



Institute of Cartography and Geoinformatics | Leibniz Universität Hannover

# Using Hough Analysis and Least Squares Adjustment for the Generalization of Building Footprints

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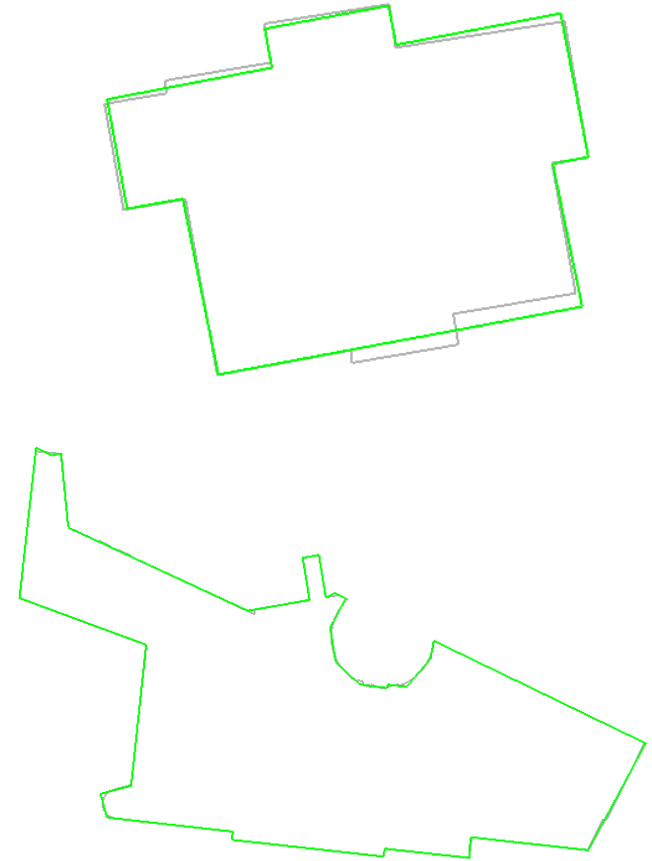
# Outline

- ▶ Introduction
- ▶ Hough Analysis: Generating Initial Segments
- ▶ Adjustment: Refining and Fitting the new Segments to the Original Shape
- ▶ Joining the Line Fragments
- ▶ Results & Issues
- ▶ Conclusion and Outlook

# Introduction

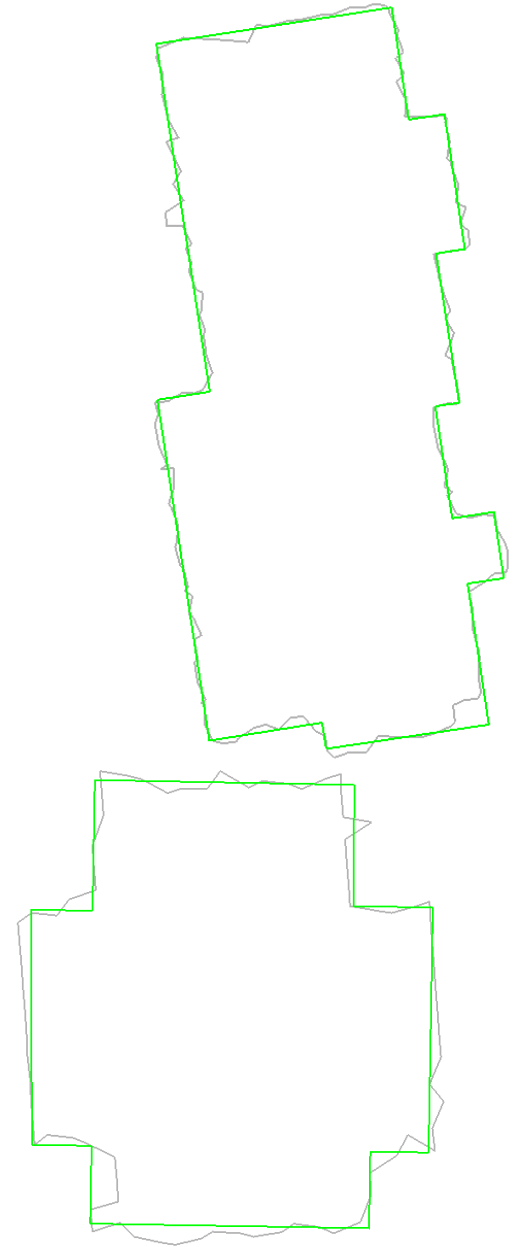
# Application scenarios

- ▶ Reasons for footprint simplification
  - ▶ Too much detail for given application (e.g. cadastre data)



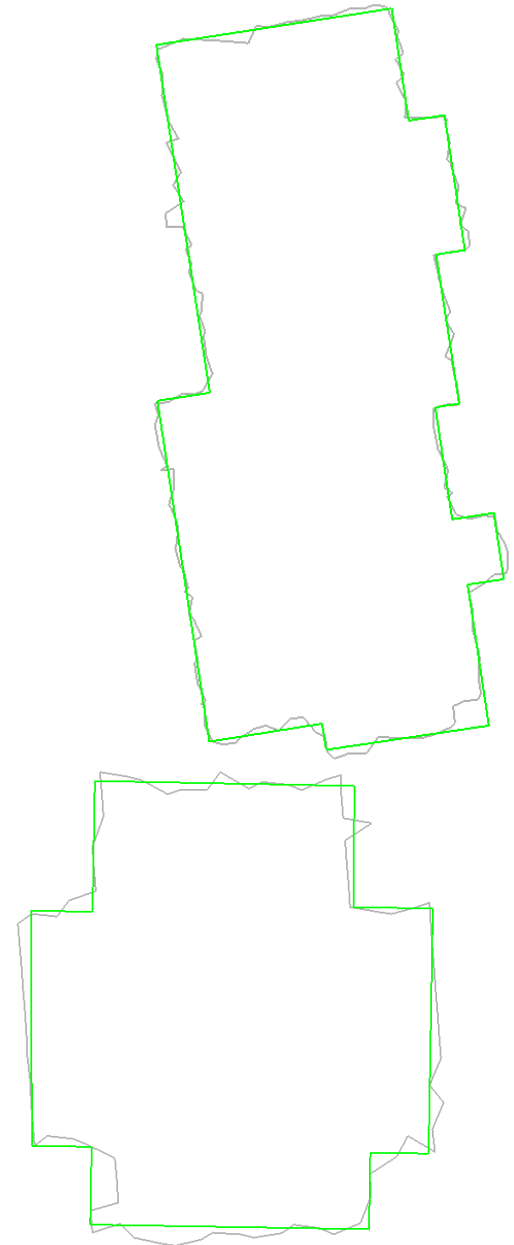
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  - ▶ Too much detail for given application (e.g. cadastre data)
  - ▶ **Smoothing and regularization of "noisy" footprints (e.g. from LIDAR)**



# Application scenarios

- ▶ Reasons for footprint simplification
  - ▶ Too much detail for given application (e.g. cadastre data)
  - ▶ Smoothing and regularization of “noisy” footprints (e.g. from LIDAR)
- ▶ Problem definition
  - ▶ For the set of points forming the outline of the footprint
  - ▶ find a “building-like” (preferring right angles etc.) polygon that best approximates this outline.



# A closer look at the problem

- ▶ Problem definition
  - ▶ For the set of points forming the outline of the footprint, find a “building-like” polygon that best approximates this outline.
- ▶ Why is this a hard problem?
  - Approximation? → least squares adjustment
  - What, exactly, is “building-like”? → emphasize right angles and parallel segments
  - **Combinatorial optimization problem nested into the adjustment**
    - Which points of the original outline are mapped to which ones on the approximating shape?
    - How to balance closeness of approximation, reduction of complexity and “building-like”-ness of the result
  - **→ NP-hard problem with weak goals**

# A Heuristic Approach

## ▶ Workflow

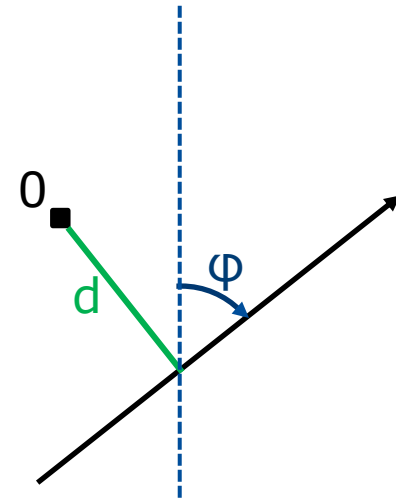
- Generate a starting solution
  - Hough analysis → line segments
- Refine the solution
  - Least squares adjustment
  - Fit new lines to sampled original
  - Increasingly emphasize right angles & parallelism
  - Generate, refine, drop segments during the process (combinatorial problem: change assignment of original points to new segments)
  - Fixed number of iterations (good results after < 20 iterations)
- Connect new segments to form a polygon



# Hough Analysis: Generating Initial Segments

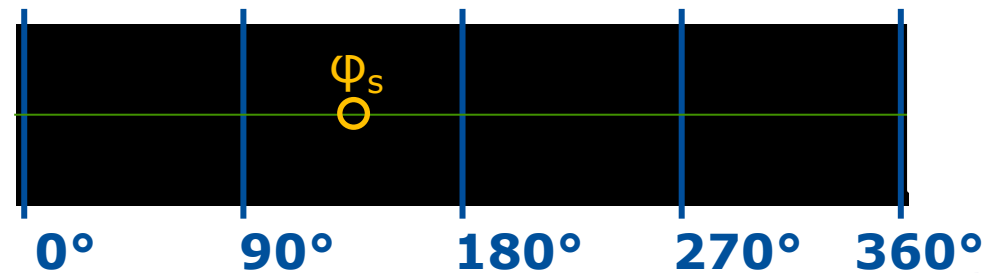
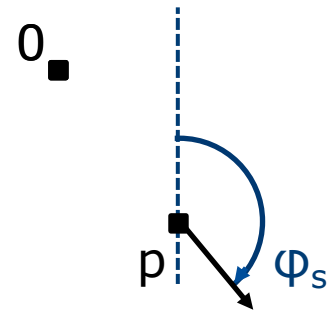
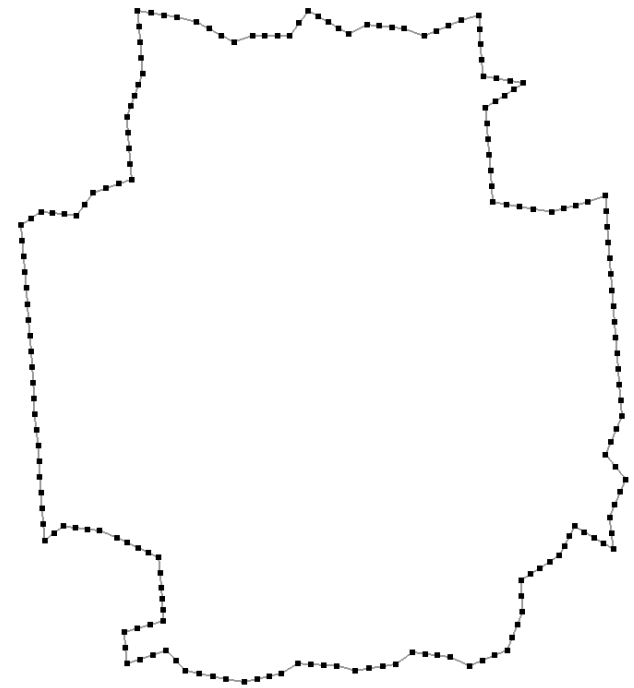
# Hough Analysis

- ▶ Transformation Line  $\rightarrow$  Point
- ▶ Line in 2D specified by
  - Direction (angle  $\varphi$ )
  - Distance to origin ( $d$ )
- ▶ Hough space is rastered for analysis (Hough accumulator)
- ▶ Difference to classical Hough analysis
  - Directed lines
  - $\rightarrow$  360° instead of 180°



