

Department of Computer Science, Yazd University

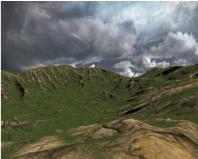
Delaunay Triangulations-Part II

A.Rahiminasab



Purpose: Approximating a terrain by constructing a polyhedral terrain from a set P of sample points.





Theorem 9.1:

Let $P = \{p_1, p_2, ..., p_n\}$ be a point set. A triangulation of P is a maximal planar subdivision with vertex set P.

riangles=
$$2n-2-k$$
 Back

$$\bowtie$$
 edges= $3n-3-k$

where k is the number of points in P on the convex hull of P

Theorem 9.2:(Thales Theorem)

Let C be a circle, L a line intersecting C in points a and b, and p,q,r and s points lying on the same side of L. Suppose that p and q lie on C, that r lies inside C, and that s lies outside C. Then

$$\angle arb > \angle abq = \angle aqb > \angle asb$$

Observation 9.3:

Let T be a triangulation with an illegal edge e.Let T' be the triangulation obtained from T by flipping e.Then

Definition

A legal triangulation is a triangulation that does not contain any illegal edge.

Conclusion:

Any angle-optimal triangulation is legal

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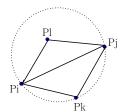
Conclusion:

Any angle-optimal triangulation is legal.

Lemma 9.4:

Let edge $\overline{p_ip_j}$ be incident to triangles $p_ip_jp_k$ and $p_ip_jp_l$ and let C be the circle through p_i,p_j and p_k . The edge $\overline{p_ip_j}$ is illegal if and only if the point p_l lies in the interior of C.

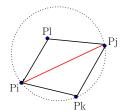
if the points p_i,p_j,p_k,p_l from a convex quadrilateral and do not lie on a common circle \Rightarrow exactly one of $\overline{p_ip_j}$ and $\overline{p_kp_l}$ is an illegal edge.



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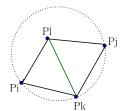
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Algorithm Legal Triangulation (\mathfrak{I})

Input. A triangulation \mathcal{T} of a point set P.

Output. A legal triangulation of P.

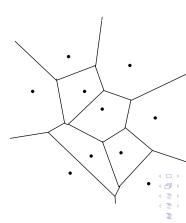
- 1. **while** \mathfrak{T} contains an illegal edge $\overline{p_i p_j}$
- 2. **do** (* Flip $\overline{p_i p_j}$ *)
- 3. Let $p_i p_j p_k$ and $p_i p_j p_l$ be the two triangles adjacent to $\overline{p_i p_j}$.
- 4. Remove $\overline{p_i p_j}$ from \mathfrak{T} , and add $\overline{p_k p_l}$ instead.
- 5. **return** \mathcal{T}

- A set P of n points in the plane
- ② The Voronoi diagram Vor(P) is the subdivision of the plane into Voronoi cells V(p) for all $p \in P$
- 3 Let G be the dual graph of Vor(P)
- The Delaunay graph DG(P) is the straight line embedding of G



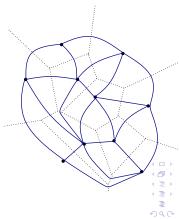
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▶ Back



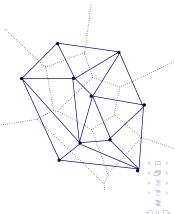
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▶ Back



Lemma 9.5:

The Delaunay graph of a planar point set is a plane graph.



The edge $\overline{p_i p_i}$ is in the Delaunay graph $Dq(P) \iff$ there is a $C_i j$ whit p_i and p_j on its boundary and no other site of Pcontained in it.

The center of such a disc lies on the common edge of $V(p_i)$ and $V(p_i)$.

If the point set *P* is in general position then the Delaunay graph is a triangulation.

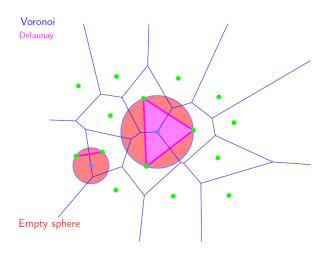
Theorem 9.6:

 $lueebox{P}$ Let P be a set of points in the plane,

- Three points $p_i, p_j, p_k \in P$ are vertices of the same face of the Delaunay graph of $P \iff$ the circle through p_i, p_j, p_k contains no point of P in its interior.
- Two points $p_i, p_j \in P$ form an edge of the Delaunay graph of $P \iff$ there is a closed disc C that contains p_i and p_j on its boundary and does not contain any other point of P.

