# Algorithms and Satisfiability

# Lecture 3 Computational Geometry Algorithms: Sweeping

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# Computational geometry

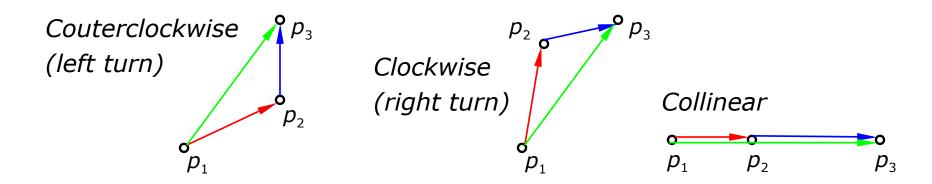
- Main goals of the lecture:
  - to understand how the basic geometric operations are performed;
  - to understand the basic idea of the sweeping algorithm design technique;
  - to understand the concept of output-sensitive algorithms;
  - to understand and be able to analyze Graham's scan, Jarvis's march, and the sweeping-line algorithm to determine whether any pair of line segments intersect.

# Computational geometry

- Computational geometry:
  - Algorithmic basis for many scientific and engineering disciplines:
    - Geographic Information Systems (GIS)
    - Robotics
    - Computer graphics
    - Computer vision
    - Computer Aided Design/Manufacturing (CAD/CAM),
    - VLSI design, etc.
  - The term first appeared in the 70's.
  - We will deal with points and line segments in 2D space.

## Basic problems: Orientation

- How to find "orientation" of two line segments?
  - Three points:  $p_1(x_1, y_1)$ ,  $p_2(x_2, y_2)$ ,  $p_3(x_3, y_3)$
  - Is segment  $(p_1, p_3)$  clockwise or counterclockwise from  $(p_1, p_2)$ ?
  - Equivalent to: Going from segment  $(p_1, p_2)$  to  $(p_2, p_3)$  do we make a **right** or a **left** turn?

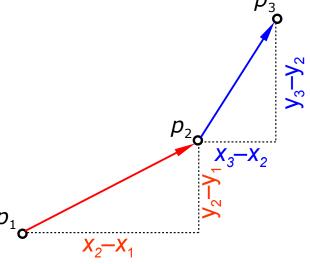


# Computing the orientation



- Orientation the standard way:
  - slope of segment  $(p_1, p_2)$ :  $\sigma = (y_2-y_1)/(x_2-x_1)$
  - slope of segment  $(p_2, p_3)$ :  $\tau = (y_3 y_2)/(x_3 x_2)$

- How do you compute then the orientation?
  - counterclockwise (left turn): σ < τ</p>
  - clockwise (right turn):  $\sigma > \tau$
  - collinear (no turn):  $\sigma = \tau$



## Cross product

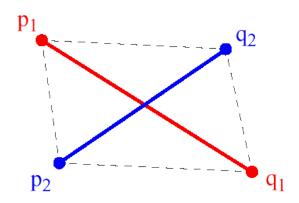


- Finding orientation without division (to avoid numerical problems)
  - $(y_2-y_1)(x_3-x_2)-(y_3-y_2)(x_2-x_1)=?$ 
    - Positive clockwise / right turn
    - Negative counterclockwise / left turn
    - Zero collinear
  - This is (almost) a cross product of two vectors

$$(x_2-x_1, y_2-y_1)\times(x_3-x_2, y_3-y_2)=\det\begin{pmatrix} x_2-x_1 & x_3-x_2 \\ y_2-y_1 & y_3-y_2 \end{pmatrix}$$

## Intersection of two segments

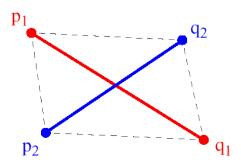
- How do we test whether two line segments intersect?
  - What would be the standard way?
  - What are the problems?



#### Intersection and orientation



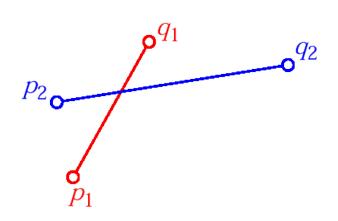
- We can use just cross products to check for intersection!
  - Two segments (p<sub>1</sub>,q<sub>1</sub>) and (p<sub>2</sub>,q<sub>2</sub>) intersect if and only if one of the two is satisfied:
  - General case:
    - (p<sub>1</sub>,q<sub>1</sub>,p<sub>2</sub>) and (p<sub>1</sub>,q<sub>1</sub>,q<sub>2</sub>) have different orientations and
    - (p<sub>2</sub>,q<sub>2</sub>,p<sub>1</sub>) and (p<sub>2</sub>,q<sub>2</sub>,q<sub>1</sub>) have different orientations
  - Special case
    - (p<sub>1</sub>,q<sub>1</sub>,p<sub>2</sub>), (p<sub>1</sub>,q<sub>1</sub>,q<sub>2</sub>), (p<sub>2</sub>,q<sub>2</sub>,p<sub>1</sub>), and (p<sub>2</sub>,q<sub>2</sub>,q<sub>1</sub>) are all collinear and
    - the x-projections of (p<sub>1</sub>,q<sub>1</sub>) and (p<sub>2</sub>,q<sub>2</sub>) intersect
    - the y-projections of  $(p_1,q_1)$  and  $(p_2,q_2)$  intersect

