

# Lecture 7: Computational Geometry

## CS 491 CAP

Uttam Thakore

Friday, October 7<sup>th</sup>, 2016

Credit for many of the slides on solving geometry problems goes to the Stanford CS 97SI course lecture on computational geometry

(<http://web.stanford.edu/class/cs97si/09-computational-geometry.pdf>)

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Basic HS Geometry Review

Trigonometry

Vectors

Solving Geometry Problems

Line-line intersection

Sweep line algorithm

Area of a polygon

Binary search

Ternary search

Convex Hull

Other Geometry Concepts

More Resources



## Trigonometry

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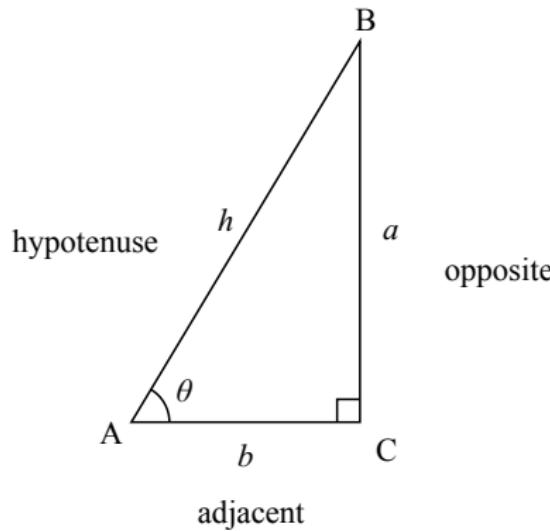
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## Other Geometry Concepts

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## Trigonometry

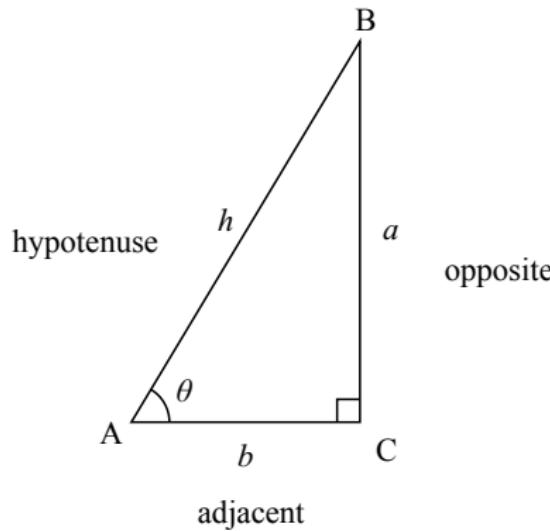
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## Trigonometry

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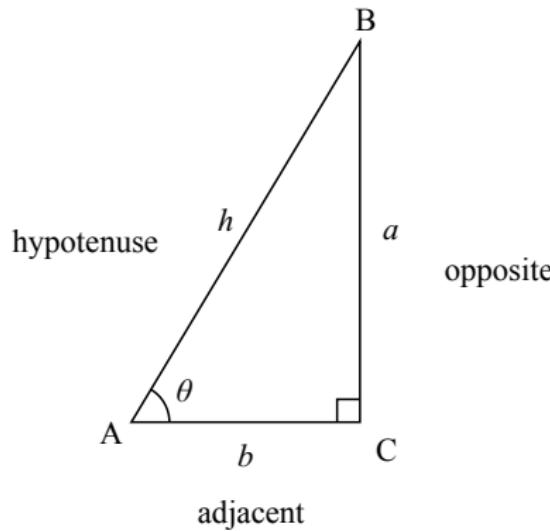
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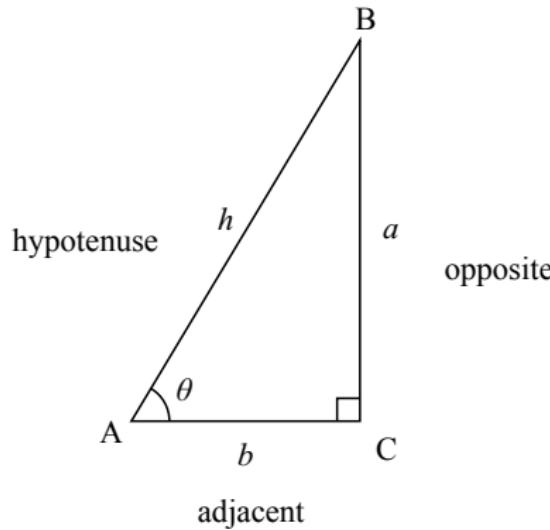
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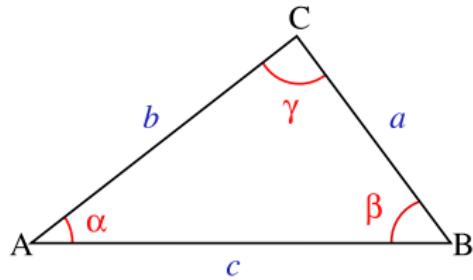
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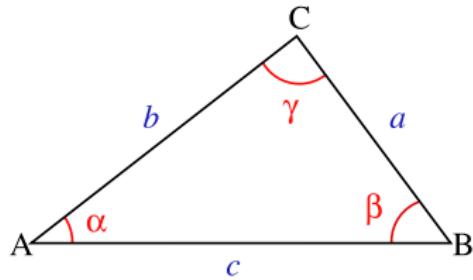
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## Trigonometry

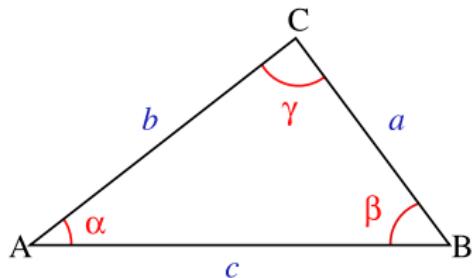
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- ▶ Law of sines:  $\frac{\sin(\alpha)}{a} = \frac{\sin(\beta)}{b} = \frac{\sin(\gamma)}{c}$
  - ▶ Law of cosines:  $a^2 = b^2 + c^2 - 2bc \cos(\alpha)$ 
    - ▶ Put another way:  $\cos(\alpha) = \frac{-a^2+b^2+c^2}{2bc}$
    - ▶ Similar for  $b$  and  $c$



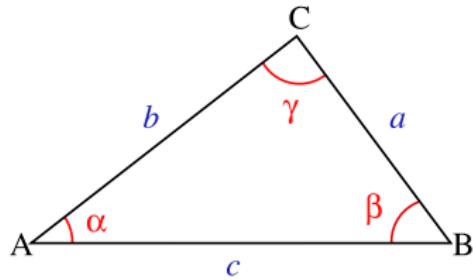
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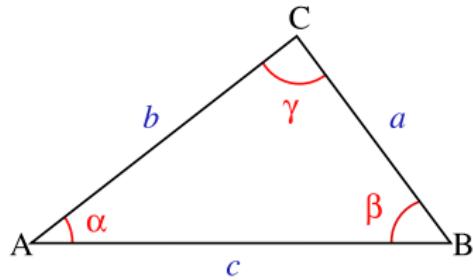


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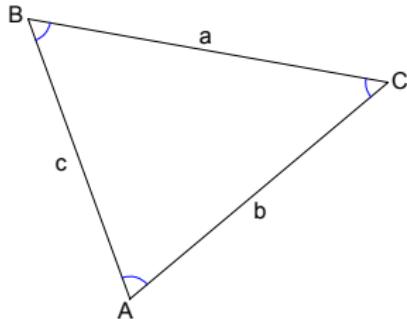
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# Heron's formula

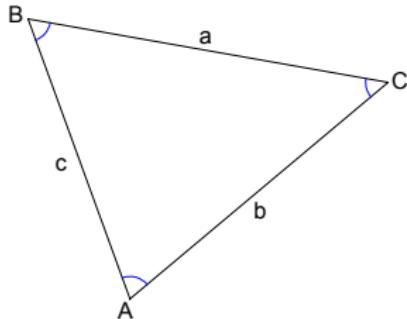


- ▶ Area of triangle =  $\sqrt{s(s - a)(s - b)(s - c)}$
- ▶  $s = \text{semiperimeter} = \frac{a+b+c}{2}$
- ▶ But there is an easier way to find the area of a triangle...



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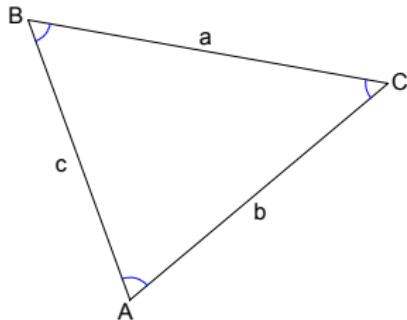


