



**SIGGRAPH 2023**  
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COMPUTER GRAPHICS & INTERACTIVE TECHNIQUES

# VARIATIONAL SHAPE RECONSTRUCTION VIA QUADRIC ERROR METRICS

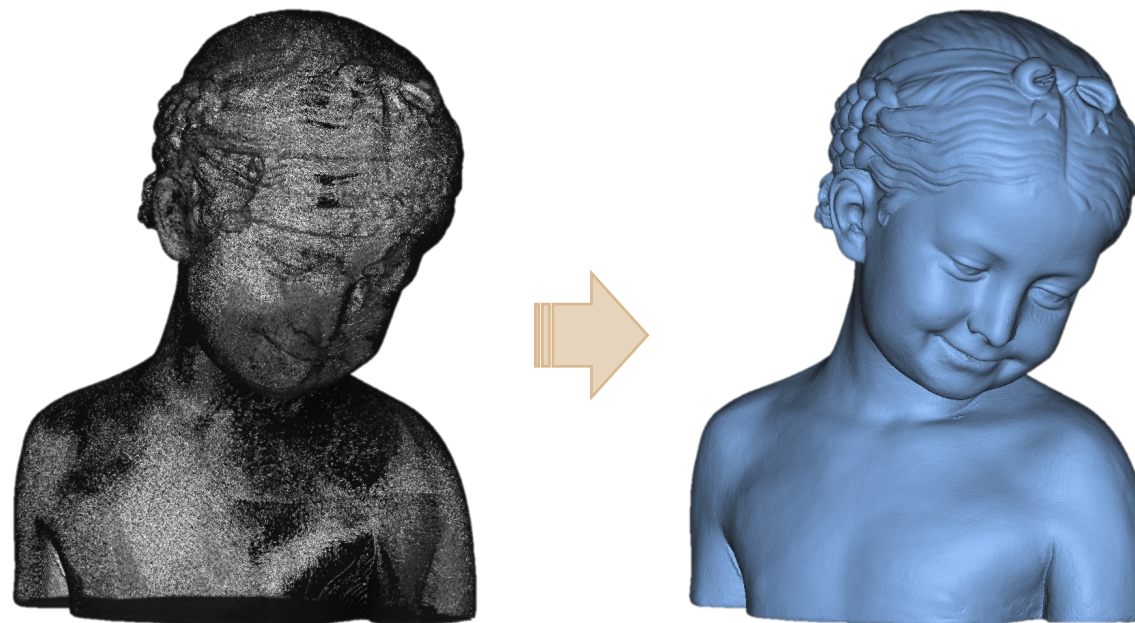
TONG ZHAO, LAURENT BUSÉ, DAVID COHEN-STEINER, TAMY BOUBEKEUR,  
JEAN-MARC THIERY, PIERRE ALLIEZ

# → DENSE MESH RECONSTRUCTION

- **Input** : Point clouds
- **Output** : Surface mesh

☹️ Facing many challenges

☹️ Often needs a post-processing to simplify the reconstructed meshes



# → DENSE CONCISE MESH RECONSTRUCTION

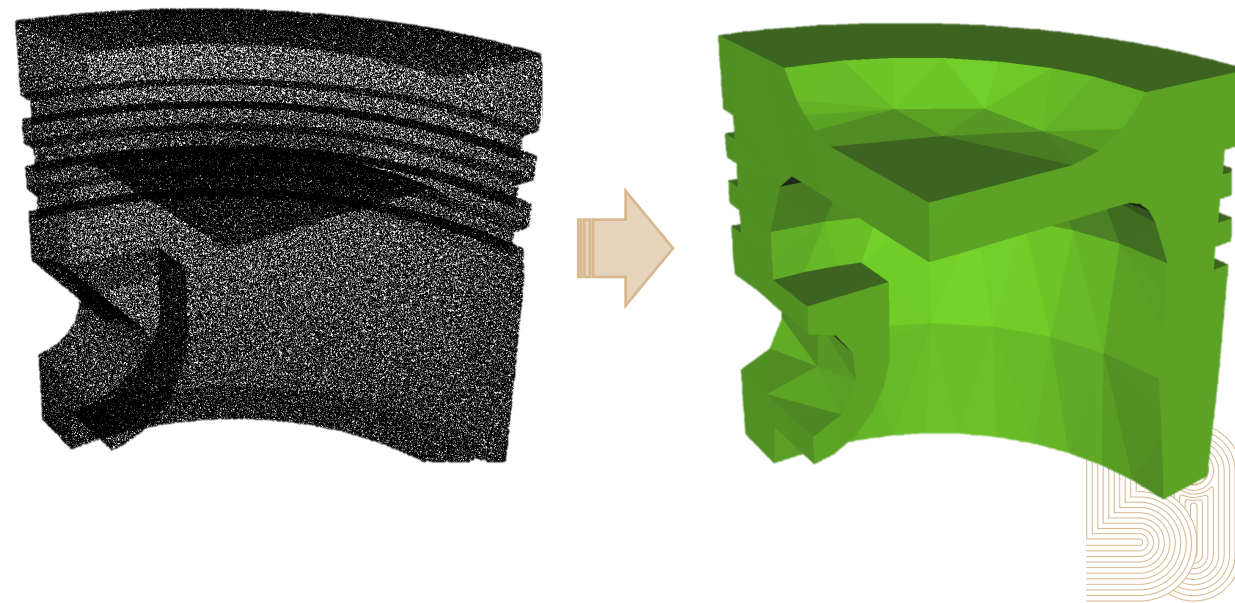
- **Input** : Point clouds
- **Output** : Surface mesh with just enough degrees of freedom

Reconstruct then simplify?

