



This paper describes objective technical results and analysis. Any subjective views or opinions that might be expressed in the paper do not necessarily represent the views of the U.S. Department of Energy or the United States Government.



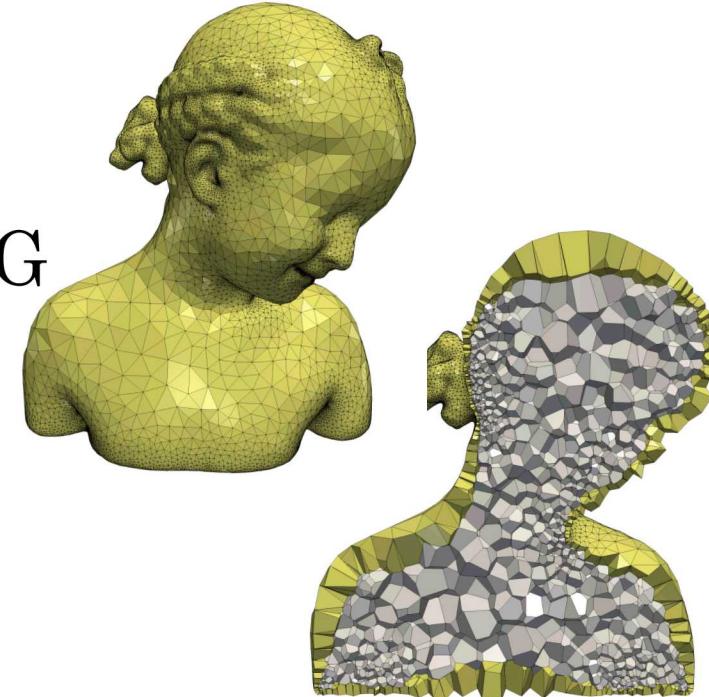
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# VOROCRUST

## VORONOI MESHING WITHOUT CLIPPING

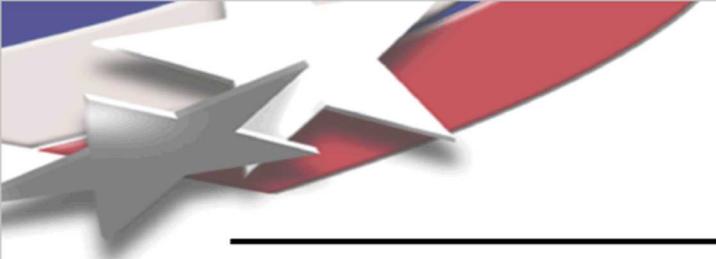
Ahmed Abdelkader<sup>1</sup>, Chandrajit Bajaj<sup>2</sup>, Mohamed Ebeida<sup>3</sup>,  
Ahmed Mahmoud<sup>4</sup>, Scott Mitchell<sup>3</sup>, John D. Owens<sup>4</sup>, and  
Ahmad Rushdi<sup>3</sup>

<sup>1</sup>University of Maryland, College Park; <sup>2</sup>University of Texas, Austin;  
<sup>3</sup>Sandia National Laboratories, Albuquerque; <sup>4</sup>University of California, Davis



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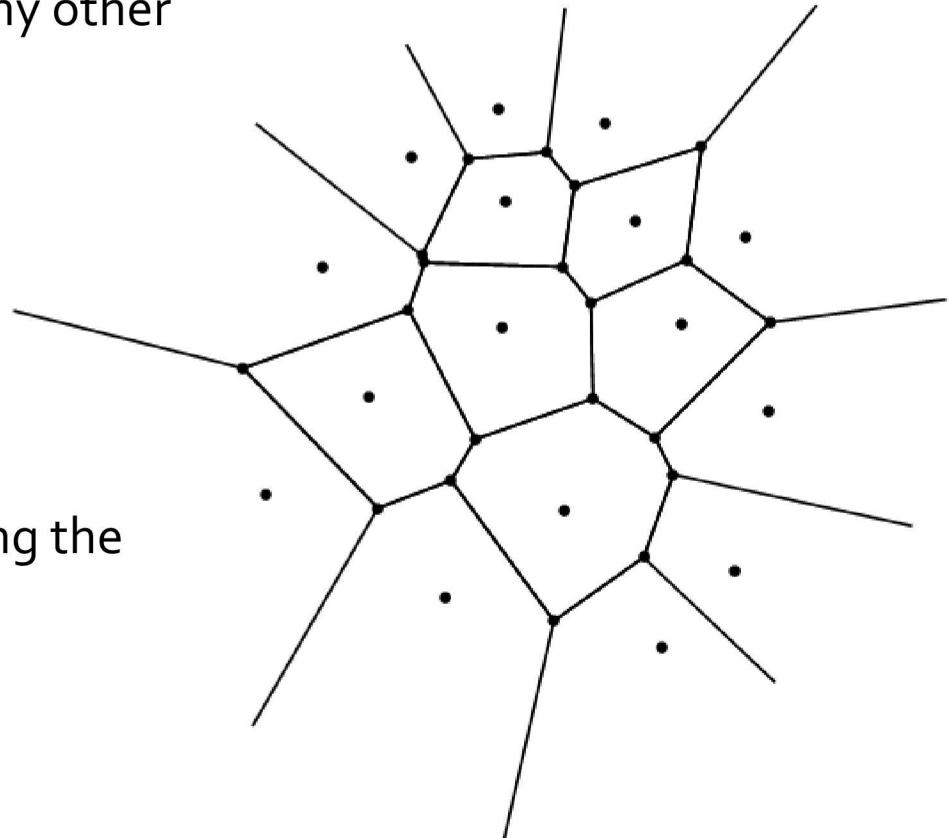
# *What is a Voronoi mesh?*

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Given a set of points (seeds), a Voronoi cell is formed around each seed by the set of points that are closest to that seed compared to any other seed.

Direct implications:

- Each cell is convex
- Each cell is bounded by planar convex facets
- A facet between two cells is orthogonal to the line connecting the cell seeds



Main Challenge:

- Representing (external and internal) boundaries is a hard problem.

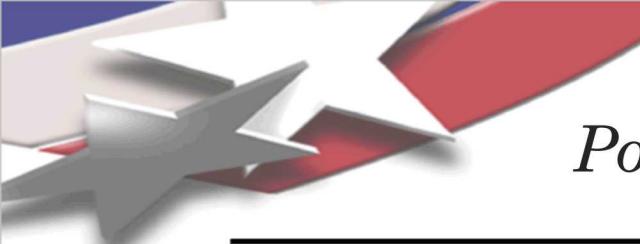


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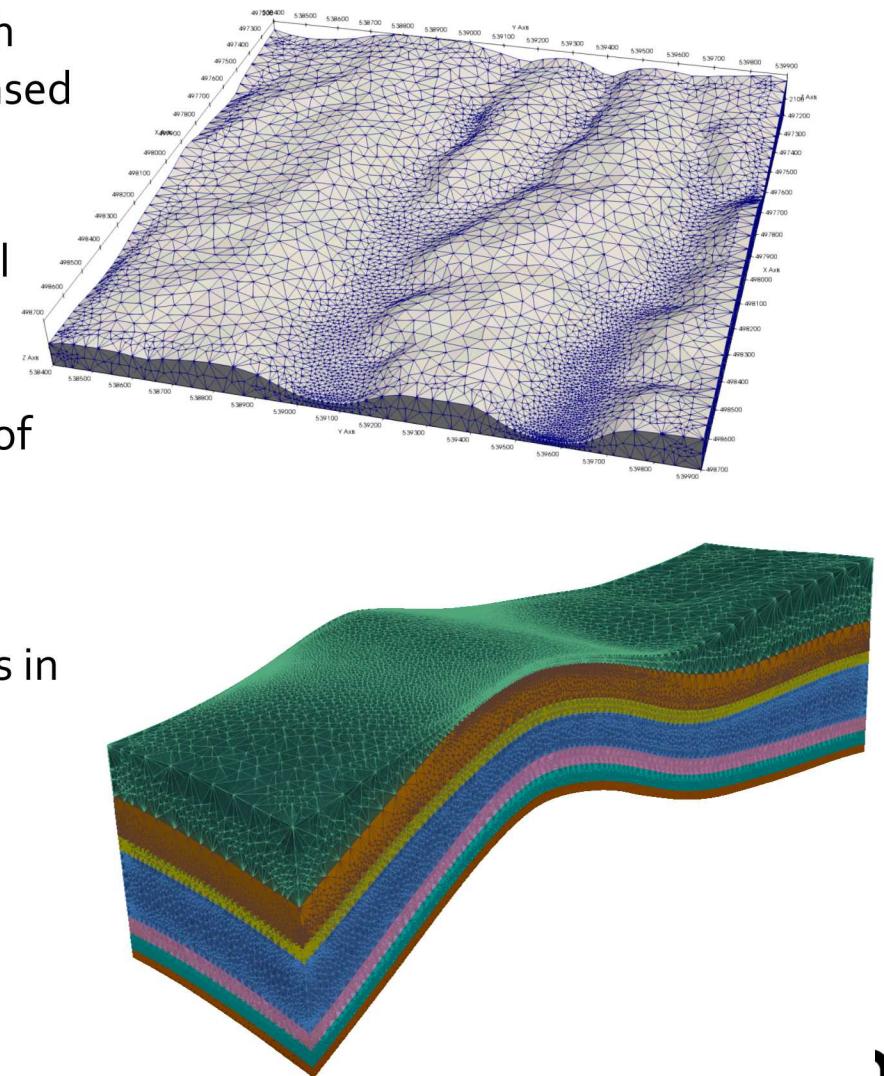


# *Polyhedral, Tetrahedral, and Hexahedral Mesh Comparison*

Source: [https://meshing.lanl.gov/proj/SFWD\\_models/main.html](https://meshing.lanl.gov/proj/SFWD_models/main.html)

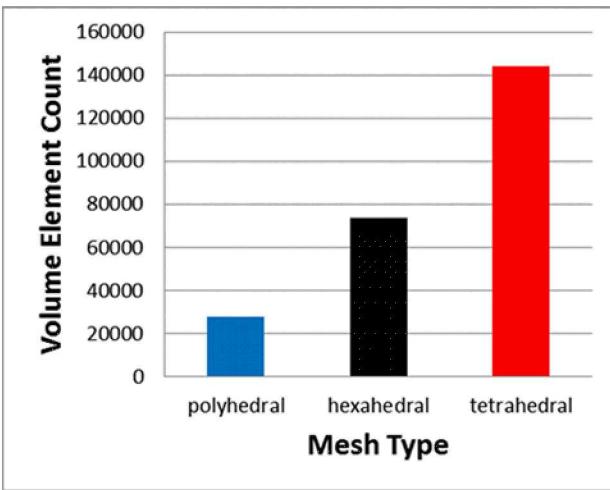
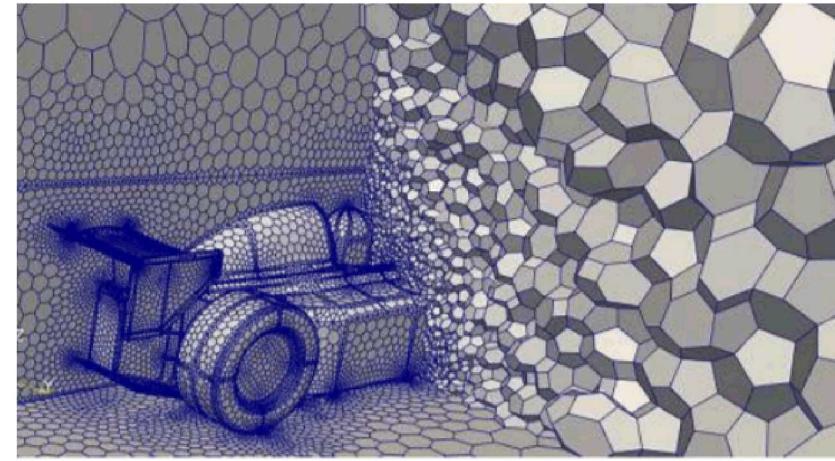
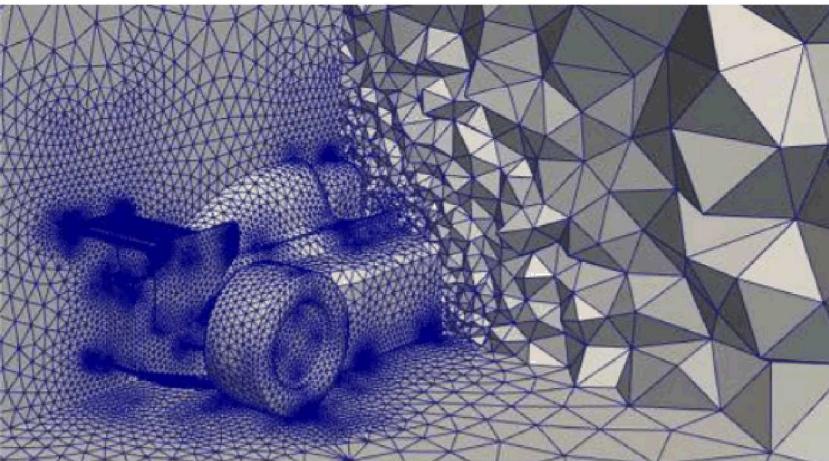
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- Polyhedral meshing is important for flow and transport codes which include TOUGH<sub>2</sub>, FEHM, PFLOTRAN, and MODFLOW which are based on the two-point flux discretization
- While the solution to flow/transport is stable without an orthogonal mesh, it is not accurate!
- A well-principled framework is enabled through the combined use of primal meshes and their orthogonal duals [Mullen et al. 2011].
- The power of orthogonal duals, exemplified by Voronoi-Delaunay meshes, has recently been demonstrated on a range of applications in computer graphics [Goes et al. 2014] and computational physics [Engwirda 2018].
- It is therefore imperative to develop new algorithms for
- primal-dual polyhedral meshing

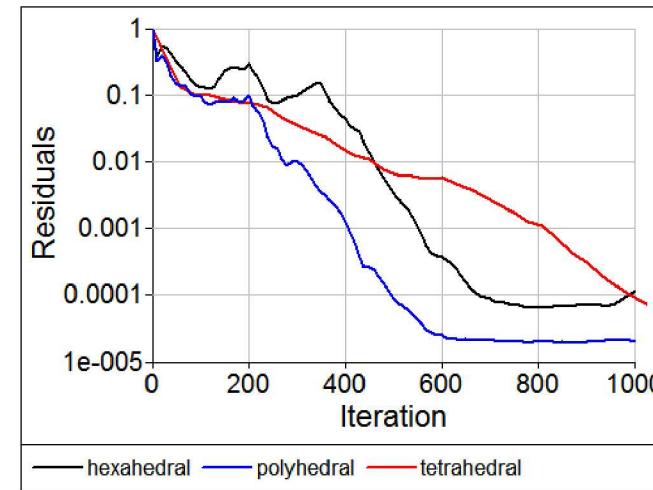


# Polyhedral, Tetrahedral, and Hexahedral Mesh Comparison

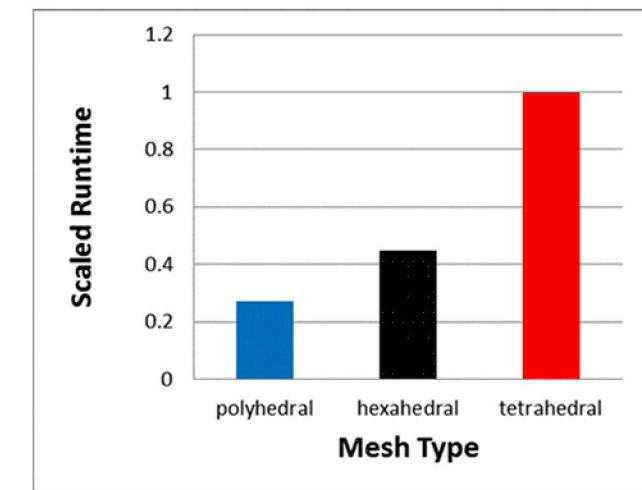
Source: <https://www.symscape.com/>



**Fewer Elements**



**Robust Convergence**



**Faster Simulation Runtime**

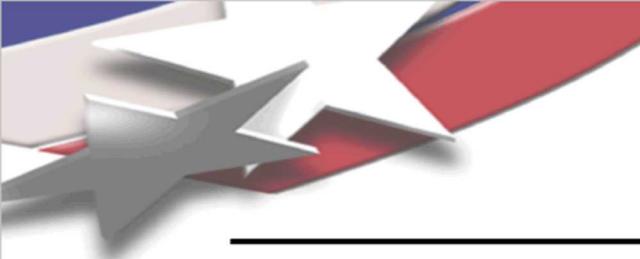


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# Current approaches for representing boundaries

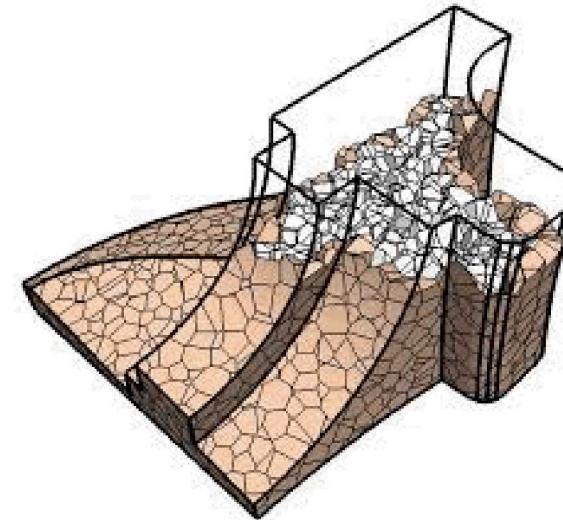
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## Clipping:

- Confine the Voronoi diagram to a compact domain.

