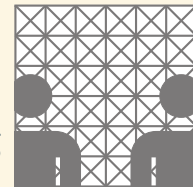


SURFACE RECONSTRUCTION

Senad Ličina

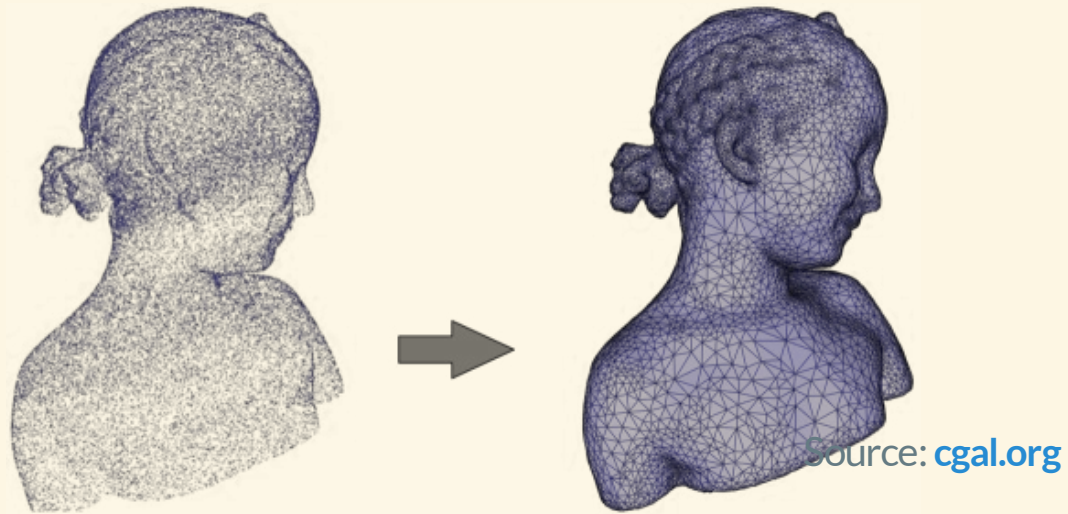
25.11.2013

Seminar: Intelligent Robotics
Fachbereich Informatik
Universität Hamburg



PROBLEM DESCRIPTION

The goal is to find the best approximating surface for a given 3D-Pointcloud.



APPLICATIONS

- Archeology, architecture & sculpture
- Computer graphics
- Medical applications
- Cartography
- Reverse engineering
- Fashion design & production

ROADMAP

1. Iterative closest point

- Point matching
- Minimizing the error metric

2. Delaunay triangulation

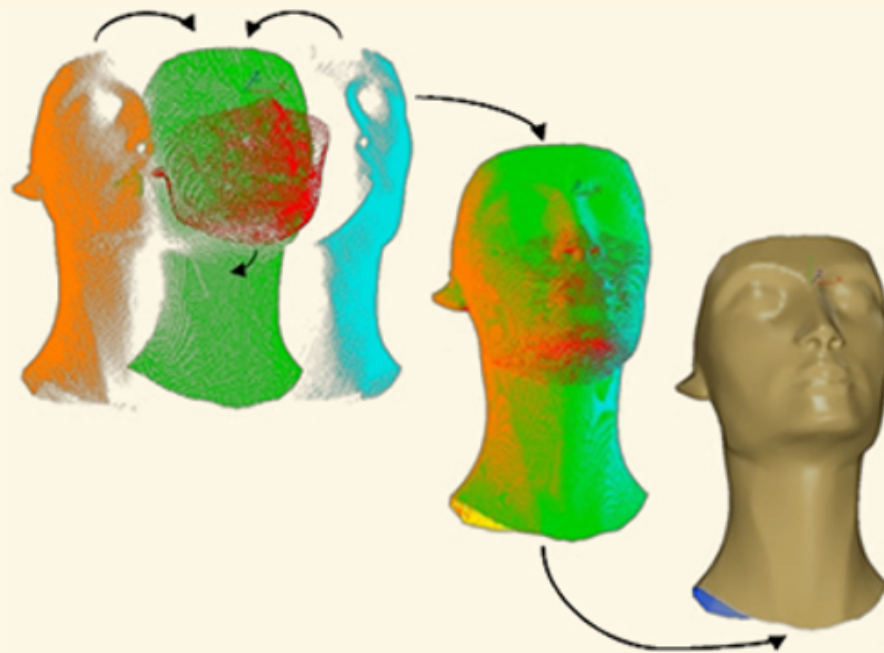
- Triangulations
- Empty circle property
- Voronoi diagram & Delaunay graph
- Randomized incremental approach

3. α -shapes

- Simplex
- Complex
- Estimating interior
- Influence of α

ITERATIVE CLOSEST POINT (ICP)

Algorithm to align multiple point clouds of an object by minimizing their difference.

