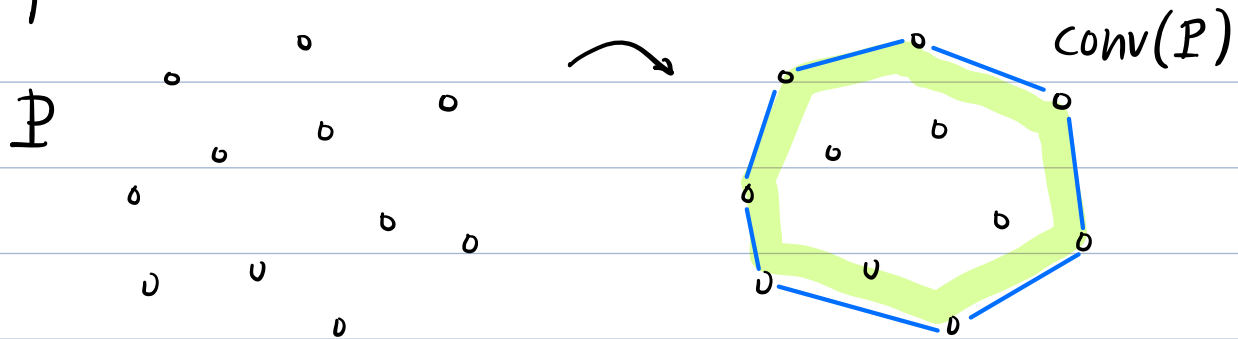


# CMSC 754 - Computational Geometry

## Lecture 2: Convex Hulls in the Plane

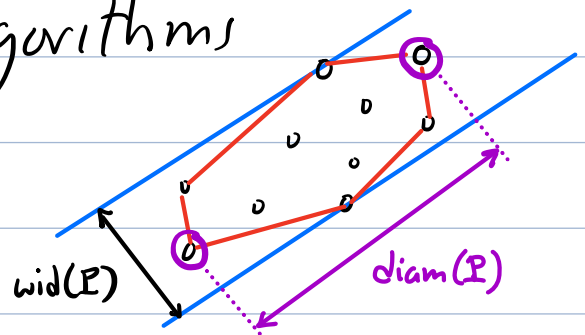
### Convex Hull: (Intuitive definition)

Given a point set  $P$  in  $\mathbb{R}^2$ , imagine snapping a rubber band around the points



Uses:

- shape approximation (intersection test)
- first step in other algorithms
  - diameter
  - width

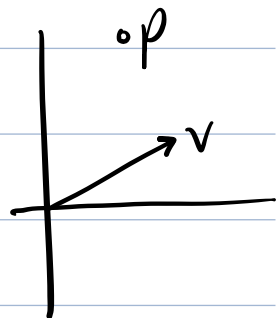


## Basic Definitions:

$\mathbb{R}^d$  - Real  $d$ -dim space  $p = (p_1, \dots, p_d)$   $p_i \in \mathbb{R}$

- Refer to as

points  $(p, q)$  - location  
vectors  $(u, v, w)$  - displacement



$\mathbb{R}$  - scalars  $\alpha, \beta, \gamma, \dots$

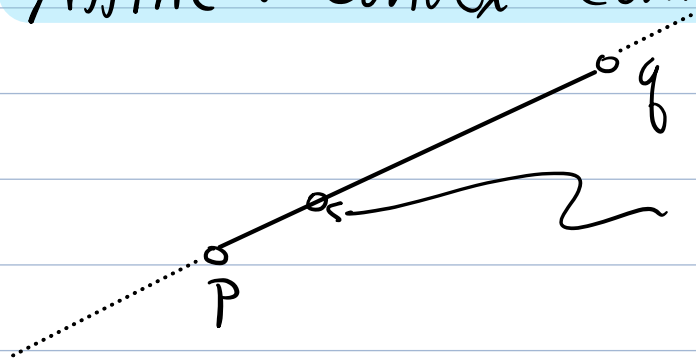
usual ops from linear algebra:

$u + v, u - v$  - vector addition

$\alpha \cdot u$  - scalar multiplication

$u \cdot v$  - dot product =  $\sum_{i=1}^d u_i v_i$

## Affine + Convex Combinations:



for  $\alpha \in \mathbb{R}$

$$(1-\alpha)p + \alpha q$$

Generally given  $p_1, \dots, p_k$ :

Affine combination:  $\sum_{i=1}^k \alpha_i p_i$   $\sum_{i=1}^k \alpha_i = 1$

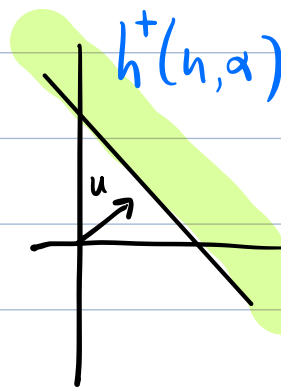
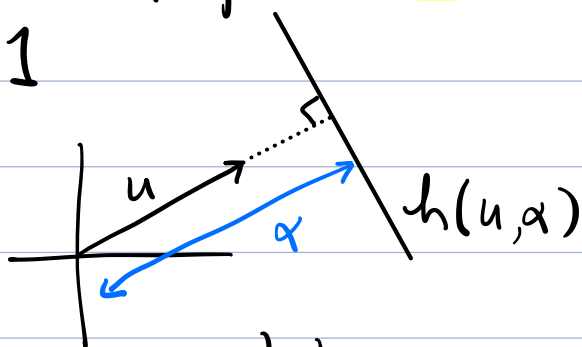
Convex combination: ... and  $0 \leq \alpha_i \leq 1$

## Lines, Hyperplanes, Halfspaces:

Given nonzero vector  $u$  + scalar  $\alpha$ ,

$h(u, \alpha) = \{ p \in \mathbb{R}^d \mid p \cdot u = \alpha \}$  is hyperplane

If  $\|u\| = 1$



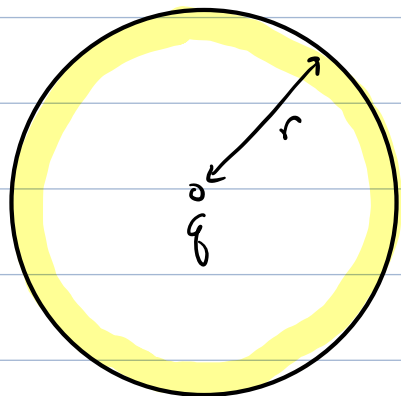
$h^+(u, \alpha) = \{ p \in \mathbb{R}^d \mid p \cdot u \geq \alpha \}$

## Euclidean Ball:

$$\text{dist}(p, q) = \|p - q\| = \left( \sum_{i=1}^d (p_i - q_i)^2 \right)^{1/2}$$

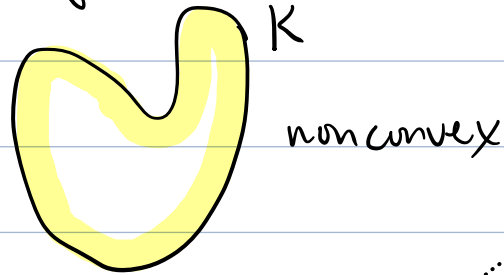
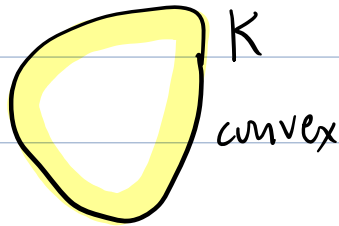
$$B(q, r) = \{ p \in \mathbb{R}^d \mid \|p - q\| \leq r \}$$

(Euclidean) ball of radius  $r$  centered at  $q$ .



