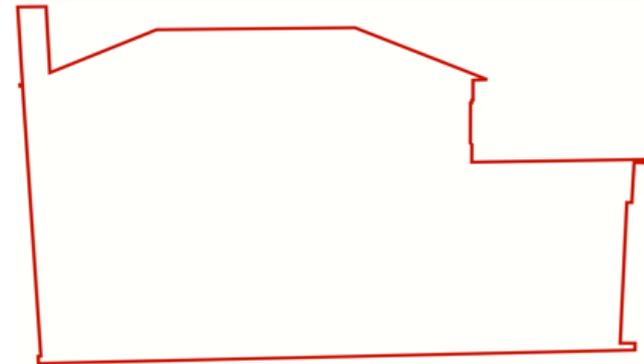
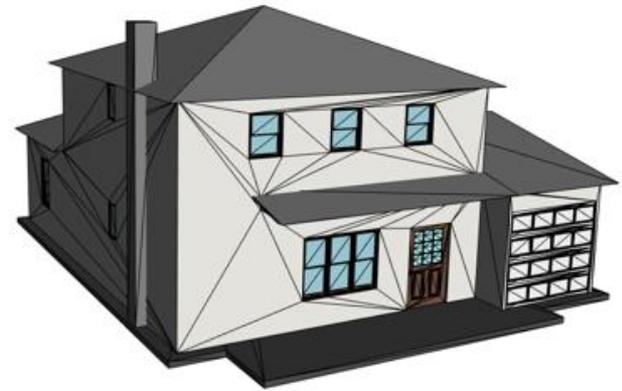


# Robust Interior-Exterior Classification For 3D Models

Nikolaos Tzounakos

Mentor #1: Liangliang Nan

Mentor #2: Hugo Ledoux



# Contents

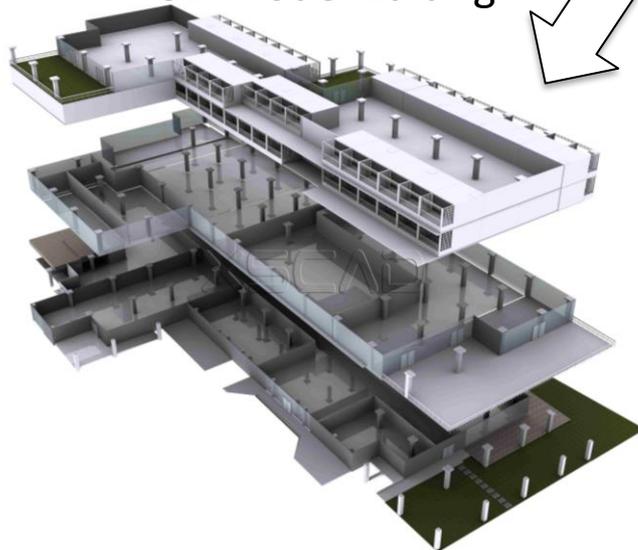
- **Motivation**
- Research Question
- Related Work
- Methodology
- Results
- Conclusions

# Motivation

3D Model



3D Model Editing

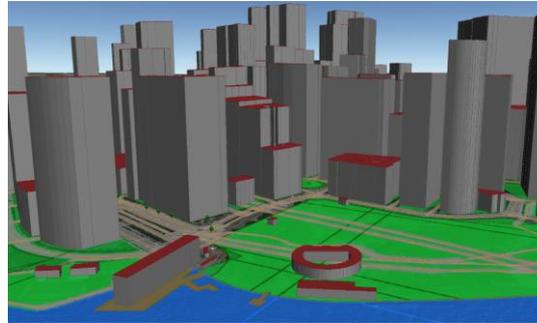


3D Printing



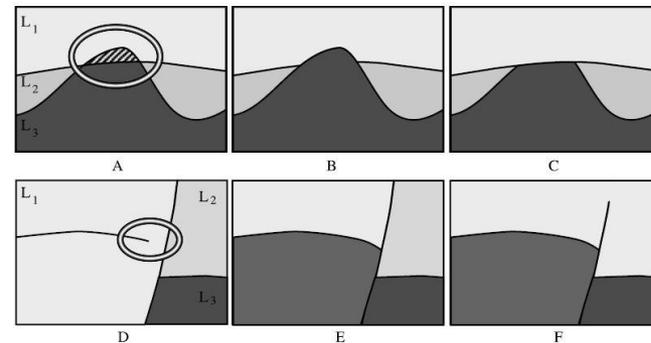
# Motivation

- CityGML models



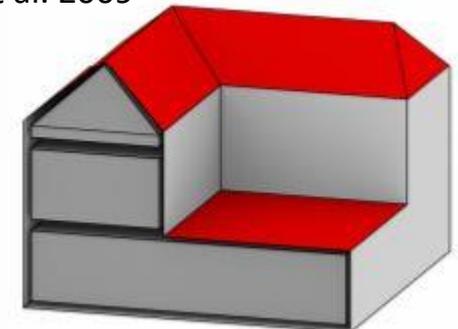
Technische Universität München

- Geology studies



Caumon et al. 2009

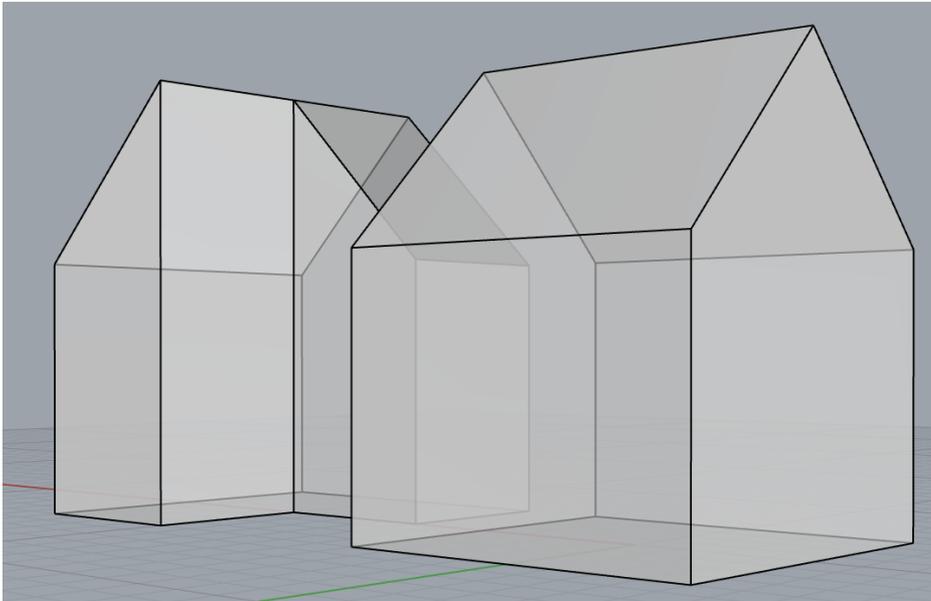
- Calculate tax based on property's area



Boeters et al. 2015

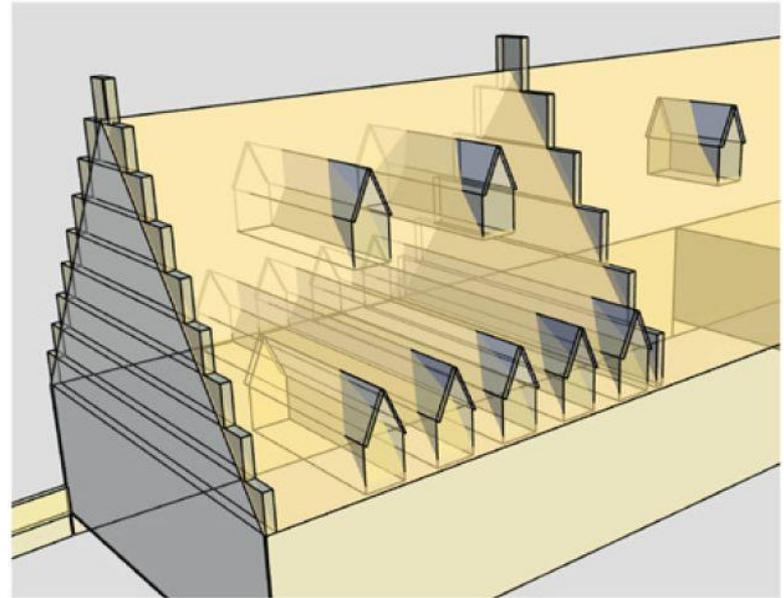
# Motivation

## Clean Model



Sondermann, 2018

## Not Clean Model

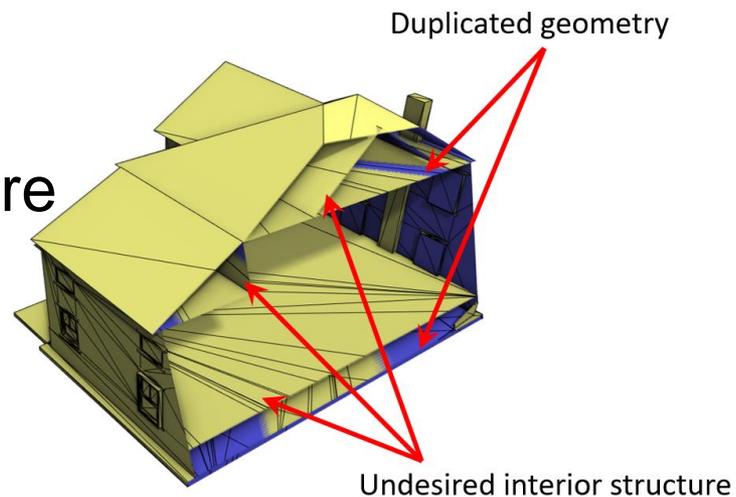
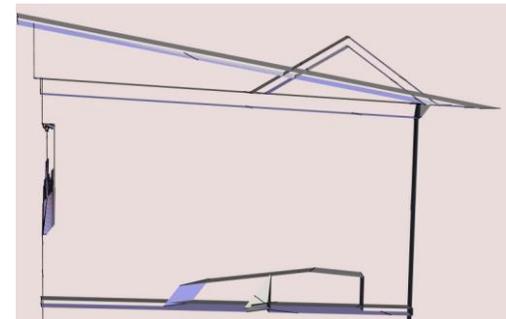
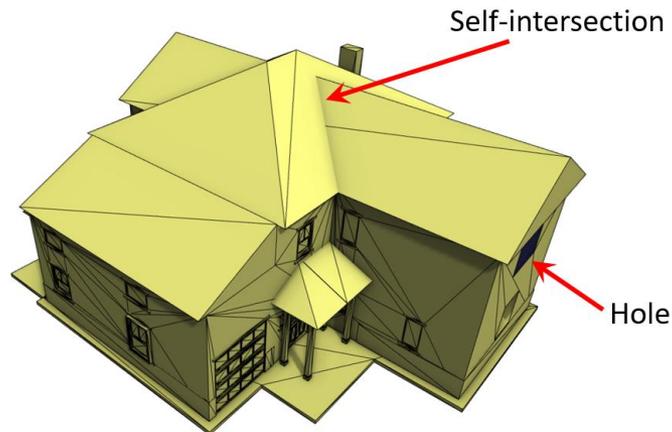


Nagel et al. 2009

# Motivation

## 3D Models Contain Deficiencies

- Holes
- Self-intersections
- Non-manifold edges
- Undesired Interior Structure
- Etc.



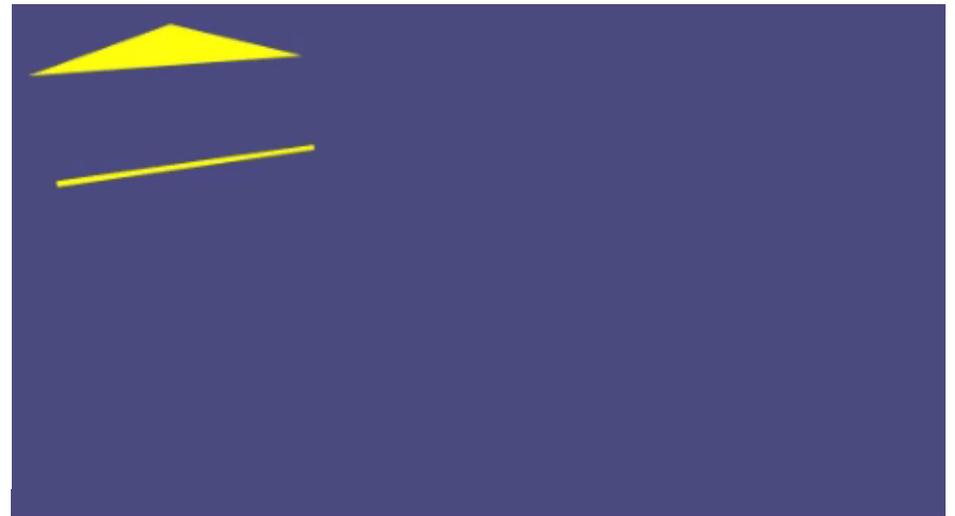
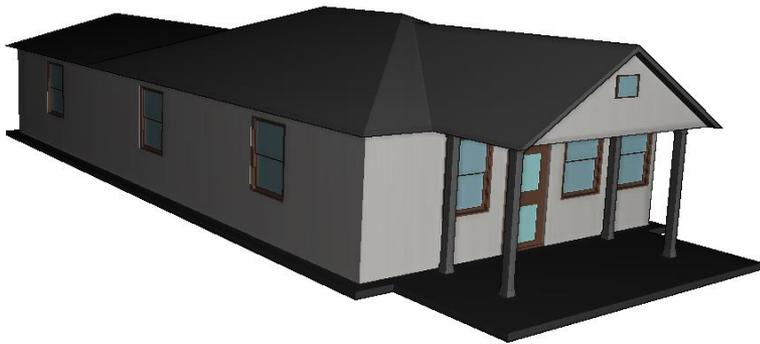
# Contents

- Motivation
- **Research Question**
- Related Work
- Methodology
- Results
- Conclusions

# Research Question

## Generalized problem: **Interior-Exterior Classification for 3D Models**

Reason: Fundamental problem!