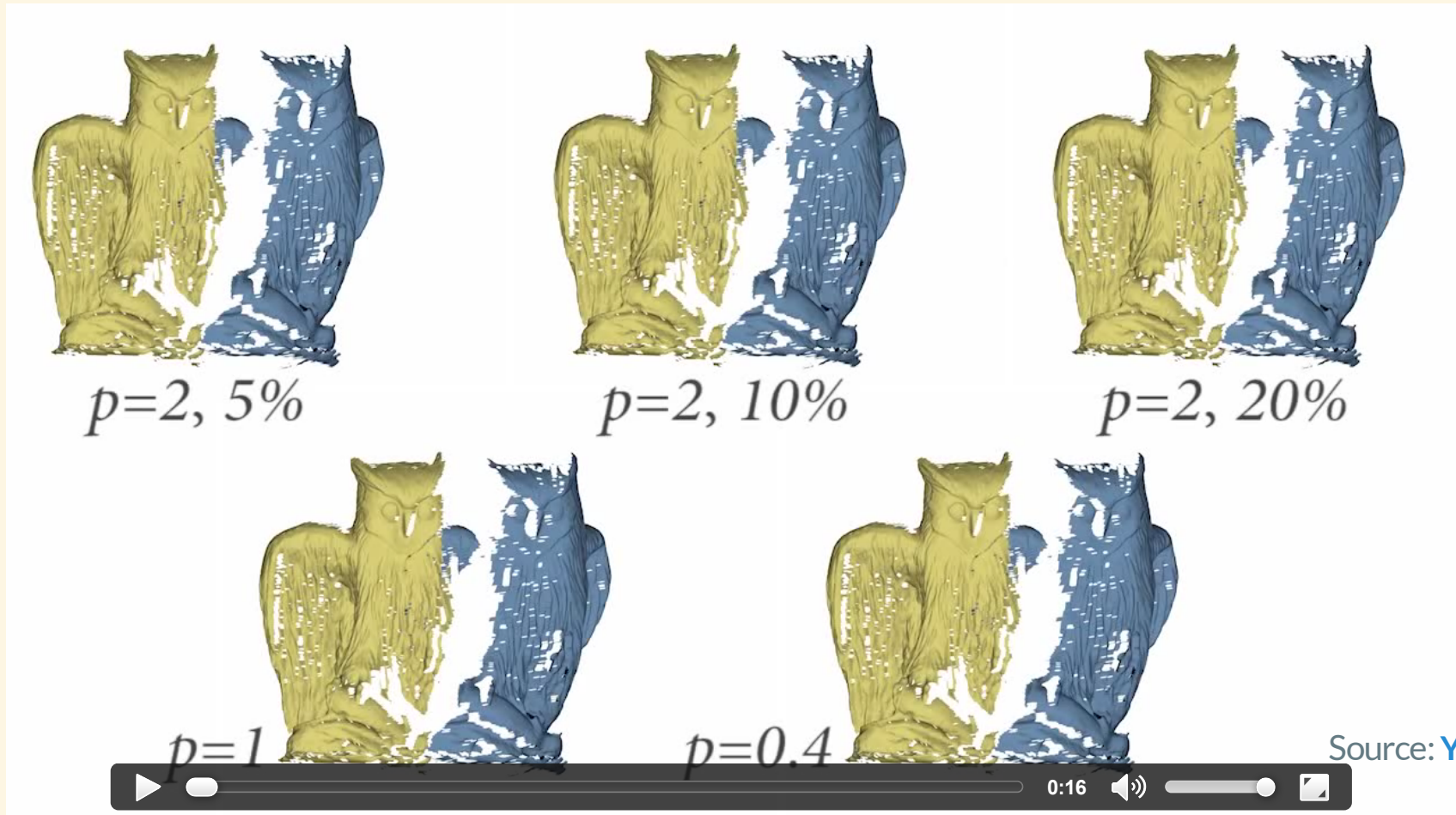


ITERATIVE CLOSEST POINT (ICP)

HOW IT WORKS

1. Selection of points
 - Downsampling
 - Feature extraction
2. Find corresponding points
 - Closest Point Matching
 - Projection-based Matching
 - Weight pair correspondence (optional)
 - Reject bad matches entirely (optional)
3. Estimate and minimize error
 - Point-to-point distance
 - Point-to-plane distance
 - Perform transformation
4. While the error is too big: iterate!