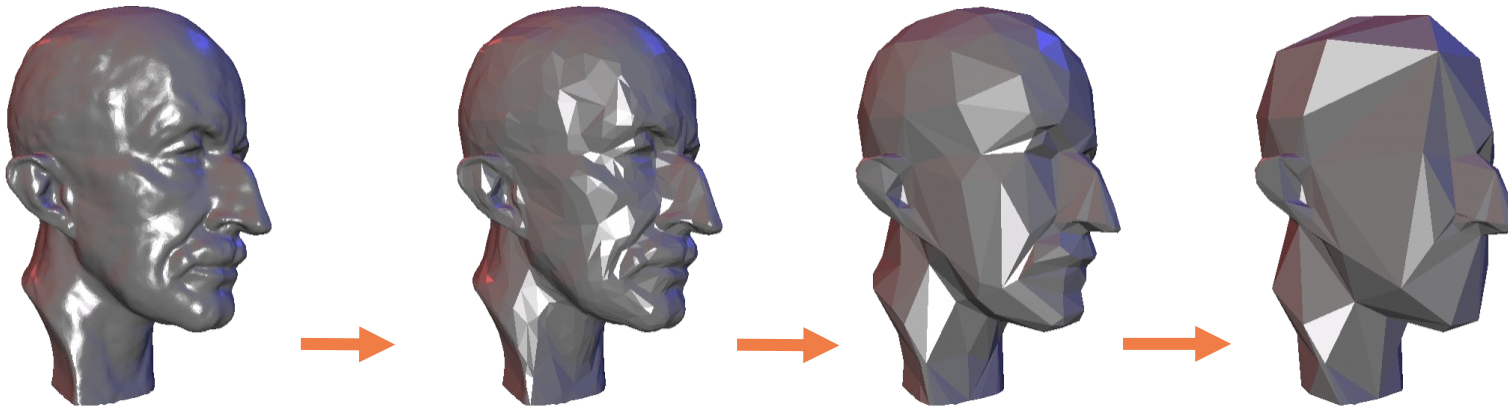
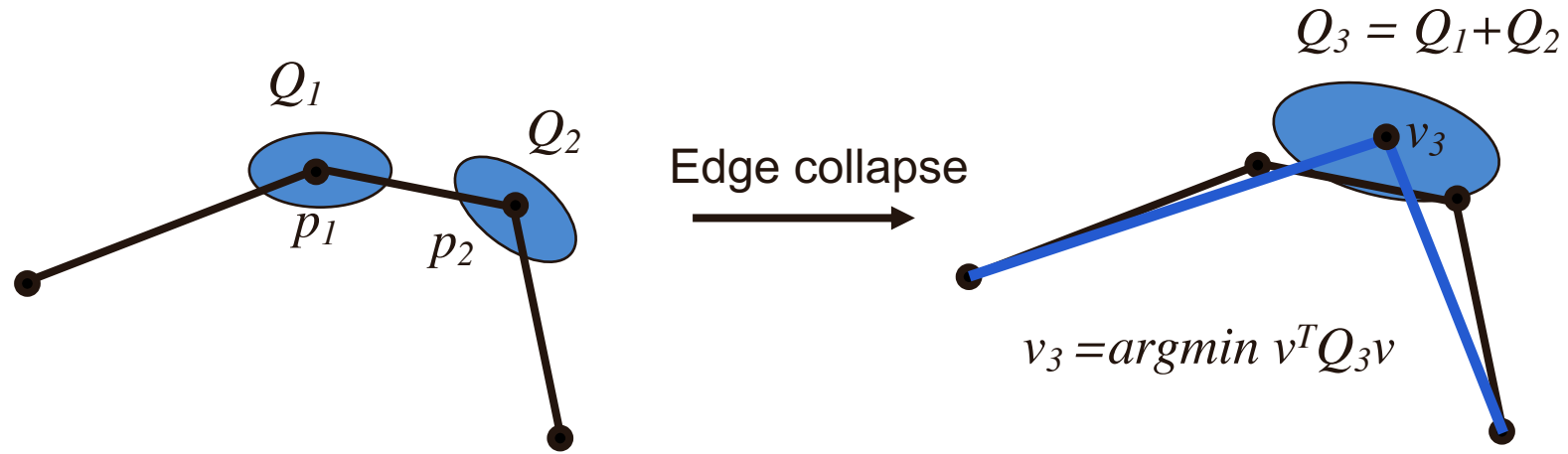


☹ Memory footprint and algorithmic complexity

☹ Inconsistency between reconstruction and simplification



# → WHY QUADRIC ERROR METRICS (QEM)?

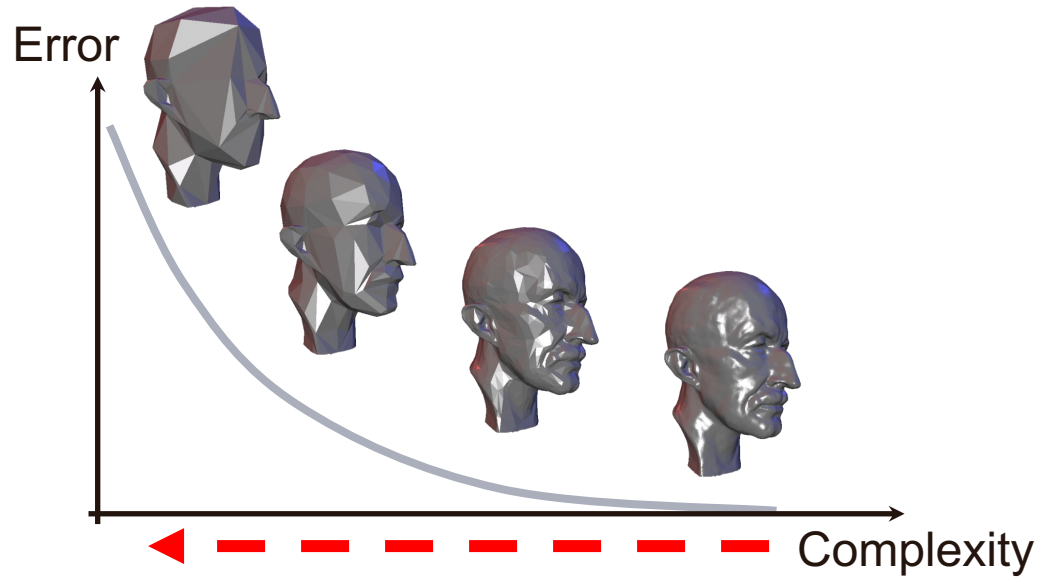




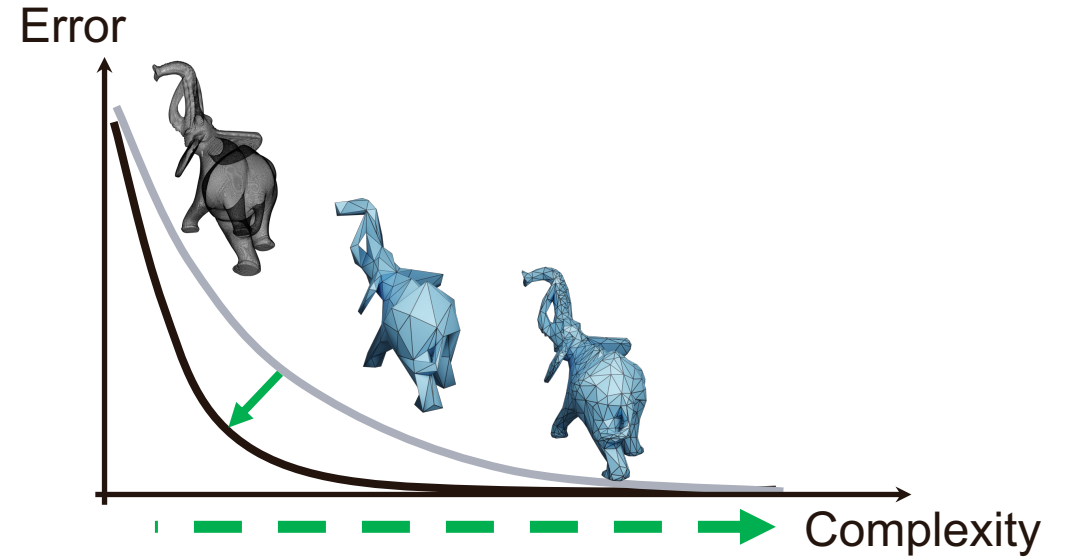
# WHY VARIATIONAL?