# Contents

- Motivation
- Research Question
- **Related Work**
- Methodology
- Results
- Conclusions

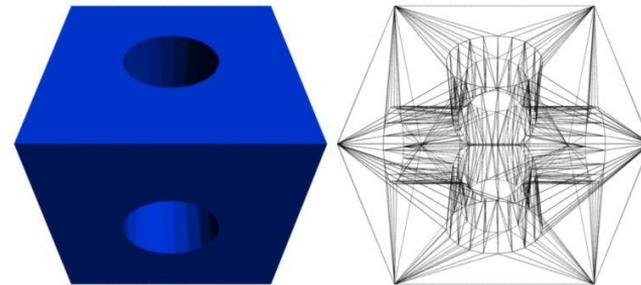
# Related Work

- Geometric / Thematic Process



Donkers *et al.*, 2015

- Direction Vectors

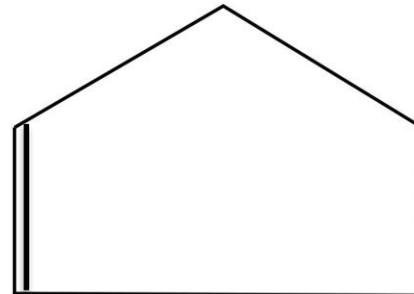


Nooruddin *et al.*, 2000

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## Limitations

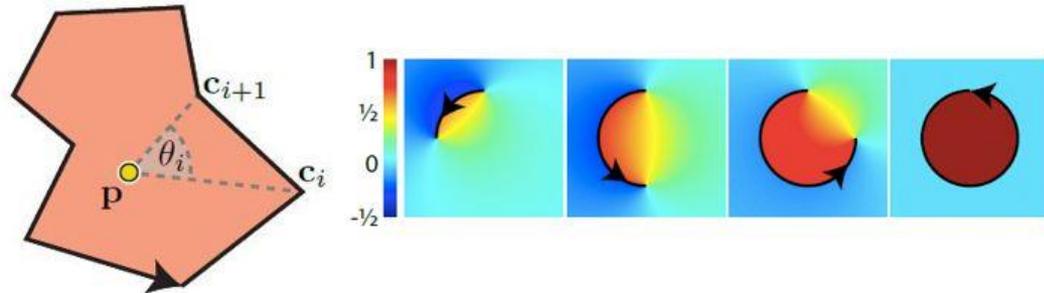
- Duplicate geometry
- Holes



# Related Work

- Winding Number

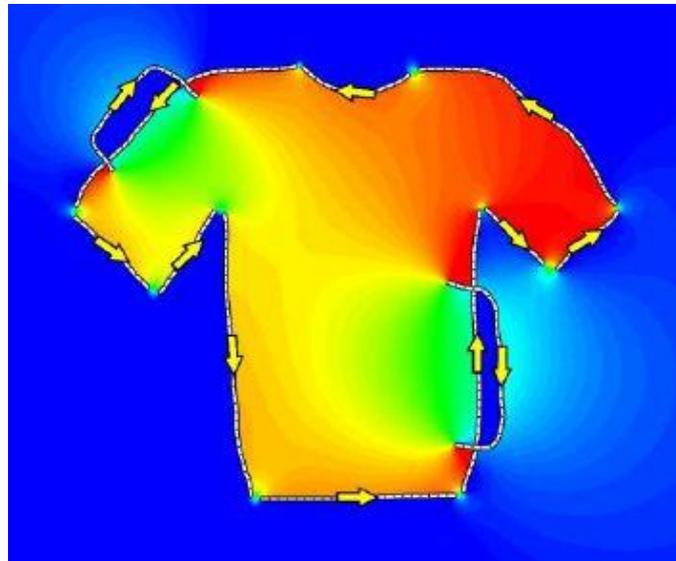
$$w_p = \frac{1}{2\pi} \sum_i^n \theta_i$$



Jacobson *et al.*, 2013

## Limitations

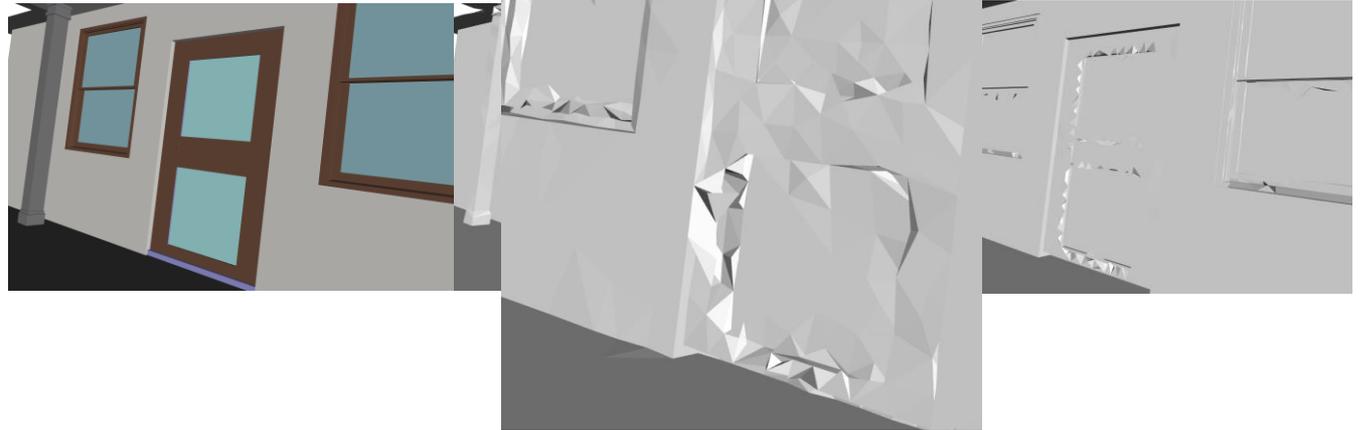
- No reliable existing 3D Constrained Delaunay Triangulation
- Dependent on consistent orientation



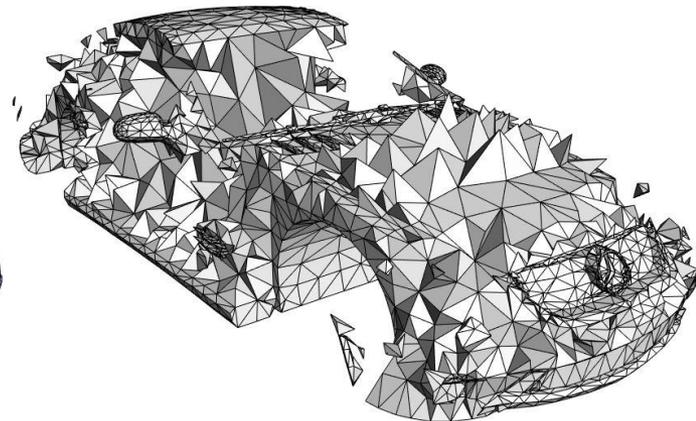
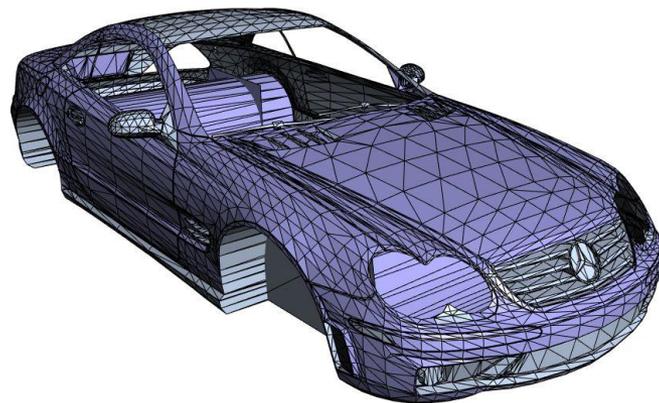
# Related Work

## Limitations

- Altered Geometry



- Computationally Demanding



# Contents

- Motivation
- Research Question
- Related Work
- **Methodology**
- Results
- Conclusions

# Methodology

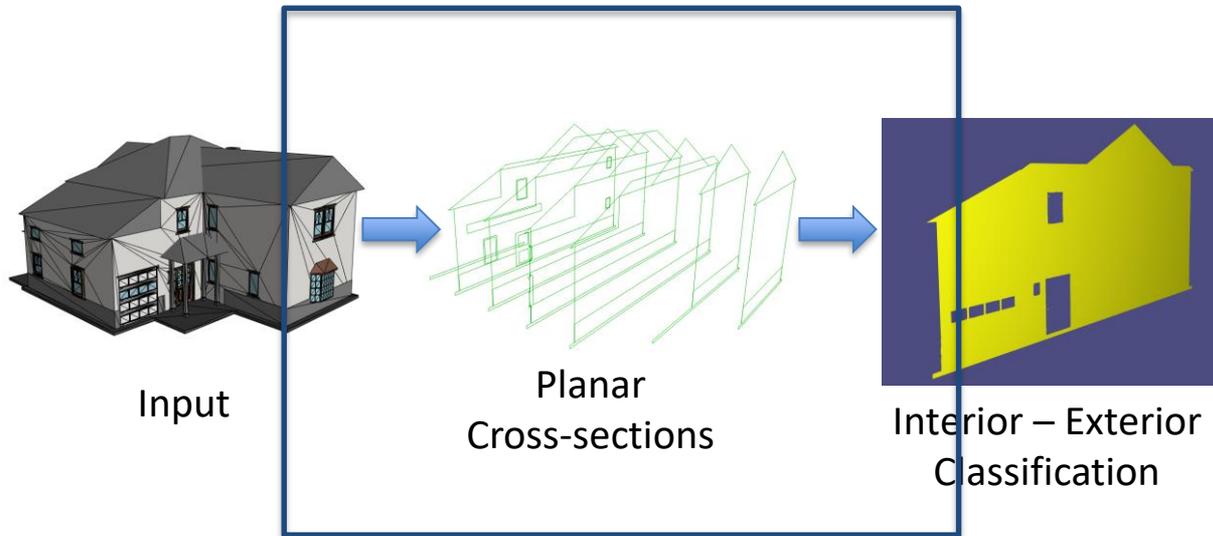
**Idea: Working on Planar Cross-Sections**  
**Transform the problem into 2D**

Requirements:

- Robust and reliable
- Can handle arbitrarily complex cross-sections
- Can preserve finer details

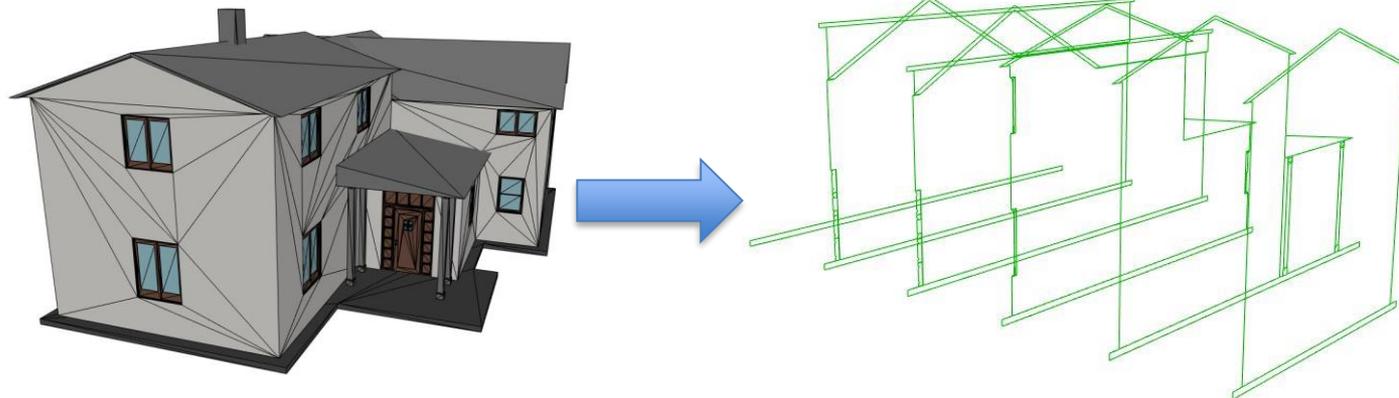
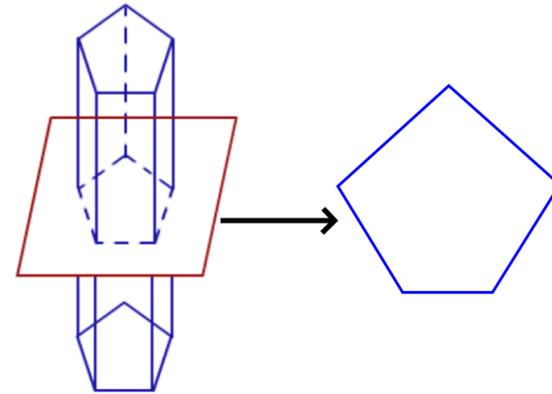
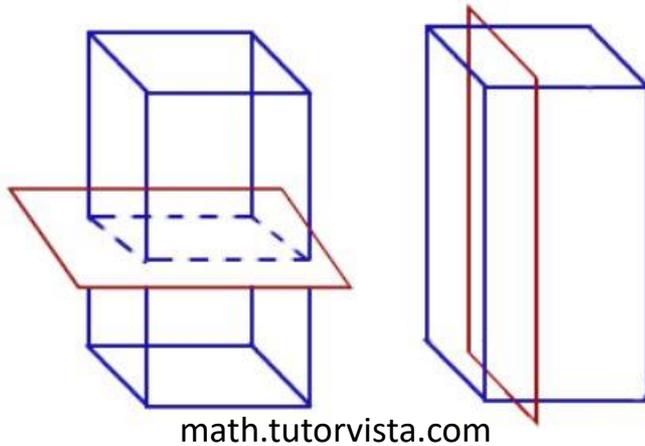
# Methodology