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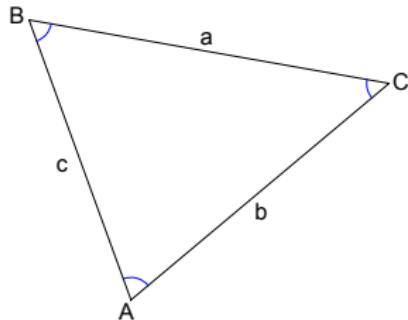
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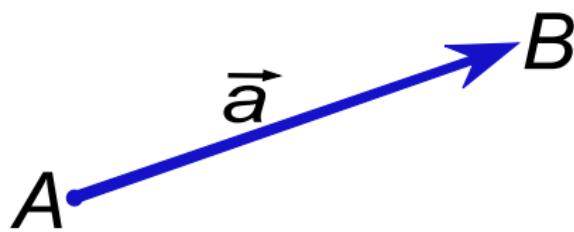
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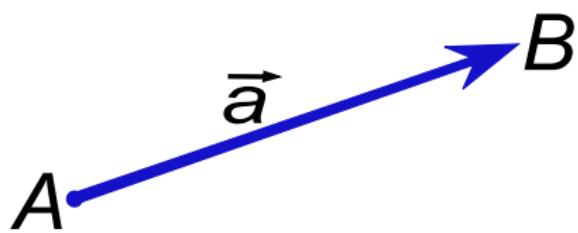
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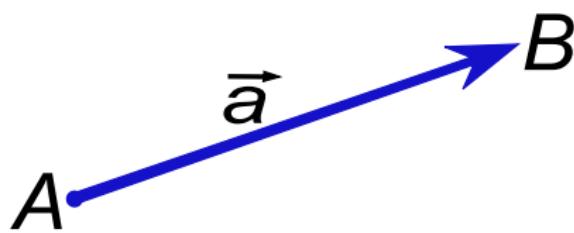
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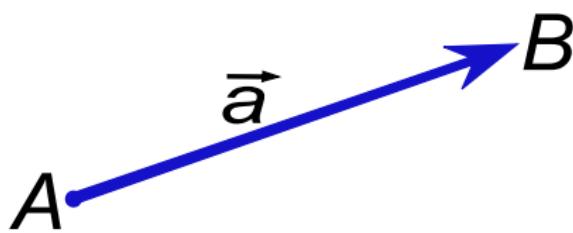
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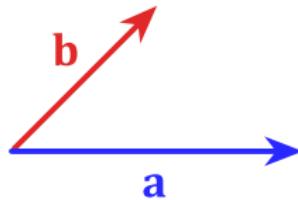
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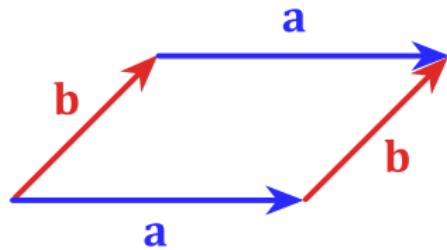
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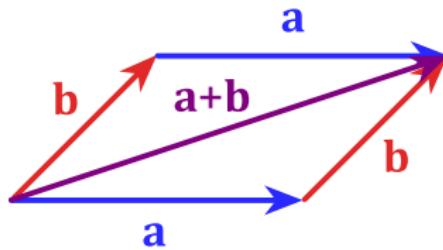
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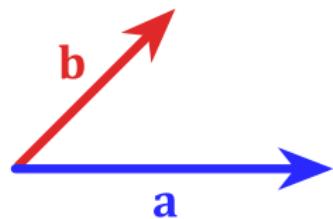
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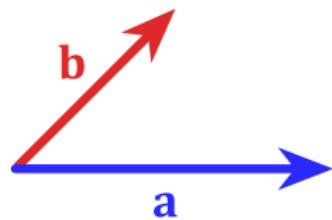
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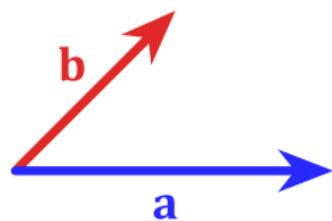
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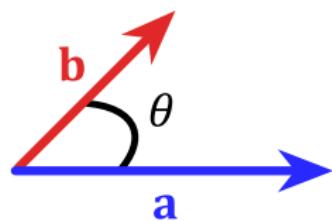
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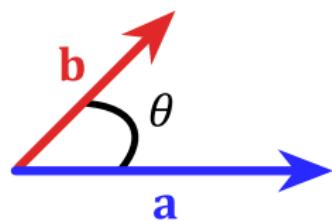
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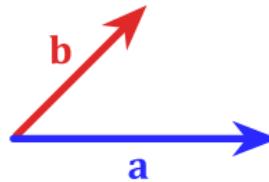
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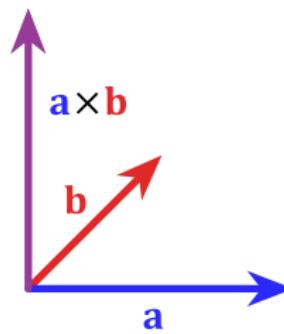
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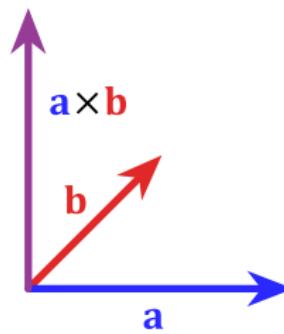
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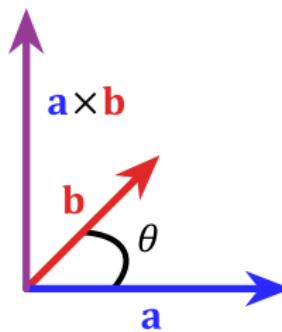
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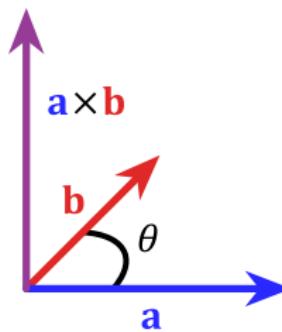
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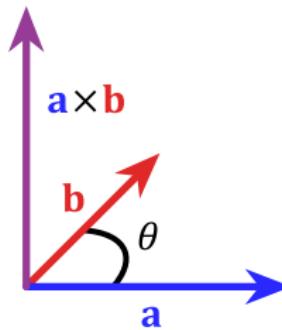
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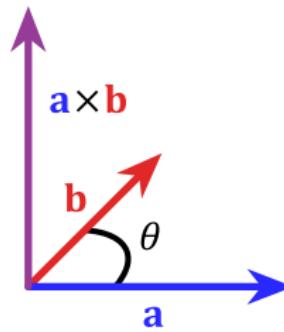
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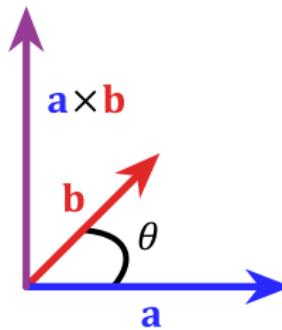
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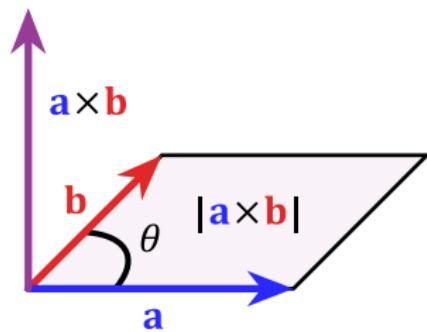
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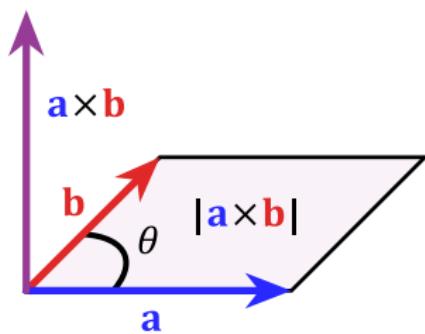
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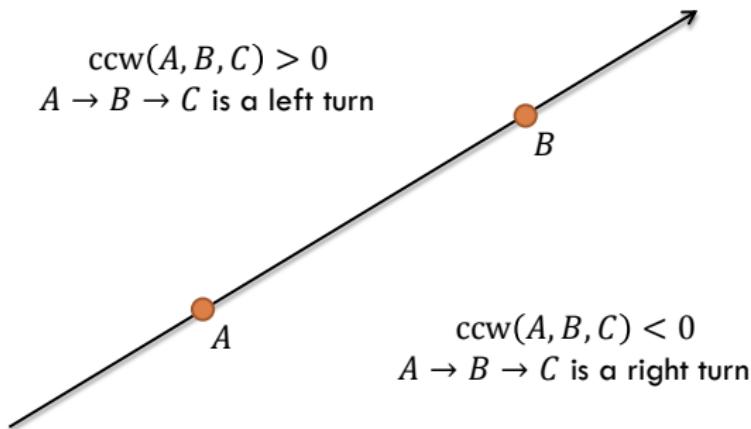
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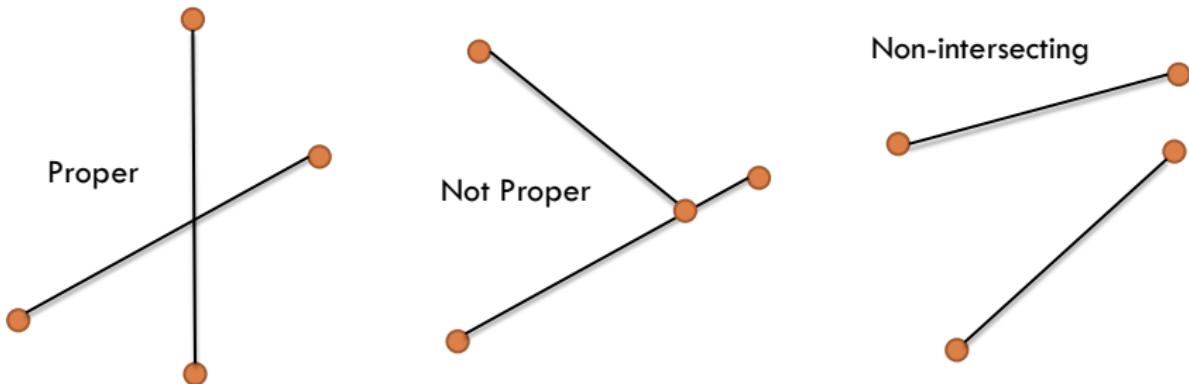
# Cross Product

- Define  $\text{ccw}(A, B, C) = (B - A) \times (C - A)$



# Segment-Segment Intersection Test

- Given two segments  $AB$  and  $CD$
- Want to determine if they intersect properly: two segments meet at a single point that are strictly inside both segments



