

# Data structures project, Implementation document

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## Contents

<b>1</b>	<b>Structure of the Program</b>	<b>2</b>
<b>2</b>	<b>Attained Computational Complexity</b>	<b>3</b>
2.1	$\mathcal{O}$ -analysis of the pseudocode . . . . .	4
2.1.1	QuickHull . . . . .	4
2.1.2	Gift-wrapping . . . . .	4
2.1.3	Graham scan . . . . .	5
<b>3</b>	<b>Comparing the Different Algorithms</b>	<b>7</b>

## 1 Structure of the Program

We divided the code into five different *Java* source packages: `algorithms`, `comparators`, `datastructures`, `graphics` and `main`.

Package *algorithms* contains an interface `Algorithm` which the algorithms will implement. Only one method is specified, namely `useAlgorithm`. All other methods are declared `private`.

*Comparators* contains only one class, `AngleComparator`. It implements a comparator for the `Point2D.Double` class, in which the points are sorted in ascending order by their polar angles. This method of sorting is used by the *Gift-wrapping algorithm*.

Package *datastructures* contains our implementation of the linked list. We implemented methods to add and remove points, to sort the list and to check whether a given object is in the list. The list also knows its length.

The *graphics* package contains code necessary to draw the results on the screen. In the *main* package we placed all other program logic, i.e. input parameters, reading and writing to and from files and so on.

## 2 Attained Computational Complexity

In the definitions document, we aimed for the best possible time complexities for our algorithms of choice. However, for simplicity, we decided to settle for  $\mathcal{O}(n)$  space complexity. This way, we could generate a new linked list for the points of the convex hull. This also reduced the complexity of our algorithms, especially the Quickhull algorithm.

## 2.1 $\mathcal{O}$ -analysis of the pseudocode

### 2.1.1 QuickHull

**QuickHull**( $S$ )

**Data:** List  $S$  of points on a plane

**Result:** List  $H$  of points that form the convex hull of  $S$

Find the points  $A$  and  $B$  that have the minimum and maximum values for  $x$ -coordinates, respectively. These points are bound to be a part of the convex hull.

Divide  $S$  into  $S_1$  and  $S_2$  so that points in  $S_1$  and  $S_2$  lie on the opposite sides of the line  $AB$ .

$H \leftarrow \{\}$ .

$H = \text{FindHull}(S_1, A, B) \cup \text{FindHull}(S_2, B, A)$

**Algorithm 1:** Core method

**FindHull**( $S, A, B$ )

**Data:** List  $S$  of points on a plane, Point  $A$ , Point  $B$

**Result:** List  $H$  of points that form the convex hull of  $S$  and are on the right of the line  $AB$

**if**  $S$  is empty **then**  
     return  $A, B$

**end**

Find  $C = \text{argmax dist}(AB, C)$

Divide  $S$  into  $S_1$  and  $S_2$  so that points in  $S_1$  lie on the right side of  $AC$  and points in  $S_2$  lie on the right side of  $BC$ . The rest of the points can be discarded.

return  $\text{FindHull}(S_1, P, C) \cup \text{FindHull}(S_2, C, Q)$ .

**Algorithm 2:** FindHull method

At first, it would seem that the time complexity of the recursive method is of order  $\mathcal{O}(n^2)$ . While this is true for some datasets, usually the recursive method discards many points with each iteration and thus brings the *average-case time complexity* down to  $\mathcal{O}(n \log n)$ .

### 2.1.2 Gift-wrapping

The following pseudocode specifies the Jarvis' march algorithm[2].

## 2.1 $\mathcal{O}$ -analysis of the ~~2~~<sup>2</sup>psuedocode ATTAINED COMPUTATIONAL COMPLEXITY

```
jarvis(S)
pointOnHull = leftmost point in S
i = 0
repeat
  P[i] = pointOnHull
  endpoint = S[0]          // initial endpoint for a candidate edge on the hull
  for j from 1 to |S|-1
    if (endpoint == pointOnHull) or (S[j] is left of line from P[i] to endpoint)
      endpoint = S[j]      // found greater left turn, update endpoint
  endfor
  i = i+1
  pointOnHull = endpoint
until endpoint == P[0]      // wrapped around to first hull point
```

The inner loop of the pseudocode is run for each input point. Thus, its time complexity is of order  $\mathcal{O}(n)$ . However, the outer loop is iterated over the hull points. If there are  $h$  hull points, the total time complexity is  $\mathcal{O}(nh)$ . This is a so-called *output-sensitive* algorithm.

### 2.1.3 Graham scan

Graham scan is given by the following pseudocode<sup>[3]</sup>:

We begin by defining an auxilliary function.

```
function ccw(p1, p2, p3):
  return (p2.x - p1.x)*(p3.y - p1.y) - (p2.y - p1.y)*(p3.x - p1.x)
```

Now we can write the graham scan in a simpler form.

```
let N          = number of points
let points[N+1] = the array of points
swap points[1] with the point with the lowest y-coordinate
sort points by polar angle with points[1]

# We want points[0] to be a sentinel point that will stop the loop.
let points[0] = points[N]
```

## 2.1 $\mathcal{O}$ -analysis of the 2D Convex Hull Algorithm

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```
# M will denote the number of points on the convex hull.
let M = 1
for i = 2 to N:
    # Find next valid point on convex hull.
    while ccw(points[M-1], points[M], points[i]) <= 0:
        if M > 1:
            M -= 1
        # All points are collinear
        else if i == N:
            break
        else
            i += 1

