

# Triangulation

**Efi Fogel**

Tel Aviv University 

Computational Geometry  
Mar. 3<sup>rd</sup>, 2014

# Outline

- 1 **Triangulation**
  - Polygon Terms and Definitions
  - The Art Gallery
  - Regularization and Triangulation
  - Literature



# Polygon Terms and Definitions

## Definition (Polygon)

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

## Theorem (Jordan Curve Theorem)

*If  $C$  is a simple closed curve in  $\mathbb{R}^2$ , then  $\mathbb{R}^2 \setminus C$  has two components (an "inside" and "outside"), with  $C$  the boundary of each.*

## Definition (Simple Polygon)

A polygon is said to be **simple** (or **Jordan**) if it is enclosed by a single closed polygonal chain that does not cross itself. In particular, the polygon edges are pairwise disjoint in their interior and the degree of all vertices is two.



## Polygon Terms & Definitions (Cont.)

The chain  $v_1, v_2, \dots, v_n$  defines a simple polygon iff

- 1 The segments  $s_1 = v_1 v_2, s_2 = v_2 v_3, \dots, s_{n-1} = v_{n-1} v_n, s_n = v_n v_1$  are disjoint in their interior.
  - 2 Consecutive segments intersect only in their endpoints. Namely  $s_i \cap s_{i+1} = v_{i+1}, i = 1, 2, \dots, n - 1$  and  $s_n \cap s_1 = v_1$
  - 3 Non adjacent segments do not intersect  $s_i \cap s_j = \emptyset, j > i + 1$ .
- $P$  — a simple polygon.
  - $\partial P$  — the boundary of  $P$ .
  - $\partial P \subseteq P$ ,  $P$  is closed and contains its boundary.
  - By convention the vertices of a polygon are ordered counterclockwise around the interior of the polygon.
    - Interior of polygon is to the left of the boundary.



# Outline

## 1 Triangulation

- Polygon Terms and Definitions
- **The Art Gallery**
- Regularization and Triangulation
- Literature

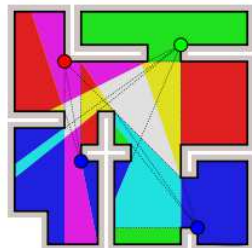


# Application: Art Gallery

## Application (Art Gallery)

*Given the floor plan of an art gallery modeled as a simple polygon with  $n$  vertices. Find out how many (and where) guards are needed to see the entire gallery, where each guard is stationed at a fixed point, has  $360^\circ$  vision, and cannot see through the walls.*

Problem posed to Vasek Chvatal by Victor Klee at a math conference in 1973. Chvatal solved it quickly with a complicated proof, which has since been simplified significantly using triangulation.



# Art Gallery: Lower Bound

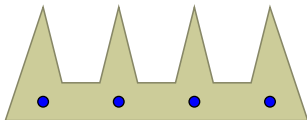
## Definition (Seeing)

A (guard) point  $p$  sees points  $q \in P$  if  $pq \subseteq P$ .

## Definition (Covering)

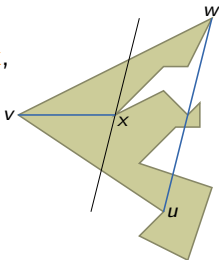
A set of guards  $G$  covers a polygon  $P$  if for any point  $p \in P$  there is a guard  $g \in G$  that sees  $p$ .

- $g(P)$  — minimum number of guards guarding  $P$ .
  - Cardinality of smallest set that covers  $P$ .
- $\mathcal{P}_n$  — set of all simple polygons with  $n$  vertices.
- $G(n) = \max_{P \in \mathcal{P}_n} g(P)$  — maximum number of guards needed to guard a simple polygon with  $n$  vertices.
- $G(n) \geq \lfloor n/3 \rfloor$



## Art Gallery: Upper Bound

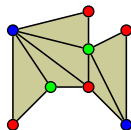
- A **diagonal** of a polygon  $P$  is a segment connecting two vertices of  $P$  that strictly see each other.
- A **triangulation** is a partition of  $P$  into triangles formed by repeatedly inserting diagonals into  $P$ .
- A vertex is **strictly convex** if its interior angle  $\alpha < \pi$ .
- The interior angle of a **reflex convex** is  $\alpha > \pi$ .
- Every polygon has at least one strictly **convex vertex**,
  - e.g., the lexicographically smallest vertex  $v$ .
- Every polygon with  $n > 3$  vertices has a diagonal.
- Every polygon may be partitioned into triangles by the addition of (0 or more) diagonals.
  - Proof by induction.
- $T$  — a triangulation of a polygon  $P$  of  $n$  vertices.
  - $T$  uses  $n - 3$  diagonals and consists of  $n - 2$  triangles.





