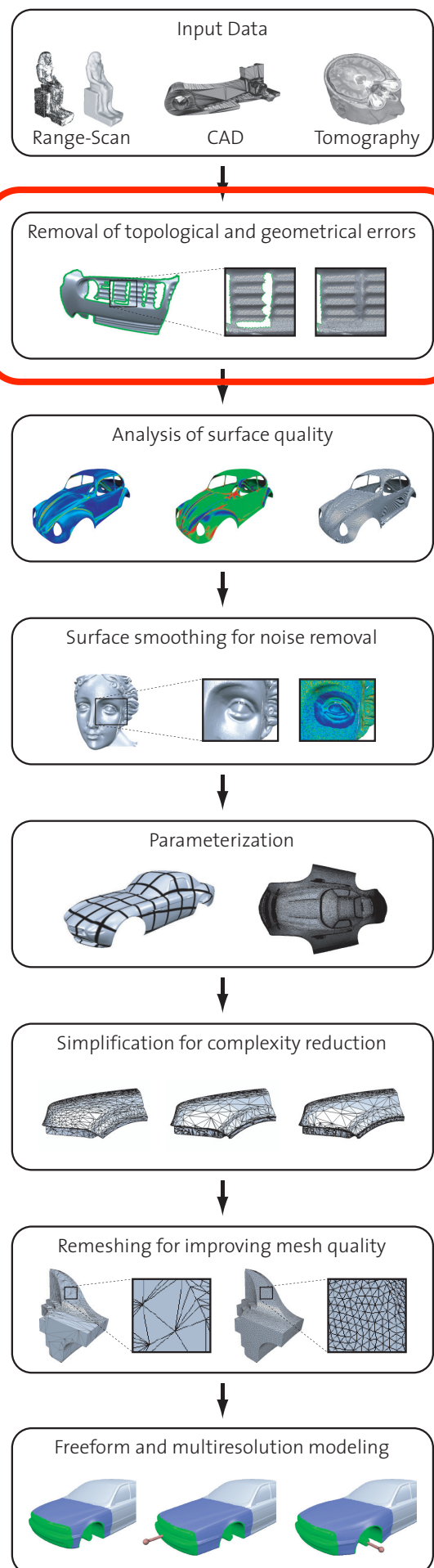


# Model Repair

Leif Kobbelt

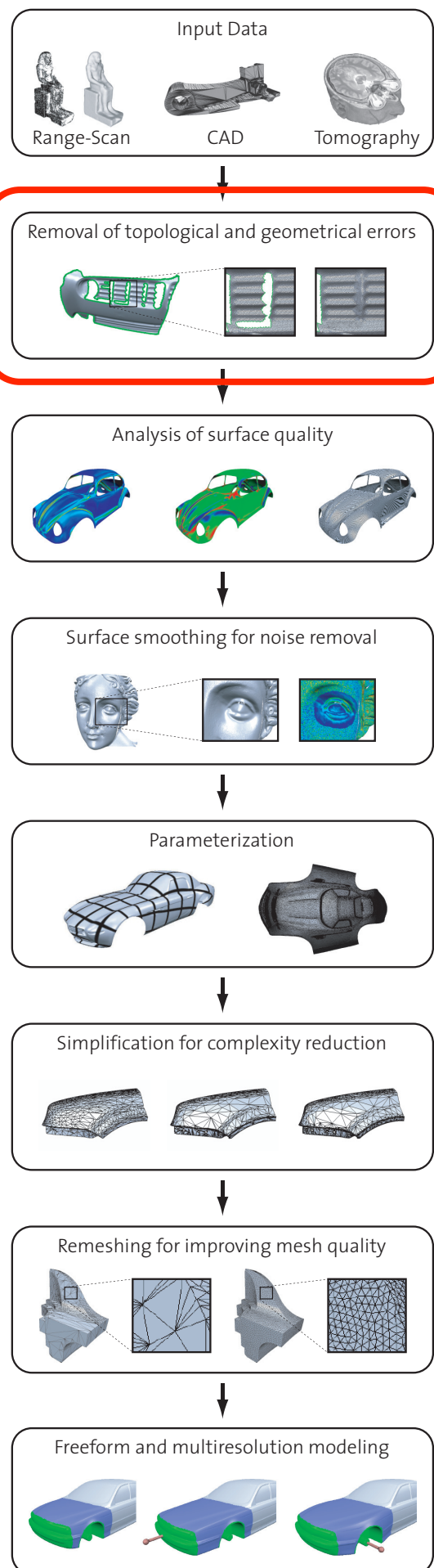
RWTH Aachen University



# Model Repair

- model repair is the removal of artifacts from a geometric model such that it becomes suitable for further processing.
- produce a nice, manifold triangle mesh
  - with boundary or
  - without boundary (watertight)





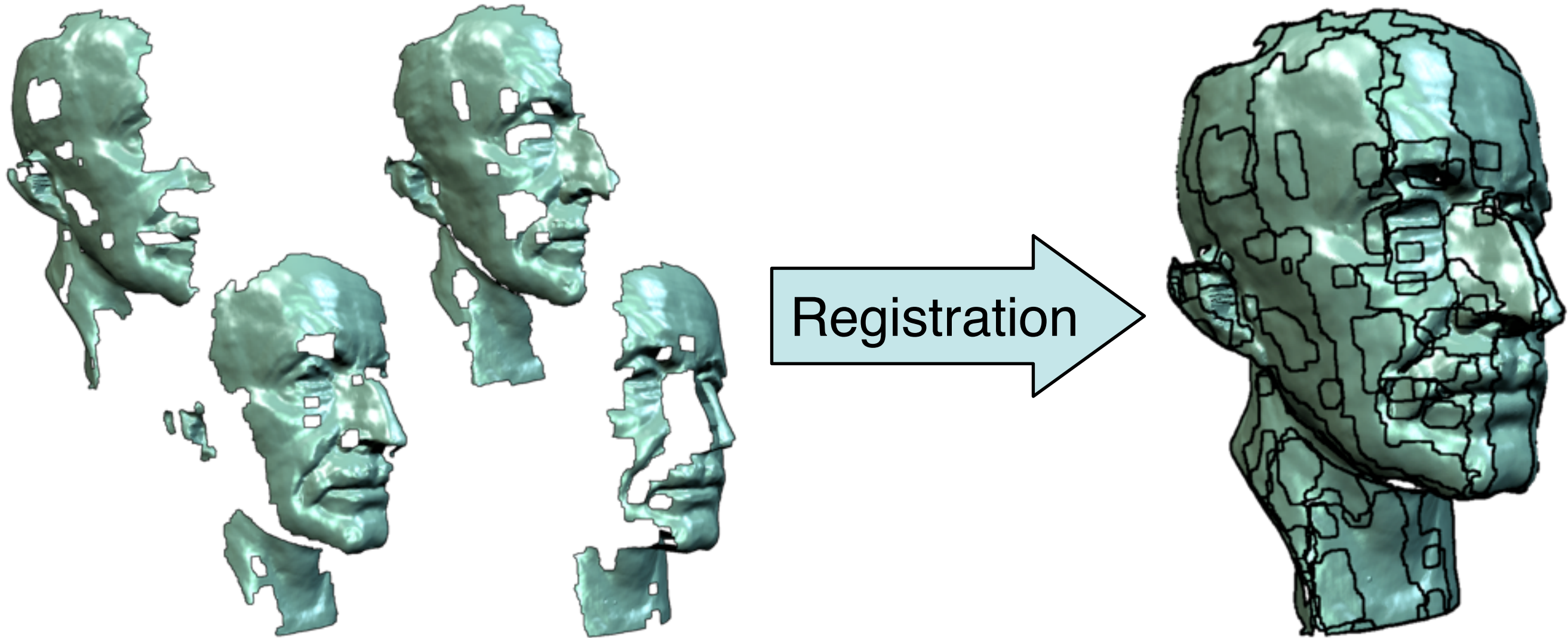
# Model Repair

- **types of input**
- **surface-oriented algorithms**
  - Filling holes in meshes [Liepa 2003]
- **volumetric algorithms**
  - Simplification and repair of polygonal models using volumetric techniques [Nooruddin and Turk 2003]
  - Automatic restoration of polygon models [Bischoff, Pavic, Kobbelt 2005]
- **conclusion & outlook**



# Range Images

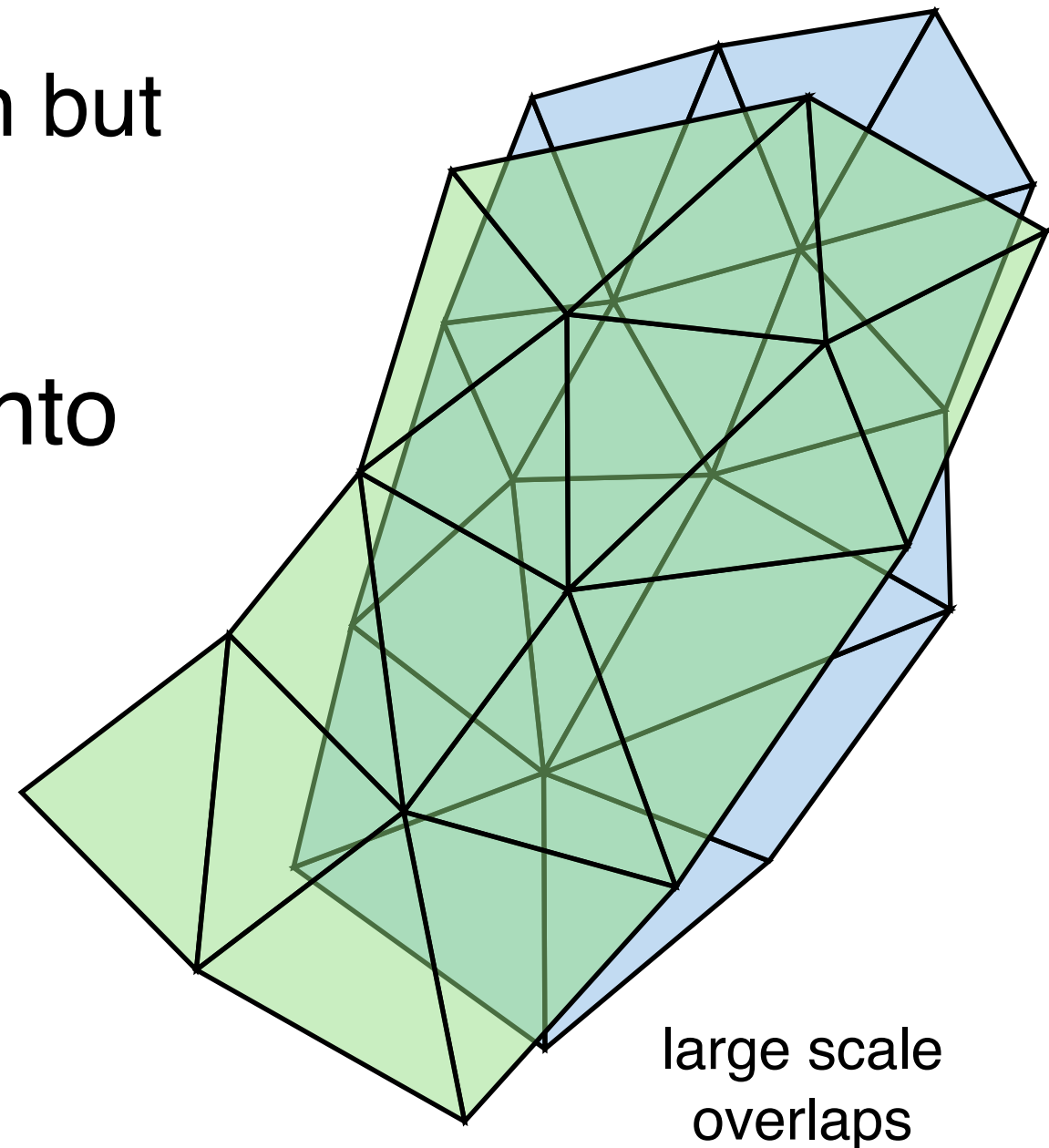
- registered range images are a set of patches that describe different parts of an object.





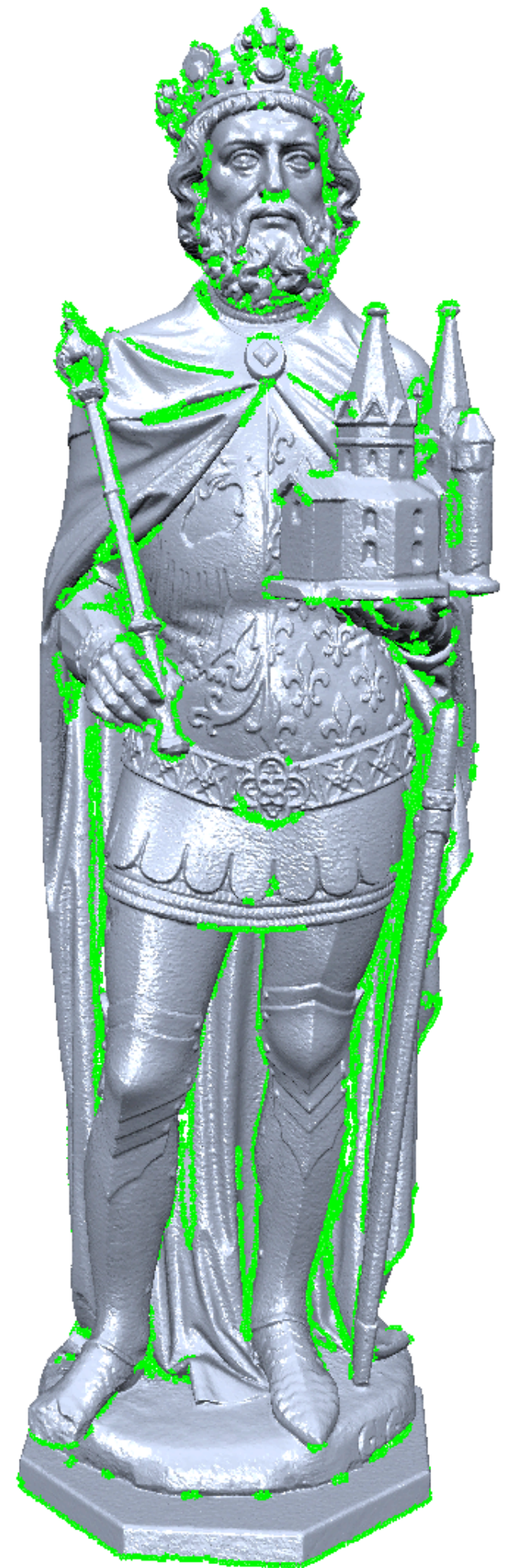
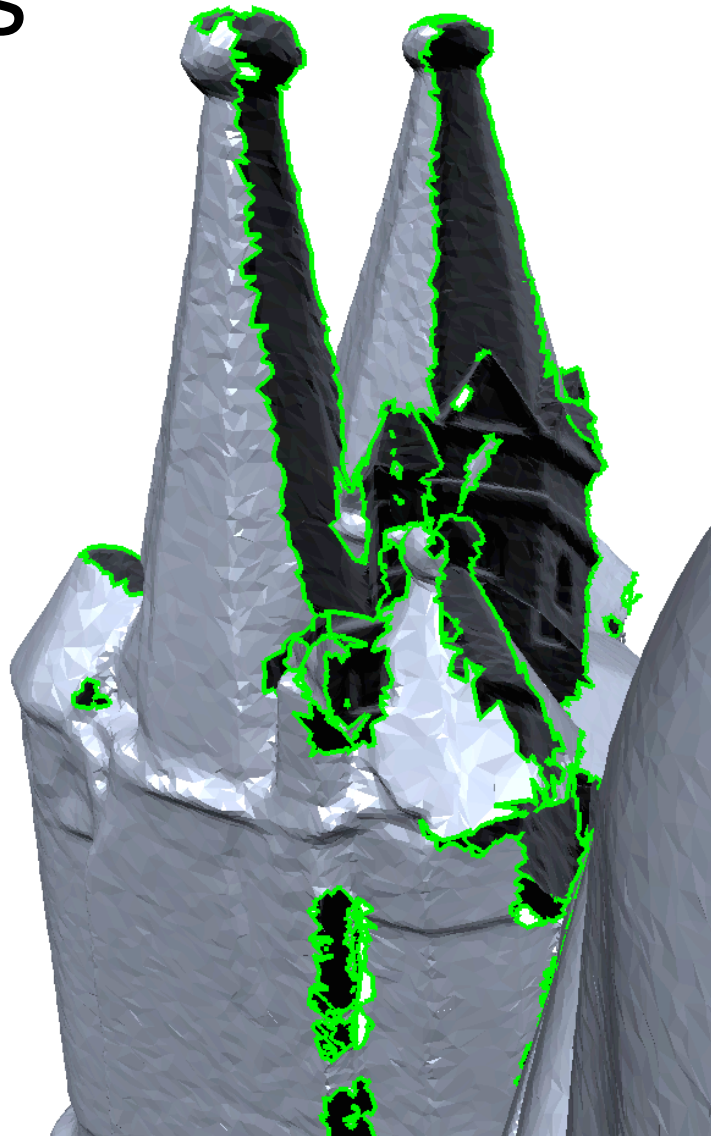
# Range Images

- large areas of overlap are ...
  - ... necessary for registration but
  - ... bad for consistency
- how to merge the patches into a single mesh?
  - inconsistent geometry
  - incompatible connectivities



# Range Images

- successfully merged range images are manifold meshes with holes and islands (i.e. boundaries)

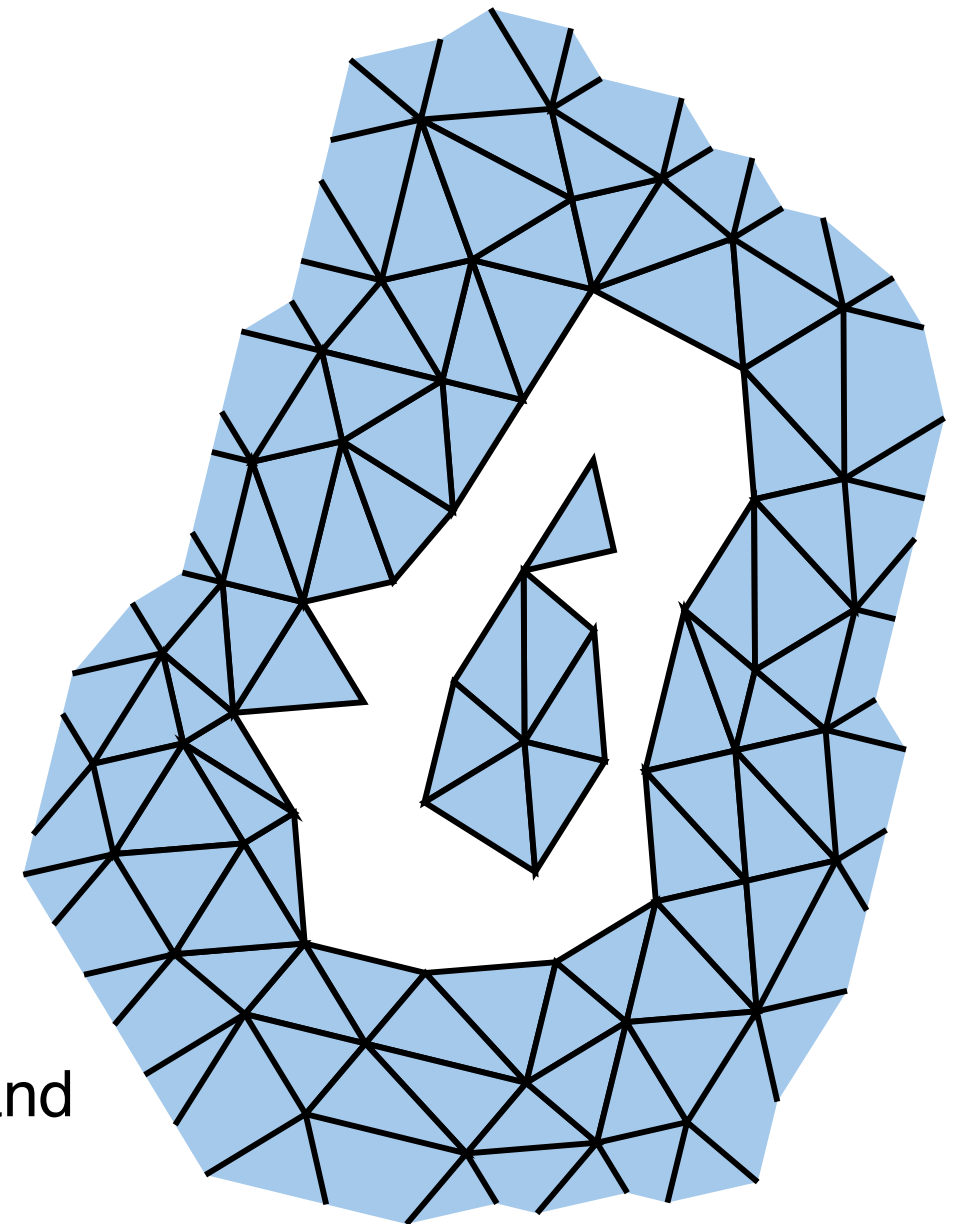


# Range Images

---

- holes and islands are due to obstructions in the line of sight of the scanner
- identify correspondences between holes and islands
- fill holes
  - smoothly
  - geometry transfer/synthesis
- avoid intersections

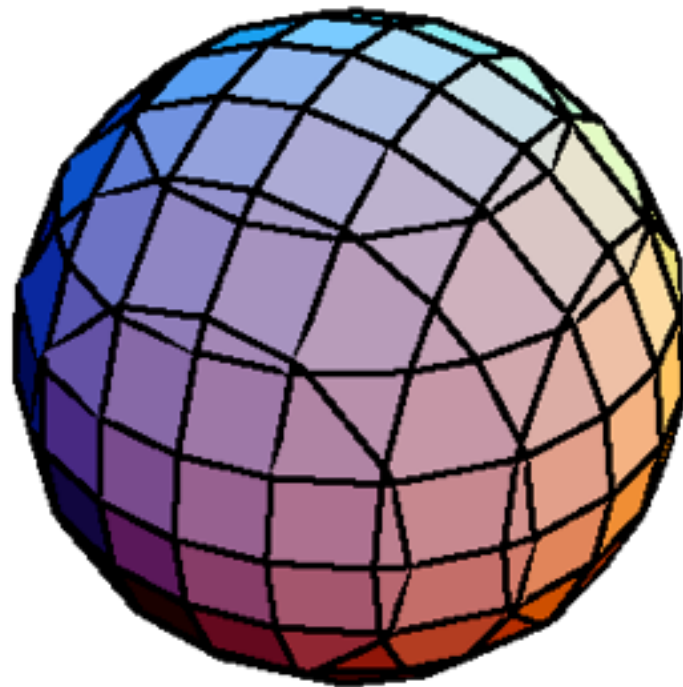
holes and  
isles





# Contoured Meshes

- contoured meshes have been extracted from a volumetric representation (e.g. by marching cubes)

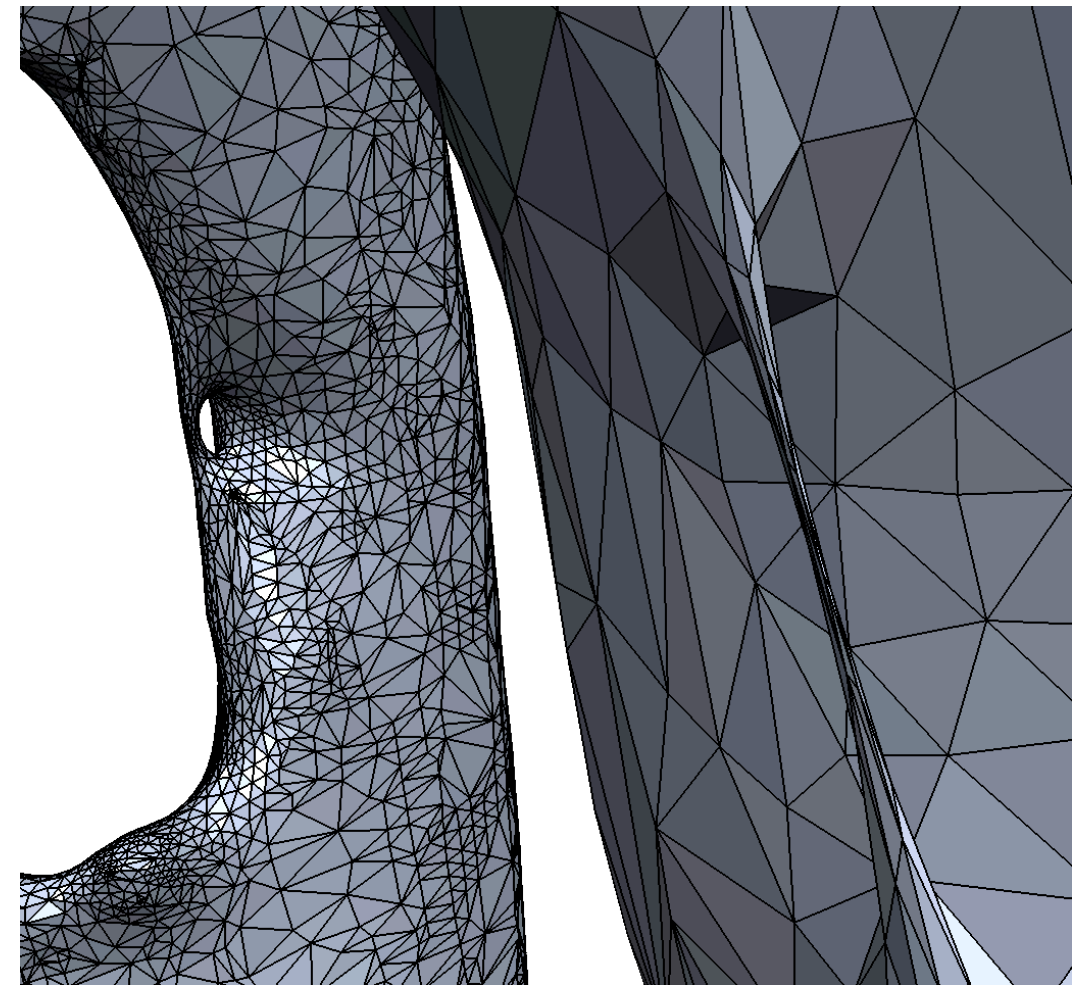
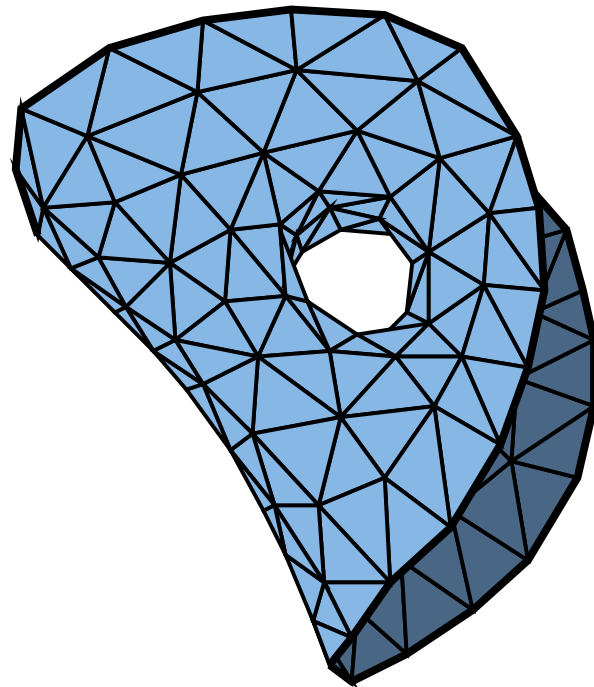




# Contoured Meshes

---

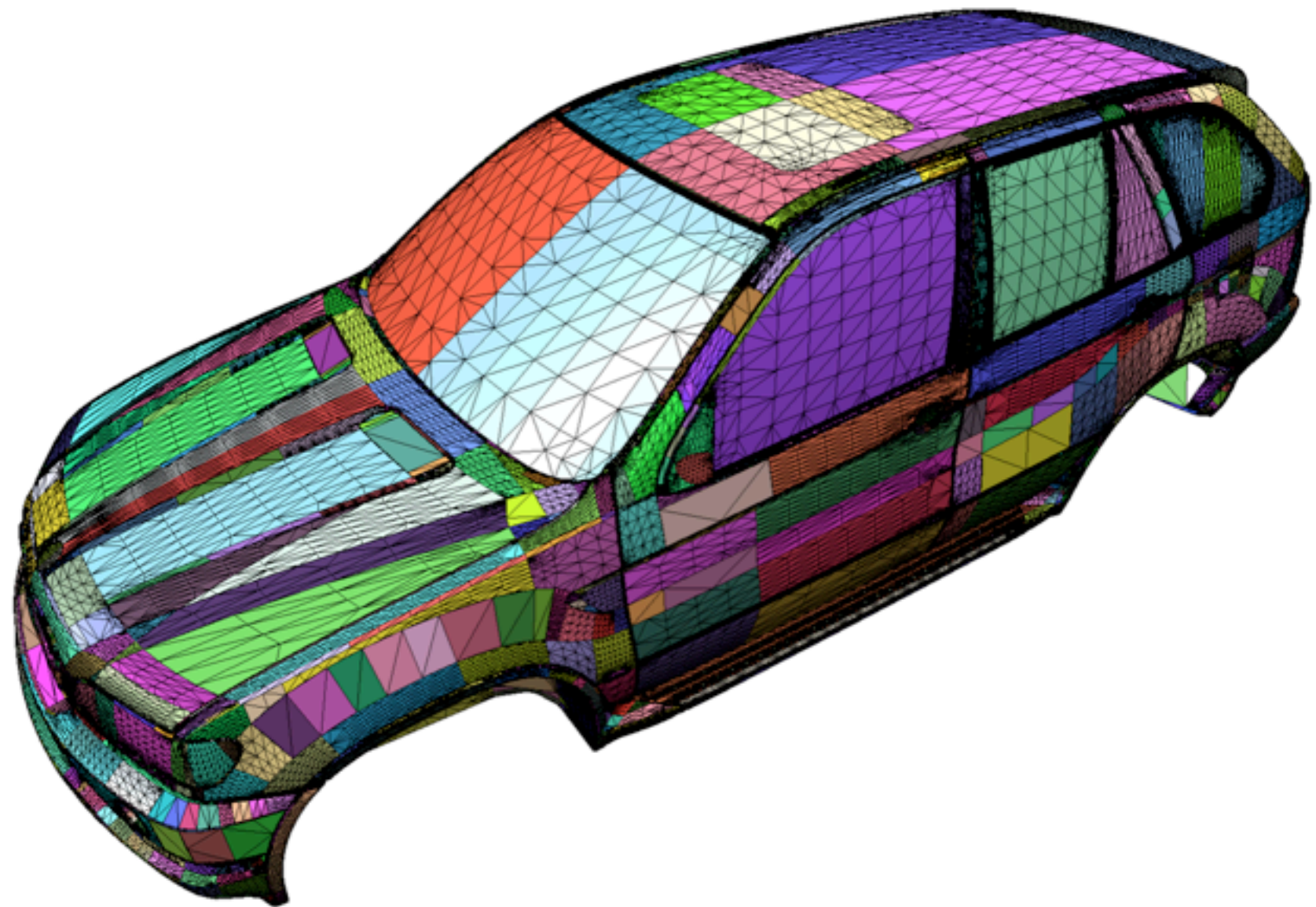
- contoured meshes are usually manifold and closed, but may contain topological noise
  - disconnected components
  - spurious handles
  - cavities



# Triangulated NURBS

---

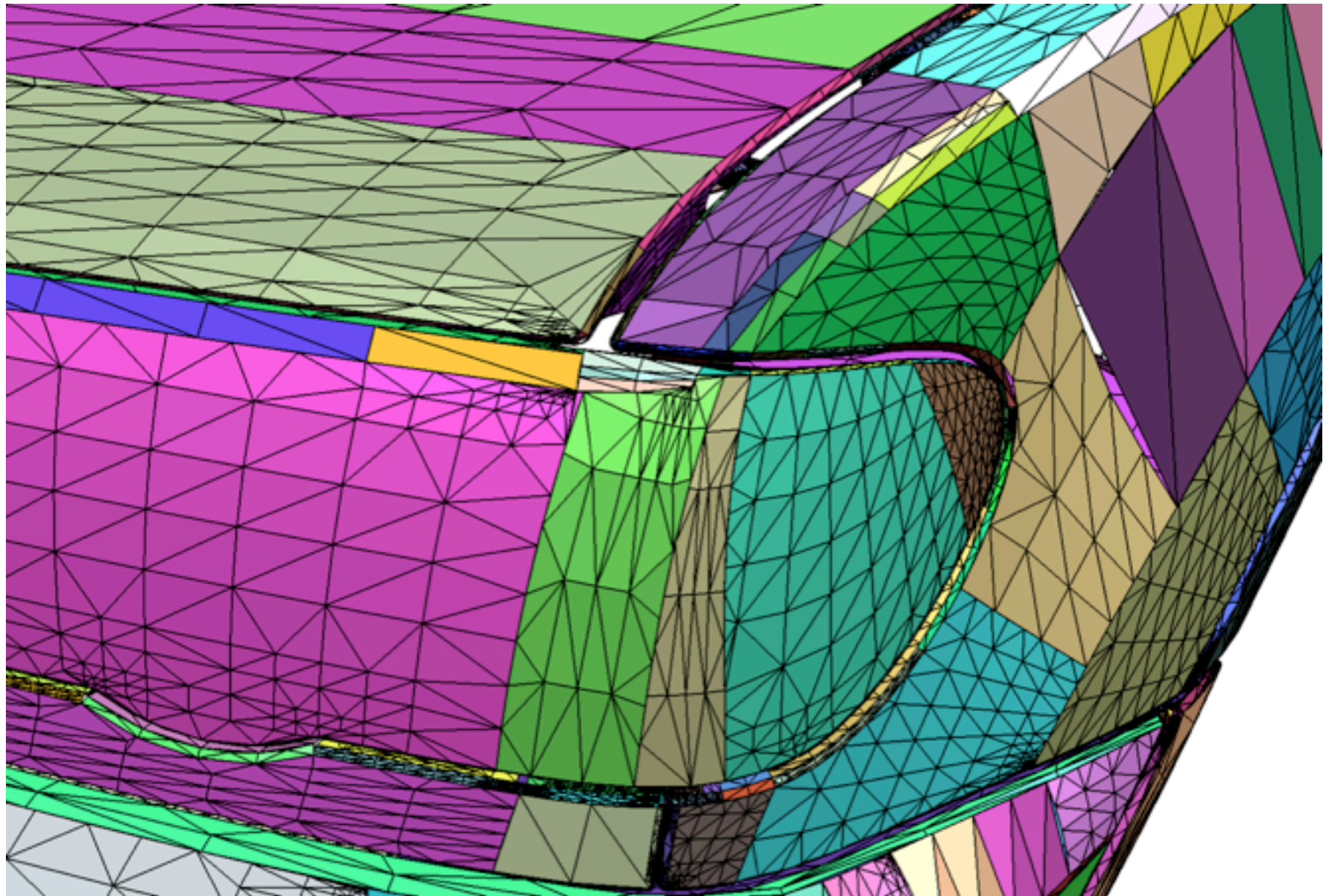
- set of patches that contain small scale gaps and overlaps





