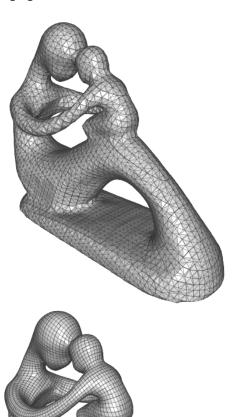
600.657: Mesh Processing

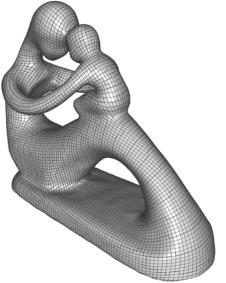
Chapter 6

Outline

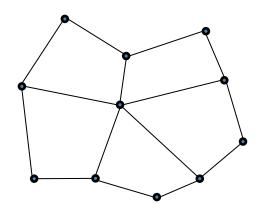
- Properties of a mesh
- Voronoi Diagrams & Delaunay Triangulations
- Triangle-Based Remeshing
 - Restricted Delaunay
 - Isotropic Remeshing

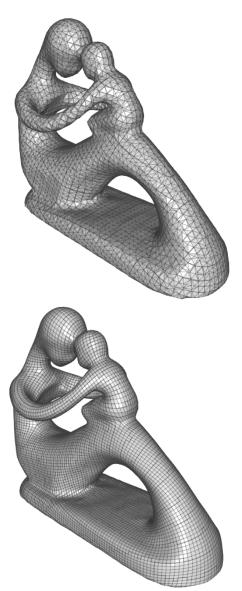
- Element Type
 - Triangles: define a simple function space for FEM simulations
 - Quads: can correspond to a local frame / symmetric matrix



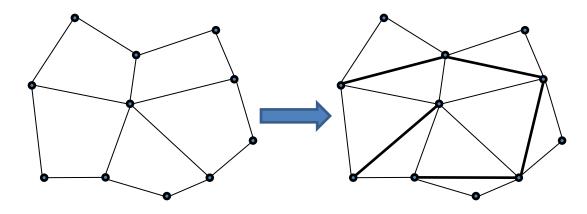


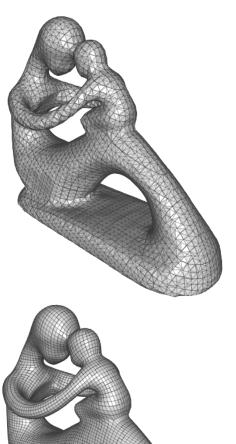
- Element Type
 - Quad to triangles

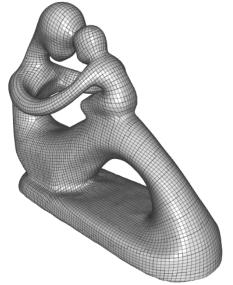




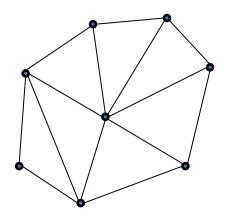
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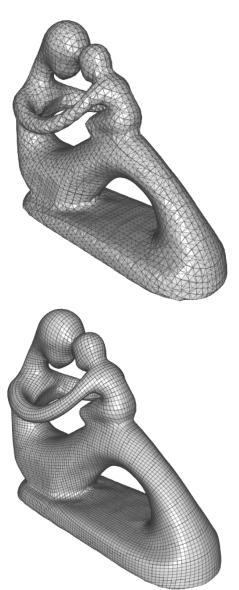




