



Greedy Algorithms

Charlie Li



Coin Problem

- Suppose you are given infinitely many coins of the following values:
- \$10, \$5, \$2, \$1, \$0.5, \$0.2, \$0.1
- What is the minimum number of coins needed to get \$M where
 - (i) $M = 1.9$
 - (ii) $M = 7.8$
 - (iii) $M = 16.1$



Coin Problem

➤ Answers:

➤ (i) 4

➤ (ii) 5

➤ (iii) 4

➤ Why can we get the answer so quickly?



Coin Problem

- ▶ Cashier's algorithm
 - ▶ While there are outstanding amount, we take one of the coin with largest value but not exceeding the outstanding amount
- ▶ (x) means the outstanding amount
- ▶ $(\$1.9) = \$1 + (\$0.9) = \$1 + \$0.5 + (\$0.4) = \$1 + \$0.5 + \$0.2 + \0.2
- ▶ $(\$7.8) = \$5 + (\$2.8) = \$5 + \$2 + (\$0.8) = \$5 + \$2 + \$0.5 + (\$0.3) = \$5 + \$2 + \$0.5 + \$0.2 + \$0.1$
- ▶ $(\$16.1) = \$10 + (\$6.1) = \$10 + \$5 + (\$1.1) = \$10 + \$5 + \$1 + \0.1



Coin Problem

- ▶ Does Cashier's algorithm always give us the optimal solution for HK's coins ?
 - ▶ $\{\$10, \$5, \$2, \$1, \$0.5, \$0.2, \$0.1\}$
- ▶ Is there any counter example? If no, why is it optimal?
- ▶ If you cannot come up with the answer, never mind, let's look at another example

Coin Problem

- Consider the system of stamps
- \$5, \$3.7, \$3.1, \$2.9, \$2.3, \$2.2, \$2, \$1.7, \$1, \$0.5, \$0.2, \$0.1
- What is the minimum number of stamps needed to get \$M where
 - (i) $M = 1.9$
 - (ii) $M = 7.8$
 - (iii) $M = 16.1$





Coin Problem

- Using the same algorithm,
- (i) $\$1.9 = \$1.7 + \$0.2$
- (ii) $\$7.8 = \$5 + \$2.3 + \0.5
- (iii) $\$16.1 = \$5 + \$5 + \$5 + \$1 + \0.1

- The algorithm gives optimal solution for (i) and (ii) but not (iii)
- $\$16.1 = \$5 + \$3.7 + \$3.7 + \$3.7$
- We can use 4 stamps only but greedy told us 5



Coin Problem

- ▶ Go back to the original problem
- ▶ Why the Cashier's algorithm gives us the optimal solution for the coins with value $\{\$10, \$5, \$2, \$1, \$0.5, \$0.2, \$0.1\}$
- ▶ Let's see if there are any properties for the optimal solution



Coin Problem



- ▶ Property 1

- ▶ The optimal solution contains at most one \$0.1 coin.
 - ▶ If there are more than one \$0.1 coin, we can change two \$0.1 into one \$0.2
- ▶ Similarly, the optimal solution contains at most one \$5, \$1, \$0.5

- ▶ Property 2

- ▶ The optimal solution contains at most two \$0.2 coins.
 - ▶ If there are more than two \$0.2 coins, we can change three \$0.2 into \$0.5 and \$0.1
- ▶ Similarly, the optimal solution contains at most two \$2

- ▶ Property 3

- ▶ The optimal solution contains no \$0.1 coins if it contains two \$0.2 coins
 - ▶ If there are one \$0.1 and two \$0.2, we can change them to \$0.5
- ▶ Similarly, optimal solution contains no \$1 coins if it contains two \$2 coins



Coin Problem

| Value of coin | Constraint | Max. value if we only use coins with less value |
|---------------|------------------------------|---|
| \$0.1 | At most 1 | \$0 |
| \$0.2 | At most 2 no \$0.1 when 2 | \$0.1 |
| \$0.5 | At most 1 | \$0.4 |
| \$1 | At most 1 | \$0.9 |
| \$2 | At most 2 no \$1 when 2 | \$1.9 |
| \$5 | At most 1 | \$4.9 |
| \$10 | No limit | \$9.9 |



Coin Problem

- ▶ From the table, we cannot get \$10 just using coins less than \$10, so we must use \$10 coin
- ▶ This is also true for \$5, \$2, \$1, \$0.5, \$0.2 and \$0.1
- ▶ So Cashier's Algorithm can give optimal solution for HK's coin system

Greedy Algorithm

- ▶ A greedy algorithm attempt to solve the problem by choosing locally optimal step and reduce the original problem into another sub-problem then solve the sub-problem using the same strategy
- ▶ It is not a specific algorithm, it is just an idea
- ▶ It is important to know that for a greedy algorithm, the previous choices should not affect the decision
- ▶ Unlike brute force and DP (will be taught in April), a greedy algorithm may not always give an optimal solution, eg. The stamp system





Coin Problem – How Greedy?

