

Lecture 31

CSE 331

A recursive algorithm

Compute-Opt(j)

Correct for $j=0$

Proof of
correctness by
induction on j

If $j = 0$ then return 0

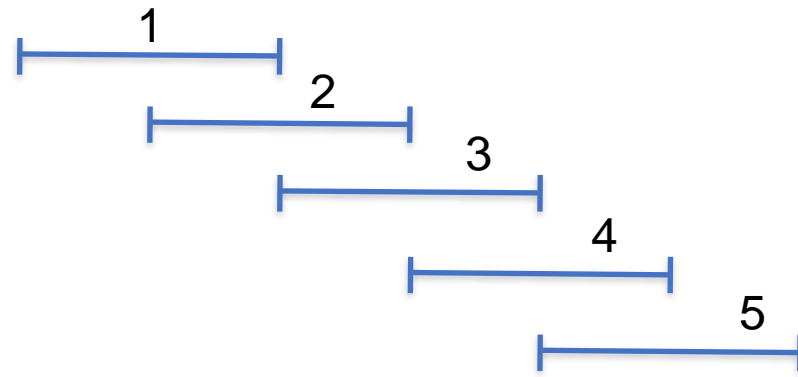
return max { $v_j + \text{Compute-Opt}(p(j))$, $\text{Compute-Opt}(j-1)$ }

= OPT($p(j)$)

= OPT($j-1$)

$$\text{OPT}(j) = \max \{ v_j + \text{OPT}(p(j)), \text{OPT}(j-1) \}$$

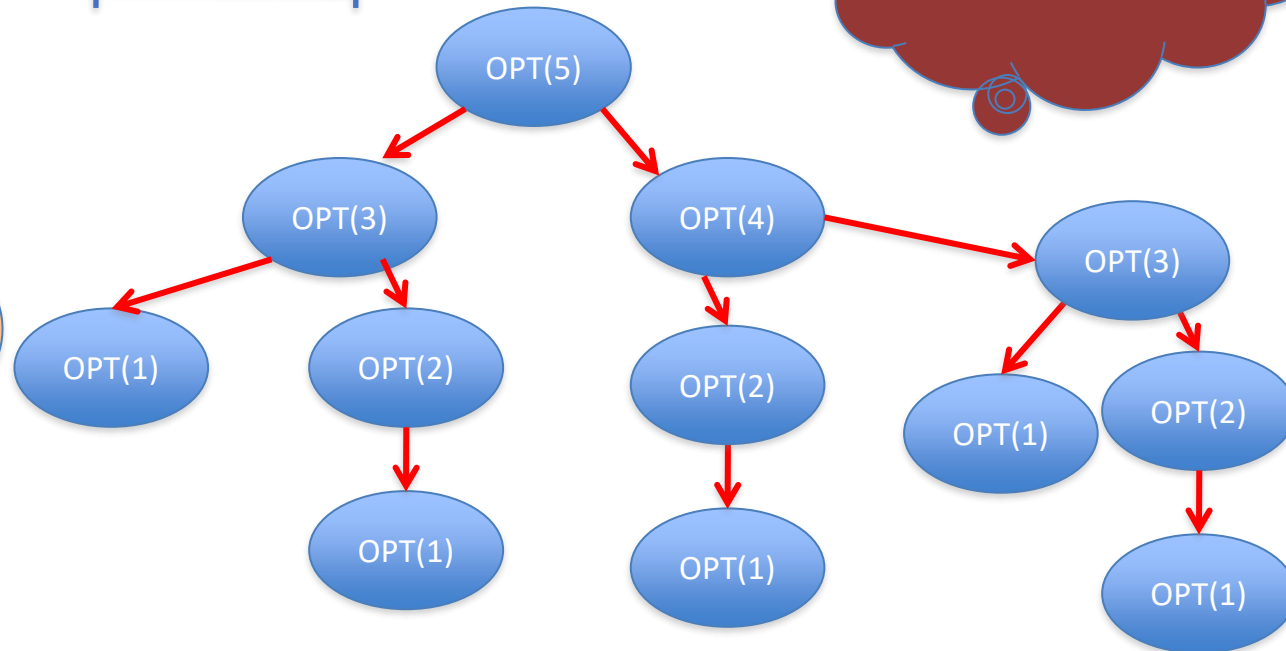
Exponential Running Time



$$p(j) = j-2$$

Only 5 OPT values!

Formal
proof: Ex.



Using Memory to be smarter

Using more space can reduce runtime!

How many distinct OPT values?

