

- ① opt / counting / feasibility
- ② recursion design
- ③ run time analysis
 - { run time
 - space
- ④ bottom up
 - top down w/ memoization

- LCS
- Edit distance
- 0-1 knapsack
- Complete knapsack

Knapsack w/ multiple constraints

- n items
- for each item i - value[i], weight[i], volumnt[i]
- knapsack weight cap W volumn cap V
- What is the maximum return $\$$??

(A) 0-1 knapsack

(B) complete knapsack

$f(i, j, k) = \max \underline{\text{value}}$ given item[1--i]
 and knapsack capacity is j & k
weight volumn

$$f(i, j, k) = \max \begin{cases} \text{value}[i] + f(i-1, j-\text{weight}[i], k-\text{volumn}[i]) \\ f(i-1, j, k) \end{cases}$$

base case $f(0, j, k) = f(i, 0, k) = f(i, j, 0) = 0$

running time ??

exp. fun.

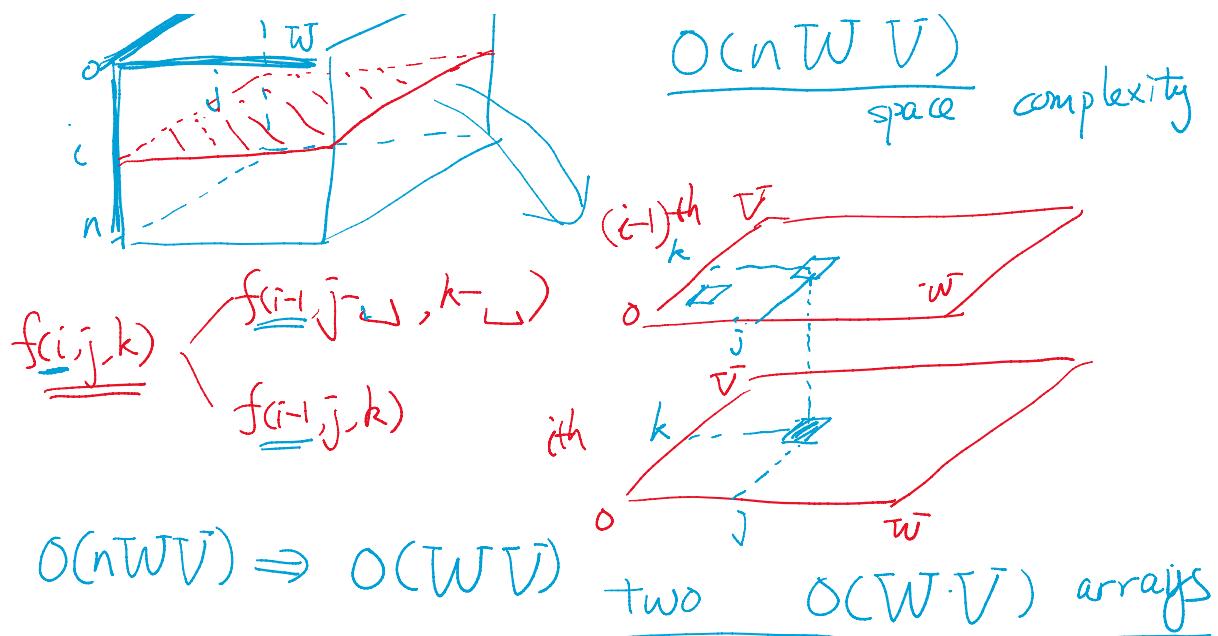


space complexity ??

(A) reduce space
bottom up

(B) cannot reduce space

$O(nWV)$ complexity



knapsack (value[1...n], weight[1...n], volume[1...n],
 W, V)

for ($i = 1 \dots n$) {

 for ($j = 1 \dots W$) {

 for ($k = 1 \dots V$) {

 if (weight[i] $\leq j$ $\&$ volume[i] $\leq k$) {

$dp[i, j, k] = \max\{ dp[i-1, j, k],$

 value[i] + $dp[i-1, j-weight[i], k-volume[i]]$ }

 } else {

$dp[i, j, k] = dp[i-1, j, k];$



 }

 }

 return $dp[n, W, V];$

(A) easy

(B) okay

(C) hard

matrix multiplication [a chain of matrices]

