Voronoi Diagram and Delaunay Triangulation Randomized Incremental Construction

Chih-Hung Liu

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Voronoi Diagrams

- Voronoi Diagrams and Delaunay Triangulations
 Properties and Duality
- 2 Randomized Incremental Construction

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• Given a set S of n point sites, Voronoi Diagram V(S) is a planar subdivision

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- VR(p, S) is the locus of points closer to p than any other site.



• Bisector
$$B(p, q) = \{x \in R^2 \mid d(x, p) = d(x, q)\}.$$



Voronoi Diagrams

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- Bisector $B(p, q) = \{x \in R^2 \mid d(x, p) = d(x, q)\}.$
- $D(p,q) = \{x \in R^2 \mid d(x,p) < d(x,q)\}.$
 - Two half-planes D(p,q) and D(q,p) separated by B(p,q).



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$$\mathsf{VR}(p, S) = \bigcap_{q \in S, q \neq p} D(p, q).$$



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Voronoi Diagrams

- Voronoi Edge
 - Common intersection between two adjacent Voronoi regions VR(p, S) and VR(q, S)



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 - A piece of B(p, q)
- Voronoi Vertex
 - Common intersection among more than two Voronoi regions VR(*p*, *S*), VR(*q*, *S*), VR(*r*, *S*), and so on.



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Voronoi Diagrams

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Voronoi Diagrams

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 - Hit more than two sites p, q, r, ... ∈ S → x is the Voronoi vertex among VR(p, S), VR(q, S), VR(r, S), ...



Voronoi Diagrams

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 - $x \in \mathbb{R}^2$ is first hit by three circles from p, q, and $r \to x$ is a Voronoi vertex among VR(p, S), VR(q, S) and VR(r, S)


Wavefront Model (Growth Model)

- Grow circles from $\forall p \in S$ at unit speed
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• VR(*p*, *S*) is unbounded if and only if *p* is a vertex of the convex hull of *S*.



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- If S is in convex position, V(S) is a tree.



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 - \vec{cp} extends to the infinity.
- If S is in convex position, V(S) is a tree.
- An unbounded Voronoi edge corresponds to a hull edge.



Voronoi Diagram (Mathematic Definition)

• Voronoi Diagram V(S)

$$V(S) = R^2 \setminus (\bigcup_{p \in S} \mathsf{VR}(p, S)) = \bigcup_{p \in S} \partial \mathsf{VR}(p, S)$$

- $\partial VR(p, S)$ is the boundary of VR(p, S)
 - $\partial VR(p, S) \not\subset VR(p, S)$
- V(S) is the union of all the Voronoi edges
- Voronoi Edge *e* between VR(p, S) and VR(q, S)

 $e = \partial \mathsf{VR}(p, S) \cap \partial \mathsf{VR}(q, S)$

• Voronoi Vertex v among VR(p, S), VR(q, S), and VR(r, S)

 $v = \partial \mathsf{VR}(p, S) \cap \partial \mathsf{VR}(q, S) \cap \partial \mathsf{VR}(r, S)$

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Complexity of V(S)

Theorem

V(S) has O(n) edges and vertices. The average number of edges of a Voronoi region is less than 6.

- Add a large curve F
 - Γ only passes through unbounded edges of V(S)
 - Cut unbounded pieces outside Г
 - One additional face and several edges and vertices.



Complexity of V(S)

Theorem

V(S) has O(n) edges and vertices. The average number of edges of a Voronoi region is less than 6.

- Euler's Polyhedron Formula: v e + f = 1 + c
 - *v*: # of vertices, *e*: # of edges, *f*: # of faces, and *c*: # number of connected components.
- An edge has two endpoints, and a vertex is incident to at least three edges.
 - $3v \leq 2e \rightarrow v \leq 2e/3$
- f = n + 1 and c = 1
 - $v = 1 + c + e f = e + 1 n \le 2e/3 \rightarrow e \le 3n 3$

• $e = v + f - 1 - c = v + n - 1 \ge 3v/2 \rightarrow v \le 2n - 2$

• Average number of edges of a region $\leq (6n - 6)/n < 6$

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Given a set S of points on the plane, a triangulation is maximal collection of non-crossing line segments among S.



Crossing (\overline{pq})

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Not Maximal (\overline{pq} is allowable)

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Triangulation

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An edge \overline{pq} is called **Delaunay** if there exists a circle passing through *p* and *q* and containing no other point in its interior.



 \overline{pq} is **Delaunay**

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Definition

A **Delaunay Triangulation** is a triangulation whose edges are all Delaunay.



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Definition

A **Delaunay Triangulation** is a triangulation whose edges are all Delaunay.

• For each face, there exists a circle passing all its vertices and containing no other point.



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• V(S) is connected



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- No more than three point sites are cocircular (At most three points are on the same circle)
 - degree of each Voronoi vertex is exactly 3.
 - Each face of the Delaunay triangulation is a triangle.
 - There is a unique Delaunay triangulation.