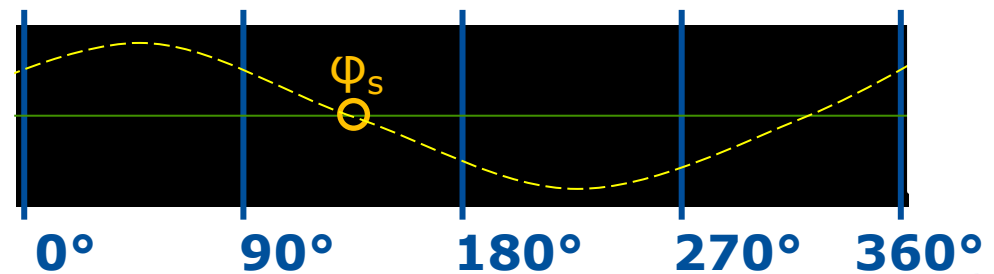
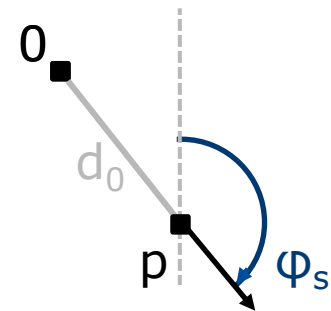
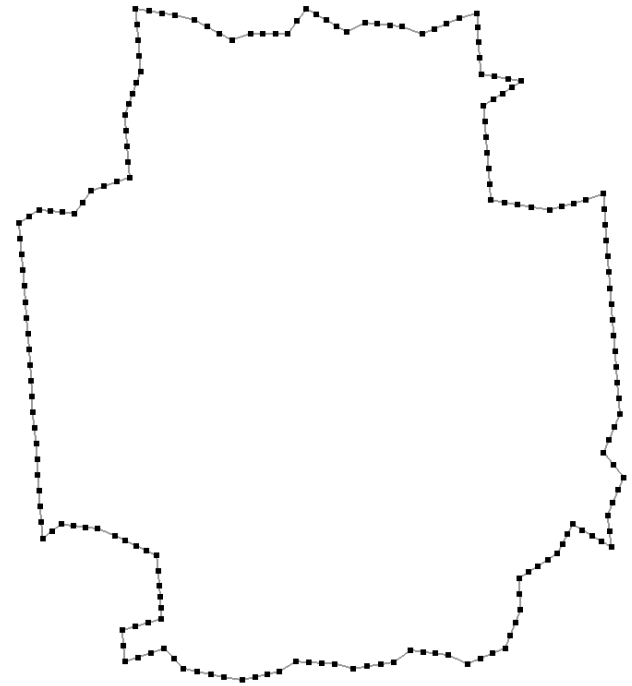
# Hough Analysis

- ▶ Polygon divided into small segments
  - Each segment as a point in Hough space: too much noise (scattered)



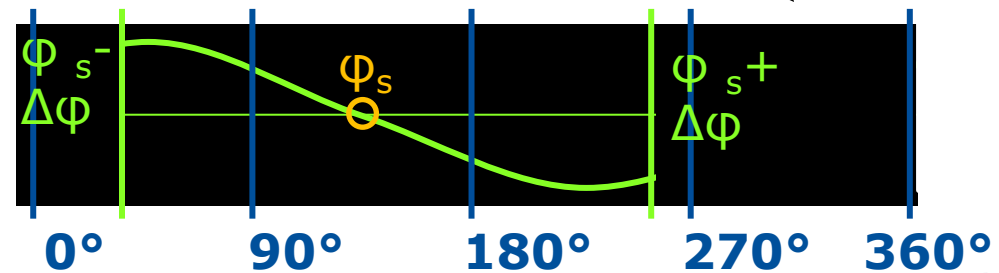
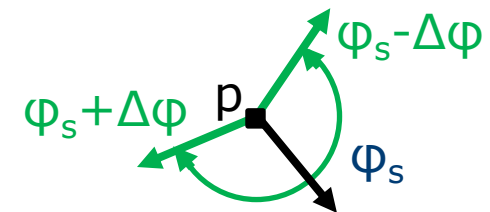
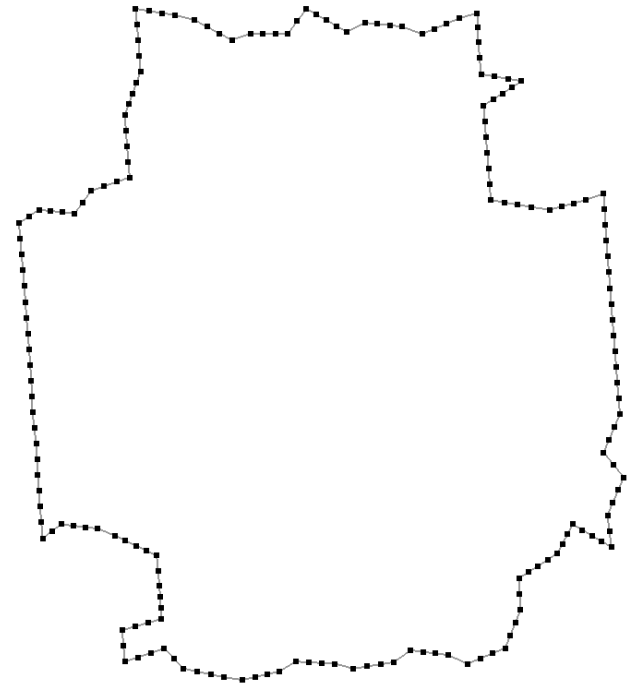
# Hough Analysis

- ▶ Polygon divided into small segments
  - Each segment as a point in Hough space: too much noise (scattered)
  - Each point as a full sine wave in Hough space: ambiguous



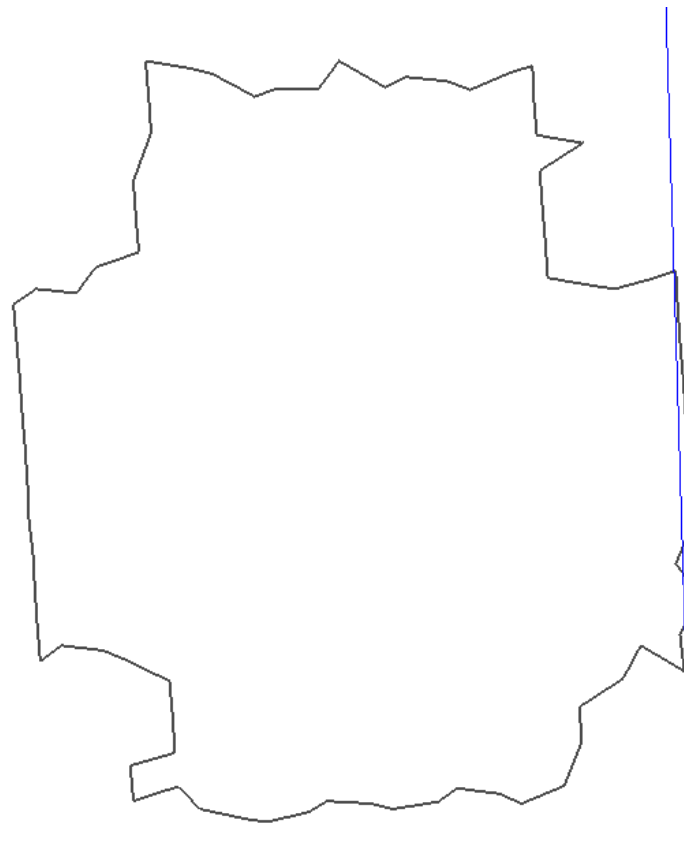
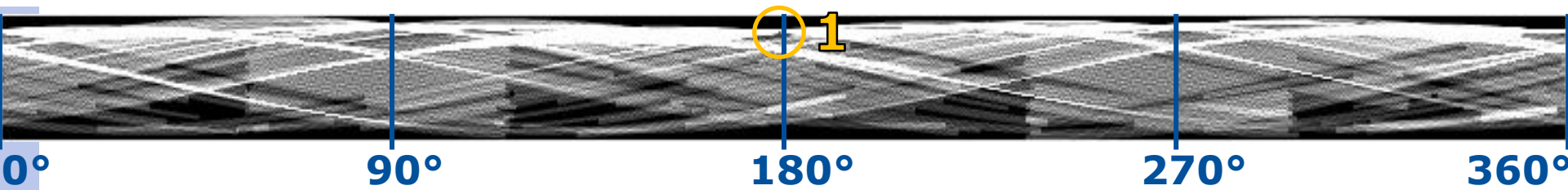
# Hough Analysis

- ▶ Polygon divided into small segments
  - Each segment as a point in Hough space: too much noise (scattered)
  - Each point as a full sine wave in Hough space: ambiguous
- ▶ Idea: tolerance band  $\Delta\varphi$  for direction
- ▶ Only values for angles within  $\varphi_s \pm \Delta\varphi$  are drawn to the accumulator

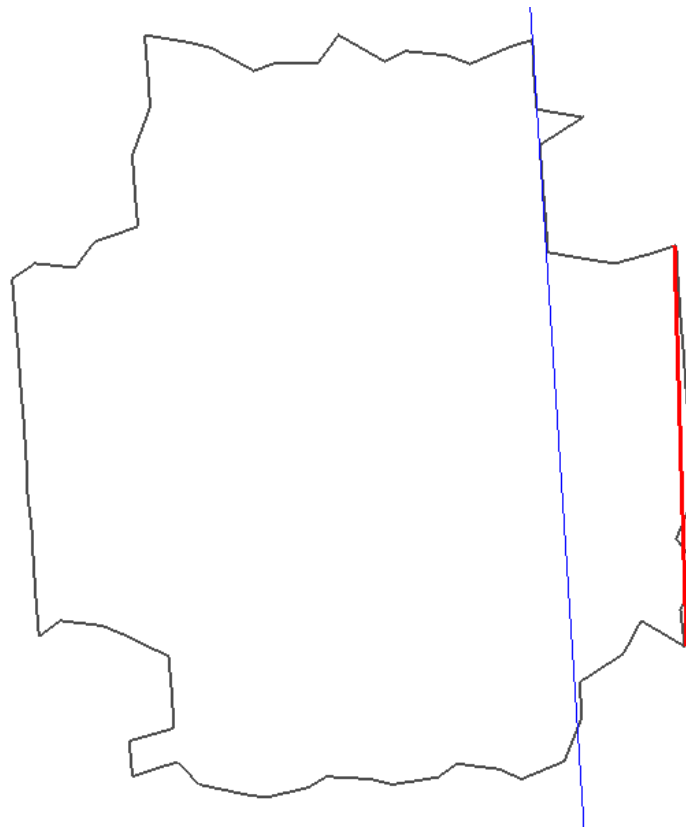
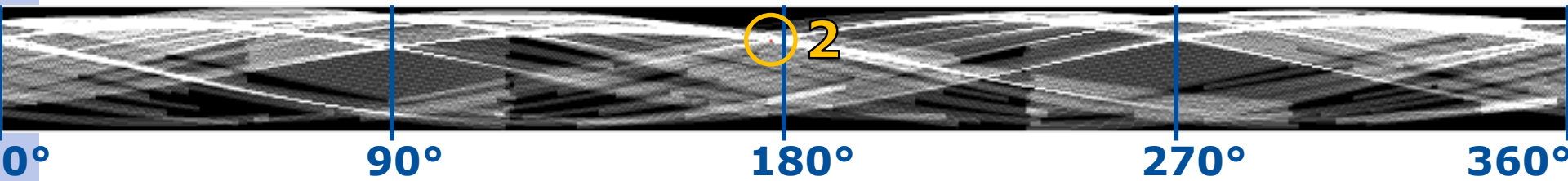