Theorem 9.7:

T is a Delaunay triangulation of $P \iff$ the circumcircle of any triangle of T does not contain a point of P in its interior.



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Theorem 9.8:

Let P be a set of points in the plane. A triangulation T of P is legal $\iff T$ is a Delaunay triangulation P.

Theorem 9.9:

Let P be a set of points in the plane. Any angle-optimal triangulation of P is a Delaunay triangulation P. Furthermore, any Delaunay triangulation of P maximizes the minimum angle over all triangulations of P.



• A Delaunay triangulation for a set P of points in a plane is a triangulation DT(P) such that no point in P is inside the circumcircle of any triangle in DT(P).



- Delaunay triangulations maximize the minimum angle of all the angles of the triangles in the triangulation; they tend to avoid skinny triangles.
- For a set of points on the same line there is no Delaunay triangulation (the notion of triangulation is degenerate for this case)
- For four or more points on the same circle (e.g., the vertices of a rectangle) the Delaunay triangulation is not unique
- By considering circumscribed spheres, the notion of Delaunay triangulation extends to three and higher dimensions

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 The triangulation is named after Boris Delaunay for his work on this topic from 1934.



 The voronoi diagram is named after Georgy F. Voronoi for his work on this topic.



Jsage Methods Description of the fourth metho Algorithm Point location structure



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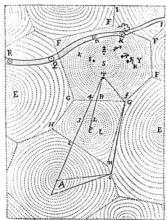




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high location structure







Usage

Delaunay triangulations help in constructing various things:

- Euclidean Minimum Spanning Trees
- Approximations to the Euclidean Traveling Salesperson Problem
- , ...

Usage

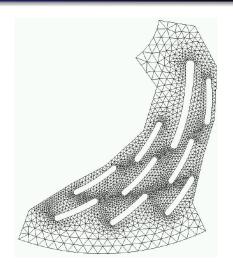
Reconstruction



Usage
Methods
Description of the fourth method
Algorithm
Point location structure

Usage

Meshing



Usage
Methods
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Algorithm
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Usage

Meshing / Remeshing



Usage
Methods
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Methods

There are several ways to compute the Delaunay triangulation:

- By plane sweep
- By iterative flipping from any triangulation
- By conversion from the Voronoi diagram
- By randomized incremental approach \(\square\)



Usage
Methods
Description of the fourth method
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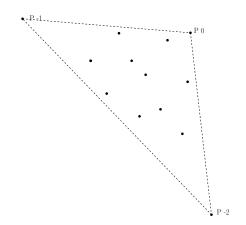
Randomized incremental approach

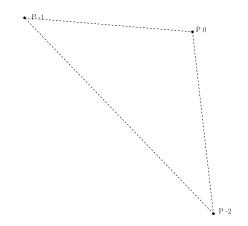
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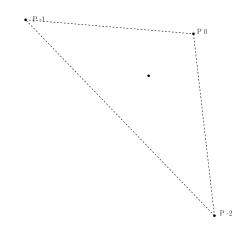
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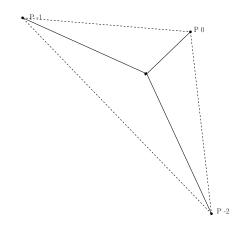
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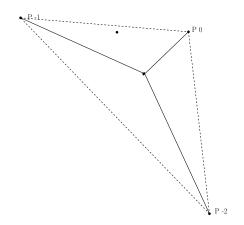
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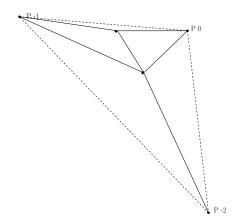