ITERATIVE CLOSEST POINT (ICP)



ITERATIVE CLOSEST POINT (ICP)

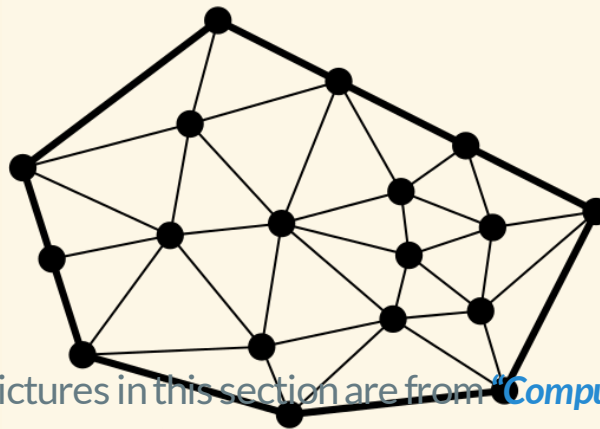
SUMMARY

- ICP is a widely used alignment algorithm
- Many variants have been proposed
- Implementations are available
 - [libICP \(C++\)](#), [PCL \(X-plattform\)](#)
- Is only locally optimal
- Requires a good initial estimate of the relative pose
- Performance depends on transformation and error estimation functions

DELAUNAY TRIANGULATION

TRIANGULATIONS

- A triangulation T is a maximum planar subdivision from a set of sample points P with triangles as bound faces. The points of P are represented as vertices
- An optimal triangulation maximizes the smallest angle
- Any angle-optimal triangulation of P is a Delaunay triangulation of P

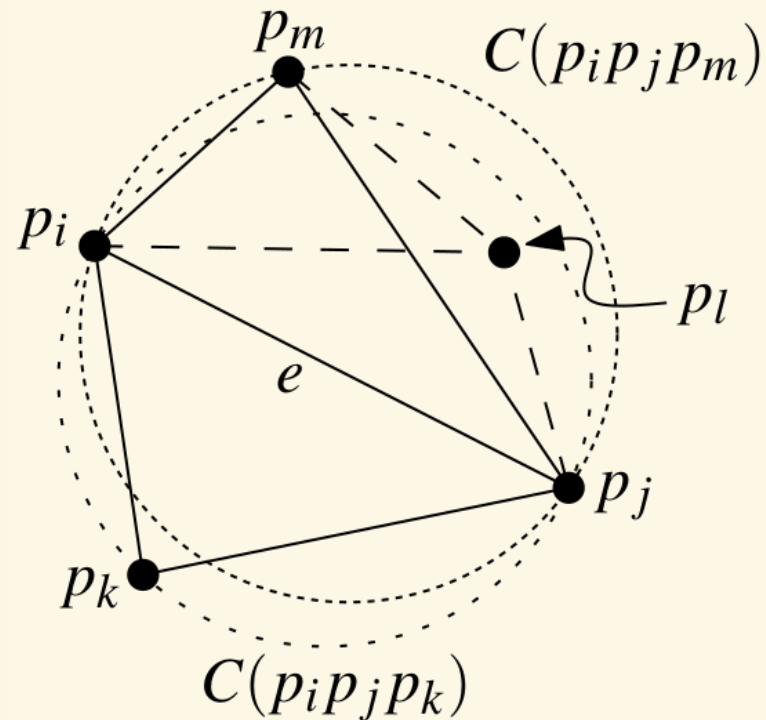


Pictures in this section are from "[Computational Geometry: Algorithms and Applications](#)"

DELAUNAY TRIANGULATION

EMPTY CIRCLE PROPERTY

T is a Delaunay triangulation of P if and only if the circumcircle of any triangle of T does not contain a point of P in its interior.