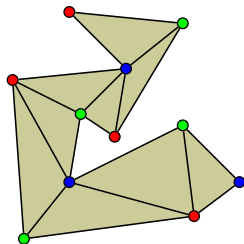
## Art Gallery: Upper Bound (Cont.)

- The dual of a triangulation  $T$  is a graph  $G(T)$  with a node associated with each triangle and an arc between two nodes iff their triangles share an edge.
- The dual graph  $G(T)$  is a tree with a vertex degree at most 3.
- 3 consecutive vertices  $u, v, w$ , form an ear if  $uw$  is a diagonal
  - $v$  is the ear tip.
- Every polygon of  $n > 3$  has at least 2 non-overlapping ears.
- The graph of the triangulation  $T(P)$  is three colorable.
- Every simple polygon  $P$  with  $n$  vertices can be guarded using  $\leq \lfloor n/3 \rfloor$  guards;  $G(n) \leq \lfloor n/3 \rfloor$ .
- Compute the triangulation of  $P$ .
- Compute a 3 coloring for  $T(P)$ .
- Choose the smallest set of vertices with the same color.
  - Its cardinality must be  $\leq \lfloor n/3 \rfloor$ .



# Art Gallery: Minimum Number of Guards

- A 3-coloring of the vertices yields 3 guards.
- However, the polygon can be guarded by only 2 guards.
- Finding the minimum number of guards is NP-hard.



## Problem (Art Gallery Decision)

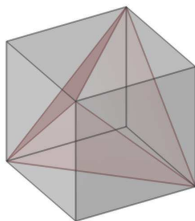
*Given both a polygon and a number  $k$ , determine whether the polygon can be guarded with  $k$  or fewer guards.*

- Even the decision problem and all of its standard variations (such as restricting the guard locations to vertices or edges of the polygon) is NP-hard.

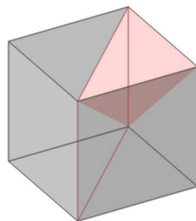


# Art Gallery in $\mathbb{R}^3$

- Even  $n$ -vertex guards do not suffice!
- Different triangulations can have different number of tetrahedra.
- Determining whether a polyhedron requires Steiner vertices for triangulation is NP-Complete.
  - Smallest example of a polyhedron that cannot be triangulated without adding new vertices. (Schoenhardt [1928]).
- Every 3D polyhedron with  $n$  vertices can be triangulated with  $O(n^2)$  tetrahedra. [Cha84]



5 tetrahedra



6 tetrahedra



# Outline

- 1 **Triangulation**
  - Polygon Terms and Definitions
  - The Art Gallery
  - **Regularization and Triangulation**
  - Literature



# Triangulation History

- Check all  $n^2$  choices for a diagonal, each in  $O(n)$  time. Repeat this  $n - 1$  times,  $O(n^4)$ .
- Find an ear in  $O(n)$  time; then recurse,  $O(n^2)$  time.
- First non-trivial algorithm:  $O(n \log n)$ . [GJP<sup>+</sup>78]
- A long series of papers and algorithms in 80s until Chazelle produced an optimal  $O(n)$  algorithm. [Cha91]
- Linear time algorithm insanely complicated; there are randomized, expected linear time algorithm that are more accessible.



# Regularization and Triangulation Algorithm Outline

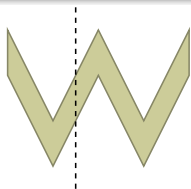
## Definition (Monotone Polygonal Chain)

A polygonal chain  $C$  is **monotone** w.r.t. line  $L$  if any line orthogonal to  $L$  intersects  $C$  in at most one point.

## Definition (Monotone Polygon)

A polygon is monotone w.r.t.  $L$  if it can be decomposed into two chains, each monotone w.r.t.  $L$ .

- Partition polygon into trapezoids.
- Use trapezoids to make a monotone subdivision.
- Triangulate each monotone piece.



[GJP<sup>+</sup>78]

An  $x$ -monotone polygon

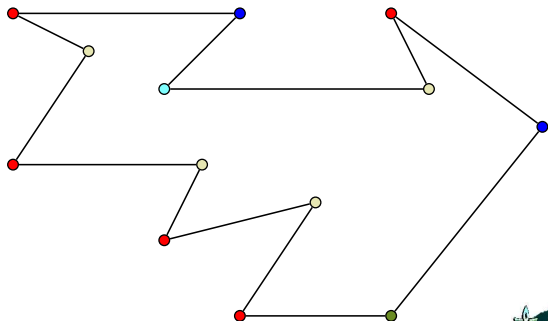


# Partitioning a Polygon into Monotone Pieces

- At each vertex, extend vertical line until it hits a polygon edge.
  - Each face of this decomposition is a pseudo trapezoid.
- Use plane sweep algorithm.
  - Time complexity is  $O(n \log n)$ .
- For each split (resp. merge) vertex  $v$ , add a diagonal that connects  $v$  to the vertex of its left (resp. right) trapezoid.

