

Dynamic Programming part 10

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- #8 → Counting } problems involved DP
#9 → Enumeration } on implicit/explicit trees
#10 → Optimization
- Chaining Matrix Multiplication
 - Burst Balloons

$$\underbrace{M_1 \times M_2 \times \dots \times M_n}$$

$M_1 \times M_2 \neq M_2 \times M_1$
Not commutative

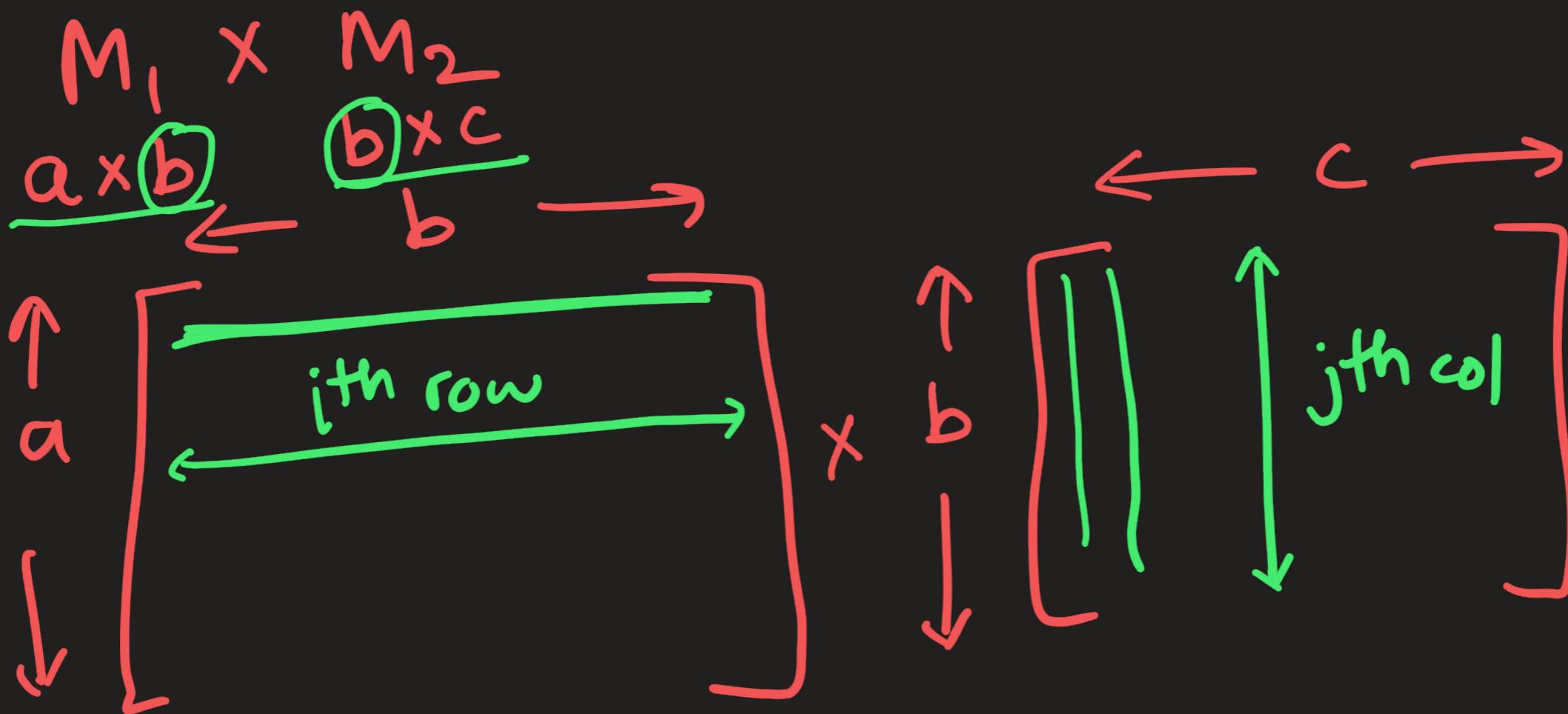
$$(M_1 \times M_2) \times M_3 = M_1 \times (M_2 \times M_3) = M_1 \underline{\times} M_2 \underline{\times} M_3$$

Associative

$$(n_1 \times n_2) \times n_3 = n_1 \times (n_2 \times n_3)$$

} in arithmetic

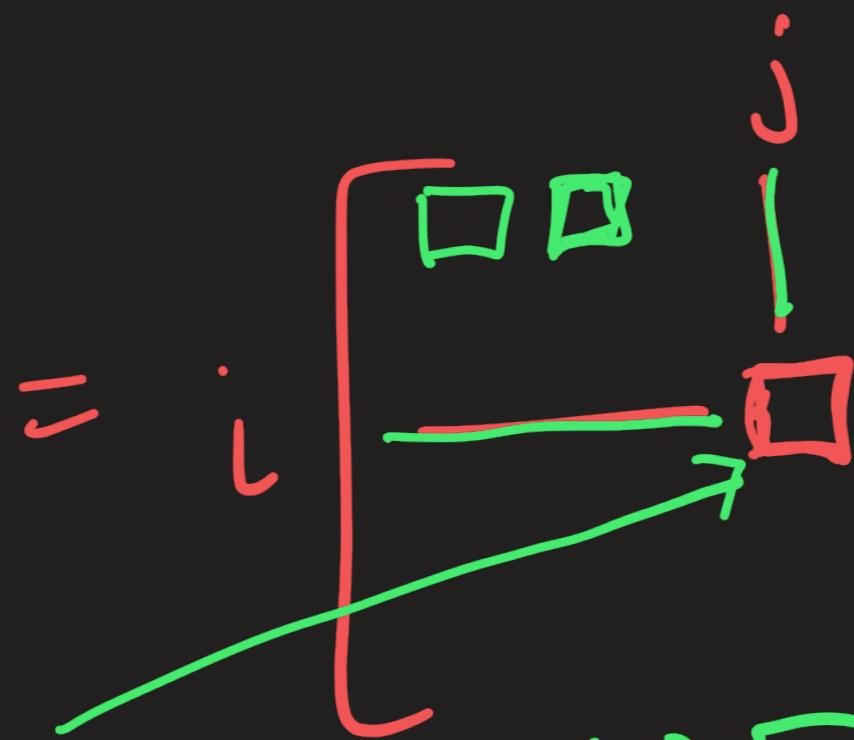
$$n_1 \times n_2 = n_2 \times n_1$$



$$M_1 \times M_2$$

Time
 $= \underline{\underline{O(abc)}}$

$$\langle a_1, a_2, \dots, a_k \rangle$$



$$\langle b_1, \dots, b_k \rangle$$

$$= \underline{\underline{a_1 \cdot b_1 + a_2 \cdot b_2 + \dots + a_k \cdot b_k}} = O(k)$$

$$a \times c$$

$$C_0 = 1 \quad C_1 = 1 \quad C_2 = 2 \quad C_3 = 5 \quad \underbrace{\binom{2^n}{n}}_{n+1} = C_n$$

Find the most "efficient" parse tree.

