

ME8026: Additive Manufacturing for Medical Applications

Tessellation Algorithms

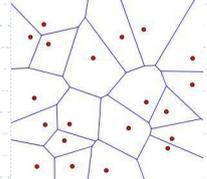
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What is Voronoi Diagram

- ◆ A Voronoi diagram is a subdivision of a plane into regions based on distance to points in a specific subset of the plane.
- ◆ It is named after **Georgy Voronoi**, and is also called a **Voronoi tessellation**, a **Voronoi decomposition**, a **Voronoi partition**, or a **Dirichlet tessellation**
- ◆ The set of points also called seeds, sites, or generators.

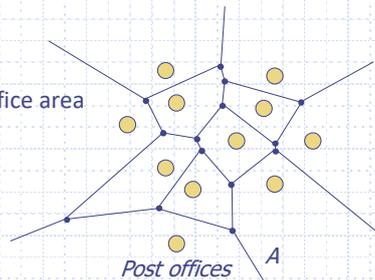


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Applications

Post Office: What is the area of service?

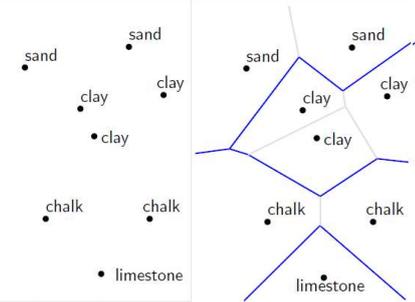
A : Post office area



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Applications

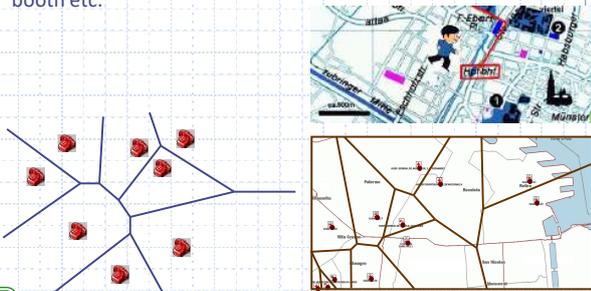
◆ Suppose we tested the soil at a number of sample points and classified the results



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Applications

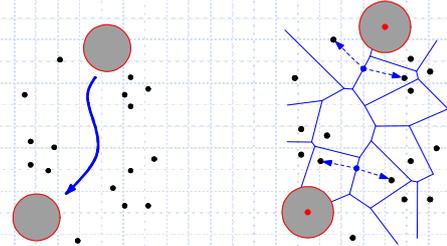
◆ Find nearest hospital, restaurant, gas station, telephone booth etc.



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Applications

◆ Robot motion planning



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Mathematical Definition

- Voronoi diagram is the partitioning of a plane with points into convex polygons such that each polygon contains exactly one generating point and every point in a given polygon is closer to its generating point than to any other

p_i : site points
 e : Voronoi edge
 v : Voronoi vertex

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Voronoi Diagram Example: 1 site

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Two sites form a perpendicular bisector

Voronoi Diagram is a line that extends infinitely in both directions, and the two half planes on either side.

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Collinear sites form a series of parallel lines

