

CS 516 -3  
Computational Geometry & Graph Drawing  
(Spring 2013)

# Last Class...

- Continued with (motivating) example: finding near neighbours (within fixed distance)
- Another (motivating) example from graph drawing: bar-visibility graphs

# Reading

MountNotes Chapters 7,8  
Chapters 9,10, 6

# Today...

- Brief review of Asst0
- Convex hulls, halfspace intersections and duality
- Two equivalences concerning convex hulls:
  - Structural equivalence (via duality) with (origin-containing) half-space intersection
  - Algorithmic equivalence (via reducibility argument) with sorting

# Today...

- Brief review of Asst0
- Convex hulls, halfspace intersections and duality
- Two equivalences concerning convex hulls:
  - Structural equivalence (via duality) with (origin-containing) half-space intersection
  - Algorithmic equivalence (via reducibility argument) with sorting

# Assignment 0

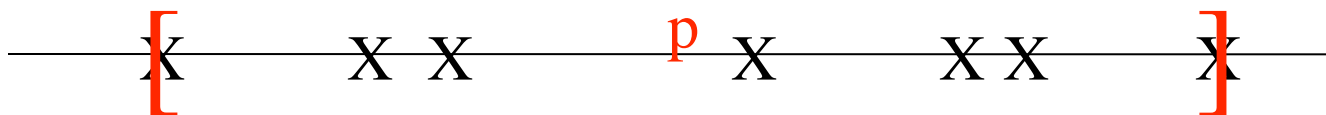
— X — X X — — X — X X — X —

# Assignment 0

— X — X X — — X — X X — X —

$$1(a) \min_p \max_{q \text{ in } S} |q-p|$$

# Assignment 0



$$1(a) \min_p \max_{q \text{ in } S} |q-p| \quad (1\text{-center})$$

# Assignment 0



$$1(b) \min_p \sum_{q \in S} |q-p| \quad (1\text{-median})$$

# Assignment 0

— X — X X — — X — X X — X —

$$1(c) \max_p \min_{q \text{ in } S} |q-p|$$

# Assignment 0



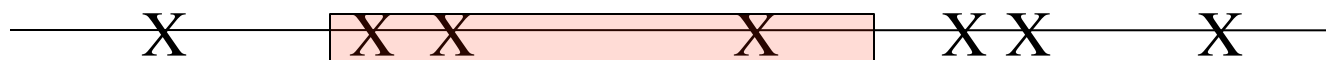
$$1(c) \max_p \min_{q \text{ in } S} |q-p|$$

# Assignment 0

— X — X X — — X — X X — X —

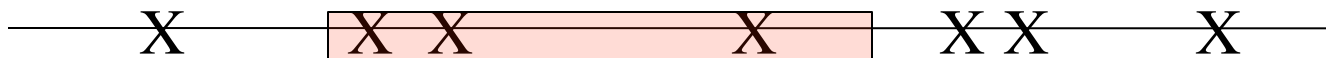
1(d)

# Assignment 0



1(d)

# Assignment 0



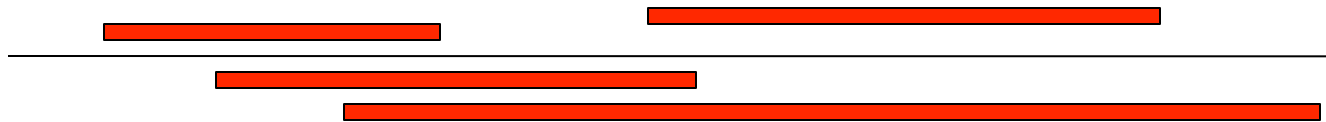
1(d) dynamic dictionary

# Assignment 0



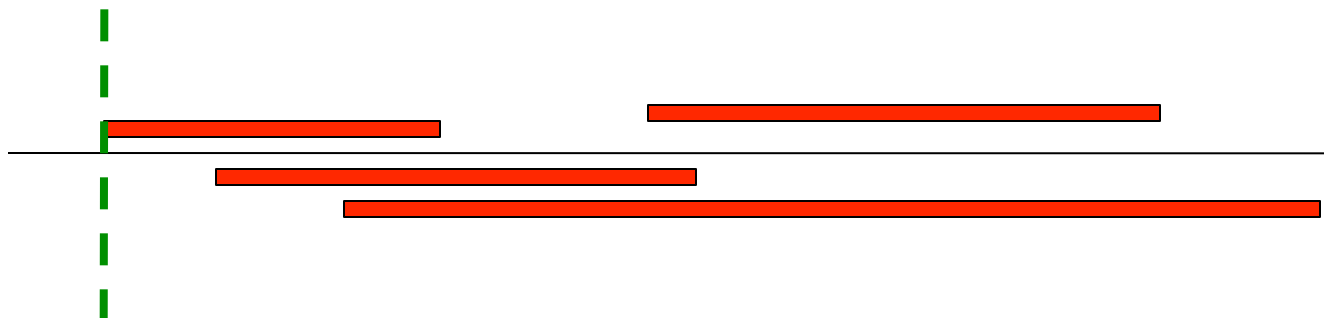
1(e) count number of *distinct* elements

