

# Recitation 8 (HW7)

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Basic Algorithms (CSCI-UA.0310-005)

# Problem 1

## Problem 1 (10+10+5 points)

Recall that we designed a dynamic programming approach to solve the problem of making change for  $n$  cents using the least number of coins (refer to Problem 9 of ADDITIONAL PROBLEMS set). Now we want to solve this problem using a greedy approach.

- (a) Design a greedy algorithm to make change for  $n$  cents using the least number of coins among quarters (25), dimes (10), nickels (5), and pennies (1). Fully explain your algorithm.

For example, if  $n = 91$ , your algorithm must return 6, since we can make change for 91 cents using 6 coins: Take 3 quarters, 1 dime, 1 nickel, and 1 penny. Also, we can show that it is not possible to make change for 91 cents using less than 6 coins.

- (b) Show that your algorithm in part (a) outputs a correct result for all positive integers  $n$ .
- (c) Provide an example of a set of coin denominations for which your greedy approach in part (a) does not output a correct result.

Note that your set of coin denominations must include a penny so that for every positive integer  $n$ , it is possible to make change for  $n$  cents using your set of coin denominations.

# Problem 1

Recall how to solve this problem using DP:

**Problem 9.** We want to make change for  $n$  cents using the least number of coins among 1, 10, 25 cents. Develop an  $O(n)$ -time dynamic programming algorithm to find the least number of coins needed. Compute the total running time of your algorithm.

For  $i = 0, \dots, n$ , let  $\text{LEASTCOINS}(i)$  denote the least number of coins required to make change for  $i$  cents. We have [Why?]

$$\text{LeastCoins}(i) = \begin{cases} 0 & \text{if } i = 0 \\ \text{LeastCoins}(i-1) + 1 & \text{if } 1 \leq i \leq 9 \\ \min(\text{LeastCoins}(i-1) + 1, \text{LeastCoins}(i-10) + 1) & \text{if } 10 \leq i \leq 24 \\ \min(\text{LeastCoins}(i-1) + 1, \text{LeastCoins}(i-10) + 1, \text{LeastCoins}(i-25) + 1) & \text{if } i \geq 25 \end{cases}$$

We have  $n+1$  subproblems to solve (i.e.,  $\text{LEASTCOINS}(0), \dots, \text{LEASTCOINS}(n)$ ), and each takes a constant time to be solved. So the total running time is  $\Theta(n)$ .

**Exercise:** Try to simplify the recursion above.

**Exercise:** Write the pseudo-code for the bottom-up DP approach.

**Note:** We will develop a simpler greedy algorithm in HW7.

# Problem 1

(a) Design a **greedy** algorithm to make change for  $n$  cents using the least number of coins among quarters (25), dimes (10), nickels (5), and pennies (1). Fully explain your algorithm.

For example, if  $n = 91$ , your algorithm must return 6, since we can make change for 91 cents using 6 coins: Take 3 quarters, 1 dime, 1 nickel, and 1 penny. Also, we can show that it is not possible to make change for 91 cents using less than 6 coins.

# Problem 1

Example:

$$n = 91$$

⇒ Step 1: try to use quarters(25) as many as we can  
 $91 / 25 = 3, \quad 91 \% 25 = 16$

so we use 3 quarters, 16 left

Step 2: try to use dimes(10) as many as we can  
 $16 / 10 = 1, \quad 16 \% 10 = 6$

so we use 1 dime, 6 left

Step 3: try to use nickels(5) as many as we can  
 $6 / 5 = 1, \quad 6 \% 5 = 1$

so we use 1 nickel, 1 left

Step 4: try to use pennies(1) as many as we can  
 $1 / 1 = 1, \quad 1 \% 1 = 0$

so we use 1 dime, 0 left

# Problem 1

## Pseudo-code

LeastCoins( $n$ ):

coins = [25, 10, 5, 1]

count = 0

for  $i = 1$  to 4:

count = count +  $n / \text{coins}[i]$

$n = n \% \text{coins}[i]$

return count

init call: LeastCoins( $n$ )

TC =  $O(1)$

SC =  $O(1)$

# Problem 1

(b) Show that your algorithm in part (a) outputs a correct result for all positive integers  $n$ .

Lemma: At each iteration, exchanging for the coin that has the largest value as many as we can gives the least number of coins.

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Proof: Suppose  $a+b+c+d$  where  $25a+10b+5c+d=n$  is the least number of coins changed for  $n$  cents, and we did Not use nickels(5) as many as we can, in another word,  $d > 5$ .

Then we substitute 5 pennies with one nickel. Then the newly formed combination is:  $a+b+c+(d-5)+1 = a+b+c+d-4 < a+b+c+d$ . Therefore,  $a+b+c+d$  is not the least number of coins changed for  $n$  cents, which contradicts the assumption. The similar proof goes to quarters and dimes. This finishes the proof.