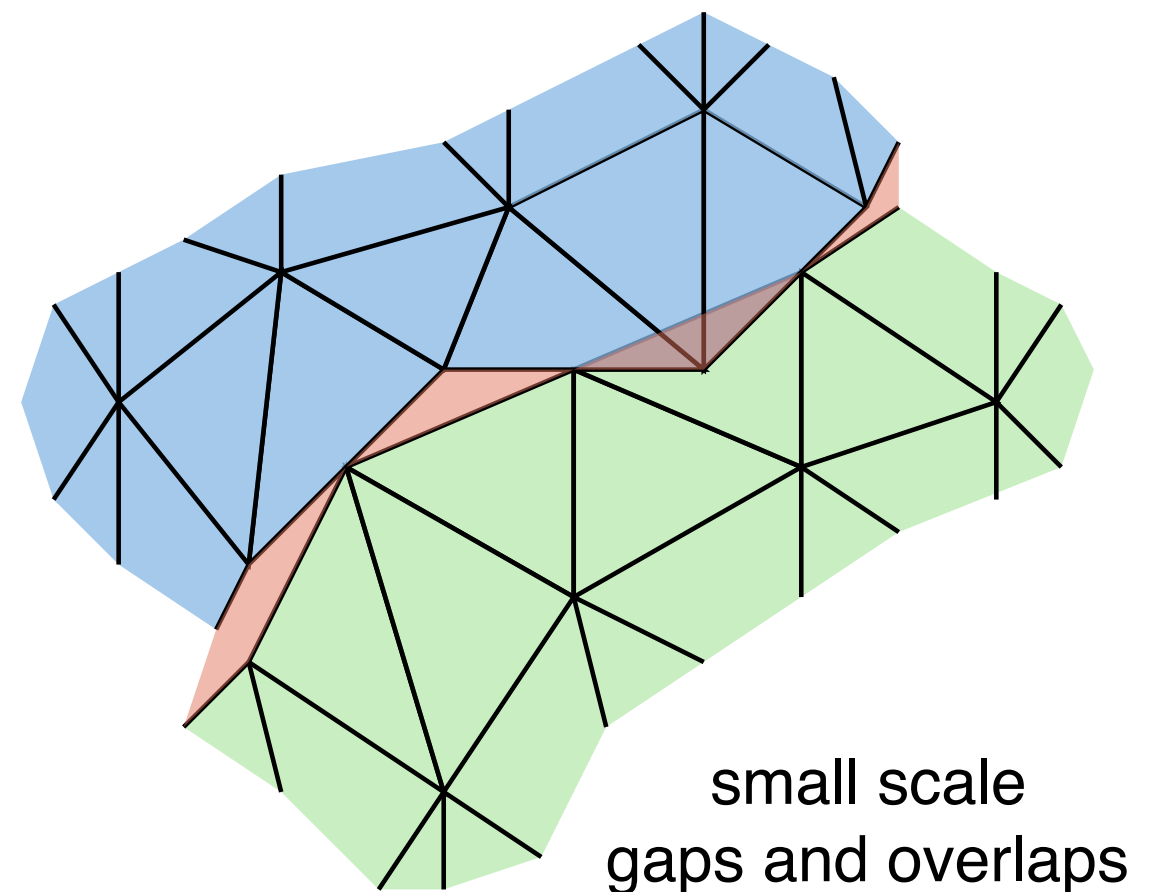
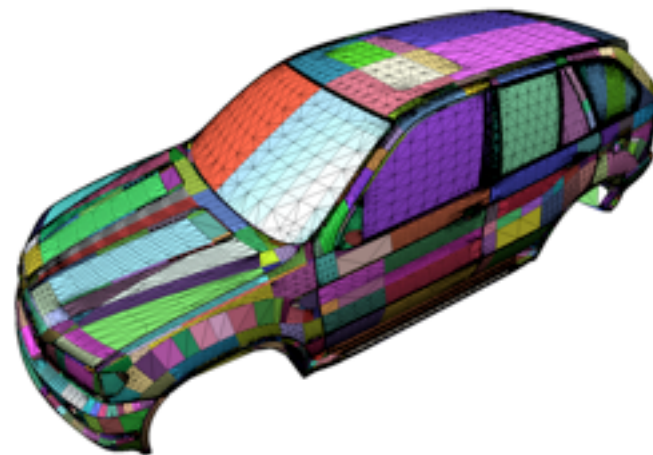
# Triangulated NURBS

- set of patches that contain small scale gaps and overlaps



# Triangulated NURBS

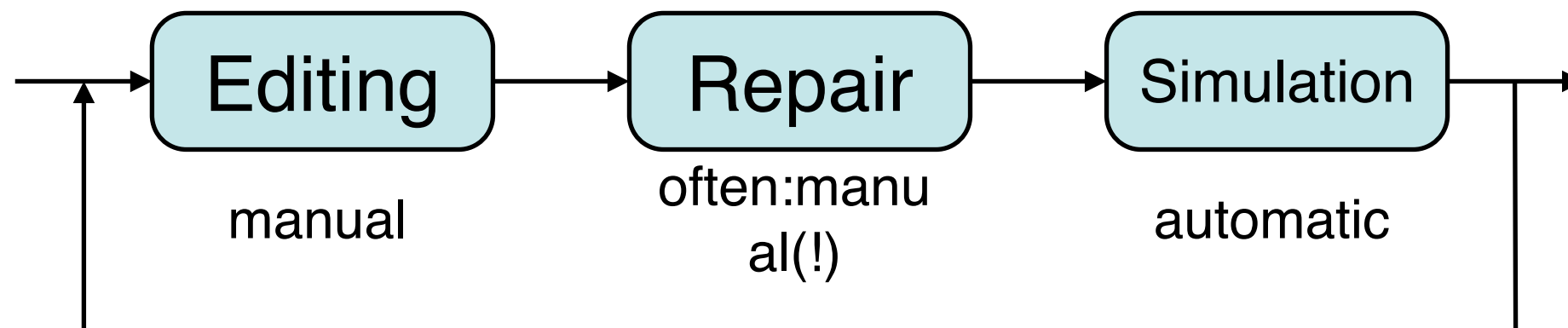
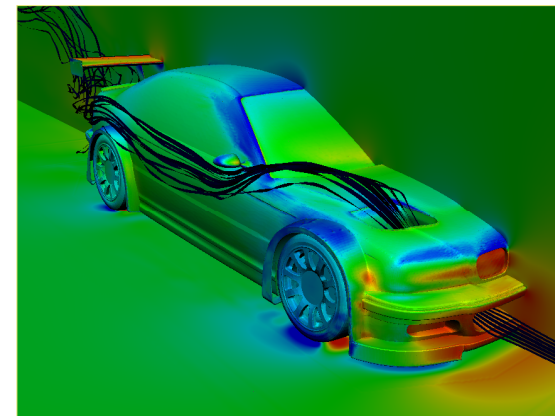
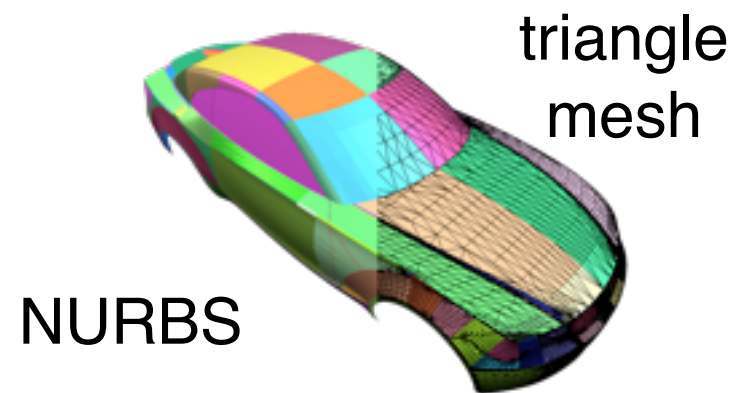
- gaps and overlaps are due to triangulating a common (trimmed) patch boundary differently from both sides
- issues
  - consistent orientation
  - structure preservation





# Triangulated NURBS

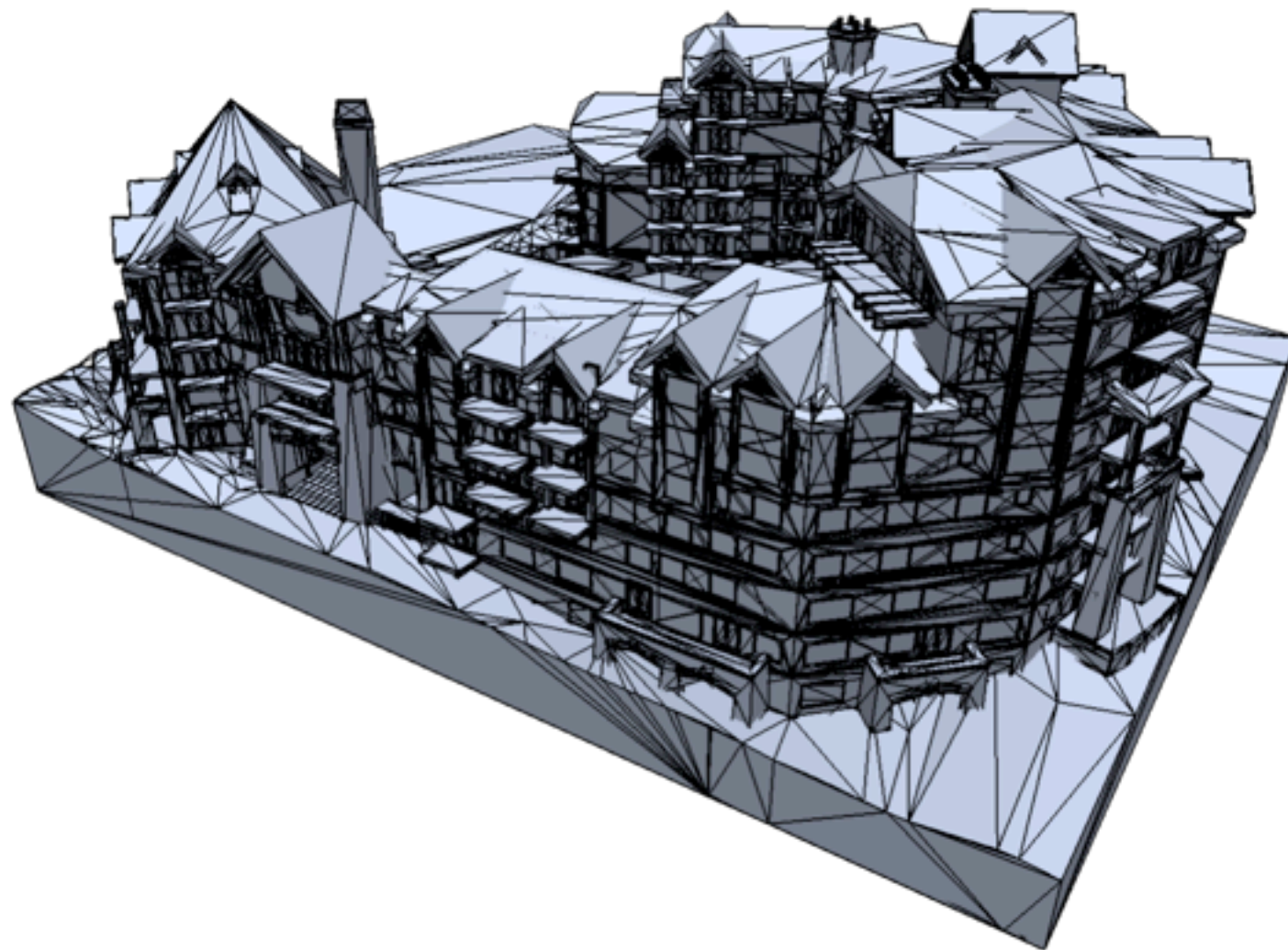
- typical workflow, e.g., in CAD/CAM:



# Triangle Soups

---

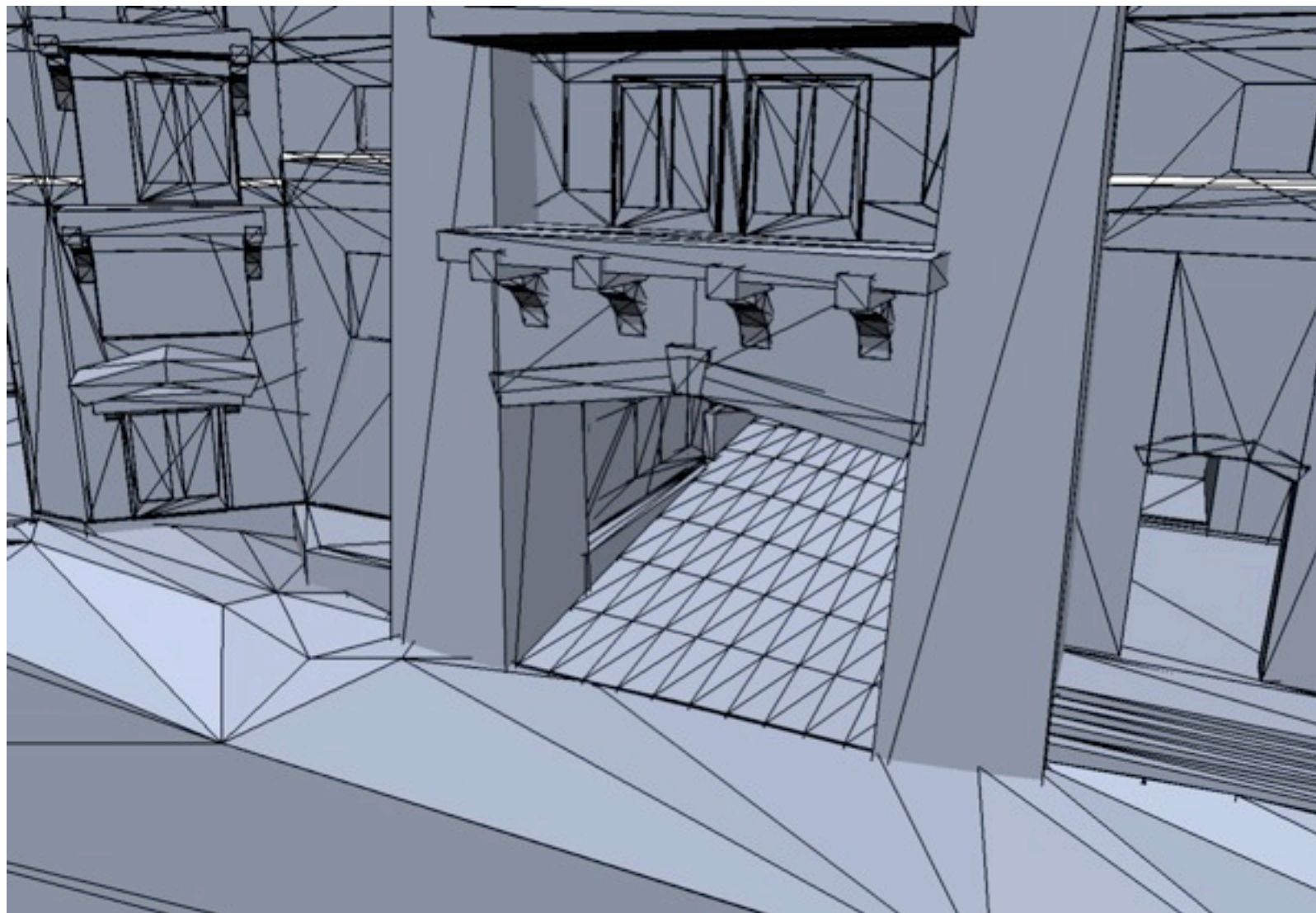
- a triangle soup is a set of triangles without connectivity information



# Triangle Soups

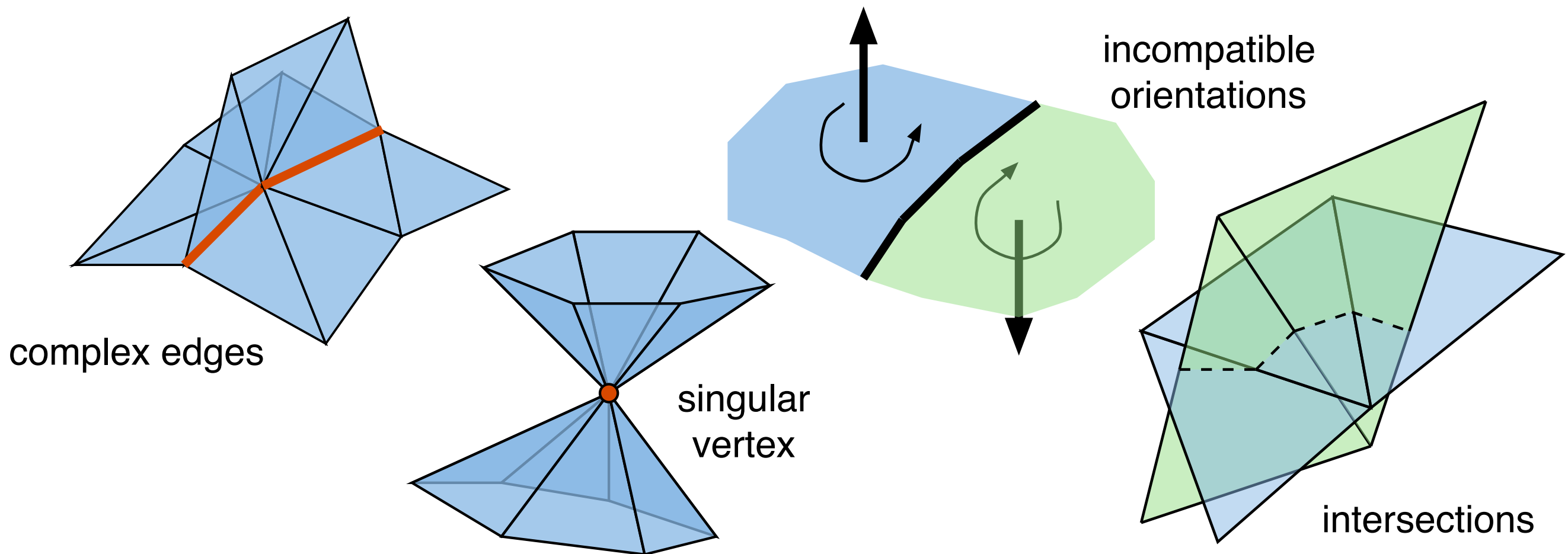
---

- a triangle soup is a set of triangles without connectivity information



# Triangle Soups

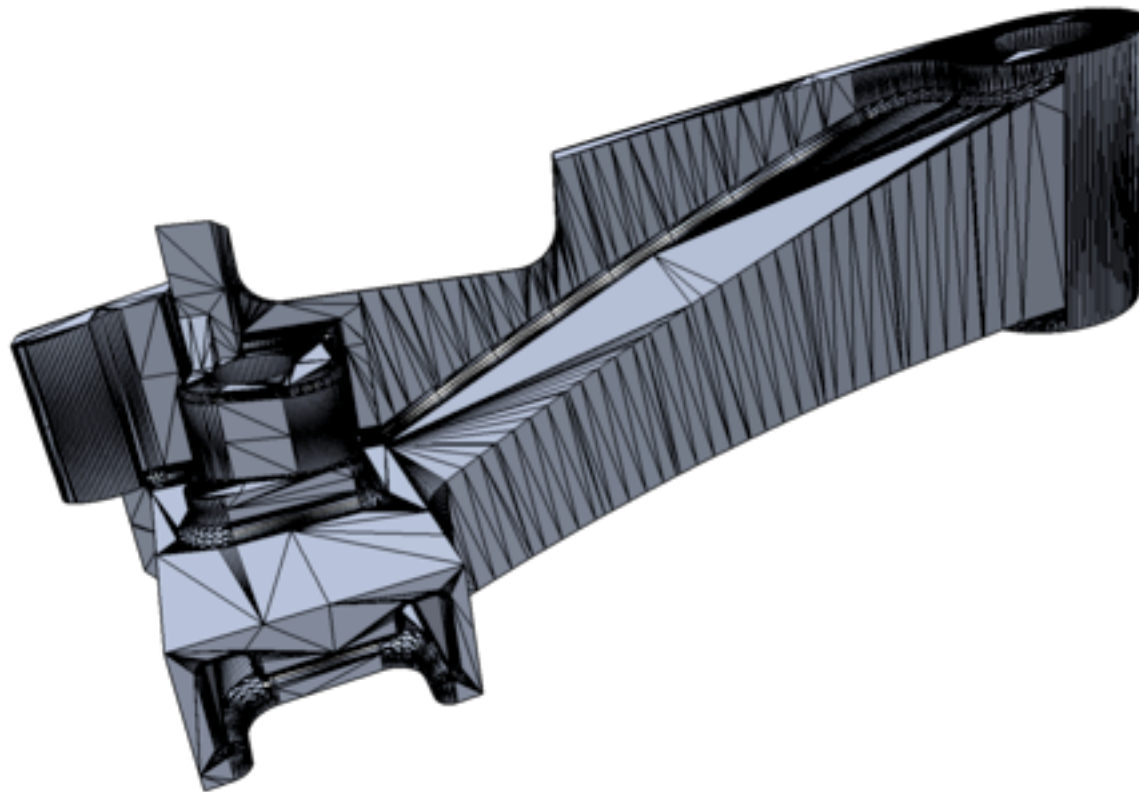
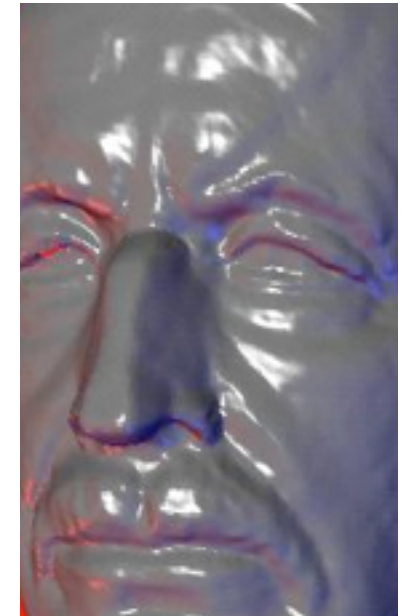
- good for visualization but bad for downstream applications that require manifold meshes
- in addition to the artifacts we already encountered:

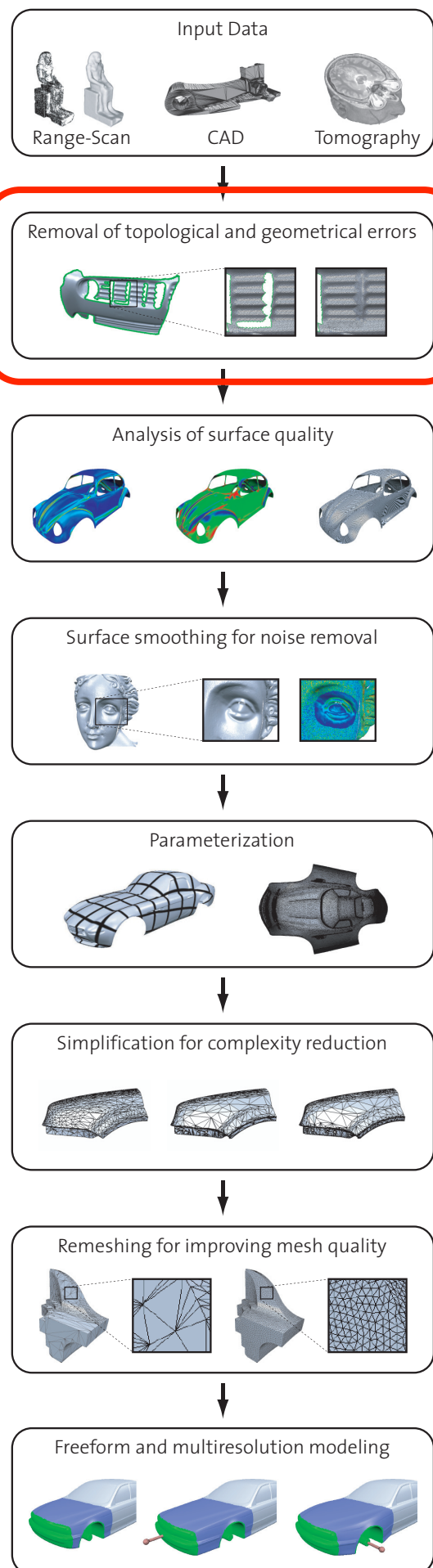




# Not Covered In *This* Lecture ...

- geometrical noise  
→ smoothing (Mark)
- badly meshed manifolds  
→ remeshing (Pierre)





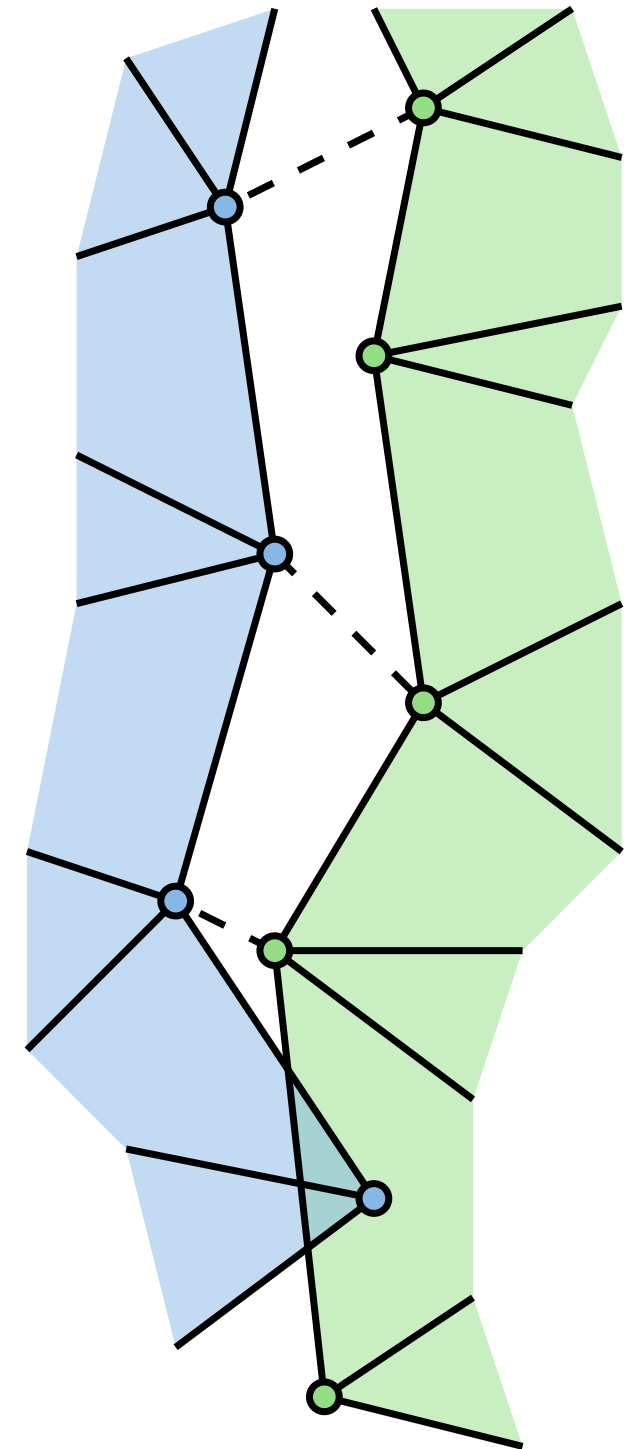
# Model Repair

- types of input
- **surface-oriented algorithms**
  - Filling holes in meshes [Liepa 2003]
- **volumetric algorithms**
  - Simplification and repair of polygonal models using volumetric techniques [Nooruddin and Turk 2003]
  - Automatic restoration of polygon models [Bischoff, Pavic, Kobbelt 2005]
- **conclusion & outlook**



# Surface-Oriented Algorithms

- surface oriented approaches explicitly identify and resolve artifacts
- methods
  - snapping
  - splitting
  - stitching
  - ...



# Surface-Oriented Algorithms

---

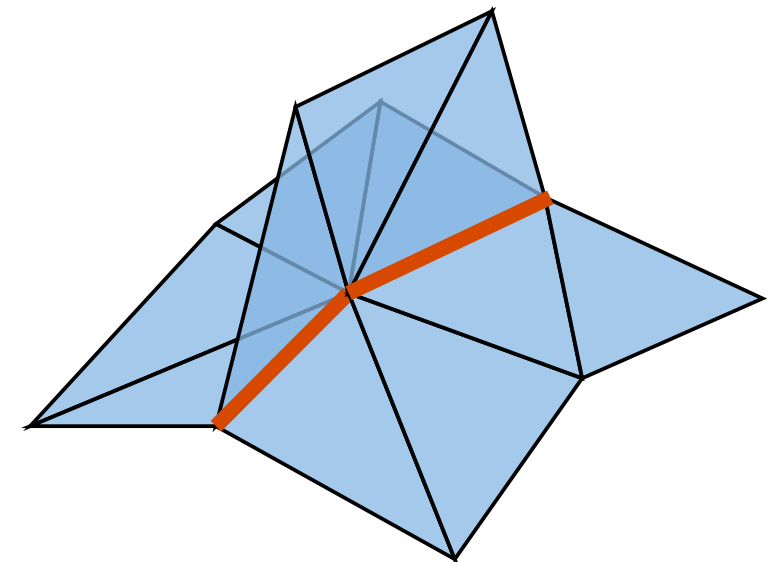
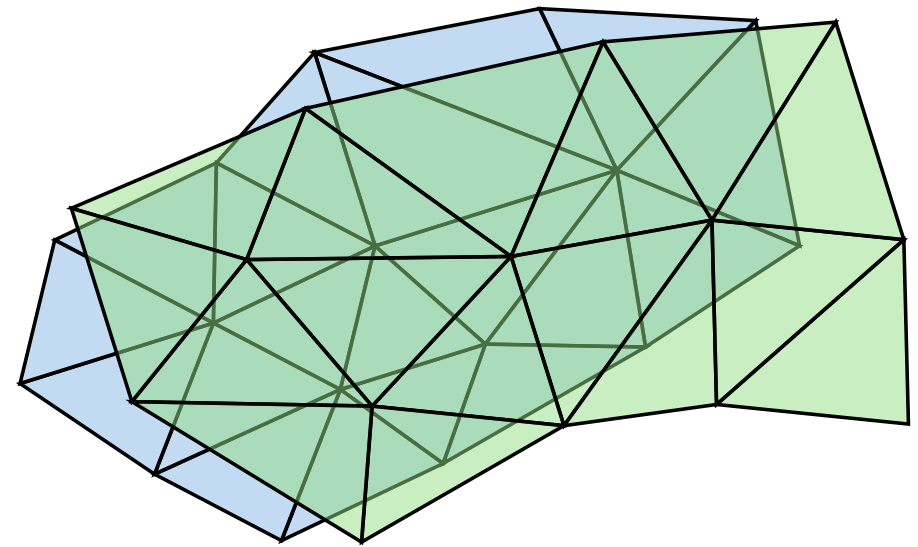
- advantages
  - fast
  - conceptually easy
  - memory friendly
  - structure preserving, minimal modification of the input



# Surface-Oriented Algorithms

---

- problems
  - not robust
    - numerical issues
    - inherent non-robustness
  - no quality guarantees on the output



# Example Algorithm

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- algorithm for filling holes

Peter Liepa

Filling Holes in Meshes

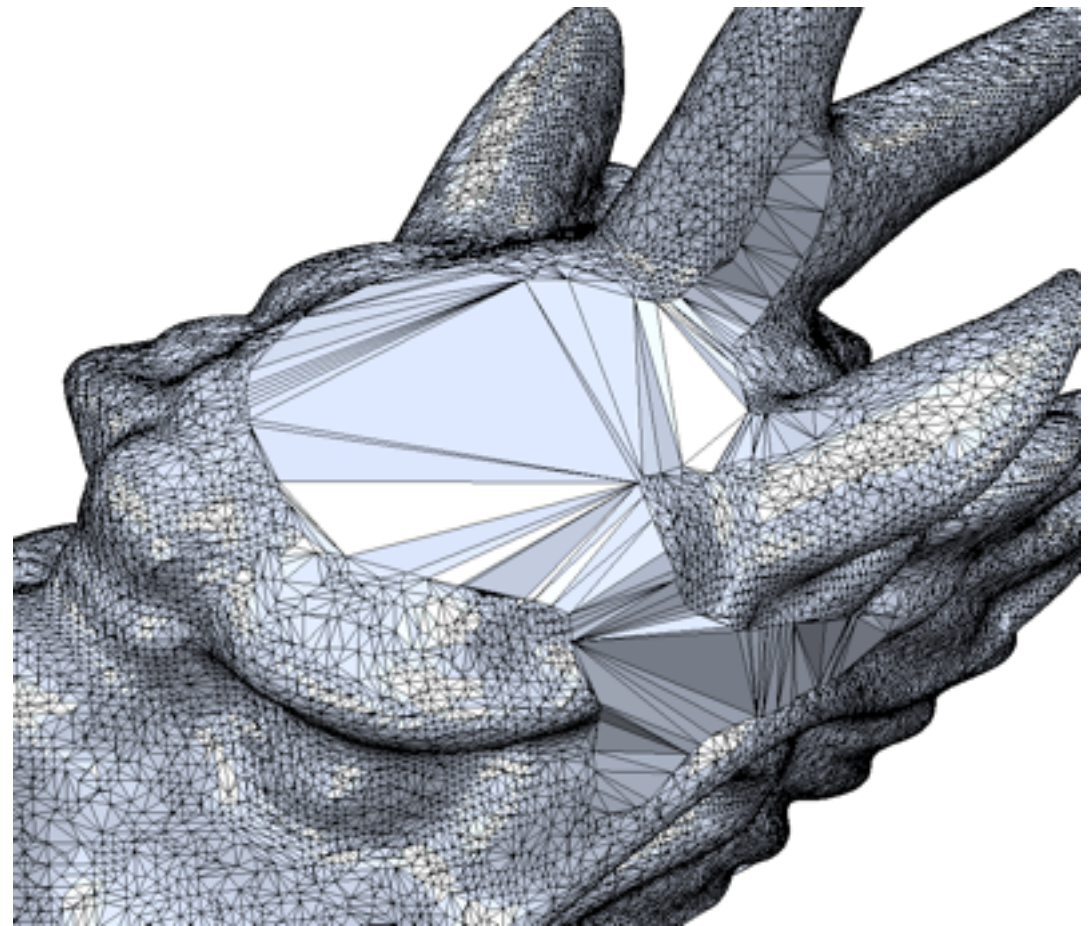
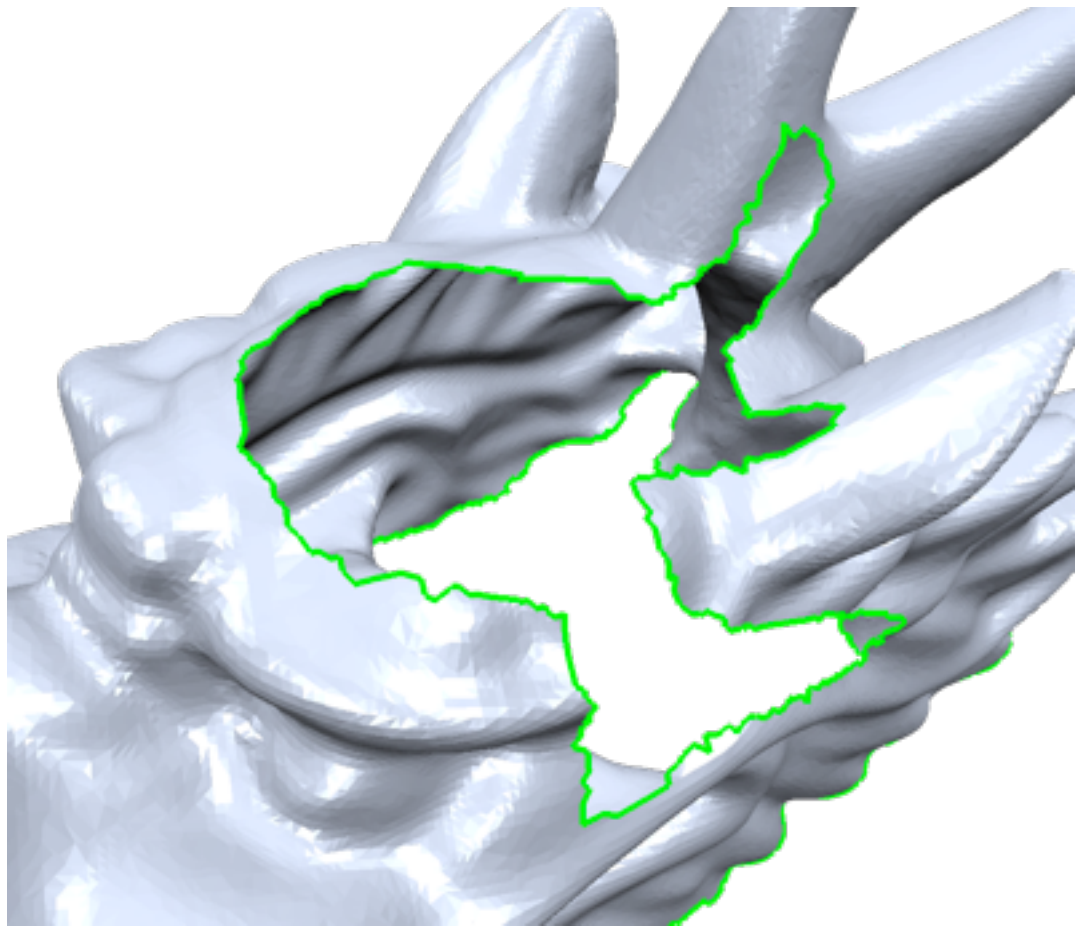
In Proc. Symposium on Geometry Processing 2003

