

Welcome to...

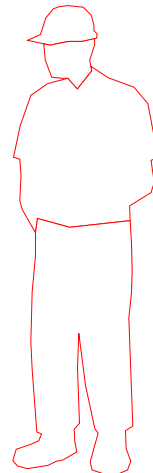
# Convex Hell



Whoops, I mean...

# Convex Hull

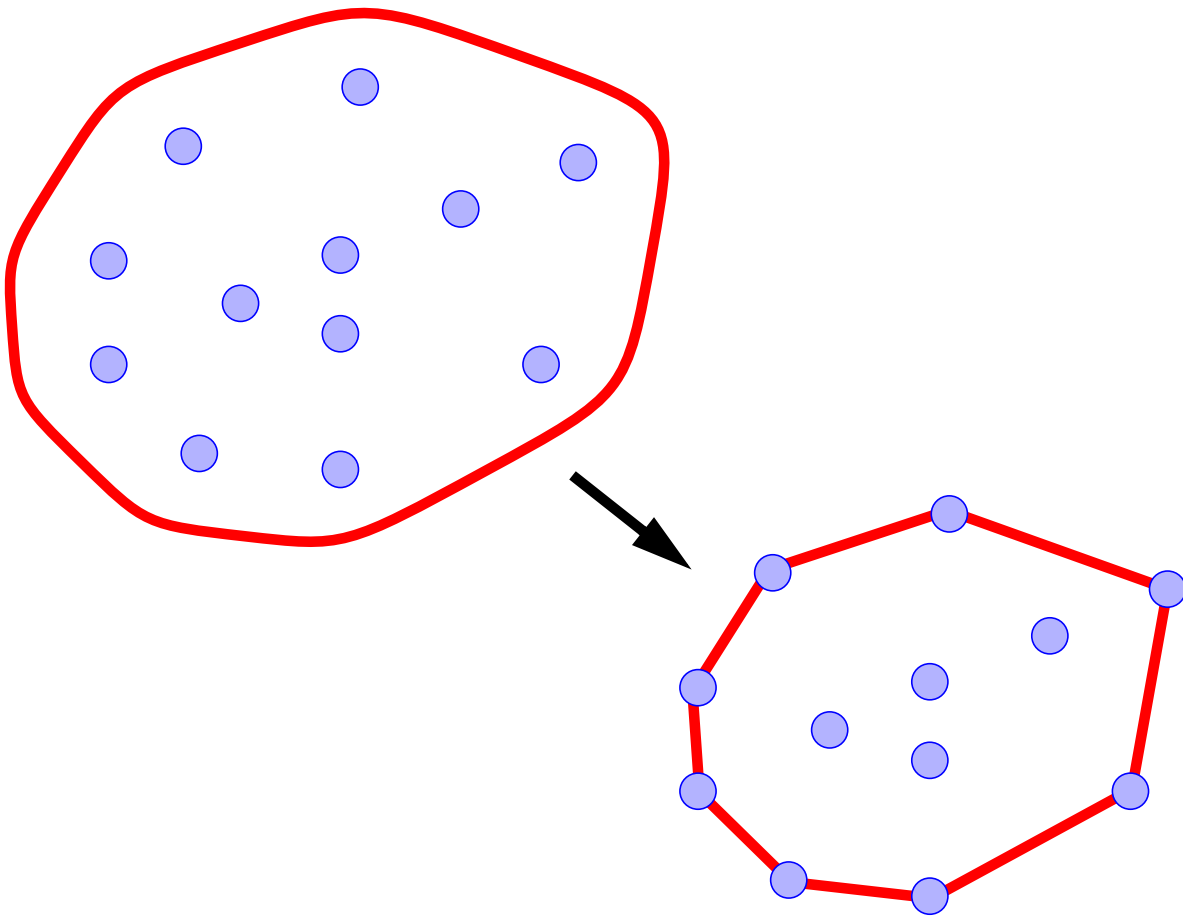
What's a  
Convex Hull?



# What is the Convex Hull?

Let  $S$  be a set of points in the plane.

**Intuition:** Imagine the points of  $S$  as being pegs; the *convex hull* of  $S$  is the shape of a rubber-band stretched around the pegs.



