

Optimization Problems, Lecture 1, Segment 2

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0/1 Knapsack Inherently Exponential

Give up

Approximate solution

Exact solution that is often fast

Greedy Algorithm a Practical Alternative

- while knapsack not full
 - put “best” available item in knapsack
- But what does best mean?
 - Most valuable
 - Least expensive
 - Highest value/units

An Example

- You are about to sit down to a meal
- You know how much you value different foods, e.g., you like donuts more than apples
- But you have a calorie budget, e.g., you don't want to consume more than 800 calories
- Choosing what to eat is a knapsack problem



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A Menu

Food	wine	beer	pizza	burger	fries	coke	apple	donut
Value	89	90	30	50	90	79	90	10
calories	123	154	258	354	365	150	95	195

- Let's look at a program that we can use to decide what to order

Class Food

```
class Food(object):
    def __init__(self, n, v, w):
        self.name = n
        self.value = v
        self.calories = w

    def getValue(self):
        return self.value

    def getCost(self):
        return self.calories

    def density(self):
        return self.getValue()/self.getCost()

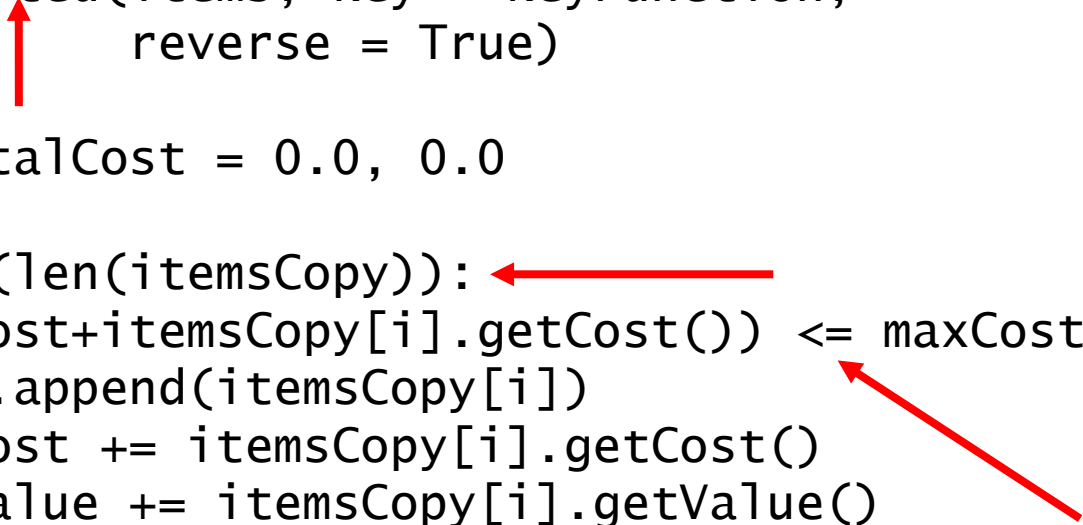
    def __str__(self):
        return self.name + ': <' + str(self.value)\
            + ', ' + str(self.calories) + '>'
```

Build Menu of Foods

```
def buildMenu(names, values, calories):  
    """names, values, calories lists of same length.  
    name a list of strings  
    values and calories lists of numbers  
    returns list of Foods"""  
    menu = []  
    for i in range(len(values)):  
        menu.append(Food(names[i], values[i],  
                           calories[i]))  
    return menu
```

Implementation of Flexible Greedy

```
def greedy(items, maxCost, keyFunction):  
    """Assumes items a list, maxCost >= 0,  
        keyFunction maps elements of items to numbers"""  
    itemsCopy = sorted(items, key = keyFunction,  
                        reverse = True)  
    result = []  
    totalValue, totalCost = 0.0, 0.0  
  
    for i in range(len(itemsCopy)):  
        if (totalCost+itemsCopy[i].getCost()) <= maxCost:  
            result.append(itemsCopy[i])  
            totalCost += itemsCopy[i].getCost()  
            totalValue += itemsCopy[i].getValue()  
  
    return (result, totalValue)
```



Algorithmic Efficiency

```
def greedy(items, maxCost, keyFunction):  
    → itemsCopy = sorted(items, key = keyFunction,  
                           reverse = True)  
    result = []  
    totalValue, totalCost = 0.0, 0.0  
  
    for i in range(len(itemsCopy)):  
        if (totalCost+itemsCopy[i].getCost()) <= maxCost:  
            result.append(itemsCopy[i])  
            totalCost += itemsCopy[i].getCost()  
            totalValue += itemsCopy[i].getValue()  
  
    return (result, totalValue)
```