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**Greedy** fine-to-coarse  
mesh simplification



**Variational** coarse-to-fine  
mesh reconstruction



- QEM is sensitive to **sharp features** and independent from **normal orientation**
- Clustering via QEM decimates intrinsically the mesh
- Variational reconstruction allows a **lower memory footprint** and **better optimization**

**Coarse-to-fine feature-preserving concise reconstruction** from **unoriented** point clouds



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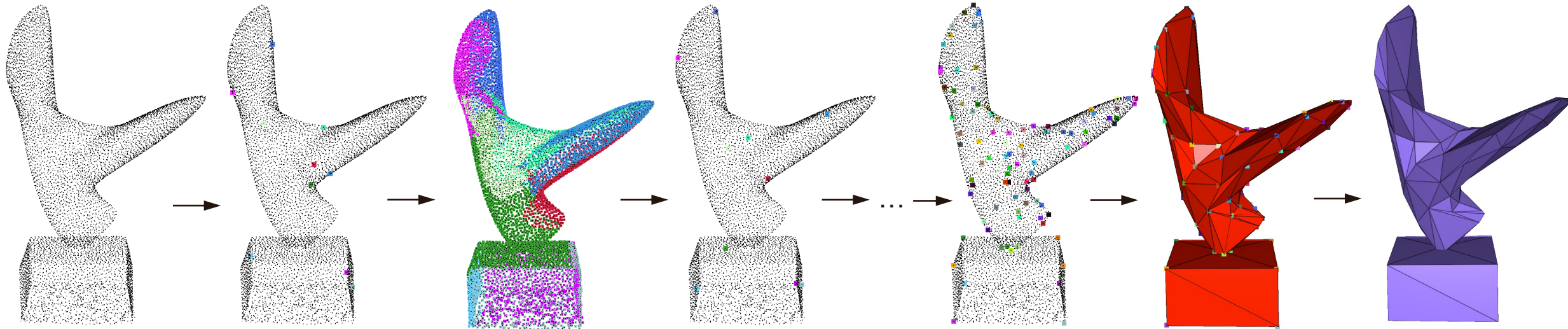


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# APPROACH

# → PIPELINE



Input

No new generator

Output

Estimate point-wise quadric

Initialize random generators

Region growing

Update generators

Batch splitting

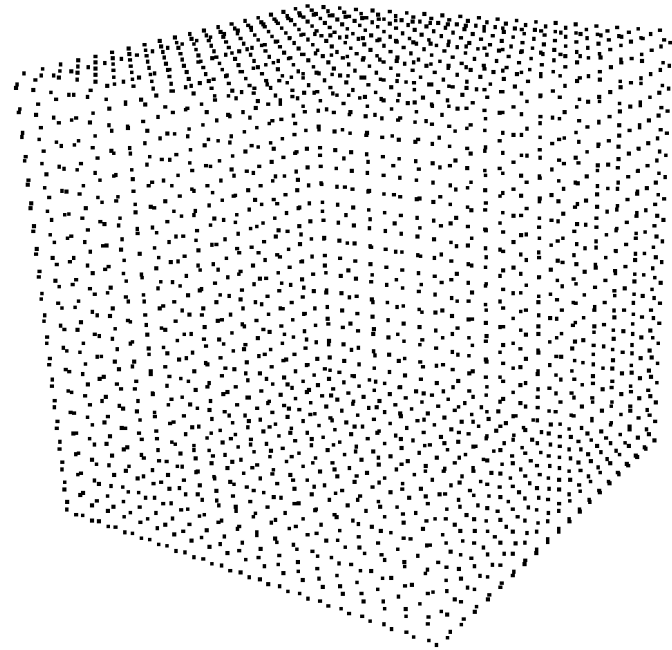
Mesh solver

If new generator(s)

