

# The Convex Hulls

Implementation of Two-dimensional Convex Hull  
Algorithms and Comparing Their Performances

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# Outline

**1. Introduction**

**2. Background for Convex Hulls**

**3. Progress**

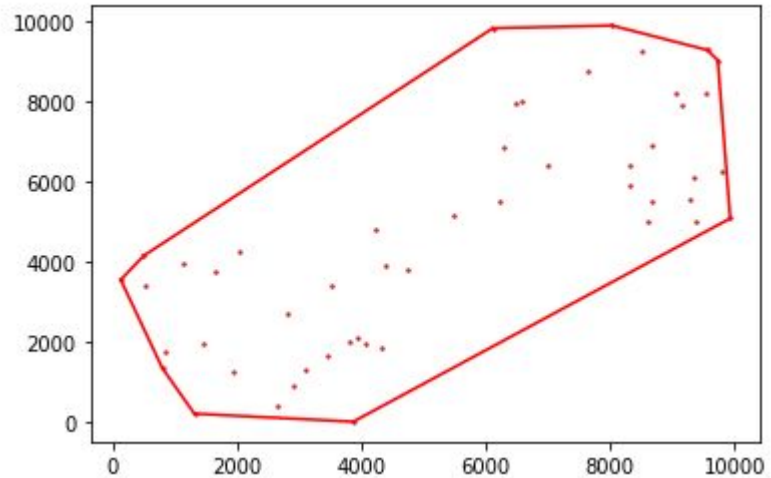
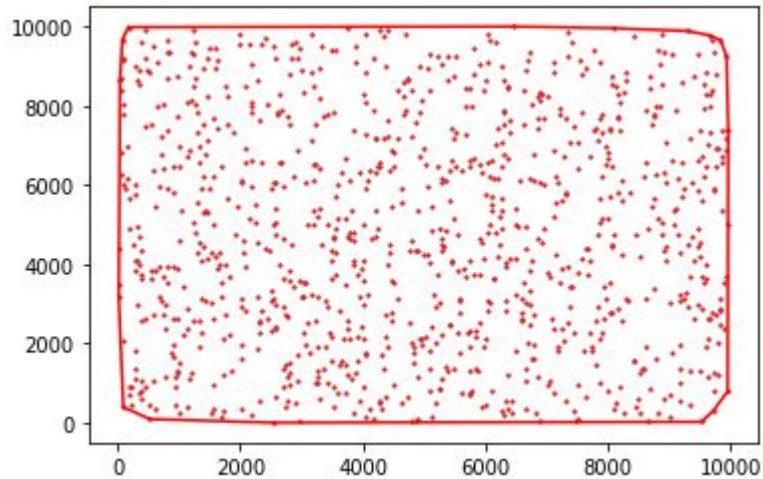
**3. Result**

**4. Demo**

# 1. Introduction

# What is Convex Hull?

Convex hull is the smallest convex set which contains all the points in it.



# Why Convex Hull?

It has wide application like in

- Math-> analyze asymptotic beh. of polynomials
- Statistic -> visualize the spread of 2D sample points
- Economic -> When actual data non-convex, made convex
- Geometric modeling -> In Bezier curve, quickly detecting intersections of curves

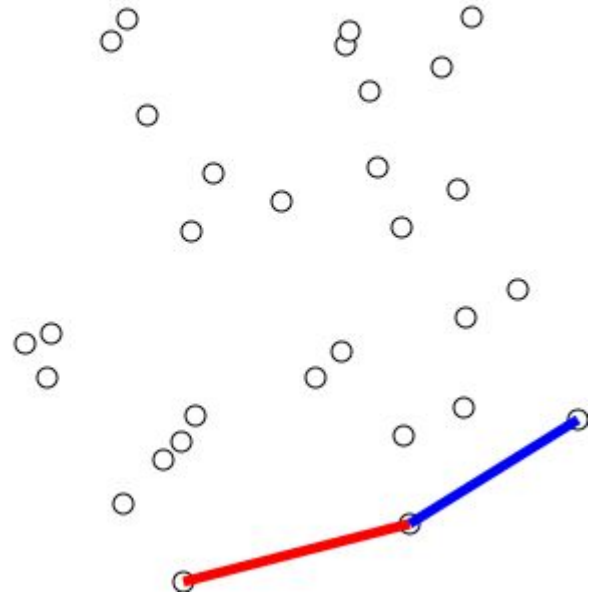
## 2. Background

# Algorithms

- In general, most of the algorithms can be solved in time  $O(n \log n)$  for 2D or 3D
  - Graham Scan  $\rightarrow O(n \log n)$
  - Gift wrapping ( Jarvis March )  $\rightarrow O(n \log n)$
  - Quickhull  $\rightarrow$  ave.  $O(n \log n)$   $\rightarrow$  wor.  $O(n^2)$
  - Divide & Conquer  $\rightarrow O(n \log n)$

