## Sampling Conditions for Clipping-free Voronoi Meshing by the VoroCrust Algorithm

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Given a bounded open set  $\mathcal{O}$  in Euclidean space, decompose its interior into Voronoi cells of bounded aspect-ratio. The cells should naturally *conform* to the bounding surface  $\mathcal{M} = \partial \mathcal{O}$ .

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- The VoroCrust project developed the first solution to this problem.
- In this talk, we focus on the subproblem of surface reconstruction, assuming a set of sample points from  $\mathcal{M}$  is given as input.

Given a set of sample points from a closed 2-manifold  $\mathcal{M}$  in Euclidean space, decompose its interior into Voronoi cells of bounded aspect-ratio. The cells should naturally *conform* to a surface mesh approximating  $\mathcal{M}$ .

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  - Instead of the Voronoi diagram, it is based on the power diagram.
  - Nonetheless, rich theory with strong approximation guarantees.



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## (3) Compute Voronoi diagram



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### Power distance and cell

For a ball b centered at c with radius r, 
$$\pi(b, x) = ||cx||^2 - r^2$$
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Weighted  $\alpha$ -complex and  $\alpha$ -shape

Define  $\mathcal{K} = Nerve(\{V_b \cap b \mid b \in B\})$  and  $\mathcal{S}$  as the underlying space  $|\mathcal{K}|$ .

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### Homotopy-equivalence

The nerve theorem implies  $\mathcal{S} = |\mathcal{K}|$  has the same homotopy-type as  $\cup B$ .

### Local features size (lfs)

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A set of points P on  $\mathcal{M}$  such that  $\forall x \in \mathcal{M} \exists p \in P$ s.t.  $||px|| \leq \epsilon \cdot lfs(x)$ .



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### From balls to surfaces [Chazal, Lieutier]

Let P be an  $\epsilon$ -sample of  $\mathcal{M}$ , with  $\epsilon < 1/160$ , and define  $b_p$  as the ball centered at  $p \in P$  with radius  $\alpha_p \cdot lfs(p)$ , where  $1/20 < \alpha_p < 1/10$ . Then,  $\mathcal{M}$  is a deformation retraction of  $\cup b_p$ .

## Beyond Homeomorphism: Isotopic Equivalence



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### A purely topological condition [Chazal, Cohen-Steiner]

Suppose that:

- $\mathcal{M}'$  is homeomorphic to  $\mathcal{M}$ ,
- $\mathcal{M}'$  is included in a topological thickening  $\mathbb M$  of  $\mathcal{M}$ ,
- $\mathcal{M}'$  separates the sides of  $\mathbb{M}$ .

Then,  $\mathcal{M}'$  is isotopic to  $\mathcal{M}$  in  $\mathbb{M}$ .

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### Sandwich theorem

 $VC \subseteq S \subseteq \cup B.$ 

## VoroCrust - Ball Intersections



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### Sampling Conditions

For constants  $\epsilon \leq \delta$ , we require an  $\epsilon$ -sampling P, with associated balls of radii  $r_i = \delta \cdot lfs(p_i)$  satisfying the following sparsity condition:

$$\mathsf{lfs}(q) \ge \mathsf{lfs}(p) \implies \|p-q\| \ge \epsilon \cdot \mathsf{lfs}(p).$$





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#### Lemma

Taking  $\epsilon=1/160$  and  $\delta=1/20,$  we get disk caps.



## VoroCrust - Sample Results



- The VoroCrust software package is scheduled for release soon.
  - Successful implementation of more ideas than what this talk covers, e.g., sharp features, medial axis approximation, sizing estimation.
- Mohamed S. Ebeida (msebeid@sandia.gov) is the VoroCrust point-of-contact at Sandia National Labs (SNL).