### *Direct implications:*

- Clipped cell may lose convexity and orphan cells may be generated
- Boundary facets could be non-planar and may have poor quality.
- The orthogonality property is no longer maintained
- It is not clear how to robustly represent internal interfaces.



Efficient Computation of 3D Clipped Voronoi Diagram  
Yan D. M. et. al. [2010]



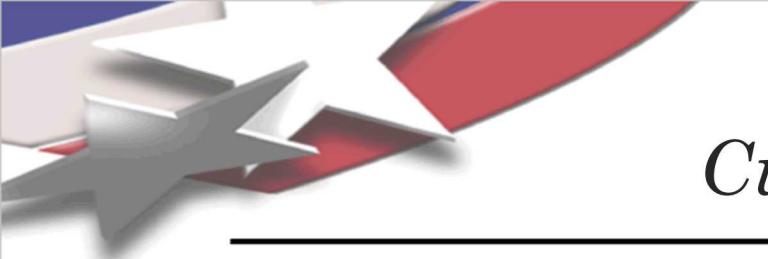
Uniform Random Voronoi Meshes  
Ebeida M. S. and Mitchell S. A. [2011]



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# *Current approaches for representing boundaries*

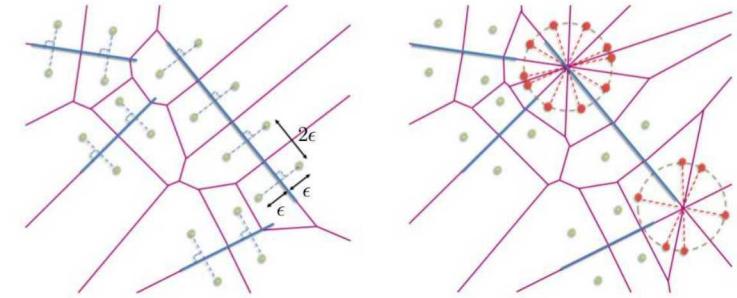
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## **Naive Mirroring:**

- Mirror the seeds across the boundary

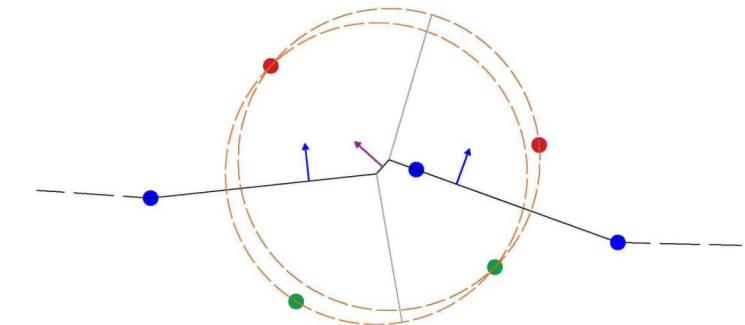
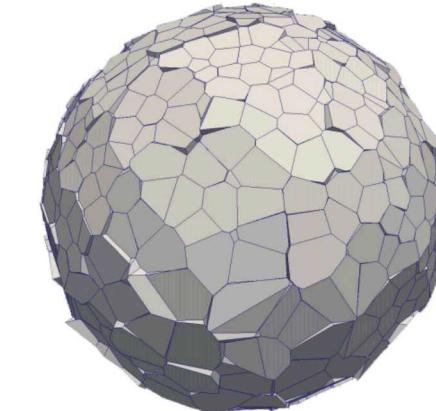
*Pros:*

- No clipping, resulting cells are convex, bounded by planar facets



*Cons:*

- Curved Boundaries result in bad normal  
→ Noisy surface approximation

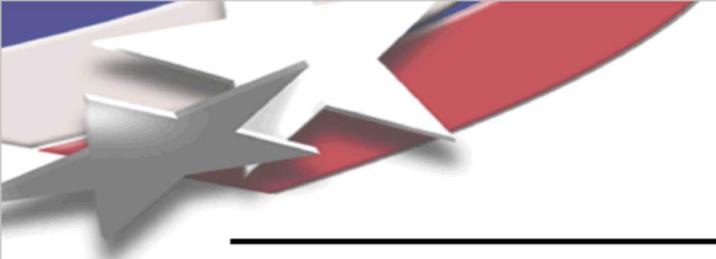


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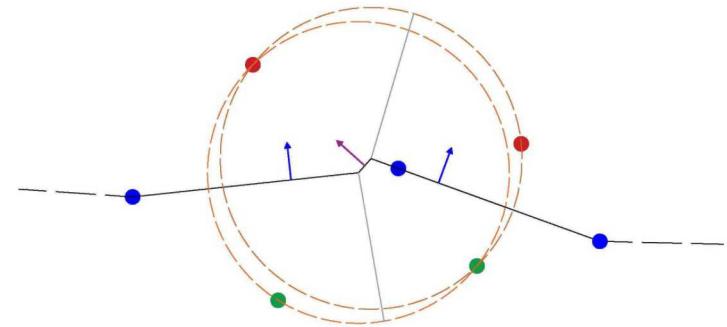


## *Our approach (The basic idea)*

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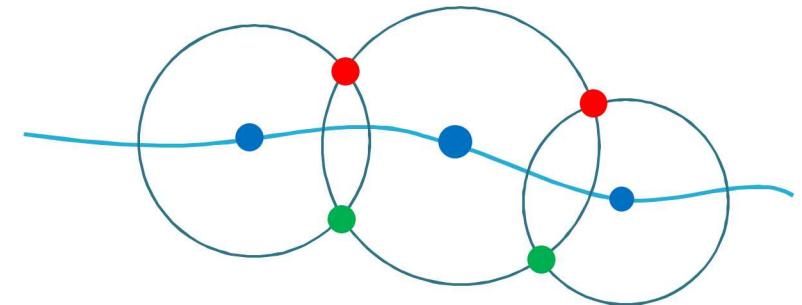
### Smart Mirroring:

- We eliminated all the facets that have bad normal by forcing the pairs of neighbor mirror seeds to lie on the same Delaunay sphere  $\rightarrow$  undesired facets become degenerate.



How?

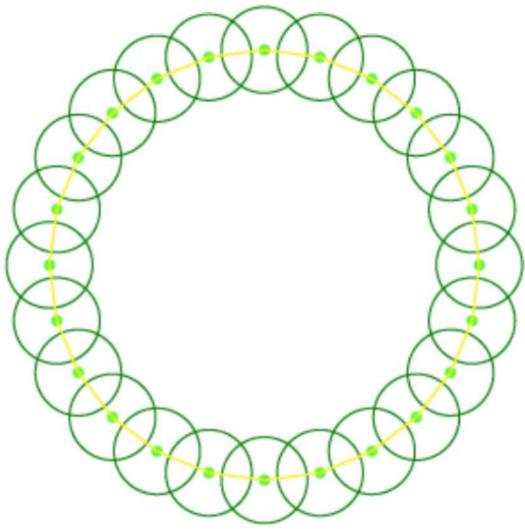
- We cover the surface with spheres and place the seeds at the intersection pair of these spheres.



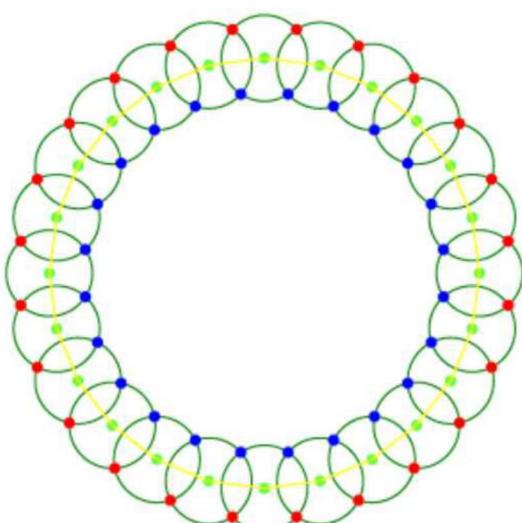


## *Our approach (a simple illustration)*

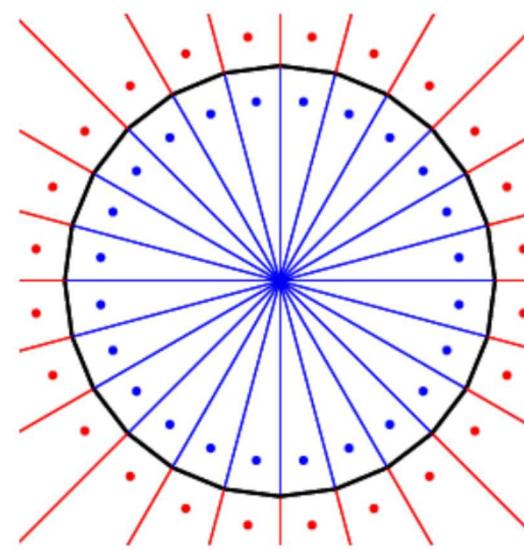
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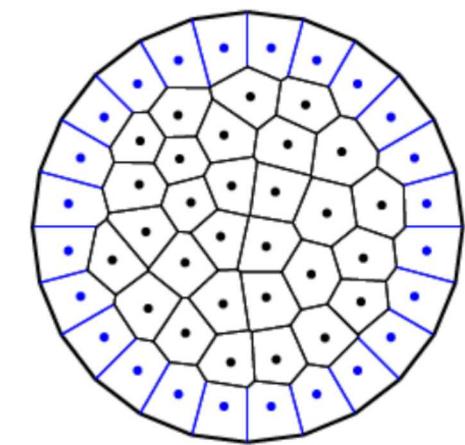
1. Cover input model  
with spheres



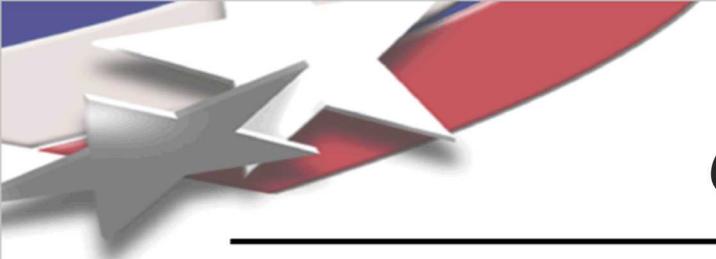
2. Place Voronoi  
seeds at the  
intersection pairs



3. Reconstruct the  
boundaries



4. Add interior seeds  
to improve mesh  
quality



## *Our approach: Questions that we had to answer*

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1. How to automatically choose the radii of surface spheres?
2. How to achieve (and maintain) maximal coverage efficiently?
3. In 3D, there could be an intersection pair of three surface spheres, where one point is covered and the other is not. How do we handle this situation?
4. How to detect and represent sharp features (sharp corners and sharp curves).
5. How to handle internal interfaces and domains with multiple materials?

Our next speaker will now present our answers.