# Graham Scan

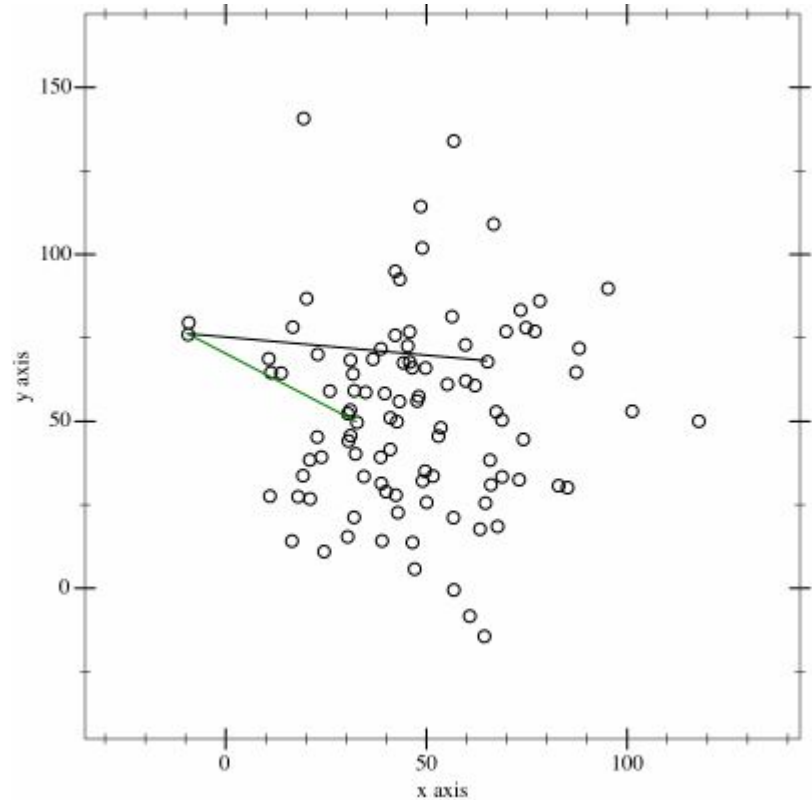
- Ronald Graham 1972
- $O(n \log n)$
- First order vertices based on polar angle
- By left test, move around the points
- If left test is true add to stack or delete from until it is true





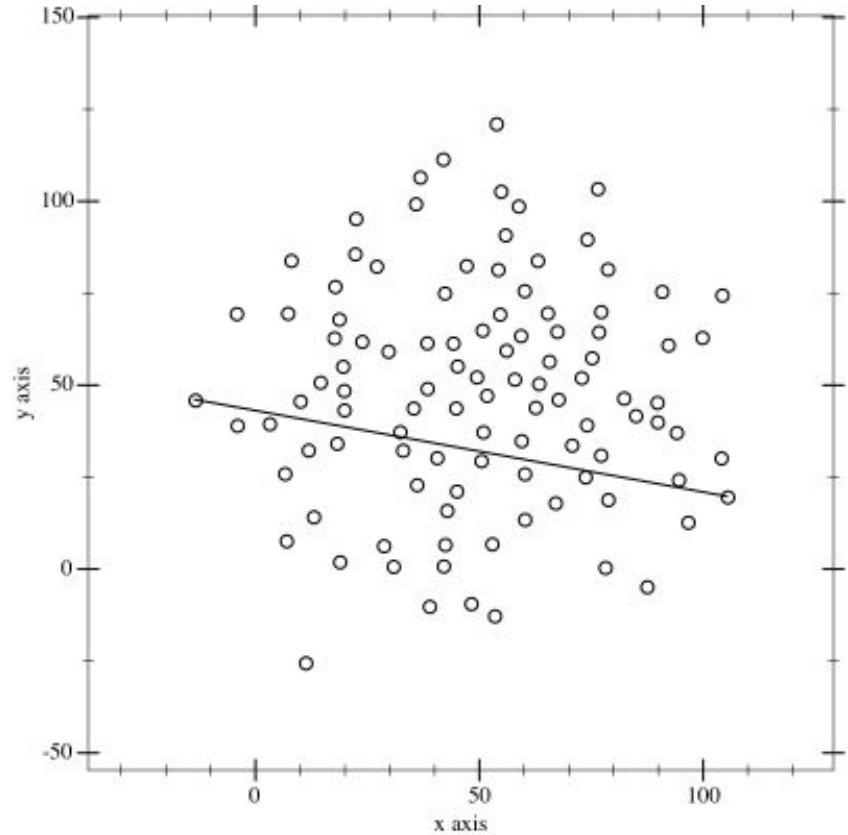
# Jarvis March

- R. A. Jarvis-1973
- $O(nh)$
- It takes smallest point based on x or y.
- Sort all points based on polar angle
- Beside Graham, only calculates the points on the convex hull.