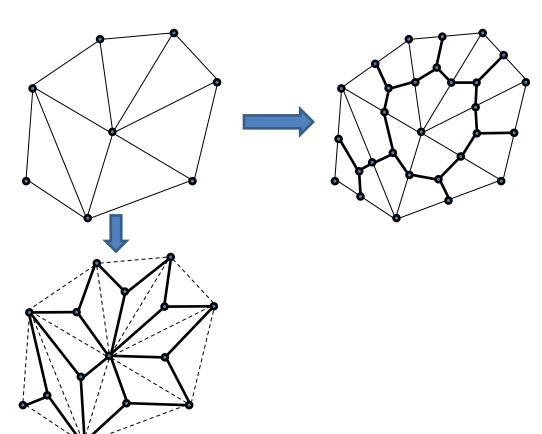


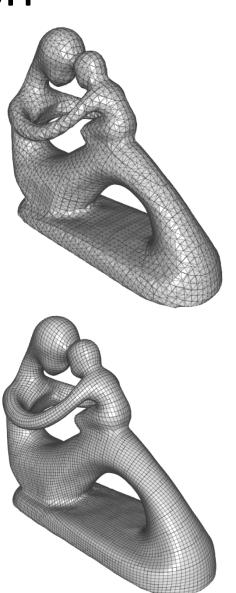
- Element Type
 - Quad to triangles



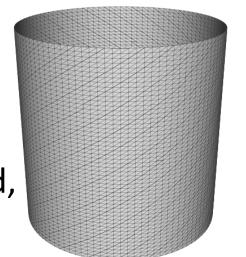


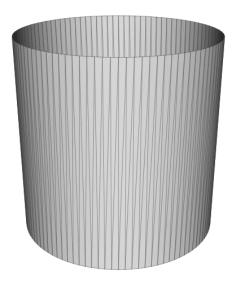
- Element Type
 - Quad to triangles



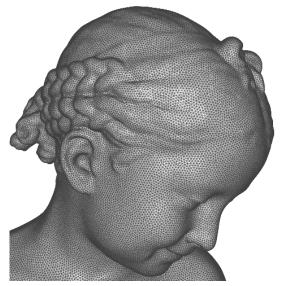


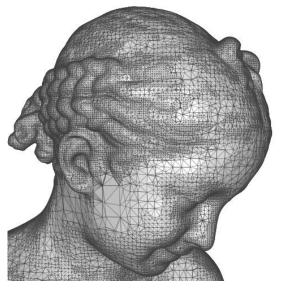
- Element Shape
 - Isotropic: better for FEM simulations
 - Anisotropic: supports an equally good,
 but cheaper, fit to the surface.





- Element Density
 - Uniform: better for FEM
 - Adaptive: requires fewer elements to represent a surface of the same geometry complexity.





Outline

- Properties of a mesh
- Voronoi Diagrams & Delaunay Triangulations
- Triangle-Based Remeshing

Convex Hulls

Definition:

Given a finite set of points $P=\{p_1,...,p_n\}\subset \mathbb{R}^n$, the convex hull the set of points consisting of the convex combinations of points in P:

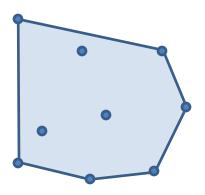
Convex
$$(P) = \left\{ \sum_{p \in P} \alpha_p p \middle| \alpha_p \ge 0 \text{ and } \sum_{p \in P} \alpha_p \right\}$$

Convex Hulls

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Given a finite set of points $P = \{p_1, ..., p_n\} \subset \mathbb{R}^n$, the convex hull the set of points consisting of the convex combinations of points in P:

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Planar Triangulations

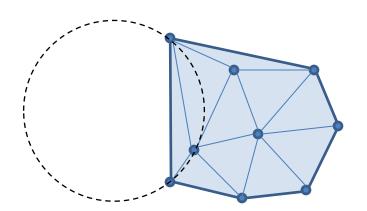
Definition:

A triangulation of a finite set of points $P=\{p_1,...,p_n\}$ is a decomposition of the convex hull of P into triangles with the property that:

- —The set of triangle vertices equals P
- The intersections of two triangles is either empty or is a common edge or vertex.

Definition:

A triangulation of the set *P* is said to be *Delaunay* if the interior of the triangles' circumcircles are empty.