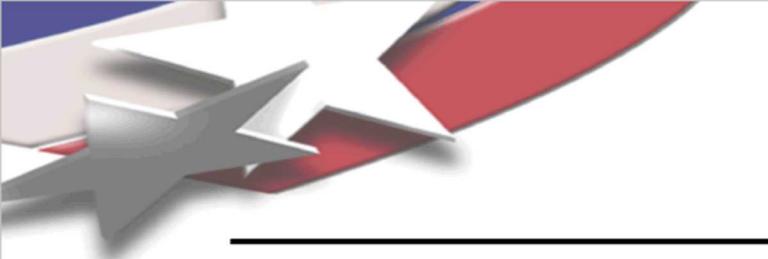


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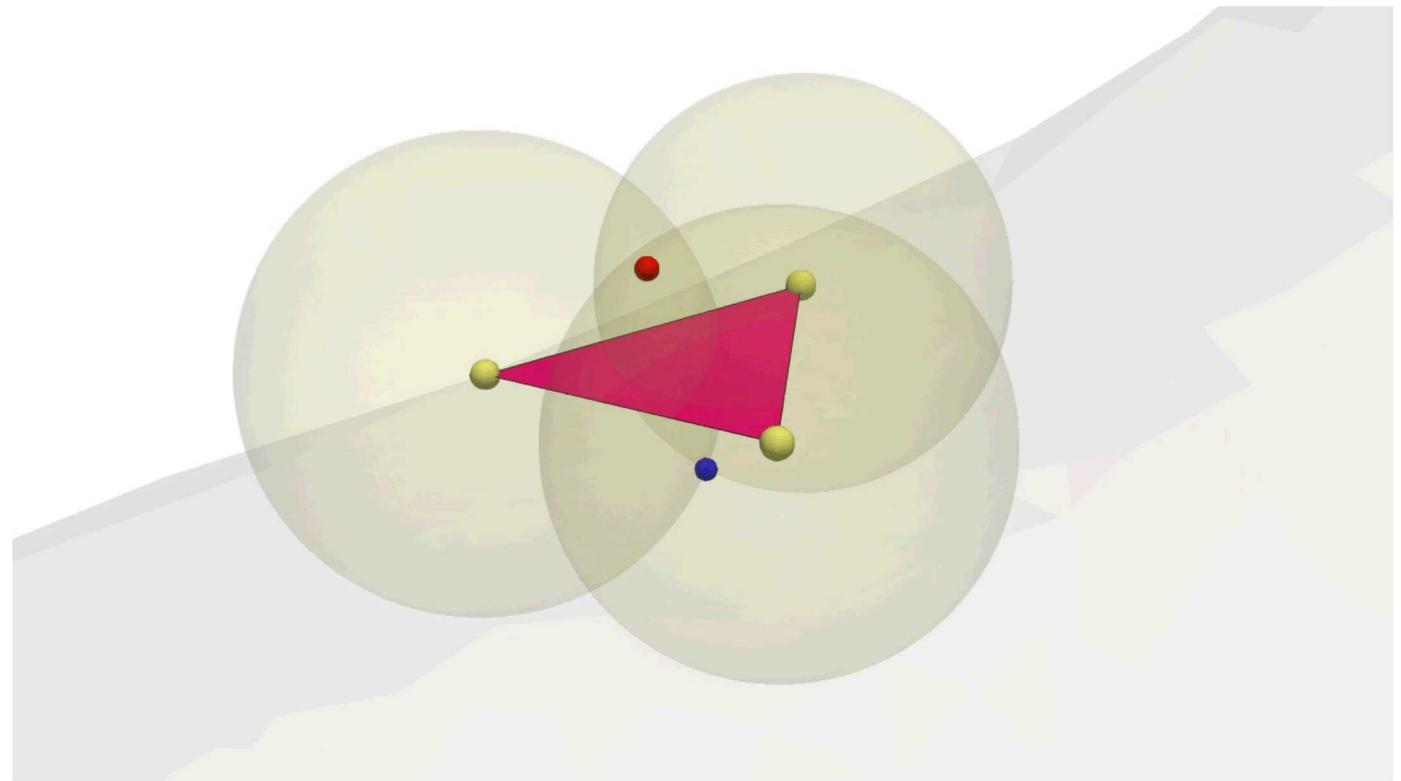
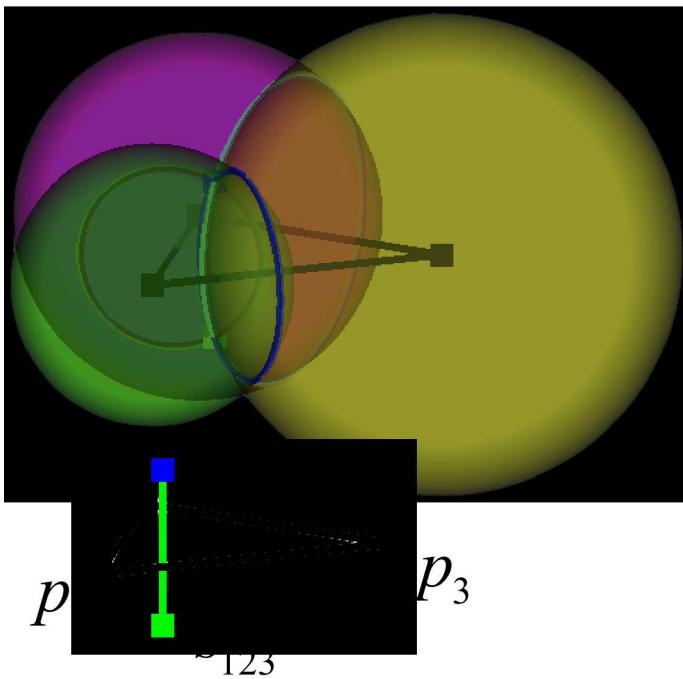


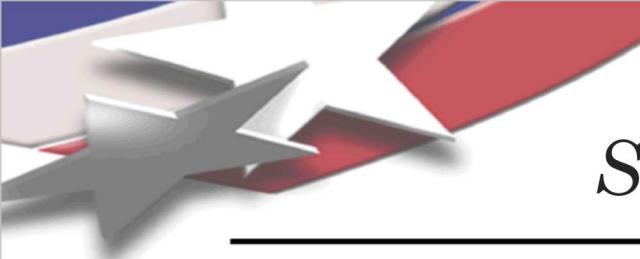
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## *Our approach (a simple illustration in 3D)*

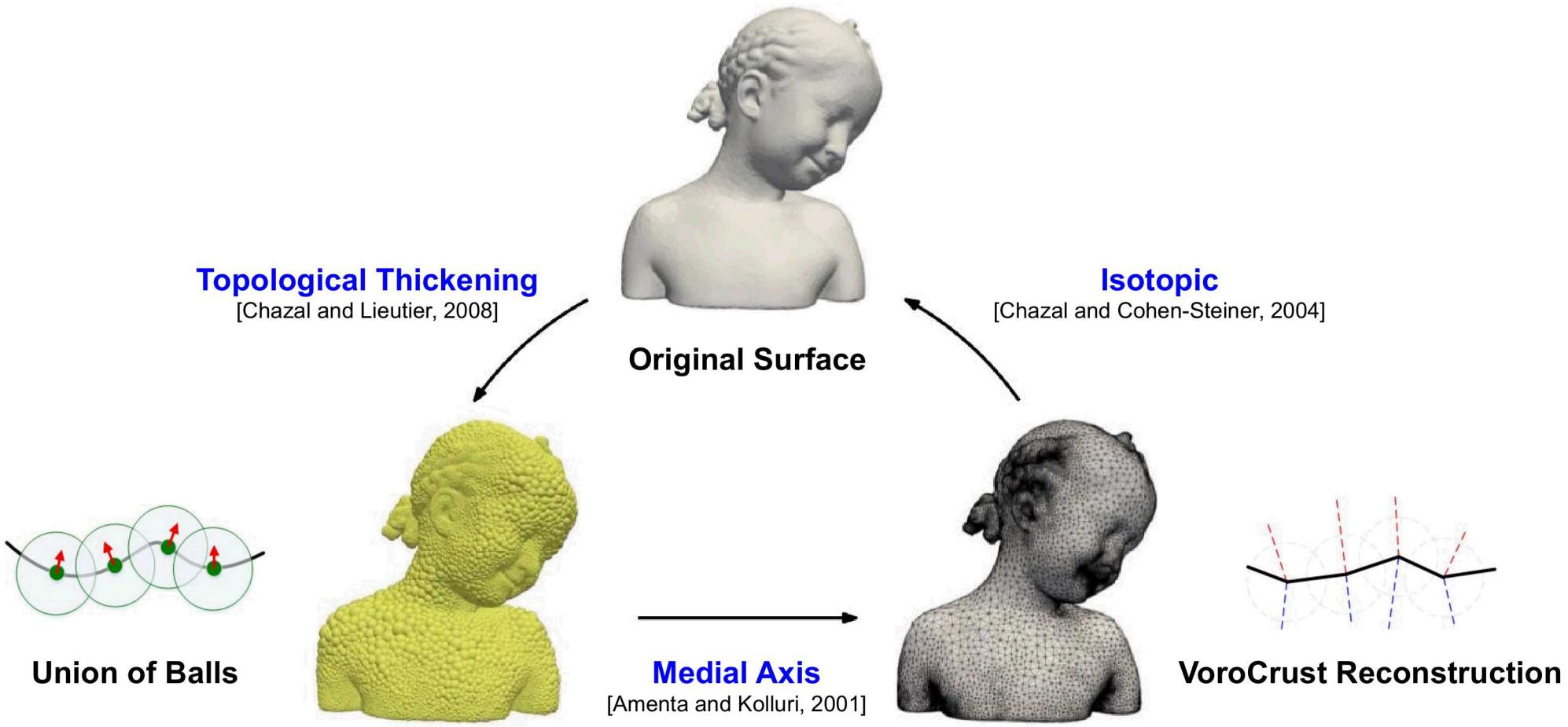
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# Sampling Conditions for Reconstruction [SoCG'18]

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## **Input:**

- $T$ : an accurate surface approximation
- $\theta^\#$ : threshold to identify sharp features

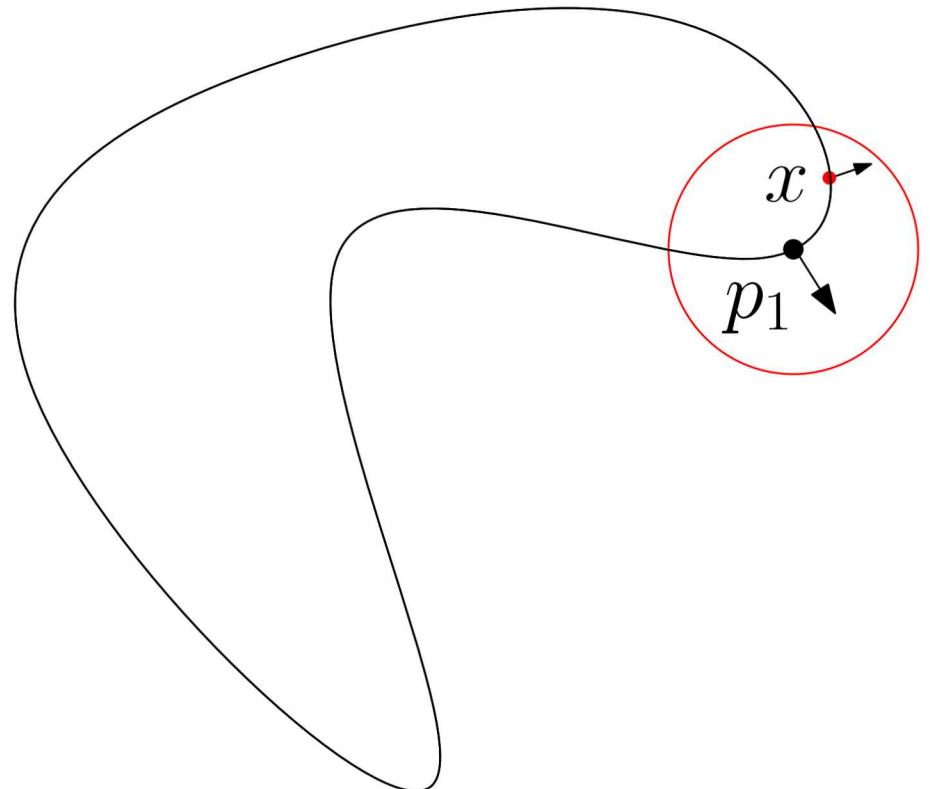
## **Requirements:**

- Generate union of balls
- Additional conditions for quality



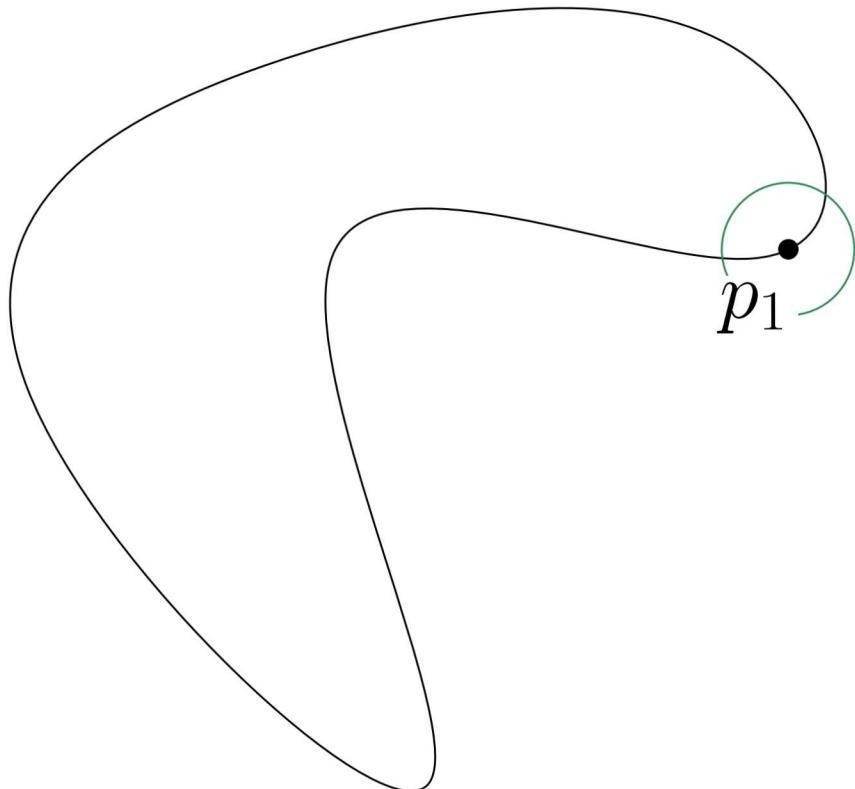
## Ball Conditions:

- Smooth coverage ( $\theta^\#$ )
- Smooth overlaps
- Locally Lipschitz ( $L$ )
- Deep coverage with sparsity ( $\alpha$ )