$n \log n$

where $n = \text{len}(\text{items})$

$$\frac{n}{n \log n}$$

$\ll 2^n$

Using greedy

```
def testGreedy(items, constraint, keyFunction):
    taken, val = greedy(items, constraint, keyFunction)
    print('Total value of items taken =', val)
    for item in taken:
        print('    ', item)
```

Using greedy

```
def testGreedy(maxUnits):  
    print('Use greedy by value to allocate', maxUnits,  
          'calories')  
    testGreedy(foods, maxUnits, Food.getValue)  
    print('\nUse greedy by cost to allocate', maxUnits,  
          'calories')  
    testGreedy(foods, maxUnits,  
                lambda x: 1/Food.getCost(x))  
    print('\nUse greedy by density to allocate', maxUnits,  
          'calories')  
    testGreedy(foods, maxUnits, Food.density)  
  
testGreedy(800)
```

lambda

- lambda used to create anonymous functions
 - $\lambda id_1, id_2, \dots id_n: \langle expression \rangle$
 - Returns a function of n arguments

lambda

- lambda used to create anonymous functions
 - `lambda <id1, id2, ... idn>: <expression>`
 - Returns a function of n arguments
- Possible to write amazing complicated lambda expressions
- **Don't**—use `def` instead if it is more than a line

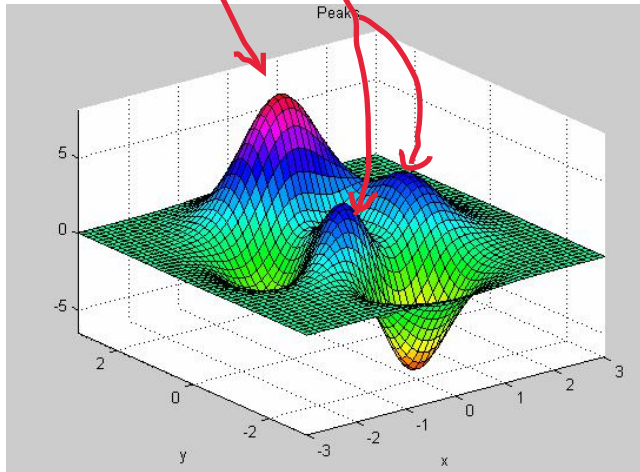
Using greedy

```
def testGreedy(foods, maxUnits):
    print('Use greedy by value to allocate', maxUnits,
          'calories')
    testGreedy(foods, maxUnits, Food.getValue)
    print('\nUse greedy by cost to allocate', maxUnits,
          'calories')
    testGreedy(foods, maxUnits,
                lambda x: 1/Food.getCost(x))
    print('\nUse greedy by density to allocate', maxUnits,
          'calories')
    testGreedy(foods, maxUnits, Food.density)

names = ['wine', 'beer', 'pizza', 'burger', 'fries',
         'cola', 'apple', 'donut', 'cake']
values = [89,90,95,100,90,79,50,10]
calories = [123,154,258,354,365,150,95,195]
foods = buildMenu(names, values, calories)
testGreedy(foods, 750)
```

Why Different Answers?

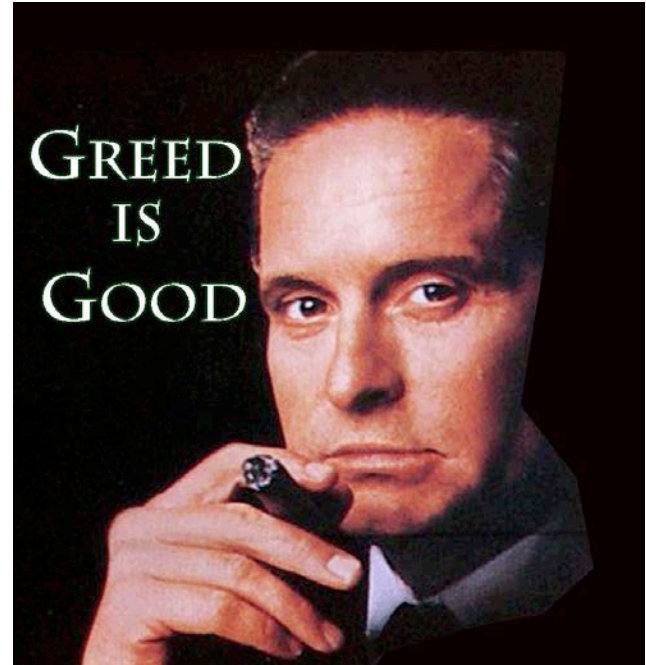
- Sequence of **locally** “optimal” choices don’t always yield a globally optimal solution



- Is greedy by density always a winner?
 - Try `testGreedy(foods, 1000)`

The Pros and Cons of Greedy

- Easy to implement
- Computationally efficient



- But does not always yield the best solution
 - Don't even know how good the approximation is
- In the next lecture we'll look at finding truly optimal solutions