# Segment-Segment Intersection Test

- Assume that the segments intersect
  - ▣ From  $A$ 's point of view, looking straight to  $B$ ,  $C$  and  $D$  must lie on different sides
  - ▣ Holds true for the other segment as well
- The intersection exists and is proper if:
  - ▣  $\text{ccw}(A, B, C) \times \text{ccw}(A, B, D) < 0$
  - ▣ AND  $\text{ccw}(C, D, A) \times \text{ccw}(C, D, B) < 0$

# Segment-Segment Intersection Test

- Determining non-proper intersections
  - We need more special cases to consider!
  - e.g. If  $\text{ccw}(A, B, C)$ ,  $\text{ccw}(A, B, D)$ ,  $\text{ccw}(C, D, A)$ ,  $\text{ccw}(C, D, B)$  are all zeros, then two segments are collinear
  - Very careful implementation is required

Sweep line algorithm

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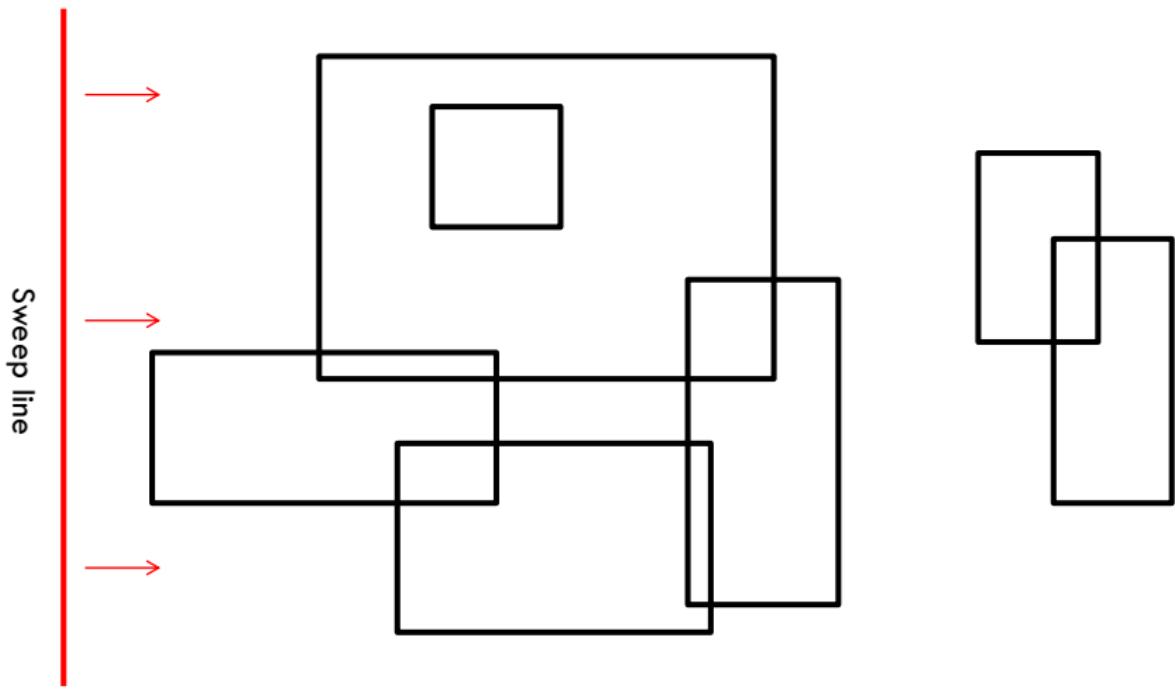
# Sweep Line Algorithm

- A problem solving strategy for geometry problems
- The main idea is to maintain a line (with some auxiliary data structure) that sweeps through the entire plane and solve the problem locally
- We can't simulate a continuous process, (e.g. sweeping a line) so we define events that causes certain changes in our data structure
  - And process the events in the order of occurrence
- We'll cover one sweep line algorithm

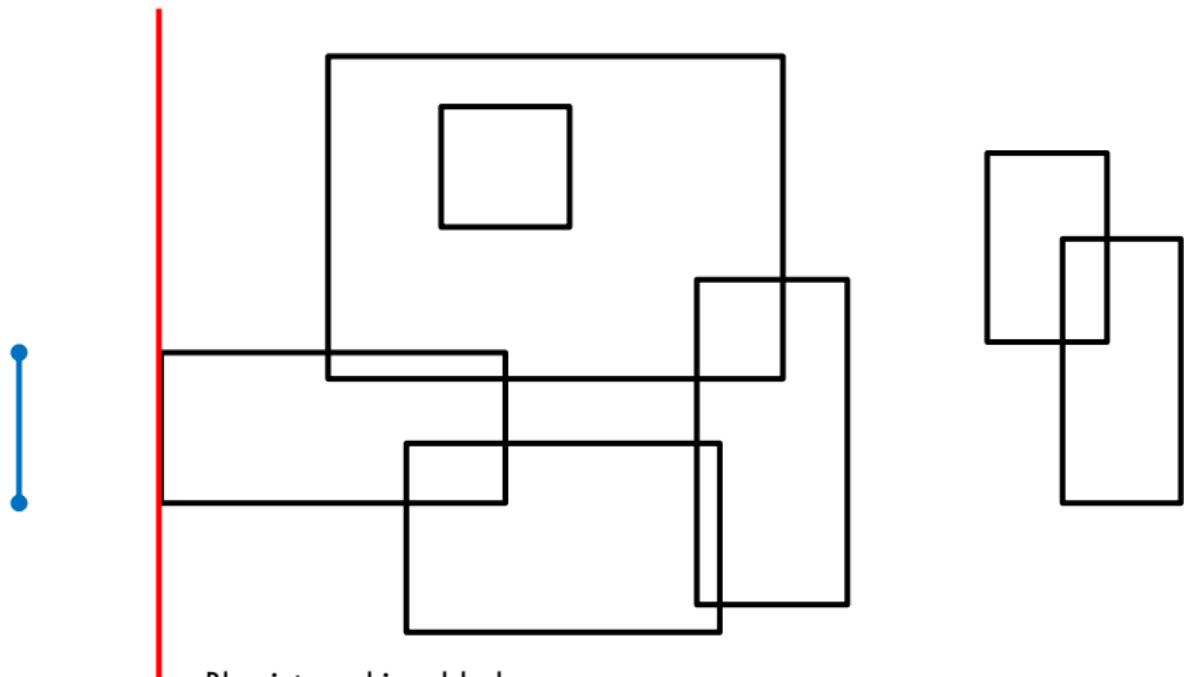
# Sweep Line Algorithm

- Problem: Given  $n$  axis-aligned rectangles, find the area of the union of them
- We will sweep the plane from left to right
- Events: left and right edges of the rectangles
- The main idea is to maintain the set of “active” rectangles in order
  - It suffices to store the  $y$ -coordinates of the rectangles