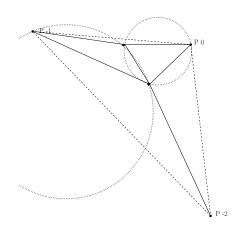


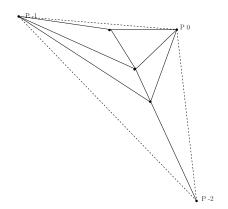


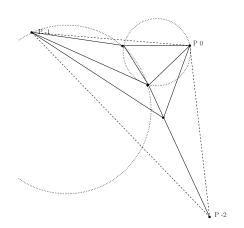


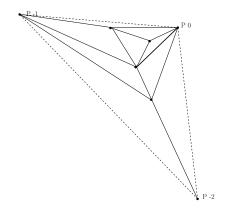


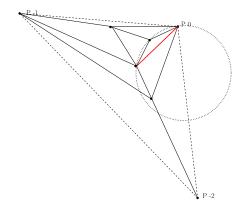


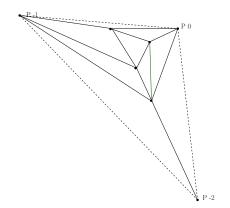


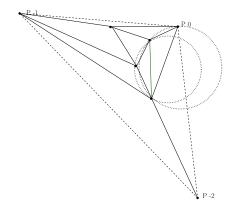




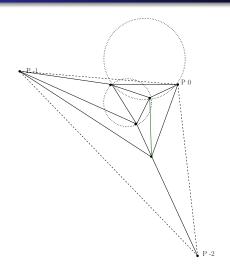


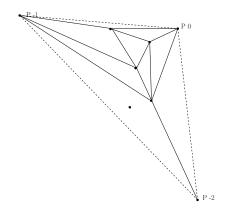


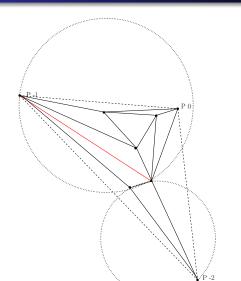


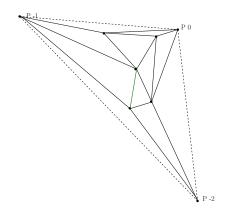


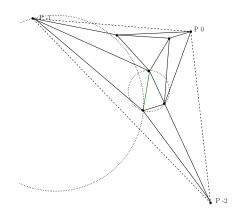




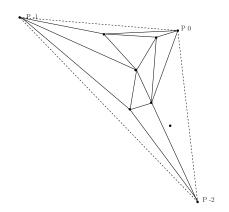


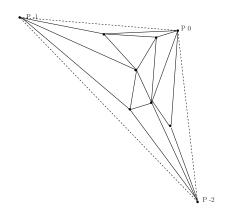


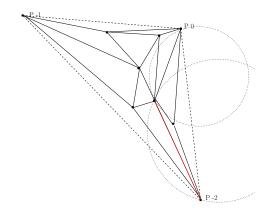




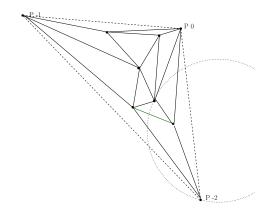




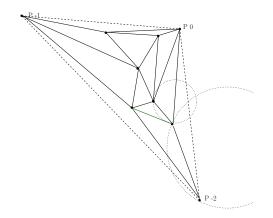


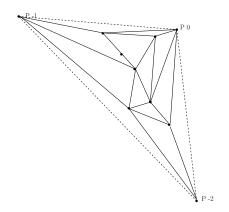


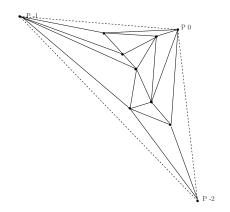


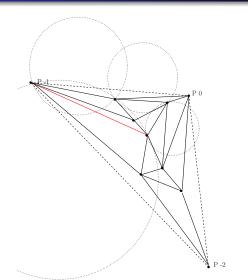


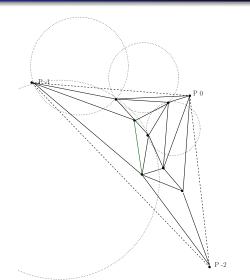


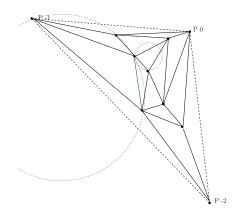


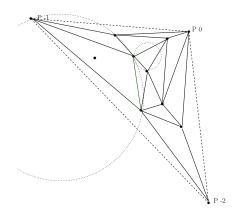


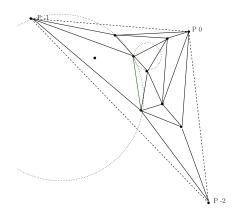


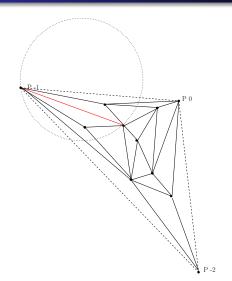


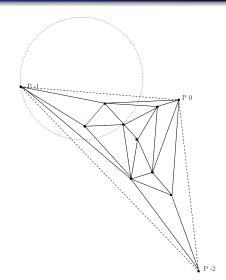


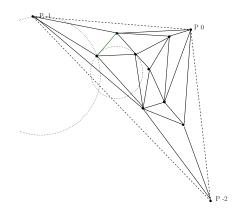


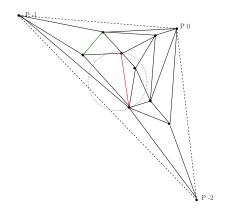




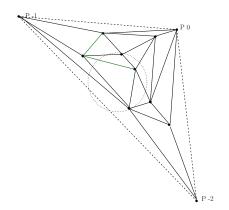


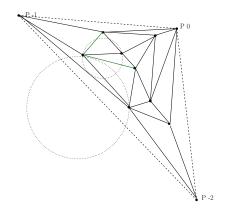




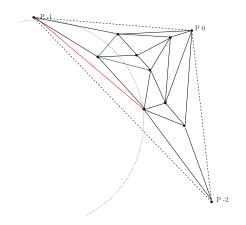




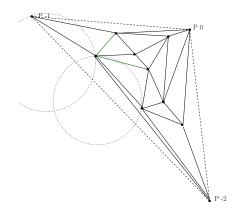


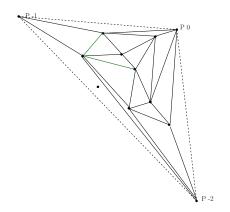


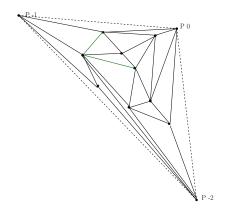


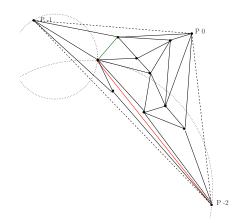




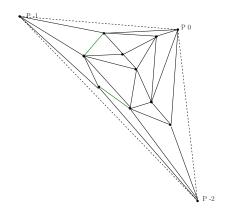


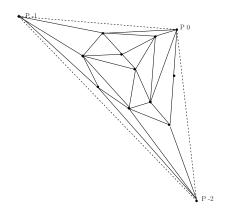


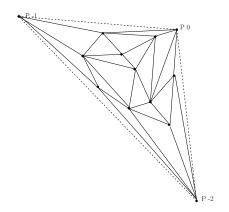


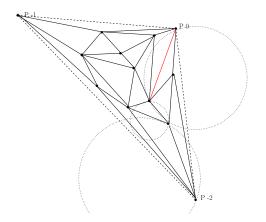


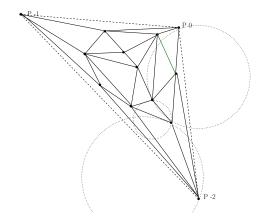


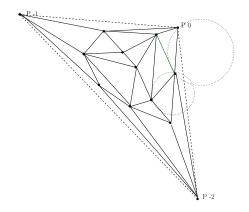




