

When should you use Dynamic Programming?
Look for the following:

- OPTIMAL SUBSTRUCTURE (you can use Dynamic Programming.)
- OVERLAPPING SUBPROBLEMS (you should use Dynamic Programming.)

MATRIX CHAIN MULTIPLICATIONS

Consider the problem of multiplying two matrices A (p x q) and B (q x r), the product AB has dimensions (p x r), its ith entry is

$$\sum_{k=1}^q a_{ik} b_{ki} \quad (1 \leq i \leq p, 1 \leq i \leq r)$$

which involves q scalar multiplications.

Thus the total number of scalar multiplications performed in computing AB is pqr.

NOW CONSIDER THE PRODUCT OF THREE MATRICES ABC OF DIMENSIONS $(p \times q)$, $(q \times r)$, AND $(r \times s)$ RESPECTIVELY.

THERE ARE TWO POSSIBLE PARENTHEZIZATIONS OF THIS PRODUCT :

$$(1) A(BC) \quad \# \text{ scalar multiplications} = pq s + qrs$$

$$(2) (AB)C \quad \# \text{ scalar multiplications} = pqr + prs$$

e.g. $p=10$, $q=100$, $r=10$, $s=100$. THEN
 (1) YIELDS 200,000 MULTIPLICATIONS AND (2) YIELDS
 20,000.

THUS ONE PARENTHEZIZATION MAY BE MORE EFFICIENT THAN ANOTHER.

FOR FOUR MATRICES THERE ARE FIVE PARENTHEZIZATIONS.

LET $P(n)$ DENOTE THE NUMBER OF DISTINCT PARENTHEZIZATIONS OF A PRODUCT OF n MATRICES.

EXERCISE: SHOW $P(n)$ SATISFIES THE RECURRENCE

$$P(n) = \sum_{k=1}^{n-1} P(k)P(n-k) \quad (n \geq 1)$$

THE SEQUENCE $P(n)$ IS CALLED THE CATALAN NUMBERS. ONE CAN SHOW THAT

$$P(n) = \frac{1}{n} \binom{2n-2}{n-1}$$

EXERCISE

USE STIRLING'S FORMULA TO SHOW

$$P(n) = \Theta\left(\frac{4^n}{n^{3/2}}\right)$$

PROBLEM

GIVEN A PRODUCT OF n MATRICES $A_1 A_2 \dots A_n$ WHERE A_i HAS DIMENSIONS $P_{i-1} \times P_i$, DETERMINE A PARENTHEZIZATION WHICH MINIMIZES THE TOTAL NUMBER OF SCALAR MULTIPLICATIONS PERFORMED.

AS USUAL THERE ARE REALLY TWO PROBLEMS

- FIND THE MINIMUM NUMBER OF MULTIPLICATIONS
- FIND THE PARENTHEZIZATION WHICH ACHIEVES IT.

WE CAN SEE THAT THE BRUTE FORCE APPROACH IS INEFFICIENT SINCE THE NUMBER OF PARENTHEZIZATIONS IS EXPONENTIAL.

TO DEVELOP A DYNAMIC PROGRAMMING SOLUTION,
WE CONSIDER THE GENERAL SUBPROBLEM OF
FINDING AN OPTIMAL PARENTHEZIZATION OF
 $A_i \dots A_j$ WHERE $1 \leq i \leq j \leq n$.

OBSERVE THAT AN OPTIMAL PARENTHEZIZATION
SPLITS $A_i \dots A_j$ INTO

$$(A_i \dots A_k) \cdot (A_{k+1} \dots A_j)$$

FOR SOME k ($i \leq k < j$).

NOTE ALSO THAT IF $A_i \dots A_j$ IS OPTIMALLY
PARENTHEZIZED, THEN SO ARE BOTH $(A_i \dots A_k)$
AND $(A_{k+1} \dots A_j)$.

PROOF: IF THE PARENTHEZIZATION OF $(A_i \dots A_k)$
IS NOT OPTIMAL, THEN WE CAN REPLACE IT
WITH AN OPTIMAL ONE YIELDING A PARENTHEZIZATION = 1
OF $A_i \dots A_k$ WITH FEWER SCALAR MULTIPLICATIONS.
THIS CONTRADICTS THAT OUR ORIGINAL PARENTHEZIZATION < j
OF $A_i \dots A_k$ WAS OPTIMAL. ///

THUS THE PRINCIPLE OF OPTIMALITY IS SATISFIED
IN THIS PROBLEM.

$$\begin{array}{ccc} \text{OPTIMAL} & \text{OPTIMAL} & \text{OPTIMAL} \\ (A_i \cdots A_k) \cdot (A_{k+1} \cdots A_j) & & \\ (P_{i-1} \times P_k) & (P_k \times P_j) & \end{array}$$

LET $m[i, j]$ DENOTE THE MINIMUM NUMBER OF SCALAR MULTIPLICATIONS NECESSARY TO COMPUTE $A_i \cdots A_j$. IF $i = j$ THEN $m[i, j] = 0$ SINCE THE PRODUCT CONSISTS OF JUST ONE MATRIX.