- Problem Description

Matrix Chain Multiplication

Given a sequence of matrices, find the most efficient way to multiply these matrices together. The problem is not actually to perform the multiplications, but merely to decide in which order to perform the multiplications.

We have many options to multiply a chain of matrices because matrix multiplication is associative. In other words, no matter how we parenthesize the product, the result will be the same. For example, if we had four matrices A, B, C, and D, we would have:

$$(ABC)D = (AB)(CD) = A(BCD) = \dots$$

However, the order in which we parenthesize the product affects the number of simple arithmetic operations needed to compute the product, or the efficiency. For example, suppose A is a 10×30 matrix, B is a 30×5 matrix, and C is a 5×60 matrix. Then,

$$(AB)C = (10 \times 30 \times 5) + (10 \times 5 \times 60) = 1500 + 3000 = 4500 \text{ operations}$$

$$A(BC) = (30 \times 5 \times 60) + (10 \times 30 \times 60) = 9000 + 18000 = 27000 \text{ operations.}$$

Clearly, the first parenthesization requires less number of operations.

Given an array `mtxSizes[]`, which represents the chain of matrices such that the i-th matrix A_i is of dimension $mtxSizes[i-1] \times mtxSizes[i]$, we need to write a function that should return the minimum number of multiplications needed to multiply the chain. Length of the chain of matrices is n and thus the size of `mtxSizes` is $(n+1)$.

Example

Input: [10, 30, 5, 60]

Output: 4500

Notes

Input Format: You will be given an integer array `mtxSizes`.

Output: Return an integer `minOps`, denoting the minimum number of operations needed.

Constraints:

$$3 \leq \text{len}(mtxSizes) \leq 100$$

- $0 \leq mtxSizes[i] \leq 100$

- For any matrix, either both the dimensions will be zero, or both the dimensions will be non zero.

$$\begin{aligned} ((A \times B) \times C) &\rightarrow 10 \times 30 \times 5 + 10 \times 5 \times 60 \\ &\quad = 1500 + 3000 = 4500 \end{aligned}$$

$$\begin{aligned} (A \times (B \times C)) &\rightarrow 30 \times 5 \times 60 + 10 \times 30 \times 60 \\ &\quad = 9000 + 18000 \\ &\quad = 27000 \text{ multiplications} \end{aligned}$$

10, 30, 5, 60

$$M_1 \otimes M_2 \otimes \dots \otimes M_{n+1}$$

\nwarrow_n multiplication operators

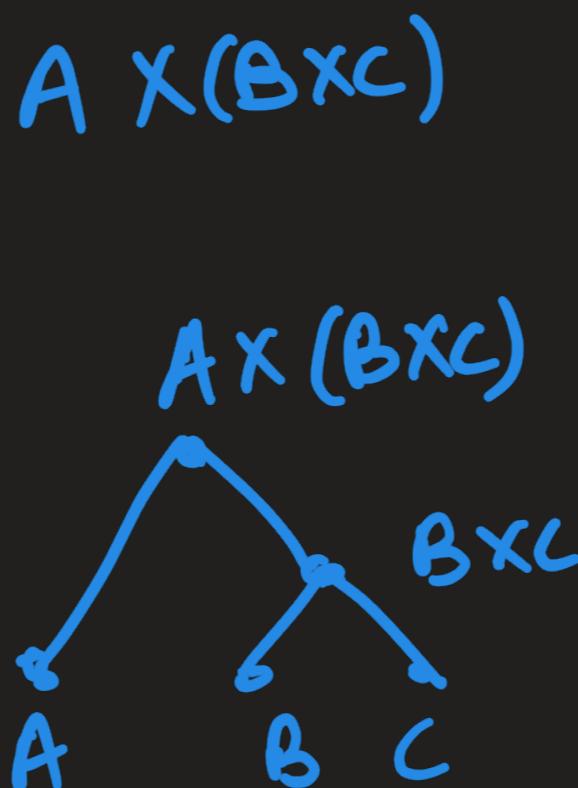
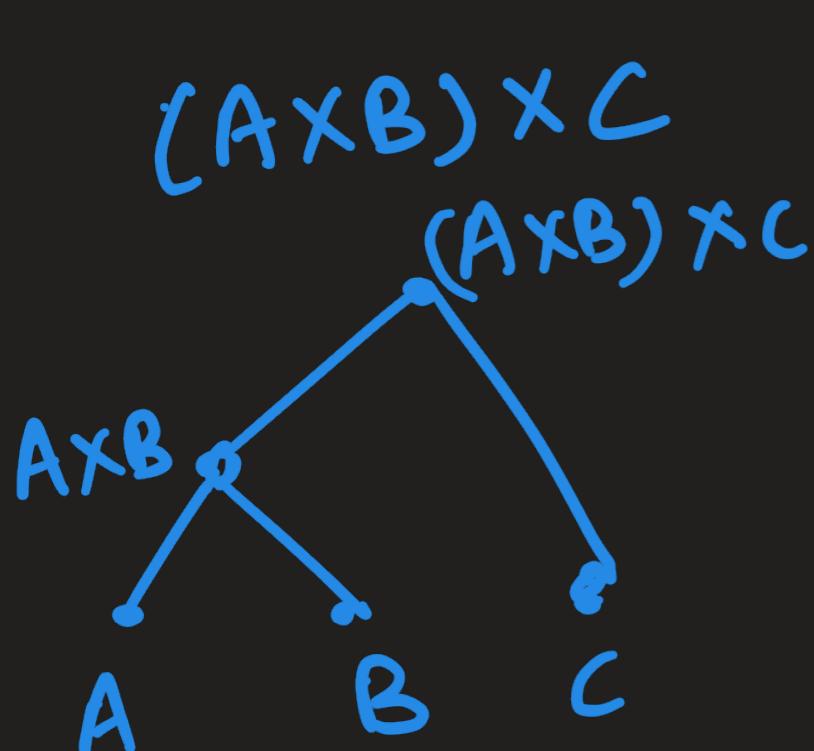
$$M_1 \rightarrow C_0 = 1$$

$$M_1 \times M_2 \rightarrow C_1 = 1$$

$$M_1 \times M_2 \times M_3 \rightarrow C_2 = 2$$

ways to parenthesize the above = C_n

(nth
Catalan
number)



2 Parse Trees

Associativity avoids ambiguity even with multiple parse trees.

exponential
in n.

