

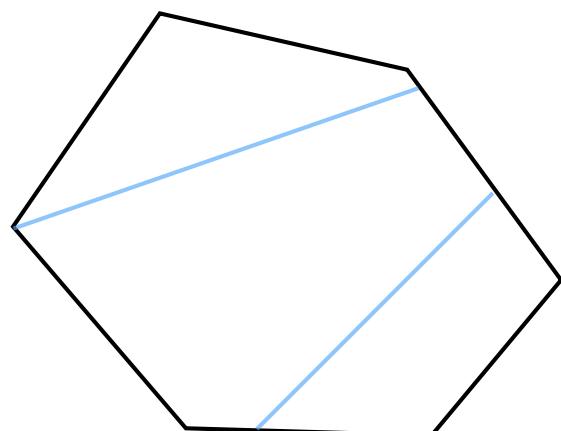
# Planar convex hulls (I)

# Outline

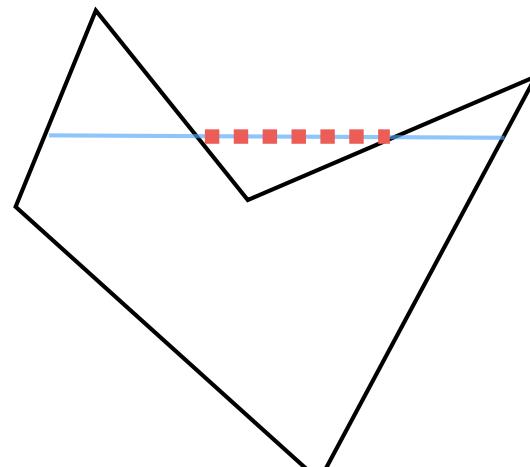
- Definition and properties
- Algorithms for computing the convex hull
  - Brute force
  - Gift wrapping
- Next times
  - Quickhull
  - Graham scan
  - Andrew's monotone chain
  - Incremental hull
  - Divide-and -conquer hull
  - Lower bound

# Convexity

A polygon  $P$  is **convex** if for any  $p, q$  in  $P$ , the segment  $pq$  lies entirely in  $P$ .



convex

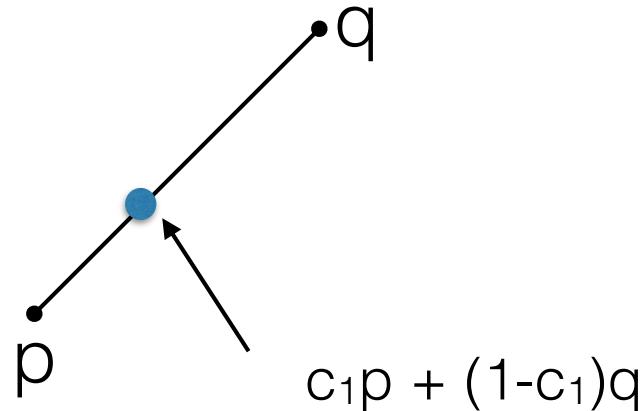


non-convex

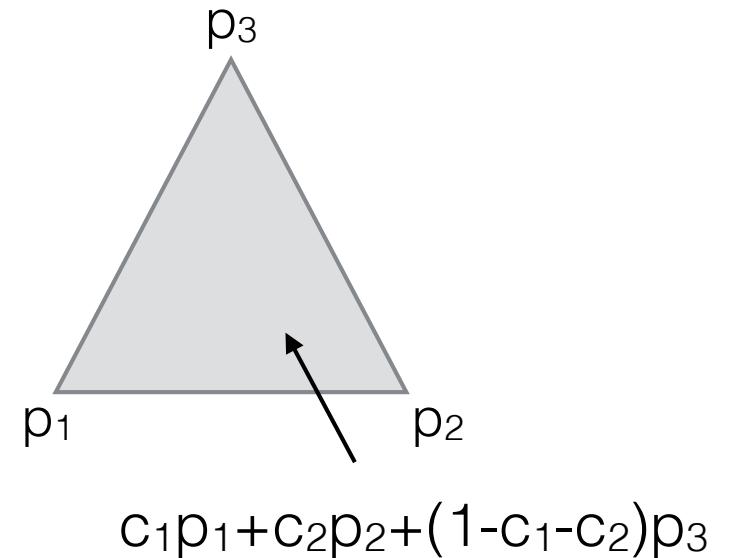
## Convexity: algebraic view

- A **convex combination** of points  $p_1, p_2, \dots, p_k$  is a point of the form

$$c_1p_1 + c_2p_2 + \dots + c_kp_k \text{ with } c_i \in [0,1], c_1 + c_2 + \dots + c_k = 1$$



a segment consists of all convex combinations of its 2 vertices

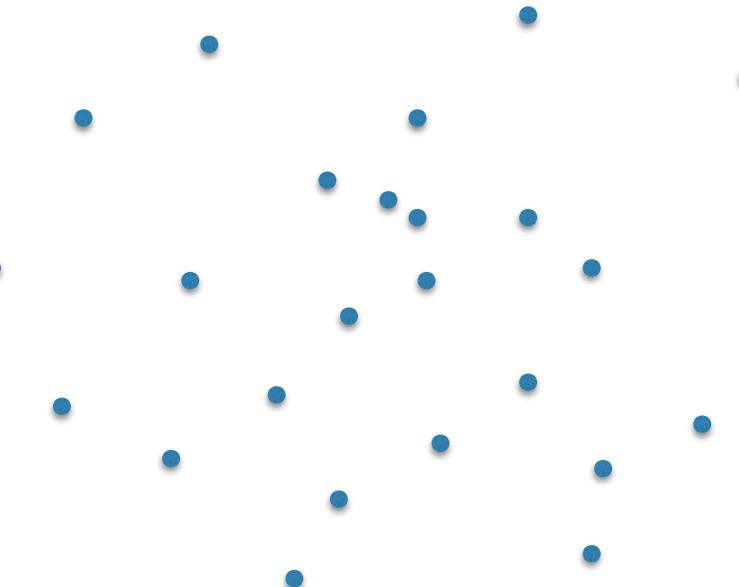


a triangle consists of all convex combinations of its 3 vertices

- The convex hull  $CH(P) =$  all convex combinations of points in  $P$

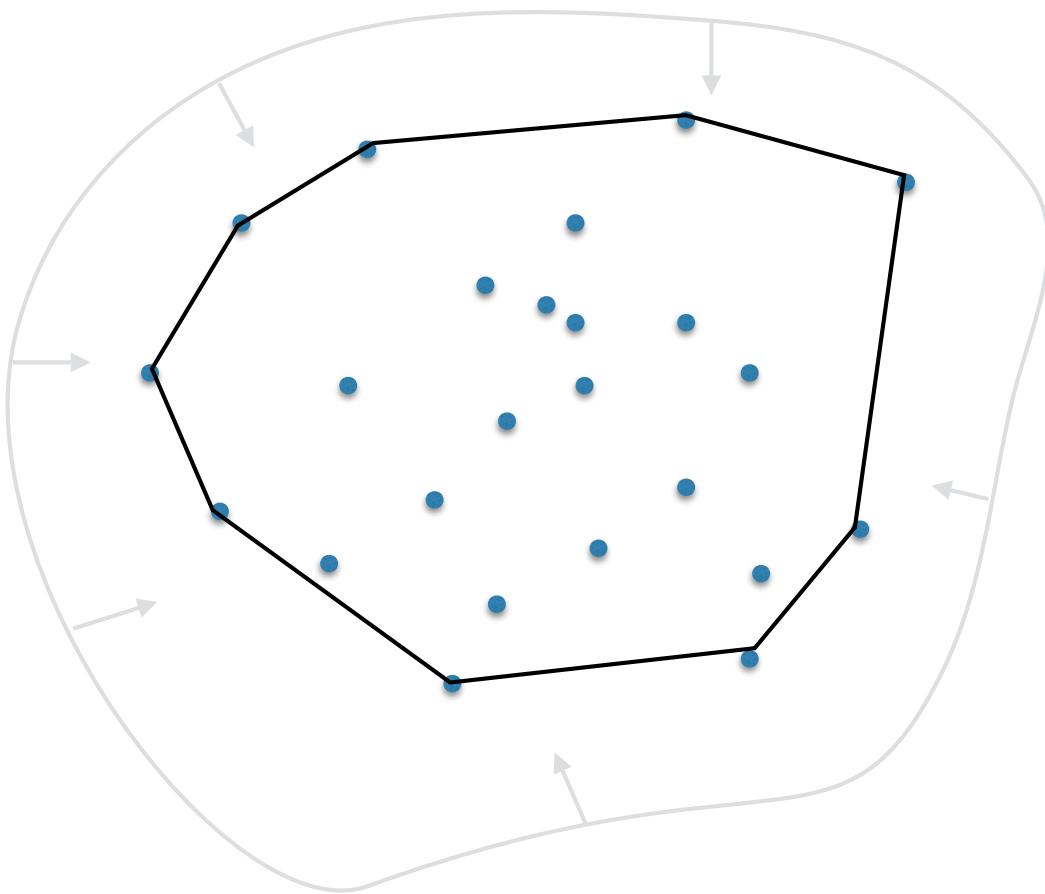
# Convex Hull

Given a set  $P$  of points in 2D, their convex hull is the smallest convex polygon that contains all points of  $P$



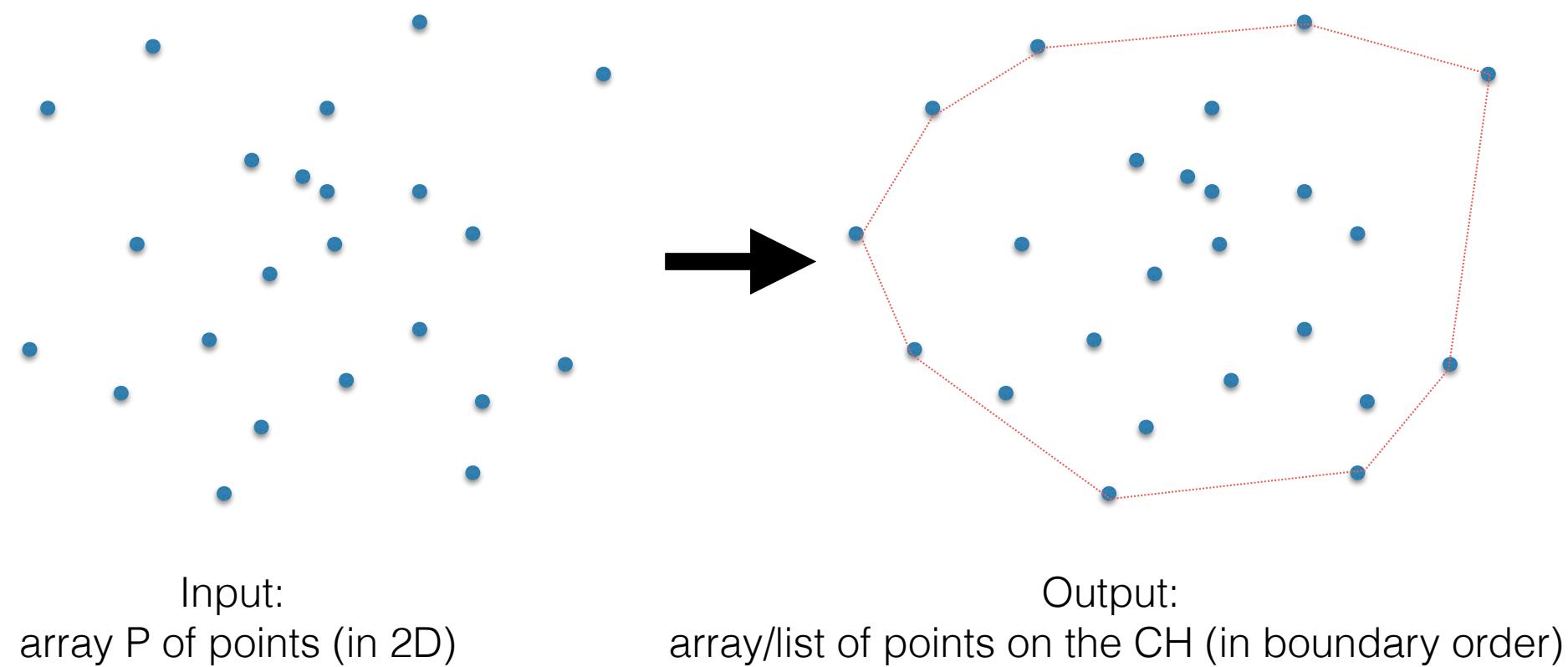
# Convex Hull

Given a set  $P$  of points in 2D, their convex hull is the smallest convex polygon that contains all points of  $P$



# Compute the Convex Hull

Given a set  $P$  of points in 2D, describe an algorithm to compute their convex hull

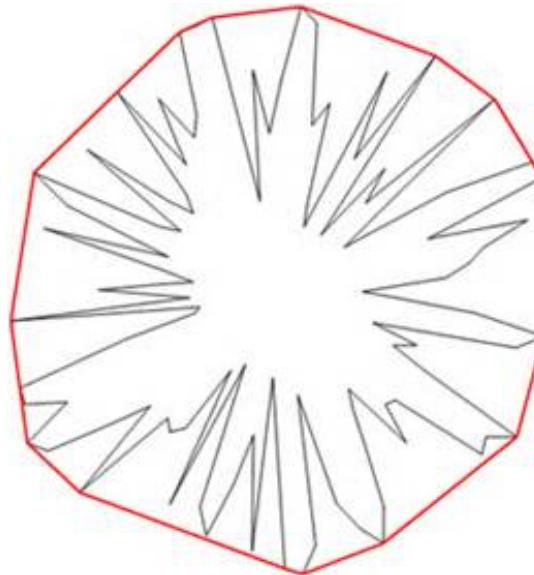


# Convex Hull

- One of the first problems studied in CG
- Many solutions
  - simple, elegant, intuitive
  - illustrate techniques for geometrical algorithms
- Used in many applications
  - robotics, path planning, partitioning problems, shape recognition, separation problems, etc

