Sebastian Wild

## Learning Outcomes

1. Know the RMQ problem and its connection

## Unit 9: Range-Minimum Queries

 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.


## Outline

## 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
- 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 $\mathrm{RMQ}_{A}(1,6)$

| 0 | $\mathbf{1}$ | 2 | 3 | 4 | 5 | 6 | 7 | 8 | 9 | 10 | 11 | 12 | 13 | 14 | 15 | 16 | 17 | 18 | 19 |  |
| :--- | :--- | :--- | :--- | :--- | :--- | :--- | :--- | :--- | :--- | :--- | :--- | :--- | :--- | :--- | :--- | :--- | :--- | :--- | :--- | :--- |
| 1 | 4 | 6 | 4 | 7 | 10 | 5 | 6 | 3 | 11 | 2 | 2 | 3 | 6 | 10 | 9 | 13 | 4 | 6 | 16 | 10 |

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## Rules of the Game

- comparison-based $\rightsquigarrow$ values don't matter, only relative order
- Two main quantities of interest:
$\swarrow \rightsquigarrow$ space usage $\leq P(n)$

1. Preprocessing time: Running time $P(n)$ of the preprocessing step
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 " $<\mathrm{P}(\mathrm{n}), \mathrm{Q}(\mathrm{n})>$ ".

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### 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 $T$,
$\leftrightarrow$
ece
how far can we read the same text from there?

$$
\text { formally: } \operatorname{LCE}(i, j)=\max \{\ell: T[i . . i+\ell)=T[j . . j+\ell)\}
$$

$\rightsquigarrow$ use suffix tree of $T$ !

- In $\mathcal{T}: \operatorname{LCE}(i, j)=\operatorname{LCP}\left(T_{i}, T_{j}\right) \rightsquigarrow$ same thing, different name!

$$
=\text { string depth of }
$$

lowest common ancester (LCA) of leaves $i$ and $j$

- in short:

$$
\operatorname{LCE}(i, j)=\operatorname{LCP}\left(T_{i}, T_{j}\right)=\operatorname{stringDepth}(\operatorname{LCA}(i, j))
$$

## 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 $\rightsquigarrow \Theta\left(n^{2}\right)$ space and preprocessing q


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!

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

## Inverse suffix array: going left \& right

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

$\Longrightarrow$ there are $r$ suffixes that come before $T_{i}$ in sorted order $\Longleftrightarrow T_{i}$ has ( 0 -based) rank $r \rightsquigarrow$ call $R[0 . . n]$ the rank array


LCP array and internal nodes

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

## RMQ Implications for LCE

- Recall: Can compute (inverse) suffix array and LCP array in $O(n)$ time
$\rightsquigarrow \mathrm{A}\langle P(n), Q(n)\rangle$ time RMQ data structure implies a $\langle P(n), Q(n)\rangle$ time solution for longest-common extensions人 $+O(n)$


### 9.3 Trivial Solutions \& Sparse Tables

## Trivial Solutions



- Two easy solutions show extreme ends of scale:


## Trivial Solutions



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## 1. Scan on demand

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


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## 2. Precompute all

- Precompute all answers in a big 2D array $M[0 . . n)[0 . . n)$
- queries simple: $\operatorname{RMQ}(i, j)=M[i][j]$
$\rightsquigarrow\left\langle O\left(n^{3}\right), O(1)\right\rangle$ fill $O\left(n^{2}\right)$ cells, each tabres $O(n)$


## Trivial Solutions



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

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- queries simple: $\mathrm{RMQ}(i, j)=M[i][j]$
$\rightsquigarrow\left\langle O\left(n^{3}\right), O(1)\right\rangle$
- Preprocessing can reuse partial results $\rightsquigarrow\left\langle O\left(n^{2}\right), O(1)\right\rangle$

$$
\begin{aligned}
& \text { if } A[M[i][j-i]] \leqslant A[j] \\
& \text { thee } M\{i][j-1] \\
& \text { else } j
\end{aligned}
$$

## Sparse Table

- Idea: Like "precompute-all", but keep only some entries
- store $M[i][j]$ iff $\ell=j-i+1$ is $2^{k}$.
$\rightsquigarrow \leq n \cdot \lg n$ entries
$\rightsquigarrow$ Can be stored as $M^{\prime}[i][k]=M[i]\left[i+2^{k}-1\right]$


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- How to answer queries?


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. $\operatorname{RMQ}(i, j)=$ $\arg \min \left\{A\left[r m q_{1}\right], A\left[r m q_{2}\right]\right\}$
with $r m q_{1}=\operatorname{RMQ}\left(i, i+2^{k}-1\right)$

$$
r m q_{2}=\operatorname{RMQ}\left(j-2^{k}+1, j\right)
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$r m q_{2}=\operatorname{RMQ}\left(j-2^{k}+1, j\right)$
$\rightsquigarrow\langle O(n \log n), O(1)\rangle$ time solution!