## Convexity:

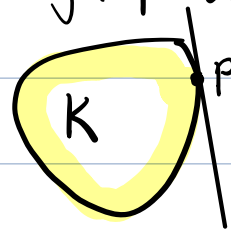
A set  $K \subseteq \mathbb{R}^d$  is **convex** if  $\forall p, q \in K$  the line segment  $\overline{pq}$  (equiv. any conv. combination of  $p + q$ ) lies within  $K$



Boundary  
of  $K$

## Support Hyperplane:

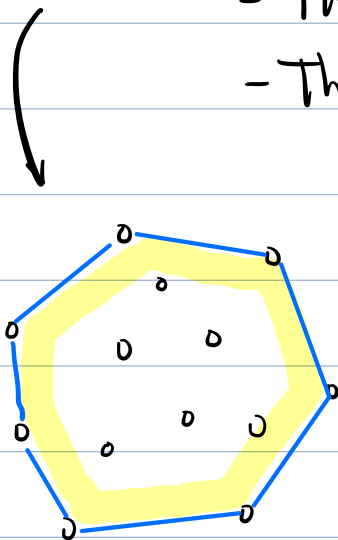
Given convex  $K$  and any point  $p \in \partial K$ ,  $\exists$  hyperplane passing through  $p$  with  $K$  lying all on one side.



## Convex Hull:

Given a set  $P$  of points in  $\mathbb{R}^d$ , the convex hull,  $\text{conv}(P)$ , is the smallest convex set containing  $P$ .

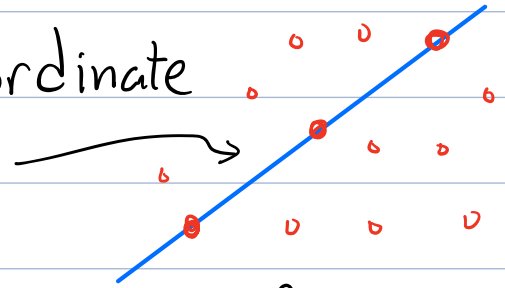
- The set of all convex combs in  $P$
- The intersection of all halfspaces containing  $P$



## General Position:

Geometric algorithms are complicated by rare (?) degenerate cases:

- points having same coordinate
- $\geq 3$  collinear points
- $\geq 4$  cocircular points

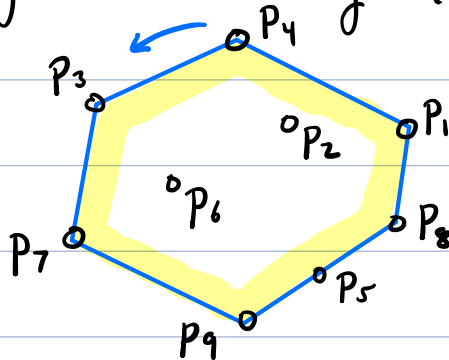


To simplify algorithm presentation we often assume these do not arise in the input.

Called **general-position assumption**

**(Planar) Convex Hull Problem:** Given a set of  $n$  pts  $P = \{p_1, \dots, p_n\} \subseteq \mathbb{R}^2$  ( $p_i = (x_i, y_i)$ ) compute  $\text{conv}(P)$ .

Output: Cyclic ordering of vertices on the hull



possible output: (indices)

$\langle 4, 3, 7, 9, 8, 1 \rangle$

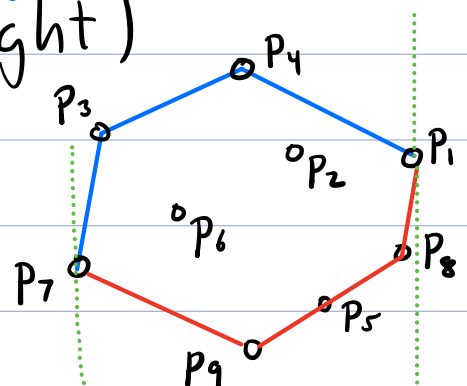
Note:  $p_5$  not output

(Can assume this away by "general position")