# Assignment 0



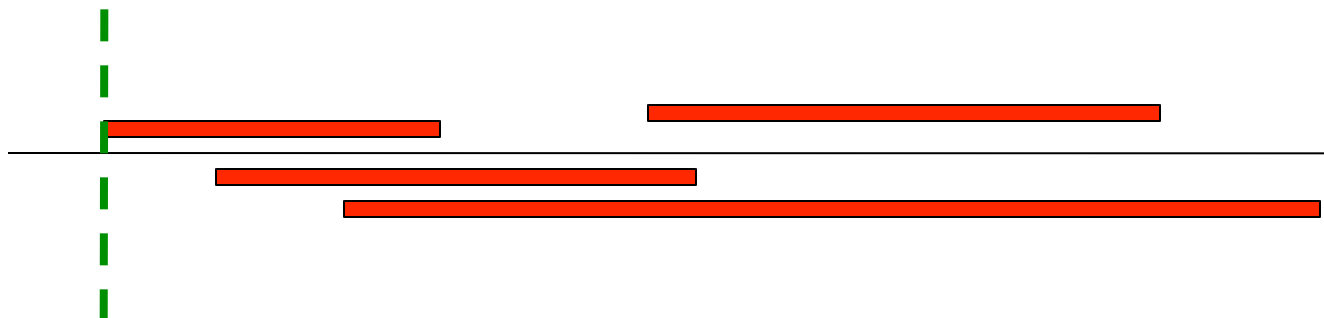
1(f) report intersecting intervals

# Assignment 0



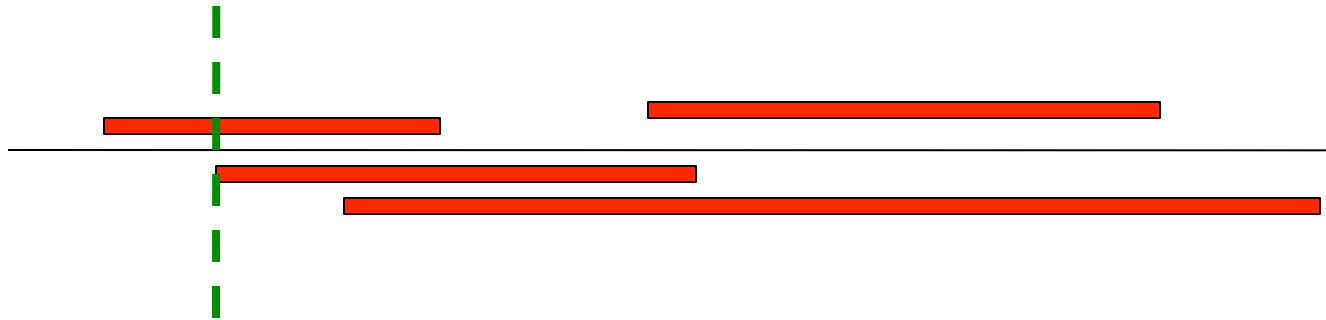
1(f) report intersecting intervals

# Assignment 0



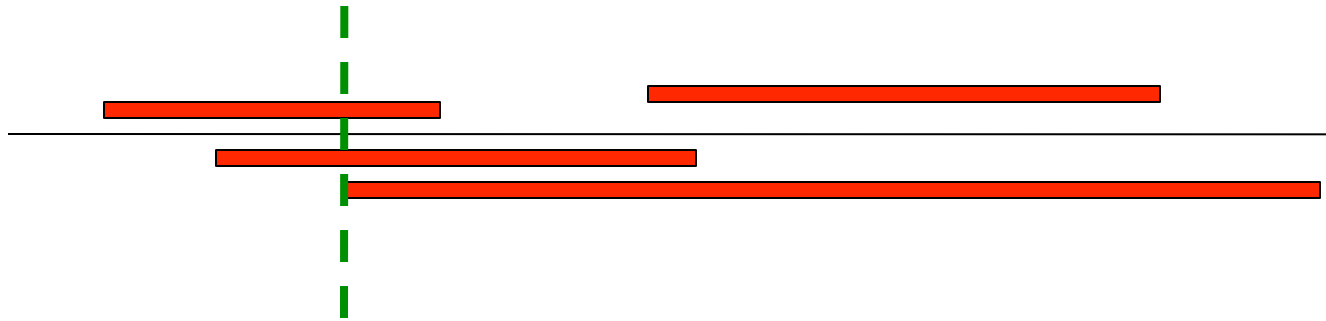
1(f) report intersecting intervals

# Assignment 0



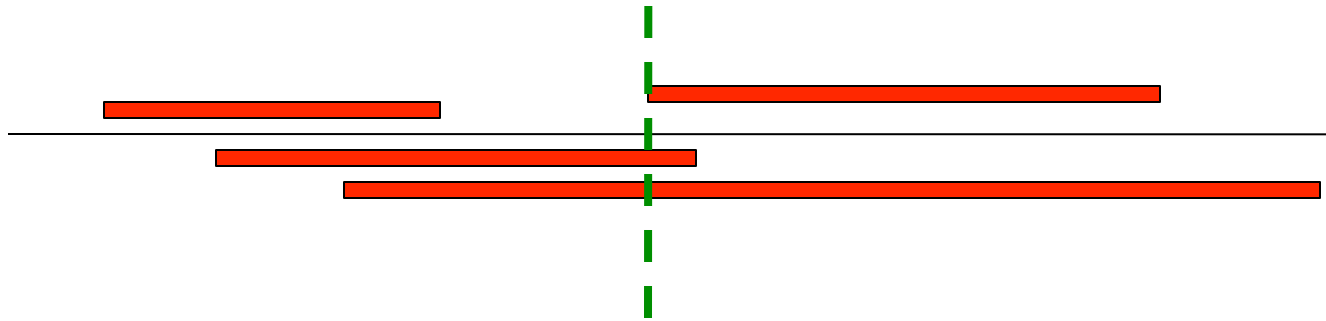
1(f) report intersecting intervals

# Assignment 0



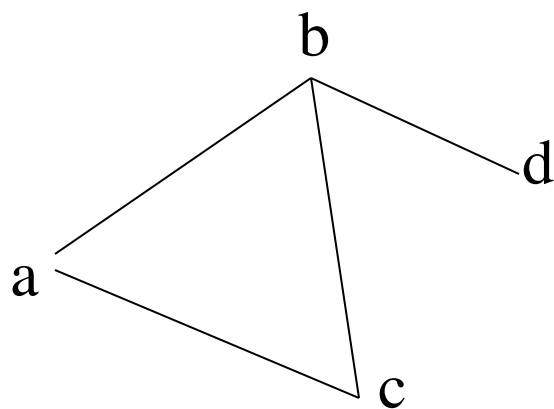
1(f) report intersecting intervals

# Assignment 0



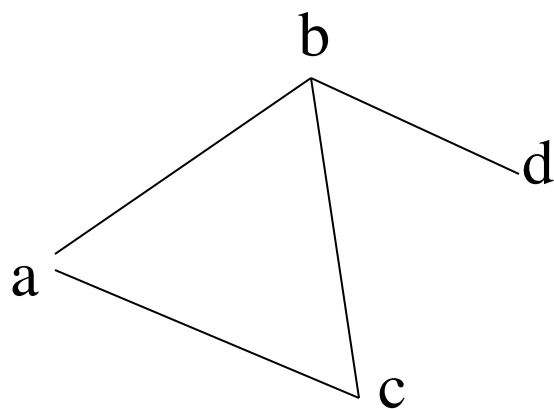
1(f) report intersecting intervals

# Assignment 0



1(g)

# Assignment 0

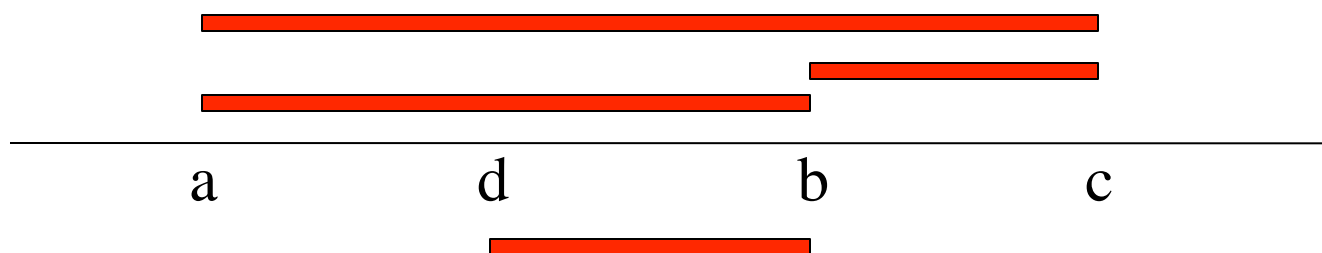
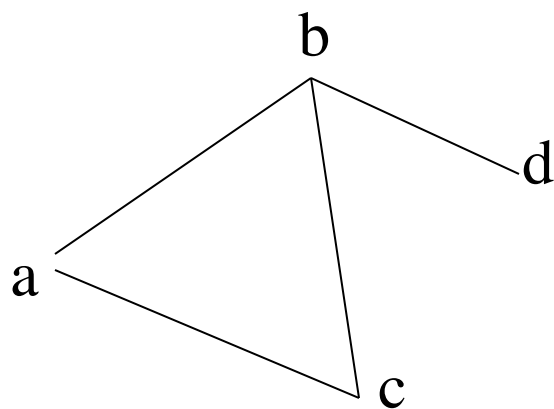


---

**a** **d** **b** **c**

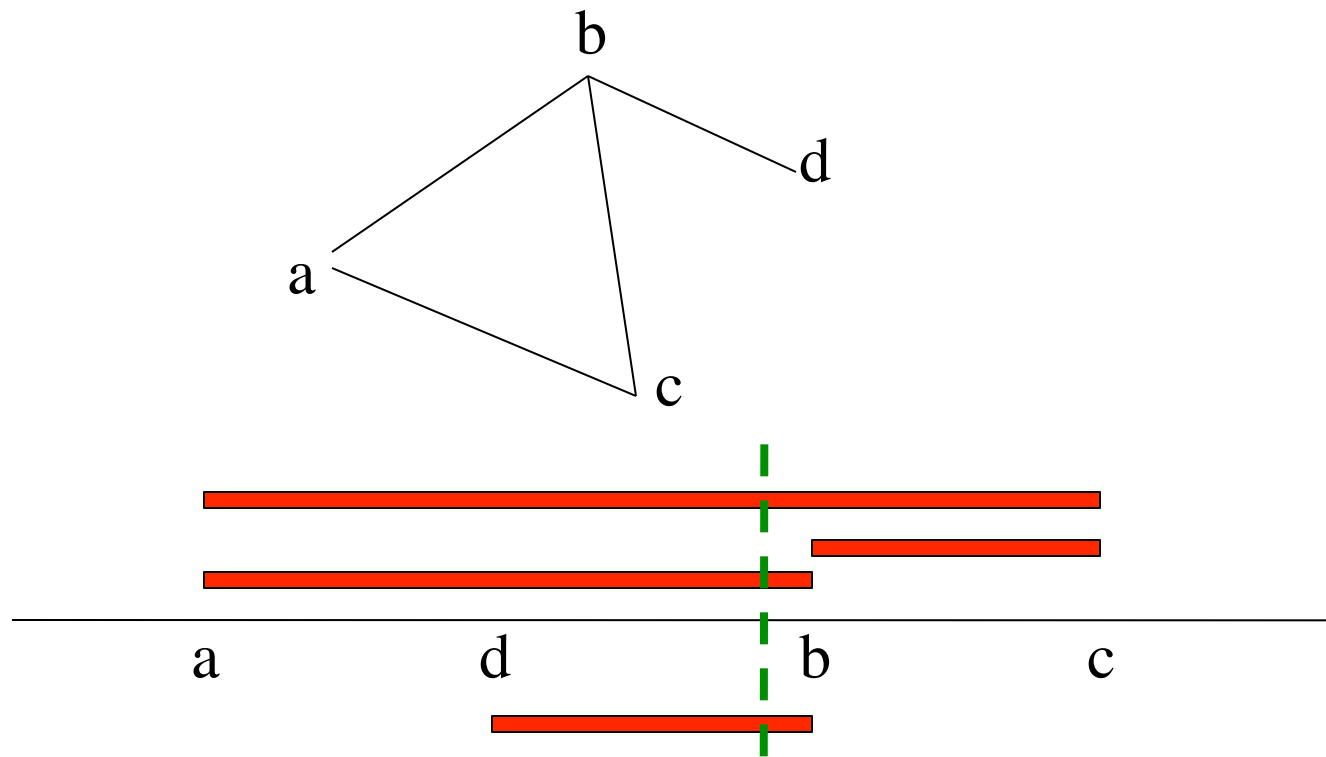
1(g)

# Assignment 0



1(g)

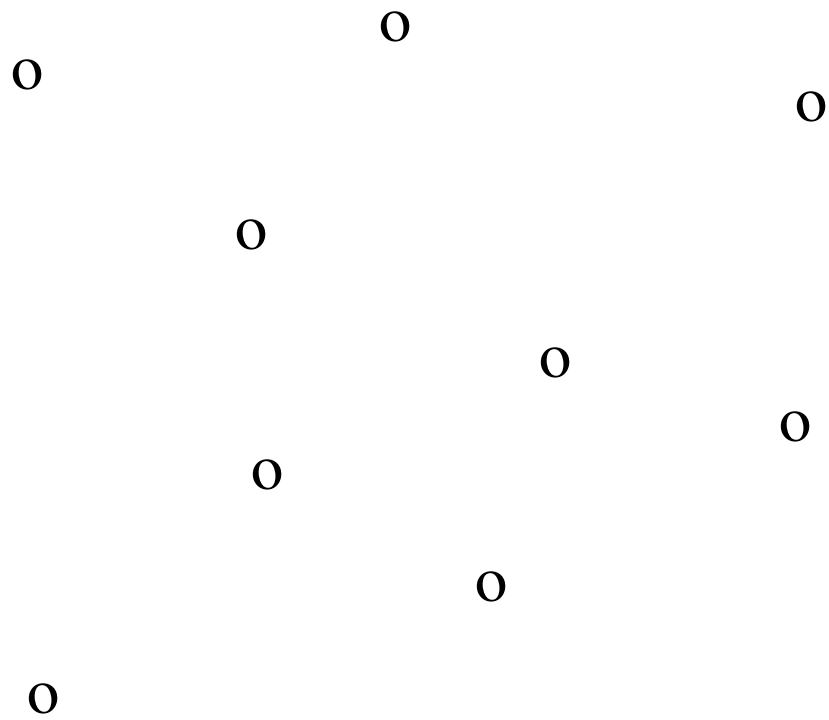
# Assignment 0



1(g) min cut linear arrangement

# Today...

- Brief review of Asst0
- Convex hulls, halfspace intersections and duality
- Two equivalences concerning convex hulls:
  - Structural equivalence (via duality) with (origin-containing) half-space intersection
  - Algorithmic equivalence (via reducibility argument) with sorting