① Brute force: Exhaustively enumerate & evaluate

all parse trees \rightarrow exponential time.
(& their costs)
& pick the min cost parse tree

② Greedy strategy : Perform the cheapest multiplication cost first.

$$A = \underline{\underline{50 \times 20}}$$

$$B = \underline{\underline{20 \times 1}}$$

$$C = 1 \times 10$$

$$D = \underline{\underline{10 \times 100}}$$

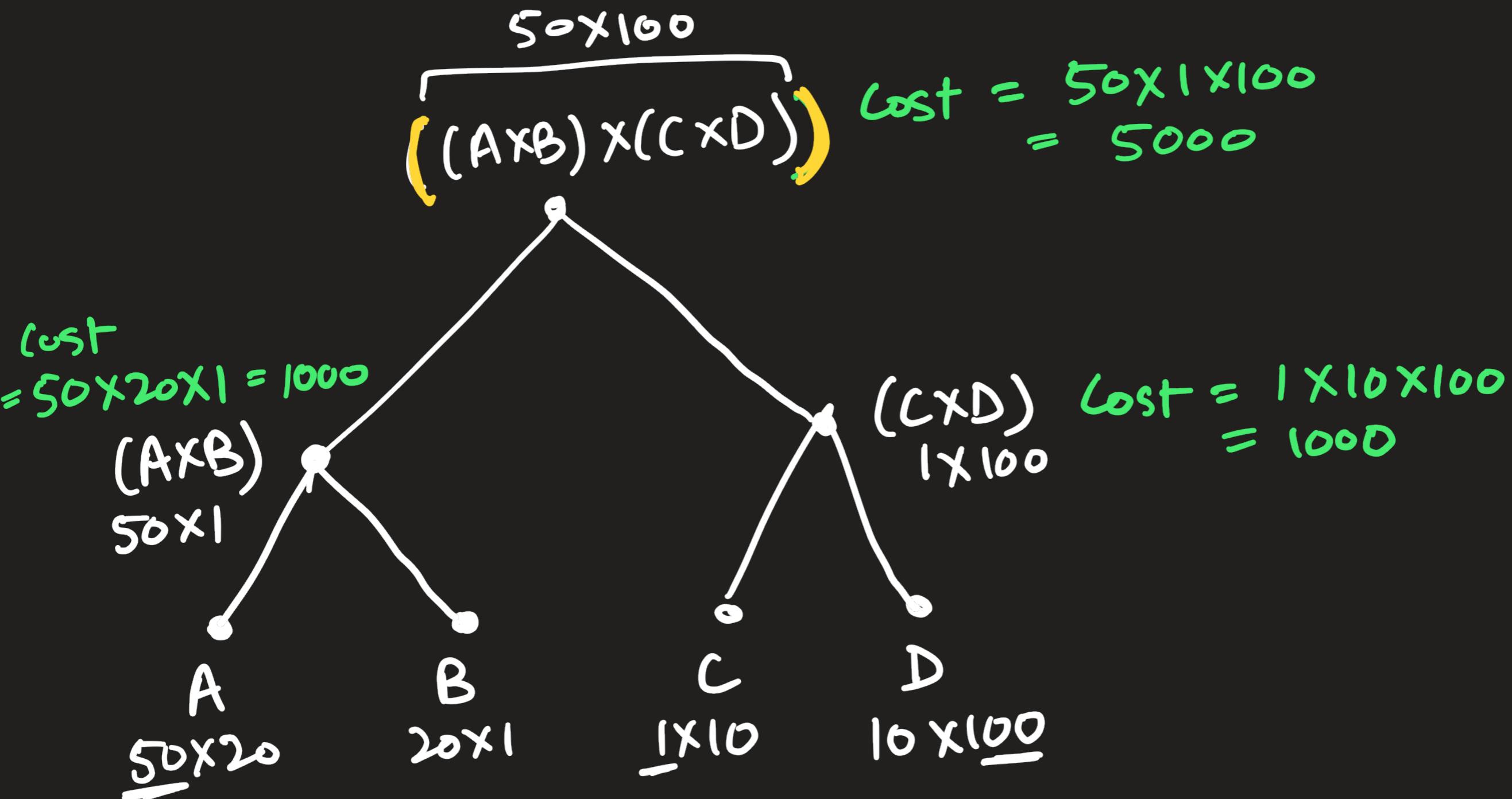
$$A \times B \times C \times D$$

$$\underbrace{(B \times C)}_{20 \times 10} \rightarrow 20 \times 1 \times 10 \\ = 200$$

$$\underbrace{(A \times (B \times C))}_{50 \times 10} \rightarrow 50 \times 20 \times 10 \\ = 10000$$

$$\underbrace{(A \times (B \times C)) \times D}_{50 \times 100} \rightarrow 50 \times 10 \times 100 \\ = 50000$$

60,200 ops

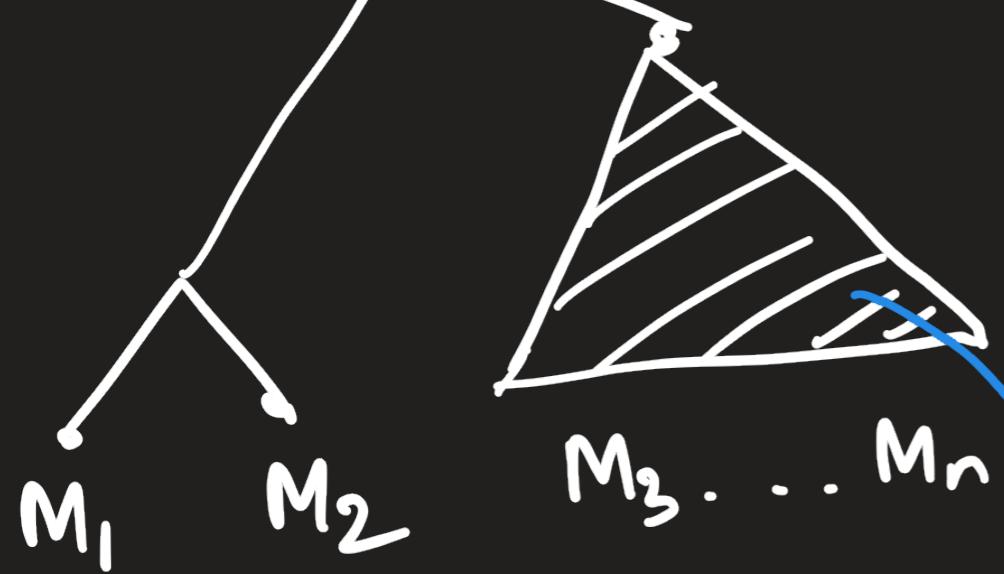


$\text{Total cost} = 5000 + 1000 + 1000 = 7000$
 operations

Greedy strategy does not work!

