

Surface Reconstruction with Alpha Shapes

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Outline

1. Motivation
2. Background
3. Alpha Shapes
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5. Problems & Limitations
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Motivation

How to reconstruct a surface from a given set of points?

INPUT

range or contour data
(e.g. from laser range finder)



Point set [4]



OUTPUT

(most optimal) approximation
of the real surface



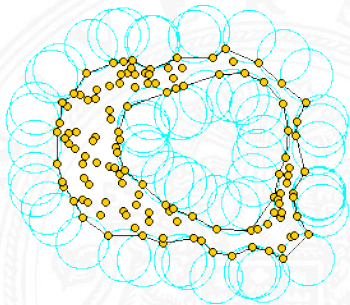
Alpha Shape [4]



Motivation

The ice cream analogy

- ▶ ice cream with solid chocolate chips
- ▶ spherical ice spoon
- ▶ curve out all parts of the ice cream without touching the chocolate chips
- ▶ straighten all curvatures

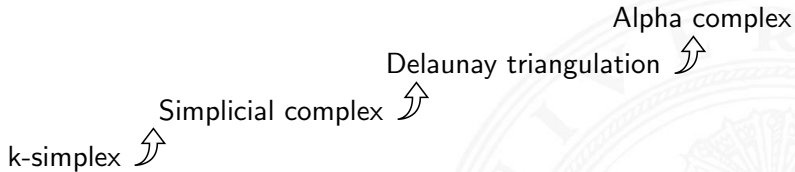


Alpha Shape in 2-dimensional space [4]



Background

How about the theory?



2D/3D

Explanation will be for 2D, extending to 3D is trivial







Background

k-simplex

Definition

k-simplex: Any subset $T \subseteq S$ of size $|T| = k + 1$, with $0 \leq k \leq 3(d)$ defines a k-simplex Δ_T that is the convex hull of T . [8]

$k = 0$	$k = 1$	$k = 2$	$k = 3$
 vertex Δ^0	 edge Δ^1	 triangle Δ^2	 tetrahedron Δ^3

<http://kurlin.org/blog/complexes-are-discretizations-of-shapes/>



Background

Simplicial complex

Definition

Simplicial complex:

A collection C of simplices forms a simplicial complex if it satisfies the following conditions:

1. for a simplex Δ_T of C , the boundary simplices of Δ_T are in C
2. for two simplices of C , their intersection is either \emptyset or a simplex in C

[5]

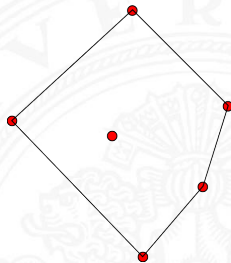


Background

Delaunay triangulation

Problem

- ▶ Given: point set S
- ▶ Underlying space: convex hull of S
- ▶ Goal: Divide $\text{conv}(S)$ into triangles with points of S as vertices.



Convex hull of a set of points



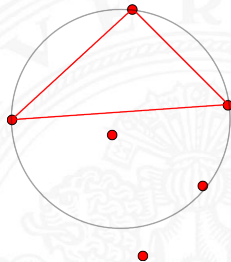
Background

Delaunay triangulation(cont.)

Algorithm

For each subset $T \subseteq S$, with $|T| = 3$

1. Test whether the circumcircle of T is empty
2. If yes, the points of T make up a triangle
3. otherwise discard T



Emptiness test is not successful



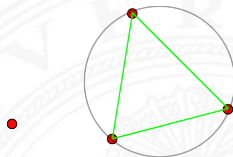
Background

Delaunay triangulation(cont.)

Algorithm

For each subset $T \subseteq S$, with $|T| = 3$

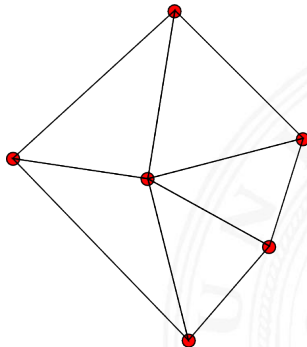
1. Test whether the circumcircle of T is empty
2. If yes, the points of T make up a triangle
3. otherwise discard T



Emptiness test is successful

Background

Delaunay triangulation(cont.)