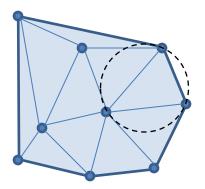


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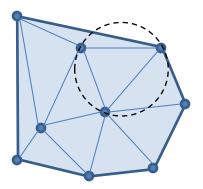
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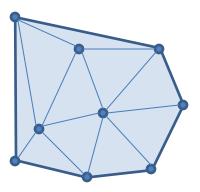
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A triangulation of the set *P* is said to be *Delaunay* if the interior of the triangles' circumcircles are empty.



Computing the Delaunay Triangulation:

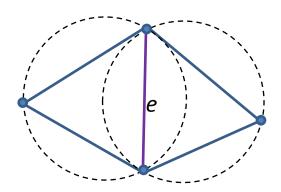
- Incremental
- Divide and Conquer
- Sweepline (planar)
- Convex hulls of paraboloids



Delaunay Edges

Definition:

An interior edge *e* is *locally Delaunay* if the interiors of the circum-circles of the two triangles do not contain the triangles' vertices.



Delaunay Edges

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Property:

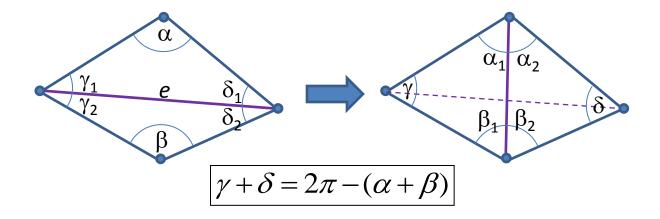
An interior edge is Delaunay iff. the sum of the opposite angles is not greater than π .

 $\alpha+\beta\leq\pi$

Delaunay Edges

Note:

If the sum of the opposite angles is greater than π , then flipping the edge will give a sum that is less than π .



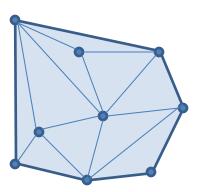
Property:

A triangulation is Delaunay if and only if every interior edge is locally Delaunay.

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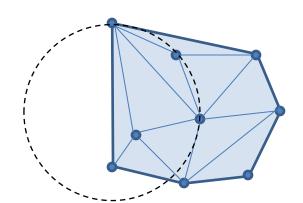
Edge Flipping Algorithm:



Property:

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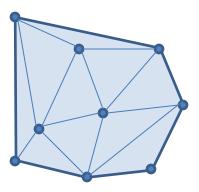
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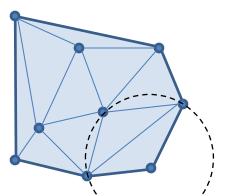
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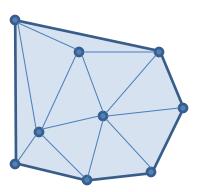
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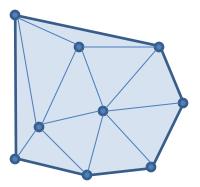
Edge Flipping Algorithm:



Edge Flipping Algorithm:

Starting with an arbitrary triangulation, flip edges until each edge is locally Delaunay.

Is this algorithm guaranteed to terminate?



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Starting with an arbitrary triangulation, flip edges until each edge is locally Delaunay.

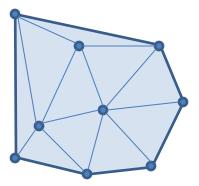
Is this algorithm guaranteed to terminate?

Termination is proved by:

- Showing that there finitely many different triangulations.
- Defining a global "energy" that is reduced with each flip (e.g. sum of squared circum-radii.)

Why Should we Care:

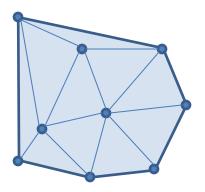
Of all possible triangulations, the Delaunay triangulation maximizes the minimal angle.



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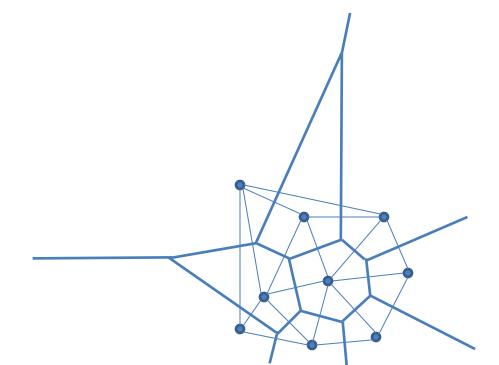
This results in a triangulation with "well-formed" triangles, facilitating numerical processing over the triangulation.