③

$$M_1 \otimes M_2 \otimes \dots \otimes M_n$$

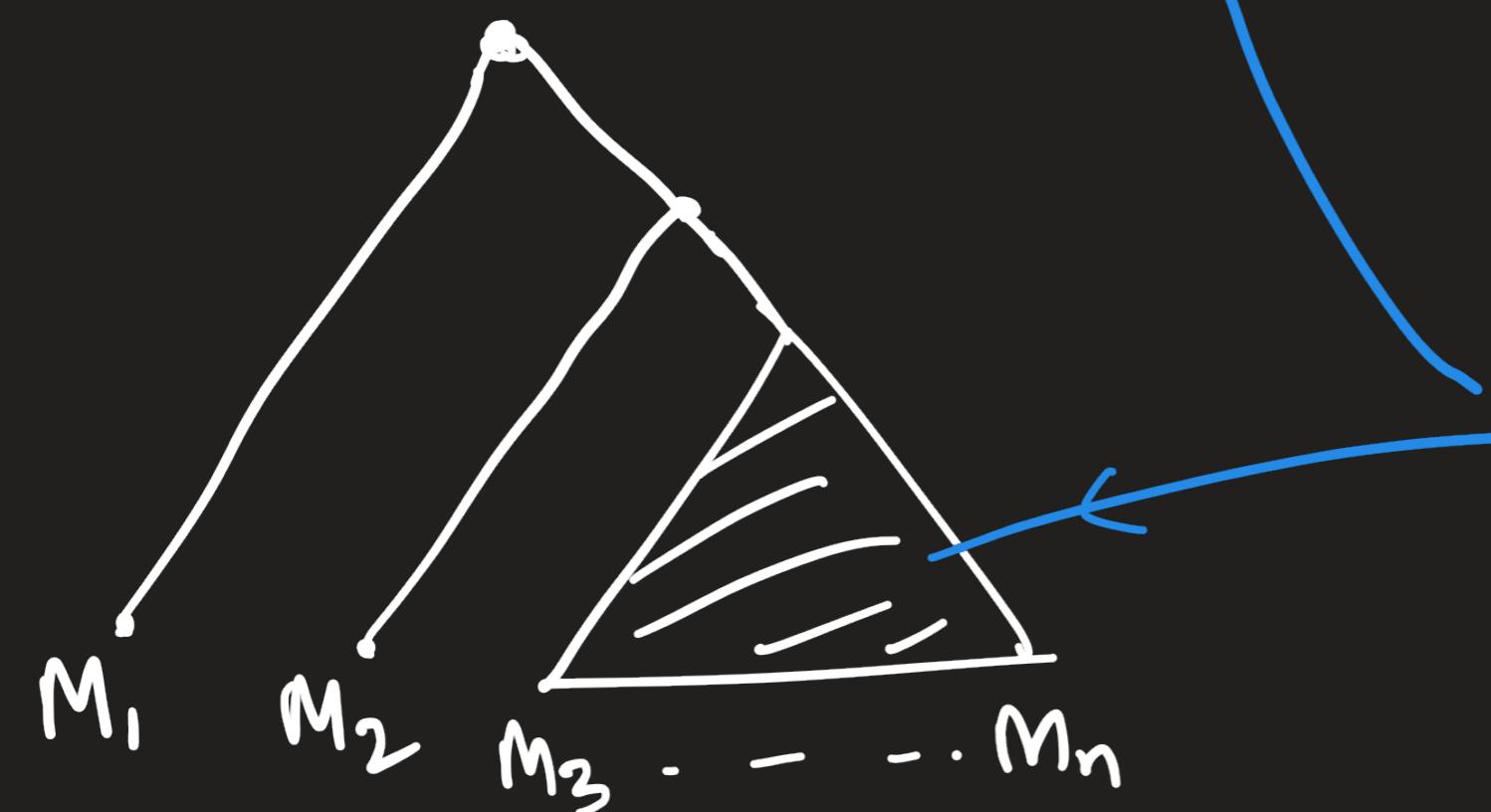


$$(M_1 \times M_2) \times (M_3 \times \dots \times M_n)$$

$$M_1 \times (M_2 \times M_3 \times \dots \times M_n)$$

$$M_1 \times M_2 \times (M_3 \times \dots \times M_n)$$

Overlapping
Subproblems



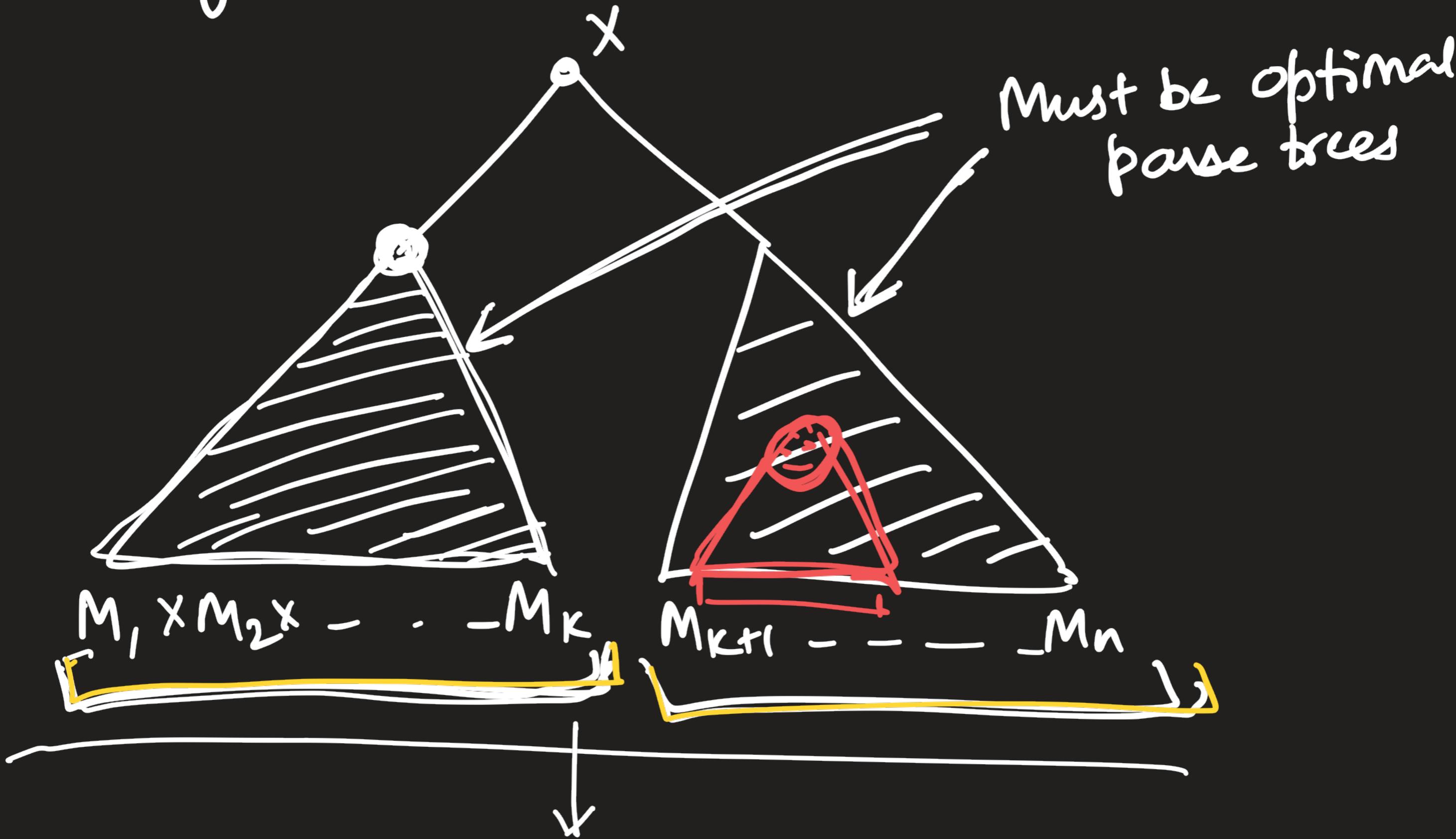
Subproblems are
subtrees of the original
problem

(NOT prefixes)

Permutation Combination Seq alignment
(2 strings)