# Hough Analysis: Example

# Hough Analysis: Example, step 1

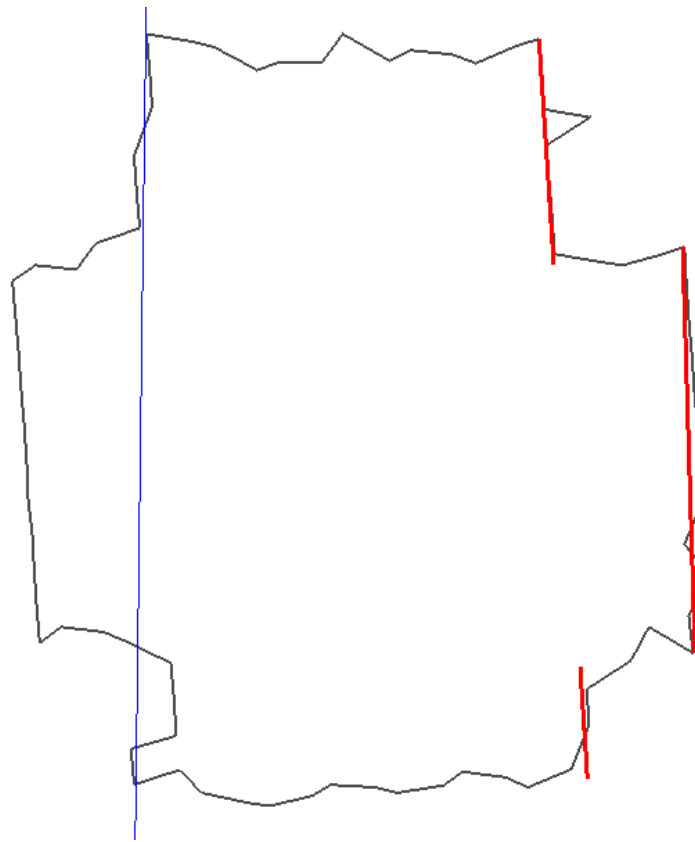
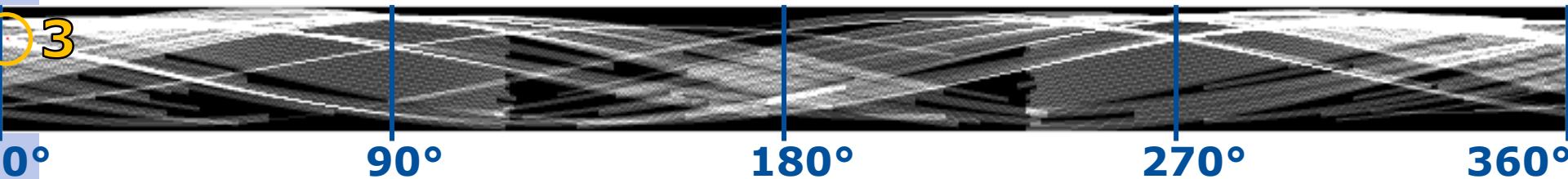


# Hough Analysis: Example, step 2

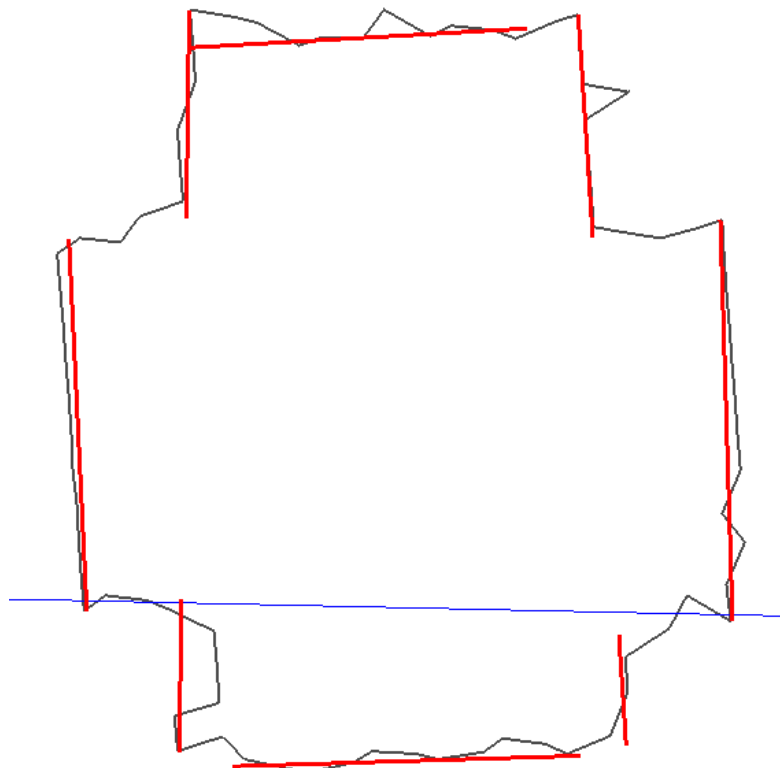
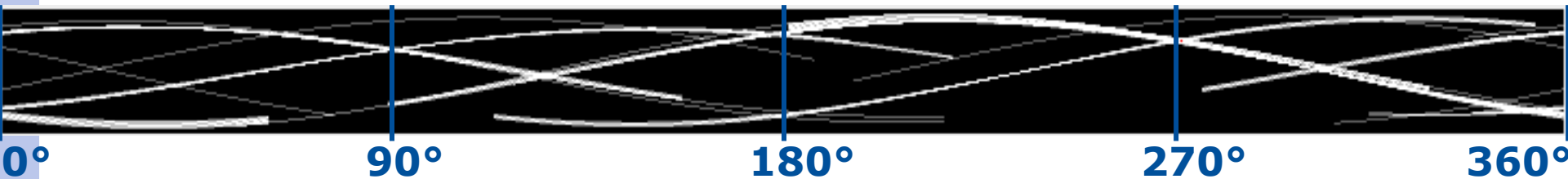




# Hough Analysis: Example, step 3



# Hough Analysis: Example, step 7



Adjustment: Refining and Fitting the new  
Segments to the Original Shape

# Adjustment process: Workflow

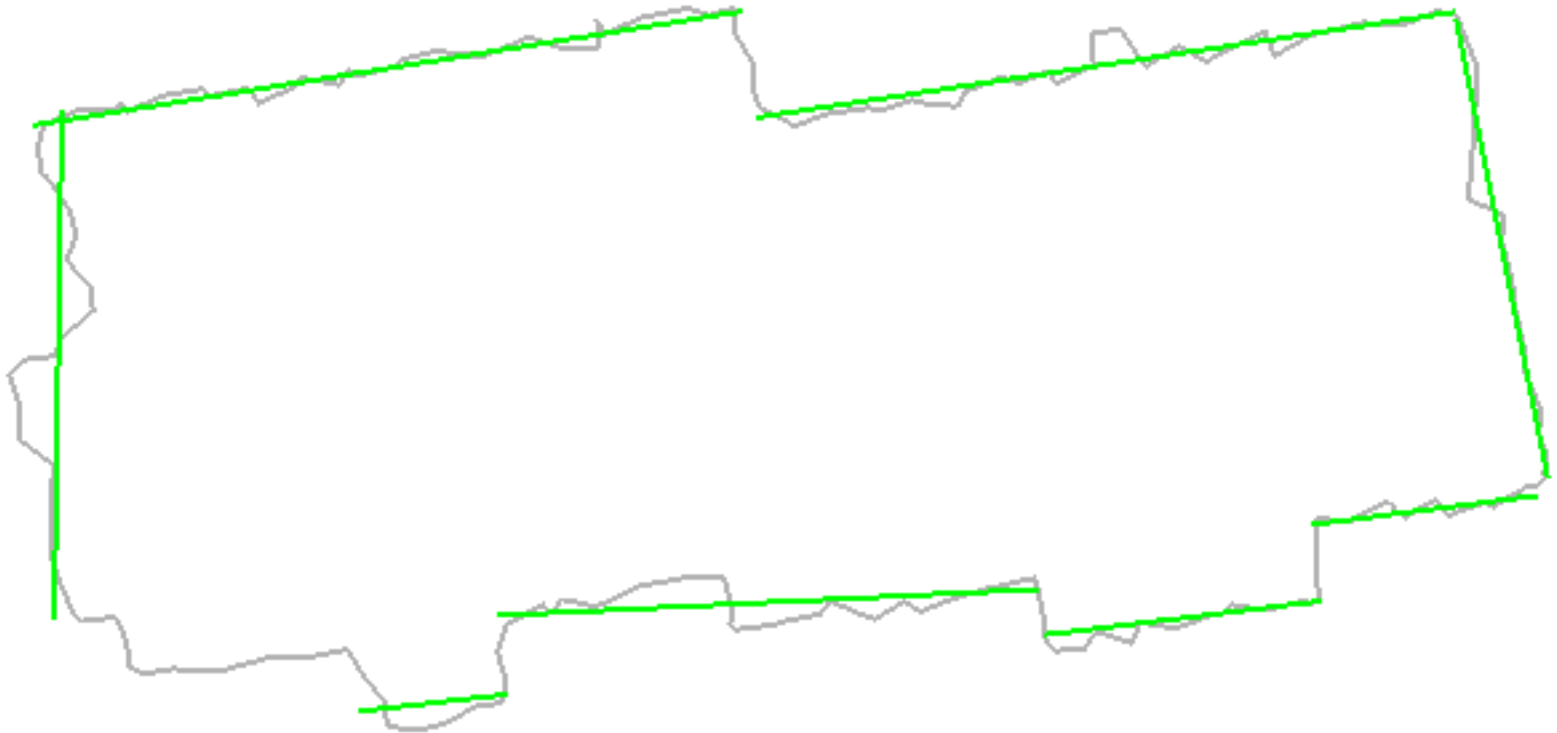
1. Reassign original points between adjacent new segments
    - Assign each point to the closest segment
    - If a segment is too short, it is removed
  2. Least squares adjustment (3 steps, linearized)
    - Line hypotheses in HNF:  $ax + by + c = 0$
    - Observation equations to
      - a) Fit segments to edges (min distance)
      - b) Enforce right angles / parallel segments (if almost  $\parallel$  or  $\perp$ )
      - c) Shift segments parallel to match edges
- ▶ Weights of observations b) and c) are increased with each iteration

