

CS3000

5/17 - Weds

Admin

- Short Hw2 due tom. 9pm
- Long Hw2 out tom, due Tues.
- Exam #1 next thurs 5/25
- Fun optional recitation tomorrow

Agenda

1. Dynamic Programming (DP)
2. Longest Common Subsequence (LCS)
3. DP LCS solution

1. Dynamic Programming

Approaches

- naive - linear search, selection sort
- divide and conquer - binary search, karatsuba, mergesort, quick sort
- DP - LCS

Start with D+C, and then... \Rightarrow can we do better? \Leftarrow



When is DP a good fit?

- optimization problems
- optimal substructure
- overlapping sub problems

Optimization Problem

- easy to find \neq solution
- we want the best of many/all solutions
- optimize (max/min) of some component

(ex)



problem: need coffee

work in reserve

class in Shillman

poss. solutions:

- Starbucks in CSC
- Tarte
- Payment
- DD in Richard
- DD in Shillman
- Sreak coffee maker into office

All valid!

But, what are we optimizing for?

- Time: Skillman one optimal solns
- \$; make my own one optimal solns
- Taste: either DP two optimal solns

In general, optimization problem can be solved naively (brute force)

- compute the value of every valid solution
- see which is best

↳ but, this is slowwwww !!

∨∨
(can we do better?)

∨∨
↳ try D+C ... might be a slow implementation !!

∨∨
(can we make a faster implementation)

DP is good when

- optimization
- optimal substructure: solution to smaller problem is part of solution to bigger problem
- overlapping subproblems: recursive solution solves the same subproblems multiple times

2. Longest Common Subsequence LCS

Sequence: like a string

ex: $X = \langle x_1, x_2, \dots, x_n \rangle$
 x_1 x_n

Subsequence of X : X with 0 or more elements removed

ex: Subsequences of X
 $\langle \rangle$ $\langle x_1 \rangle$ $\langle x_2 \rangle$ $\langle x_1, x_2 \rangle$ $\langle x_1, x_3 \rangle$ $\langle x_2, x_3 \rangle$ $\langle x_1, x_2, x_3 \rangle$

ex: Invalid Subsequences of X
 $\langle x_2, x_1 \rangle$ $\langle x_1, x_2, x_1 \rangle$

How many subsequences of X are there? 2^n

ex: $X = \langle A, L, G, O \rangle$ $2^4 = 16$
 $\bar{2} \bar{2} \bar{2} \bar{2}$

LCS: given two sequences X, Y

$X = \langle x_1, x_2, \dots, x_m \rangle$ $Y = \langle y_1, y_2, \dots, y_n \rangle$

An LCS(X, Y):

- is a subsequence of X
- is a subsequence of Y
- is an optimal solution
↳ longest!

For today: $LCS(X, Y)$ is the length

Approach #1: naive (Brute Force)

- Find all subsequences of X (2^m)
- Find all subsequences of Y (2^n)
- Find the ones they have in common
- Choose the largest

Solves the problem?

Runtime: $2^m + 2^n$ 

!!!
(can we do better?)
!!! ↳ try D+C

Approach #2: Divide + Conquer

X = <A, G, A, T> m = 4
Y = <G, X, B, T> n = 4

- work our way backwards from x_m and y_n
- just focus on length

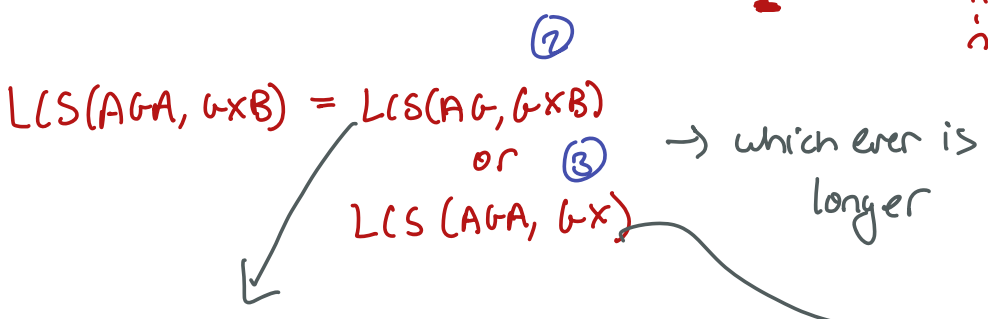
D+C → start at end

A, G, A, **T** → A, G, A
G, X, B, **T** → G, X, B

① $LCS(AGAT, GXBT) = LCS(AGA, GXB) + 1$

next $LCS(AGA, GXB)$

A, G, A
G, X, B not the same
!!!
n



→ repeated work!

next

$$LCS(A, G, GXB)$$

A, G
G, X, B

$$LCS(AGA, GX) \\ = LCS(A, G, GX) \\ \text{or} \\ LCS(AGA, G)$$

$$LCS(A, G, GXB) = \textcircled{4} LCS(A, G, GX) \\ \text{or} \\ \textcircled{5} LCS(A, GXB)$$

→ whichever is longer

(more...)