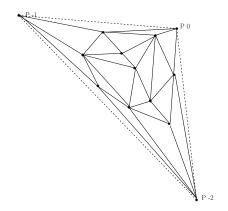


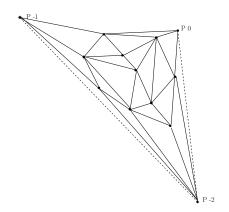


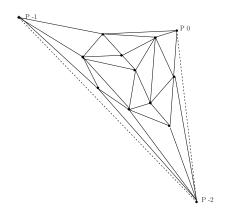


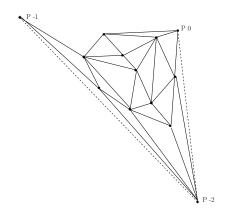


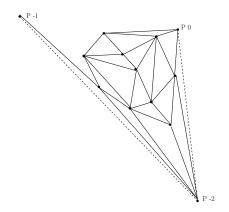


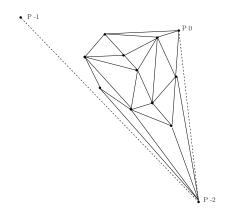




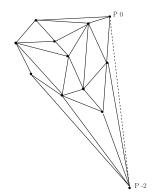






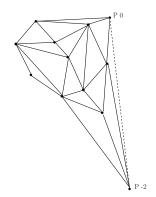




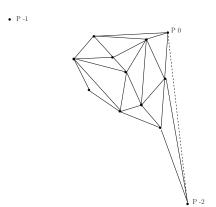


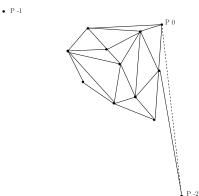
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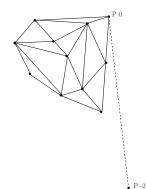
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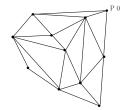
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• P-1

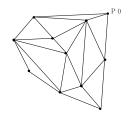


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• P -1







Pseudocode

▶ Back

7.

Algorithm DELAUNAYTRIANGULATION(*P*)

Input. A set P of n+1 points in the plane.

Output. A Delaunay triangulation of P.

- 1. Let p_0 be the lexicographically highest point of P, that is, the rightmost among the points with largest y-coordinate.
- 2. Let p_{-1} and p_{-2} be two points in \mathbb{R}^2 sufficiently far away and such that P is contained in the triangle $p_0p_{-1}p_{-2}$.
- 3. Initialize Υ as the triangulation consisting of the single triangle $p_0p_{-1}p_{-2}$.
- 4. Compute a random permutation p_1, p_2, \dots, p_n of $P \setminus \{p_0\}$.
- 5. for $r \leftarrow 1$ to n
- 6. **do** (* Insert p_r into \mathfrak{T} : *)
 - Find a triangle $p_i p_j p_k \in \mathcal{T}$ containing p_r .
- 8. **if** p_r lies in the interior of the triangle $p_i p_j p_k$
- 9. **then** Add edges from p_r to the three vertices of $p_i p_j p_k$, thereby splitting $p_i p_j p_k$ into three triangles.
- 10. LegalizeEdge($p_r, \overline{p_i p_j}, \mathfrak{T}$)
