ **Goal:** Answer LCE queries, i.e.,
given positions i, j in T ,
how far can we read the same text from there?
formally: $\text{LCE}(i, j) = \max\{\ell : T[i..i+\ell] = T[j..j+\ell]\}$



↪ use suffix tree of T !

- ▶ In \mathcal{T} : $\text{LCE}(i, j) = \text{LCP}(T_i, T_j) \rightsquigarrow$ same thing, different name!
= string depth of
lowest common ancestor (LCA) of
leaves \boxed{i} and \boxed{j}

- ▶ in short: $\text{LCE}(i, j) = \text{LCP}(T_i, T_j) = \text{stringDepth}(\text{LCA}(\boxed{i}, \boxed{j}))$



Recall Unit 6

Efficient LCA

How to find lowest common ancestors?

- ▶ Could walk up the tree to find LCA $\rightsquigarrow \Theta(n)$ worst case 🗑️
- ▶ Could store all LCAs in big table $\rightsquigarrow \Theta(n^2)$ space and preprocessing 🗑️



Amazing result: Can compute data structure in $\Theta(n)$ time and space that finds any LCA is **constant(!) time**.

- ▶ a bit tricky to understand
- ▶ but a theoretical breakthrough
- ▶ and useful in practice

and suffix tree construction inside ...



\rightsquigarrow for now, use $O(1)$ LCA as black box.

\rightsquigarrow After linear preprocessing (time & space), we can find LCEs in $O(1)$ time.

Finally: Longest common extensions

- In Unit 6: Left question open how to compute LCA in suffix trees
- But: Enhanced Suffix Array makes life easier!

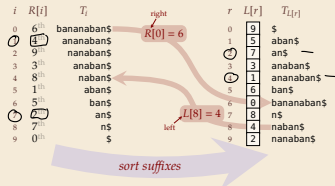
0 1 2 3 4 5 6 7 8 9
 banana ban\$
 ↑ ↑

$$\text{LCE}(i, j) = \text{LCP}[\text{RMQ}_{\text{LCP}}(\min\{R[i], R[j]\} + 1, \max\{R[i], R[j]\})]$$

Inverse suffix array: going left & right

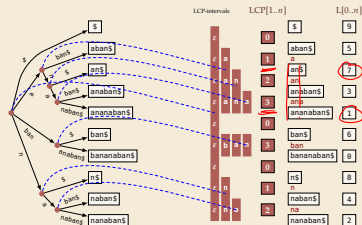
► to understand the fastest algorithm, it is helpful to define the *inverse suffix array*:

- $R[i] = r \iff L[r] = i$ $L = \text{leaf array}$
- \iff there are r suffixes that come before T_i in sorted order
- $\iff T_i$ has (0-based) *rank* $r \rightsquigarrow$ call $R[0..n]$ the *rank array*



25

LCP array and internal nodes



\rightsquigarrow Leaf array $L[0..n]$ plus LCP array $\text{LCP}[1..n]$ encode full tree!

35

RMQ Implications for LCE

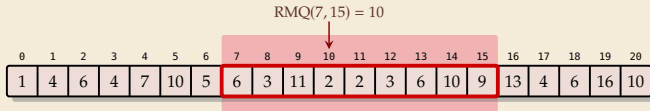
► Recall: Can compute (inverse) suffix array and LCP array in $O(n)$ time

↪ A $\langle P(n), Q(n) \rangle$ time RMQ data structure implies a $\langle P(n), Q(n) \rangle$ time solution for longest-common extensions

\wedge
 $+ O(\omega)$

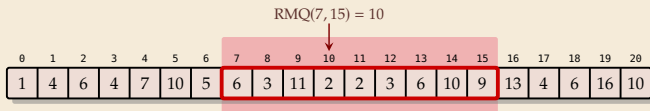
9.3 Trivial Solutions & Sparse Tables

Trivial Solutions



- Two easy solutions show extreme ends of scale:

Trivial Solutions

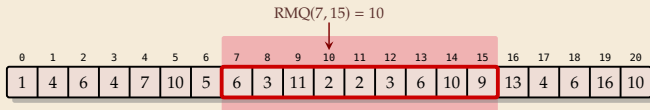


- ▶ Two easy solutions show extreme ends of scale:

1. Scan on demand

- ▶ no preprocessing at all
 - ▶ answer $\text{RMQ}(i, j)$ by scanning through $A[i..j]$, keeping track of min
- $\rightsquigarrow \langle O(1), O(n) \rangle$

Trivial Solutions



- ▶ Two easy solutions show extreme ends of scale:

1. Scan on demand

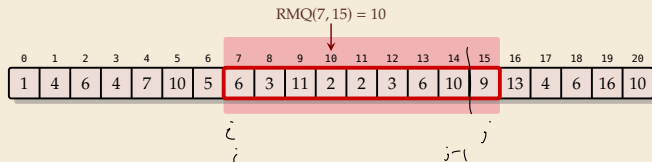
- ▶ no preprocessing at all
 - ▶ answer $\text{RMQ}(i, j)$ by scanning through $A[i..j]$, keeping track of min
- $\rightsquigarrow \langle O(1), O(n) \rangle$

2. Precompute all

- ▶ Precompute all answers in a big 2D array $M[0..n][0..n]$
- ▶ queries simple: $\text{RMQ}(i, j) = M[i][j]$

$\rightsquigarrow \langle O(n^3), O(1) \rangle$ — fill $\Theta(n^2)$ cells, each takes $O(n)$

Trivial Solutions



- ▶ Two easy solutions show extreme ends of scale:

1. Scan on demand

- ▶ no preprocessing at all
- ▶ answer $\text{RMQ}(i, j)$ by scanning through $A[i..j]$, keeping track of min

$\rightsquigarrow \langle O(1), O(n) \rangle$

$$M[i][j] = \text{arg min} \{ A[M[i][j-1]], A[j] \}$$

2. Precompute all

- ▶ Precompute all answers in a big 2D array $M[0..n][0..n]$
- ▶ queries simple: $\text{RMQ}(i, j) = M[i][j]$

$\rightsquigarrow \langle O(n^3), O(1) \rangle$

- ▶ Preprocessing can reuse partial results $\rightsquigarrow \langle O(n^2), O(1) \rangle$

$$\begin{aligned} &\text{if } A[M[i][j-1]] \leq A[j] \\ &\quad \text{then } M[i][j] = M[i][j-1] \\ &\quad \text{else } j \end{aligned}$$

Sparse Table

- ▶ **Idea:** Like “precompute-all”, but keep only some entries
- ▶ store $M[i][j]$ iff $\ell = j - i + 1$ is 2^k .
 - ↪ $\leq n \cdot \lg n$ entries
 - ↪ Can be stored as $M'[i][k] = M[i][i + 2^k - 1]$

Sparse Table

- ▶ **Idea:** Like “precompute-all”, but keep only some entries
- ▶ store $M[i][j]$ iff $\ell = j - i + 1$ is 2^k .
 - ↪ $\leq n \cdot \lg n$ entries
 - ↪ Can be stored as $M'[i][k]$
- ▶ How to answer queries?

Sparse Table

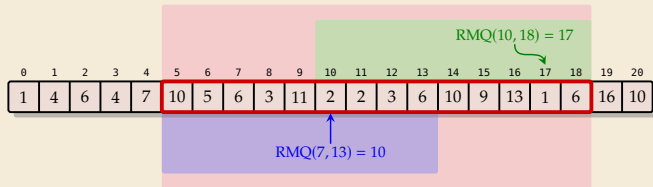
► **Idea:** Like “precompute-all”, but keep only some entries

► store $M[i][j]$ iff $\ell = j - i + 1$ is 2^k .