- ▶ Answer to main problem =
 - ▶ Optimal step's effect to answer + Answer to sub-problem
- ▶ Problem: Remaining amount K
 - ▶ We will greedily take a coin with largest value but not exceeding K
 - ▶ We will take a coin d where $d = \max\{D_i | D_i \leq K\}$
 - ▶ The sub-problem is remaining amount $K - d$
 - ▶ Answer for remaining amount K : $\text{Ans}(K) = 1 + \text{Ans}(K - d)$
 - ▶ Answer to main problem: $\text{Ans}(N)$
 - ▶ Base case: $\text{Ans}(0) = 0$

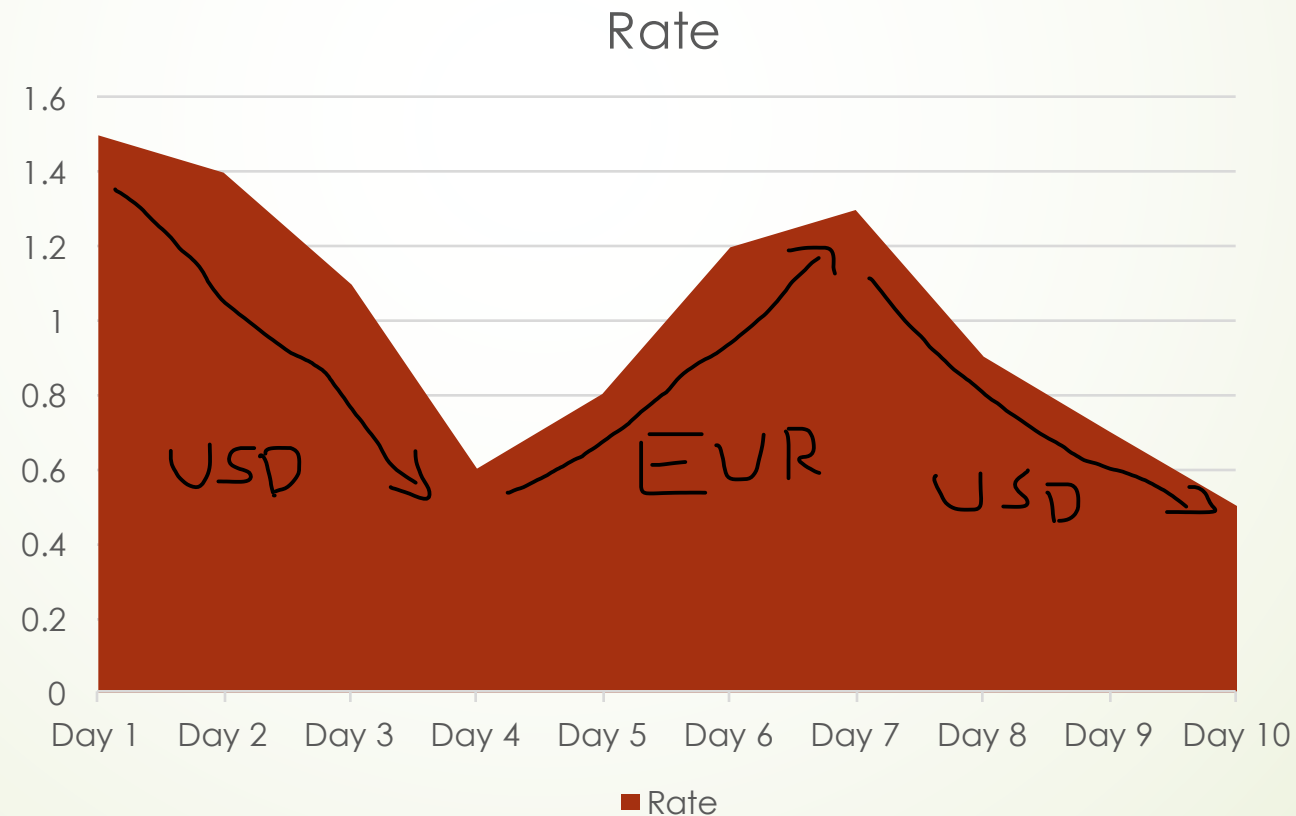


J042 Currency Exchange

- You know the exact exchange rate between USD and EUR for the following N days, you have US\$ M at day 1, how much USD will you have if you trade optimally?