point set  $S$

0

0

0

0

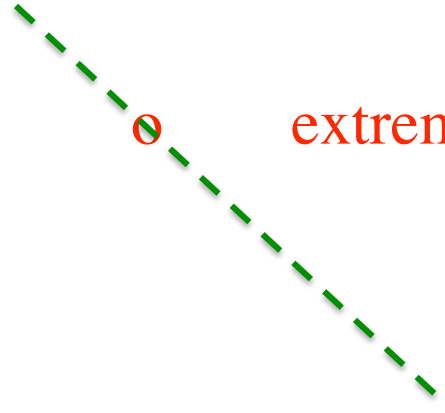
0

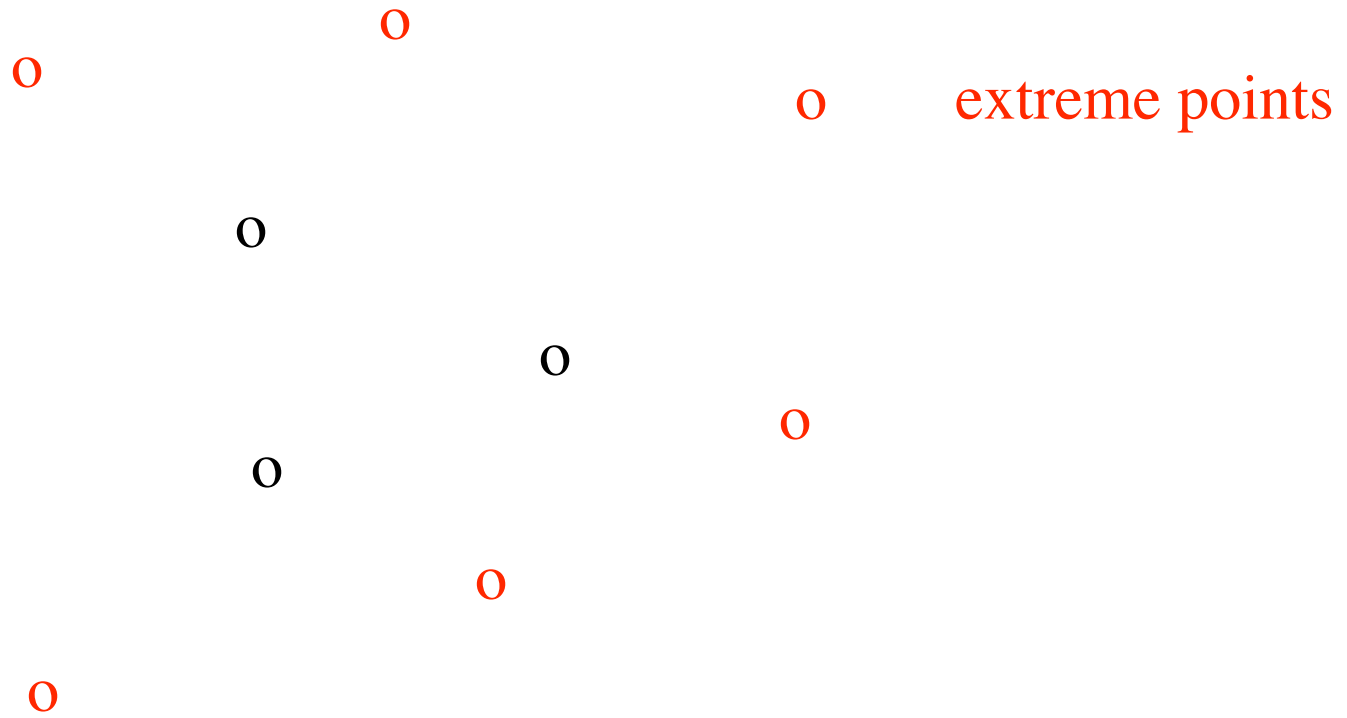
0

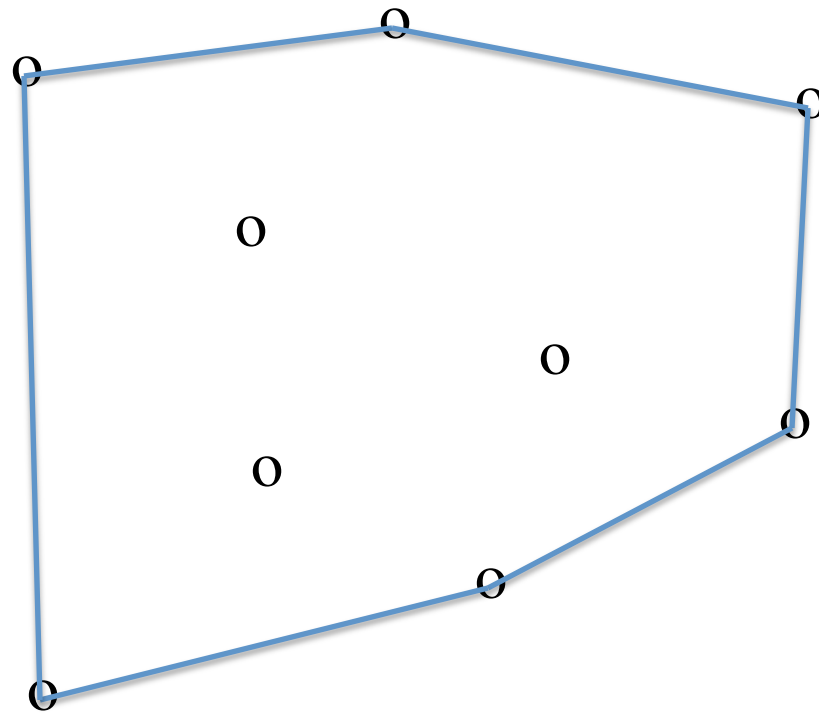
0

0

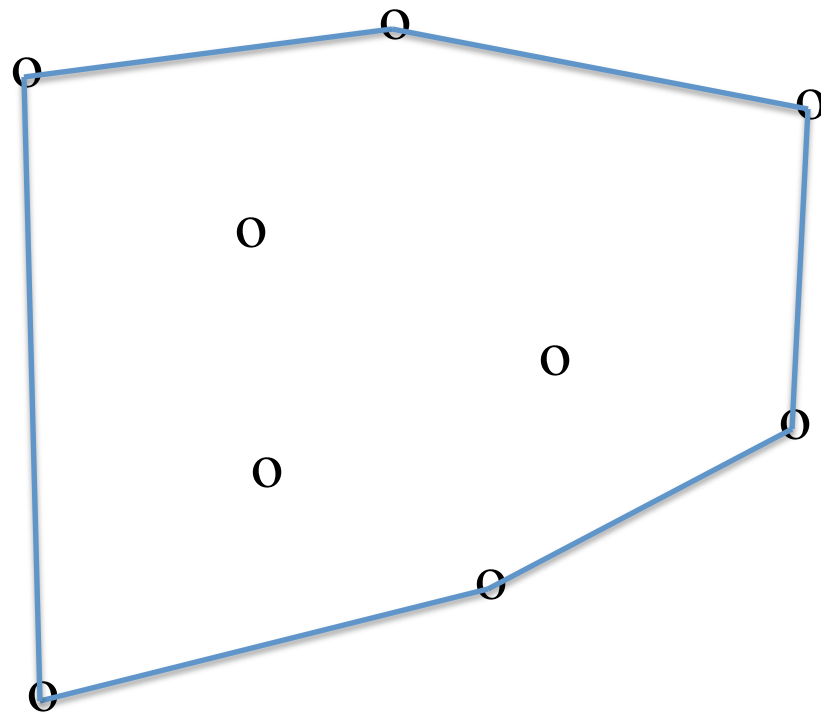
extreme point



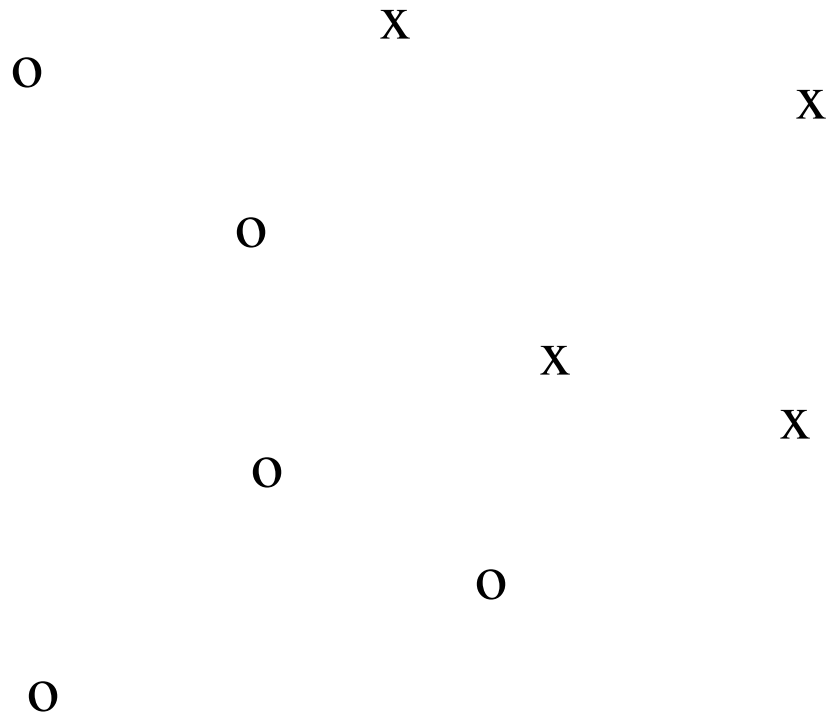




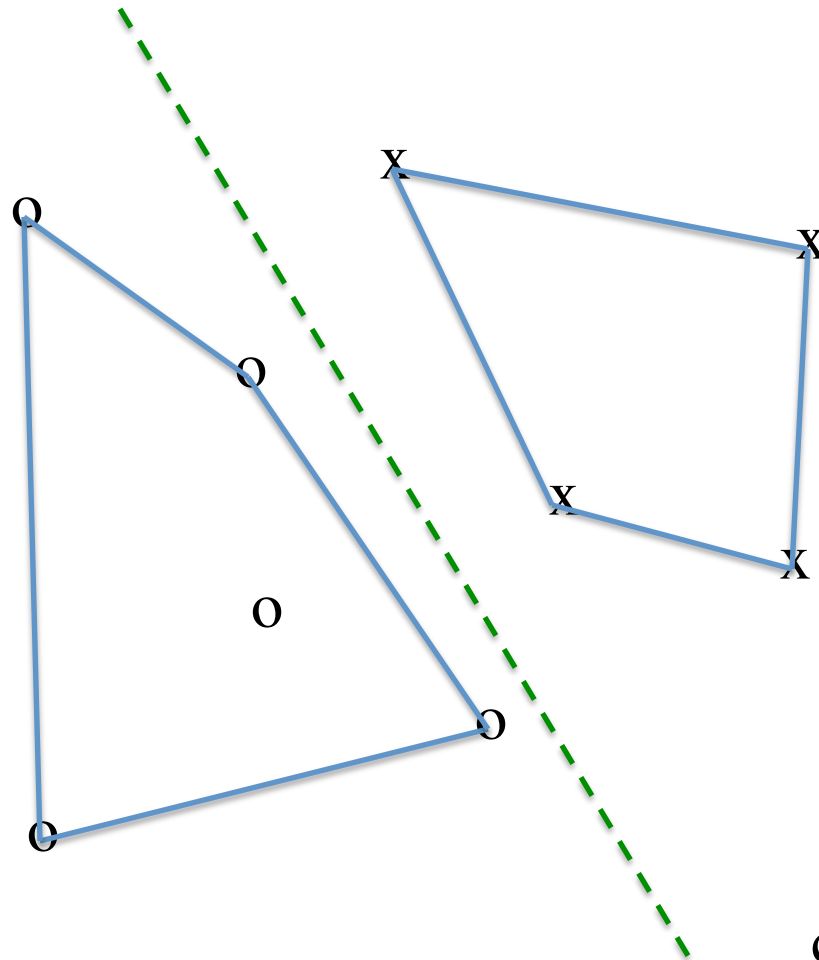
convex-hull =  
polygon whose vertices  
are extreme points