DELAUNAY TRIANGULATION

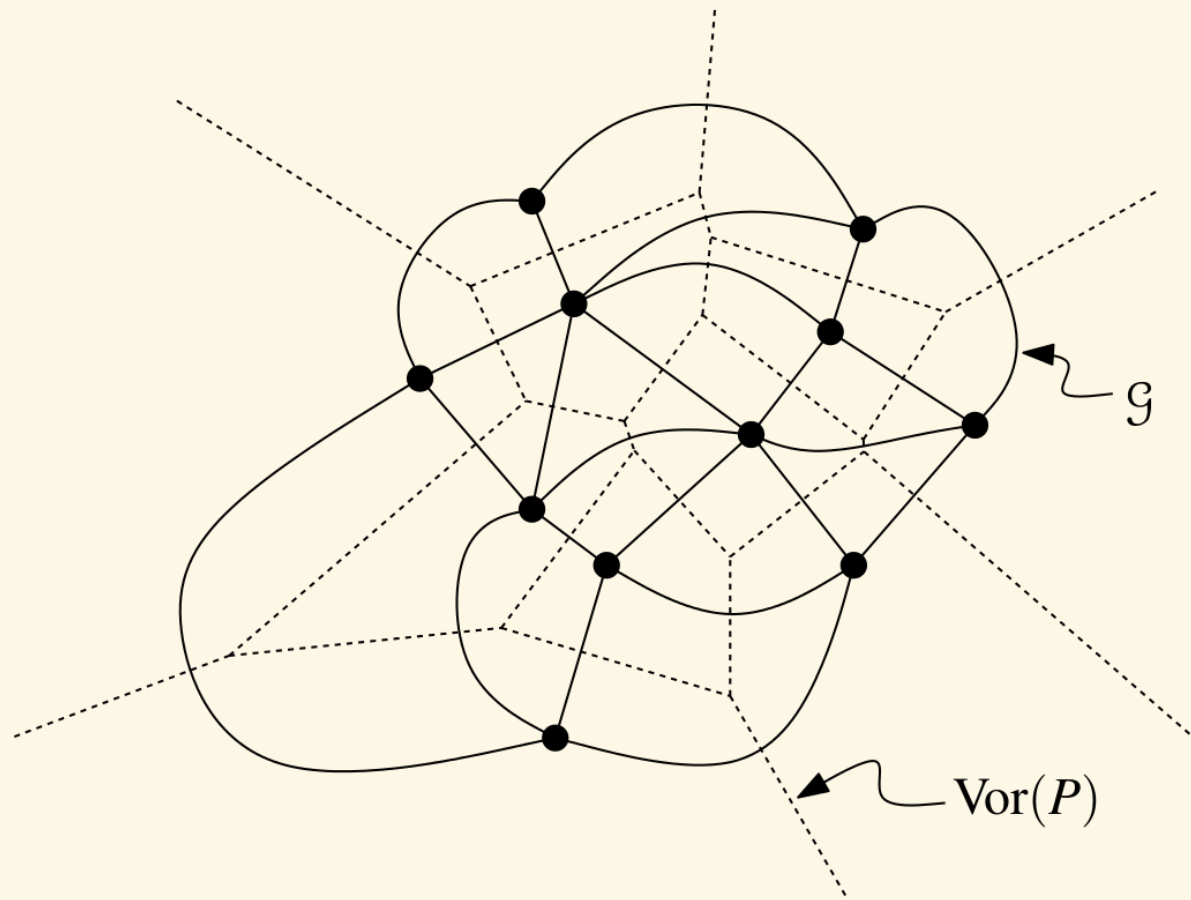
COMPUTING DELAUNAY TRIANGULATIONS

There are various approaches to compute a Delaunay triangulation. I will concentrate on the following two:

- Extracting the dual graph of the Voroni digram
- Randomized incremental approach

