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## Convex Hull Report

### Part 1 - Code

See appendix

### Part 2 - Complexity

The majority of my implementation is contained within `getConvexHull()`:

```
# The main function to get the convex hull - it will run log(n)
times
# In this function there are two while loops, each with O(n) time
complexity
# Therefore, we get O(n log n) time for this algorithm. The time
complexities of
# each function can be found above the corresponding function.
def getConvexHull(self, points) -> list:
    if len(points) <= 3:
        if len(points) == 3 and self.getSlope(points[0],
points[1]) < self.getSlope(points[0], points[2]):
            (points[1], points[2]) = (points[2], points[1])
    else:
        # get hulls
        midIndex = math.floor(len(points) / 2)
        hull1 = self.getConvexHull(points[0: midIndex])
        hull2 = self.getConvexHull(points[midIndex:])

        # set up variables to get top and bottom lines
        indexTop1 = self.findLeftMostPointIndex(hull1)
        indexTop2 = 0

        indexBottom1 = indexTop1
        indexBottom2 = 0

        nextIndex1 = (indexTop1 + 1) if indexTop1 + 1 !=
len(hull1) else 0
        nextIndex2 = len(hull2) - 1

        slope = self.getSlope(hull1[indexTop1], hull2[indexTop2])
        slopeNew1 = self.getSlope(hull1[nextIndex1],
hull2[indexTop2])
```

```

        slopeNew2 = self.getSlope(hull1[indexTop1],
hull2[nextIndex2])

    # find top two points - linear time
    while slope < slopeNew1 or slope > slopeNew2:
        if slope < slopeNew1:
            indexTop1 = nextIndex1
            nextIndex1 = self.getNextPointIndex(hull1,
nextIndex1, True)
        if slope > slopeNew2:
            indexTop2 = nextIndex2
            nextIndex2 = self.getNextPointIndex(hull2,
nextIndex2, False)

        slope = self.getSlope(hull1[indexTop1],
hull2[indexTop2])
        slopeNew1 = self.getSlope(hull1[nextIndex1],
hull2[indexTop2])
        slopeNew2 = self.getSlope(hull1[indexTop1],
hull2[nextIndex2])

        nextIndex1 = indexBottom1 - 1 if indexBottom1 != 0 else
len(hull1) - 1
        nextIndex2 = 1

        slope = self.getSlope(hull1[indexBottom1],
hull2[indexBottom2])
        slopeNew1 = self.getSlope(hull1[nextIndex1],
hull2[indexBottom2])
        slopeNew2 = self.getSlope(hull1[indexBottom1],
hull2[nextIndex2])

    # find bottom two points - linear time
    while slope > slopeNew1 or slope < slopeNew2:
        if slope > slopeNew1:
            indexBottom1 = nextIndex1
            nextIndex1 = self.getNextPointIndex(hull1,
nextIndex1, False)
        if slope < slopeNew2:
            indexBottom2 = nextIndex2
            nextIndex2 = self.getNextPointIndex(hull2,
nextIndex2, True)

        slope = self.getSlope(hull1[indexBottom1],
hull2[indexBottom2])

```

```

        slopeNew1 = self.getSlope(hull1[nextIndex1],
hull2[indexBottom2])
        slopeNew2 = self.getSlope(hull1[indexBottom1],
hull2[nextIndex2])

        # concatenate the two arrays - linear time
        points = hull1[0:indexBottom1 + 1] +
((hull2[indexBottom2:] + hull2[0:1]) if indexTop2 == 0 else
(hull2[indexBottom2:indexTop2 + 1])) + ([] if indexTop1 == 0 else
hull1[indexTop1:])

    return points

```

This function here is  $O(n \log n)$  time. As you can see in the comments above the function. This is a recursive call, thus giving us the  $\log(n)$  part of our time complexity. In other words, it runs  $\log(n)$  times as it divides the points up into sub-hulls. The rest of the functions that I've used are all constant time. You can reference the appendix to see my comments for more information. Within this function, we have 2 while loops which run in linear time. This gives us the theoretical  $O(n \log n)$  time complexity that we desired.