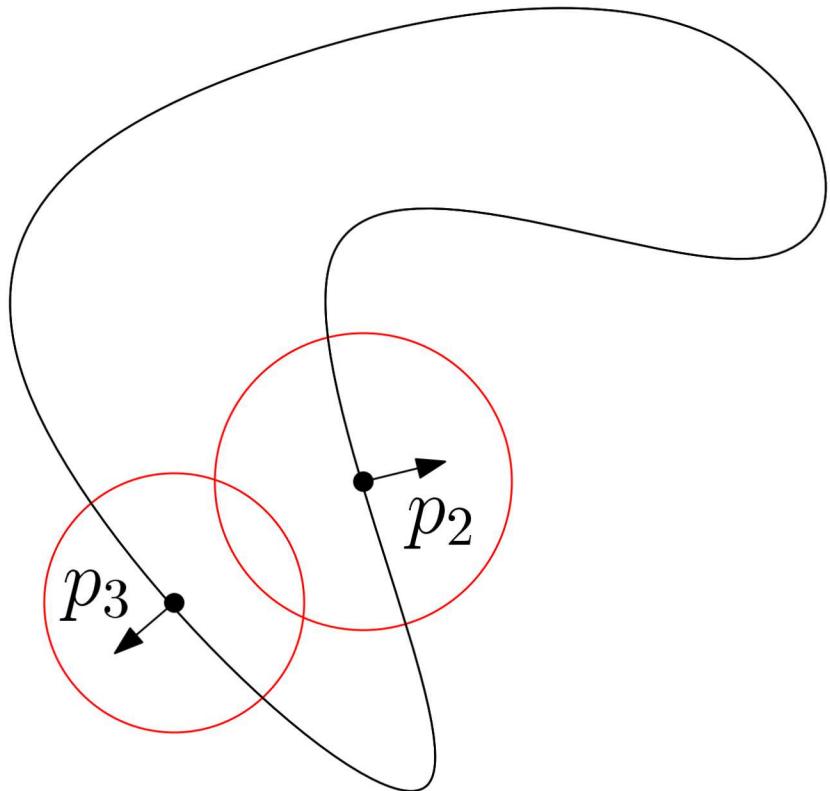
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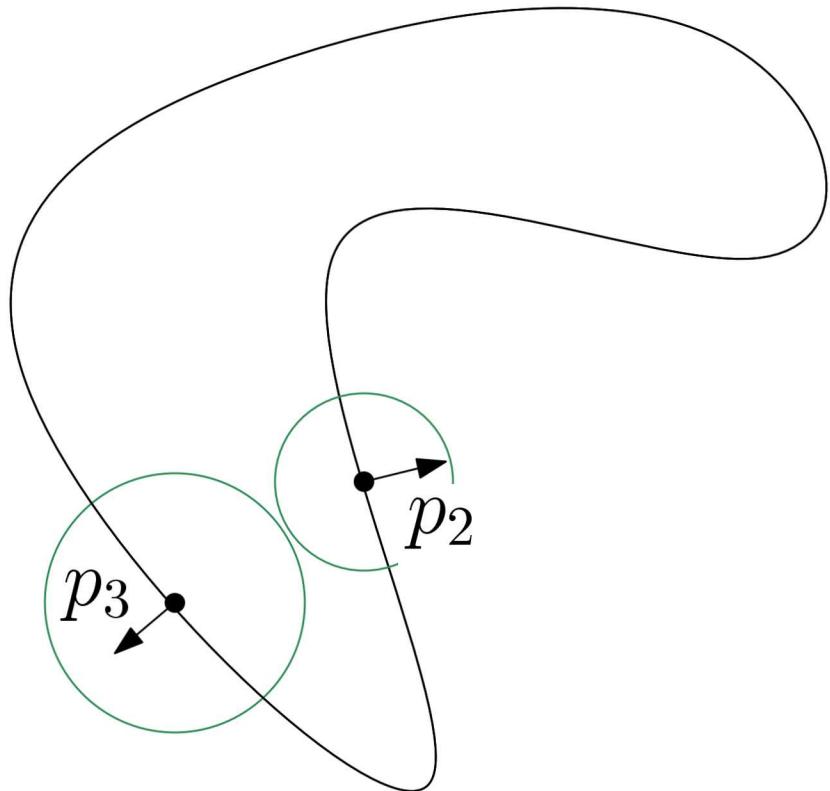
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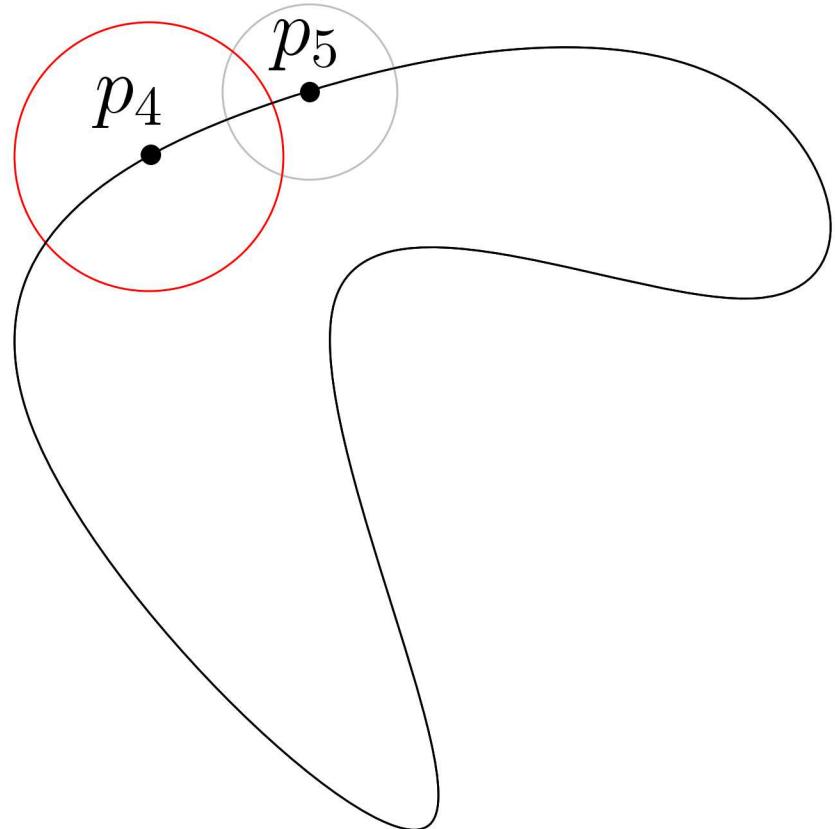
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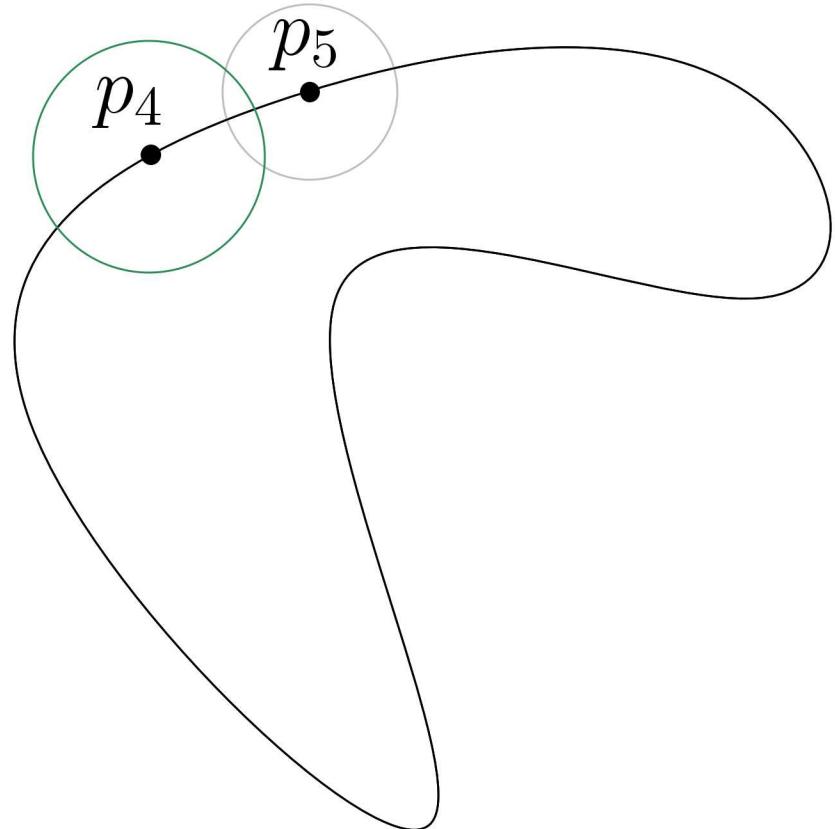
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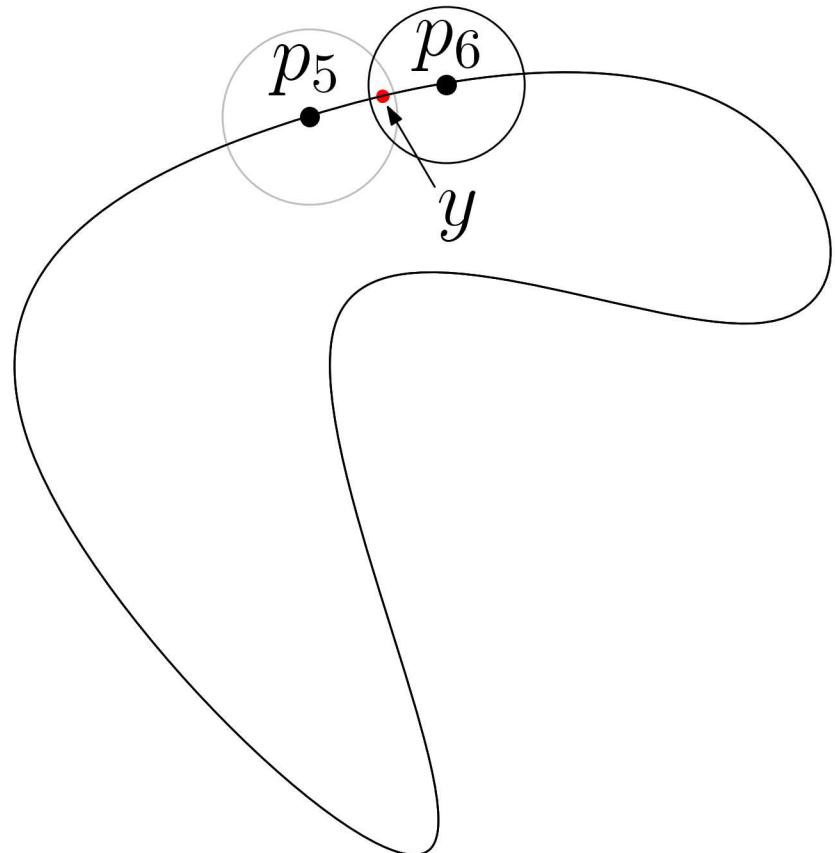
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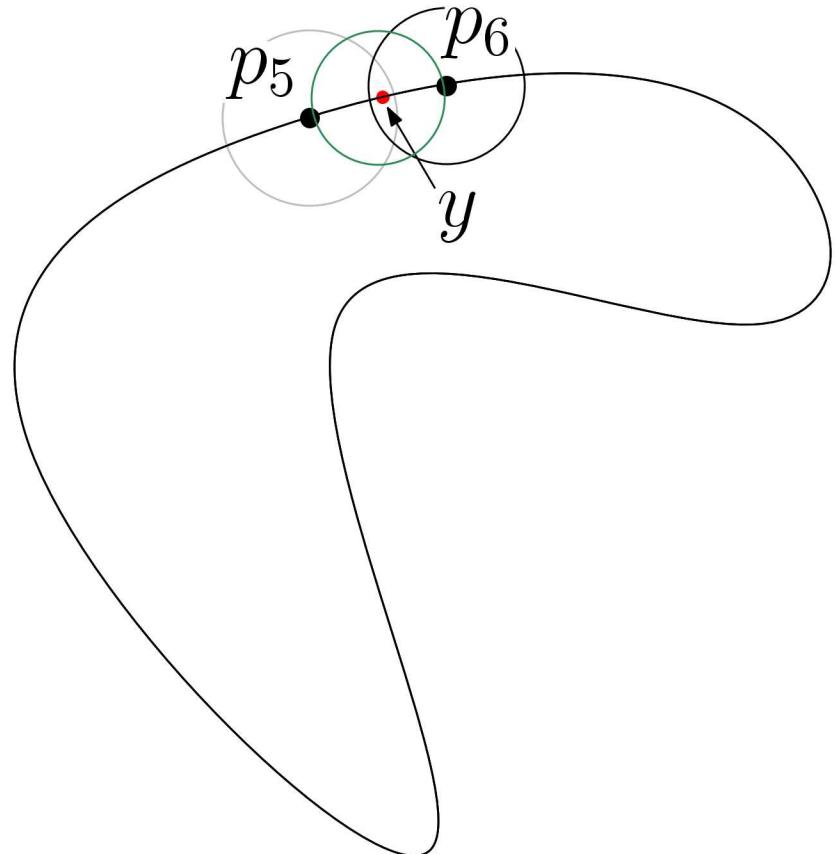
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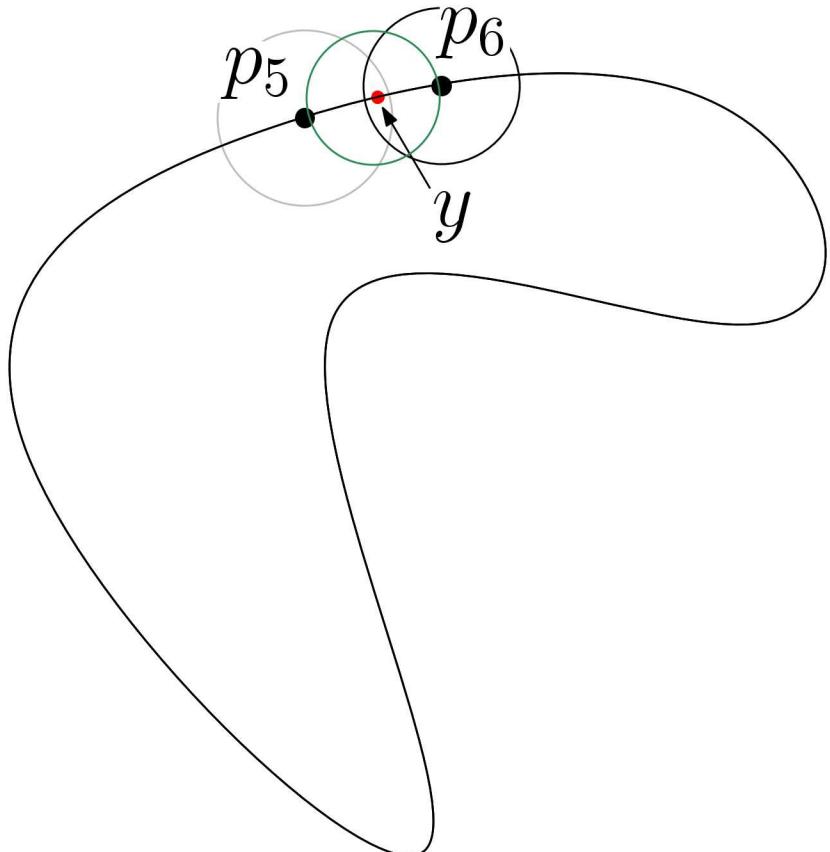
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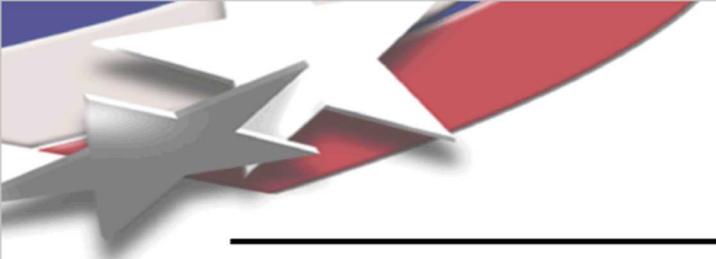


## Ball Conditions:

- Smooth coverage ( $\theta^\#$ )
- Smooth overlaps
- Locally Lipschitz ( $L$ )
- Deep coverage with sparsity ( $\alpha$ )

Violations resolved by **shrinking**





# VoroCrust Refinement Loop (simplified)

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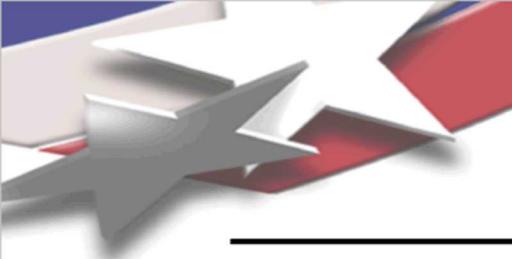
**Algorithm 1:** High-level VoroCrust algorithm