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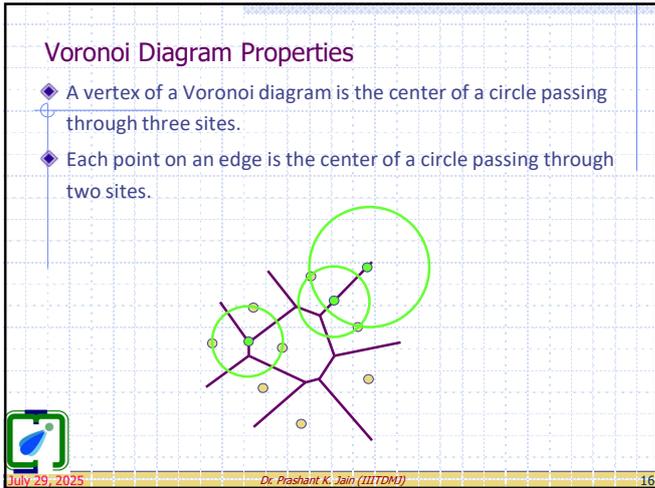
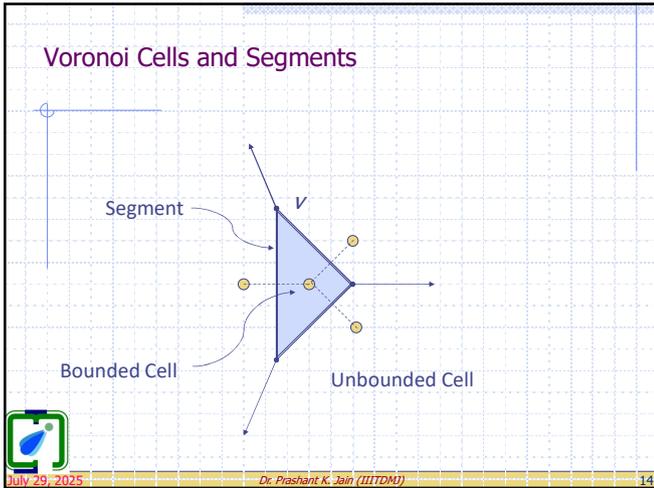
Non-collinear sites form Voronoi half lines that meet at a vertex

A Voronoi vertex is the center of an empty circle touching 3 or more sites.

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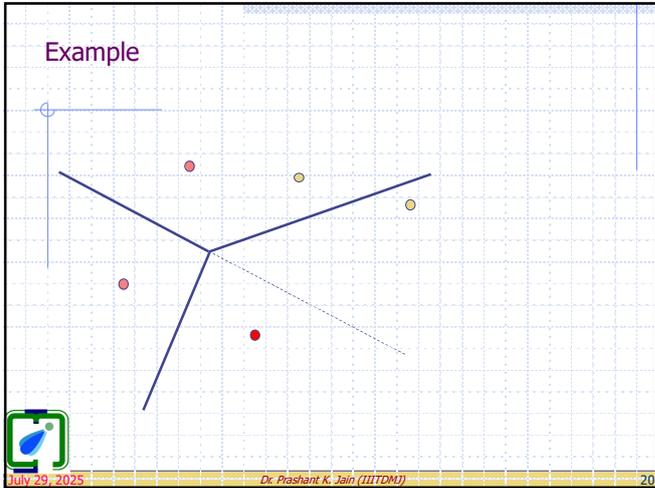
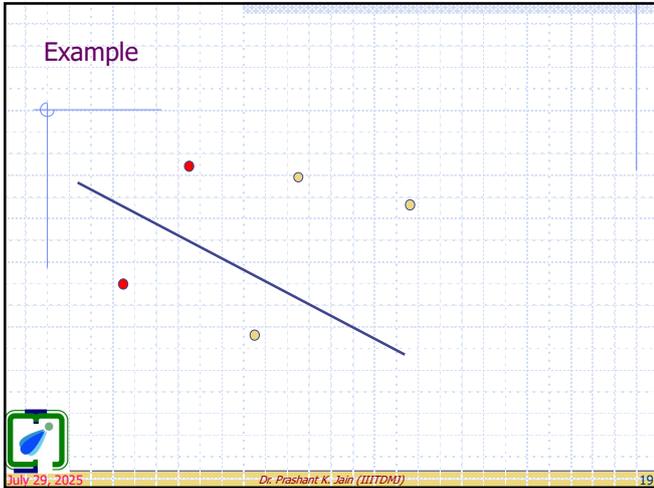
Voronoi Cells and Segments