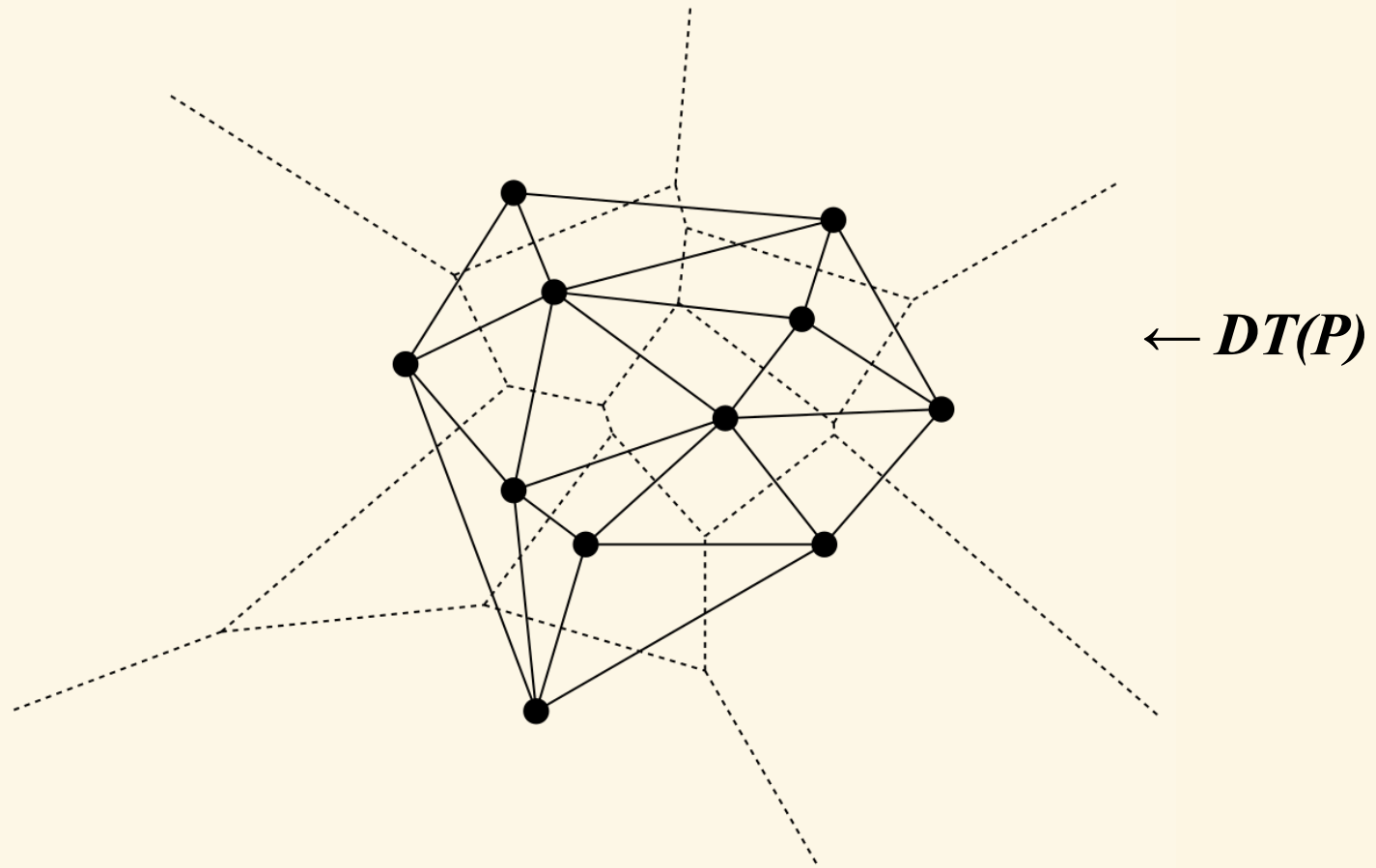
DELAUNAY TRIANGULATION

VORONOI DIAGRAM



DELAUNAY TRIANGULATION

DELAUNAY GRAPH



DELAUNAY TRIANGULATION

RANDOMIZED INCREMENTAL APPROACH

1. p_0 = any “edge” point from P (e.g. top-&rightmost)
2. Choose $p_{-1}, p_{-2} \in \mathbb{R}^2$ such that P is contained in the triangle $p_0p_{-1}p_{-2}$
3. Connect $p_0p_{-1}p_{-2}$ and use it as initial T
4. for each p_i in P :
 5. Find the triangle t in which p_i is contained
 6. Subdivide t by connecting it's vertices with p_i and update T
 7. Search for illegal edges and flip them
8. Remove p_{-1}, p_{-2} and all their edges from T