**Alternative output: (left to right)**

**Upper-hull + Lower-hull**

$\langle 7, 3, 4, 1 \rangle + \langle 7, 9, 8, 1 \rangle$

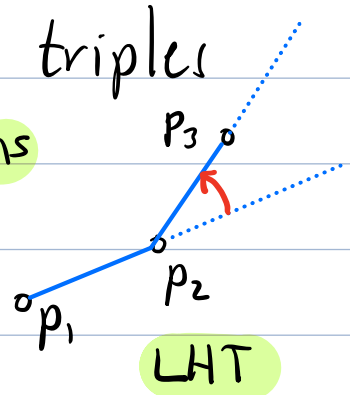
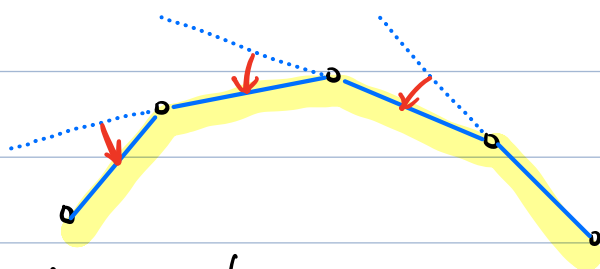


## Graham's Scan: $O(n \log n)$ solution

- Compute upper + lower hulls separately
- Upper-hull:
  - Sort pts by x-coords
  - Add each to upper hull
  - Remove pts no longer on hull
- Lower-hull: (symmetrical) ← How?

## Observations:

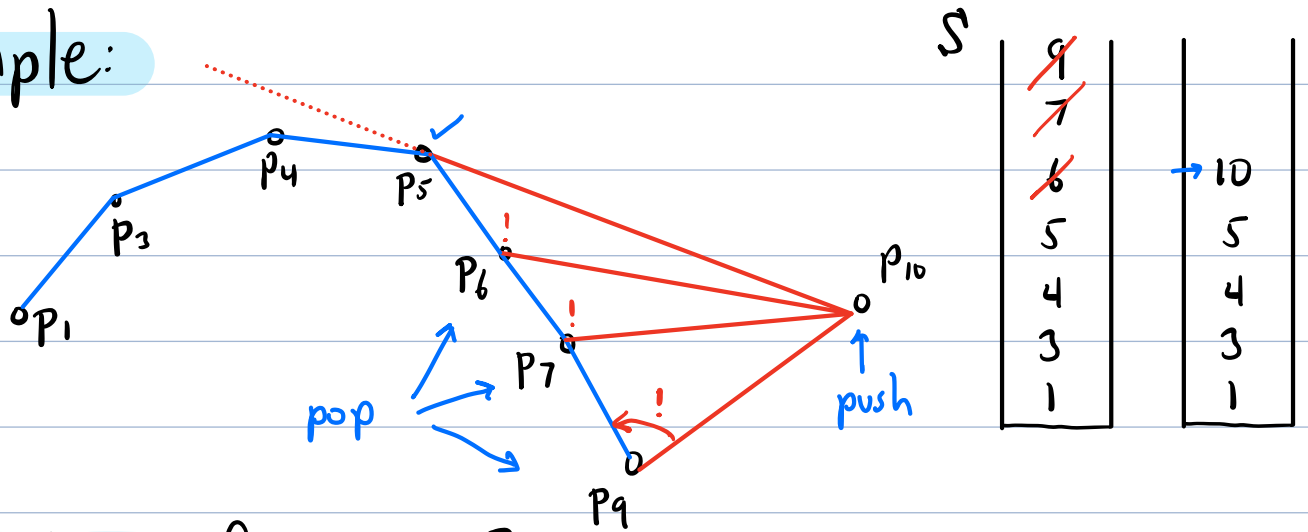
- The rightmost pt always on hull
- Reading right to left, consecutive triples on the hull form **left-hand turns**



## Incremental Approach:

- Store vertices (indices) of upper hull on **stack**
- For each new point  $p_i$  (left to right)
  - While  $\langle p_i, S[\text{top}], S[\text{top}-1] \rangle$  do **not** form LHT - **pop**  $\curvearrowright$
- **Push**  $p_i$

Example:



How to test for LHT?