# Adjustment: Example

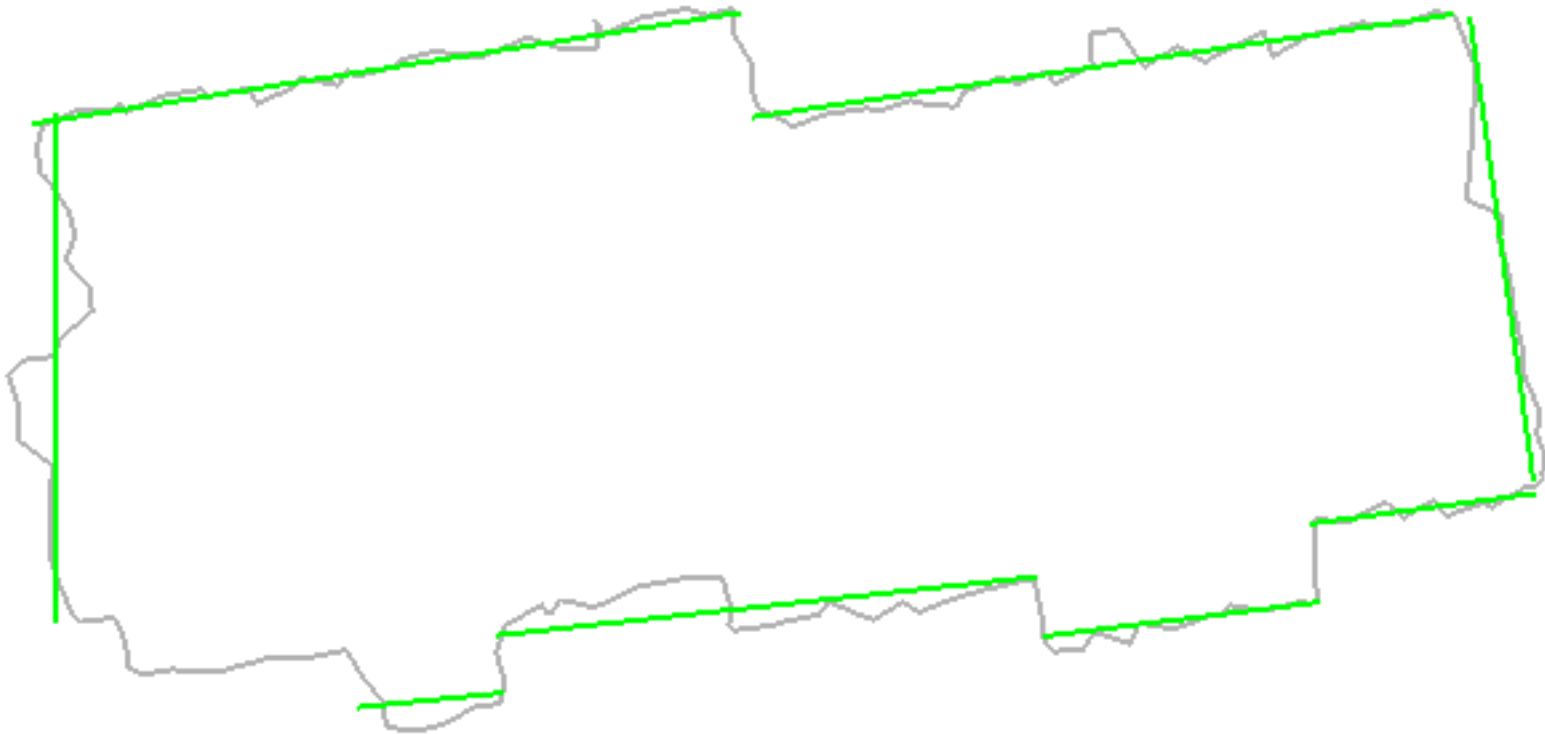
# Original shape



# After iteration 1

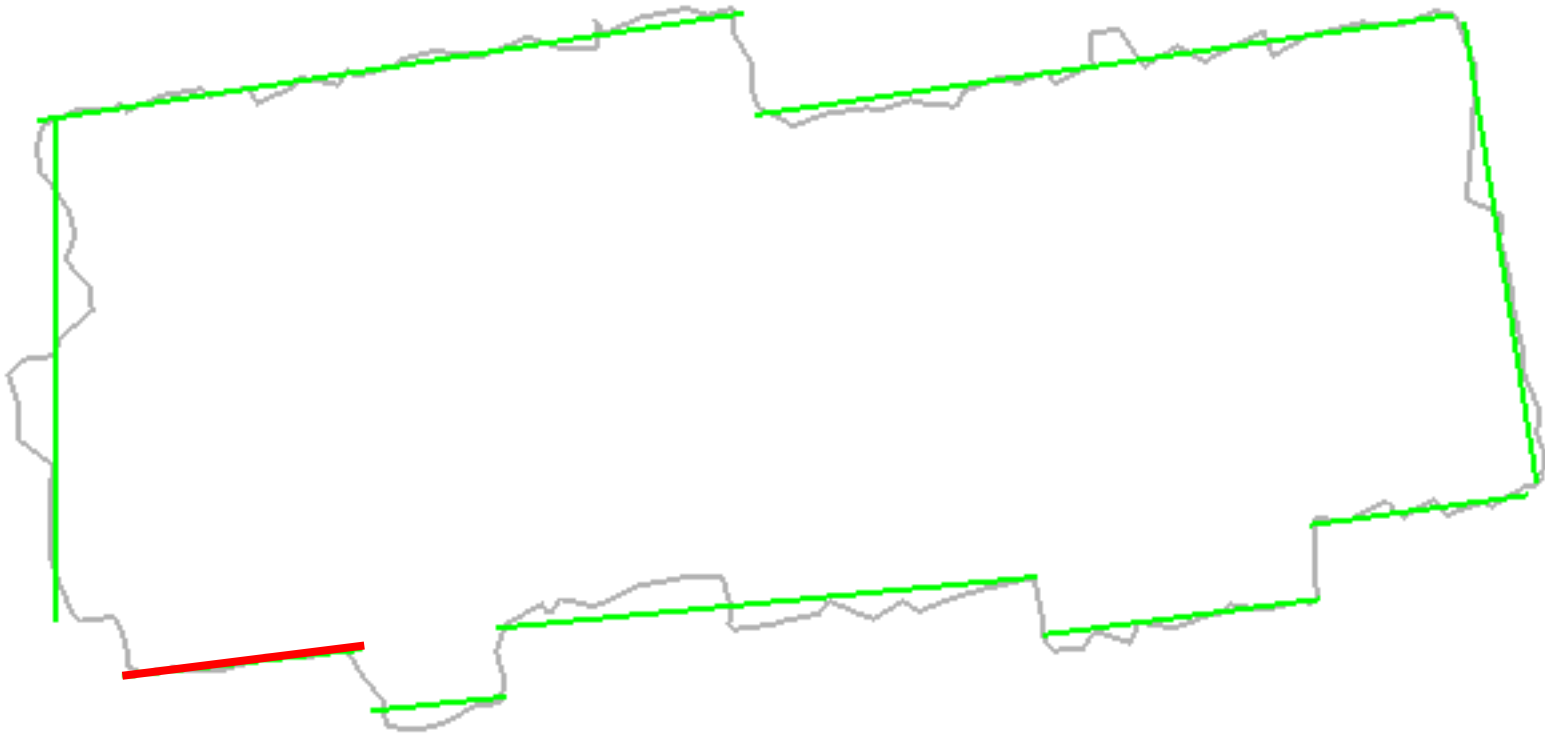


# After iteration 2

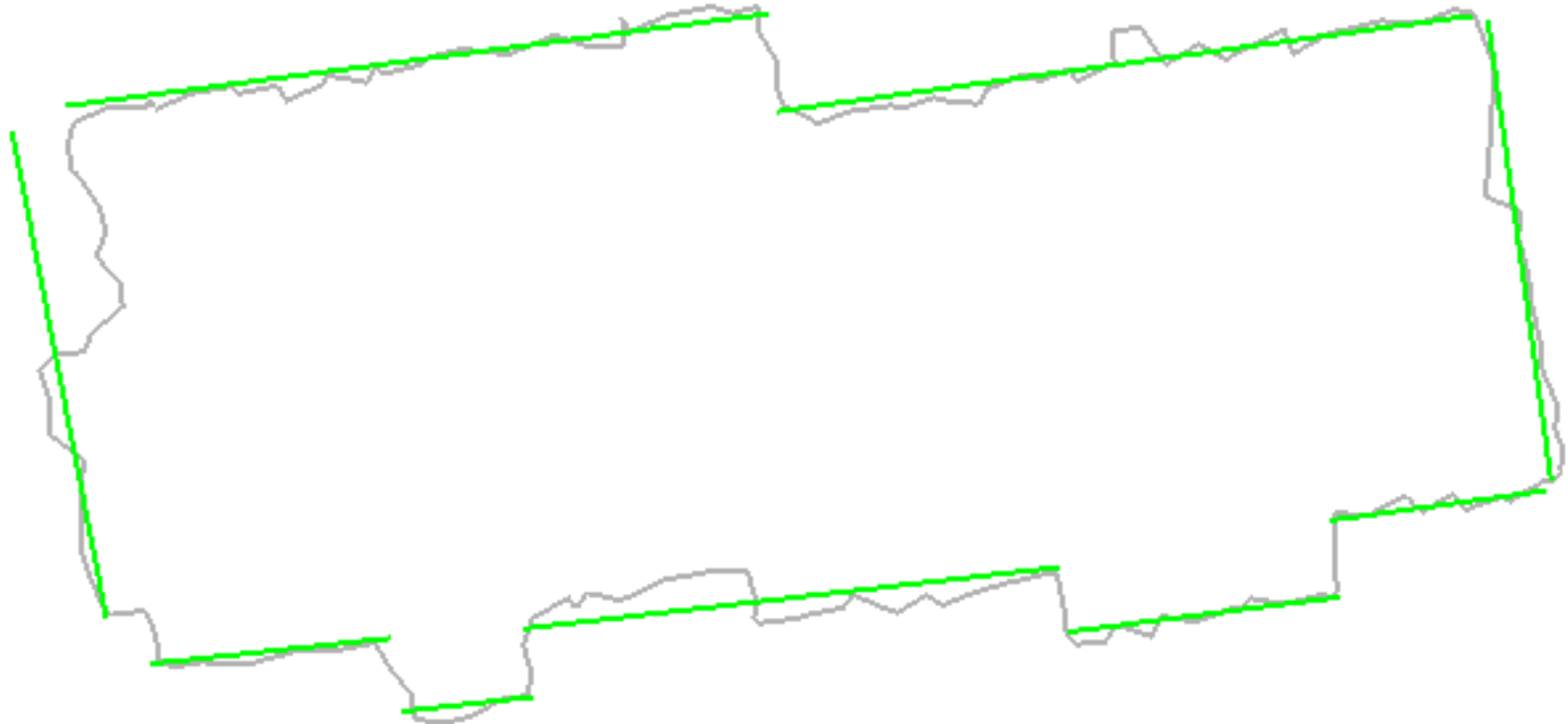




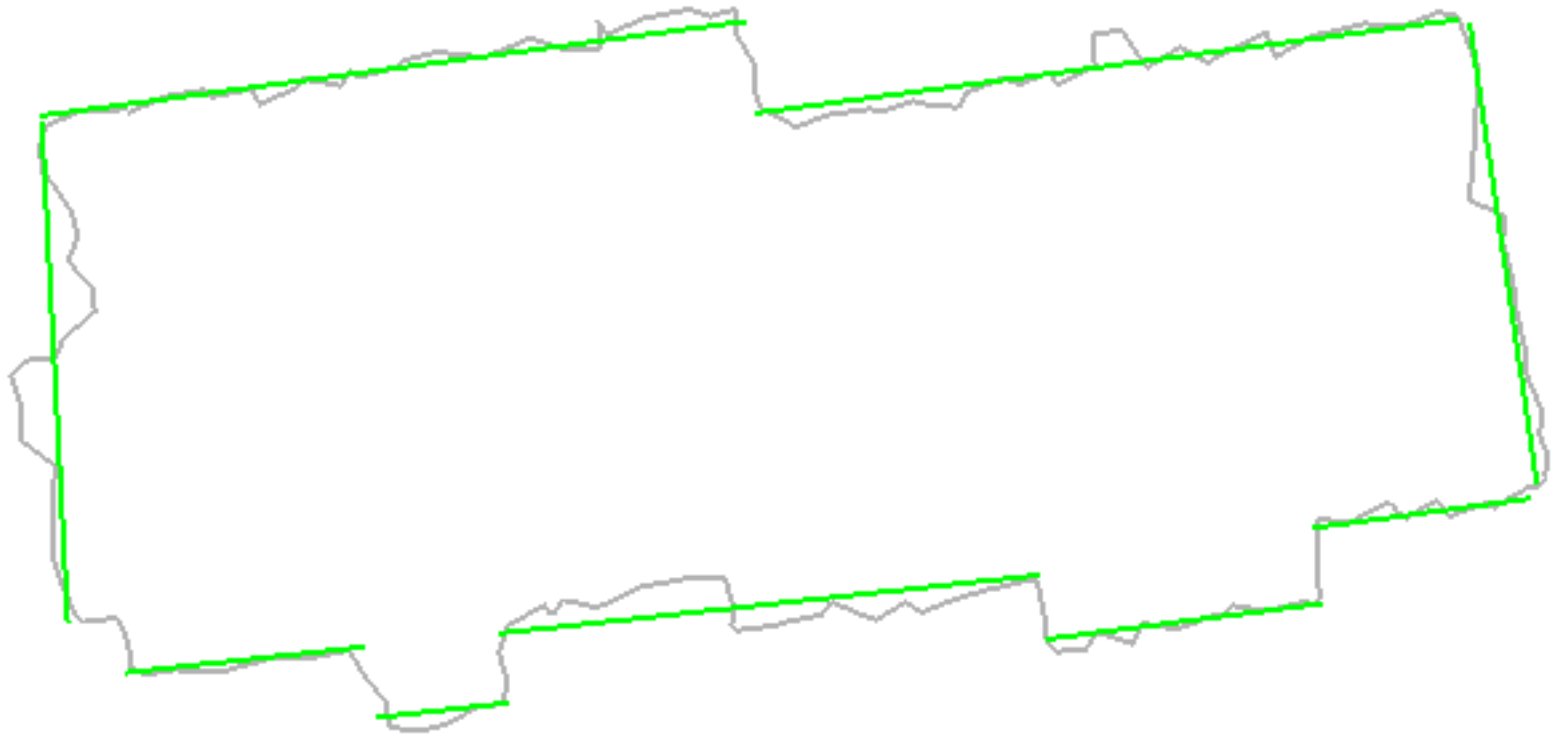