# Problem 1

(c) Provide an example of a set of coin denominations for which your greedy approach in part (a) does not output a correct result.

Note that your set of coin denominations must include a penny so that for every positive integer  $n$ , it is possible to make change for  $n$  cents using your set of coin denominations.

# Problem 1

(c) Example: 15, 10, 1

$n = 20$

With algorithm developed in (a),  $\text{count} = 1(15) + 5(1) = 6$ ;

But the output should be 2. ( $2 * 10 = 20$ )

# Problem 1

A follow-up question:

What feature of coin combination makes the greedy strategy work?

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What feature of coin combination makes the greedy strategy work?

Each coin is at least twice as the next smaller one.

Assume  $C[1] > C[2] > \dots > C[n]$ ,

then there should be  $C[i] \geq 2 * C[i+1]$  for  $1 \leq i < n$

# Problem 2

## Problem 2 (10+10+5 points)

Recall the frog problem discussed in Homework 5 Problem 3:

Consider the array  $A[1 \dots n]$  consisting of  $n$  non-negative integers. There is a frog on the last index of the array, i.e. the  $n$ th index of the array. In each step, if the frog is positioned on the  $i^{\text{th}}$  index, then it can make a jump of size at most  $A[i]$  towards the beginning of the array. In other words, it can hop to any of the indices  $i, \dots, i - A[i]$ .

- (a) Develop a GREEDY algorithm to determine whether the frog can reach the first index of  $A$ .
- (b) Show the correctness of your algorithm in part (a).
- (c) Find and justify the time complexity of your algorithm.

## Problem 2

(a) Develop a GREEDY algorithm to determine whether the frog can reach the first index of  $A$ .

Recall the Dynamic Programming way:

At the index  $i$ , try all options  $i-1, i-2, \dots, i-A[i]$ . If any work, it work.

How does Greedy Strategy work?

## Problem 2

(a) Develop a GREEDY algorithm to determine whether the frog can reach the first index of  $A$ .

Recall the Dynamic Programming way:

At the index  $i$ , try all options  $i-1, i-2, \dots, i-A[i]$ . If any work, it work.

How does Greedy Strategy work?

Intuitive thought:

Since the frog jumps from right to left, each time it jumps to the leftmost  $(i-A[i])$ .

## Problem 2

(a) Develop a GREEDY algorithm to determine whether the frog can reach the first index of  $A$ .

'Since the frog jumps from right to left, each time it jumps to the leftmost  $(i - A[i])$ '.

This is indeed a Greedy Strategy.

But it may fail.



## Problem 2

(a) Develop a GREEDY algorithm to determine whether the frog can reach the first index of  $A$ .

'Since the frog jumps from right to left, each time it jumps to the leftmost  $(i - A[i])$ '.

This is indeed a Greedy Strategy.

But it may fail.

Example:        1 0 2 2    (assume 1-indexed)

The frog will stuck at index 2 if it jumps to index 2 at the first step.

But it can reach the index 1 if it jumps to index 3 at the first step.

## Problem 2

(a) Develop a GREEDY algorithm to determine whether the frog can reach the first index of  $A$ .

'Since the frog jumps from right to left, each time it jumps to the leftmost  $(i - A[i])$ '.

Need a little optimization

## Problem 2

(a) Develop a GREEDY algorithm to determine whether the frog can reach the first index of  $A$ .

'Since the frog jumps from right to left, each time it jumps to the leftmost  $(i - A[i])$ '.

Need a little optimization

Still take the strategy (jump to the leftmost), but consider all indexes that could be reached.

If index  $i$  could be reached, all indexes larger than  $i$  could must be reached.

## Problem 2

(a) Develop a GREEDY algorithm to determine whether the frog can reach the first index of  $A$ .

'Since the frog jumps from right to left, each time it jumps to the leftmost  $(i - A[i])$ '.

Need a little optimization

Still take the strategy (jump to the leftmost), but consider all indexes that could be reached.

If index  $i$  could be reach, all indexes larger than  $i$  could must be reached.

Solution: Find the current leftmost index that could be reached and update.

Meanwhile try all indexes not less than the current leftmost index.

## Problem 2

(a) Develop a GREEDY algorithm to determine whether the frog can reach the first index of  $A$ .

```
1 CanReach(A):  
2     n = size of A (1-indexed)  
3     leftmost = n    Current leftmost index that could be reached  
4     for i = n downto 1:  
5         if(i < leftmost)    Means index i cannot be reached,  
6             return false  
7         leftmost = min(leftmost, i-A[i])    Update the current leftmost index  
8         if(leftmost <= 1)    could be reached  
9             return true  
10
```

## Problem 2

(b) Show the correctness of your algorithm in part (a).