    # Update M and swap points[i] to the correct place.
    M += 1
    swap points[M] with points[i]
```

The actual algorithm has the time complexity  $\mathcal{O}(n)$ , but since it is necessary to sort the input first, it is dominated by the time complexity  $\mathcal{O}(n \log n)$  of our *Mergesort* implementation.

### 3 Comparing the Different Algorithms

We compared the performance of our algorithms using two test cases. First, we had a hardest case dataset for which all of the input points were part of the convex hull. This was achieved by taking evenly spaced numbers using the *Octave* command `linspace` and applying sin and cosin functions to them. This produced a set of points that lie on the unit circle in the plane.

Other test case consisted of generating random points from a Gaussian distribution. This in our mind represents a "average case" since Gaussian distributions are quite prevalent in natural sciences.

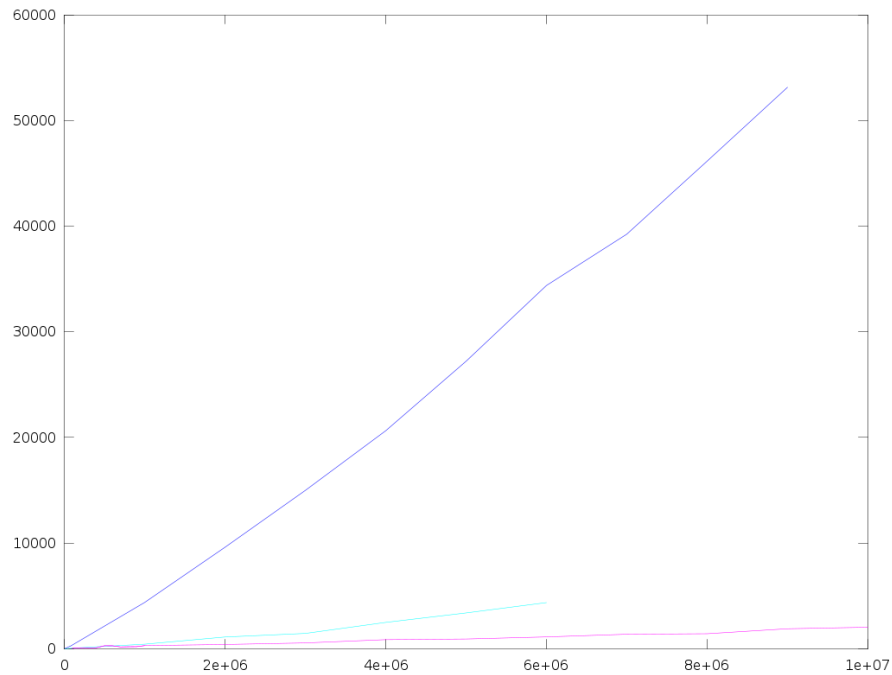


Figure 1: Average case performance



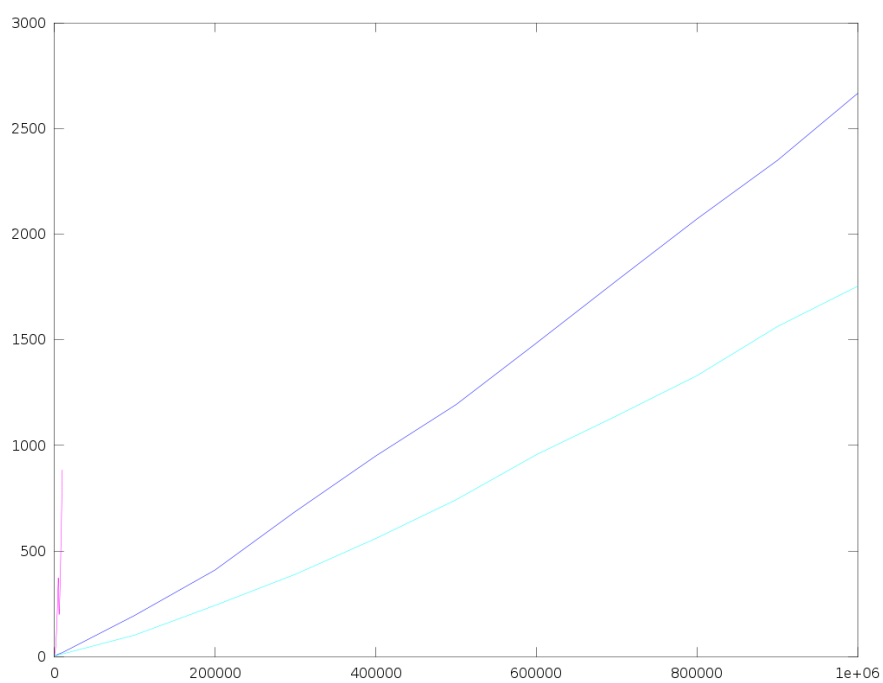


Figure 2: Worst case performance

### 3 *COMPARING THE DIFFERENT ALGORITHMS*

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In the figures, the Quickhull algorithm is plotted in cyan, gift-wrapping in magenta and Graham scan in blue.

X-axis is the amount of points and y-axis is the time in milliseconds. Quickhull could not be performed for large datasets because of the Java stack size.

## References

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