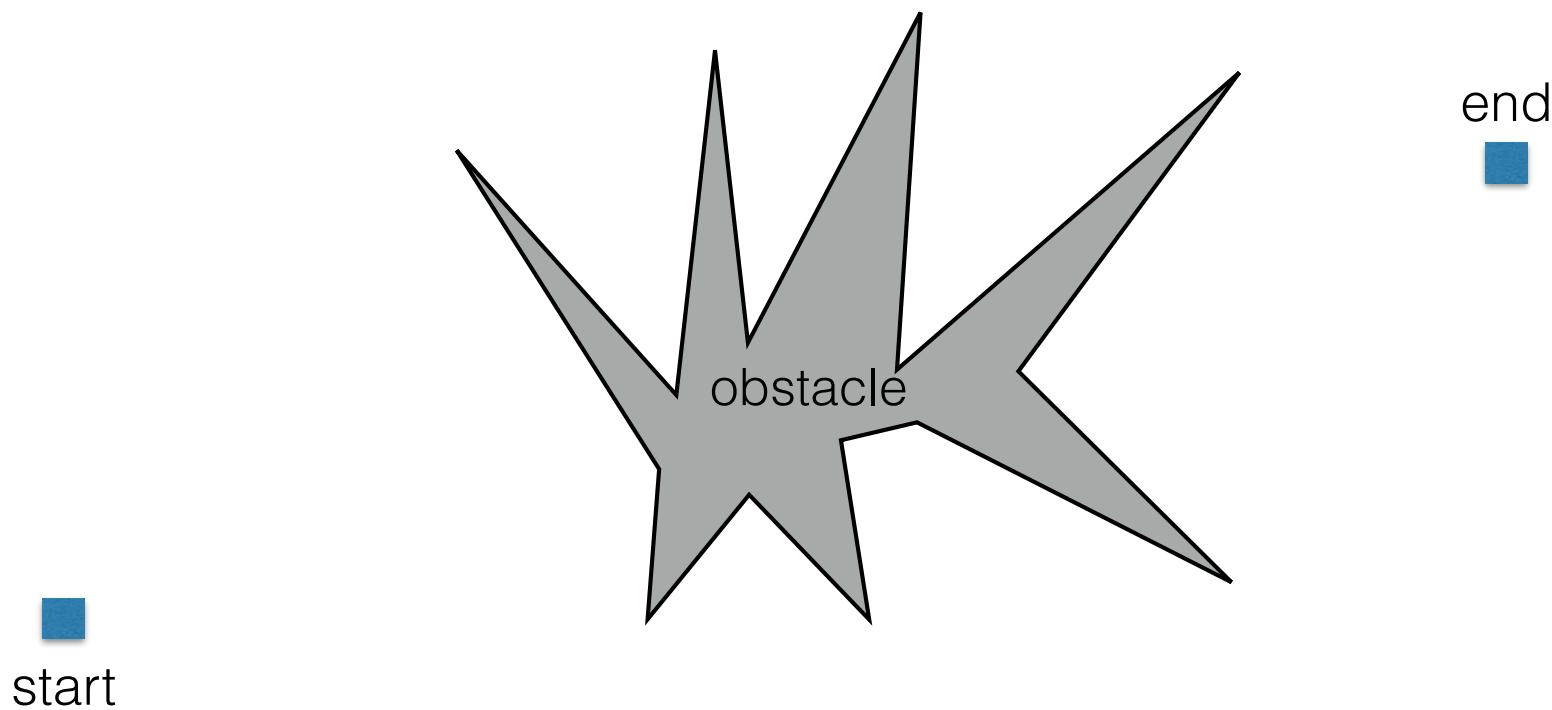
# Applications

- Shape analysis, matching, recognition
  - approximate objects by their CH



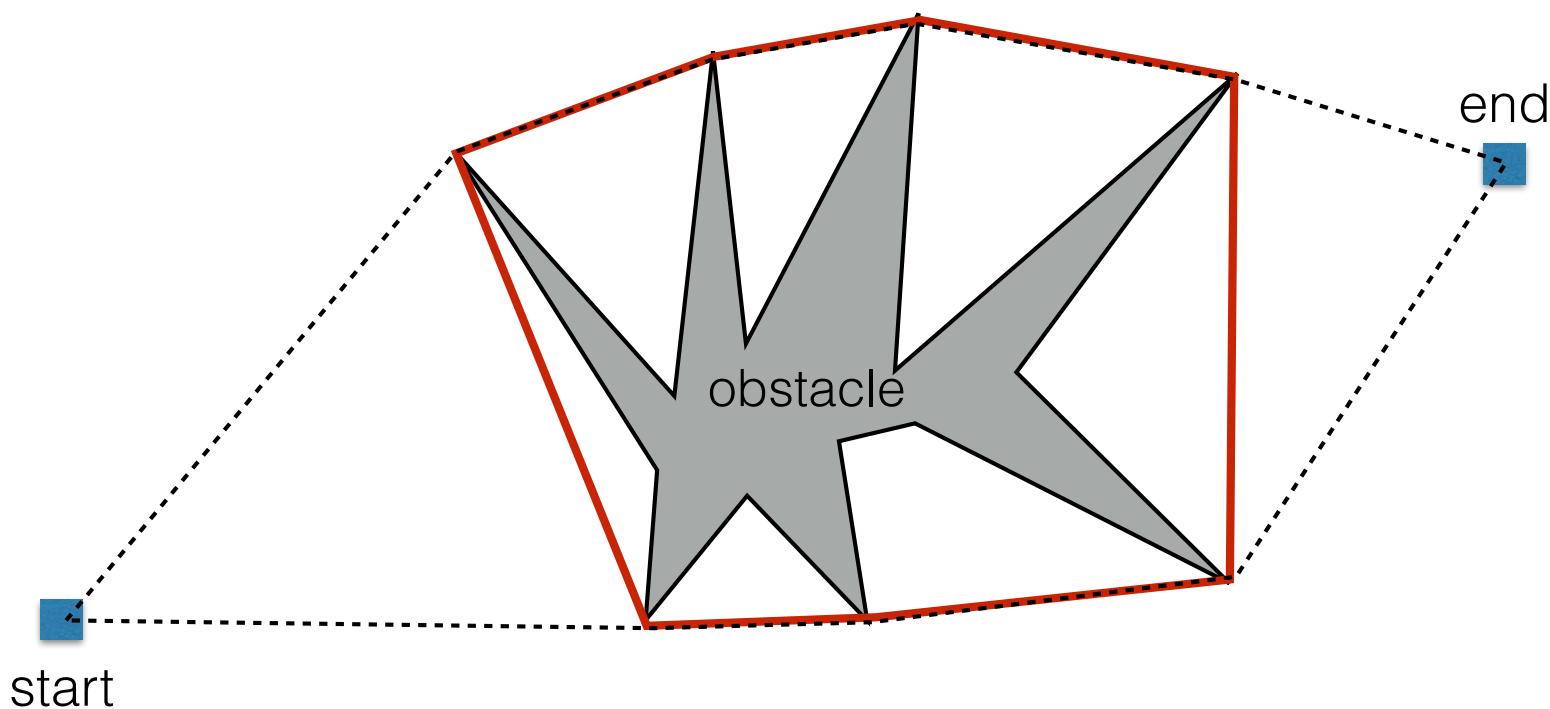
# Applications

- Path planning: find (shortest) collision-free path from start to end



# Applications

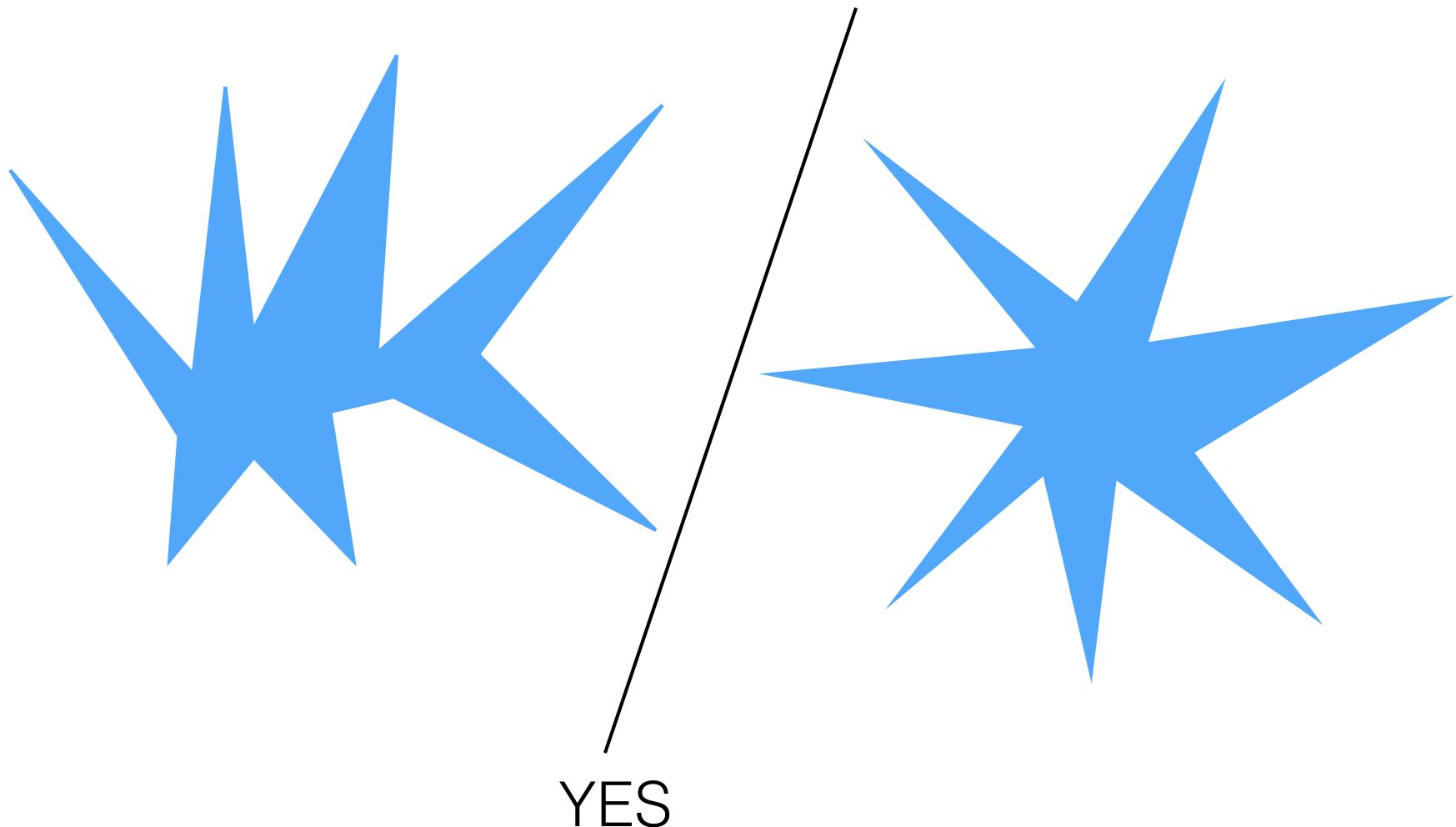
- Path planning: find (shortest) collision-free path from start to end



- The shortest path follows the CH(obstacle)
  - it is the shorter of the upper path and lower path

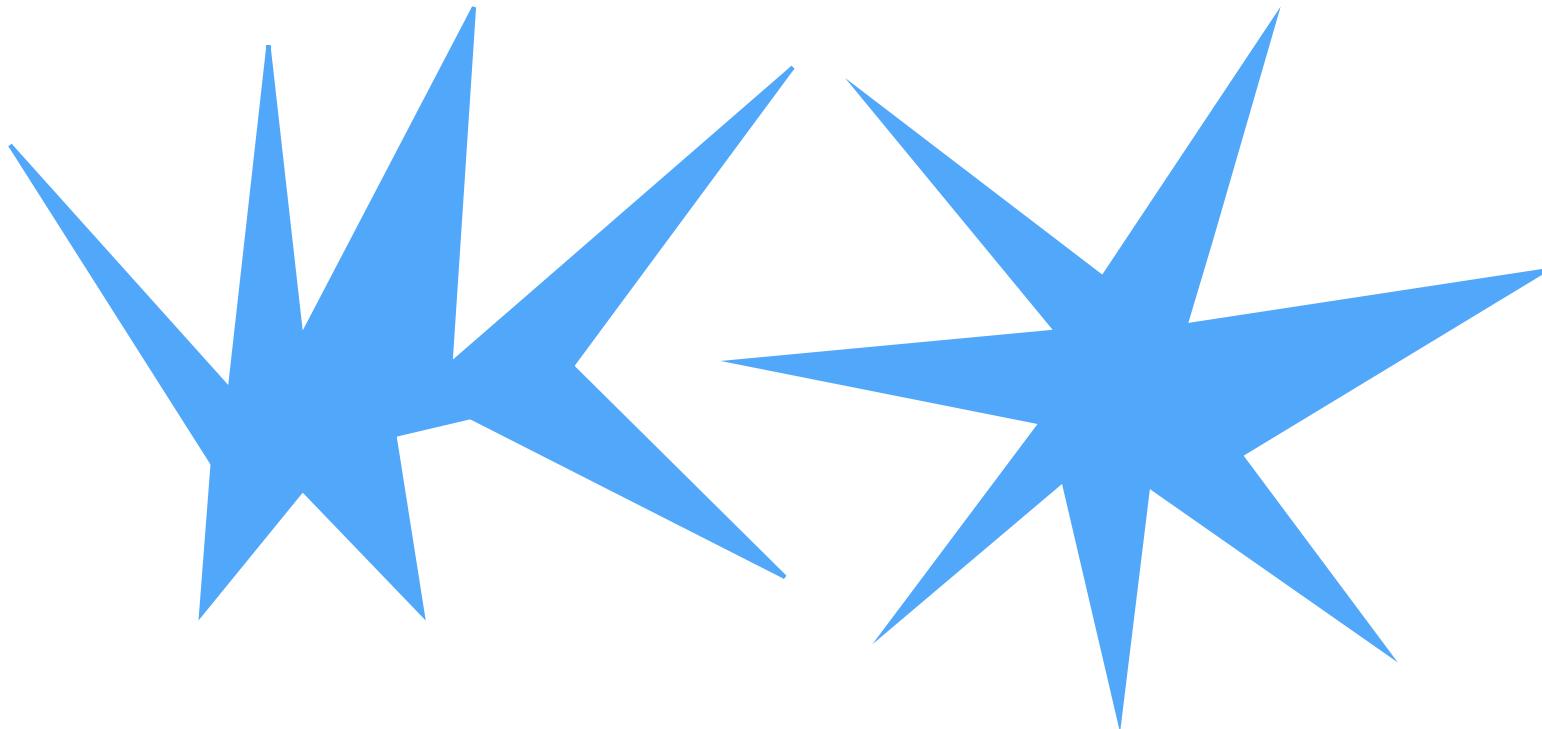
# Applications

- Partitioning problems
  - does there exist a line separating two objects?