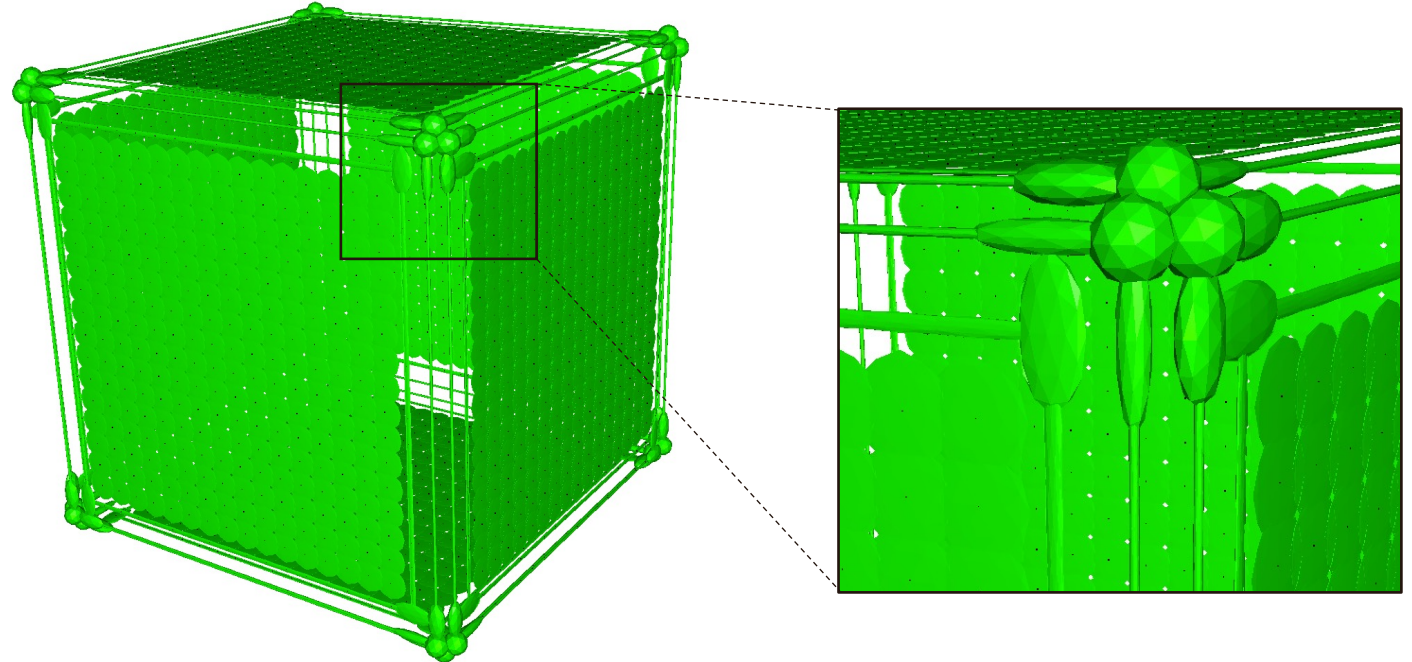




# → STEP 1: INITIALIZATION



(a) Point cloud

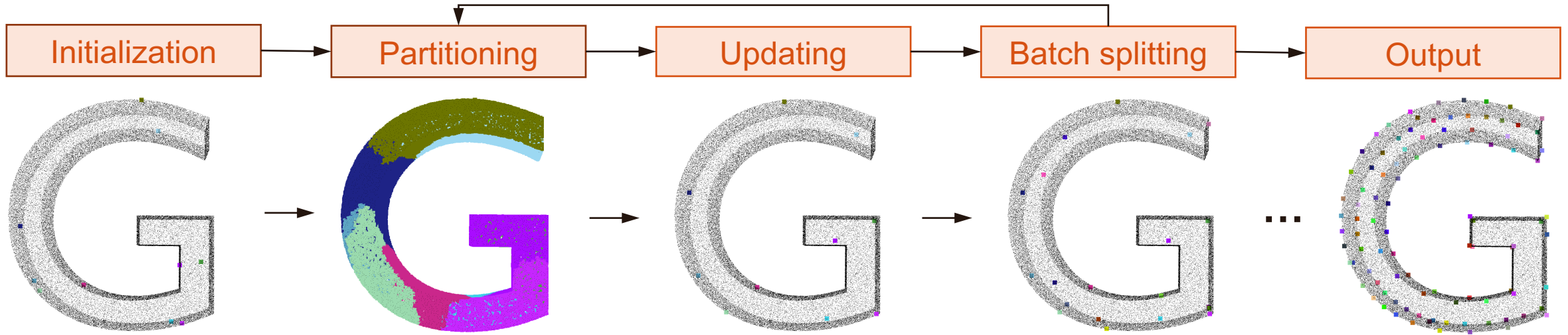


(a) Diffused QEM ellipsoids<sup>[1]</sup>

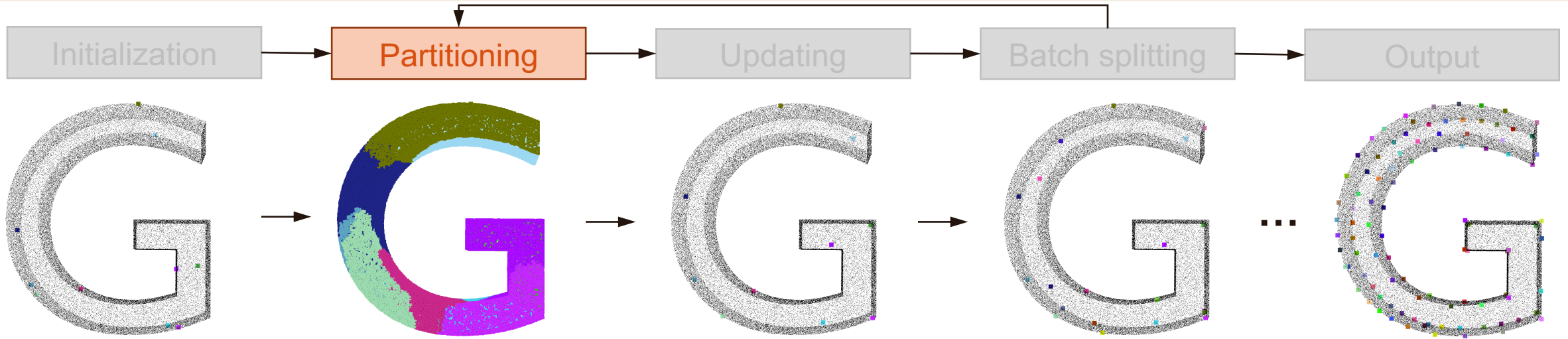


[1] Legrand, H el ene, et al. *Filtered quadrics for high-speed geometry smoothing and clustering*. *Computer Graphics Forum*, 2019.

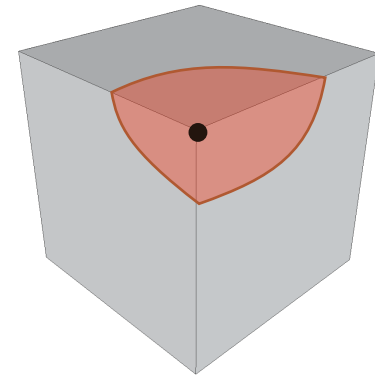
## → STEP 2: CLUSTER QEM



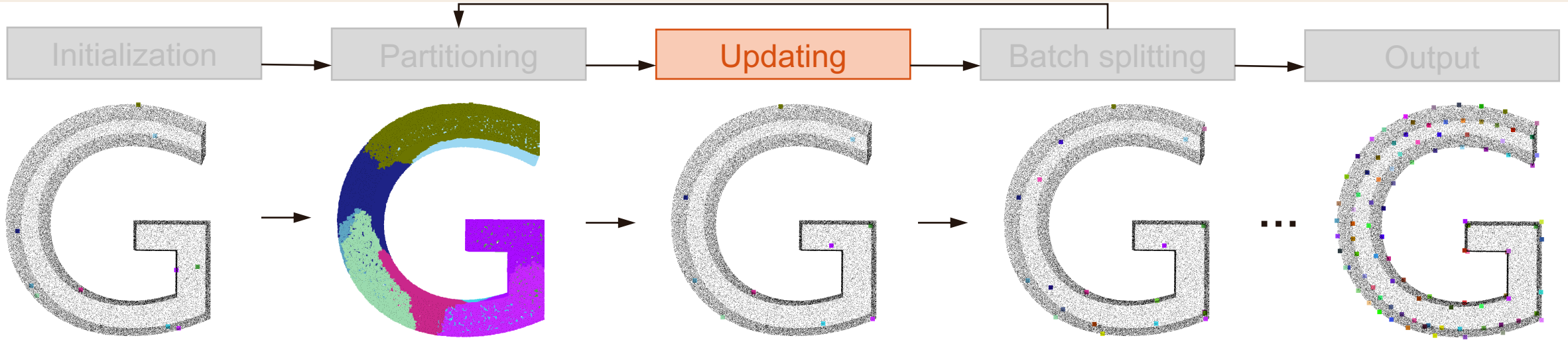
# → STEP 2: CLUSTER QEM



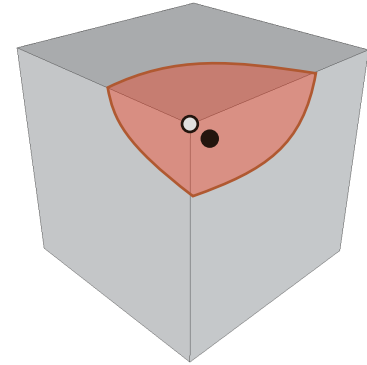
$$E(p_i, l_j) = [c_j, 1]^T \cdot Q_{v_i} \cdot [c_j, 1]$$



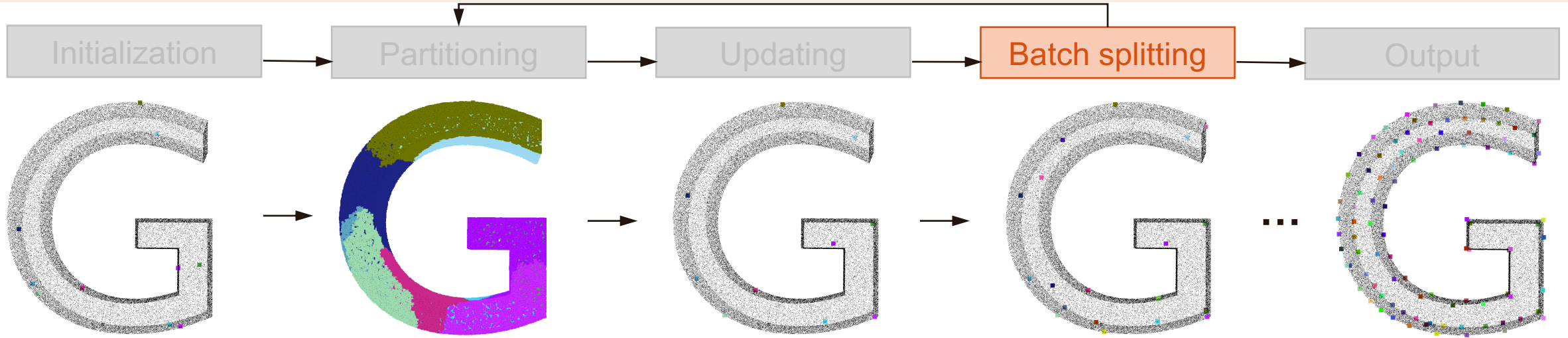
# → STEP 2: CLUSTER QEM



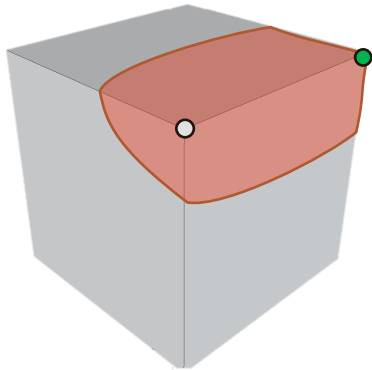
$$E(p_i, l_j) = [c_j, 1]^T \cdot Q_{v_i} \cdot [c_j, 1]$$
$$c_j^* = \operatorname{argmin}_{p \in \mathbb{R}^3} [p, 1]^T \cdot Q_{c_j} \cdot [p, 1]$$



