

# Algorithms

## Lesson #2: Greedy Algorithms

(Based on slides by Prof. Dana Shapira)



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## What is a Greedy Algorithm?



- Solves an optimization problem
- Optimal Substructure:
  - optimal solution contains in it optimal solutions to subproblems
- Greedy Strategy:
  - At each decision point, do what looks best "locally"
  - Top-down algorithmic structure
    - With each step, reduce problem to a smaller problem
- Greedy Choice Property:
  - "locally best" = globally best

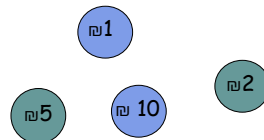
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## Coin Change

### Problem -

Give change for  $n$  Shekels using the minimum number of coins.

Example:  $n = 38$



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## Coin Change



```
S ← set of all coins
A ← 0    //Number of used coins
while n > 0 {
    C ← maximum coin in S
    A ← A + ⌊n/C⌋
    n ← n - ⌊n/C⌋ · C
    S ← S - {C}
}
```

- Can you think of an example where Greedy is not optimal?

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## The Fractional Knapsack Problem

### Problem -

You have a knapsack which can only contain certain weight  $C$  of goods.

With this weight capacity constraint, you want to maximize the values of the goods you can put in the knapsack.

### Example:

	Total value	Total weight (kilos)
Candy	₹50	10
Chocolate	₹40	5
Ice cream	₹30	5

- If  $C=14$  kilos, what would you do?

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## The Fractional Knapsack Problem

### Problem -

Given  $G_1, G_2, \dots, G_n$ , each  $G_i$  with weight  $w_i$  and value  $v_i$ .

Maximize the profit out of the goods you can put in the knapsack with capacity  $C$ .

- Let  $f_i$  ( $0 \leq f_i \leq 1$ ) be the fractional of  $G_i$  one would put in the knapsack.

- Maximize  $\sum_{i=1}^n f_i v_i$
- Subject to  $\sum_{i=1}^n f_i w_i \leq C$

General concepts:

- Feasible solution
- Optimal solution

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## The Fractional Knapsack Problem

```

S ← set of all  $v_i/w_i$ 
while C > 0
  i ← index of maximum value in S
  S ← S - { $v_i/w_i$ }
  if ( $w_i < C$ )
    print('wi Kilos of item i were taken')
    C ← C - wi
  else
    print('C Kilos of item i were taken')
    C ← 0

```

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## The Integer Knapsack Problem

### Problem -

Given  $G_1, G_2, \dots, G_n$ , each  $G_i$  with weight  $w_i$  and value  $v_i$ .

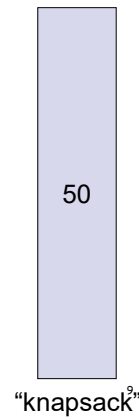
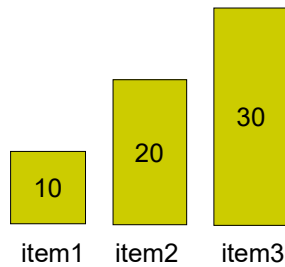
Maximize the profit out of the goods you can put in the knapsack with capacity  $C$ .

- This time  $f_i \in \{0,1\}$  (can't cut goods in the middle)
- Maximize  $\sum_{i=1}^n f_i v_i$
- Subject to  $\sum_{i=1}^n f_i w_i \leq C$
- Can you think of an example where Greedy is not optimal?

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## The Integer Knapsack Problem

Value: ~60 ~100 ~120



## Activity Selection

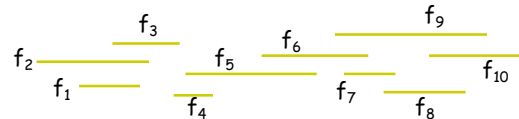
- **Problem -**  
Given  $S = \{1, 2, \dots, n\}$  of  $n$  activities
  - Each activity  $i$  has:
    - start time:  $s_i$
    - finish time:  $f_i$
    - $s_i < f_i$
  - Activities  $i, j$  are compatible iff non-overlapping:
 
$$[s_i, f_i) \quad [s_j, f_j)$$
  - Objective:
    - select a **maximum-sized** set of mutually compatible activities



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## Activity Selection

- **Solution**  
Order the activities by increasing finishing time, i.e.,  $f_1 \leq f_2 \leq \dots \leq f_n$

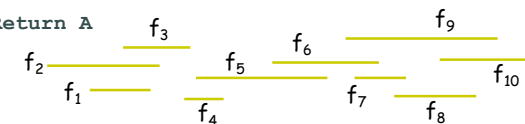


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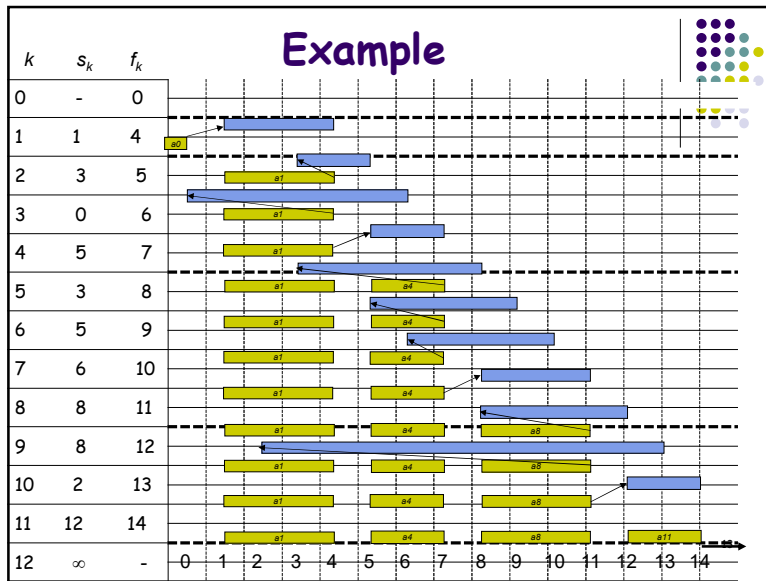
## Activity Selection

Greedy-Activity-Selector( $s, f$ )

1.  $n \leftarrow \text{length}(s)$
2.  $A \leftarrow \{1\}$  //Set of selected activities
3.  $j \leftarrow 1$  //Last selected activity
4. for  $i = 2$  to  $n$
5.   if  $s_i \geq f_j$
6.     then  $A \leftarrow A \cup \{i\}$
7.      $j \leftarrow i$
8. Return  $A$



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## Optimality of Activity Selection

**Theorem:** Algorithm GREED-ACTIVITY-SELECTOR is optimal

**Proof:**

Greedy-Activity-Selector( $s, f$ )

```

1.  $n \leftarrow \text{length}(s)$ 
2.  $A \leftarrow \{1\}$  //Set of selected activities
3.  $j \leftarrow 1$  //Last selected activity
4. for  $i = 2$  to  $n$ 
5.   if  $s_i \geq f_j$ 
6.     then  $A \leftarrow A \cup \{i\}$ 
7.      $j \leftarrow i$ 
8. Return  $A$ 

```

**Loop invariant:** Here we have a feasible solution for activities  $1, \dots, i-1$  with:

- $|A|$  maximal
- $j$  minimal for this  $|A|$

The loop invariant is proven by induction on  $i$

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## Weighted Activity Selection

Now each activity also has a **weight**  $w_i$

We want to maximize the sum of weights

(Before, all activities had  $w_i=1$  -- unweighted)

Does greedy work here?

How do we do greedy?

- Choose minimum finishing time, as before...
- Choose maximum weight...

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