- three stages

1. compute a coarse triangulation  $T$  to fill a hole
2. refine the triangulation,  $T \rightarrow T'$ , to match the vertex densities of the surrounding area
3. smooth the triangulation  $T'$  to match the geometry of the surrounding

# Filling Holes in Meshes - 1

- compute a coarse triangulation  $T$

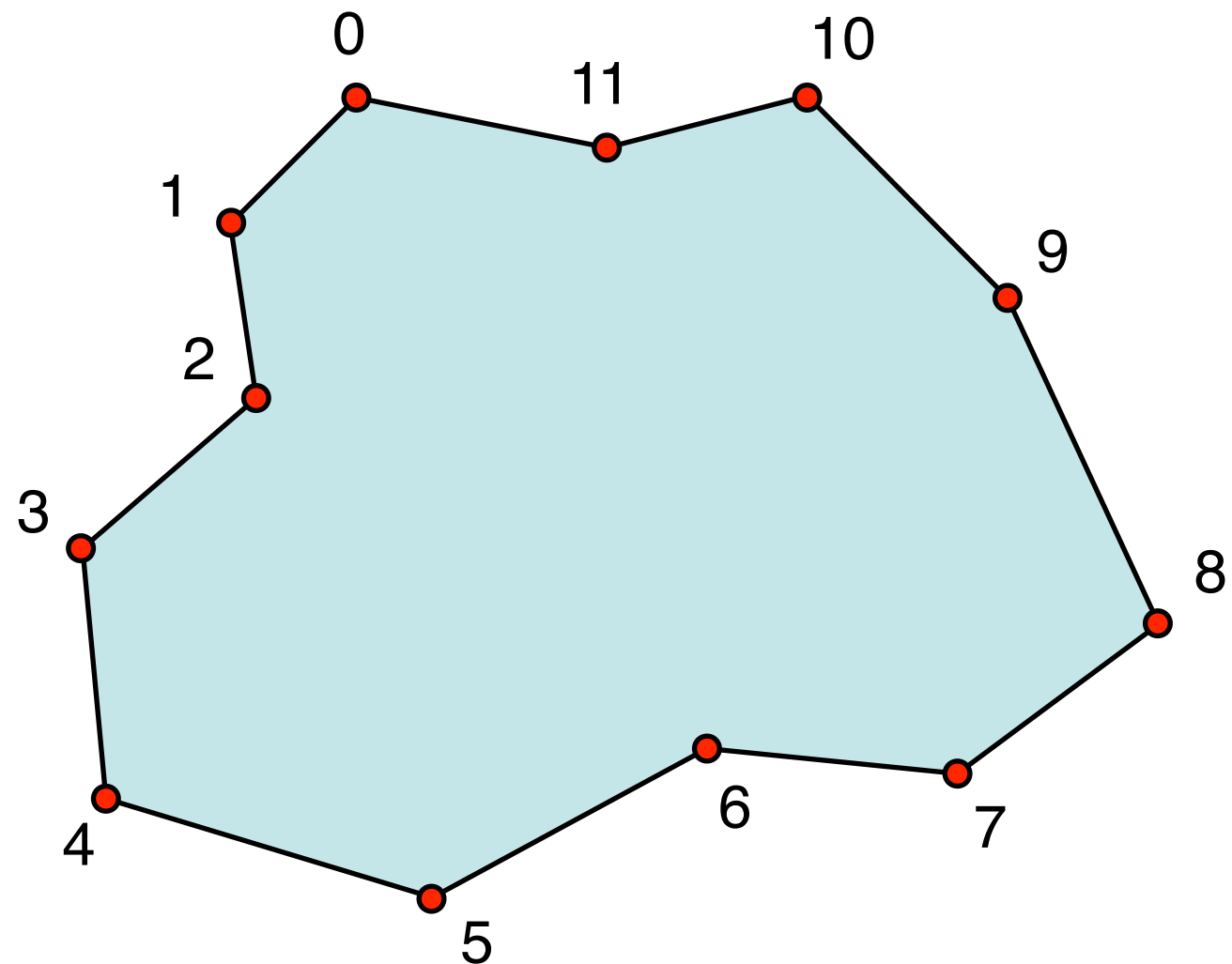




# Filling Holes in Meshes - 1

- compute a coarse triangulation  $T$  of minimal weight  $w(T)$

$n$  vertices,  
 $n-2$  triangles

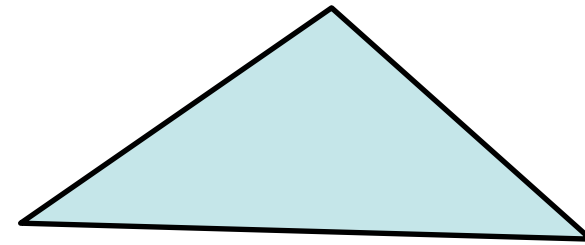


# Filling Holes in Meshes - 1

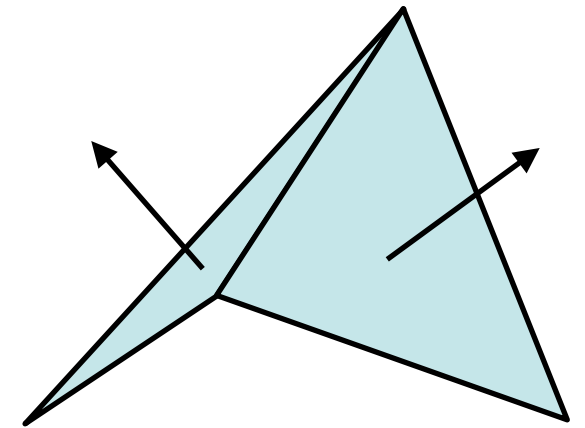
---

- weight  $w(T)$  is a mixture of

- $\text{area}(T) = \sum_{\Delta \in T} \text{area}(\Delta)$



- maximum dihedral angle in  $T$

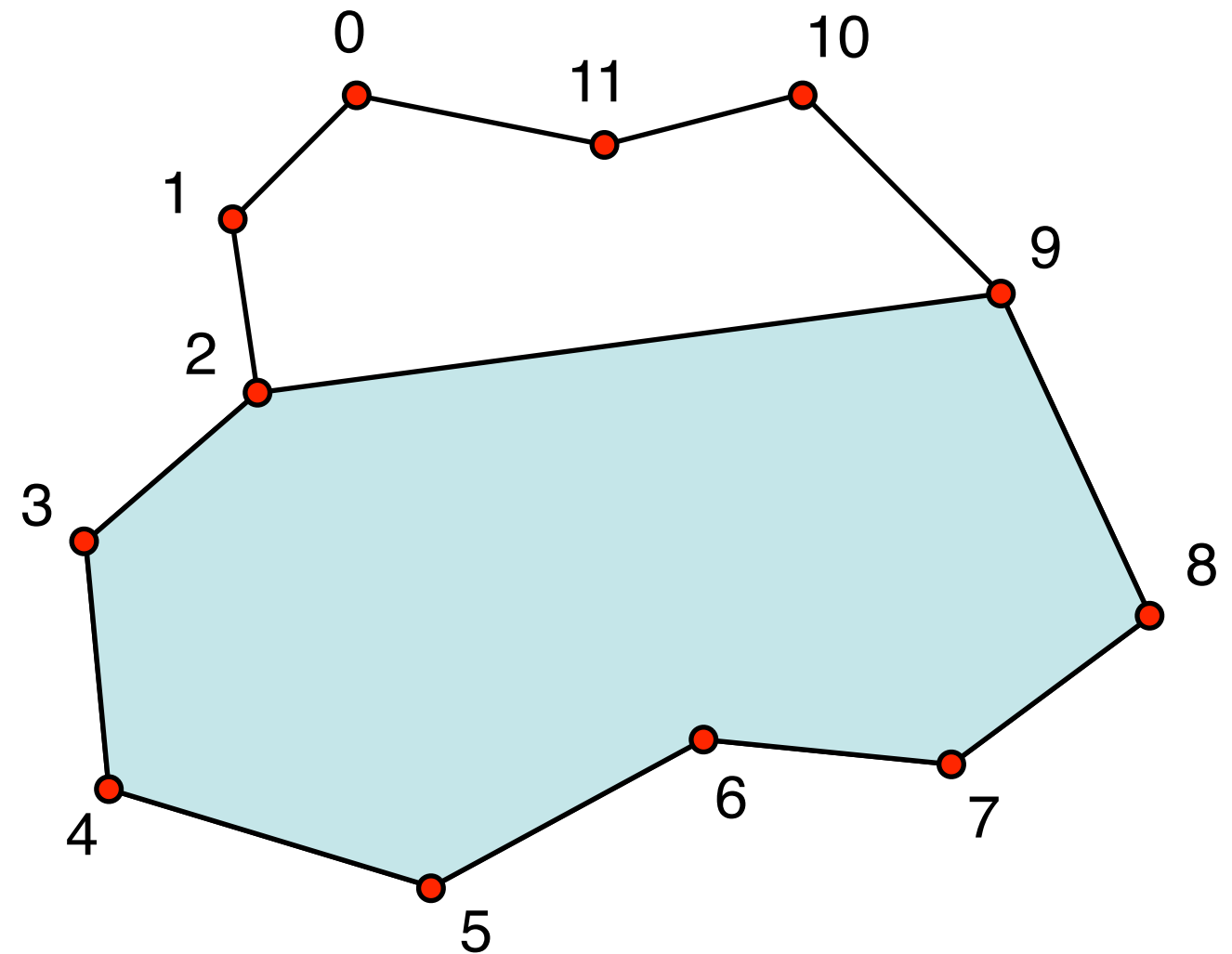


- thus, we favour triangulations of low area and low normal variation

# Filling Holes in Meshes - 1

- let  $w[a,c]$  be the minimal weight that can be achieved in triangulating the polygon  $a, a+1, \dots, c$

$w[2,9] = ?$

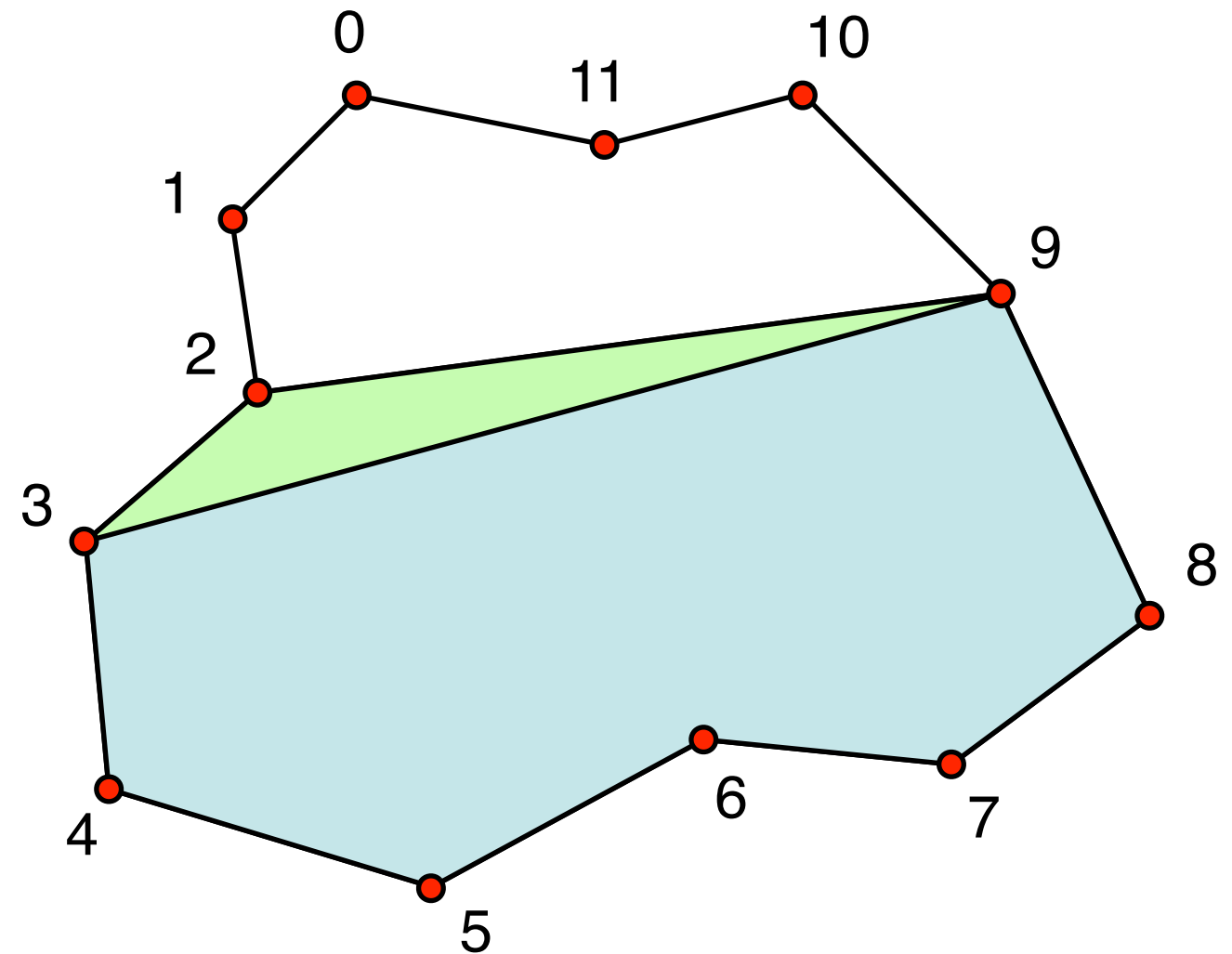




# Filling Holes in Meshes - 1

- let  $w[a,c]$  be the minimal weight that can be achieved in triangulating the polygon  $a, a+1, \dots, c$

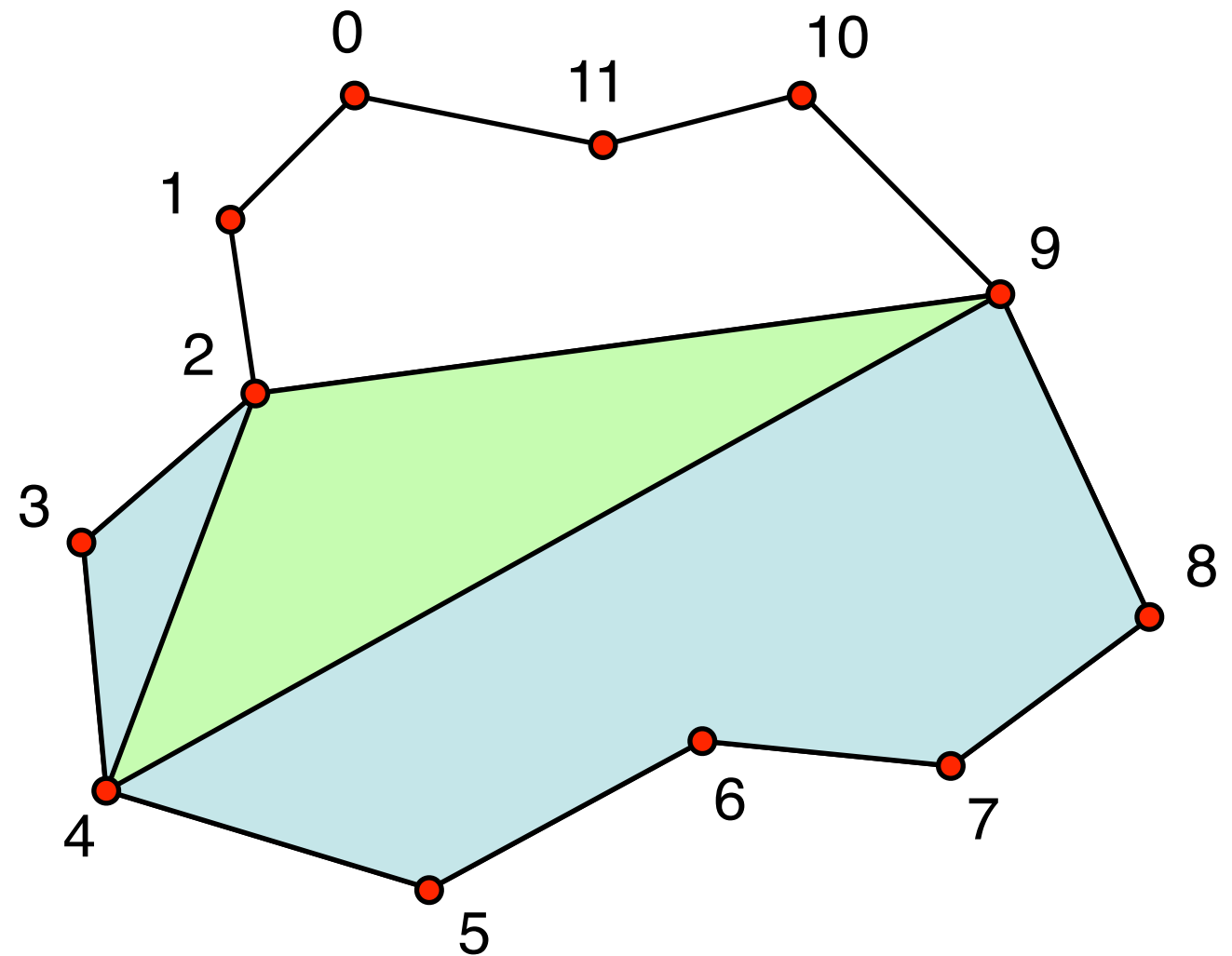
$$w[2,9] = \min(w(\Delta(2,3,9)) + w[3,9],$$



# Filling Holes in Meshes - 1

- let  $w[a,c]$  be the minimal weight that can be achieved in triangulating the polygon  $a, a+1, \dots, c$

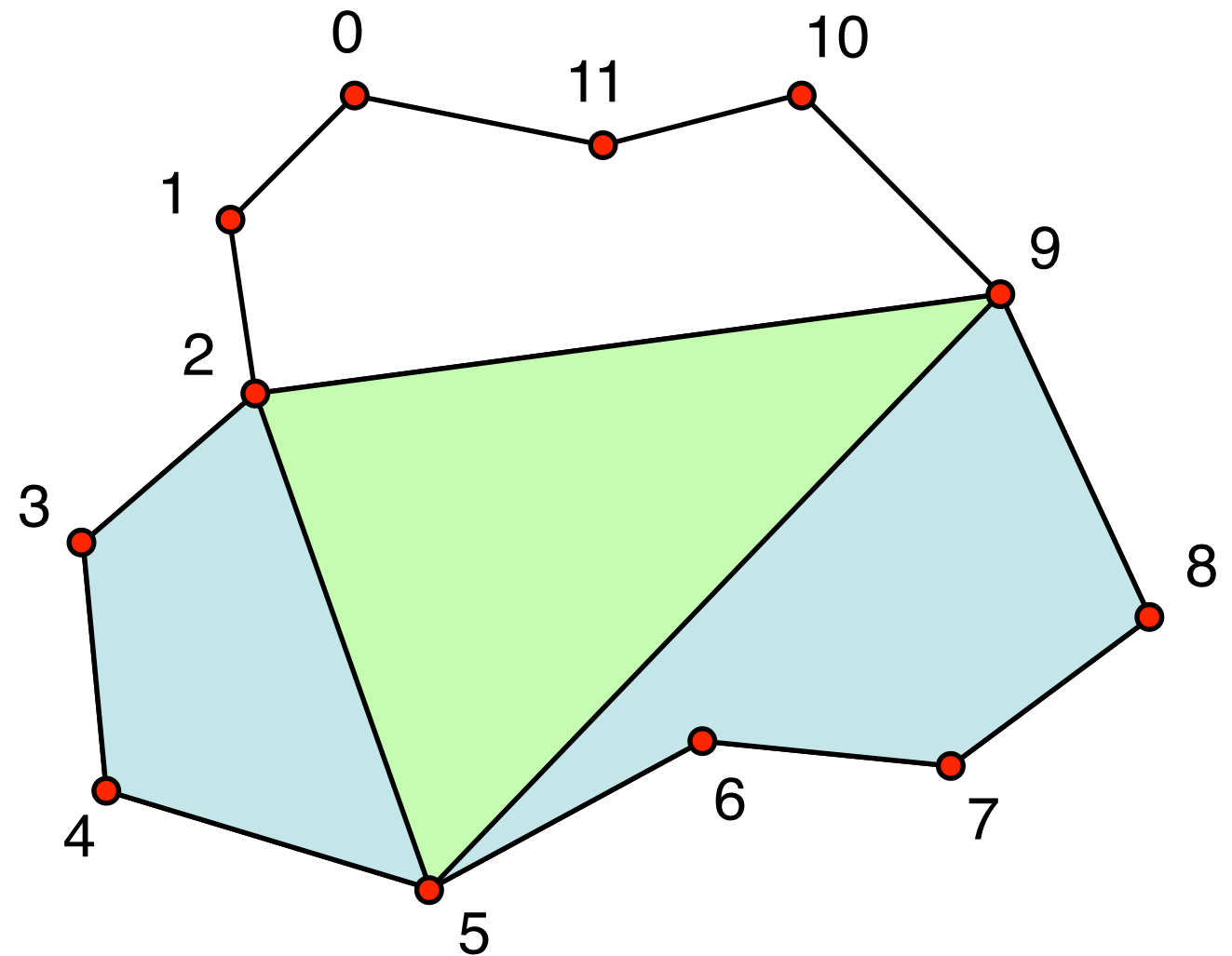
$$w[2,9] = \min(\begin{aligned} &w(\Delta(2,3,9)) + w[3,9], \\ &w[2,4] + w(\Delta(2,4,9)) + w[4,9], \end{aligned})$$



# Filling Holes in Meshes - 1

- let  $w[a,c]$  be the minimal weight that can be achieved in triangulating the polygon  $a, a+1, \dots, c$

$$w[2,9] = \min(\begin{aligned} &w(\Delta(2,3,9)) + w[3,9], \\ &w[2,4] + w(\Delta(2,4,9)) + w[4,9], \\ &w[2,5] + w(\Delta(2,5,9)) + w[5,9], \end{aligned})$$

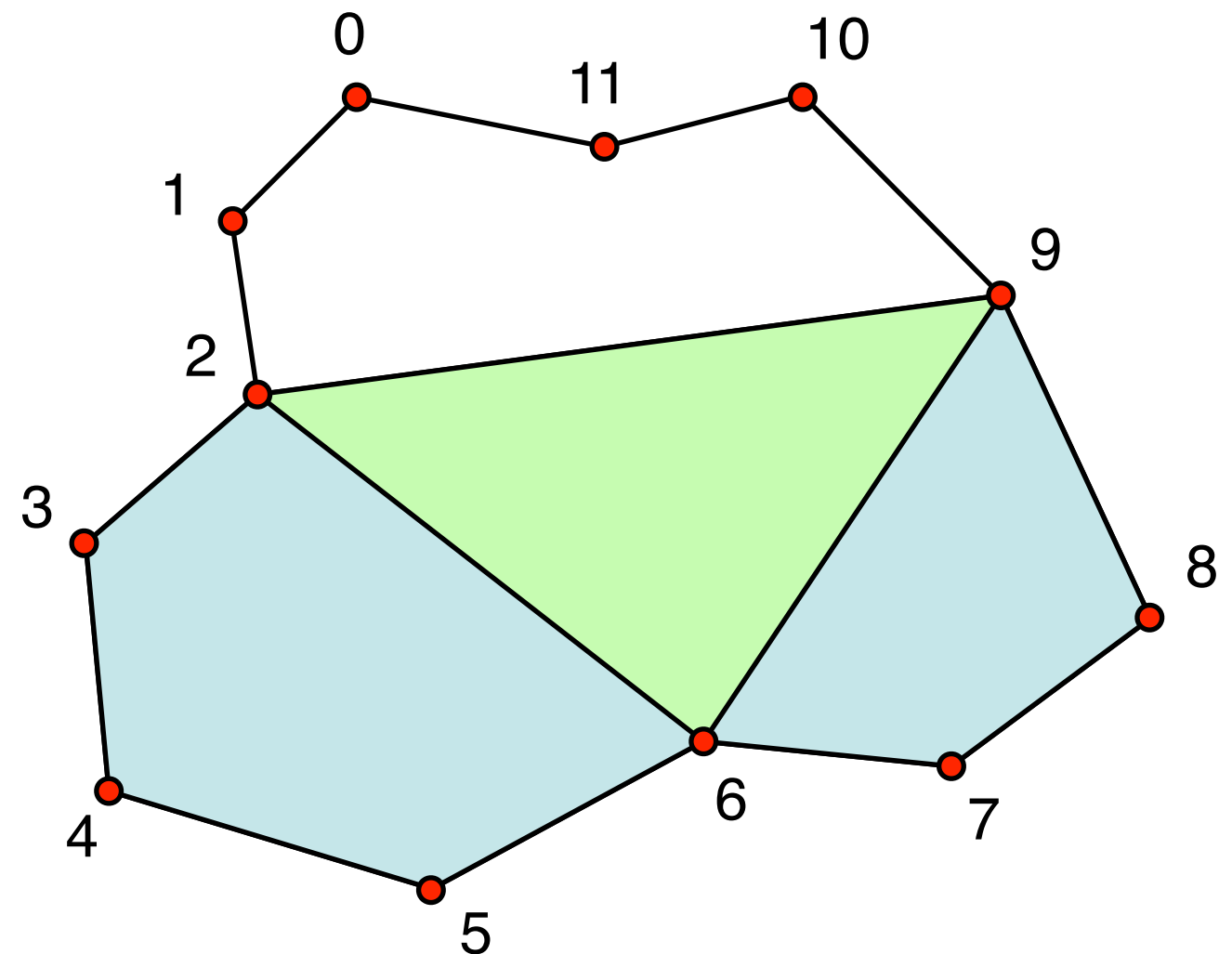




# Filling Holes in Meshes - 1

- let  $w[a,c]$  be the minimal weight that can be achieved in triangulating the polygon  $a, a+1, \dots, c$

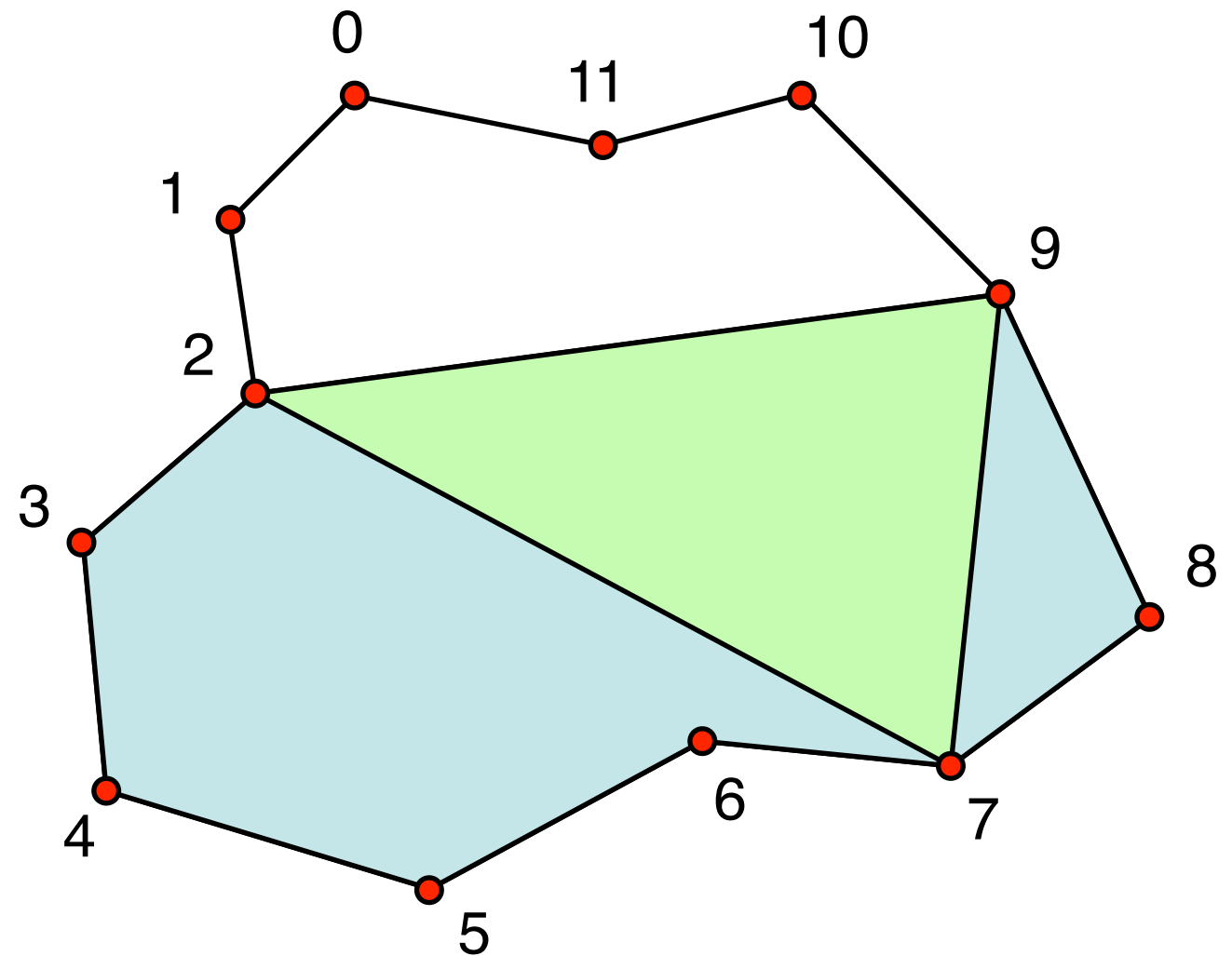
$$w[2,9] = \min(\begin{aligned} &w(\Delta(2,3,9)) + w[3,9], \\ &w[2,4] + w(\Delta(2,4,9)) + w[4,9], \\ &w[2,5] + w(\Delta(2,5,9)) + w[5,9], \\ &w[2,6] + w(\Delta(2,6,9)) + w[6,9], \end{aligned})$$



# Filling Holes in Meshes - 1

- let  $w[a,c]$  be the minimal weight that can be achieved in triangulating the polygon  $a, a+1, \dots, c$

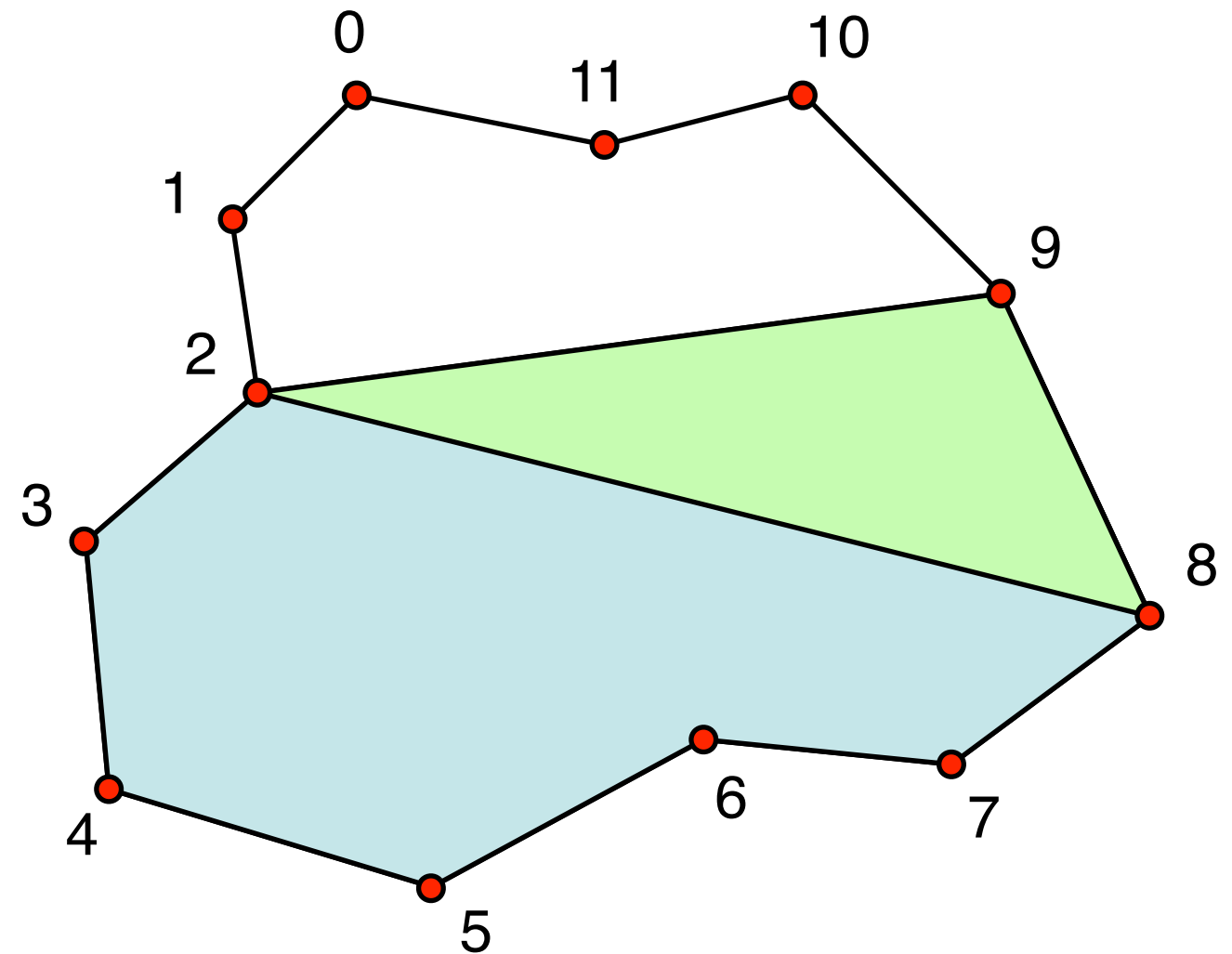
$$w[2,9] = \min(\begin{aligned} &w(\Delta(2,3,9)) + w[3,9], \\ &w[2,4] + w(\Delta(2,4,9)) + w[4,9], \\ &w[2,5] + w(\Delta(2,5,9)) + w[5,9], \\ &w[2,6] + w(\Delta(2,6,9)) + w[6,9], \\ &w[2,7] + w(\Delta(2,7,9)) + w[7,9], \end{aligned})$$