# → STEP 2: CLUSTER QEM



$$E(p_i, l_j) = [c_j, 1]^T \cdot Q_{v_i} \cdot [c_j, 1]$$



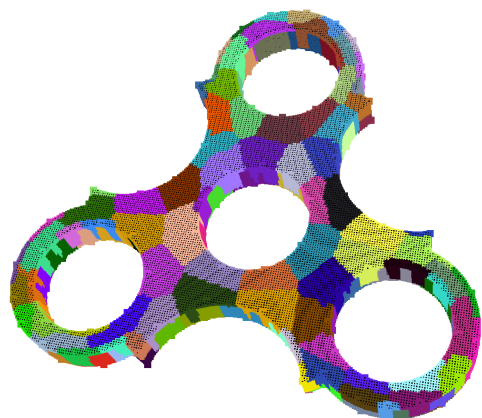
$$c_j^* = \operatorname{argmin}_{p \in \mathbb{R}^3} [p, 1]^T \cdot Q_{c_j} \cdot [p, 1]$$

$$p_{\max}(l_j) = \operatorname{argmax}_{p_i \in l_j} [p_i, 1]^T \cdot Q_{c_j} \cdot [p_i, 1]$$

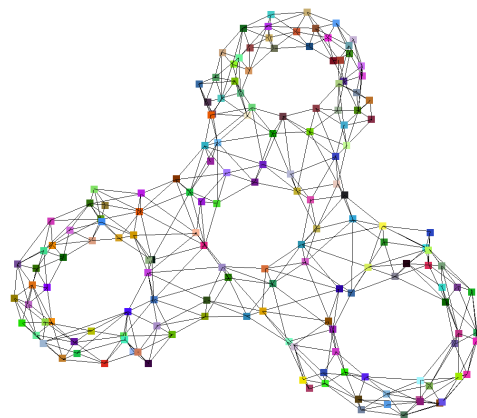


## → STEP 3: MESHING

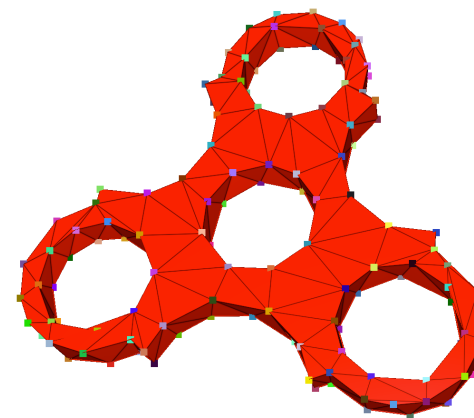
1. Construct **edge candidate** set: connect adjacent clusters
2. Construct **facet candidate** set: find 3-cycles
3. Mesh extraction via **Binary Integer Programming (BIP) solver** <sup>[1]</sup>



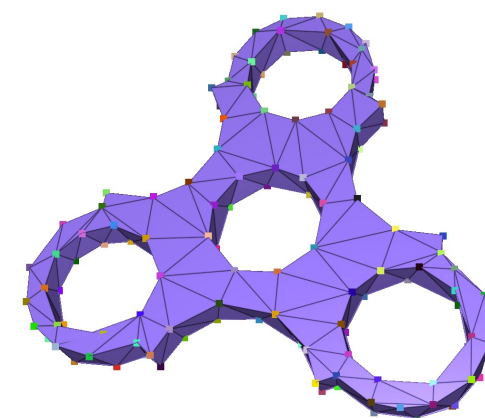
Clusters



Edge graph



Facet candidates



Output mesh

[1] Nan, Liangliang, et al. *Polyfit: Polygonal surface reconstruction from point clouds*. Proceedings of the IEEE International Conference on Computer Vision. 2017.

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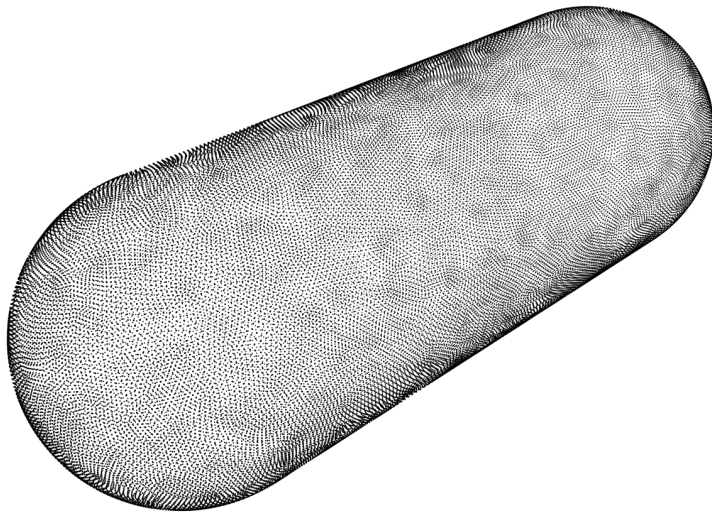
# RESULTS



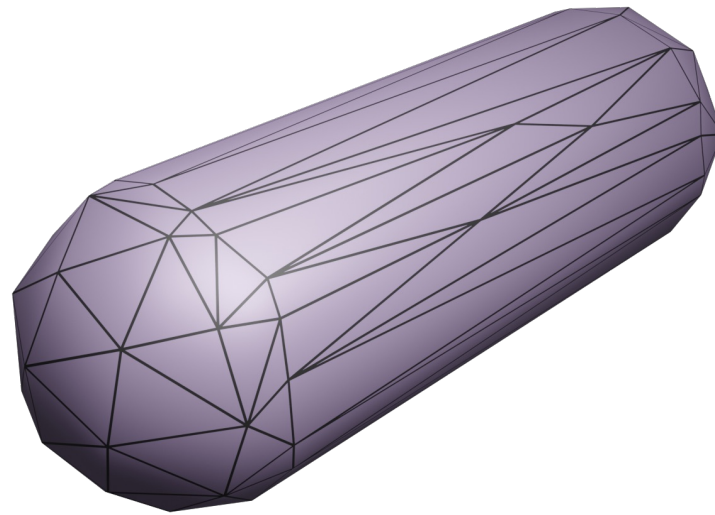
# GREEDY V.S. VARIATIONAL



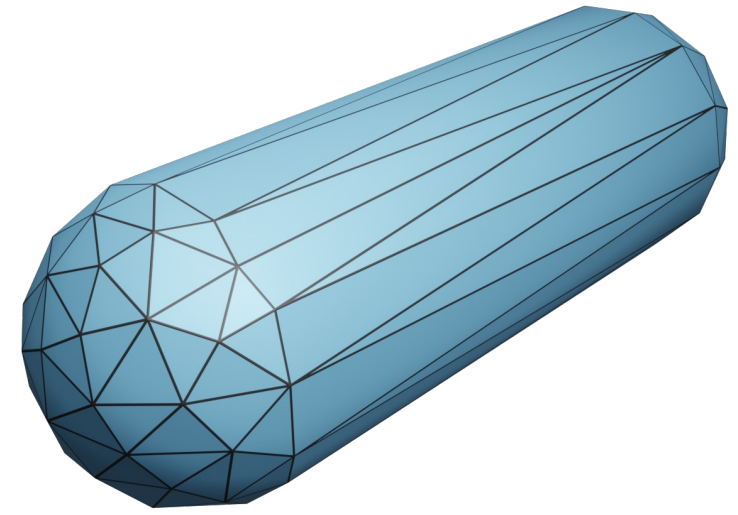
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Input 3D point cloud