---

**Input:** Triangle mesh  $\mathcal{T}$ , and parameters  $\theta^\sharp$  and  $L$

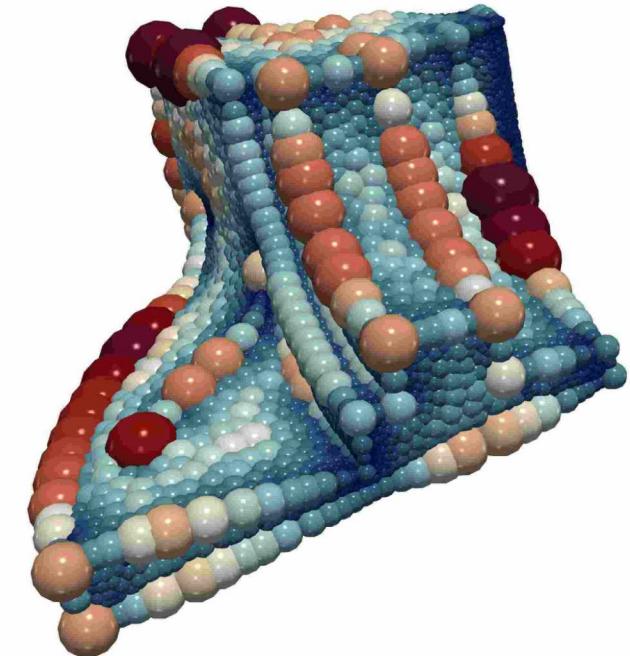
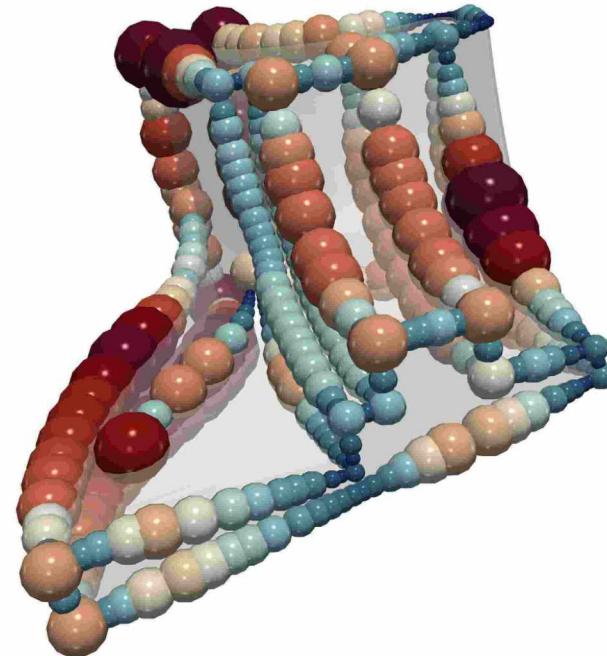
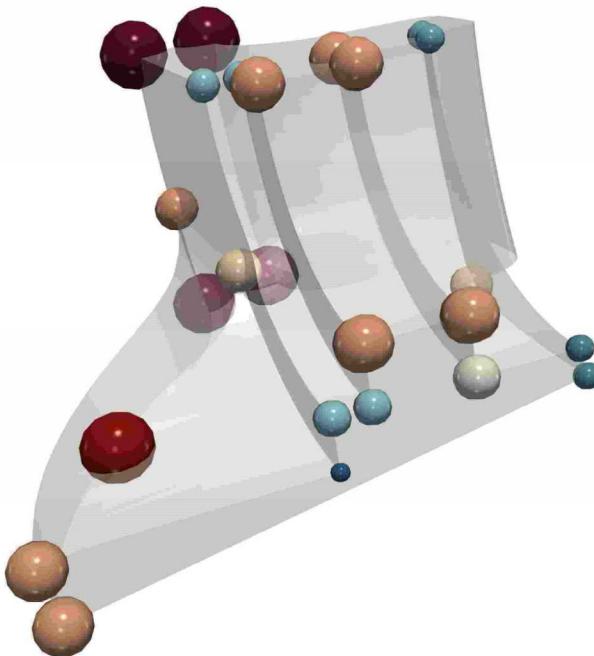
```
1  $\mathcal{B} \leftarrow \emptyset$ 
2 while  $\mathcal{U} = \cup \mathcal{B}$  does not cover  $\mathcal{T}$  do
3   Add balls to cover  $\mathcal{T}$ 
4   Shrink balls violating any ball conditions
5 end
6  $\mathcal{S}^\uparrow \leftarrow$  pairs of seeds from triplets of balls in  $\mathcal{B}$ 
7 return  $\mathcal{S}^\uparrow$ 
```

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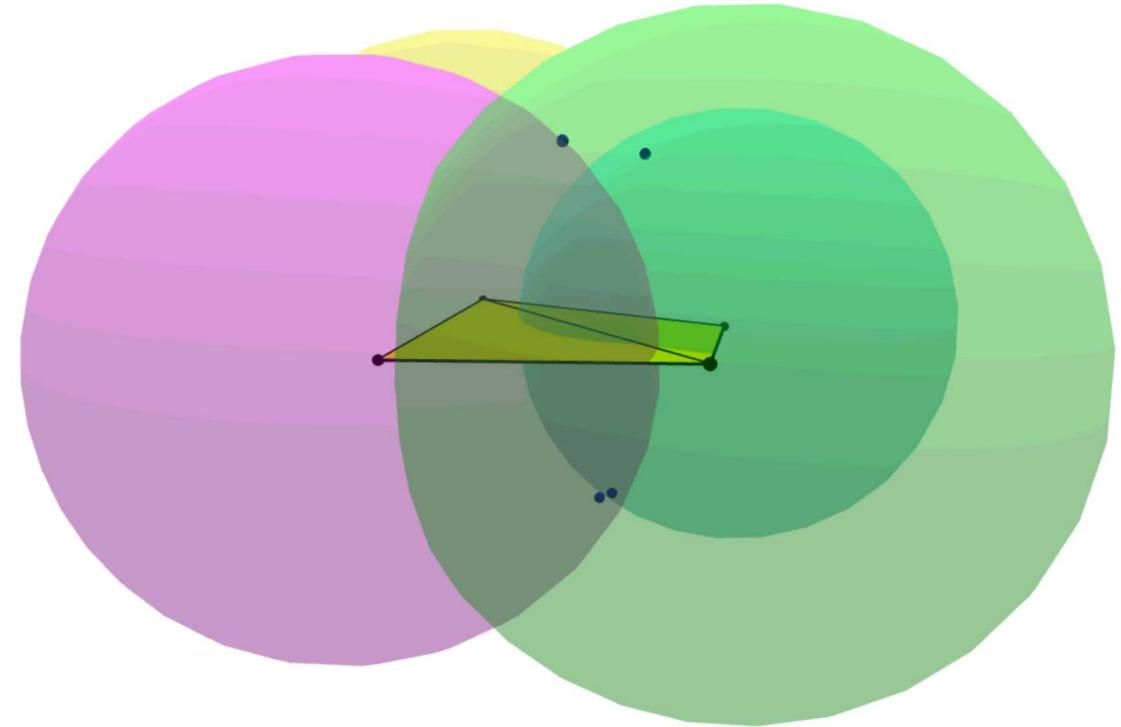
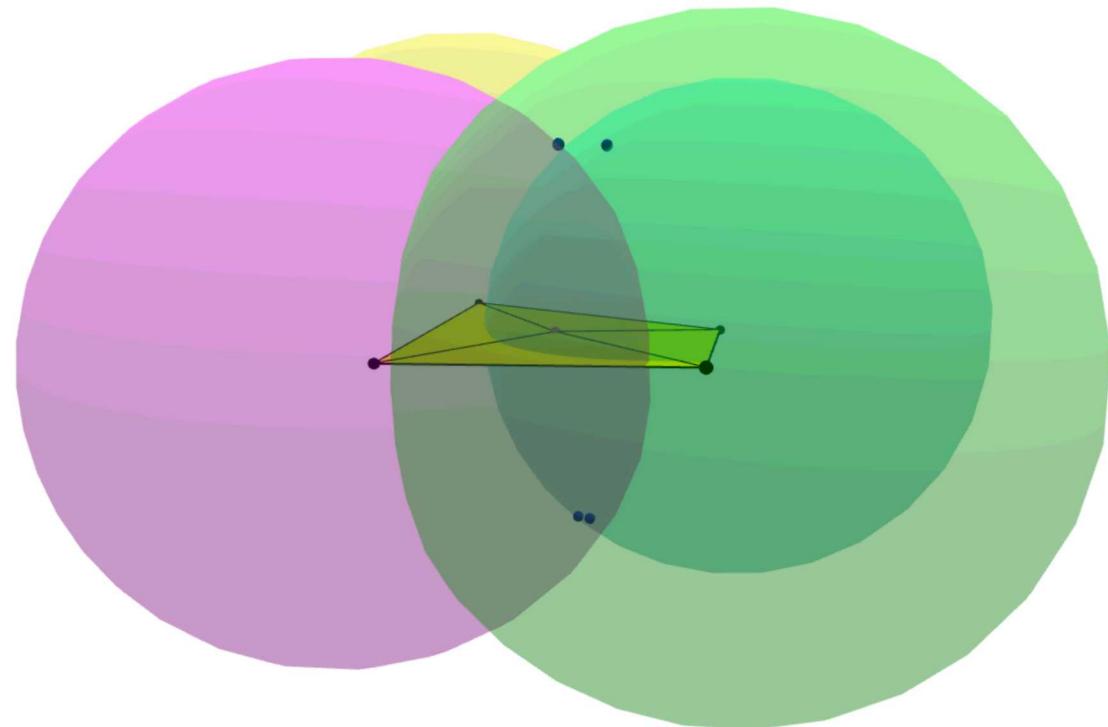


# *Surface Coverage with Sharp Feature Protection*

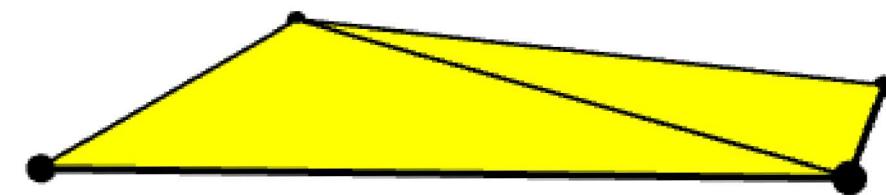
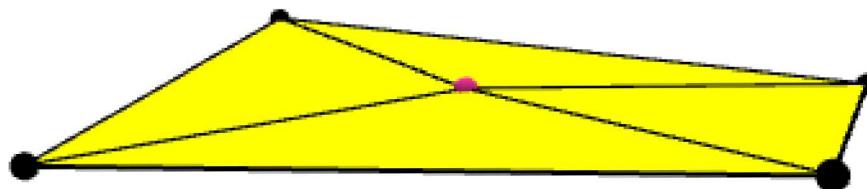
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Corner balls  $\Leftrightarrow$  Edge balls  $\Leftrightarrow$  Surface balls



Extra Steiner vertex (sliver)  $\Rightarrow$  No sliver after perturbation of radii



Extra Steiner vertex (sliver)  $\Rightarrow$  No sliver after perturbation of radii



# *VoroCrust Refinement Loop (revised)*

**Algorithm 2:** High-level VoroCrust algorithm (revised)

**Input:** Triangle mesh  $\mathcal{T}$ , and parameters  $\theta^\#$  and  $L$

1  $\mathcal{B} \leftarrow \emptyset$

2 while  $\mathcal{U} = \cup \mathcal{B}$  does not cover  $\mathcal{T}$  do

### 3 | Add balls to cover $\mathcal{T}$

#### 4 Shrink balls violating any ball conditions

or forming half-covered seeds

6 end

7  $S^\uparrow \leftarrow$  pairs of seeds from triplets of balls in  $\mathcal{B}$

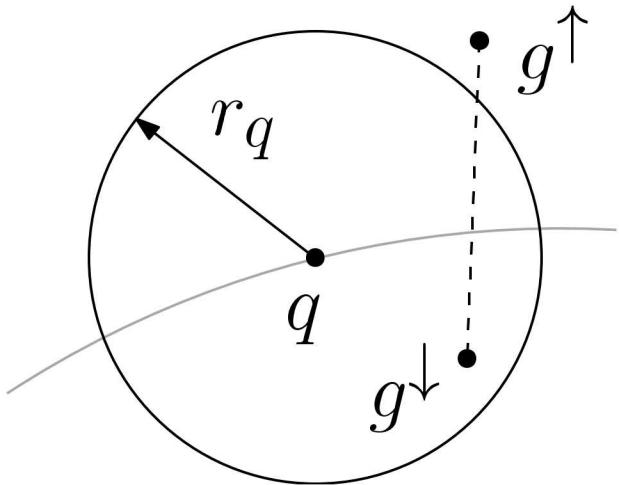
8 return  $S^{\uparrow\downarrow}$

# Termination without Slivers

Shrinking violates coverage, requiring **new samples**

- How much to shrink to uncover  $g^\downarrow$ ?

$$\begin{aligned}\Delta &= \frac{r_q - \|q - g^\downarrow\|}{r_q} \leq \frac{\|q - g^\uparrow\| - \|q - g^\downarrow\|}{\|q - g^\downarrow\|} \\ &= \frac{\|q - g^\uparrow\|}{\|q - g^\downarrow\|} - 1.\end{aligned}$$



- Higher sampling density locally flattens the mesh

$$\frac{\|q - g^\uparrow\|}{\|q - g^\downarrow\|} \rightarrow 1 \implies \Delta \rightarrow 0$$

- Coverage less likely to be violated with low  $\Delta$

# Termination without Slivers

Shrinking violates coverage, requiring **new samples**

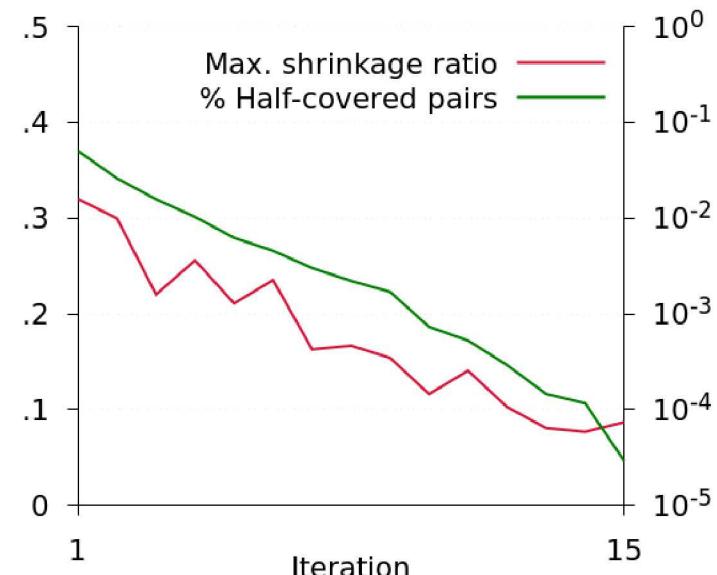
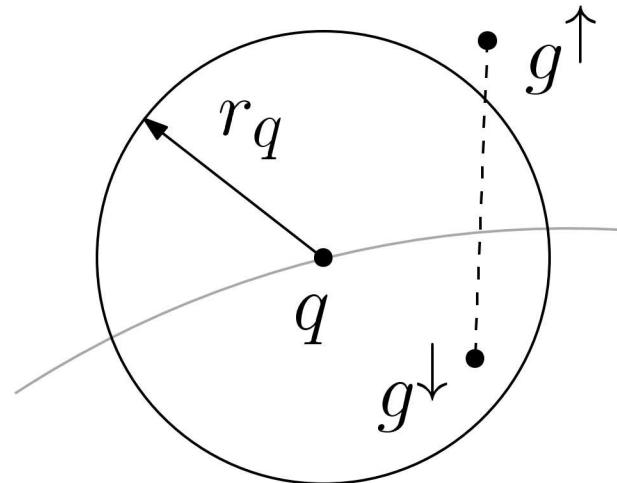
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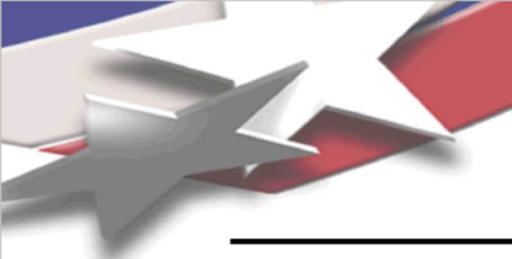
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- Higher sampling density locally flattens the mesh