Definition:

The *Voronoi Diagram* of the set P is the partition of space into cells V(p) such that for all $q \in V(p)$, q is closer to p than to any other point $p' \in P$.

The Voronoi Diagram of *P* is the dual of the Delaunay Triangulation.



The Voronoi Diagram of *P* is the dual of the Delaunay Triangulation:

− <u>2D</u>:

- Every vertex of the triangulation is dual to a polygon in the diagram.
- Every edge of the triangulation is dual to an edge of the diagram.
- Every triangle of the triangulation is dual to a vertex of the diagram.

The Voronoi Diagram of *P* is the dual of the Delaunay Triangulation:

− <u>3D</u>:

- Every vertex of the triangulation is dual to a polyhedron in the diagram.
- Every edge of the triangulation is dual to an face of the diagram.
- Every triangle of the triangulation is dual to an edge of the diagram.
- Every tetrahedron of the triangulation is dual to a vertex of the diagram.

Restricted Delaunay Triangulation

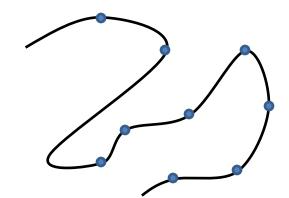
Goal:

Given a surface S and a set of points P in S, we would like to compute a good triangulation of P that is true* to the surface.

^{*}Note that not every point set P has to admit a true triangulation.

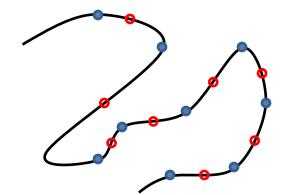
Approach (Take 1):

We could compute a Voronoi Diagram on *S* using the notion of distances on the surface, and then take the dual to get a Delaunay Triangulation.



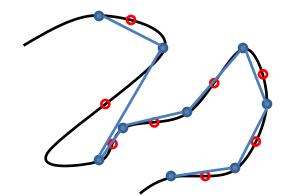
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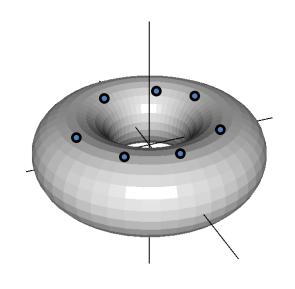


Approach (Take 1):

We could compute a Voronoi Diagram on *S* using the notion of distances on the surface, and then take the dual to get a Delaunay Triangulation.

Challenges:

- 1. Measuring distances on a surface can be expensive.
- 2. The dual complex may not be a manifold (or even have any triangles).

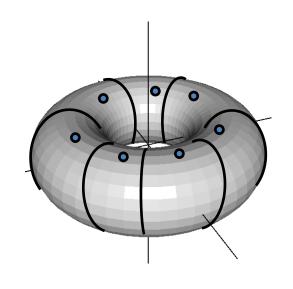


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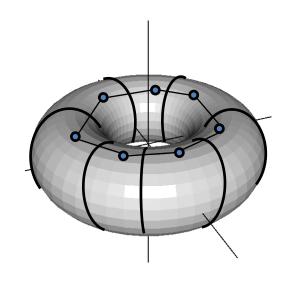


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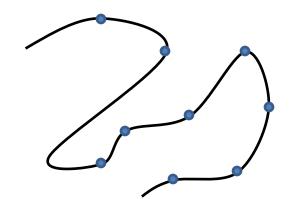
Challenges:

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Approach (Take 2):

Instead of trying to compute a Voronoi Diagram using distances on the surface, compute a regular Voronoi Diagram and look at its restriction to the surface.



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Instead of trying to compute a Voronoi Diagram using distances on the surface, compute a regular Voronoi Diagram and look at its restriction to the surface.