↪ $\leq n \cdot \lg n$ entries

↪ Can be stored as $M'[i][k]$

► How to answer queries?



$$rmq_1 = M'[i][k]$$

$$rmq_2 = M'[j - 2^k + 1][k]$$

1. Find k with $\ell/2 \leq 2^k \leq \ell$

2. Cover range $[i..j]$ by
 2^k positions right from i and
 2^k positions left from j

3. $RMQ(i, j) =$
 $\arg \min \{A[rmq_1], A[rmq_2]\}$

with $rmq_1 = RMQ(i, i + 2^k - 1)$

$rmq_2 = RMQ(j - 2^k + 1, j)$

Sparse Table

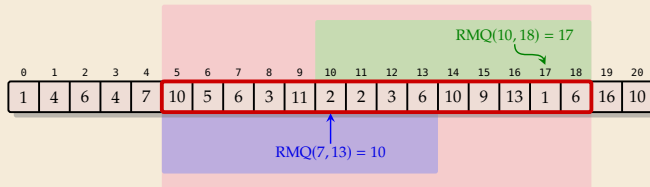
► **Idea:** Like “precompute-all”, but keep only some entries

► store $M[i][j]$ iff $\ell = j - i + 1$ is 2^k .

↪ $\leq n \cdot \lg n$ entries

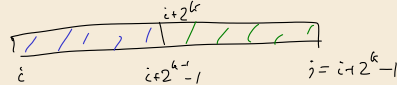
↪ Can be stored as $M'[i][k]$

► How to answer queries?



► Preprocessing can be done in $O(n \log n)$ times

↪ $\langle O(n \log n), O(1) \rangle$ time solution!



$$M'[i][k] =$$

$$\arg \min \{ A[M'[i][k-1]], A[M'[i+2^{k-1}][k-1]] \}$$

1. Find k with $\ell/2 \leq 2^k \leq \ell$

2. Cover range $[i..j]$ by
 2^k positions right from i and
 2^k positions left from j

3. $RMQ(i, j) =$
 $\arg \min \{ A[rmq_1], A[rmq_2] \}$

with $rmq_1 = RMQ(i, i + 2^k - 1)$

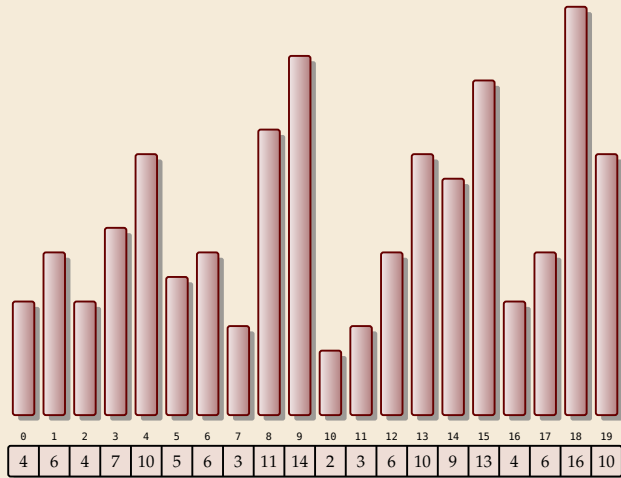
$rmq_2 = RMQ(j - 2^k + 1, j)$

9.4 Cartesian Trees

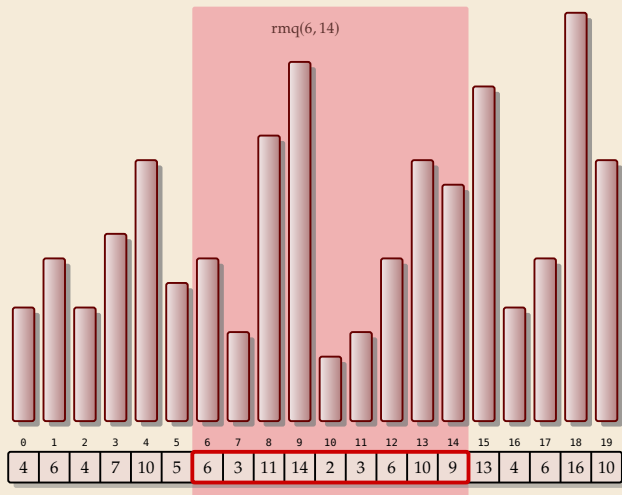
RMQ & LCA

0	1	2	3	4	5	6	7	8	9	10	11	12	13	14	15	16	17	18	19
4	6	4	7	10	5	6	3	11	14	2	3	6	10	9	13	4	6	16	10