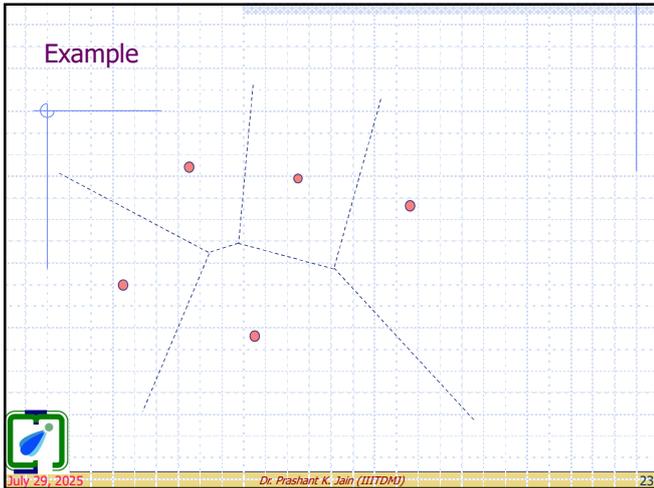
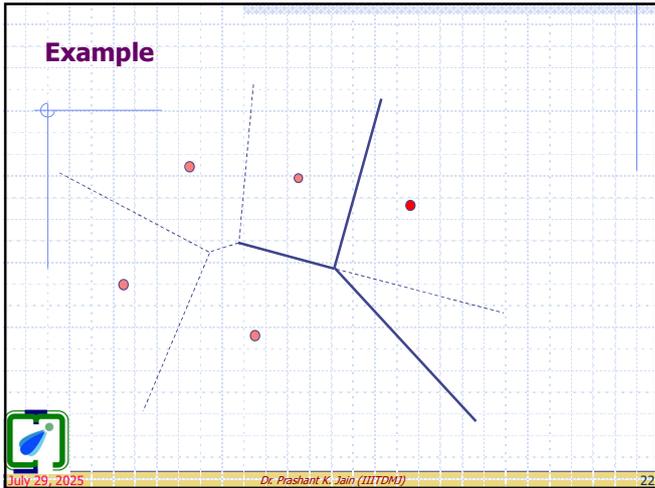
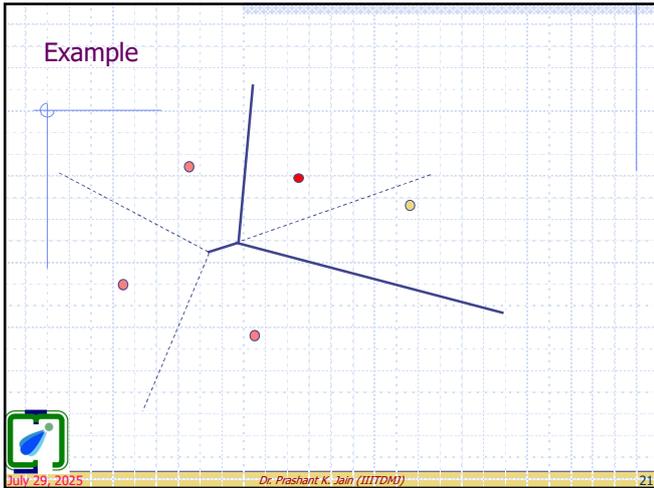
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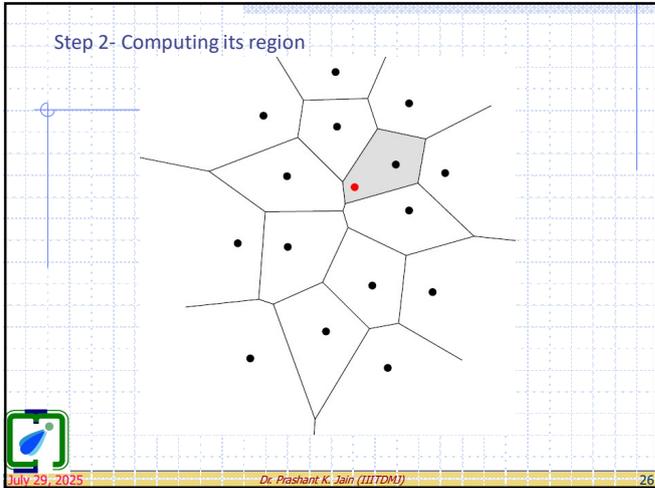
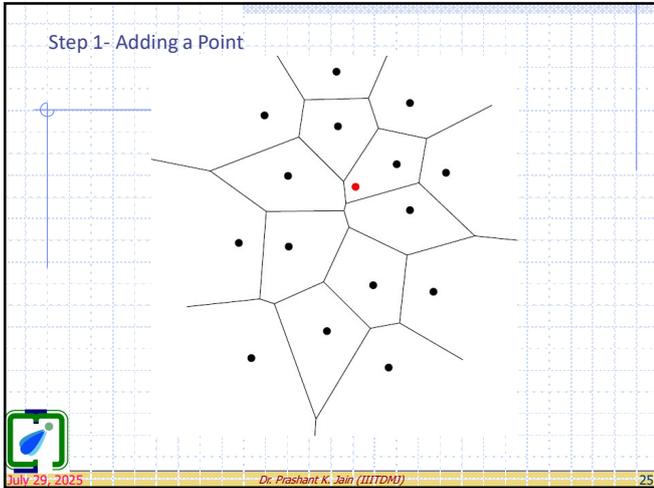
- ### Implementations
- ◆ Incremental Algorithm
 - ◆ Divide and Conquer Algorithm
 - ◆ Fortune's Algorithm (Sweep line)
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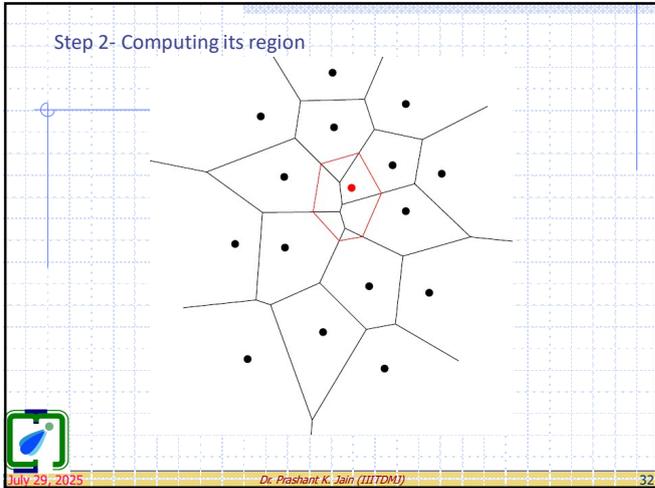