# Applications

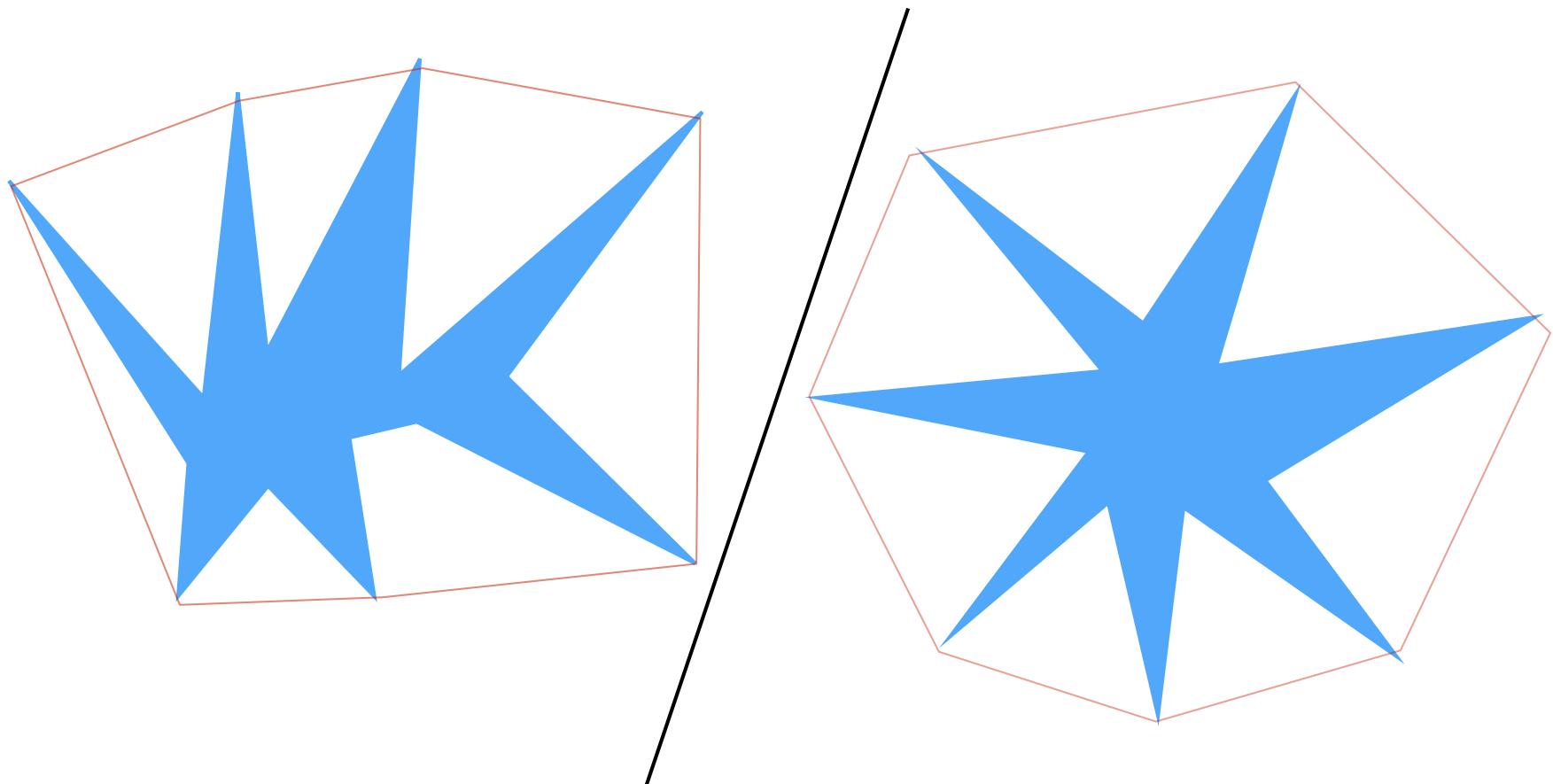
- Partitioning problems
  - does there exist a line separating two objects?



NO

# Applications

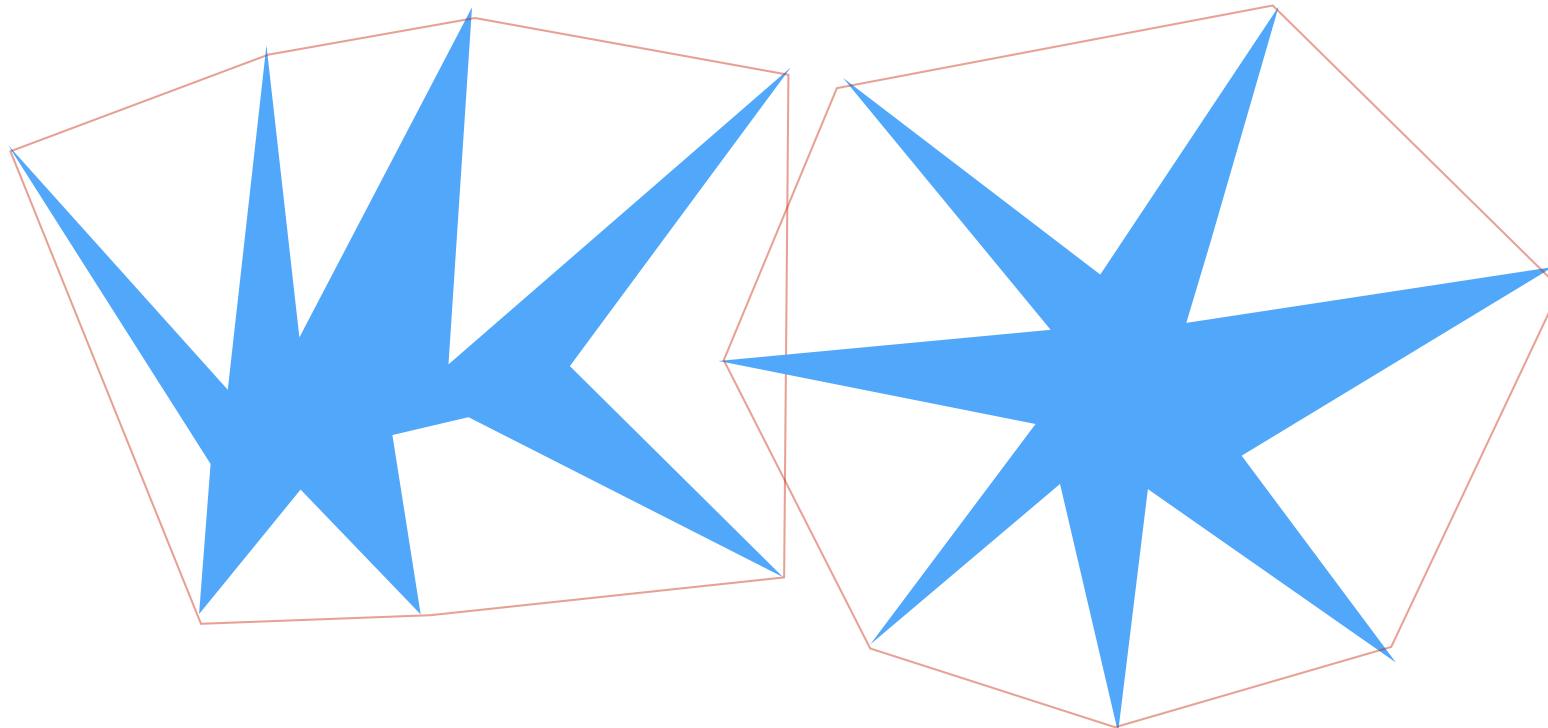
- Partitioning problems
  - does there exist a line separating two objects?



YES

# Applications

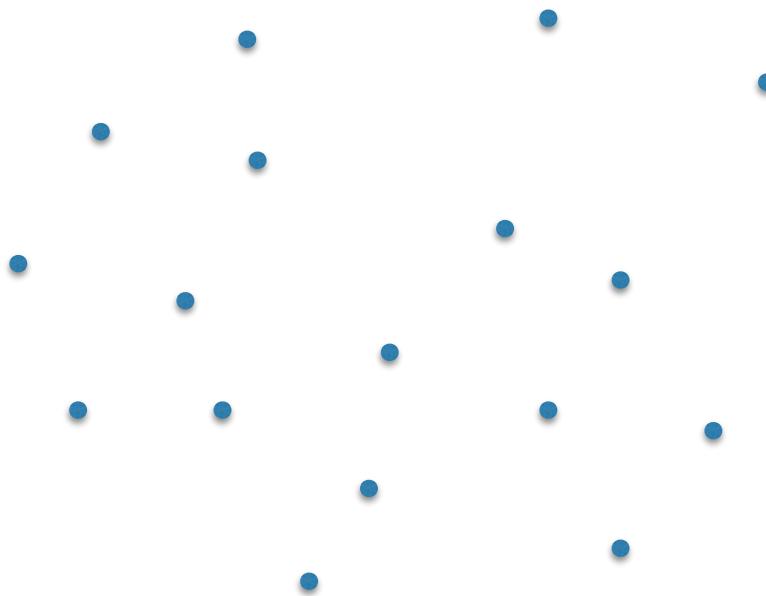
- Partitioning problems
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NO