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### Loop invariant:

Variable *leftmost* is the current leftmost index the frog could reach.

And all indexes in [*leftmost*, n] are reachable.

## Problem 2

(b) Show the correctness of your algorithm in part (a).

### Initialization:

Before the iteration, *leftmost* =  $n$  is the only reachable (also the leftmost) index.



## Problem 2

(b) Show the correctness of your algorithm in part (a).

### Maintenance:

Assume it holds for  $l=p$ :

Variable *leftmost* is the current leftmost index the frog could reach.

And all indexes in [*leftmost*,  $n$ ] are reachable.

## Problem 2

(b) Show the correctness of your algorithm in part (a).

### Maintenance:

Then for  $l=p-1$ :

Since all indexes in [*leftmost*,  $n$ ] are reachable, if  $leftmost \leq p-1$ , then index  $p-1$  is also reachable.

So index  $(p-1)-1, \dots, (p-1) - A[p-1]$  will also be reachable.

## Problem 2

(b) Show the correctness of your algorithm in part (a).

### Maintenance:

Then for  $l=p-1$ :

If *leftmost* is smaller, then [*leftmost*,  $n$ ] are already reachable from the assumption.

If  $(p-1)-A[p-1]$  is smaller, then  $[(p-1)-A[p-1], p-1]$  and [*leftmost*,  $n$ ] are reachable.  
Since *leftmost*  $\leq p-1$ , we can infer that  $[(p-1)-A[p-1], n]$  is reachable.

So the updated *leftmost* is the smaller one between *leftmost* and  $(p-1)-A[p-1]$ .

## Problem 2

(b) Show the correctness of your algorithm in part (a).

**Maintenance:**

Then for  $l=p-1$ :

Otherwise, *leftmost*  $> p-1$ , so index  $p-1$  is unreachable, then all indexes smaller  $p-1$  are also unreachable. So the frog cannot jump to the first index.

## Problem 2

(b) Show the correctness of your algorithm in part (a).

### **Termination:**

After the iteration terminates, if the leftmost  $\leq 1$ , the first index is reachable.

Also, all index in  $[1, n]$  are reachable.

## Problem 2

(c) Find and justify the time complexity of your algorithm.

$\theta(n)$

# Problem 3

## Problem 3 (13+12 points)

You are given a set  $\mathcal{I}$  of  $n$  intervals on the real line. The starting and finishing times of these  $n$  intervals are given by the arrays  $s[1 \dots n]$  and  $f[1 \dots n]$ , where  $s[i]$  and  $f[i]$  denote the starting time and the finishing time of the  $i^{th}$  interval in  $\mathcal{I}$ , respectively.

We want to color the intervals in  $\mathcal{I}$  so that no two overlapping intervals are assigned the same color.

- (a) Develop a GREEDY algorithm to compute the minimum number of colors needed to color  $\mathcal{I}$  so that overlapping intervals are given different colors.
- (b) Show the correctness of your algorithm in part (a) and find its running time.

## Problem 3

(a) Develop a Greedy algorithm to compute the minimum number of colors needed to color  $I$  so that overlapping intervals are given different colors.

Example:

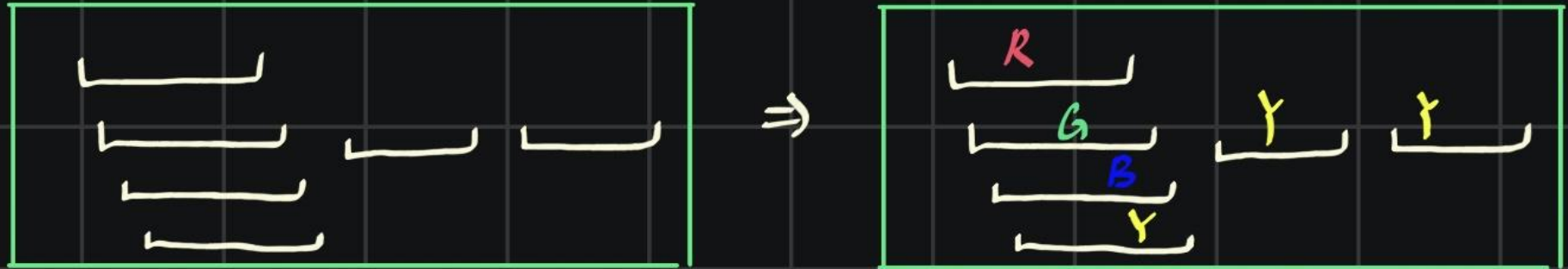




# Problem 3

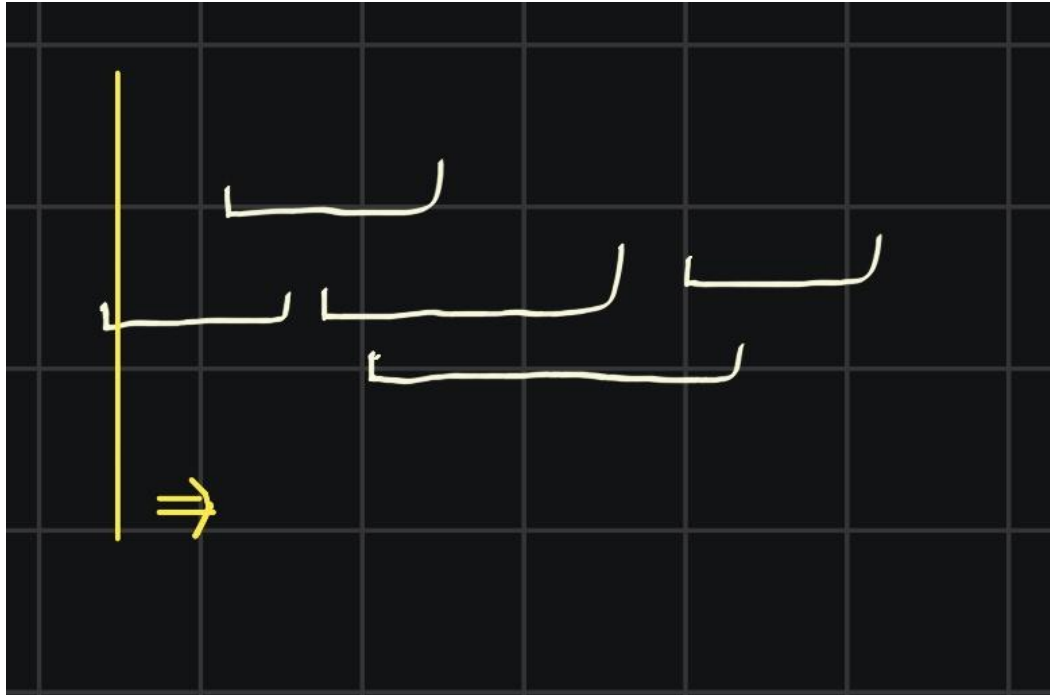
How to deal with the intervals, overlaps?

What is the relationship between the colors and overlaps?



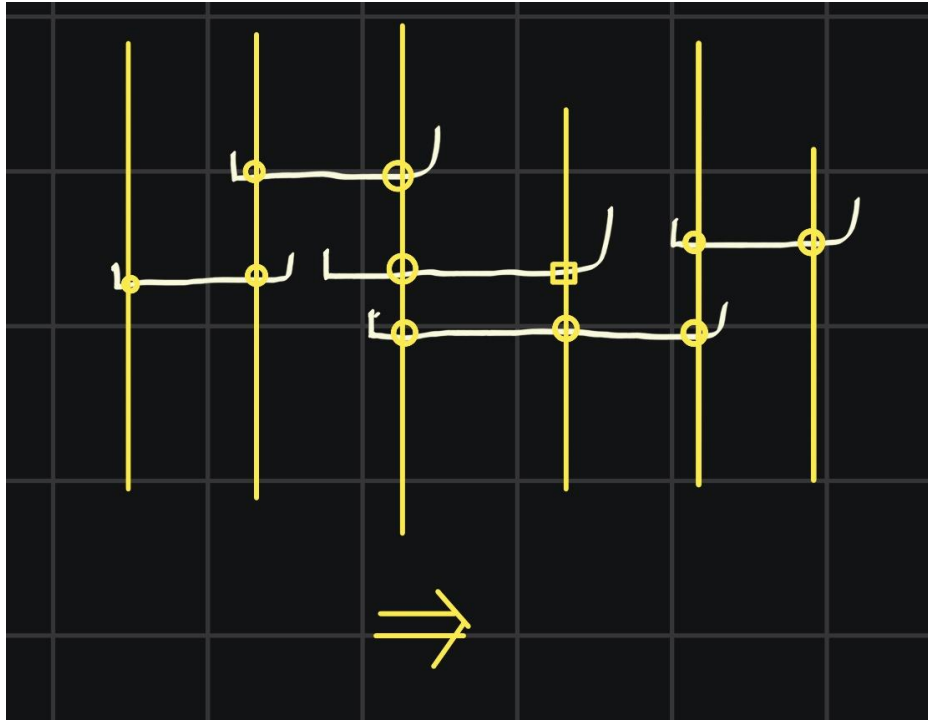
## Problem 3

Imagine there is a sweep line, sweeping the intervals from left to right. And find the intersections between intervals with this sweep line.



