

# Introduction to Computational Geometry

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# Outline

- 1 Introduction
- 2 Area Computation of a Simple Polygon
- 3 Point Inclusion in a Simple Polygon
- 4 Line Segment Intersection: An application of plane sweep
- 5 Convex Hull: An application of an incremental algorithm
- 6 Art Gallery Problem: A study of combinatorial geometry

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- This branch of study is around thirty years old if one assumes Michael Ian Shamos's thesis [1] as the starting point.

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- Programming in CG is also a little difficult. Libraries like **LEDA** [5] and **CGAL** [6] are now available.
- CG algorithms suffer from the curse of degeneracies. So, we would make certain assumptions at times like **no three points are collinear**, **no four points are cocircular**, etc.

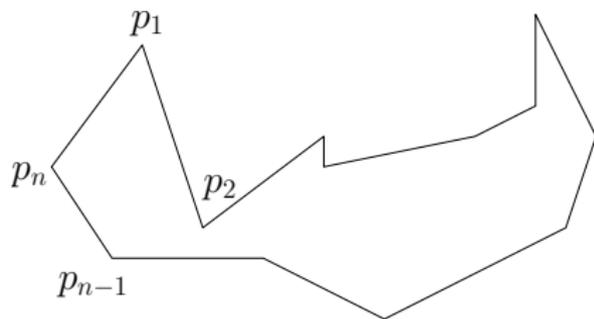
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# Area Computation

## Problem

Given a simple polygon  $P$  of  $n$  points, compute its area.



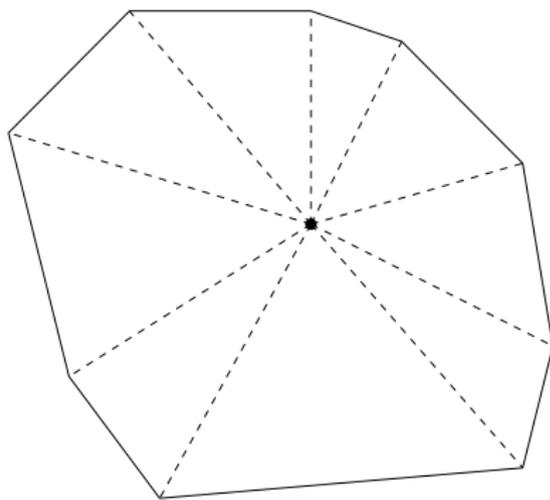
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## Area of a convex polygon

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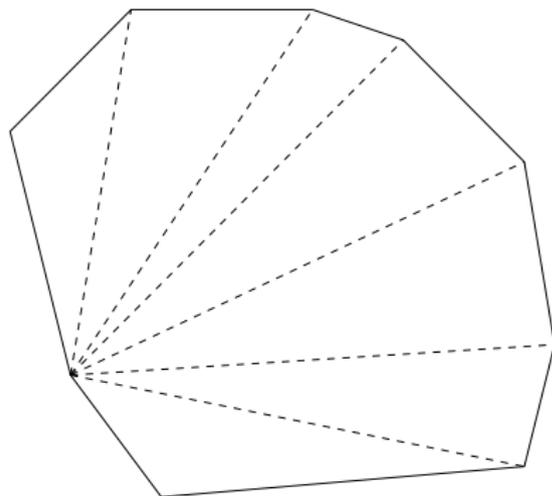
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## A better idea for convex polygon

We can **triangulate**  $P$  by **non-crossing diagonals** into  $n - 2$  triangles and then find the area.



$(n - 3)$  diagonals and  $(n - 2)$  triangles

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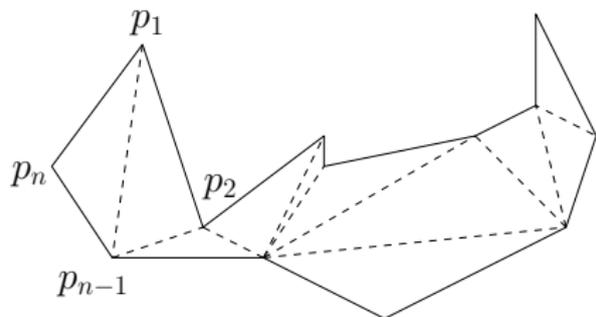
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## A better idea for simple polygon

We can do likewise.



$(n - 3)$  diagonals and  $(n - 2)$  triangles

# Area Computation and Polygon Triangulation

## Moral of the story

A simple polygon can be **triangulated** into  $(n - 2)$  **triangles** by  $(n - 3)$  **non-crossing diagonals**.



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The proof is by induction on  $n$ .

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The proof is by induction on  $n$ .

## Time complexity

We can **triangulate**  $P$  by a very complicated  $O(n)$  algorithm [7]  
OR by a *more or less simple*  $O(n \log n)$  time algorithm [4].