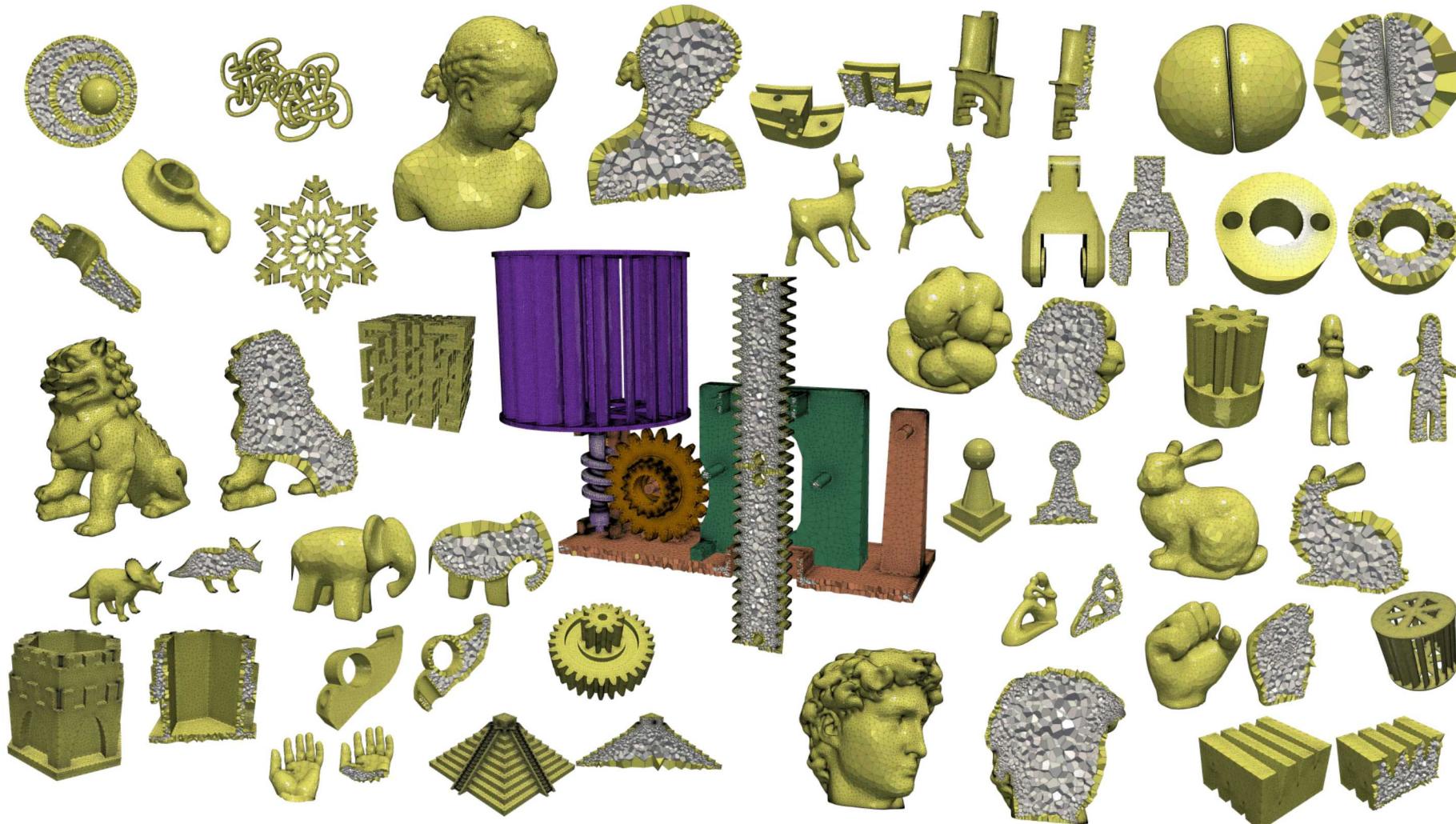
$$\frac{\|q - g^\uparrow\|}{\|q - g^\downarrow\|} \rightarrow 1 \implies \Delta \rightarrow 0$$

- Coverage less likely to be violated with low  $\Delta$





## *Results: smooth/sharp-features/narrow-regions*

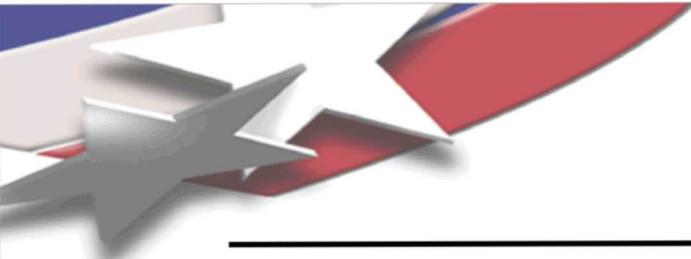


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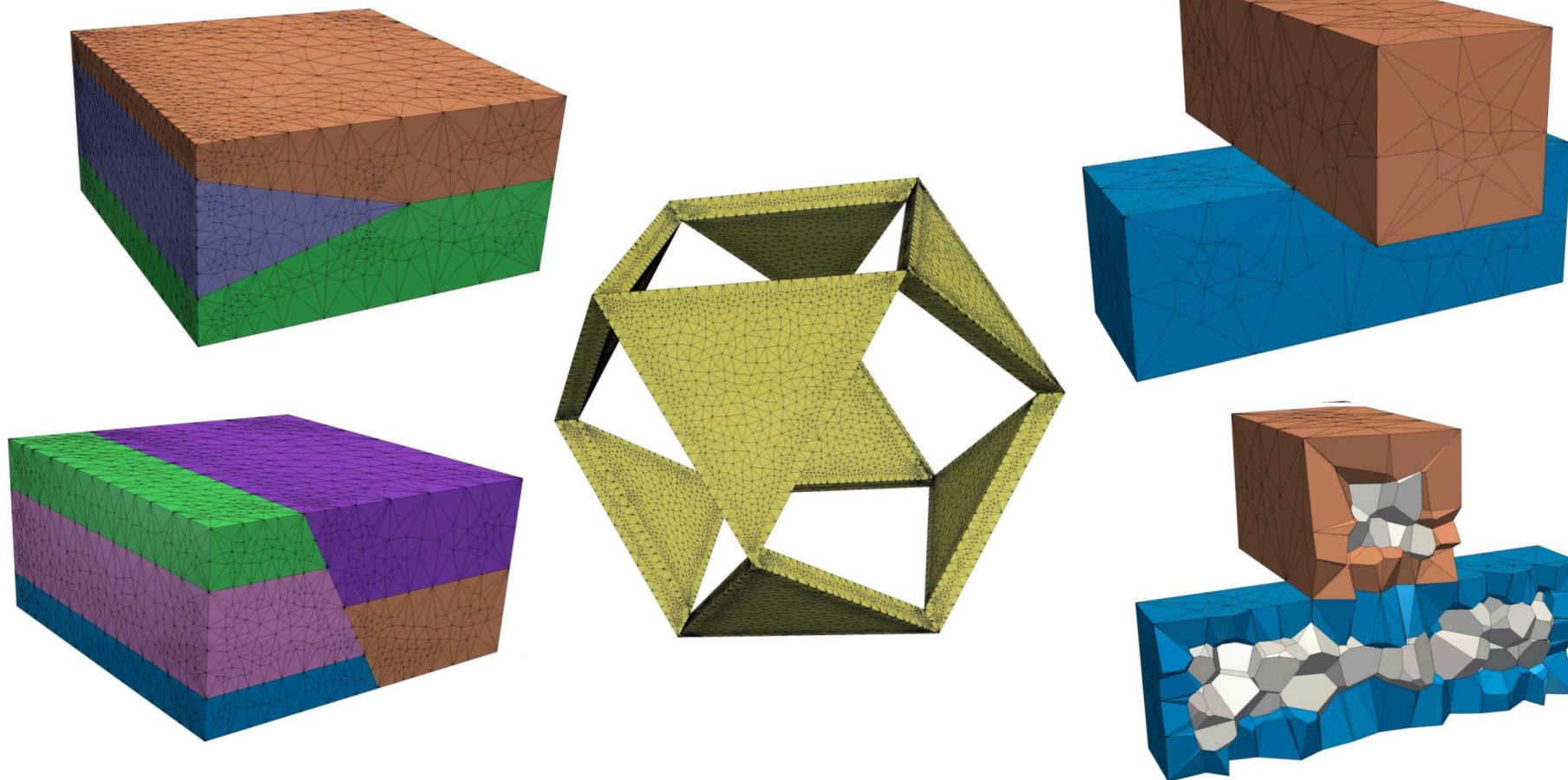


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## *Results: non-manifold*

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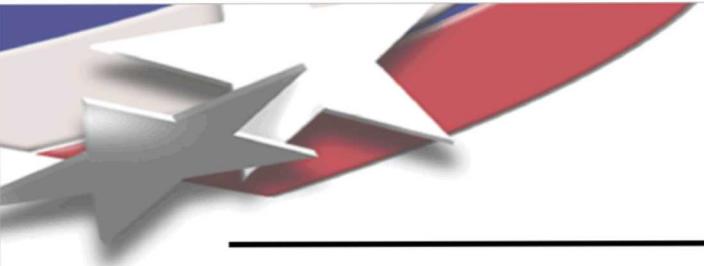


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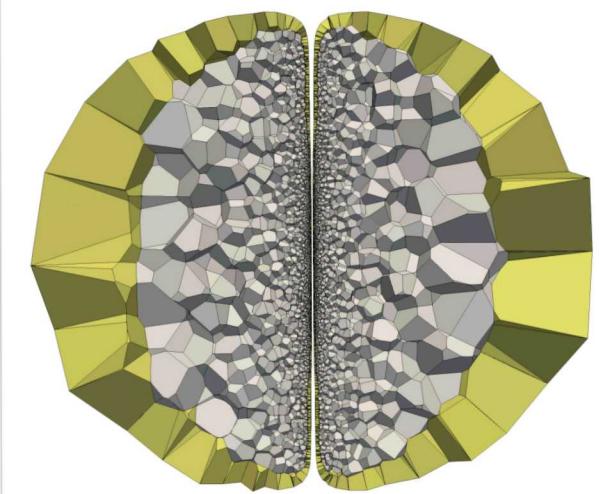


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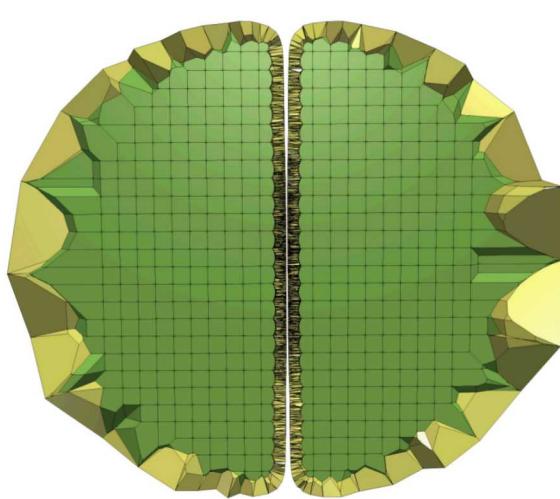


## *Results: interior*

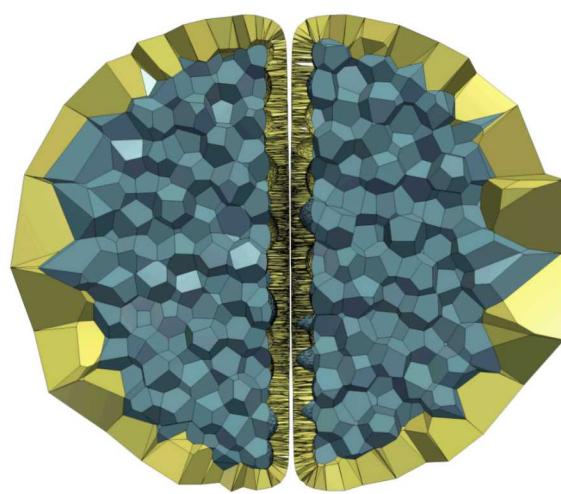
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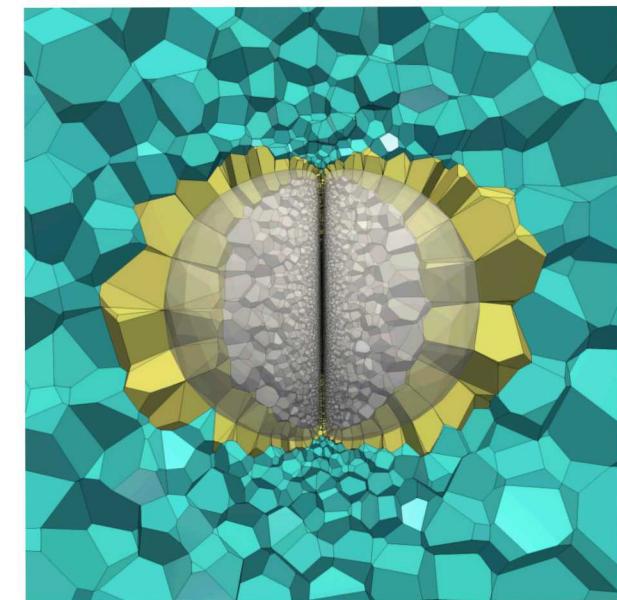
Random



Grid



CVT



Multi components



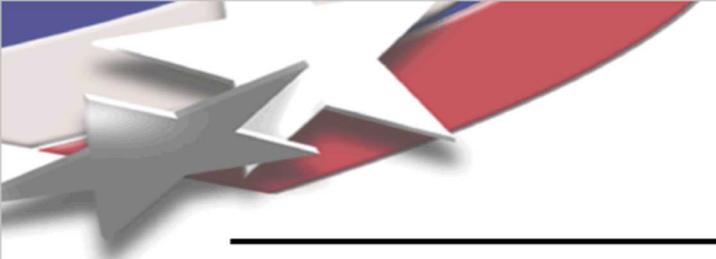
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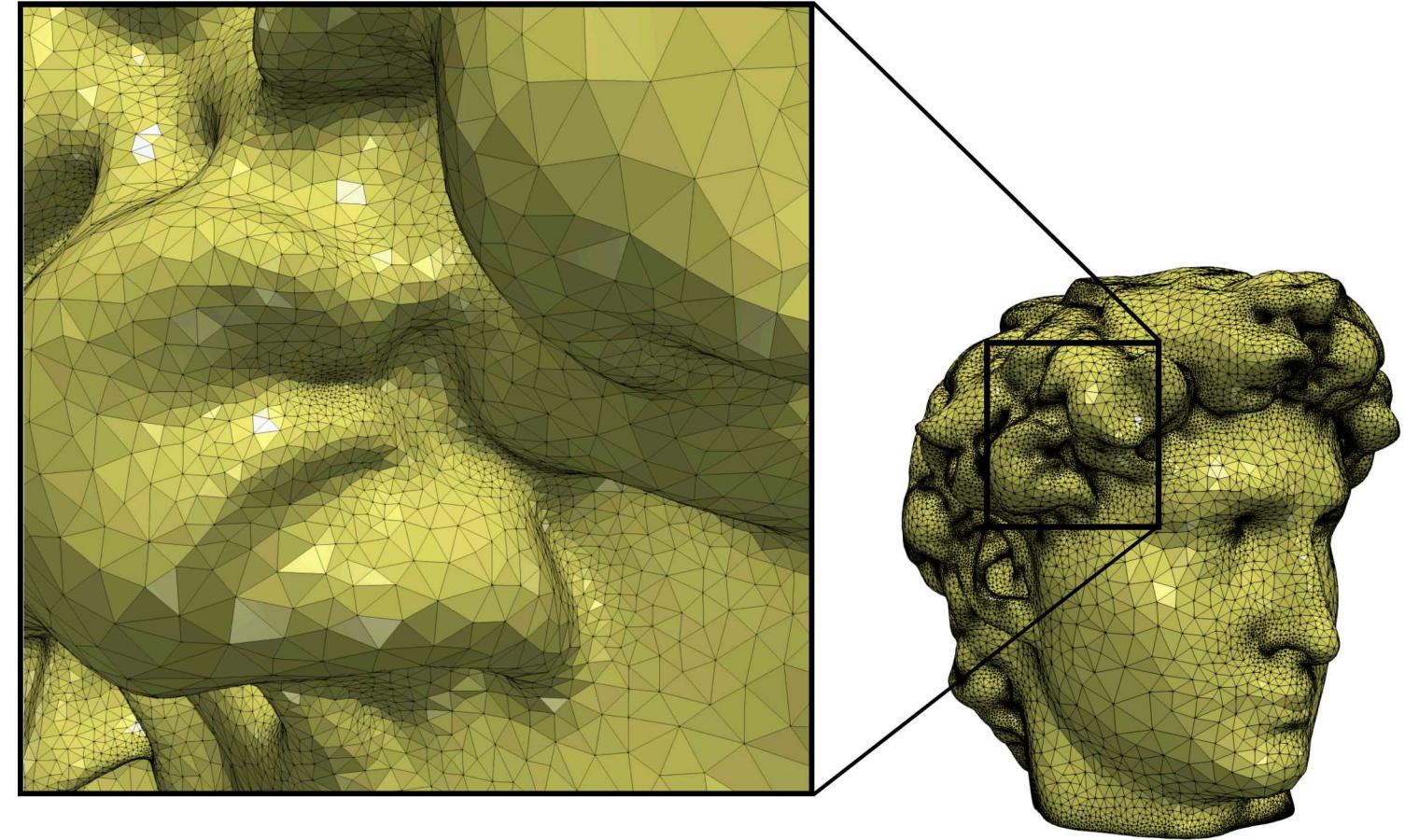