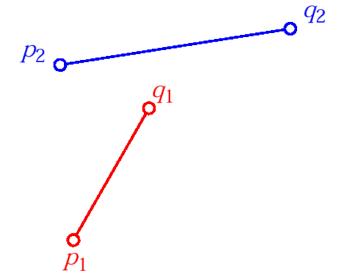


# Orientation examples



- General case:
  - $(p_1,q_1,p_2)$  and  $(p_1,q_1,q_2)$  have different orientations and
  - $(p_2,q_2,p_1)$  and  $(p_2,q_2,q_1)$  have different orientations

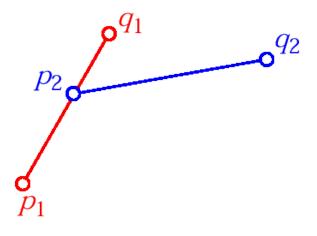


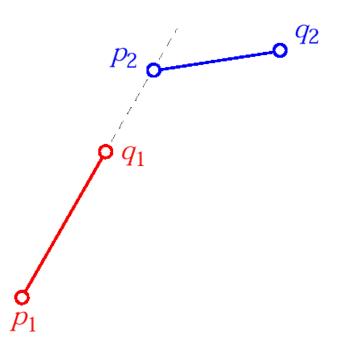


# Orientation examples (2)



- General case:
  - $(p_1,q_1,p_2)$  and  $(p_1,q_1,q_2)$  have different orientations and
  - $(p_2,q_2,p_1)$  and  $(p_2,q_2,q_1)$  have different orientations

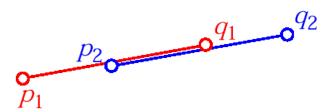


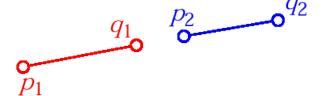


# Orientation examples (3)



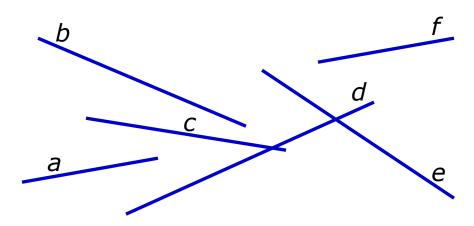
- Special case
  - $(p_1,q_1,p_2)$ ,  $(p_1,q_1,q_2)$ ,  $(p_2,q_2,p_1)$ , and  $(p_2,q_2,q_1)$  are all collinear **and**
  - the x-projections of  $(p_1,q_1)$  and  $(p_2,q_2)$  intersect
  - the y-projections of  $(p_1,q_1)$  and  $(p_2,q_2)$  intersect





# Determining intersections

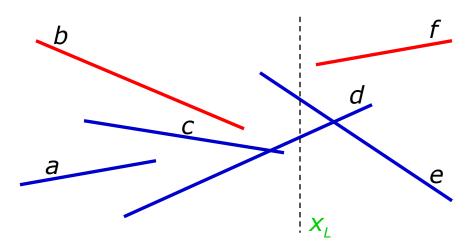
- Given a set of n segments, determine whether any two line segments intersect
  - Note: not asking to report all intersections, just true or false.
  - Usefull as a building block: e.g., check intersection of arbitrary polygons.
  - What would be the brute force algorithm and what is its worst-case complexity?