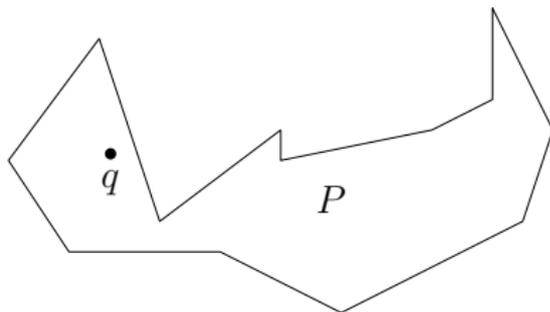
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# Point Inclusion

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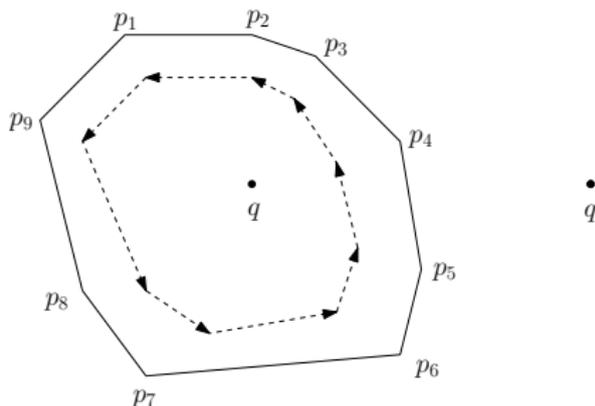
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$q$  is always to the left if  $q \in P$ , else, it varies.

# Point Inclusion

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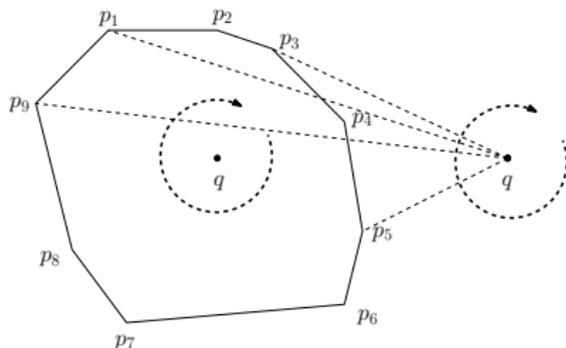
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## Another idea for convex polygon

- Stand at  $q$  and look around the polygon.
- We can show the same result for a simple polygon also.

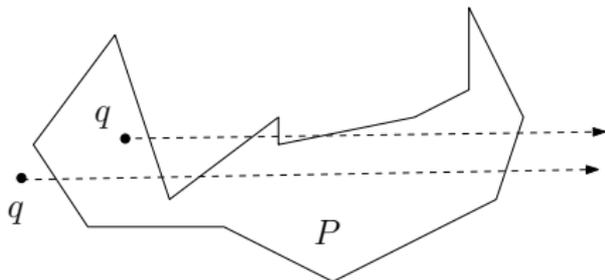


Total angular turn around  $q$  is  $2\pi$  if  $q \in P$ , else, 0

# Point Inclusion

## Another technique: Ray Shooting

Shoot a **ray** and count the number of **crossings** with edges of  $P$ . If it is odd, then  $q \in P$ . If it is even, then  $q \notin P$ . Some degenerate cases need to be handled. Time taken is  $O(n)$ .



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# Line Segment Intersection

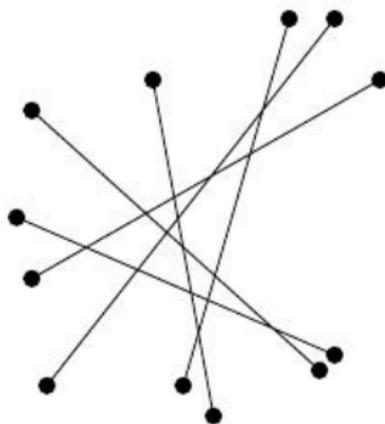
## Input

A set of line segments  $\mathcal{L}$  in  
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$$|\mathcal{L}| = n.$$

## Output

Report the intersections.



