# Greedy Algorithm

Construct a solution iteratively, via sequence of myopic decisions, and hope that everything works out in the end.

## Template

```
Greedy Algorithm(A,n)
                                            Sorting / or do something to rank
   Candidates = rank (A)
                                            Initialize solution
    solution = \emptyset
                                            Some greedy choice
    for i = 1 to n
                                            Check feasibility before adding
      c= findbest(Candidates)
                                            Remove the selected element
      solution = solution U {c}
                                           Update the set candidates (optional)
      candidates = candidates \ {c}
      candidates = revaluate(candidates)
    return solution
```

## Features and Bugs of the Greedy paradigm

Easy to come up with one or more greedy algorithms

Easy to analyse the running time

Hard to establish correctness

· Warning: Most greedy algorithms are not always correct.

# Exchange trick, to prove correctness (Worked often, but not always)

Let A be the greedy algorithm that we are trying to prove correct, and

A(I) the output of A on some input I.

Let O be an optimal solution on input I that is not equal to A(I).

The goal in exchange argument is to show how to modify O to create a new solution O' with the following properties:

- 1. O' is at least as good of solution as O (or equivalently O' is also optimal), and
- 2. O' is "more like" A(I) than O.

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THIS IS THE CREATIVE PART - different for each algorithm/problem.

#### Two ways to proceed

#### First way. Contradiction

Theorem: The algorithm A solves the problem.

Proof by contradiction: Algorithm A doesn't solve the problem.

• Hence, there must be some input I on which A does not produce an optimal solution. Let the output produced by A be A(I).

Fact: Let O be the optimal solution that is most like A(I).

- If we can show how to modify O to create a new solution O' with the following properties:
- 1. O' is at least as good of solution as O (and hence O' is also optimal), and
- 2. O' is more like A(I) than O.

Then we have a contradiction to the choice of O. Thus, the theorem.

#### Two ways to proceed

#### **Second way. Constructive way**

Theorem: The algorithm A solves the problem.

Let I be an arbitrary instance. Let O be arbitrary optimal solution for I. Assume that we can show how to modify O to create a new solution O' with the following properties

- 1. O' is at least as good of solution as O (and hence O' is also optimal), and
- 2. O' is more like A(I) than O.

Then consider the sequence O'; O''; O'''; ....

Each element of this sequence is optimal, and more like A(I) than the proceeding element. Hence, ultimately this sequence must terminate with A(I).

Hence, A(I) is optimal.

#### P1: Job Scheduling

Time in the system for a job: Waiting time

All jobs arrived at time ZERO

IP: Set of n jobs= $\{j_1, j_2, ..., j_n\}$  with processing time  $P(j_1)$ ,  $P(j_2)$ , ...  $P(j_n)$ , and a single resource.

OP: Schedule jobs on one resource s.t. it minimizes the total waiting time in the system.

#### Example

Job 1- 5 units , Job 2- 10 units, Job 3- 4 units
Order waiting time

$$[1,2,3]$$
- 0+(5)+(5+10)= 20

$$[3,1,2]$$
- 0+(4)+(4+5)=13

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Order

waiting time

$$[1,2,3]$$
- 0+(5)+(5+10)= 20

[3,1,2]- 0+(4)+(4+5)=13... this order is the optimal

## **Developing Intuition**

Some arbitrary order of jobs...

Finish time of job  $1 = t_1$ 

Finish time of job 2 =  $t_1 + t_2$ 

Finish time of job 3 =  $t_1 + t_2 + t_3$ 

•

•

Finish time of job n =  $t_1 + t_2 + ... + t_n$ 

Total Finishing Time =  $nt_1+(n-1)t_2+...+t_n$ 

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Can you guess the greedy choice?

•

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**Shortest Job First** 

Finish time of job  $n = t_1 + t_2 + ... + t_n$ 

Total Finishing Time =  $nt_1+(n-1)t_2+...+t_n$ 

Use exchange trick......with contradiction

Assume the statement is not true.

Fact: OPT is an optimal solution.

Note that in OPT, there exists two consecutive jobs X and Y, s.t. X is being served before Y, and P(x) > P(y).

Else OPT will be same schedule which follows the shortest job sequence order.

Now suppose we interchange X and Y in OPT, and else remain same. What happens?

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| Order in OPT   | XY |
|----------------|----|
| New order OPT' | YX |

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Order in OPT ......XY No need to worry about these jobs (think why??)

New order OPT' ......YX

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Total wait Time (OPT')= Total wait Time(OPT)-P(X)+P(Y)

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Else OPT will be same schedule which follows the shortest job sequence order.

Now suppose we interchange X and Y in OPT, and else remain same. What happens?

Total wait Time (OPT')= Total wait Time(OPT)-P(X)+P(Y) . Now, we know that P(x) > P(y).

Thus, Total wait Time (OPT') < Total wait Time(OPT)

# Job Scheduling with m resources, (minimize waiting time)

# GENERALIZE THE PREVIOUS IDEA TO SOLVE THIS PROBLEM.

#### Flow to solve a problem

Given a problem P,

Try to come up with a greedy algorithm

- a) then try to construct a counter example,
- b) if you can construct, GOTO step 1.
- c) if you cannot construct a counter example, ask your friend.
- d) if your friend also fail to find one, ask me.
- e) If we cannot construct one, we will post it in <a href="math.stackexchange">mathoverflow.net</a>, and wait for few days...
- f) if no one replies, then try to prove that your greedy algorithm works.
- g) if we can prove, then alright.
- h) if we are unable to prove, time to tune our greedy choice based on the difficulty we face during the proof.