# Example

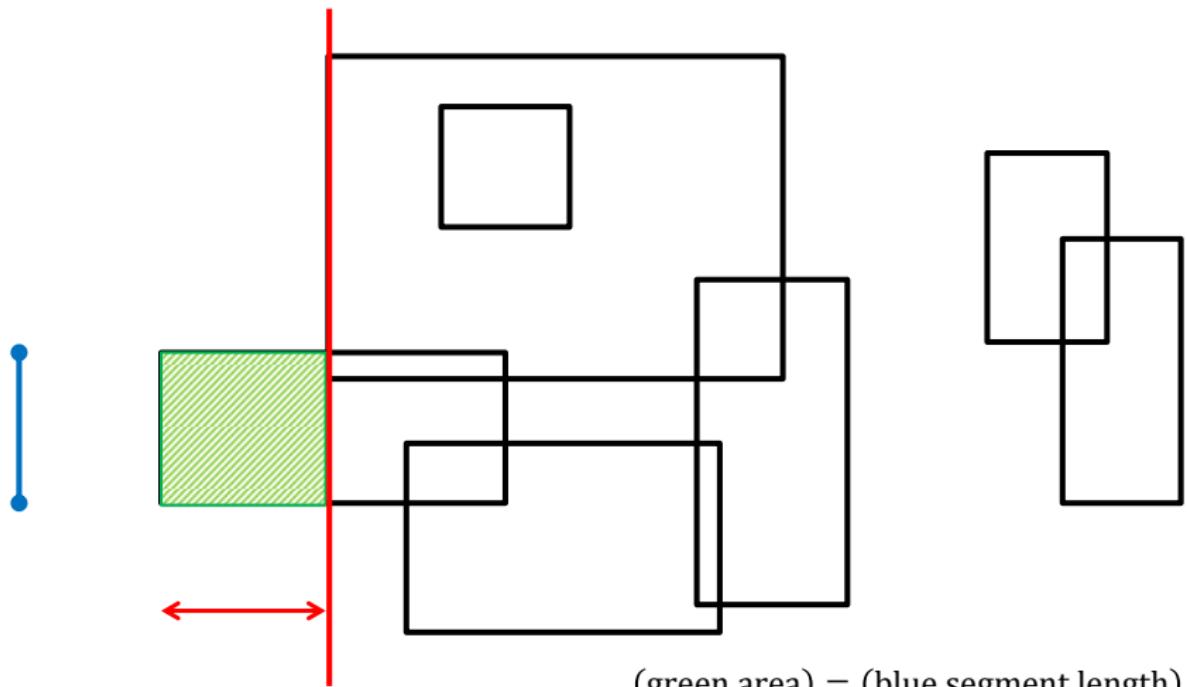


# Example

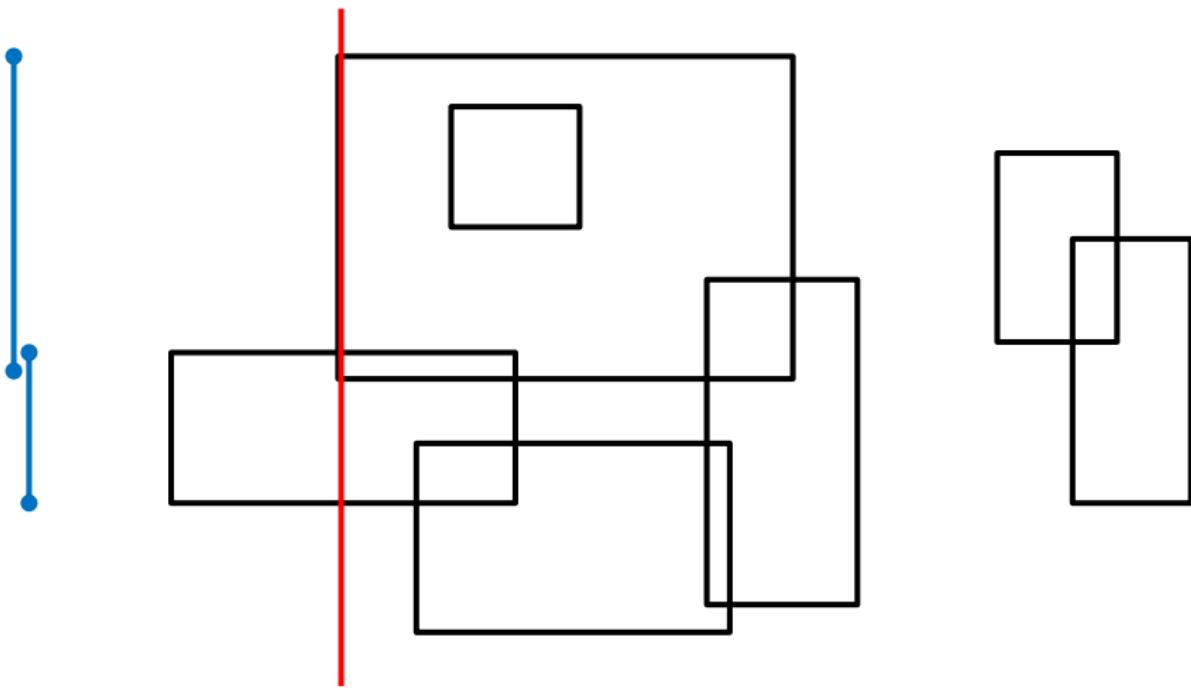


Blue interval is added  
to the data structure

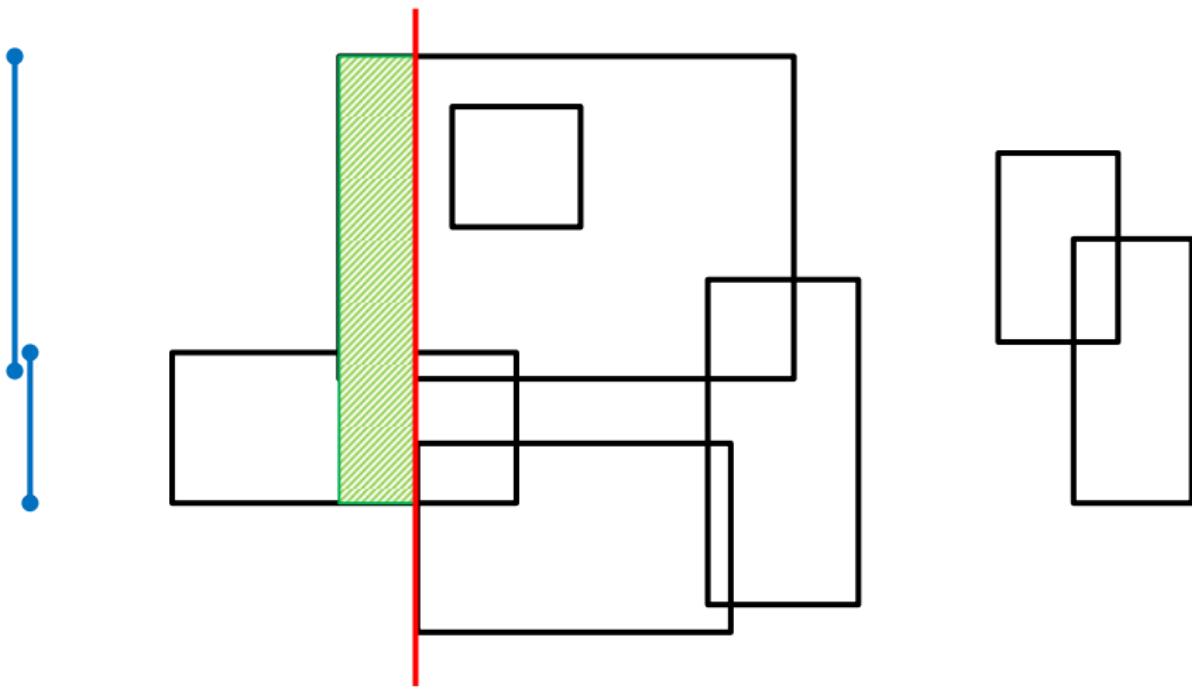
# Example


$$(\text{green area}) = (\text{blue segment length}) \times (\text{distance that the sweep line traveled})$$

