Lecture Notes for *Introduction to Computational Geometry* (Com S 418/518) Yan-Bin Jia, Iowa State University

# Voronoi Diagrams

#### Outline:

- I. Problem definition
- II. Voronoi cells
- III. Delaunay triangulations
- IV. Geometric complexity
- V. Beach line in construction
- VI. Site event

Textbook: Computational Geometry: Algorithms and Applications (3rd ed.) by M. de Berg et al., Springer-Verlag, 2008.

















Voronoi diagram



#### Input: Point Set

$$P = \{p_1, p_2, \dots, p_n\}$$



#### Input: Point Set











#### **Two Sites**



Perpendicular bisector



 $V(p_6)$  is determined by  $p_2, p_5, p_7, p_8$  only.

$$V(p_i) = \bigcap_{\substack{1 \le j \le n \\ j \ne i}} h(p_i, p_j)$$



 $V(p_6)$  is determined by  $p_2, p_5, p_7, p_8$  only.  $V(p_6) \subset h(p_6, p_j), j = 1, 3, 4.$ 

$$V(p_i) = \bigcap_{\substack{1 \le j \le n \\ j \ne i}} h(p_i, p_j)$$







## **Unbounded Voronoi Cells**



#### Only Case of Disconnected VD

All the sites are collinear.



Only n - 1 Sites Collinear



#### **Only One Vertex**

All the sites are on the same circle.



#### Not All Sites Collinear





*Dual graph* obtained by adding a line segment between every two sites sharing a Voronoi edge.







#### **One More Example**

50 points (generated using the Mathematica command VoronoiMesh)



 $\leq 2n - 5$  vertices  $\leq 3n - 6$  edges



 $\leq 2n - 5$  vertices  $\leq 3n - 6$  edges

**Proof** Let  $n_v =$ #vertices and  $n_e =$  #edges.



 $\leq 2n - 5$  vertices  $\leq 3n - 6$  edges

**Proof** Let  $n_v =$ #vertices and  $n_e =$  #edges.

• Add vertex  $v_{\infty}$  far enough.



 $\leq 2n - 5$  vertices  $\leq 3n - 6$  edges

**Proof** Let  $n_v =$ #vertices and  $n_e =$  #edges.

- Add vertex  $v_{\infty}$  far enough.
- Extend (and bend) all half-lines in Vor(P) to reach  $v_{\infty}$ .



 $\leq 2n - 5$  vertices  $\leq 3n - 6$  edges

**Proof** Let  $n_v =$ #vertices and  $n_e =$  #edges.

• Add vertex  $v_{\infty}$  far enough.

• Extend (and bend) all half-lines in Vor(*P*) to reach  $v_{\infty}$ .

a planar graph



 $\leq 2n - 5$  vertices  $\leq 3n - 6$  edges

**Proof** Let  $n_v =$ #vertices and  $n_e =$  #edges.

• Add vertex  $v_{\infty}$  far enough.

• Extend (and bend) all half-lines in Vor(*P*) to reach  $v_{\infty}$ .  $\bigcirc$ a planar graph  $\bigcirc$  $(n_v + 1) - n_e + n = 2$  (Euler's formula)



 $\leq 2n - 5$  vertices  $\leq 3n - 6$  edges

**Proof** Let  $n_v =$ #vertices and  $n_e =$  #edges.

• Add vertex  $v_{\infty}$  far enough.

• Extend (and bend) all half-lines in Vor(*P*) to reach  $v_{\infty}$ .  $\bigcirc$ a planar graph  $\bigcirc$  $(n_v + 1) - n_e + n = 2$  (Euler's formula)  $n_e = \stackrel{\bigcirc}{n_v} + n - 1$  $n_v = n_e - n + 1$ 



#### Cont'd

• Every vertex has degree  $\geq 3$ .
















# Vertex



 $C_P(q)$ : largest circle centered at qand not containing any site from P in its interior.

# Vertex



 $C_P(q)$ : largest circle centered at qand not containing any site from P in its interior.

#### **Theorem**

(i) q is a vertex of Vor(P) iff  $C_P(q)$ passes through  $\geq 3$  sites.

(ii) Bisector *b* of  $p_i$  and  $p_j$  is an edge of Vor(*P*) iff for some point *r* on *b*,  $C_P(r)$  passes through  $p_i$  and  $p_j$  but no other sites.

(i) q is a vertex of Vor(P) iff  $C_P(q)$ passes through  $\geq 3$  sites.





