

**Problem 1. (6 pts)**

- a) Assume the following symbols  $a, b, c, d, e$  occur with frequencies  $1/2, 1/4, 1/8, 1/16, 1/16$  respectively. What is the Huffman encoding of the alphabet? (3 pts)
- b) If the encoding is applied to a file consisting of 1 million characters with the same given frequencies, what is the length of the encoded file in bits? (3 pts)

**SOLUTION:**

a -> 0  
b -> 10  
c -> 110  
d -> 1110  
e -> 1111

$$\text{length} = \frac{1000000}{2} \cdot 1 + \frac{1000000}{4} \cdot 2 + \frac{1000000}{8} \cdot 3 + 2 \cdot \frac{1000000}{16} \cdot 4 = 1,875,000$$

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**Problem 2. (5 pts)**

Complete problem 16.2-2 on page 427 in the book

**SOLUTION:**

The solution is based on the optimal-substructure observation in the text: Let  $i$  be the highest-numbered item in an optimal solution  $S$  for  $W$  pounds and items  $1, \dots, n$ . Then  $S' = S - \{i\}$  must be an optimal solution for  $W - w_i$  pounds and items  $1, \dots, i - 1$ , and the value of the solution  $S$  is  $v_i$  plus the value of the subproblem solution  $S'$ .

We can express this relationship in the following formula: Define  $c[i, w]$  to be the value of the solution for items  $1, \dots, i$  and maximum weight  $w$ . Then

$$c[i, w] = \begin{cases} 0 & \text{if } i = 0 \text{ or } w = 0, \\ c[i - 1, w] & \text{if } w_i > w, \\ \max(v_i + c[i - 1, w - w_i], c[i - 1, w]) & \text{if } i > 0 \text{ and } w \geq w_i. \end{cases}$$

The last case says that the value of a solution for  $i$  items either includes item  $i$ , in which case it is  $v_i$  plus a subproblem solution for  $i - 1$  items and the weight excluding  $w_i$ , or doesn't include item  $i$ , in which case it is a subproblem solution for  $i - 1$  items and the same weight. That is, if the thief picks item  $i$ , he takes  $v_i$  value, and he can choose from items  $1, \dots, i - 1$  up to the weight limit  $w - w_i$ , and get  $c[i - 1, w - w_i]$  additional value. On the other hand, if he decides not to take item  $i$ , he can choose from items  $1, \dots, i - 1$  up to the weight limit  $w$ , and get  $c[i - 1, w]$  value. The better of these two choices should be made.

The algorithm takes as inputs the maximum weight  $W$ , the number of items  $n$ , and the two sequences  $v = \langle v_1, v_2, \dots, v_n \rangle$  and  $w = \langle w_1, w_2, \dots, w_n \rangle$ . It stores the  $c[i, j]$  values in a table  $c[0..n, 0..W]$  whose entries are computed in row-major order. (That is, the first row of  $c$  is filled in from left to right, then the second row,

and so on.) At the end of the computation,  $c[n, W]$  contains the maximum value the thief can take.

```
DYNAMIC-0-1-KNAPSACK( $v, w, n, W$ )
let  $c[0..n, 0..W]$  be a new array
for  $w = 0$  to  $W$ 
     $c[0, w] = 0$ 
for  $i = 1$  to  $n$ 
     $c[i, 0] = 0$ 
    for  $w = 1$  to  $W$ 
        if  $w_i \leq w$ 
            if  $v_i + c[i - 1, w - w_i] > c[i - 1, w]$ 
                 $c[i, w] = v_i + c[i - 1, w - w_i]$ 
            else  $c[i, w] = c[i - 1, w]$ 
        else  $c[i, w] = c[i - 1, w]$ 
```

We can use the  $c$  table to deduce the set of items to take by starting at  $c[n, W]$  and tracing where the optimal values came from. If  $c[i, w] = c[i - 1, w]$ , then item  $i$  is not part of the solution, and we continue tracing with  $c[i - 1, w]$ . Otherwise item  $i$  is part of the solution, and we continue tracing with  $c[i - 1, w - w_i]$ .

The above algorithm takes  $\Theta(nW)$  time total:

- $\Theta(nW)$  to fill in the  $c$  table:  $(n + 1) \cdot (W + 1)$  entries, each requiring  $\Theta(1)$  time to compute.
- $O(n)$  time to trace the solution (since it starts in row  $n$  of the table and moves up one row at each step).

### Problem 3. (8 pts)

Consider the problem of making change for  $n$  cents using the fewest number of coins. Assume that each coin's value is an integer.

Problem 3.a. (4 points)

- a) Suppose that the available coins are in the denominations that are powers of  $c$ , i.e., the denominations are  $c^0; c^1; \dots; c^k$  for some integers  $c > 1$  and  $k \geq 1$ . Show that the greedy algorithm of *picking the largest denomination* first always yields an optimal solution. You are expected to reason about why this approach gives an optimal solution. (*Hint: Show that for each denomination  $c^i$ , the optimal solution must have less than  $c$  coins.*)

Problem 3.b. (4 points)

- b) Design an  $O(nk)$  time algorithm that makes change for any set of  $k$  different coin denominations, assuming that one of the coins is 3 cents in value.