# Problem 3

The minimum number of colors needed = the maximum number of intersections



# Problem 3

Then how to sweep??

How to move this line? How to implement this algorithm??

=> We only care about the **start** and **end point** for each interval.

# Problem 3

Pseudo-code

MinColors( $S[1 \dots n]$ ,  $f[1 \dots n]$ ):

$points[1 \dots 2n] = [0, ""]$

for  $i = 1$  to  $n$ :

$points[i] = (S[i], "s")$

$points[i+n] = (f[i], "f")$

(1)

sort  $points[1 \dots 2n]$  increasingly, "f" goes  
to ahead if there is a tie.

(2)

result = 0

intersections = 0

(3)

for  $i = 1$  to  $2n$ :

if ( $points[i][1] == "s"$ ):

$intersections = intersections + 1$

$result = \max(result, intersections)$

else:

$intersections = intersections - 1$

return result

init call:

MinColor( $S[1 \dots n]$ ,  $f[1 \dots n]$ )

step (1): make a new list of tuples,  
(num, "s" or "f")

step (2): sort the list based on num,  
putting "f" elements ahead if there is  
a tie.

step (3): iterate the list,  
simulate the sweep line.  
case i: it's a "s" point  
case ii: it's a "f" point

## Problem 3

(b) Show the correctness of your algorithm in part (a) and find its running time.

=> Use loop invariant to prove step (3)

**Loop Invariant:**

At the **end** of the for-loop iteration for index  $l$ , *intersections* represents the overlaps of intervals considering the first  $l$  points.

## Problem 3

(Loop Invariant: At the end of the for-loop iteration for index  $l$ , *intersections* represents the overlaps of intervals considering the first  $l$  points.)

**(I) Initialization:** check that the loop invariant holds for  $l=1$ :

The first point is a “s” point. At the **end** of the for-loop iteration for index **1**, *intersections* is equal to 1, representing only one interval (overlap) here.

## Problem 3

(Loop Invariant: At the end of the for-loop iteration for index  $l$ , *intersections* represents the overlaps of intervals considering the first  $l$  points.)

### (II) Maintenance:

**Assumption:** assume that the loop invariant holds for  $l = p$ : At the **end** of the for-loop iteration for index  $p$ , *intersections* represents the overlaps of intervals considering the first  $p$  points, say  $\text{intersections} = k$ .



## Problem 3

(Loop Invariant: At the end of the for-loop iteration for index  $l$ , *intersections* represents the overlaps of intervals considering the first  $l$  points.)

### (II) Maintenance:

**Conclusion:** prove that the loop invariant holds for  $l = p+1$ . If the  $(p+1)$ th point is a “s”, it means a new starting point of an interval presents, then one more overlap here, thus  $\text{intersections} = k+1$ ;

If the  $(p+1)$ th point is a “f”, it means a finishing point of an interval presents, then overlap ends here, thus  $\text{intersections} = k-1$ . Hence proved.

## Problem 3

(Loop Invariant: At the end of the for-loop iteration for index  $l$ , *intersections* represents the overlaps of intervals considering the first  $l$  points.)

**(III)Termination:** check that the loop invariant holds for  $l=2n$ :

The last point is a “f” point. At the **end** of the for-loop iteration for index  $l = 2n$ , there is no intersection point and no overlap. *Intersections* = 0.

# Problem 3

Find its running time:

$$TC = O(n \log n + n)$$

$$= O(n \log n)$$

Pseudo-code

MinColors( $s[1..n]$ ,  $f[1..n]$ ):

points[1...2n] = [(0, "")]

for  $i = 1$  to  $n$ :

points[i] = ( $s[i]$ , "s")

points[i+n] = ( $f[i]$ , "f")

TC =  $O(n)$

sort points[1...2n] increasingly, "f" goes  
to ahead if there is a tie.

TC =  $O(2n \log 2n)$   
 $= O(n \log n)$

result = 0

intersections = 0

for  $i = 1$  to  $2n$ :

if (points[i][1] == "s"):

intersections = intersections + 1

result = max(result, intersections)

else:

intersections = intersections - 1

return result

notes

# Problem 4

## Problem 4 (10+15 points)

Let  $P$  be a set of  $n$  points in the plane. The points of  $P$  are given one point at a time. After receiving each point, we compute the convex hull of the points seen so far.

- (a) As a naive approach, we could run Graham's scan once after receiving each point, with a total running time of  $O(n^2 \log n)$ . Write down the psuedo-code for this algorithm.
- (b) Develop an  $O(n^2)$ -time algorithm to solve the problem. Write down the pseudo-code of your algorithm and justify that the run-time of your algorithm is  $O(n^2)$ .