(100, 2) (2, 100) (100, 10)

$A_1 \times A_2 \times A_3$

\times / ~

$$\begin{array}{c} \cancel{A_1 \times A_2 \times A_3} \\ \hline (\cancel{A_1 \times A_2}) \times \cancel{A_3} \\ \quad \quad \quad (100, 100) \end{array}$$

$\cancel{\text{Op1}}$

$$\begin{array}{r} 100 \times 2 \times 100 = 20,000 \\ 100 \times 100 \times 10 = 100,000 \\ \hline 120,000 \end{array}$$

$\checkmark \text{Op2}$

$$A_1 \times \frac{(A_2 \times A_3)}{k} \quad \begin{array}{l} k \\ (2, 10) \end{array}$$

$$\boxed{O(i \cdot j \cdot k)}$$

$$\begin{array}{r} 2 \times 100 \times 10 = 2,000 \\ 100 \times 2 \times 10 = 2,000 \\ \hline 4,000 \end{array}$$

$$A_1 \times A_2 \times \dots \times A_n$$

$$(p_0, p_1) \quad (p_1, p_2) \quad \dots \quad (p_{n-1}, p_n)$$

Q: what's min cost to multiply everything?

$$\overbrace{A_1 \times A_2 \times A_3 \times \dots \times A_{n-1} \times A_n}^{(p_0, p_1) \quad (p_1, p_2) \quad \dots \quad (p_{n-1}, p_n)}$$

which is our "last" multiplication ??

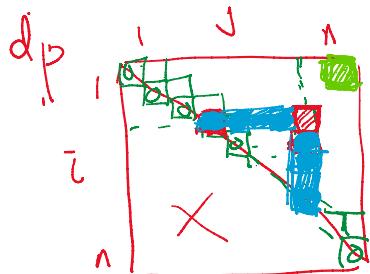
$n-1$ multiplication, which one is last one??

$$f(1, n) = \min \left\{ \begin{array}{l} f(1, 2) + f(3, n) + p_0 \times p_1 \times p_n \\ f(1, n-1) + f(n) + p_0 \times p_{n-1} \times p_n \end{array} \right\}$$

$$f(i, j) = \min_{j-i-1} \left\{ \begin{array}{l} f(i, i) + f(i+1, j) + p_{i-1} \times p_i \times p_j \\ f(i, i+1) + f(i+2, j) + p_{i-1} \times p_{i+1} \times p_j \\ f(i, j-1) + f(j, j) + p_{i-1} \times p_{j-1} \times p_j \end{array} \right\}$$

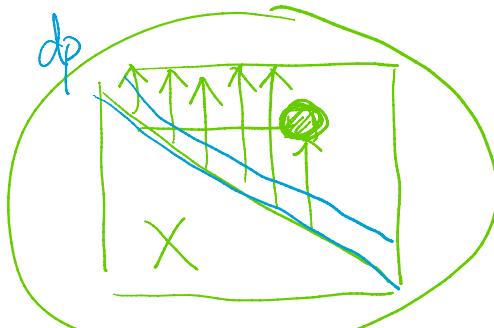
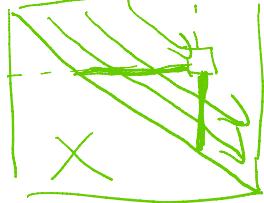
$$(\underline{f(i,j+1) + f(j,j)} + P_{i-1} \times P_{j-1} \times P_j)$$

$$= \min_{k=i \dots j-1} \{ f(i,k) + f(k+1,j) + P_{i-1} \times P_k \times P_j \}$$



$$f(i,j) \quad i \leq j$$

$$\underline{f(i,i) = 0}, \quad \underline{f(i,i+1) = P_{i-1} \times P_i \times P_{i+1}}$$