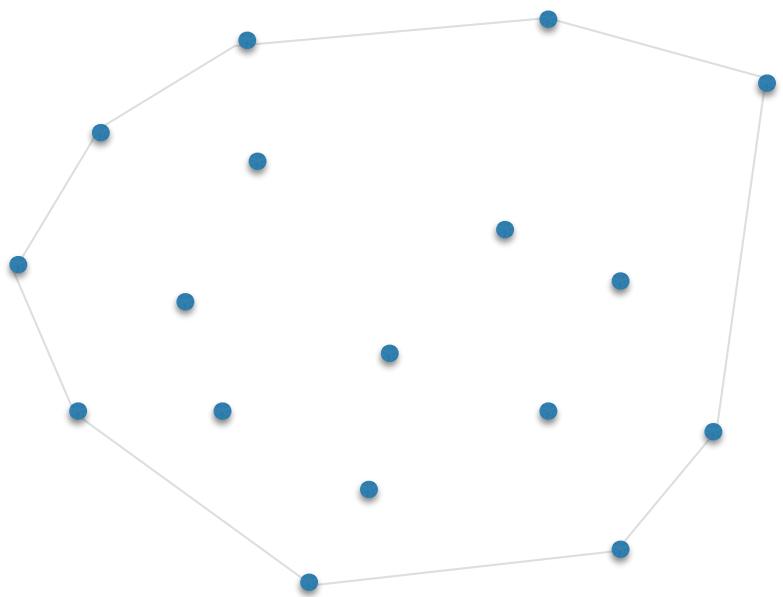
# Applications

- Find the two points in  $P$  that are farthest away

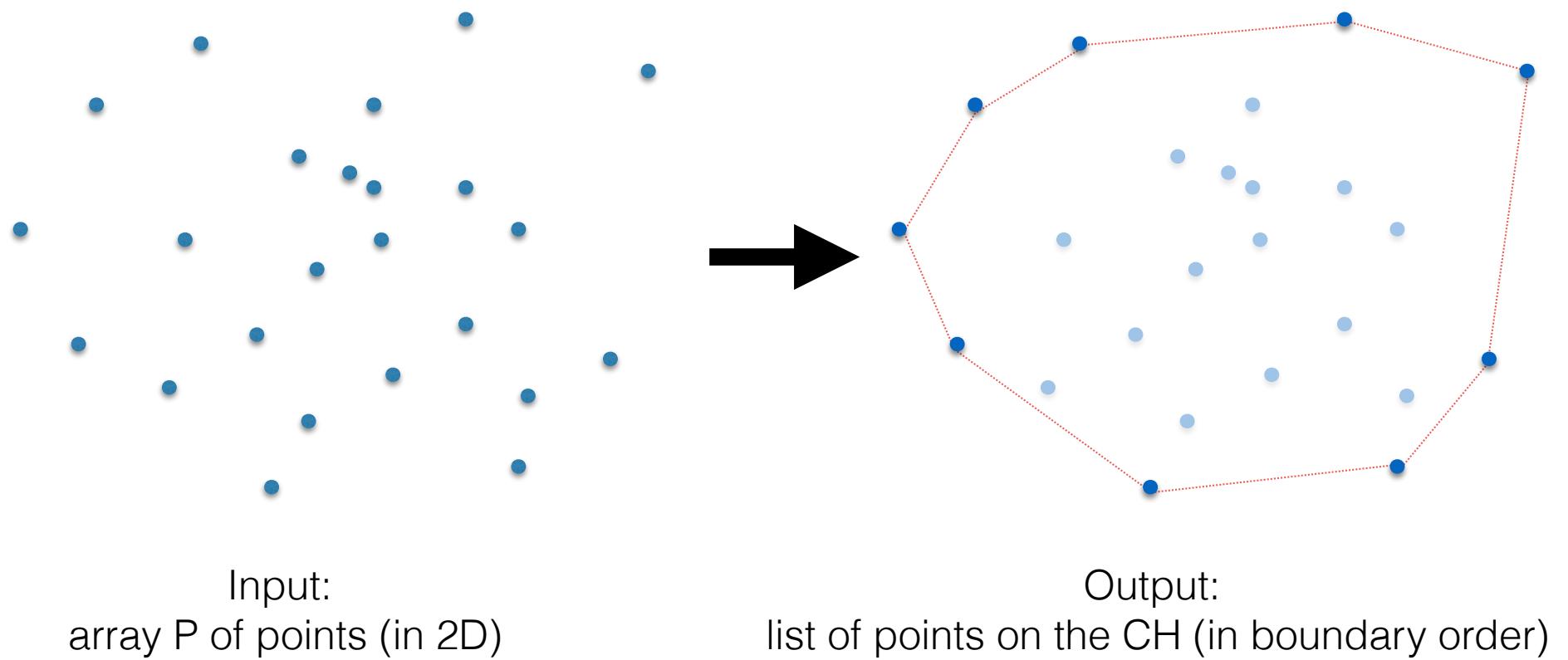


# Applications

- Find the two points in  $P$  that are farthest away



So, we want to compute the convex hull



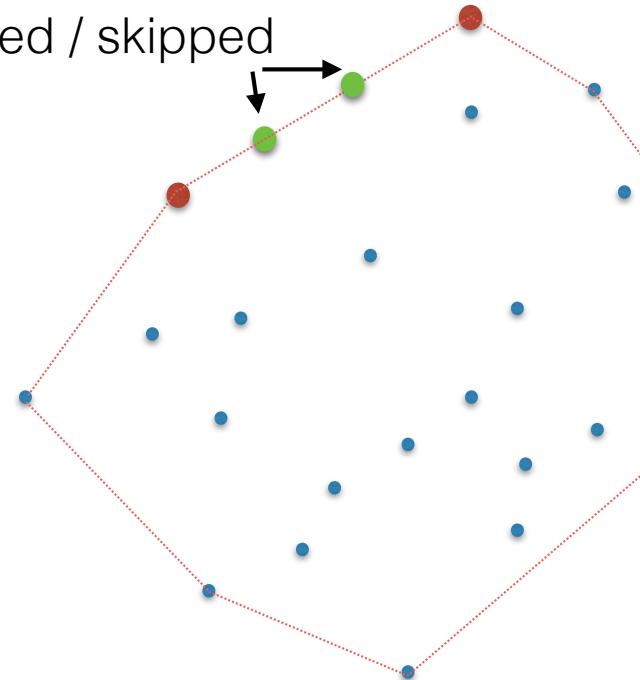
# Convex Hull Variants

Several types of convex hull output are conceivable

- **all** points on the hull
- **only non-collinear** points

- in **boundary** order
- in **arbitrary** order

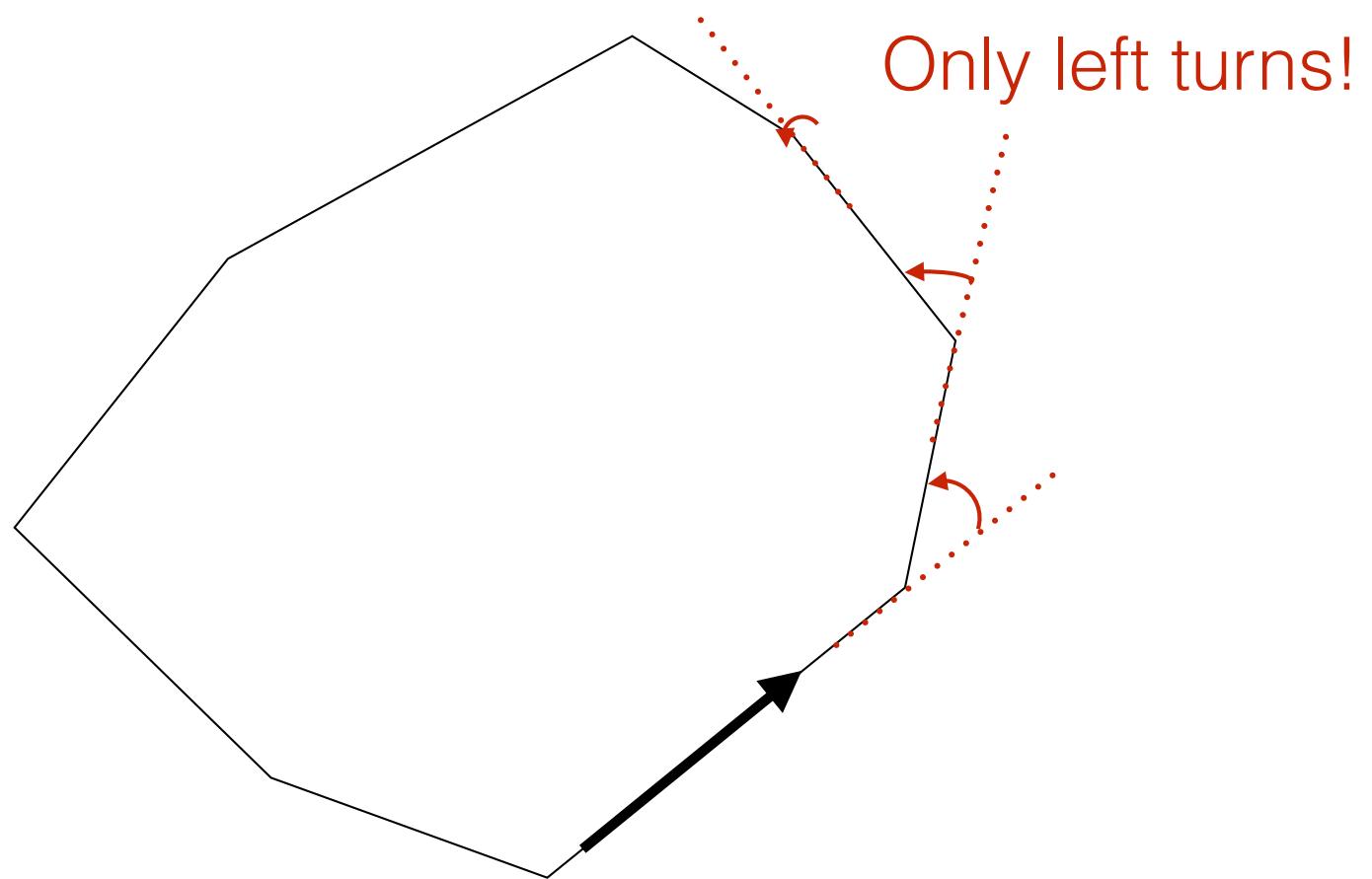
can be included / skipped

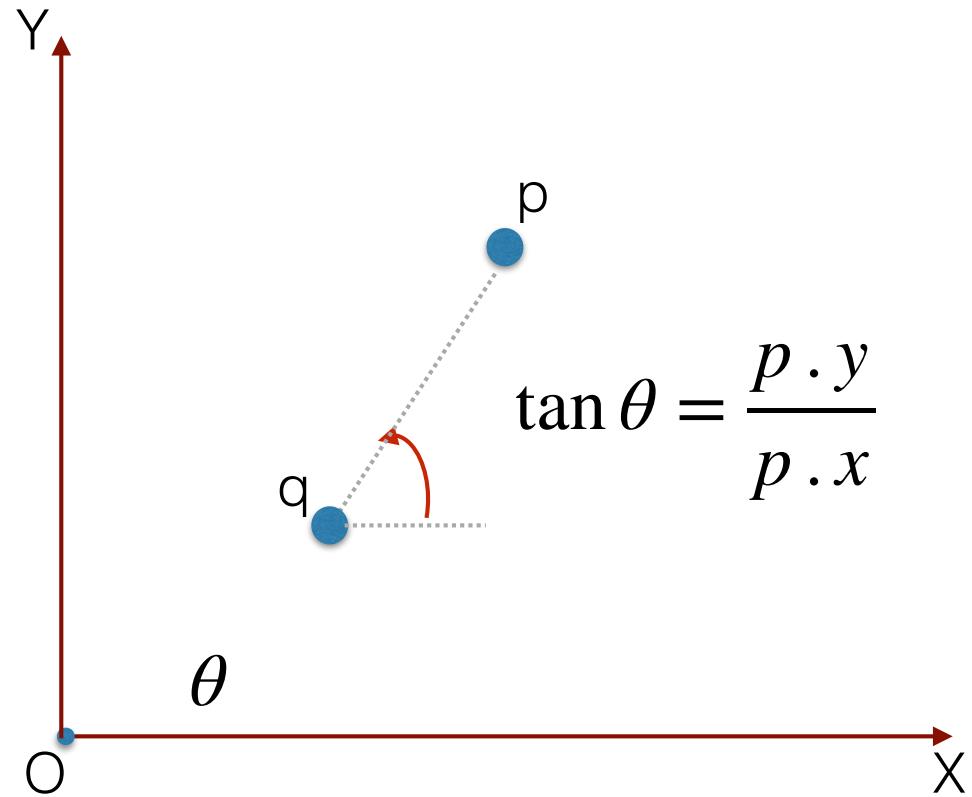
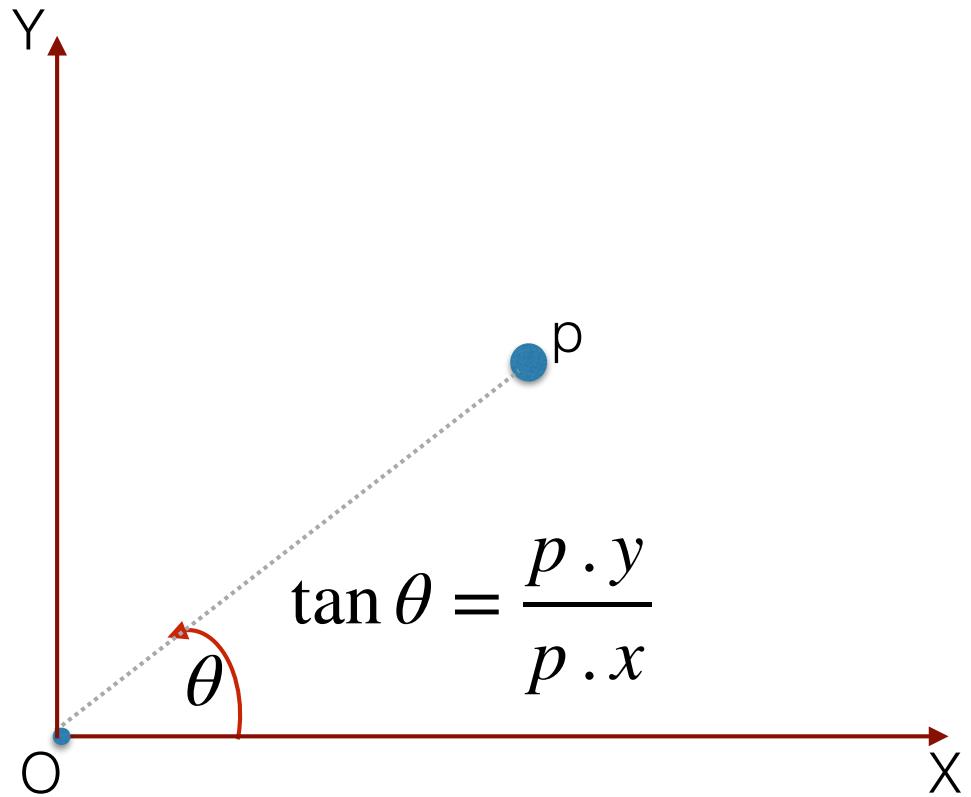


- It may seem that computing in boundary order is harder. It is known that identifying the points on the eCH has a lower bound of  $\Omega(n \lg n)$ . Therefore sorting is not the bottleneck.

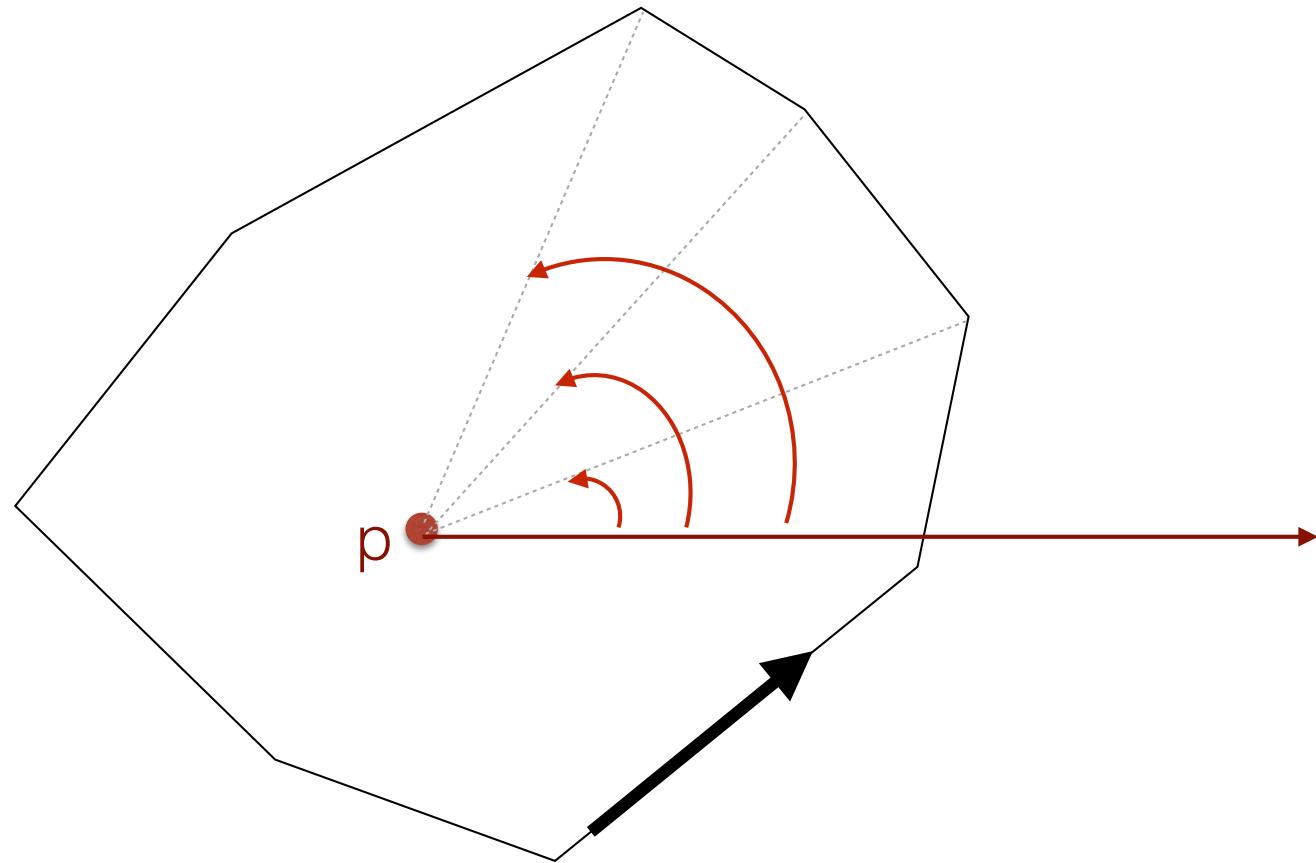
Convex Hull:  
Some basic properties

Walk ccw along the boundary of a convex polygon



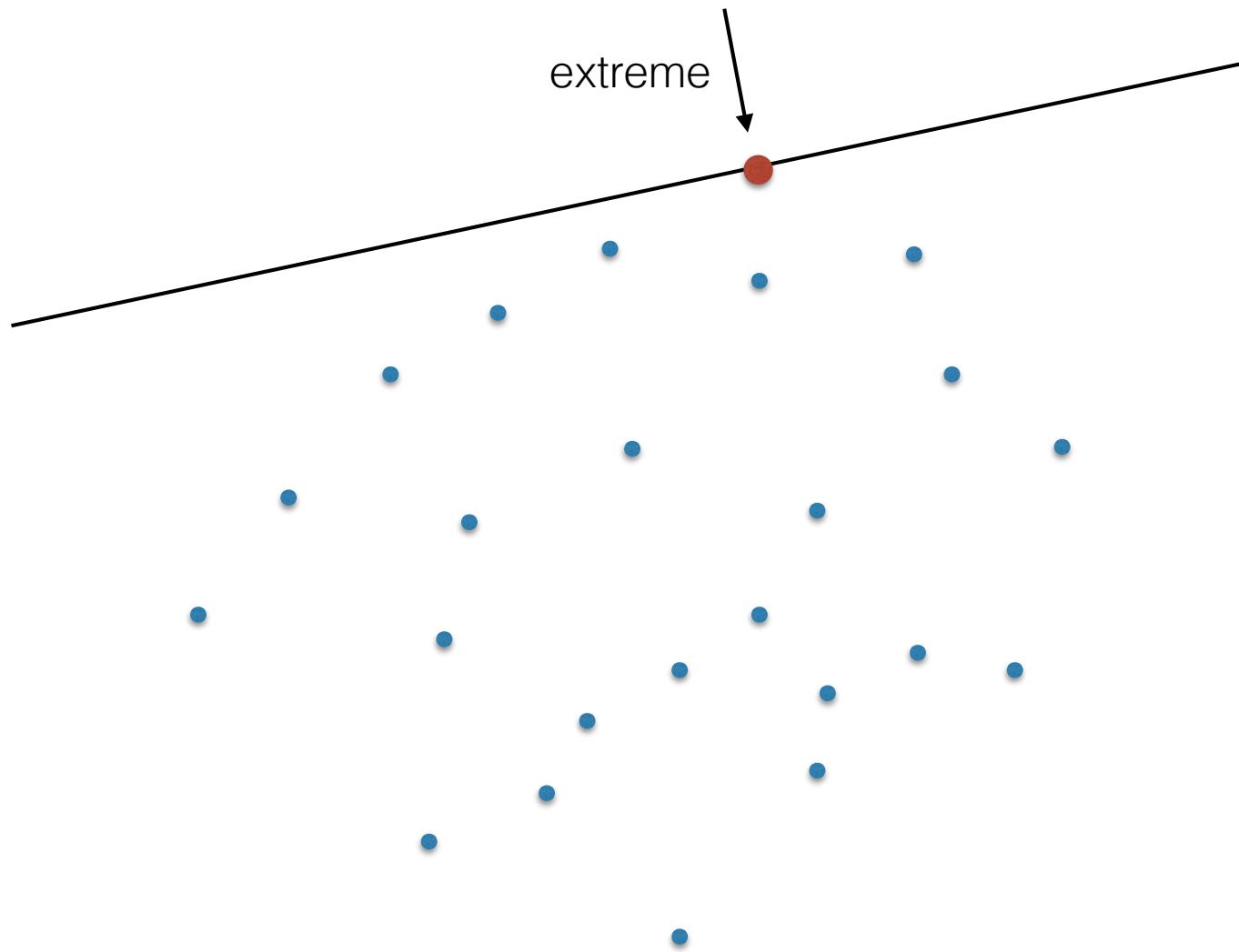


For any point  $p$  inside, the points on the boundary are in radial order around  $p$