10:46

- remove one element from X, Y
- remove one from X but not Y
- remove one from Y but not X

$$X = \langle x_1, x_2, \dots, x_m \rangle$$

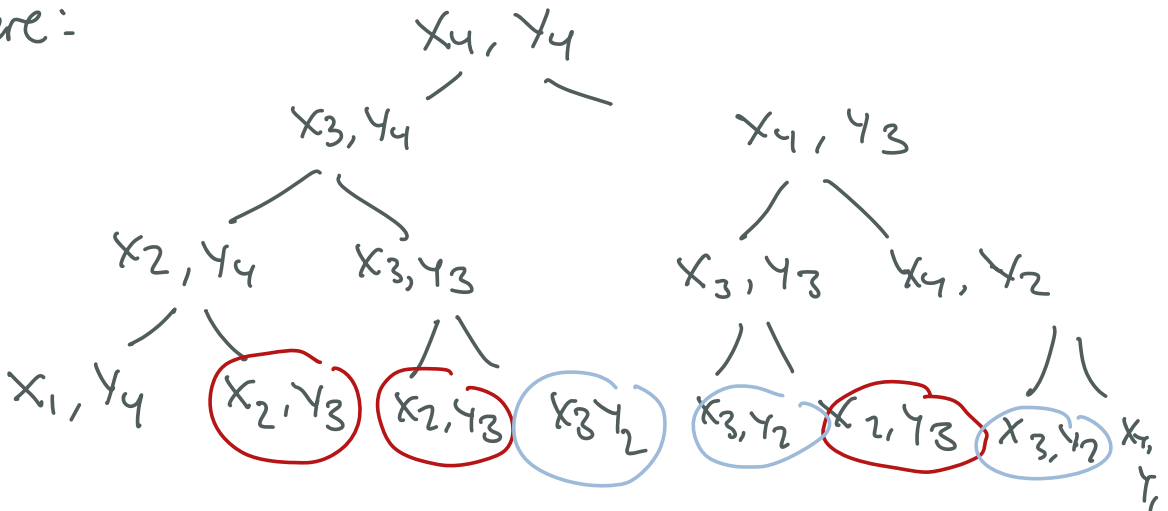
$$Y = \langle y_1, y_2, \dots, y_n \rangle$$

Worst case: no elements in common

$$X = \text{Sequence } X_i = \langle x_1, x_2, \dots, x_i \rangle$$

$$Y = \text{Sequence } Y_j = \langle y_1, y_2, \dots, y_j \rangle$$

Compare:



So much overlap!

eventually compare every x_1, x_2, \dots, x_m to every y_1, y_2, \dots, y_n

$\rightarrow O(2^m)$



Same as naive solution

3. DP approach

DP!

Implementation is better

- once we solve a subproblem, never solve it again
- instead, remember it!
- tradeoff of time/space

D+C
↳ DP

Recurrence for the value of an optimal solution

$C[i, j]$ = length of an LCS of x_i and y_j

$C[i, j] =$ $\left\{ \begin{array}{l} \text{Base case: } \emptyset \text{ when } i=0 \text{ or } j=0 \\ \text{if } x_i == y_j \quad C[i-1, j-1] + 1 \\ \text{if } x_i \neq y_j \quad \max \{ C[i-1, j], C[i, j-1] \} \end{array} \right.$

↳ make a table/matrix
"C" table

$X = \langle A, G, A, T \rangle$

$Y = \langle G, X, B, T \rangle$

(ex) $C[0,0] = LCS("", "") = 0$

$C[1,1] = LCS(A, G) = 0$

$C[3,1] = LCS(AGA, G) = 1$

$C[1,3] = LCS(A, GXB) = 0$

$C[4,4] = LCS(AGAT, GXBT) = \text{actual answer!}$

(C table) → length

(X)		G j=1	X j=2	B j=3	T j=4
i=0	BC	0	0	0	0
A i=1	BC	0	A, G	A, GX	A, GXB
G i=2	BC	0	0	0	0
		A, G	A, GX	A, GXB	A, GXBT
A i=3	BC	0	1	1	1
		AGA, G	AGA, GX	AGA, GXB	AGA, GXBT
T i=4	BC	0	1	1	1
		AGAT, G	AGAT, GX	AGAT, GXB	AGAT, GXBT
	BC	0	1	1	2

Final answer!

(Answers to
subproblems)