RMQ & LCA

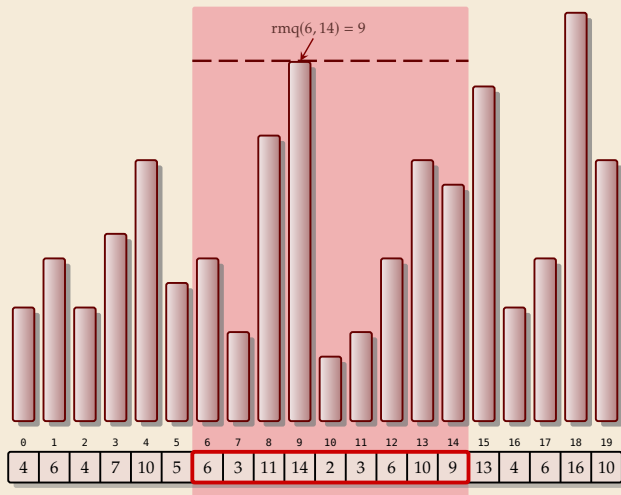


RMQ & LCA



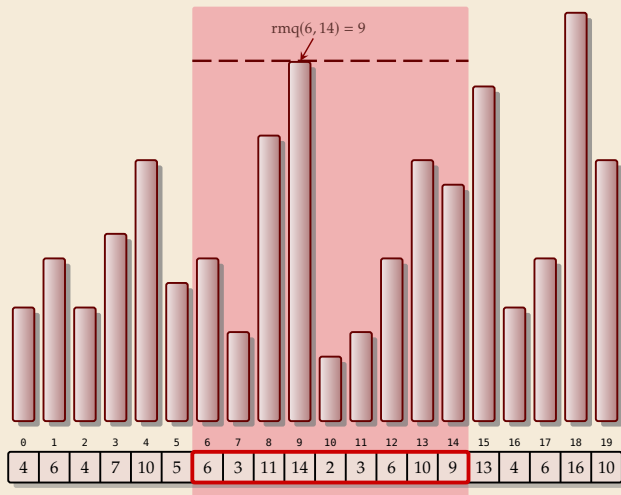
- Range-max queries on array A :
 $\text{rmq}_A(i, j) = \arg \max_{i \leq k \leq j} A[k]$
 $= \text{index of max}$

RMQ & LCA



- **Range-max queries** on array A :
 $\text{rmq}_A(i, j) = \arg \max_{i \leq k \leq j} A[k]$
 $= \text{index of max}$

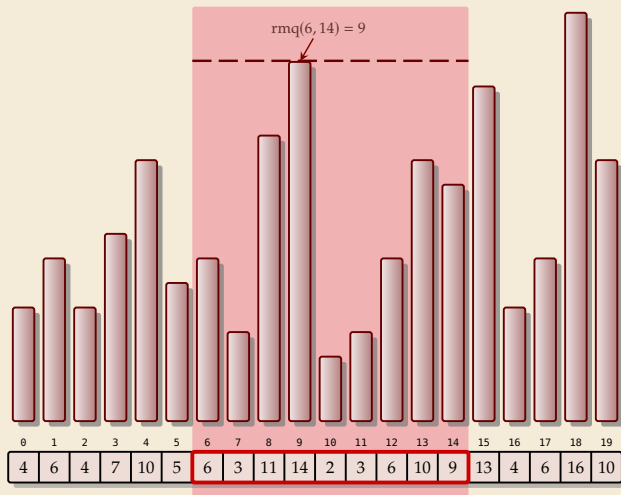
RMQ & LCA



- **Range-max queries** on array A :
$$\text{rmq}_A(i, j) = \arg \max_{i \leq k \leq j} A[k]$$

