# Introduction to Computational Geometry

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# Outline

 Computational Geometry (CG) involves study of algorithms for solving geometric problems on a computer. The emphasis is more on discrete nature of geometric problems as opposed to continuous issues.

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- There are many areas in computer science like computer graphics, computer vision and image processing, robotics, computer-aided designing (CAD), geographic information systems (GIS), etc. that give rise to geometric problems.
- If one assumes Michael Ian Shamos's thesis [Shamos M. I., 1978] as the starting point, then this branch of study is around forty years old.

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- CG algorithms suffer from the curse of degeneracies. So, we would make certain simplifying assumptions at times like no three points are collinear, no four points are cocircular, etc.
- Programming in CG is a little difficult. Fortunately, libraries like LEDA [LEDA, www.algorithmic-solutions.com] and CGAL [CGAL, www.cgal.com] are now available. These libraries implement various data structures and algorithms specific to CG.

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- Then we study a few classical CG problems.

# Outline

# Problem

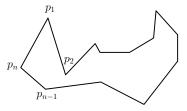
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#### Definition

A sinple polygon is the region of a plane bounded by a finite collection of line segments forming a simple closed curve.



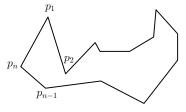
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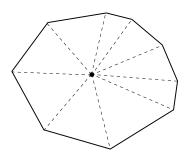
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 Let us first solve the problem for convex polygon.



# Area of a convex polygon

Find a point inside P, draw n triangles and compute the area.

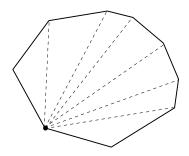


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We can triangulate P by non-crossing diagonals into n-2 triangles and then find the area.



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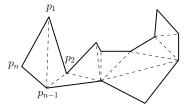
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# Area of a simple polygon

We can do likewise.



#### Result

If P be a simple polygon with n vertices with coordinates of the vertex  $p_i$  being  $(x_i, y_i)$ ,  $1 \le i \le n$ , then twice the area of P is given by

$$2A(P) = \sum_{i=1}^{n} (x_i y_{i+1} - y_i x_{i+1})$$

# Theorem

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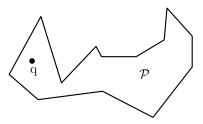
#### Time complexity

We can triangulate P by a very complicated O(n) time algorithm [Chazelle B., 1991] OR by a more or less simple  $O(n \log n)$  time algorithm [Berg M. d. et. al., 1997].

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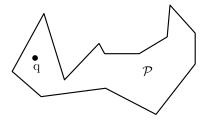
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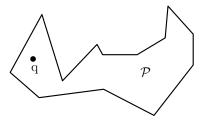


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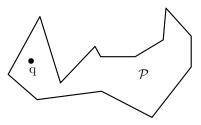
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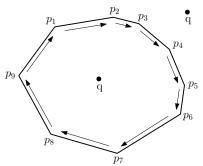
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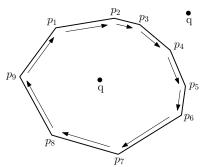
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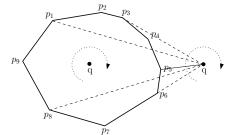
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## Point Inclusion: Another Idea

## For convex polygon

Walk around the polygon and compute total angle subtended at q. Time complexity is O(n).



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

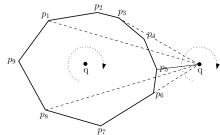
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#### For arbitrary simple polygon

Same result holds for arbitrary simple polygon also.

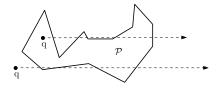


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# Point Inclusion: Still another Idea

# Ray Shooting

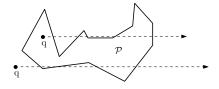
 Shoot a ray and count the number of crossings with edges of P. If it is odd, then q ∈ P. If it is even, then q ∉ P.



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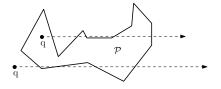
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- Time complexity is O(n).
- Some degenerate cases need to be taken care of.