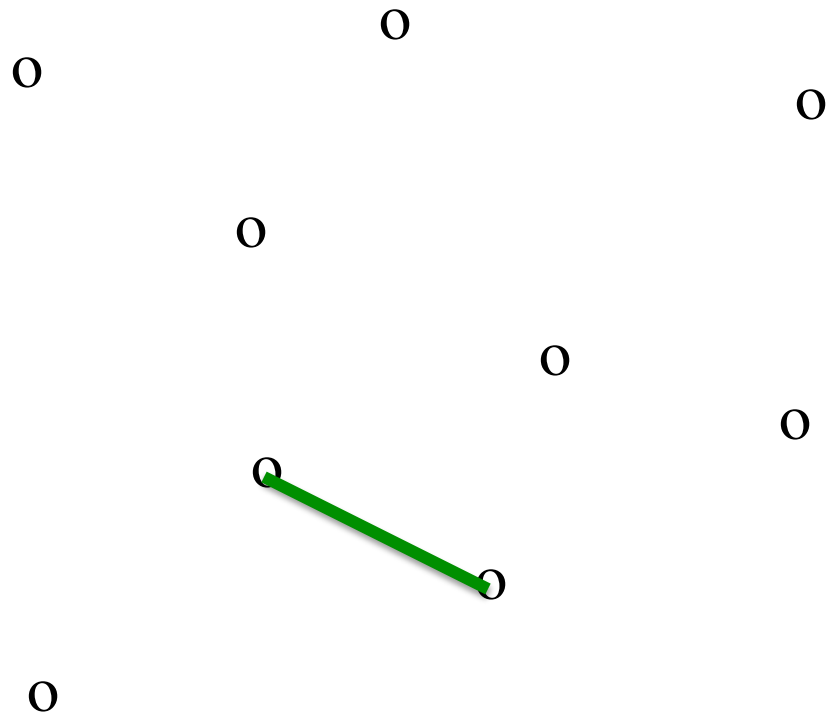
convex-hull :  
shape approx



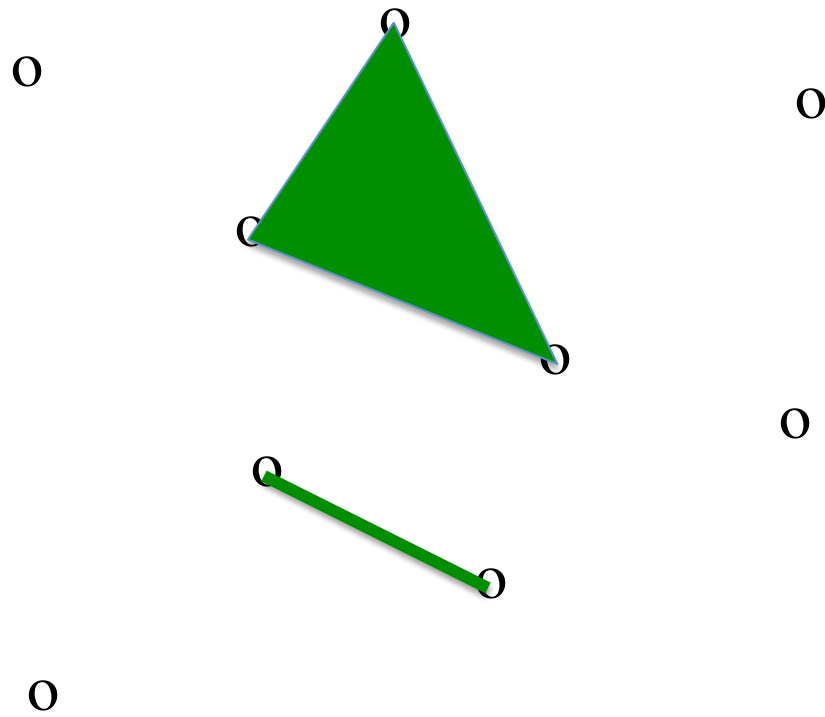
convex-hull :  
shape approx  
linear separability



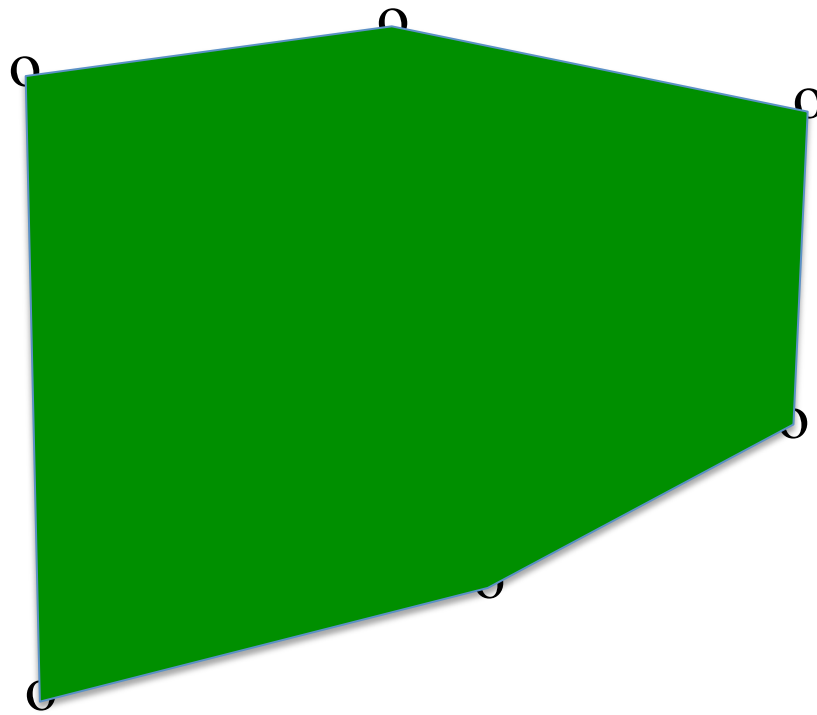
convex-hull :  
shape approx  
linear separability