The space complexity of this algorithm is pretty high. There was no requirement for space complexity so I didn't worry about that very much. However, for each iteration of the getConvexHull algorithm, we have a points array, two arrays representing the sub-hulls, and various integers and floats to represent the data. This gives us a space complexity of about  $O(n \log n)$  as well. Although that does seem pretty low, I can think of some ways that it could be better, mainly replacing the points array with the sub-hulls as soon as they're back in order to minimize space.

## Part 3 - Empirical Data

Table 1 shows the empirical data received from multiple runs of my convex hull implementation. I ran 5 iterations of varying points,  $n$ , where  $n = 10, 100, 1,000, 10,000, 100,000, 500,000, 1,000,000$ . The mean is below the five iterations followed by the calculated constant of proportionality,  $c$ . The order of growth in big-O notation is  $O(n \log n)$  (I work through this in part 3). Using that order of growth, we can calculate a constant of proportionality:

$$c = \text{mean} / (n \log n)$$

In higher numbers, the constant begins to settle at around  $1.8e^{-6}$  whereas the number is higher at lower numbers. Therefore, the constant equates to  $1.8e^{-6}$  for our big-theta functions.

However, taking a look at this now and trying to find a time complexity from this data, I would claim that it is  $O(n)$  given the fact that it grows pretty linearly with a constant of proportionality of  $c = 1 / 100,000$ . For each  $n$ , the mean of the iterations is very close to  $n/100,000$ . For instance, 10.9284 is fairly close to  $n / 100,000$  where  $n = 1,000,000$ . I discuss the differences between the theoretical and empirical order of growth in part 4.

$i$	10	100	1,000	10,000	100,000	500,000	1,000,000
1	0.000	0.001	0.011	0.084	0.923	5.438	10.356
2	0.000	0.001	0.011	0.093	0.861	4.813	10.421
3	0.000	0.001	0.011	0.084	0.902	5.838	11.928
4	0.000	0.001	0.011	0.084	0.897	5.477	10.819
5	0.000	0.001	0.011	0.086	0.871	5.296	11.118
Mean	0.000	0.001	0.011	0.0862	0.8708	5.3724	10.9284
$c$	?	5	$3.66e^{-6}$	$2.155e^{-6}$	$1.741e^{-6}$	$1.885e^{-6}$	$1.821e^{-6}$

Table 1

Chart 1 shows the values from table 1 in visual form. As you can see, the growth is generally  $n \log n$  as  $n$  increases. The individual colors represent the 5 iterations in order.