- Add a Delaunay edge between vertices $p,p' \in P$ if their Voronoi regions meet on the surface.
- Add a Delaunay triangle between vertices $p,p',p'' \in P$ if their Voronoi regions meet on the surface.

Approach (Take 2):

Instead of trying to compute a Voronoi Diagram

Note:

- The Voronoi regions of the vertices of a Delaunay edge meet on the surface iff. the dual Voronoi face intersects the surface.
- The Voronoi regions of the vertices of a Delaunay triangle mee on the surface iff. The dual Voronoi edge intersects the surface.

 $p,p' \in P$ if their Voronoi regions meet on the surface.

Add a Delaunay triangle between vertices
 p,p',p'' ∈ P if their Voronoi regions
 meet on the surface.

Approach (Take 2):

Instead of trying to compute a Voronoi Diagram

Note:

- The Voronoi regions of the vertices of a Delaunay edge meet on the surface iff. the dual Voronoi face intersects the surface.
- The Voronoi regions of the vertices of a Delaunay triangle mee

Note that there is (still) no guarantee that the restricted Delaunay Triangulation is manifold.

on the surface.

Add a Delaunay triangle between vertices
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 meet on the surface.

Outline

- Properties of a mesh
- Voronoi Diagrams & Delaunay Triangulations
- Triangle-Based Remeshing
 - Restricted Delaunay
 - Isotropic Remeshing

Goal:

Use the restricted Delaunay Triangulation, to triangulate the points $P \subset S$.

Approach:

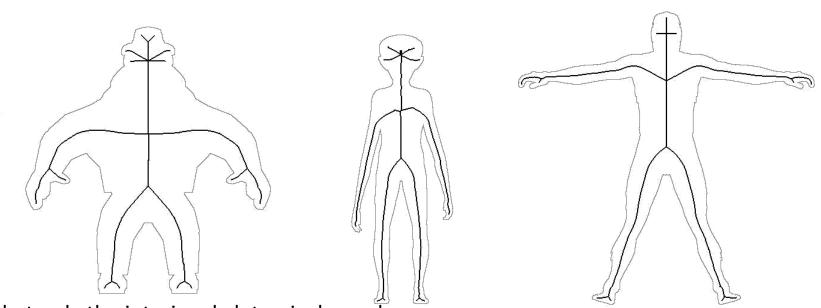
Ensure that the complex is manifold by inserting a additional points when it is not.

General Idea:

The restricted Delaunay Triangulation will fail to be manifold when the samples are not well-spaced.

Definition:

The *medial axis* or *skeleton* of a shape is the set of points that are simultaneously closest to two points on *S*.



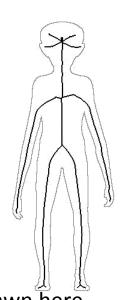
^{*}Note that only the interior skeleton is drawn here.

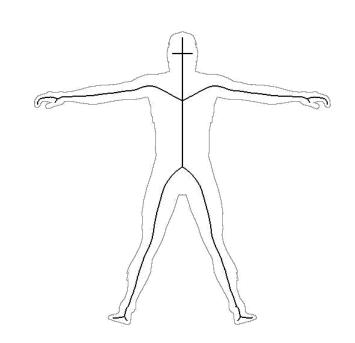
Definition:

The *reach* of a point on *S* is its distance to the nearest point on the medial axis.

This provides a measure of:

- Curvature
- Proximity of surface sheets





*Note that only the interior skeleton is drawn here.

Note:

If we intersect a surface with a ball and the set of points on the intersection have reach smaller than the radius of the ball, then the intersection is connected.

General Idea:

The restricted Delaunay Triangulation will fail to be manifold when the samples are not well-spaced.

More Specifically:

We want points on the Delaunay Triangulation to be closer to each other than their reach.

Algorithm:

Compute the Delaunay Triangulation.

Compute the restricted D. Triangulation

While there are triangles whose circumsphere's radius is larger than a fraction of the reach:

Add the intersection of the triangle's dual with the surface (Locally) update the Delaunay Triangulation

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Algorithm:

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Compute the restricted D. Triangulation

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(Locally) update the Delaunay Triangulation

Algorithm:

Compute the Delaunay Triangulation.