**Solution 1:** An algorithm that accepts only denominations that are powers of  $c$  and implements the greedy approach. This way, all we need is to go through the denomination in a decreasing order and pick as many as the largest denominations we can, subtract the result from  $n$  and recurse. The complexity of this approach is  $O(k)$ .

*Example:*

```
denomination      # Loop to create an array of the different denominations from c and k
```

Reverse sort (denomination)      # For the greedy algorithm to pick the largest denomination first

making change function (n, denomination):

```
changed          # array to store the coins that are used to make change for n cents
```

[illegible]

```
coin ← denomination[i]
```

```
if n > 0 # only change if the amount for making change is > 0
```

```
while n >= coin      # loop to make as many changes for the current largest denomination
```

```
n ← n - coin      # update the amount
```

```
changed ← coin      # add the coin that was used to make the change
```

The outer for loop runs n number of times through a set of denominations to use the largest value first and thus has a time complexity of  $O(n)$ . The inner while loop runs k number of times to make as many changes for a given denomination and thus has a time complexity of  $O(k)$ . Therefore, the overall time complexity is  $O(nk)$ .

Solution 2: For the general case, we can reason in terms of the optimal substructure as follows:

Let  $count[j]$  be the minimum number of coins we need to make change for  $j$  cents. First off, for  $j \leq 0$  we have  $count[j] = 0$ . Next, if an optimal solution for  $count[j]$  contains a coin from denomination  $d_i < j$ , then we have  $count[j] = 1 + count[j - d_i]$ . Thus, we can write the following recursive function that captures the optimal substructure:

If  $j \leq 0$  then  $count[j] = 0$ . Otherwise (i.e.,  $j > 1$ ),  $count[j] = 1 + \min_{1 \leq i \leq k} \{count[j - d_i]\}$ .

Let  $denom[1..n]$  be an array and  $denom[j]$  represent a denomination used in an optimal solution of the make change problem for  $j$ . Notice that,  $count[j]$  shows how many coins of denomination  $denom[j]$  we have. The sketch of the algorithm would be something similar to the following:

MakeChange( $k, d, n$ ) { //  $d_1, d_2, \dots, d_k$  are the denominations

    for  $j = 1$  to  $n$

$count[j] = \infty$

        for  $i = 1$  to  $k$

            if  $((j \geq d_i) \text{ and } (1 + count[j - d_i] < count[j]))$  then

$count[j] = 1 + count[j - d_i]$

$denom[j] = d_i$

    return arrays  $count[]$  and  $denom[]$ ;

}

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#### Problem 4. (6 pts)

Implementation:

Implement the make change algorithm you designed in the previous problem. Your program should read a text file "data.txt" where each line in "data.txt" contains three values  $c$ ,  $k$  and  $n$ . Please make sure you take your input in the specified order  $c$ ,  $k$  and  $n$ . For example, a line in "data.txt" may look like the following:

4 3 73

where  $c = 4$ ;  $k = 3$ ;  $n = 73$ . That is, the set of denominations is  $\{4^0; 4^1; 4^2; 4^3\} = \{1; 4; 16; 64\}$ , and we would like to make change for  $n = 73$ . The file "data.txt" may include multiple lines like above.

The output will be written to a file called "change.txt", where the output corresponding to each input line contains a few lines. Each line has two numbers, where the first number denotes a denomination and the second number represents the cardinality of that denomination in the solution. For example, for the above input line '4 3 73', the optimal solution is the multiset  $\{64; 4; 4; 1\}$ , and the output in the file "change.txt" is as follows:

Data input:  $c = 4$ ,  $k = 3$ ,  $n = 73$

Denomination: 64 Quantity: 1  
Denomination: 16 Quantity: none  
Denomination: 4 Quantity: 2  
Denomination: 1 Quantity: 1

which means the solution contains one coin of denomination 64, none of 16, two coins of 4, and one coin of 1. You can use a delimiter line to separate the outputs generated for different input lines.

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#### Problem 5 – Extra Credit (4 pts)

- a) Using Huffman encoding of  $n$  symbols with the frequencies  $f_1, f_2, f_3 \dots f_n$ , what is the longest a codeword could possibly be? (2pts)
- b) Give at least one example set of frequencies that would produce the case above. (2pts)

#### SOLUTION:

The longest codeword can be a length of  $n-1$ . Encoding of  $n$  symbols with of them have probabilities of  $1/2, 1/4, \dots, 1/2^{n-2}$ . Only 2 of them having a probability  $1/2^{n-1}$  to get this value.

**Submit a copy of all your code files and a README file that explains how to compile and run your code in a ZIP file to TEACH. We will only test execution with an input file named data.txt.**