### **CS271 Computer Graphics II**

Lecture 4

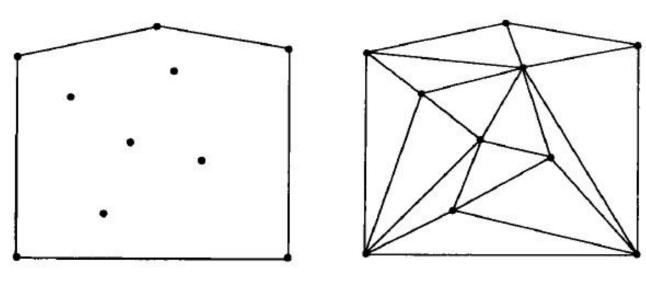
Computational Geometry – Delaunay

### Overview

- Triangulation
- Delaunay Triangulation
- Constrained Delaunay Triangulation
- 3D Delaunay Triangulation

## Triangulation

Triangulation for a point set  $P = \{p_1, p_2, ..., p_n\}$  is a division for the area  $\omega$ , which contains P.  $\omega$  can be any polygon area. If not given, the convex hull of P is  $\omega$ .



 $\omega$  is the convex hull of P

A triangulation of P

### Triangulation

Triangulation for a point set  $P = \{p_1, p_2, ..., p_n\}$  is a division for the area  $\omega$ , which contains P.  $\omega$  can be any polygon area. If not given, the convex hull of P is  $\omega$ .

#### Requirements

- Divide  $\omega$  into triangles.
- All the vertices of triangles belong to P and the boundary of  $\omega$ , and all the points of P and vertices of the boundary of  $\omega$  are the vertices of triangles.
- All the triangles only share edges and vertices.
- Each point in the triangle must belong to  $\omega$  and each point in  $\omega$  must belong to a triangle.

## Properties of Triangulation

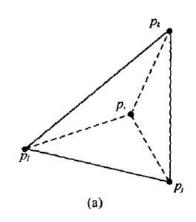
For the triangulation of the point set  $P = \{p_1, p_2, ..., p_n\}$ , the number of triangles t, vertices v, and edges e have the following relationship.

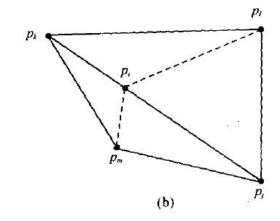
- t = e v + 1
- $e \le 3v 6$
- $t \le 2v 5$

According to the *Euler's formula* (v - e + f = 2) of the planar graph

### Construction of Triangulation

- *Input*: point set  $P = \{p_1, p_2, ..., p_n\}$
- *Output:* triangulation of P: T(P)
- 1. compute the convex hull CH(P);
- 2. compute a triangulation of CH(P);
- 3. for (point  $p_i \in P \cap p_i \in CH(P)$ ) {
- 4. find the located triangle  $\Delta p_l p_j p_k \in T$ ;
- 5. if  $p_i$  is inside  $\Delta p_l p_j p_k$ , link  $p_i$  to  $p_l$ ,  $p_j$ ,  $p_k$  and get new T;
- 6. if  $p_i$  is on the edge  $p_l p_j$  of  $\Delta p_l p_j p_k$ , link  $p_i$  to  $p_k$  and link  $p_i$  to  $p_m$  if  $\Delta p_l p_j p_m$  exists, and get new T;
- **7.** }