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Pseudocode

▶ Back

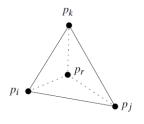
Algorithm DELAUNAYTRIANGULATION(*P*)

Input. A set P of n+1 points in the plane.

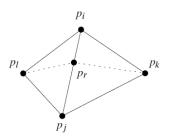
Output. A Delaunay triangulation of *P*.

- Let p₀ be the lexicographically highest point of P, that is, the rightmost among the points with largest y-coordinate.
- 2. Let p_{-1} and p_{-2} be two points in \mathbb{R}^2 sufficiently far away and such that P is contained in the triangle $p_0p_{-1}p_{-2}$.
- 3. Initialize \mathcal{T} as the triangulation consisting of the single triangle $p_0p_{-1}p_{-2}$.
- 4. Compute a random permutation p_1, p_2, \dots, p_n of $P \setminus \{p_0\}$.
- 5. for $r \leftarrow 1$ to n
- 6. **do** (* Insert p_r into \mathfrak{T} : *)
- 7. Find a triangle $p_i p_j p_k \in \mathcal{T}$ containing p_r .
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p_r lies in the interior of a triangle



p_r falls on an edge



Pseudocode

```
else (* p<sub>r</sub> lies on an edge of p<sub>i</sub>p<sub>j</sub>p<sub>k</sub>, say the edge p̄<sub>i</sub>p̄<sub>j</sub> *)
Add edges from p<sub>r</sub> to p<sub>k</sub> and to the third vertex p<sub>l</sub> of the other triangle that is incident to p̄<sub>i</sub>p̄<sub>j</sub>, thereby splitting the two triangles incident to p̄<sub>i</sub>p̄<sub>j</sub> into four triangles.
LegalizeEdge(p<sub>r</sub>, p̄<sub>i</sub>p̄<sub>l</sub>, T)
LegalizeEdge(p<sub>r</sub>, p̄<sub>l</sub>p̄<sub>j</sub>, T)
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```

LEGALIZEEDGE($p_r, \overline{p_k p_i}, \mathfrak{I}$)

19. Discard p_{-1} and p_{-2} with all their incident edges from \mathcal{T} . 20. **return** \mathcal{T}

18.

Randomized incremental approach