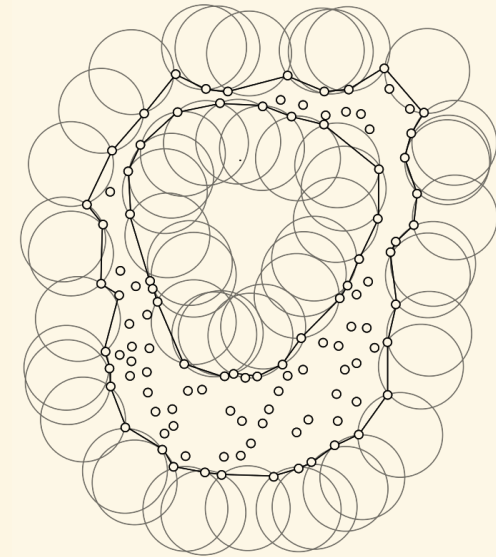
DELAUNAY TRIANGULATION

SUMMARY

- Delaunay triangulations can be used in various applications:
 - Surface reconstruction (terrain approximation)
 - Creation of an Euclidean minimum spanning tree
 - Finding solutions to the Traveling salesperson problem
 - Creation of α -Hulls
- Algorithms can run in $O(n \log n)$ for n points
- Implementations are available
 - [CGAL \(C++\)](#), [Triangle \(C/C++\)](#), [poly2tri \(X-platform\)](#)

α -SHAPES

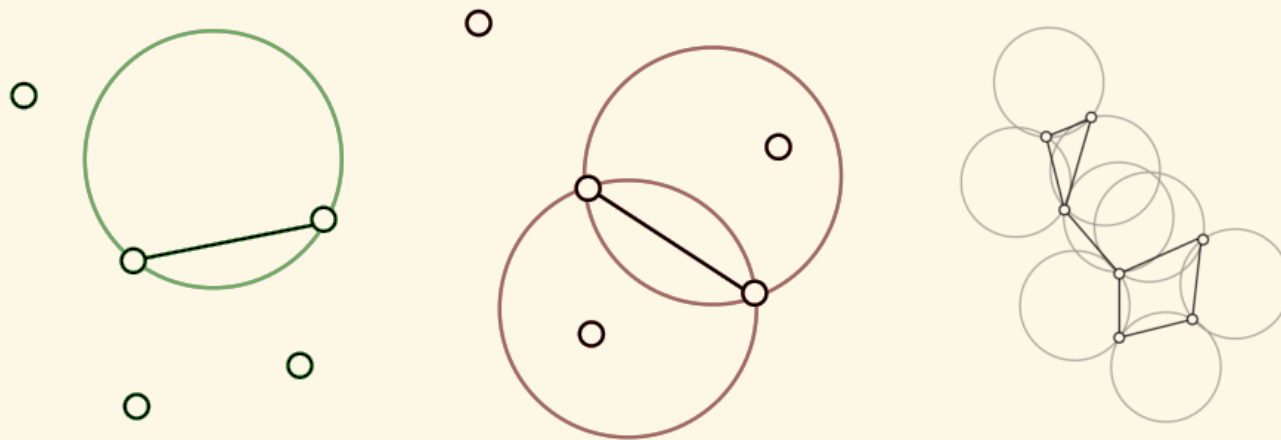
- α -shapes describe the “shape” formed by a given set $P \in \mathbb{R}^n$
- Generated by estimating *empty* n -spheres...
 - ...which are fixed by k ($2 \leq k \leq n$) points $p_i \in P$



Pictures in this section are from “[Introduction to Alpha Shapes](#)”

α -SHAPES

- k -simplex (Δ_T): A subset of P with at most n elements
- α -ball (b): a n -sphere of radius α
- An α -ball b is empty if it includes no point $\in P$
- A k -simplex Δ_T is α -exposed if an empty α -ball exists which lays on all points of Δ_T
- Boundary ∂S_α : Set of all α -exposed k -simplices



