



# COMP5045 - Computational Geometry

Course page: Ed

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## Course book:

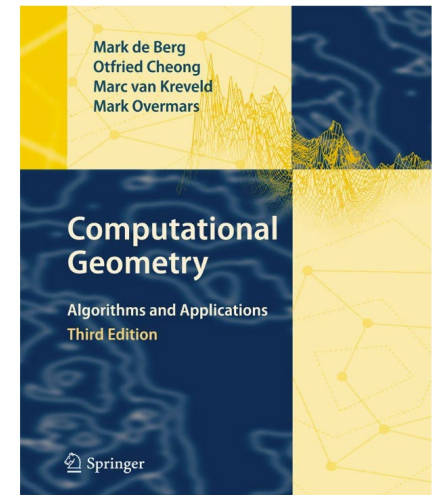
M. de Berg, O. Cheong, M. van Kreveld and M. Overmars  
Computational Geometry: Algorithms and Application  
Springer-Verlag (2<sup>nd</sup> or 3<sup>rd</sup> edition)

## Outline:

13 lectures Thursdays 2-4pm  
4 assignments (~4 questions/assignment)  
Written exam [40% required to pass]

## Tutorials:

Thursdays 4-5pm in Civil Eng Seminar Room 304  
Fridays 4-5pm in Mechanical Eng Seminar Room 2 S226





### Assessment:

Each assignment 17.5% (total 70%)

Written exam 30%

**Handing in late is not accepted = 0 points**

Assignments submitted via Canvas as pdf (no handwriting!)

### Collaboration:

General ideas - Yes!

Formulation and writing - No!

Read [Academic Dishonesty and Plagiarism.](#)

- › Lecture 1: The Art gallery problem
- › Lecture 2: Sweepline technique: triangulation & segment intersection
- › Lecture 3: Sweepline technique: Convex hulls
- › Lecture 4: Linear programming and probabilistic analysis
- › Lecture 5: Orthogonal range searching I: kd-trees and range trees
- › Lecture 6: Orthogonal range searching II: fractional cascading and interval trees
- › Lecture 7: Voronoi diagrams and Delaunay triangulation
- › Lecture 8: Arrangements and duality
- › Lecture 9: Planar point location
- › Lecture 10: Approximation Algorithms: Applications of the WSPD
- › Lecture 11: Curve similarity
- › Lecture 12: TBA
- › Lecture 13: Recap

› Proof techniques:

- Proof of contradiction, Induction proof...
- See also Sections 1.2-3 in "[Introduction to Theory of Computations](#)"

[Maheshwari and Smid]

› Basic data structures

- Binary search trees, lists, queues, stacks, graphs...

› Algorithms

- Techniques: greedy and D&C
- Sorting, searching, depth-first search, breadth-first search...

› big-O/big-Omega notations, basic analysis, recursion...

## Algorithms:

300 BC: Euclid designed an algorithm for GCD.

780 AD: al-Khowarizmi - the word “Algorithm” is derived from his name.

...

Babbage, Cantor, Hilbert, Church, Gödel

...

1936: Turing developed a machine that provides a formal and rigorous definition of an algorithm



## Computational Geometry:

1644: Descartes wrote about Voronoi diagrams

1759: Euler & Vandermonde discussed Euclidean TSP

1978: Shamos wrote his thesis which defines the start of modern CG

1985: Preparata & Shamos wrote the first CG textbook

# What is computational geometry?

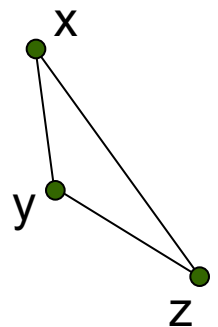
The study of algorithms to solve problems stated in terms of geometry.

**The problems we study are defined in a metric space!**

For every two points  $x$  and  $y$  in the metric space, there is a function  $g(x,y) \geq 0$  which gives the distance between them as a nonnegative real number. A metric space must also satisfy

1.  $g(x,y) = 0$  iff  $x = y$ ,
2.  $g(x,y) = g(y,x)$ , and
3. the triangle inequality must hold  $g(x,y) + g(y,z) \geq g(x,z)$ .

We will mainly consider the Euclidean metric ( $L_2$ -metric).





# Why computational geometry?

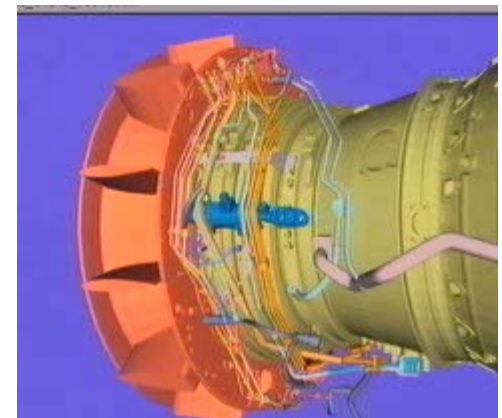
Certain problems are inherently geometric:

- Point location
- Range searching
- Motion planning
- ...



Other problems are just much easier to solve if we use the underlying metric:

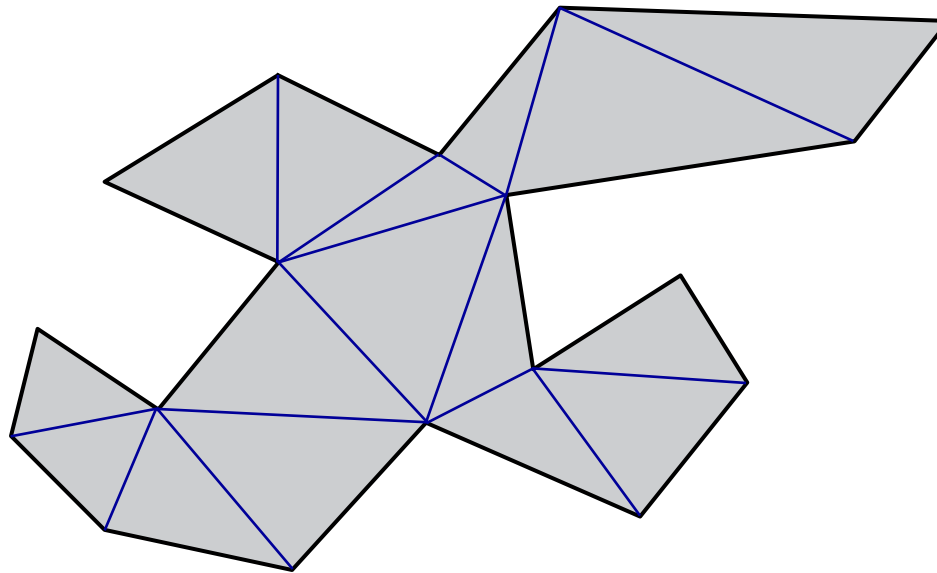
- Travelling Salesman Problem
- Nearest neighbour
- ...







