

6.006  
Rivest  
L20.1  
11/13/08

Admin:

Reading: CLRS 15.1-15.4

Outline: Dynamic Programming (2/4)

- Review DP concepts
- Longest path in a DAG
- Longest common subsequence
- Picking up pennies

## Review Dyn. Prog. concepts

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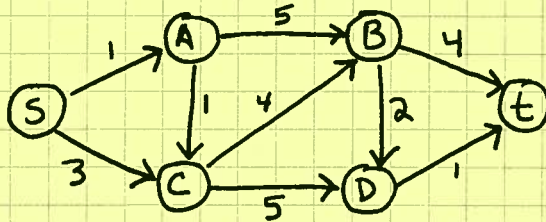
- typically, an optimization problem that can be solved recursively.
- recursive calls generate similar subproblems
- subproblem dependence graph: (DAG: no cycles!)  
 $V = \text{set of subproblems}$   
 $E = \{ x \rightarrow y : \text{solving } x \text{ involves calling for } y \text{'s solution} \}$
- Two approaches:
  - ① "top-down" (recursive) implementation, but "memoizing" solutions to subproblems as they are solved }  $\equiv$  DFS
  - ② "bottom\*up": sort  $V$  in reverse topological order, solve subproblems in that order, save solutions as subproblems are solved.
- Solution time is typically  $\Theta(V+E)$ , assuming that solving a subproblem is linear in number of recursive calls it makes (i.e., in # of outgoing edges it has).



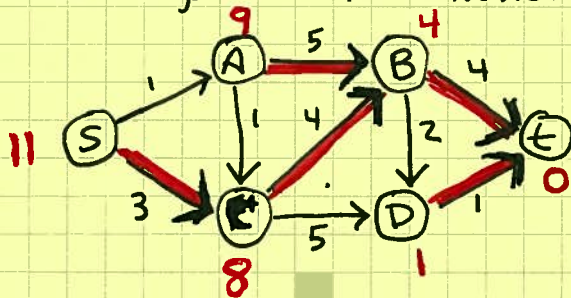
## Longest Path in a DAG

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- Find longest  $s \rightarrow t$  path in given DAG  $G = (V, E)$



- subproblem for each vertex  $u$ :  
what is length of longest  $u \rightarrow t$  path, and  
what is first vertex (after  $u$ ) on this path?  
("single destination" rather than "single source" — we've  
turned things around for convenience, no big deal.)



$$d[u] = \max_{(u,v) \in E} (w(u,v) + d[v]) \quad (\text{but } d[t] = 0)$$

- do DFS on  $G$ , starting at  $s$ .  
save ("memoize")  $d[u]$  when  $u$  "finished". (illustrate)  
time is  $\Theta(V + E)$
- can find "critical path" in project ("PERT chart") similarly

$$d[u] = w(u) + \max_{(u,v) \in E} (d[v]) \quad (\text{but } d[t] = w(t))$$

where  $w(u)$  = time to complete task  $u$  on its own.

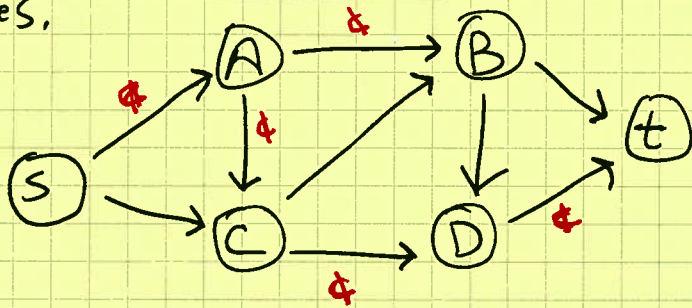
"Picking up pennies"

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Given a DAG  $G = (V, E)$ , where some edges have pennies on them & some don't,

find path from given start vertex with most

pennies.



(Ans = sACDt)

This is just longest path problem,

where length of edge = # of pennies on it!



# Longest Common Subsequence (LCS)

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- apps: "edit distance", "diff", spell-checking,  
DNA comparison, document distance (new def), plagiarism detection, etc.

