# Algorithm Design and Analysis

**Computational Geometry (Fundamentals and the Convex Hull)** 

### Goals for today

- Explore some fundamental tools for computational geometry
- Understand important tools/ideas such as:
  - Dot and cross products
  - The line-side test
- Define and solve the convex hull problem

### Why geometry?

- Applications in robotics
- Applications to graphics
- Applications to algorithms (LPs!!)

### Representation and Model

How might we represent some of the following ideas?

**Real number** Floating-point number

**Point** A pair of floating-point numbers

**Line** A pair of points

**Line Segment** A pair of points

**Triangle** A triple of points

Concerns? Rounding ??

### Fundamental Objects & Operations

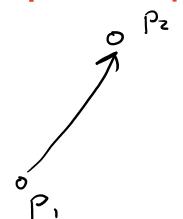
Representation (Point): A pair of real numbers



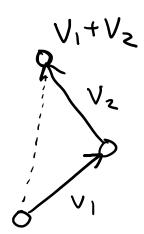
Representation (Vector): A pair of real numbers

We will use these interchangeably

#### **Operation (Addition/subtraction):**



$$(x_1, y_1) + (x_2, y_2) = (x_1 + x_2, y_1 + y_2)$$
  
 $(x_1, y_1) - (x_2, y_2) = (x_1 - x_2, y_1 - y_2)$ 

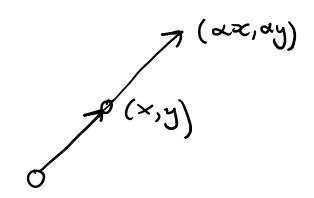


### **Fundamental Operations (continued)**

#### **Operation (Scalar multiplication):**

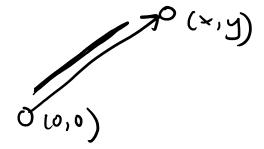
$$\alpha(x,y) = (\alpha x, \alpha y), \qquad \alpha \in R$$

$$\alpha \in R$$



#### **Operation (Length/magnitude):**

$$||(x,y)|| = \sqrt{x^2 + y^2}$$



#### **Application (Distance):**



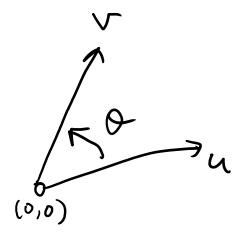
### Fundamental Operations (continued)

#### **Operation (The dot product):**

$$(x_1, y_1) \cdot (x_2, y_2) = x_1 x_2 + y_1 y_2$$

#### Useful theorem (The dot product angle formula):

$$u \cdot v = ||u|| ||v|| \cos(\theta)$$



### Application of the dot product

**Application (Projection):** Given a **point** p and a **line** L that goes through the origin in the direction of q (a unit vector), find the point p' on L that

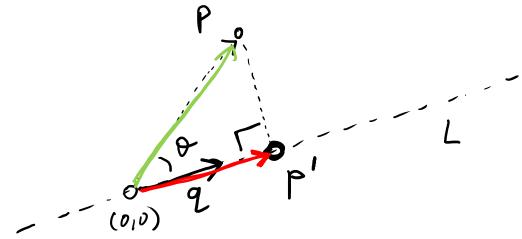
is closest to p

$$P \cdot 9 = ||p|| ||q|| \cos(0)$$

$$= ||p|| \cos(0)$$

$$p' = (p \cdot q) q$$

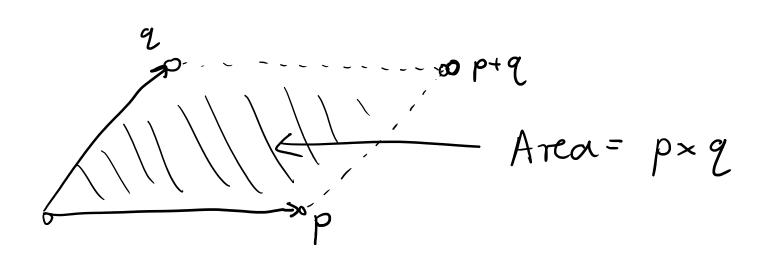
length unr vector



### Fundamental Operations (continued)

#### **Operation (The cross product):**

$$(x_1, y_1) \times (x_2, y_2) = \det\left(\begin{bmatrix} x_1 & y_1 \\ x_2 & y_2 \end{bmatrix}\right) = x_1 y_2 - x_2 y_1$$



"Signed area"

possitive if q

is left of p

negative otherwise

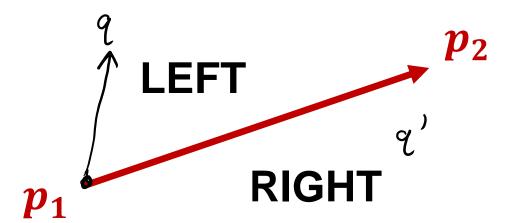
### Line-side test (Important!)

