

Data Structures and Algorithms

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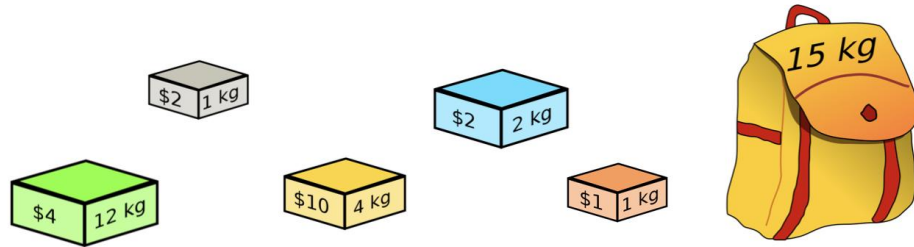
Lab 5

Dynamic Programming & Knapsack Problem

Agenda

- Recap
 - Dynamic Programming
- Knapsack Problem
- Coding exercises

Knapsack Problem



Knapsack Problem

$$S = \left\{ \begin{array}{|c|c|} \hline \$4 & 12 \text{ kg} \\ \hline \end{array}, \begin{array}{|c|c|} \hline \$2 & 1 \text{ kg} \\ \hline \end{array}, \begin{array}{|c|c|} \hline \$10 & 4 \text{ kg} \\ \hline \end{array}, \begin{array}{|c|c|} \hline \$2 & 2 \text{ kg} \\ \hline \end{array}, \begin{array}{|c|c|} \hline \$1 & 1 \text{ kg} \\ \hline \end{array} \right\}$$

Given weights and values of n items, put these items in a knapsack of capacity W to get the maximum total value in the knapsack.



Knapsack Problem

$$S = \left\{ \begin{array}{|c|c|} \hline \$4 & 12 \text{ kg} \\ \hline \end{array}, \begin{array}{|c|c|} \hline \$2 & 1 \text{ kg} \\ \hline \end{array}, \begin{array}{|c|c|} \hline \$10 & 4 \text{ kg} \\ \hline \end{array}, \begin{array}{|c|c|} \hline \$2 & 2 \text{ kg} \\ \hline \end{array}, \begin{array}{|c|c|} \hline \$1 & 1 \text{ kg} \\ \hline \end{array} \right\}$$

1. Total value should be maximized.
2. Total weight should not exceed the limit.
3. Each item can be taken (once) or not taken.



Note: this variation is commonly known as «0-1 Knapsack problem».

Knapsack Problem

value[] = {60, 100, 120};

weight[] = {10, 20, 30};

W = 50;

Solution: 220

Weight = 10; Value = 60;

Weight = 20; Value = 100;

Weight = 30; Value = 120;

Weight = (20+10); Value = (100+60);

Weight = (30+10); Value = (120+60);

Weight = (30+20); Value = (120+100);

Weight = (30+20+10) > 50

Recap: Algorithmic Strategies

- Brute Force
- Greedy
- Divide-and-Conquer
- Dynamic Programming

Knapsack Problem: Brute Force

$$S = \left\{ \begin{array}{c} \text{Green box} \\ \$4 \quad 12 \text{ kg} \end{array}, \begin{array}{c} \text{Grey box} \\ \$2 \quad 1 \text{ kg} \end{array}, \begin{array}{c} \text{Yellow box} \\ \$10 \quad 4 \text{ kg} \end{array}, \begin{array}{c} \text{Blue box} \\ \$2 \quad 2 \text{ kg} \end{array}, \begin{array}{c} \text{Orange box} \\ \$1 \quad 1 \text{ kg} \end{array} \right\}$$

Exercise 5.1. Suggest a brute-force algorithm for Knapsack Problem.

Exercise 5.2. Determine the time complexity of the brute force algorithm.



Knapsack Problem: Greedy

$$S = \left\{ \begin{array}{c} \text{Green box} \\ \$4 \quad 12 \text{ kg} \end{array}, \begin{array}{c} \text{Grey box} \\ \$2 \quad 1 \text{ kg} \end{array}, \begin{array}{c} \text{Yellow box} \\ \$10 \quad 4 \text{ kg} \end{array}, \begin{array}{c} \text{Blue box} \\ \$2 \quad 2 \text{ kg} \end{array}, \begin{array}{c} \text{Orange box} \\ \$1 \quad 1 \text{ kg} \end{array} \right\}$$

Exercise 5.3. Suggest a greedy algorithm for Knapsack Problem.