A recursive algorithm

M-Compute-Opt(*j*)

If *j* = 0 then return 0

If *M*[*j*] is not null then return *M*[*j*]

M[*j*] = max { *v_j* + M-Compute-Opt(*p*(*j*)), M-Compute-Opt(*j*-1) }

return *M*[*j*]

M-Compute-Opt(*j*)
= OPT(*j*)

Run time = $O(\# \text{ recursive calls})$

Bounding # recursions

M-Compute-Opt(j)

If $j = 0$ then return 0

If $M[j]$ is not null then return $M[j]$

$M[j] = \max \{ v_j + \text{M-Compute-Opt}(p(j)), \text{M-Compute-Opt}(j-1) \}$

return $M[j]$

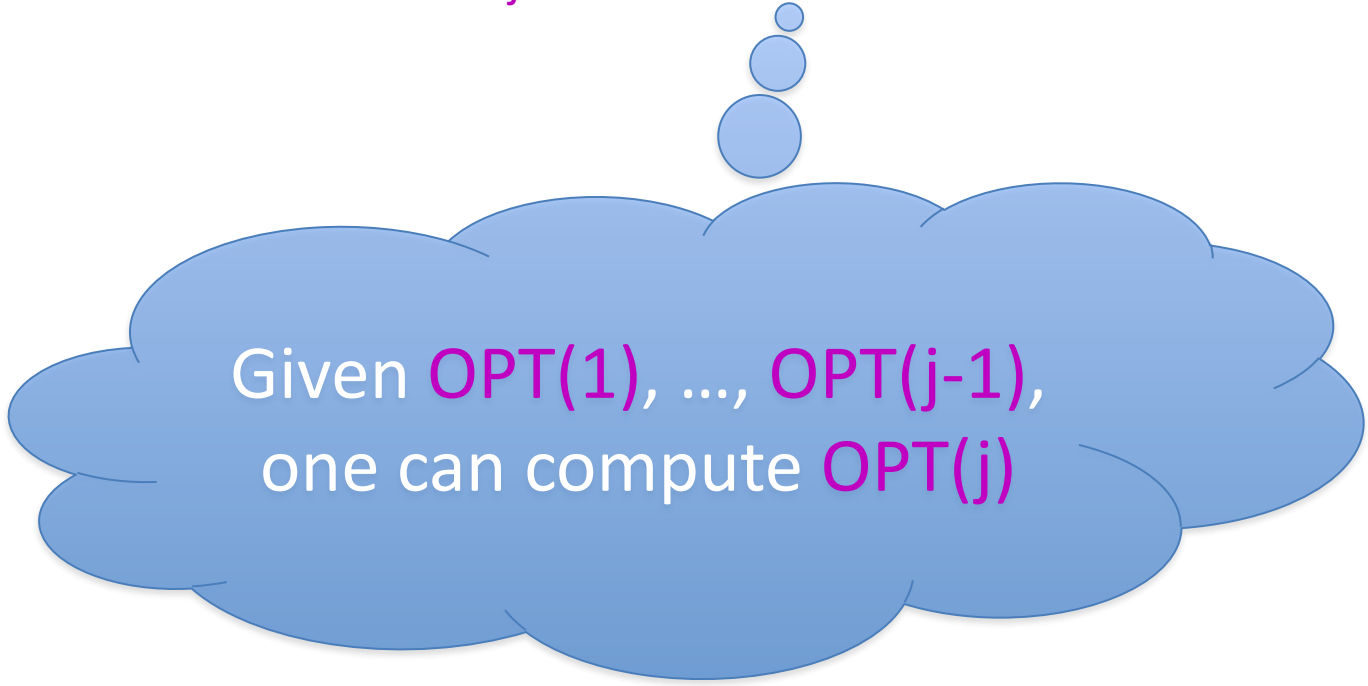
$O(n)$ overall

Whenever a recursive call is made an M value is assigned

At most n values of M can be assigned

Property of OPT

$$\text{OPT}(j) = \max \{ v_j + \text{OPT}(p(j)), \text{OPT}(j-1) \}$$



Given $\text{OPT}(1), \dots, \text{OPT}(j-1)$,
one can compute $\text{OPT}(j)$

Recursion+ memory = Iteration

Iteratively compute the OPT(j) values

Iterative-Compute-Opt

$M[0] = 0$

For $j=1, \dots, n$

$M[j] = \max \{ v_j + M[p(j)], M[j-1] \}$

$M[j] = \text{OPT}(j)$

$O(n)$ run time

Algo run on the board...

Reading Assignment

Sec 6.1, 6.2 of [KT]

When to use Dynamic Programming

There are polynomially many sub-problems

$$\text{OPT}(1), \dots, \text{OPT}(n)$$

Optimal solution can be computed from solutions to sub-problems

$$\text{OPT}(j) = \max \{ v_j + \text{OPT}(p(j)), \text{OPT}(j-1) \}$$

There is an ordering among sub-problem that allows for iterative solution

$$\text{OPT}(j) \text{ only depends on } \text{OPT}(j-1), \dots, \text{OPT}(1)$$



Richard Bellman

Scheduling to min idle cycles

n jobs, i^{th} job takes w_i cycles

You have W cycles on the cloud



What is the maximum number of cycles you can schedule?

Subset sum problem

Input: n integers w_1, w_2, \dots, w_n

bound W

Output: subset S of $[n]$ such that

(1) sum of w_i for all i in S is at most W

(2) $w(S)$ is maximized

Rest of today's agenda

Dynamic Program for Subset Sum problem

Algo on the board...