IF $i \leq k < j$, AND k IS THE SPLIT POSITION OF AN OPTIMAL PARENTHESIZATION THEN

$$m[i, j] = m[i, k] + m[k+1, j] + P_{i-1} P_k P_j$$

SINCE WE DON'T KNOW k , WE DEFINE IN GENERAL

$$m[i, j] = \begin{cases} 0 & i = j \\ \min_{i \leq k < j} (m[i, k] + m[k+1, j] + P_{i-1} P_k P_j) & i < j \end{cases}$$

Ex. $n=5$; $P_0=10, P_1=20, P_2=30, P_3=10, P_4=40, P_5=10$

TABLE M

	1	2	3	4	5
1	0	6000	8000	12000	13000
2	x	0	6000	14000	12000
3	x	x	0	12000	7000
4	x	x	x	0	4000
5	x	x	x	x	0

FOR INSTANCE, TO COMPUTE $m[2,5]$:

$$m[2,5] = \min \begin{cases} m[2,2] + m[3,5] + P_1 P_2 P_5 = 13000 & (k=2) \\ m[2,3] + m[4,5] + P_1 P_3 P_5 = \boxed{12000} & (k=3) \checkmark \\ m[2,4] + m[5,5] + P_1 P_4 P_5 = 22000 & (k=4) \end{cases}$$

OBSERVE THAT TO COMPUTE $m[2,5]$ ONE NEEDS ENTRIES $m[2,2..4]$ AND $m[3..5,5]$. THUS TO FILL THE TABLE, FIRST INITIALIZE THE MAIN DIAGONAL TO 0, THEN SUCCESSIVELY FILL EACH OFF DIAGONAL ABOVE THE MAIN.

i.e. $m[i,i] = 0 \quad (1 \leq i \leq n)$

THEN $m[i, i+1] \quad (1 \leq i \leq n-1)$

$m[i, i+2] \quad (1 \leq i \leq n-2)$

AND IN GENERAL

$m[i, i+l] \quad (1 \leq i \leq n-l)$

FOR $l = 1, 2, \dots, n-1$

SEE P. 336 FOR PSEUDO-CODE .

FROM THIS TABLE WE CAN RE-CONSTRUCT THE VALUES k , WHICH GIVE THE SPLIT POINTS FOR EACH SUBPROBLEM.

A MORE EFFICIENT APPROACH IS TO STORE k VALUES IN A PARALLEL TABLE $S[i, j]$ AS WE CONSTRUCT $m[i, j]$. (P. 336).

EX. SAME AS ABOVE, WE SEE $S[2, 5] = 3$, AND

TABLE S

	1	2	3	4	5
1	x	1	1	3	3
2	x	x	2	3	3
3	x	x	x	3	3
4	x	x	x	x	4
5	x	x	x	x	x

FROM THIS TABLE WE CAN CONSTRUCT THE OPTIMAL PARENTHESIZATION :

$$(A_1, (A_2 A_3))(A_4 A_5)$$

All Pairs Shortest Paths (APSP) (25, 2)

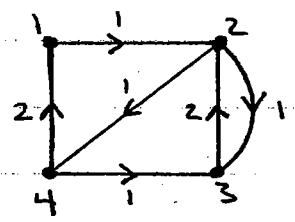
CONSIDER A DIRECTED GRAPH IN WHICH A WEIGHT (COST) IS ASSIGNED TO EACH DIRECTED EDGE.

WE WRITE $G = (V, E)$ WHERE V IS THE VERTEX SET AND E IS THE SET OF DIRECTED EDGES.

THE ADJACENCY MATRIX OF G IS DEFINED AS $W = (w_{ij})$ WHERE

$$w_{ij} = \begin{cases} 0 & \text{if } i=j \\ \text{WEIGHT OF DIR. EDGE } (i,j) & \text{if } i \neq j, (i,j) \in E \\ \infty & \text{if } i \neq j, (i,j) \notin E \end{cases}$$

EX.



$$V = \{1, 2, 3, 4\}$$

$$E = \{(1,2), (2,4), (4,1), (4,3), (3,2), (2,2)\}$$

$$W = \begin{pmatrix} 0 & 1 & \infty & \infty \\ \infty & 0 & 1 & 1 \\ \infty & 2 & 0 & \infty \\ 2 & \infty & 1 & 0 \end{pmatrix}$$