## After iteration 3: A new Segment



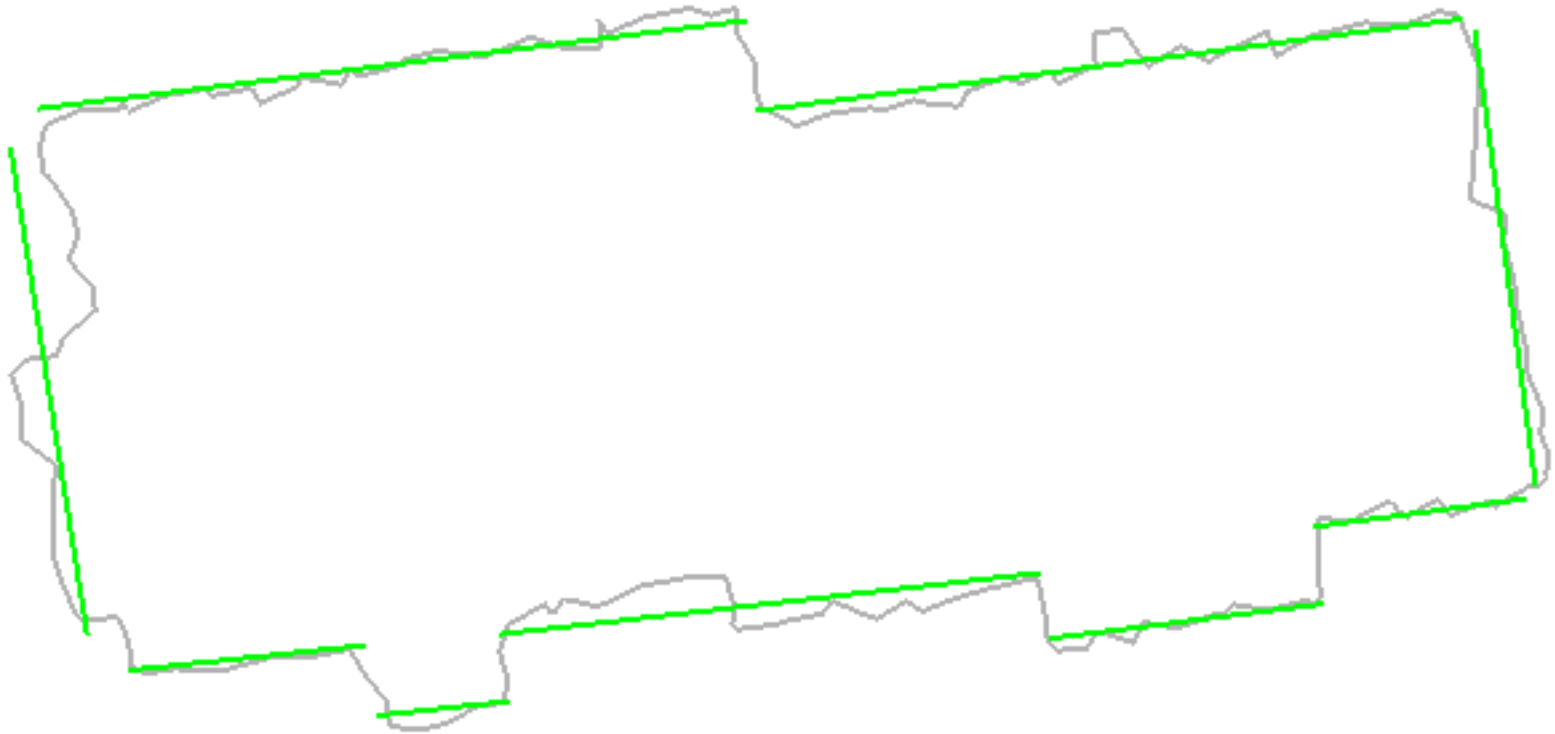
# After iteration 4



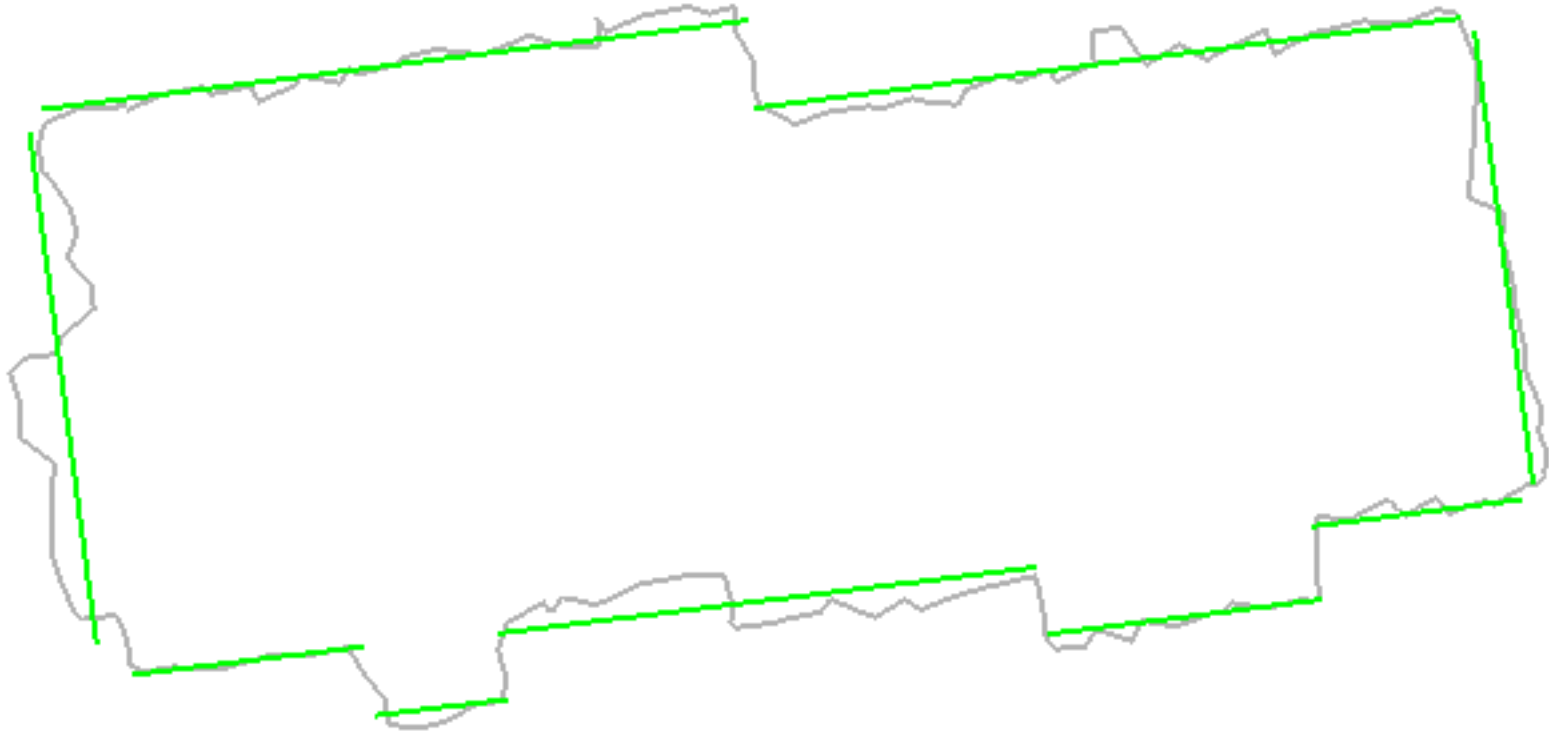
# After iteration 5



# After iteration 6



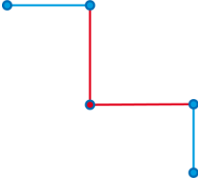
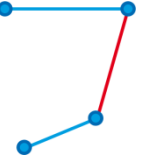