# Filling Holes in Meshes - 1

- let  $w[a,c]$  be the minimal weight that can be achieved in triangulating the polygon  $a, a+1, \dots, c$

$$w[2,9] = \min(\begin{aligned} &w(\Delta(2,3,9)) + w[3,9], \\ &w[2,4] + w(\Delta(2,4,9)) + w[4,9], \\ &w[2,5] + w(\Delta(2,5,9)) + w[5,9], \\ &w[2,6] + w(\Delta(2,6,9)) + w[6,9], \\ &w[2,7] + w(\Delta(2,7,9)) + w[7,9], \\ &w[2,8] + w(\Delta(2,8,9)) \end{aligned})$$





# Filling Holes in Meshes - 1

---

- let  $w[a,c]$  be the minimal weight that can be achieved in triangulating the polygon  $a, a+1, \dots, c$
- recursion formula

$$w[a,c] = \min_{a < b < c} w[a,b] + w(\Delta(a,b,c)) + w[b,c]$$

$$w[x, x+1] = 0$$

- dynamic programming leads to an  $O(n^3)$  algorithm

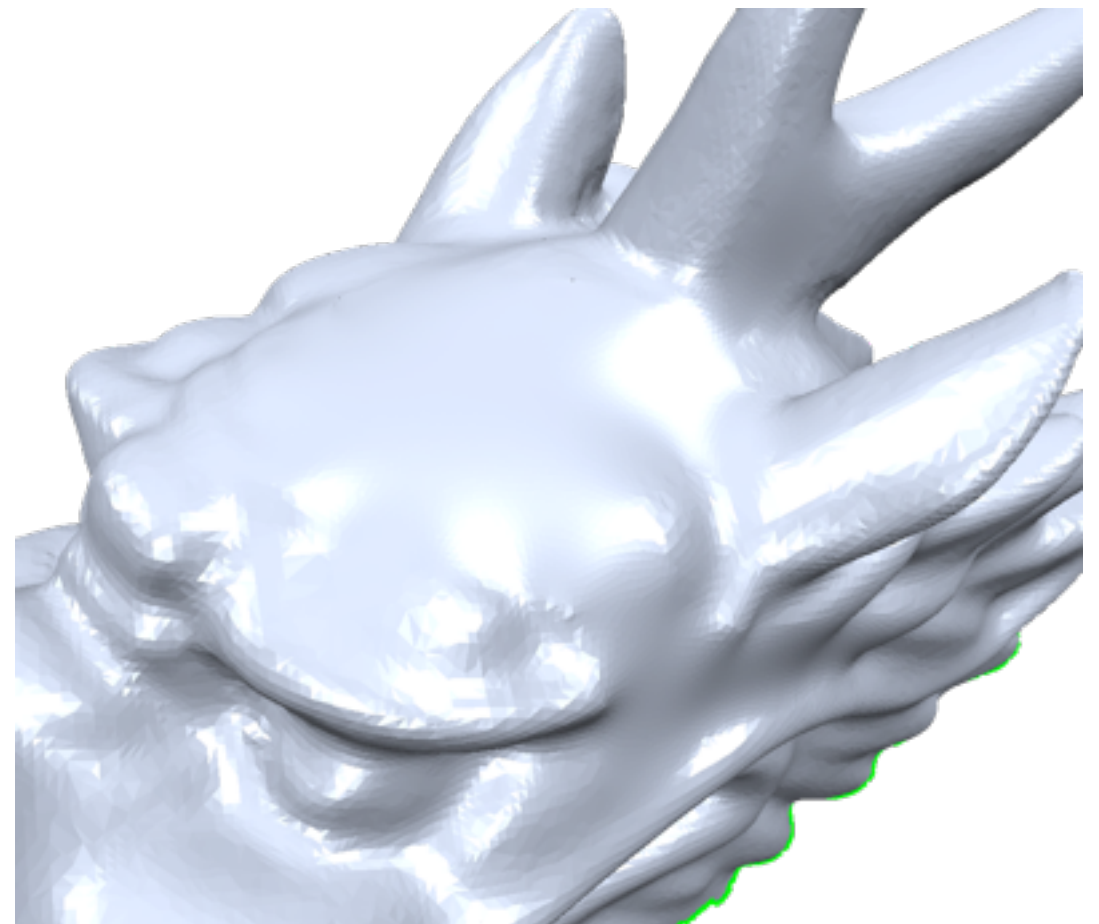
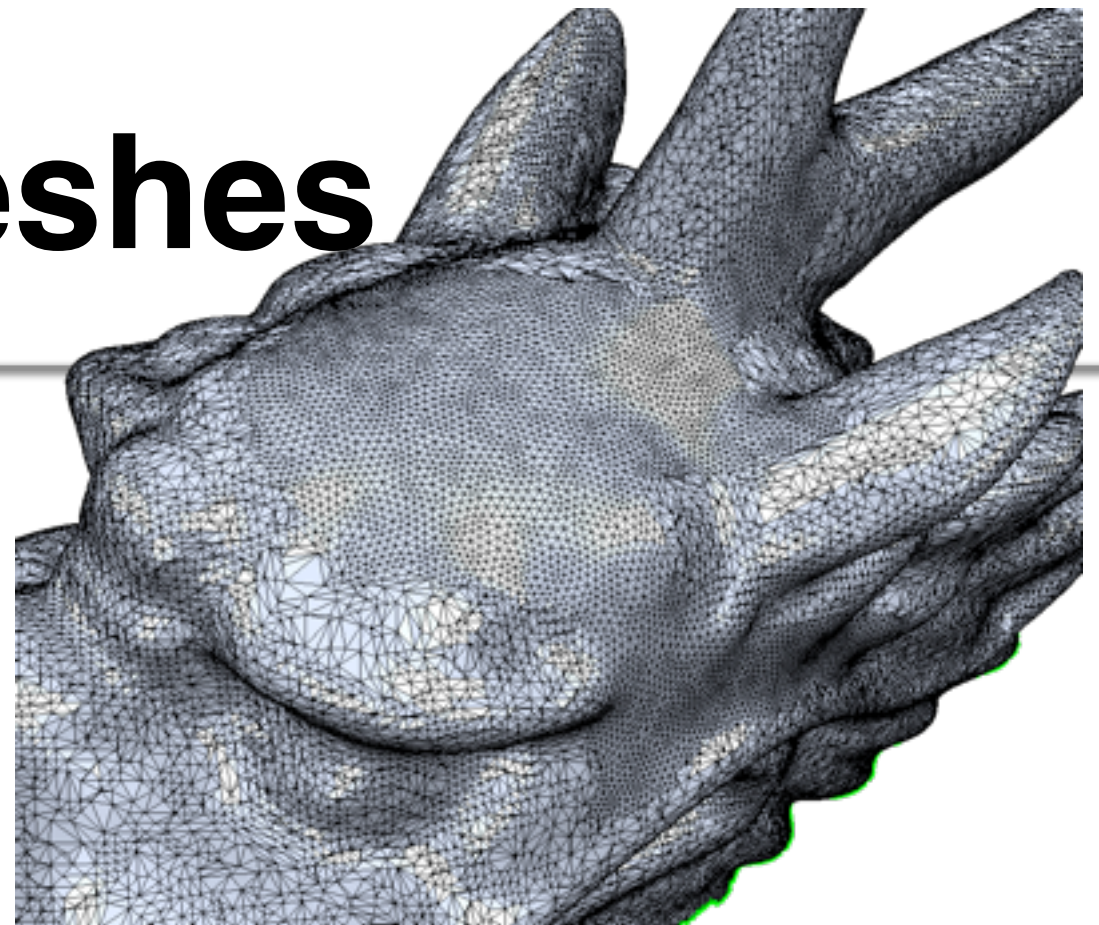
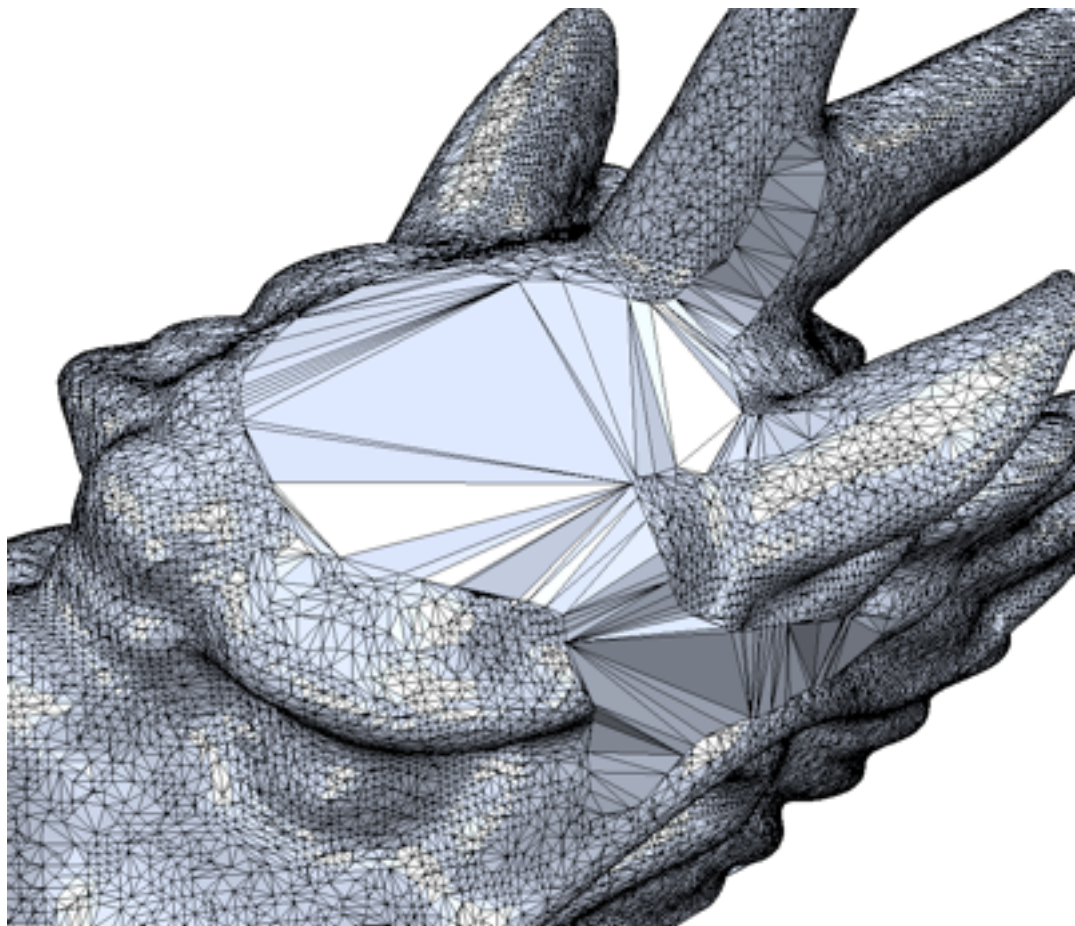
# Filling Holes in Meshes - 2+3

---

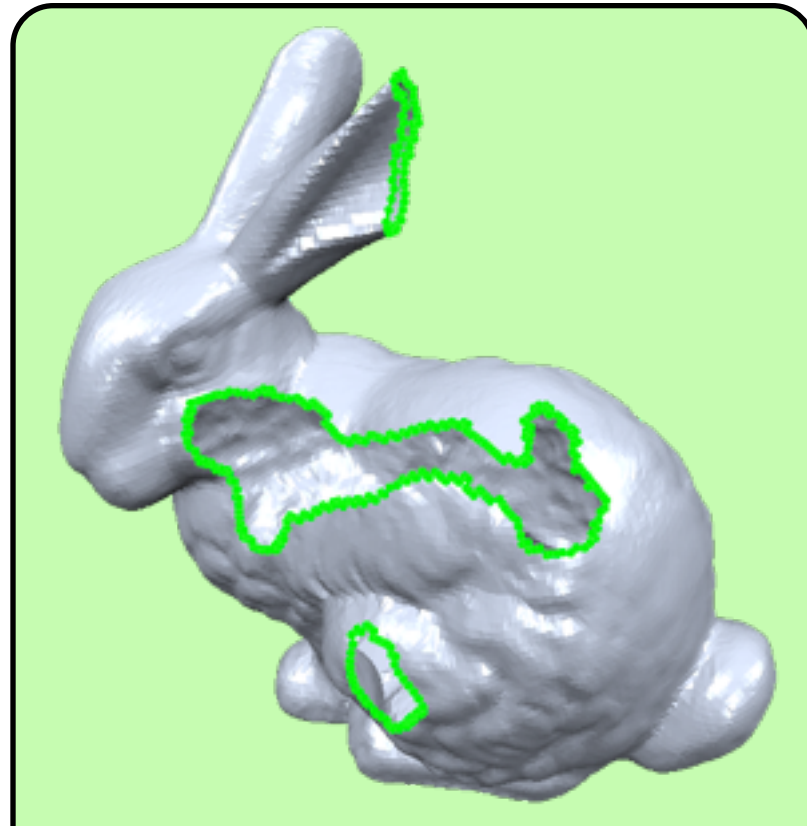
- refine the triangulation such that its vertex density matches that of the surrounding area
- ➔ Pierre's talk about remeshing
- smooth the filling such that its geometry matches that of the surrounding area
- ➔ Mark's talk about mesh smoothing

# Filling Holes in Meshes

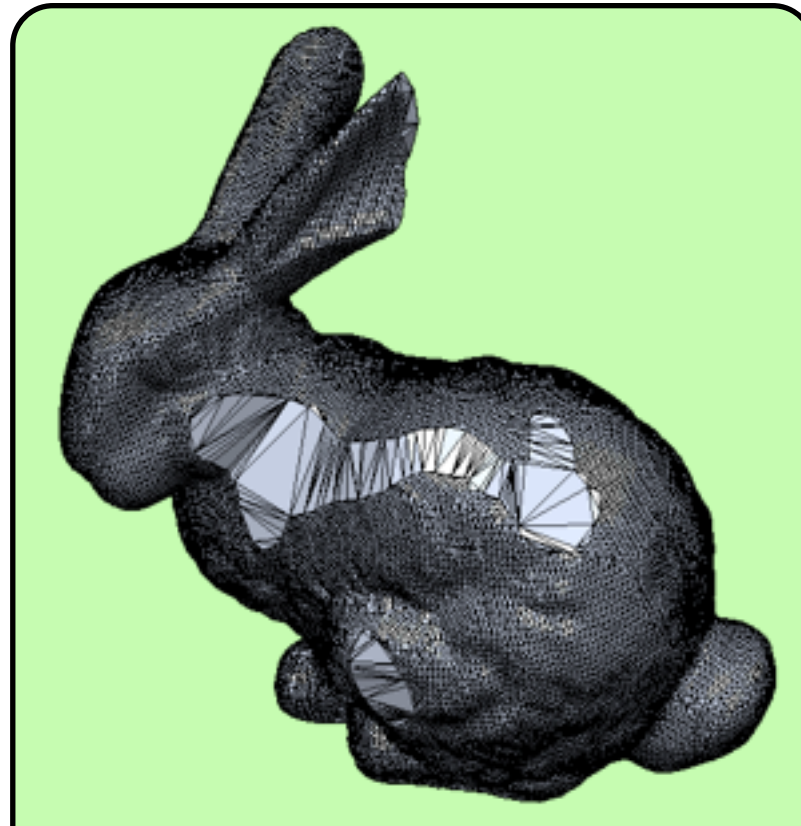
- refinement and smoothing







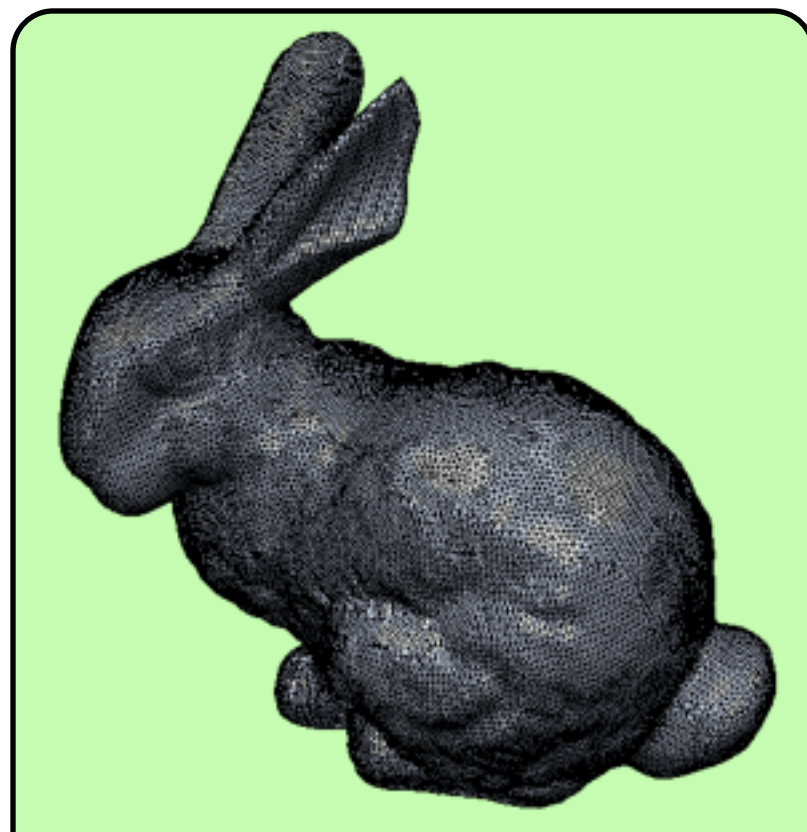
Input model



Minimal triangulation



Refined triangulation



Output model



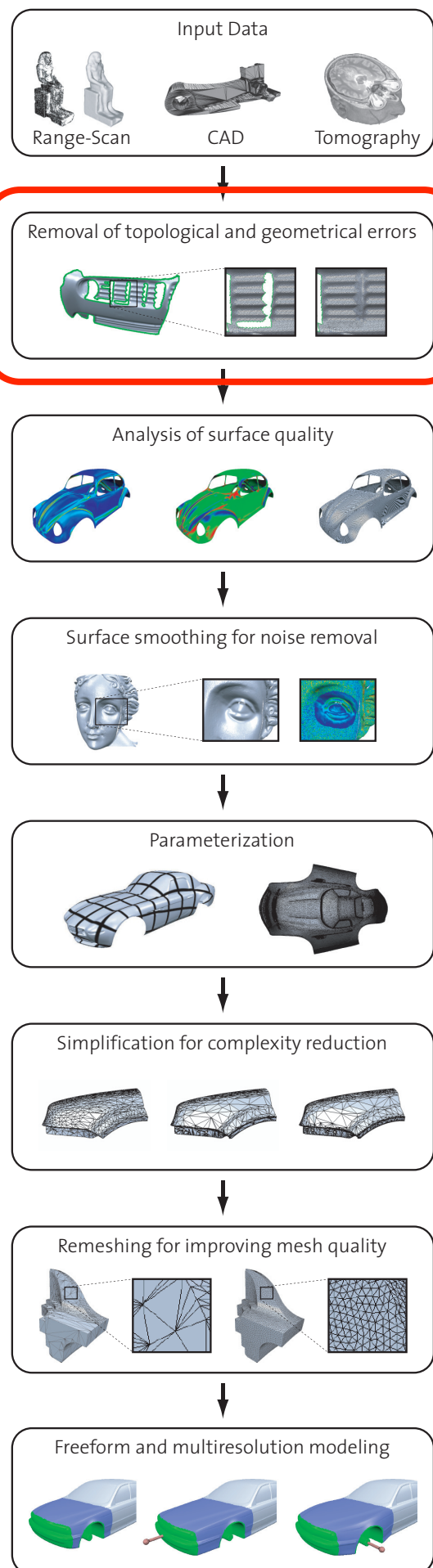
Output model



# Filling Holes in Meshes

---

- what problems do we encounter?
  - islands are not incorporated
  - self-intersections cannot be excluded
  - quality depends on boundary distortion



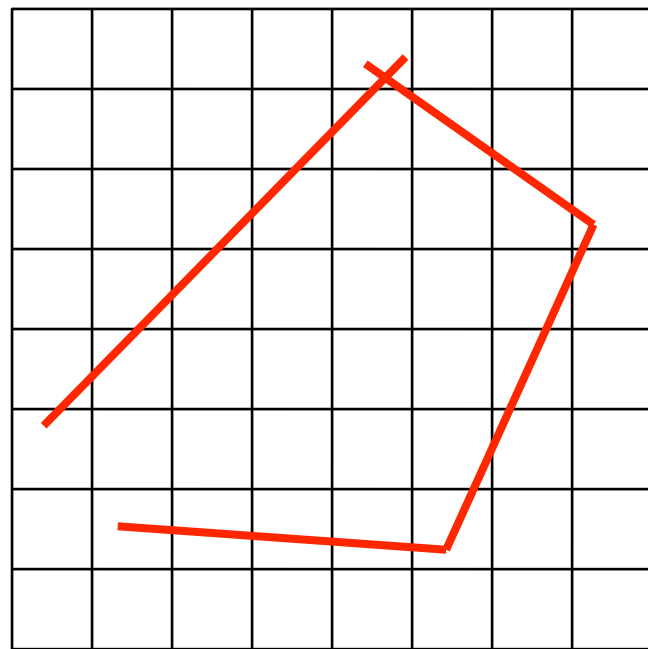
# Model Repair

- types of input
- surface-oriented algorithms
  - Filling holes in meshes [Liepa 2003]
- **volumetric algorithms**
  - Simplification and repair of polygonal models using volumetric techniques [Nooruddin and Turk 2003]
  - Automatic restoration of polygon models [Bischoff, Pavic, Kobbelt 2005]
- conclusion & outlook

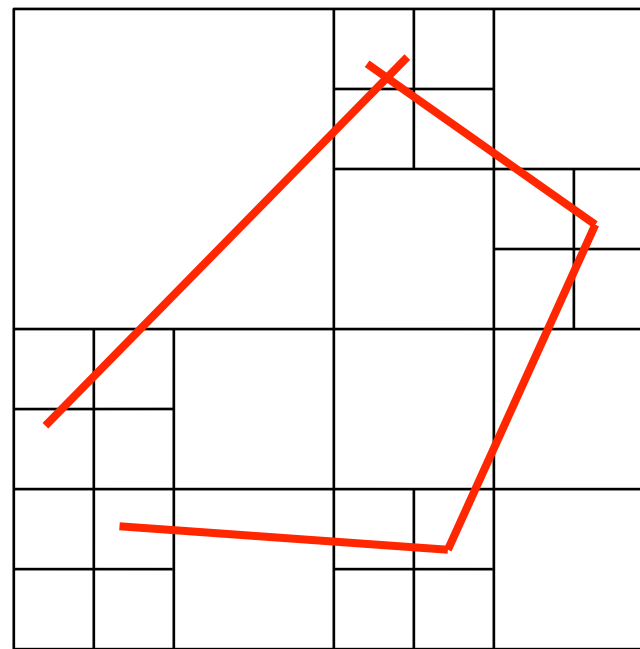


# Volumetric Algorithms

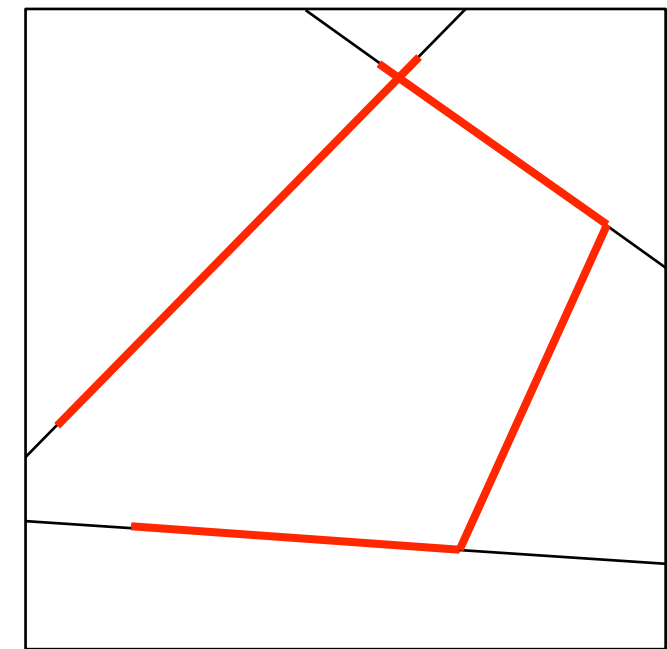
1. convert the input model into an intermediate volumetric representation → loss of information



voxel grid



adaptive octree



BSP tree

# Volumetric Algorithms

---

1. convert the input model into an intermediate volumetric representation → loss of information
2. discrete volumetric representation → robust and reliable processing
  - morphological operators (dilation, erosion)
  - smoothing
  - flood-fill to determine interior/exterior
  - ...



# Volumetric Algorithms

---

1. convert the input model into an intermediate volumetric representation → loss of information
2. discrete volumetric representation → robust and reliable processing
  - morphological operators (dilation, erosion)
  - smoothing
  - flood-fill to determine interior/exterior
3. extract the surface of a solid object from the volume → manifold and watertight

# Volumetric Algorithms

---

1. convert the input model into an intermediate volumetric representation → **loss of information**
2. discrete volumetric representation → **robust and reliable processing**
  - morphological operators (dilation, erosion)
  - smoothing
  - flood-fill to determine interior/exterior
3. extract the surface of a solid object from the volume → **manifold and watertight**

# Volumetric Algorithms

---

- advantages
  - fully automatic
  - few (intuitive) user parameters
  - robust
  - guaranteed manifold output

# Volumetric Algorithms

---

- problems
  - slow and memory intensive
    - ➔ adaptive data structures
  - aliasing and loss of features
    - ➔ feature sensitive reconstruction (EMC, DC)
  - loss of mesh structure
    - ➔ bad luck (... hybrid approaches)
  - large output
    - ➔ mesh decimation (Mark's talk)



# Example 1

---

- example algorithm 1

F. S. Nooruddin and G. Turk

Simplification and Repair of Polygonal Models Using Volumetric Techniques

IEEE Transactions on Visualization and Computer Graphics 2003

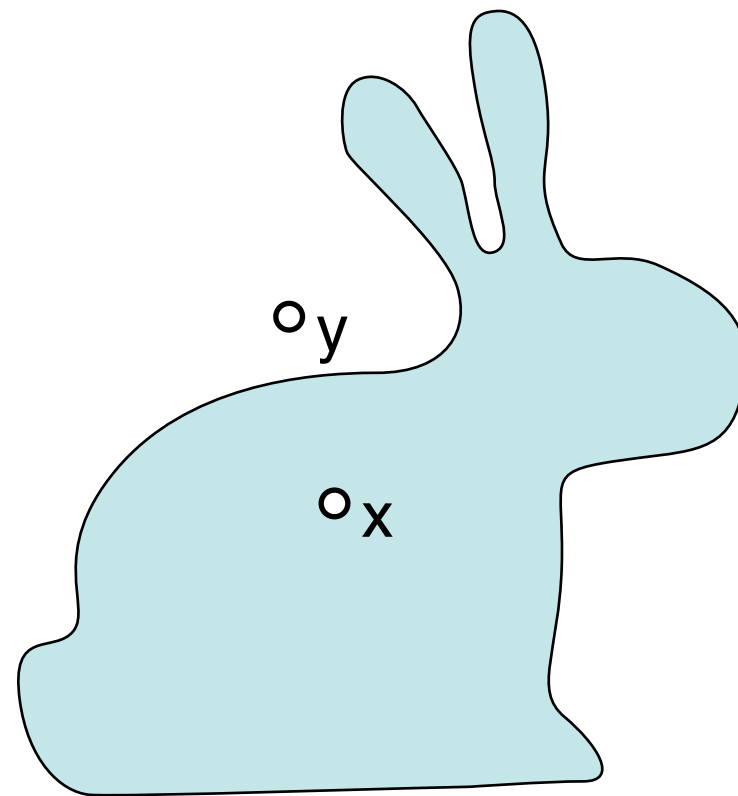
- issues

- classification of sample points as being *inside* or *outside* of the object  
(parity count, ray stabbing)
- sampling the volume
- extracting the mesh

# Nooruddin and Turk's Method

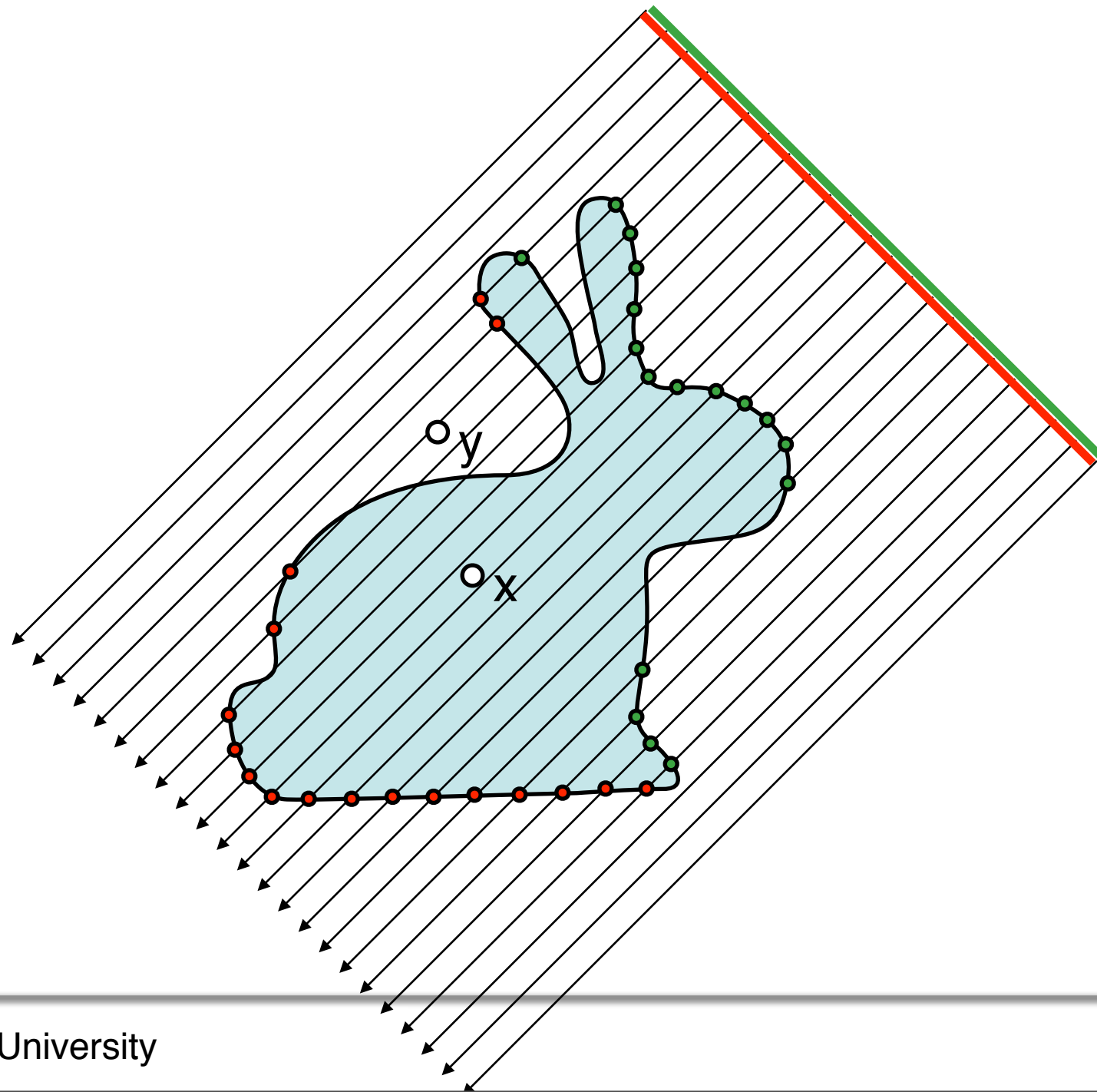
---

- point classification: Layered depth images (LDI)



# Nooruddin and Turk's Method

- point classification: Layered depth images (LDI)



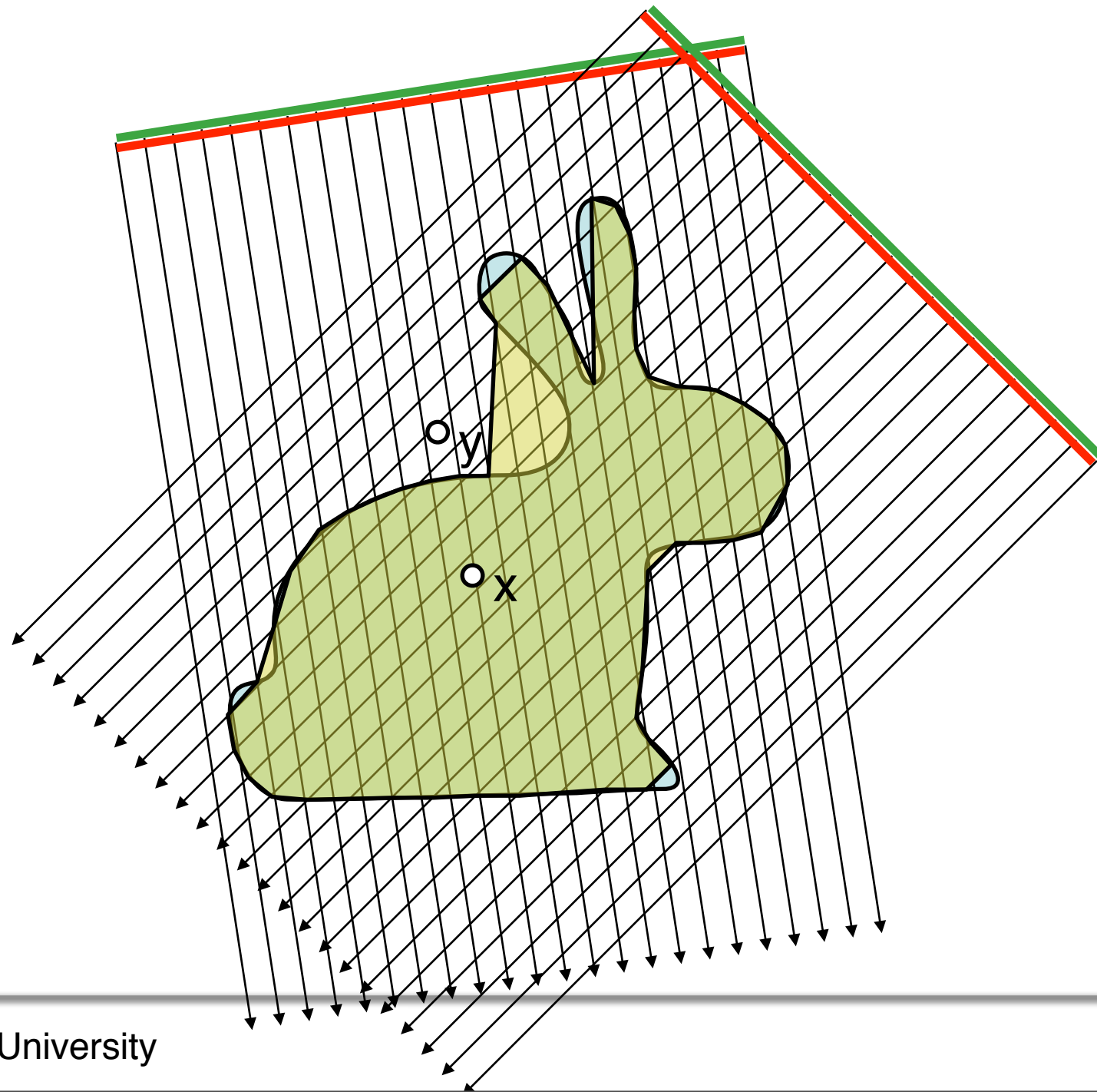
# Nooruddin and Turk's Method

- point classification: Layered depth images (LDI)