Delaunay triangulation



Alpha Shapes

Alpha complex

The alpha complex C_α is a subcomplex of the Delaunay triangulation (DT)

Each k -simplex $\Delta_T \in DT(S)$ is in the alpha complex C_α if

- (i) the circumcircle of T with radius $r < \alpha$ is empty **or**
- (ii) it is a boundary simplex of a simplex of (i)

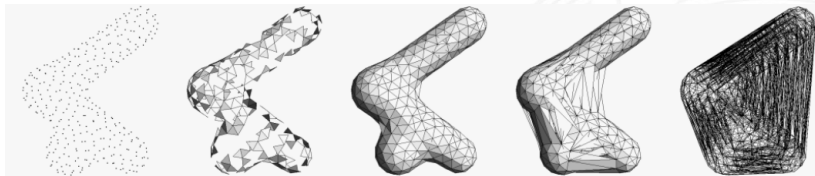
The polytope S_α then is the underlying space (i.e. union of all k -simplices Δ_T) of the alpha complex C_α :

$$|C_\alpha| = S_\alpha$$

Alpha Shapes

Family

Family of α -shapes S_α ($0 \leq \alpha \leq \infty$)



$\alpha = \{0, 0.19, 0.25, 0.75, \infty\}$ [10]

$$S_0 = S$$

$$S_\infty = \text{conv}(S)$$

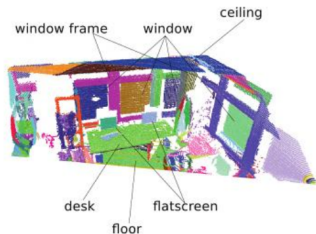


Application in Robotics

Scene recovery and analysis

3D Scene Recovery and Spatial Scene Analysis for Unorganized Point Clouds [9]

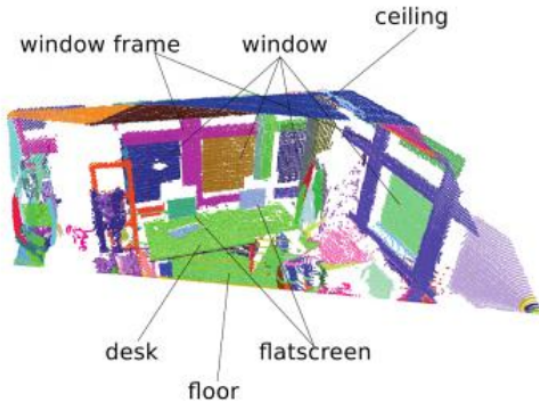
- ▶ extracting spatial entities from point clouds
- ▶ region growing as segmentation method
- ▶ surface reconstructing of each region by alpha shapes
- ▶ properties of alpha shapes are used to infer semantics



[9]

Application in Robotics

Scene recovery and analysis

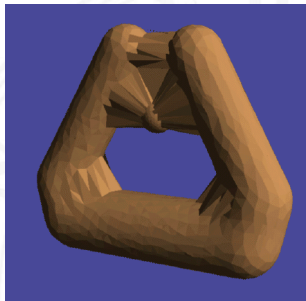




Problems & Limitations

Accuracy

- ▶ Choosing the "best" α value is not trivial \rightarrow some (heuristic) methods
- ▶ Not for all object's surfaces there is a good α value due to non-uniformly sampled data
 - ▶ **Interstices** might be covered
 - ▶ **Neighboring** objects might be connected
 - ▶ **Joints** or sharp turns might not be sharp anymore



[10]

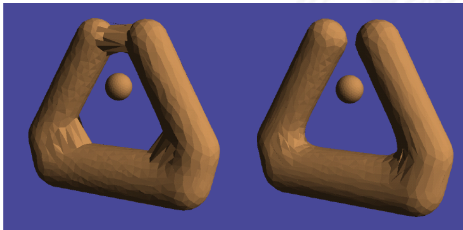


Problems & Limitations

Accuracy

Improvement: locally adjusting α test

- ▶ density scaling [10]
- ▶ anisotropic scaling [10]
- ▶ weighted alpha shapes [7]



Left: density scaling, right: added anisotropic scaling



Problems & Limitations

Time complexity

- ▶ Depends mostly on computation of Delaunay triangulation
- ▶ For DT in worst-case $\mathcal{O}(n^2)$, with n as number of points
- ▶ Edelsbrunner and Shar [6] developed a method for regular triangulations that performs with $\mathcal{O}(n \log n)$.
Mostly gives a complexity closer to linear. [10]



Comparison

Method	Time complexity	Robustness
Ball Pivoting [3]	linear (without DT)	Noise: yes ; Undersampling: no
Voronoi Filtering [2]	quadratic (uses Voronoi Diagram)	Noise: yes ; Undersampling: no
Cocone Algorithm[1]	quadratic (based on Voronoi Filtering)	Noise: no ; Undersampling: no

- ▶ There are (heuristic) methods that improve robustness for each algorithm.
- ▶ Especially for undersampling and non-uniform sampled data by local adaptation.



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