#### Observations

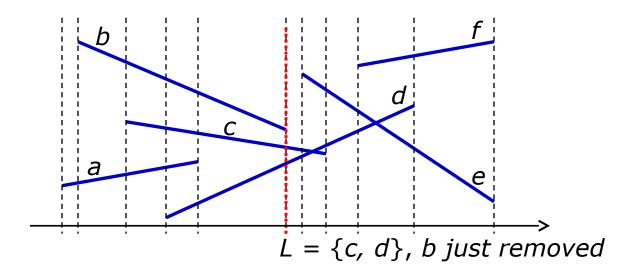


- Helpful observation:
  - Two segments definitely do not intersect if their projections to the x axis do not intersect
  - In other words: If segments intersect, there is some  $x_L$  such that line  $x = x_L$  intersects both segments



# Sweeping technique

- A powerful algorithm design technique: sweeping.
  - Two sets of data are maintained:
    - **sweep-line status**: the set of segments intersecting the sweep line *L*
    - event-point schedule: where updates to L are required

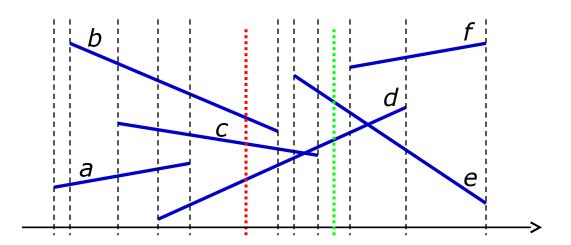


# Plane-sweeping algorithm

- Skeleton of the algorithm:
  - Each segment end point is an event point
  - At an event point, update the status of the sweep line and perform intersection tests
    - left end point: a new segment is added to the status of L and it is tested for intersection against the other segments in the status
    - right end point: it is deleted from the status of L
- Analysis:
  - What is the worst-case complexity?
  - Worst-case example?

# Improving the algorithm

- More useful observations:
  - For a specific position of the sweep line, there is an order of segments in the y-axis;
  - If segments intersect there is a position of the sweep-line such that two segments are adjacent in this order;
  - Order does not change in-between event points;
    - True only to the left of the leftmost intersection point. If the algorithm does not return before, this intersection is detected!
  - Main idea: check only all new pairs of neighbors in the order!



## Sweep-line status DS

- Sweep-line status data structure:
  - Operations:
    - Insert
    - Delete
    - Below (Predecessor)
    - Above (Successor)
  - Balanced binary search tree T (e.g., Red-Black)
    - The bottom-to-top order of segments on the line  $L \Leftrightarrow$  the left-to-right order of in-order traversal of T
  - How do you do comparison?

## Algorithm



#### AnySegmentsIntersect(S)

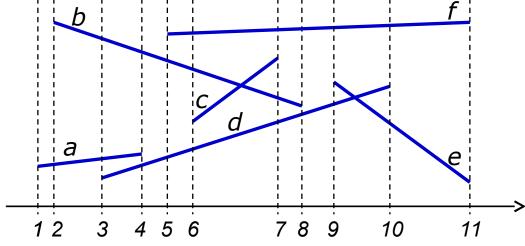
```
01 T ← Ø
02 sort the left and right endpoints of the segments in
  S from left to right, breaking ties by putting left
  endpoints first
03 for each point p in the sorted list of endpoints do
04
      if p is the left endpoint of a segment s then
05
         Insert(T,s)
06
         if (Above(T,s) exists and intersects s) or
             (Below(T,s)) exists and intersects s) then
07
               return TRUE
08
      if p is the right endpoint of a segment s then
09
          if both Above(T,s) and Below(T,s) exist and
            Above (T,s) intersects Below(T,s) then
10
               return TRUE
11
            Delete(T,s)
12 return FALSE
```

#### Let's run it



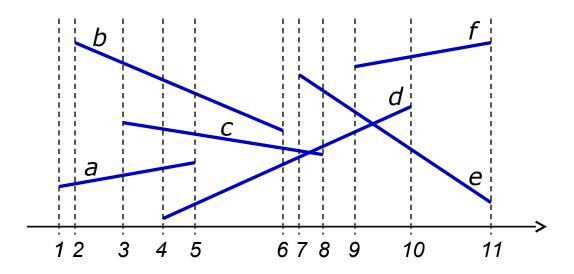
```
AnySegmentsIntersect(S)
```

```
01 T ← Ø
02 sort the left and right endpoints of the segments in S from
       to right, breaking ties by putting left endpoints
  left
  first
03 for each point p in the sorted list of endpoints do
04
      if p is the left endpoint of a segment s then
05
         Insert(T,s)
06
         if (Above(T,s) exists and intersects s) or
         (Below(T,s)) exists and intersects s) then
07
               return TRUE
0.8
      if p is the right endpoint of a segment s then
09
          if both Above(T,s) and Below(T,s) exist and
             Above (T,s) intersects Below(T,s) then
10
               return TRUE
11
            Delete(T,s)
12 return FALSE
```



## Example





- Which intersection checks are done in each step?
- At which event an intersection is discovered?
- Go to <u>Socrative</u> and write in your answer:
  - E.g., "3, 4" means 3 intersection checks, at the 4th event.
- What if sweeping is from right to left?