Mem ($\boxed{P[0 \dots n]}$) {

for ($i=1 \dots n$) $dp[i,i]=0$;

for ($i=1 \dots n-1$) $dp[i,i+1] = P[i+1] \cdot P[i] \cdot P[i+1]$;

for ($j=3 \dots n$) {

for ($i=j-2 \dots 1$) {

$dp[i,j] = \infty$;

for ($k=i \dots j-1$) {

$dp[i,j] = \min (dp[i,j],$

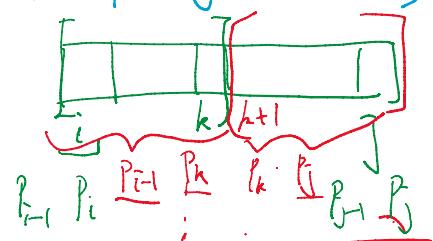
$dp[i,k] + dp[k+1,j] + P[i] \cdot P[k] \cdot P[j])$

$O(n^3)$ run time

space $O(n^2)$

return $dp[1,n]$;

$k=i \dots j-1$



string palindrome

e.g.

| | | |
|---|---|---|
| a | n | a |
| a | n | n |
| h | a | n |
| a | n | a |

[banana] split into a list of palindromes

- [b, ana, n, a] 4
- [b, a, n, a, n, a] 6

- [b, anana] 2

Q: what's the min # of palindromes

input string A 1 2 n
A 1 2 3 4 5 6 7 - - - - -

$f(i) := \min \# \text{ of palindromes given } A[1..i]$

$$A \quad \underline{\underline{b}} \underline{a} \underline{n} \underline{a} \underline{n} \underline{t} \underline{a}$$

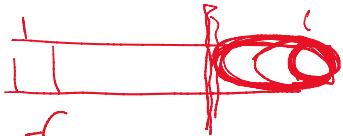
$f(6) = \min \left\{ \begin{array}{l} f(5) + 1 \quad "a" \text{ as last} \\ f(3) + 1 \quad "ana" \text{ as last} \\ f(1) + 1 \quad "anana" \text{ as last} \end{array} \right.$

"last" palindrome
in the list

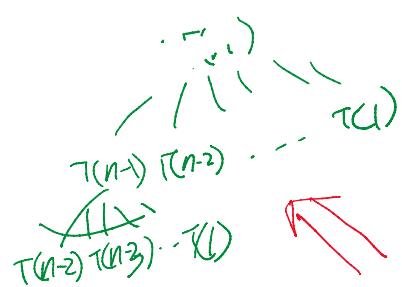
$f(1) = \dots$



$$f(i) = \min_{k=1 \dots i} \{ f(k-1) + 1 \text{ if } A[k:i] \text{ is palindrome} \}$$



$$f(0) = 0 \quad f(1) = 1$$



b a n n a n a

| | | | | | | |
|---|---|---|---|---|---|---|
| b | a | n | n | a | n | a |
|---|---|---|---|---|---|---|

$O(n^3)$
 $O(n^2)$

min_palindrome(A[1..n]) {

dp[0]=0;

for ($i=1 \dots n$) {

dp[i] = i;

for ($k=1 \dots i$) {

if (is_palindrome(A[k:i]))

dp[i] = min(dp[i],
1 + dp[k-1])

return dp[n];

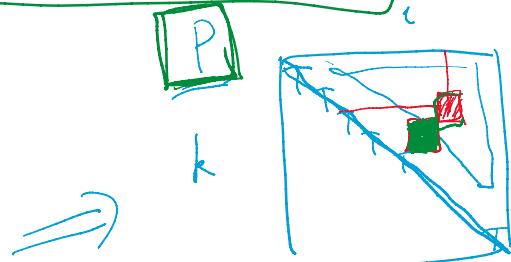
is_palindrome

| | | |
|---|---------|---|
| k | \dots | i |
|---|---------|---|

linear len(string)

Q : can we make it
constant time operation?