Exercise 5.4. Determine the time complexity of the greedy algorithm.



Knapsack Problem: Greedy

$$S = \left\{ \begin{array}{c} \text{Green Box} \\ \$4 \quad 12 \text{ kg} \end{array}, \begin{array}{c} \text{Grey Box} \\ \$2 \quad 1 \text{ kg} \end{array}, \begin{array}{c} \text{Yellow Box} \\ \$10 \quad 4 \text{ kg} \end{array}, \begin{array}{c} \text{Blue Box} \\ \$2 \quad 2 \text{ kg} \end{array}, \begin{array}{c} \text{Orange Box} \\ \$1 \quad 1 \text{ kg} \end{array} \right\}$$

Exercise 5.3. Suggest a greedy algorithm for Knapsack Problem.

Exercise 5.4. Determine the time complexity of the greedy algorithm.

Exercise 5.5. Prove that greedy algorithm is not always correct or demonstrate a counterexample.



Knapsack Problem: Divide and Conquer

$$S = \left\{ \begin{array}{|c|c|} \hline \$4 & 12 \text{ kg} \\ \hline \end{array}, \begin{array}{|c|c|} \hline \$2 & 1 \text{ kg} \\ \hline \end{array}, \begin{array}{|c|c|} \hline \$10 & 4 \text{ kg} \\ \hline \end{array}, \begin{array}{|c|c|} \hline \$2 & 2 \text{ kg} \\ \hline \end{array}, \begin{array}{|c|c|} \hline \$1 & 1 \text{ kg} \\ \hline \end{array} \right\}$$

Exercise 5.6. Suggest divide-and-conquer algorithm for Knapsack Problem.

Exercise 5.7. Determine the time complexity of the divide-and-conquer algorithm.



Knapsack Problem: Divide and Conquer

$$S = \left\{ \begin{array}{|c|c|} \hline \$4 & 12 \text{ kg} \\ \hline \end{array}, \begin{array}{|c|c|} \hline \$2 & 1 \text{ kg} \\ \hline \end{array}, \begin{array}{|c|c|} \hline \$10 & 4 \text{ kg} \\ \hline \end{array}, \begin{array}{|c|c|} \hline \$2 & 2 \text{ kg} \\ \hline \end{array}, \begin{array}{|c|c|} \hline \$1 & 1 \text{ kg} \\ \hline \end{array} \right\}$$

Exercise 5.6. Suggest divide-and-conquer algorithm for Knapsack Problem.

Exercise 5.7. Determine the time complexity of the divide-and-conquer algorithm.

Exercise 5.8. Determine opportunities for optimisation by identifying overlapping subproblems in the divide-and-conquer approach.



Knapsack Problem: Divide and Conquer

Knapsack problem: divide & conquer

$$S = \{ \text{\$4 } 12 \text{ kg}, \text{\$2 } 1 \text{ kg}, \text{\$10 } 4 \text{ kg}, \text{\$2 } 2 \text{ kg}, \text{\$1 } 1 \text{ kg} \}$$



Should we take this item?

If we **do** take



If we **do not** take



- Capacity is reduced by 2 kg
- Total value is increased by \$2
- We have one less item to consider

- We have one less item to consider

$$S = \{ \text{\$4 } 12 \text{ kg}, \text{\$2 } 1 \text{ kg}, \text{\$10 } 4 \text{ kg}, \text{\$1 } 1 \text{ kg} \}$$

Knapsack Problem: Divide and conquer

$$S = \left\{ \begin{array}{|c|c|} \hline \$4 & 12 \text{ kg} \\ \hline \end{array}, \begin{array}{|c|c|} \hline \$2 & 1 \text{ kg} \\ \hline \end{array}, \begin{array}{|c|c|} \hline \$10 & 4 \text{ kg} \\ \hline \end{array}, \begin{array}{|c|c|} \hline \$2 & 2 \text{ kg} \\ \hline \end{array}, \begin{array}{|c|c|} \hline \$1 & 1 \text{ kg} \\ \hline \end{array} \right\}$$

1. Consider all subsets of items and calculate the total weight and value of all subsets.
2. pick the maximum value subset:
 - a. Maximum value obtained by n-1 items and W weight (excluding nth item).
 - b. Value of nth item plus maximum value obtained by n-1 items and W minus the weight of the nth item (including nth item).