## Polygon Triangulation and The Art Gallery Problem

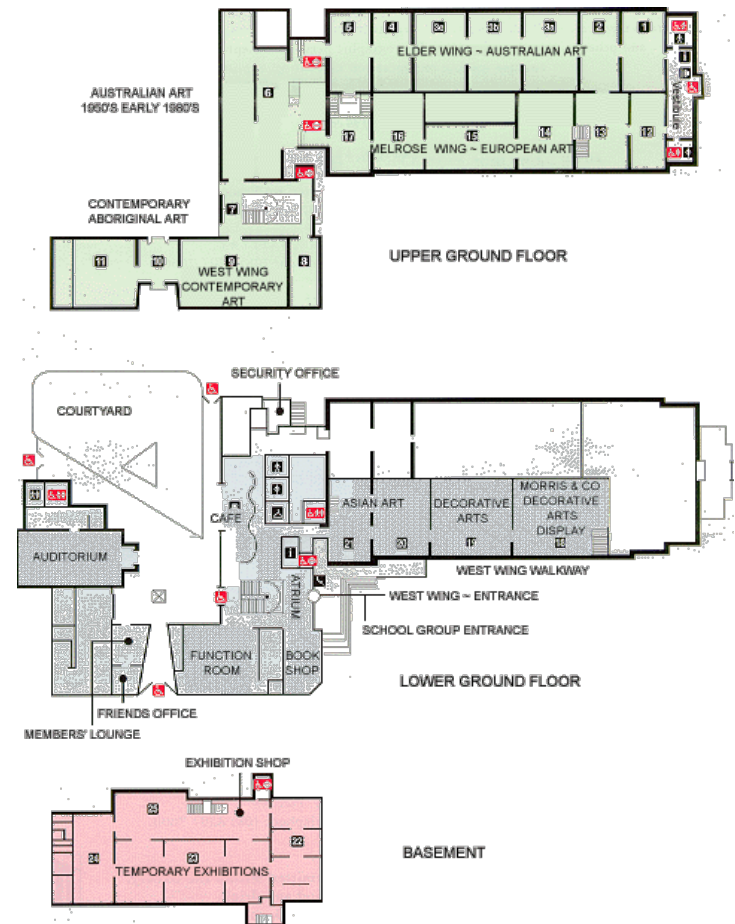


# The Art Gallery problem

## Question:

How many guards are needed to guard an art gallery?

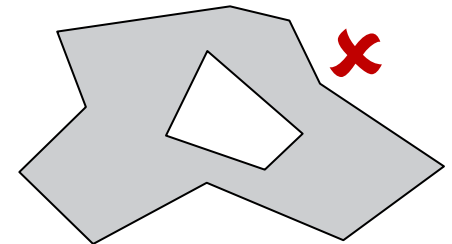
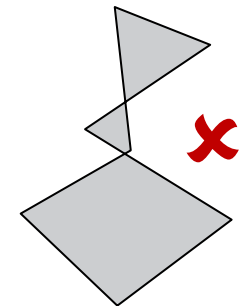
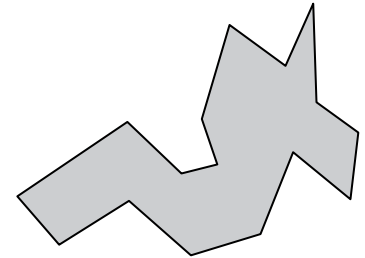
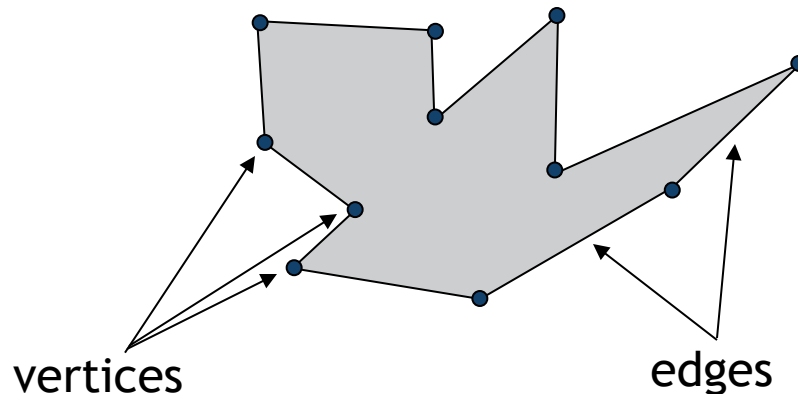
Victor Klee posed this problem to Václav Chvátal in 1973.



**Input:** An Art Gallery =  
A simple polygon with  $n$  line segments

**Polygon:** A region of the plane bounded by a set of  
straight line segments forming a closed curve.

**Simple:** A polygon which does not self-intersect and  
doesn't have any holes.

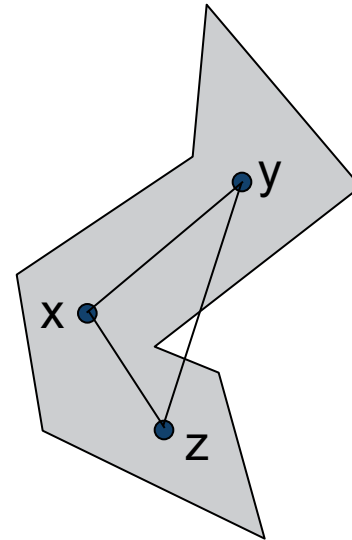




**Guard:** (camera, motion sensors, fire detectors, ...)

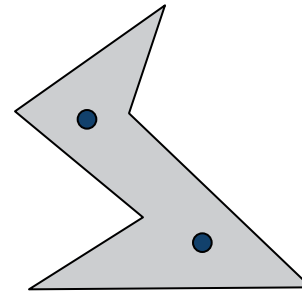
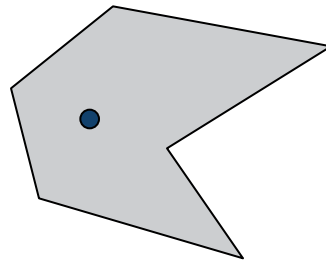
- $2\pi$  range visibility
- infinite distance
- cannot see through walls
- cannot move

x can see y iff -  $(x,y) \subseteq P$



**Question:** How many guards are needed to guard an art gallery?

$n=6$



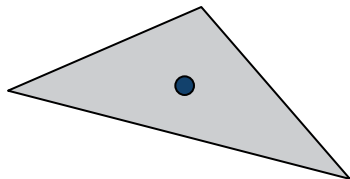
$G(n)$  = the smallest number of guards that suffice to guard any polygon with  $n$  vertices.

Is  $G(n) \leq n$ ? If we place one guard on each vertex?

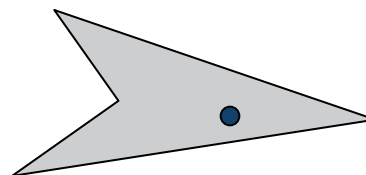
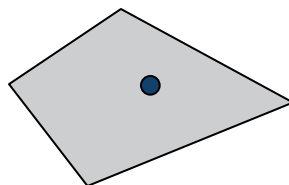


# A lower bound

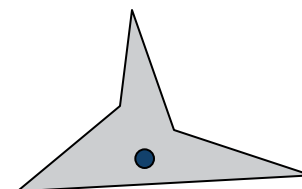
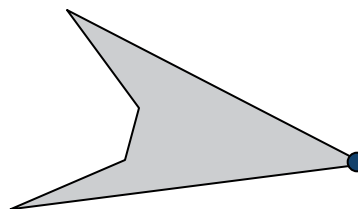
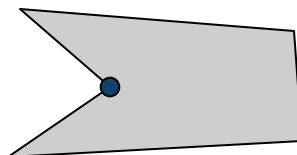
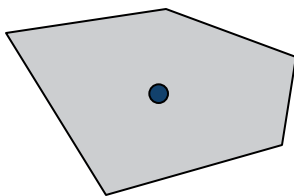
$n=3$