$$= \text{index of max}$$
- **Task:** Preprocess A ,
then answer RMQs fast

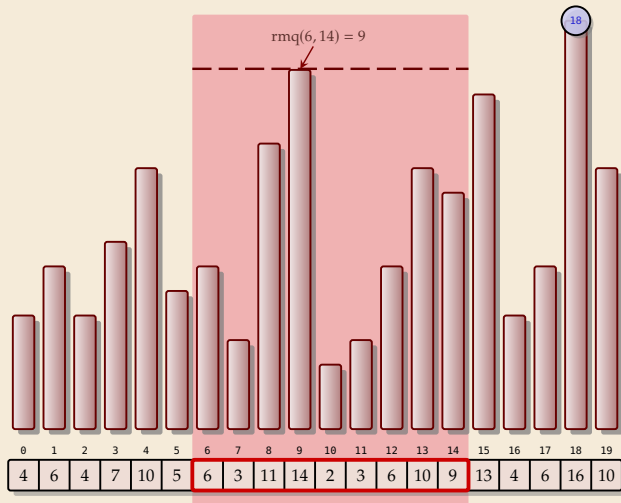
RMQ & LCA



- **Range-max queries** on array A :
$$\text{rmq}_A(i, j) = \arg \max_{i \leq k \leq j} A[k]$$

$$= \text{index of max}$$
- **Task:** Preprocess A ,
then answer RMQs fast
ideally constant time!

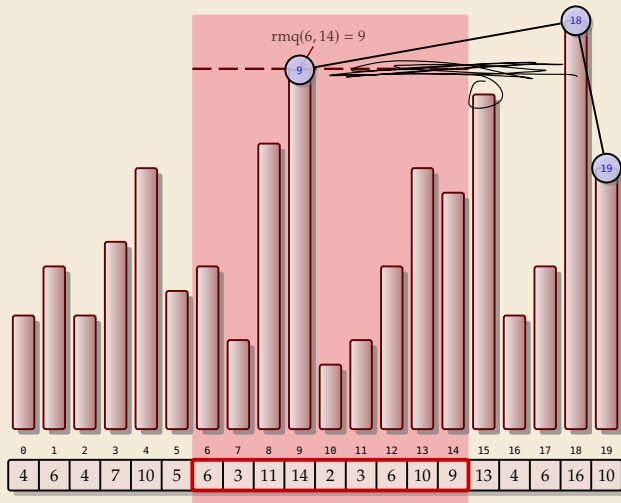
RMQ & LCA



- **Range-max queries** on array A :
$$\text{rmq}_A(i, j) = \arg \max_{i \leq k \leq j} A[k]$$

 $= \text{index of max}$
- **Task:** Preprocess A ,
then answer RMQs fast
ideally constant time!
- **Cartesian tree:** (cf. *treap*)
construct binary tree by
sweeping line down

RMQ & LCA



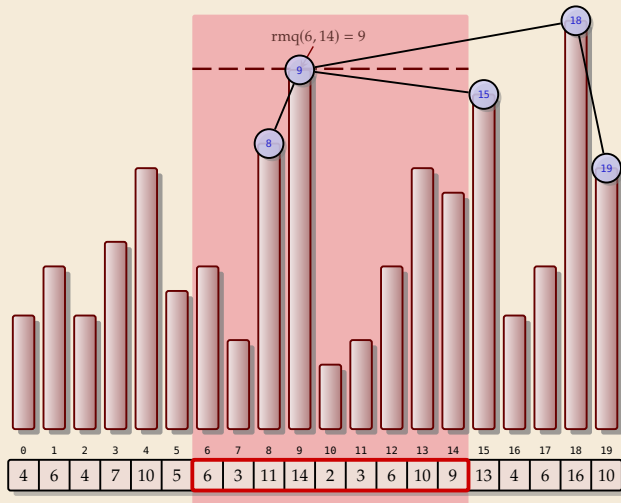
- **Range-max queries** on array A :

$$\text{rmq}_A(i, j) = \arg \max_{i \leq k \leq j} A[k]$$

$= \text{index of max}$

- **Task:** Preprocess A ,
then answer RMQs fast
ideally constant time!
- **Cartesian tree:** (cf. *treap*)
construct binary tree by
sweeping line down