**Formal definition:** the *convex hull* of  $S$  is the smallest convex polygon that contains all the points of  $S$

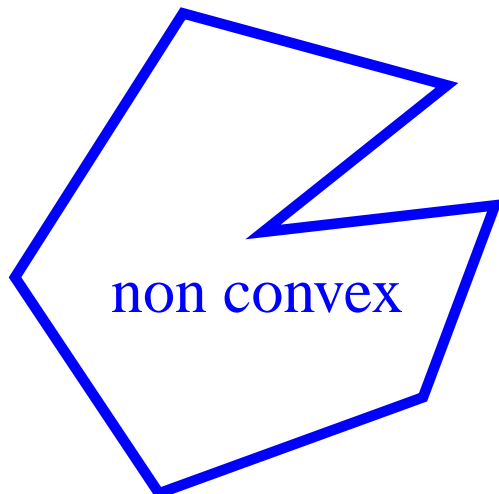
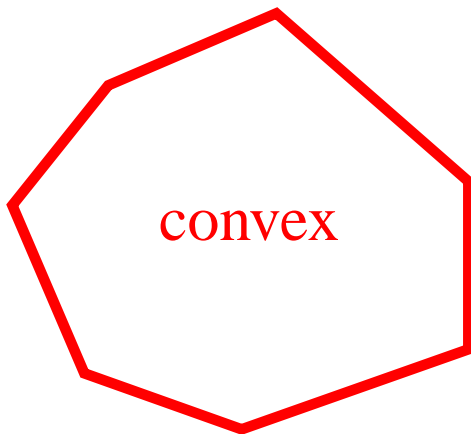


# Convexity

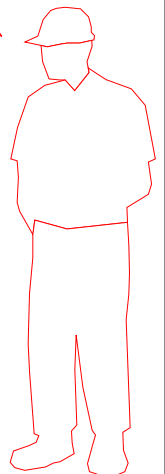
You know what *convex* means, right?

A polygon  $P$  is said to be *convex* if:

1.  $P$  is non-intersecting; and
2. for any two points  $p$  and  $q$  on the boundary of  $P$ , segment  $pq$  lies entirely inside  $P$



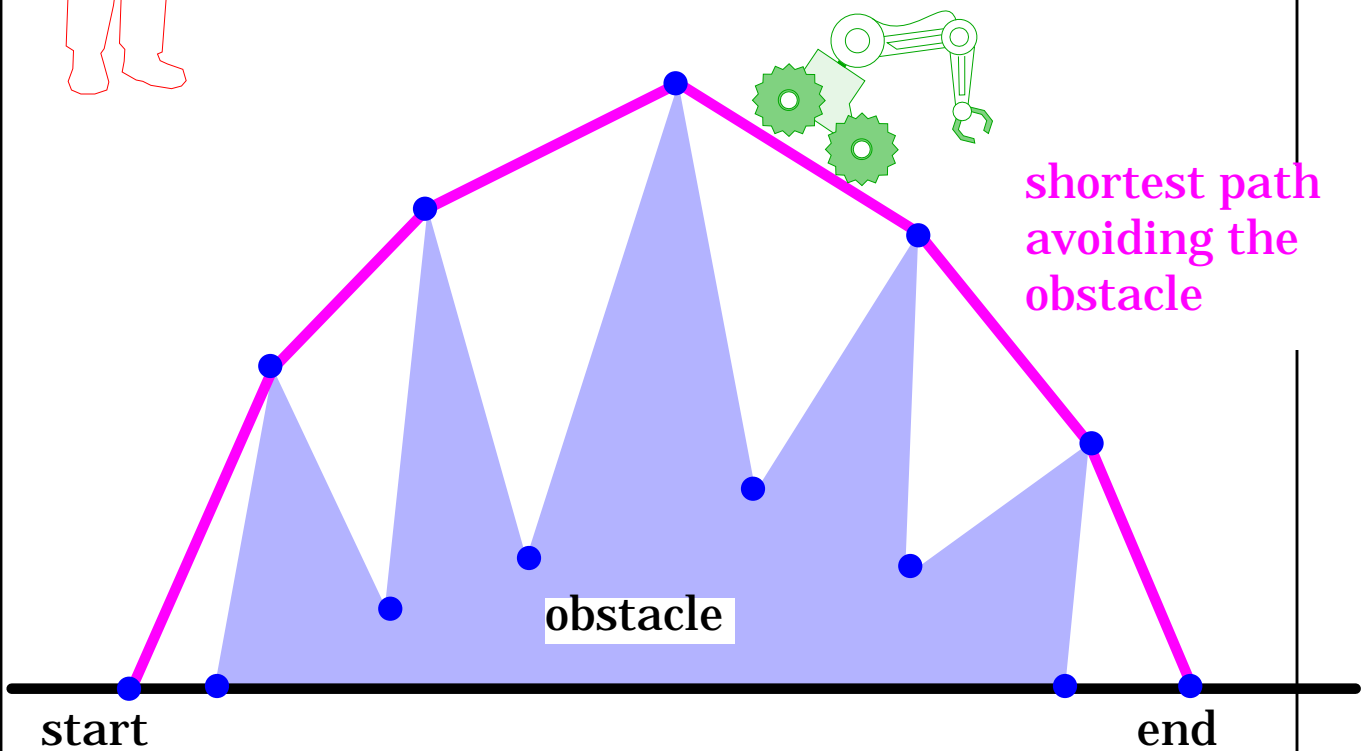
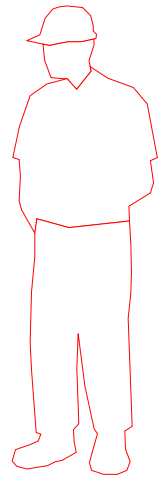
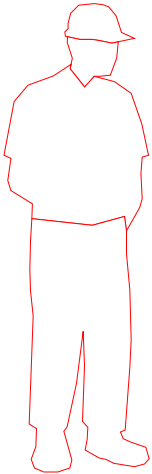
Eh? What's convex?