# After iteration 20

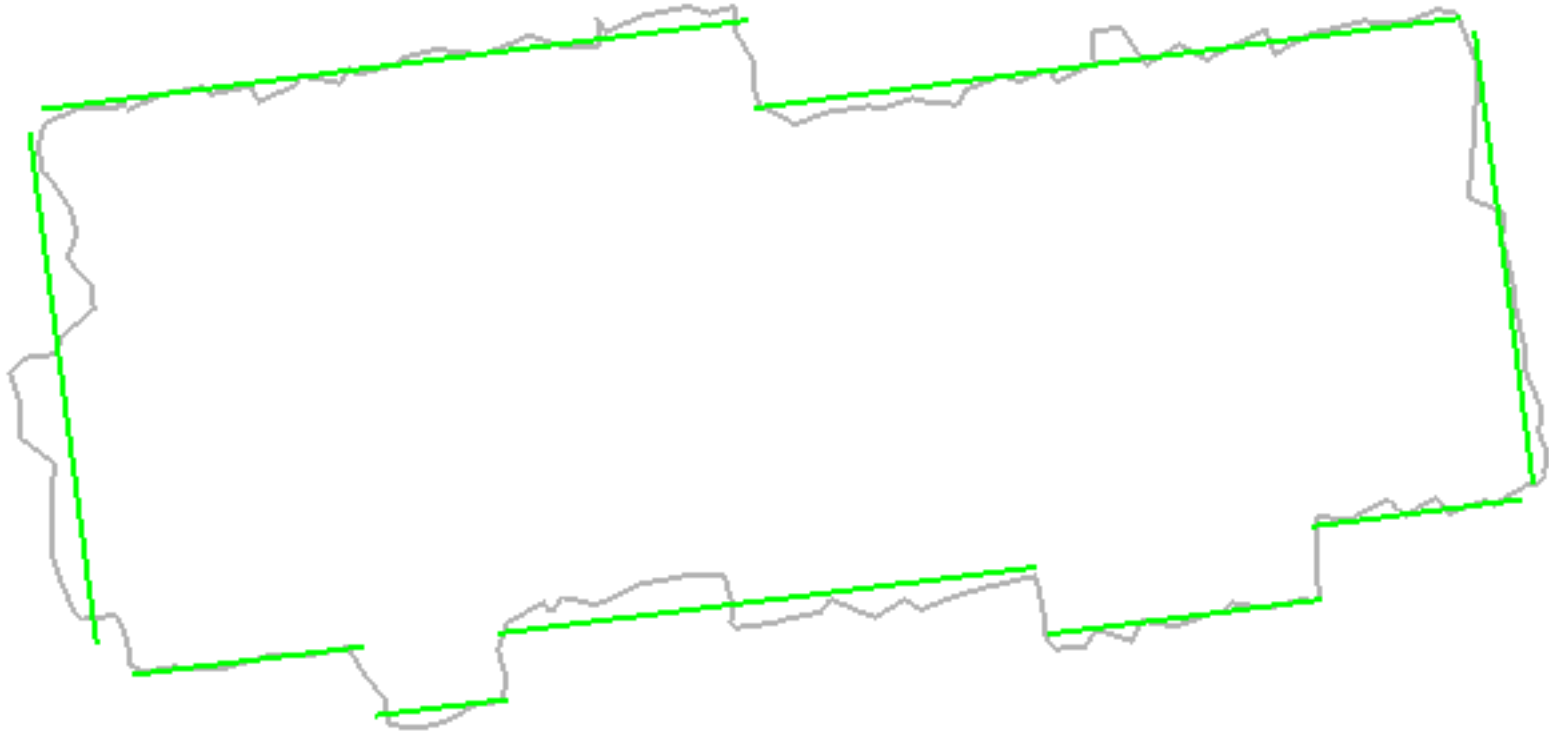


# Joining the Line Fragments

# Fragment join: 4 cases

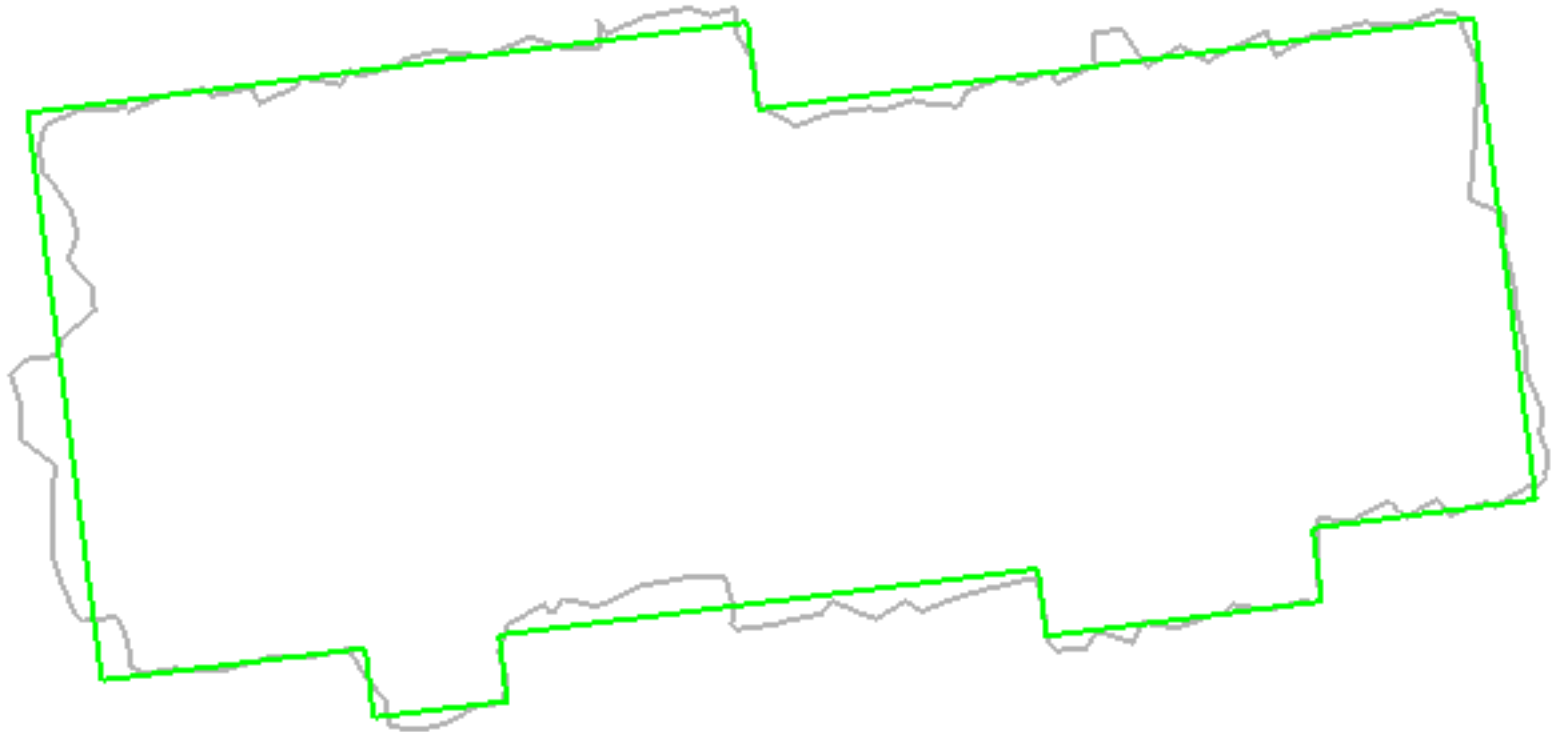
			
<p>(a) Intersection within <math>\epsilon_{line}</math> of segment ends</p>	<p>(b) Parallel segments (intersection <math>\rightarrow \infty</math>)</p>	<p>(c) Perpendicular segments (intersection distance <math>&gt; \epsilon_{line}</math>)</p>	<p>(d) Any other case</p>
<ul style="list-style-type: none"> <li>Join segments at their intersection point</li> </ul>	<ul style="list-style-type: none"> <li>insert a perpendicular segment halfway between the segment ends</li> </ul>	<ul style="list-style-type: none"> <li>insert two perpendicular segments</li> </ul>	<ul style="list-style-type: none"> <li>insert a segment joining the ends of the original segments</li> </ul>