## Vertex Ontology

- ① ○ — merge vertex
- ② ○ — split vertex
- ③ ● — start vertex
- ④ ● — end vertex
- ⑤ ● — regular vertex

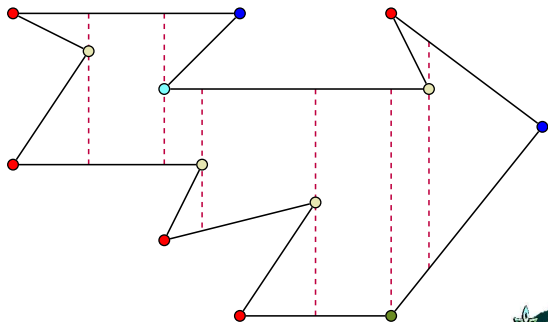


# Partitioning a Polygon into Monotone Pieces

- At each vertex, extend vertical line until it hits a polygon edge.
  - Each face of this decomposition is a pseudo trapezoid.
- Use plane sweep algorithm.
  - Time complexity is  $O(n \log n)$ .
- For each split (resp. merge) vertex  $v$ , add a diagonal that connects  $v$  to the vertex of its left (resp. right) trapezoid.

## Vertex Ontology

- ① ○ — merge vertex
- ② ○ — split vertex
- ③ ● — start vertex
- ④ ● — end vertex
- ⑤ ● — regular vertex



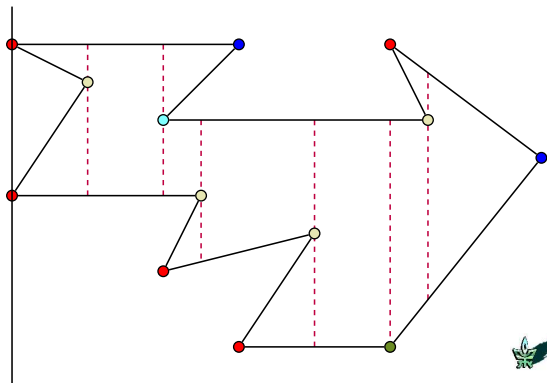


# Partitioning a Polygon into Monotone Pieces

- At each vertex, extend vertical line until it hits a polygon edge.
  - Each face of this decomposition is a pseudo trapezoid.
- Use plane sweep algorithm.
  - Time complexity is  $O(n \log n)$ .
- For each split (resp. merge) vertex  $v$ , add a diagonal that connects  $v$  to the vertex of its left (resp. right) trapezoid.

## Vertex Ontology

- ① ● — merge vertex
- ② ● — split vertex
- ③ ● — start vertex
- ④ ● — end vertex
- ⑤ ● — regular vertex

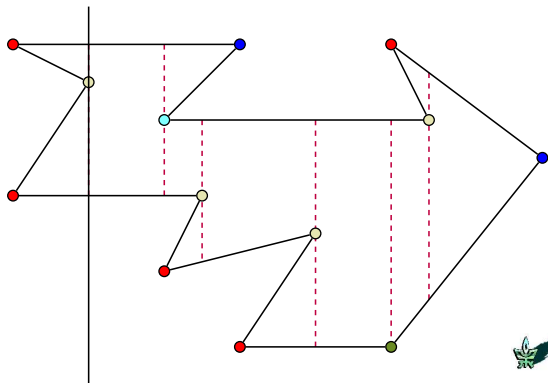


# Partitioning a Polygon into Monotone Pieces

- At each vertex, extend vertical line until it hits a polygon edge.
  - Each face of this decomposition is a pseudo trapezoid.
- Use plane sweep algorithm.
  - Time complexity is  $O(n \log n)$ .
- For each split (resp. merge) vertex  $v$ , add a diagonal that connects  $v$  to the vertex of its left (resp. right) trapezoid.