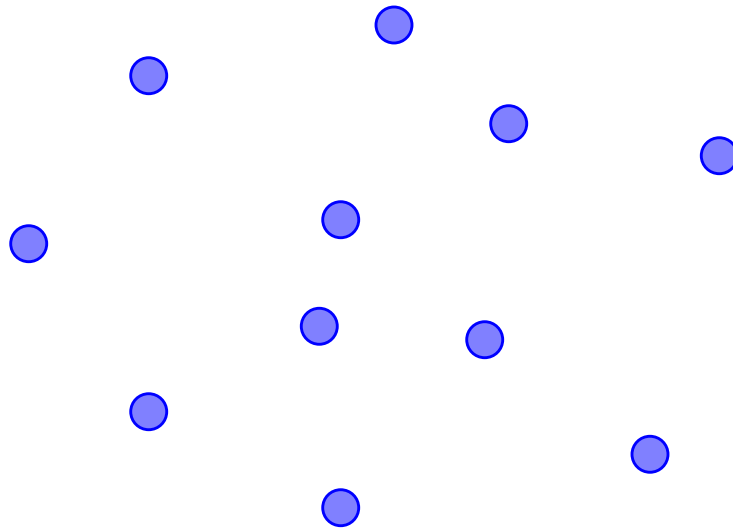
# Why Convex Hulls?

I don't ...  
... but robots do!

Who cares about  
convex hulls?