## Overview

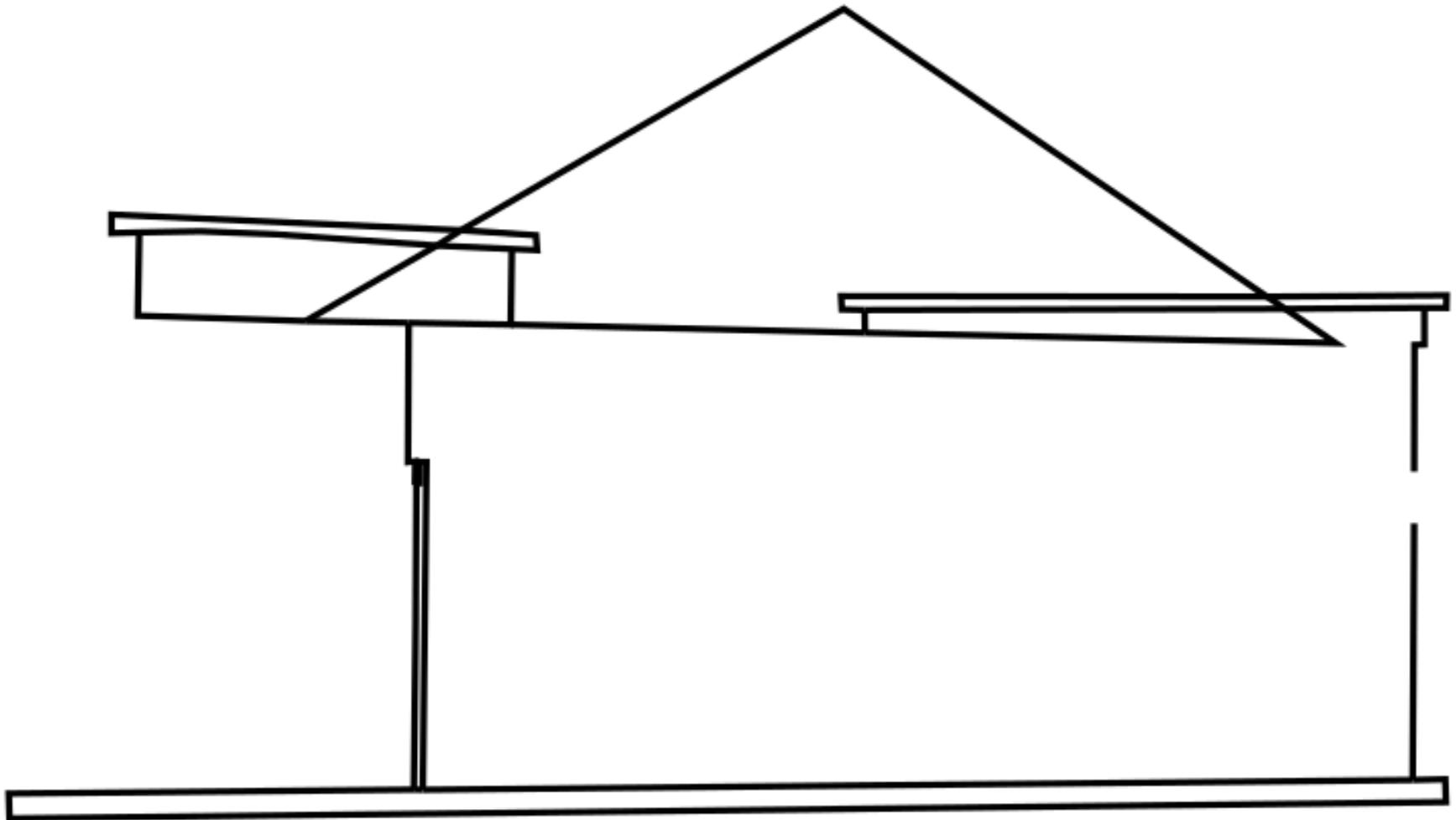


# Methodology

- Planar cross-sections

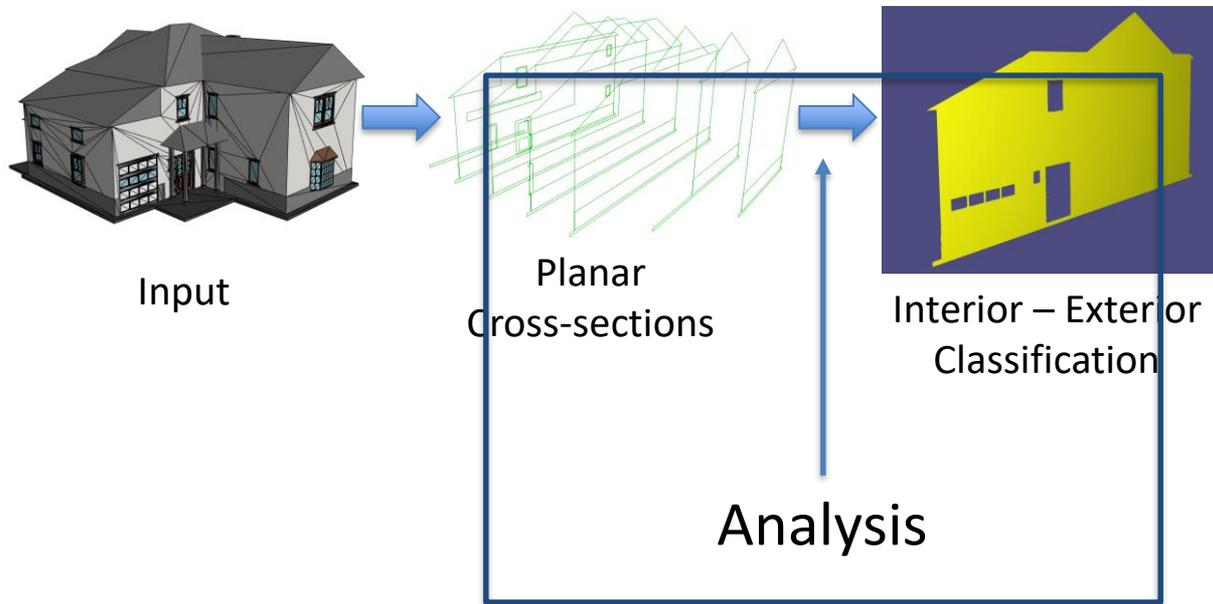


# Methodology



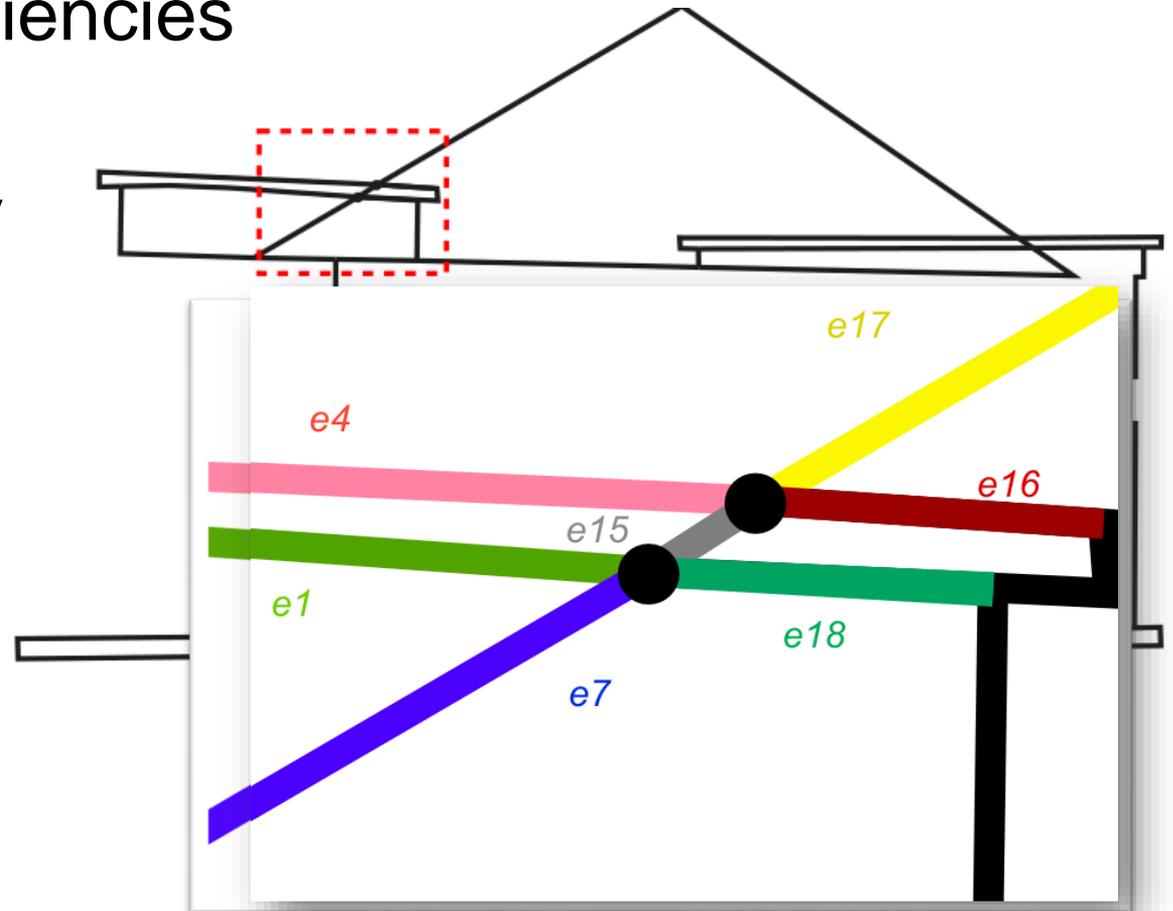
# Methodology

## Overview



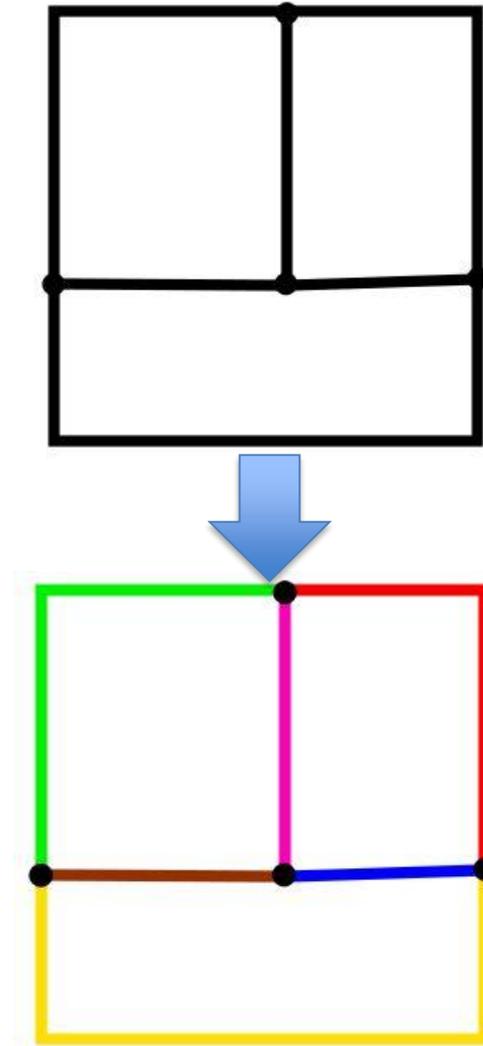
# Methodology

- Remove Deficiencies
- Duplicate Geometry
- Self-Intersections



# Methodology

- Structure the cross-sections into connected components
- Construct components made of multiple line-segments.
- Reduce/ Simplify future computations



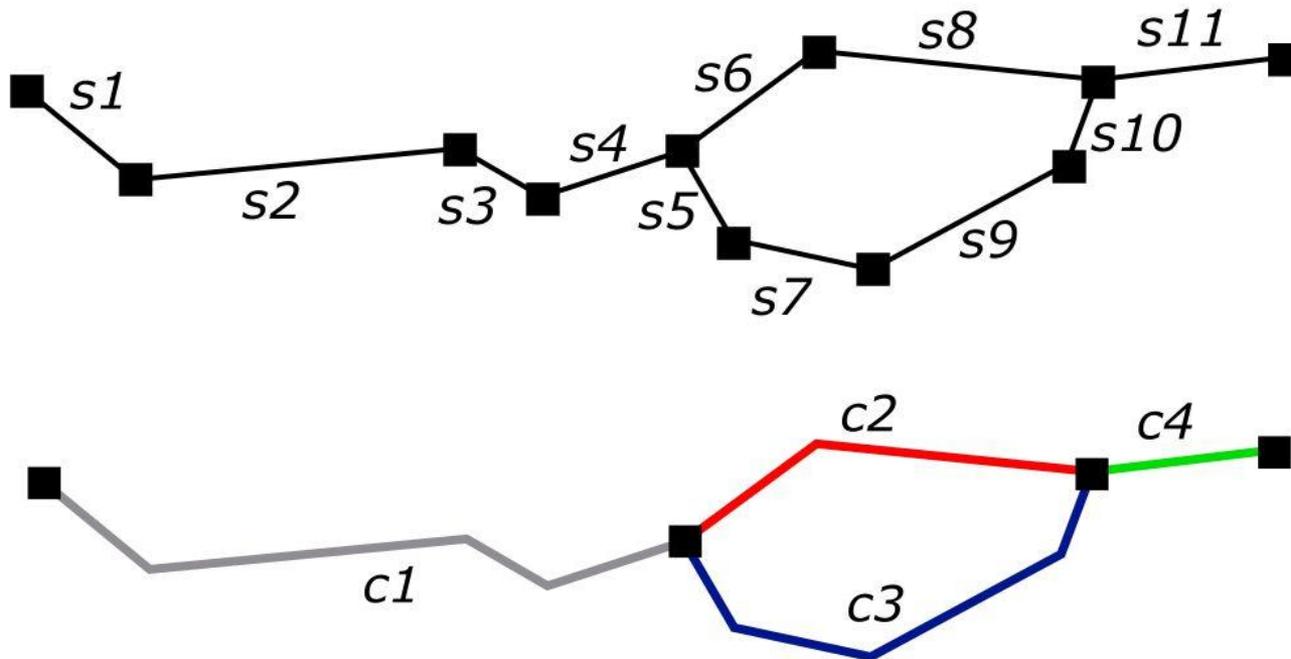
# Methodology

Reason

Connected components simplify computations

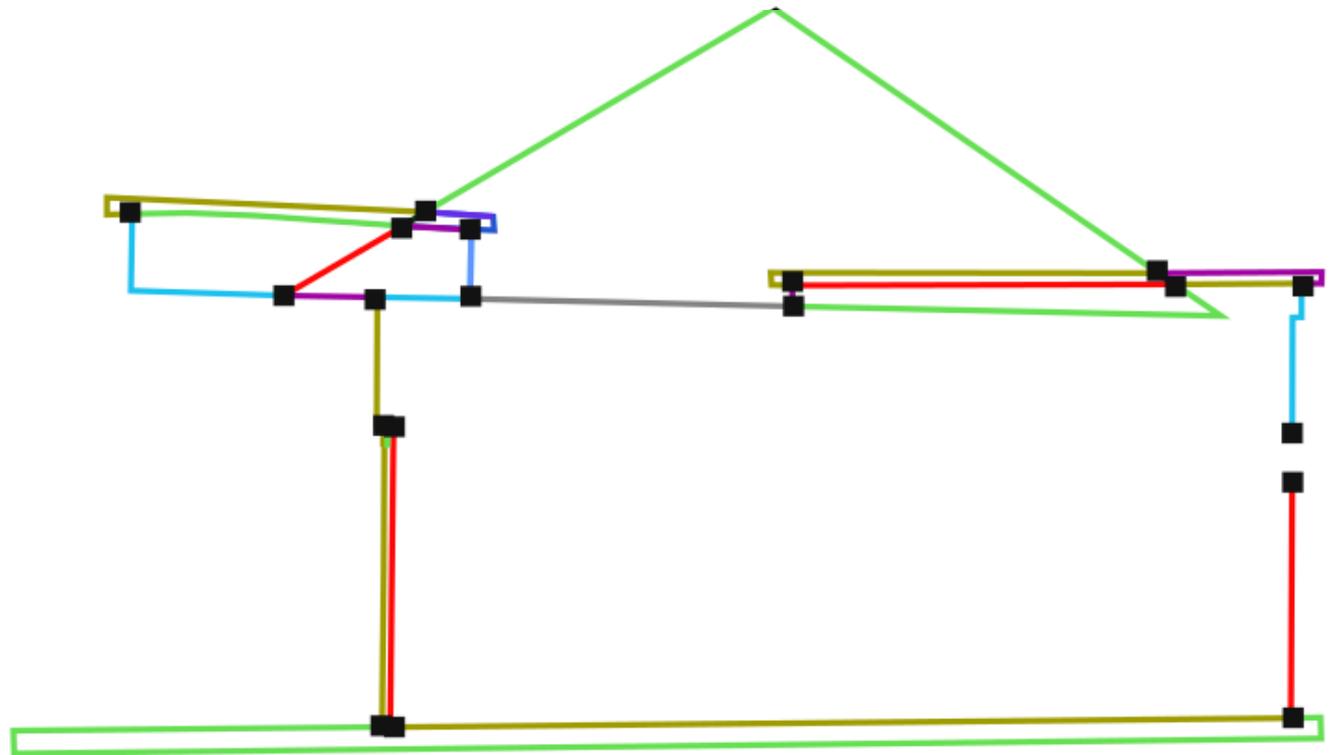


Better Performance!