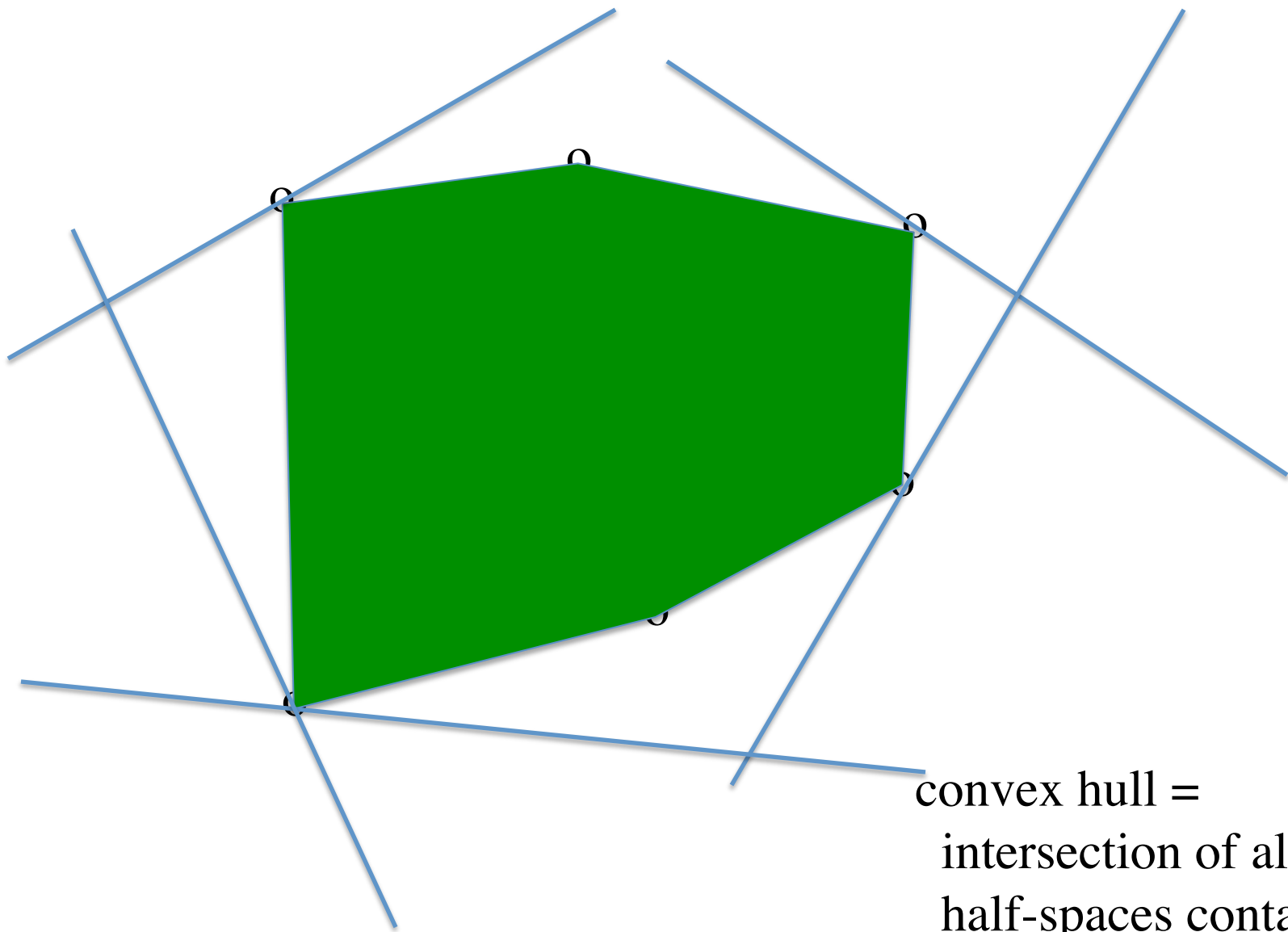
convex combination



convex combinations



convex hull =  
union of all  
convex combinations



convex hull =  
intersection of all  
half-spaces containing  $S$

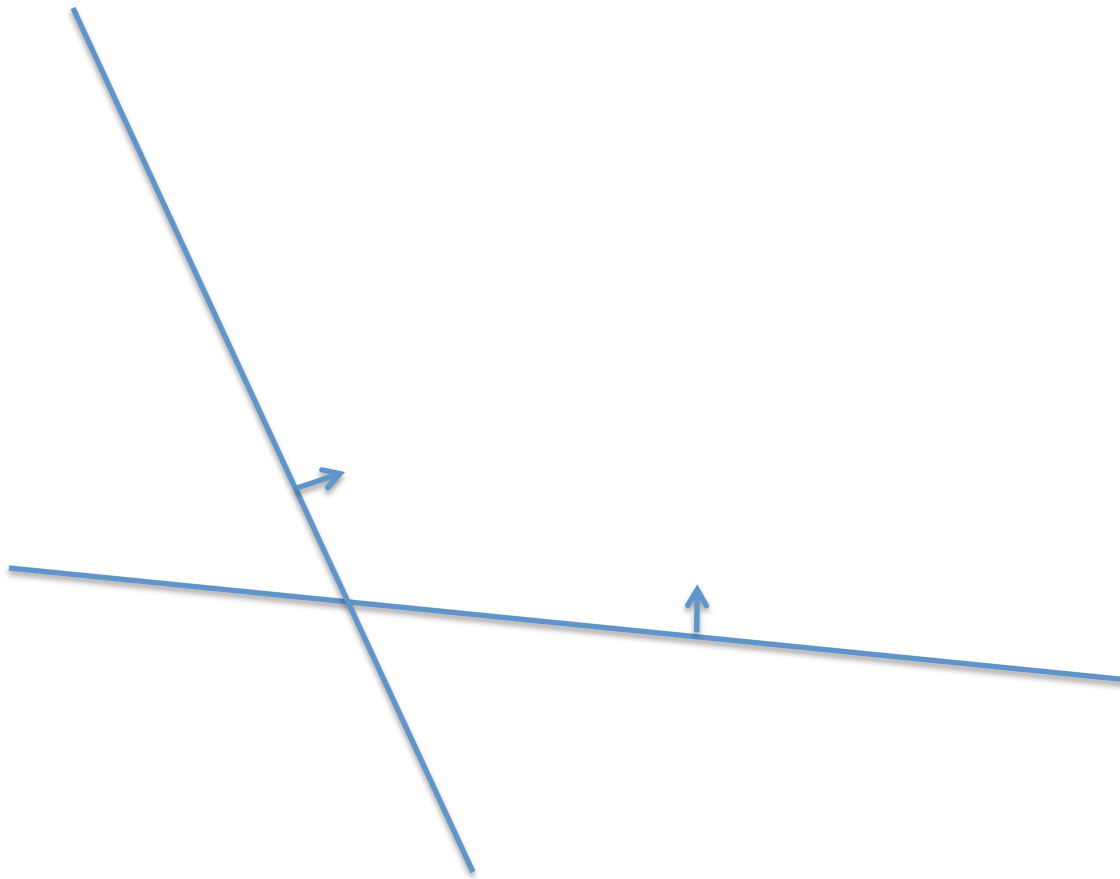
# Convex hull $\text{CH}(S)$

- $\text{CH}(S)$  is *smallest convex set* containing  $S$ .
- In  $\mathbf{R}^2$ ,  $\text{CH}(S)$  is smallest area (or perimeter) convex polygon containing  $S$ .
- In  $\mathbf{R}^2$ ,  $\text{CH}(S)$  is union of all triangles formed by triples of points in  $S$ .

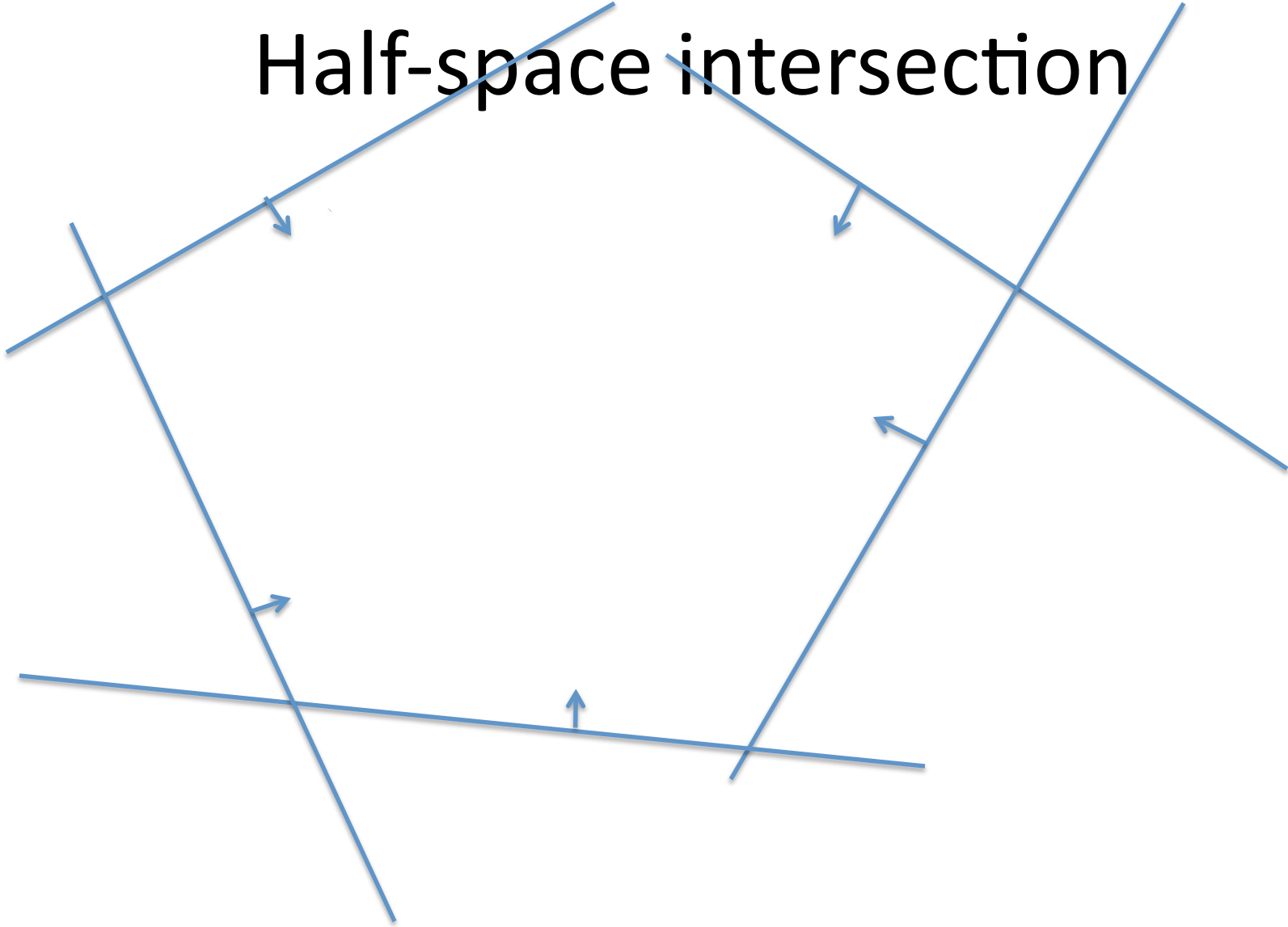
# Convex hull $\text{CH}(S)$

- $\text{CH}(S)$  is *smallest convex set* containing  $S$ .
- In  $\mathbf{R}^2$ ,  $\text{CH}(S)$  is smallest area (or perimeter) convex polygon containing  $S$ .
- In  $\mathbf{R}^2$ ,  $\text{CH}(S)$  is union of all triangles formed by triples of points in  $S$ .
- None of these descriptions/properties yield efficient algorithms; at best  $O(|S|^3)$ .

