# CS173 Longest Increasing Substrings

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#### Today's material

- The Longest Increasing Subsequence problem
- ► DP algorithm for finding a longest increasing substring

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## Dynamic Programming

Dynamic programming is an algorithmic design technique that can make it easy to solve problems efficiently.

Dynamic programming is similar to recursion – but it is bottom-up, instead of top-down.

Interesting applications of dynamic programming include:

- Computing the longest increasing subsequence in a sequence
- Finding the longest common subsequence of two sequences

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- Finding all-pairs shortest paths in an edge-weighted graph
- Solving two-player games

### Finding a Longest Increasing Subsequence

Input: sequence  $X = x_1, x_2, ..., x_n$  of integers Output: longest subsequence of X that is strictly increasing

Example: X = 7, 1, 4, 3, 5, 2, 4, -1, 6, 1, 2, 5, 6, 7

Some increasing subsequences:

- ▶ 3,5
- ► -1,2,5
- 1,3,5,6,7
- ► -1,1,2,5,6,7

Maybe the last one is the longest?

Finding the longest increasing subsequence in a sequence can be done in polynomial time using dynamic programming.

We will solve the *simpler* problem of finding the longest increasing substring.

## Finding a Longest Increasing Substring

Input: sequence (or array)  $X = x_1 x_2 \dots x_n$  of integers Output: increasing substring of X that is as long as possible.

What is a substring?

A substring is a string that begins at some x<sub>i</sub> and ends at some x<sub>j</sub> (with j ≥ i) and includes all the intermediate elements.

For example,  $x_2, x_3, x_4$  is a substring but  $x_2, x_4$  is not.

Suppose X = 1, 3, 1, 8, 2, 4, 9, 2, 10, 3.

- What are some increasing substrings?
- What are some increasing subsequences?

## Finding a Longest Increasing Substring

Input: sequence (or array)  $X = x_1 x_2 \dots x_n$  of integers Output: increasing substring of X that is as long as possible.

Example: X = 1, 3, 1, 8, 2, 4, 9, 2, 10, 3 (so  $x_1 = 1, x_2 = 3$ , etc.)

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Which of the following are increasing substrings?

- 1. x<sub>1</sub>
- 2. *x*<sub>5</sub>
- 3.  $x_1, x_3$
- 4.  $x_1, x_2$
- 5.  $x_2, x_3$
- 6.  $x_3, x_4$

## Finding a Longest Increasing Substring

Example: X = 1, 3, 1, 8, 2, 4, 9, 2, 10, 3 (so  $x_1 = 1, x_2 = 3$ , etc.)

By inspection we see that the longest increasing substring is 2, 4, 9, formed by using  $x_5, x_6, x_7$ .

How can we design an algorithm to solve this problem?

Finding a Longest Increasing Substring Example: X = 1, 3, 1, 8, 2, 4, 9, 2, 10, 3 (so  $x_1 = 1, x_2 = 3$ , etc.)

How can we design an algorithm to solve this problem?

Let M[i] denote the length of the longest increasing substring that ends at  $x_i$ .

So:

- M[1] = 1
- ► *M*[2] = 2

*M*[4] = 2 (why isn't it 3?)

Class exercise:

- 1. calculate M[i] for i = 5, 6, 7, 8, 9, 10.
- 2. What is the longest increasing substring for X?
- 3. What index does it end at?
- 4. What do you see for M[i] for that index i?

Let M[i] denote the length of the longest increasing substring that ends at  $x_i$ .

Suppose X is your arbitrary input.

How can we answer these two questions:

If we knew M[1], M[2],..., M[n] (where n is the length of the array), what would be the length of the longest incrasing substring for X? Would it be M[n] or something else?

2. Can we use  $M[1], M[2], \ldots, M[j-1]$  to compute M[j]?

# Computing *M*[*i*]

Let M[i] denote the length of the longest increase substring that ends at  $x_i$ .

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Then how we set M[i] depends on the value of i:

- 1. If i = 1 then M[i] = 1
- 2. If  $i \ge 2$  then:

• 
$$M[i] = 1$$
 if  $x_{i-1} \ge x_i$   
•  $M[i] = 1 + M[i-1]$  if  $x_{i-1} < x_i$ 

Why is this correct?

# Computing *M*[*i*]

Let M[i] denote the length of the longest increase substring that ends at  $x_i$ .

Then:

- 1. M[1] = 1.
  - Because  $x_1$  is the longest increasing substring that ends at  $x_1$
- 2. M[i] = 1 if  $x_{i-1} \ge x_i$  and  $i \ge 2$ 
  - ▶ Because x<sub>i</sub> is the longest increasing substring ending at x<sub>i</sub> when x<sub>i-1</sub> ≥ x<sub>i</sub>
- 3. M[i] = 1 + M[i-1] if  $x_{i-1} < x_i$  and  $i \ge 2$ 
  - Because the longest increasing substring ending at x<sub>i</sub> in this case is formed by appending x<sub>i</sub> to the longest increasing substring ending at x<sub>i-1</sub>

#### Putting this together

Given  $X = x_1, x_2, ..., x_n$ , to find the *length* of the longest increasing substring:

- For i = 1 up to n do:
  - Compute M[i] using rules from previous slide
- Return max{M[1], M[2], M[3], ..., M[n]}

Questions:

- 1. Why is this correct?
- 2. What is the running time?
- 3. This only gives you the length of the longest increasing substring.
- 4. How do you get the longest increasing substring itself?

## Writing DP algorithms

Please observe the following guidelines for writing a dynamic programming algorithm:

- Explain your variables using English, showing what they are supposed to mean
- Show how to compute the values for the boundary conditions

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- Specify the order in which you compute the values
- Show how to compute each value based on the earlier computations
- Show where the final answer is stored

## Summary

- Dynamic programming and recursive algorithms are two ways of dealing with algorithm design.
- One is top down (recursion) and the other is bottom-up (dynamic programming).
- You can prove your algorithm is correct using induction, when the algorithm uses recursion or dynamic programming.

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In both cases, you identify subproblems and show how solving subproblems lets you solve big problems.