# Methodology

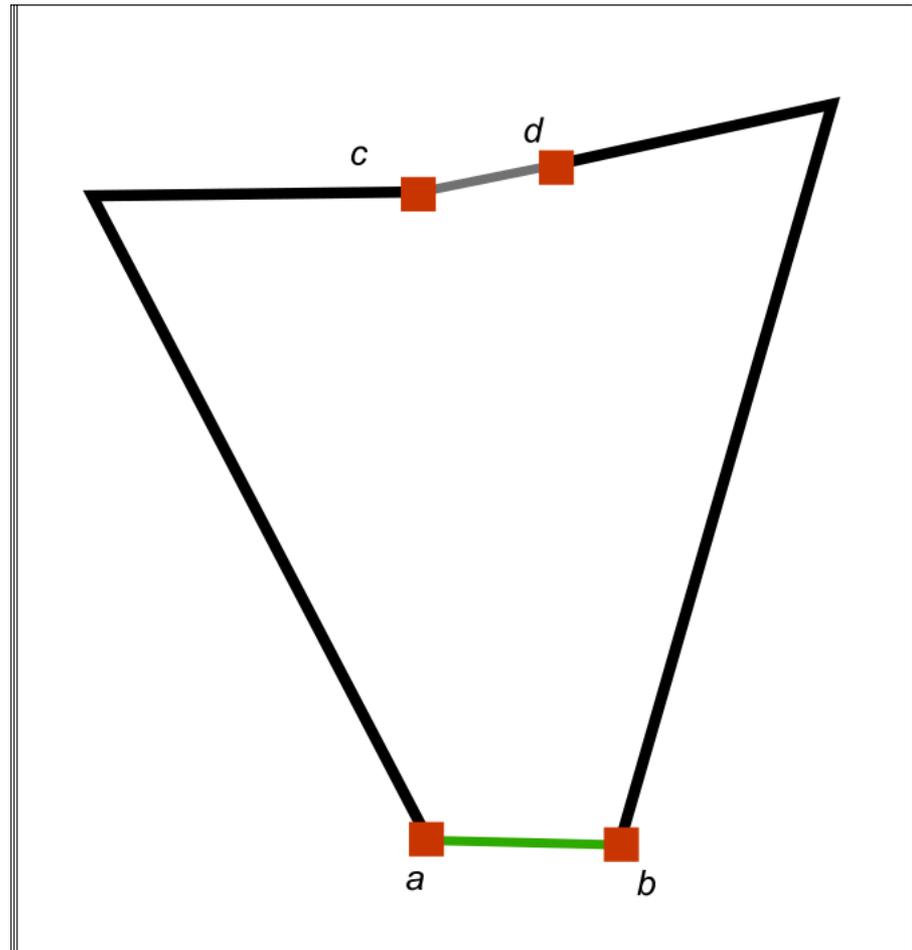
- Divide the section into line-segment components



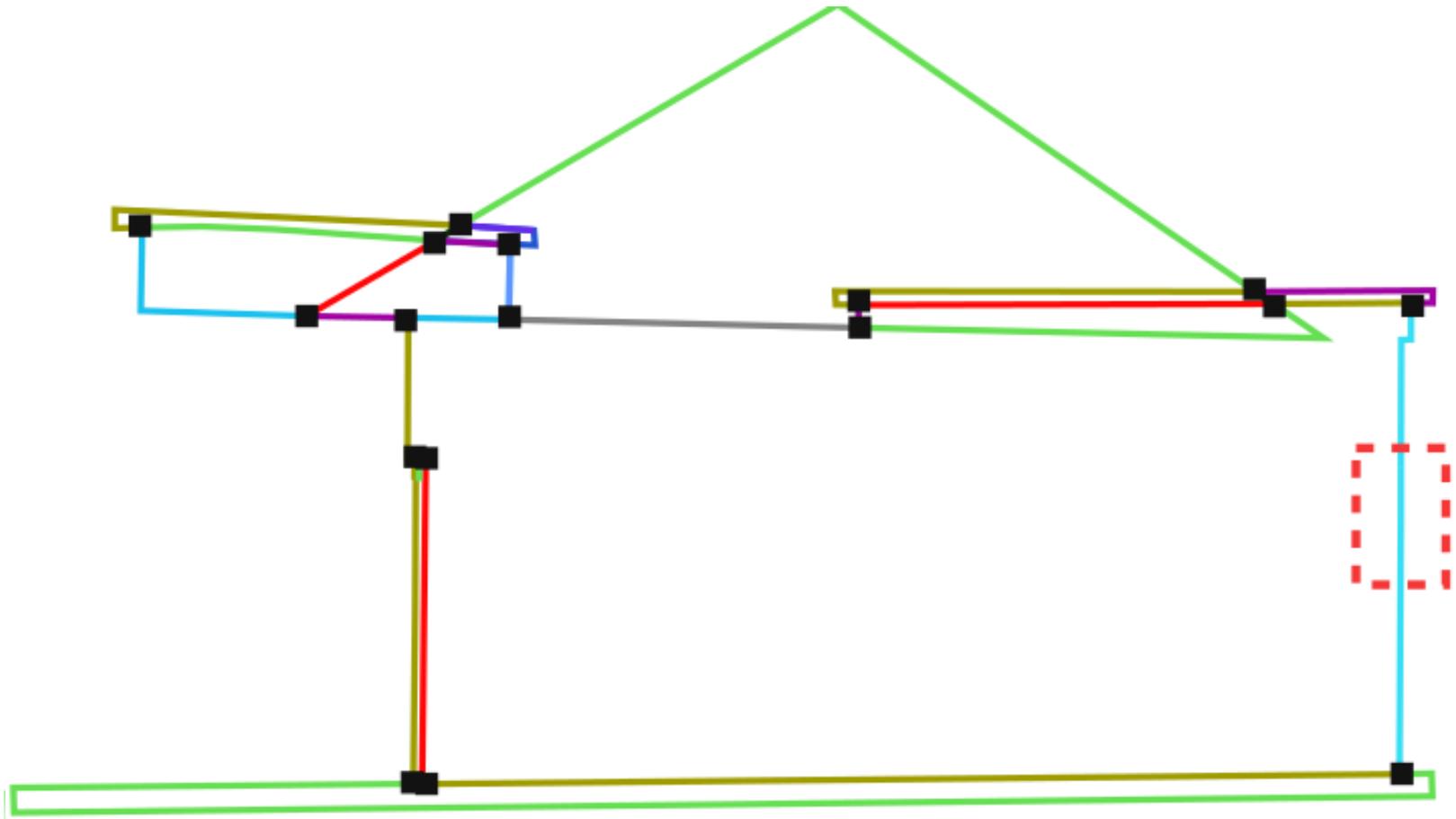
# Methodology

- Close Holes: Triangulation

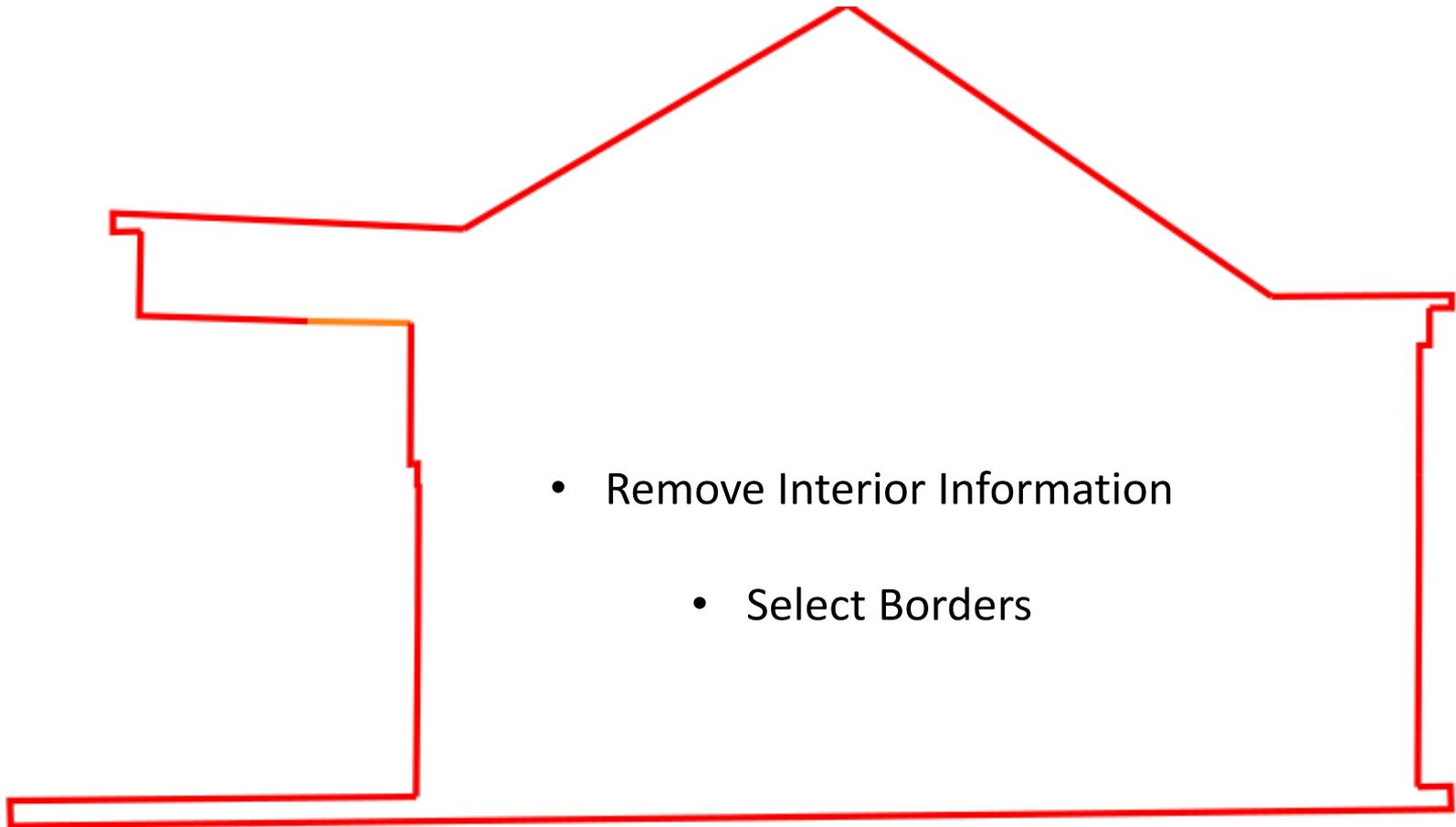
- Automatic Delaunay Triangulation
- Select shortest edges
- Keep selected edges



# Methodology

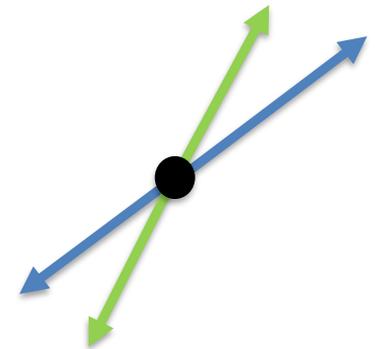


# Methodology



# Methodology

- Twin-Ray Voting
  - **Ray Casting:** Generate ray from each segment's centroid
  - Count intersections number of ray with elements of cross-section
  - **Twin – ray :** For each ray, another is generated in opposite direction.

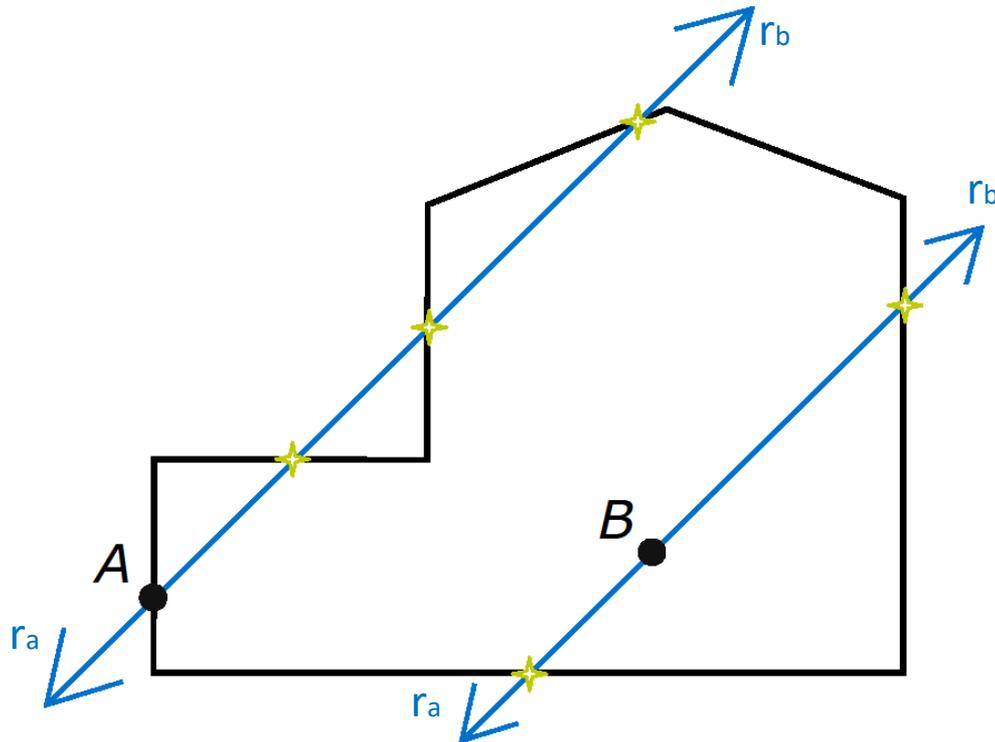


Reason: Independent of orientation!