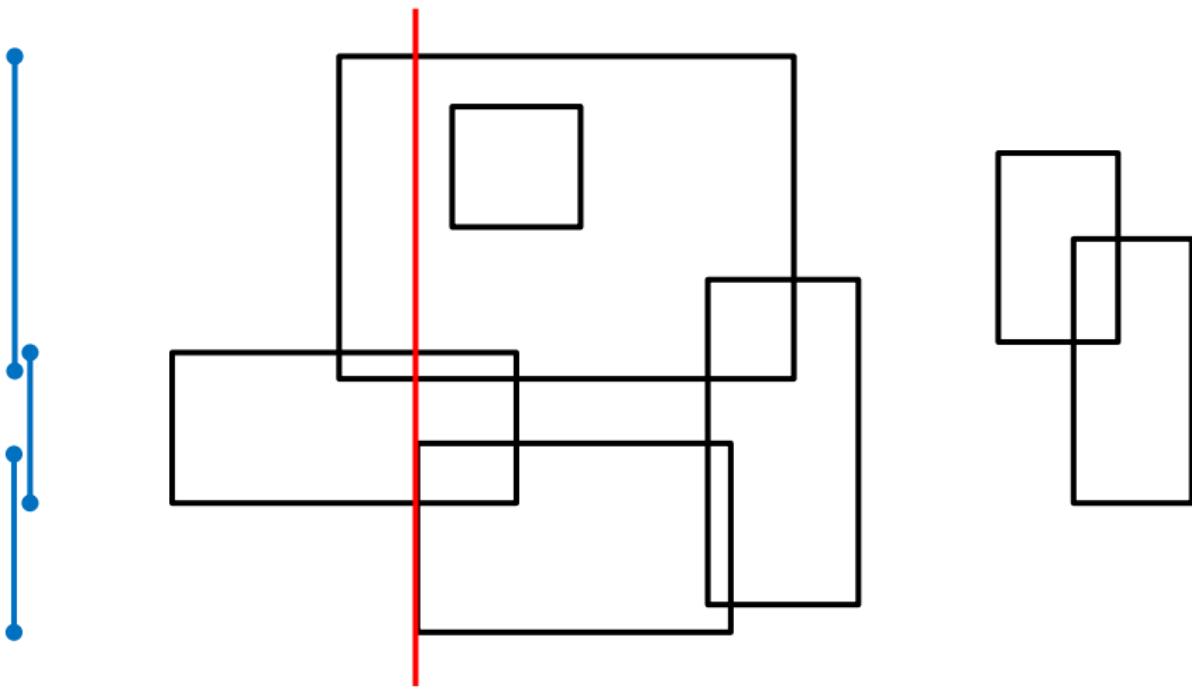
# Example



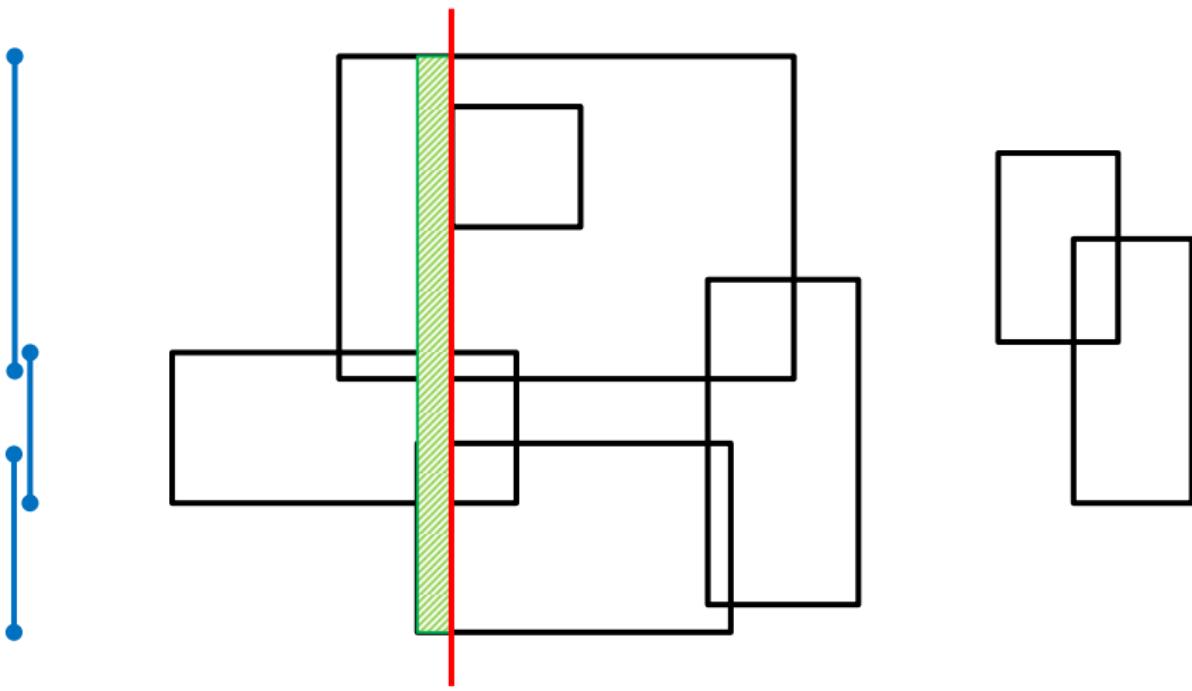
# Example



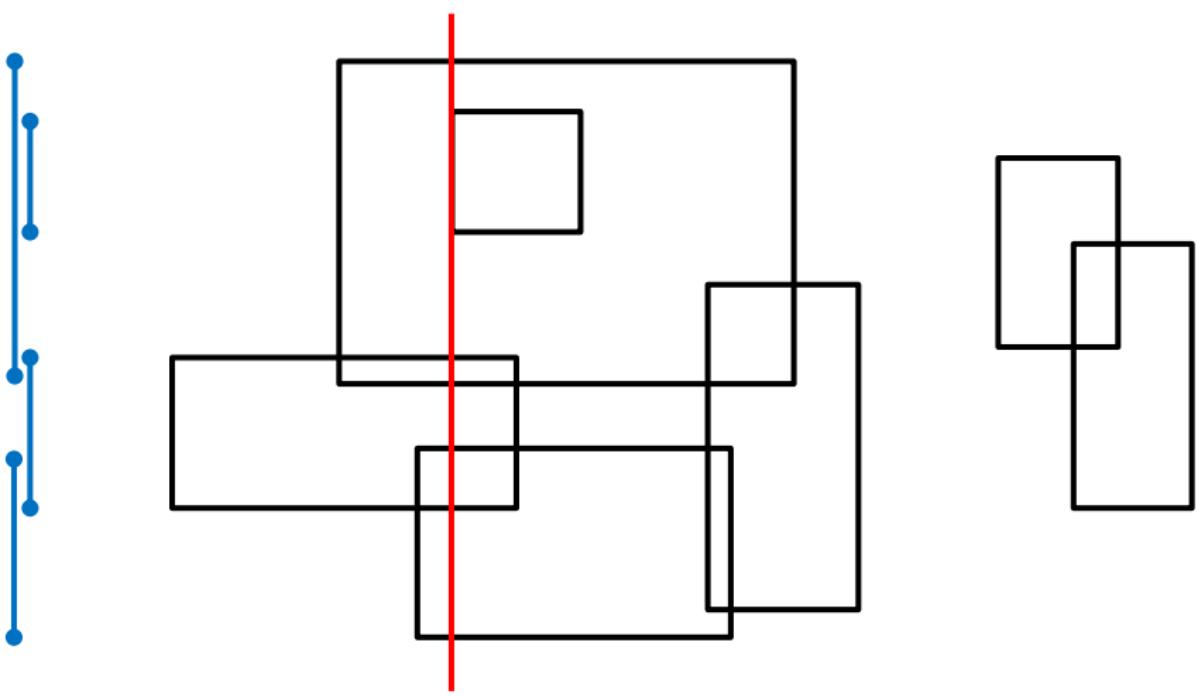
# Example



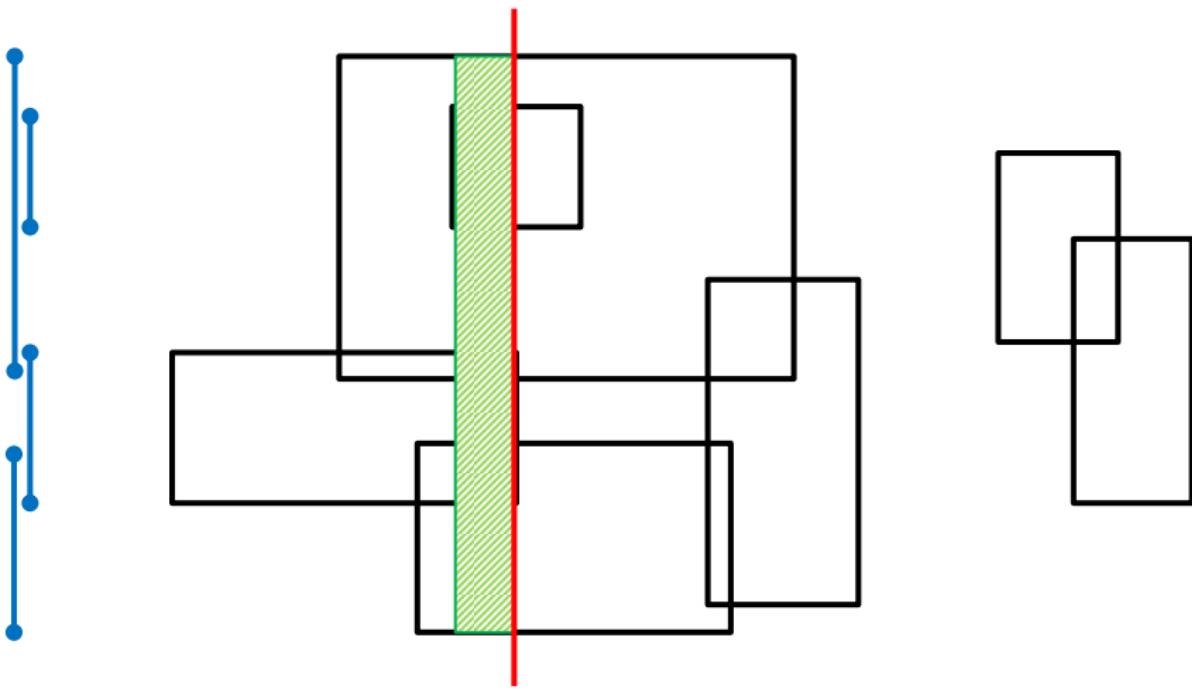
# Example



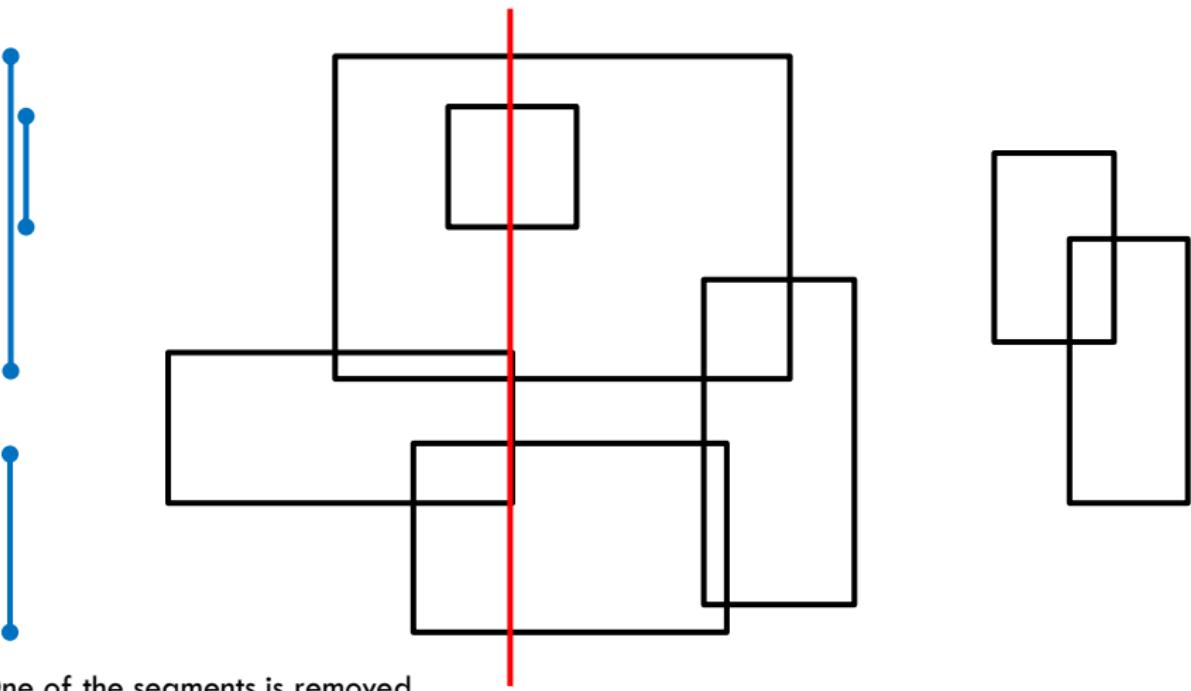
# Example



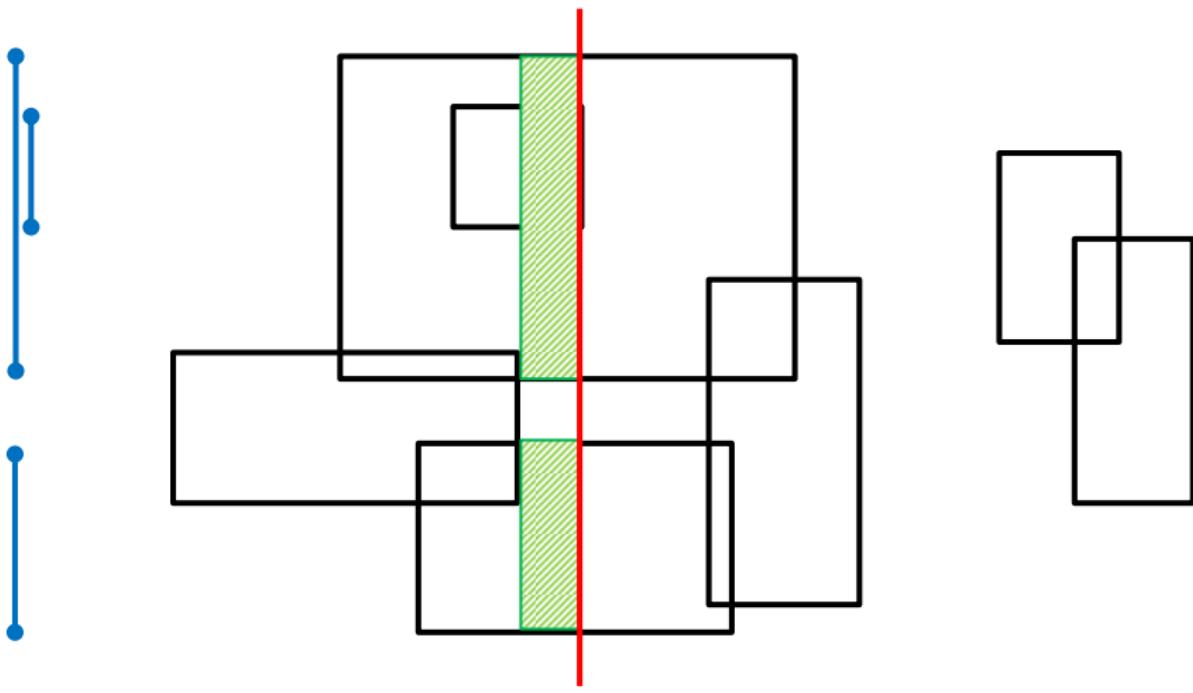
# Example



# Example



# Example



# Pseudopseudocode

- If the sweep line hits the left edge of a rectangle
  - ▣ Insert it to the data structure
- Right edge?
  - ▣ Remove it
- Move to the next event, and add the area(s) of the green rectangle(s)
  - ▣ Finding the length of the union of the blue segments is the hardest step
  - ▣ There is an easy  $O(n)$  method for this step

# Notes on Sweep Line Algorithms

- Sweep line algorithm is a generic concept
  - ▣ Come up with the right set of events and data structures for each problem
- Exercise problems
  - ▣ Finding the perimeter of the union of rectangles
  - ▣ Finding all  $k$  intersections of  $n$  line segments in  $O((n + k) \log n)$  time

Area of a polygon

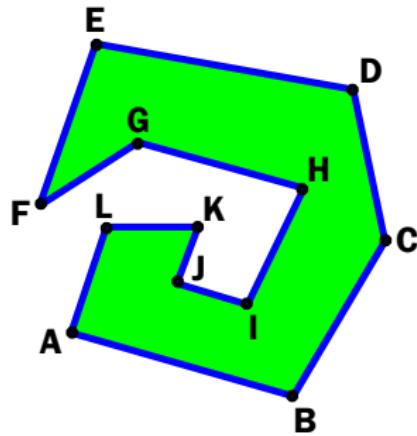
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## Area of a polygon

# Triangulation!

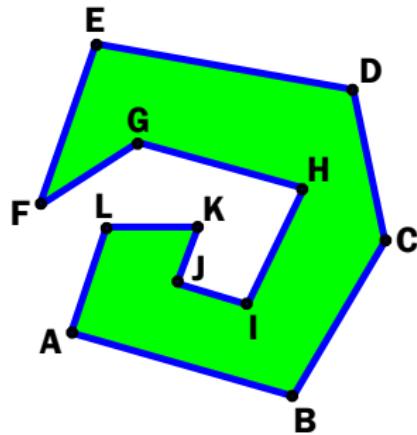
1. Start at any point (let's call it  $A$ )
2. Go through all other points,  
summing areas of triangles made  
by vectors from  $A$  (using cross  
product)



## Area of a polygon

# Triangulation!

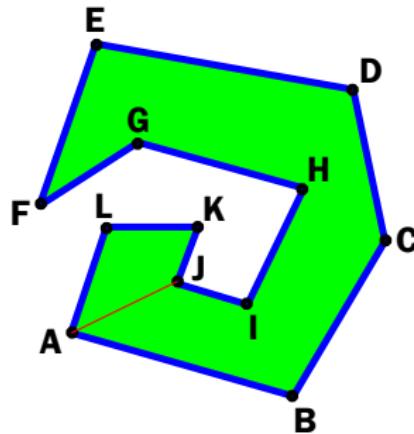
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## Area of a polygon

# Triangulation!

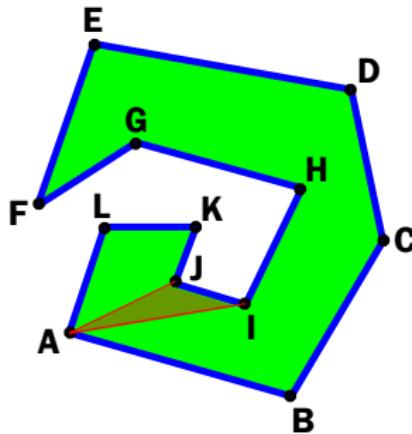
1. Start at any point (let's call it  $A$ )
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Area of a polygon

## Why does this work?

- ▶ For convex polygons, obvious
- ▶ For concave polygons, when we turn inwards, area is negative
- ▶ Sum of the negative and positive triangles equals area of polygon



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# Note on Binary Search

- Usually, binary search is used to find an item of interest in a sorted array
- There is a nice application of binary search, often used in geometry problems
