

# Knapsack Problem 2

CS 491 – Competitive Programming

**Dr. Mattox Beckman**

UNIVERSITY OF ILLINOIS AT URBANA-CHAMPAIGN  
DEPARTMENT OF COMPUTER SCIENCE

Fall 2023



# Objectives

- ▶ Use a combination of divide and conquer to solve the knapsack-n problem.

# Running Example

- ▶ Suppose we have the following items:

$w$	$c$
5	15
4	10
1	1

- ▶ Demonstrate that a greedy algorithm will not work.
  - ▶ Hint: Use a bag of capacity 13.

# The intuition

- ▶ Suppose  $f(S)$  is the best solution we can get from a bag of size  $S$ .
- ▶ Then, for some  $0 < X < S$ , we have  $f(S) = f(S - X) + f(X)$ .
- ▶ Do you believe that?

# The intuition

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- ▶ Then, for some  $0 < X < S$ , we have  $f(S) = f(S - X) + f(X)$ .
- ▶ Do you believe that?

$w = 5, c = 15$

$w = 4, c = 10$

$w = 4, c = 10$

# How to pick $x$

- ▶ Let  $W$  be the maximum weight item (in our case, 5).

$$\begin{aligned} S_1 &= \lfloor \frac{S-W}{2} \rfloor + (S - W) \pmod{2} = 4 \\ S_2 &= \lfloor \frac{S+W}{2} \rfloor = 9 \end{aligned}$$

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## What we need to consider

- ▶ We need to consider all the pairs  
 $(S_1, S_2), (S_1 + 1, S_2 - 1), \dots, (S_1 + W/2, S_2 - W/2)$ .

$$f(13) = f(4) + f(9) = 10 + 20 = 30$$

$$f(13) = f(5) + f(8) = 15 + 20 = 35$$

$$f(13) = f(6) + f(7) = 16 + 17 = 33$$

- ▶ In this example, our best partition is at 5 and 8, giving us 35.

$w = 5, c = 15$

$w = 4, c = 10$

$w = 4, c = 10$

$w = 5, c = 15$

$w = 4, c = 10$

$w = 4, c = 10$

# Bigger Example

- ▶ Remember the weights:

$w$	$c$
5	15
4	10
1	1

- ▶ What is the optimum cost for a bag of size 58?
  - ▶  $S_1 = 27, S_2 = 31$
  - ▶ So we need to compute  $f(27) + f(31), f(28) + f(30), f(29) + f(29)$ .

## Bigger Example, Recurse!

- ▶ What is the optimum cost for a bag of size 53?
  - ▶  $S_1 = 27, S_2 = 31$
  - ▶ We will use recursion to compute  $f(27), \dots, f(31)$
- ▶ To compute  $f(27)$  we have  $S_1 = 11$ .
- ▶ To compute  $f(31)$  we have  $S_2 = 18$ .
  - ▶ We only compute  $S_1$  for the left and  $S_2$  for the right since we will need the whole range anyway.

## Bigger Example, Recurse!

- ▶ What is the optimum cost for a bag of size 53?
  - ▶  $S_1 = 27, S_2 = 31$
  - ▶ We will use recursion to compute  $f(27), \dots, f(31)$
  - ▶ To compute  $f(27)$  we have  $S_1 = 11$ .
  - ▶ To compute  $f(31)$  we have  $S_2 = 18$ .
- ▶ Recurse again on 11 and 18...
  - ▶  $S_1 = 3, S_2 = 11$ .
- ▶ The next recursion has  $S_1 \leq 0$ , so we stop here.

## Base Case

- Compute up to  $3W$  as a regular DP array.

```

1 for(long long i=0;i<N;i++) {
2     cin >> w[i] >> c[i];
3     maxw=max(maxw,w[i]);
4 }
5 for (long long i=0;i<N;i++)
6     for (long long j=w[i];j<=3*maxw;j++)
7         dp[j]=max(dp[j],dp[j-w[i]]+c[i]);

```

0	1	2	3	4	5	6	7	8	9	10	11	12	13	14	15
0	1	2	3	10	11	12	13	20	21	22	23	30	31	32	33
0	1	2	3	10	15	16	17	20	25	30	31	32	35	40	45

## Compute the S levels

```

8  e=0; S1=S; S2=S;
9  while(S1>0) {
10     l[e]=S1; r[e]=S2;
11     S1=(S1-maxw)/2+(S1-maxw)%2;
12     S2=(S2+maxw)/2;
13     e++;
14 }

```

For this case: we get

e	l	r
0	58	58
1	27	31
2	11	18
3	3	11

## Recursively compute answers

```
1  for(long long i=e-1;i>=0; i--) {
2      for (long long j=l[i];j<=r[i];j++) {
3          if(j<=3*maxw)
4              ans[i][j]=dp[j];
5          else for(long long k=(j-maxw)/2+(j-maxw)%2;
6                  k*2LL<=j;
7                  k++)
8              ans[i][j]=max(ans[i][j]
9                              ,ans[i+1][k]+ans[i+1][j-k]);
10     }
```

## Recursively compute answers, $e = 3$

```

1  for(long long i=e-1;i>=0; i--) {
2      for (long long j=l[i];j<=r[i];j++) {
3          if(j<=3*maxw)
4              ans[i][j]=dp[j];
5          else for(long long k=(j-maxw)/2+(j-maxw)%2;
6                  k*2LL<=j;
7                  k++)
8              ans[i][j]=max(ans[i][j]
9                             ,ans[i+1][k]+ans[i+1][j-k]);
10     }

```

►  $ans[3][3..11] = 3, 10, 15, 16, 17, 20, 25, 30, 31$



## Recursively compute answers, Rest of e

```

1  for(long long i=e-1;i>=0; i--) {
2      for (long long j=1[i];j<=r[i];j++) {
3          if(j<=3*maxw)
4              ans[i][j]=dp[j];
5          else for(long long k=(j-maxw)/2+(j-maxw)%2;
6                  k*2LL<=j;
7                  k++)
8              ans[i][j]=max(ans[i][j]
9                             ,ans[i+1][k]+ans[i+1][j-k]);
10     }

```

- ▶  $ans[3][3..11] = 3, 10, 15, 16, 17, 20, 25, 30, 31$
- ▶  $ans[2][11..18] = 31, 32, 35, 40, 45, 46, 47, 50$
- ▶  $ans[1][27..31] = 77, 80, 85, 90, 91$
- ▶  $ans[0][58] = 170$

# Optimization

- ▶ We don't need the whole array!!

```
1 for(long long i=e-1;i>=0; i--) {
2     for (long long j=l[i];j<=r[i];j++) {
3         if(j<=3*maxw)
4             ans[i][j-1[i]]=dp[j];
5         else for(long long k=(j-maxw)/2+(j-maxw)%2;
6                 k*2LL<=j;
7                 k++)
8             ans[i][j-1[i]]=max(ans[i][j-1[i]]
9                                 ,ans[i+1][k-1[i+1]] +
10                                 ans[i+1][j-k-1[i+1]]);
11     }
```