## *Results: surface quality*

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### Surface Triangle Metrics:

- Minimum triangle quality
- % of angles  $< 30$  or  $> 90$
- Hausdorff distance

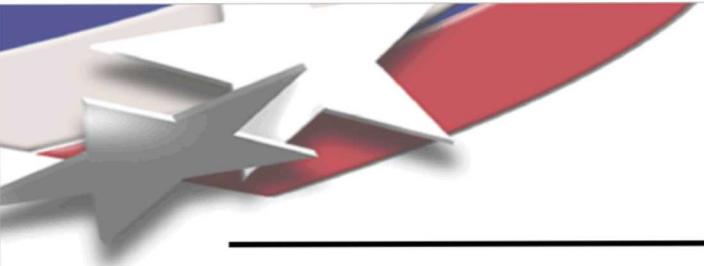


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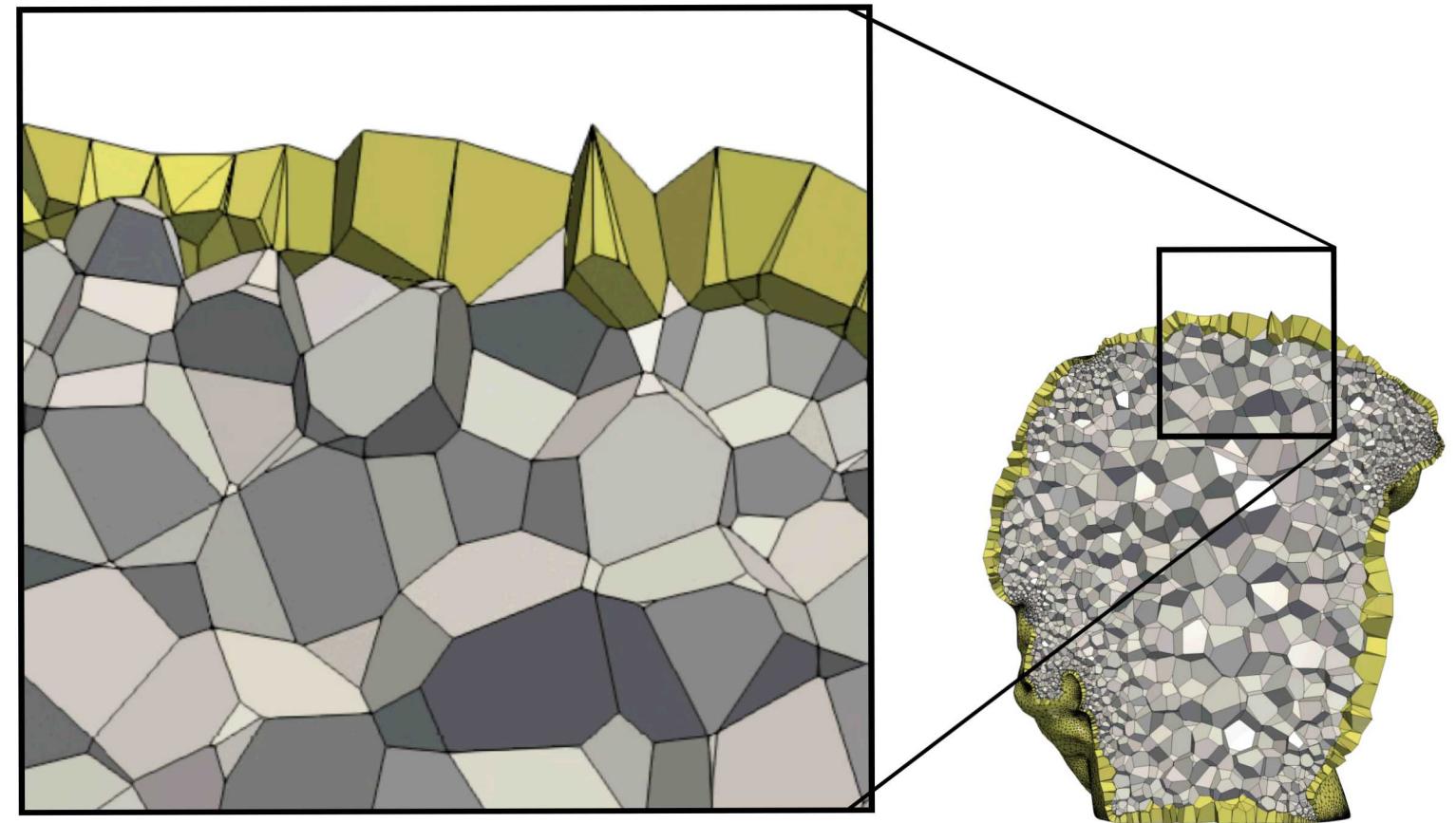


## *Results: volume cells quality*

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### Volume Cells Metrics:

- Maximum aspect ration



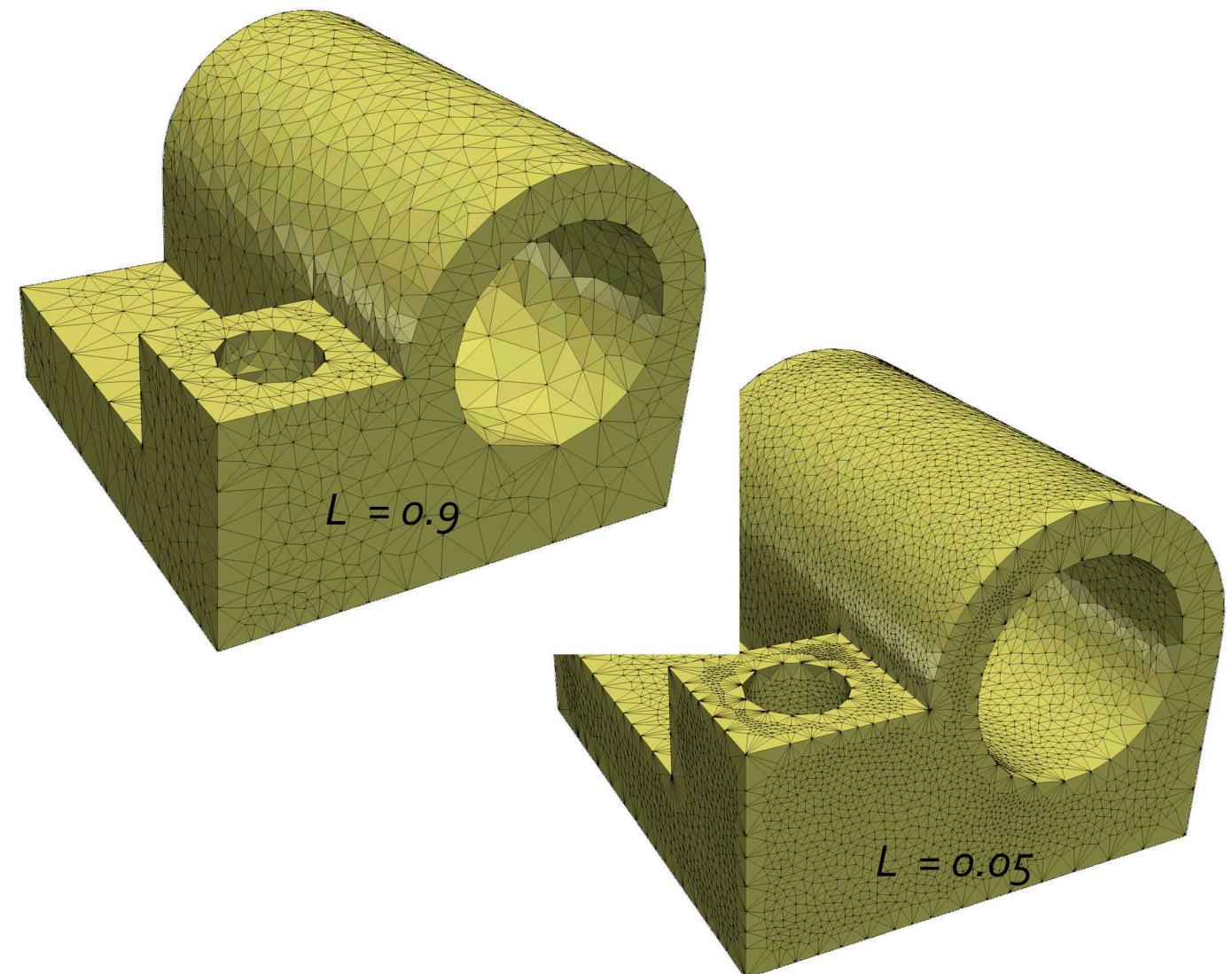
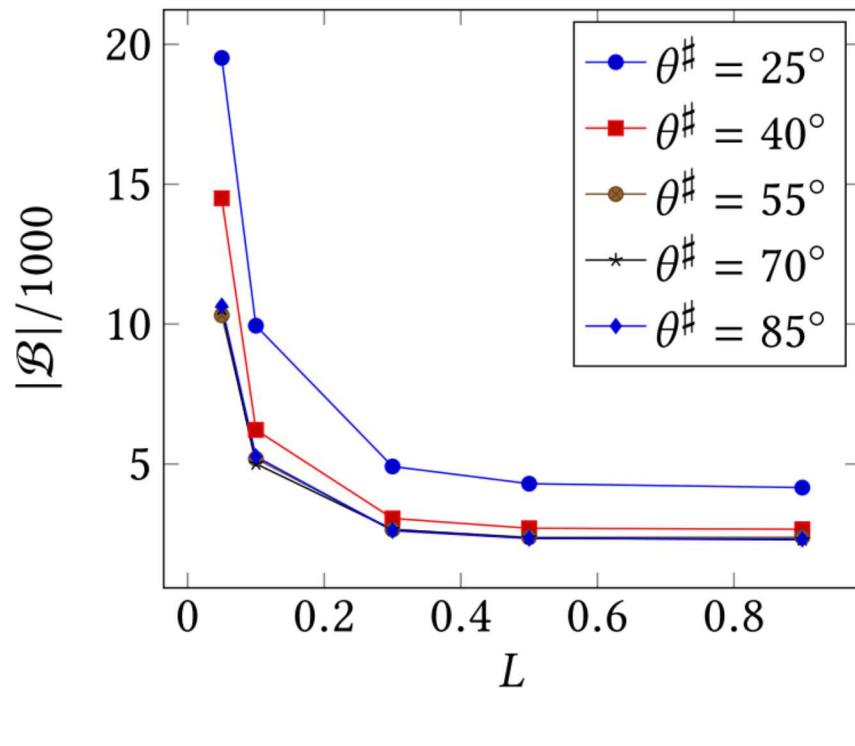
VoroCrust

Voronoi Meshing Without Clipping

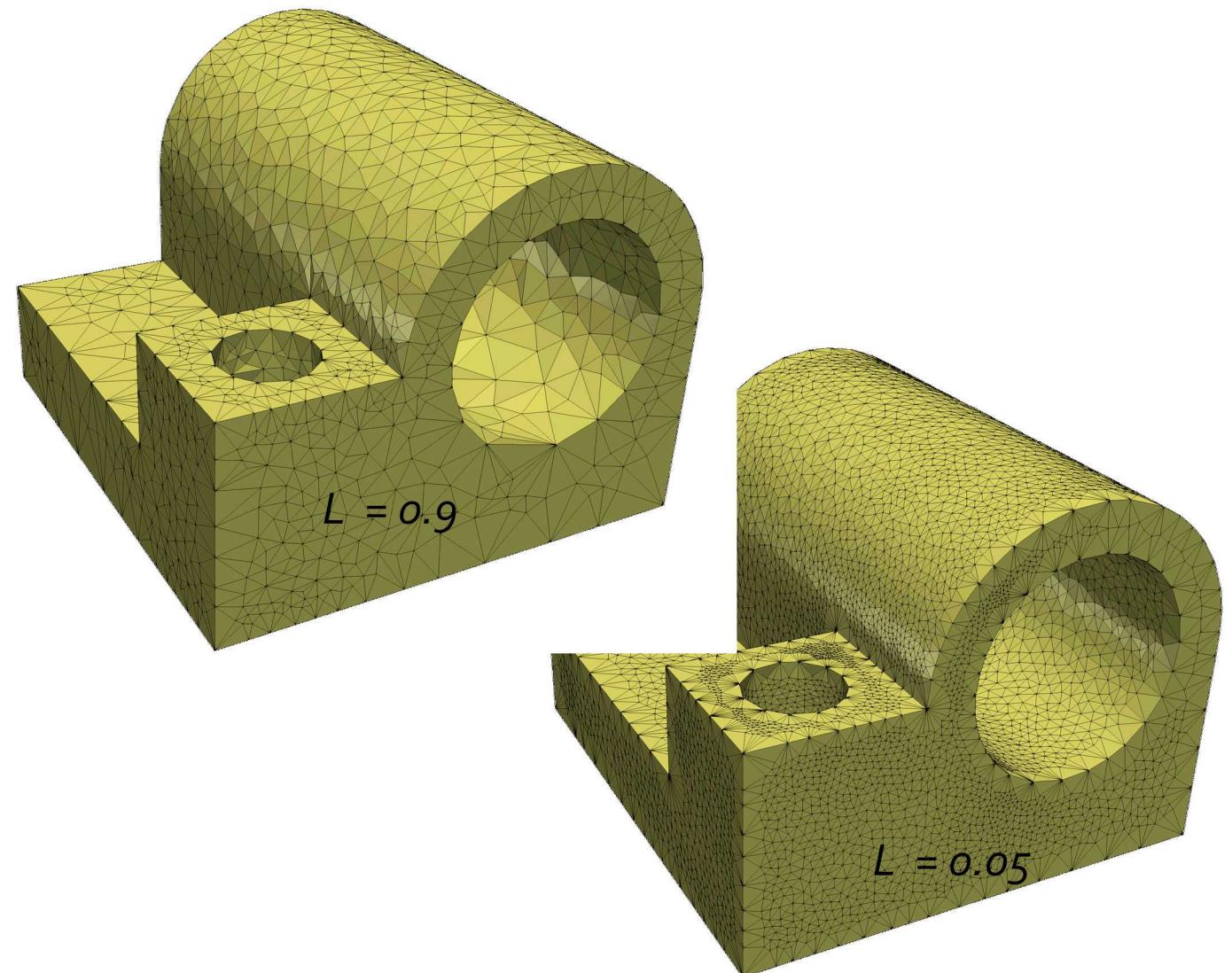
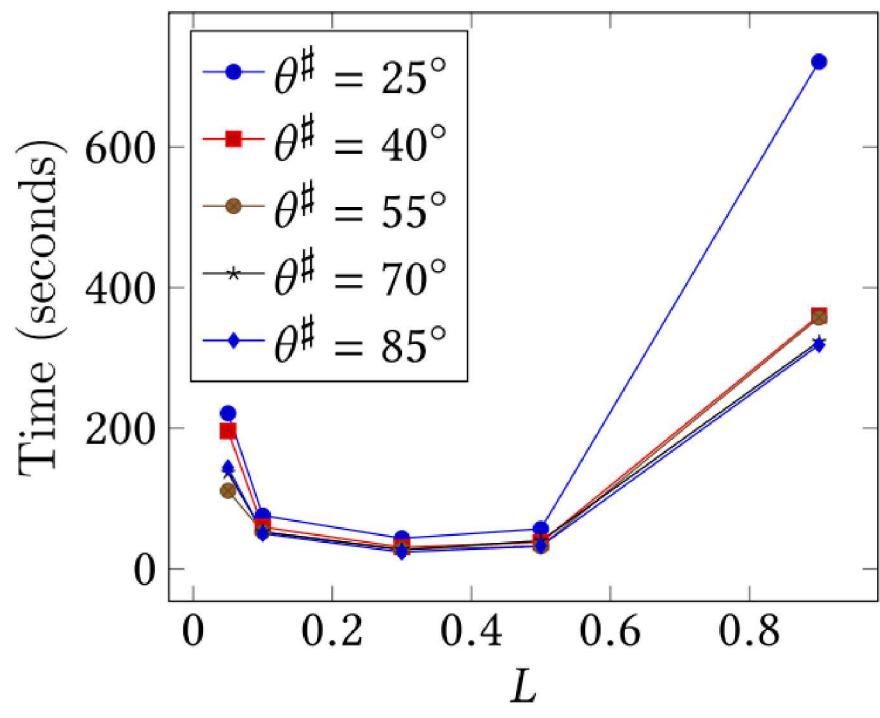