# Nooruddin and Turk's Method

- point classification: Layered depth images (LDI)





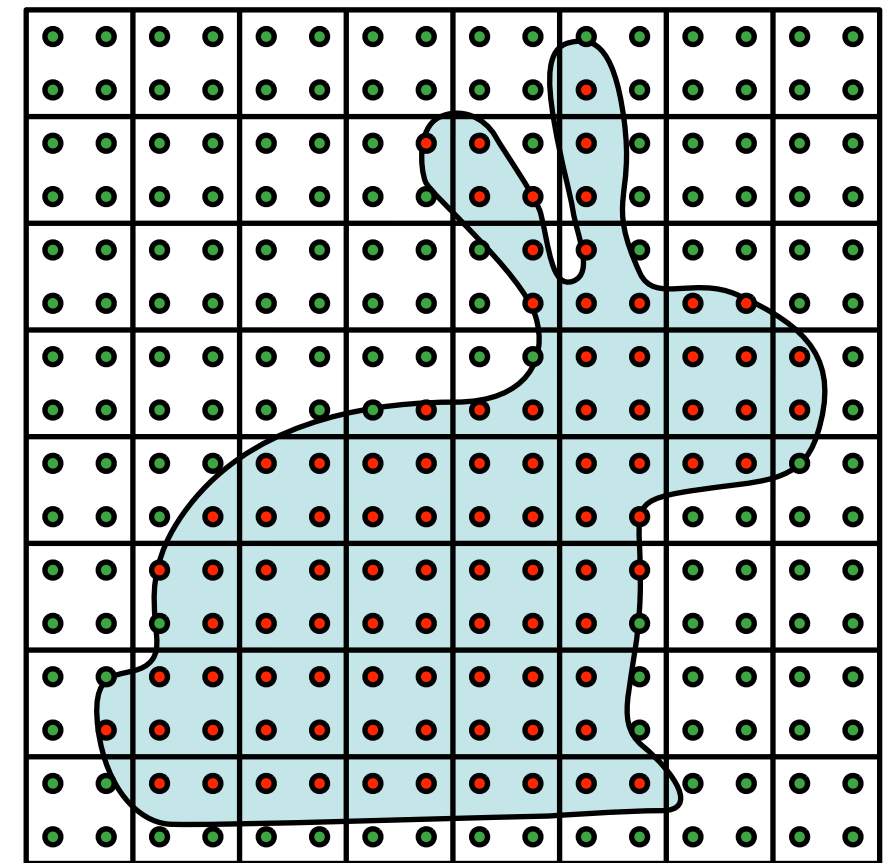
# Nooruddin and Turk's Method

---

- point classification: Layered depth images (LDI)
  1. record  $n$  layered depth images
  2. project the query point  $x$  into each depth image
  3. if any of the images classifies  $x$  as exterior, then  $x$  is globally classified as exterior else as interior

# Nooruddin and Turk's Method

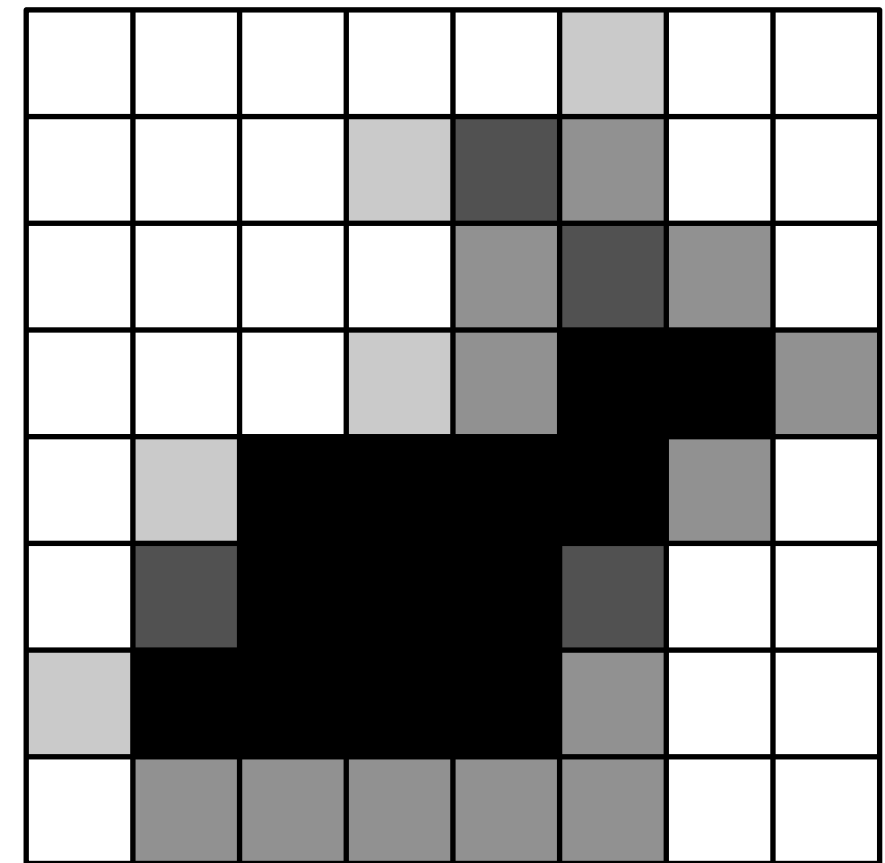
- supersampling
- filtering
  - Gaussian
  - morphological filters (dilation, erosion)
    - model simplification
    - reduction of topological noise
- marching cubes



# Nooruddin and Turk's Method

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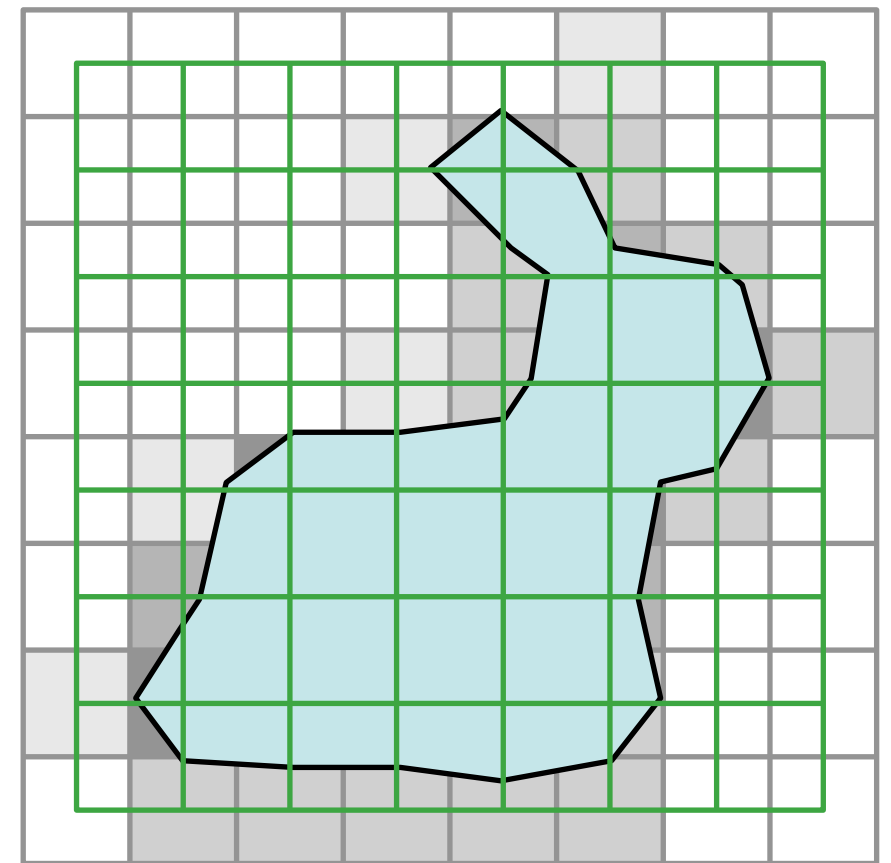
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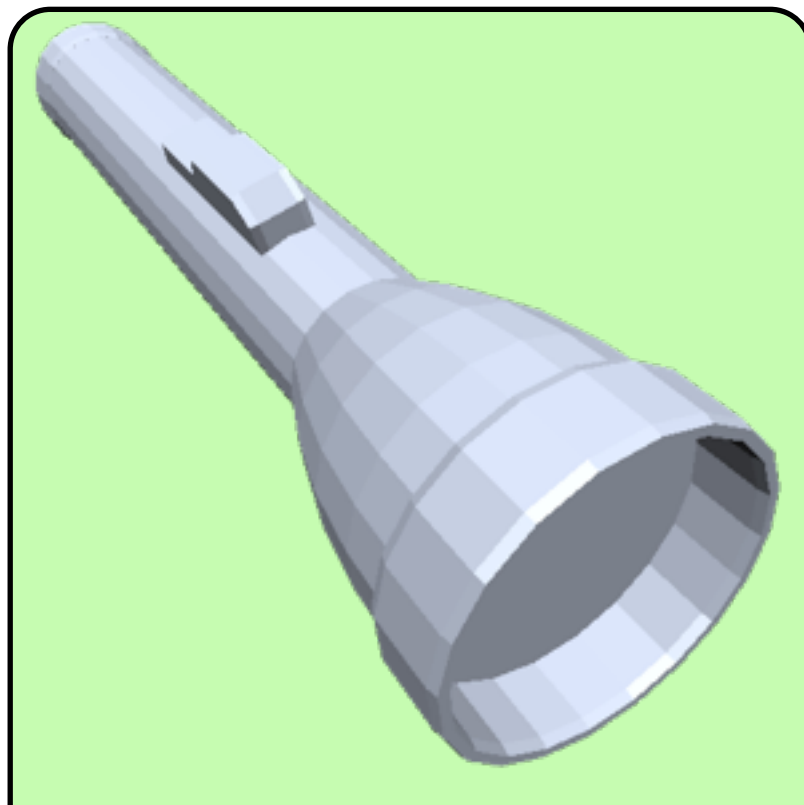


# Nooruddin and Turk's Method

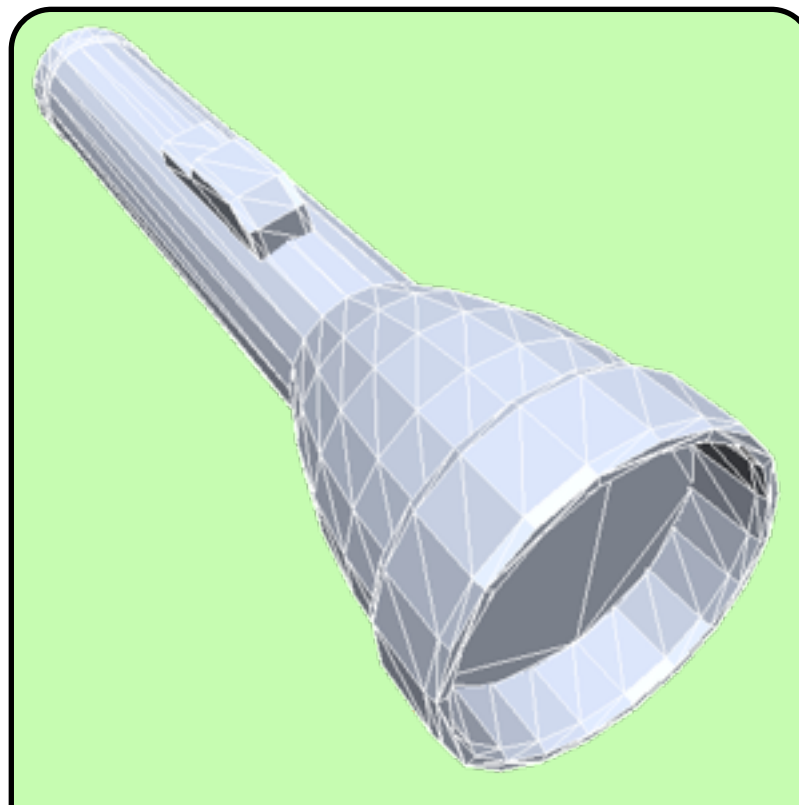
---

- supersampling
- filtering
  - Gaussian
  - morphological filters (dilation, erosion)
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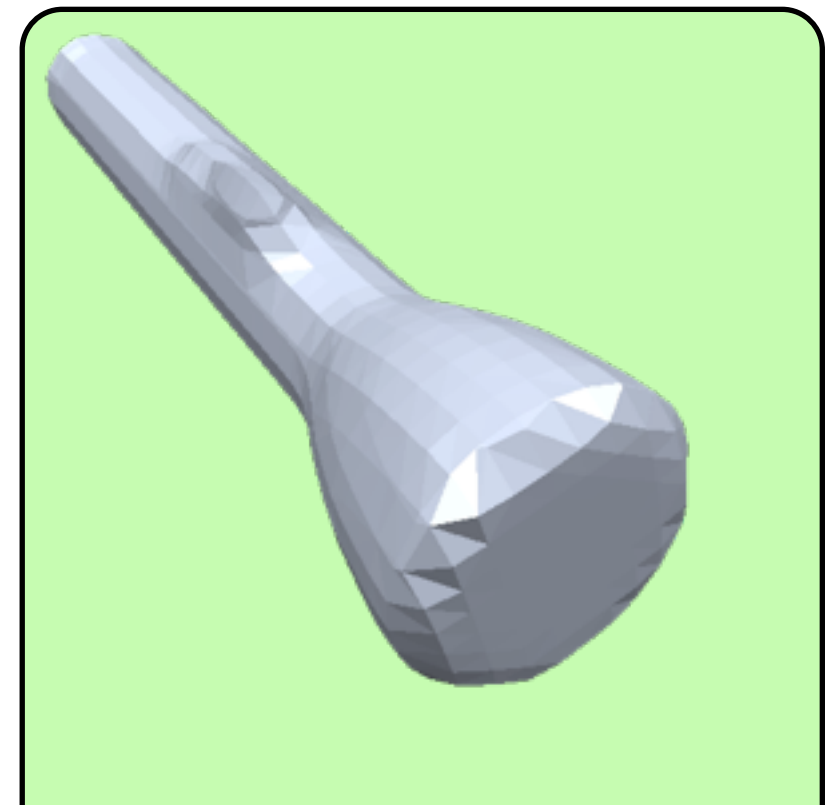




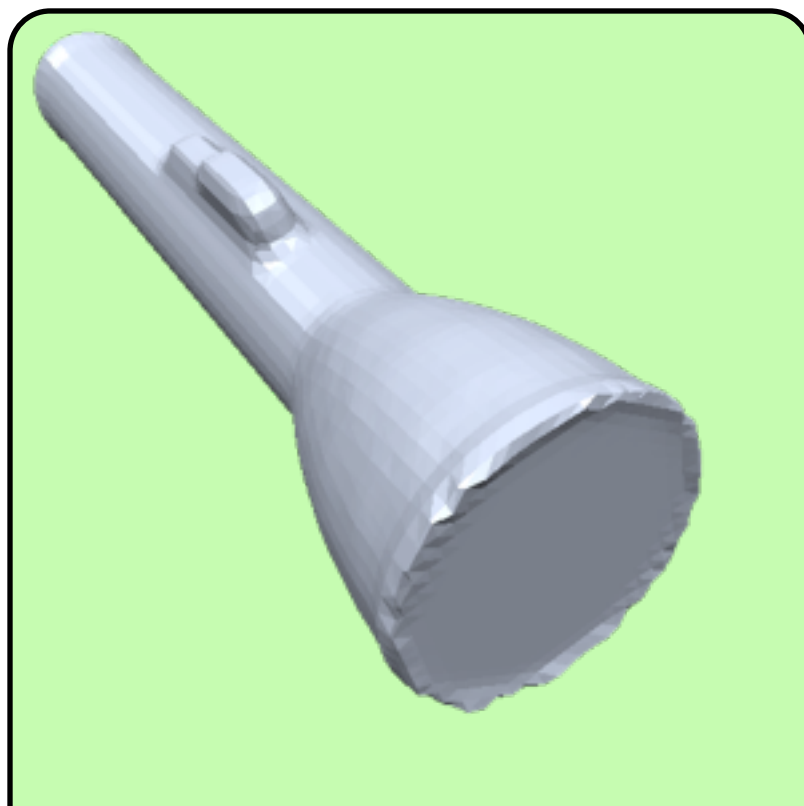
Input model



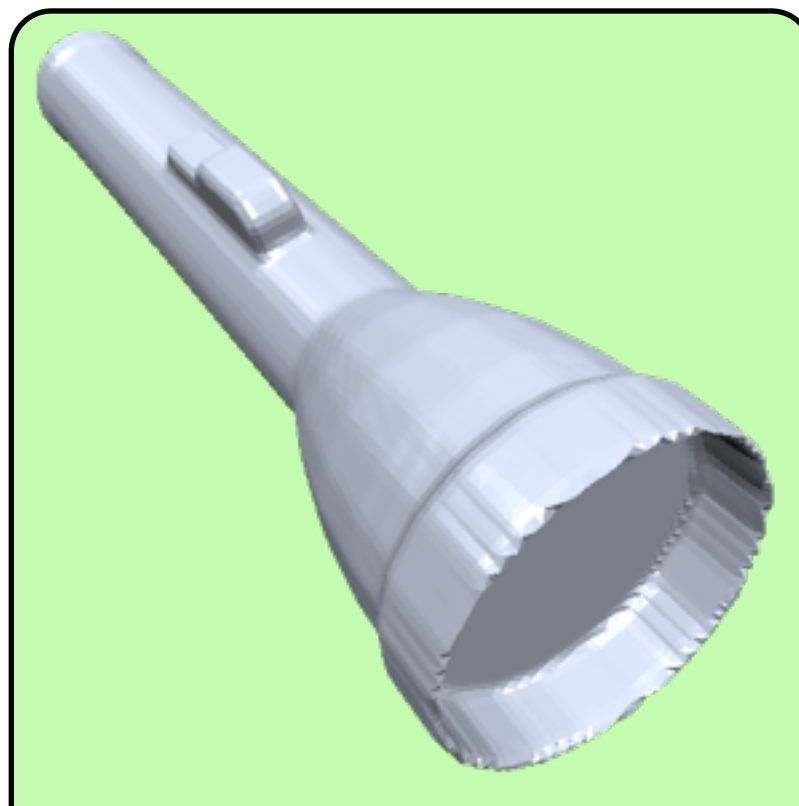
Input model



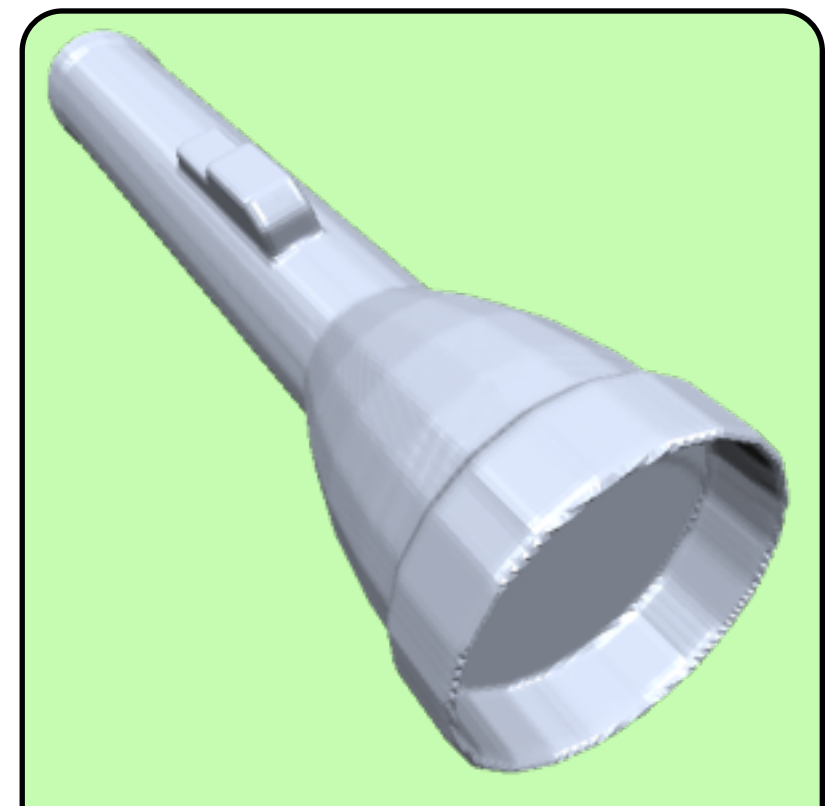
50×50×50



100×100×100

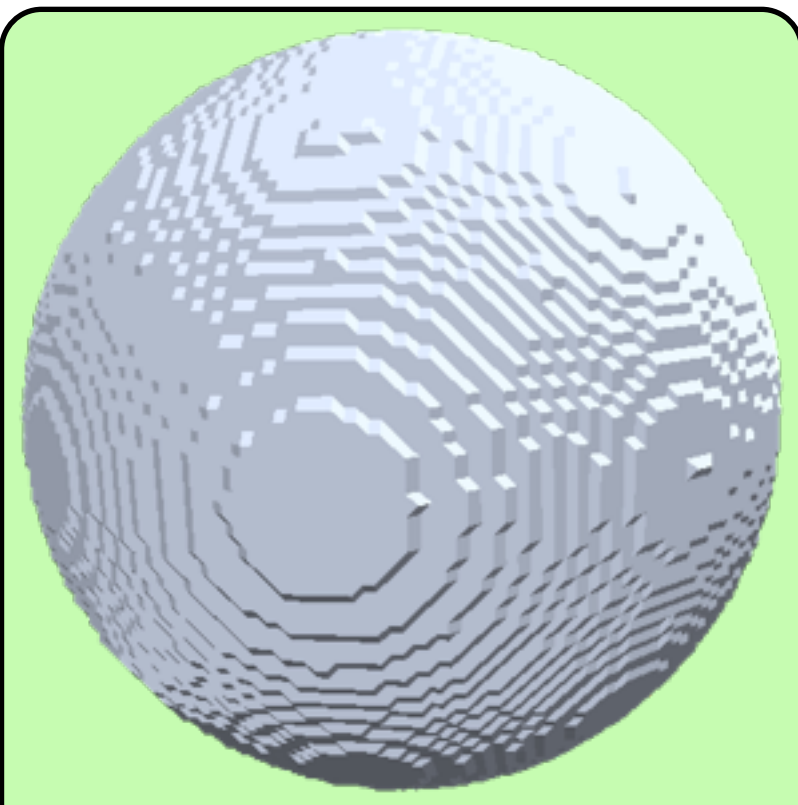


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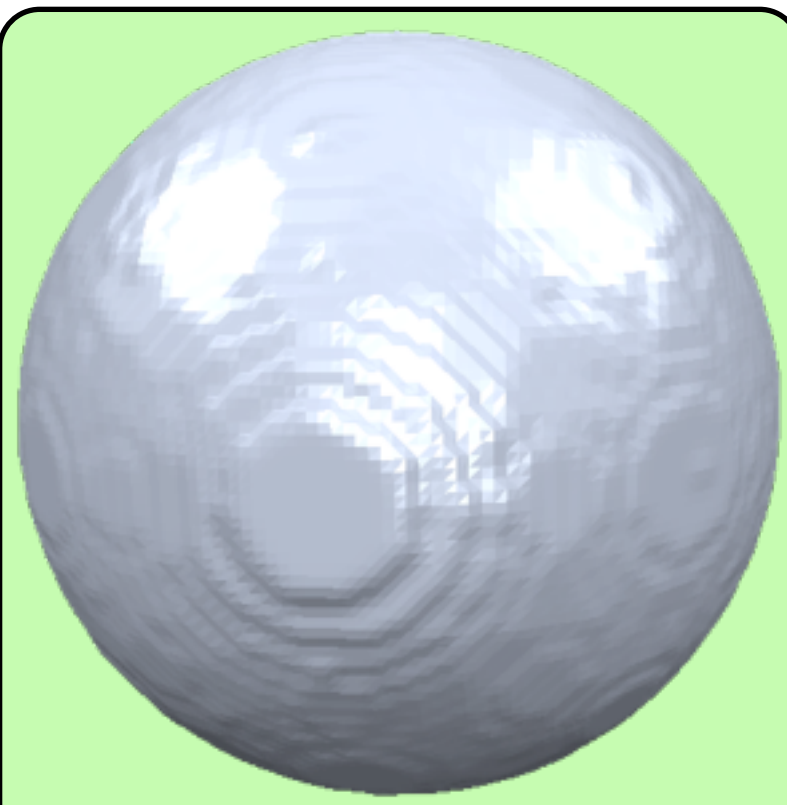


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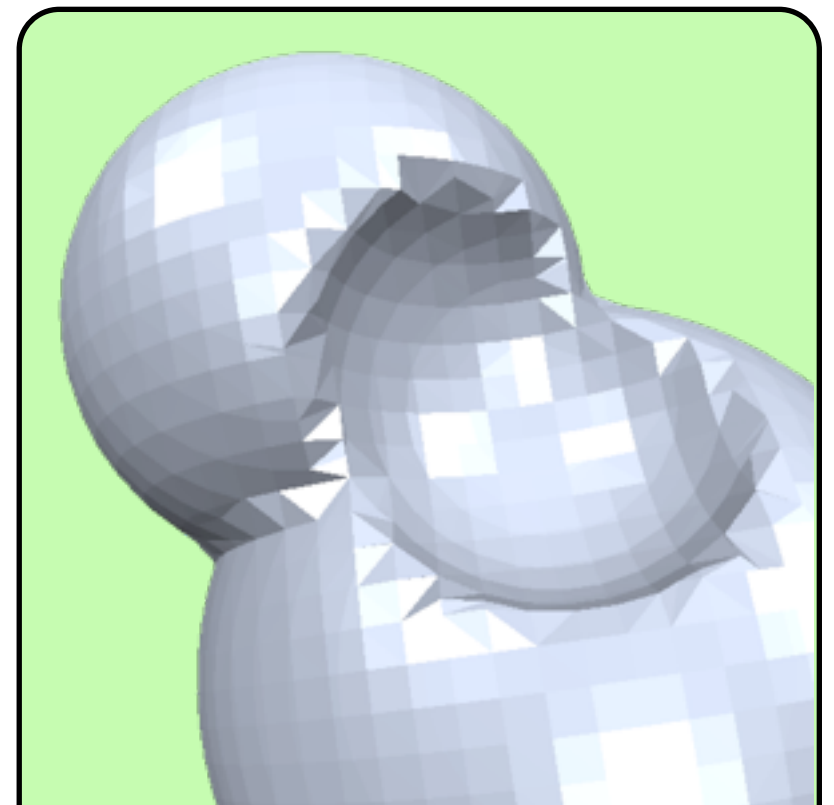




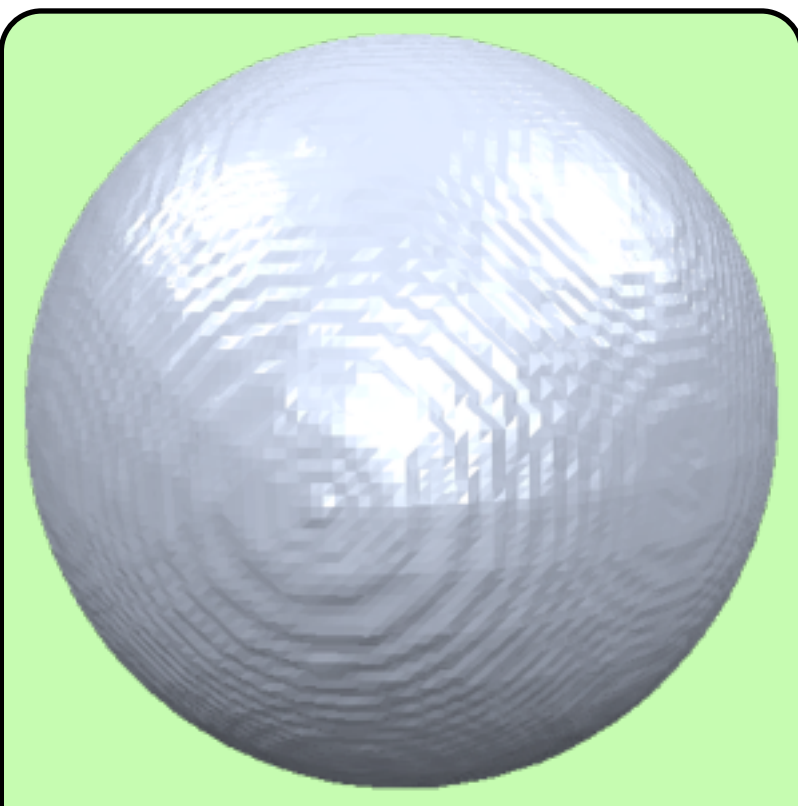
Raw



Smoothing



Marching Cubes



Supersampling



Supersampling + smoothing

# Nooruddin and Turk's Method

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- voxelization
  - characteristic function / signed distance function
  - cannot handle all kinds of inconsistencies
- repair
  - uniform treatment of voxel
  - cannot exploit local shape information
- extraction
  - thresholding
  - sampling artifacts

# Example 2

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- example algorithm 2

S. Bischoff, D. Pavic, L. Kobbelt

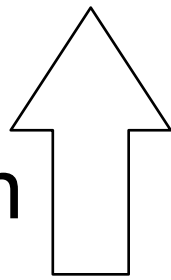
Automatic Restoration of Polygon Models

Transactions on Graphics 2005

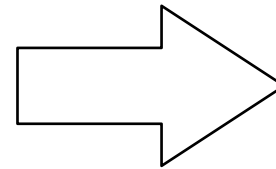
# Overview

volumetric  
representation

voxelization

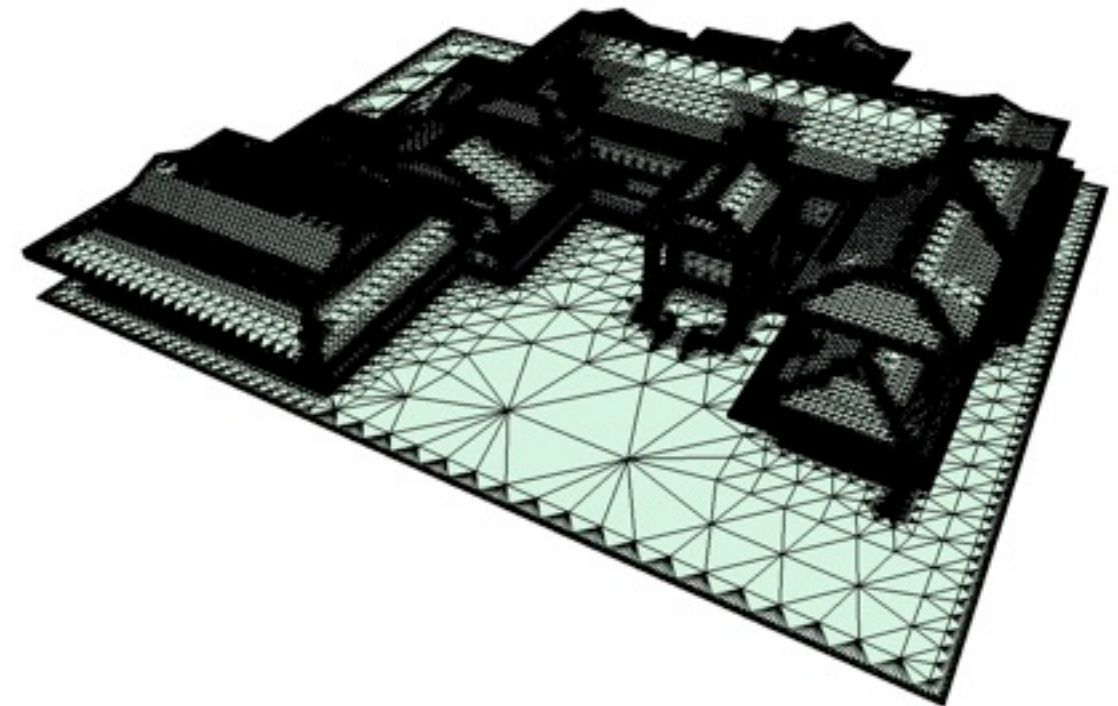
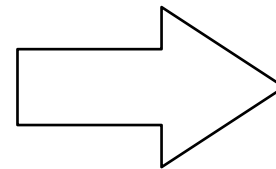
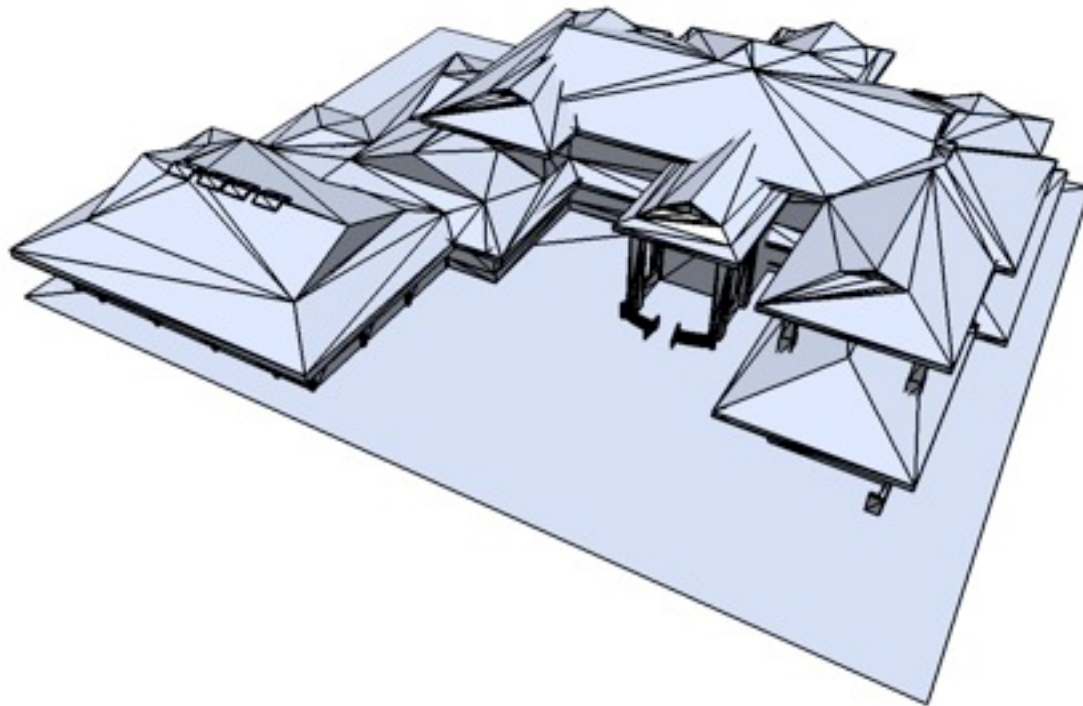
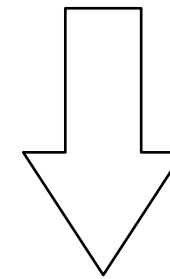


gap filling,  
removal of  
interior geometry



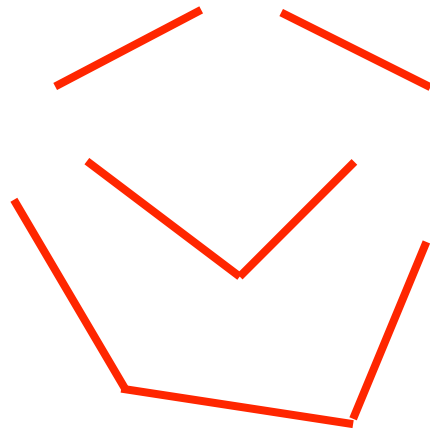
volumetric  
representation

manifold  
mesh  
extraction



# Overview

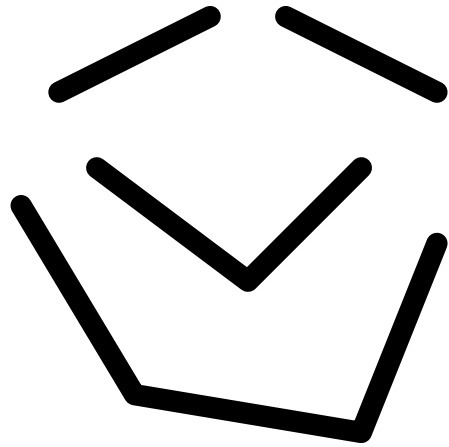
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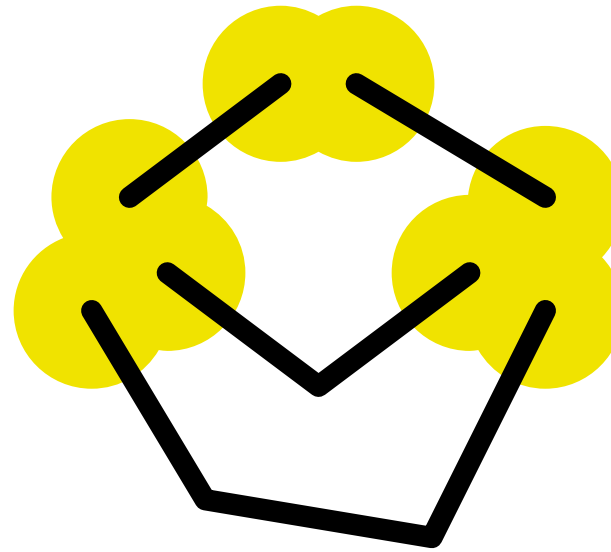
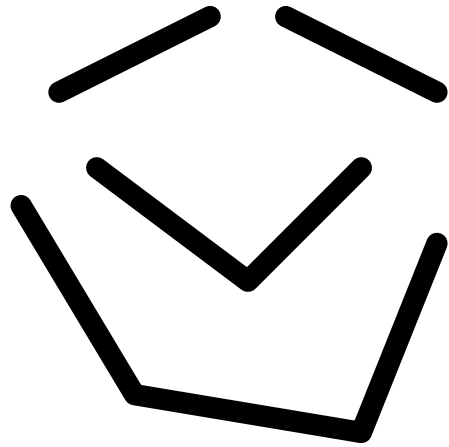
# Overview