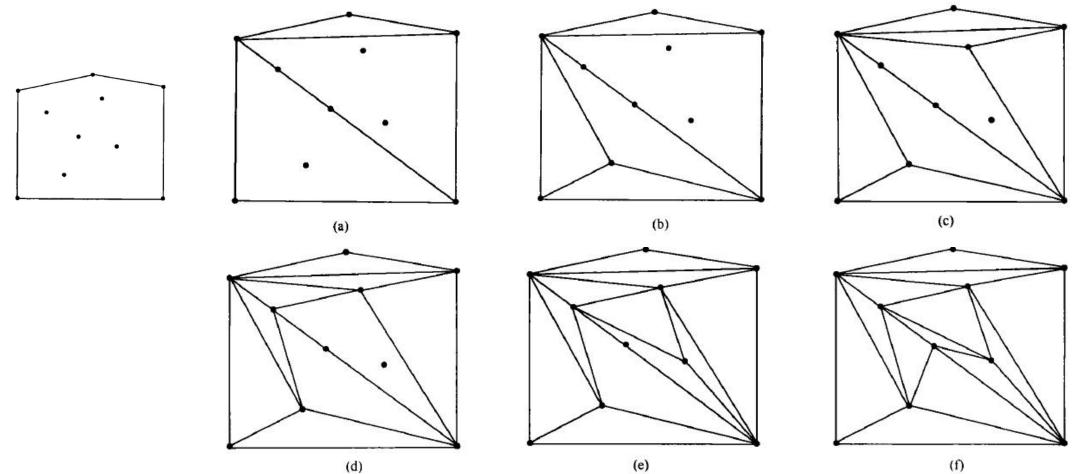




## Triangulation

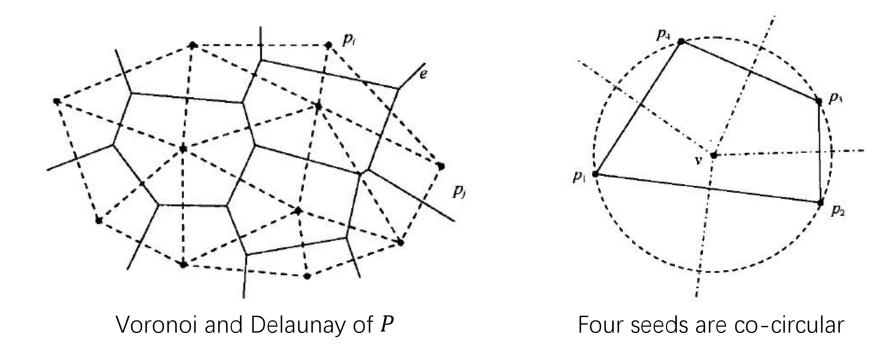
The result depends on the triangulation methods and the sequence of adding points.

### Example



### **Delaunay Triangulation**

For a point set  $P = \{p_1, p_2, ..., p_n\}$ , construct the VD(P). If we link each two seeds, which have shared Voronoi edge, we can get the dual diagram – **Delaunay diagram**.



If there is no degenerate case, we get Delaunay Triangulation DT(P).

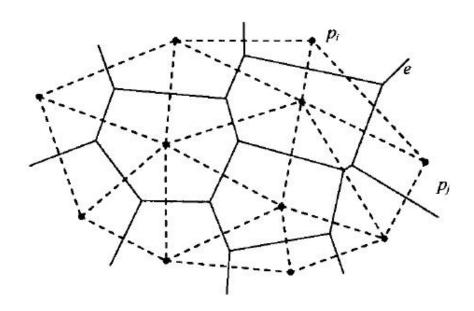
## Voronoi and Delaunay Triangulation

The vertices of DT(P)  $\Longrightarrow$  The facets of VD(P)

The triangles of DT(P)  $\Longrightarrow$  The vertices of VD(P)

The edges of DT(P)  $\Longrightarrow$  The edges of VD(P)

The boundary of DT(P)  $\Longrightarrow$  The convex hull of P  $\Longrightarrow$  The seeds of VD(P) with open area



### Properties of Delaunay Triangulation

- 1. DT(P) has  $\leq 3n 6$  edges and  $\leq 2n 5$  Delaunay triangles.
- 2. For two points  $p_i$  and  $p_j$  of P,  $p_i p_j$  is one edge of DT(P) if and only if there exists an empty circle only passing  $p_i$  and  $p_j$ .

The trajectory of the center of the empty circle only passing  $p_i$ and  $p_j$  form the Voronoi edge.  $B(p_i,p_j)$ 

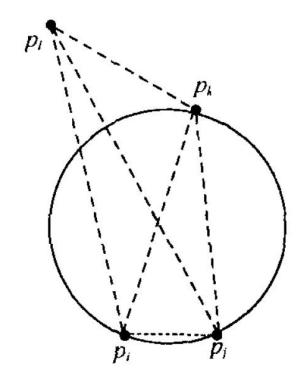
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- 3. For the point  $p_i$ , there must be a DT(P) edge between  $p_i$  and its nearest point in P.
- 4. The point  $p_i$ ,  $p_j$  and  $p_k$  is the vertices of a Delaunay triangle if and only if there exists an empty circle only passing  $p_i$ ,  $p_j$  and  $p_k$ .
- 5. There is no other points inside a Delaunay triangle.
- 6. For any four points, compared with other triangulation methods, the two Delaunay triangles have the property the minimum angle is the maximum.