α -exposed

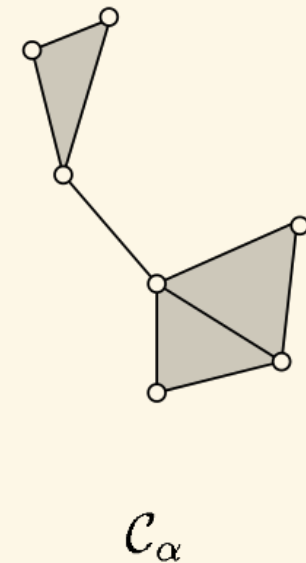
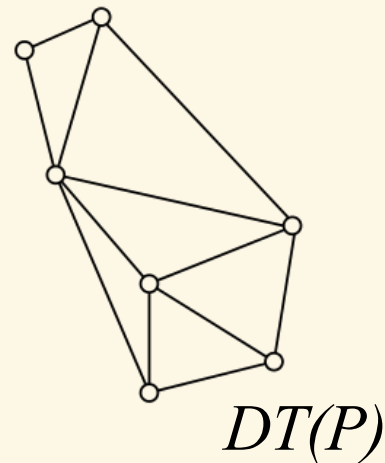
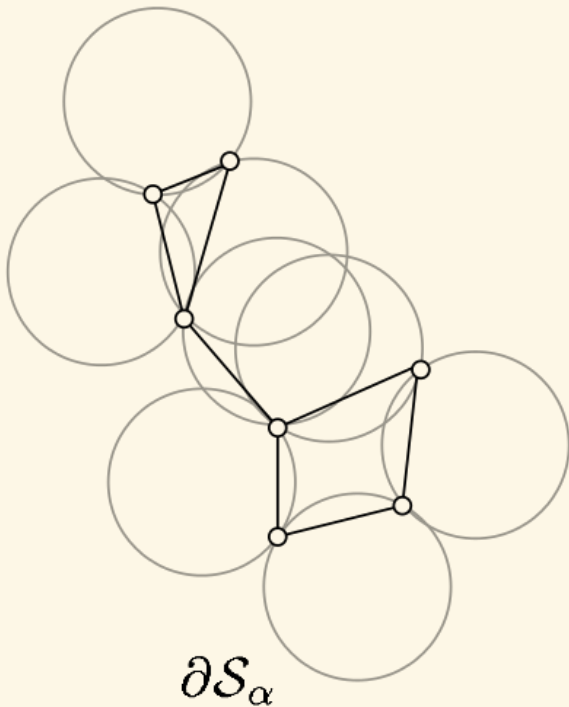
not α -exposed

∂S_α

α -SHAPES

DELAUNAY AGAIN

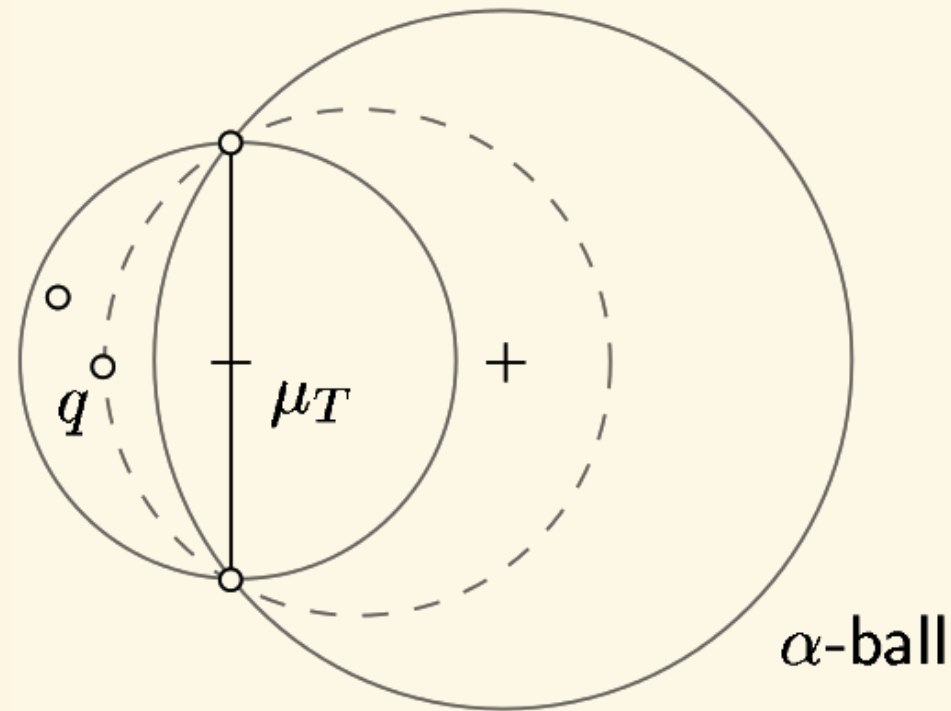
- All possible simplices are elements of the Delaunay triangulation
- It thereby is sufficient to search the elements of $DT(P)$ for simplices



