

ACM SIGSPATIAL 2020

# Topology-Preserving Terrain Simplification

Ulderico Fugacci

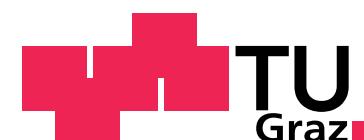
CNR - IMATI

Michael Kerber

TU Graz

Hugo Manet

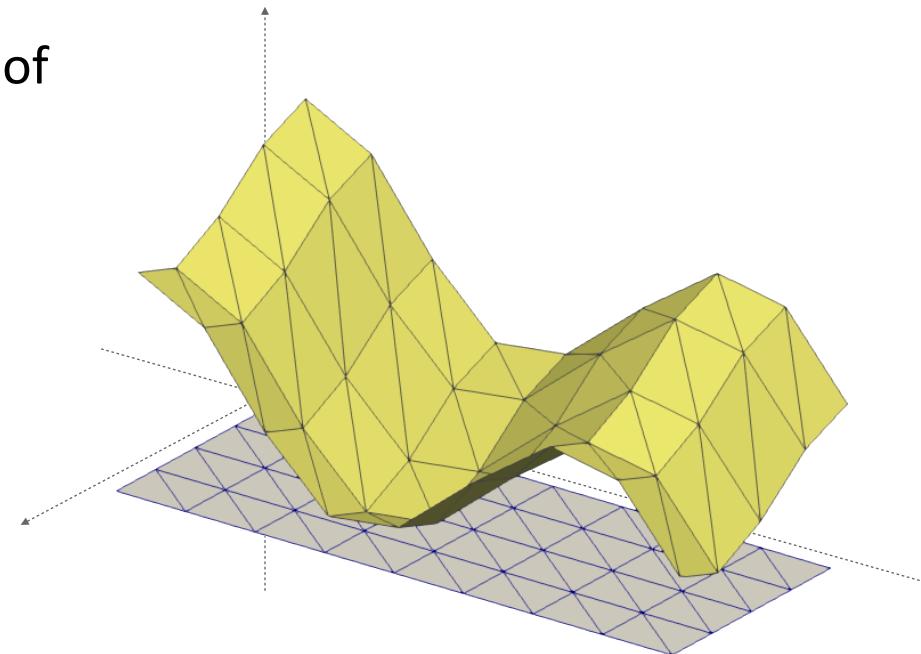
ENS Paris



international production high level  
tools infrastructure societal  
development challenges local  
mission system spreading initiatives  
IMATI excellent research  
productive leadership innovation  
participation engineering scientific  
knowledge mathematics education  
projects

# Motivations

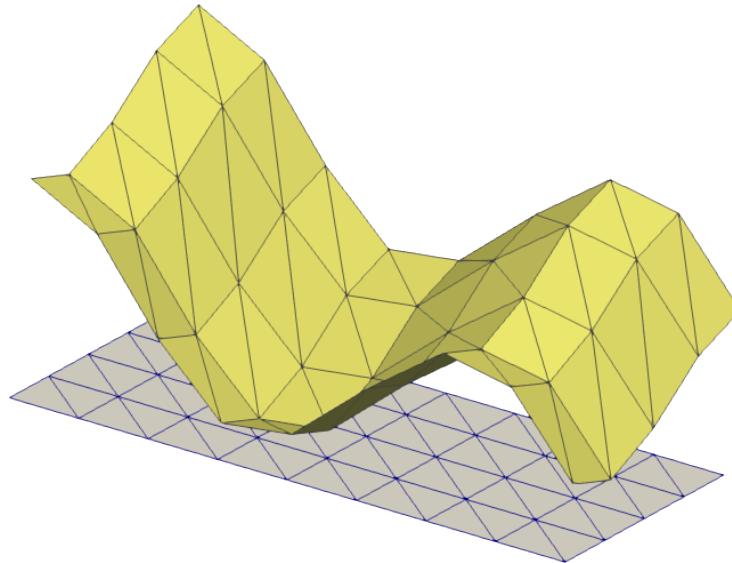
A **terrain  $T$**  consists of



- ◆ a **triangulation** of a **compact polygonal region in  $\mathbb{R}^2$**  on a set of vertices  $V$  (possibly with internal vertices)
- ◆ endowed with an **injective scalar function  $t: V \rightarrow \mathbb{R}$**  called **height function**