Operation (Line-side test): Given points  $p_1, p_2, q$ , we want to know whether q is on the LEFT or RIGHT of the line from  $p_1$  to  $p_2$ 

$$V_{1} = P_{2} - P_{1}$$

$$V_{2} = Q - P_{1}$$

$$V_{1} \times V_{2} \begin{cases} > 0 & LEFT \\ < 0 & RIGHT \\ = 0 & ON LINE \end{cases}$$



### **Convex Combinations**

**Definition (Convex combination):** A *convex combination* of the points  $p_1, p_2, ..., p_k$  is a point

$$p' = \sum_{i=1}^k \alpha_i \, p_i$$

such that  $\sum \alpha_i = 1$  and  $\alpha_i \ge 0$  for all i

$$P^{1} \qquad P^{2}$$

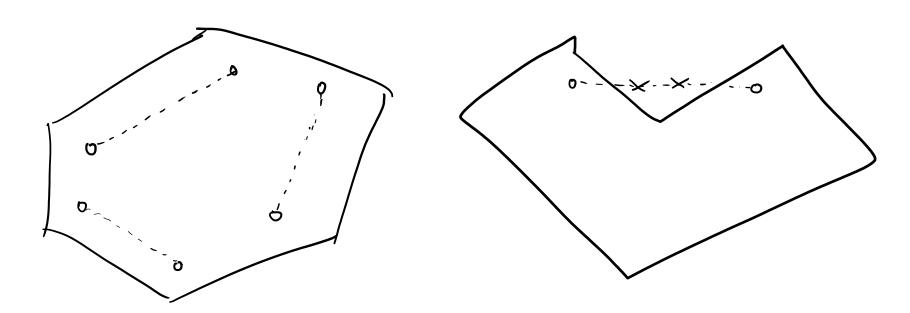
$$P^{1} = \times_{1} P_{1} + \times_{2} P_{2}$$

0

# The Convex Hull

### **Convexity recap**

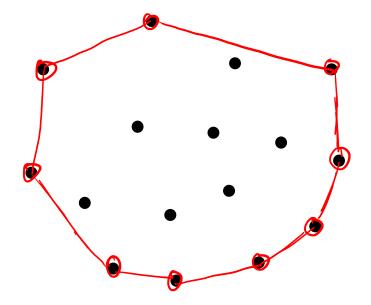
**Definition (Convex set):** A set is convex if for any points p, q, any convex combination of p, q is also in the set



### **The Convex Hull**

**Definition (Convex hull):** Given a set of points  $p_1, ..., p_n$ , the **convex hull** is the smallest convex polygon containing all of them

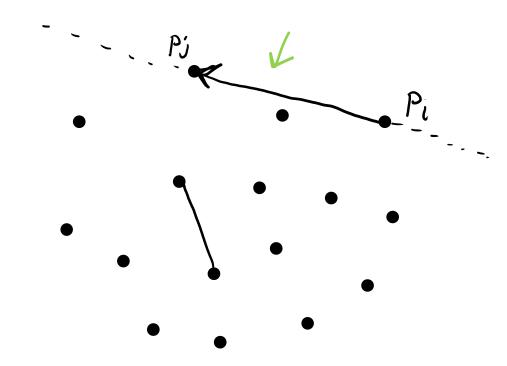
Goal: output the vertices of the hull in counterclockwise order



# An $O(n^3)$ -time algorithm

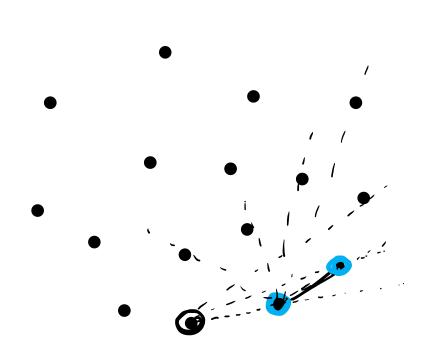
Observation (Hull edges): The edges of the convex hull must be pairs of points from the input

Claim (Hull edges): A segment  $(p_i, p_j)$  is on the convex hull if and only if...



## Better: An $O(n^2)$ -time algorithm

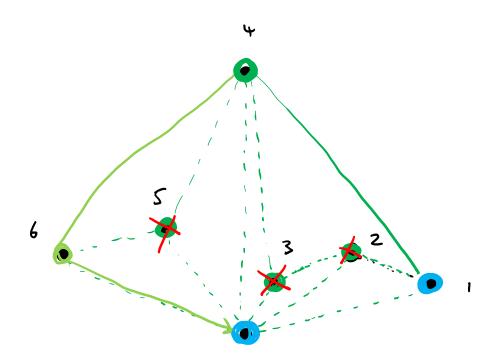
Observation (Order helps): The  $O(n^3)$ -time algorithm found the hull edges in an arbitrary order... What if we try to find them in CCW order



Find next pt as the one with least angle

### Graham Scan: An $O(n \log n)$ algorithm

Observation (Order helps again): We went from  $O(n^3)$  to  $O(n^2)$  by finding the edges in order... but we still processed the points in an arbitrary order. Can we order the points and do better?



### Graham Scan: An $O(n \log n)$ algorithm

#### **Algorithm (Graham Scan):**

```
Find lowest point p_0
Sort points p_1, p_2, \dots counterclockwise by their angle with p_0
H = [p_0, p_1]
for each point i = 2 \dots n - 1
   while LST(H[-2], H[-1], Pi) == RIGHT
        H.pop()
   H. append (p;)
```

### **Graham Scan: Complexity**

**Theorem:** Graham Scan runs in  $O(n \log n)$  time

```
Proof:

Sorting takes O(n \log n)

Loops are O(n) + O(n)
```

### **Lower Bound**

Theorem: Any convex hull algorithm that uses line-side tests to find the hull requires  $\Omega(n \log n)$  line-side tests (in a decision tree model)

Won't prove this

### Take-home messages

- Computational geometry is all about using the right tools (and drawing good diagrams)
  - Dot product
  - Cross product
  - Line-side test
  - Convex hull