## Parameter L:

- Maximum aspect ration

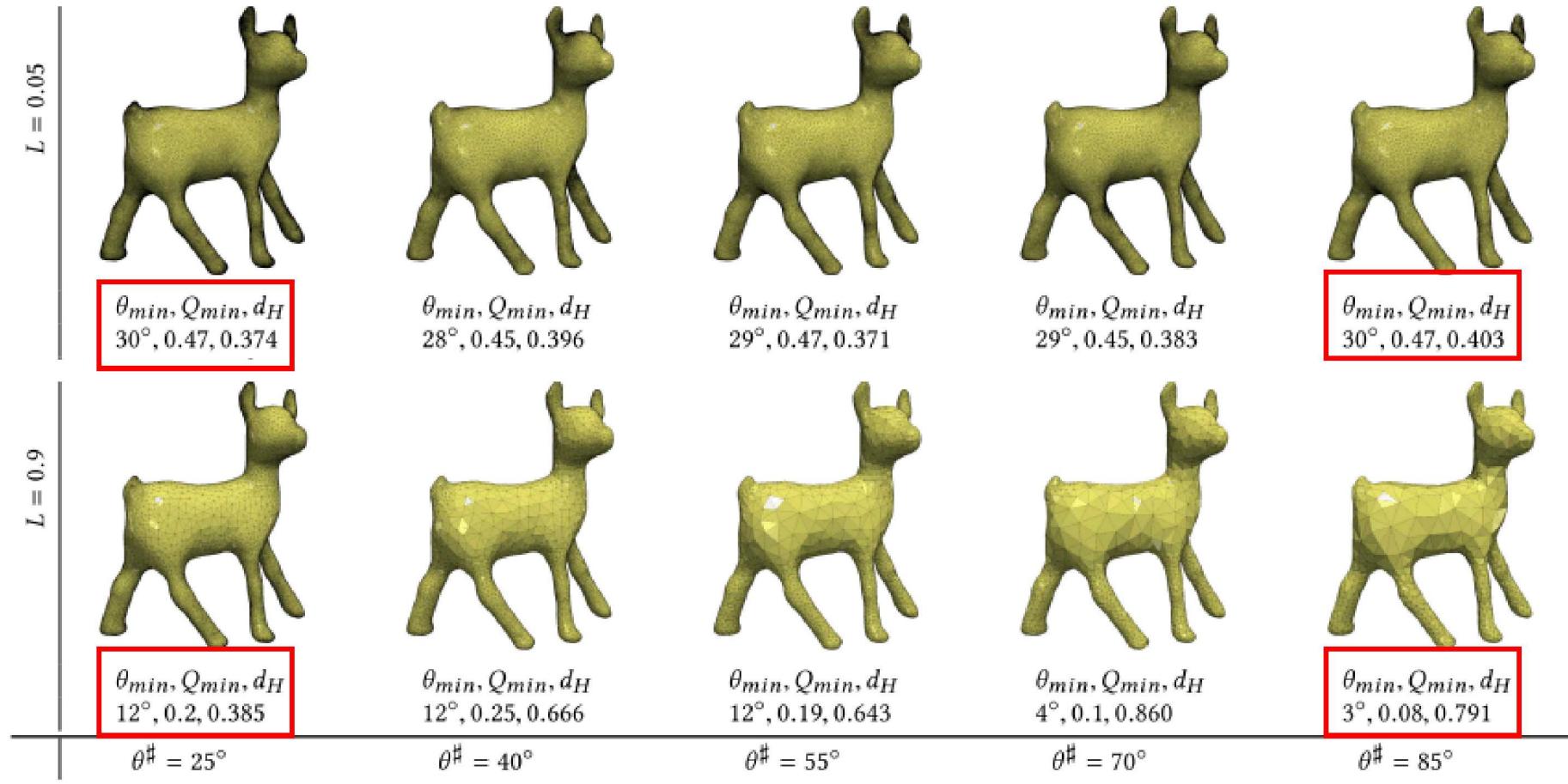


## Parameter L



# Results: parameter study

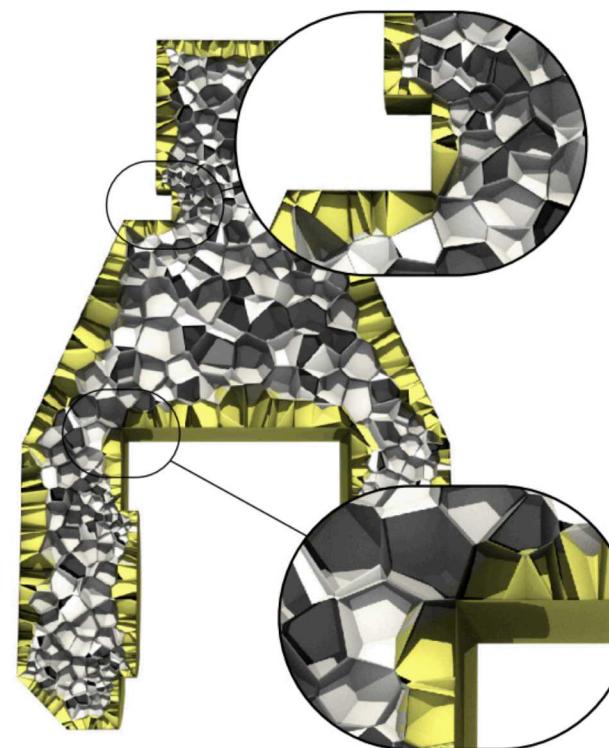
Parameter ( $\theta^\#$ )



## Comparison against Restricted Voronoi Diagram (RVD):

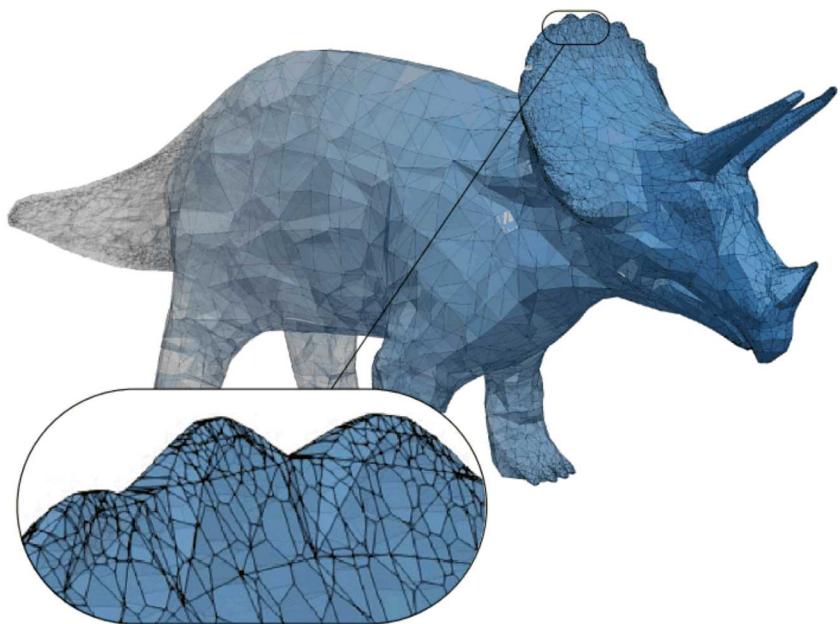


RVD



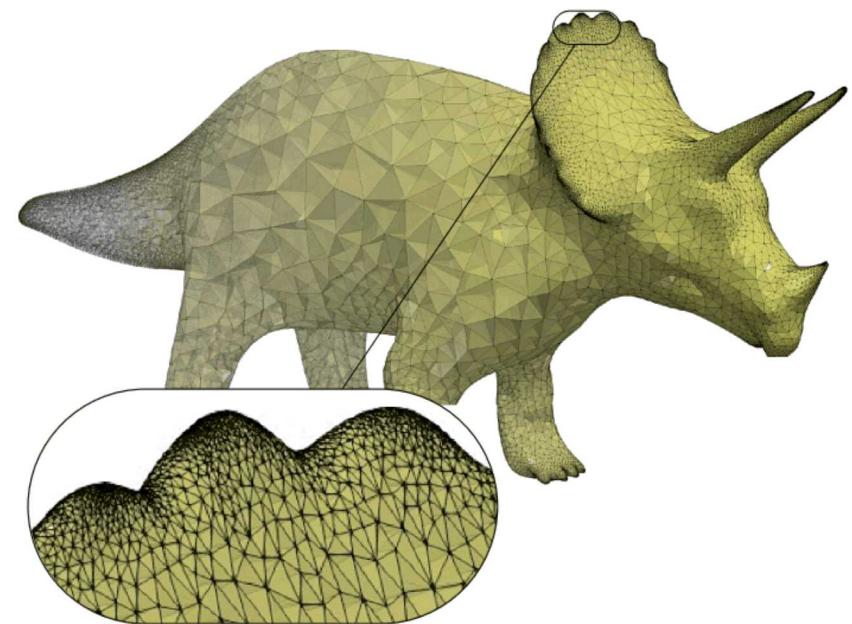
VoroCrust

## Comparison against Restricted Voronoi Diagram (RVD):



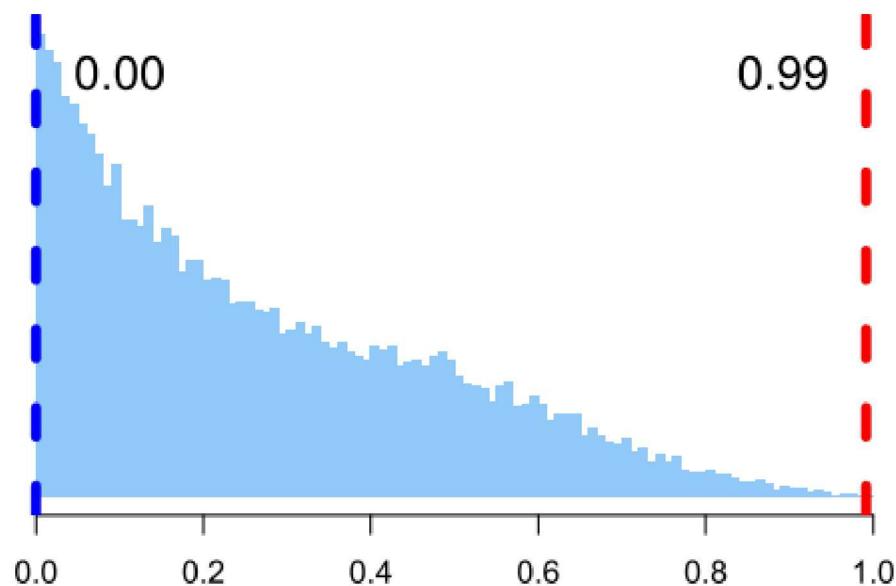
RVD

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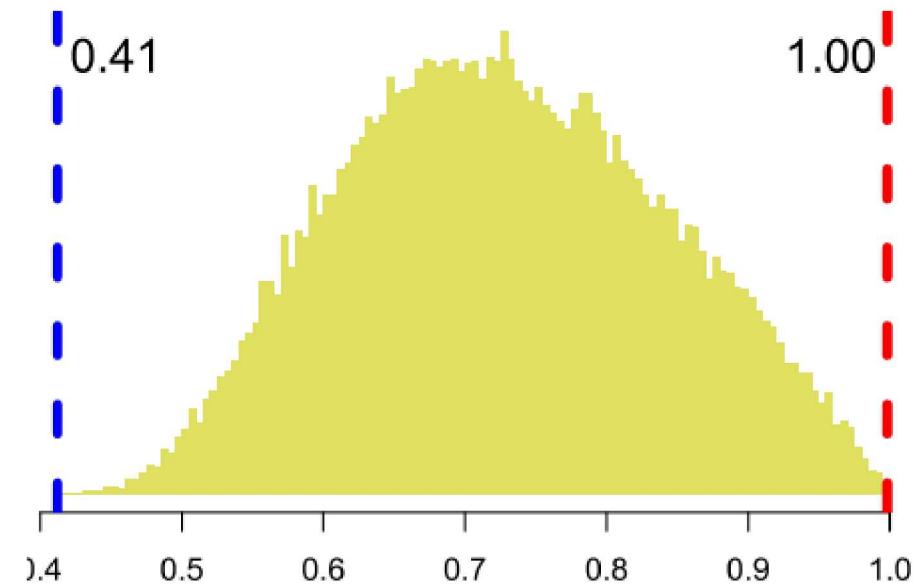
VoroCrust

## Comparison against Restricted Voronoi Diagram (RVD):

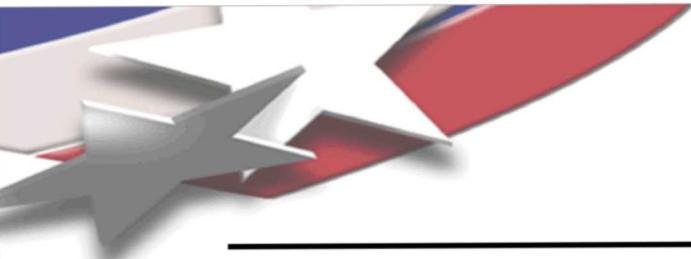


RVD

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## *Limitations*

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- Short edges
- Input faithfulness (e.g., non-watertight)
- Isotropic sampling

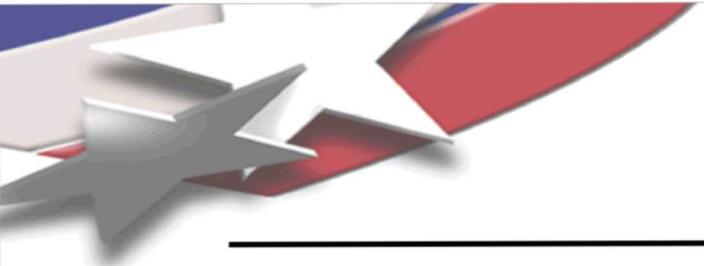


VoroCrust

Voronoi Meshing Without Clipping



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## Conclusion

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- First provably-correct algorithm for conforming Voronoi mesh on arbitrary domains
- Guarantees on convexity, output quality
- Robust, well-tested implementation
  - [VoroCrust.Sandia.gov](http://VoroCrust.Sandia.gov)



VoroCrust

Voronoi Meshing Without Clipping



- Speedup by parallelization
- Anisotropic meshing
- Short edges elimination





Visit  
*VoroCrust.Sandia.gov*

Thank you!



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