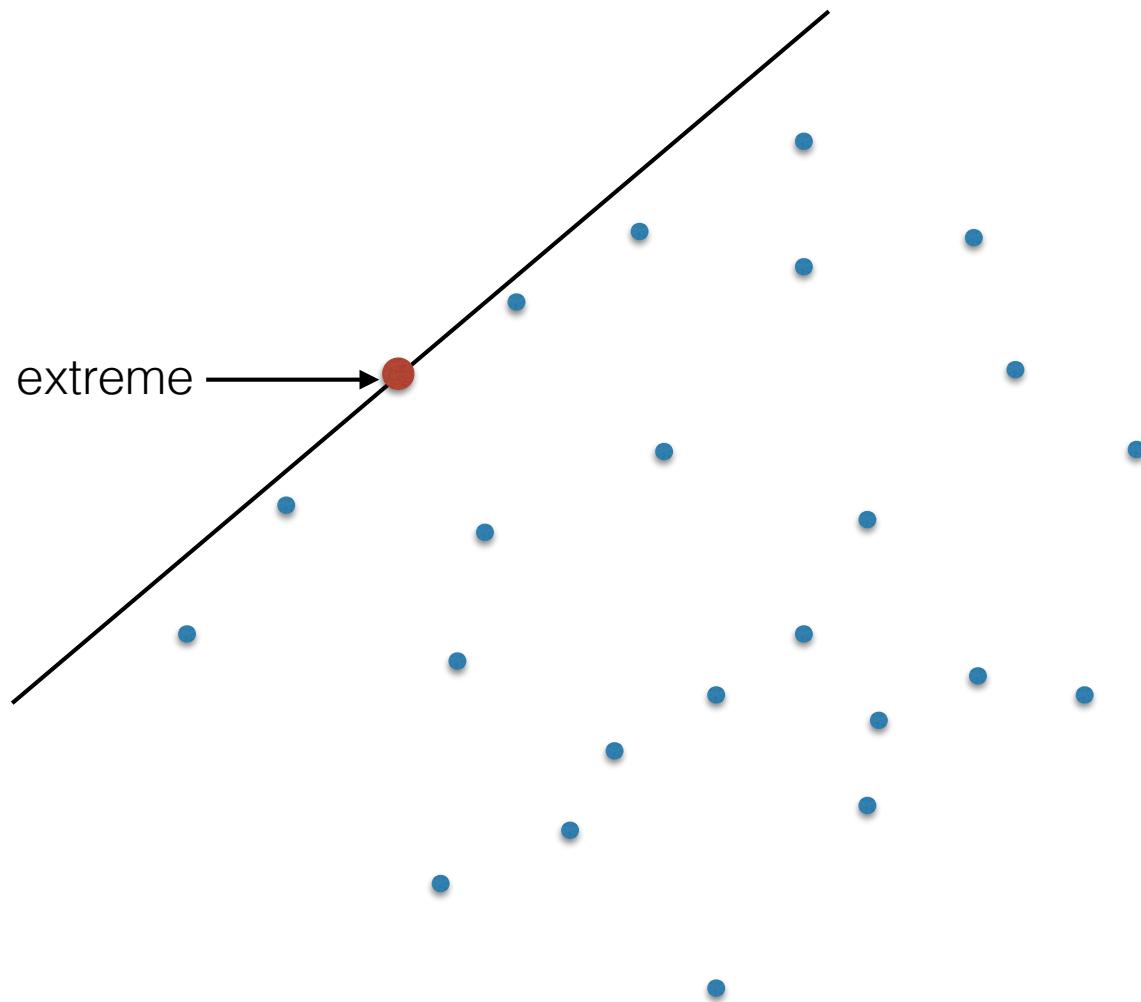
# Extreme points

- A point  $p$  is called **extreme** if there exists a line  $l$  through  $p$ , such that all the other points of  $P$  are on the same side of  $l$  (and not on  $l$ )



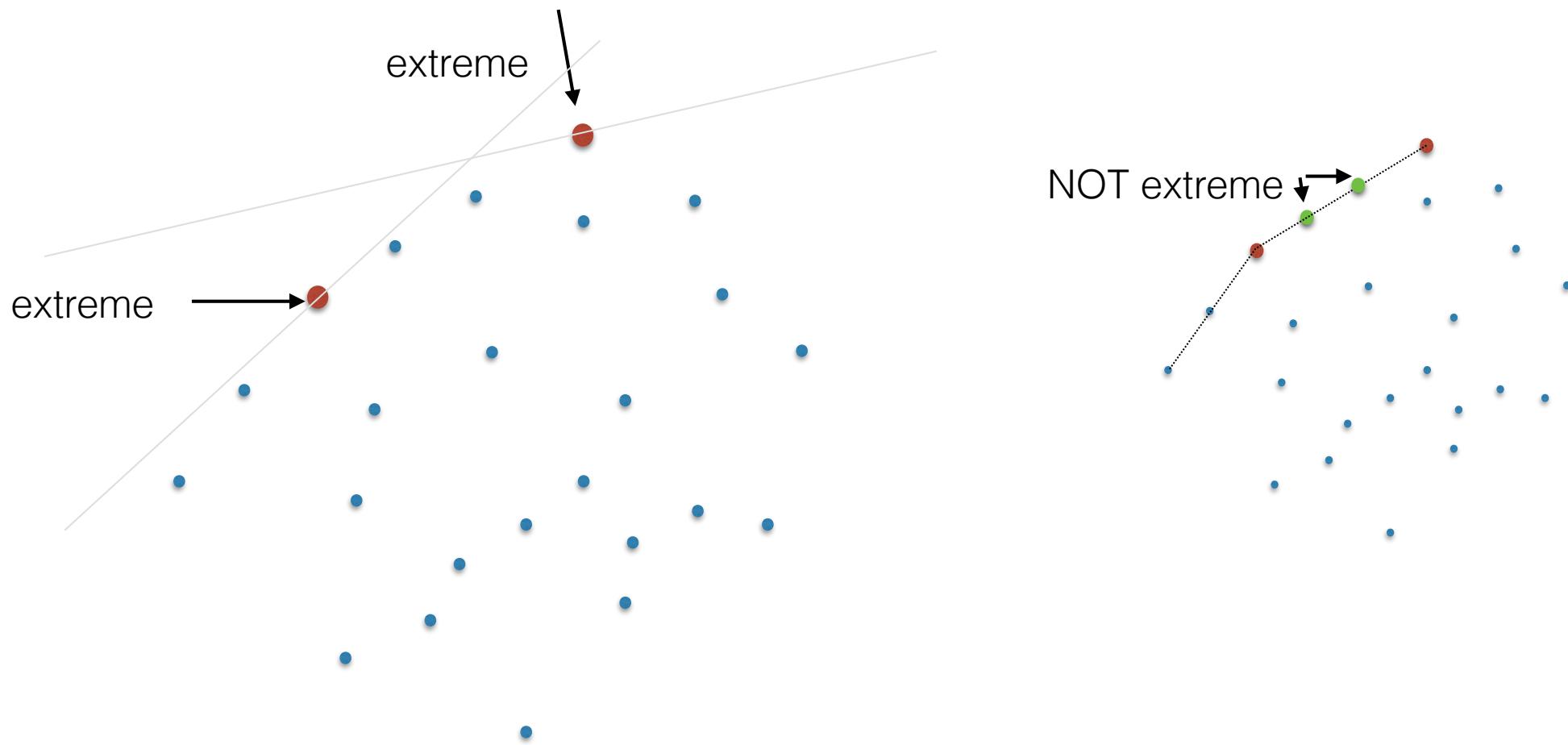
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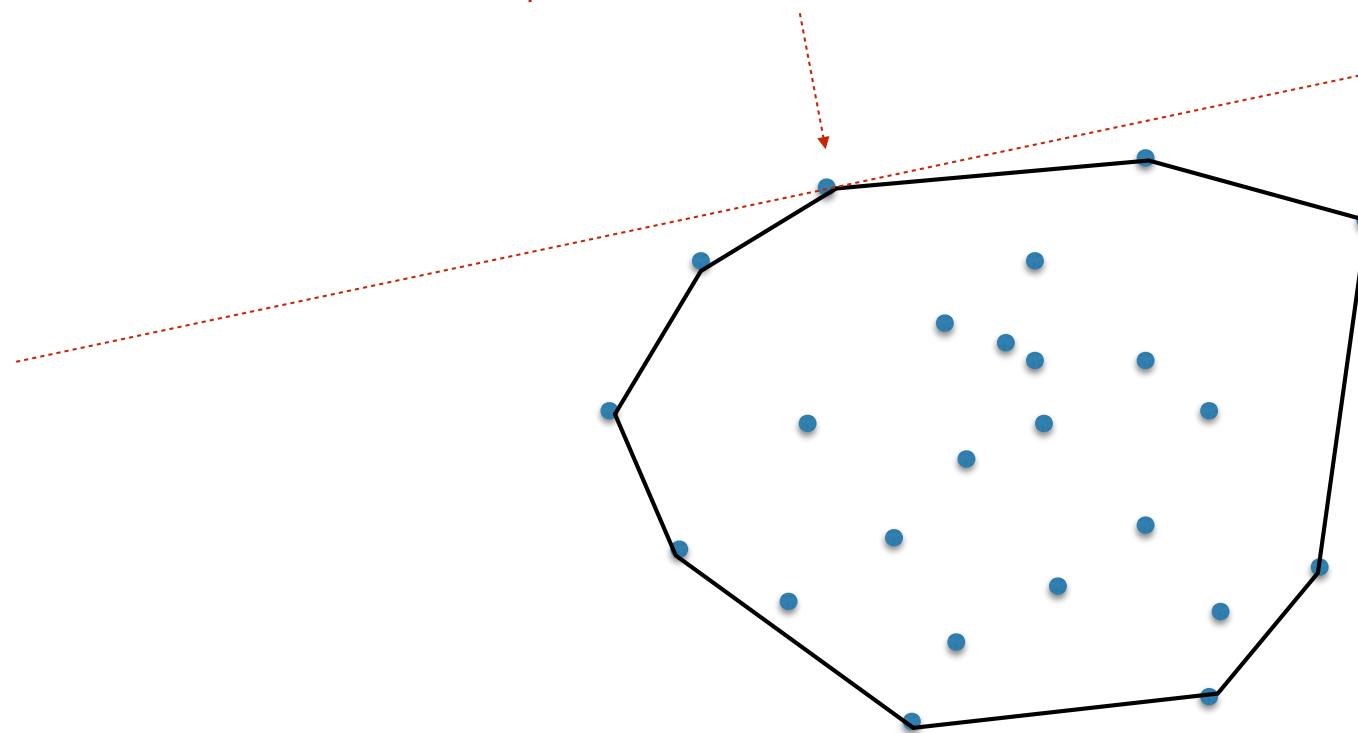
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A point is on the CH  $\iff$  it is extreme

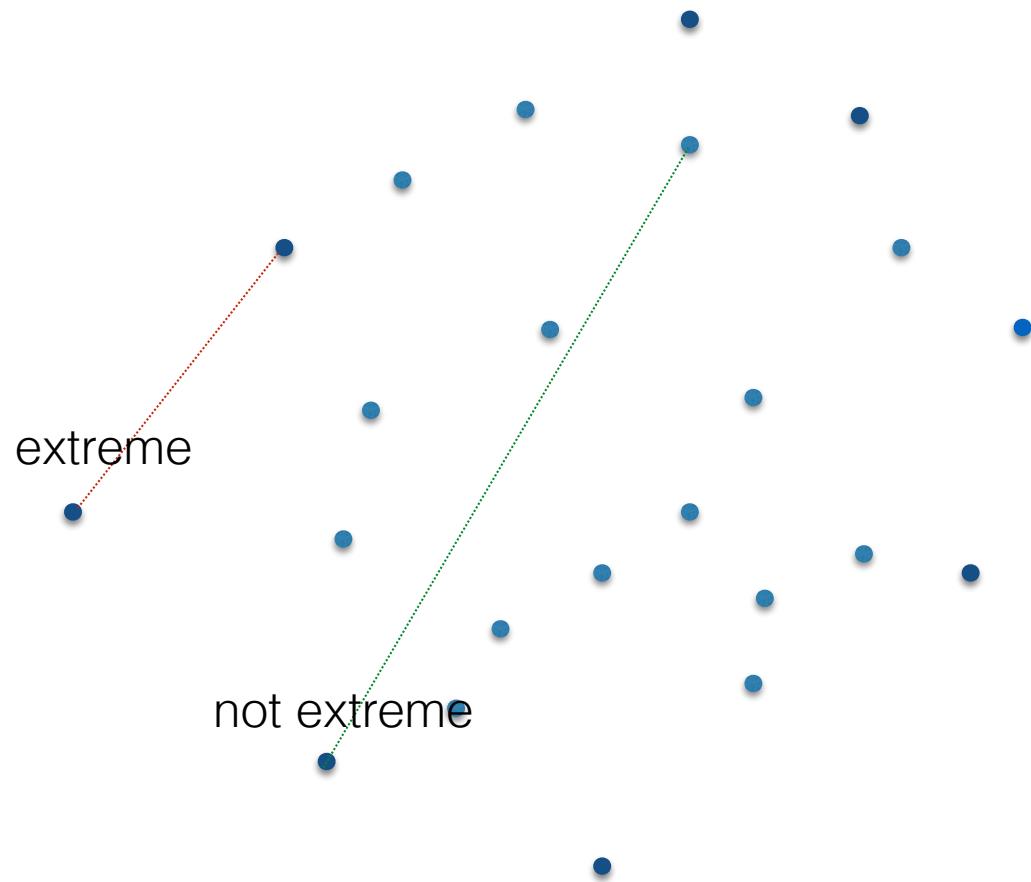
All points on the CH are extreme



All extreme points are on the CH

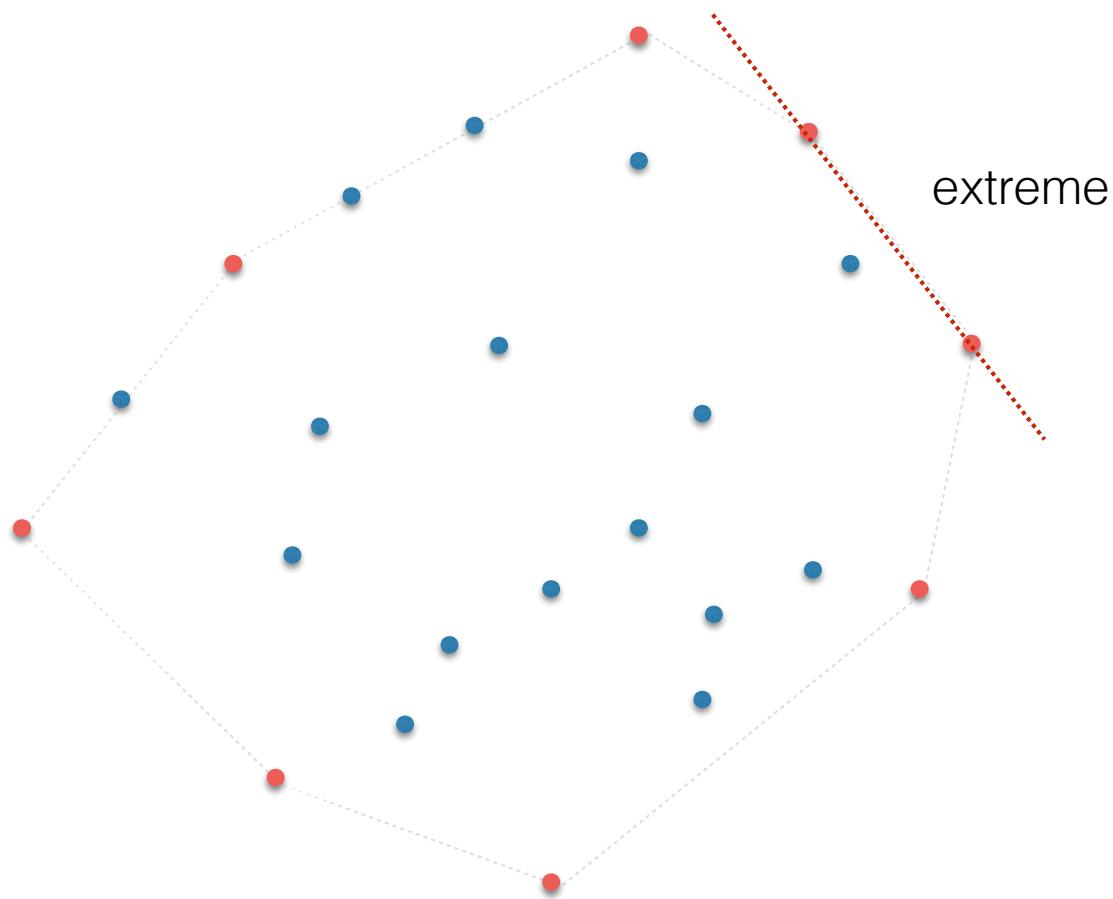
# Extreme edges

- An edge  $(p_i, p_j)$  is **extreme** if all the other points of  $P$  are on one side of it (or on)