# Analysis, Special cases



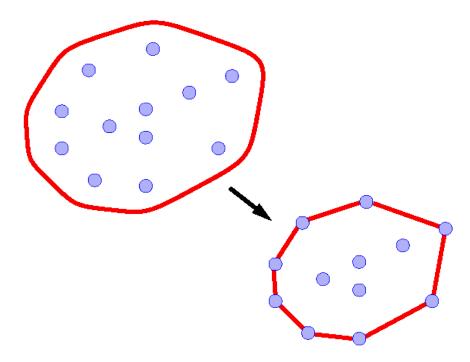
- Running time:
  - Sorting the segment endpoints:  $\Theta(n \lg n)$
  - The loop is executed once for every end point (2n) taking each time  $\Theta(\lg n)$  (at most three red-black tree operations)
  - The total running time is  $\Theta(n \lg n)$
- Special cases (correctness not obvious, have to prove separately):
  - More than two segments intersect at one point
    - Can be shown to work just fine
  - There are some vertical segments
    - Can be proven to work correctly if bottom endpoints are treated as left endpoint (processed first in the event sequence)

# Sweeping technique principles

- Principles of the sweeping technique:
  - Define events and their order
  - If all the events can be determined in advance sort the events
  - Else use a priority queue to manage the events
  - See which operations have to be performed with the sweepline status at each event point
  - Choose a data-structure for the sweep-line status to efficiently support those operations

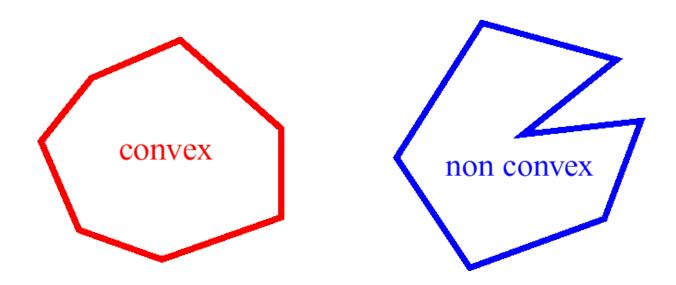
## Convex hull problem

- Convex hull problem:
  - Let S be a set of n points in the plane. Compute the convex hull of these points.
  - Intuition: 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



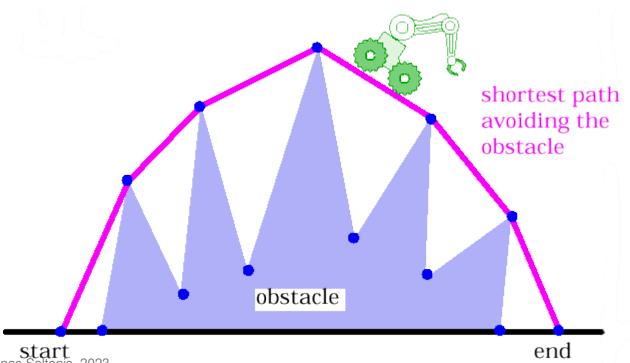
#### What is convex

- A polygon P is said to be convex if:
  - P is simple (non-intersecting); and
  - for any two points p and q on the boundary of P, segment (p,q) lies entirely inside P



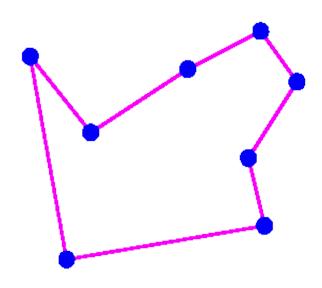
## Many applications, many algs

- In motion planning for robots, often there is a need to compute convex hulls.
- Convex hulls are often useful as a starting point in comp. geometry
  - For example, furthest-pair problem.



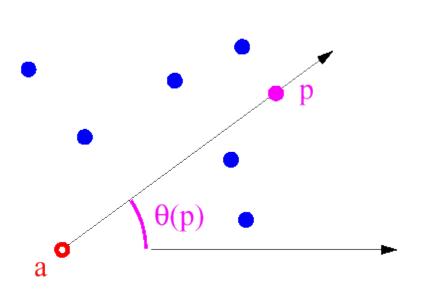
### Graham Scan

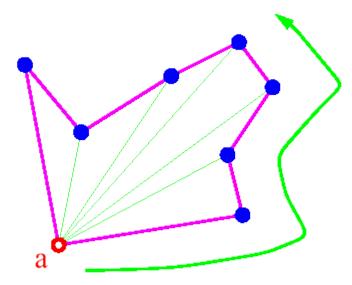
- Graham Scan algorithm.
  - Phase 1: Solve the problem of finding the simple (noncrossing) closed path visiting all points