Orientation test

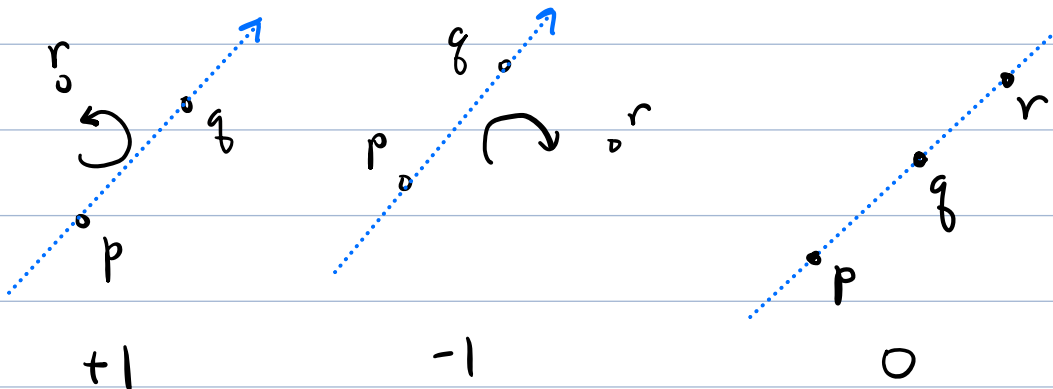
Given a sequence  $\langle p, q, r \rangle$  of 3 pts in  $\mathbb{R}^2$

$$\text{orient}(p, q, r) = \text{sign} \left( \det \begin{pmatrix} 1 & p_x & p_y \\ 1 & q_x & q_y \\ 1 & r_x & r_y \end{pmatrix} \right)$$

is: +1 if they are oriented CCW (LHT)

-1 " " " " CW (RHT)

0 if they are collinear (or duplicates)



## Graham's Scan: (Upper Hull only)

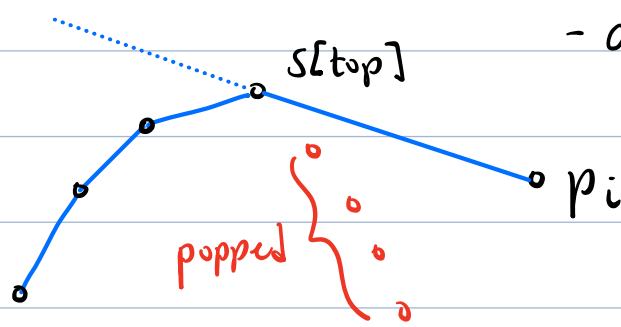
- Sort pts by increasing x-coords  $\langle p_1, \dots, p_n \rangle$
- Push  $p_1, p_2$  onto  $S$
- for  $i \leftarrow 3$  to  $n$ 
  - while ( $|S| \geq 2$  and  $\text{orient}(p_i, S[t], S[t-1]) \leq 0$ ) pop  $S$
- push  $p_i$

## Correctness: (Sketch)

**Lemma:** After processing  $p_i$ ,  $S$  contains upper hull of  $\langle p_1, \dots, p_i \rangle$

**Proof:** By induction on  $i$ .

- $p_i$  must be last vertex of hull
- all the popped pts are not on upper hull
- all remaining pts are on upper hull



(omit the details)



Running time:

- $O(n \log n)$  to sort
- for  $3 \leq i \leq n$ , let  $d_i = \text{num. of pops}$  when inserting  $p_i$

- Time for scan is  $\sim$

$$\sum_{i=3}^n (d_i + 1) \leq n + \sum_{i=3}^n d_i$$

↑                      ↙  
for pops            for push of  $p_i$

- Note that  $\sum d_i \leq n \rightarrow \text{Why?}$

- Total time:  $O(n \log n + 2n) = O(n \log n)$

Also see lecture notes for a hull algorithm based on divide + conquer