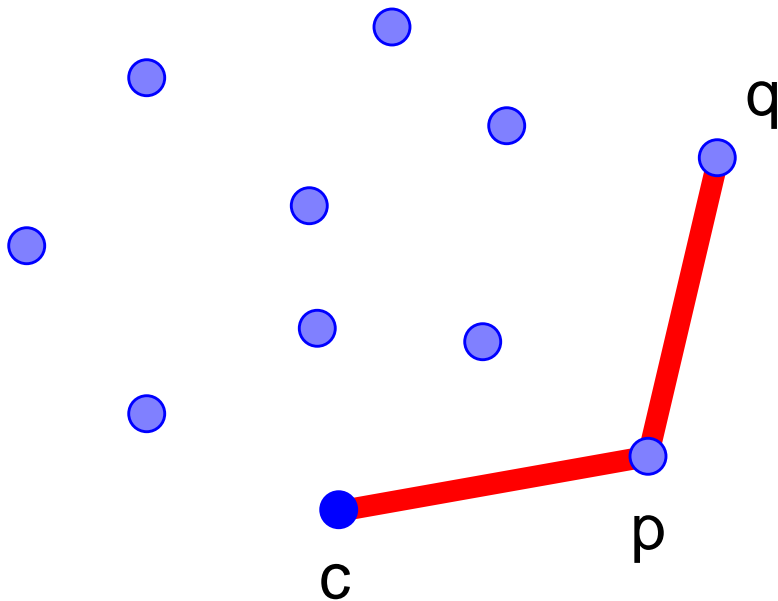
# The Package Wrapping Algorithm



# Package Wrap

- given the current point, how do we compute the next point?
- set up an orientation tournament using the current point as the anchor-point...
- the next point is selected as the point that beats all other points at **CCW** orientation, i.e., for any other point, we have

$$\text{orientation}(c, p, q) = \text{CCW}$$



# Time Complexity of Package Wrap

- For every point on the hull we examine all the other points to determine the next point
- Notation:
  - $N$ : number of points
  - $M$ : number of hull points ( $M \leq N$ )
- Time complexity:
  - $\Theta(MN)$
- Worst case:  $\Theta(N^2)$ 
  - all the points are on the hull ( $M=N$ )
- Average case:  $\Theta(N \log N)$  —  $\Theta(N^{4/3})$ 
  - for points randomly distributed inside a *square*,  $M = \Theta(\log N)$  on average
  - for points randomly distributed inside a *circle*,  $M = \Theta(N^{1/3})$  on average





Package Wrap has worst-case time complexity  $O(N^2)$

Which is bad...



But in 1972,  
Nabisco needed a  
better cookie - so  
they hired R. L.  
Graham, who  
came up with...

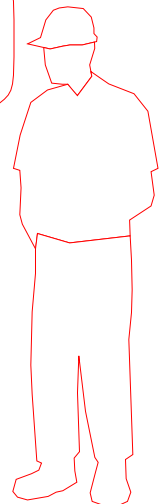


# The Graham Scan Algorithm

## Rave Reviews:

- “Almost linear!”  
- Sedgewick
- “It’s just a sort!”  
- Atul
- “Two thumbs up!”  
- Siskel and Ebert
- Nabisco says...

“A better crunch!”

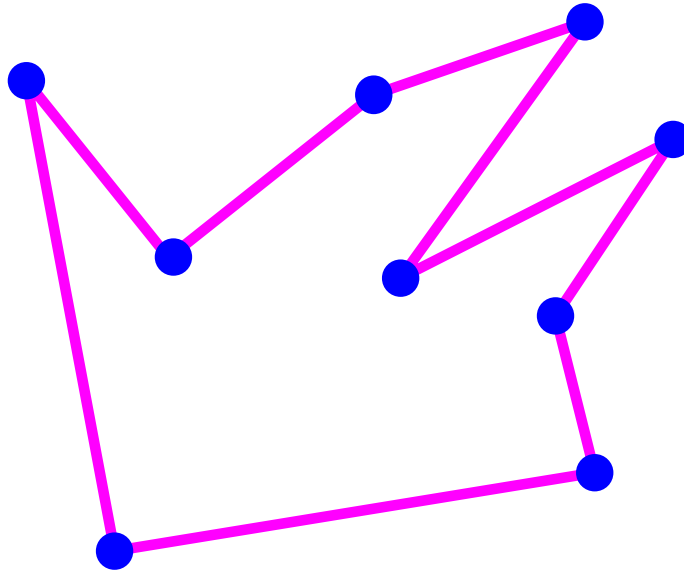


and history was made.