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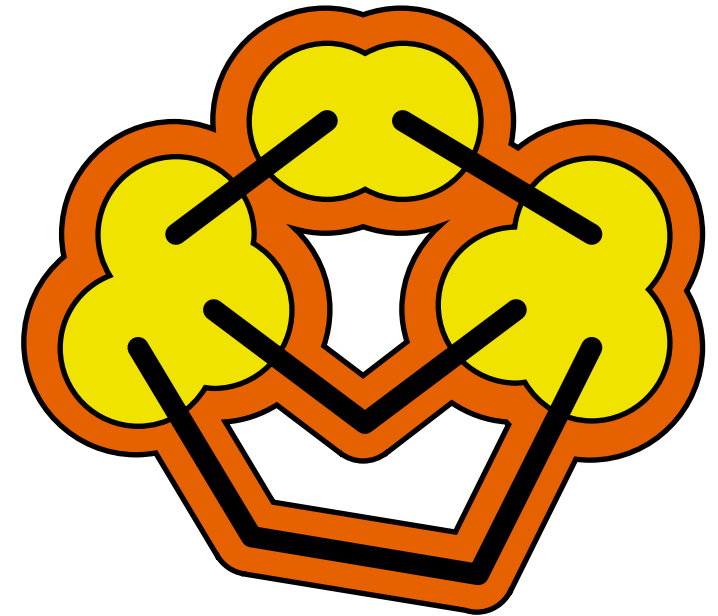
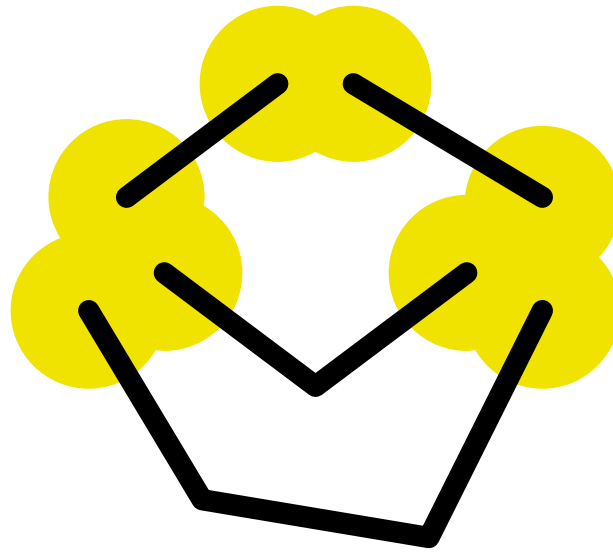
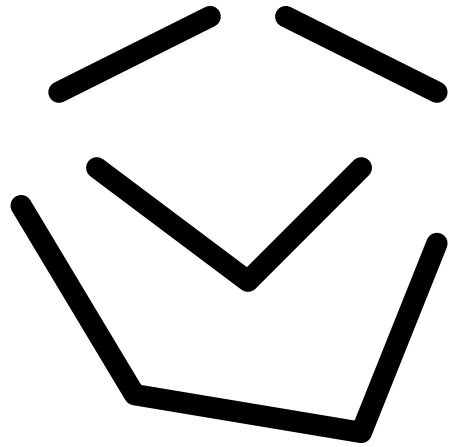
# Overview

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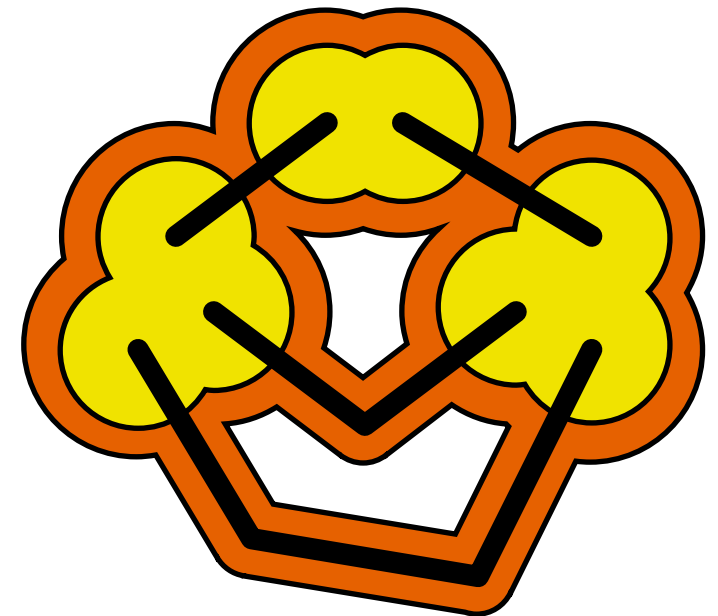
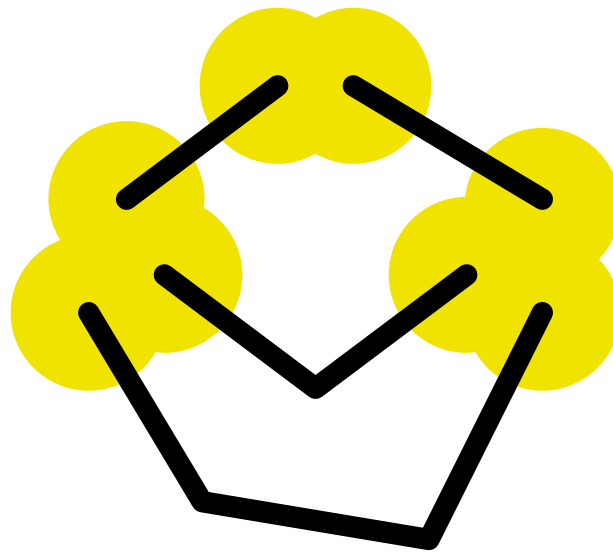
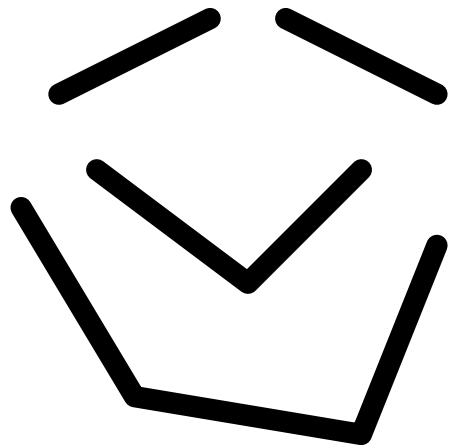
# Overview

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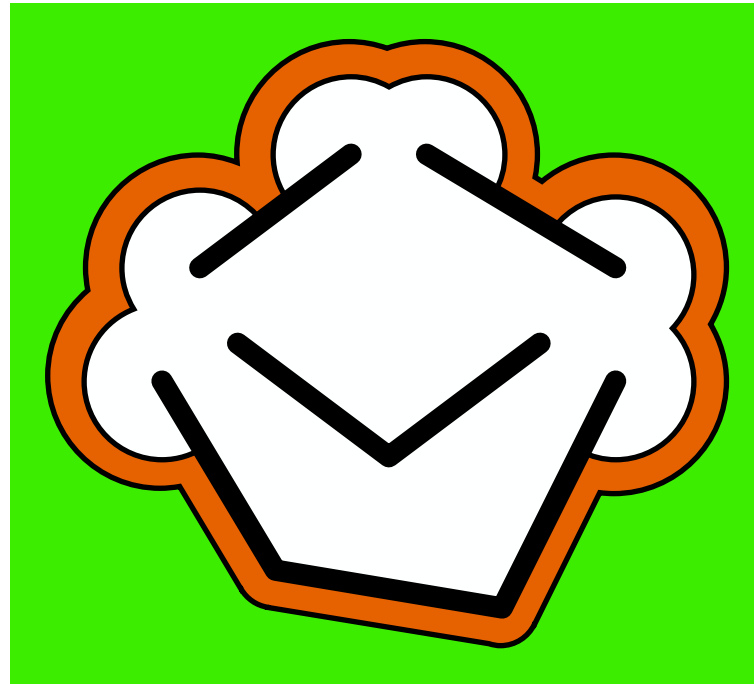
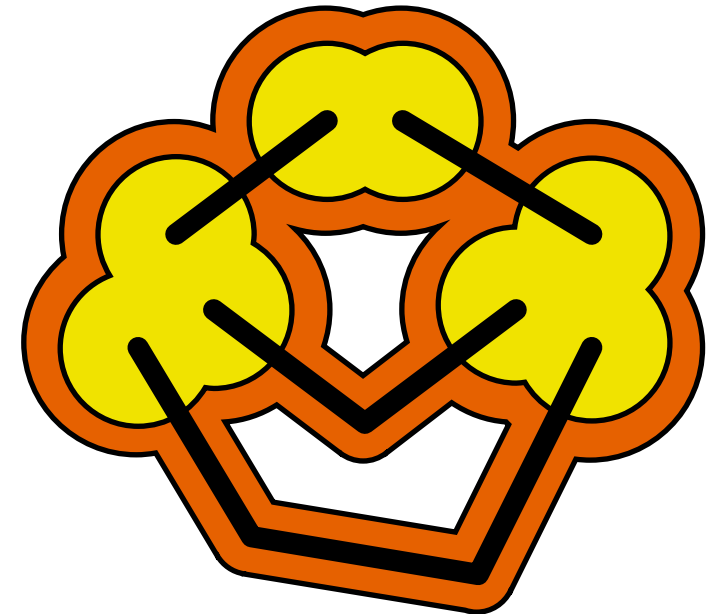
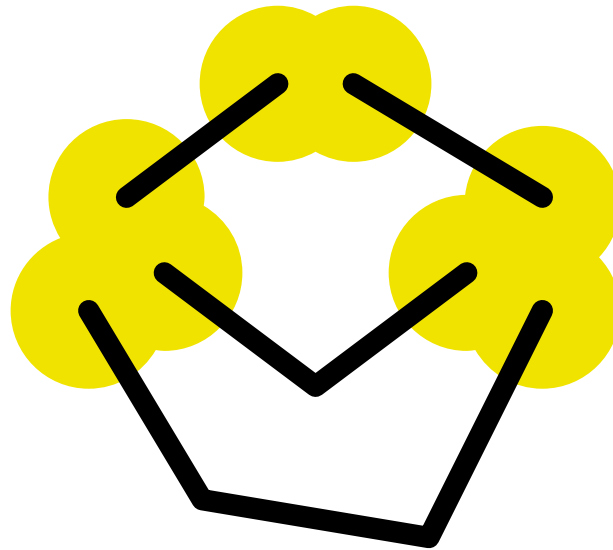
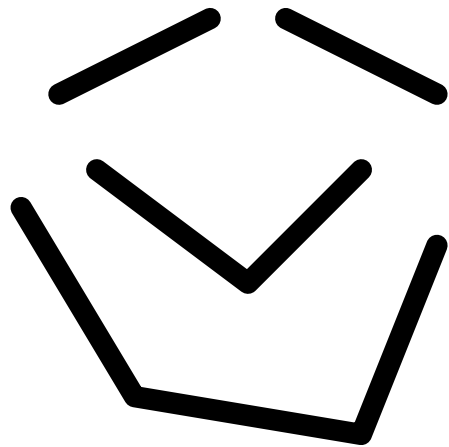
# Overview

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# Overview

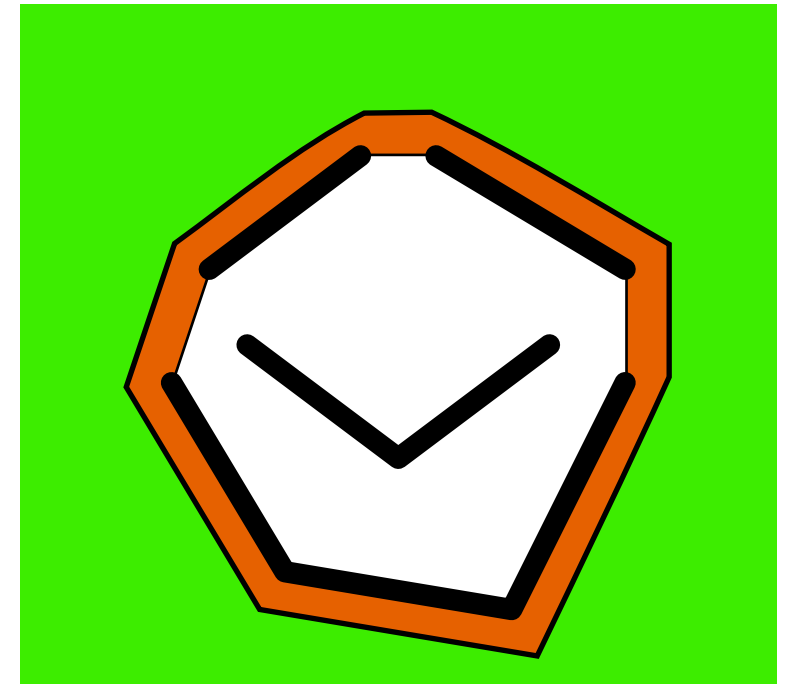
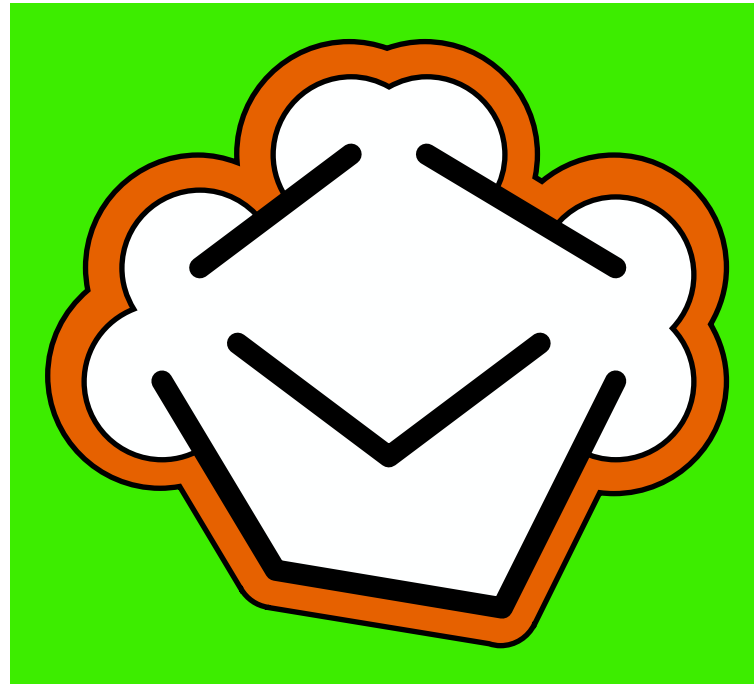
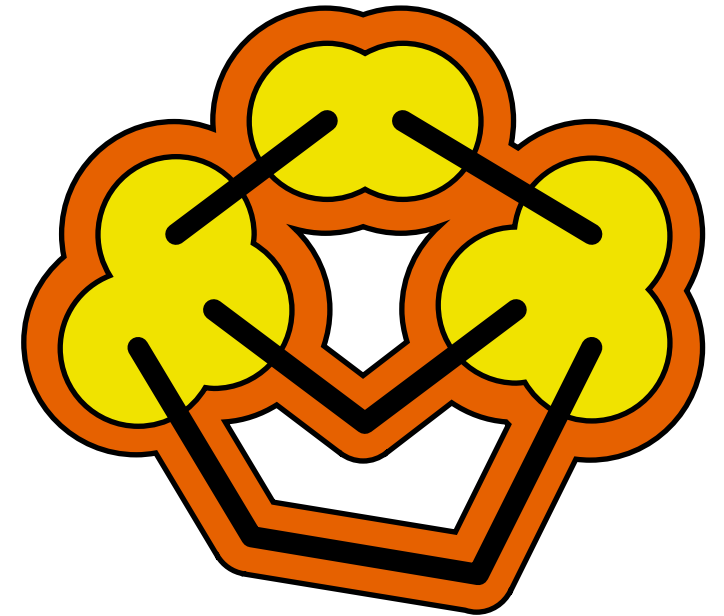
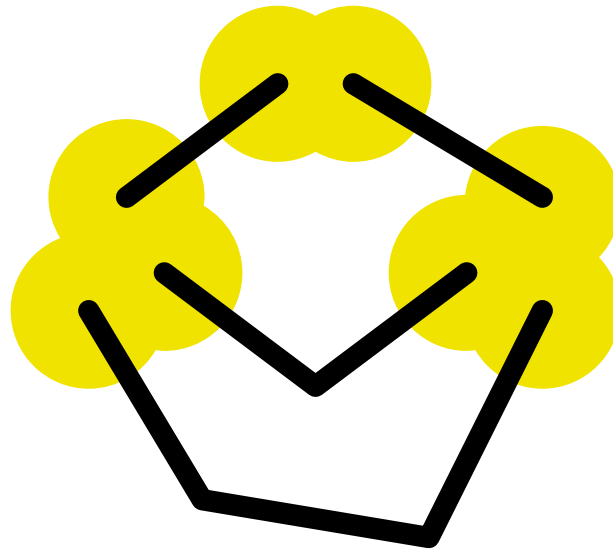
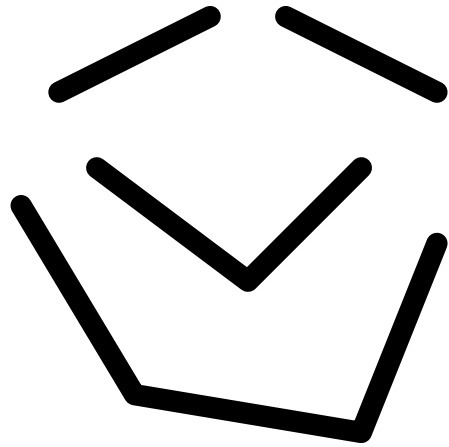
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# Overview

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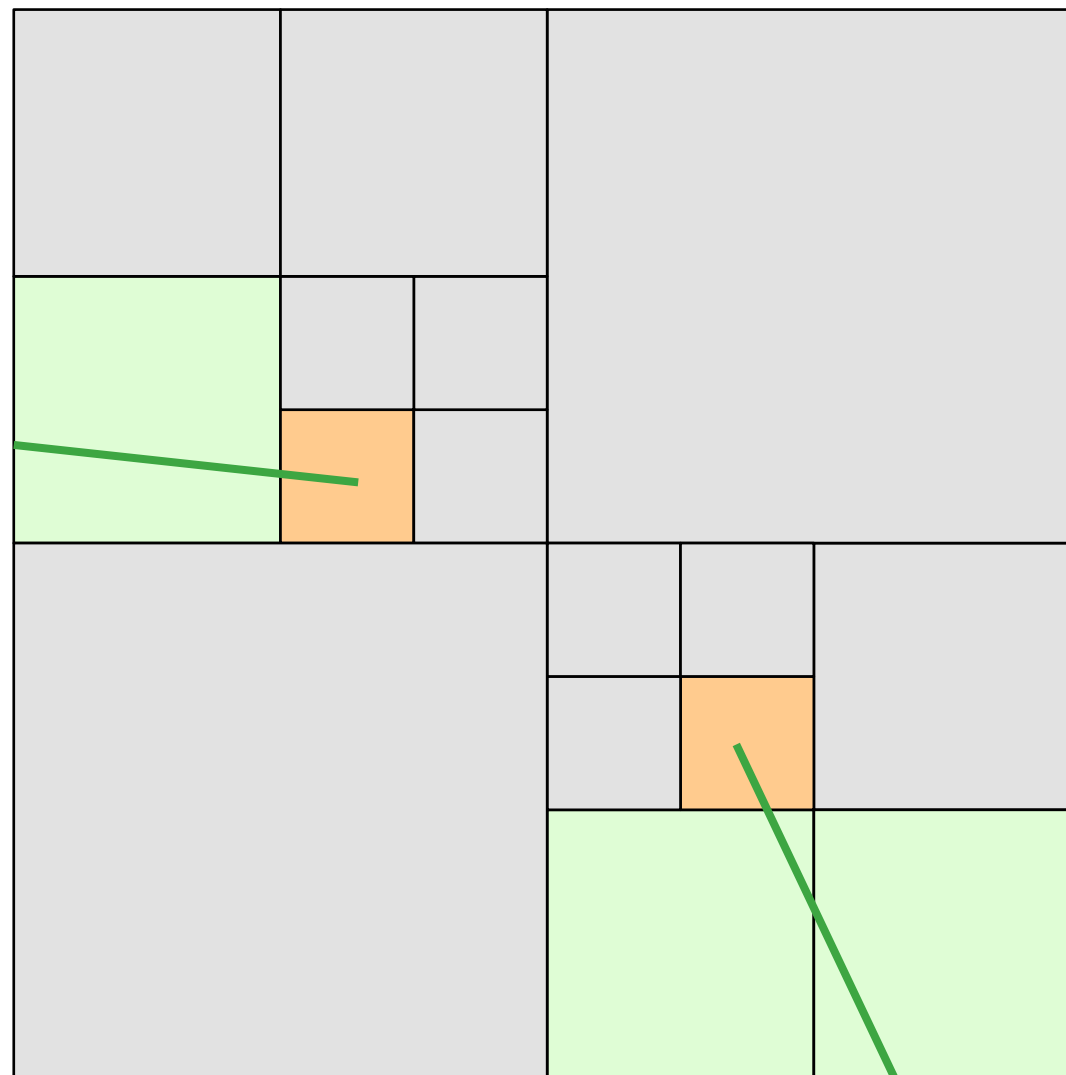




# Closing Gaps

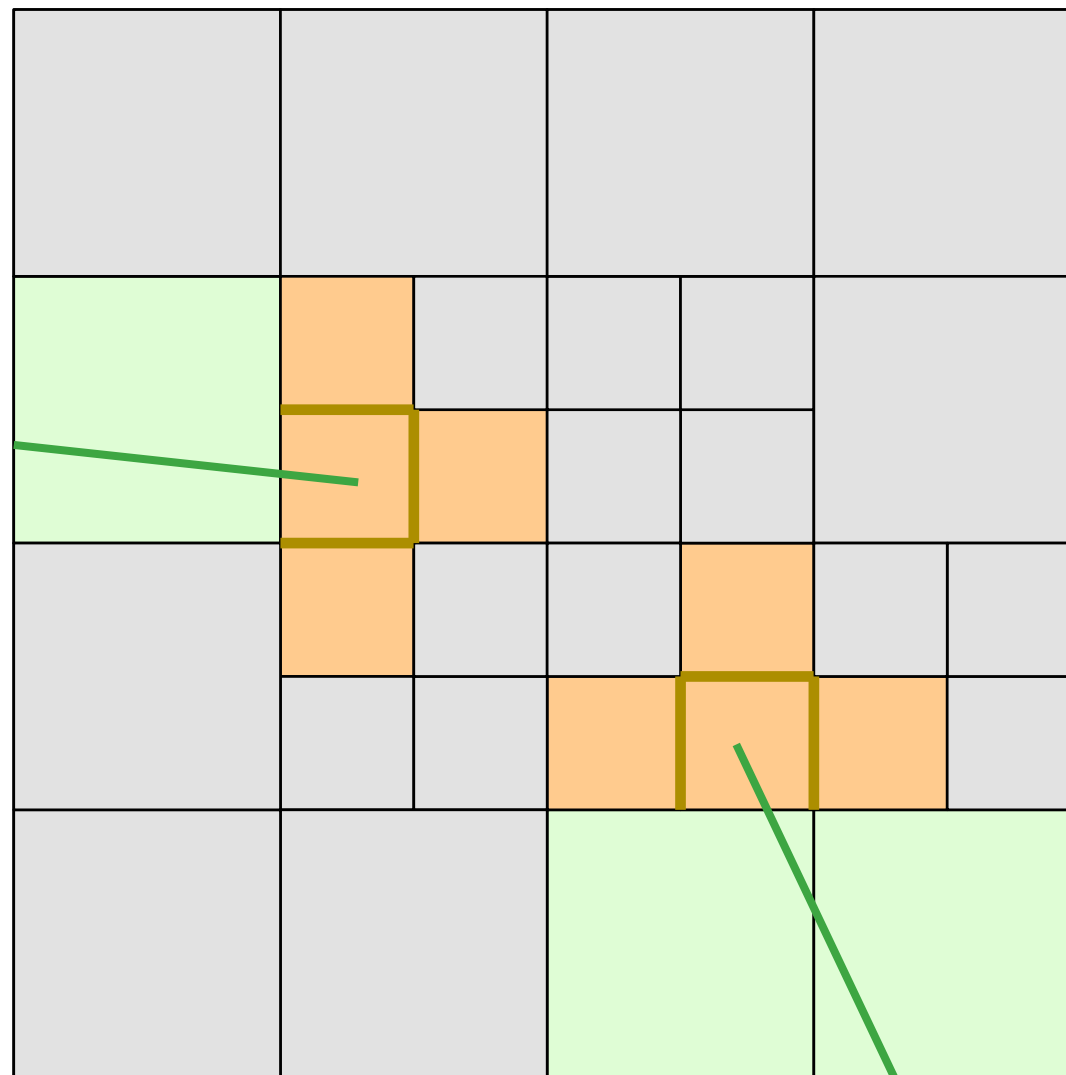
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- close gaps by dilating the boundary voxels



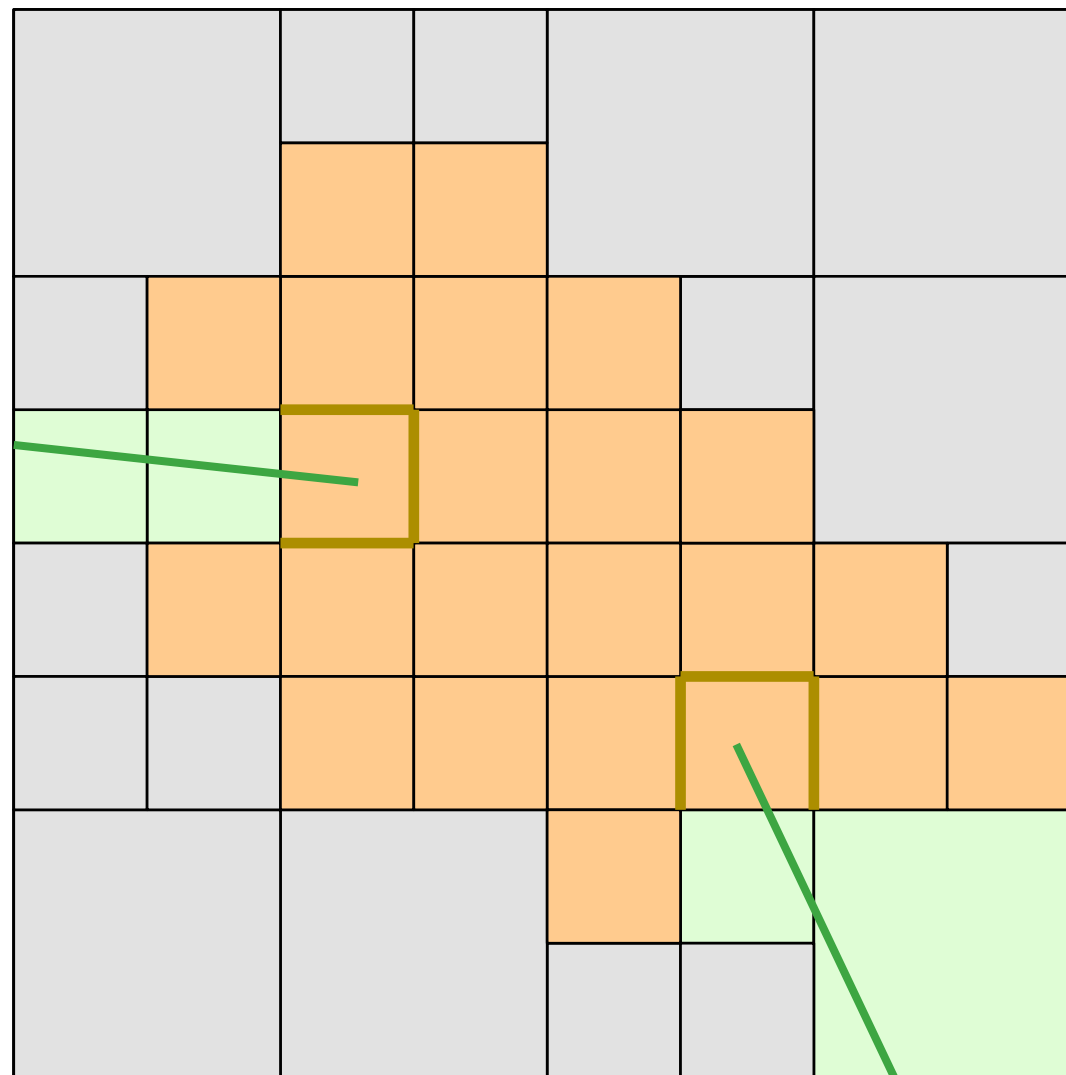
# Closing Gaps

- close gaps by dilating the boundary voxels



# Closing Gaps

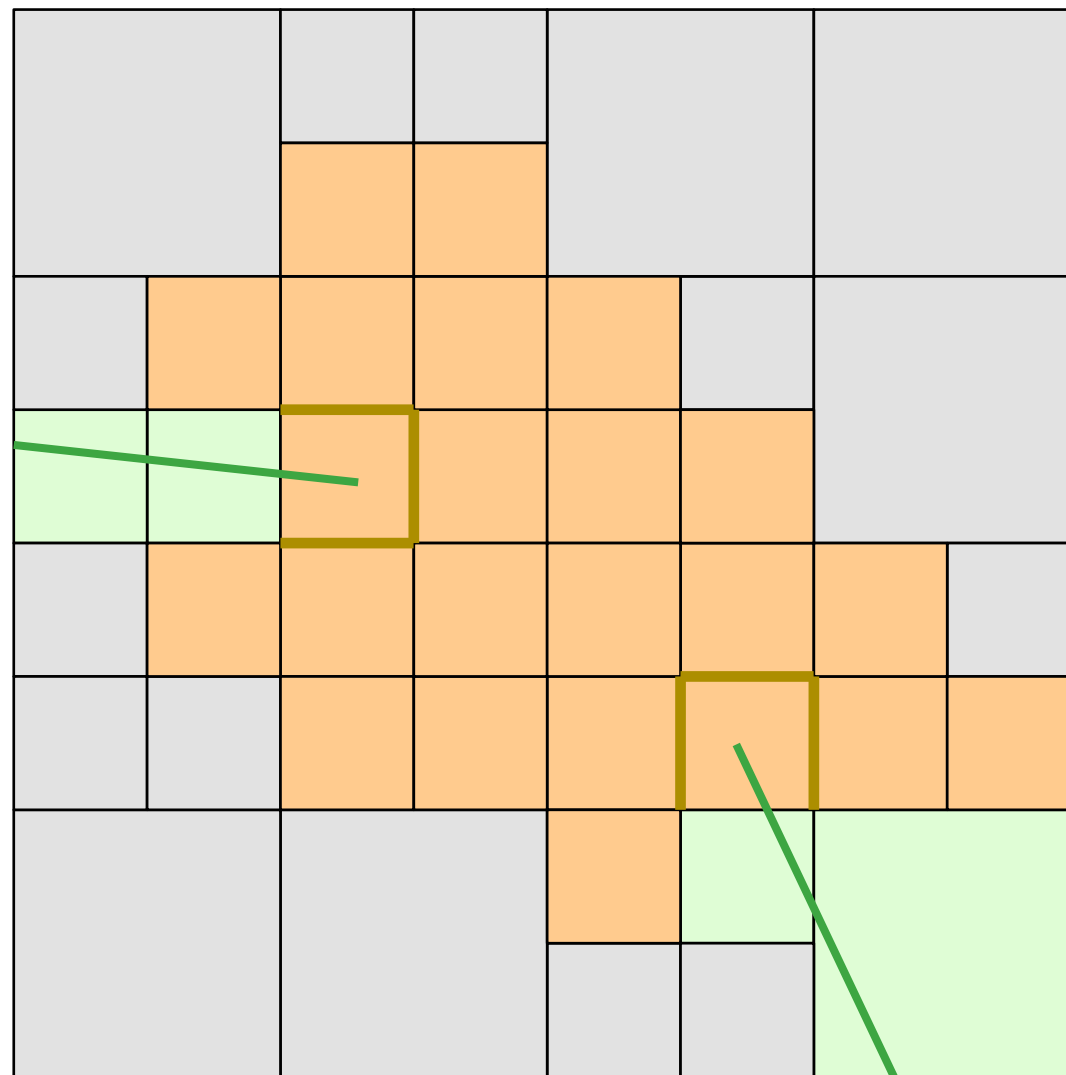
- close gaps by dilating the boundary voxels