# Final Fragments after Adjustment





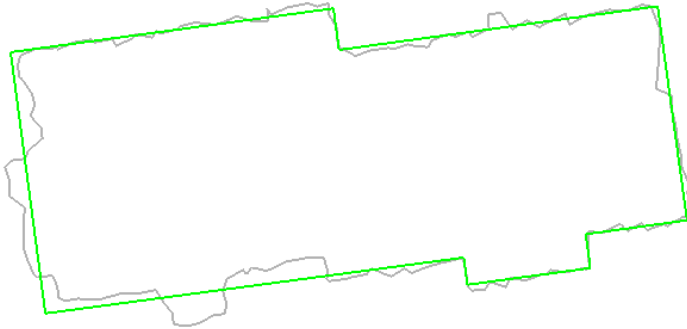
# Joined Fragments



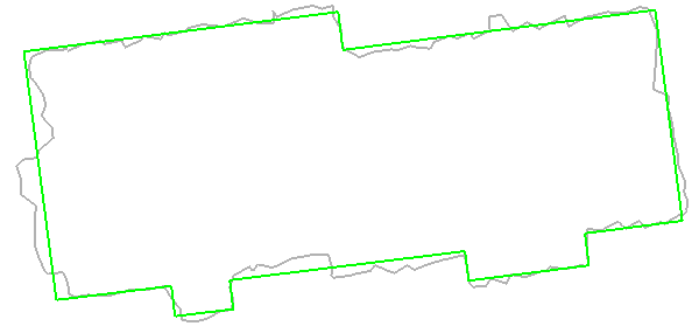
# Results & Issues

# LOD Series for Building No. 500

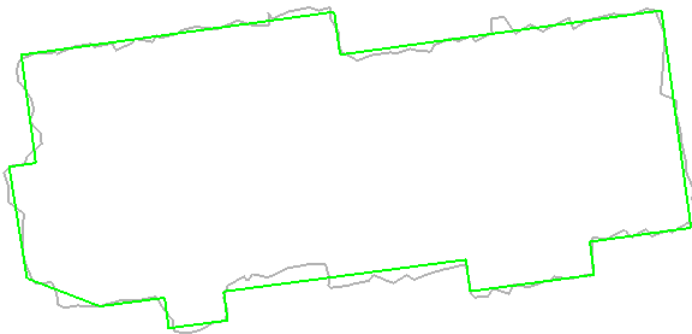
Resolution: 2.0m



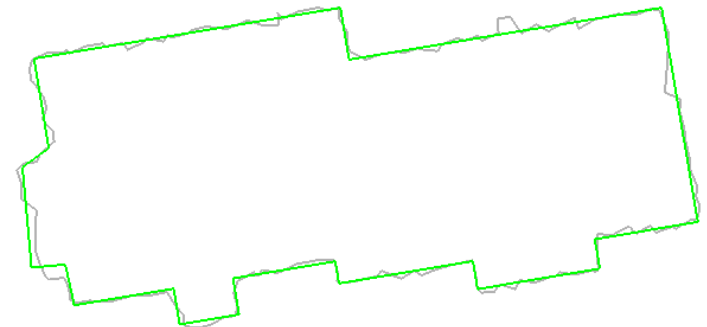
Resolution: 1.5m



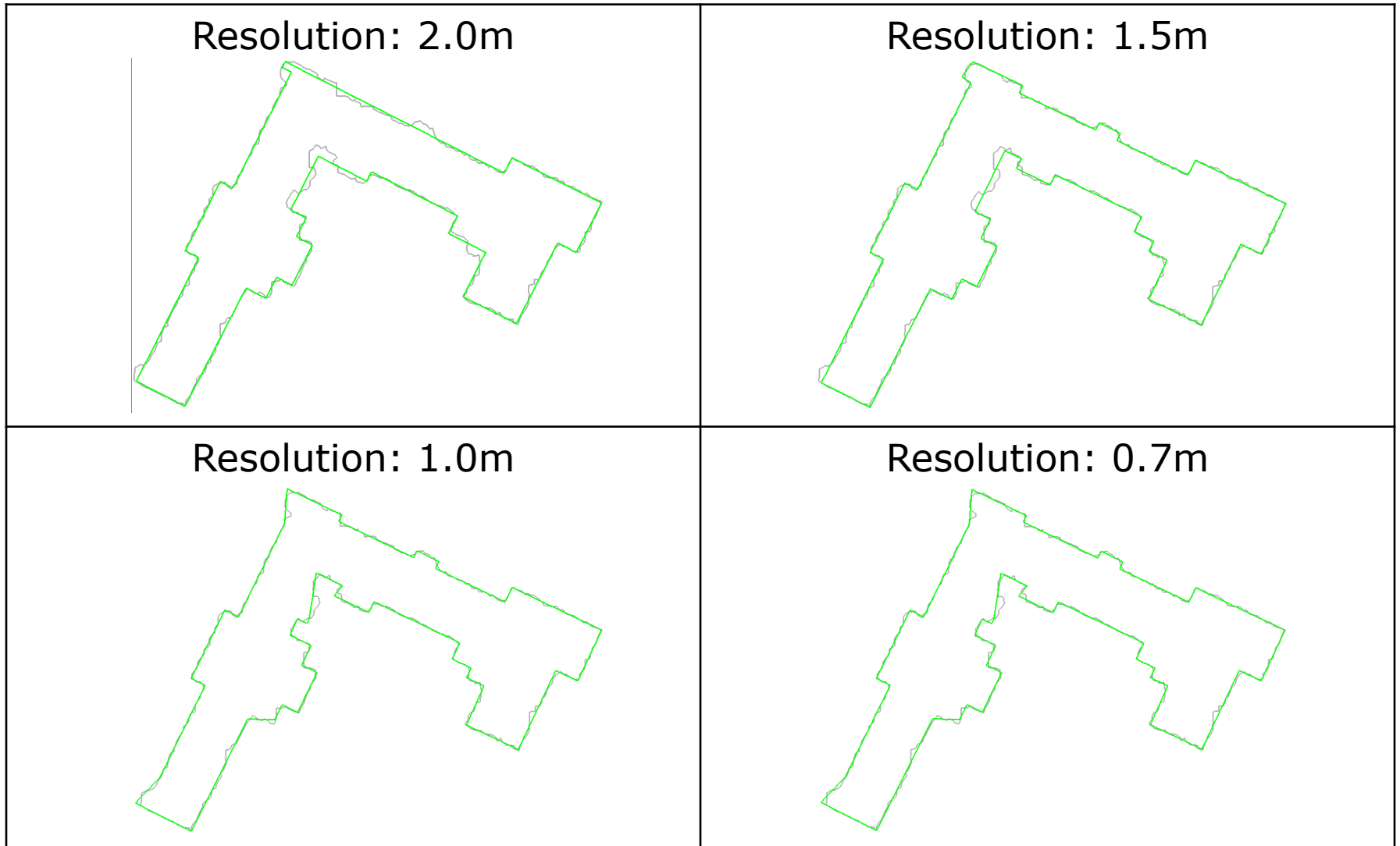
Resolution: 1.0m



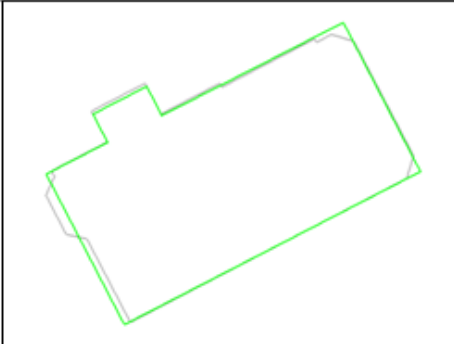
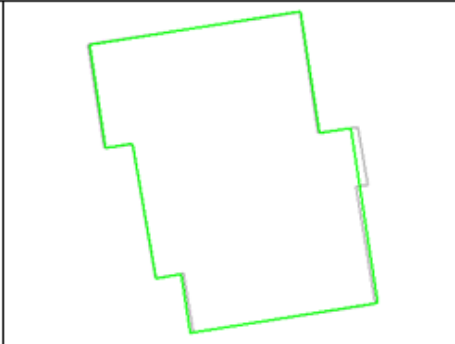
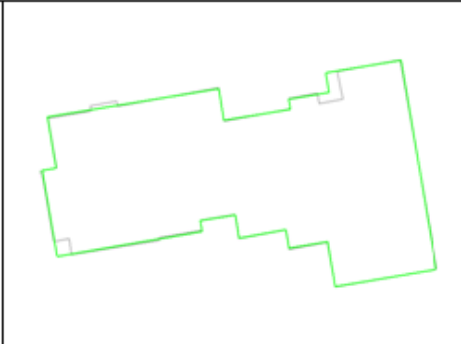
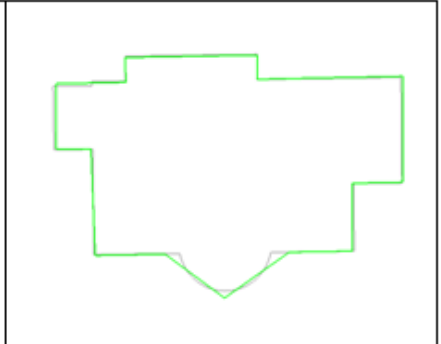
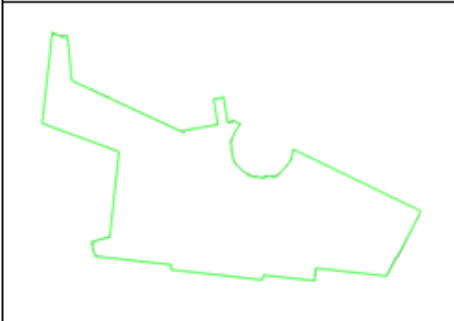
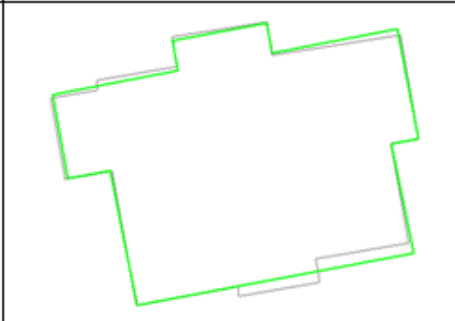
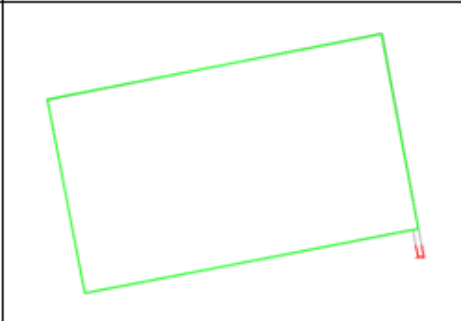
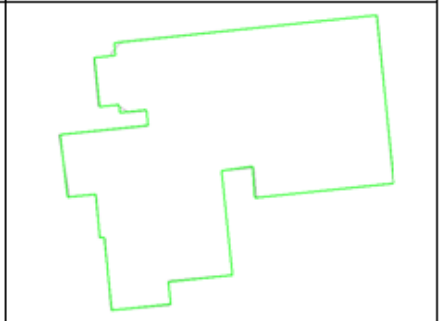
Resolution: 0.7m



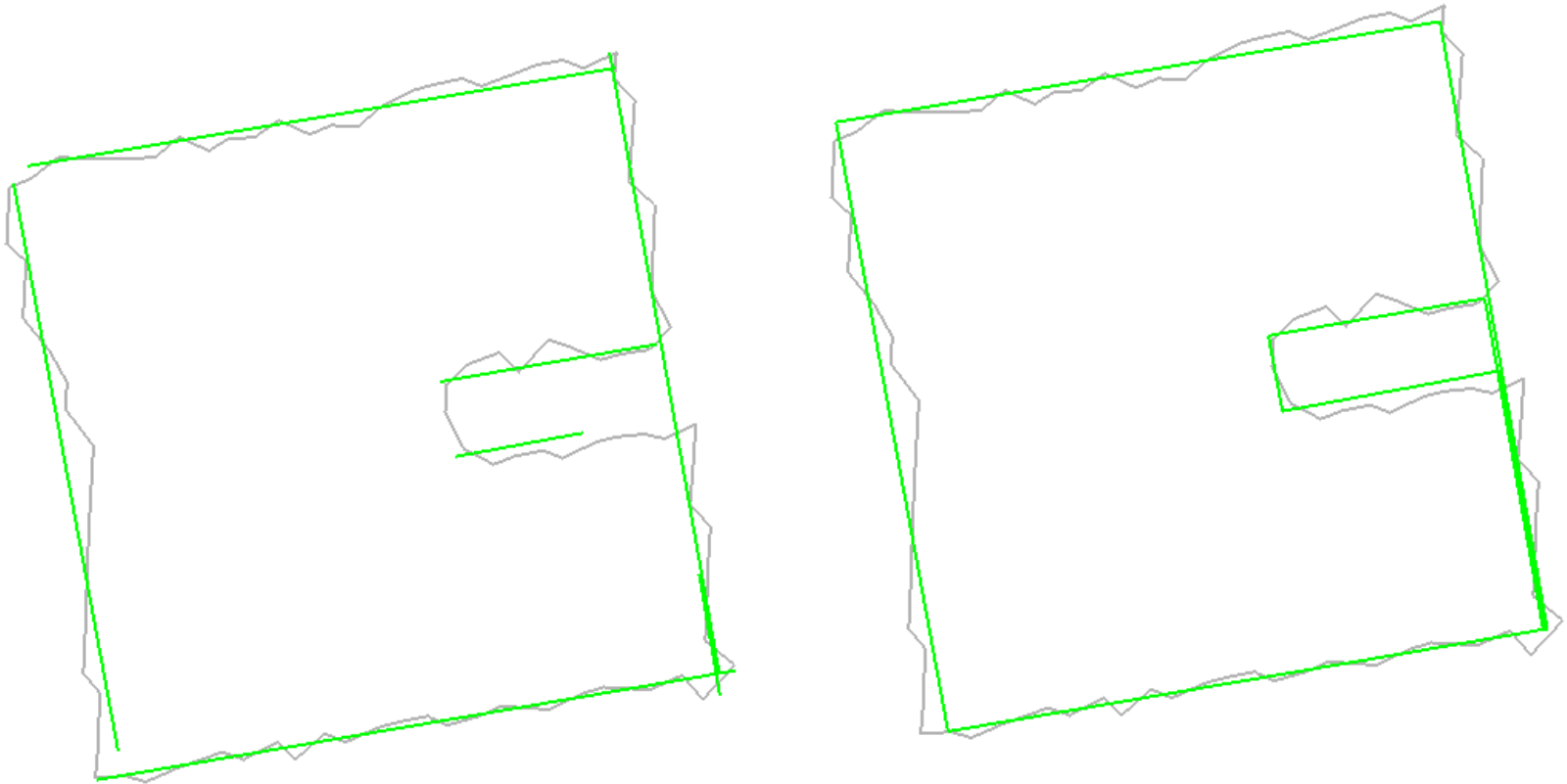
# LOD Series for Building No. 1935



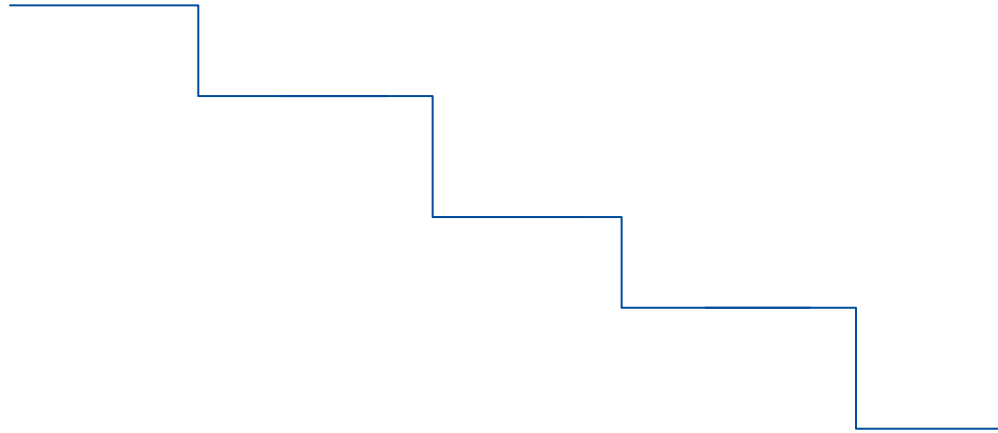
# Data reduction: Examples (resolution: 0.7m)

			
21/8	12/10	30/20	175(16)/15(13)
			
394(32)/32(22)	18/12	6/4	25/22

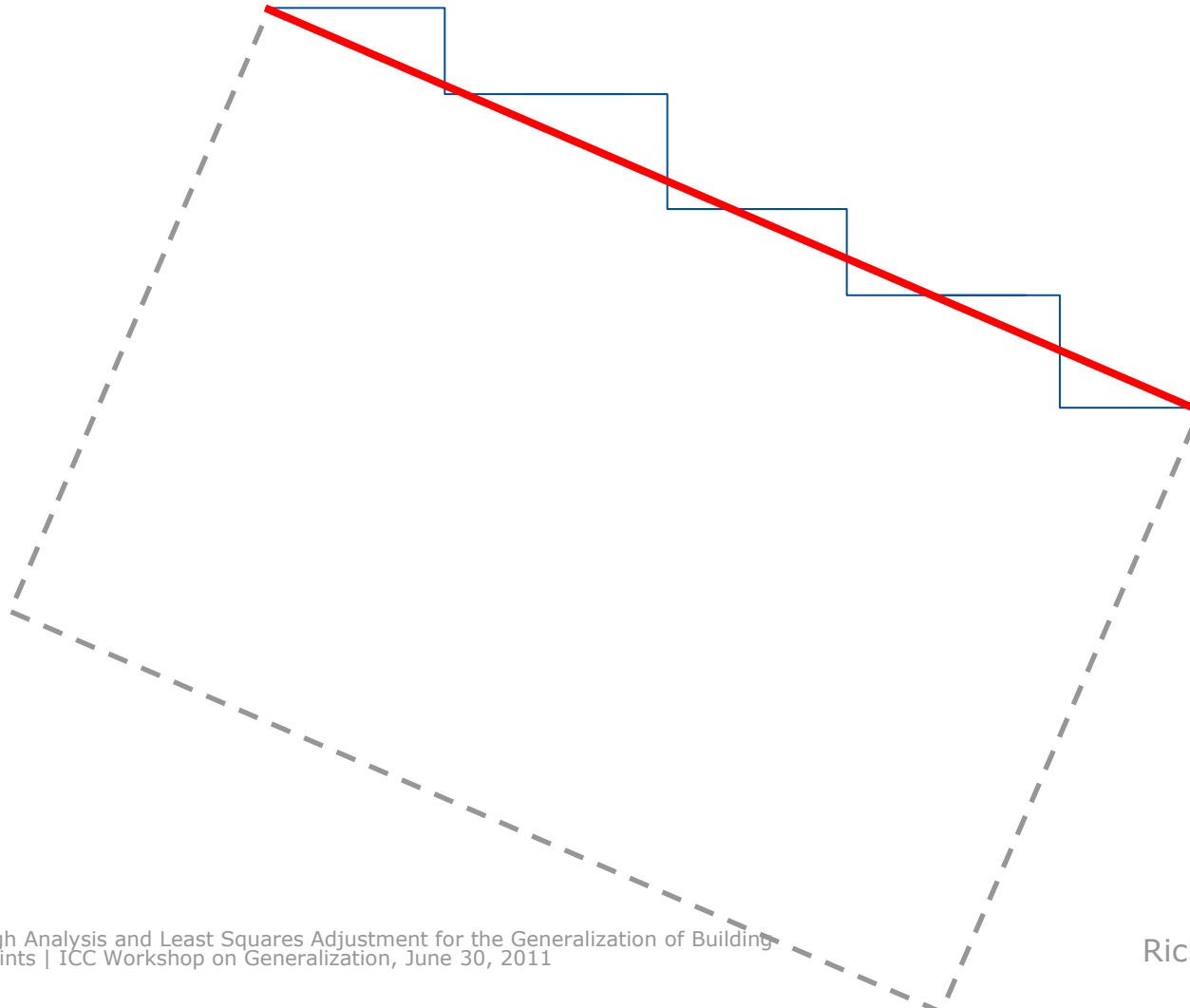
# “Cut Segments”