# Methodology

- Twin-Ray Voting

Result:  $\begin{cases} \text{outer border, if numsects}_a \text{ is even, and numsects}_b \text{ is odd} \\ \text{not border, if both numsects odd or even} \end{cases}$

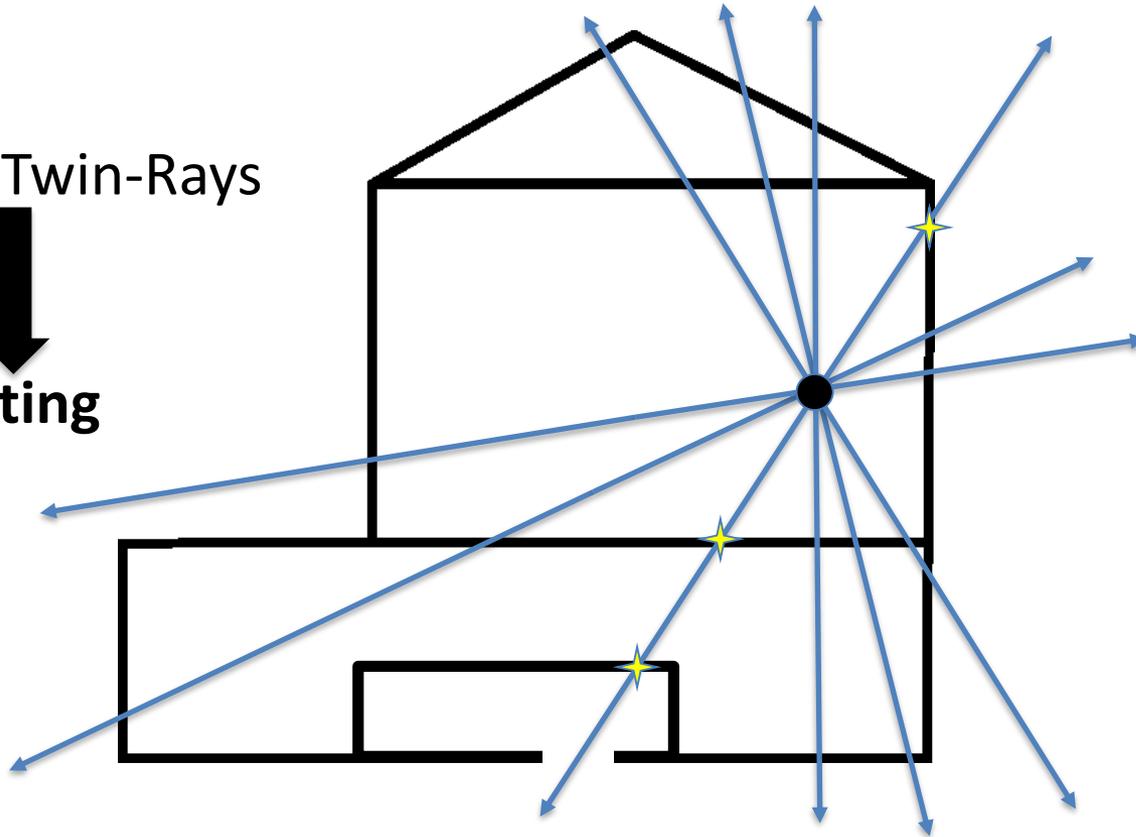


# Methodology

Models can be non-manifold, though!

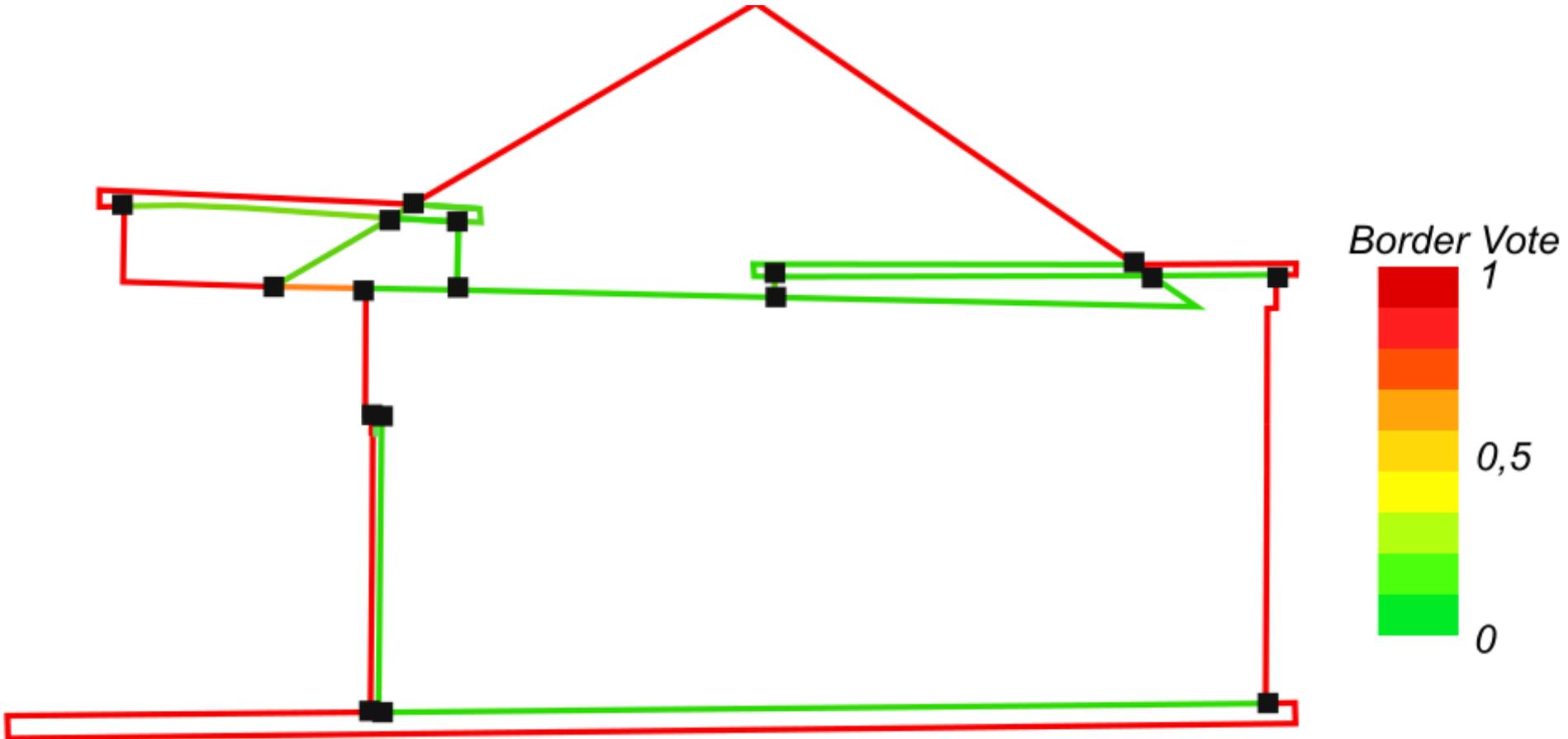
Multiple Twin-Rays

↓  
Voting



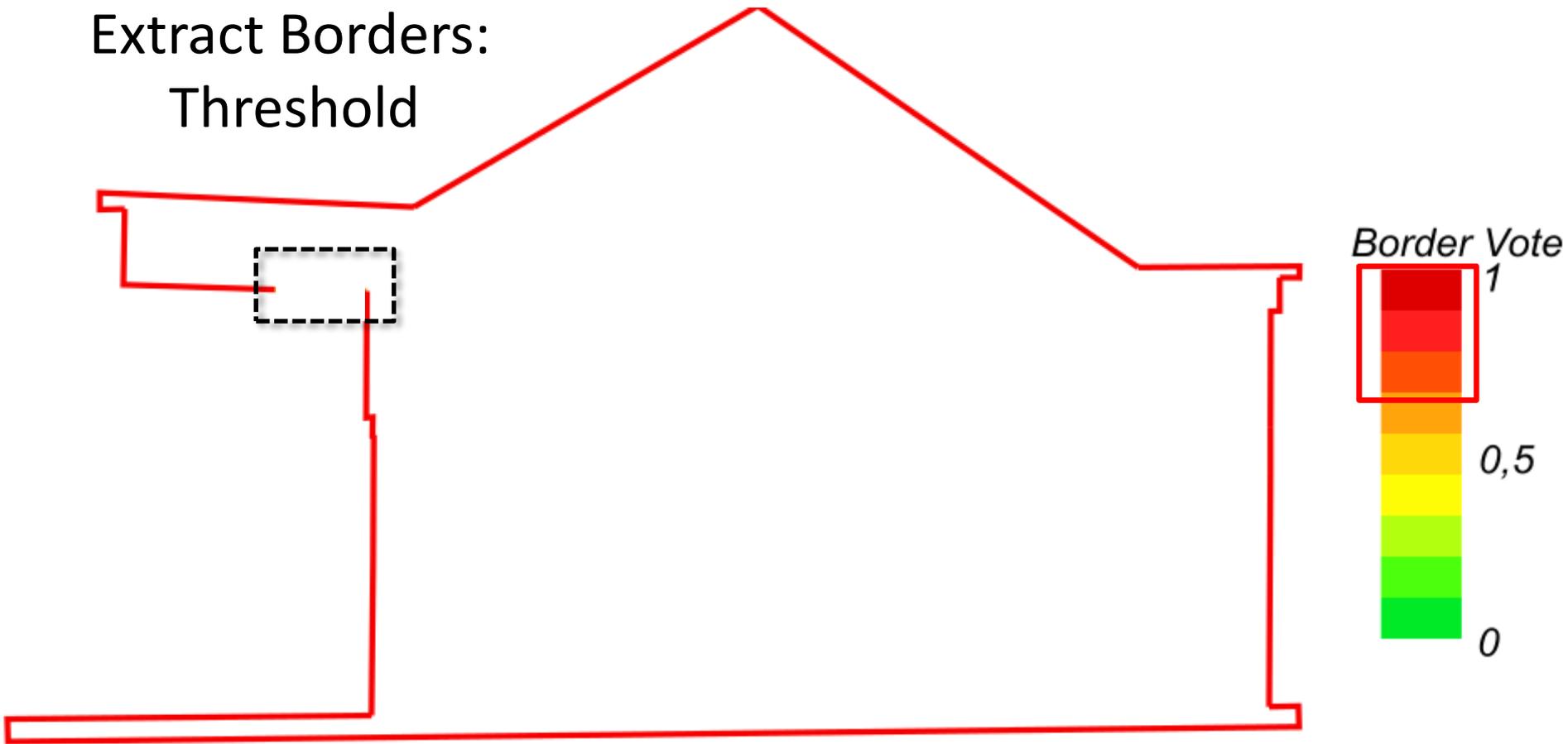
More weight when no intersections in a ray's path!

# Methodology



# Methodology

Extract Borders:  
Threshold



# Methodology

Extract Borders:  
Curve Tracing



# Methodology

## Extract Borders: Optimization

Maximize Border Vote Energy:

$$BE = \sum_{i=1}^{n_c} b_i \cdot x_i$$

Where:

- $i$ : connected component
- $n_c$ : total component number
- $x_i$ : binary value of  $i$  component's selection
- $b_i$ : border vote value of component  $i$

# Methodology

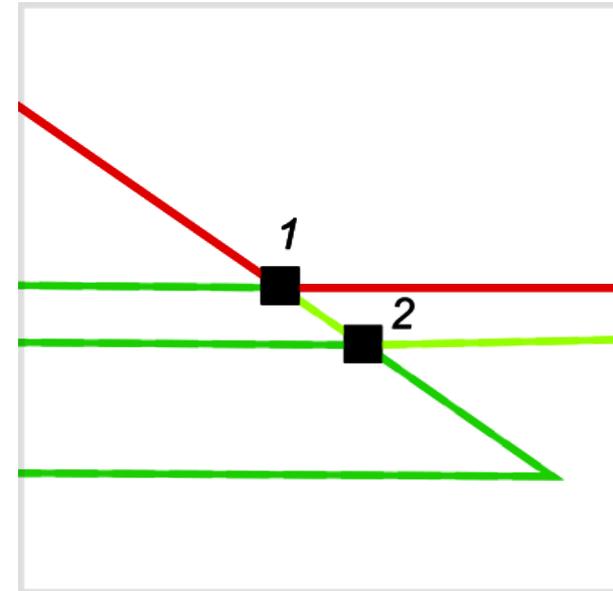
- Optimization Constraints

For each endpoint:  $A_e = \sum_{i=1}^{n_{ac}} x_i = 0 \text{ or } 2$

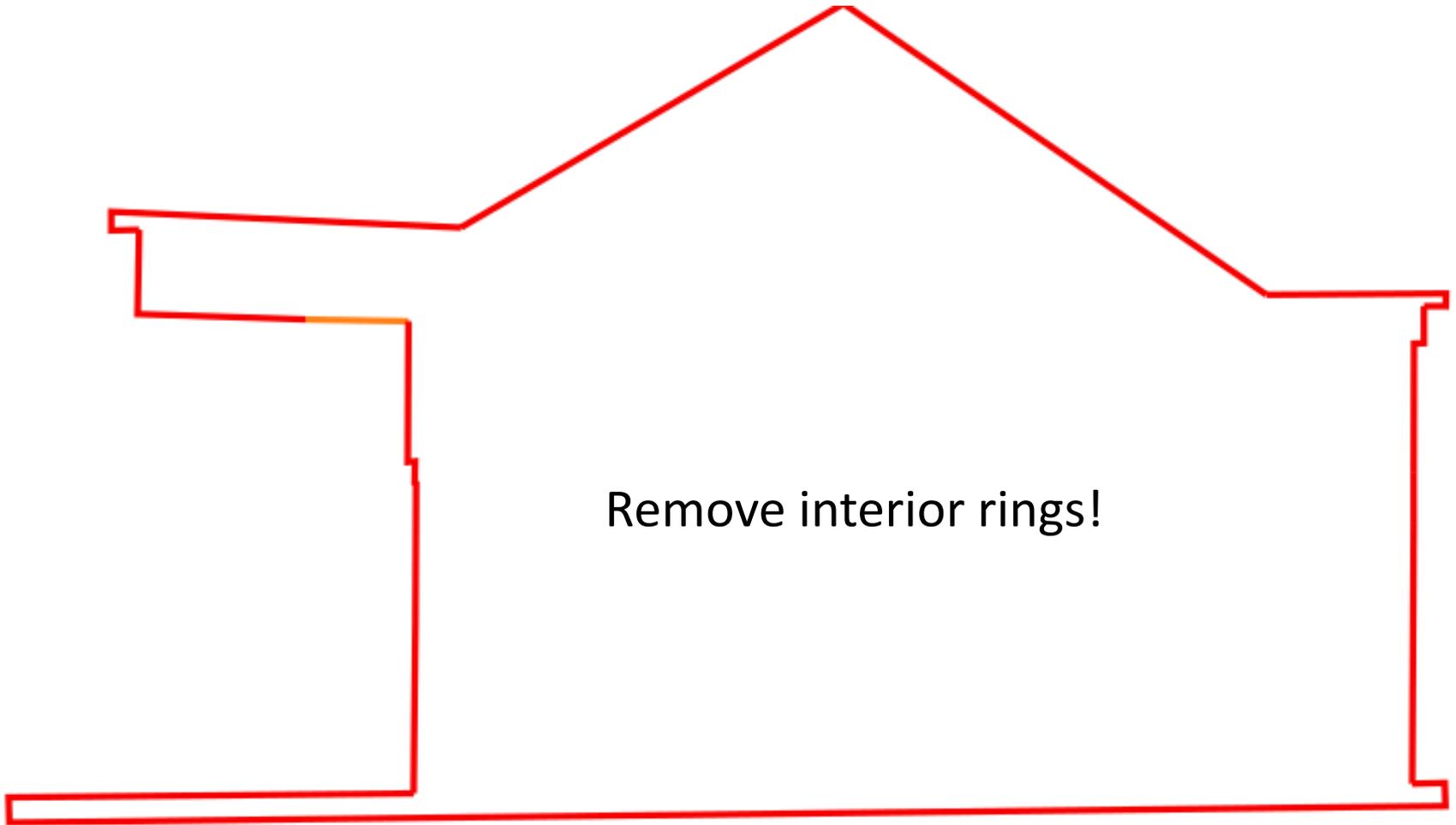
Rewritten as:  $A_e = \sum_{i=1}^{n_{ac}} x_i - 2 \cdot w_e = 0$

Where:

- $A_e$ : Degree of adjacency of endpoint  $e$
- $w_e$ : Binary value defining endpoint  $e$ 's final existence