# Half-space intersection

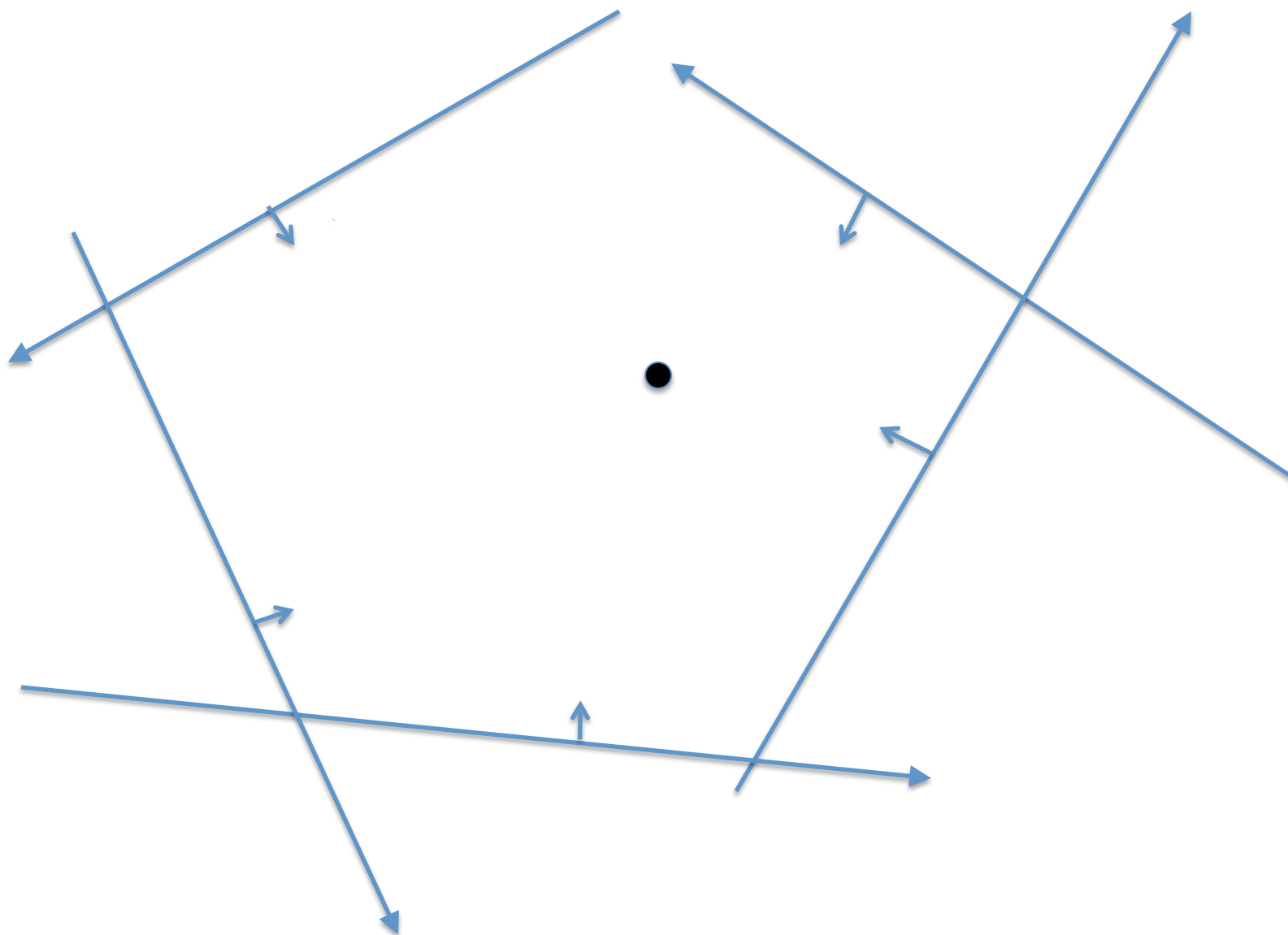


# Half-space intersection



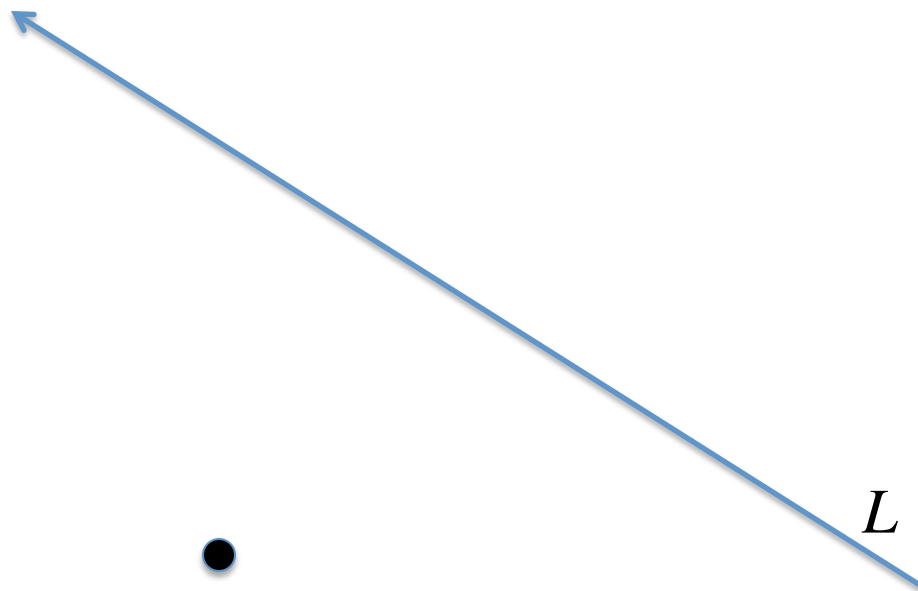
# Half-space intersection

- suppose we have a *witness* to the non-emptiness of the intersection—may as well be the origin
- such half-spaces are defined by *oriented* lines (directed so that origin lies to the left)

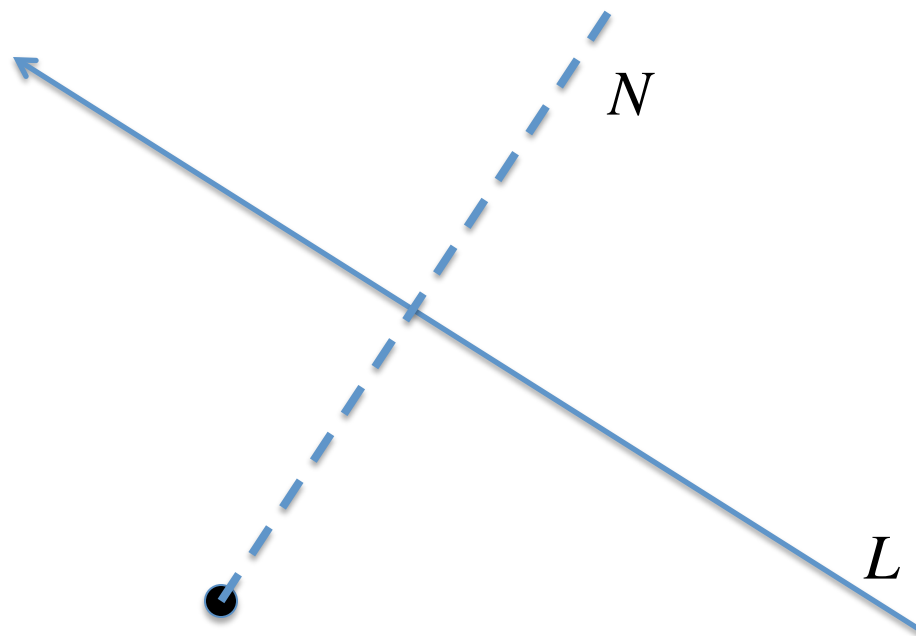


# Polarity transform

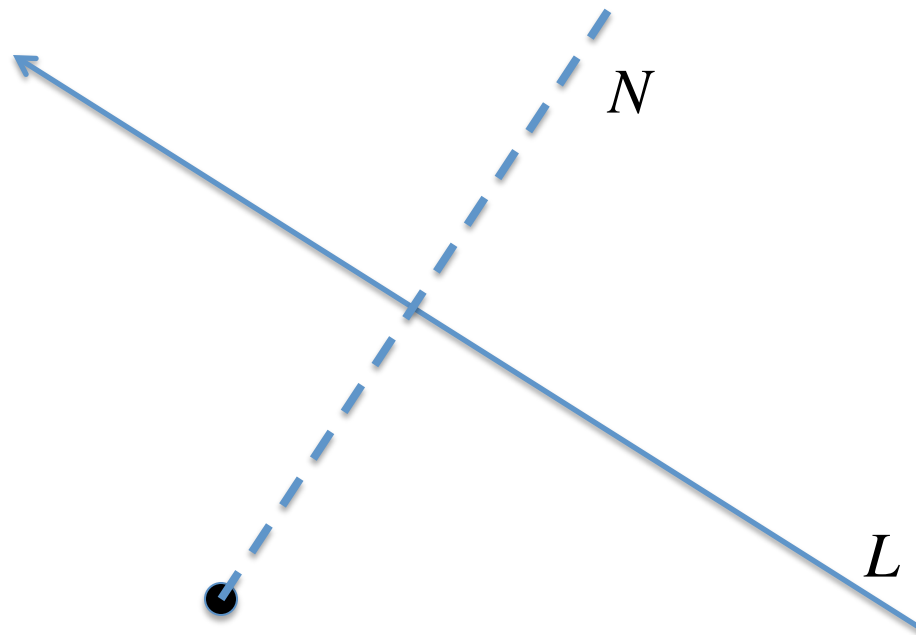
- an arbitrary line  $L$  that *avoids* the origin has the an equation of the form:  $ax + by - 1 = 0$
- view as directed line where points to *left* (respectively *right*) make  $ax + by - 1$  *negative* (respectively, *positive*)