J042 Currency Exchange

- When thinking greedily, we should be holding EUR when the rate increase and holding USD when the rate decreases





J042 Currency Exchange

- ▶ Try this input:

10 100

1.5 1.4 1.1 0.6 0.8 1.2 1.3 0.9 0.7 0.5

- ▶ Between day 1 and day 2, we will do nothing since the rate decreases
- ▶ Between day 2 and day 3, we will do nothing since the rate decreases
- ▶ ...
- ▶ Between day 4 and day 5, we will change to EUR at day 4 and change back at day 5 since the rate increases
- ▶ ...

J042 Currency Exchange

► The code looks like this:

```
1 #include<stdio>
2
3 int n;
4 double m, c[10004];
5
6 int main() {
7     scanf("%d %lf", &n, &m);
8     for (int i = 0; i < n; i++) scanf("%lf", &c[i]);
9     for (int i = 1; i < n; i++)
10         if (c[i - 1] > c[i])
11             m = m/c[i]*c[i - 1];
12     printf("%.2lf\n", m);
13 }
```



J042 Currency Exchange

- Why is this optimal?
- What if we hold EUR when the rate increase?
- What if we hold USD when the rate decrease?
- How are these compare to our greedy solution?



Fractional Knapsack

- Suppose you have a cup with volume V ml.
- There are N flavors of drinks, for each flavor, there are only a_i ml available and contain a total of s_i g sugar
- At most how many grams of sugar can you consume if you fill up the cup optimally?



Fractional Knapsack

| Flavor | Volume available (ml) | Total sugar (g) |
|--------|-----------------------|-----------------|
| A | 320 | 35 |
| B | 220 | 0 |
| C | 240 | 40 |
| D | 200 | 30 |

Fractional Knapsack

- We can just sort the flavors according to sugar per unit volume, and then fill up our cup according to the order

| Flavor | Volume available (ml) | Total sugar (g) | Sugar per volume | Used |
|--------|-----------------------|-----------------|------------------|------|
| C | 240 | 40 | 0.167 | 240 |
| D | 200 | 30 | 0.15 | 200 |
| A | 320 | 35 | 0.109 | 160 |
| B | 220 | 0 | 0 | 0 |

Fractional Knapsack

- Why is this optimal?
- Try to answer seeing what will happen if we change some of C into D, A or B

| Flavor | Volume available (ml) | Total sugar (g) | Sugar per volume | Used |
|--------|-----------------------|-----------------|------------------|------|
| C | 240 | 40 | 0.167 | 240 |
| D | 200 | 30 | 0.15 | 200 |
| A | 320 | 35 | 0.109 | 160 |
| B | 220 | 0 | 0 | 0 |

0-1 Knapsack

- What will happen if the question is changed to “If you used some flavor X, you must use up all flavor X”
- Can we still use greedy? Can you think of counter example?

| Flavor | Volume available (ml) | Total sugar (g) | Sugar per volume | Choice |
|--------|-----------------------|-----------------|------------------|----------|
| C | 240 | 40 | 0.167 | 0 or 240 |
| D | 200 | 30 | 0.15 | 0 or 200 |
| A | 320 | 35 | 0.109 | 0 or 320 |
| B | 220 | 0 | 0 | 0 or 220 |



S011 Activities

- ▶ You have N activities to join.
- ▶ The i^{th} activity start at S_i and end at E_i
- ▶ For any two activities, you can join both of them iff they do not overlap
- ▶ Find the max. no. activities you can join



S011 Activities

- ▶ 4 ways to greedy:
 - ▶ (1) Attend the activity with smallest starting time
 - ▶ (2) Attend the activity with smallest ending time
 - ▶ (3) Attend the activity with smallest conflicts
 - ▶ (4) Attend the activity with shortest interval
- ▶ Three of them are wrong, do you know which three?
- ▶ What are the counter examples?