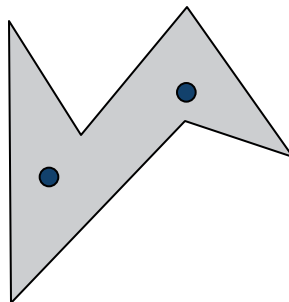
$n=4$



$n=5$



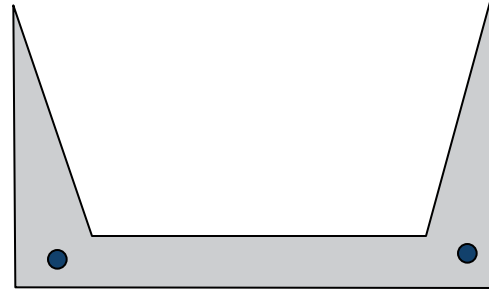
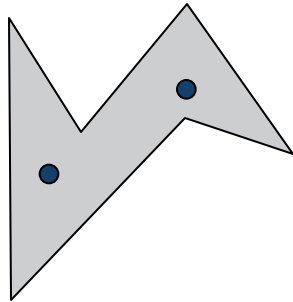
$n=6$



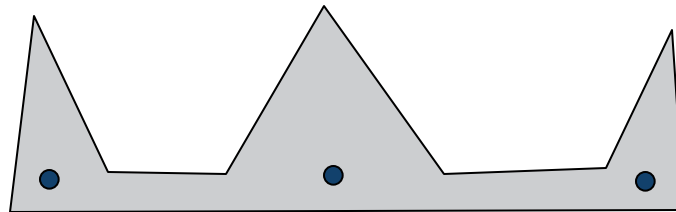


# A lower bound

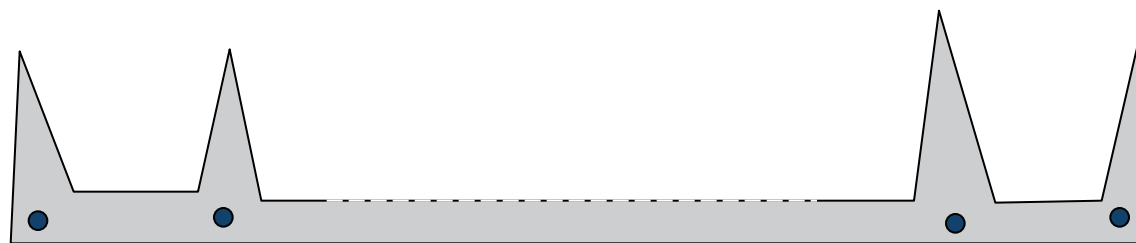
$n=6$



$n=9$



$n=3k$

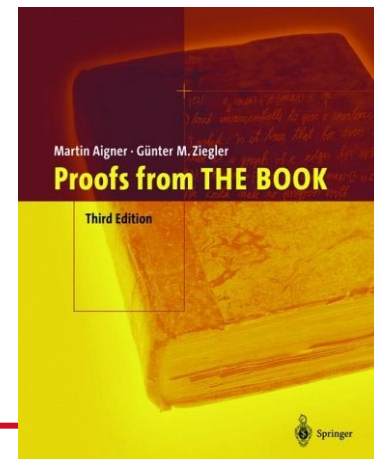


We have shown:  $G(n) \geq \lfloor n/3 \rfloor$

**Conjecture:**  $G(n) = \lfloor n/3 \rfloor$   
Proved by Chvátal in 1975.

“Steve Fisk learned of Klee's question from Chvátal's article, but found the proof unappealing. He continued thinking about the problem and came up with a solution while dozing off on a bus travelling somewhere in Afghanistan.”

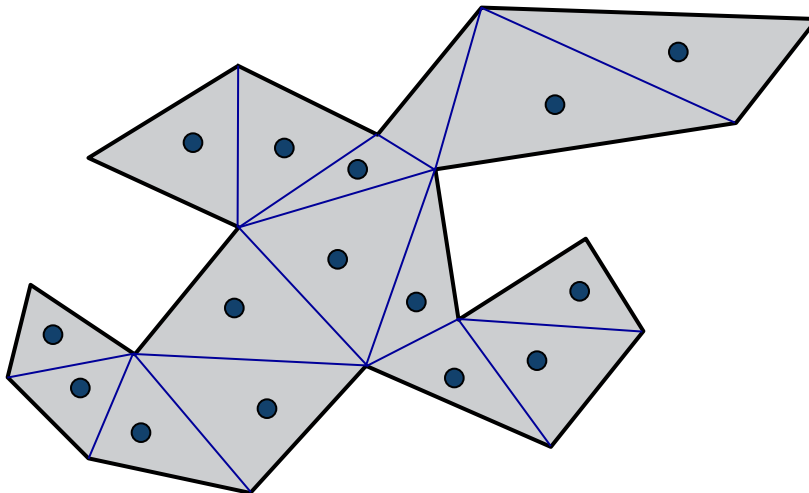
An elegant proof was given by Fisk in 1978.  
Included in “Proofs from the book”.





Prove that  $G(n) \leq n-2$ .

- Decompose  $P$  into pieces that are easy to guard.  
For example triangles!
- How can we use a triangulation of  $P$  to place a set of guards?



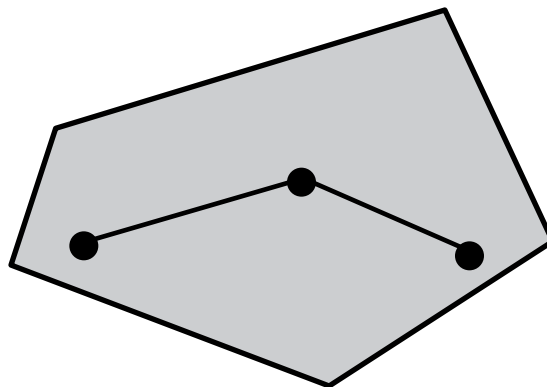
#guards = #triangles

Why is a triangle easy to guard?

A triangle is convex.

**Definition of convex set:**

An object is convex if for every pair of points within the object, every point on the straight line segment that joins them is also within the object.



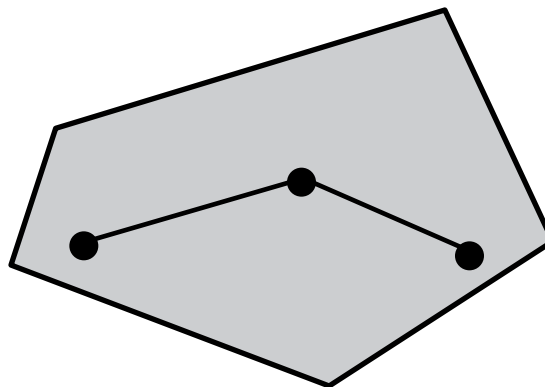
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**Definition of convex set:**

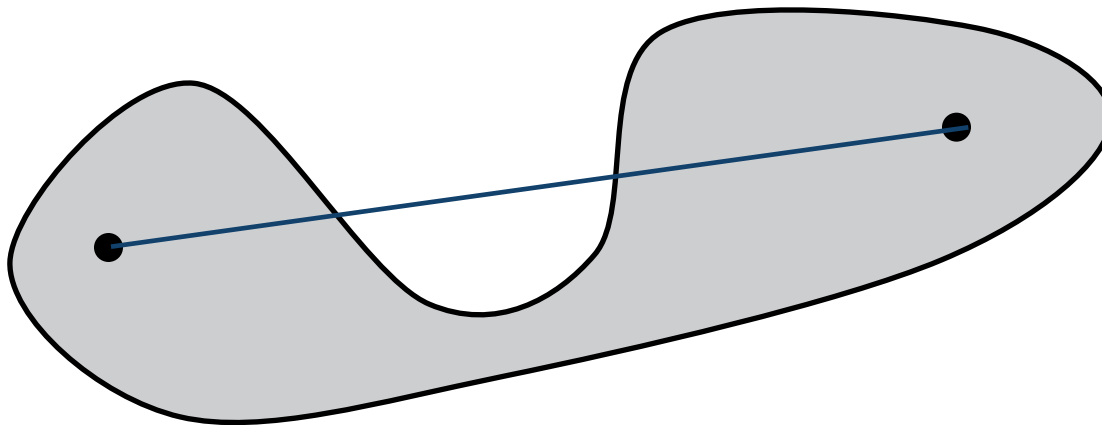
An object is convex if for every pair of points  $p$  and  $q$  within the object,  $p$  can see  $q$ .