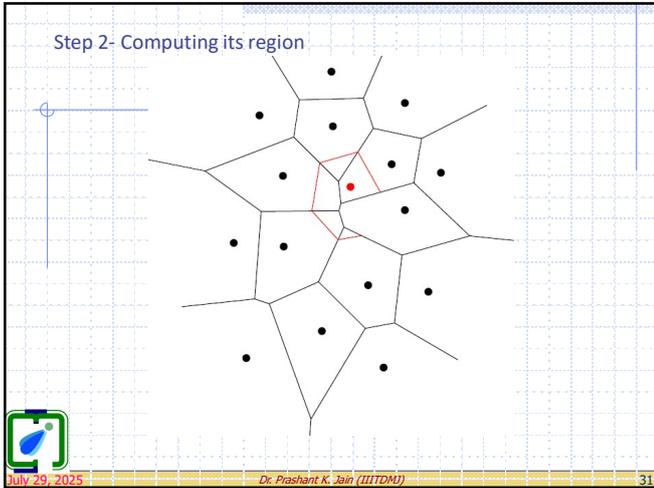
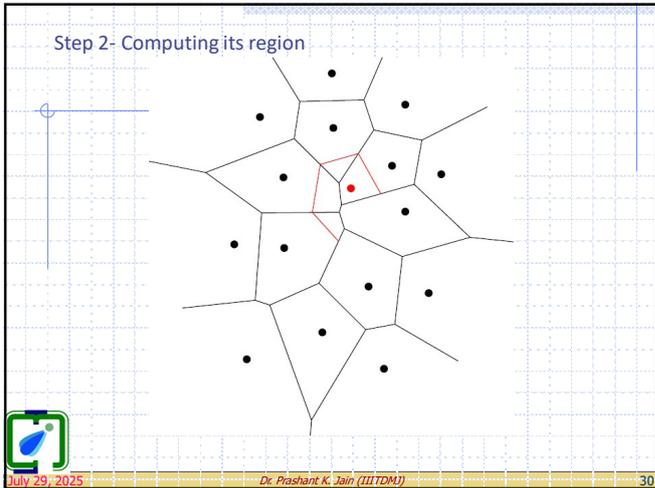
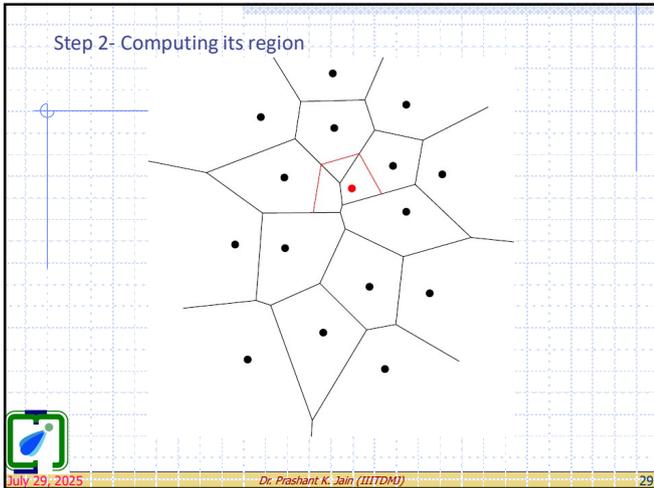
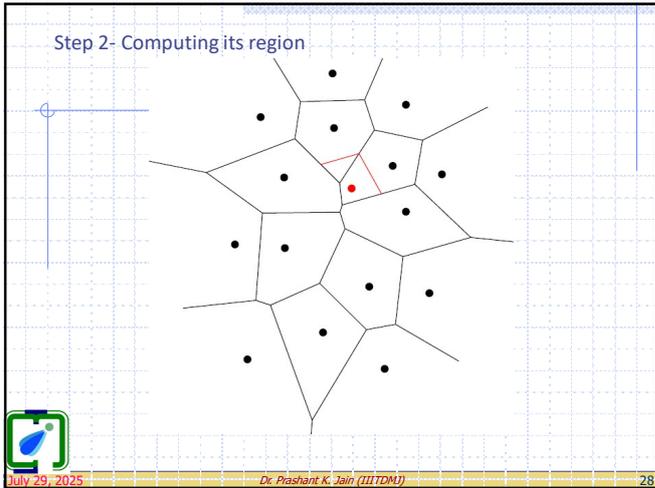
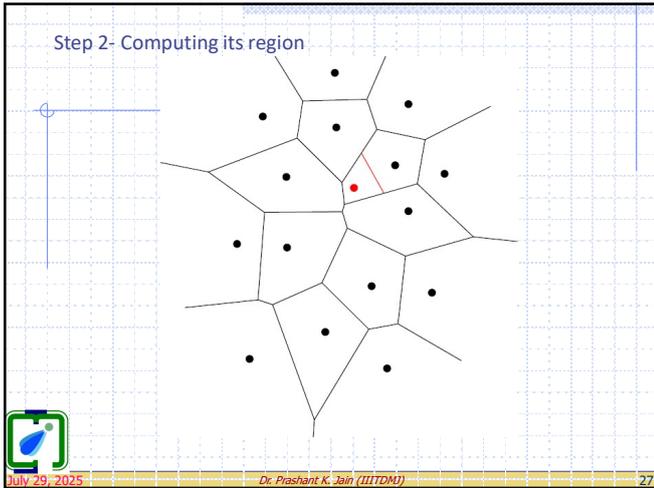
- ### Incremental Algorithm
- ◆ Starting with any point of $\{p_1, \dots, p_i\}$ add point p_{i+1}
 - ◆ Explore all candidates to find the site p_j closest to p_{i+1}
 - ◆ Draw the perpendicular bisector between the selected points
 - ◆ Select closest points again and again and draw the perpendicular bisector until the last point of the given data set is taken into consideration
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- Modification in the Voronoi diagram
- ◆ A single point is inserted at a time in the Voronoi Diagram
 - ◆ Computing the region
 - ◆ Draw perpendicular bisector between new points and its neighbour points
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Step 3- Prune the initial diagram