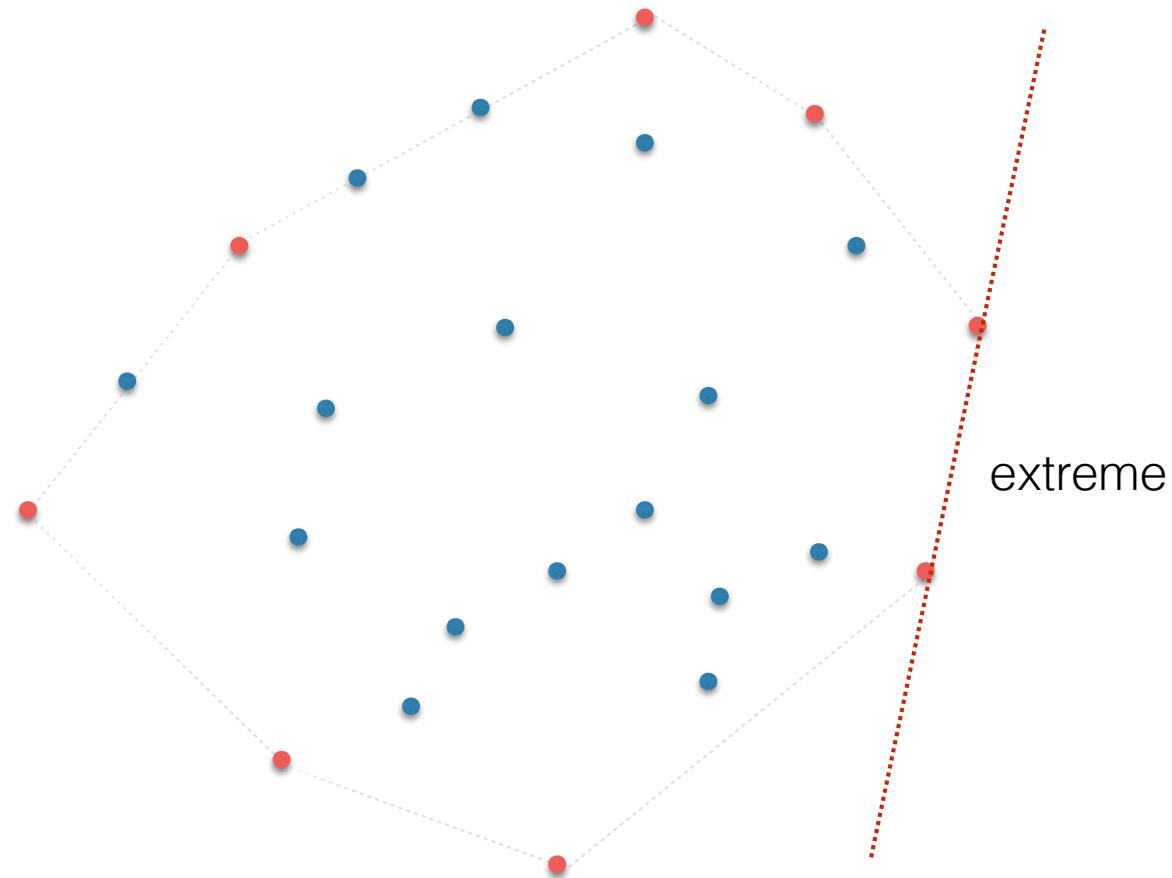
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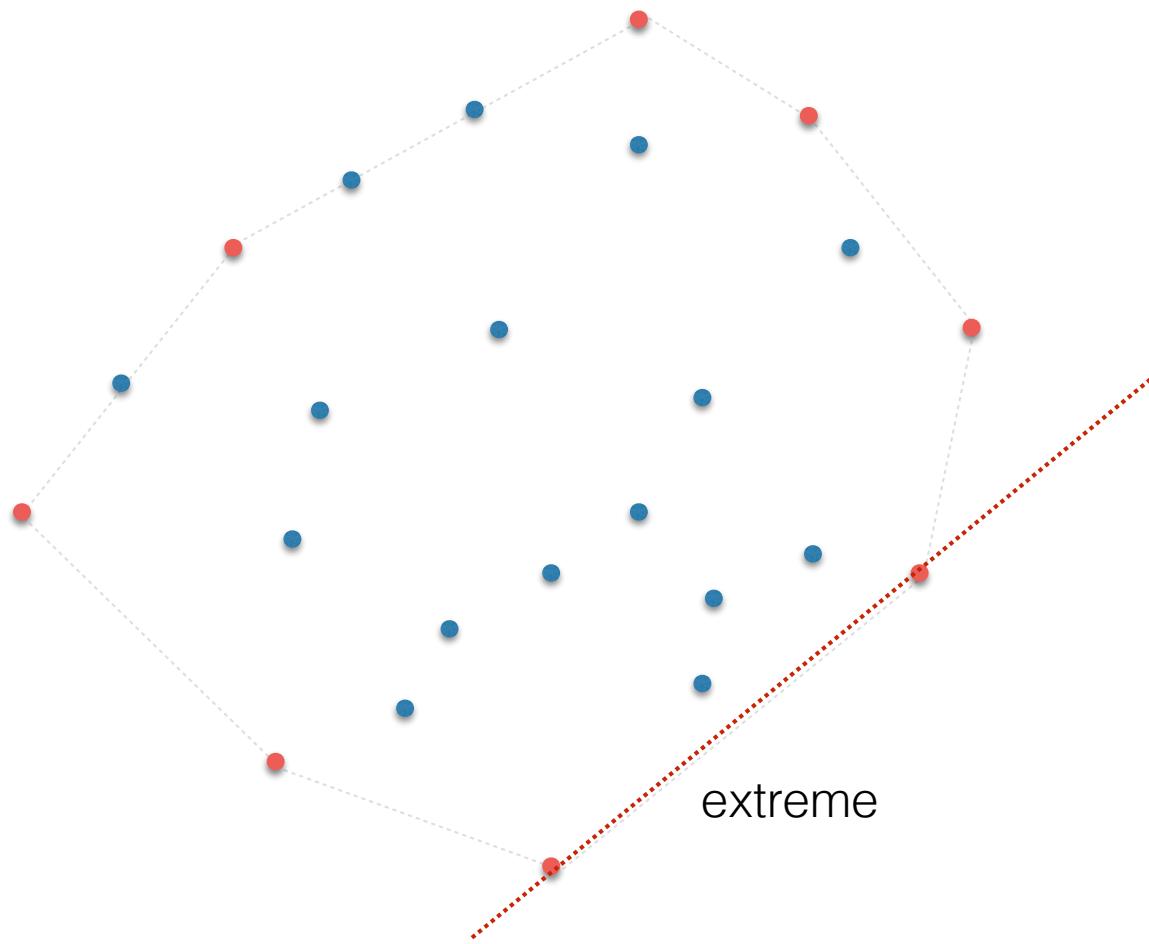
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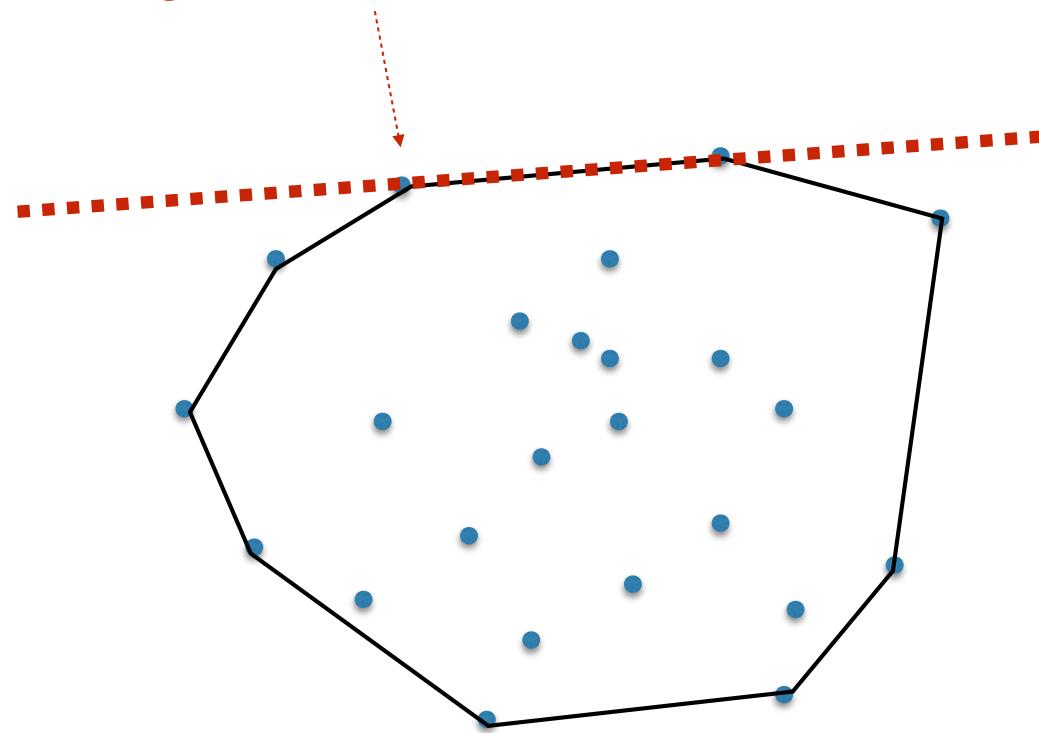
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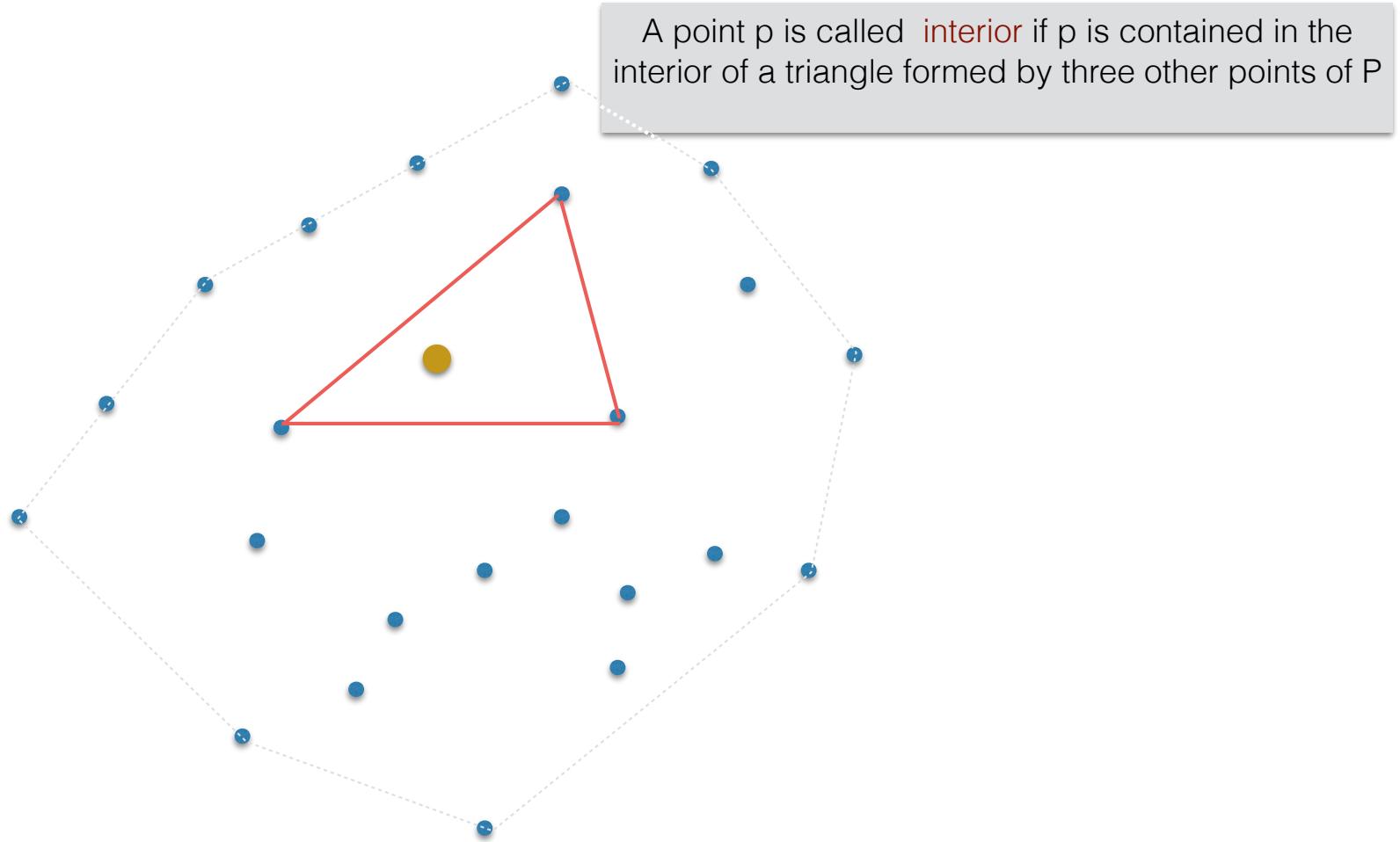
All edges on the CH are extreme