(i) q is a vertex of Vor(P) iff  $C_P(q)$  passes through  $\geq 3$  sites.

( $\Leftarrow$ ) Suppose *q* exists such that  $C_P(q)$  passes through  $\ge 3$  sites  $p_i, p_j, p_k$ .



(i) q is a vertex of Vor(P) iff  $C_P(q)$  passes through  $\geq 3$  sites.



( $\Leftarrow$ ) Suppose *q* exists such that  $C_P(q)$  passes through  $\geq 3$  sites  $p_i, p_j, p_k$ .

 $C_P(q)$  has no site in its interior.

(i) q is a vertex of Vor(P) iff  $C_P(q)$  passes through  $\geq 3$  sites.



( $\Leftarrow$ ) Suppose *q* exists such that  $C_P(q)$  passes through  $\geq 3$  sites  $p_i, p_j, p_k$ .

 $C_P(q)$  has no site in its interior. Q q must be on the boundary of  $V(p_i)$ ,  $V(p_j)$ , and  $V(p_k)$ .

(i) q is a vertex of Vor(P) iff  $C_P(q)$  passes through  $\geq 3$  sites.



( $\Leftarrow$ ) Suppose *q* exists such that  $C_P(q)$  passes through  $\ge 3$  sites  $p_i, p_j, p_k$ .

 $C_P(q)$  has no site in its interior. Q must be on the boundary of  $V(p_i)$ ,  $V(p_j)$ , and  $V(p_k)$ . Q is a vertex of Vor(P).

(i) q is a vertex of Vor(P) iff  $C_P(q)$  passes through  $\geq 3$  sites.



( $\Leftarrow$ ) Suppose *q* exists such that  $C_P(q)$  passes through  $\ge 3$  sites  $p_i, p_j, p_k$ .

 $C_P(q)$  has no site in its interior. Q must be on the boundary of  $V(p_i)$ ,  $V(p_j)$ , and  $V(p_k)$ . Q

q is a vertex of Vor(P).

 $(\Rightarrow)$  Vertex q is adjacent to 3 edge.

(i) q is a vertex of Vor(P) iff  $C_P(q)$  passes through  $\geq 3$  sites.



( $\Leftarrow$ ) Suppose *q* exists such that  $C_P(q)$  passes through  $\geq 3$  sites  $p_i, p_j, p_k$ .

 $C_P(q)$  has no site in its interior. Q q must be on the boundary of  $V(p_i)$ ,  $V(p_j)$ , and  $V(p_k)$ .

q is a vertex of Vor(P).

(⇒) Vertex *q* is adjacent to 3 edge. ⇒ It is adjacent to three cells:  $V(p_i), V(p_j), \text{ and } V(p_k).$ 

(i) q is a vertex of Vor(P) iff  $C_P(q)$  passes through  $\geq 3$  sites.



( $\Leftarrow$ ) Suppose *q* exists such that  $C_P(q)$  passes through  $\geq 3$  sites  $p_i, p_j, p_k$ .

 $C_P(q)$  has no site in its interior. Q q must be on the boundary of  $V(p_i)$ ,  $V(p_j)$ , and  $V(p_k)$ .

q is a vertex of Vor(P).

( $\Rightarrow$ ) Vertex *q* is adjacent to 3 edge.  $\Longrightarrow$  It is adjacent to three cells:  $V(p_i), V(p_j), \text{ and } V(p_k).$ 

q is equidistant to  $p_i$ ,  $p_j$ , and  $p_k$ , and no other sites is closer to q.

(i) q is a vertex of Vor(P) iff  $C_P(q)$  passes through  $\geq 3$  sites.



( $\Leftarrow$ ) Suppose *q* exists such that  $C_P(q)$  passes through  $\ge 3$  sites  $p_i, p_j, p_k$ .

 $C_P(q)$  has no site in its interior. Q q must be on the boundary of  $V(p_i)$ ,  $V(p_j)$ , and  $V(p_k)$ .

q is a vertex of Vor(P).

( $\Rightarrow$ ) Vertex *q* is adjacent to 3 edge.  $\Longrightarrow$  It is adjacent to three cells:  $V(p_i), V(p_j), \text{ and } V(p_k).$   $\downarrow$  *q* is equidistant to  $p_i, p_j, \text{ and } p_k, \text{ and no other sites is closer to } q.$   $\downarrow$  $C_P(q)$  has no site in its interior.

(i) q is a vertex of Vor(P) iff  $C_P(q)$  passes through  $\geq 3$  sites.