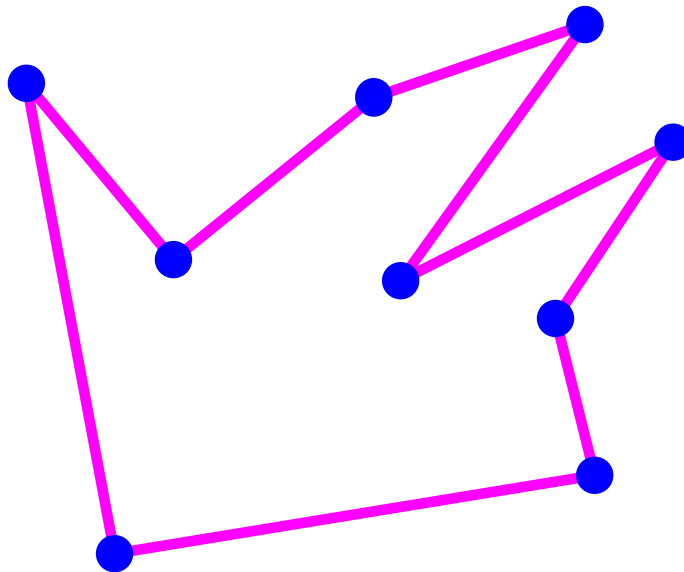


# Graham Scan

- Form a simple polygon (connect the dots as before)

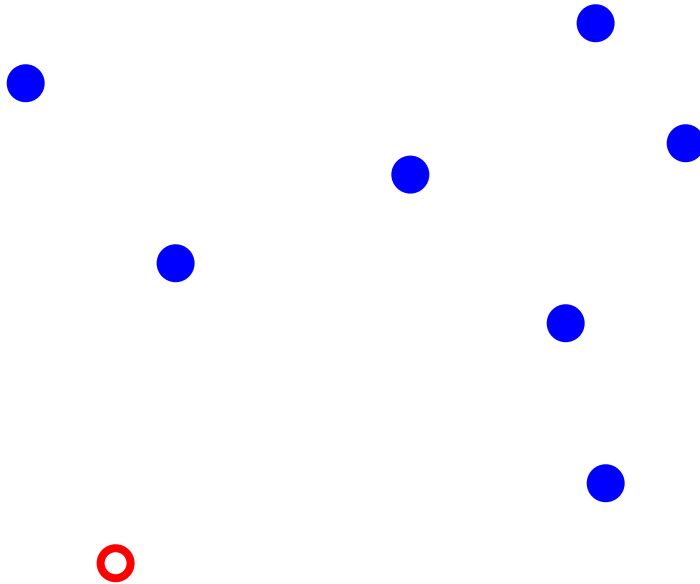


- Remove points at concave angles



# Graham Scan

## How Does it Work?

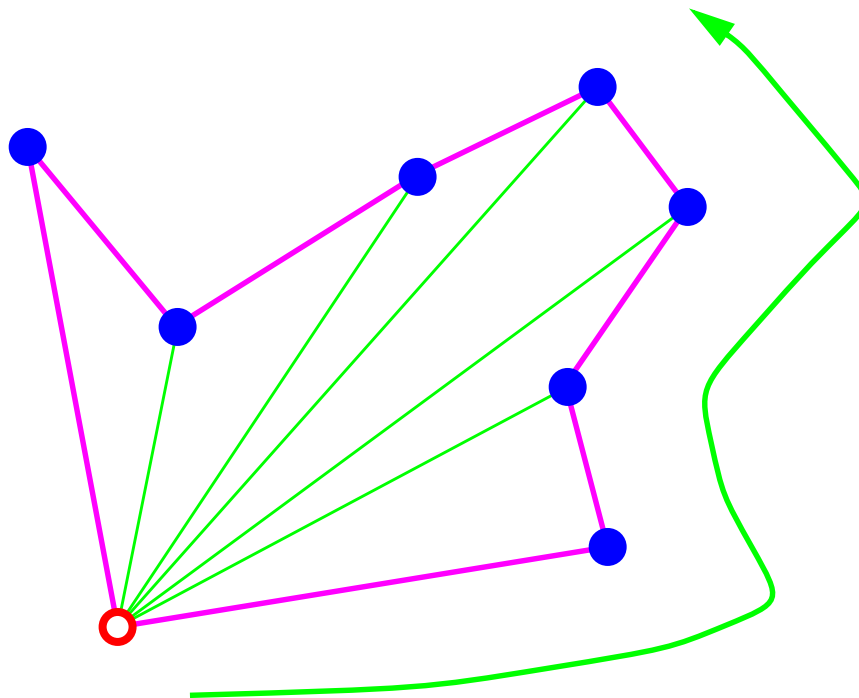


Start with the lowest point (anchor point)