Poisson + QEM



Our approach



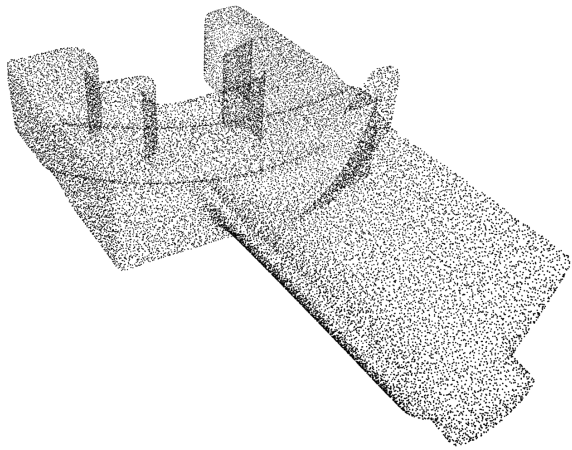




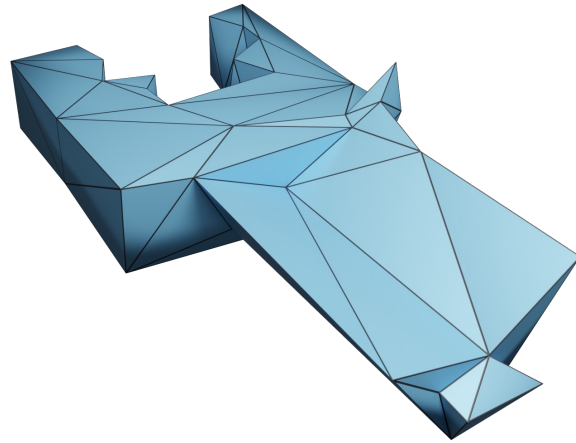
# FEATURE-PRESERVING



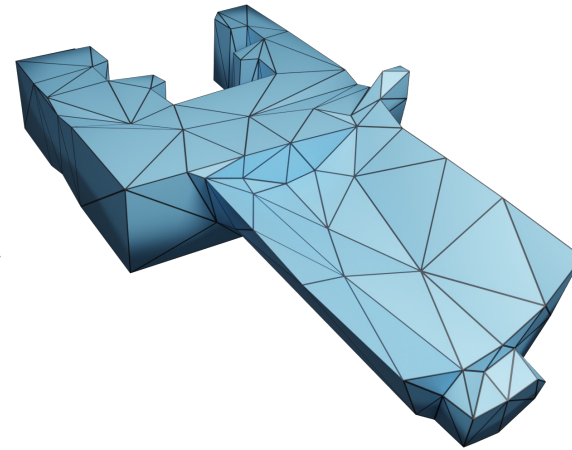
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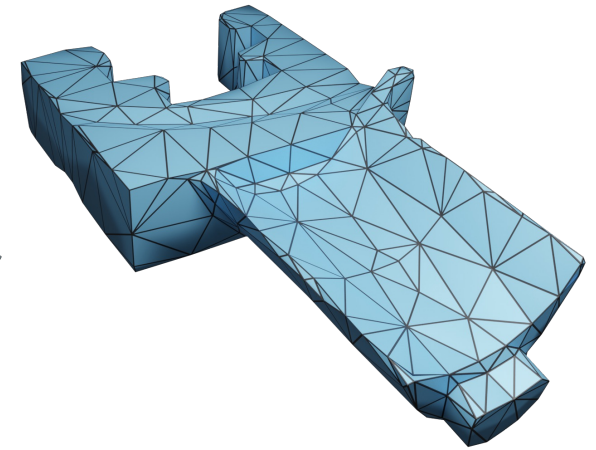
Input 3D point cloud