( $\Leftarrow$ ) Suppose *q* exists such that  $C_P(q)$  passes through  $\ge 3$  sites  $p_i, p_j, p_k$ .

 $C_P(q)$  has no site in its interior. Q q must be on the boundary of  $V(p_i)$ ,  $V(p_j)$ , and  $V(p_k)$ .

q is a vertex of Vor(P).

( $\Rightarrow$ ) Vertex *q* is adjacent to 3 edge.  $\Longrightarrow$  It is adjacent to three cells:  $V(p_i), V(p_j), \text{ and } V(p_k).$   $\downarrow$  *q* is equidistant to  $p_i, p_j, \text{ and } p_k, \text{ and no other sites is closer to } q.$   $\downarrow$  $C_P(q)$  has no site in its interior.

# V. Computing VD

Naive algorithm:

Compute every Voronoi cell  $V(p_i)$ .

• Half-plane intersection.

♦ n cells.

# V. Computing VD

Naive algorithm:

Compute every Voronoi cell  $V(p_i)$ .

Half-plane intersection.

 $O(n \log n)$ 

♦ n cells.

# V. Computing VD

Naive algorithm:

Compute every Voronoi cell  $V(p_i)$ .

• Half-plane intersection.

 $O(n \log n)$ 

♦ n cells.

 $O(n^2 \log n)$ 













# Sweep in a Different Fashion

- Do not maintain the intersection of Vor(*P*) with the half-plane above *l*.
- Maintain the part of Vor(P) of sites above *l* that will not change.



- $p_i$ : site above l $p_j$ : site below l
- q: point above l

# Sweep in a Different Fashion

- Do not maintain the intersection of Vor(*P*) with the half-plane above *l*.
- Maintain the part of Vor(P) of sites above *l* that will not change.



- $p_i$ : site above l $p_j$ : site below l
- *q*: point above *l q* is closer to *l* than to  $p_j$ .

# Sweep in a Different Fashion

- Do not maintain the intersection of Vor(P) with the half-plane above l.
- Maintain the part of Vor(P) of sites above *l* that will not change.



```
p_i: site above l
p_j: site below l
```

```
q: point above l
q is closer to l than to p_j.
```

If q is closer to  $p_i$  than to l, then it must be closer to  $p_i$  than to  $p_j$ .

Locus of points equidistant to  $p_i = (a_i, b_i)$ and  $l: y = l_y$ .



Locus of points equidistant to  $p_i = (a_i, b_i)$ and  $l: y = l_y$ .

$$(x - a_i)^2 + (y - b_i)^2 = (y - l_y)^2$$



------

Locus of points equidistant to  $p_i = (a_i, b_i)$ and  $l: y = l_y$ .



------

$$(x - a_i)^2 + (y - b_i)^2 = (y - l_y)^2$$

$$\bigcup$$

$$x^2 - 2a_i x + a_i^2 + b_i^2 - l_y^2 = 2(b_i - l_y)y$$

Locus of points equidistant to  $p_i = (a_i, b_i)$ and  $l: y = l_y$ .



------

$$(x - a_i)^2 + (y - b_i)^2 = (y - l_y)^2$$

$$\bigcup$$

$$x^2 - 2a_i x + a_i^2 + b_i^2 - l_y^2 = 2(b_i - l_y)y$$

Parabola!

Locus of points equidistant to  $p_i = (a_i, b_i)$ and  $l: y = l_y$ .



All the points above the parabola are closer to  $p_i$  than to l (and all the sites below l).

#### **Beach Line**

Parabolic arcs bounding the locus of points closer to some site above l than to l.



### **Beach Line**

Parabolic arcs bounding the locus of points closer to some site above l than to l.

 Lower envelope of all the parabolas due to the sites above *l*.




- Lower envelope of all the parabolas due to the sites above *l*.
- ♦ x-monotone.



- Lower envelope of all the parabolas due to the sites above *l*.
- ♦ x-monotone.
- One parabola can contribute more than once (e.g., by p<sub>j</sub>).



- Lower envelope of all the parabolas due to the sites above *l*.
- x-monotone.
- One parabola can contribute more than once (e.g., by p<sub>j</sub>).
- Breakpoints lie on the edges of Vor(P).



- Lower envelope of all the parabolas due to the sites above *l*.
- x-monotone.
- One parabola can contribute more than once (e.g., by p<sub>i</sub>).
- Breakpoints lie on the edges of Vor(P).
- They will trace out exactly Vor(P) as l moves from top to bottom.