All extreme edges are on the CH

# Interior points

- $p$  interior  $\iff p$  **not** on the CH



## Convex hull properties: Summary

- Walking counter-clockwise on the boundary of the CH you make only left turns
- Consider a point  $p$  inside the CH. Then the points on the boundary of the CH are encountered in sorted radial order around  $p$
- CH consists of extreme points and edges
  - point is extreme  $\iff$  it is on the CH
  - $(p_i, p_j)$  form an edge on the CH  $\iff$  edge  $(p_i, p_j)$  is extreme
  - point  $p$  is interior  $\iff$   $p$  not on the CH

# Algorithm: Brute force

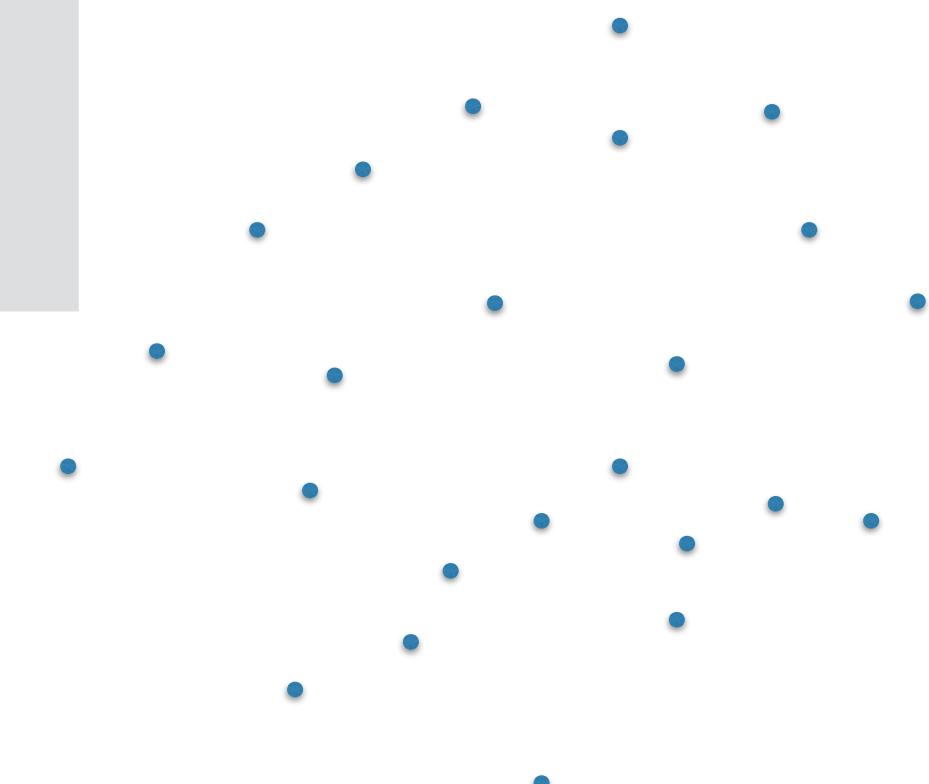
# Algorithm: Brute force

Idea: Find extreme edges

## Algorithm (input P)

- for all distinct pairs  $(p_i, p_j)$ 
  - check if edge  $(p_i, p_j)$  is extreme

- Analysis?



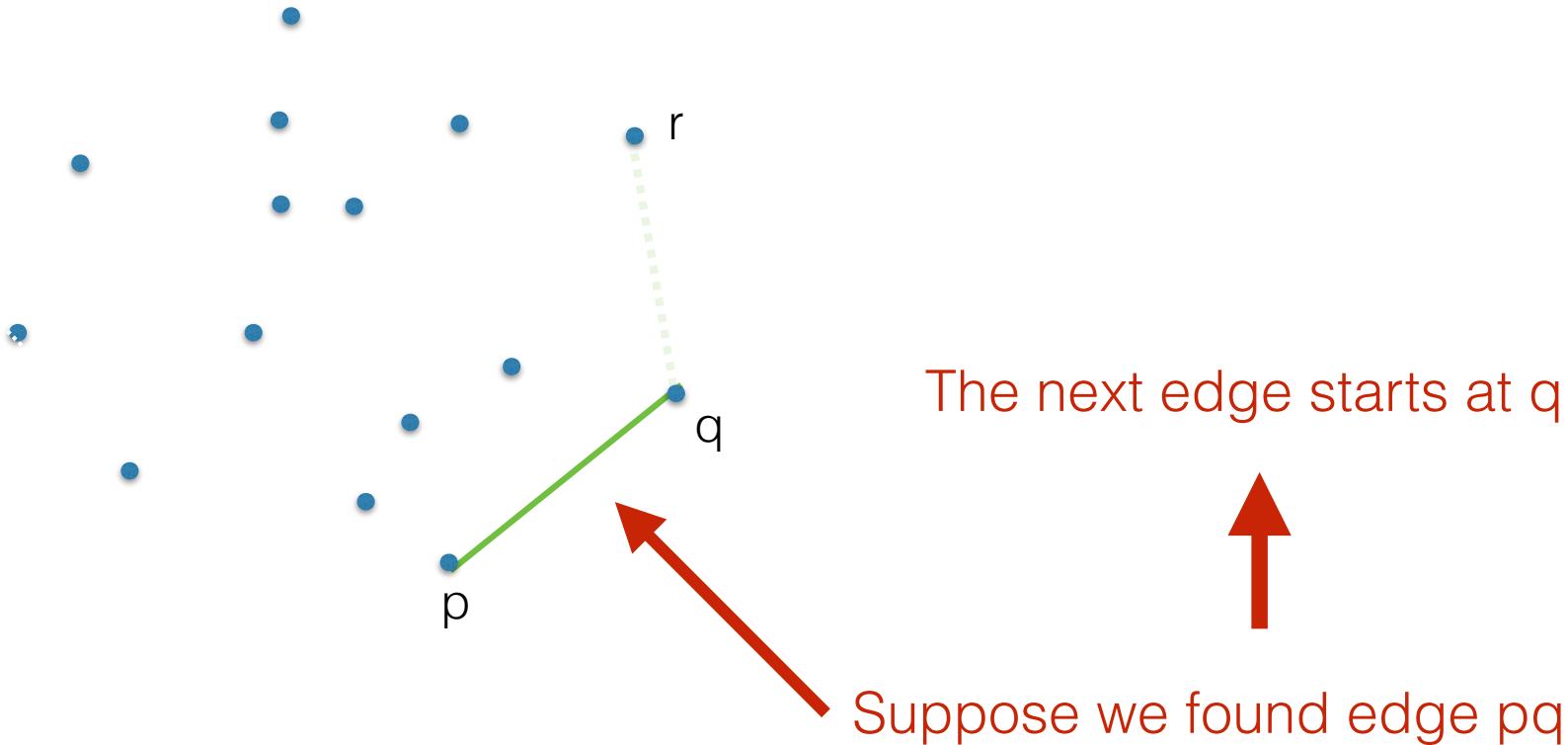
# Algorithm: Gift wrapping

◆ by Chand and Kapur [1970].

# Algorithm: Gift wrapping

We know that CH consists of extreme edges, and each edge shares a vertex with next edge

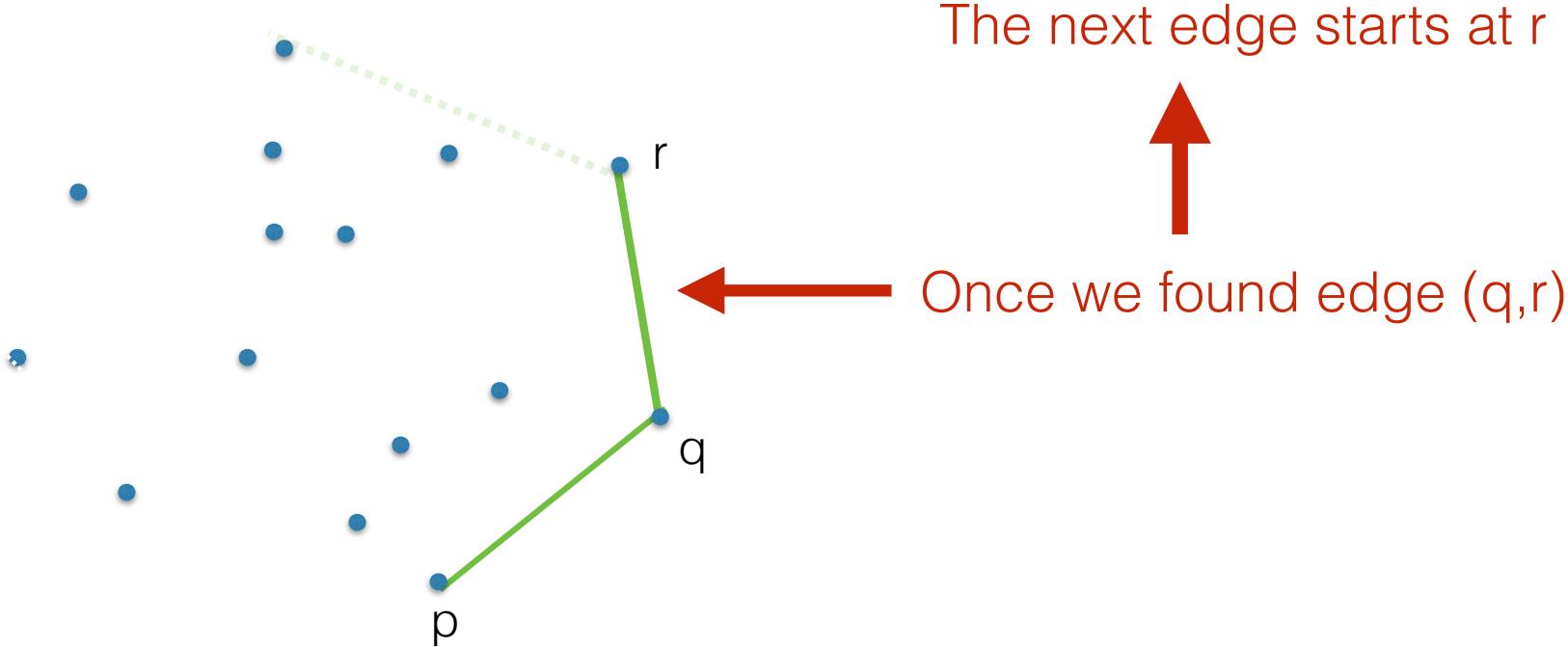
Idea: use an edge to find the next one



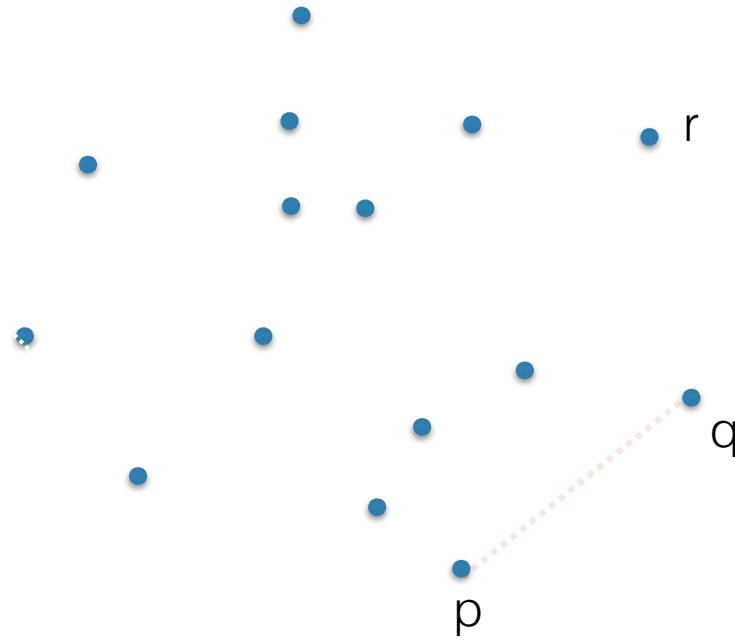
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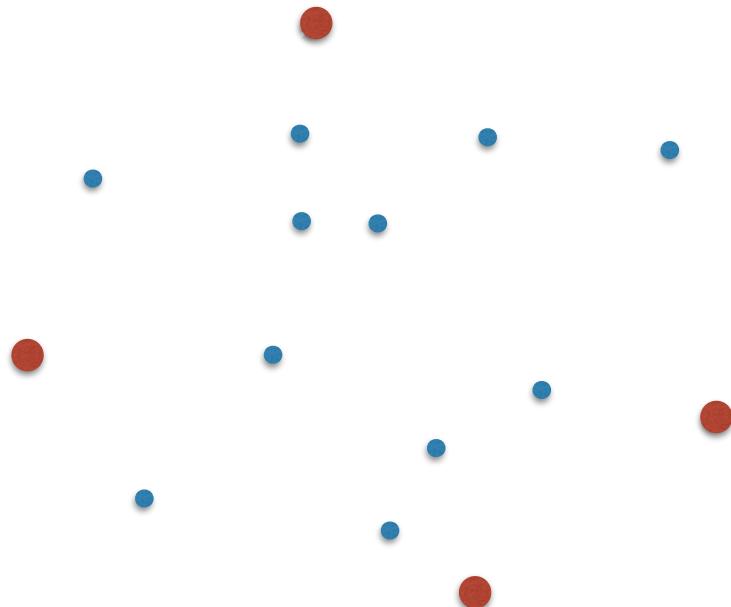


How to find an extreme edge to start from?



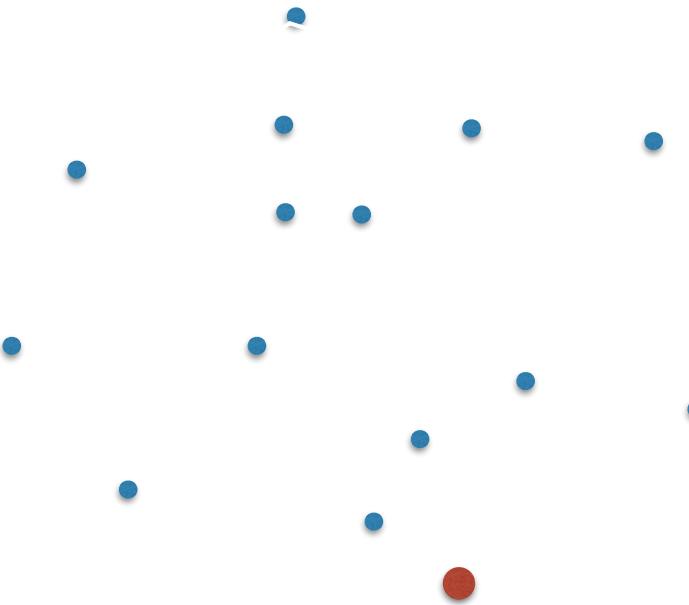
Start from a point  $p$  that is guaranteed to be in CH

- Claim
  - point with minimum x-coordinate is extreme
  - point with maximum x-coordinate is extreme
  - point with minimum y-coordinate is extreme
  - point with maximum y-coordinate is extreme
- Can you justify why?



