# **Tutorial: Convex Hull**

#### Note

This tutorial aims to determine the convex hull of a set of 2D points with a simple and classical algorithm. This tool is largely used in computational geometry and image modeling. This tutorial is widely inspired of the Wikipedia page https://en.wikipedia.org/wiki/Graham\_scan.

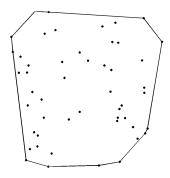


Figure 1: Convex Hull example.

#### 1 Graham scan

The Graham scan is a method of computing the convex hull of a finite set of points in the plane with time complexity  $O(n \log n)$ , n is the number of points. It is an evolution of the Gift wrapping algorithm (O(nh), h) is the number of points in the hull) in the sense that it avoids evaluating all pairs of angles by first sorting the points.

### 1.1 Lowest y-coordinate point

The first step, as in the gift wrapping algorithm, is to find the point with the lowest y-coordinate. If two points exist in the set, choose the one with the lowest x-coordinate: it is denoted P. This step obviously takes O(n).

## 1.2 Sort by angle

Next, the set of points must be sorted in increasing order of the angle they and the point P make with the x-axis.



The idea is not to code a sorting algorithm. Use the MATLAB® sort function.

This is the limiting step, it takes  $O(n \log n)$ . Notice that the cosine of the angle is a decreasing function between 0 and 180 degrees, and will thus avoid to evaluate the angle itself. The sorted set of points is denoted S (it does not contain P).

#### 1.3 Check angles: left or right turn?

From the star-like shape issued from the sorting algorithm, construct a list  $\mathcal{L}$  of points as:  $\mathcal{L} = \{P, \mathcal{S}, P\}.$ 

Then, for each triplet of consecutive points  $(P_i, P_{i+1}, P_{i+2})$  of  $\mathcal{L}$ , check if the angle  $\widehat{P_iP_{i+1}P_{i+2}}$  is a right turn or a left turn. In case of a right turn, remove  $P_{i+1}$  from the list  $\mathcal{L}$ . Process the entire list this way.

### 1.4 Left or right turn?

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. Consider the cross product of the vectors  $\overrightarrow{P_iP_{i+1}}$  and  $\overrightarrow{P_iP_{i+2}}$ .

```
Procedure ccw(p_1, p_2, p_3)

1 | return (p_2.x - p_1.x) * (p_3.y - p_1.y) - (p_2.y - p_1.y) * (p_3.x - p_1.x);
```

Three points are a counter-clockwise turn if ccw > 0, clockwise if ccw < 0, and collinear if ccw = 0 because ccw is a determinant that gives the signed area of the triangle formed by  $p_1$ ,  $p_2$  and  $p_3$ .

# 1.5 Convex hull algorithm

This pseudo-code shows a different version of the algorithm, where points in the hull are pushed into a new list instead of removed from  $\mathcal{L}$ .

```
Data: n: number of points

Data: \mathcal{L}: sorted list of n+1 elements

Data: First and last elements are the starting point P.

Data: All other points are sorted by polar angle with P.

stack will denote a stack structure, with push and pop functions.

Data: stack.push(\mathcal{L}(1))

Data: stack.push(\mathcal{L}(2))

for i=3 to n+1 do

| while stack.size \geq 2 AND ccw(stack.secondlast, stack.last, \mathcal{L}(i)) < 0) do

| stack.push(\mathcal{L}(i));

end

stack.push(\mathcal{L}(i));
```

In this pseudo-code, stack.secondlast is the point just before the last one in the stack. When coding this algorithm, you might encounter problems with floating points operations (collinearity or equality check might be a problem).



- 1. Generate a set of random points.
- 2. Implement and apply the algorithm, and visualize the result.