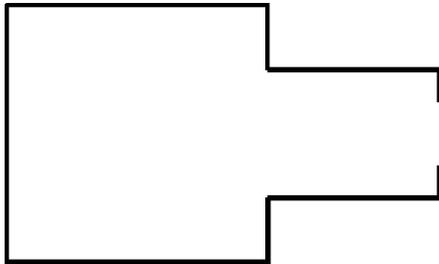
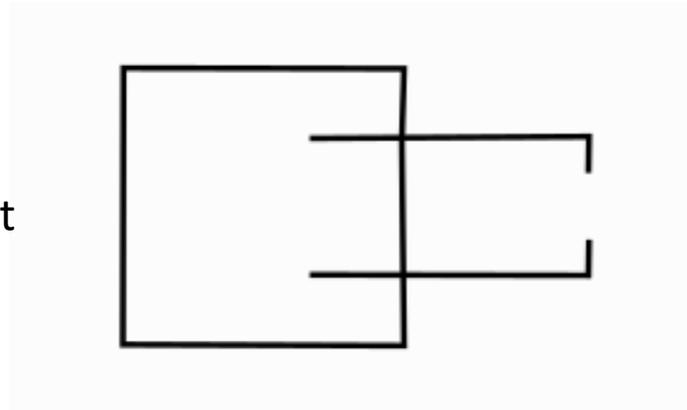


# Methodology

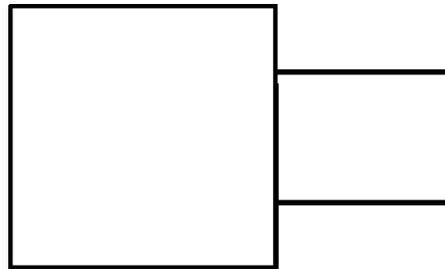


# Methodology

Input

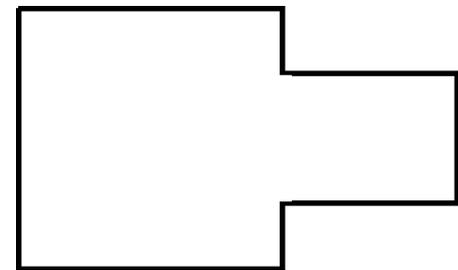


Threshold



Curve Trace

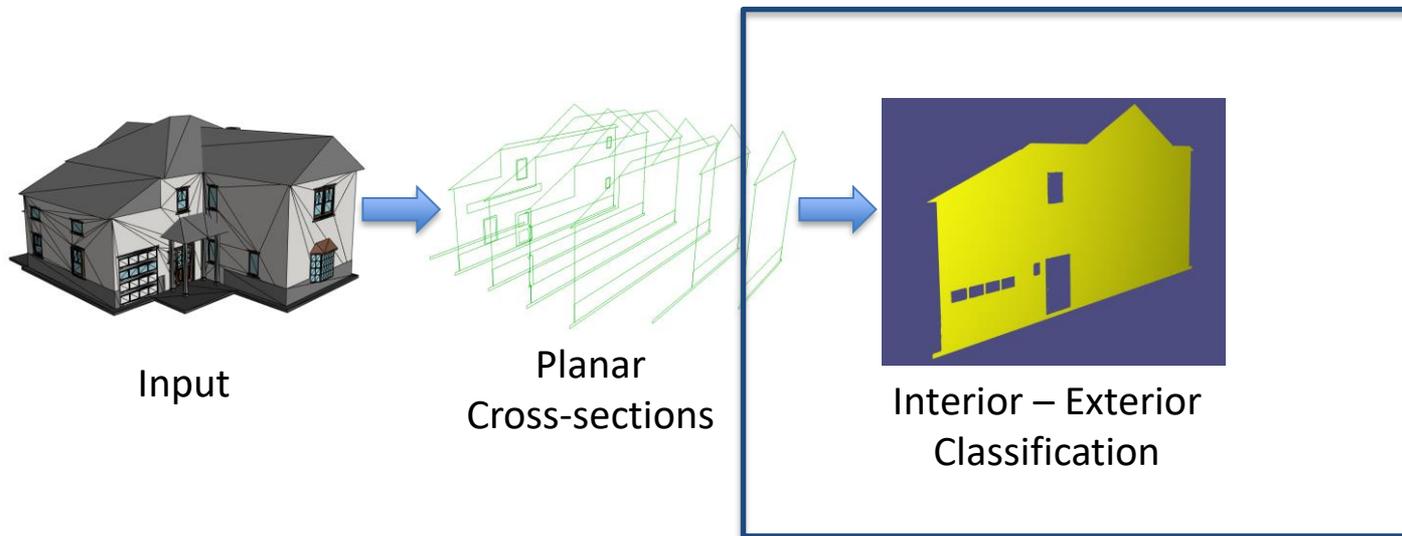
Closed Surface!



Ours

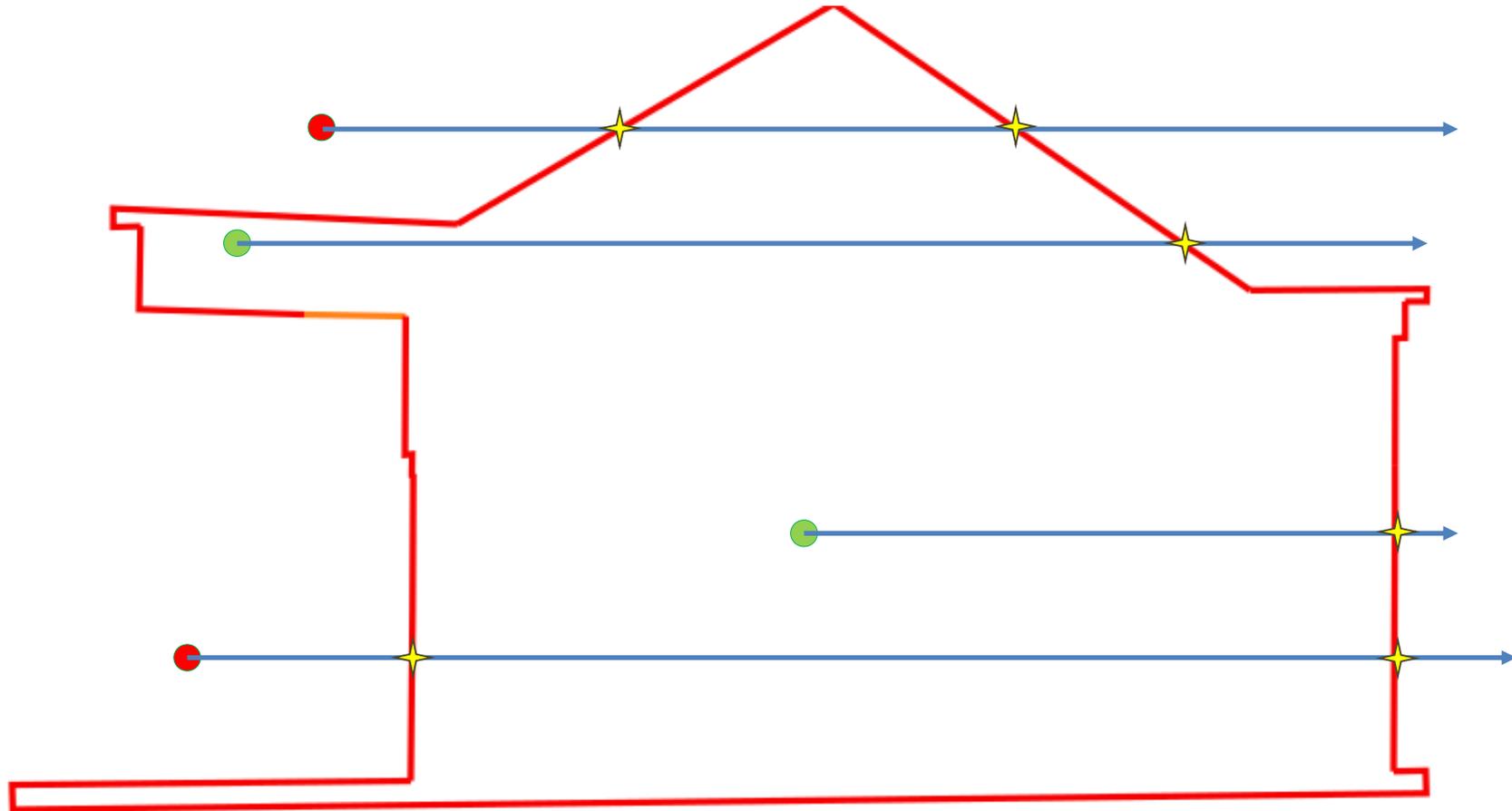
# Methodology

## Overview



# Methodology

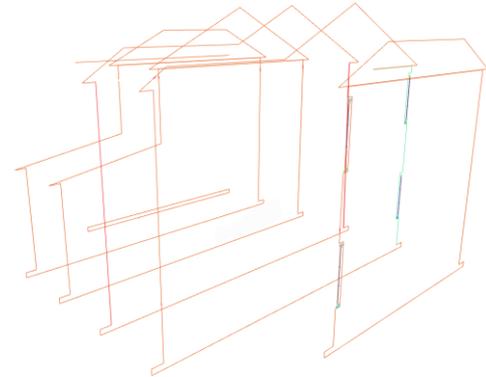
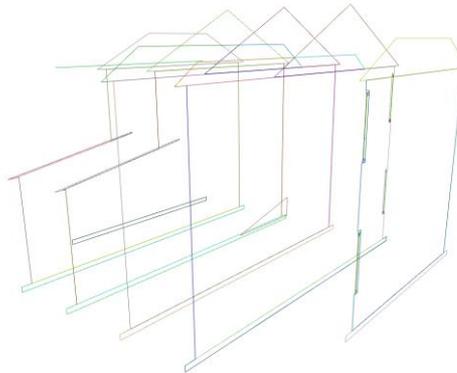
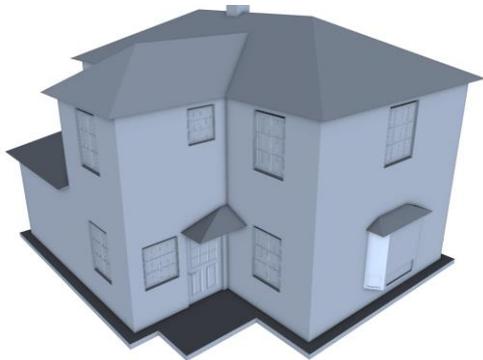
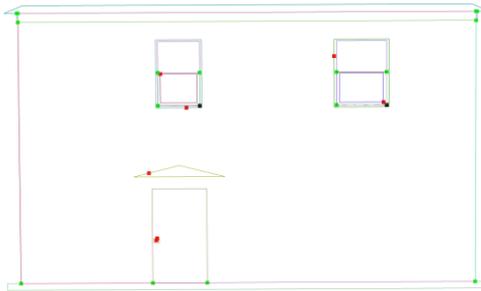
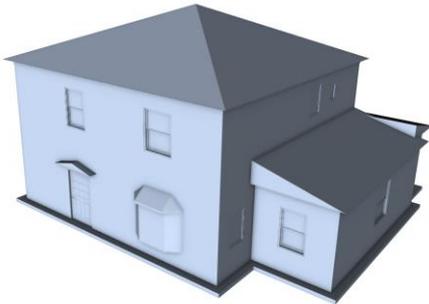
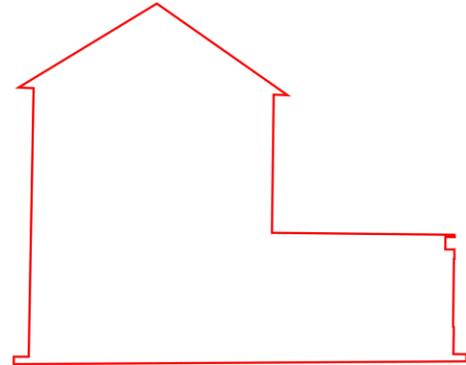
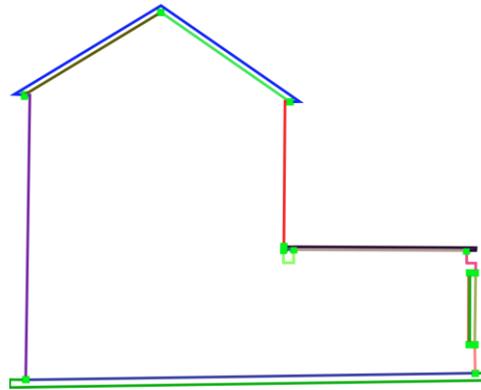
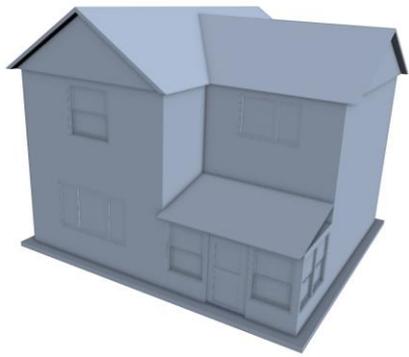
- Inside-Outside Classification