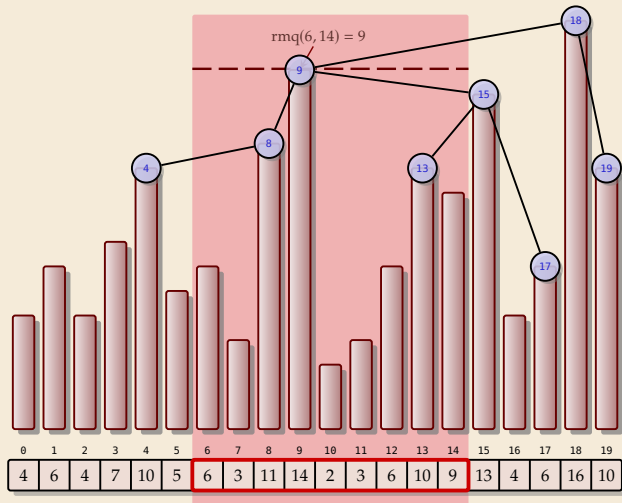
RMQ & LCA



- **Range-max queries** on array A :
$$\text{rmq}_A(i, j) = \arg \max_{i \leq k \leq j} A[k]$$

 $= \text{index of max}$
- **Task:** Preprocess A ,
then answer RMQs fast
ideally constant time!
- **Cartesian tree:** (cf. *treap*)
construct binary tree by
sweeping line down

RMQ & LCA

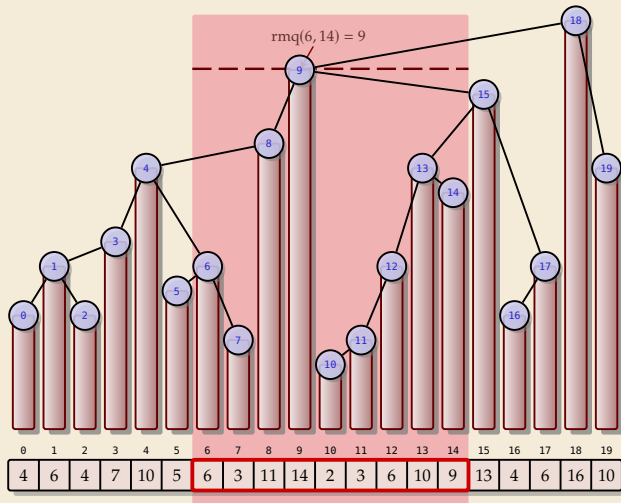


- **Range-max queries** on array A :

$$\text{rmq}_A(i, j) = \arg \max_{i \leq k \leq j} A[k] \\ = \text{index of max}$$

- **Task:** Preprocess A ,
then answer RMQs fast
ideally constant time!
- **Cartesian tree:** (cf. *treap*)
construct binary tree by
sweeping line down

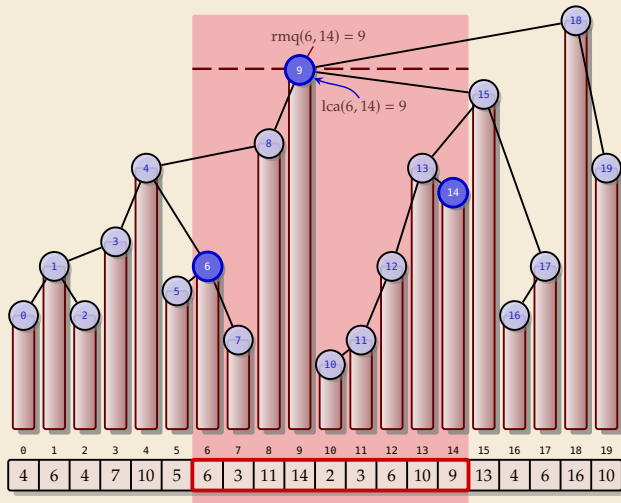
RMQ & LCA



- **Range-max queries** on array A :
$$\text{rmq}_A(i, j) = \arg \max_{i \leq k \leq j} A[k]$$

$$= \text{index of max}$$
- **Task:** Preprocess A ,
then answer RMQs fast
ideally constant time!
- **Cartesian tree:** (cf. *treap*)
construct binary tree by
sweeping line down