Coarse



Medium



Dense

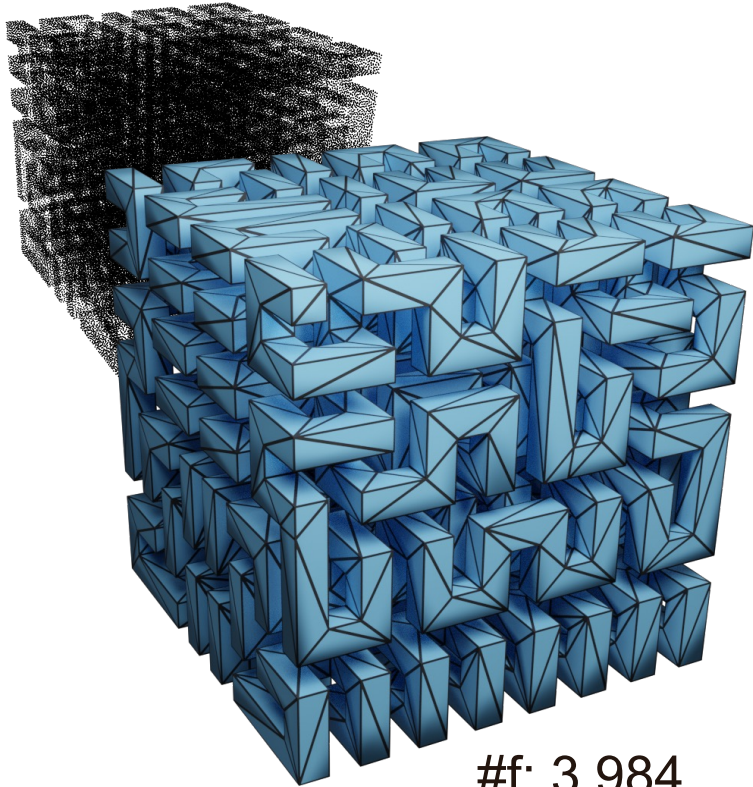




# NORMAL ORIENTATION

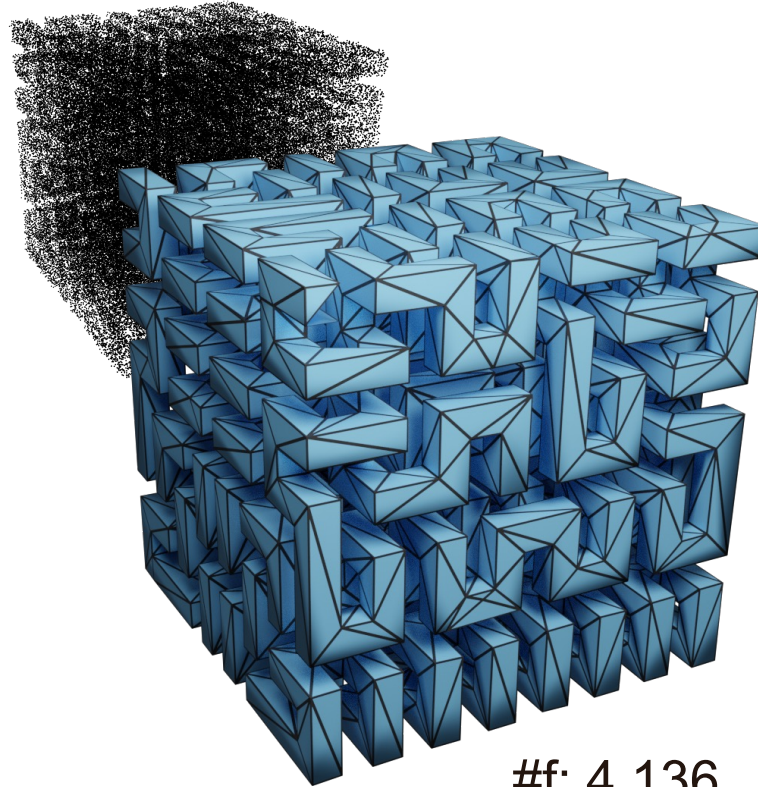


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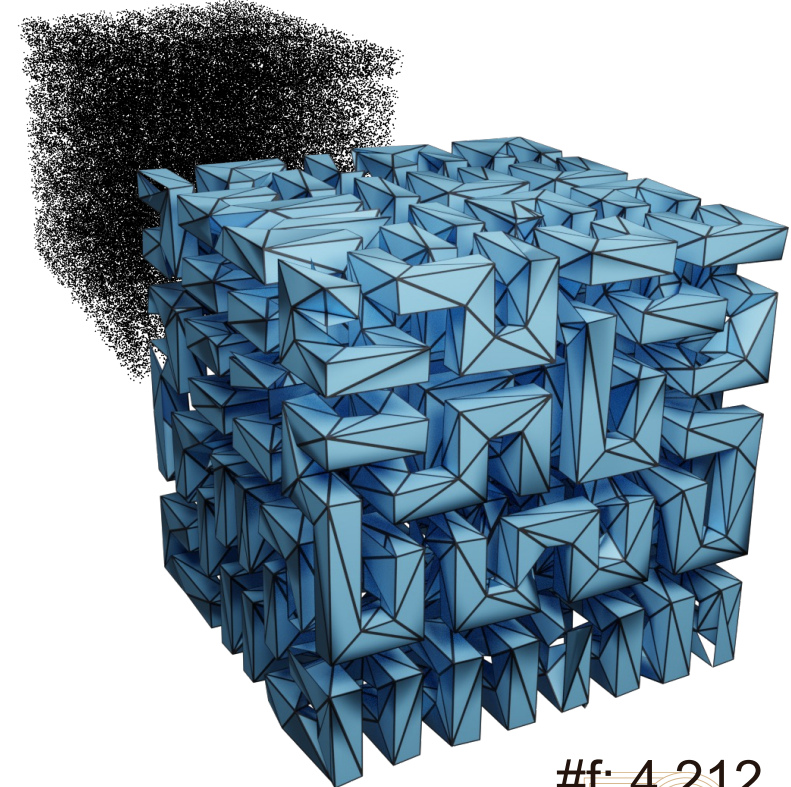
#f: 3,984