# Motivations

By filtering  $T$  through the height function  $t$ ,

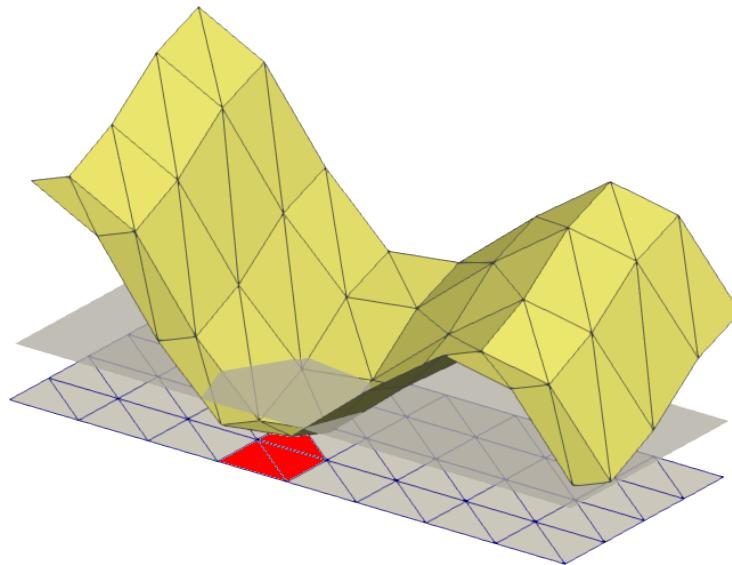


**Persistent Homology**  
enables the study of  
*terrain morphology*

***Changes in homology*** are in correspondence with ***critical points*** of  $t$

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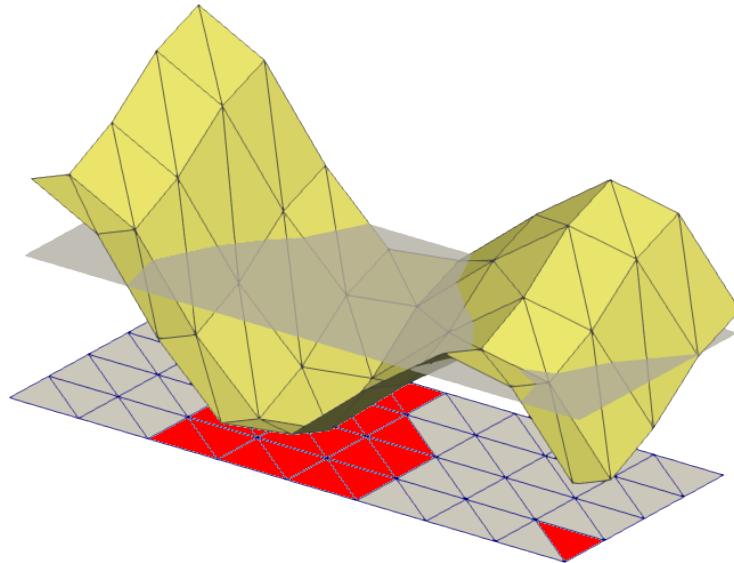


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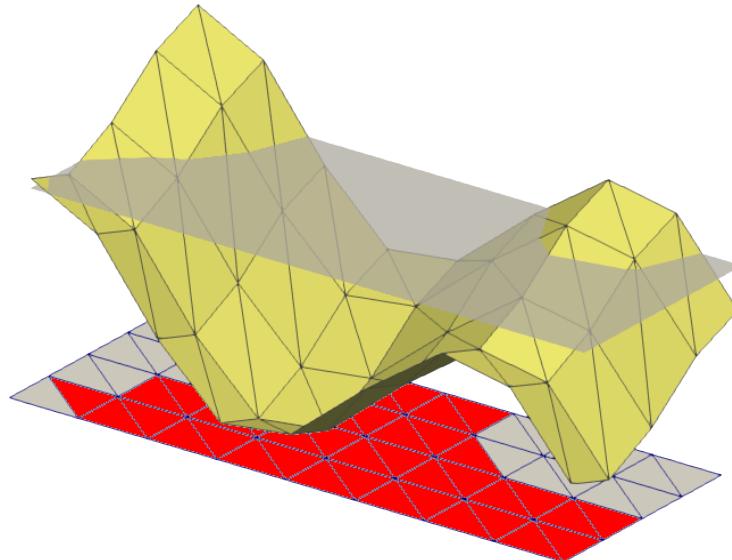