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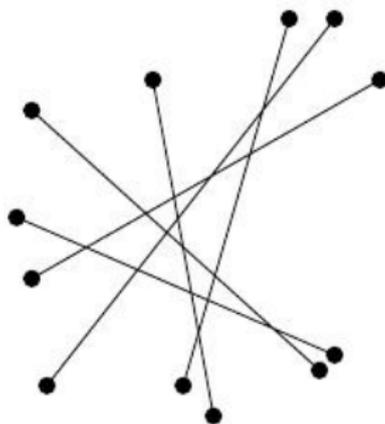
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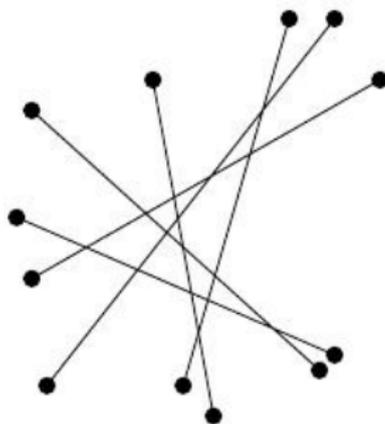
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## Output Sensitive Algorithm

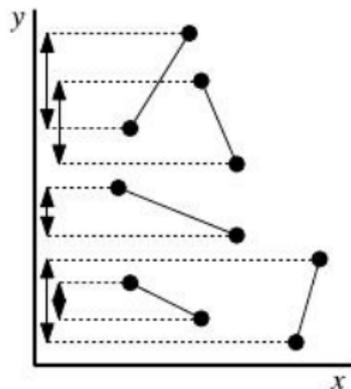
Number of intersections might vary from 0 to  $\binom{n}{2} = O(n^2)$ . So, the lower bound of the problem is  $\Omega(n^2)$ . The idea is now to look for an **output sensitive** algorithm.



# An Output Sensitive Algorithm

## The idea

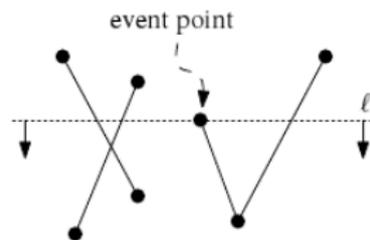
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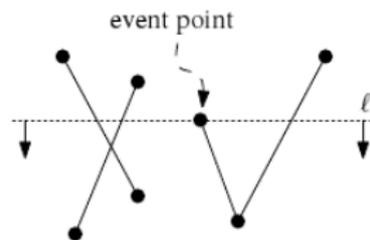
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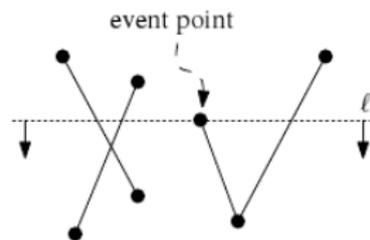
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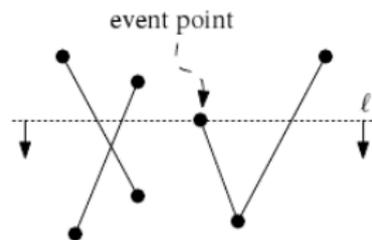
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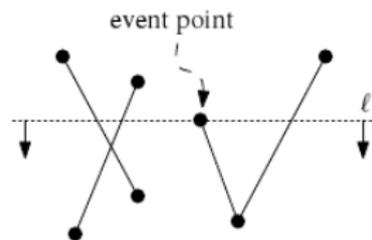




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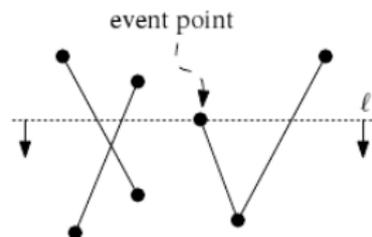
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- $\ell$  is the **sweep line** and the algorithm paradigm is **plane sweep**.
- The **status** of the sweep line is the line segments intersecting it.
- Only at particular points known as **event points**, the status needs to be updated.