Compute the restricted D. Triangulation

While there are triangles whose circumsphere's radius is larger than a fraction of the reach:

Add the intersection of the triangle's dual with the surface (Locally) update the Delaunay Triangulation

Update the Restricted D. Triangulation

*Note that the algorithm would still keep going

<u>Implementation Requirements</u>:

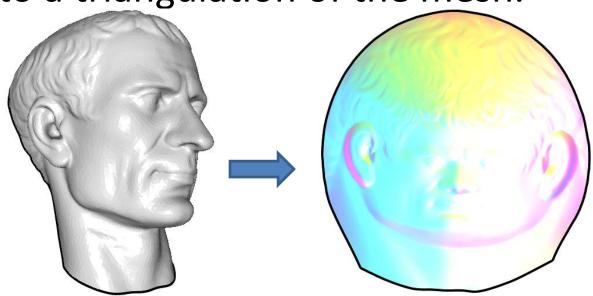
- A single computation of a (restricted) Delaunay
 Triangulation plus local updates.
- The ability to evaluate the reach of a surface point.
- The ability to intersect the dual Voronoi edge with the surface.

Properties:

- With the appropriate scaling, the method returns a manifold, non-self-intersecting, triangulation with the same topology as S.
- May over-refine in flat regions.
- Requires a strictly positive reach (which is not satisfied triangle meshes).

Observation:

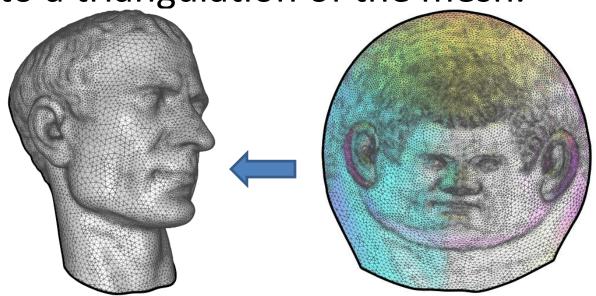
Given a parameterization of *S* over a 2D domain, we can pull back a triangulation of the 2D domain to a triangulation of the mesh.*



*May have intersecting triangles

Observation:

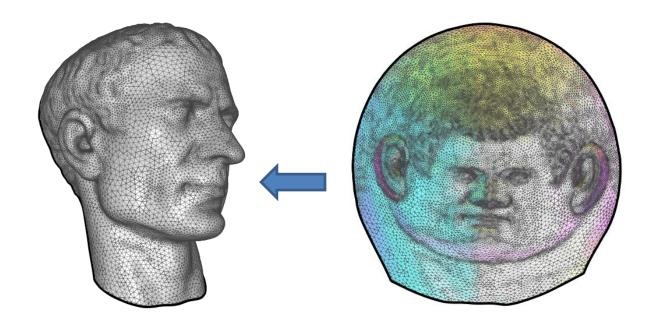
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Questions:

- 1. Which parameterization do we choose?
- 2. How do we triangulate the 2D domain?

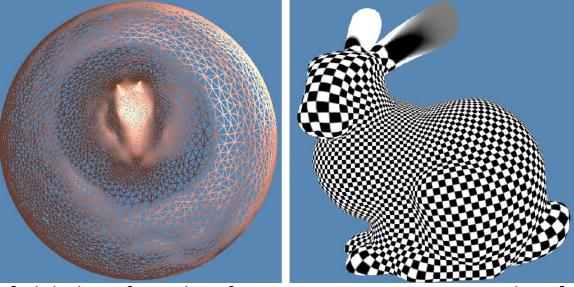


1. Which parameterization do we choose?

Use a conformal parameterization.

The distortion is strictly due to scaling, so we can undue that by appropriately tesselating the

2D domain.