RMQ & LCA

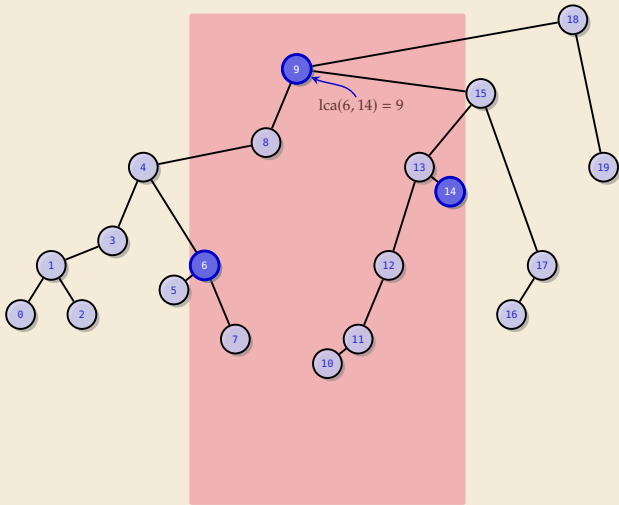


- **Range-max queries** on array A :

$$\text{rmq}_A(i, j) = \arg \max_{i \leq k \leq j} A[k]$$

$$= \text{index of max}$$
- **Task:** Preprocess A ,
then answer RMQs fast
ideally constant time!
- **Cartesian tree:** (cf. *treap*)
construct binary tree by
sweeping line down
- $\text{rmq}(i, j) =$
lowest common ancessor (LCA)

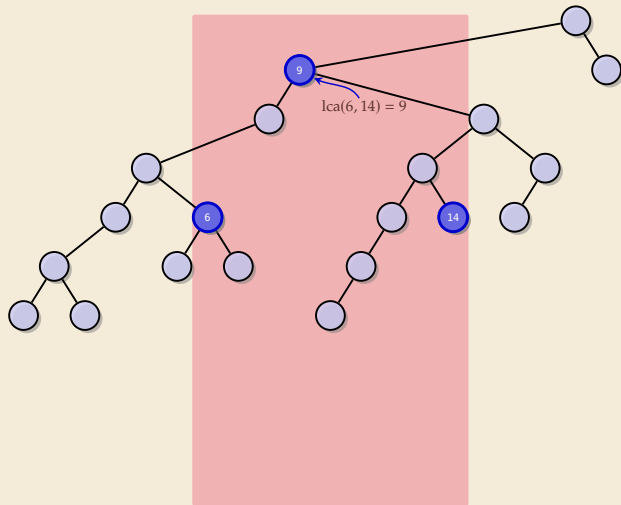
RMQ & LCA



- ▶ **Range-max queries** on array A :
$$\text{rmq}_A(i, j) = \arg \max_{i \leq k \leq j} A[k]$$

$$= \text{index of max}$$
- ▶ **Task:** Preprocess A ,
then answer RMQs fast
ideally constant time!
- ▶ **Cartesian tree:** (cf. *treap*)
construct binary tree by
sweeping line down
- ▶ $\text{rmq}(i, j) =$
lowest common ancestor (LCA)

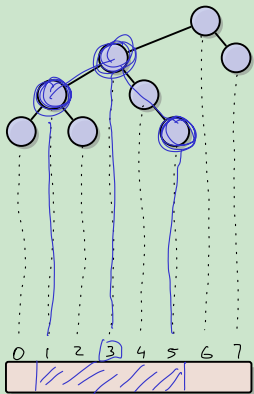
RMQ & LCA



- **Range-max queries** on array A :
$$\text{rmq}_A(i, j) = \arg \max_{i \leq k \leq j} A[k]$$

$$= \text{index of max}$$
- **Task:** Preprocess A ,
then answer RMQs fast
ideally constant time!
- **Cartesian tree:** (cf. *treap*)
construct binary tree by
sweeping line down
- $\text{rmq}(i, j) =$ inorder of
lowest common ancestor (LCA)
of i th and j th node in inorder

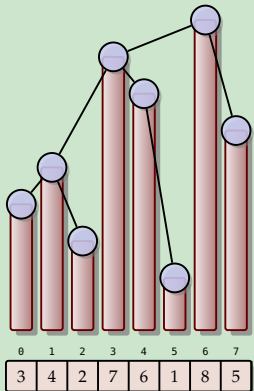
Clicker Question



Given the (max-oriented) Cartesian tree for A on the left, what is $\text{RMQ}_A(1, 5)$?