## Vertex Ontology

- ① ○ — merge vertex
- ② ○ — split vertex
- ③ ● — start vertex
- ④ ● — end vertex
- ⑤ ● — regular vertex

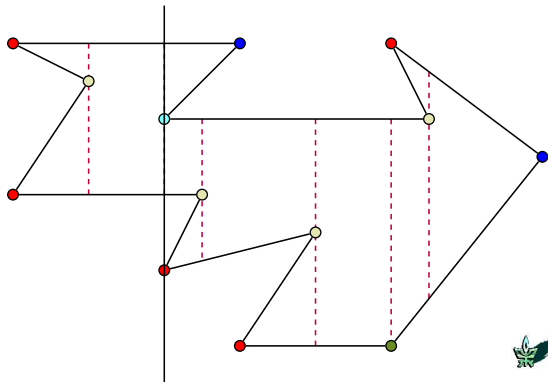


# Partitioning a Polygon into Monotone Pieces

- At each vertex, extend vertical line until it hits a polygon edge.
  - Each face of this decomposition is a pseudo trapezoid.
- Use plane sweep algorithm.
  - Time complexity is  $O(n \log n)$ .
- For each split (resp. merge) vertex  $v$ , add a diagonal that connects  $v$  to the vertex of its left (resp. right) trapezoid.

## Vertex Ontology

- ① ○ — merge vertex
- ② ○ — split vertex
- ③ ● — start vertex
- ④ ● — end vertex
- ⑤ ● — regular vertex

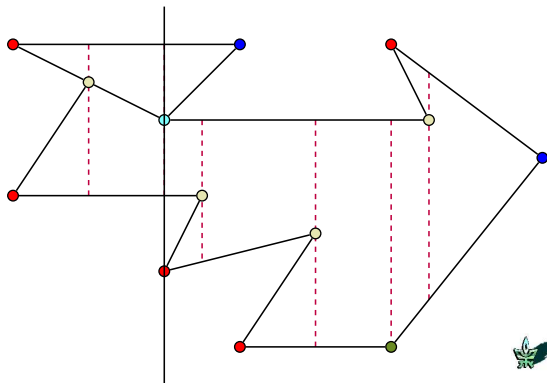


# Partitioning a Polygon into Monotone Pieces

- At each vertex, extend vertical line until it hits a polygon edge.
  - Each face of this decomposition is a pseudo trapezoid.
- Use plane sweep algorithm.
  - Time complexity is  $O(n \log n)$ .
- For each split (resp. merge) vertex  $v$ , add a diagonal that connects  $v$  to the vertex of its left (resp. right) trapezoid.

## Vertex Ontology

- ① ○ — merge vertex
- ② ○ — split vertex
- ③ ● — start vertex
- ④ ● — end vertex
- ⑤ ● — regular vertex

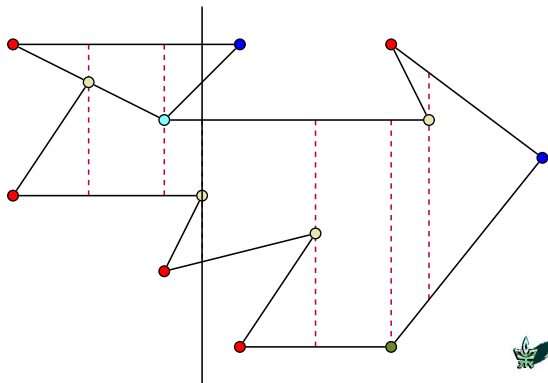


# Partitioning a Polygon into Monotone Pieces

- At each vertex, extend vertical line until it hits a polygon edge.
  - Each face of this decomposition is a pseudo trapezoid.
- Use plane sweep algorithm.
  - Time complexity is  $O(n \log n)$ .
- For each split (resp. merge) vertex  $v$ , add a diagonal that connects  $v$  to the vertex of its left (resp. right) trapezoid.

## Vertex Ontology

- ① ○ — merge vertex
- ② ○ — split vertex
- ③ ● — start vertex
- ④ ● — end vertex
- ⑤ ● — regular vertex

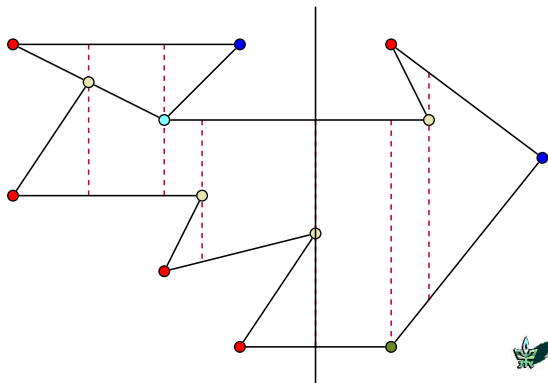


# Partitioning a Polygon into Monotone Pieces

- At each vertex, extend vertical line until it hits a polygon edge.
  - Each face of this decomposition is a pseudo trapezoid.
- Use plane sweep algorithm.
  - Time complexity is  $O(n \log n)$ .
- For each split (resp. merge) vertex  $v$ , add a diagonal that connects  $v$  to the vertex of its left (resp. right) trapezoid.