### 9.4 Cartesian Trees

RMQ \& LCA


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- Rang -max queries on array $A$ : $\mathrm{rmq}_{A}(i, j)=\arg \max A[k]$ $i \leq k \leq j$
$=$ index of max

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## RMQ \& LCA



- Range-max queries on array $A$ : $\mathrm{rmq}_{A}(i, j)=\arg \max A[k]$ $i \leq k \leq j$ $=$ index of max
- Task: Preprocess $A$, then answer RMQs fast


## RMQ \& LCA



- Range-max queries on array $A$ : $\mathrm{rmq}_{A}(i, j)=\underset{i \leq k \leq j}{\arg \max } A[k]$
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## RMQ \& LCA



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| :--- | :--- | :--- | :--- | :--- | :--- | :--- | :--- | :--- | :--- | :--- | :--- | :--- | :--- | :--- | :--- | :--- | :--- | :--- | :--- |
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$$
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- Cartesian tree: (cf. treap) construct binary tree by sweeping line down
- $\operatorname{rmq}(i, j)=$ inorder of lowest common ancestor (LCA) of $i$ th and $j$ th node in inorder


## Clicker Question



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## Clicker Question



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## Cartesian Tree - Larger Example



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## Counting binary trees



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

Counting binary trees


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naive bound: $n^{n^{2}}$

- How many different Cartesian trees are there for arrays of length $n$ ? $\quad \lg _{g}\left(n^{n^{2}}\right)=n^{2} \lg n$
- known result: Catalan numbers $\frac{1}{n+1}\binom{2 n}{n}$
- easy to see: $\leq 2^{2 n}$
visit all nodes in proorder
$\rightsquigarrow$ many arrays will give rise to the same Cartesian tree Can we exploit that? store for visited node: (has left child, has night dos))

Clicker Question


### 9.5 Exhaustive Tabulation

## Four Russians?

The exhaustive-tabulation technique to follow is often called "Four Russians trick" . . .

- The algorithmic technique was published 1970 by V. L. Arlazarov, E. A. Dinitz, M. A. Kronrod, and I. A. Faradžev
- all worked in Moscow at that time . . . but not clear if all are Russians!
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(Arlazarov and Kronrod are Russian)
- American authors coined the slightly derogatory "Method of Four Russians" ... name now in wide use


## Bootstrapping

- We know a $\langle O(n \log n), O(1)\rangle$ time solution
- If we use that for $m=\Theta(n / \log n)$ elements, $O(m \log m)=O(n)$ !


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- Create array of block minima $B[0 . . m)$ for $m=\lceil n / b\rceil=O(n / \log n)$



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- Create array of block minima $B[0 . . m)$ for $m=\lceil n / b\rceil=O(n / \log n)$

$\rightsquigarrow$ Use sparse tables for $B$.
$\rightsquigarrow$ Can solve RMQs in $B[0 . . m)$ in $\langle O(n), O(1)\rangle$ time


## Query decomposition

- Query $\mathrm{RMQ}_{A}(i, j)$ covers
- suffix of block $\ell=\lfloor i / \mathrm{m}\rfloor$
- prefix of block $r=\lfloor j / m\rfloor$ query
- blocks $\ell+1, \ldots, r-1$ entirely

$B[0 . . m) 114 \mid 03^{3} 7511$


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## Intrablock queries [1]

$\rightsquigarrow$ It remains to solve the intrablock queries!

- Want $\langle O(n), O(1)\rangle$ time overall
must include preprocessing for all $m=\left\lceil\frac{n}{b}\right\rceil=\Theta\left(\frac{n}{\log n}\right)$ blocks!


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- many blocks, but just $b=\left\lceil\frac{1}{4} \lg n\right\rceil$ numbers long
$\rightsquigarrow$ Cartesian tree of $b$ elements can be encoded using $2 b=\frac{1}{2} \lg n$ bits
$\rightsquigarrow$ \# different Cartesian trees is $\leq 2^{2 b}=2^{\frac{1}{2} \lg n}=\left(2^{\lg n}\right)^{1 / 2}=\sqrt{n}$
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$\rightsquigarrow$ many equivalent blocks!
$\rightsquigarrow$ Exhaustive Tabulation Technique:

1. represent each subproblem by storing its type (here: encoding of Cartesian tree)
2. enumerate all possible subproblem types and their solutions
3. use type as index in a large lookup table

## Intrablock queries [2]

1. For each block, compute $2 b$ bit representation of Cartesian tree

- can be done in linear time


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2. Compute large lookup table

| $1023$ | Block type | $i$ | $j$ | $\mathrm{RMQ}(i, j)$ |
| :---: | :---: | :---: | :---: | :---: |
| $\vdots \vdots \vdots$ | $\vdots$ |  |  |  |
|  | 11100000 | 0 | 3 | 2 |
|  | 11100000 | $\bigcirc$ | 1 | 1 |
| 11100000 | 11100000 | $\bigcirc$ | 2 | 2 |
|  | 1110000 | 1 | 2 | 2 |
|  | 11100000 | 1 | 3 | 2 |
|  | 11100000 | 2 | 3 | 2 |

## Intrablock queries [2]

1. For each block, compute $2 b$ bit representation of Cartesian tree

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2. Compute large lookup table

| Block type | $i$ | $j$ | $\operatorname{RMQ}(i, j)$ |
| :---: | :--- | :--- | :--- |

- $\leq \sqrt{n}$ block types
- $\leq b^{2}$ combinations for $i$ and $j$
$\rightsquigarrow \Theta\left(\sqrt{n} \cdot \log ^{2} n\right)$ rows
- each row can be computed in $O(\log n)$ time
$\rightsquigarrow$ overall preprocessing: $O(n)$ time!


## Discussion

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$\rightsquigarrow\langle O(n), O(1)\rangle$ time solution for LCE in strings!


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q a bit complicated

## Discussion

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$\rightsquigarrow\langle O(n), O(1)\rangle$ time solution for LCE in strings!

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## Research questions:

- Reduce the space usage
- Avoid access to $A$ at query time