Optimal substraction ? Yes

Imagine the optimal pause tree



Decrease - and - conquer : What is the last \times operation ?

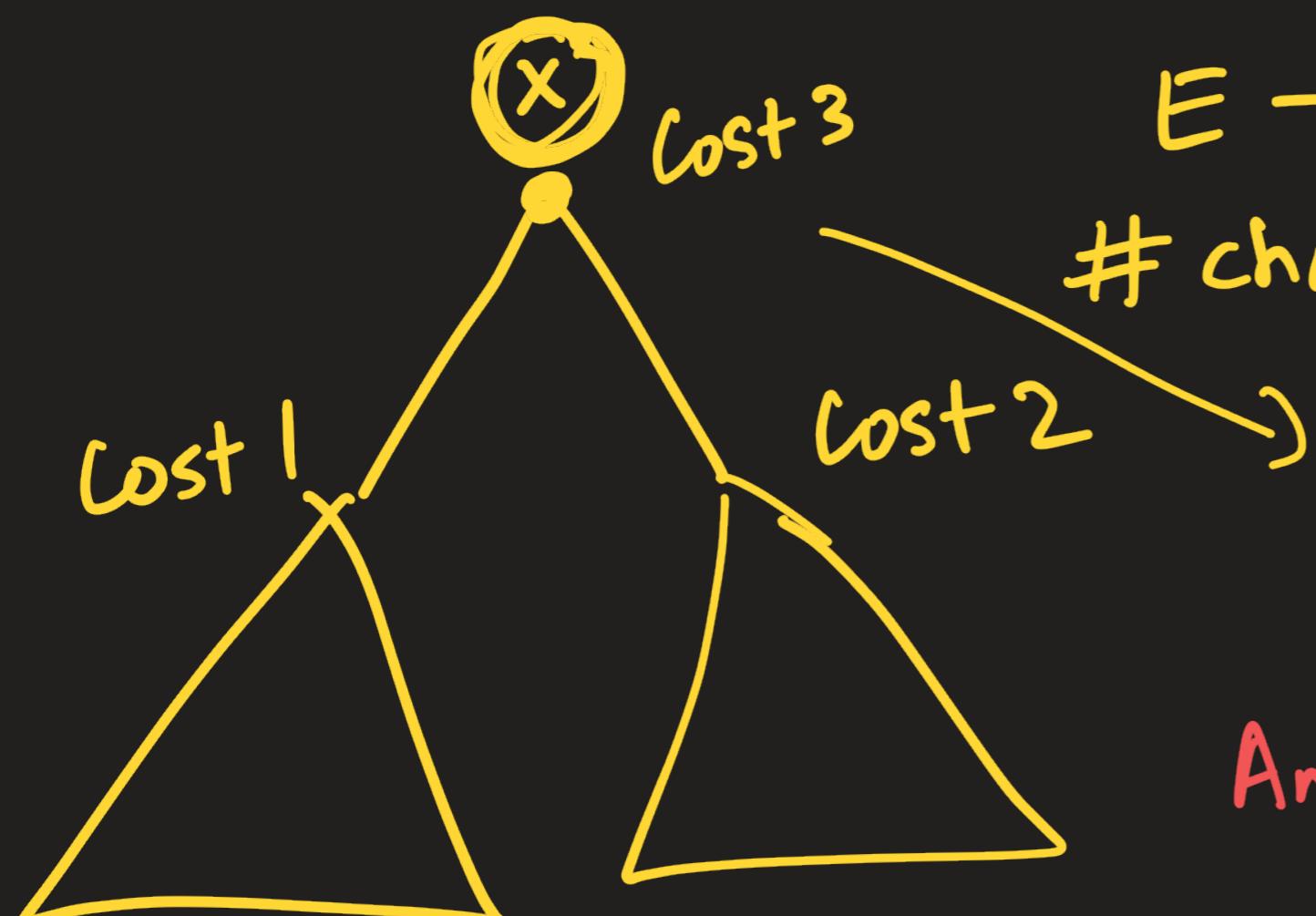
(Look at the rightmost parenthesis)

paired with the leftmost parentheses.

$E \rightarrow$ matrix or $(E \times E)$

choices = # matrices - 1

Cost 1 + Cost 2 + Cost 3,



An arbitrary worker will get

$M_i \times M_{i+1} \times \dots \times M_j$ as the subproblem definition.