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Delaunay Triangulation

- A Delaunay Triangulation (DT) 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 $DT(P)$.
- The triangulation is named after Boris Delaunay for his work on this topic from 1934

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Contd..

- Circumcircle associated with each triangle contains no other point in its interior.
- The circumcircle associated with T_1 is empty. It does not contain a point in its interior.
- The circumcircle associated with T_2 is empty. It does not contain a point in its interior.
- This triangulation is a Delaunay triangulation

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Contd..

- The triangles below are different.
- The circumcircle associated with T_1 is not empty. It contains V_3 in its interior.
- The circumcircle associated with T_2 is not empty. It contains V_1 in its interior.
- This triangulation is not a Delaunay triangulation.

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Relationship with the Voronoi diagram

- The Delaunay triangulation of a discrete point set P in general position corresponds to the dual graph of the Voronoi diagram for P

The Delaunay triangulation with all the circumcircles and their centers (in red).

Connecting the centers of the circumcircles produces the Voronoi diagram (in red).

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Dual Nature

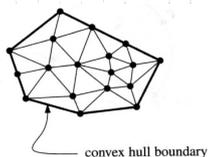
— Voronoi Diagram
— Delaunay Triangulation

B. Delaunay: Sur la sphère vide, Izvestia Akademii Nauk SSSR, Otdelenie Matematicheskikh i Estestvennykh Nauk, 7:793-800, 1934

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Delaunay Triangulation properties

- ◆ Delaunay triangulation is a straight-line dual graph of the Voronoi Diagram of a point set.
- ◆ Maximize the minimum angle of all the angles of the triangles in the triangulation.
- ◆ A circle circumscribing any Delaunay triangle does not contain any other input points in its interior. Circumcircles of all the triangles are empty.
- ◆ Outer polygon must be convex hull



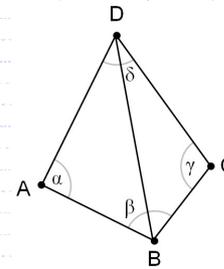
convex hull boundary

B. Delaunay; Sur la sphère vide, Izvestia Akademii Nauk SSSR, Otdelenie Matematicheskikh i Estestvennykh Nauk, 7:793-800, 1934

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Flipping

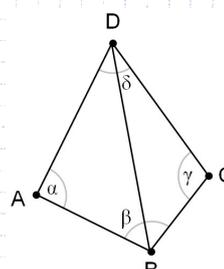
- ◆ Looking at two triangles ABD and BCD with the common edge BD.
- ◆ If the sum of the angles α and γ is less than or equal to 180° , the triangles meet the Delaunay condition.
- ◆ This is an important property because it allows the use of a flipping technique.



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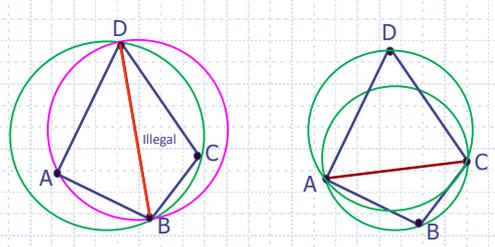
- ◆ Triangles with large internal angles are selected over ones with small internal angles.
- ◆ The triangles in the non-Delaunay triangulation have sharp angles at vertices B and D.
- ◆ If the edge {B, D} were replaced by an edge joining A and C, the minimum angle would be maximized and the triangulation would become a Delaunay triangulation.



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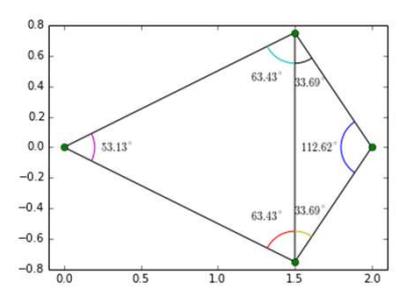
- ◆ If two triangles do not meet the Delaunay condition, switching the common edge BD for the common edge AC produces two triangles that do meet the Delaunay condition



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Flipping through animation

- ◆ If the connecting edge altered, the minimum angle would be maximized and the triangulation would become a Delaunay triangulation.