[Global Conformal Surface Parameterization, Gu and Yau]

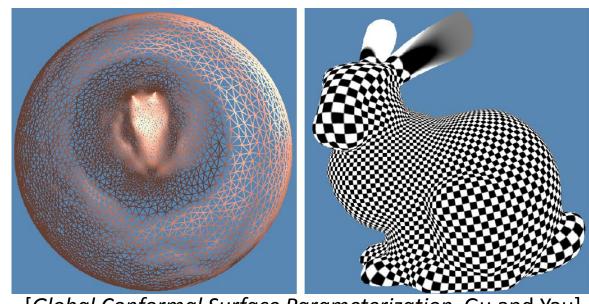
2. How do we triangulate the 2D domain?

If we have a point sampling, we can compute the (constrained) Delaunay triangulation...

So how do we choose the point set?

Goal:

We would like to undue the area distortion caused by the conformal map.



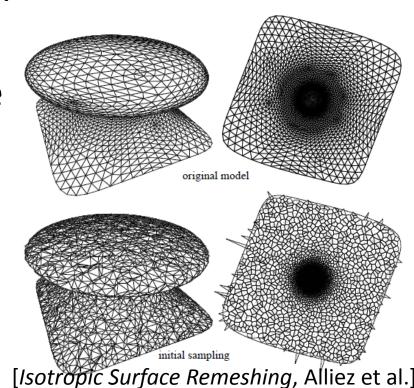
[Global Conformal Surface Parameterization, Gu and Yau]

Goal:

We would like to undue the area distortion caused by the conformal map.

Approach:

Use the distortion to sample the 2D domain adaptively.



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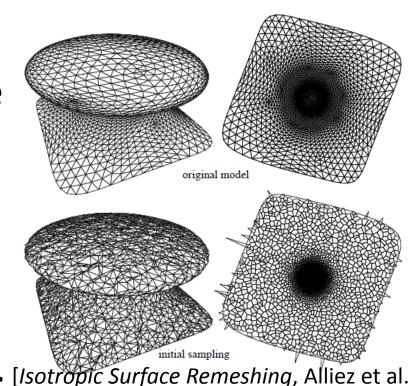
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Approach:

Use the distortion to sample the 2D domain adaptively.

Challenge:

Just because the points are randomly distributed, that doesn't make them uniform. [Isotropic Surface Remeshing, Alliez et al.]



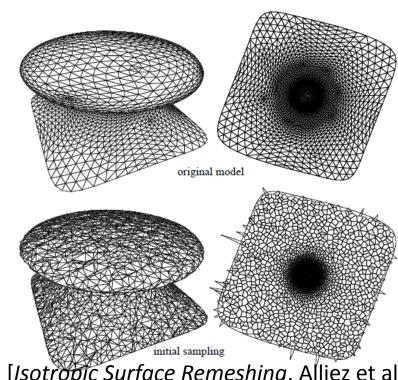
Update/Solve for well-distributed positions.

Given a density function ρ , solve for a point set P and a partition of the 2D domain:

$$\Omega = \bigcup_{p \in P} R_p$$

that minimizes:

$$E(P,R) = \sum_{p \in P} \int_{x \in R_p} \rho(x) ||x - p||^2 dx$$

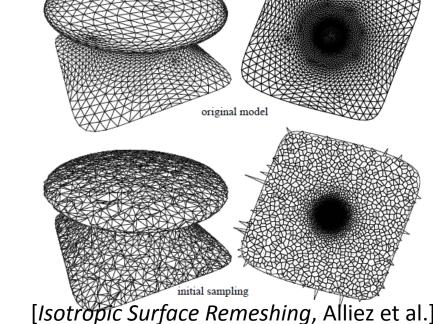


[Isotropic Surface Remeshing, Alliez et al.]

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Lloyd Relaxation:

Though finding the optimal solution is hard, improving on a solution is easy.



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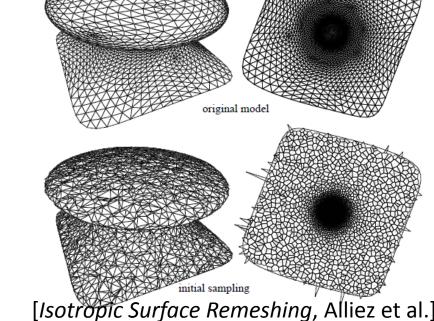
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Observations:

- Given the positions P, the R_p minimizing the energy are the Voronoi regions of $p \in P$.