# Event Points and Sweep Line Status

## Event Points and the Event Queue

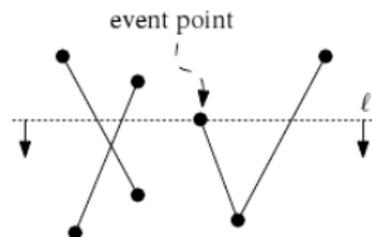
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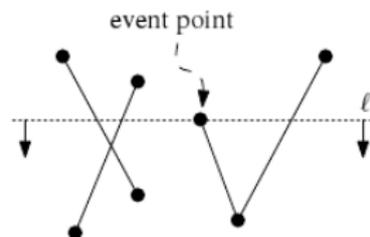
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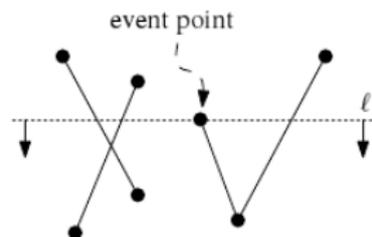
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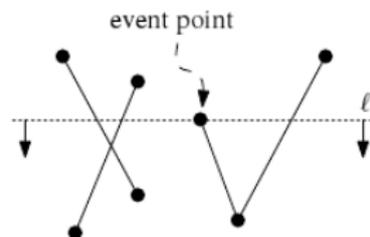
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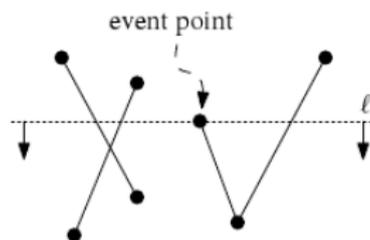
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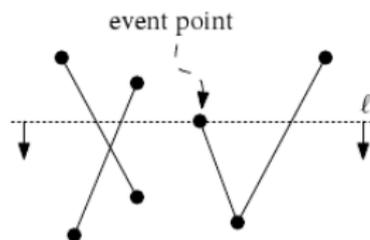
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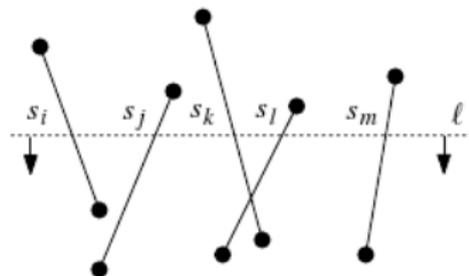
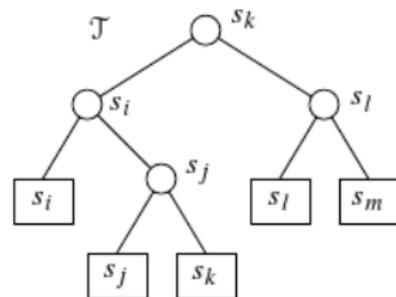




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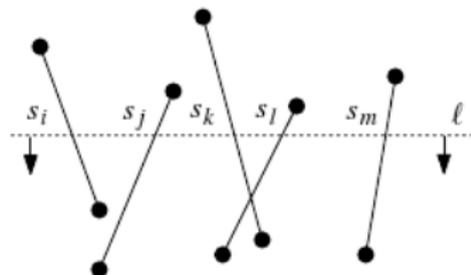
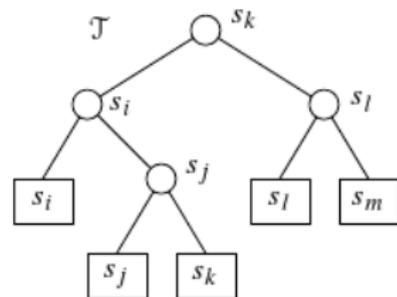
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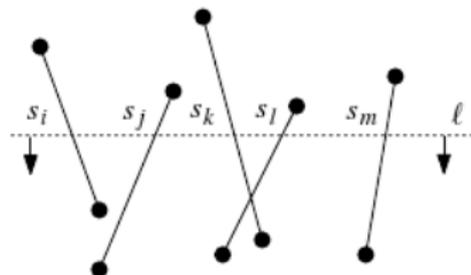
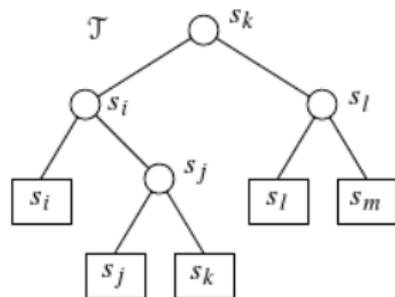
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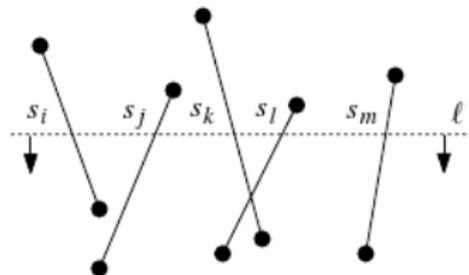
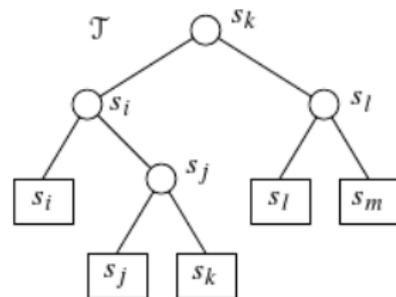
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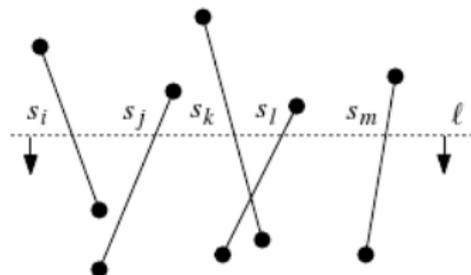
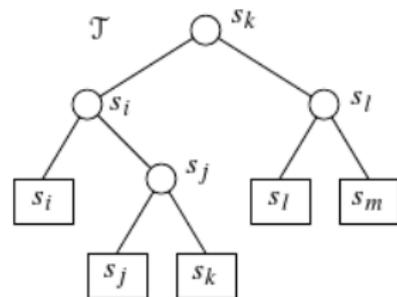
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- $s_k$  and  $s_l$  are two segments intersecting at a point.
- There is an event point above the intersecting point where  $s_k$  and  $s_l$  are adjacent and are tested for intersection. So, no intersection point is ever missed.