Knapsack Problem: Recursive Function

$$f(items, W_{max})$$

maximum total value for a specific instance of Knapsack problem

Knapsack Problem: Recursive Function

$$f(items, W_{max})$$

maximum total value for a specific instance of Knapsack problem

$$f(\emptyset, W) = 0$$

$$f(\{item\} \cup items, W) = \max(\underbrace{f(items, W)}_{\text{What if we do not take it?}}, \underbrace{item.value + f(items, W - item.weight)}_{\text{What if we do take it?}})$$

Should we take **this** item?

What if we **do not** take it?

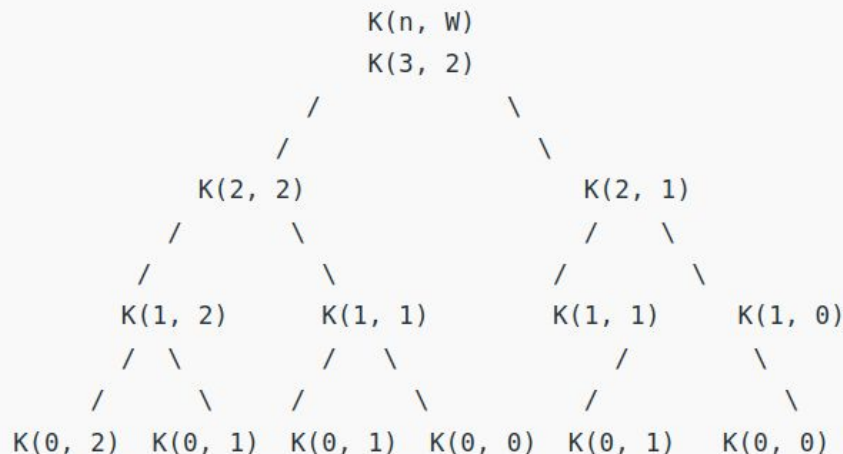
What if we **do** take it?

Knapsack Problem: Divide and conquer

- This approach computes the same sub-problems again and again.
- In the recursion tree, $K(1, 1)$ is being evaluated twice.
- The time complexity of this naive recursive solution is exponential (2^n).

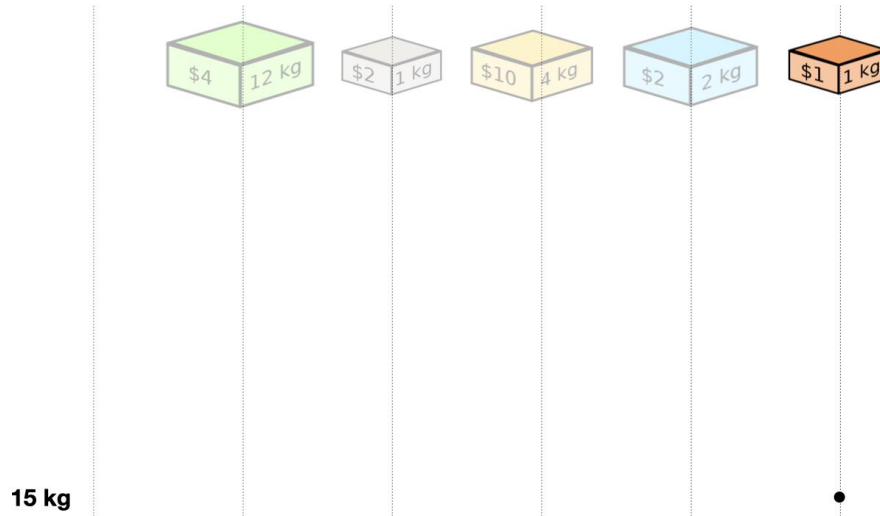
In the following recursion tree, $K()$ refers to `knapSack()`. The two parameters indicated in the following recursion tree are n and W .