  - Example: finding the largest circle that fits into a given polygon
    - Don't try to find a closed form solution or anything like that!
    - Instead, binary search on the answer

Ternary search

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# Ternary Search

- Another useful method in many geometry problems
- Finds the minimum point of a “convex” function  $f$ 
  - Not exactly convex, but let’s use this word anyway
- Initialize the search interval  $[s, e]$
- Until  $e - s$  becomes small:
  - $m_1 = s + (e - s)/3, m_2 = e - (e - s)/3$
  - If  $f(m_1) \leq f(m_2)$ , then set  $e$  to  $m_2$
  - Otherwise, set  $s$  to  $m_1$

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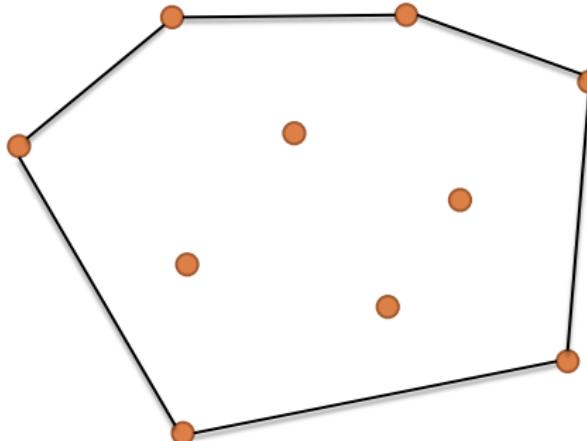
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# Convex Hull Problem

- Given  $n$  points on the plane, find the smallest convex polygon that contains all the given points
  - For simplicity, assume that no three points are collinear



# Simple $O(n^3)$ algorithm

- $AB$  is an edge of the convex hull iff  $\text{ccw}(A, B, C)$  have the same sign for all other given points  $C$ 
  - This gives us a simple algorithm
- For each  $A$  and  $B$ :
  - If  $\text{ccw}(A, B, C) > 0$  for all  $C \neq A, B$ :
    - Record the edge  $A \rightarrow B$
- Walk along the recorded edges to recover the convex hull

# Faster Algorithm: Graham Scan

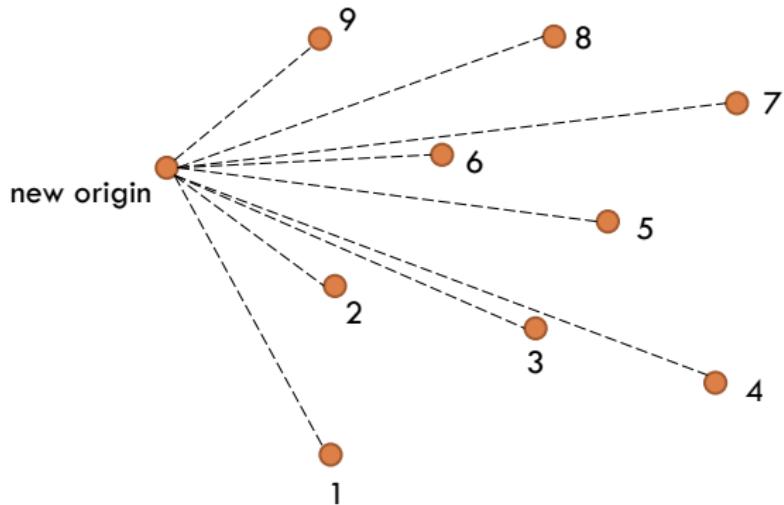
- We know that the leftmost given point has to be in the convex hull
  - We assume that there is a unique leftmost point
- Make the leftmost point the origin
  - So that all other points have positive  $x$  coordinates
- Sort the points in increasing order of  $y/x$ 
  - Increasing order of angle, whatever you like to call it
- Incrementally construct the convex hull using a stack

# Incremental Construction

- We maintain a **convex chain** of the given points
- For each  $i$ , we do the following:
  - Append point  $i$  to the current chain
  - If the new point causes a concave corner, remove the bad vertex from the chain that causes it
  - Repeat until the new chain becomes convex