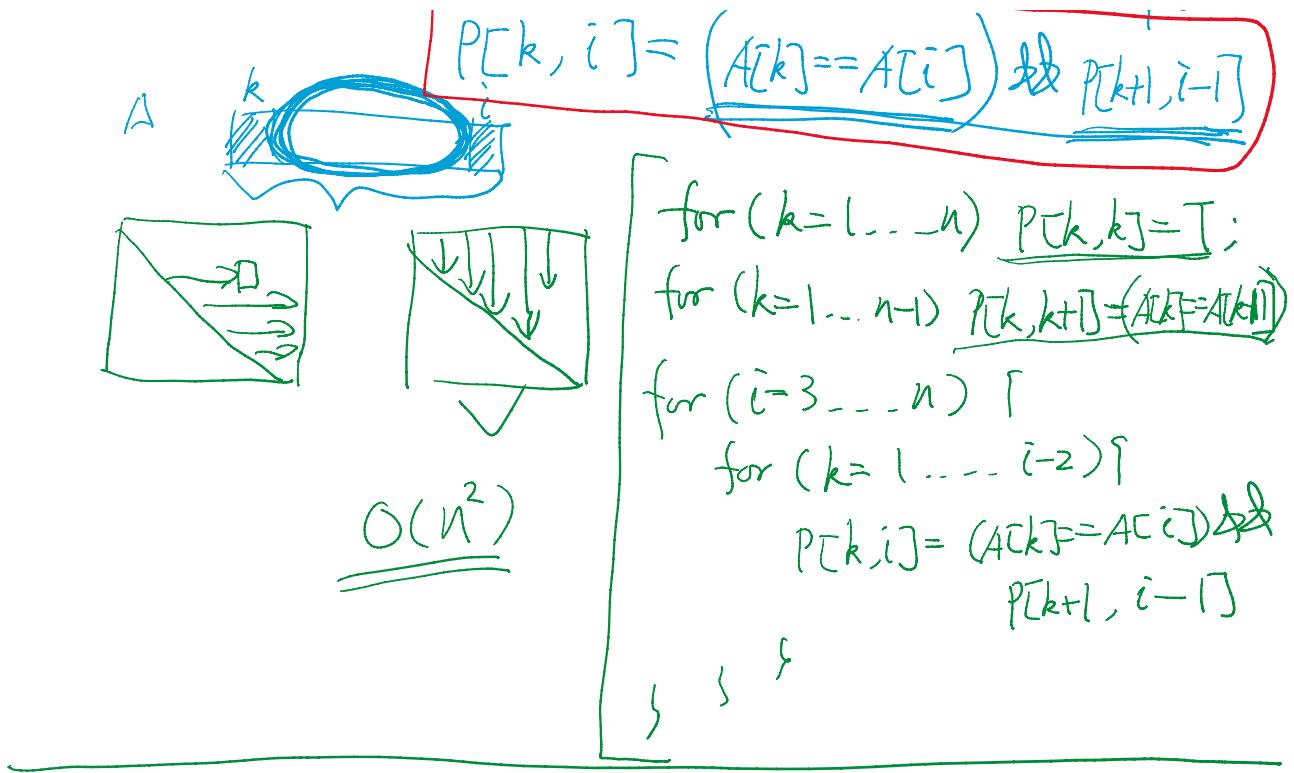
A [k, i]



$k \leq i$

$P[k, i] = \begin{cases} \text{True means } A[k:i] \text{ is palindrome} \\ \text{False means } A[k:i] \text{ is not palindrome} \end{cases}$

$P[k, i] = (A[k] == A[i]) \& P[k+1, i-1]$



(A) easy

(B) okay

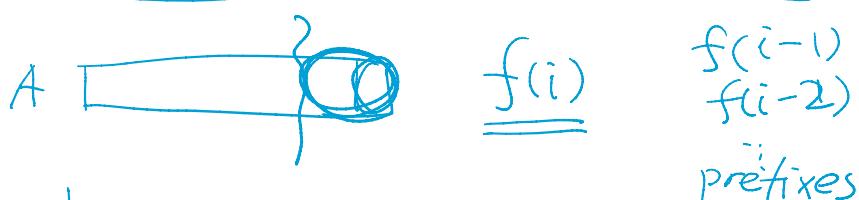
(C) hard

recursion structure

① pair of sequences [LCS, Edit distance]



② single sequence [string palindrome]



③ knapsack [0-1 complete . multiple constraints]

③ knap sack [0-1] complete, multiple constraints
e.g. final exam question
coin change

rectices

④ intervals [matrix multiplication]