Every convex set can be guarded by one guard.



Assume the opposite!

There exists two points within the triangle that cannot see each other.

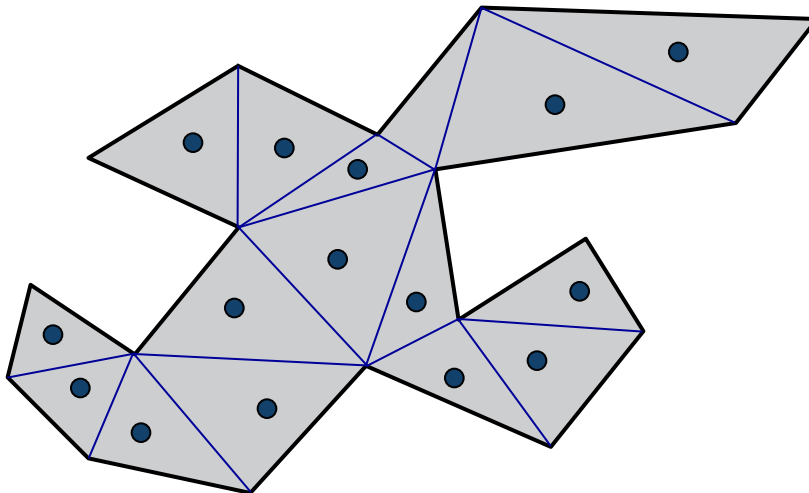


But that **contradicts** the definition of a convex set  
 $\Rightarrow$  Every pair of points must see each other!

QED

Prove that  $G(n) \leq n-2$ .

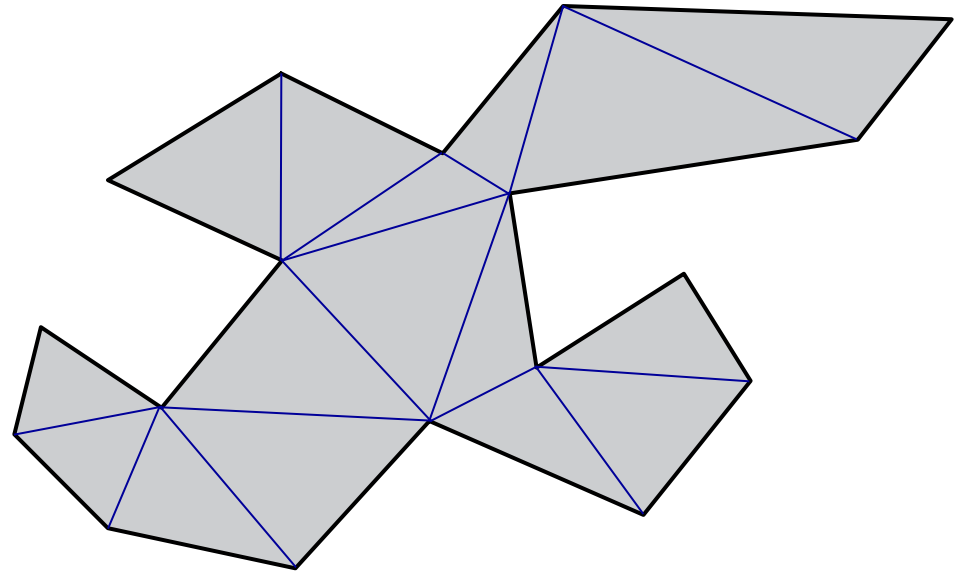
- Decompose  $P$  into pieces that are easy to guard.  
For example triangles!
- How can we use a triangulation of  $P$  to place a set of guards?



#guards = #triangles

A triangulation can be obtained by adding a maximal number of non-intersecting diagonals within  $P$ .

A diagonal of  $P$  is a line segment between two vertices of  $P$  that are visible to each other.



**BUT!**

1. Does a triangulation always exist?
2. What is the number of triangles?

Does a triangulation always exist?

Is there always a diagonal?

**Lemma:** Every simple polygon with  $>3$  vertices has a diagonal.

Does a triangulation always exist?

Is there always a diagonal?

**Lemma:** Every simple polygon with  $>3$  vertices has a diagonal.

A **constructive proof** is a proof that demonstrates the existence of a mathematical object by creating such an object.

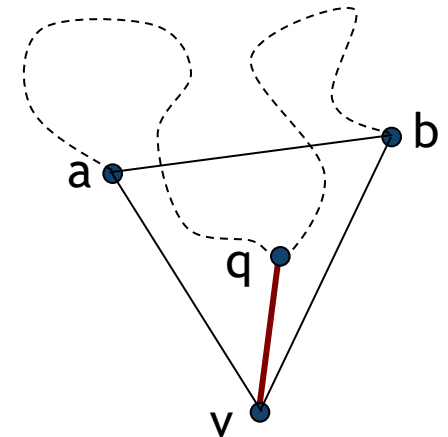
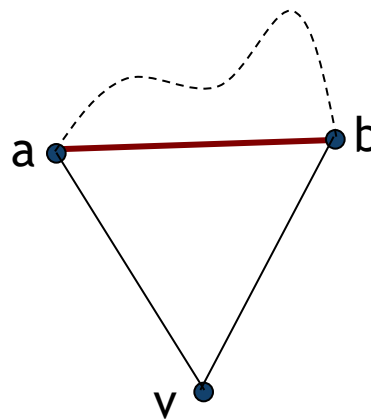
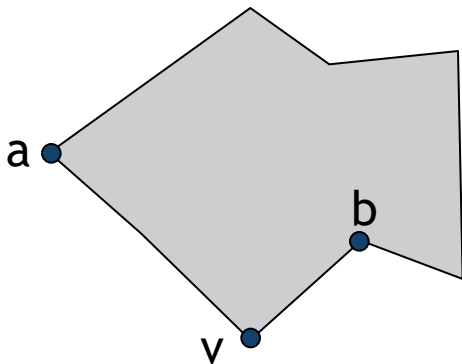
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Does a triangulation always exist?

Is there always a diagonal?