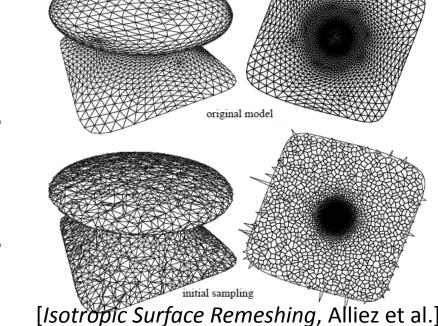
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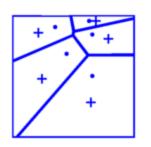
- Given the positions P, the R_p minimizing the energy are the Voronoi regions of $p \in P$.
- Given the regions R_p , the p minimizing the energy are the ρ-weighted centers of R_p .

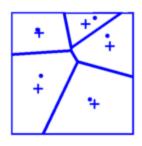


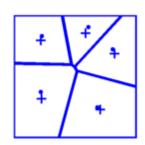
$$E(P,R) = \sum_{p \in P} \int_{x \in R_n} \rho(x) ||x - p||^2 dx$$

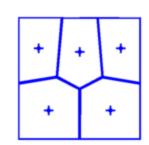
Implementation:

Iteratively alternate between computing the Voronoi regions of the points in *P*, and computing the centers of the regions.



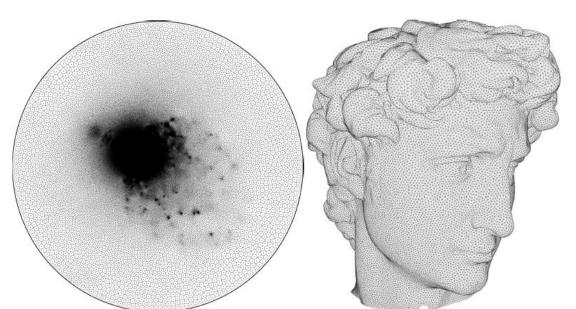


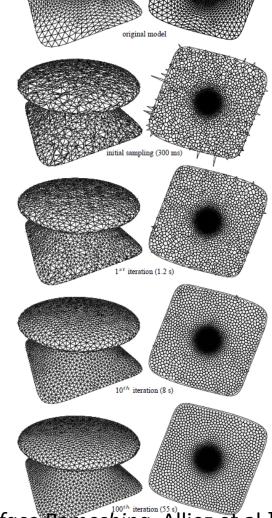




$$E(P,R) = \sum_{p \in P} \int_{x \in R_p} \rho(x) ||x - p||^2 dx$$

Applying this using the distortion weights from the conformal map, we get an isotropic tessellation.

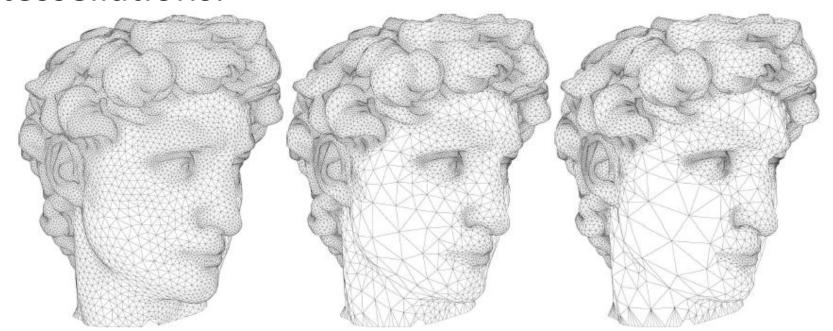




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Adapting the weights to take into account, curvature, you can get curvature-adapted tessellations.



[Isotropic Surface Remeshing, Alliez et al.]

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Constraining the Delaunay Triangulation, you can preserve edges in the triangulation.