# Contents

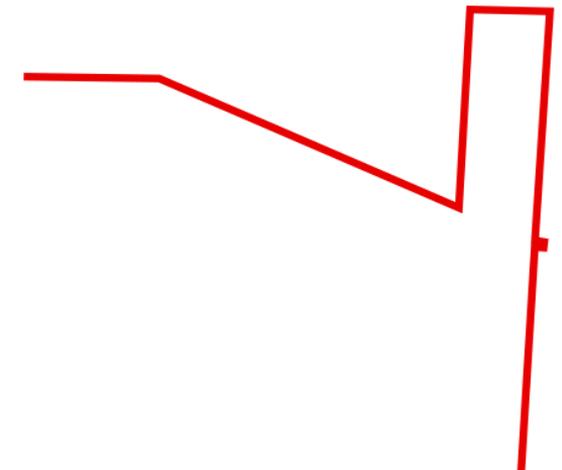
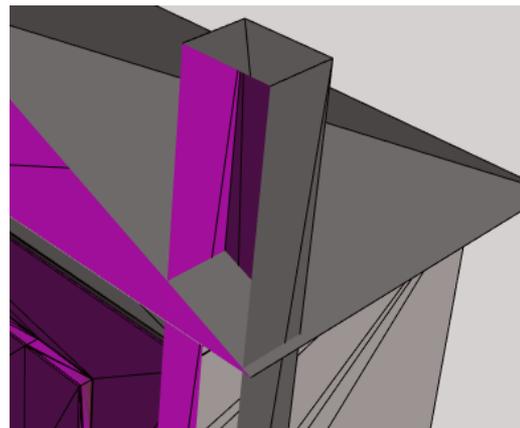
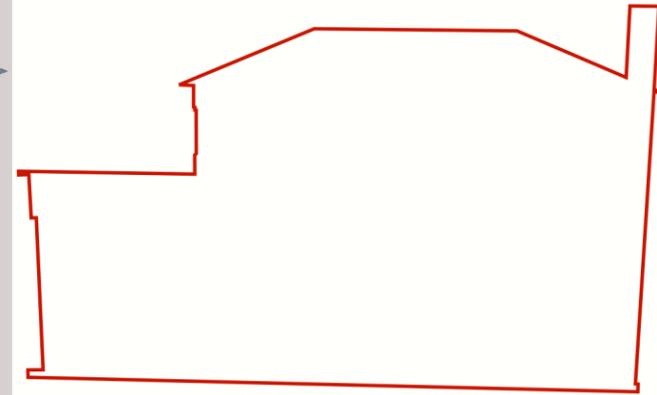
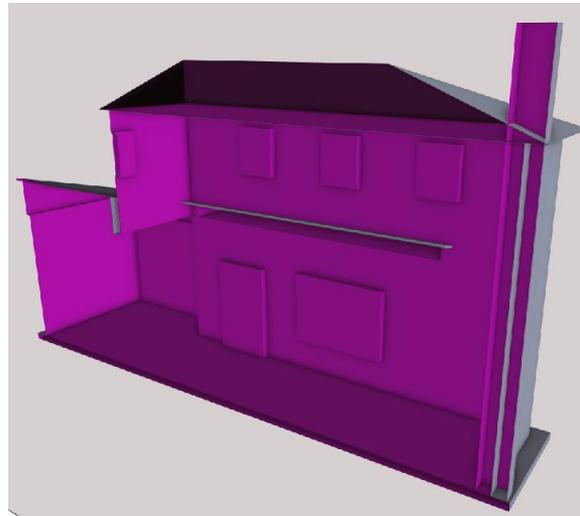
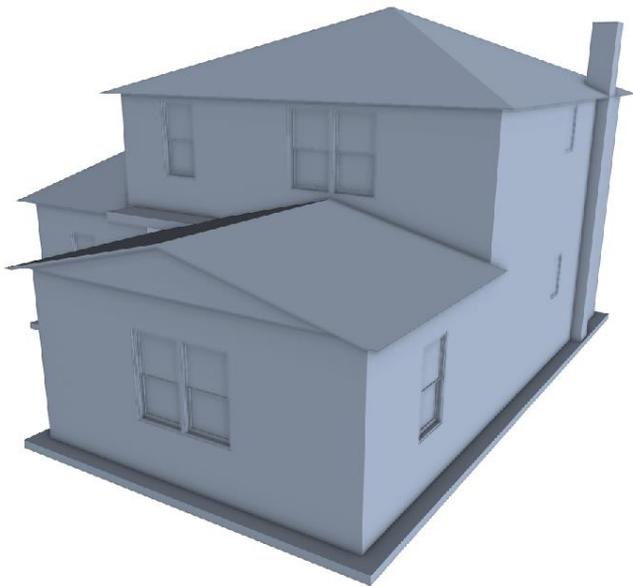
- Motivation
- Research Question
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# Results

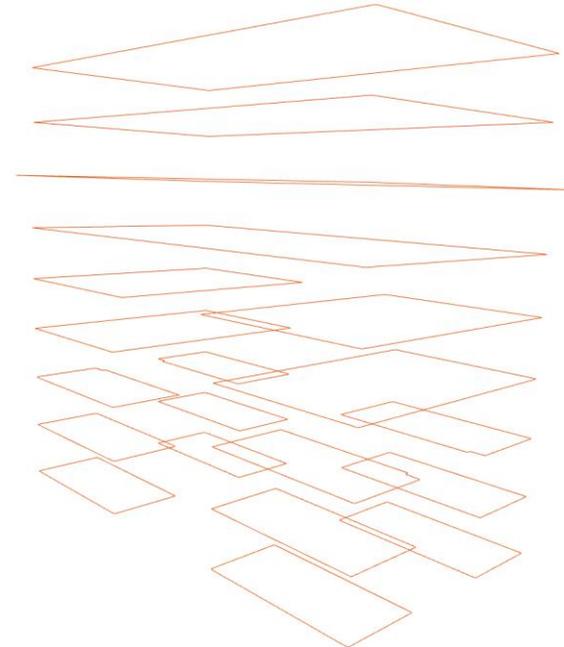
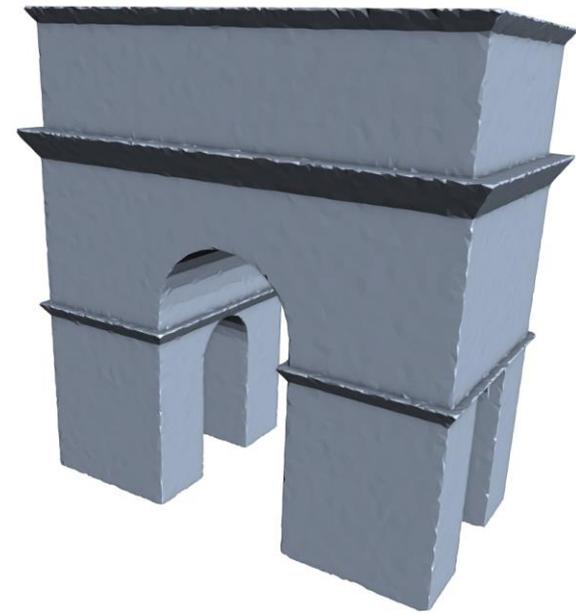


# Results

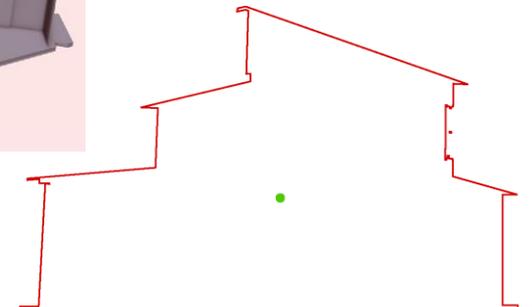
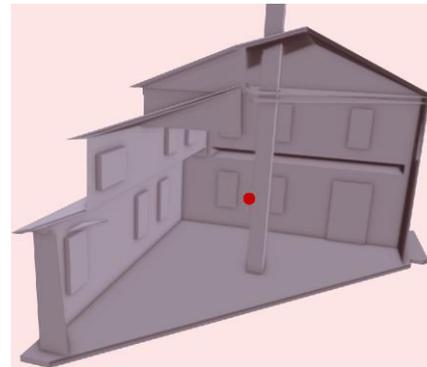
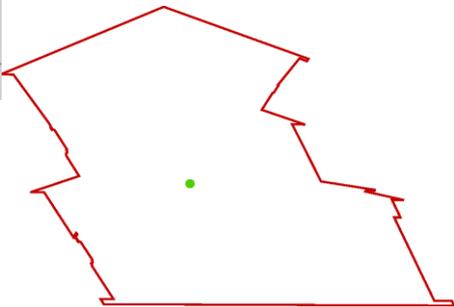
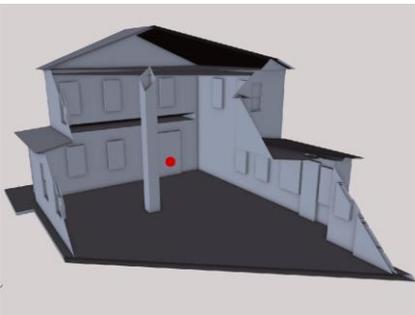
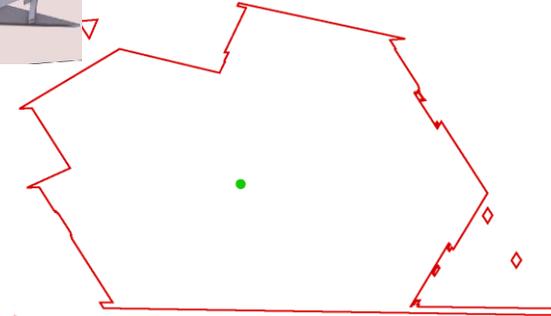
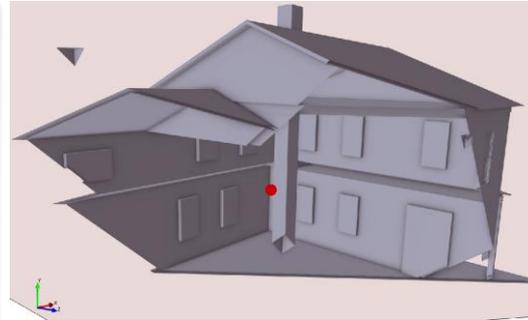
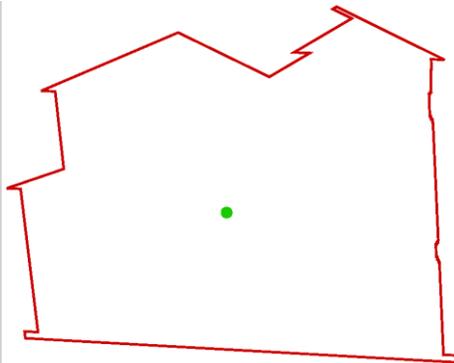
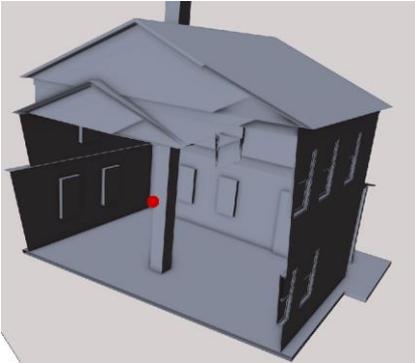
## Self-Intersections



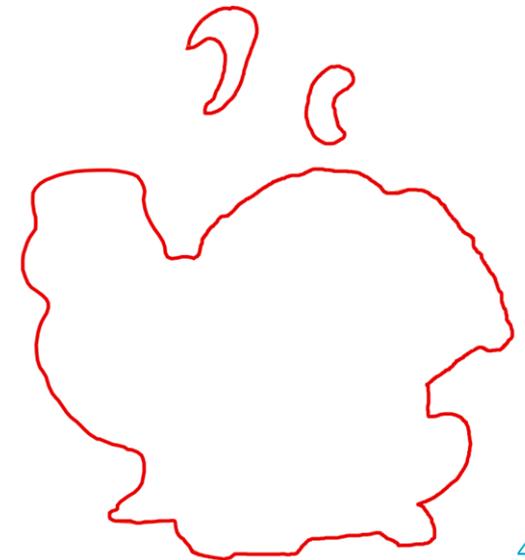
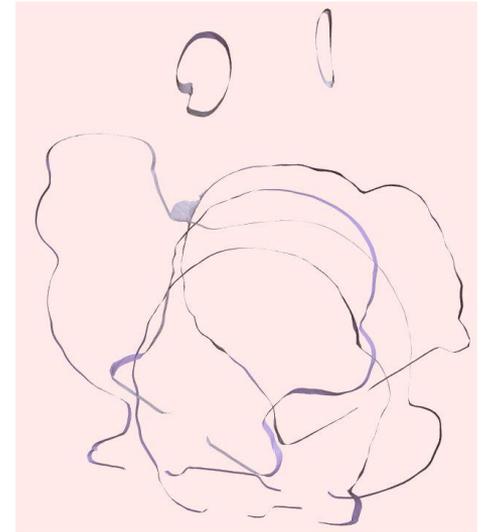
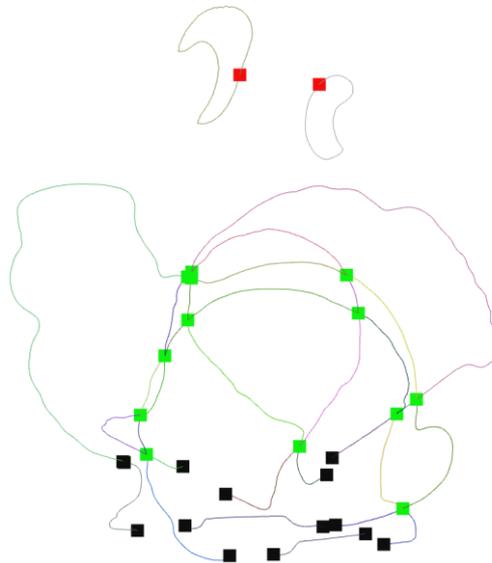
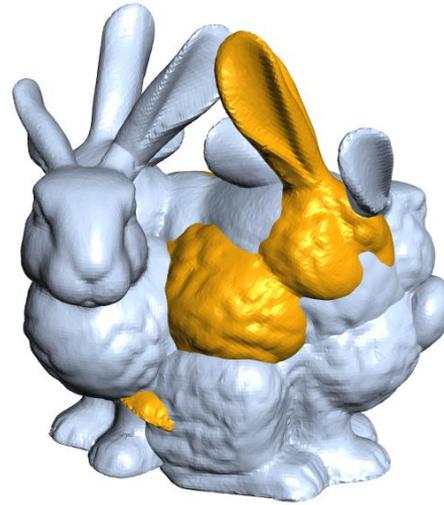
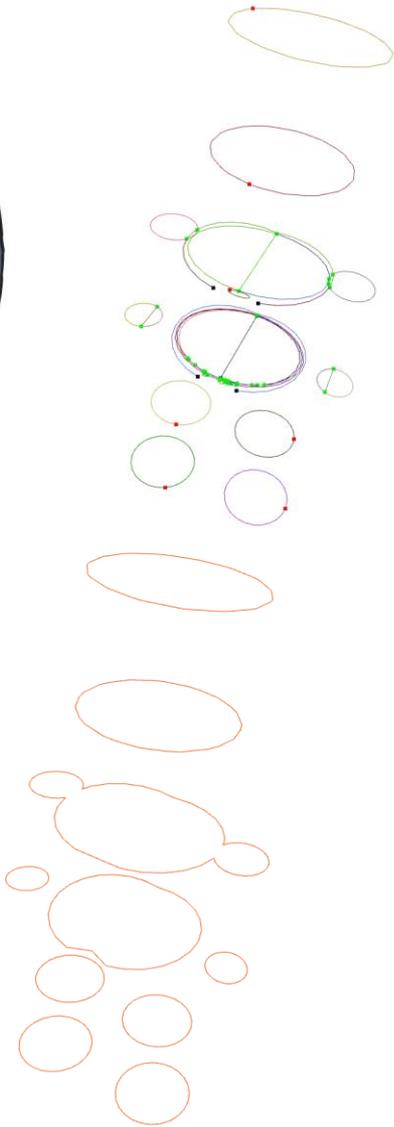
# Results



# Robust to Plane Orientations



# Results

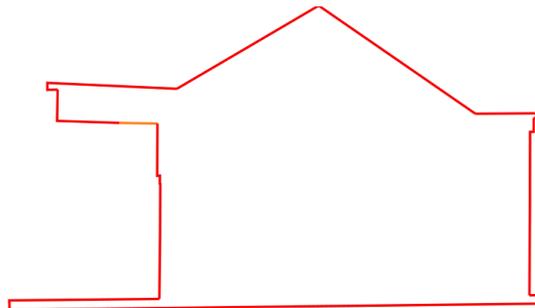


# Comparison

Extract Border

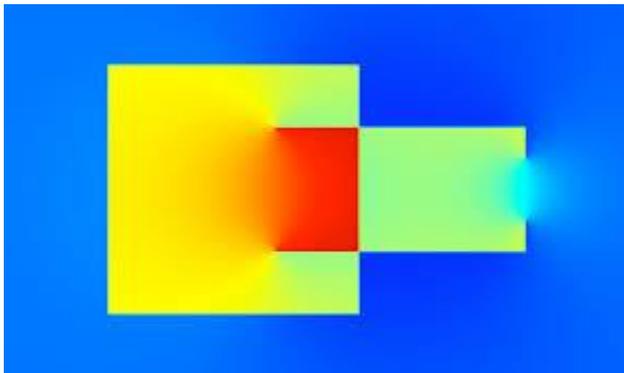
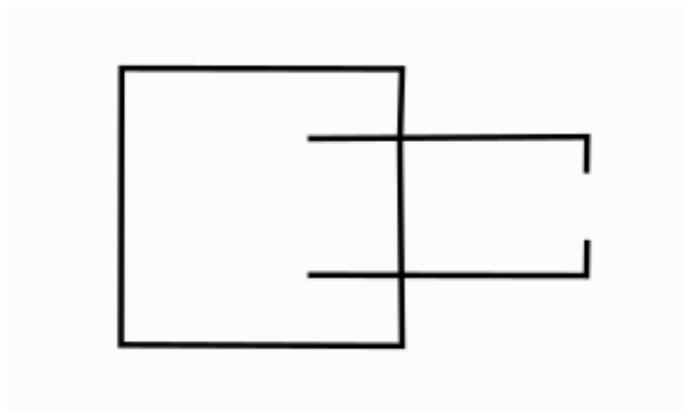
Optimization Ensures  
Manifoldness!