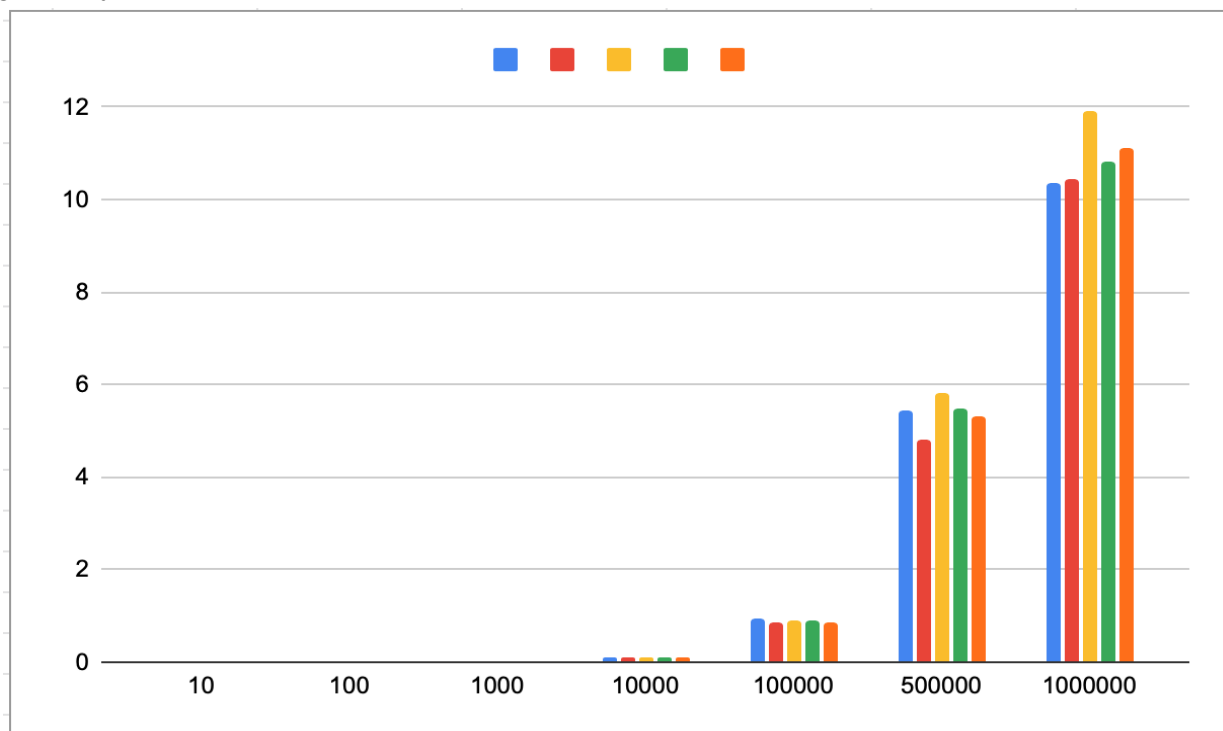


Chart 1

## Part 4

The disparity between the theoretical and empirical time complexities confuses me. Even in going through my code, I came to the conclusion that the algorithm should run  $O(n \log n)$ . However, the data never lies. It seems to run at about  $O(n)$  time with a constant of

proportionality of  $1/100,000$ . I went through the math in section 3. I honestly don't have any ideas as to why this would happen, excepting hardware differences. I'm perfectly happy accepting a lower time complexity.