Noise: 0



#f: 4,136

Noise: 0.5%

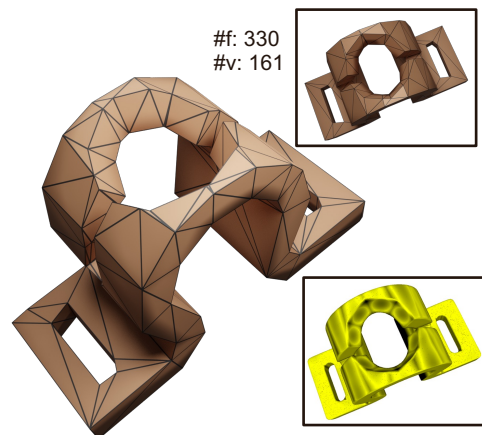


#f: 4,212

Noise: 1%

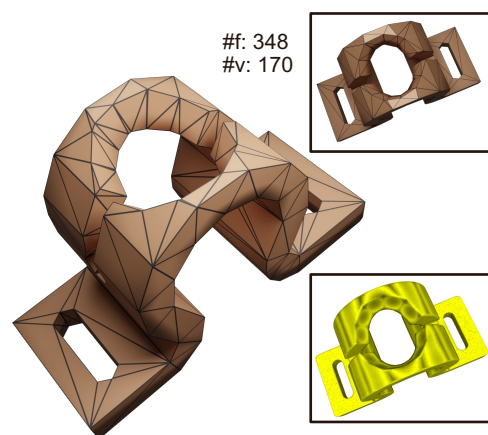


# → COMPARISON



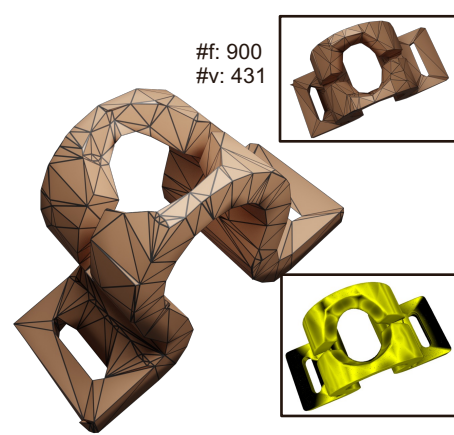
#f: 330  
#v: 161

KSR<sup>[1]</sup>



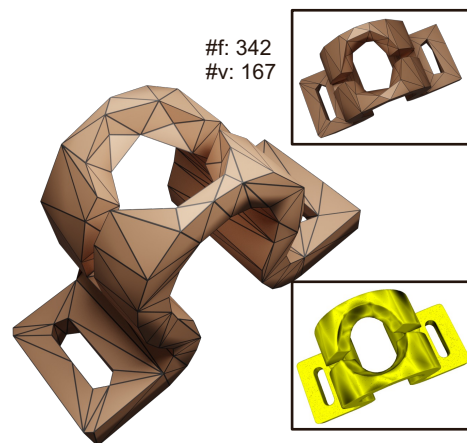
#f: 348  
#v: 170

GoCoPP<sup>[2]</sup>



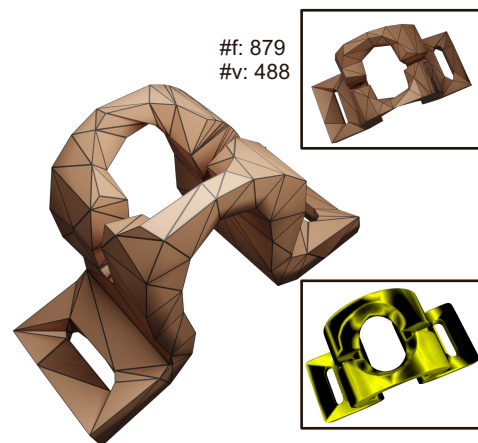
#f: 900  
#v: 431

Poisson + VSA



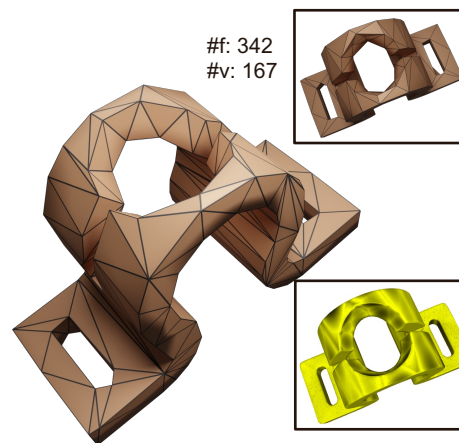
#f: 342  
#v: 167

Poisson + QEM



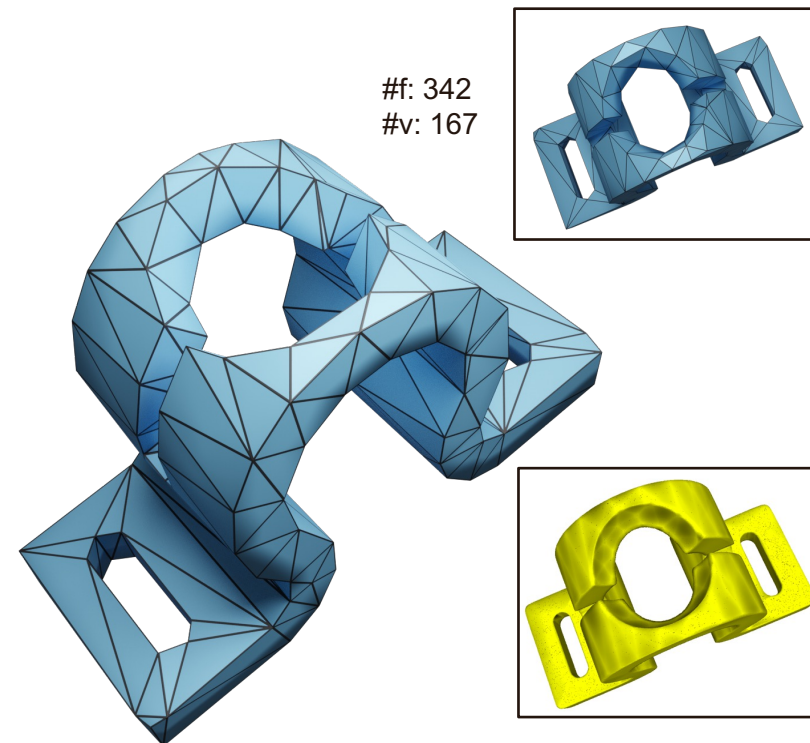
#f: 879  
#v: 488

RFEPS<sup>[3]</sup> + VSA



#f: 342  
#v: 167

RFEPS<sup>[3]</sup> + QEM



#f: 342  
#v: 167

Our approach



[1] Bauchet, Jean-Philippe, et al. *Kinetic shape reconstruction*. ACM TOG 39(5), 2020.

[2] Yu, Mulin, et al. *Finding Good Configurations of Planar Primitives in Unorganized Point Clouds*. IEEE CVPR, 2022.

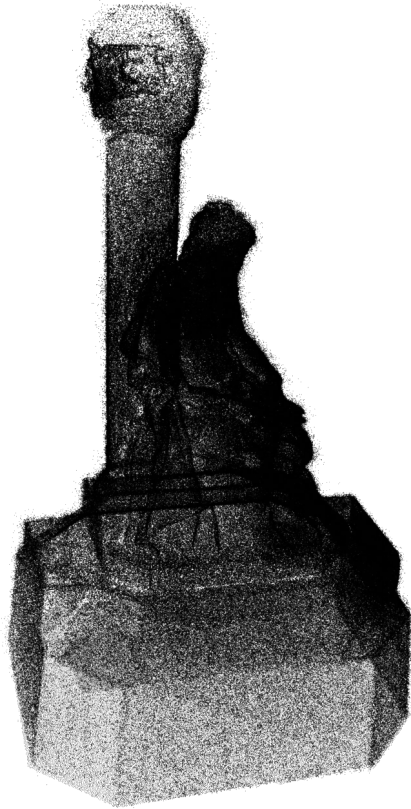
[3] Xu, Rui, et al. *RFEPS: Reconstructing feature-line equipped polygonal surface*. ACM Transactions on Graphics 2022.



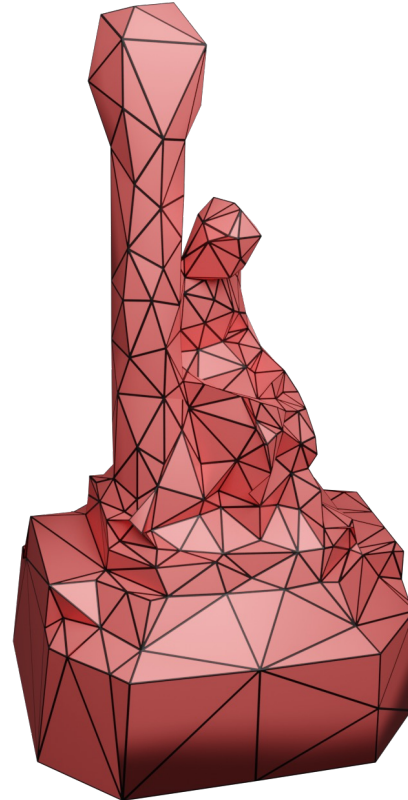
# RECONSTRUCTION FROM PHOTOGRAMMETRY



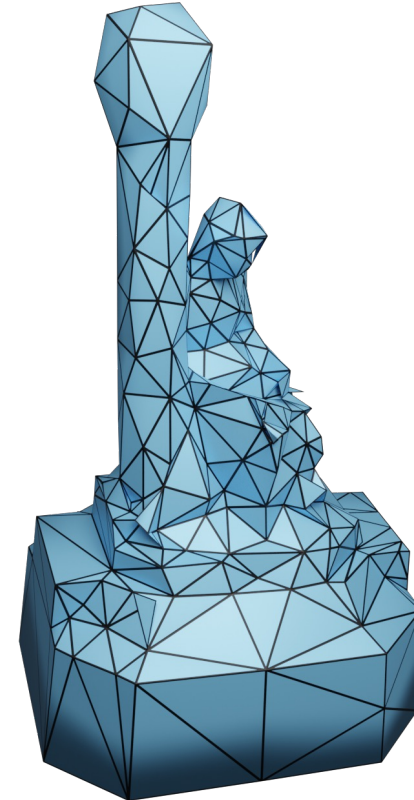
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Noisy point cloud



Face candidates



Reconstructed mesh



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# CONCLUSION

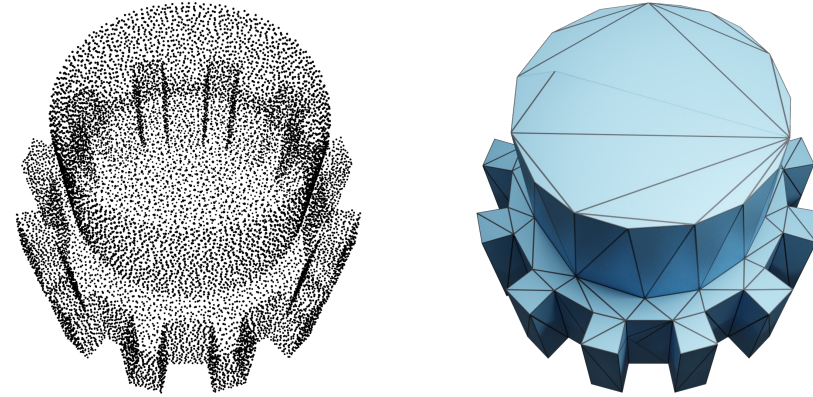
## → CONCLUSION

- A concise mesh reconstruction approach from raw point clouds
  - + QEM
  - + Variational partitioning
  - ✓ Unoriented point clouds
  - ✓ Feature-preserving
  - ✓ Coarse-to-fine



## → LIMITATION

- Point clouds with outliers
- Point clouds with boundaries
- Meshing solver may introduce fold-over



## PERSPECTIVE

- ✓ QEM can be a powerful tool in many point cloud processing tasks
- ✓ Supervised methods can help to deal with defects
- ✓ Robust meshing solver



# THANK YOU!



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Website: [tong-zhao.github.io/vsr](https://tong-zhao.github.io/vsr)



**DAVID  
COHEN-STEINER**  
INRIA



**TAMY BOUBEKEUR**  
ADOBE RESEARCH



Codes will be soon released in



**JEAN-MARC THIERY**  
ADOBE RESEARCH



**PIERRE ALLIEZ**  
INRIA