S011 Activities

- ▶ The correct answer is (2) attend the activity with smallest ending time
- ▶ We first sort the activities with ascending end time.
- ▶ Then we will attend the first one. (local optimal step)
- ▶ So we cannot join any other activities before the one end, we just eliminate those we cannot join. (Reduce to sub-problem)
- ▶ Repeat until there are no activities left. (base case)

S011 Activities

➤ The code looks like this:

```
13 bool cmp(activity x, activity y) {
14     return x.e < y.e;
15 }
16
17 bool cmp2(activity x, activity y) {
18     return x.i < y.i;
19 }
20
21 int main() {
22     cin >> n;
23     for (int i = 1; i <= n; i++) {
24         cin >> a[i].s >> a[i].e;
25         a[i].i = i;
26     }
27     sort(a + 1, a + n + 1, cmp);
28     for (int i = 1, j = 0; i <= n; i++) {
29         if (a[i].s < j) continue;
30         j = a[i].e;
31         a[i].u = true;
32         c++;
33     }
34     sort(a + 1, a + n + 1, cmp2);
35     cout << c << endl;
36     for (int i = 1; i <= n; i++) if (a[i].u) cout << i << endl;
37 }
```



S011 Activities

- ▶ Why is this optimal?
- ▶ Consider only 2 activities, if we cannot join both, which should we join?
- ▶ We should join the one which ends earlier, because this can help us reserve more time to join other activities
- ▶ By applying the same argument to all pairs of activities, we know that always attending the one with smallest ending time is the best.



M1713 Biscuit Clicker

- ▶ When the production rate is P , Alice will get a biscuit every $1/P$ seconds
- ▶ The basic production rate is 1
- ▶ There are N upgrades where every upgrade can be bought at most once
- ▶ For the i^{th} upgrade, the cost is C_i and it multiply the production rate by P_i
- ▶ Find the fastest way to collect K biscuits in the bank

M1713 Biscuit Clicker

- ▶ If we consider only two upgrades
- ▶ We will buy upgrade i before j if

$$C_i + \frac{C_j}{P_i} \leq C_j + \frac{C_i}{P_j}$$

- ▶ If we consider only one upgrade
- ▶ We will buy upgrade i if

$$C_i + \frac{K}{P_i} \leq K$$

- ▶ Actually, if we sort according to the first inequality and pick upgrades according to the second inequality, this will give us the full solution

M1713 Biscuit Clicker

► The code looks like this:

```
10 bool cmp(int x, int y) {
11     return c[x] + 1. * c[y] / p[x] < c[y] + 1. * c[x] / p[y];
12 }
13
14 int main() {
15     cin >> n >> k;
16     for (int i = 0; i < n; i++) f[i] = i;
17     for (int i = 0; i < n; i++) cin >> c[i] >> p[i];
18     for (int i = 0; i < n; i++)
19         if (c[i] + 1. * k / p[i] < k) {
20             u[i] = true;
21             tt++;
22         }
23     sort(f, f + n, cmp);
24     cout << tt << endl;
25     for (int i = 0; i < n; i++) if (u[f[i]]) cout << f[i] + 1 << " ";
26     cout << endl;
27 }
```

M1713 Biscuit Clicker

- ▶ The most important part is to see the transverse property of the first inequality

$$C_i + \frac{C_j}{P_i} \leq C_j + \frac{C_i}{P_j}$$

- ▶ If we buy upgrade i before upgrade j, and if we buy upgrade j before upgrade k, then we should buy upgrade i before upgrade k
- ▶ If this property holds, then we may try to use greedy to solve the problem
 - ▶ First, this tell us that we can sort the upgrades
 - ▶ Second, we can easily show if there are any inversions, it will not be the optimal solution



Conclusion

- ▶ When can we use greedy?
 - ▶ First, when you think you can (TRUE!!!)
 - ▶ Second, you cannot find counter example (You should try to do so)
 - ▶ The system gives you full feedback (it worth trying)
 - ▶ As you can see, greedy algorithm is not long, so it worth trying if you can code fastly
 - ▶ points are given per subtask and you have no idea (it worth trying)
 - ▶ Greedy solution sometimes give extremely good approximation for the optimal solution
- ▶ It is not realistic to prove the correctness during the competition
 - ▶ Just prove in mind for a little bit is enough



Suggested Tasks



- 01014 Stamps
- D109 Giving changes
- M0632 Machine Scheduling
- M0633 Children's Game
- J044 Amazing Robot
- J064 Cave Adventures
- J154 Father's Will

Extra: M0633 Children's Game

- Idea similar to M1713 Biscuit Clicker, think of what will happen if $N = 2$
- The code looks like this:

```
1 #include<iostream>
2 #include<string>
3 #include<algorithm>
4
5 using namespace std;
6
7 int n;
8 string a[55];
9
10 bool cmp(string x, string y) {
11     return x < y;
12 }
13
14 int main() {
15     cin >> n;
16     for (int i = 0; i < n; i++) cin >> a[i];
17     sort(a, a + n, cmp);
18     for (int i = 0; i < n; i++) cout << a[i];
19     cout << endl;
20 }
```