# The Algorithm

## Algorithm

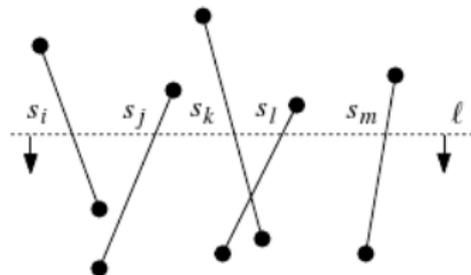
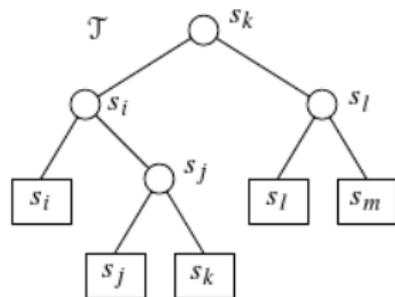
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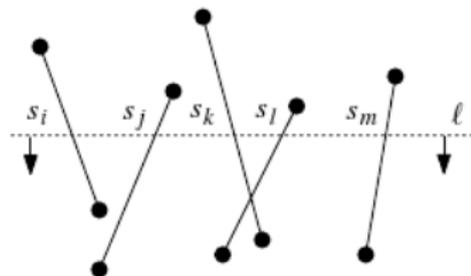
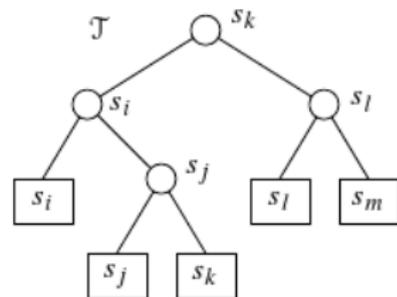
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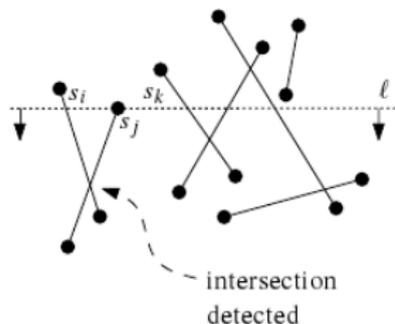
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- Keep on extracting points from  $\mathcal{H}$  till it is non-empty.
- Based on the three cases: **segment top end point**, **segment bottom end point** and **intersection point**, take necessary actions on  $\mathcal{T}$ .



# The Algorithm

## Algorithm: The three cases

- **[Top end point]** Insert the line segment into  $\mathcal{T}$  based on  $x$ - coordinates.

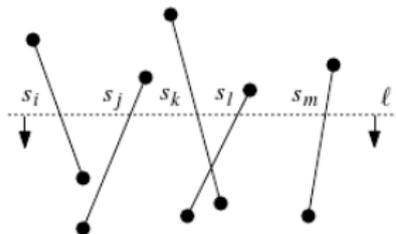
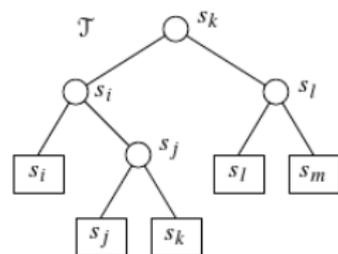




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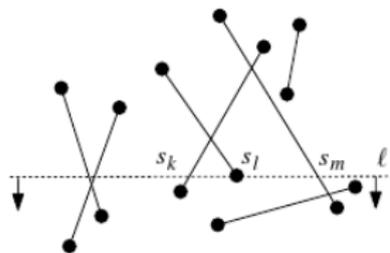
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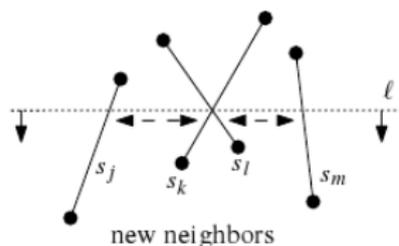
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- **[Intersection point]** Swap the line segments' status in  $\mathcal{T}$ . Check for intersections of preceding and succeeding entries.



# The Analysis

## Analysis

- Total number of event points is  $2n + I$ , where  $I$  is the number of intersections.