### Properties of Delaunay Triangulation

For any four points, compared with other triangulation methods, the two Delaunay triangles have the property – the minimum angle is the maximum.

Prove by the relation between the angle of circumference and the arc.



## Theorem of Delaunay Triangulation

If no four points in P are co-circular, the Delaunay diagram of P is the Delaunay Triangulation DT(P).

## Edge flipping algorithm

**Legal edge:** the diagonal  $p_i p_k$  of a convex tetragon meets the minimum angle is the maximum.

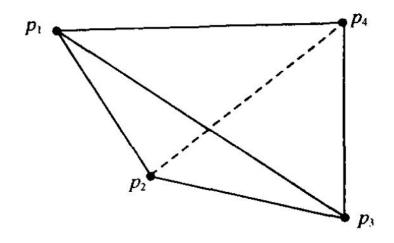
Legal triangulation: all the edges of the triangulation are legal edges.

#### **Theorem**

T(P) is a legal triangulation if and only if it is a Delaunay Triangulation.

## Edge flipping algorithm

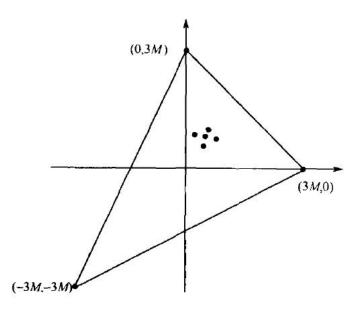
- *Input*: point set  $P = \{p_1, p_2, ..., p_n\}$
- *Output: DT*(*P*)
- 1. compute any a triangulation T(P);
- 2. While (there exists illegal edge  $p_i p_j$ ) {
- 3. assume there are two neighbor triangles  $\Delta p_i p_j p_k$  and  $\Delta p_i p_j p_l$ ,
- 4. replace  $p_i p_j$  by  $p_k p_l$
- **5.** }
- 6. return T



It is bound to converge because every flip operation will increase the lower bound of six angles.

### Incremental algorithm

- *Input*: point set  $P = \{p_1, p_2, ..., p_n\}$
- *Output: DT*(*P*)
- 1. compute an initial triangle  $\alpha$  which is large enough to cover P.
- 2. For (each point in P){
- 3. find the located triangle  $\Delta p_l p_i p_k \in T$ ;
- 4. compute new T;
- 5. flip illegal edge to make T become DT.
- 6.
- 7. delete related edges of  $\alpha$ ;
- 8. return T



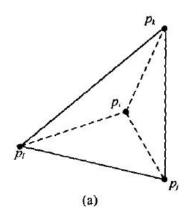
### Incremental algorithm

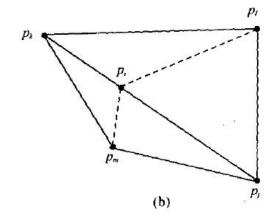
O(nlogn)

For the new added point  $p_i$ 

- All the new triangles has the vertex  $p_i$ .
- All the temporary illegal edges must exist in the opposite edges of  $p_i$  of new added triangles.
- Recursively check and flip.

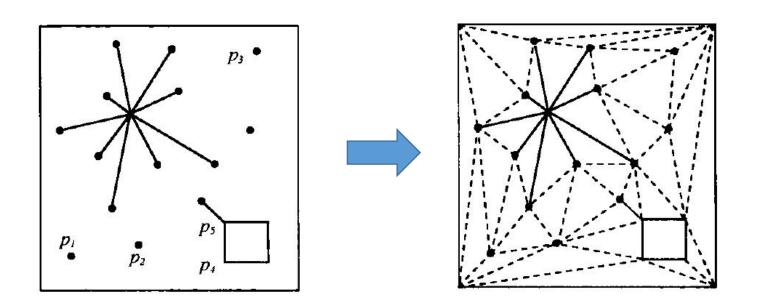
Use a directed acyclic graph to store the triangle division for fast location query.