Duality

Theorem

Under the general position assumption, the Delaunay triangulation is a dual graph of the Voronoi diagram.

• A site $p \leftrightarrow$ a Voronoi region VR(p, S)



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- A site $p \leftrightarrow$ a Voronoi region VR(p, S)
- A Delaunay edge pq ↔ a Voronoi edge between VR(p, S) and VR(q, S)



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Theorem

Under the general position assumption, the Delaunay triangulation is a dual graph of the Voronoi diagram.

- A site $p \leftrightarrow$ a Voronoi region VR(p, S)
- A Delaunay edge pq ↔ a Voronoi edge between VR(p, S) and VR(q, S)
- A Delaunay triangle △pqr ↔ a Voronoi vertex among VR(p, S), VR(q, S) and VR(r, S)



• Lower Bound for Time: $\Omega(n \log n)$

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Algorithms

- Lower Bound for Time: $\Omega(n \log n)$
 - Convex hull of S can be computed in linear time from V(S).



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Algorithms

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- O(n log n) time algorithms
 - Plane Sweep Algorithm
 - Divide and Conquer Algorithm

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Randomized Incremental Construction

- General Idea
 - Consider a random sequence of S, (s_1, s_2, \ldots, s_n) .
 - Let R_i be $\{s_1, ..., s_i\}$
 - From i = 4 to i = n 1, construct $V(R_{i+1})$ from $V(R_i)$ by inserting s_{i+1} .
- Tasks
 - What is a configuration?
 - What is a conflict relation?
 - How to use conflict relations to insert a site?
 - How to update conflict relations?
- General Position Assumption
 - No more than three sites are located on the same circle
 - \rightarrow The degree of a Voronoi vertex is exactly 3
 - No more than two points are located on the same line
 - \rightarrow The Voronoi diagram is connected

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Configuration: A Voronoi edge

- A Voronoi region can not be a configuration because it could consist of O(n) edges, i.e., it is not defined by a constant number of sites
- Consider a Voronoi edge *e* between VR(*p*, *S*) and VR(*q*, *S*)
 - $e \subseteq B(p,q)$
 - Assume *e* has two endpoints *v* and *u*. Then
 - $v = \overline{VR(p, S)} \cap \overline{VR(q, S)VR(r, S)}$ and $u = \overline{VR(p, S)} \cap \overline{VR(q, S)VR(s, S)}$.
 - e is defined by p, q, r, s
 - A Voronoi edge is defined by at most 4 sites.


Conflict Relation

• A site $t \in S \setminus R$ conflicts with a Voronoi edge *e* between VR(p, R) and VR(q, R) if $e \cap VR(t, R \cup \{t\}) \neq \emptyset$.



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Lemma

 $e \cap VR(r, R \cup \{r\}) = e \cap VR(r, \{p, q, r\})$ (Local Test)

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Lemma

$V(R) \cap VR(t, R \cup \{t\})$ is a tree



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Lemma $V(R) \cap VR(t, R \cup \{t\})$ is a tree



Use the conflict list to find an edge which conflicts with t.

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Use the conflict list to find an edge which conflicts with *t*.

2 From the edge to find out $V(R) \cap VR(t, R \cup \{t\})$

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- Use the conflict list to find an edge which conflicts with *t*.
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- So Link the leaves of $V(R) \cap VR(t, R \cup \{t\})$ clockwise

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Update Conflict Relations: Partial Edges

Consider an edge e' of V(R ∪ {t}) which belongs to an edge e of V(R)



Lemma

Any site $s \in S \setminus (R \cup \{t\})$ in conflict with e' will conflict with e. That is, if $e' \cap VR(s, R \cup \{t, s\}) \neq \emptyset$, $e \cap VR(s, R \cup \{s\}) \neq \emptyset$.

- The set of sites in conflict with e' is a subset of the set of sites in conflict with e
- For each site in conflict with e, check if it conflicts with e'.

Update Conflict Relations: Fully new edges

 Consider an edge e' of V(R ∪ {t}) which does not belong to any edge of V(R)



Lemma

e' and a path of $V(R) \cap VR(t, R \cup \{t\})$ will form a cycle. Let *P* be the path in $V(R) \cap VR(t, R \cup \{t\})$ which forms a cycle with *e'*. Any site $s \in S \setminus (R \cup \{t\})$ in conflict with *e'* will conflict with one edge along the path.

For each site in conflict with an edge of *P*, check if it conflicts with e'.

Lemma

Each edge of V(R) which is destroyed due to the insertion of t will be check at most 3 times.

An edge of V(R) contains at most one edge V(R ∪ {t}) and belongs to at most two paths which form a cycle with an edge of V(R ∪ {t}).

Lemma

The time to insert *t* is proportional to the total size of the conflict lists for the edges of V(R) which are destroyed due to the insertion of *t*

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Thank You!!

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