

# CS 4800: Algorithms & Data

Lecture 8

February 2, 2018

# Coin change

- Coin of denominations  $d_1, d_2, \dots, d_k$
- Wants to make change for  $n$  cents using as few coins as possible

# Memoization

- Initialize  $Best[0] \leftarrow 0$
- $ComputeBest(v)$ :
  - If  $Best[v]$  is calculated, return  $Best[v]$
  - Else
    - $Best[v] \leftarrow 1 + \min_{i=1\dots k, d_i \leq v} ComputeBest(v - d_i)$
    - Return  $Best[v]$

# Bottom-up style

- $Best[0] \leftarrow 0$
- For  $v$  from 1 to  $n$ 
  - $Best[v] \leftarrow 1 + \min_{i=1\dots k, d_i \leq v} Best[v - d_i]$

# Knapsack problem

- $n$  items, each with weight  $w_i$  and value  $v_i$
- Capacity  $S$
- Pick items with maximum total value without exceeding capacity
- Comparison with log cutter?

# First attempt

- Imitate our log cutter solution
- $\text{Best}(s)$  : best value from sack size  $s$
- Let the first item in the sack be item  $i$  with weight  $w_i$  and value  $v_i$
- The rest of the solution should be the best way to fill up capacity  $s-w_i$
- If not, we can sub in best solution for  $s-w_i$  and get a better solution for  $w$
- What's wrong?
- $\text{best}(s-w_i)$  might use item  $i$  and we cannot use  $i$  twice

# Example

- Capacity  $W=2$
- Two items
  - $w_1 = 1, v_1 = 2$
  - $w_2 = 2, v_2 = 3$
- $best(1) = 2$  (use item 1)
- $best(2) =$  ??  $2(\text{from item 1}) + best(1)$

# Second attempt

- Our subproblems need not only sack size  $w$  but also which items are available
- $\text{best}(i, w)$ : best value for sack size  $w$  using items  $i, i+1, \dots, n$ .



# Formulate recursion

- How to compute  $best(i, s)$ ?

- Either pick item  $i$  or not

- $best(i, s) = \max \begin{cases} best(i + 1, s) \\ best(i + 1, s - w_i) + v_i \end{cases}$

- Order to evaluate?

- From large  $i$  to small  $i$

# Knapsack DP

- For  $j \leftarrow 0$  to  $s$ 
  - $best[n + 1, j] \leftarrow 0$  // base case: no item, no value
- For  $i \leftarrow n$  downto  $1$  // add one item at a time
  - For  $j \leftarrow 0$  to  $s$ 
    - $best[i, j] \leftarrow best[i + 1, j]$  // not use item  $i$
    - If  $j \geq w_i$  and  $best[i + 1, j] < v_i + best[i + 1, j - w_i]$ 
      - $best[i, j] \leftarrow v_i + best[i + 1, j - w_i]$  // use item  $i$
- Return  $best[1, s]$

# Remember choices

- For  $j \leftarrow 0$  to  $s$ 
  - $best[n + 1, j] \leftarrow 0$  // base case: no item, no value
- For  $i \leftarrow n$  downto  $1$  // add one item at a time
  - For  $j \leftarrow 0$  to  $s$ 
    - $best[i, j] \leftarrow best[i + 1, j]$  // not use item  $i$
    - *$picked[i, j] \leftarrow False$*
    - If  $j \geq w_i$  and  $best[i + 1, j] < v_i + best[i + 1, j - w_i]$ 
      - $best[i, j] \leftarrow v_i + best[i + 1, j - w_i]$
      - *$picked[i, j] \leftarrow True$*
- Return  $best[1, s]$

# Retrace the solution

- $cap = s$
- $sol = \{\}$
- For  $i \leftarrow 1$  to  $n$ 
  - If  $picked[i, cap]$  then
    - $sol \leftarrow sol \cup \{i\}$
    - $cap \leftarrow cap - w_i$

3 items, capacity 5,  $w_1=w_2=w_3=2$ ,  $v_1=9$ ,  $v_2=8$ ,  $v_3=7$

items Cap	{1,2,3}	{2,3}	{3}	none
0				0
1				0
2				0
3				0
4				0
5				0
6				0

Answer =  $\text{best}[\{1,2,3\}, 5] = 17$

3 items, capacity 5,  $w_1=w_2=w_3=2$ ,  $v_1=9$ ,  $v_2=8$ ,  $v_3=7$

items Cap	{1,2,3}	{2,3}	{3}	none
0	0	0	0	0
1	0	0	0	0
2	Max(9,8)=9	Max(8,7)=8	7	0
3	9	8	7	0
4	Max(17,15)	15	7	0
5	17	15	7	0
6	Max(24,15)	15	7	0

Answer = best[{{1,2,3}, 5] = 17

# Blueprint of DP

- Model solution as a sequence of decisions
- Guess the first/last decision to reduce to smaller problems
- Relate subproblems via recurrence
- Either
  - Recursion and memoization
  - Determine evaluation order to build DP table bottom-up
- Solve original problem

# Blueprint of DP in log cutter

Subproblems	Best(t): max \$ from t-inch log for t=1...n
Guess	Thickness of last board
Recurrence	$Best(t) = \max_{i \leq t} (p_i + Best(t - i))$
Order	Compute Best(t) for t from 1 to n
Solve orig. problem	Return Best(n)



# Blueprint of DP in knapsack

Subproblems	
Guess	
Recurrence	
Order	
Solve orig. problem	

# Blueprint of DP in knapsack

Subproblems	Best(i, C): max value for sack size C with items {i,i+1, ..., n}
Guess	Whether pick item i or not
Recurrence	$Best(i, C) = \max(v_i + Best(i + 1, C - w_i), Best(i + 1, C))$
Order	Compute Best(i,C) for i from n down to 1
Solve orig. problem	Return Best(1, W)