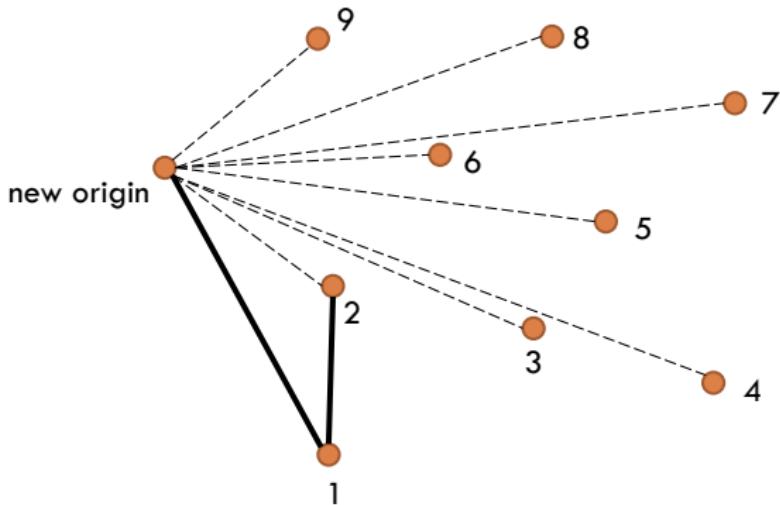
# Example

- Points are numbered in increasing order of  $y/x$



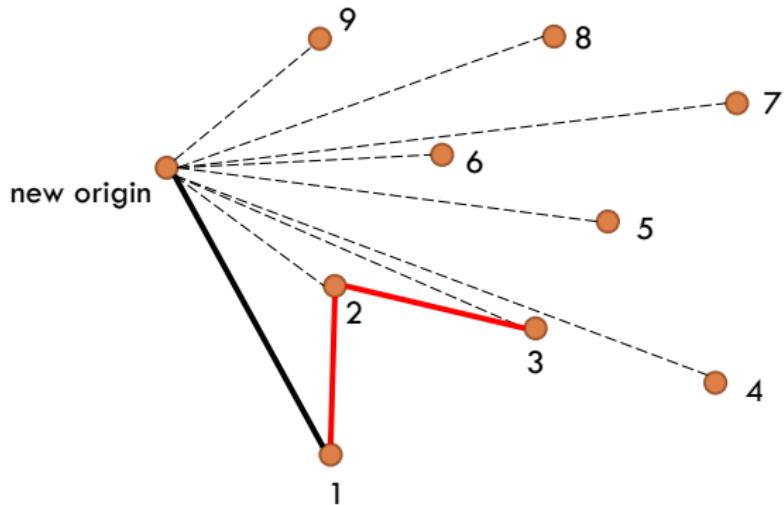
# Example

- Add the first two points in the chain



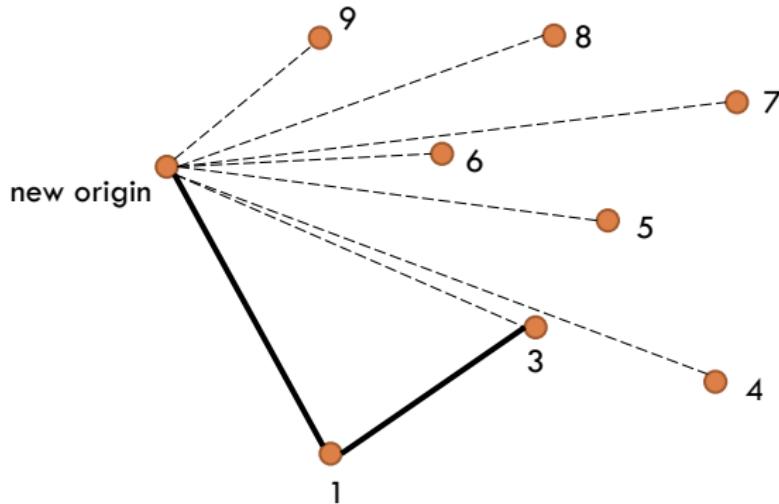
# Example

- Adding point 3 causes a concave corner 1-2-3
- Remove 2



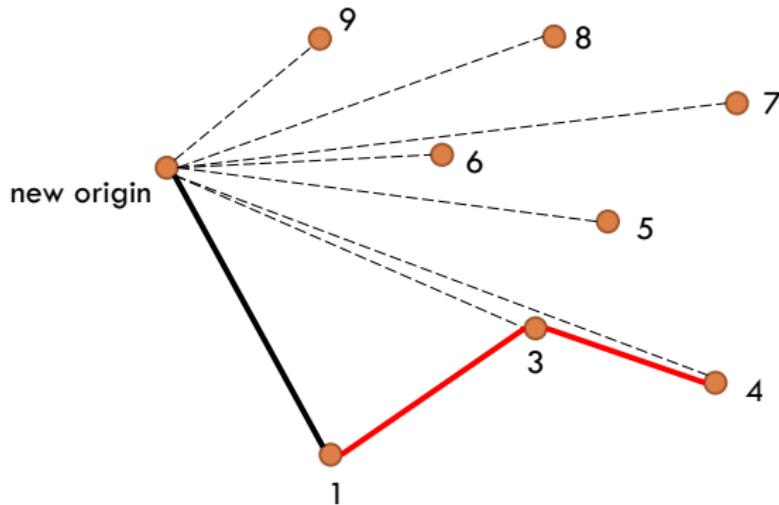
# Example

□ That's better...



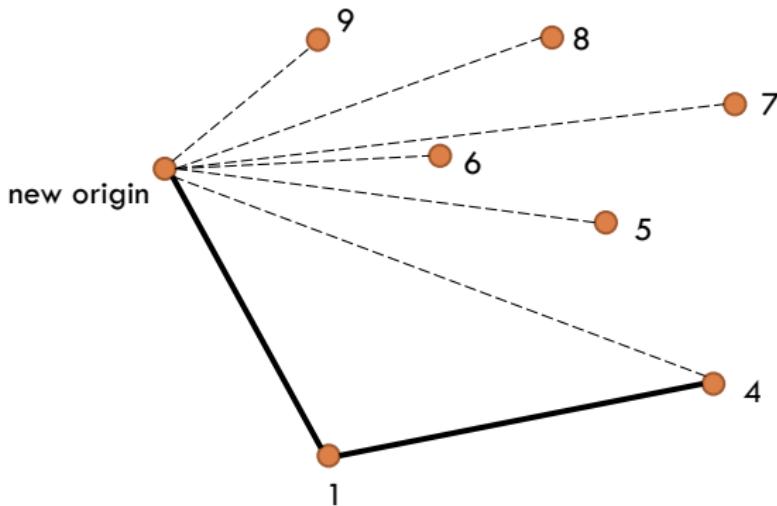
# Example

- Adding 4 to the chain causes a problem
- Remove 3



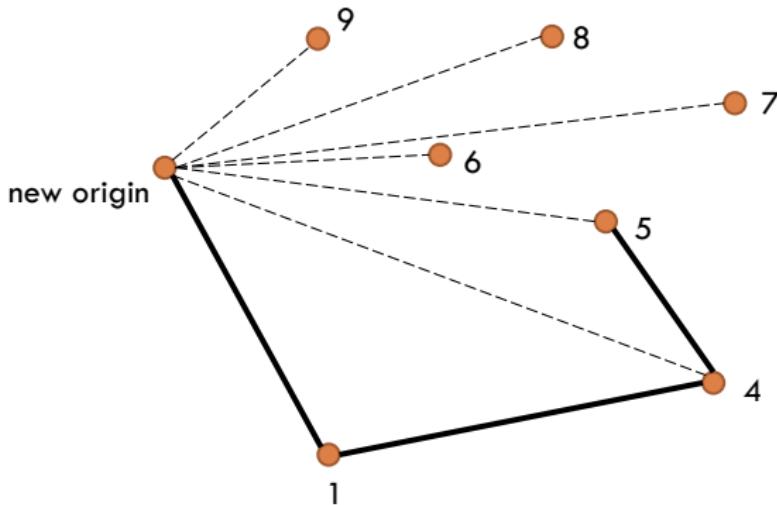
# Example

- Continue adding points...



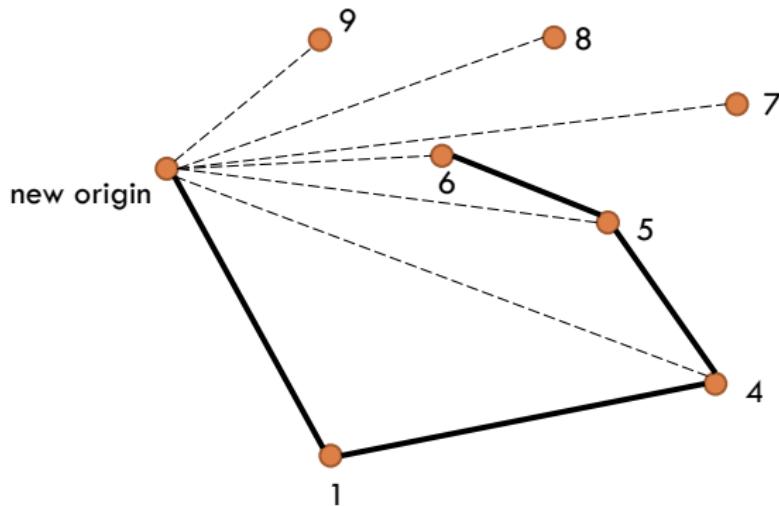
# Example

- Continue adding points...