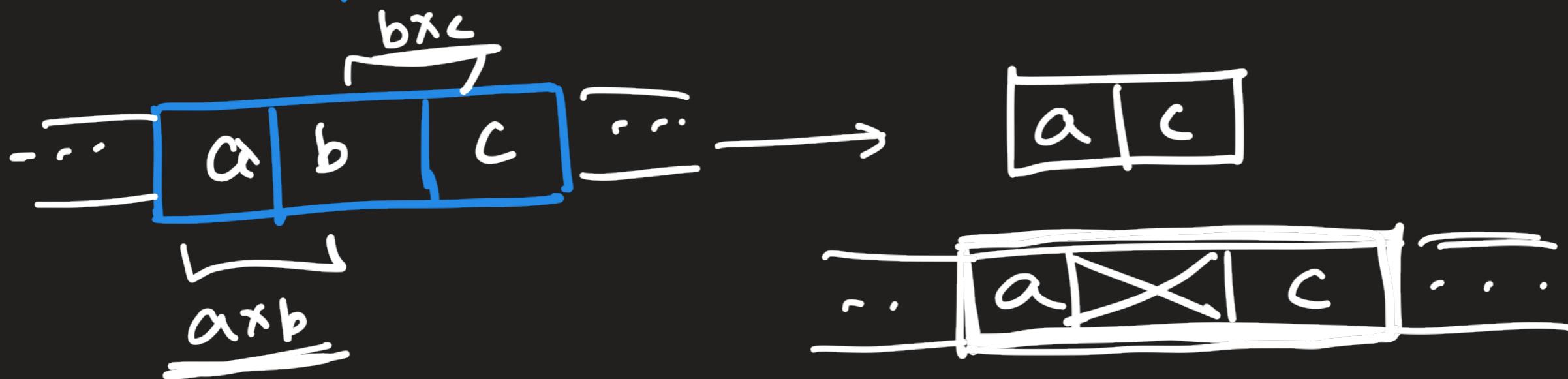
Array size $\rightarrow n$ numbers

$n-1$ matrices

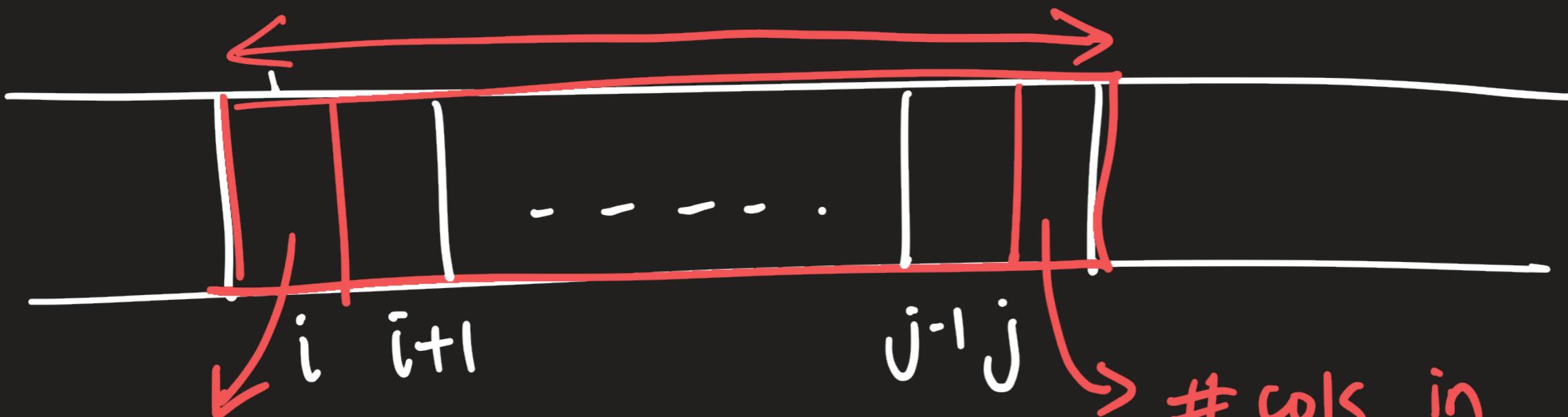
For there to be at least one \times operation