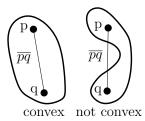
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### Definition

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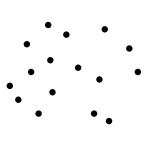
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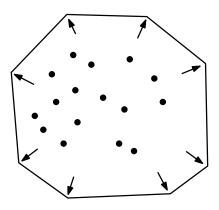
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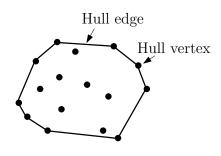
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### Convex Hull Problem

#### Problem

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

## A Naive Algorithm

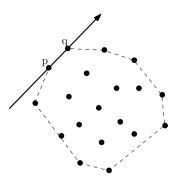
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• Consider all line segments determined by  $\binom{n}{2} = O(n^2)$  pairs of points.

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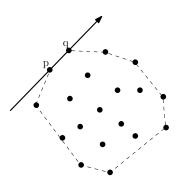
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- If a line segment has all the other n - 2 points on one side of it, then it is a hull edge.
- We need  $\binom{n}{2}(n-2) = O(n^3)$  time.



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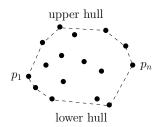
- Better characterizations lead to better algorithms.
- How much better can we make?
- Leads to the notion of lower bound of a problem.
- The problem of Convex Hull has a lower bound of  $\Omega(n \log n)$ . This can be shown by a reduction from the problem of sorting which also has a lower bound of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

## Optimal Algorithms

- Grahams scan, time complexity O(nlogn) (Graham, R.L., 1972).
- Divide and conquer algorithm, time complexity O(nlogn) (Preparata, F. P. and Hong, S. J., 1977).
- Jarvis's march or gift wrapping algorithm, time complexity O(nh) where h is the number of vertices of the convex hull. (Jarvis, R. A., 1973)
- Most efficient algorithm to date is based on the idea of Jarvis's march, time complexity O(nlogh) (T. M. Chan, 1996).

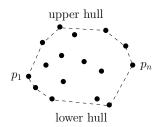
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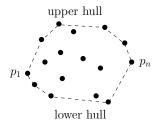
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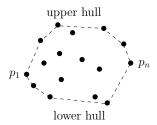


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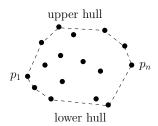


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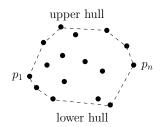


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- The lower hull can be computed in a similar fashion.



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Output: Vertices of  $\operatorname{CH}(P)$  in clockwise order

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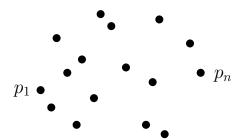
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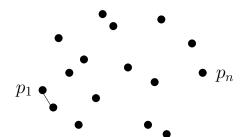
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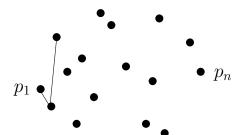
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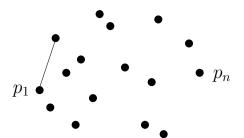
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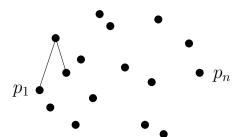
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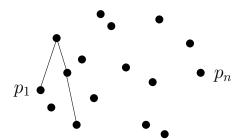


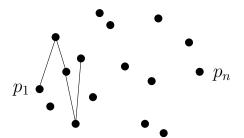


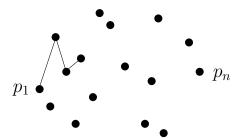


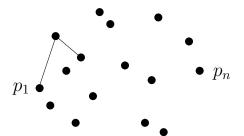


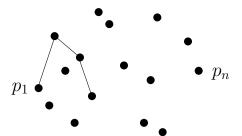


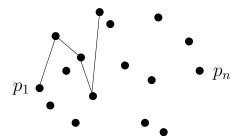


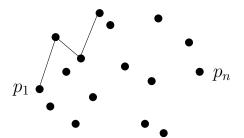


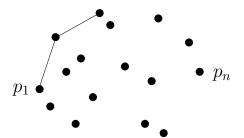


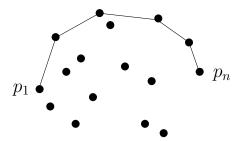












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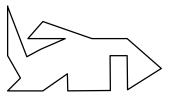
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- So, the total number of executions of the while loop body is bounded by O(n).
- Hence, the total time complexity is  $O(n \log n)$ .