**Lemma:** Every simple polygon with  $>3$  vertices has a diagonal.



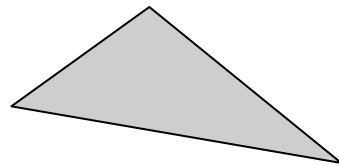
QED



**Theorem:** Every simple polygon admits a triangulation.

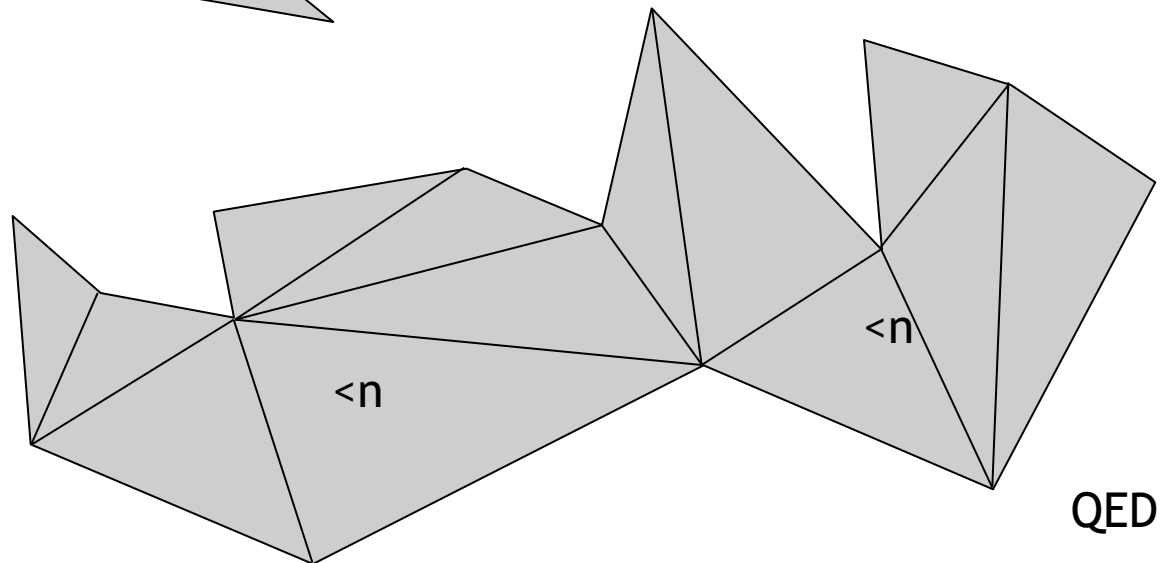
**Proof by induction** (over the number of vertices):

Base case:  
 $n=3$



Induction hyp.:  
 $n < m$

Induction step:  
 $n=m$

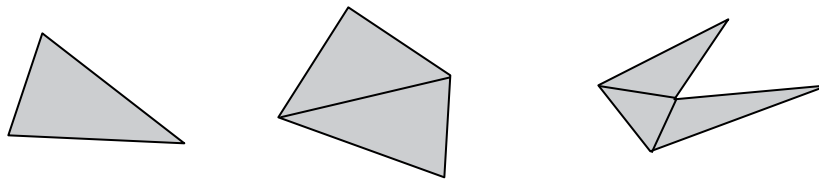


QED



**Theorem:** Every triangulation of  $P$  of  $n$  vertices consists of  $x$  triangles.

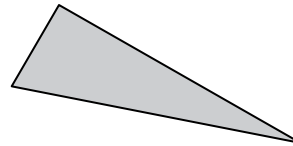
What's  $x$ ?



Conjecture:  $x = n - 2$

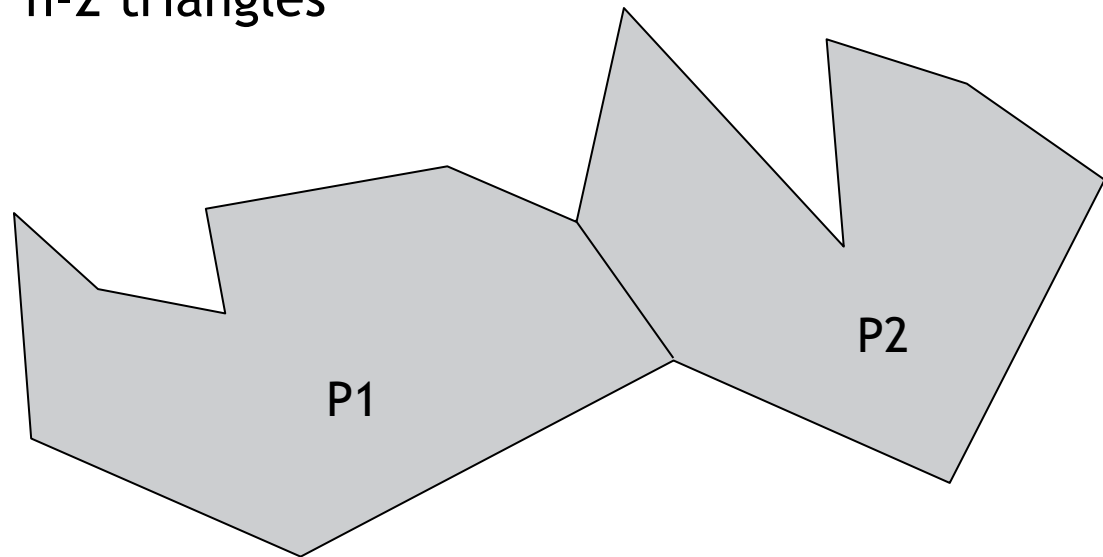
Proof by induction:

Base case ( $n = 3$ ):



Ind. hyp. ( $n < m$ ):  $n-2$  triangles

Ind. step ( $n=m$ ):



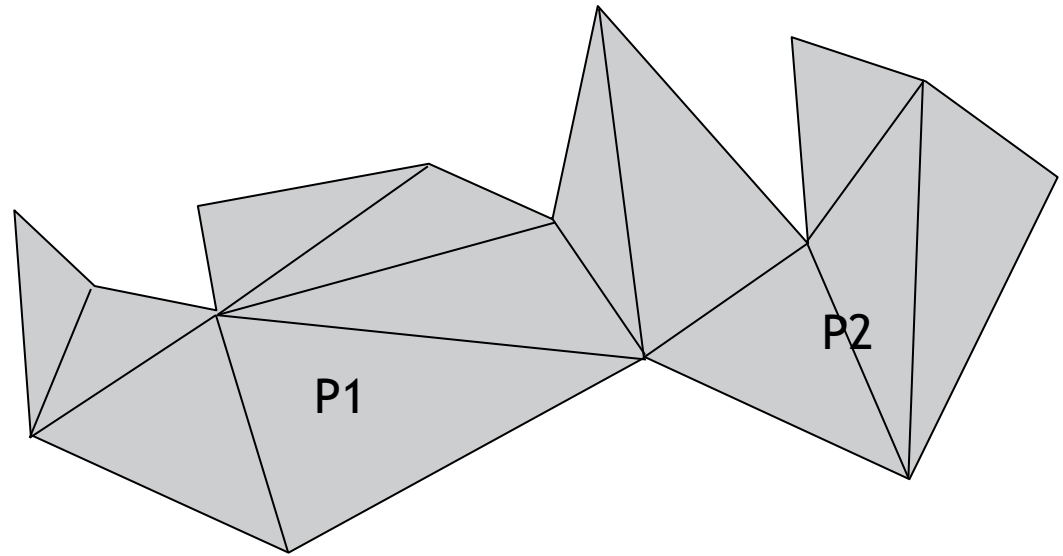


## Number of triangles

$$|P1| = m1 < n$$

$$|P2| = m2 < n$$

$$m1 + m2 = n + 2$$



According to ind. hyp.