## Problem 4

- (a) As a naive approach, we could run Graham's scan once after receiving each point, with a total running time of  $O(n^2 \log n)$ . Write down the psuedo-code for this algorithm.

Run Graham's Scan  $n$  times

# Problem 4

- (a) As a naive approach, we could run Graham's scan once after receiving each point, with a total running time of  $O(n^2 \log n)$ . Write down the psuedo-code for this algorithm.

For  $i = 1$  to  $n$ :

Receive a new point

```
let points be the list of points
let stack = empty_stack()
```

**Also works if P0 is the leftmost one  
(and the bottom one if tied)**

```
find the lowest y-coordinate and leftmost point, called P0
sort points by polar angle with P0, if several points have the same polar angle then only keep the farthest
```

```
for point in points:
    # pop the last point from the stack if we turn clockwise to reach this point
    while count stack > 1 and ccw(next_to_top(stack), top(stack), point) <= 0:
        pop stack
    push point to stack
end
```

**ccw > 0 if three points make a counter-clockwise turn,  
clockwise if ccw < 0, and collinear if ccw = 0.**

Output stack

Again, determining whether three points constitute a "left turn" or a "right turn" does not require computing the actual angle between the two line segments, and can actually be achieved with simple arithmetic only. For three points  $P_1 = (x_1, y_1)$ ,  $P_2 = (x_2, y_2)$  and  $P_3 = (x_3, y_3)$ , compute the z-coordinate of the **cross product** of the two **vectors**  $\overrightarrow{P_1P_2}$  and  $\overrightarrow{P_1P_3}$ , which is given by the expression  $(x_2 - x_1)(y_3 - y_1) - (y_2 - y_1)(x_3 - x_1)$ . If the result is 0, the points are collinear; if it is positive, the three points constitute a "left turn" or counter-clockwise orientation, otherwise a "right turn" or clockwise orientation (for counter-clockwise numbered points).

For  $i = 1$  to  $n$ :

Receive a new point

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- (b) Develop an  $O(n^2)$ -time algorithm to solve the problem. Write down the pseudo-code of your algorithm and justify that the run-time of your algorithm is  $O(n^2)$ .



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Remark  $TC = O(n)$  if we can use counting sort for (2).

If all indexes are integers and are in limited range, counting sort will work.

Remaining part is same.

Space Complexity:  $O(\text{range of } X * \text{range of } Y)$

## Problem 4

- (b) Develop an  $O(n^2)$ -time algorithm to solve the problem. Write down the pseudo-code of your algorithm and justify that the run-time of your algorithm is  $O(n^2)$ .

A solution to a more general case? (no restriction of index)

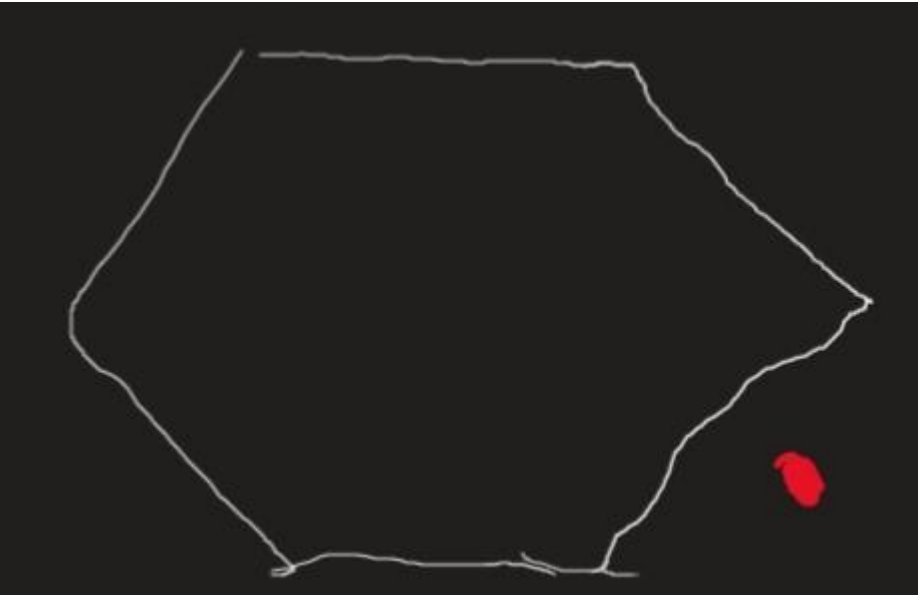
**HARD!!!!**

Hint: Think in an inductive method

If we know the convex hull of **n** points, how to get that of **n+1** points?