- Given two strings/sequences  $x$  &  $y$ , find a longest common subsequence (elements in same order but not nec. contiguous)

- Example:  $x = \text{C A T G}$   
 $y = \text{A C G}$  or  $x = \text{C A T G}$   
 $y = \text{A C G}$   
 $z = \text{LCS}(x, y) = \text{AG}$  or  $z = \text{LCS}(x, y) = \text{CG}$   
(may be more than one LCS)

- Naive brute force = try all  $2^{|x|}$  subsequences of  $x$   
see if it occurs in  $y$   
time =  $\Theta(2^{|x|} \cdot |y|)$

- Consider "chopping game" - try to maximize # points  
Given two strings, do a sequence of moves until  
nothing is left.

Move = drop 1<sup>st</sup> char of  $x$  (0 pts)

~~C A T G~~  
~~A C G~~  
| |

or drop 1<sup>st</sup> char of  $y$  (0 pts)

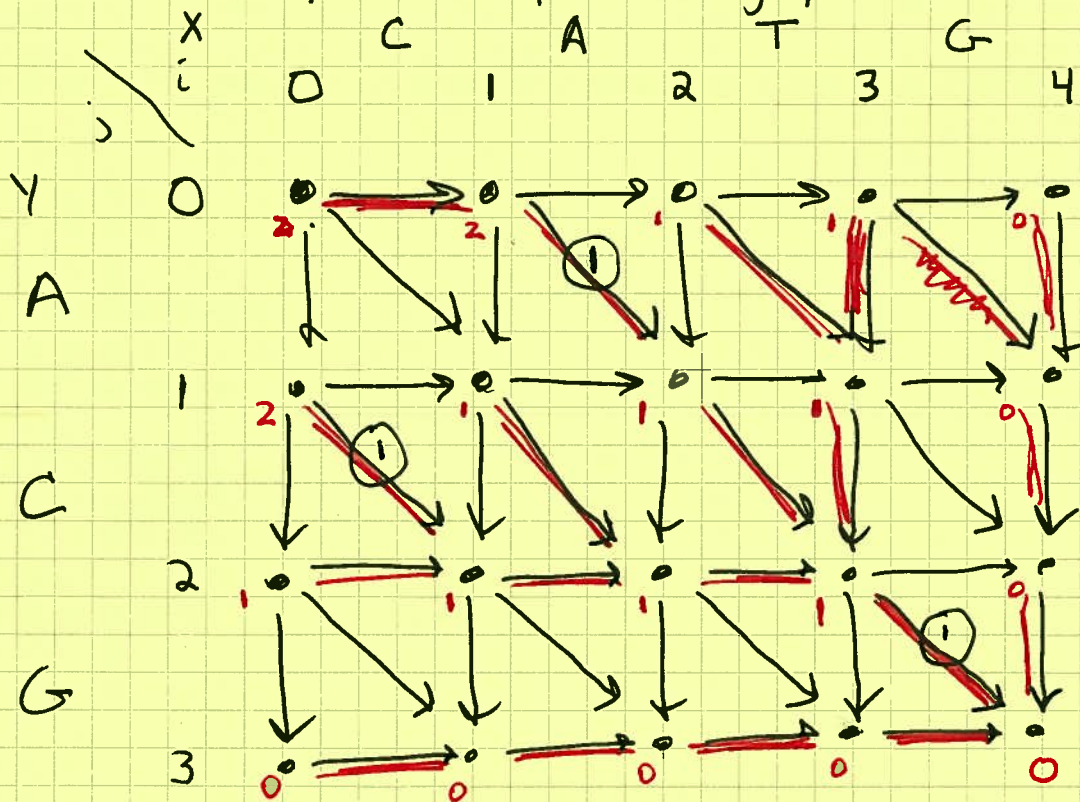
or drop 1<sup>st</sup> chars of  $x$  &  $y$  (1 pt if same char dropped  
else 0 pts)

- Claim: max score achievable = length of **LCS**  
(Just take letters corresponding to points achieved.)

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- State of game = subproblem  
 = pair of suffixes  $(x[i:], y[j:])$   
 after having dropped  $i$  from  $x$  &  $j$  from  $y$

- Draw subproblem dependence graph



Picking up pennies!

- $\rightarrow$   $\equiv$  drop  $x$
- $\downarrow$   $\equiv$  drop  $y$
- $\searrow$   $\equiv$  drop both

- all edges have 0 weight except for  $\searrow$  with  $x[i]=y[j]$
- want longest path (!)

Time =  $\Theta(V+E) = \Theta(|x| \cdot |y|)$

Space =  $\Theta(|x| \cdot |y|)$  ( $\Rightarrow \Theta(\min(|x|, |y|))$   
 just to find length  
 do by rows, or columns)