#triangles in P1 is  $m1 - 2$

#triangles in P2 is  $m2 - 2$

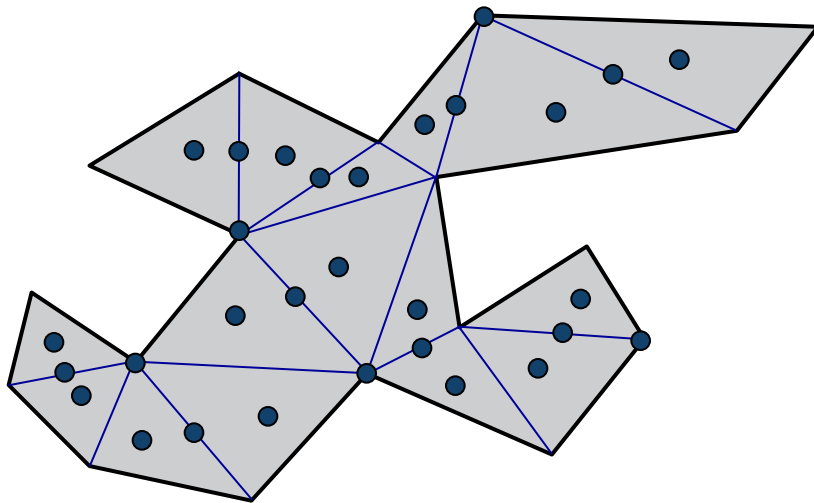
$$(m1 - 2) + (m2 - 2) = m1 + m2 - 4 = n - 2$$

QED

**Theorem:** Every triangulation of P consists of  $n - 2$  triangles.



## Back to the Art Gallery



$$G(n) \geq \lfloor n/3 \rfloor$$

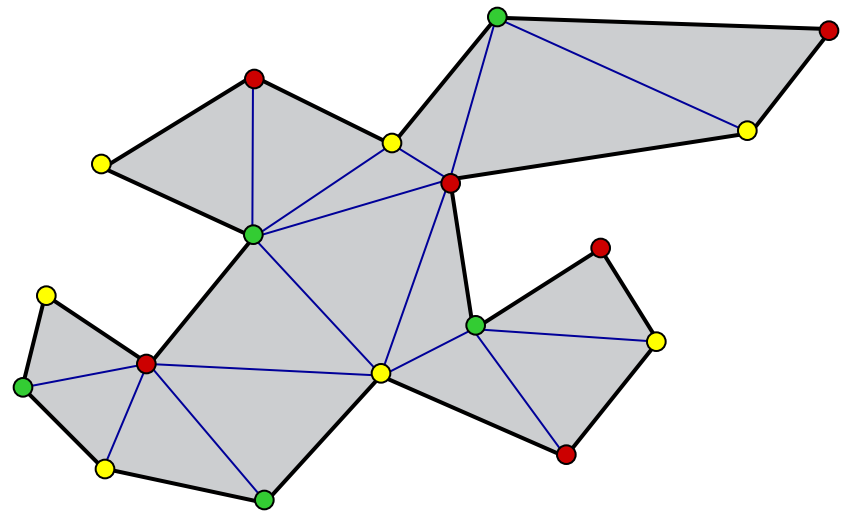
$$G(n) \leq \#guards = \#triangles = n-2$$

How do we place the guards?



**Idea:** Assign a colour to each vertex such that no two adjacent vertices have the same colour.

#yellow = 7  
#green = 5  
#red = 6

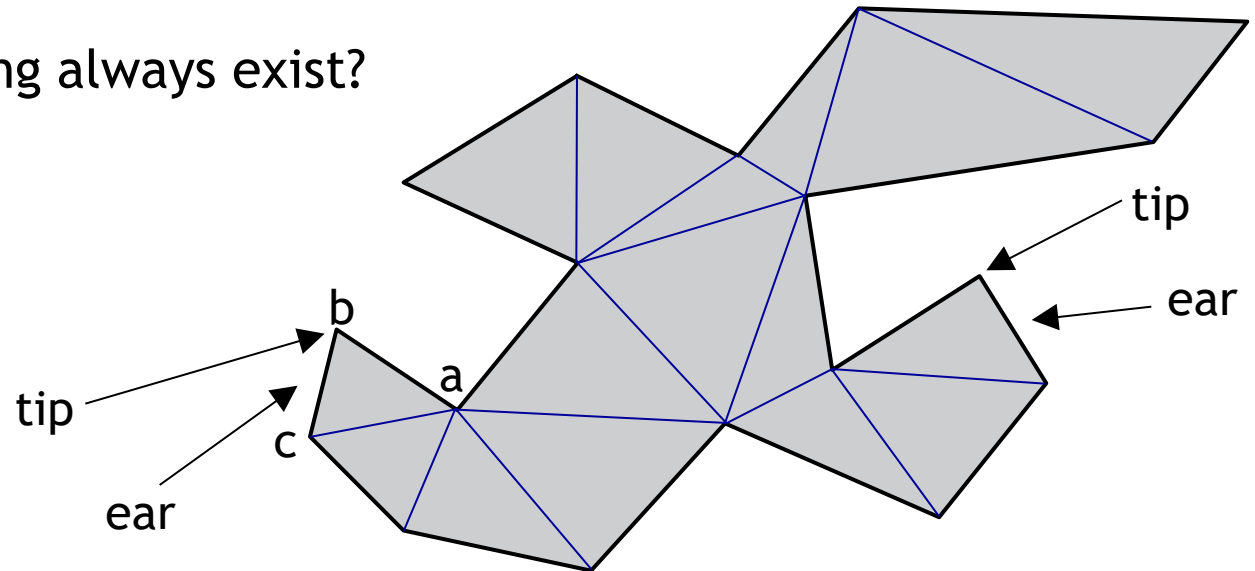


Place guards on the green vertices.

$\Rightarrow$  #guards  $\leq \lfloor n/3 \rfloor$       Why?



Does a 3-colouring always exist?



**Definition:** Three consecutive vertices  $a$ ,  $b$  and  $c$  of  $P$  form an ear of  $P$  if  $ac$  is a diagonal of  $P$ , where  $b$  is the ear tip.

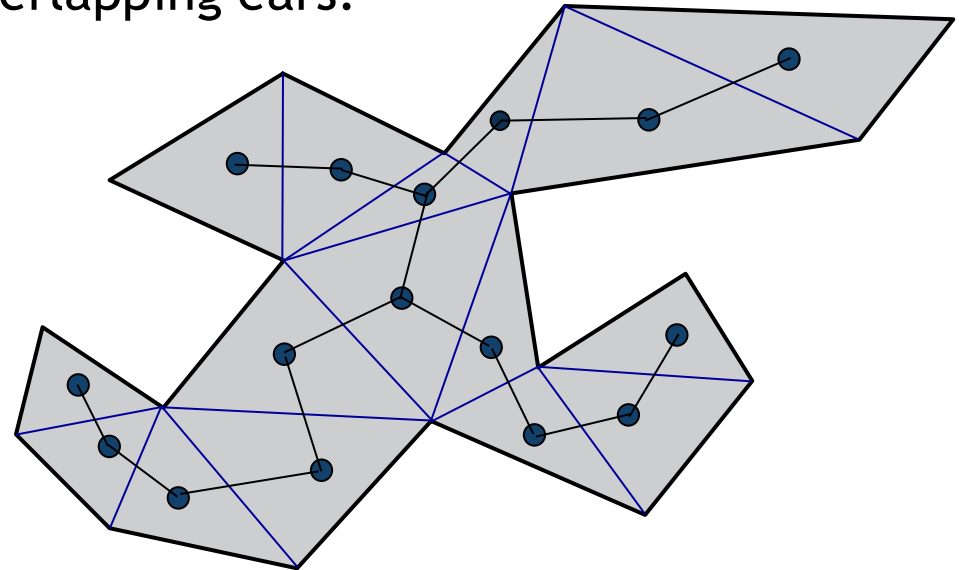




**Theorem:** Every polygon with  $n > 3$  vertices has at least two non-overlapping ears.

Consider the dual  $D(T)$  of the triangulation  $T$ .

$D(T)$  is a (binary) tree. Why?

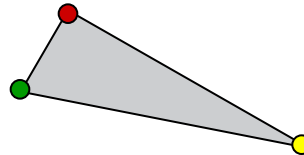


Every tree with at least two nodes has at least two vertices of degree 1  $\Rightarrow$   $T$  has at least two ears.