# Quickhull

- Bradford Barber-1996
- Worst case  $O(n^2)$  Average case  $O(n \log n)$
- Divides points into 2
- Find farthest point by calculating triangle area as recursive until no points left on recursive function

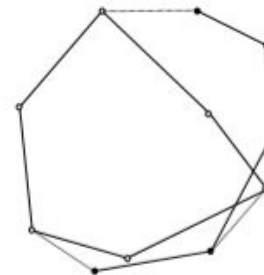
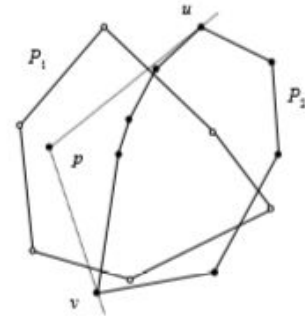
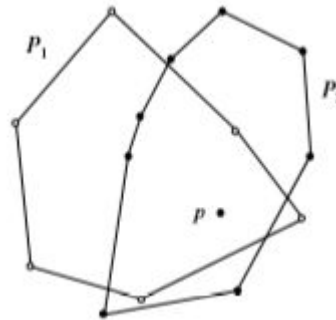


# Divide and Conquer

- Quickhull recursively
- Then Merge them

# Merge Hull ( Merging Process of D&C)

1.  $P_1$  &  $P_2$  are convex hulls, find  $p$  internal  $P_1$
2. If  $p$  internal  $P_2 \rightarrow$  step 3  
Else  $\rightarrow$  step 4
3. Sort based on polar for  $p$
4. Find  $u$  and  $v$  and eliminate middle chain in  $P_2$
5. Graham Scan
  - Merge:  $p_1 \rightarrow m$   $p_2 \rightarrow n$  So,  $O(m+n)=O(N)$
  - In Total  $O(N \log N)$



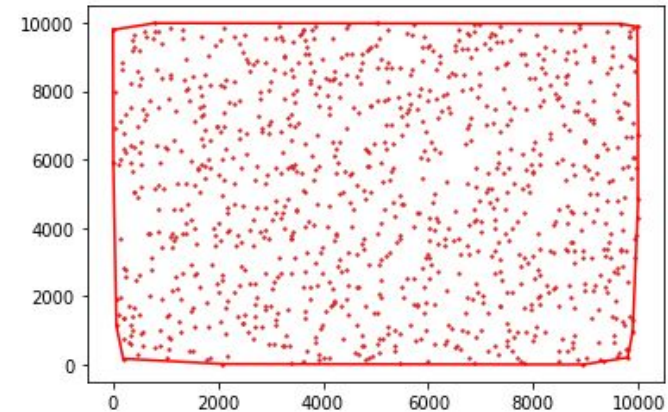
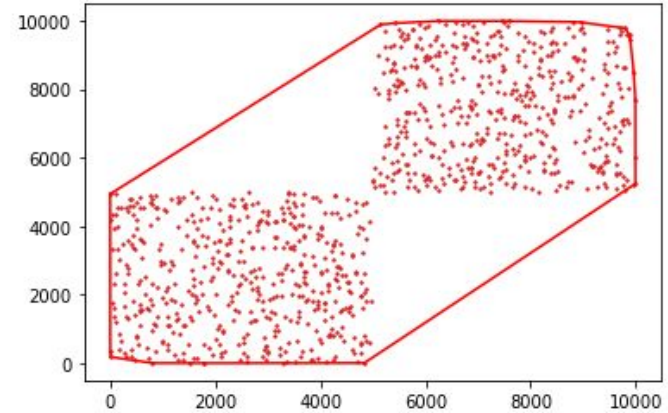
### 3. Progress

# Language & Libraries

- Python 3 for coding
- The libraries:
  - random for point generation
  - math for tan calculations
  - numpy as array
  - time for timing calculations
  - matplotlib to show visual results

# Features

- Clustered and non-clustered points
- from 1000 to 10.000.000 random point size
- Time calculation