sli.do/comp526

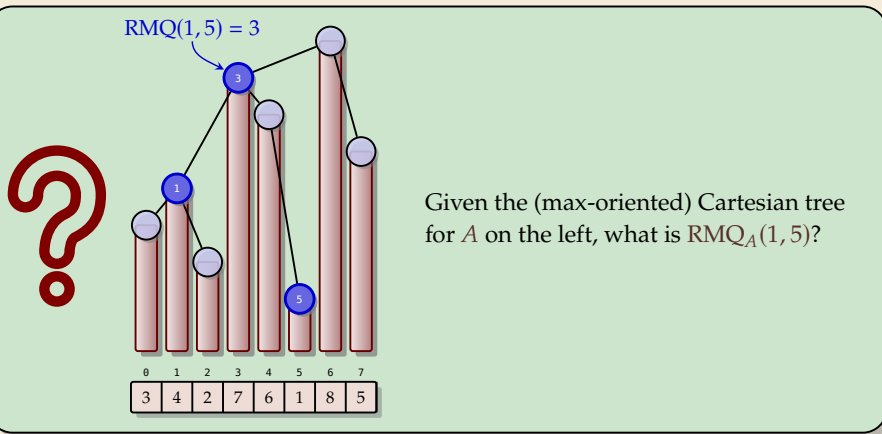
Clicker Question



Given the (max-oriented) Cartesian tree for A on the left, what is $\text{RMQ}_A(1, 5)$?

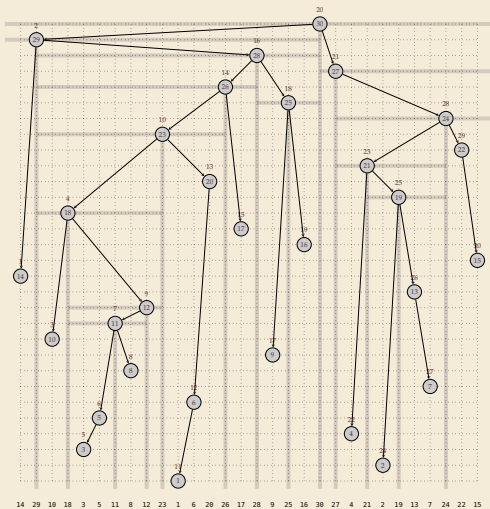
sli.do/comp526

Clicker Question

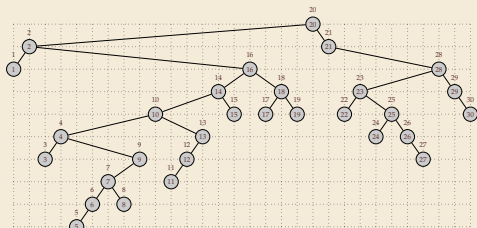


sli.do/comp526

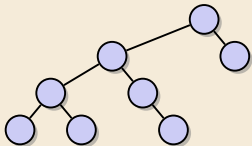
Cartesian Tree – Larger Example





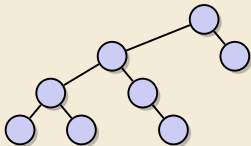


Counting binary trees



- ▶ Given the Cartesian tree,
all RMQ answers are determined
and vice versa!

Counting binary trees



- ▶ Given the Cartesian tree,
all RMQ answers are determined
and vice versa!

naive bound: n^{n^2}

- How many different Cartesian trees are there for arrays of length n ?

$$\lg(n^{n^2}) = n^2 \lg n$$

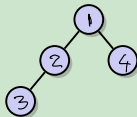
- known result: *Catalan numbers* $\frac{1}{n+1} \binom{2n}{n}$

- easy to see: $\leq 2^{2n}$

\rightsquigarrow many arrays will give rise to the same Cartesian tree
Can we exploit that?

visit all nodes in preorder
store for visited node:
(has left child, has right child)

Clicker Question



What binary string corresponds to the tree shown on the left?
(using the encoding just discussed)

1 2 3 4
1 1 1 0 0 0 0 0



visit all nodes in preorder
store for visited node:
(has left child, has right child)

sli.do/comp526