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- Total number of event points is  $2n + I$ , where  $I$  is the number of intersections.
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- So, the total time taken is  $O((2n + I) \log n) = O(n \log n + I \log n)$ .

# Outline

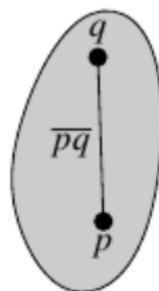
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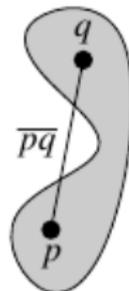
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## Definition

A set  $S \subset \mathcal{R}^2$  is convex if for any two points  $p, q \in S$ ,  $\overline{pq} \in S$ .



convex



not convex

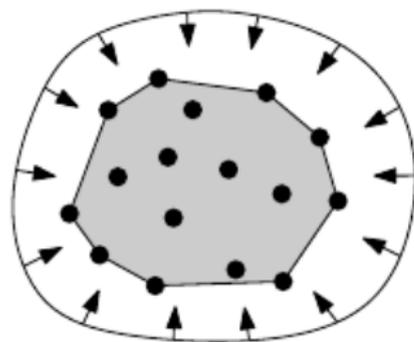
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Let  $\mathcal{P}$  be a set of points in  $\mathcal{R}^2$ . Convex hull of  $\mathcal{P}$ , denoted by  $CH(\mathcal{P})$ , is the **smallest** convex set containing  $\mathcal{P}$ .



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## Problem

Given a set of points  $\mathcal{P}$  in the plane, compute the convex hull  $CH(\mathcal{P})$  of the set  $\mathcal{P}$ .

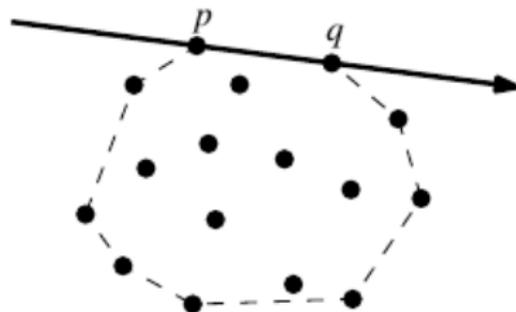
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- Consider all line segments determined by  $\binom{n}{2} = O(n^2)$  pairs of points.
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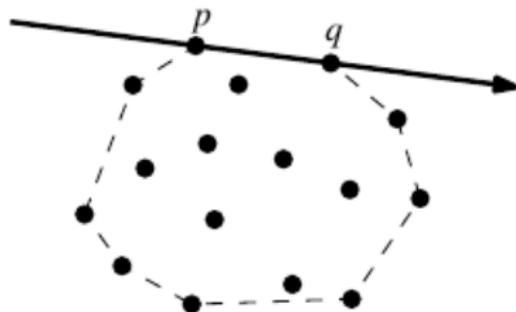
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- We need  $\binom{n}{2}(n - 2) = O(n^3)$  time.



# Towards a Better Algorithm

Way forward, but how much?

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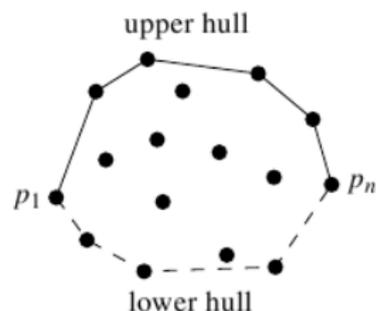
## Way forward, but how much?

- **Better characterizations lead to better algorithms.**
- How much better can we make?
- Leads to the notion of **lower bound of a problem**.
- The problem of Convex Hull has a lower bound of  $\Omega(n \log n)$ .  
This can be shown by a **reduction** from the problem of **sorting** which also has a lower bound of  $\Omega(n \log n)$ .

# Graham's Scan: An optimal algorithm for Convex Hull

## A better characterization

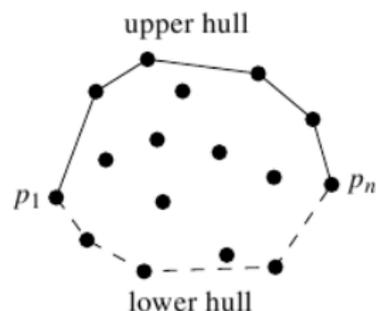
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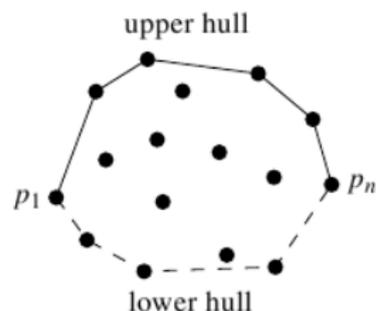