## Problem 4

- (b) Develop an  $O(n^2)$ -time algorithm to solve the problem. Write down the pseudo-code of your algorithm and justify that the run-time of your algorithm is  $O(n^2)$ .



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Why do we delete that edge?

## Problem 4

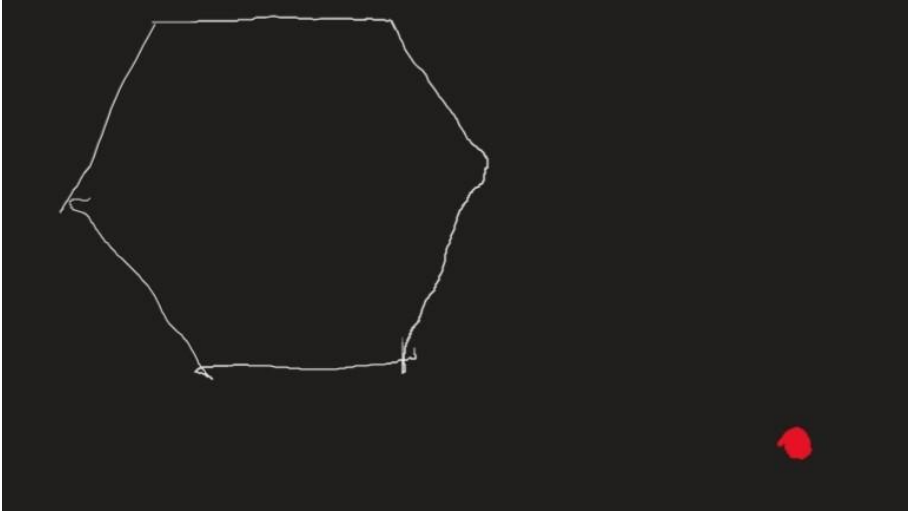
- (b) Develop an  $O(n^2)$ -time algorithm to solve the problem. Write down the pseudo-code of your algorithm and justify that the run-time of your algorithm is  $O(n^2)$ .

Why do we delete that edge?

Since it does not satisfy the counter-clockwise direction with the new point.

## Problem 4

- (b) Develop an  $O(n^2)$ -time algorithm to solve the problem. Write down the pseudo-code of your algorithm and justify that the run-time of your algorithm is  $O(n^2)$ .



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- (b) Develop an  $O(n^2)$ -time algorithm to solve the problem. Write down the pseudo-code of your algorithm and justify that the run-time of your algorithm is  $O(n^2)$ .

Why do we delete those three edges?

Since they don't satisfy the counter-clockwise direction with the new point.



## Problem 4

- (b) Develop an  $O(n^2)$ -time algorithm to solve the problem. Write down the pseudo-code of your algorithm and justify that the run-time of your algorithm is  $O(n^2)$ .

Also, we can infer that

edges that to be deleted must be consecutive in convex hull.

## Problem 4

- (b) Develop an  $O(n^2)$ -time algorithm to solve the problem. Write down the pseudo-code of your algorithm and justify that the run-time of your algorithm is  $O(n^2)$ .

Thus, the solution is:

For the convex hull of  $n$  points, delete all edges that don't satisfy the counter-clockwise direction with the new point.

Then add two edges (the red edges in the above graph).

## Problem 4

- (b) Develop an  $O(n^2)$ -time algorithm to solve the problem. Write down the pseudo-code of your algorithm and justify that the run-time of your algorithm is  $O(n^2)$ .

---

```
1 Convex_hull = [(P0,P1), (P1,P2), (P2,P0)]    // ordered
2
3 for i = 4 to n:
4     Pi is the new point
5     For edge in Convex_hull:
6         if(edge is not counter-clockwise with Pi):
7             delete edge from Convex_hull
8             // The deleted edge must be consecutive
9             // Assume the start of first deleted edge
10            //      is Ps, the end of last deleted
11            //      edge is Pe
12    if(some edges were deleted)
13        insert two edges (Ps, Pi), (Pi, Pe) to Convex_hull in order
14        //insert two edges into the position of deleted edges
```

# Jarvis march algorithm

Reference: [https://en.wikipedia.org/wiki/Gift\\_wrapping\\_algorithm](https://en.wikipedia.org/wiki/Gift_wrapping_algorithm)

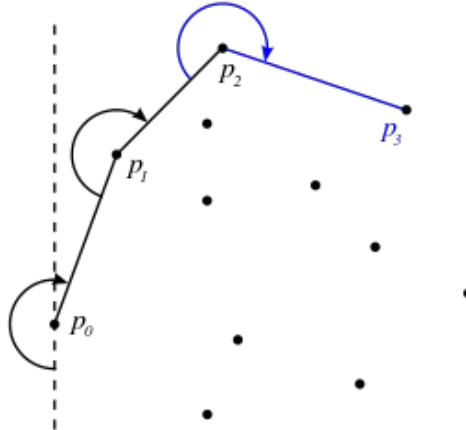
In the two-dimensional plane, **Jarvis march** is an algorithm for computing the convex hull of a given set of points.

