

# INF280: Competitive programming

Advanced datastructure algorithms

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Louis Jachiet

# Sliding windows

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# Sliding window techniques to improve efficiency

Typical examples using a list  $i_1, \dots, i_N$  and an integer  $K$

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## Naive algorithm

Two (or three!) nested loops, recomputing from scratch for each position  $j$ .

# Sliding window techniques to improve efficiency

## Sliding window idea

Optimize away nested loops!

**Example: fixed width (e.g. maintaining sum of  $K$  elements)**

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17	37	42	5	23	89	45	71	43	2	45	74	28	44	98
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## General idea

Maintain a double ended queue where:

- you add on the right to grow
- remove on the left to shrink
- maintain some computation over the window content

Works with **monotone** criteria for windows!

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# Advanced technique for sliding window

## The deque trick to maintain min and max

Maintain the (ordered) list of elements that might become min/max.

**Example: maintaining min of 5 elements)**

17	37	42	5	23	89	45	71	43	2	35	74	28	44	98
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## Updates

- Add on the right: remove everything bigger
- Remove on the left: remove when min

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Candidate mins: 5, 23

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Also works with a set... with a  $O(\log(n))$  penalty.

## Prefix sums

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# Structure to compute sums in $O(1)$

## Input

A list of elements  $v_1 \dots v_n$  over a group

## Query

Compute  $q(i, j) = \sum_{i \leq \ell < j} v_\ell$

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## Solution

Precompute  $T[i] = \sum_{\ell < i} v_\ell$ ,  $q(i, j) = T[j] - T[i]$

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Works in  $d$  dimensions!

# Segment trees

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## Segment trees works with keys and values

- Keys needs to be ordered and are typically integers,
- values can be from any semigroup (e.g.  $+$  or  $\min$  over floats).



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- Keys needs to be ordered and are typically integers,
- values can be from any semigroup (e.g.  $+$  or  $\min$  over floats).

## A powerful structure that supports the following queries:

- Add a key  $k$  with a value  $v$
- Add  $v$  to the value of all keys in the range  $[l; r]$
- Replace with  $v$  to the value of all keys in the range  $[l; r]$
- Get the sum of all values for keys in the range  $[l; r]$

# Segment trees, an example

## Snow problem

We have a 1D representation of the snow height and the following queries:

- maximal snow height for a span  $[l; r]$
- add  $k$  centimeters of snow on the span  $[l; r]$
- replace the height of snow with  $k$  for the span  $[l; r]$  (snow grooming)

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We have a 1D representation of the snow height and the following queries:

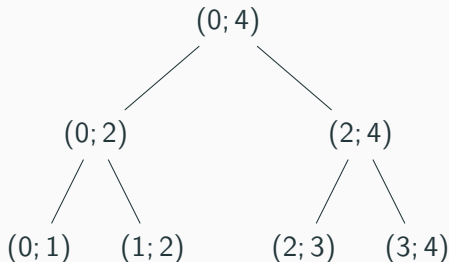
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## A weird semigroup:

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# Segment trees, the idea

Maintain a binary search tree on the keys

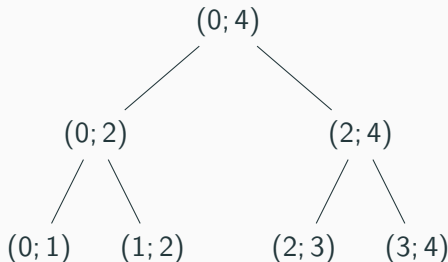


Maintain lots of information on all nodes

- the span the current node is concerned with
- the sum/max of all values from values below in the tree
- whether the values have been replaced (*lazy*)
- whether we need to add something to the children values (*lazy*)

# Segment trees, the idea

Maintain a binary search tree on the keys



**To update or query :**

- start from the root to the leaves
- propagate any lazy value
- restore sum/max going back up

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