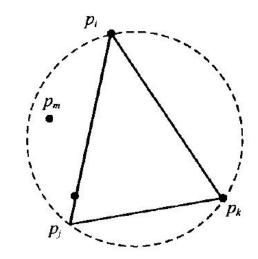




## Constrained Delaunay Triangulation (CDT)

For a point set P and line segment set  $LSS(P_1, L)$ , where L is line segments and  $P_1$  is vertices, P and  $P_1$  should become vertices and L should become edges in CDT.

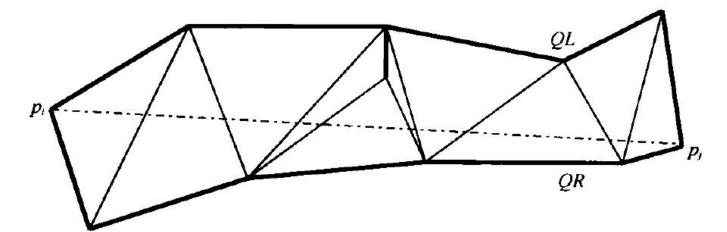




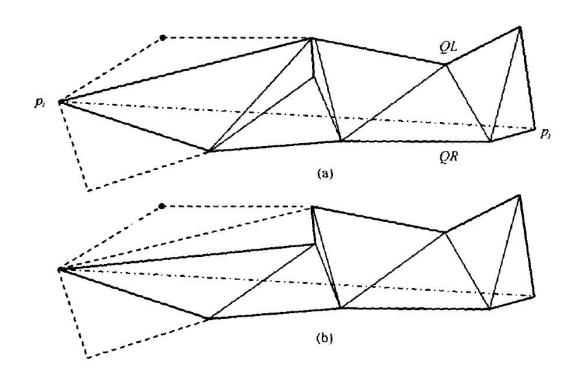
 $\Delta p_i p_j p_k$  is legal if  $p_i p_j$  is constrained edge.

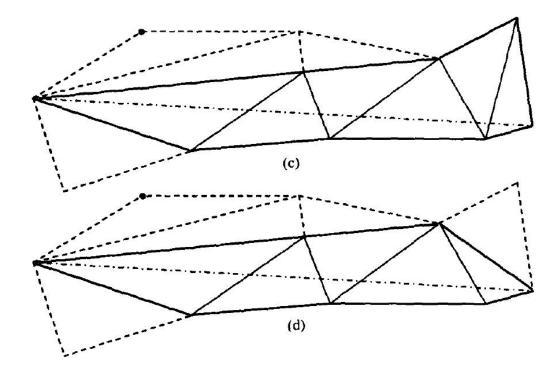
## Constrained Delaunay Triangulation (CDT)

- Compute DT for  $P \cap P_1$
- Insert *L*
- Flip edges for DT
- Optimize related triangles to DT