## Part 5

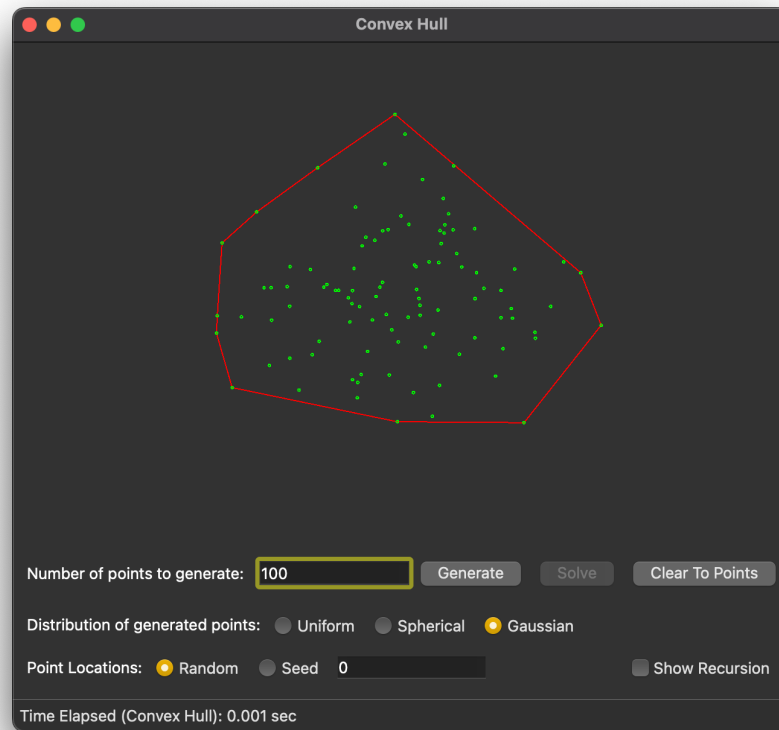


Fig 1: Example of a successful convex hull when  $n = 100$

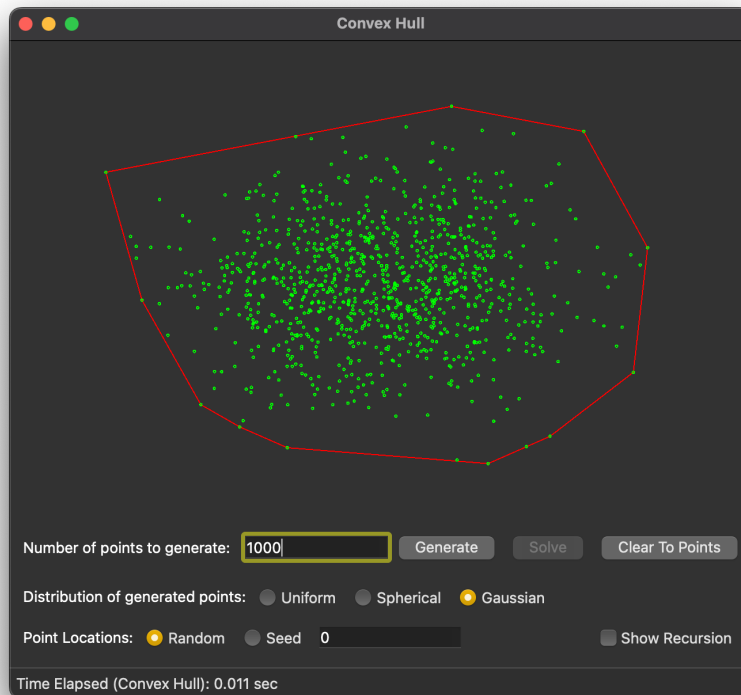


Fig 2: Example of a successful convex hull when  $n = 1,000$

## Appendix - Code

convex\_hull.py

```
from typing import List
```

```
from which_pyqt import PYQT_VER
```

```
import math
```

```
if PYQT_VER == 'PYQT5':
```

```
    from PyQt5.QtCore import QLineF, QPointF, QObject
```

```
elif PYQT_VER == 'PYQT4':
```

```
    from PyQt4.QtCore import QLineF, QPointF, QObject
```

```
elif PYQT_VER == 'PYQT6':
```

```
    from PyQt6.QtCore import QLineF, QPointF, QObject
```

```
else:
```

```
    raise Exception('Unsupported Version of PyQt:
```

```
{}'.format(PYQT_VER))
```

```
import time
```

```

# Some global color constants that might be useful
RED = (255, 0, 0)
GREEN = (0, 255, 0)
BLUE = (0, 0, 255)

# Global variable that controls the speed of the recursion
automation, in seconds
#
PAUSE = 0.25

#
# This is the class you have to complete.
#
class ConvexHullSolver(QObject):

    # Class constructor
    def __init__(self):
        super().__init__()
        self.pause = False

    # Some helper methods that make calls to the GUI, allowing us to
    send updates
    # to be displayed.

    def showTangent(self, line, color):
        self.view.addLines(line, color)
        if self.pause:
            time.sleep(PAUSE)

    def eraseTangent(self, line):
        self.view.clearLines(line)

    def blinkTangent(self, line, color):
        self.showTangent(line, color)
        self.eraseTangent(line)

    def showHull(self, polygon, color):
        self.view.addLines(polygon, color)
        if self.pause:
            time.sleep(PAUSE)

    def eraseHull(self, polygon):
        self.view.clearLines(polygon)

    def showText(self, text):

```

```

        self.view.displayStatusText(text)

# MY FUNCTIONS
# Used to help the quick sort algorithm below, sortPointsByX()
#
def partition(self, array, low, high):
    pivot = array[high]
    i = low - 1
    for j in range(low, high):
        if array[j].x() > pivot.x():
            i = i + 1
            (array[i], array[j]) = (array[j], array[i])

    (array[i + 1], array[high]) = (array[high], array[i + 1])
    return i + 1

# A quick sort algorithm to sort the initial unsorted points by x
value.
# This is a  $O(n \log n)$  time complexity (given from wikipedia).
def sortPointsByX(self, array, low, high):
    if low < high:
        pi = self.partition(array, low, high)
        self.sortPointsByX(array, low, pi - 1)
        self.sortPointsByX(array, pi + 1, high)

# This is used to get the slope - constant time
def getSlope(self, p1, p2) -> int:
    return (p1.y() - p2.y()) / (p1.x() - p2.x())

# Get the left-most point - n time
def findLeftMostPointIndex(self, points) -> int:
    leftMostIndex = 0
    while points[leftMostIndex + 1].x() <
points[leftMostIndex].x():
        leftMostIndex += 1
    if leftMostIndex + 1 >= len(points):
        break
    return leftMostIndex

# Get the next point - constant time
def getNextPointIndex(self, points, index, clockwise: bool):
    if clockwise:
        if len(points) == index + 1:
            return 0
        else:

```



```

        return index + 1
    else:
        if index == 0:
            return len(points) - 1
        else:
            return index - 1

# The main function to get the convex hull - it will run log(n)
times
# In this function there are two while loops, each with O(n) time
complexity
# Therefore, we get O(n log n) time for this algorithm. The time
complexities of
# each function can be found above the corresponding function.
def getConvexHull(self, points) -> list:
    if len(points) <= 3:
        if len(points) == 3 and self.getSlope(points[0],
points[1]) < self.getSlope(points[0], points[2]):
            (points[1], points[2]) = (points[2], points[1])
    else:
        # get hulls
        midIndex = math.floor(len(points) / 2)
        hull1 = self.getConvexHull(points[0: midIndex])
        hull2 = self.getConvexHull(points[midIndex:])

        # set up variables to get top and bottom lines
        indexTop1 = self.findLeftMostPointIndex(hull1)
        indexTop2 = 0

        indexBottom1 = indexTop1
        indexBottom2 = 0

        nextIndex1 = (indexTop1 + 1) if indexTop1 + 1 !=
len(hull1) else 0
        nextIndex2 = len(hull2) - 1

        slope = self.getSlope(hull1[indexTop1], hull2[indexTop2])
        slopeNew1 = self.getSlope(hull1[nextIndex1],
hull2[indexTop2])
        slopeNew2 = self.getSlope(hull1[indexTop1],
hull2[nextIndex2])

        # find top two points - linear time
        while slope < slopeNew1 or slope > slopeNew2:
            if slope < slopeNew1:

```

```

        indexTop1 = nextIndex1
        nextIndex1 = self.getNextPointIndex(hull1,
nextIndex1, True)
        if slope > slopeNew2:
            indexTop2 = nextIndex2
            nextIndex2 = self.getNextPointIndex(hull2,
nextIndex2, False)

        slope = self.getSlope(hull1[indexTop1],
hull2[indexTop2])
        slopeNew1 = self.getSlope(hull1[nextIndex1],
hull2[indexTop2])
        slopeNew2 = self.getSlope(hull1[indexTop1],
hull2[nextIndex2])

        nextIndex1 = indexBottom1 - 1 if indexBottom1 != 0 else
len(hull1) - 1
        nextIndex2 = 1

        slope = self.getSlope(hull1[indexBottom1],
hull2[indexBottom2])
        slopeNew1 = self.getSlope(hull1[nextIndex1],
hull2[indexBottom2])
        slopeNew2 = self.getSlope(hull1[indexBottom1],
hull2[nextIndex2])

        # find bottom two points - linear time
        while slope > slopeNew1 or slope < slopeNew2:
            if slope > slopeNew1:
                indexBottom1 = nextIndex1
                nextIndex1 = self.getNextPointIndex(hull1,
nextIndex1, False)
            if slope < slopeNew2:
                indexBottom2 = nextIndex2
                nextIndex2 = self.getNextPointIndex(hull2,
nextIndex2, True)
            slope = self.getSlope(hull1[indexBottom1],
hull2[indexBottom2])
            slopeNew1 = self.getSlope(hull1[nextIndex1],
hull2[indexBottom2])
            slopeNew2 = self.getSlope(hull1[indexBottom1],
hull2[nextIndex2])

        # concatenate the two arrays - linear time

```

```

        points = hull1[0:indexBottom1 + 1] +
        ((hull2[indexBottom2:] + hull2[0:1]) if indexTop2 == 0 else
        (hull2[indexBottom2:indexTop2 + 1])) + ([] if indexTop1 == 0 else
        hull1[indexTop1:])

    return points

    # This is the method that gets called by the GUI and actually
    # executes
    # the finding of the hull
    def compute_hull(self, points, pause, view):
        self.pause = pause
        self.view = view
        assert (type(points) == list and type(points[0]) == QPointF)

        t1 = time.time()
        self.sortPointsByX(points, 0, len(points) - 1)
        t2 = time.time()

        t3 = time.time()
        points = self.getConvexHull(points)
        polygon = [QPointF(points[i], points[(i + 1) % len(points)])
        for i in range(len(points))]
        t4 = time.time()

        # when passing lines to the display, pass a list of QPointF
        # objects. Each QPointF
        # object can be created with two QPointF objects corresponding
        # to the endpoints
        self.showHull(polygon, RED)
        self.showText('Time Elapsed (Convex Hull): {:.3f}
        sec'.format(t4 - t3))

```