The recursion tree is for following sample inputs.
`wt[] = {1, 1, 1}`, `W = 2`, `val[] = {10, 20, 30}`



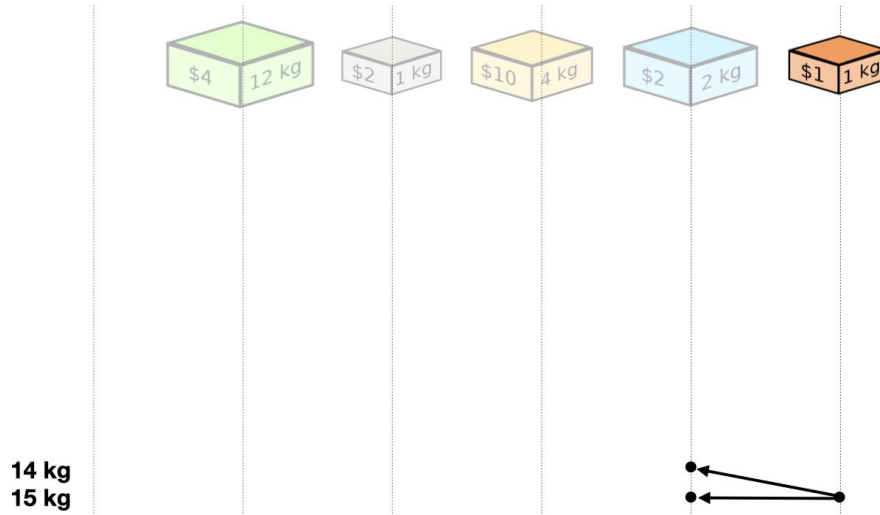
Knapsack Problem: Subproblem Space

Knapsack problem: divide & conquer



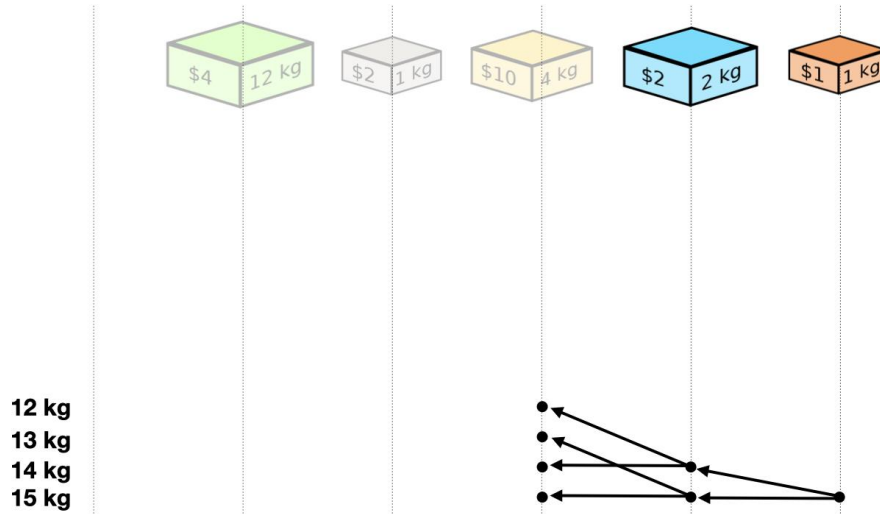
Knapsack Problem: Subproblem Space

Knapsack problem: divide & conquer



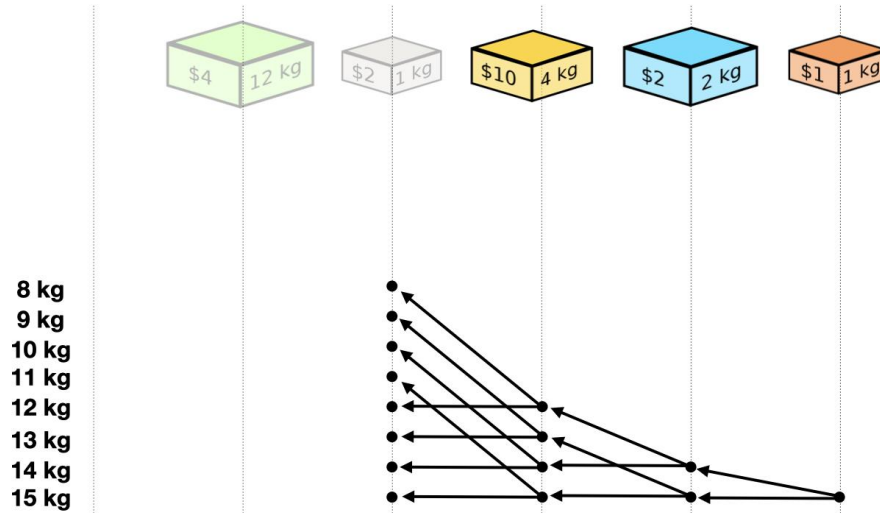
Knapsack Problem: Subproblem Space

Knapsack problem: divide & conquer



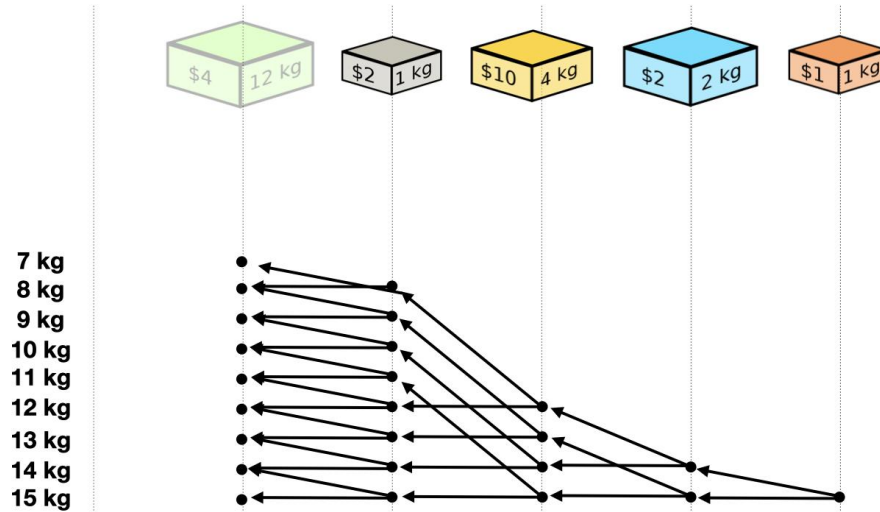
Knapsack Problem: Subproblem Space

Knapsack problem: divide & conquer



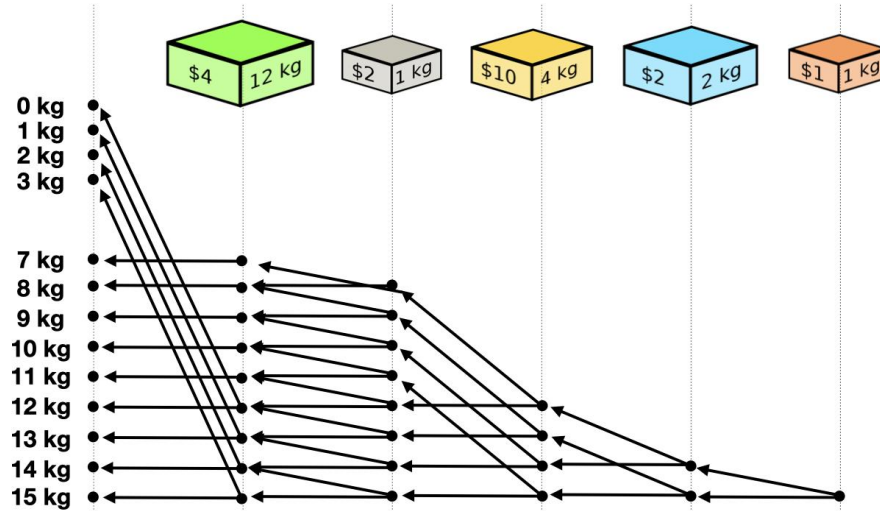
Knapsack Problem: Subproblem Space

Knapsack problem: divide & conquer



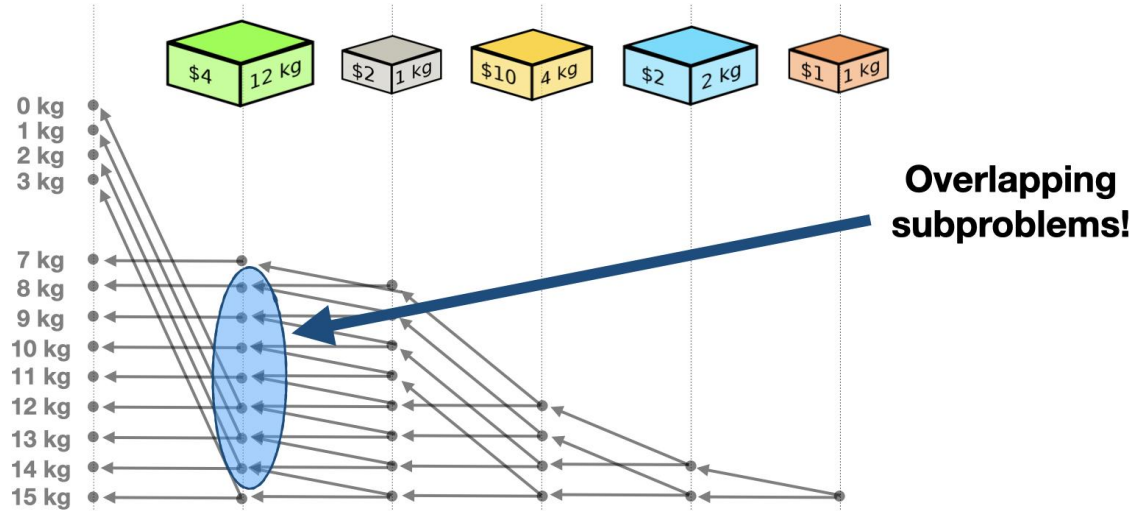
Knapsack Problem: Subproblem Space

Knapsack problem: divide & conquer



Knapsack Problem: Subproblem Space

Knapsack problem: divide & conquer



Dynamic Programming

Top-down approach

- Use recursive algorithm
- Memoize solutions for subproblems

Bottom-up approach

- Solve smaller subproblems first
- Then build up on those to solve bigger subproblems
- Repeat