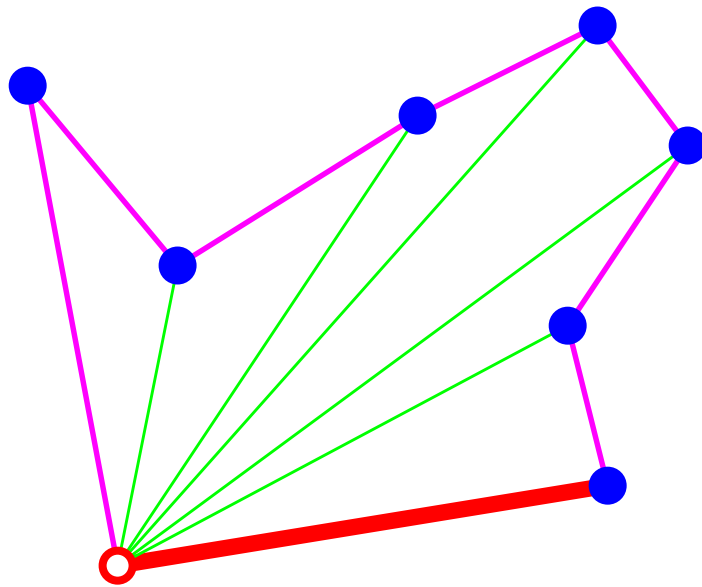
# Graham Scan: Phase 1

Now, form a closed simple path traversing the points by increasing angle with respect to the anchor point