Parabolic arcs bounding the locus of points closer to some site above l than to l.



- Lower envelope of all the parabolas due to the sites above *l*.
- ♦ x-monotone.
- One parabola can contribute more than once (e.g., by p<sub>i</sub>).
- Breakpoints lie on the edges of Vor(P).
- They will trace out exactly Vor(P) as l moves from top to bottom.

Maintain the beach line (not explicitly) during the sweep.

## VI. Two Types of Events

As the sweep line moves downward, the beach line's topological structure changes when



# VI. Two Types of Events

As the sweep line moves downward, the beach line's topological structure changes when



a) a new parabolic arc appears (a *site event*), or

# VI. Two Types of Events

As the sweep line moves downward, the beach line's topological structure changes when



- a) a new parabolic arc appears (a *site event*), or
- b) a parabolic arc shrinks to a point and then vanishes (a *circle event*).

The sweep line *l* reaches a new site.



(a) Before











- Two new break points emerge right after a site event.
- They trace out the same edge ( $e_2$  below) in opposite directions.



- Two new break points emerge right after a site event.
- They trace out the same edge ( $e_2$  below) in opposite directions.



*v*: Voronoi vertex *e*<sub>1</sub>, *e*<sub>2</sub>, *e*<sub>3</sub>: Voronoi edges

- Two new break points emerge right after a site event.
- They trace out the same edge ( $e_2$  below) in opposite directions.



v: Voronoi vertex  $e_1, e_2, e_3$ : Voronoi edges

• The edge  $r_1r_2$  is not connected to the rest of the (constructed) Voronoi diagram.

- Two new break points emerge right after a site event.
- They trace out the same edge ( $e_2$  below) in opposite directions.



*v*: Voronoi vertex  $e_1, e_2, e_3$ : Voronoi edges

• The edge  $r_1r_2$  is not connected to the rest of the (constructed) Voronoi diagram.

It will grow and meet another edge and become connected.

At a site event:

- A new arc appears on the beach line.
- A new Voronoi edge starts to be traced out.

At a site event:

- A new arc appears on the beach line.
- A new Voronoi edge starts to be traced out.

Lemma A new arc can only appear on the beach line via a site event.

At a site event:

- A new arc appears on the beach line.
- A new Voronoi edge starts to be traced out.

Lemma A new arc can only appear on the beach line via a site event.

**Corollary** The beach line consists of  $\leq 2n - 1$  parabolic arcs.

At a site event:

- A new arc appears on the beach line.
- A new Voronoi edge starts to be traced out.

Lemma A new arc can only appear on the beach line via a site event.

**Corollary** The beach line consists of  $\leq 2n - 1$  parabolic arcs.

**Proof** The first encountered site generates one arc.

At a site event:

- A new arc appears on the beach line.
- A new Voronoi edge starts to be traced out.

Lemma A new arc can only appear on the beach line via a site event.

**Corollary** The beach line consists of  $\leq 2n - 1$  parabolic arcs.

- ProofThe first encountered site generates one arc.Each newly encountered site
  - yields one new arc, and

At a site event:

- A new arc appears on the beach line.
- A new Voronoi edge starts to be traced out.

Lemma A new arc can only appear on the beach line via a site event.

**Corollary** The beach line consists of  $\leq 2n - 1$  parabolic arcs.

**Proof** The first encountered site generates one arc.

Each newly encountered site

- yields one new arc, and
- splits at most one existing arc into two (i.e., adding one arc to the total count).

At a site event:

- A new arc appears on the beach line.
- A new Voronoi edge starts to be traced out.

Lemma A new arc can only appear on the beach line via a site event.

**Corollary** The beach line consists of  $\leq 2n - 1$  parabolic arcs.

Proof The first encountered site generates one arc.
Each newly encountered site

- yields one new arc, and
- splits at most one existing arc into two (i.e., adding one arc to the total count).

 $\implies$  # increase in arcs  $\leq$  2.

At a site event:

- A new arc appears on the beach line.
- A new Voronoi edge starts to be traced out.

Lemma A new arc can only appear on the beach line via a site event.

**Corollary** The beach line consists of  $\leq 2n - 1$  parabolic arcs.

Proof The first encountered site generates one arc.
Each newly encountered site

- yields one new arc, and
- splits at most one existing arc into two (i.e., adding one arc to the total count).

# arcs  $\leq 1 + 2(n - 1) = 2n - 1$ .