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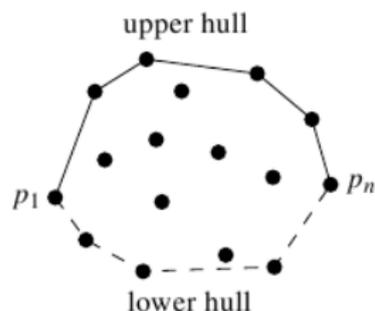
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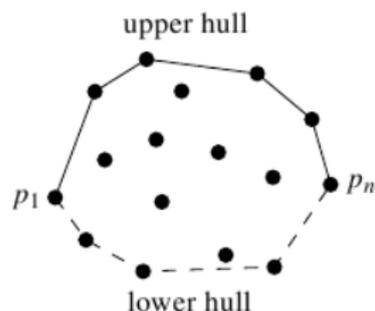
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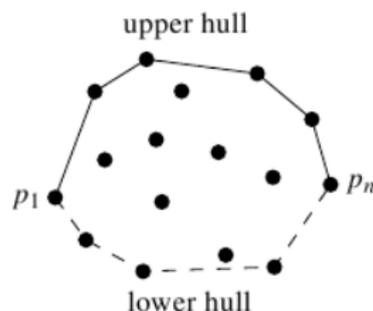
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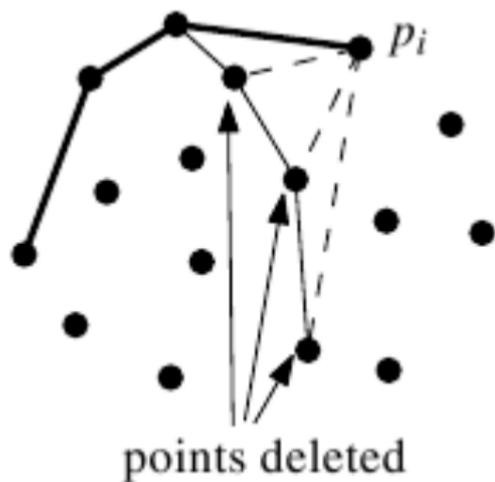
            Delete the middle of the last  
            three points from  $L_U$ ;

    }

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# The Algorithm in Action

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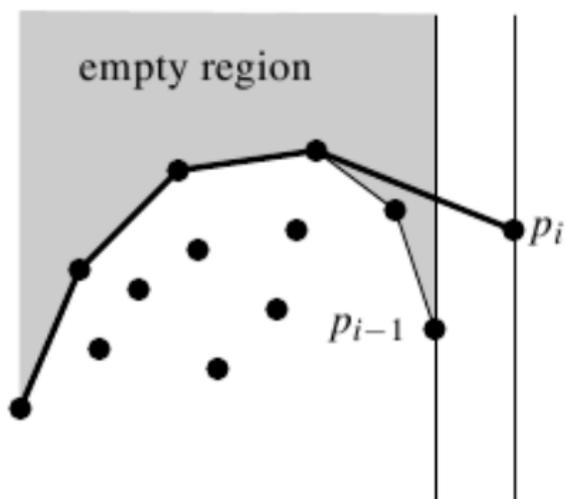
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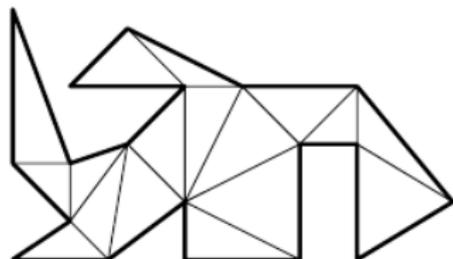
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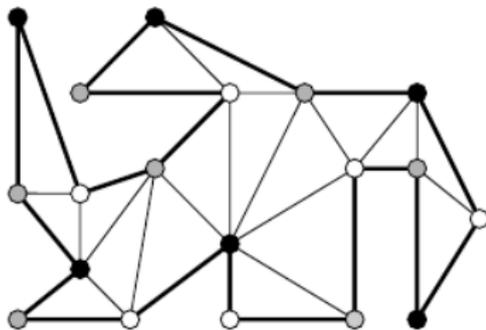
- Can we find as a function of  $n$  the number of cameras that suffices to guard  $P$ ?
- Recall  $P$  can be triangulated into  $n - 2$  triangles. Place a guard in each triangle.



# Art Gallery Problem

Can we bring the bound down?