Optimization



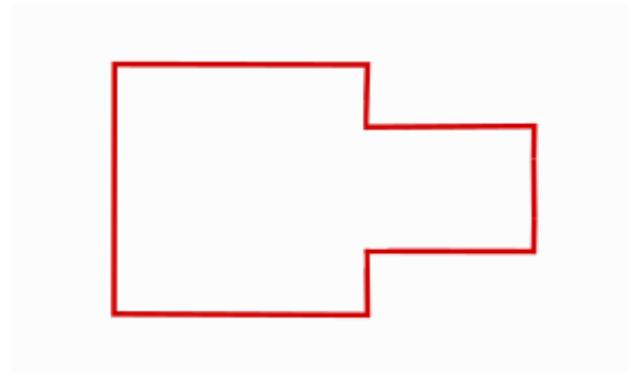
# Comparison

Input



Winding Number  
*Jacobson et al., 2013*

Ours

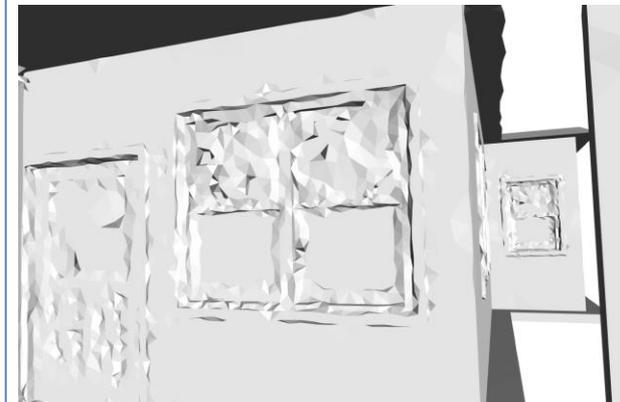
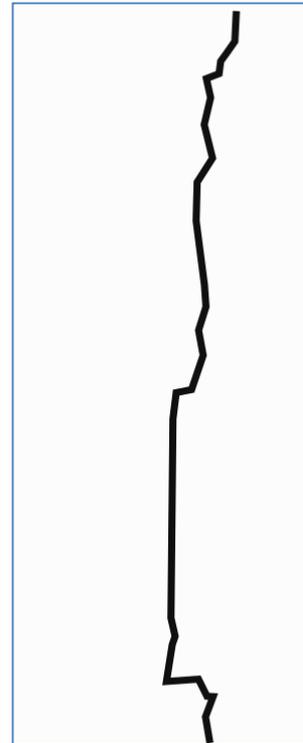
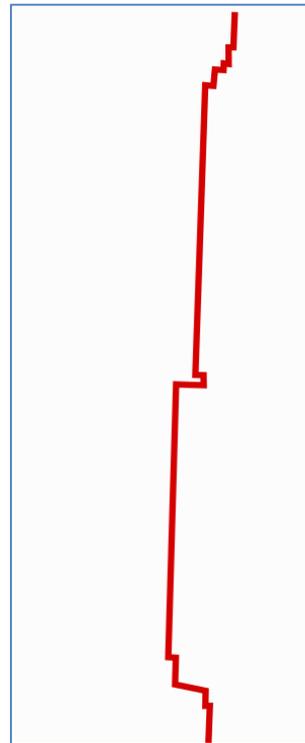


# Comparison

Output Window Geometry



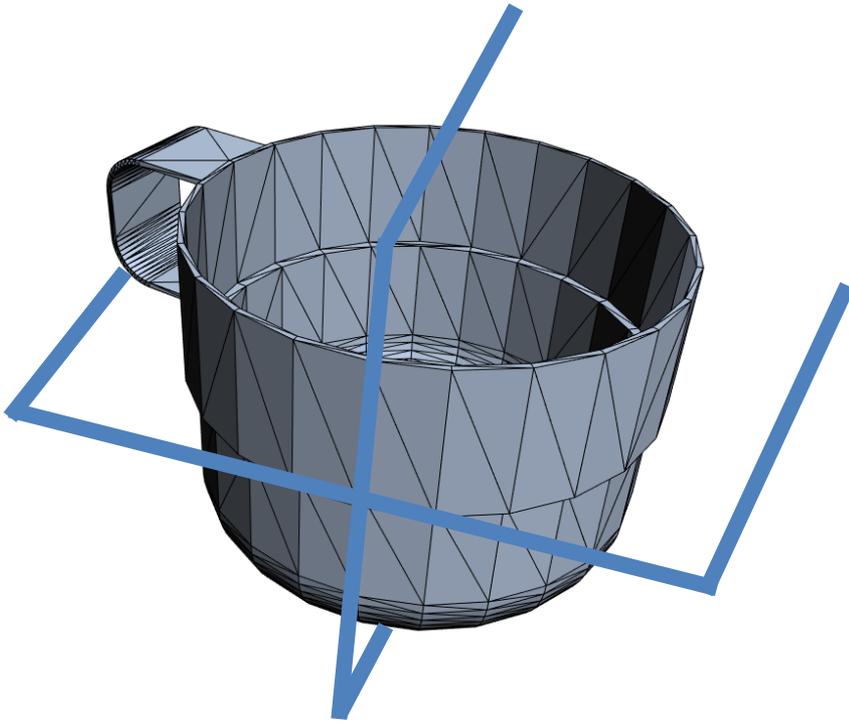
Ours



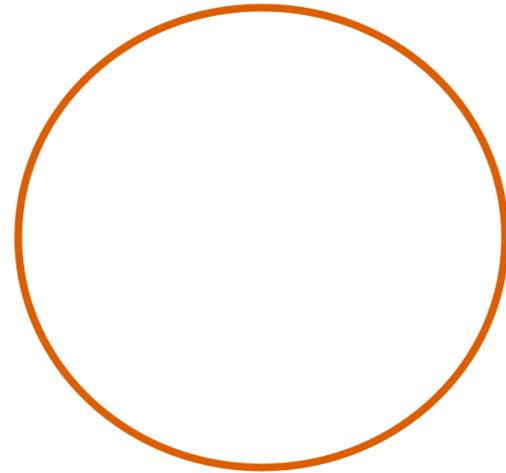
TetWild  
*Hu et al., 2018*

# Limitations

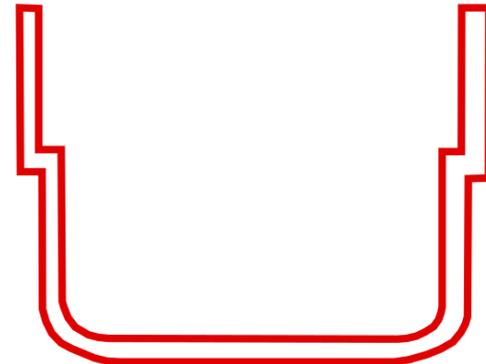
- Cup Geometry



Horizontal

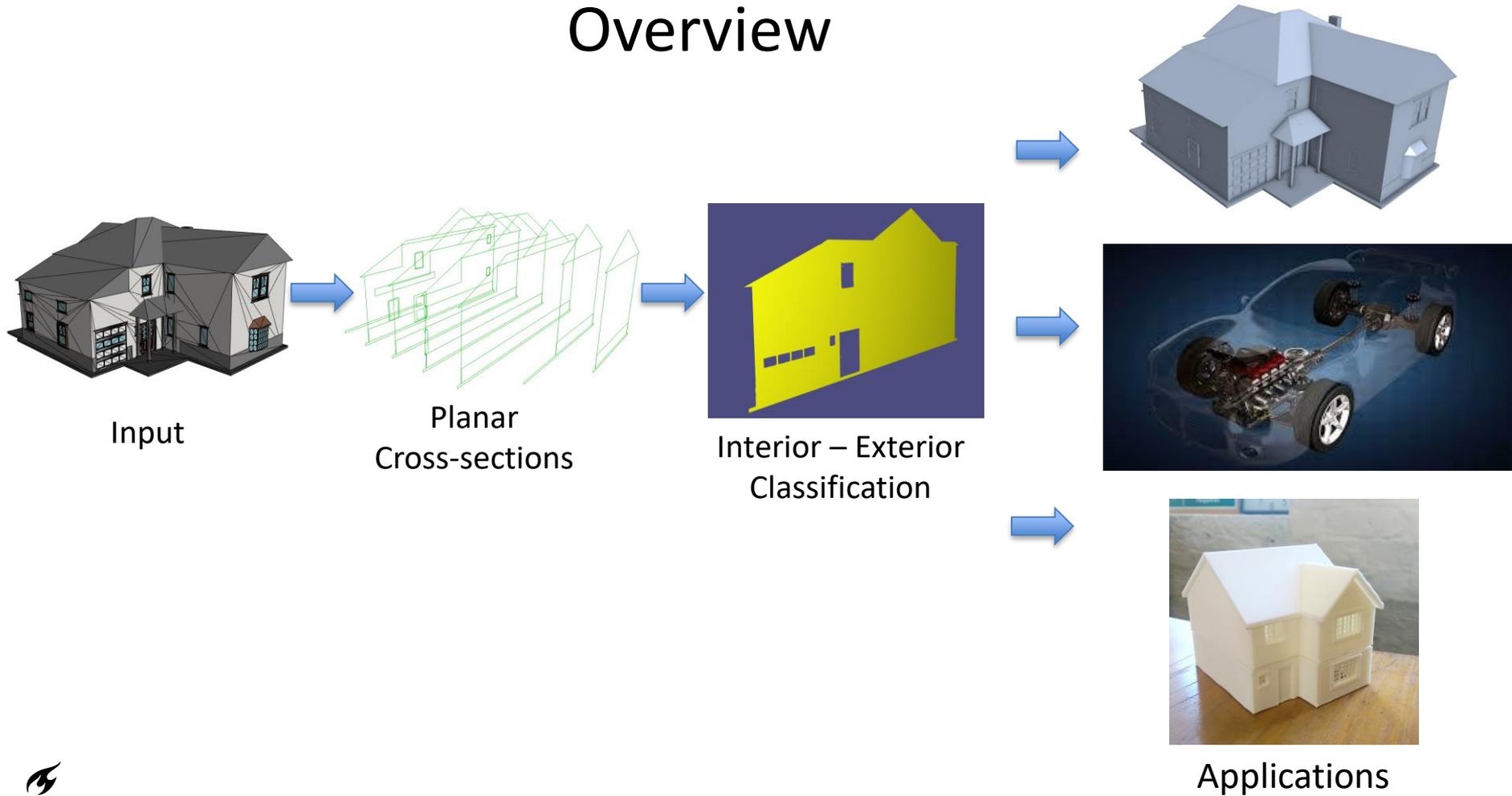


Vertical



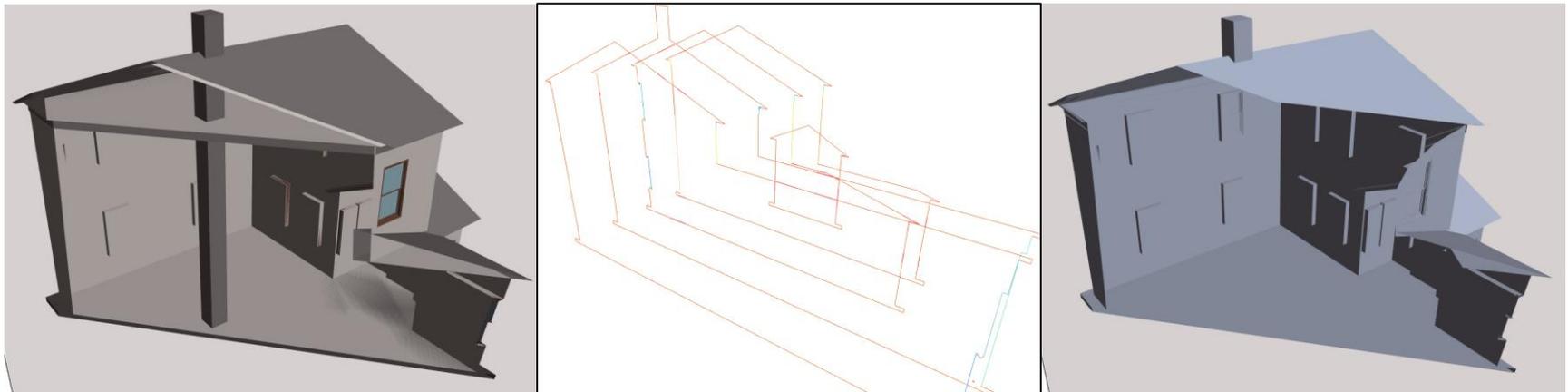
# Future Work & Applications

## Overview



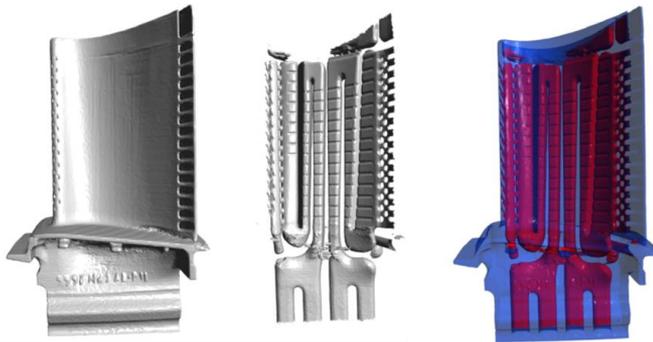
# Future Work & Applications

- Outer Surface Extraction



# Future Work & Applications

3D Printing



Visualization

Model  
Editing



# Contents

- Motivation
- Research Question
- Related Work
- Methodology
- Results
- **Conclusions**

# Conclusions

- Valid novel methodology
  - 3D Classification through 2D analysis
  - Generally robust, regardless of plane orientation
- Coping with Model Deficiencies

Deficiency Type	Solution
Duplicate Geometry	Pre-Processing Mesh & Graph Reconstruction
Self-Intersections	
Inconsistent Orientation	Irrelevant to Pipeline!
Holes	Delaunay Triangulation

Thank You  
For your Attention!