# “Stairs”: Ambiguities

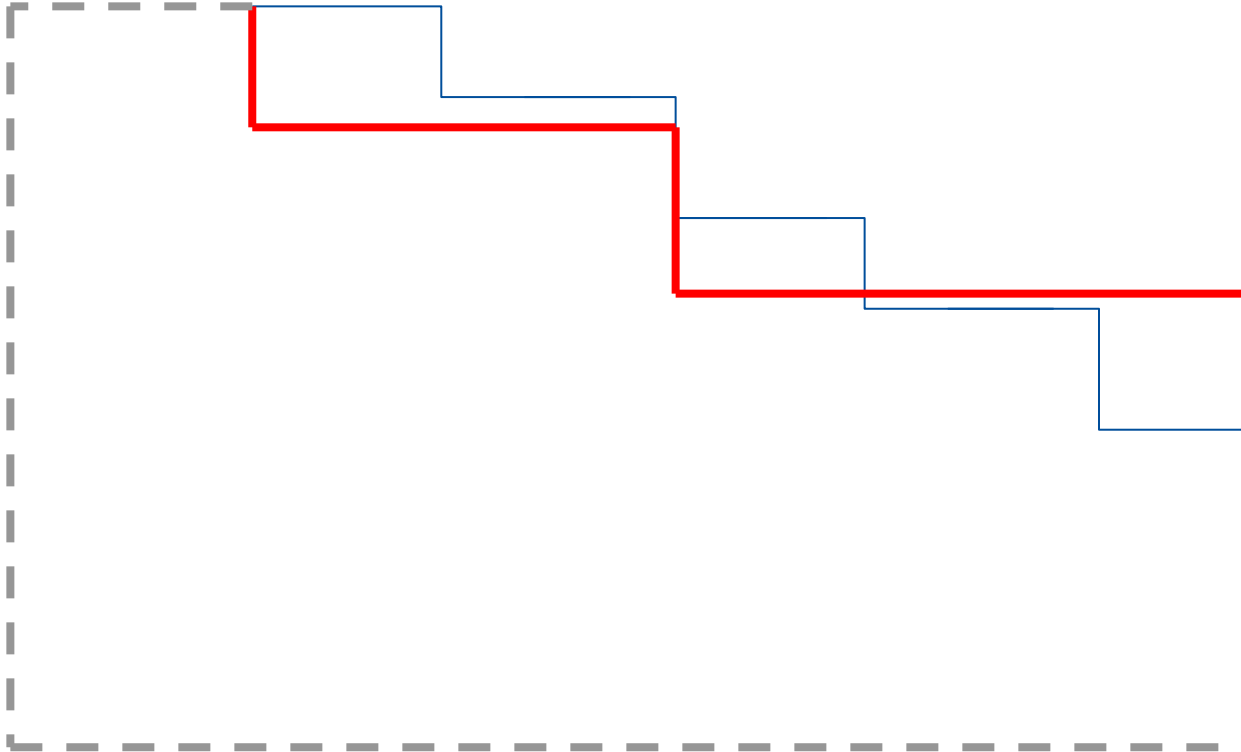


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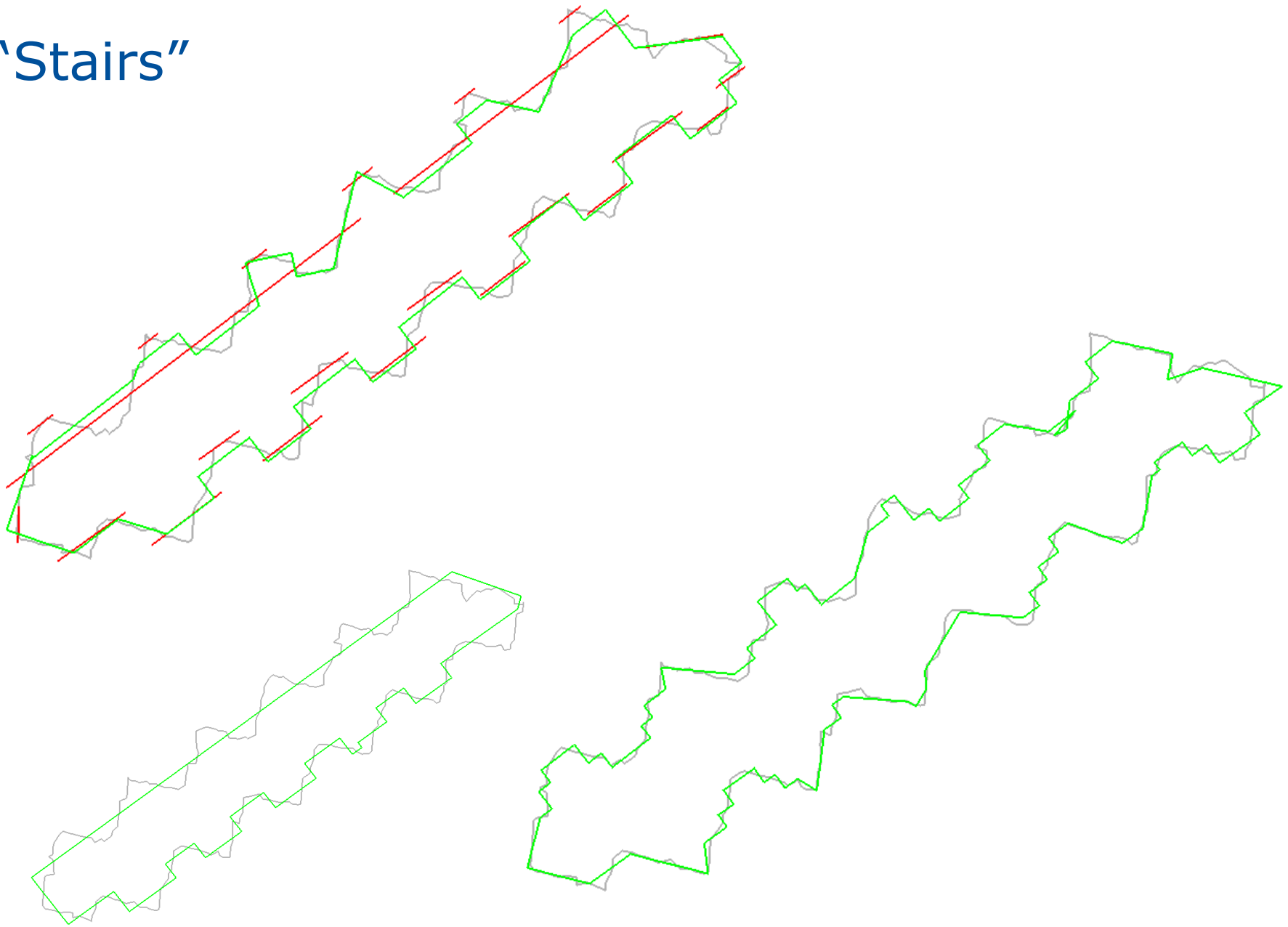




# “Stairs”: Ambiguities



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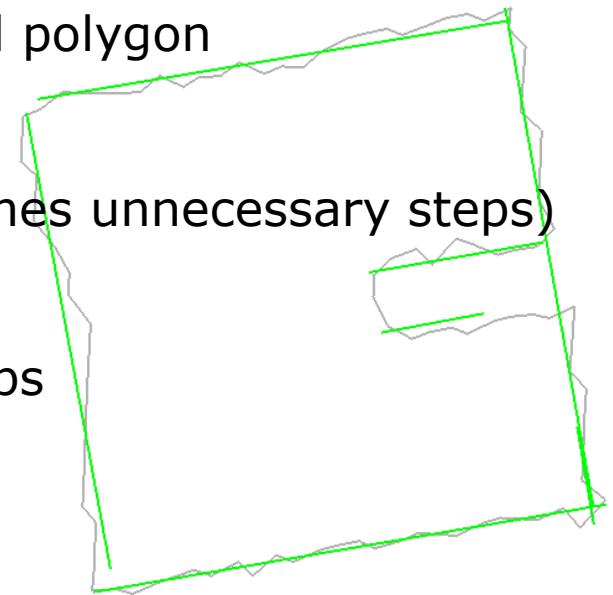
# Conclusions & Outlook

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- ▶ Two use cases of building footprint simplification addressed
  - LOD generation / data reduction for given resolution
  - “De-noising” of fuzzy footprints
- ▶ General approach
  - Use a slightly modified Hough transform to find initial line segments
  - Refine the line segments to fit the original shape using LSA
  - Connect the line segments to form a closed polygon
- ▶ Results
  - Almost optimal compression rates (sometimes unnecessary steps)

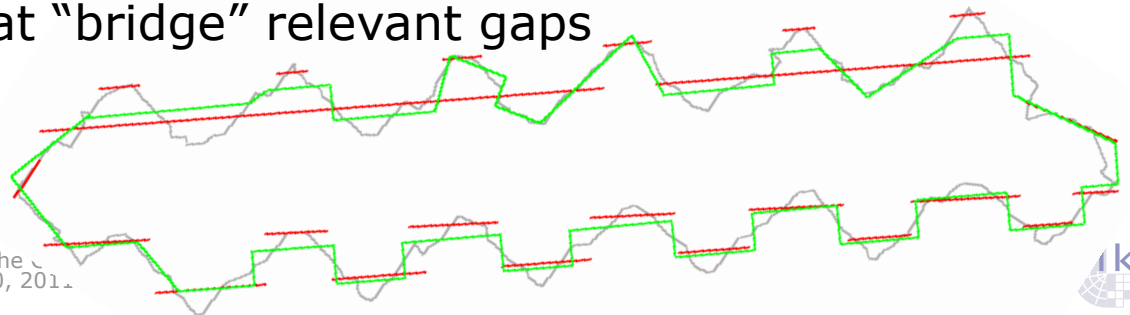
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  - Almost optimal compression rates (sometimes unnecessary steps)
  - Issues:
    - Split segments that “bridge” relevant gaps
    - Resolve “stairs”



# Outlook

- ▶ Hough analysis
  - Evaluate different maxima simultaneously
  - Compare to RANSAC
- ▶ Resolve “bridged gaps” and “stairs” issues
- ▶ Include holes
- ▶ Increase stability / ensure convergence
  - Simulated annealing
  - Circular dependencies