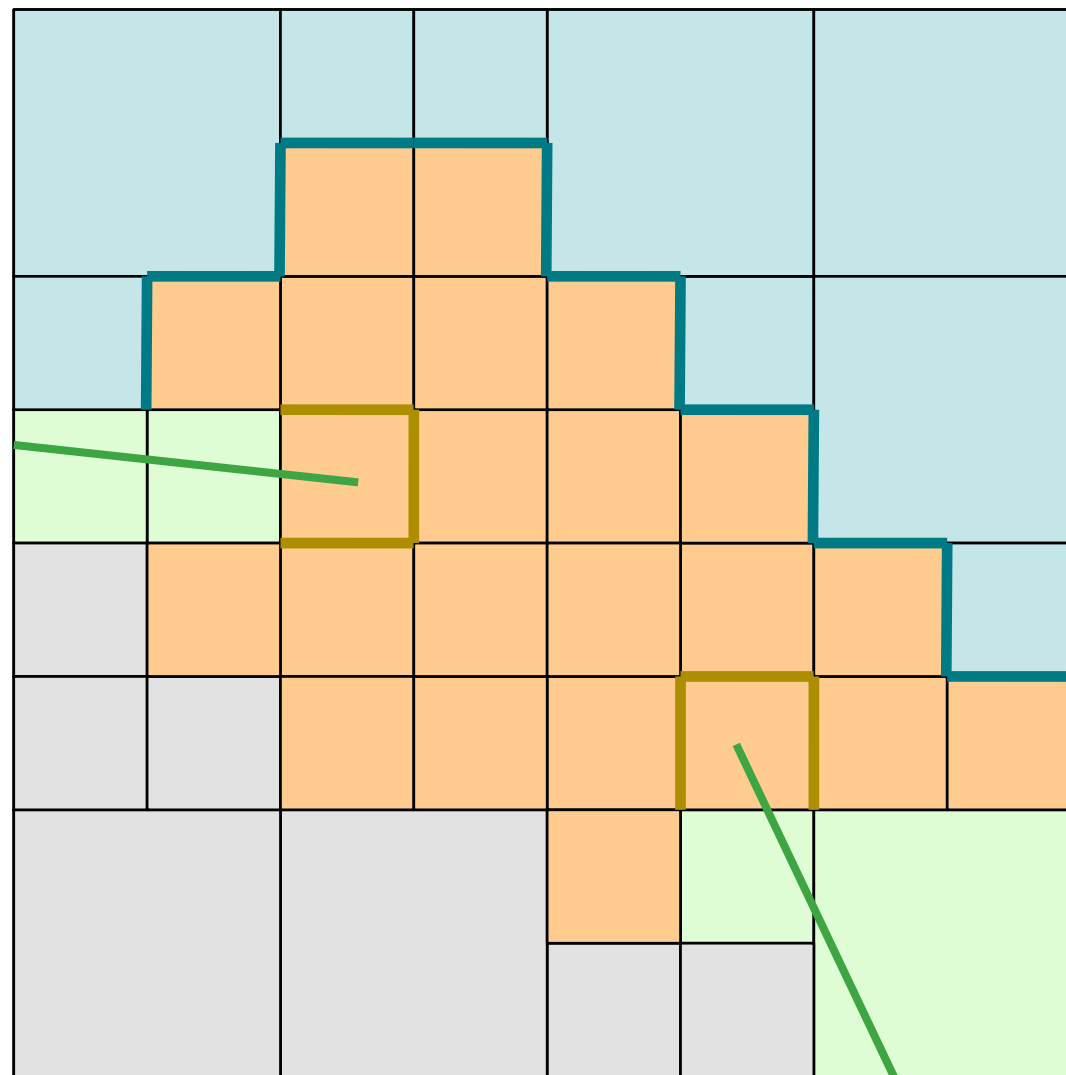
# Determine Exterior

- determine the exterior by flood filling & dilation



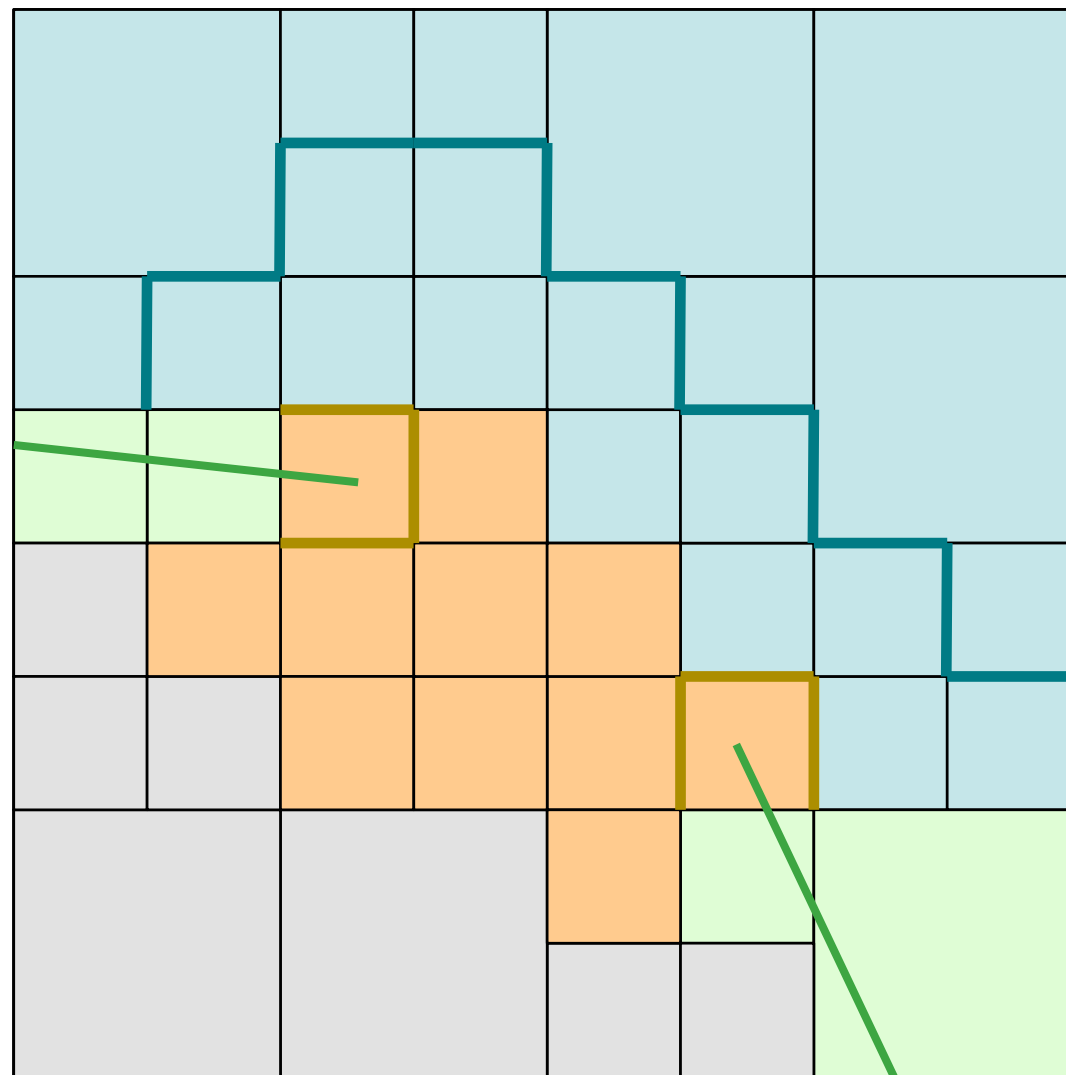
# Determine Exterior

- determine the exterior by flood filling & dilation



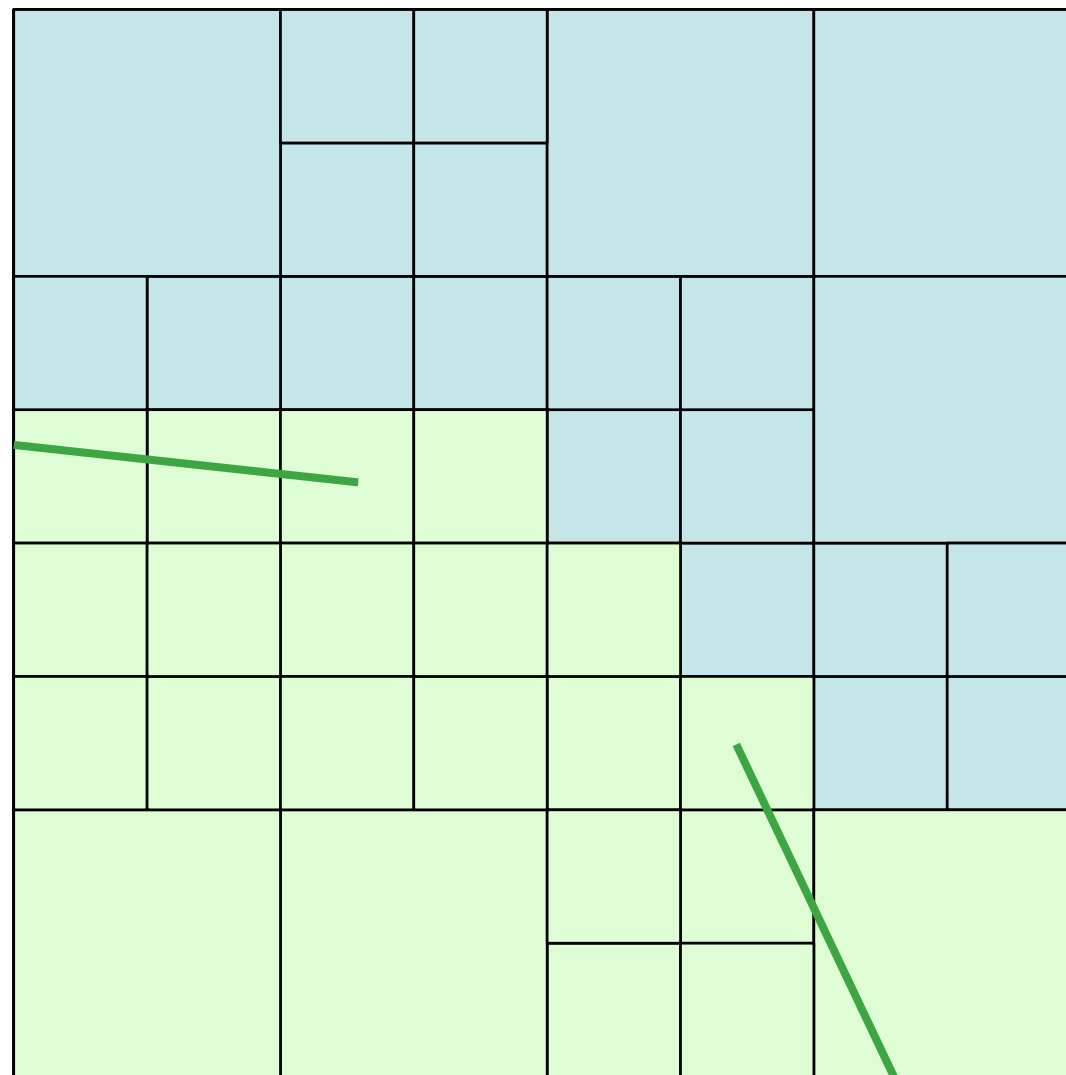
# Determine Exterior

- determine the exterior by flood filling & dilation



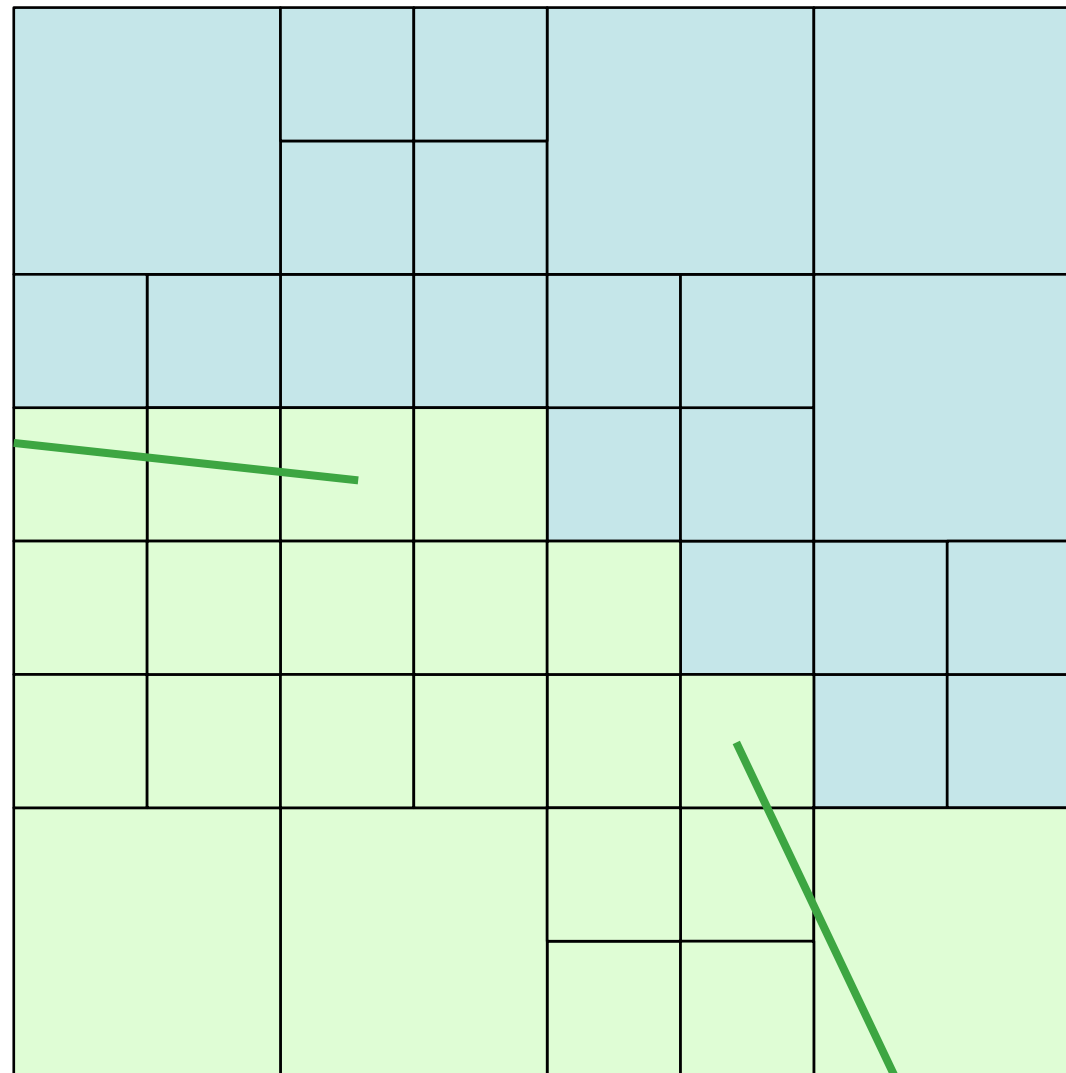
# Determine Exterior

- determine the exterior by flood filling & dilation



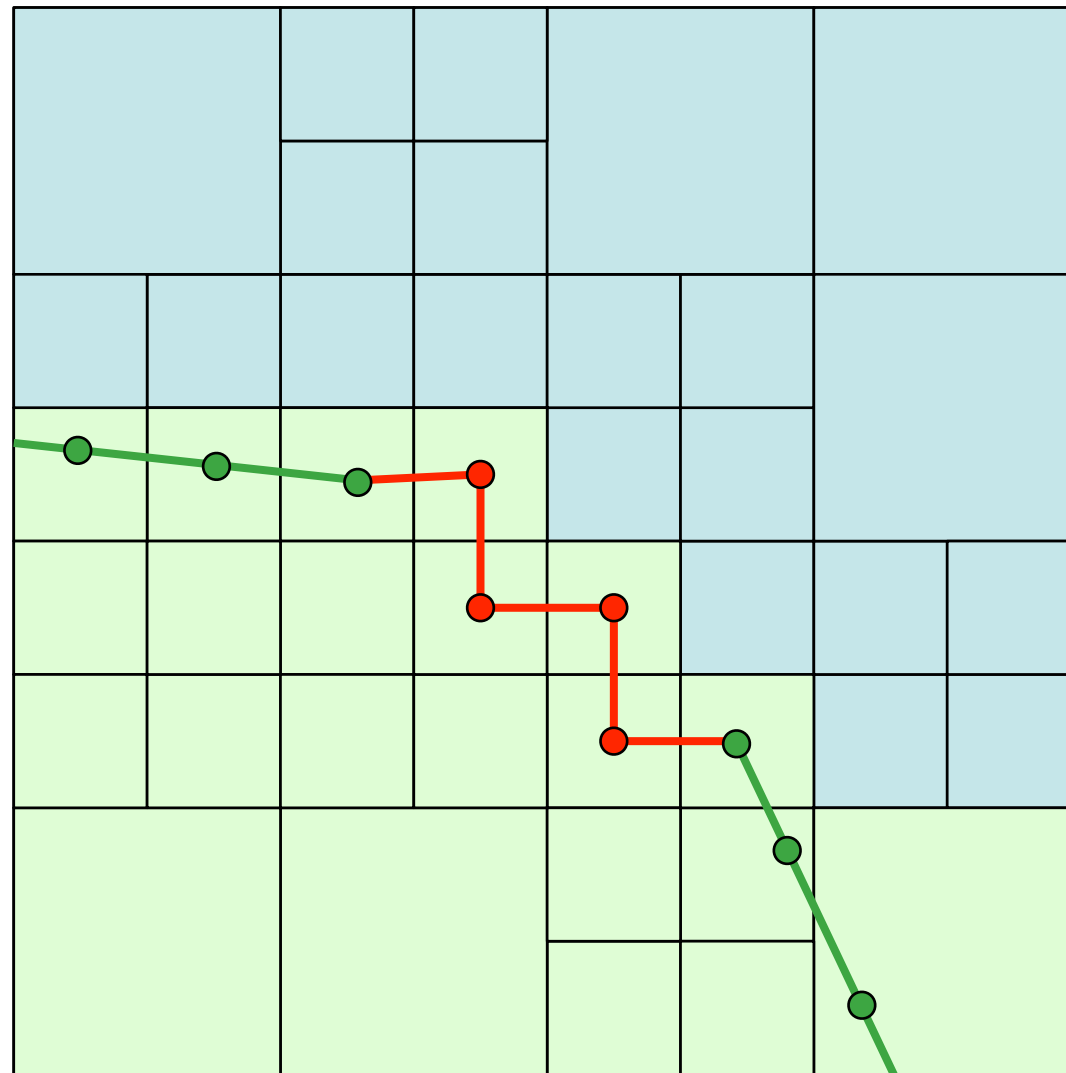
# Extract the Surface

- extract the surface by a variant of Dual Contouring



# Extract the Surface

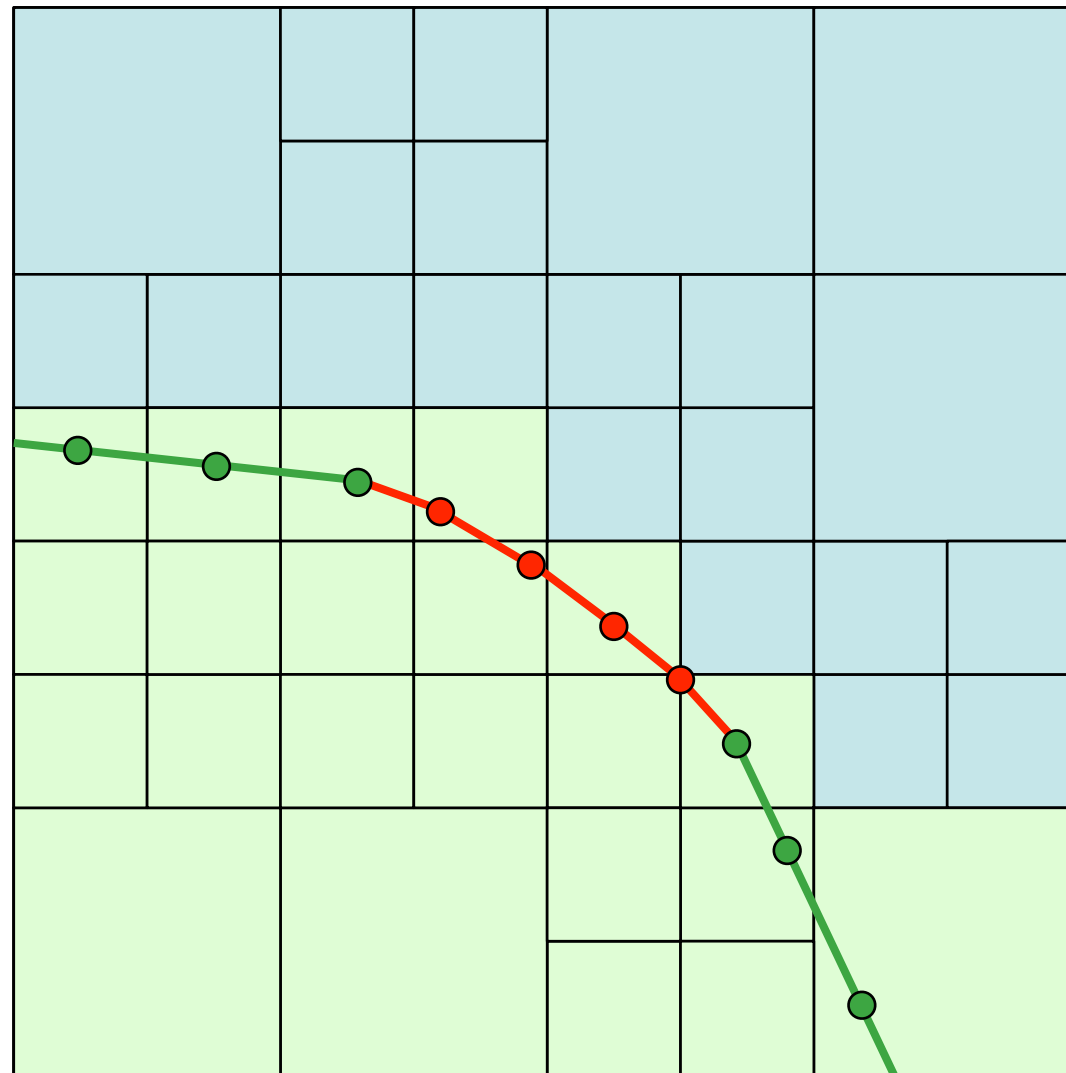
- extract the surface by a variant of Dual Contouring



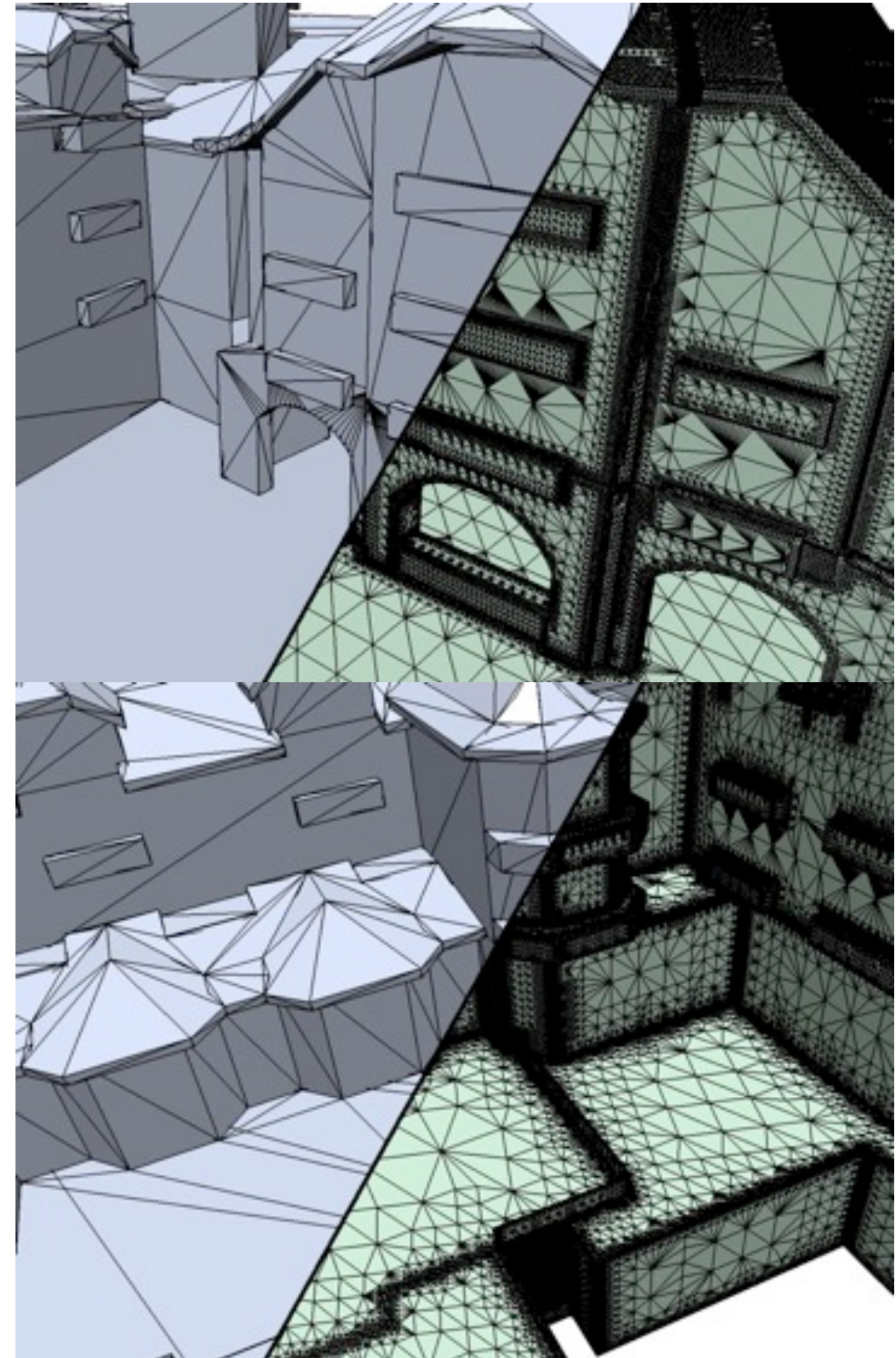
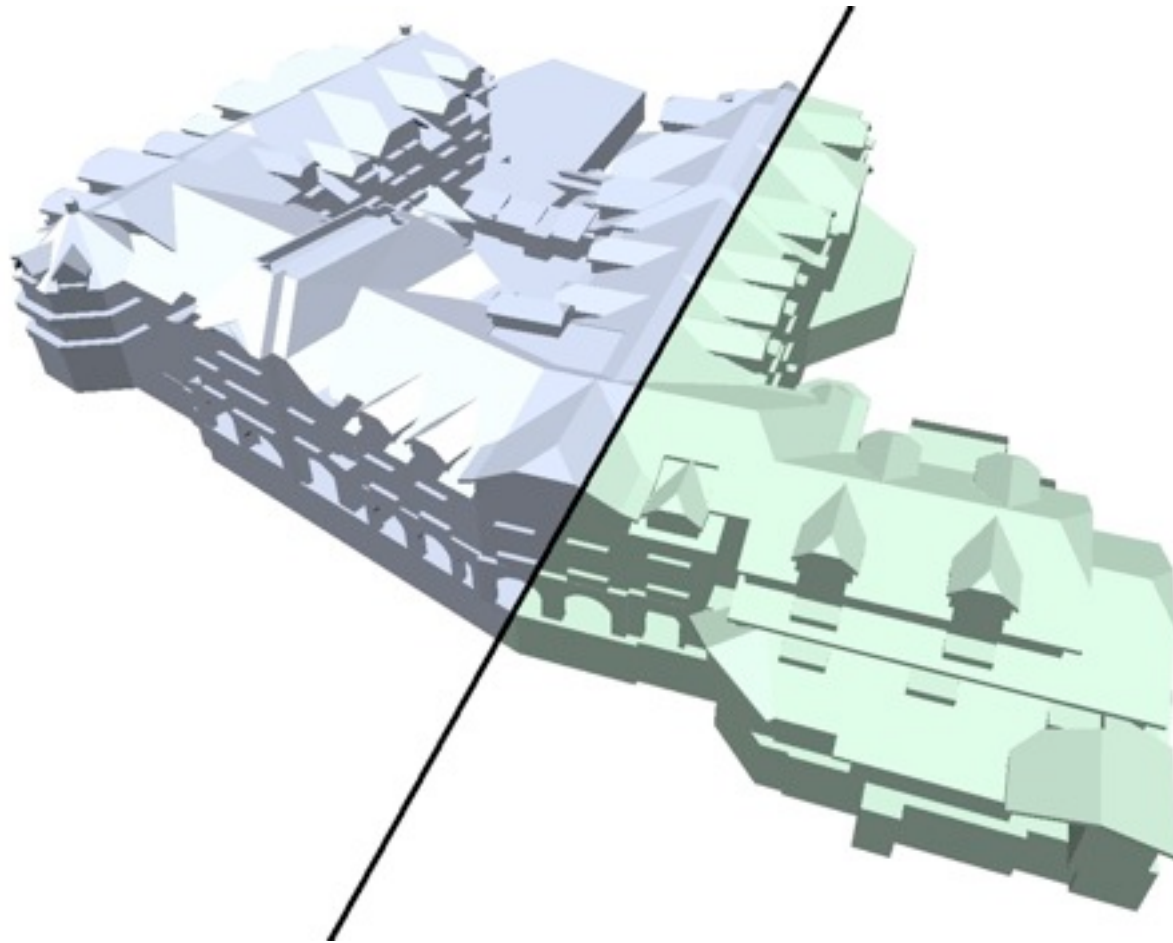


# Extract the Surface

- extract the surface by a variant of Dual Contouring

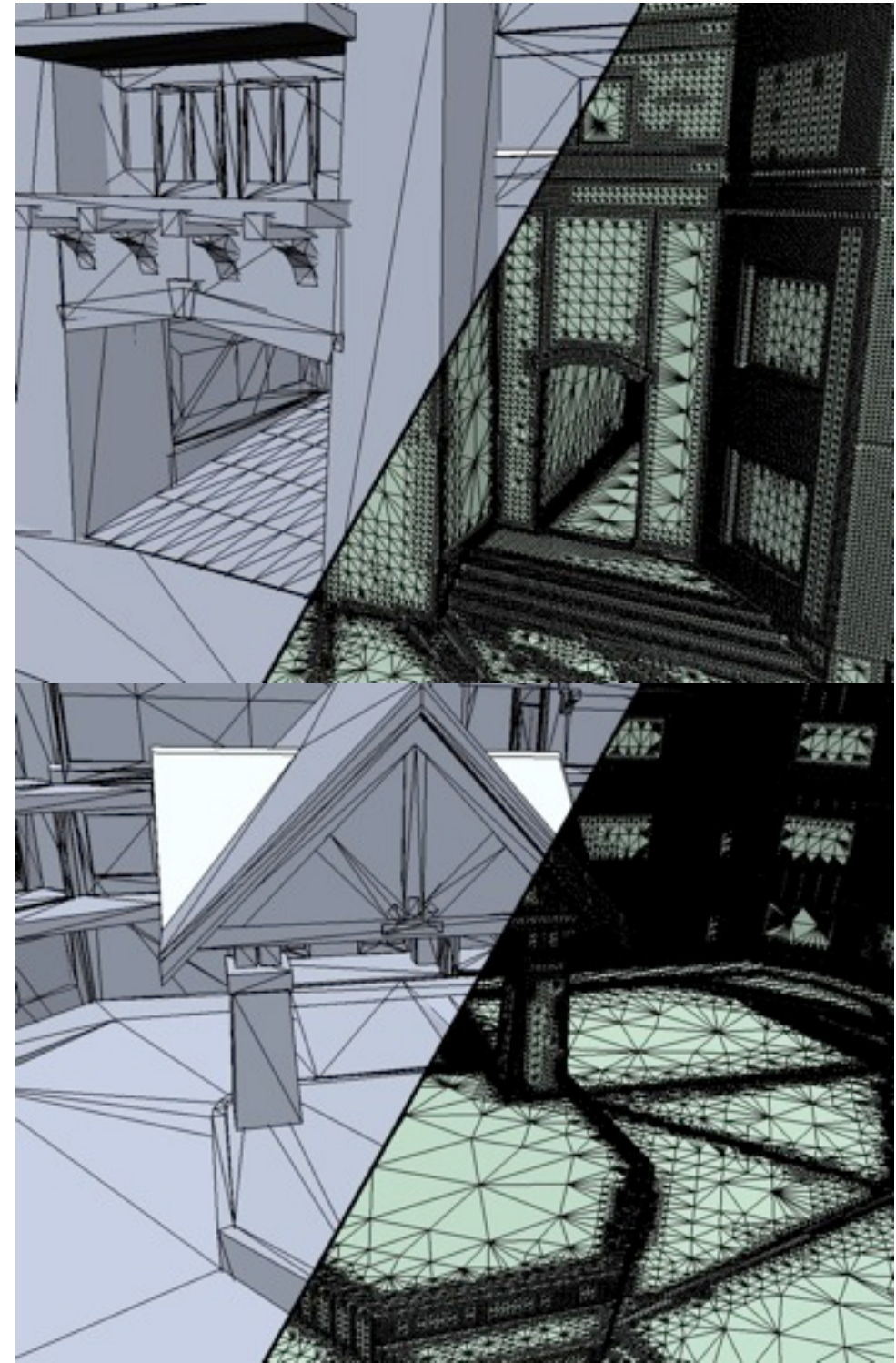
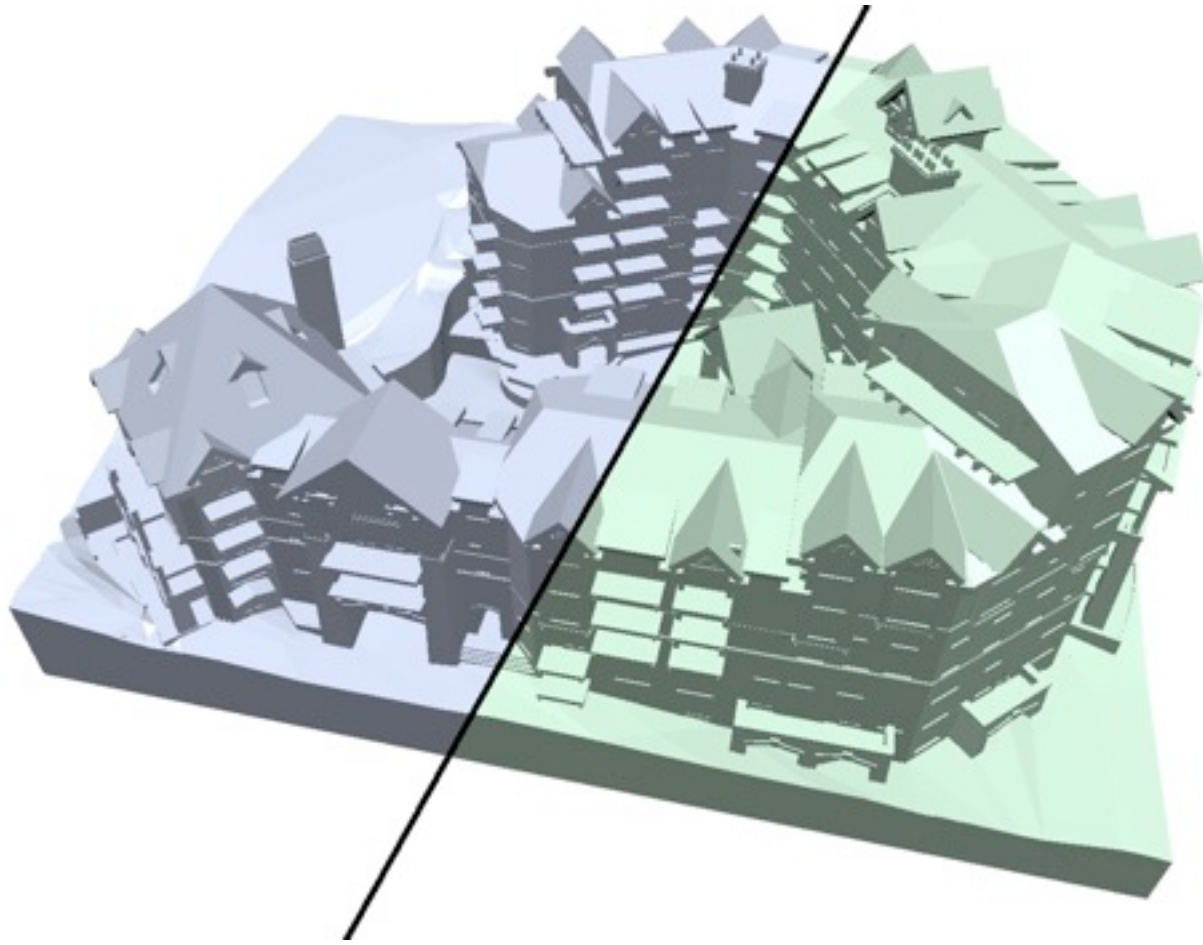