```
▶ Lemma 9.4
```

LegalizeEdge $(p_r, \overline{p_i p_j}, \mathfrak{T})$

- 1. (* The point being inserted is p_r , and $\overline{p_i p_j}$ is the edge of \mathcal{T} that may need to be flipped. *)
 - 2. **if** $\overline{p_i p_j}$ is illegal
- 3. **then** Let $p_i p_j p_k$ be the triangle adjacent to $p_r p_i p_j$ along $\overline{p_i p_j}$.
- 4. $(* Flip \overline{p_i p_j}: *) Replace \overline{p_i p_j} with \overline{p_r p_k}.$
- 5. LegalizeEdge($p_r, \overline{p_i p_k}, \mathfrak{T}$)
- 6. LegalizeEdge($p_r, \overline{p_k p_j}, \mathfrak{T}$)

Randomized incremental approach

But

what about the correctness of algorithm?



Randomized incremental approach

Must show no illegal edge left behind!

- ullet We see that every new edge added is incident to P_r .
- We will see that every new edge added is in fact legal
- Together with the fact that an edge can only become illegal if one of its incident triangles changes, then our algorithm tests any edge that may become illegal.

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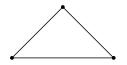
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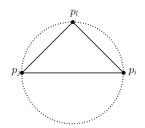
Randomized incremental approach

Lemma 9.10:

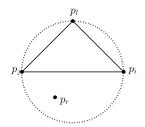
Every new edge created in 'DELAUNAYTRIANGULATION' or in 'LEGALIZEEDGE' during the insertion of P_r is an edge of the Delaunay graph of $\{p_{-1},p_{-2},p_0,...,p_r\}$



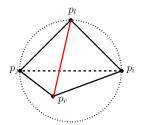
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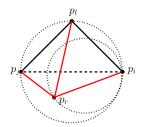
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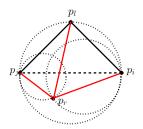
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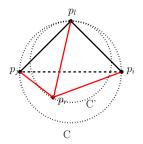
Lemma 9.10:



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How to find the triangle containing the point p_r ?

► Go to algorithm

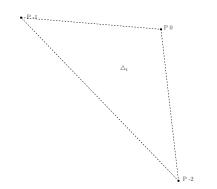
introduction DAG

- A point location structure D is a directed acyclic graph.
- The leaves of D correspond to the triangles of the current triangulation T
 exist cross-pointers between those leaves and the triangulation.
- The internal nodes of D correspond to triangles that have already been destroyed
 - Any internal node gets at most three outgoing pointers

introduction DAG

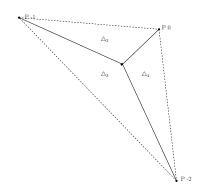
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Constructing DAG

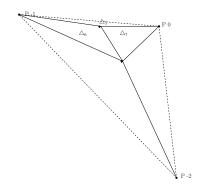


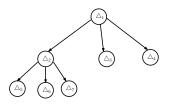


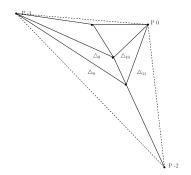
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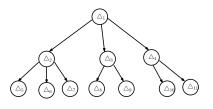


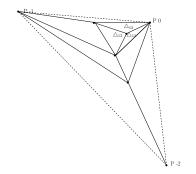


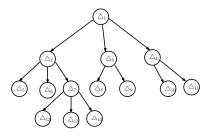


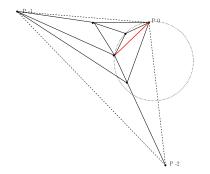


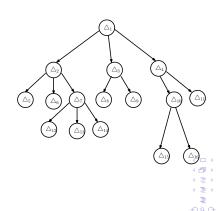


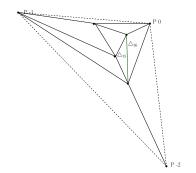


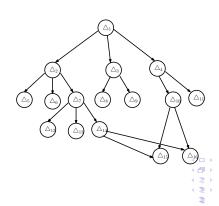












Point location

- Start at the root of D,
- Check the three children of the root and descend to the corresponding child,

•

.

① until we reach a leaf of D, this leaf corresponding to a triangle in the current triangulation that contains p_r .

How to choose p_{-1} and p_{-2} ?

and

How to implement the test of whether an edge is legal?

The first issue

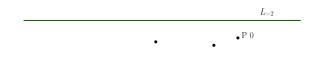
 \bullet P 0

The first issue

 $_{\bullet}\,P\;0$

 p_{-1} L_{-1}

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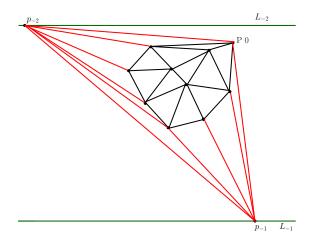


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The first issue



The first issue

Position of a point p_j with respect to the oriented line from p_i to p_k :

- p_j lies to the left of the line from p_i to p_{-1} ;
- p_j lies to the left of the line from p_{-2} to p_i ;