### Outline

#### The problem

Given a simple polygon  $\mathcal{P}$  of n vertices, find the minimum number of cameras that can guard  $\mathcal{P}$ .

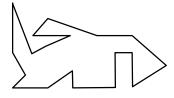


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Given a simple polygon  $\mathcal{P}$  of n vertices, find the minimum number of cameras that can guard  $\mathcal{P}$ .

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The problem is NP-Hard.



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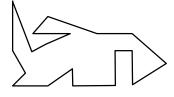
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Can we find, as a function of n, the number of cameras that suffices to guard  $\mathcal{P}$ ?



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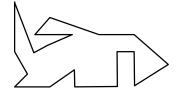
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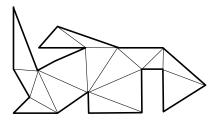
Only one camera is required.



```
Easy solution
```

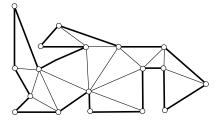
#### Easy solution

• Recall  $\mathcal{P}$  can be triangulated into n-2 triangles. Place a guard in each triangle.



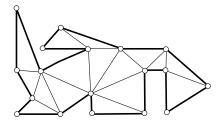
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- Recall  $\mathcal{P}$  can be triangulated into n-2 triangles. Place a guard in each triangle.
- Or place guards at vertices of the triangulation  $\mathcal T$  of  $\mathcal P$ .



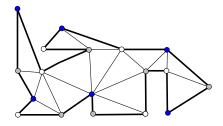
#### Easy solution

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- We get an O(n) bound on the number of guards.

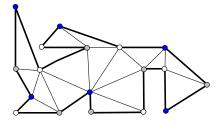


#### Can the bound be reduced?

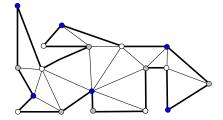
 We do a 3-coloring of the vertices of T. Each triangle of T has a blue, gray and white vertex.



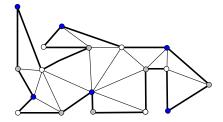
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- Hence,  $\lfloor \frac{n}{3} \rfloor$  guards suffice.
- But, does a 3-coloring always exist?

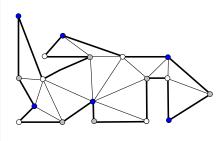


#### Theorem

The triangulation graph of a simple polygon P may be 3-colored.

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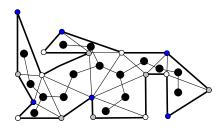


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#### A 3-coloring always exist

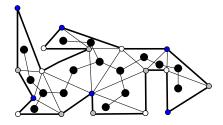
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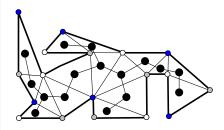
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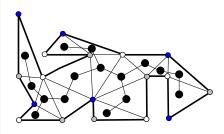
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- ullet  $\mathcal{G}_{\mathcal{T}}$  is a tree as  $\mathcal{P}$  has no holes.
- Do a DFS on  $\mathcal{G}_{\mathcal{T}}$  to obtain the coloring.
- Place guards at those vertices that have color of the minimum color class. Hence,  $\lfloor \frac{n}{3} \rfloor$  guards are sufficient to guard  $\mathcal{P}$ .

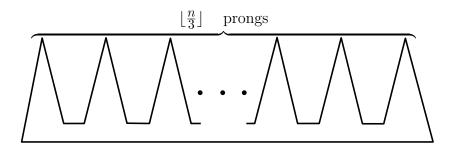


#### Necessity?

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

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### Art Gallery Theorem

#### Final Result

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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http://www.cgal.org

http:
//en.wikipedia.org/wiki/Computational_geometry
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# Thank you!