## Vertex Ontology

- ① ○ — merge vertex
- ② ○ — split vertex
- ③ ● — start vertex
- ④ ● — end vertex
- ⑤ ● — regular vertex

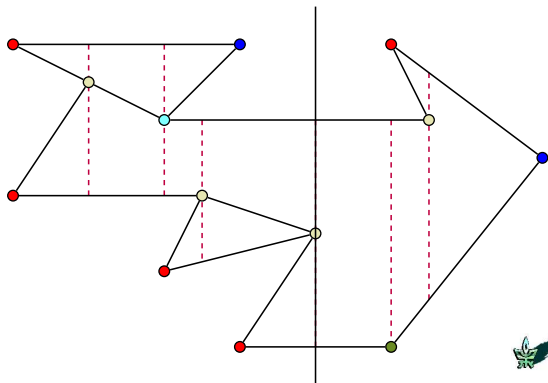


# Partitioning a Polygon into Monotone Pieces

- At each vertex, extend vertical line until it hits a polygon edge.
  - Each face of this decomposition is a pseudo trapezoid.
- Use plane sweep algorithm.
  - Time complexity is  $O(n \log n)$ .
- For each split (resp. merge) vertex  $v$ , add a diagonal that connects  $v$  to the vertex of its left (resp. right) trapezoid.

## Vertex Ontology

- ① ● — merge vertex
- ② ● — split vertex
- ③ ● — start vertex
- ④ ● — end vertex
- ⑤ ● — regular vertex

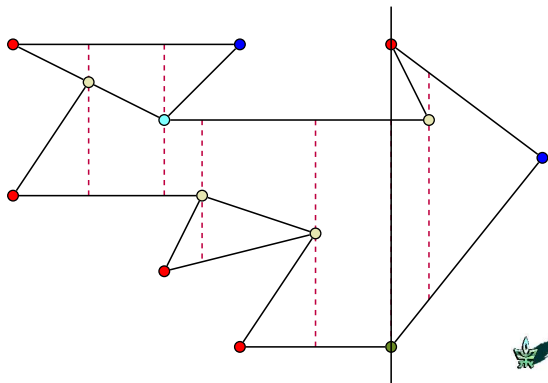


# Partitioning a Polygon into Monotone Pieces

- At each vertex, extend vertical line until it hits a polygon edge.
  - Each face of this decomposition is a pseudo trapezoid.
- Use plane sweep algorithm.
  - Time complexity is  $O(n \log n)$ .
- For each split (resp. merge) vertex  $v$ , add a diagonal that connects  $v$  to the vertex of its left (resp. right) trapezoid.

## Vertex Ontology

- ① ● — merge vertex
- ② ● — split vertex
- ③ ● — start vertex
- ④ ● — end vertex
- ⑤ ● — regular vertex



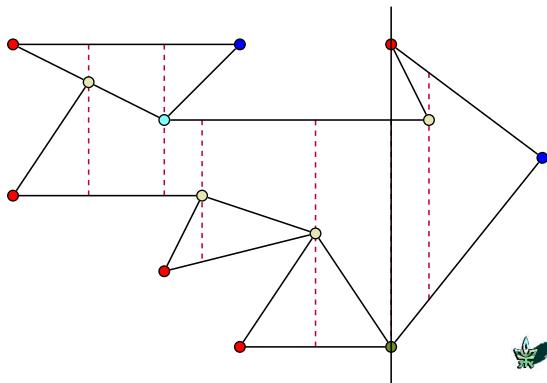


# Partitioning a Polygon into Monotone Pieces

- At each vertex, extend vertical line until it hits a polygon edge.
  - Each face of this decomposition is a pseudo trapezoid.
- Use plane sweep algorithm.
  - Time complexity is  $O(n \log n)$ .
- For each split (resp. merge) vertex  $v$ , add a diagonal that connects  $v$  to the vertex of its left (resp. right) trapezoid.

## Vertex Ontology

- ① ○ — merge vertex
- ② ○ — split vertex
- ③ ● — start vertex
- ④ ● — end vertex
- ⑤ ● — regular vertex

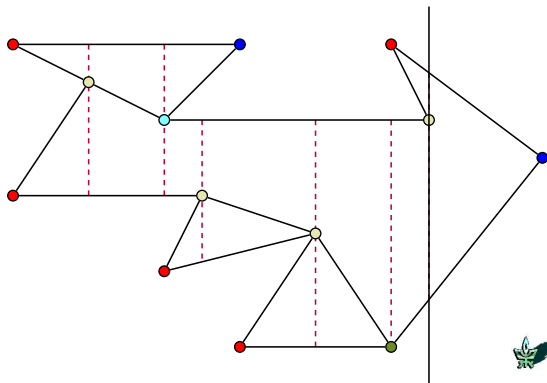


# Partitioning a Polygon into Monotone Pieces

- At each vertex, extend vertical line until it hits a polygon edge.
  - Each face of this decomposition is a pseudo trapezoid.
- Use plane sweep algorithm.
  - Time complexity is  $O(n \log n)$ .
- For each split (resp. merge) vertex  $v$ , add a diagonal that connects  $v$  to the vertex of its left (resp. right) trapezoid.