It has  $O(nh)$  time complexity, where  $n$  is the number of points and  $h$  is the number of points on the convex hull.

# Jarvis march algorithm

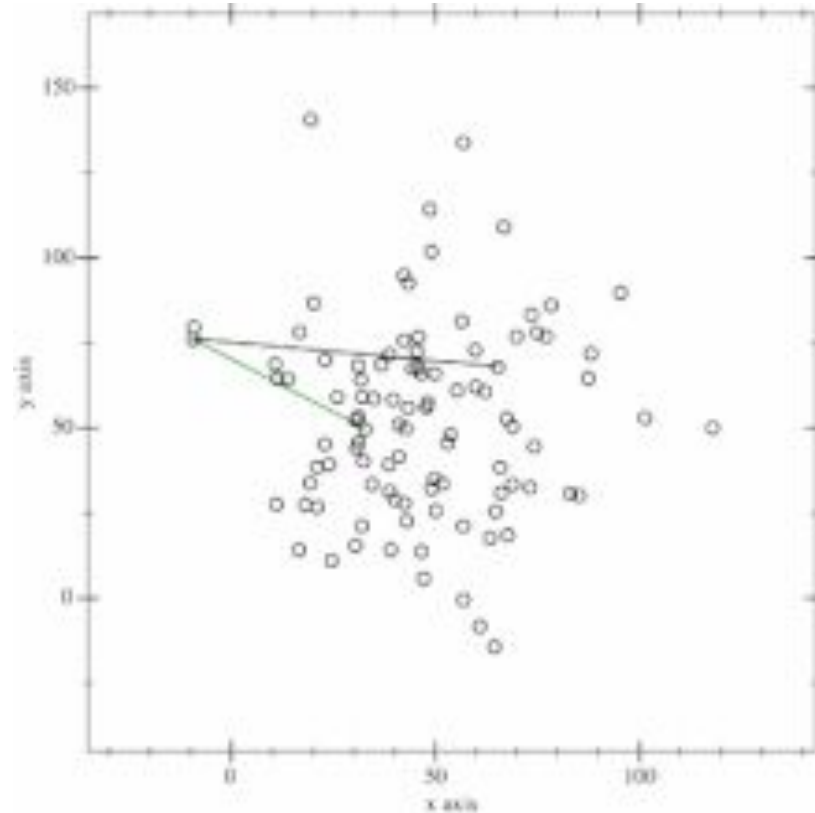
This algorithm begins with  $i=0$  and a point  $p_0$  known to be on the convex hull, e.g., the leftmost point, and selects the point  $p_{i+1}$  such that all points are to the right of the line  $p_i$  and  $p_{i+1}$ . This point may be found in  $O(n)$  time by comparing polar angles of all points with respect to point  $p_i$  taken for the center of polar coordinates.

Letting  $i=i+1$ , and repeating with until one reaches  $ph=p_0$  again yields the convex hull in  $h$  steps.



# Jarvis march algorithm

Animation:



# Jarvis march algorithm

Pseudocode [\[edit\]](#)

```
algorithm jarvis(S) is
    // S is the set of points
    // P will be the set of points which form the convex hull. Final set size is i.
    pointOnHull = leftmost point in S // which is guaranteed to be part of the CH(S)
    i := 0
    repeat
        P[i] := pointOnHull
        endpoint := S[0] // initial endpoint for a candidate edge on the hull
        for j from 0 to |S| do
            // endpoint == pointOnHull is a rare case and can happen only when j == 1 and a better endpoint has not yet been set for
the loop
            if (endpoint == pointOnHull) or (S[j] is on left of line from P[i] to endpoint) then
                endpoint := S[j] // found greater left turn, update endpoint
        i := i + 1
        pointOnHull = endpoint
    until endpoint = P[0] // wrapped around to first hull point
```

# Jarvis march algorithm

Complexity:

The inner loop checks every point in the set  $S$ , and the outer loop repeats for each point on the hull. Hence the total run time is  $O(nh)$ .

The run time depends on the size of the output, so Jarvis's march is an output-sensitive algorithm.

However, because the running time depends linearly on the number of hull vertices, it is only faster than  $O(n \log n)$  algorithms such as [Graham scan](#) when the number  $h$  of hull vertices is smaller than  $\log n$ .



**Q & A**

Thank you