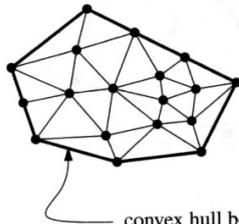


Source: https://en.wikipedia.org/wiki/Delaunay_triangulation

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Triangulation Details

- ◆ For P consisting of n points, all triangulations contain $2n-2-k$ triangles, $3n-3-k$ edges
- ◆ n = number of points in P
- ◆ k = number of points on convex hull of P



convex hull boundary

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Non-unique Delaunay Triangulation

- In two dimensions, degeneracies arise when four or more unique points lie on the same circle.
- The vertices of a square, for example, have a non-unique Delaunay triangulation

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3D Delaunay triangulation

- 3-D Delaunay triangulation made up of two tetrahedra
- The circumsphere of one tetrahedron is shown to highlight the empty circumsphere criterion
- A 3-D Delaunay triangulation produces tetrahedra that satisfy the empty circumsphere criterion.

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Applications

- For modelling terrain or other objects given a set of sample points, the Delaunay triangulation gives a nice set of triangles to use as polygons in the model. In particular, the Delaunay triangulation avoids narrow triangles.

Sierra Nevada terrain map

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Applications

- Determine a triangulation then raise points to desired height

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Applications

- Delaunay triangulations are used in creation of triangular meshes which are used analysis of stresses and strains in structures.

Shaded Plot
E1 smoothed
0.000
0.000
0.000
0.000
0.000

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Thale's Theorem

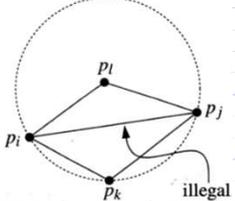
- Thale's Theorem can be used to test if an edge is legal
- Let C be a circle, l is a line intersecting C in points a and b and $p, q, r,$ and s points lying on the same side of l . Suppose that p and q lie on C , that r lies inside C , and that s lies outside C . Then:

$$\angle arb > \angle apb = \angle aqb > \angle asb.$$

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Testing for Illegal Edges

- ◆ If P_i, P_j, P_k, P_l form a convex quadrilateral and do not lie on a common circle, exactly one of P_iP_j and P_kP_l is an illegal edge
- ◆ The edge P_iP_j is illegal if P_l lies inside C
- ◆ Proved using Thales's Theorem. e.g., the angle $P_iP_kP_j$ is smaller than the angle $P_iP_lP_j$




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Computing Legal Triangulations

- ◆ Compute a triangulation of input points P
- ◆ Flip illegal edges of this triangulation until all edges are legal



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Flip Algorithms

- ◆ If we have any triangulation of the points available, then illegal edges are found using Thale's Theorem and then they are flipped repeatedly until no triangle is non-Delaunay.



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References:-

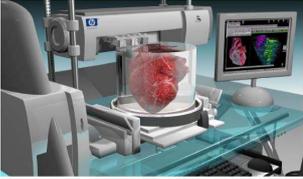
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- ◆ Vera Sacristan, Computational Geometry, Facultat d'Informatica de Barcelona, Universitat Politecnica de Catalunya
- ◆ Mark de Berg, Marc van Kreveld, Mark Overmars, and Otfried Schwarzkopf. "Computational Geometry: Algorithms and Applications." Springer-Verlag, second edition, 2000.



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THANK YOU






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Incremental Algorithm

- ◆ Each point is inserted in Voronoi Diagram one by one.
- ◆ Step 1- Starting with the Voronoi diagram of $\{p_1, \dots, p_i\}$ add point p_{i+1}
- ◆ Step 2- Explore all candidates to find the site p_j closest to p_{i+1} and compute its region by building its boundary starting from bisector $b_{i+1,j}$.
- ◆ Step 3- Update the diagram by pruning the initial edges.



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Delaunay Triangulation

- ◆ Delaunay triangulation is a straight-line dual graph of the Voronoi Diagram of a point set.
- ◆ Maximize the minimum angle of all the angles of the triangles in the triangulation.
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— Voronoi Diagram
— Delaunay Triangulation

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Delaunay Triangulation

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Applications

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