Dynamic Programming

1. In a $DP[i][j]$ table, consider all the possible weights from '1' to 'W' as the columns and weights that can be kept as the rows.
2. The state $DP[i][j]$ will denote maximum value of 'j-weight' considering all values from '1 to ith'.
3. Now we have to take a maximum of two possibilities,
 - a. if we do not fill 'ith' weight in 'jth' column then $DP[i][j]$ state will be same as $DP[i-1][j]$
 - b. but if we fill the weight, $DP[i][j]$ will be equal to the value of 'wi' + value of the column weighing 'j-wi' in the previous row.
 - c. So we take the maximum of these two possibilities to fill the current state.

- **Time Complexity: $O(N*W)$.**

where 'N' is the number of weight element and 'W' is capacity. As for every weight element we traverse through all weight capacities $1 \leq w \leq W$.

Dynamic Programming (example)

```
Let weight elements = {1, 2, 3}
Let weight values = {10, 15, 40}
Capacity=6
```

	0	1	2	3	4	5	6
0	0	0	0	0	0	0	0
1	0	0	10	10	10	10	10
2	0	0	10	15	25	25	25
3	0	0	0	0	0	0	0

Explanation:

For filling 'weight = 2' we come across 'j = 3' in which we take maximum of $(10, 15 + DP[1][3-2]) = 25$

'2'	'2 filled'
not filled	

	0	1	2	3	4	5	6
0	0	0	0	0	0	0	0
1	0	0	10	10	10	10	10
2	0	0	10	15	25	25	25
3	0	0	10	15	40	50	65




Explanation:

For filling 'weight=3', we come across 'j=4' in which we take maximum of $(25, 40 + DP[2][4-3]) = 50$

For filling 'weight=3' we come across 'j=5' in which we take maximum of $(25, 40 + DP[2][5-3]) = 55$


For filling 'weight=3' we come across 'j=6' in which we take maximum of $(25, 40 + DP[2][6-3]) = 65$





Knapsack Problem: Dynamic Programming

					
0 kg					
1 kg					
2 kg					
3 kg					
4 kg					
5 kg					
6 kg					
7 kg					
8 kg					
9 kg					
10 kg					
11 kg					
12 kg					
13 kg					
14 kg					
15 kg					

Knapsack Problem: CodeForces

[PROBLEMS](#) [SUBMIT CODE](#) [MY SUBMISSIONS](#) [STATUS](#) [STANDINGS](#) [CUSTOM INVOCATION](#)

Problems 

#	Name		
A	Knapsack (Brute Force)	standard input/output 2 s, 256 MB	 
B	Knapsack Problem	standard input/output 0.25 s, 256 MB	 

[Complete problemset](#)

<https://codeforces.com/group/M5kRwzPJIU/contest/369148>

See You next week!