$$L: ax+by-1 = 0$$

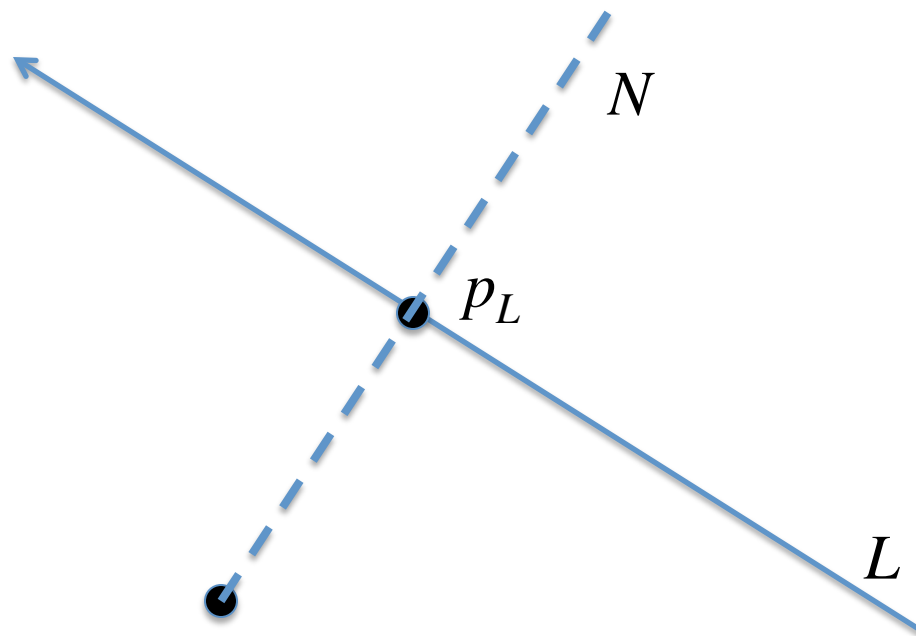


$$L: ax+by-1=0$$



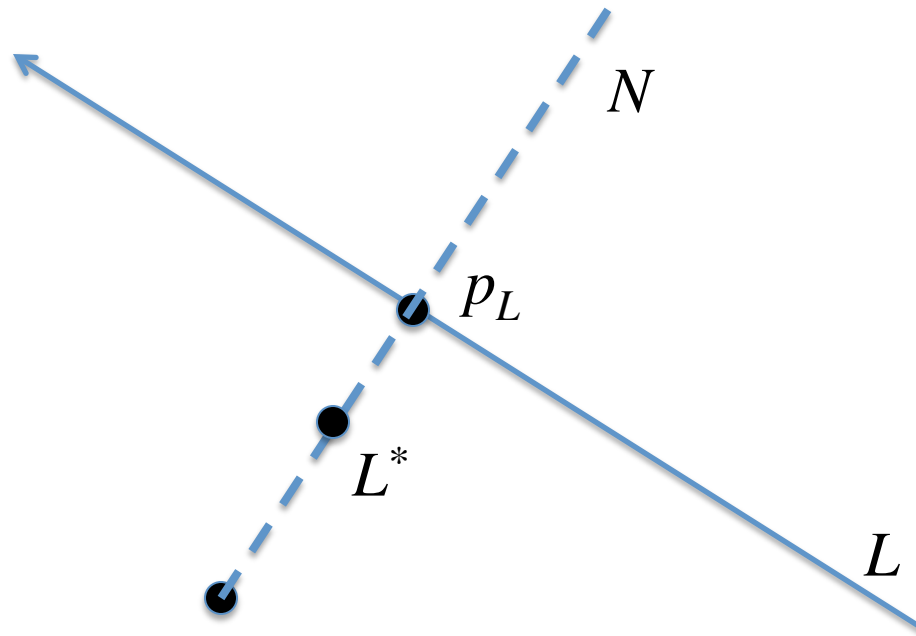
$$L: ax+by-1 = 0$$

$$N: bx-ay = 0$$



$$L: ax+by-1 = 0$$

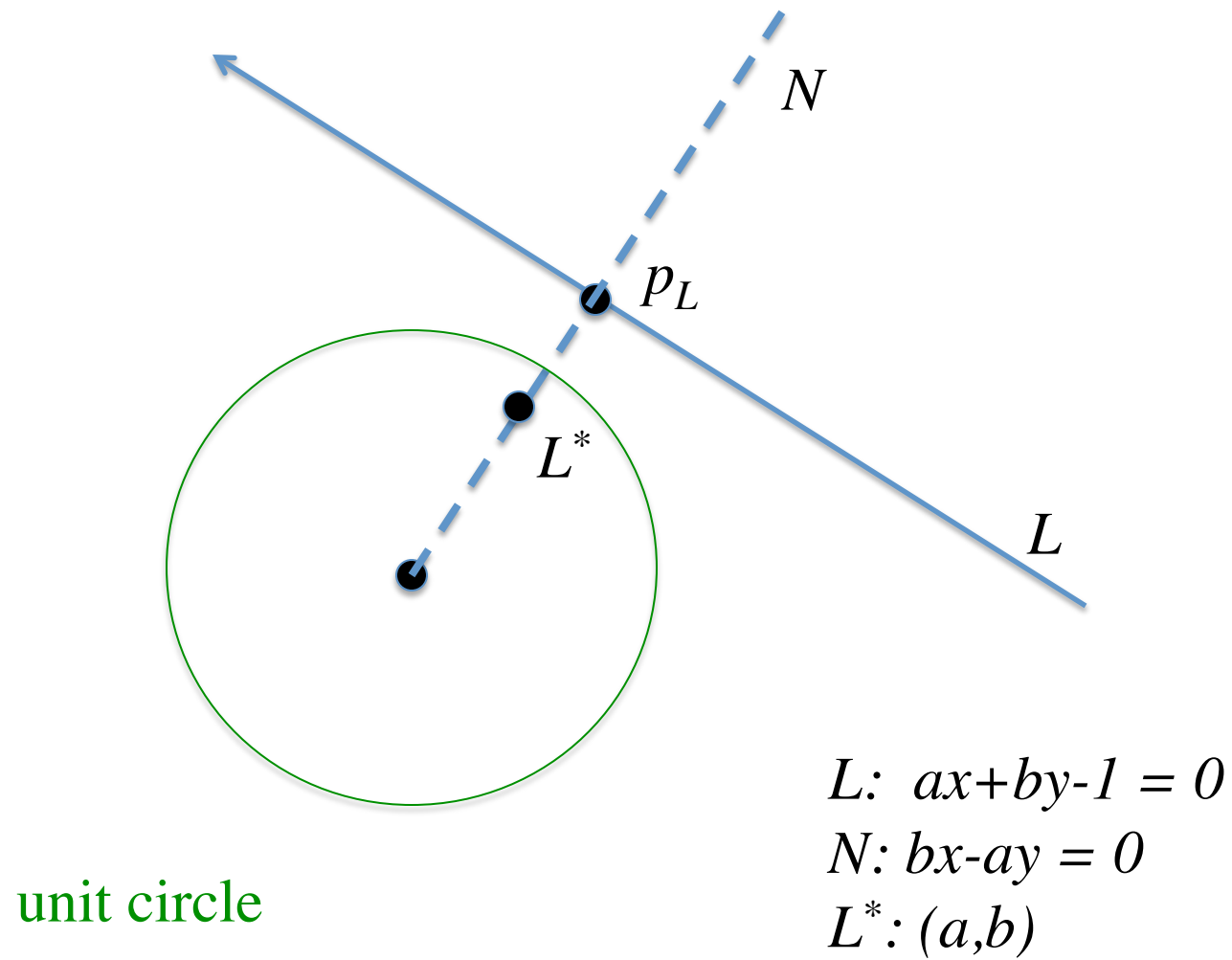
$$N: bx-ay = 0$$

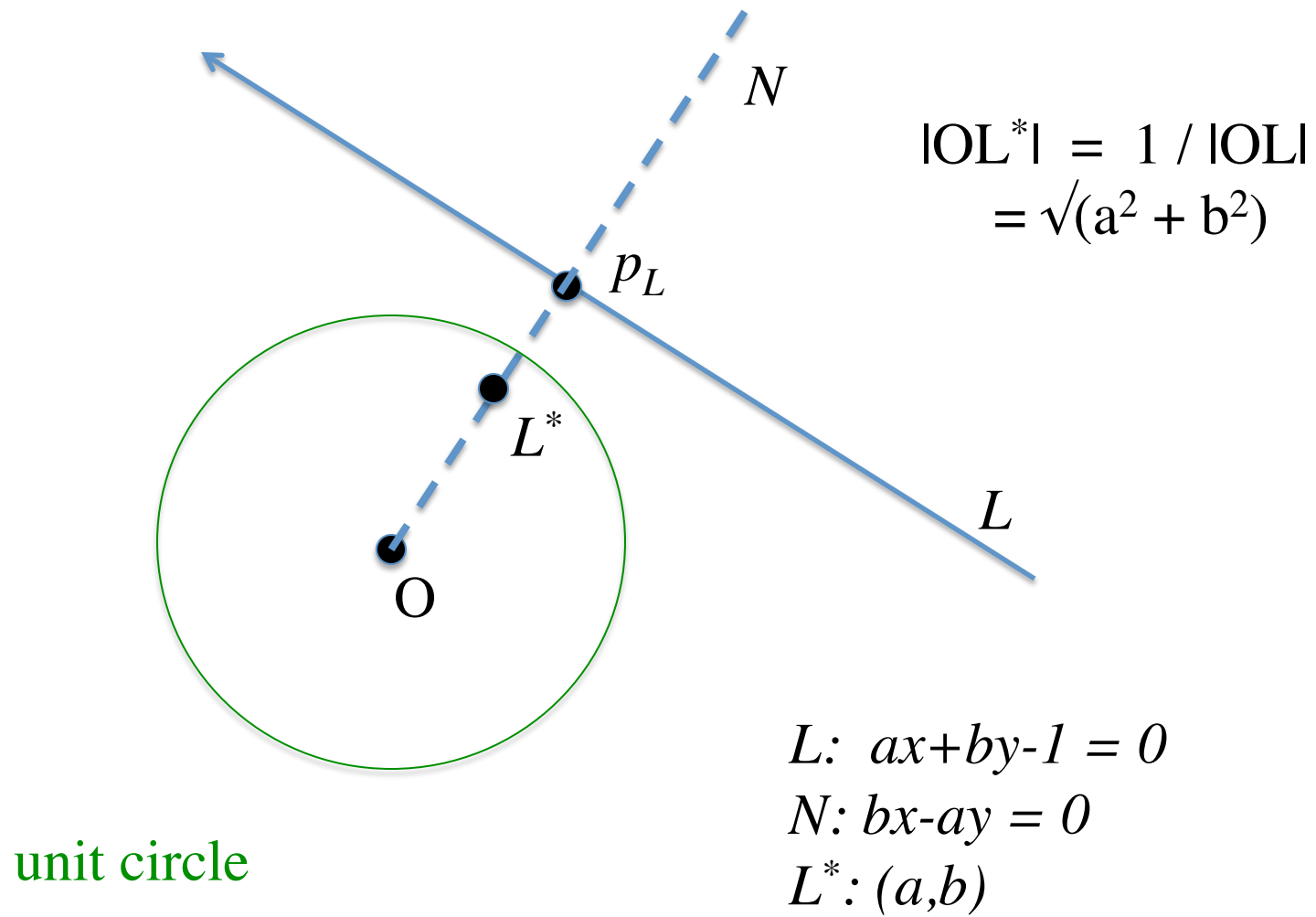


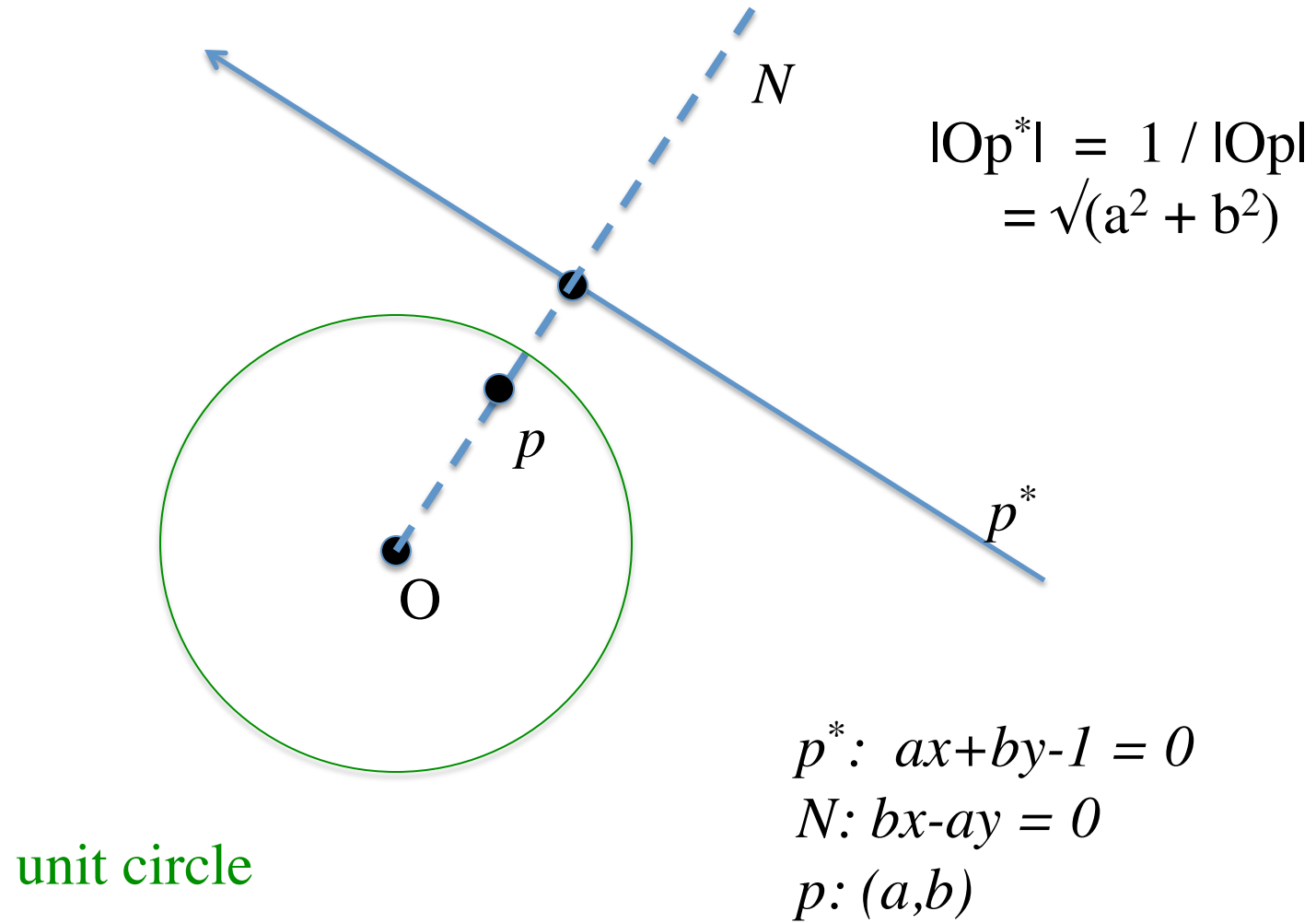
$$L: ax+by-1 = 0$$

$$N: bx-ay = 0$$

$$L^*: (a,b)$$







# Properties

- [self inverse]  $(p^*)^* = p$

# Properties

- [self inverse]  $(p^*)^* = p$  (and  $(L^*)^* = L$ )

# Properties

- [self inverse]  $(p^*)^* = p$
- [incidence preserving] if  $p$  belongs to  $L$ , then  $L^*$  belongs to  $p^*$

# Properties

- [self inverse]  $(p^*)^* = p$
- [incidence preserving] if  $p$  belongs to  $L$ , then  $L^*$  belongs to  $p^*$
- [sidedness reversing] if  $p$  lies to the left (right) of  $L$ , then  $L^*$  lies to the left (right) of  $p^*$

# Properties

- [self inverse]  $(p^*)^* = p$
- [incidence preserving] if  $p$  belongs to  $L$ , then  $L^*$  belongs to  $p^*$
- [sidedness reversing] if  $p$  lies to the left (right) of  $L$ , then  $L^*$  lies to the left (right) of  $p^*$
- the line joining points  $p_1$  and  $p_2$  is the dual of the point formed by the intersection of the lines  $p_1^*$  and  $p_2^*$

# Equivalent problems

- [half-space intersection] finding all points that lie to the left of the (primal) lines defining the half-spaces
- [convex hull] finding all lines that lie to the right of all of the (dual) points
- in both cases a succinct description is a polygon (polytope); the boundary order is preserved under duality.