## Vertex Ontology

- ① ○ — merge vertex
- ② ○ — split vertex
- ③ ● — start vertex
- ④ ● — end vertex
- ⑤ ● — regular vertex

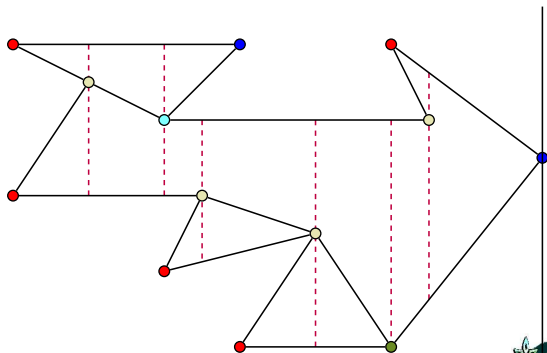


# Partitioning a Polygon into Monotone Pieces

- At each vertex, extend vertical line until it hits a polygon edge.
  - Each face of this decomposition is a pseudo trapezoid.
- Use plane sweep algorithm.
  - Time complexity is  $O(n \log n)$ .
- For each split (resp. merge) vertex  $v$ , add a diagonal that connects  $v$  to the vertex of its left (resp. right) trapezoid.

## Vertex Ontology

- ① ○ — merge vertex
- ② ○ — split vertex
- ③ ● — start vertex
- ④ ● — end vertex
- ⑤ ● — regular vertex

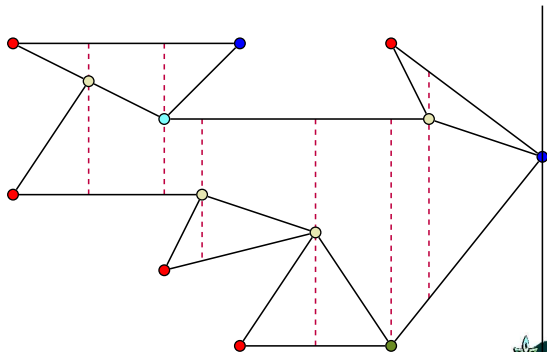


# Partitioning a Polygon into Monotone Pieces

- At each vertex, extend vertical line until it hits a polygon edge.
  - Each face of this decomposition is a pseudo trapezoid.
- Use plane sweep algorithm.
  - Time complexity is  $O(n \log n)$ .
- For each split (resp. merge) vertex  $v$ , add a diagonal that connects  $v$  to the vertex of its left (resp. right) trapezoid.

## Vertex Ontology

- ① ○ — merge vertex
- ② ○ — split vertex
- ③ ● — start vertex
- ④ ● — end vertex
- ⑤ ● — regular vertex



# Regularization and Triangulation Algorithm Proof

## Lemma ( $x$ -monotone)

A polygon is  $x$ -monotone if it has no split vertices and no merge vertices.

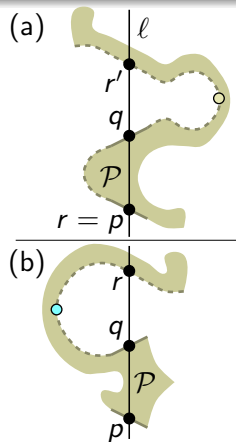
- Suppose  $P$  is a non  $x$ -monotone polygon.
- We have to prove that  $P$  contains a split or a merge vertex.

$q$  — the top endpoint of  $l \cap P$ .

$p$  — the bottom endpoint of  $l \cap P$ .

$r$  — the first intersection of  $l$  with  $\partial P$  starting at  $q$  going counterclockwise.

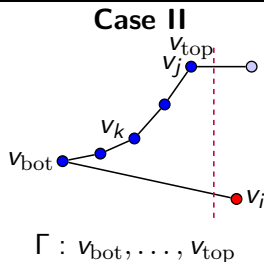
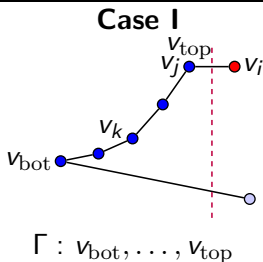
- There are two cases
  - (a)  $p = r \Rightarrow \exists$  merge vertex
  - (b)  $p \neq r \Rightarrow \exists$  split vertex



# Triangulating Monotone Polygons

Triangulate a monotone polygon  $P$  on  $n$  vertices.