- p_j is lexicographically larger than p_i.
 By our choice of p₋₁ and p₋₂, the above conditions are equivalent.

The second issue

Let $\overline{p_ip_j}$ be the edge of to be tested,and let p_k and p_l be the other vertices of the triangles incident to $\overline{p_ip_j}$ (if they exist).

- $\overline{p_ip_j}$ is an edge of the triangle $p_0p_{-1}p_{-2}$. These edges are always legal.
- The indices i,j,k,l are all non-negative.
 — this case is normal
- All other cases $\overline{p_ip_j}$ is legal if and only if $\min(k,l) < \min(i,j)$

Lemma 9.11:

The expected number of triangles created by the algorithm is at most 9n + 1.

Proof.

$$P_r := \{p_1, p_2, ..., p_r\} \qquad \qquad Dg_r := Dg(\{p_{-2}, p_{-1}, p_0\} \cup P_r)$$

• \sharp (new triangles in step r) $\leq 2k - 3$ $k = deg(p_r, Dg)$

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degree of p_r , over all possible permutations of the set P?

- Backwards analysis:
 - By Theorem 7.3: \sharp Edges in $Dg_r \le 3(r+3)$ 6

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Lemma 9.12:

The Delaunay triangulation can be computed in O(nlogn) expected time, using O(n) expected storage.

Proof.

- Space follows from nodes in D representing triangles created, which by the previous lemma is O(n).
- Not counting the time for point location.
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- Let $K(\triangle) \subset P$ be the points inside the circumcircle of a given triangle \triangle
- Therefore the total time for the point location steps is:

$$O(n + \sum_{\triangle} \operatorname{card}(K(\triangle)))$$

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If P is a point set in general position, then

$$\sum_{\triangle} \operatorname{card}(K(\triangle)) = O(nlog n)$$

Proof.

- ullet P is in general position,then every subset P_r is in general position
- ullet triangulation after insert p_r is the unique triangulation Dg
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Rewrite the sum:

$${\textstyle\sum\limits_{r=1}^{n}\Big(\sum\limits_{\vartriangle\in T_{r}\smallsetminus T_{r-1}}\mathrm{card}(K(\bigtriangleup))\Big)}$$

- Let $k(P_r, q) = \sharp$ of triangles $\triangle \in T_r$; $q \in K(\triangle)$
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$$\sum_{\Delta \in T_r \times T_{r-1}} \operatorname{card}(K(\Delta)) = \sum_{q \in P \times P_r} \mathsf{k}(P_r, q, p_r)$$

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• But $E[k(P_r,q,p_r)] \leq 2$

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- Probability that p_r is incident to a triangle is 3/r
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- Py Theorem 9.1: T_m has 2(m + 3) 2 3 = 2m + 1
- ullet T_{m+1} has two triangles more than T_m
- Thus, card $(T_r \setminus T_{r+1})$
 - \leq card(triangles destroyed by p_{r+1})
 - = card(triangles created by p_{r+1})-2
 - = card $(T_{r+1} imes T_r)$ 2
- We can rewrite our sum as

$$E[\sum_{\Delta \in T_r \setminus T_{r-1}} \operatorname{card}(K(\Delta))] \le 3\left(\frac{n-1}{r}\right) \left(E[\operatorname{card}(T_{r+1} \setminus T_r)] - 2\right)$$

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- Remember we fixed P_r earlier
- Consider all P_r by averaging over both sides of the inequality, but the inequality comes out identical.
- $E[\sharp]$ of triangles created by $p_r]$ = $E[\sharp]$ of edges incident to p_{r+1} in $T_{r+1}] \le 6$
- Therefore:

$$E[\sum_{\Delta \in T_r \setminus T_{r-1}} \operatorname{card}(K(\Delta))] \le 12 \left(\frac{n-1}{r}\right)$$

• If we sum this over all r, we have shown that

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And thus, the algorithm runs in O(nlogn) time.

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