# Dynamic programming

#### Class 6

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### **Dynamic Programming**

### **Preliminaries**

#### Algo. techniques, so far

• recursion: elegantly consuming the instance

• on-line choice: probabilistic solution

• greedy: local optimization (sometimes)

## Recursion may become ineffective

• we are required to find an optimal solution

• the specific measure is convex:

an optimal solution for I should contain an optimal sol. for I' < I.

• however, a recursive solution would require to solve sub-instances repeteadly

#### Chain matrix mult.

Assume textbook matrix multiplication

 $A^1_{p_1\times p_2}\circ A^2_{p_2\times p_3}$  requires exactly  $p_1\cdot p_2\cdot p_3$  scalar mult.

$$A^1_{p_1 \times p_2} \circ A^2_{p_2 \times p_3} \circ A^3_{p_3 \times p_4}$$

might require  $p_1 \cdot p_2 \cdot p_3 + p_1 \cdot p_3 \cdot p_4$  mult.

or

 $p_1 \cdot p_2 \cdot p_4 + p_2 \cdot p_3 \cdot p_4$  mult.

$$(A^1 \circ A^2) \circ A^3 = A^1 \circ (A^2 \circ A^3)$$

#### Optimal execution of CMM

Instance:

1. a sequence of matrices  $A^1, A^2, \dots A^n$ 

s.t. each matrix product is defined:

$$A^1_{p_1 \times p_2}, A^2_{p_2 \times p_3}, \dots A^n_{p_n \times p_{n+1}},$$

2. solution: a multiplication plan, e.g.,

$$((A_1 \cdot A_2) \cdot (A_3 \cdot A_4)) \cdot A_5$$

. . . or

$$((A_1 \cdot ((A_2 \cdot A_3) \cdot (A_4 \cdot A_5)))$$

3. Measure: the overall no of scalar multiplications.

#### What is known?

A recursive a. would have to try all solutions:

$$MIN\{A^1 \circ (A^2..A^n), (A^1 \circ A^2) \circ (A^3..A^n), \dots\}$$

. . . with several repeated branches.

E.g., 
$$(A^2 \circ A^3)$$
 is a subcase of  $(A^1..A^3)$ ,  $(A^2..A^4)$ ,  $(A^1..A^4)$ ,  $(A^2..A^5)$ , ...

## What is known? II

The number of recursive calls is proportional to the Catalan numbers series:

$$C_n = \frac{1}{n+1} \binom{2n}{n} = \frac{(2n)!}{(n+1)!n!} = \prod_{k=2}^n \frac{n+k}{k}$$
 for  $n \ge 0$ .

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n	 5	 10	11	12
$C_2$	 42	 16,796	208,012	742,900

## Dynamic programming

- allocate extra memory (size  $\propto n$ ) to keep record of intermediate results
- work **bottom-up** to fill a table of intermediate results: each time we compute a new result by simply comparing existing results for **shortest subinstances**
- a Dynamic Programming algorithm fills up a solution table until the given instance is solved.
- no recursion, cost is normally  $\propto n^2$ . However, a table of  $\propto n^2$  needs to be stored

## Dynamic programming for CMM

Keep two tables:

1. Cost

i, j

= min. cost for the chain  $A^i..A^j$ 

2. Sol

i, j

 $= i \le k < j$  tells where the outer paren. should fall:

 $(A^i..A^k) \circ (A^{k+1}..A^j)$