# Results



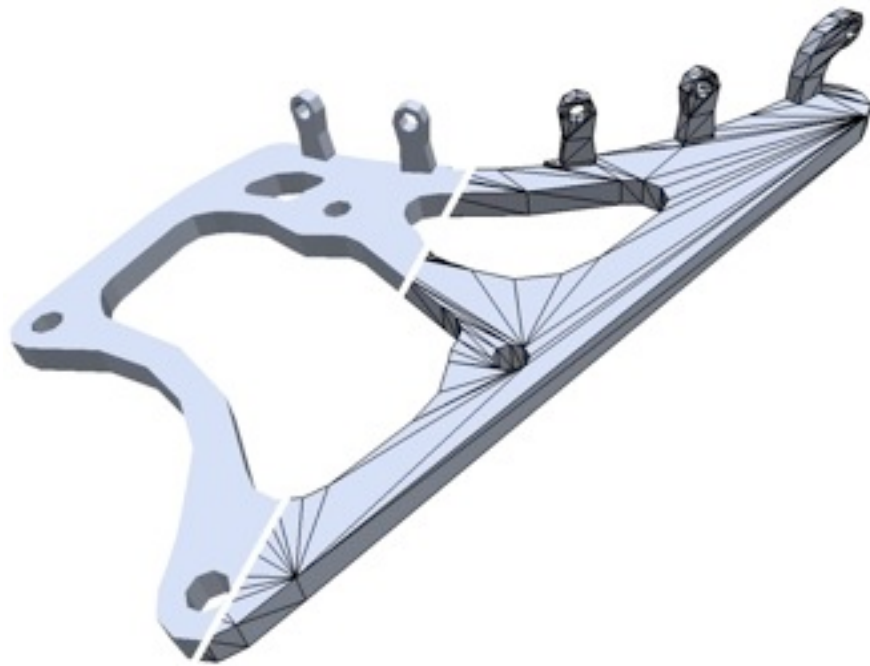


# Results

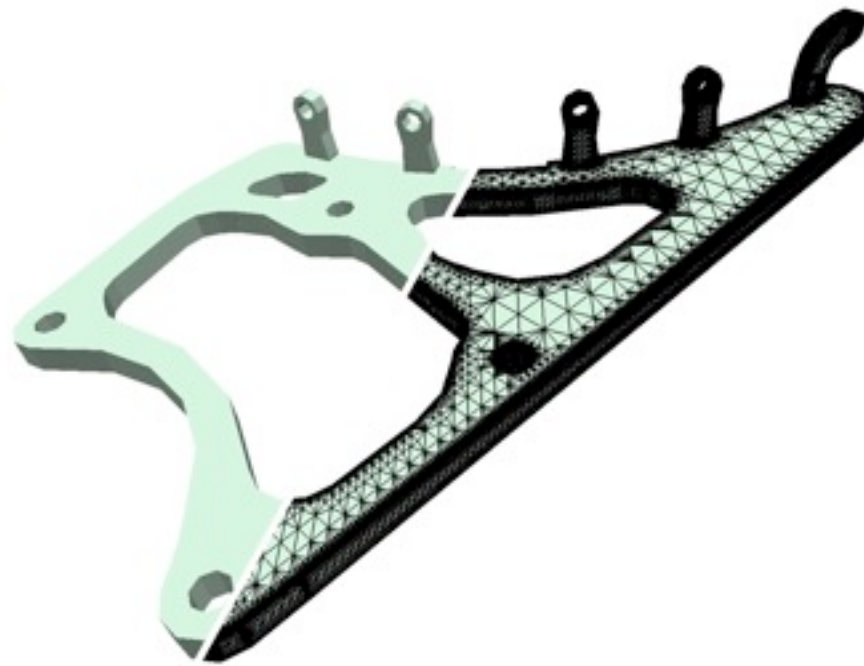


# Results

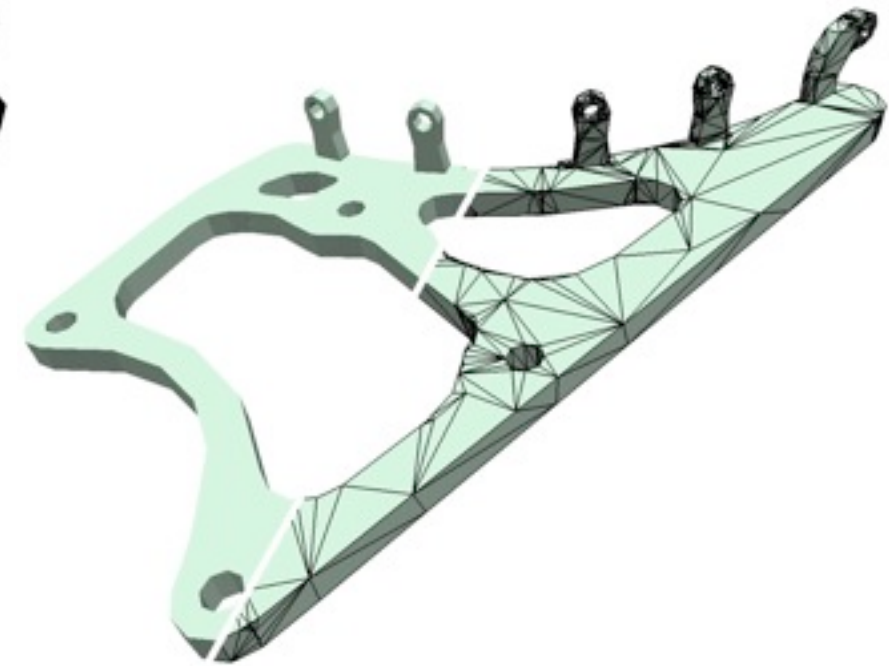
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original  
1124 triangles



reconstruction  
279892 triangles  
(at  $1000^3$ )

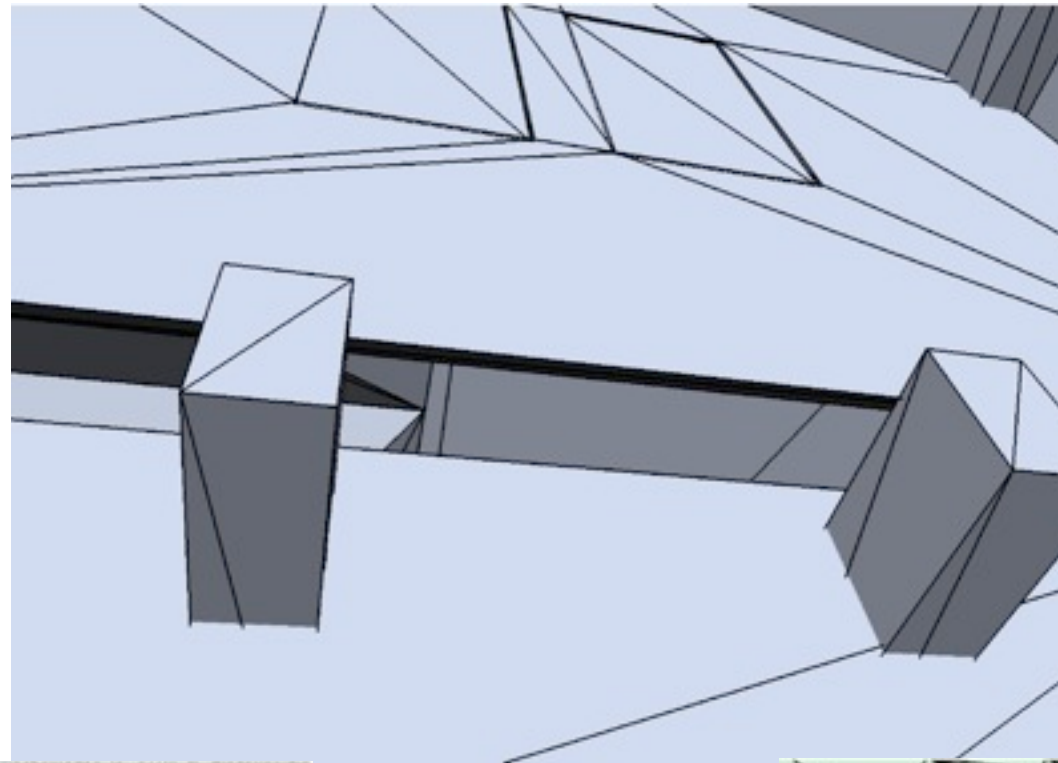
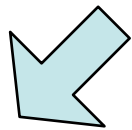


decimated  
7018 triangles

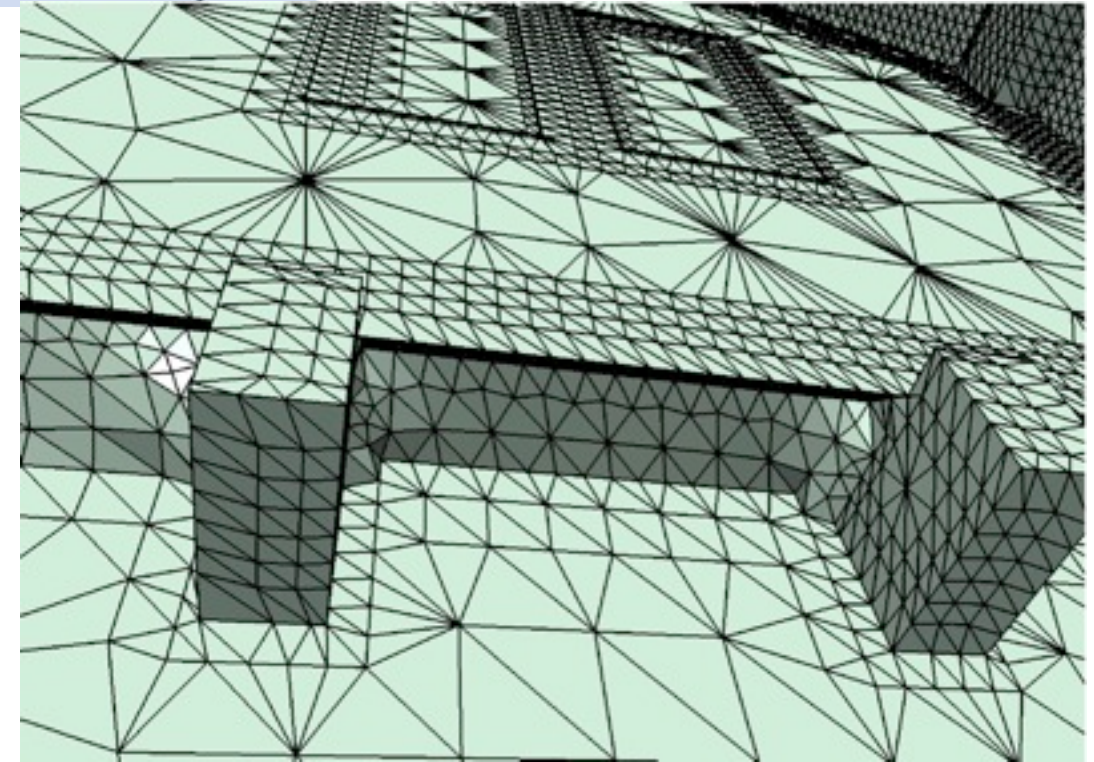
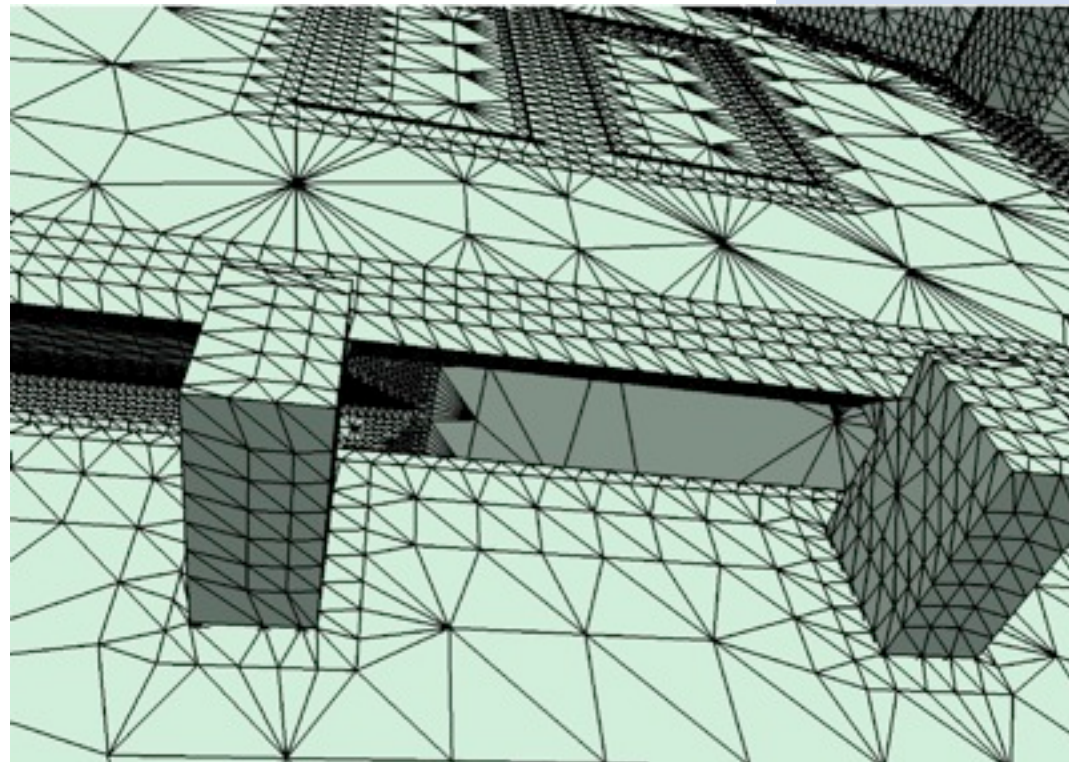
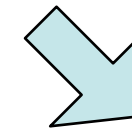


# Results

without  
gap filling

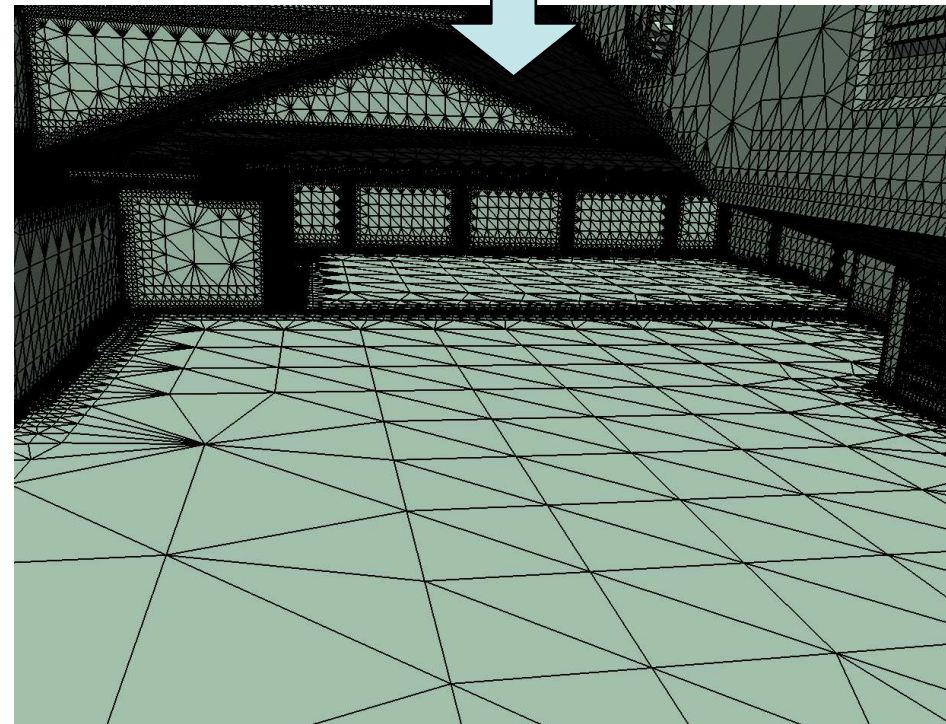
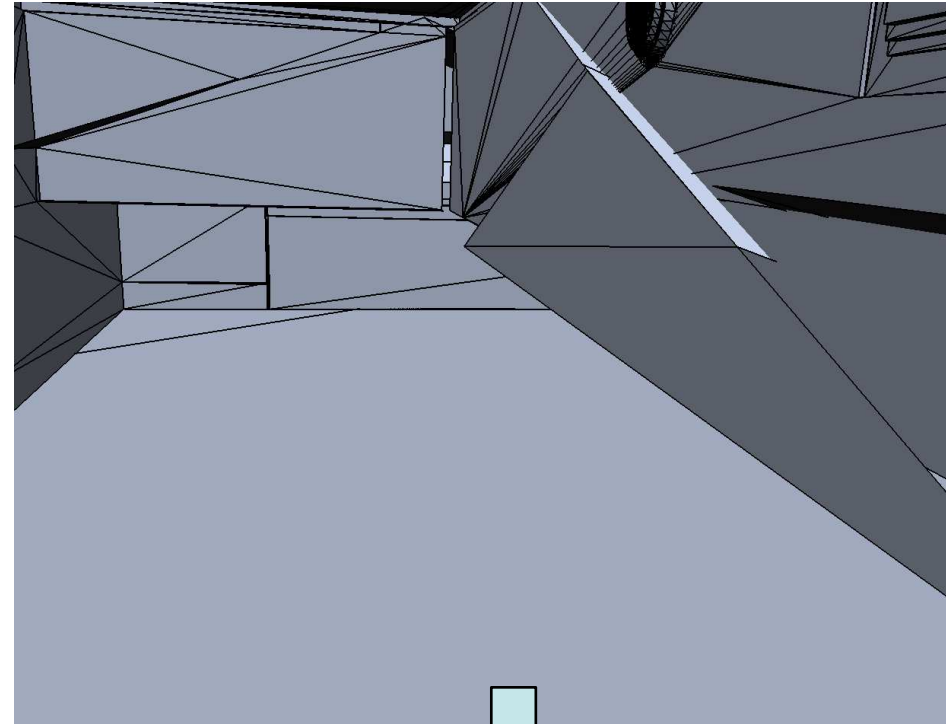
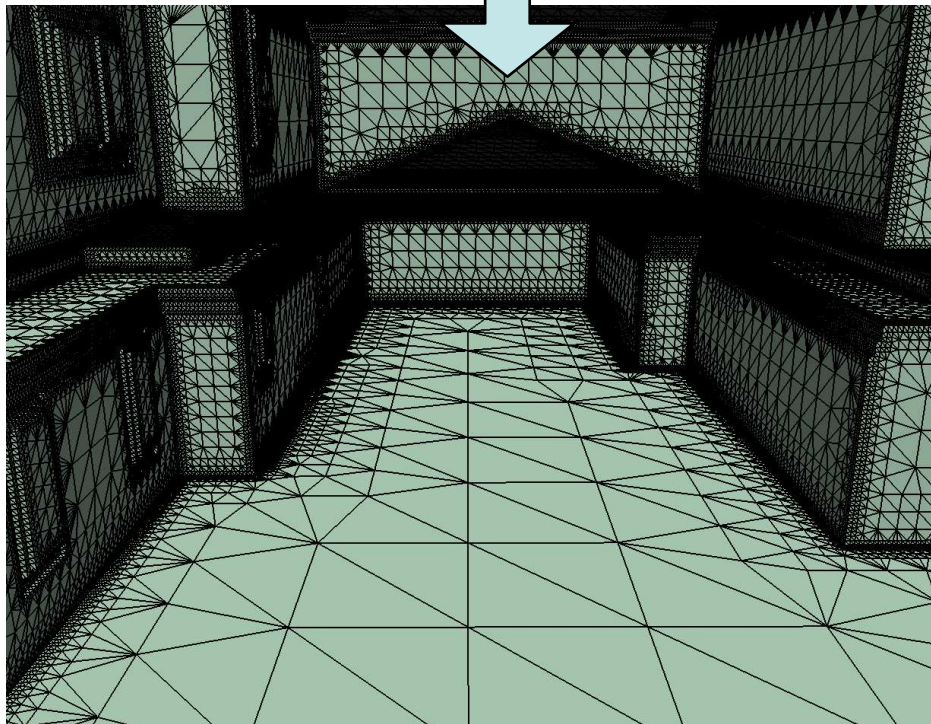
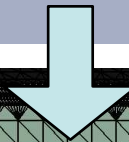
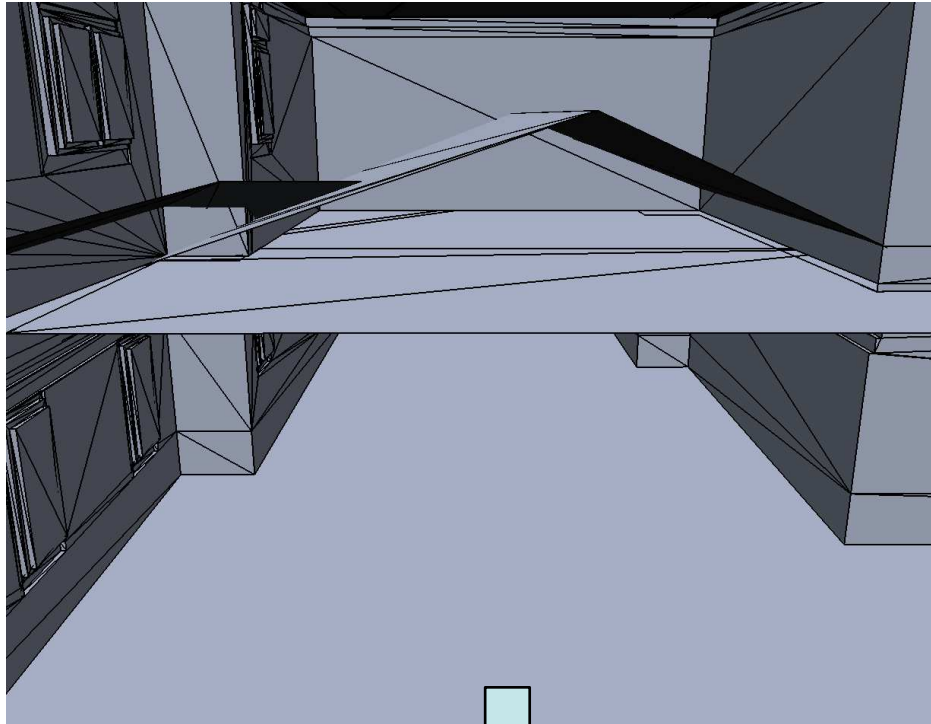


with  
gap filling

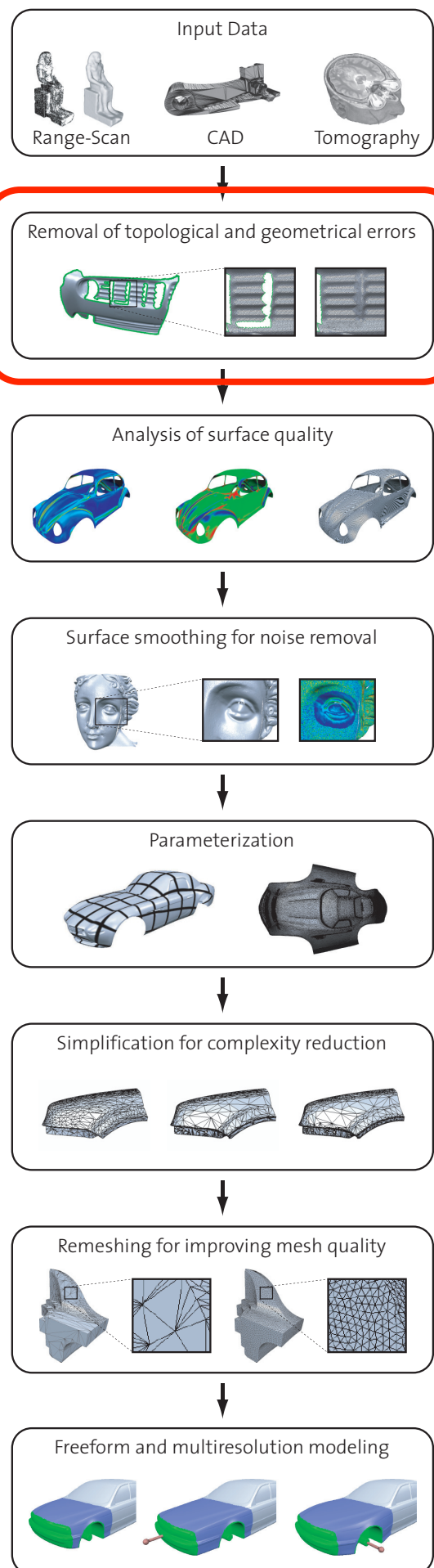




# Results







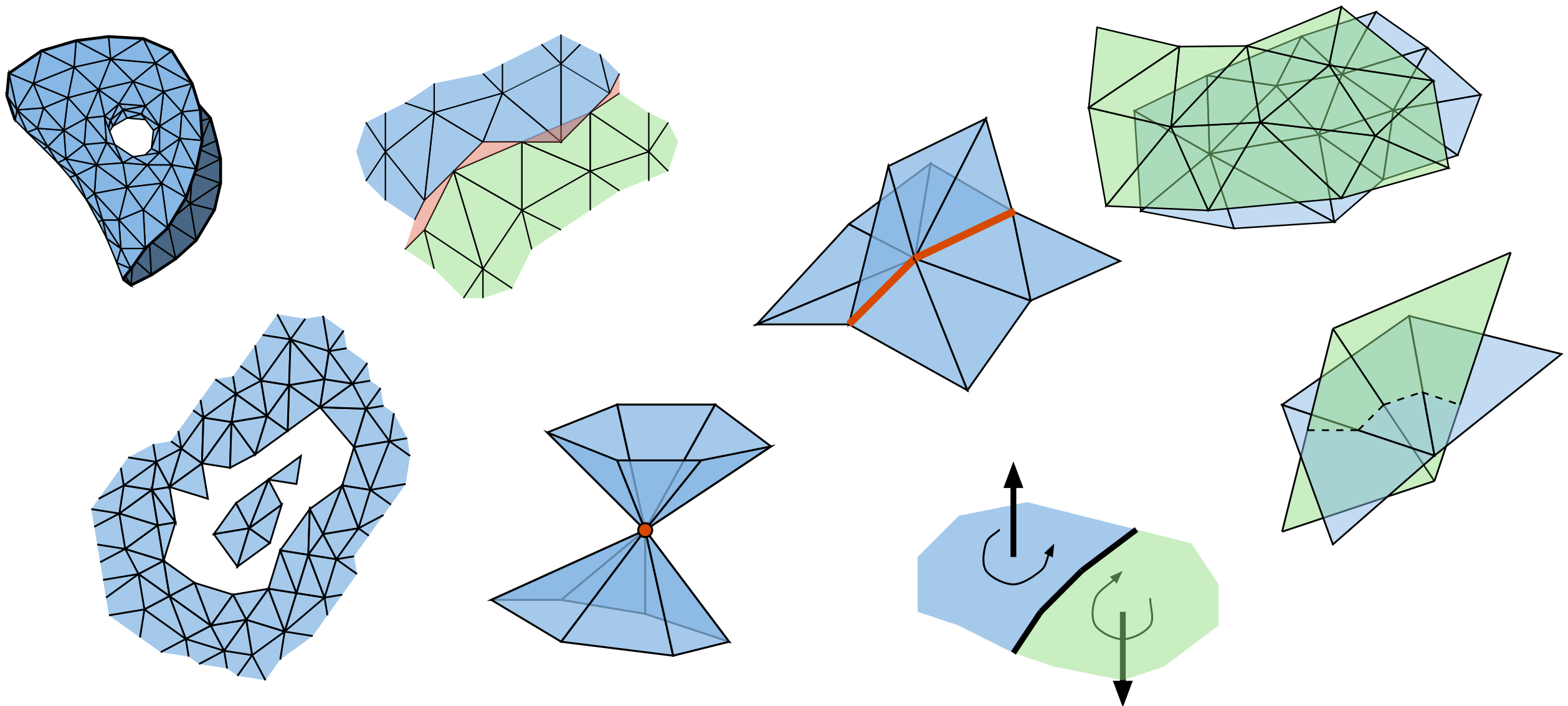
# Model Repair

- types of input
- surface-oriented algorithms
  - Filling holes in meshes [Liepa 2003]
- volumetric algorithms
  - Simplification and repair of polygonal models using volumetric techniques [Nooruddin and Turk 2003]
  - Automatic restoration of polygon models [Bischoff, Pavic, Kobbelt 2005]
- **conclusion & outlook**



# Conclusion

- mesh repair to remove artifacts that arise in various types of input models



# Conclusion

---

- surface-oriented algorithms ...
  - fast, structure preserving
  - often not robust, need user interaction and cannot give quality guarantees on the output
- volumetric algorithms ...
  - use an intermediate volumetric representation and thus produce guaranteed watertight meshes
  - suffer from (topological) sampling problems

# History of Mesh Repair

- Surface-oriented
- Volumetric

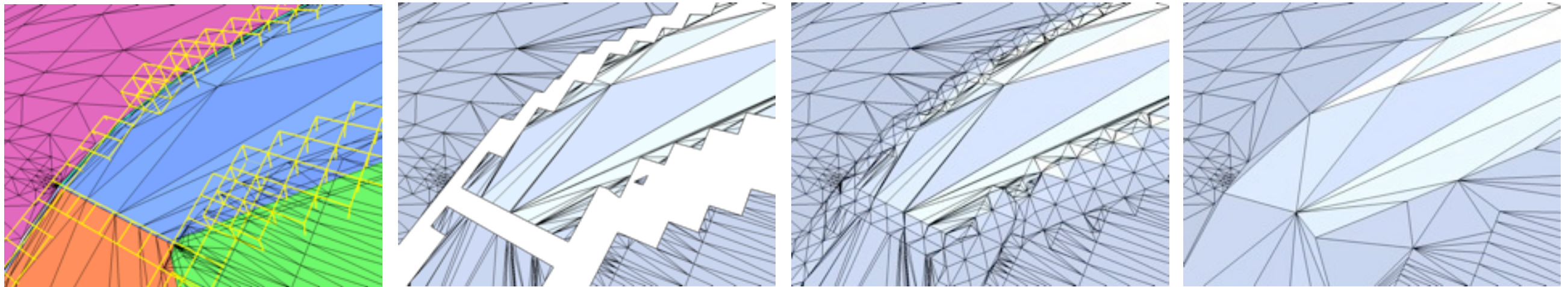
- 
- |  |      |      |
|--|------|------|
| – Bøhn, Wozny: Automatic CAD Model Repair: Shell-Closure.  | 1992 |      |
| – Mäkelä, Dolenc: Some Efficient Procedures for Correcting Triangulated Models.                  |      | 1993 |
| – Turk, Levoy: Zippered Polygon Meshes from Range Images.  | 1994 |      |
| – Barequet, Sharir: Filling Gaps in the Boundary of a Polyhedron.                                |      | 1995 |
| – Curless, Levoy: A Volumetric Method for Building Complex Models from Range Images.             | 1996 |      |
| – Barequet, Kumar: Repairing CAD Models.   | 1997 |      |
| – Murali, Funkhouser: Consistent Solid and Boundary Representations.                             |      | 1997 |
| – Guéziec, Taubin, Lazarus, Horn: Cutting and Stitching: [...]                                   | 2001 |      |
| – Guskov, Wood: Topological Noise Removal.   | 2001 |      |
| – Borodin, Novotni, Klein: Progressive Gap Closing for Mesh Repairing.                           |      | 2002 |
| – Davis, Marschner, Garr, Levoy: Filling Holes in Complex Surfaces Using Volumetric Diffusion.   |      | 2002 |
| – Liepa: Filling Holes in Meshes.  | 2003 |      |
| – Greß, Klein: Efficient Representation and Extraction of 2-Manifold Isosurfaces Using kd-Trees. |      | 2003 |
| – Nooruddin, Turk: Simplification and Repair of Polygonal Models Using Volumetric Techniques.    |      | 2003 |
| – Borodin, Zachmann Klein: Consistent Normal Orientation for Polygonal Meshes.                   |      | 2004 |
| – Ju: Robust Repair of Polygonal Models.   |      | 2004 |
| – Bischoff, Pavic, Kobbelt: Automatic Restoration of Polygon Models.                             |      | 2005 |
| – Podolak, Rusinkiewicz: Atomic Volumes for Mesh Completion.                                     | 2005 |      |
| – Shen, O'Brien, Shewchuk: Interpolating and Approximating Implicit Surfaces from Polygon Soup.  |      | 2005 |
- 



# Outlook

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- **hybrid** algorithms that are ...
  - ... robust and
  - ... structure preserving



- Bischoff, Kobbelt: *Structure Preserving CAD Model Repair*. Eurographics 2005