**Theorem:** The triangulation of a simple polygon can always be 3-coloured.

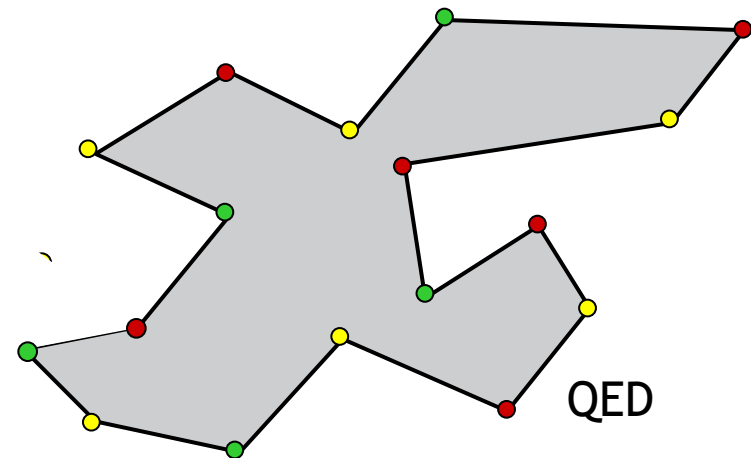
**Proof by induction:**

Base case ( $n=3$ ):



Ind. hyp. ( $n < m$ ):

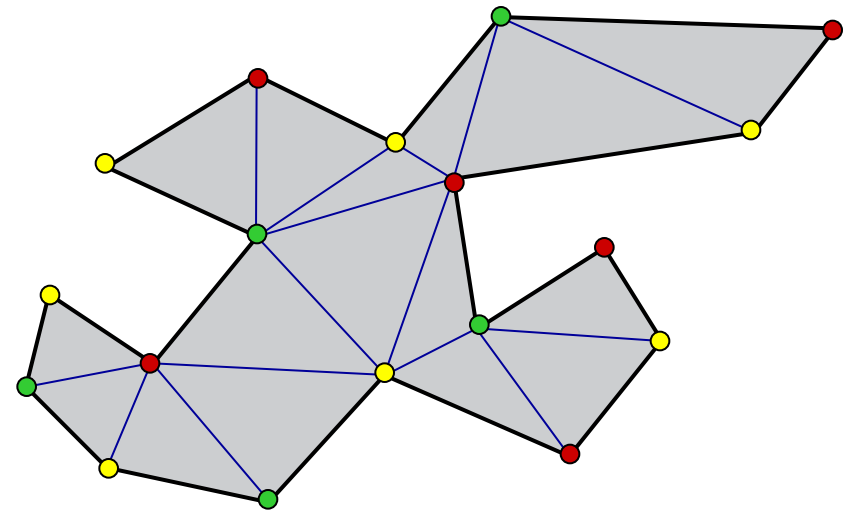
Ind. step ( $n=m$ ): Polygon has an ear.





## Theorem:

1. Every simple polygon can be triangulated.
2. The triangulation of a simple polygon can be 3-coloured.
3. Every simple polygon with  $n$  vertices can be guarded with  $\lfloor n/3 \rfloor$  guards.



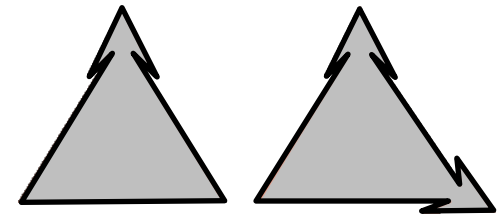
A triangulation exists but how can we compute it?

1. Construct a simple polygon  $P$  and a placement of guards such that the guards see every point of the perimeter of  $P$ , but there is at least one point interior to  $P$  not seen by any guard.
2. Construct a polygon  $P$  and a watchman route of a guard such that the guard sees the perimeter of  $P$  but there is at least one point interior to  $P$  not seen.

### 3. Open problem

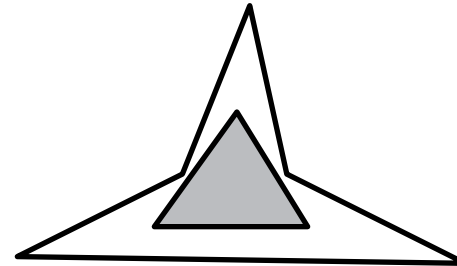
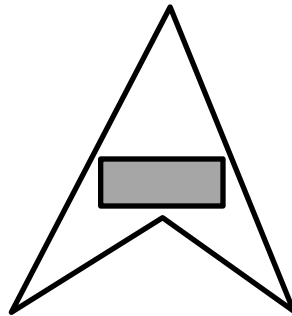
Conjecture by Toussaint'81:

Except for a few polygons,  $\lfloor n/4 \rfloor$  edge guards are always sufficient to guard any polygon with  $n$  vertices.





4. What about a polygon with  $n$  vertices and  $h$  holes?  
Shermer'82:  $\lfloor (n+h)/3 \rfloor$  guards are sometimes necessary.  
O'Rourke'82:  $\lfloor (n+2h)/3 \rfloor$  guards are always sufficient.  
**Conjecture:**  $\lfloor (n+h)/3 \rfloor$  is a tight bound.



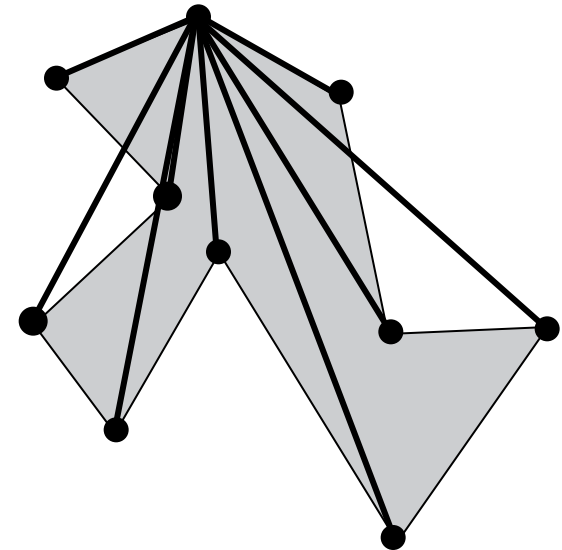
5. The problem of finding the smallest number of guards is NP-hard [Lee and Lin'86] and APX-hard [Eidenbenz'02]. There exists an  $O(\log n)$ -approximation algorithm for vertex guards with running time  $O(n^5)$ . [Gosh'10].

**Theorem:** Every polygon has a diagonal.

Testing a diagonal:  $O(n)$       Why?