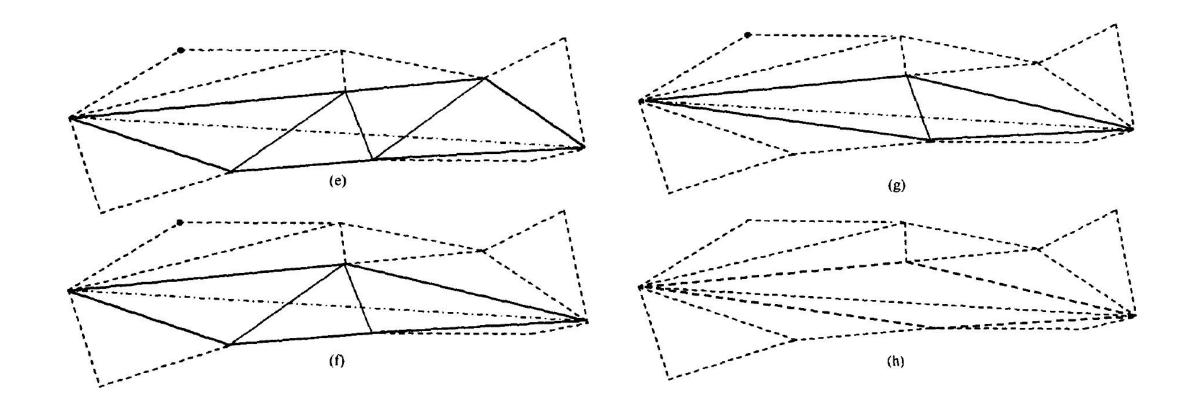


# Example of the process

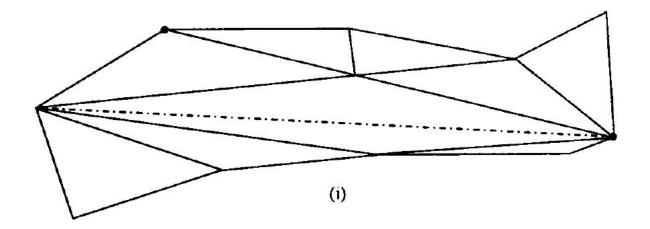




# Example of the process



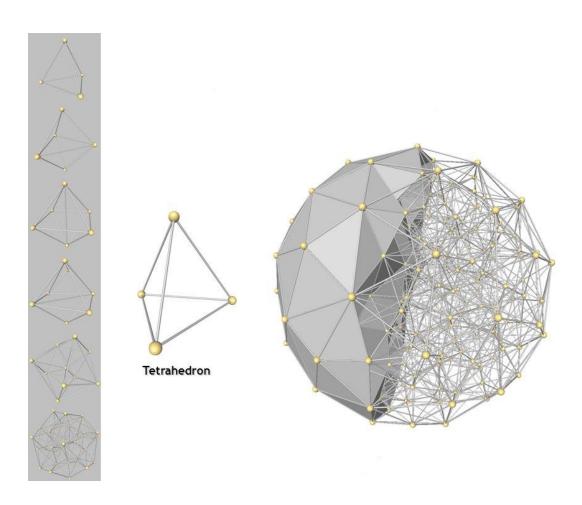
## Example of the process



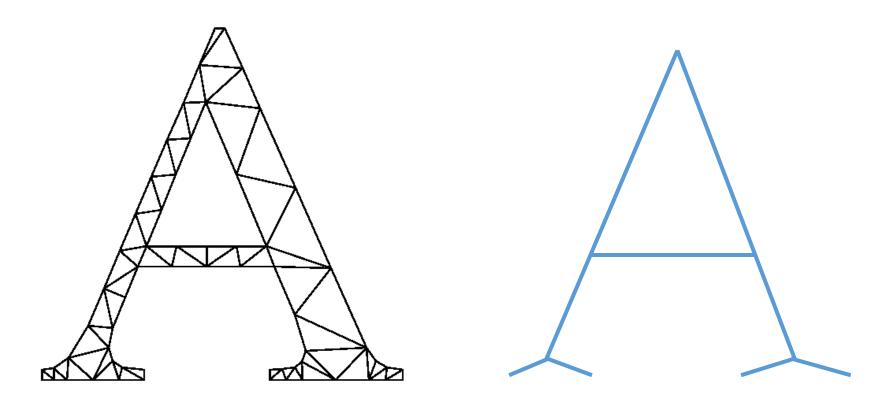
**Constrained Delaunay Triangulation** 

## 3D Delaunay Triangulation

- The dual of 3D Voronoi
- Consists of tetrahedron

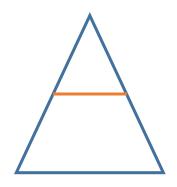


### Delaunay Triangulation MAT

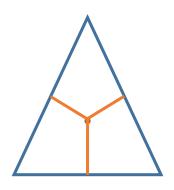


Connect centers of circumcircles of Delaunay Triangles according to the neighborhood. **Dense sampling** has better accuracy.

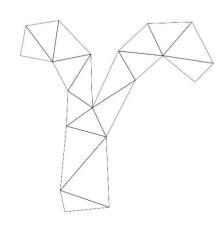
### Chordal Axis Transform (CAT) approximated MAT



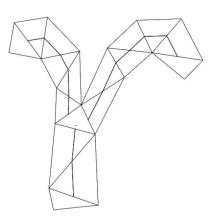
Case 1: One edge on the boundary



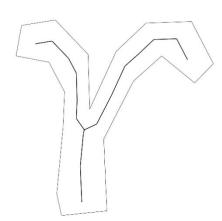
Case 2: No edge on the boundary



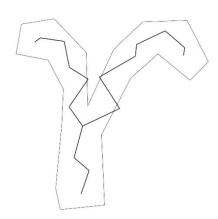
DT



Case 1 process



Case 1&2 process



Compared with the method using centers of circumcircles

## Skeleton extraction by CAT



# 3D CAT