$$n-1 \geq 2$$

$$n \geq 3$$



$$\underline{M'} \times M'' \times \dots \times \underline{M'''}$$

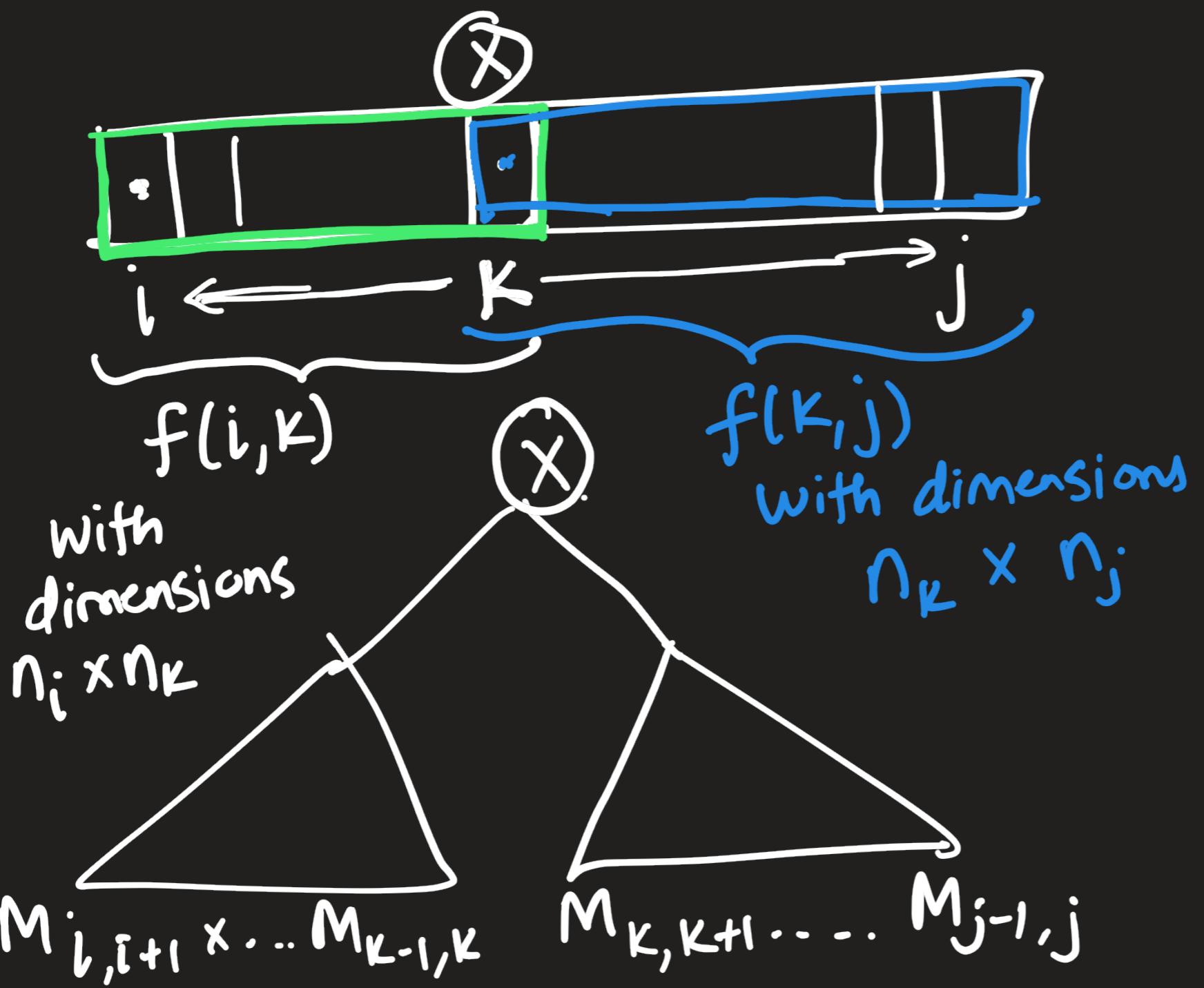


rows
in leftmost
matrix

cols in
rightmost matrix.

What is the least cost way to multiply
these matrices?

$f(i, j) = \text{Min cost of multiplying}$
 $M_{i, i+1} \times M_{i+1, i+2} \times \dots \times M_{j-1, j}$



Final \textcircled{X}
 will have
 cost = $n_i \times n_k \times n_j$

$$f(i, j) = \underset{k=i+1}{\text{MIN}} \left[f(i, k) + f(k, j) + M[i] \times M[k] \times M[j] \right]$$

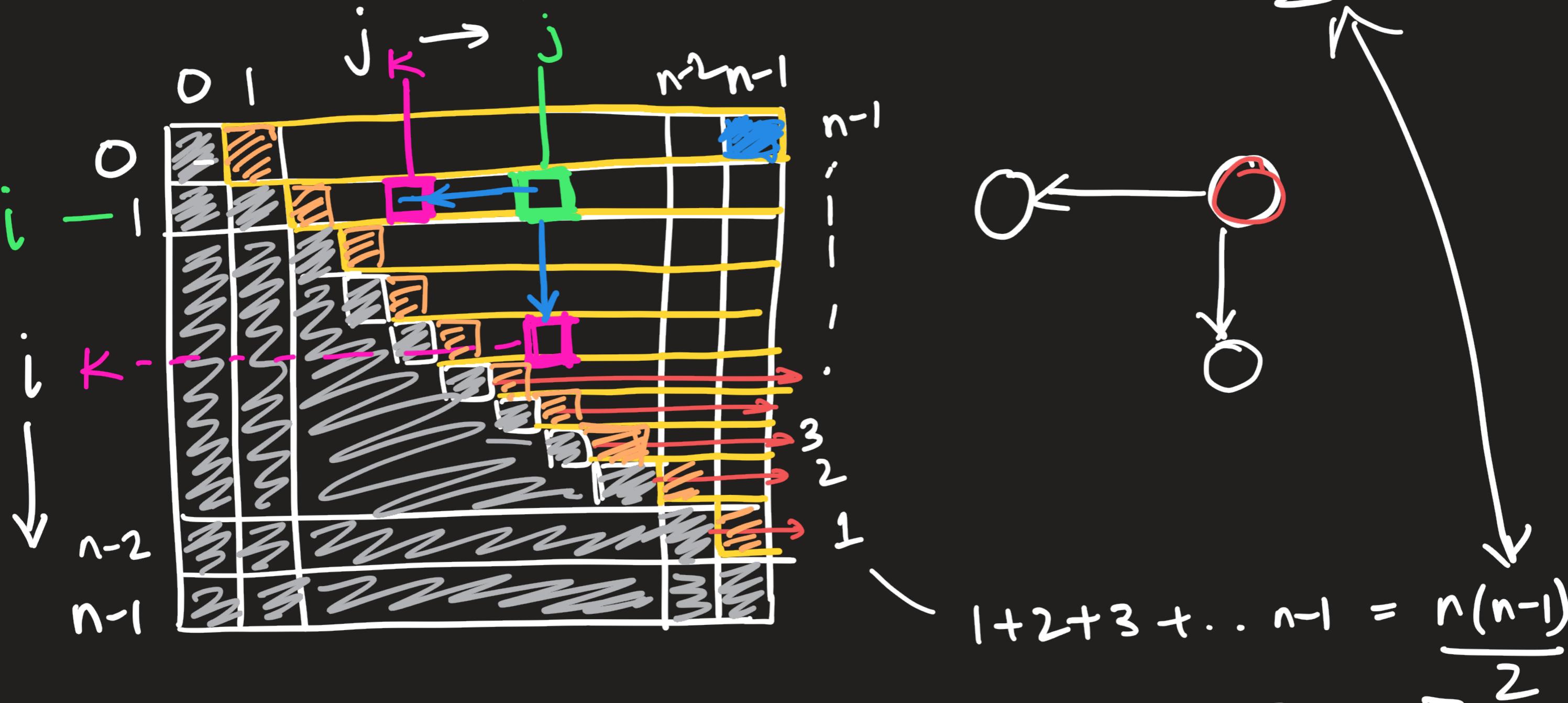
min cost
 for building
 left subtree

min cost
 for building
 right subtree

cost of
 final \textcircled{X}
 operation

$$f(i, j) \leftarrow 0 \leq i < j \leq n-1$$

$$\# \text{ distinct subproblems} = {}^n C_2 = \frac{n(n-1)}{2}$$



Base Case : $f(i, i+1) = 0 \quad \forall i \in [0, n-2]$

table = a 2D table of size $n \times n$
initialized to 00
($n = \text{length}(\text{mtxSizes})$)

Base Cases

for row in 0 to $n-2$:

table[row][row+1] = 0

0 for maximization
problem

Recursive Case

for row in $n-2$ down to 0:

for col in row+2 to $n-1$:

// calculate $f(\text{row}, \text{col})$ and store it in table[row][col]

for k in row+1 to col-1: → max for maximization

table[row][col] = \min [table[row][col],

(table[row][k] + table[k][col])

+ mtxSizes[row] * mtxSizes[k] *

mtxSizes[col])

$O(n)$

return table[0][n-1]

$$\begin{aligned} T(n) &= \# \text{cells} \times O(n) \\ &= O(n^2) \times O(n) = O(n^3) \end{aligned}$$

$$\text{Aux Space} = O(n^2)$$

```
10 - def minMultiplicationCost mtxSizes):
11
12     n = len(mtxSizes)
13     table = [[float("inf")] * n for _ in range(n)]
14
15     for i in range(n-1):
16         table[i][i+1] = 0
17
18     for i in range(n, -1, -1):
19         for j in range(i+2, n):
20             for k in range(i+1, j):
21                 table[i][j] = min(table[i][j], table[i][k] + table[k][j] + mtxSizes[i]*mtxSizes[k]*mtxSizes[j])
22
23     return table[0][-1]
```

312. Burst Balloons

Hard 4191 122 Add to List Share

You are given n balloons, indexed from 0 to $n - 1$. Each balloon is painted with a number on it represented by an array nums . You are asked to burst all the balloons.

If you burst the i^{th} balloon, you will get $\text{nums}[i - 1] * \text{nums}[i] * \text{nums}[i + 1]$ coins. If $i - 1$ or $i + 1$ goes out of bounds of the array, then treat it as if there is a balloon with a 1 painted on it.

Return the maximum coins you can collect by bursting the balloons wisely.

Example 1:

Input: $\text{nums} = [3, 1, 5, 8]$

Output: 167

Explanation:

$\text{nums} = [3, 1, 5, 8] \rightarrow [3, 5, 8] \rightarrow [3, 8] \rightarrow [8] \rightarrow []$
 $\text{coins} = \underline{3*1*5} + \underline{3*5*8} + \underline{1*3*8} + \underline{1*8*1} = \underline{167}$

Constraints:

- $n == \text{nums.length}$
- $1 \leq n \leq 500$
- $0 \leq \text{nums}[i] \leq 100$

Example 2:

$5 * 8 * 1 + 1 * 5 * 1 + 1 * 3 * 1 + 1 * 1 * 1$
[3, 1, 5] [3, 1] [0]

Input: $\text{nums} = [1, 5]$

Output: 10

$$40 + 5 + 3 + 1 = 49$$

$$1 * 1 * 5 + 1 * 5 * 1 = 10$$

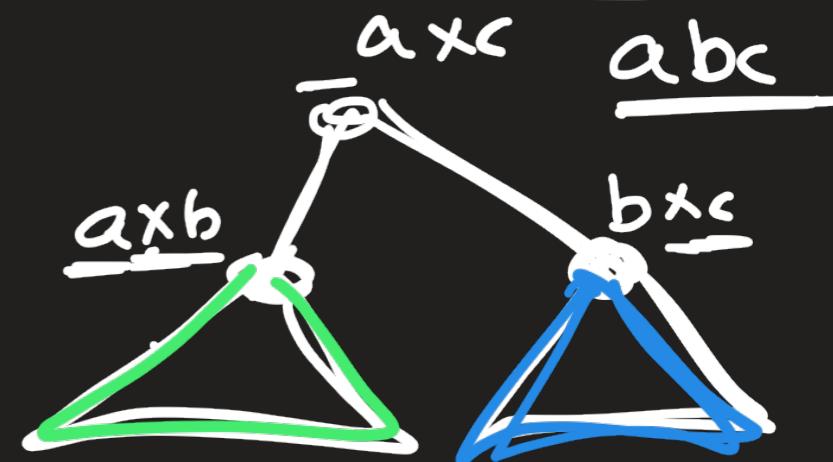
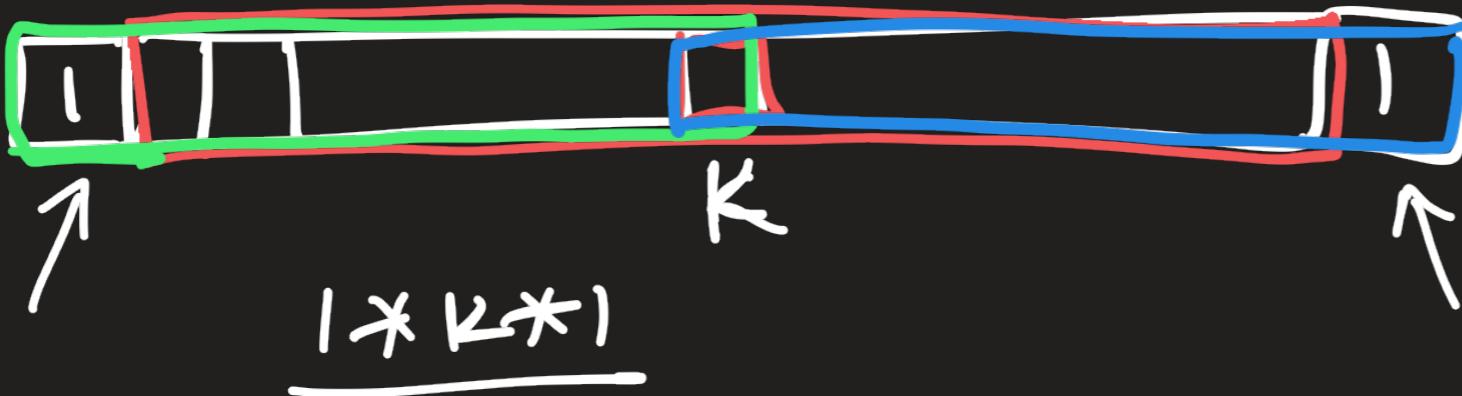
$$1 * 5 * 1 + 1 * 1 * 1 = 6$$

Transform & Conquer

↳ Problem Reduction



Maybe bursting a balloon \equiv Multiplying two matrices together.



newarray = [] + nums + []



```
2 ▼ def maxCoins(self, nums):
3     """
4         :type nums: List[int]
5         :rtype: int
6     """
7
8     newnums = [1] + nums + [1]
9
10    n = len(newnums)
11    table = [[0]*n for _ in range(n)]
12
13    for i in range(n-1):
14        table[i][i+1] = 0
15
16    for i in range(n, -1, -1):
17        for j in range(i+2, n):
18            for k in range(i+1, j):
19                table[i][j] = max(table[i][j], table[i][k] + table[k][j] + newnums[i]*newnums[k]*newnums[j])
20
21    return table[0][-1]
22
```