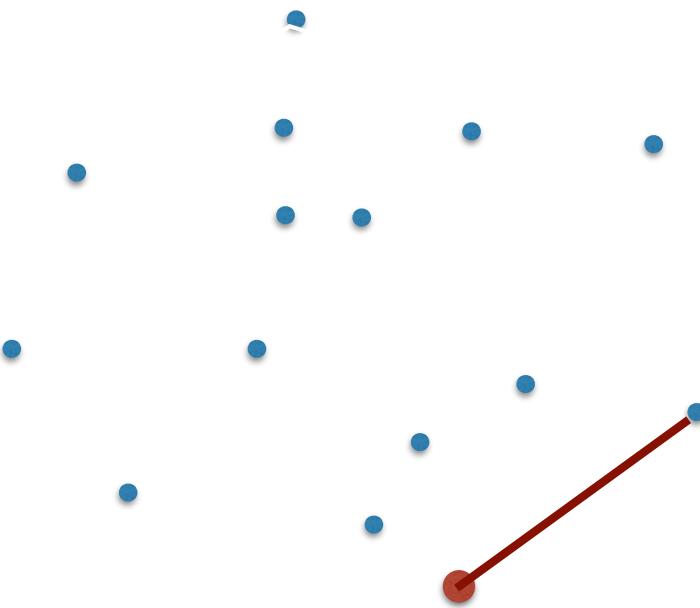
# Algorithm: Gift wrapping

- Start from bottom-most point (if more than one, pick right most)



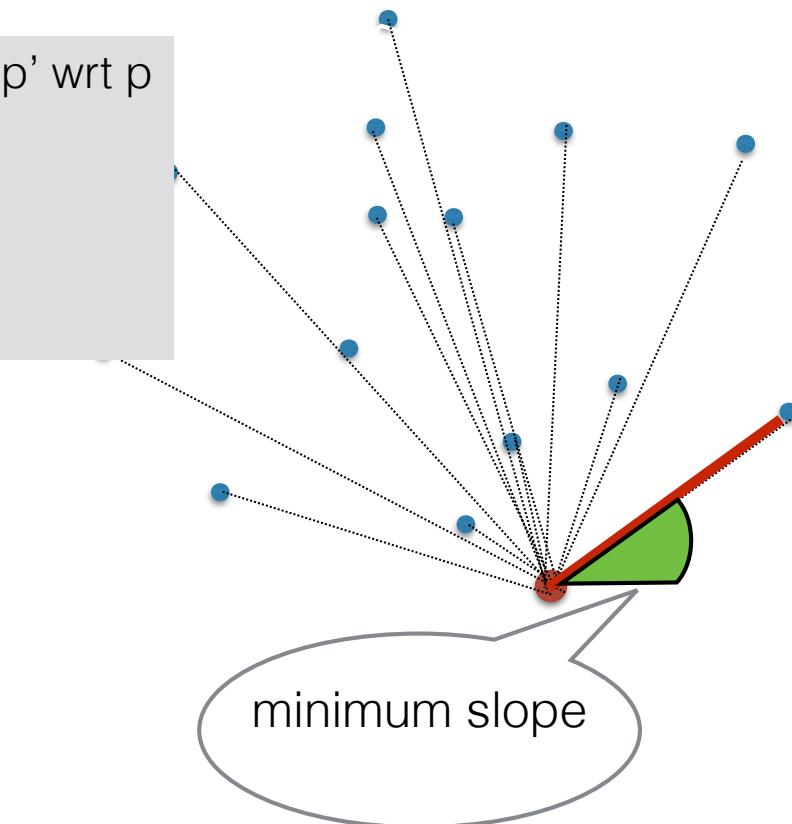
# Algorithm: Gift wrapping

- Start from bottom-most point (if more than one, pick right most)
- Find first edge: how??



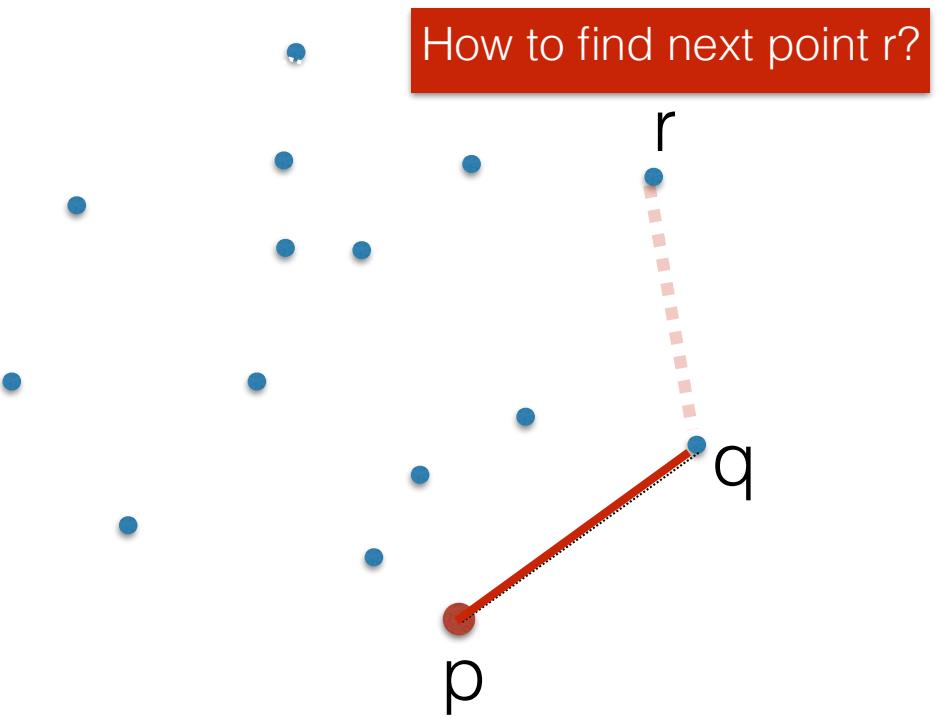
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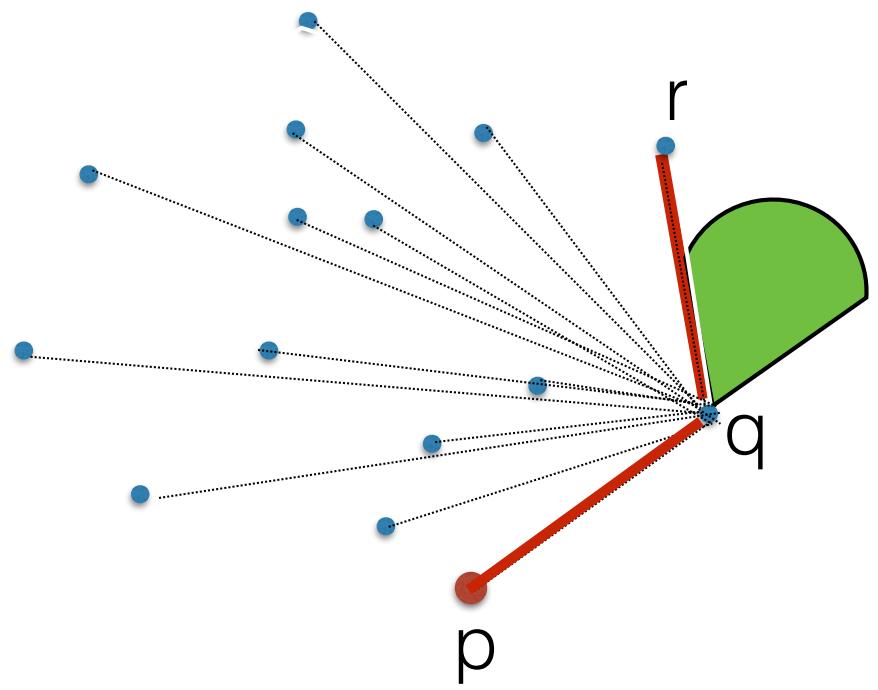
- Start from bottom-most point (if more than one, pick right most)
- Find first edge:
  - for each point  $p'$ : compute slope of  $p'$  wrt  $p$
  - let  $q$  = point with smallest slope  
//claim:  $pq$  is extreme edge
  - output  $(p, q)$  as first edge



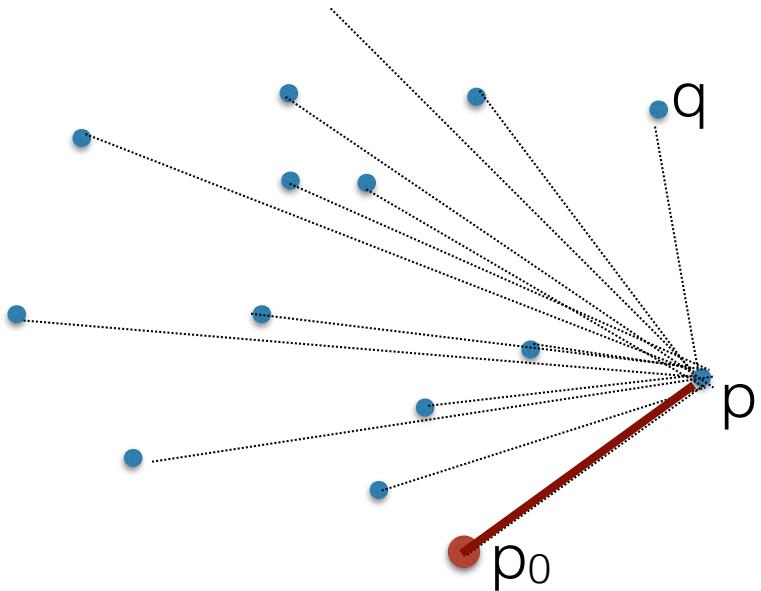
# Algorithm: Gift wrapping

- Start from bottom-most point (if more than one, pick right most)
- Find first edge pq
- Repeat: find extreme edge from q





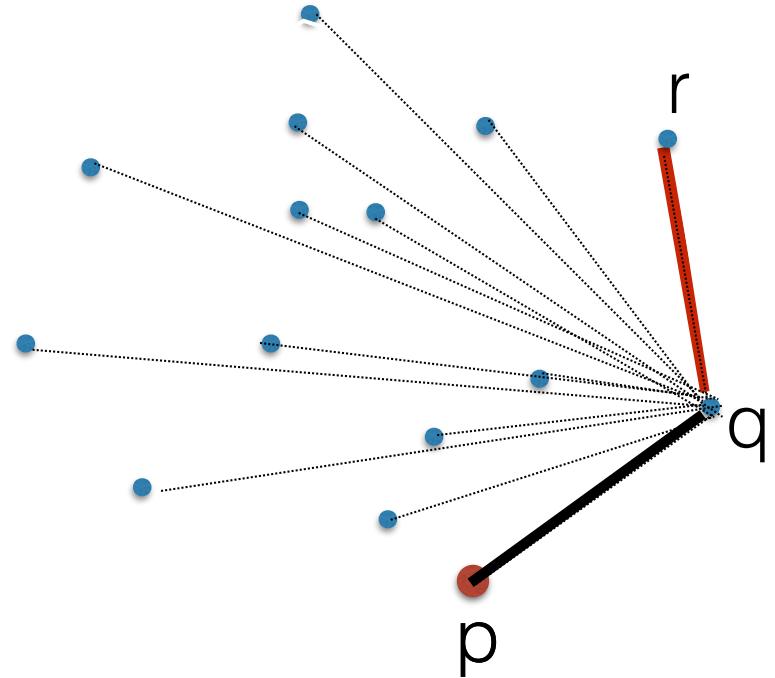
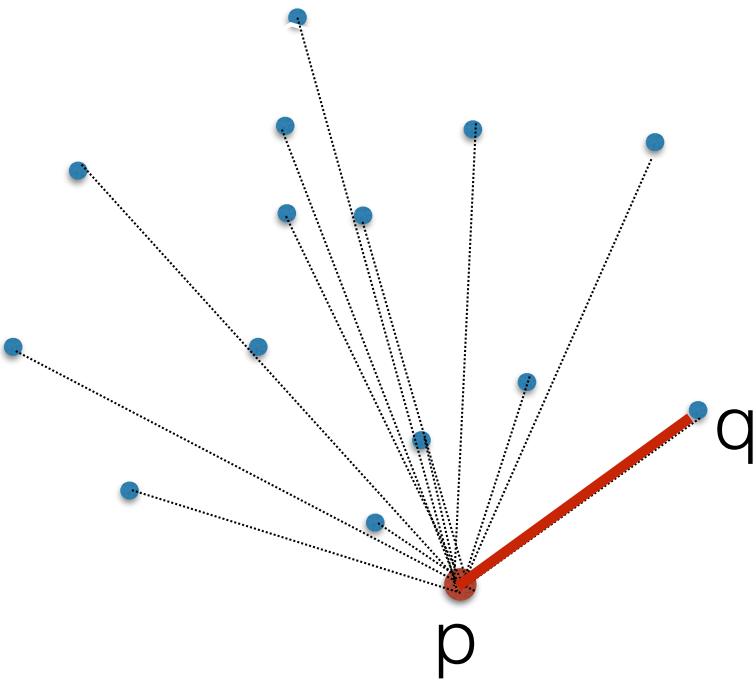
## Algorithm: Gift wrapping



- Let  $p_0$  = point with smallest y-coord (if more than one, pick right-most)
- Let  $p$  = point with smallest slope wrt  $p_0$
- add points  $p_0, p$  to the CH
- repeat
  - let  $q$  = point with smallest slope wrt prev edge on the hull
  - add point  $q$  to the CH
- until  $q = p_0$

# Can be implemented with left()

- $q$  is the point that appears to be furthest to the right to someone standing at  $p$



- initialize  $q$  to be an arbitrary point
- for each point  $u$  ( $u \neq q$ ):
  - if  $\text{left}(p, u, q)$ :  $q = u$

## Class work

- Simulate Gift-Wrapping on an arbitrary (small) set of points
- What are configurations of points that cause troubles for Gift Wrapping?  
(referred to as **degenerate cases**)
- Running time: Express function of  $n$  and  $k$ , where  $k$  is the output size  
(number of points on the convex hull)
  - How small/large can  $k$  be for a set of  $n$  points?
  - Show examples that trigger best/worst cases
  - Based on this, when is Gift-wrapping a good choice to compute CH  
(i.e. when is it efficient)?

## Gift wrapping summary

- Runs in  $O(k \cdot n)$  time, where  $k$  is the size of the  $\text{CH}(P)$
- Efficient if  $k$  is small:
  - For  $k = O(1)$ , it takes  $O(n)$
- Not efficient if  $k$  is large:
  - For  $k = O(n)$ , Gift wrapping takes  $O(n^2)$
- Faster algorithms are known
- Gift wrapping extends easily to 3D and for many years was the primary algorithm for 3D

# Summary

- Brute force:  $O(n^3)$
- Gift wrapping:  $O(k \cdot n)$ 
  - output-size sensitive:  $O(n)$  best case,  $O(n^2)$  worst case
    - ◆ by Chand and Kapur [1970]. Extends to 3D and to arbitrary dimensions; for many years was the primary algorithm for higher dimensions
- Graham scan
- Quickhull
- incremental,
- divide-and-conquer
- $\Omega(n \lg n)$  lower bound