## 4. Results



Graham Scan	Uniform(s)	Clustered(s)	Expected
1,000	0.00348	0.00343	$O(n \log n) = 3,000$
10,000	0.04643	0.04083	$O(n \log n) = 40,000$
100,000	1.26024	0.48540	$O(n \log n) = 500,000$
1,000,000	7.10247	7.25312	$O(n \log n) = 6,000,000$
2,000,000	14.91750	14.30834	$O(n \log n) = 12,602,060$
3,000,000	23.81629	23.92488	$O(n \log n) = 19,431,363$
4,000,000	31.19035	30.92443	$O(n \log n) = 26,408,240$
5,000,000	40.74763	38.05435	$O(n \log n) = 33,494,850$
10,000,000	87.29779	80.77861	$O(n \log n) = 70,000,000$

Jarvis' March	Uniform(s)	Clustered(s)	Expected
1,000	0.01776 h = 23	0.01535 h = 18	u->O(nh)=23,000 c->O(nh)=18,000
10,000	0.23531 h = 26	0.25829 h = 26	u->O(nh)=260,000 c->O(nh)=260,000
100,000	5.52423 h = 37	4.01435 h = 35	u->O(nh)=3,700,000 c->O(nh)=3,500,000
1,000,000	66.89897 h = 33	69.90606 h = 41	u->O(nh)=33,000,000 c->O(nh)=41,000,000
2,000,000	174.11069 h = 47	115.76362 h = 44	u->O(nh)=94,000,000 c->O(nh)=88,000,000
3,000,000	244.66016 h = 45	295.58773 h = 48	u->O(nh)=135,000,000 c->O(nh)=144,000,000
4,000,000	340.58623 h = 40	414.12098 h = 48	u->O(nh)=160,000,000 c->O(nh)=192,000,000
5,000,000	353.88278 h = 47	469.60794 h = 44	u->O(nh)=235,000,000 c->O(nh)=220,000,000
10,000,000	356.32224 h=50	1145.9719 h=66	u->O(nh)=500,000,000 c->O(nh)=660,000,000

Quickhull	Uniform(s)	Clustered(s)	Expected
1,000	0.00512	0.00384	$O(n \log n) = 3,000$ $O(n^*n) = 10^6$
10,000	0.05689	0.03930	$O(n \log n) = 40,000$ $O(n^*n) = 10^8$
100,000	0.71644	0.55157	$O(n \log n) = 500,000$ $O(n^*n) = 10^{10}$
1,000,000	5.52458	5.60349	$O(n \log n) = 6,000,000$ $O(n^*n) = 10^{12}$
2,000,000	11.87036	11.54690	$O(n \log n) = 12,602,060$ $O(n^*n) = 4 * 10^{12}$
3,000,000	X	17.12558	$O(n \log n) = 19,431,363$ $O(n^*n) = 9 * 10^{12}$
4,000,000	X	X	$O(n \log n) = 26,408,240$ $O(n^*n) = 16 * 10^{12}$
5,000,000	X	X	$O(n \log n) = 33,494,850$ $O(n^*n) = 25 * 10^{12}$
10,000,000	X	X	$O(n \log n) = 70,000,000$ $O(n^*n) = 10^{14}$

Merge Hull	Uniform(s)	Clustered(s)	Expected
1,000	0.00414	0.00391	$O(n \log n) = 3,000$
10,000	0.04171	0.03664	$O(n \log n) = 40,000$
100,000	0.52161	0.44887	$O(n \log n) = 500,000$
1,000,000	6.18138	6.00312	$O(n \log n) = 6,000,000$
2,000,000	12.24851	13.15488	$O(n \log n) = 12,602,060$
3,000,000	17.88851	26.40263	$O(n \log n) = 19,431,363$
4,000,000	25.77283	31.05477	$O(n \log n) = 26,408,240$
5,000,000	32.26809	42.65405	$O(n \log n) = 33,494,850$
10,000,000	X	X	$O(n \log n) = 70,000,000$

Clustered	Graham	Jarvis	Quickhull	Merge
1,000,000	7.25312	69.90606 h = 41	5.60349	6.00312
2,000,000	14.30834	115.76362 h = 44	11.54690	13.15488
3,000,000	23.92488	295.58773 h = 48	17.12558	26.40263
4,000,000	30.92443	414.12098 h = 48	X	31.05477
5,000,000	38.05435	469.60794 h = 44	X	42.65405
10,000,000	80.77861	1145.9719 h=66	X	X

Uniform	Graham	Jarvis	Quickhull	Merge
1,000,000	7.10247	66.89897 h = 33	5.52458	6.18138
2,000,000	14.91750	174.11069 h = 47	11.87036	12.24851
3,000,000	23.81629	244.66016 h = 45	X	17.88851
4,000,000	31.19035	340.58623 h = 40	X	25.77283
5,000,000	40.74763	353.88278 h = 47	X	32.26809
10,000,000	87.29779	356.32224 h=50	X	X



Demo