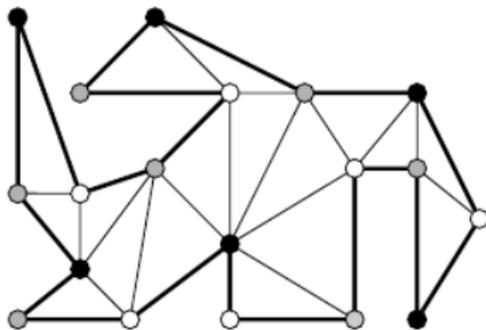
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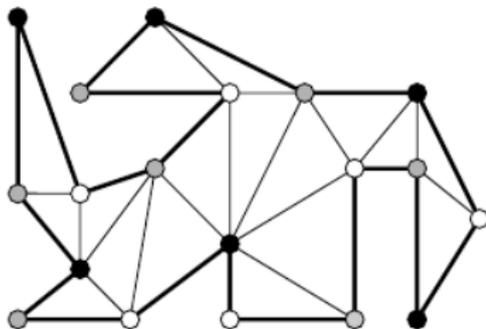




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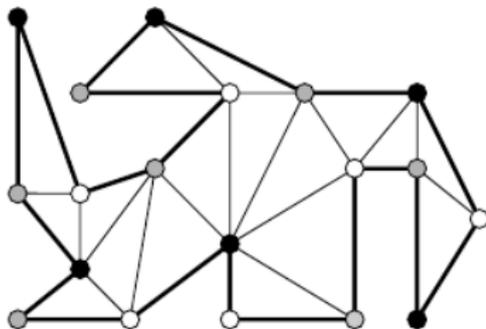
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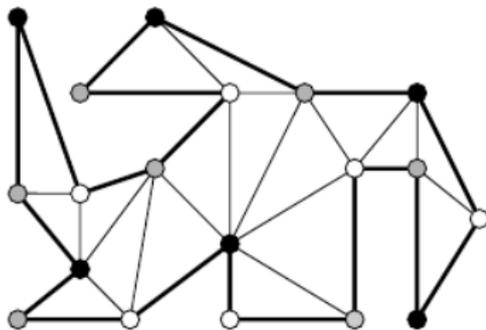
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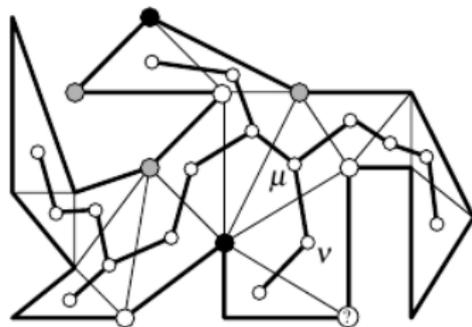
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- Choose the smallest color class to guard  $P$ .
- Hence,  $\lfloor \frac{n}{3} \rfloor$  guards suffice.
- But, does a 3-coloring always exist?



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## A 3-coloring always exists

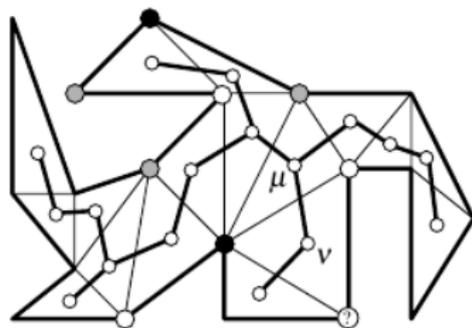
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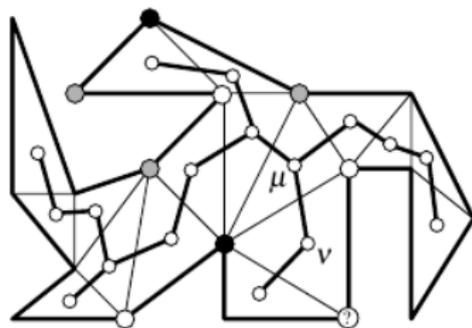
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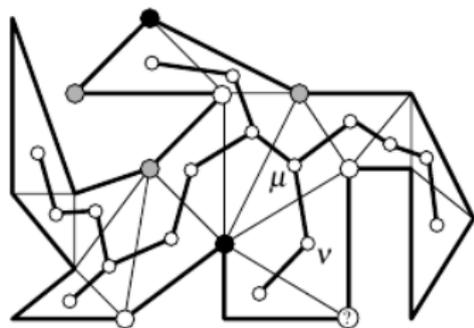
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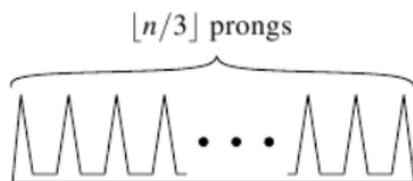
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## Necessity?

Are  $\lfloor \frac{n}{3} \rfloor$  guards sometimes necessary?



# Art Gallery Theorem

## The Final Theorem

For a simple polygon with  $n$  vertices,  $\lfloor \frac{n}{3} \rfloor$  cameras are always sufficient and occasionally necessary to have every point in the polygon visible from at least one of the cameras.

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