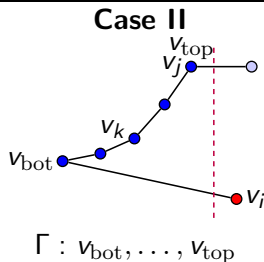
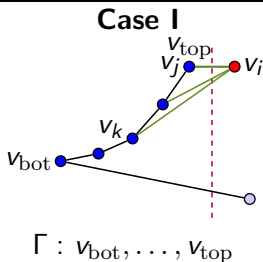
1. Sort the vertices in lexicographically increasing order to yield  $v_1, v_2, \dots, v_n$
2. Initialize a stack  $\Gamma$ , push( $\Gamma, v_1, v_2$ ).
3. **for**  $i = 3, \dots, n$  **do**
4.     **if**  $v_i$  and  $v_j = \text{top}(\Gamma)$  on same chain
5.     I { Add diagonals  $v_i v_j, \dots, v_i v_k$ , where  $v_k$  is last to admit legal diagonal.
6.     I {  $v_{k+1}, \dots, v_j = \text{pop}(\Gamma)$ .
7.     I { push( $\Gamma, v_i$ ).
8.     **else**
9.     II { Add diagonals from  $v_i$  to all vertices on stack.
10.    II {  $v_j = \text{pop}(\Gamma)$ .
11.    II { clear( $\Gamma$ ).
12.    II { push( $\Gamma, v_j, v_i$ ).



# Triangulating Monotone Polygons

Triangulate a monotone polygon  $P$  on  $n$  vertices.

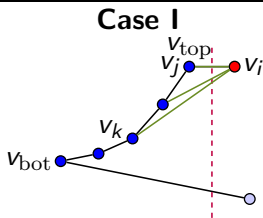
1. Sort the vertices in lexicographically increasing order to yield  $v_1, v_2, \dots, v_n$
2. Initialize a stack  $\Gamma$ , push( $\Gamma, v_1, v_2$ ).
3. **for**  $i = 3, \dots, n$  **do**
4.     **if**  $v_i$  and  $v_j = \text{top}(\Gamma)$  on same chain
5.     I { Add diagonals  $v_i v_j, \dots, v_i v_k$ , where  $v_k$  is last to admit legal diagonal.
6.     I {  $v_{k+1}, \dots, v_j = \text{pop}(\Gamma)$ .
7.     I { push( $\Gamma, v_i$ ).
8.     **else**
9.     II { Add diagonals from  $v_i$  to all vertices on stack.
10.    II {  $v_j = \text{pop}(\Gamma)$ .
11.    II { clear( $\Gamma$ ).
12.    II { push( $\Gamma, v_j, v_i$ ).



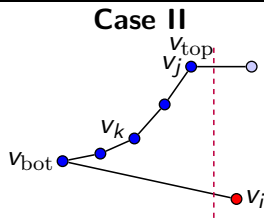
# Triangulating Monotone Polygons

Triangulate a monotone polygon  $P$  on  $n$  vertices.

1. Sort the vertices in lexicographically increasing order to yield  $v_1, v_2, \dots, v_n$
2. Initialize a stack  $\Gamma$ , push( $\Gamma, v_1, v_2$ ).
3. **for**  $i = 3, \dots, n$  **do**
4.     **if**  $v_i$  and  $v_j = \text{top}(\Gamma)$  on same chain
5.     I { Add diagonals  $v_i v_j, \dots, v_i v_k$ , where  $v_k$  is last to admit legal diagonal.
6.     I {  $v_{k+1}, \dots, v_j = \text{pop}(\Gamma)$ .
7.     I { push( $\Gamma, v_i$ ).
8.     **else**
9.     II { Add diagonals from  $v_i$  to all vertices on stack.
10.    II {  $v_j = \text{pop}(\Gamma)$ .
11.    II { clear( $\Gamma$ ).
12.    II { push( $\Gamma, v_j, v_i$ ).



$\Gamma : v_{\text{bot}}, \dots, v_k, v_i$



$\Gamma : v_{\text{bot}}, \dots, v_{\text{top}}$

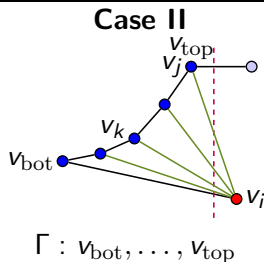
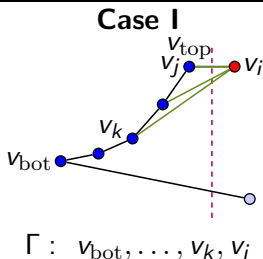




# Triangulating Monotone Polygons

Triangulate a monotone polygon  $P$  on  $n$  vertices.