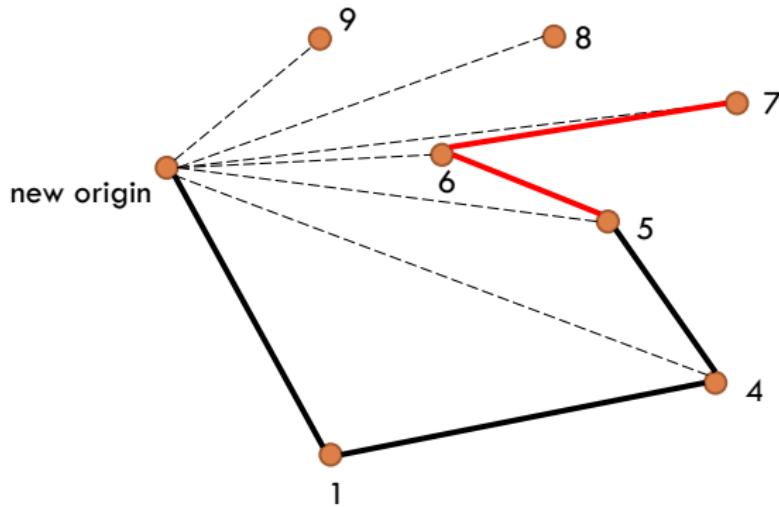
# Example

□ Continue adding points...



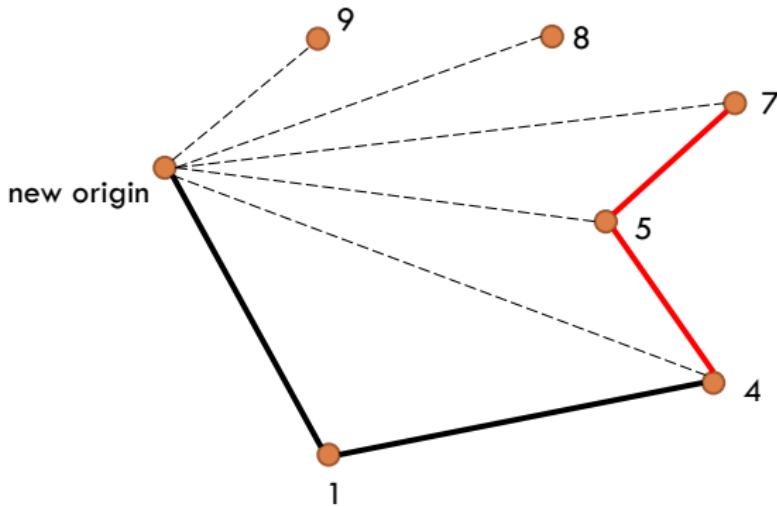
# Example

□ Bad corner!



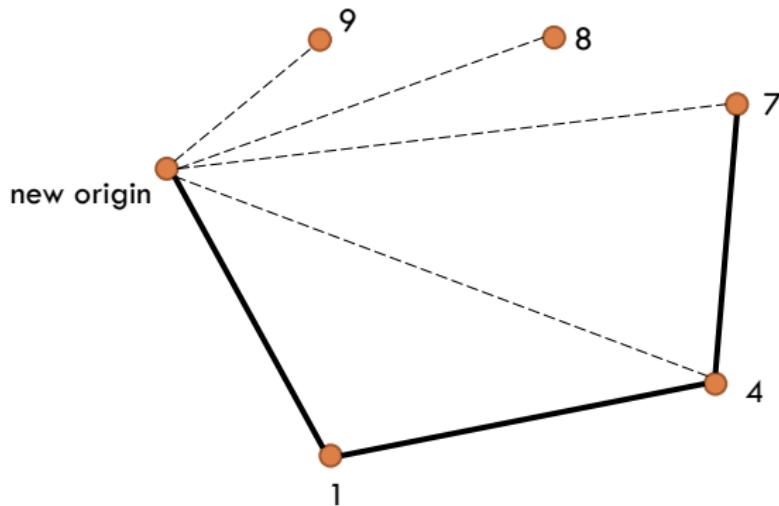
# Example

□ Bad corner again!



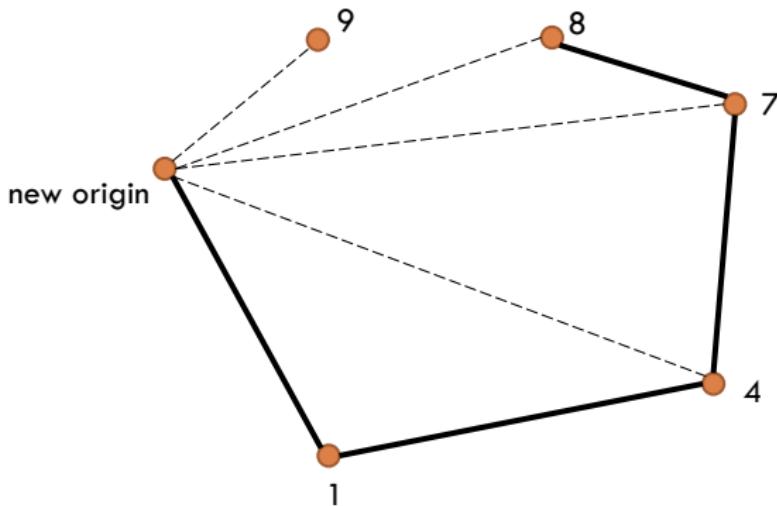
# Example

- Continue adding points...



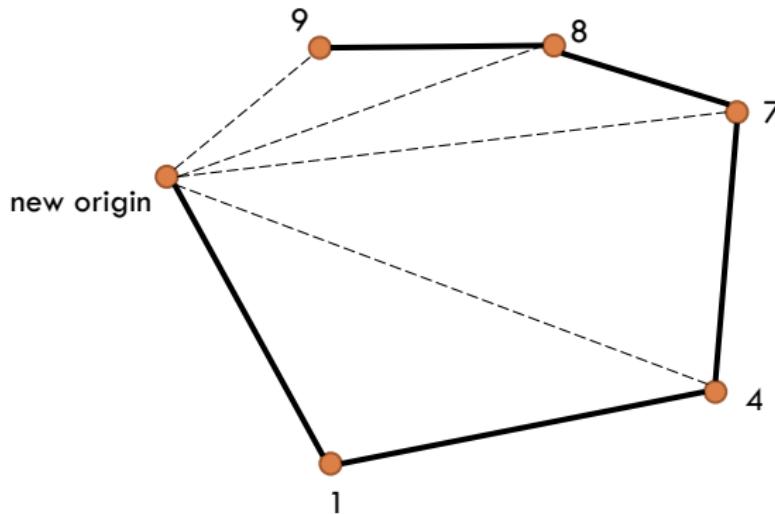
# Example

- Continue adding points...



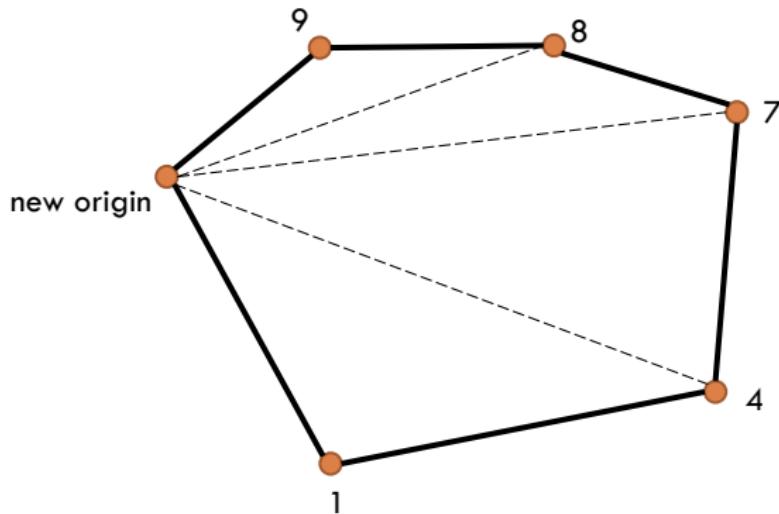
# Example

- Continue adding points...



# Example

□ Done!



# Pseudocode

- Set the leftmost point  $(0,0)$ , and sort the rest of the points in increasing order of  $y/x$
- Initialize stack  $S$
- For  $i = 1 \dots n$ :
  - Let  $A$  be the second topmost element of  $S$ ,  $B$  be the topmost element of  $S$ ,  $C$  be the  $i$ th point
  - If  $\text{ccw}(A, B, C) < 0$ , pop  $S$  and go back
  - Push  $C$  to  $S$
- Points in  $S$  form the convex hull

Convex Hull

## Graham Scan Complexity

- ▶ Sorting of points takes  $O(n \log n)$  time
- ▶ Construction of the hull requires only traversal of all points once, with removal from the stack at most once, so  $O(n)$  time
- ▶ Total runtime complexity:  $O(n \log n)$

Convex Hull

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## There are more geometry concepts to know!

- ▶ Circle concepts – chord length, inscribed and circumscribed polygons, circles and intersecting tangent/secant lines
- ▶ Sphere concepts – great circle distance
- ▶ Polygons – checking if point is inside polygon (extension of concepts covered today)
- ▶ For formulas, algorithms, and implementations, see Chapter 7 of [Competitive Programming](#) by Steven Halim

Thankfully, most of these concepts do not appear in our regionals

- ▶ However, you should know these for World Finals!

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## Some geometry resources

- ▶ [TopCoder Algorithm Tutorials - Basic Geometry Concepts](#)
- ▶ [TopCoder Algorithm Tutorials - Line Intersection and its Applications](#)
- ▶ [TopCoder Algorithm Tutorials - Practice TopCoder geometry problems](#)
- ▶ [Ahmed-Aly list of geometry problems](#)
- ▶ [Stanford Introduction to ICPC Course](#)
  - ▶ [Geometry Lecture Slides](#)
- ▶ [Stanford ICPC Notebook \(contains geometry algorithm implementations in C++\)](#)
- ▶ [Chapter 7 of Competitive Programming by Steven Halim](#)