# Remark

- Mount (lecture 8) presents a *different point-line duality transform* (based on slope & y-intercept):

point  $p:(a,b)$  maps to line  $p^*: y=ax-b$   
(and vice-versa)

this takes points to non-vertical lines

# Same properties

- [self inverse]  $(p^*)^* = p$
- [incidence preserving] if  $p$  belongs to  $L$ , then  $L^*$  belongs to  $p^*$
- [sidedness reversing] if  $p$  lies to the left (right) of  $L$ , then  $L^*$  lies to the left (right) of  $p^*$
- the line joining points  $p_1$  and  $p_2$  is the dual of the point formed by the intersection of the lines  $p_1^*$  and  $p_2^*$

## 2-d convex hulls and sorting

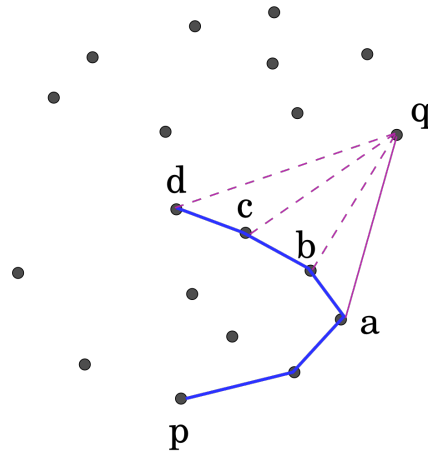
- let  $T_{\text{sort}}(n)$  and  $T_{\text{CH}}(n)$  denote the worst case complexities of the sorting and convex hull problems (for input instances of size  $n$ )

# 2-d convex hulls and sorting

- let  $T_{\text{sort}}(n)$  and  $T_{\text{CH}}(n)$  denote the worst case complexities of the sorting and convex hull problems (for input instances of size  $n$ )
- we will show :
  - $T_{\text{sort}}(n) \leq T_{\text{CH}}(n) + \Theta(n)$
  - $T_{\text{CH}}(n) \leq T_{\text{sort}}(n) + \Theta(n)$

# Graham Scan

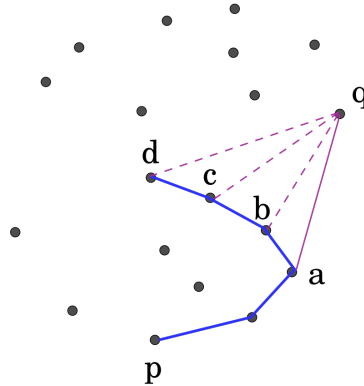
---



1. Sort by *Y-order*;  $p_1, p_2, \dots, p_n$ .
2. Initialize. **push**  $(p_i, stack)$ ,  $i = 1, 2$ .
3. **for**  $i = 3$  **to**  $n$  **do**  
    **while**  $\angle \text{next, top, } p_i \neq \text{Left-Turn}$   
        **pop**  $(stack)$   
    **push**  $(p_i, stack)$ .
4. **return**  $stack$ .
5. **Invented by R. Graham '73.** (Left and Right convex hull chains separately.)

# Analysis of Graham Scan

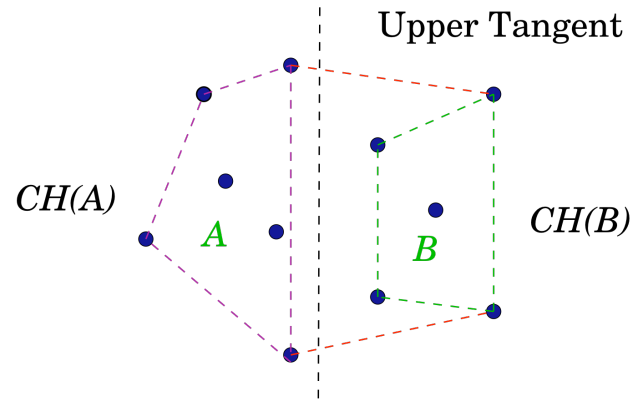
---



1. **Invariant:**  $\langle p_1, \dots, \text{top}(\text{stack}) \rangle$  is **convex**. On termination, points in *stack* are on *CH*.
2. **Orientation Test:**  $D = \begin{vmatrix} 1 & p_x & p_y \\ 1 & q_x & q_y \\ 1 & r_x & r_y \end{vmatrix}$   
 $\angle p, q, r$  is **LEFT** if  $D > 0$ , **RIGHT** if  $D < 0$ , and **straight** if  $D = 0$ .
3. After sorting, the scan takes  $O(n)$  time: in each step, either a point is deleted, or added to stack.

# Divide and Conquer

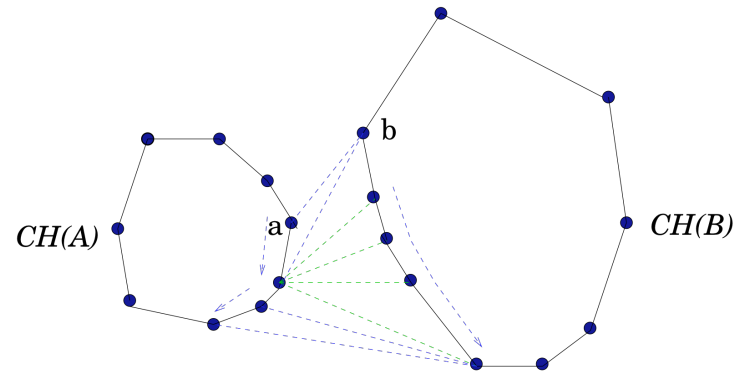
---



- Sort points by  $X$ -coordinates.
- Let  $A$  be the set of  $n/2$  leftmost points, and  $B$  the set of  $n/2$  rightmost points.
- Recursively compute  $CH(A)$  and  $CH(B)$ .
- Merge  $CH(A)$  and  $CH(B)$  to obtain  $CH(S)$ .

# Merging Convex Hulls

---

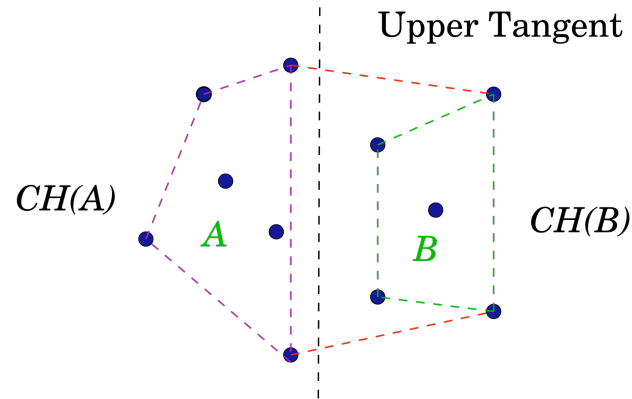


Lower Tangent

- $a$  = rightmost point of  $CH(A)$ .
- $b$  = leftmost point of  $CH(B)$ .
- while  $ab$  not lower tangent of  $CH(A)$  and  $CH(B)$  do
  1. while  $ab$  not lower tangent to  $CH(A)$   
set  $a = a - 1$  (move  $a$  CW);
  2. while  $ab$  not lower tangent to  $CH(B)$   
set  $b = b + 1$  (move  $b$  CCW);
- Return  $ab$

# Analysis of D&C

---



- Initial sorting takes  $O(N \log N)$  time.
- Recurrence for divide and conquer  
 $T(N) = 2T(N/2) + O(N)$
- $O(N)$  for merging (computing tangents).
- Recurrence solves to  $T(N) = O(N \log N)$ .

Can hulls be merged more  
efficiently?

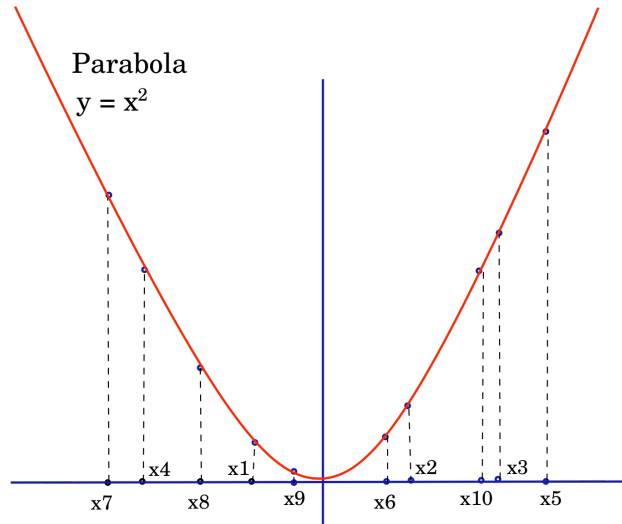
What if hulls are not linearly  
separated?

# Other sorting-inspired algorithms

Can hulls be constructed more  
efficiently?

# Lower Bounds

---



- Reduce sorting to convex hull.
- List of numbers to sort  $\{x_1, x_2, \dots, x_n\}$ .
- Create point  $p_i = (x_i, x_i^2)$ , for each  $i$ .
- Convex hull of  $\{p_1, p_2, \dots, p_n\}$  has points in sorted  $x$ -order.  $\Rightarrow$  CH of  $n$  points must take  $\Omega(n \log n)$  in worst-case time.

# Other approaches...

- Convex hull algorithms that avoid sorting:
  - gift-wrapping (Jarvis)  $O(n h)$
  - discard/filter interior points (QuickHull)