# Finding non-crossing path

- How do we find such a non-crossing path:
  - Pick the bottommost point a as the anchor point
  - For each point p, compute the angle  $\theta(p)$  of the segment (a,p) with respect to the x-axis.
  - Traversing the points by increasing angle yields a simple closed path

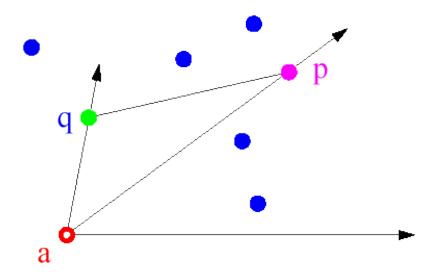




# Sorting by angle

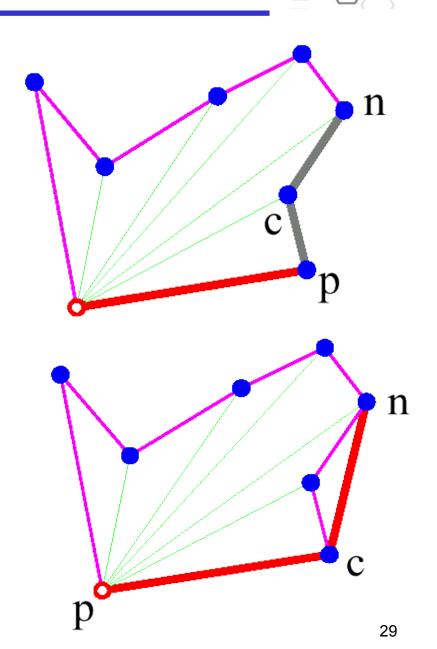
- How do we sort by increasing angle?
  - Observation: We do not need to compute the actual angle!
  - We just need to compare them for sorting

$$\theta(p) < \theta(q)$$
  
 $\Leftrightarrow$  orientation(a,p,q) = counterclockwise



## Rotational sweeping

- Phase 2 of Graham Scan:
   Rotational sweeping
  - The anchor point and the first point in the polar-angle order have to be in the hull
  - Traverse points in the sorted order:
    - Before including the next point n check if the new added segment makes a left turn
    - If not, keep discarding the previous point (c) until a left turn is made



## Implementation

- Implementation:
  - Stack to store the vertices of the convex hull

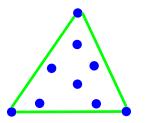
## Analysis

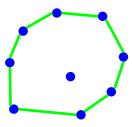


- Analysis:
  - Phase 1: Θ(n log n)
    - the anchor point is found:  $\Theta(n)$
    - points are sorted by the angle around the anchor
  - Phase 2: Θ(n)
    - each point is pushed into the stack once
    - each point is removed from the stack at most once
  - Total time complexity Θ(n log n)

# Size of the output

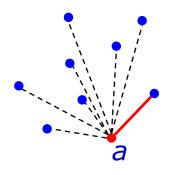
- In computational geometry, the size of an algorithm's output may differ/depend on the input.
  - Line-intersection problem vs. convex-hull problem
  - Observation: Graham's scan running time depends only on the size of the input – it is independent of the size of the output

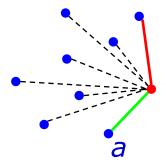


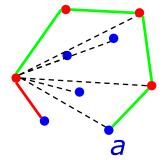


# Gift wrapping

- Would be nice to have an algorithm that runs fast if the convex hull is small
  - Idea: gift wrapping (a.k.a Jarvis's march)
    - 1. Start with the lowest point a.
    - 2. The next point in the convex hull has to be in the clockwise direction with respect to all the remaining points looking from the current point on the convex hull
    - 3. Repeat 2. until a is reached. Include a in the convex hull



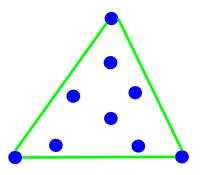




#### Jarvis's march



How many cross products are computed for this example?



- The running time of Jarvis's march:
  - Find lowest point: *O*(*n*)
  - For each vertex in the convex hull: *n*–2 cross-product computations
  - Total: O(nh), where h is the number of vertices in the convex hull

## Output-sensitive algorithms

- Output-sensitive algorithm: its running time depends on the size of the output.
  - When should we use Jarvi's march instead of the Graham's scan?
  - The asymptotically optimal output-sensitive algorithm of Kirkpatrick and Seidel runs in O(n lg h)