**Algorithm 1:**

```
while P not triangulated do
  (x,y) := find_valid_diagonal(P)
  output (x,y)
```



**Time complexity:**

#iterations =  $O(n)$

#diagonals =  $O(n^2)$

Test a diagonal =  $O(n)$   $\Rightarrow O(n^4)$

**Theorem:** Every polygon has at least two non-overlapping ears.

## Algorithm 2:

while  $n > 3$  do

    locate a valid ear tip  $v_2$

    output diagonal  $(v_1, v_3)$

    delete  $v_2$  from  $P$

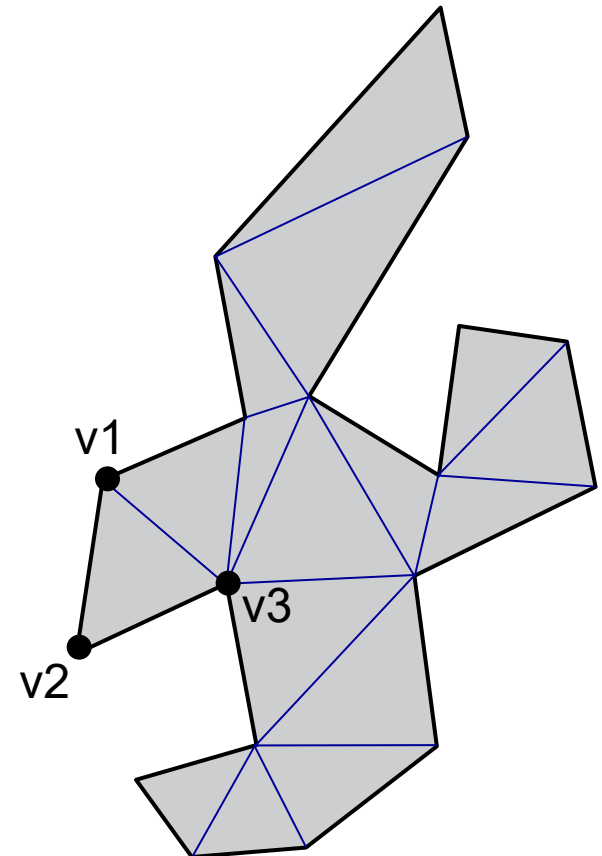
$n-3$

$O(n^2)$

$O(1)$

$O(1)$

Total:  $O(n^3)$



## Algorithm 3:

compute all valid ears  $S$

while  $n > 3$  do

    locate a valid ear tip  $v_2$

    output diagonal  $(v_1, v_3)$

    delete  $v_2$  from  $P$

    delete  $(v_0, v_1, v_2)$  from  $S$

    delete  $(v_2, v_3, v_4)$  from  $S$

    check ear  $(v_0, v_1, v_3)$

    check ear  $(v_1, v_3, v_4)$

$O(n^2)$

$n-3$

$O(1)$

$O(1)$

$O(1)$

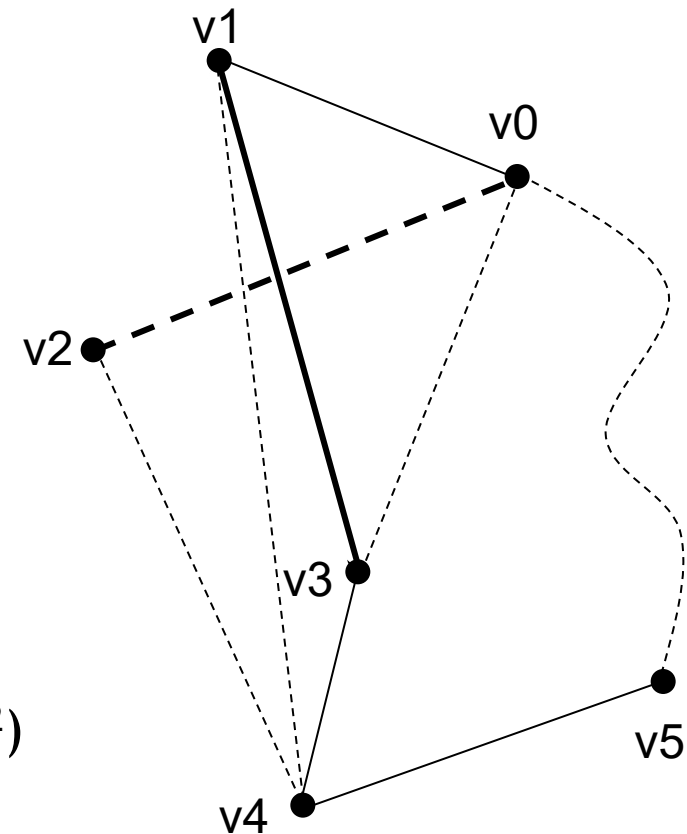
$O(n)$

$O(n)$

$O(n)$

$O(n)$

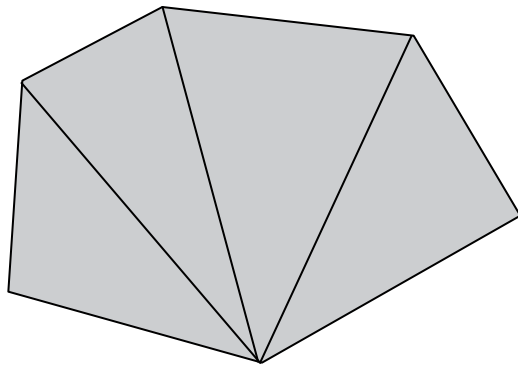
Total:  $O(n^2)$



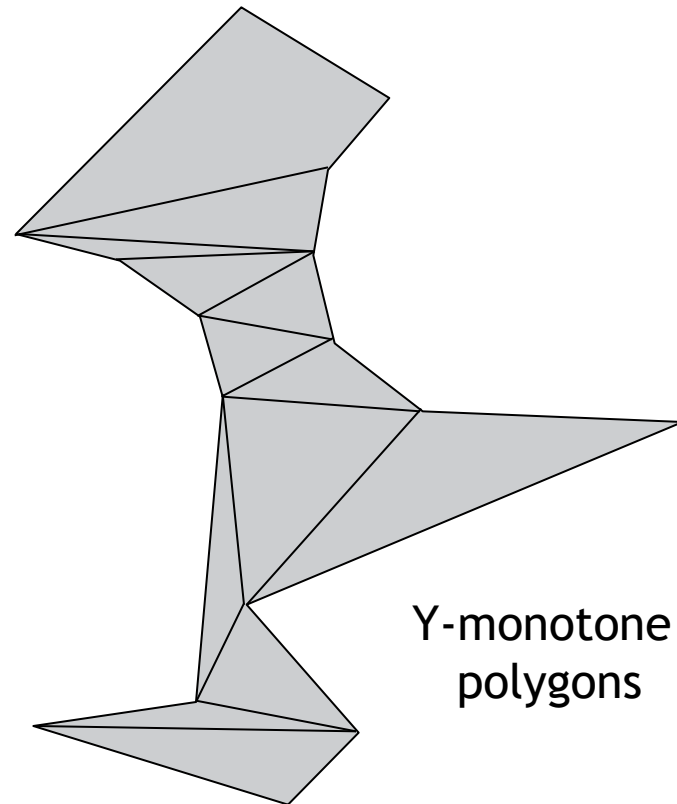




**Observation:** Some polygons are very easy to triangulate.



Convex polygons



Y-monotone  
polygons

## Algorithm 4: [Lecture 2]

Partition $P$ into $y$ -monotone pieces	$O(n \log n)$
Triangulate every $y$ -monotone polygon	$O(n)$

**Theorem:** Every simple polygon can be triangulated in  $O(n \log n)$  time.

- ›  $O(n \log n)$  time [Garey, Johnson, Preparata & Tarjan'78]
- ›  $O(n \log \log n)$  [Tarjan & van Wijk'88]
- ›  $O(n \log^* n)$  [Clarkson et al.'89]
- ›  $O(n)$  [Chazelle'91]
- ›  $O(n)$  randomised [Amato, Goodrich & Ramos'00]

Open problem: Is there a simple  $O(n)$ -time algorithm?

- Every simple polygon with  $n$  vertices can be decomposed into  $n-2$  triangles.
- Every triangulated simple polygon can be 3-colourable.
- Every simple polygon can be “guarded” by  $n/3$  guards, and  $n/3$  guards is sometimes necessary.
- To find a guard set our algorithm requires a triangulation.
  - $O(n^2)$  time algorithm
  - $O(n \log n)$  time algorithm [Lecture 2]

