


# ALGORITHMS

Admin stuff - from web page  <https://www.student.cs.uwaterloo.ca/~cs341/>

Outline How to find the best algorithmic solutions to problems

## I. How to Design Algorithms

- general paradigms - greedy, divide and conquer, dynamic programming, reductions
- basic repertoire of algorithms
  - sorting (1st year), string algorithms (CS240)
  - domain specific algs. covered in other courses  
e.g. graph algorithms, linear prog. (C&O);  
numerical algs.; algebraic algs in symbolic computing.

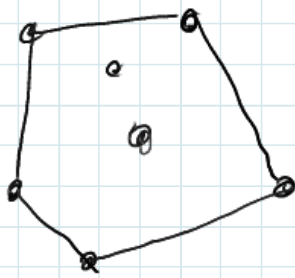
## II. How to analyze algorithms - how good is this alg.?

- time, space, goodness of approximation
- O notation, worst/avg. case
- models of computation

## III Lower bounds - Do we have the best alg.?

- models of computation
- basic lower bounds
- NP-completeness and undecidability.

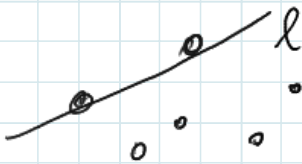
## Case Study Convex Hull



Given  $n$  points in the plane, find their convex hull — the smallest convex set containing the points. (Like putting a rubber band around nails sticking out.)

Why? Convex hull gives "shape" of a set of points — better container than min. bounding box.

Equivalently (and better for alg.) the convex hull is a polygon whose sides are formed by lines  $l$  that go through [at least] 2 points and have no points to one side of  $l$ .



### A. Straightforward Algorithm.

for all pairs of points  $r, s$

find line through  $r, s$

if all other points lie on or to one side of  $l$

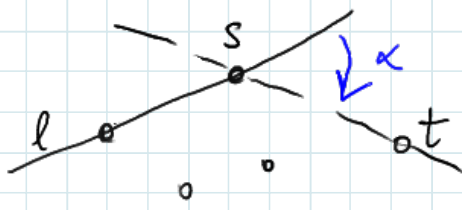
then  $l$  forms part of convex hull.

Time for  $n$  points:  $O(n^3)$

Can we do better? Yes — several possibilities.

### B. Jarvis' March

Observe that once we have found one line  $l$ , there is a natural "next" line  $l'$ .



Rotate  $l$  through  $s$  until it hits the next point  $t$ .

How can we find  $l'$ ? Look at all lines through  $s$  and another point, and find the "extreme" one in the sense of minimizing angle  $\alpha$ .

Finding extreme is like finding min. element of a set -  $O(n)$ .  
Whole alg. is  $O(n^2)$ .

[This alg. is good to use when the convex hull has few points. It actually takes time  $O(n \cdot h)$ ,  $h = \#$  convex hull points.]

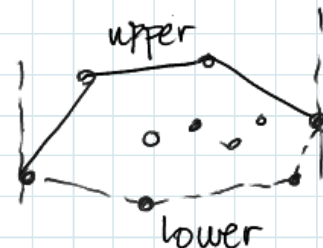
Can we do better? Yes.

### C. Reduction.

Repeatedly finding the min. should remind you of sorting.

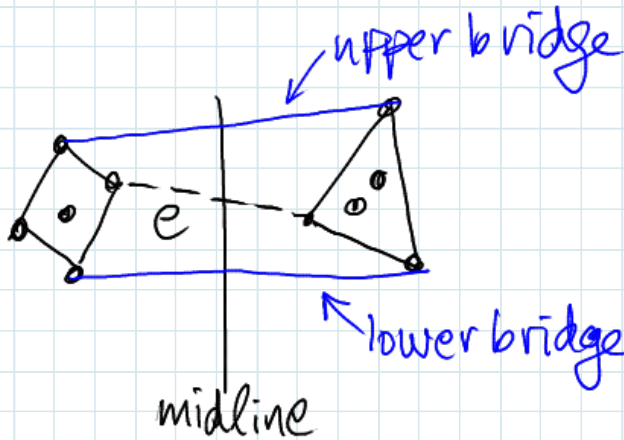
Sort points by  $x$ -coordinate. Then you can find convex hull with  $O(n)$  further work.

Exercise. Hint: Find upper and lower convex hull separately.



A reduction uses an alg. you know (sorting) to solve a new problem.

D. Use divide and conquer



Divide in half by vertical  
Recursively find convex hull  
on each side

Combine by finding  
upper & lower bridge

[details:  $e$  = edge from max  $x$   
on left to min  $x$  on right.

"Walk  $e$  up" to get upper bridge  
...]

$O(n)$  to find median,  
upper & lower bridge

Get recurrence relation

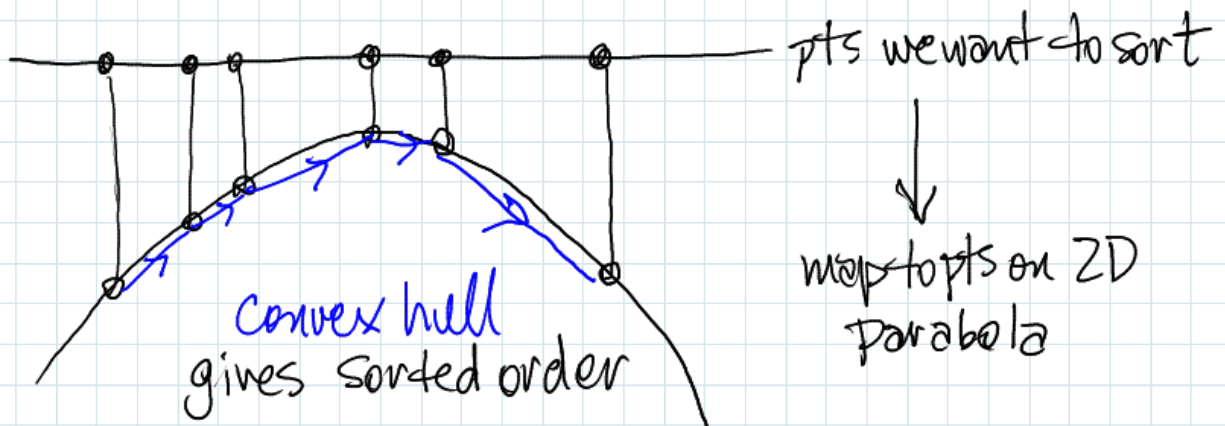
$$T(n) = 2T\left(\frac{n}{2}\right) + O(n)$$

Like recurrence for merge sort, so  $T(n) = O(n \log n)$

Can we do better?

In some sense, NO.

If we could find convex hull faster, we could sort faster



This is not rigorous — what is the model of computation?

Challenge Look up Timothy Chan's

"output sensitive convex hull alg.  $O(n \log h)$

[Note: we saw  $O(n \log n)$  and  $O(n \cdot h)$ . Which is better?

Neither — hence Timothy's alg.]



## Analyzing Algorithms

Definitions An algorithm is a finite answer to an infinite question.

Problem - specification of infinite set of inputs

- specification of corresponding outputs

[Note: can be difficult in practice to distinguish infinite from large finite, e.g. chess - finite, but large enough to be very hard & interesting]

Algorithm - well defined computational procedure to go from any input to corresponding output.

For our purposes - described in pseudo code.

Analyze an Algorithm - measure time and space used by the algorithm as a function of input size  
- measured not by running the program, but by using an abstract model of computing.

## Models of Computation

- specify the elementary computations out of which algorithms are built.
- specify measure of time, space, input size.

Bottom line: model should reflect (but simplify) reality.