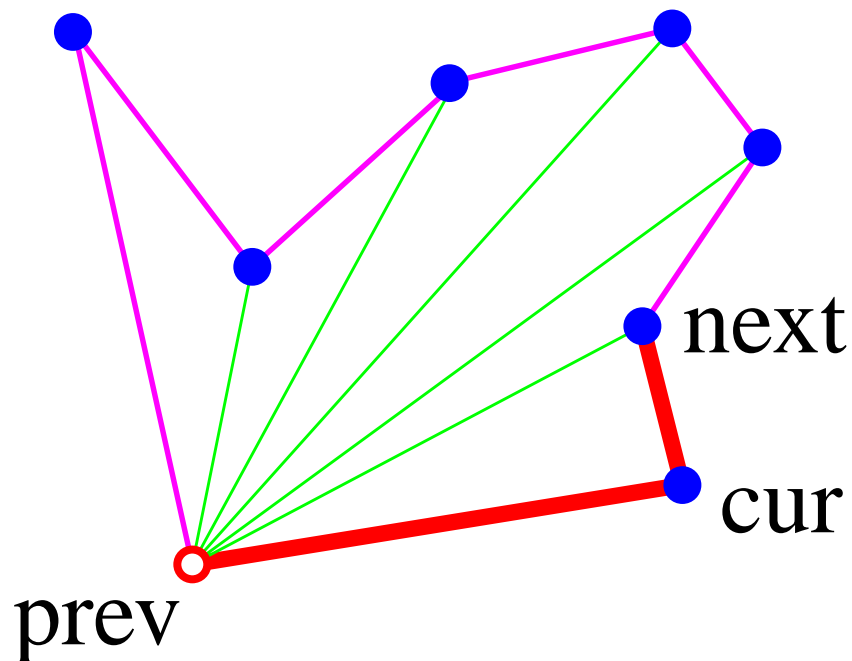
# Graham Scan: Phase 2

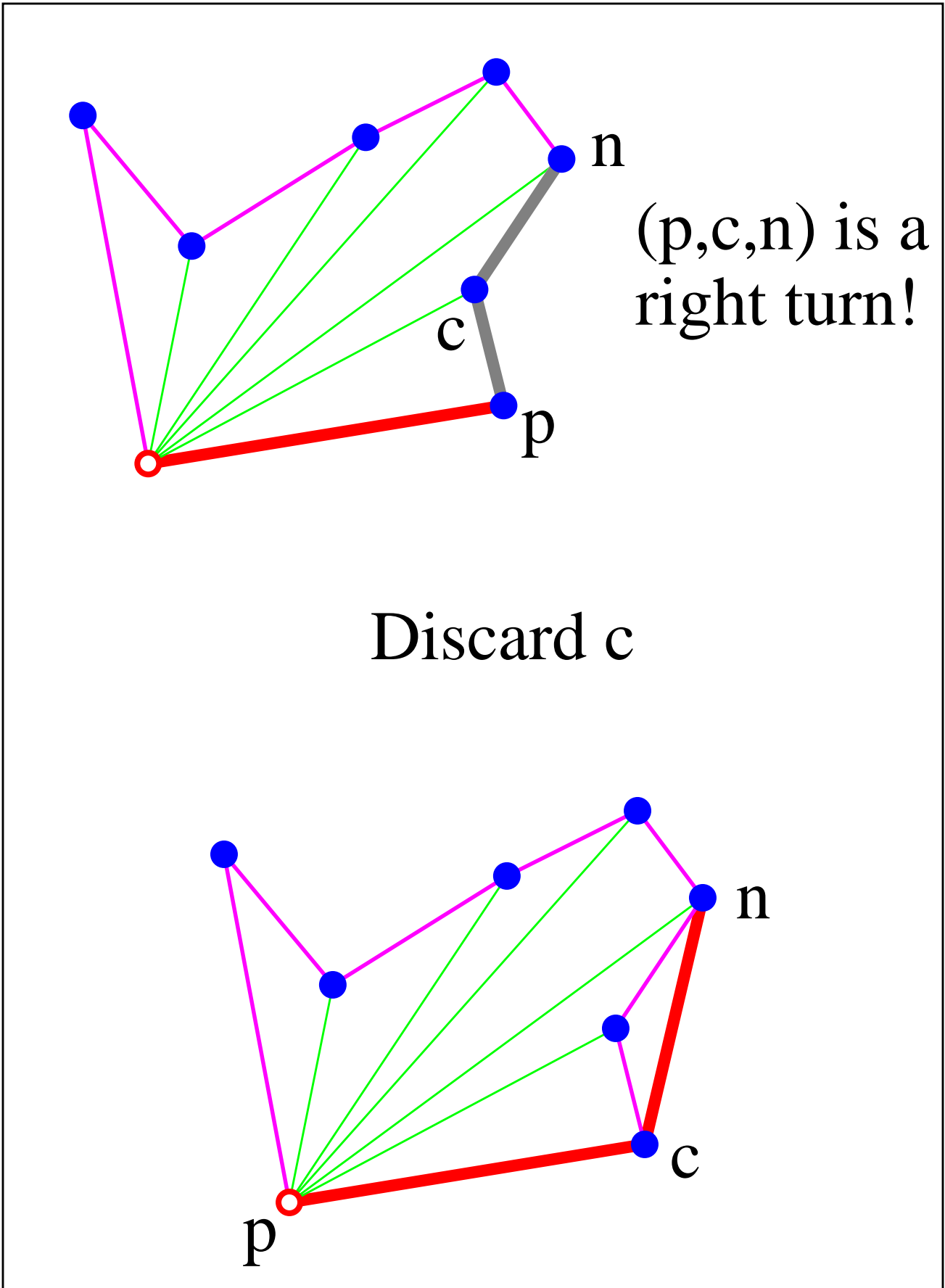
The anchor point and the next point on the path must be on the hull (why?)