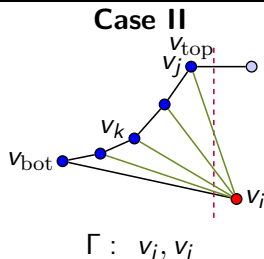
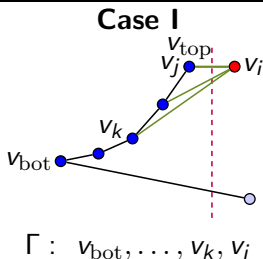
1. Sort the vertices in lexicographically increasing order to yield  $v_1, v_2, \dots, v_n$
2. Initialize a stack  $\Gamma$ , push( $\Gamma, v_1, v_2$ ).
3. **for**  $i = 3, \dots, n$  **do**
4.     **if**  $v_i$  and  $v_j = \text{top}(\Gamma)$  on same chain
5.     I { Add diagonals  $v_i v_j, \dots, v_i v_k$ , where  $v_k$  is last to admit legal diagonal.
6.     I {  $v_{k+1}, \dots, v_j = \text{pop}(\Gamma)$ .
7.     I { push( $\Gamma, v_i$ ).
8.     **else**
9.     II { Add diagonals from  $v_i$  to all vertices on stack.
10.    II {  $v_j = \text{pop}(\Gamma)$ .
11.    II { clear( $\Gamma$ ).
12.    II { push( $\Gamma, v_j, v_i$ ).



# Triangulating Monotone Polygons

Triangulate a monotone polygon  $P$  on  $n$  vertices.

1. Sort the vertices in lexicographically increasing order to yield  $v_1, v_2, \dots, v_n$
2. Initialize a stack  $\Gamma$ , push( $\Gamma, v_1, v_2$ ).
3. **for**  $i = 3, \dots, n$  **do**
4.     **if**  $v_i$  and  $v_j = \text{top}(\Gamma)$  on same chain
5.     I { Add diagonals  $v_i v_j, \dots, v_i v_k$ , where  $v_k$  is last to admit legal diagonal.
6.     I {  $v_{k+1}, \dots, v_j = \text{pop}(\Gamma)$ .
7.     I { push( $\Gamma, v_i$ ).
8.     **else**
9.     II { Add diagonals from  $v_i$  to all vertices on stack.
10.    II {  $v_j = \text{pop}(\Gamma)$ .
11.    II { clear( $\Gamma$ ).
12.    II { push( $\Gamma, v_j, v_i$ ).



# Regularization and Triangulation Algorithm Complexity

- Regularization via plane sweep takes  $O(n \log n)$  time.
- Triangulation
  - Sorting by merging the two monotone chains of  $P$  takes  $O(n)$  time.
  - A vertex is added to stack once. Once it's visited during a scan, it's removed from the stack.
  - In each step, at least one diagonal is added; or the reflex stack chain is extended by one vertex.
  - Triangulating a monotone polygon takes  $O(n)$  time.
- Total time for polygon triangulation is therefore  $O(n \log n)$ .










# Outline

## 1 Triangulation

- Polygon Terms and Definitions
- The Art Gallery
- Regularization and Triangulation
- Literature



# Triangulation Bibliography I

-  B. Chazelle.  
Triangulating a Simple Polygon in Linear Time.  
*Discrete and Computational Geometry*, 6:485–524,1991.
-  M. R. Garey, D. S. Johnson, F. P. Preparata, and R. E. Tarjan.  
Triangulating a Simple Polygon.  
*Information Processing Letter*, 7(4): 175-180, 1978.
-  R. E. Tarjan and C. J. van Wyk.  
An  $O(n \log \log(n))$  Time Algorithm for Triangulating a Simple Polygon.  
*SIAM Journal of Computing*, 17(1):143-178, 1988.
-  Mark de Berg, Mark van Kreveld, Mark H. Overmars, and Otfried Cheong.  
*Computational Geometry: Algorithms and Applications*.  
Springer, 3<sup>rd</sup> edition, 2008. Chapter 3: Polygon Triangulation.
-  Alexey V. Skvortsov, Yuri L. Kostyuk  
Efficient algorithms for Delaunay triangulation.  
*Geoinformatics. Theory and practice (Tomsk State University) 1*: 22–47, 1998.
-  Bernard Chazelle.  
Convex partitions of polyhedra: a lower bound and worst-case optimal algorithm.  
*SIAM Journal on Computing*, 13:488–507, 1984.
-  Michael J. Laszlo.  
*Computational Geometry and Computer Graphics in C++*.  
Prentice-Hall, 1996