α -SHAPES

ALPHA COMPLEXES

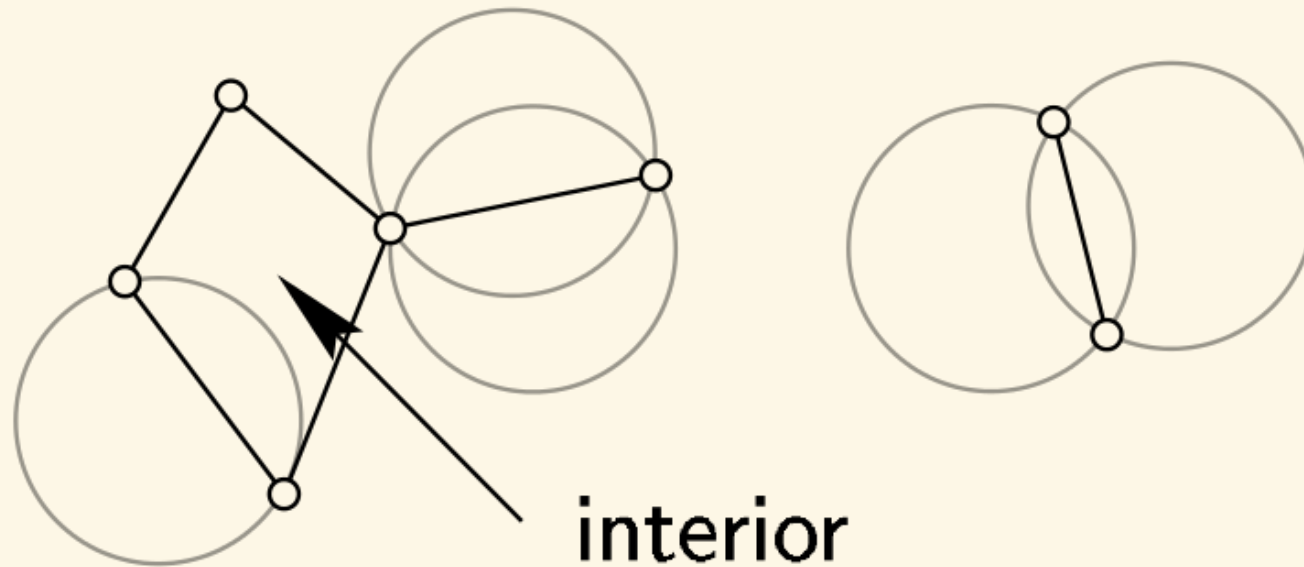
- An α -complex $C_\alpha(P)$ is a simplicial subcomplex of $DT(P)$
- Formed by the union of all boundaries ∂S_r with $r \leq \alpha$



α -SHAPES

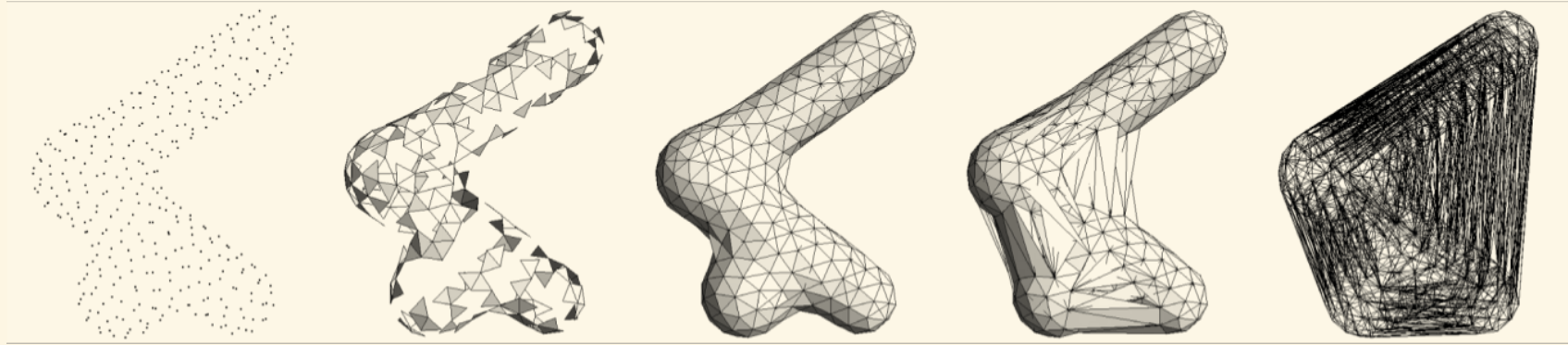
FINDING THE INTERIOR

Δ_T bounds the interior when exactly one α -ball is empty



α -SHAPES

INFLUENCE OF α



- When α is 0 the obtained α -shape will be identical to P
- When α is ∞ the obtained α -shape will be the convex hull of P

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THE END

THANK YOU FOR YOUR ATTENTION!



ANY QUESTIONS LEFT?