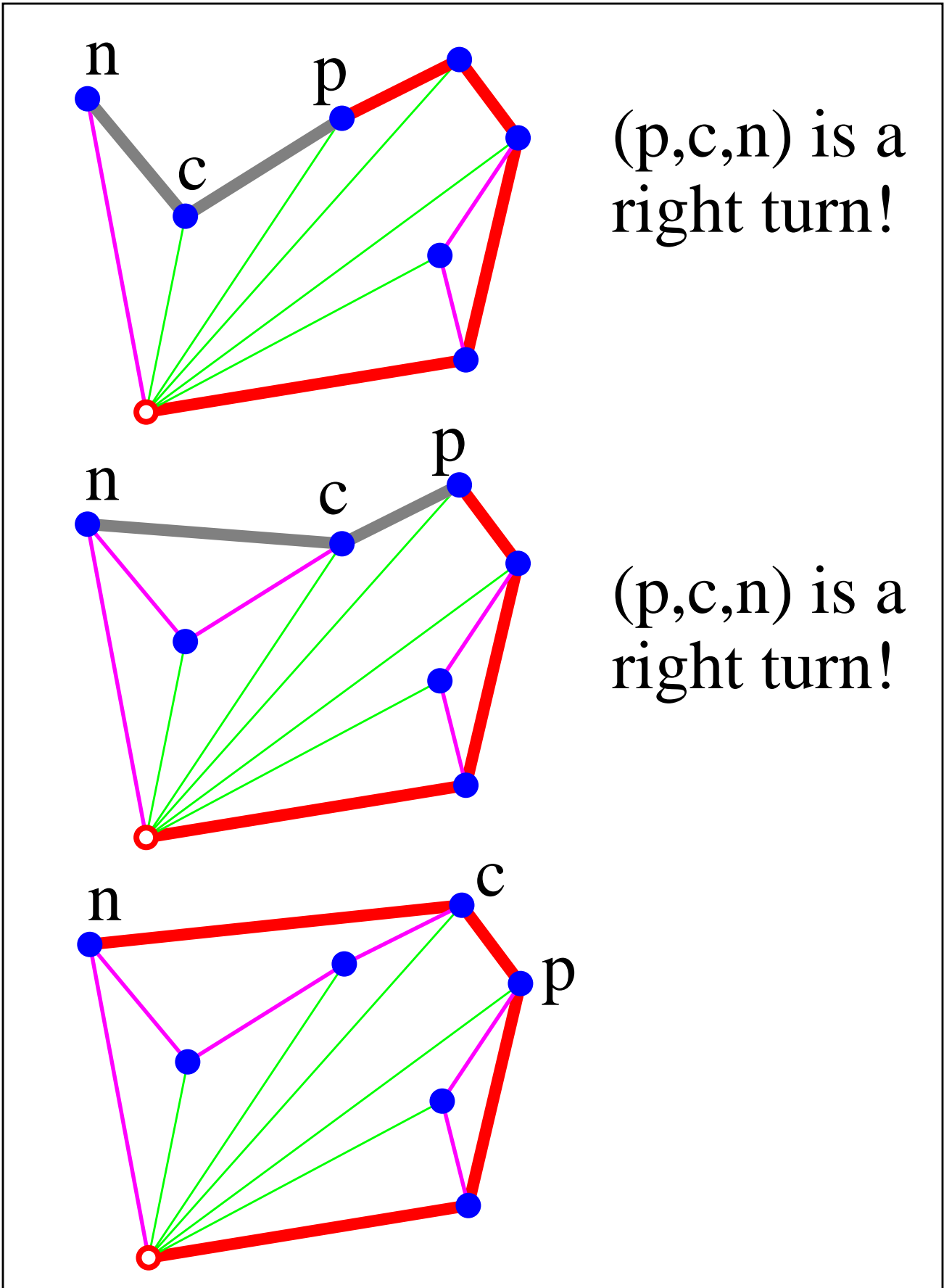
# Graham Scan: Phase 2

- keep the path and the hull points in two sequences
- elements are removed from the beginning of the path sequence and are inserted and deleted from the end of the hull sequence
- orientation is used to decide whether to accept or reject the next point









# Time Complexity of Graham Scan

- Phase 1 takes time  $O(N \log N)$ 
  - points are sorted by angle around the anchor
- Phase 2 takes time  $O(N)$ 
  - each point is inserted into the sequence exactly once, and
  - each point is removed from the sequence at most once
- Total time complexity  $O(N \log N)$



# How to Increase Speed

- Wipe out a lot of the points you know won't be on the hull! This is *interior elimination*
- Here's a good way to do interior elimination if the points are randomly distributed in a square with horizontal and vertical sides:
  - Find the farthest points in the SW, NW, NE, and SE directions
  - Eliminate the points inside the quadrilateral (SW, NW, NE, SE)
  - Do Graham Scan on the remaining points (only  $O(\sqrt{N})$  points are left on average!)