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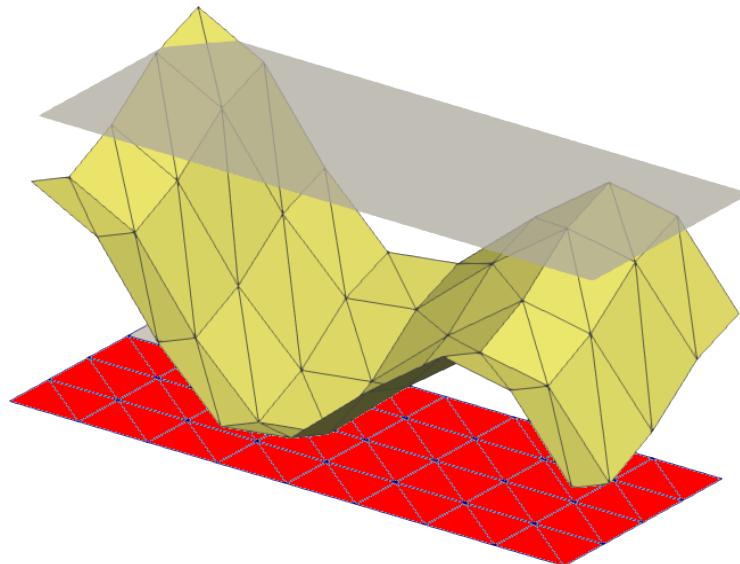


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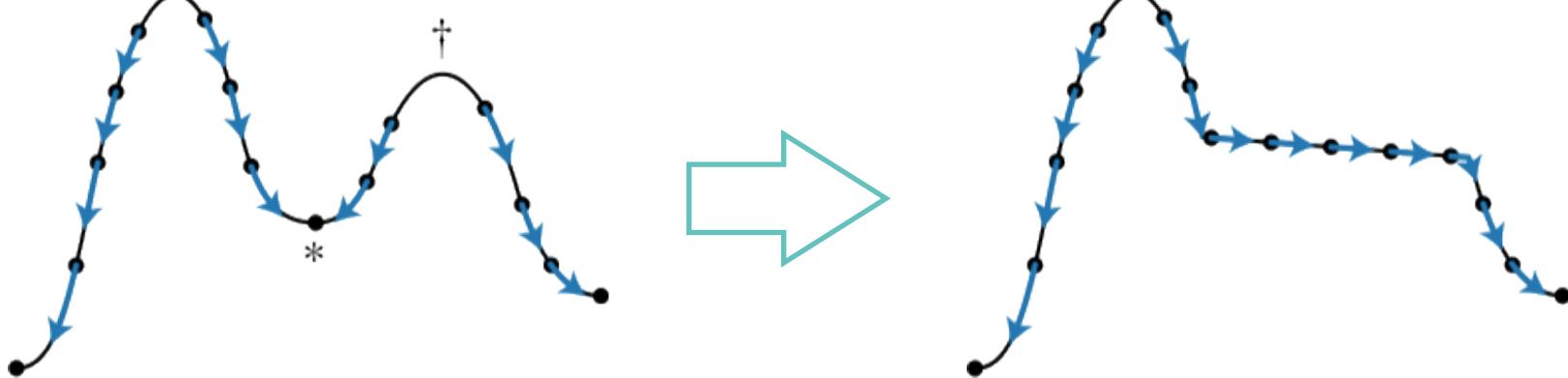


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# Motivations

*Topological terrain simplification* consists in the *removal* of



Images from [Bauer et al. 2012]

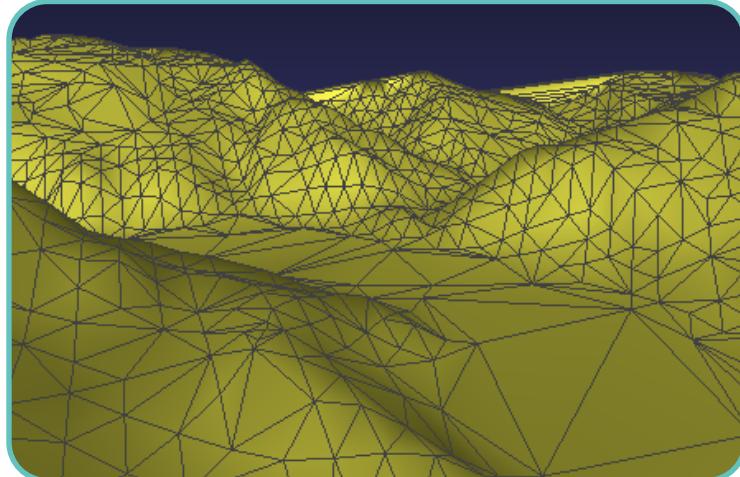
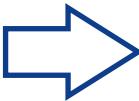
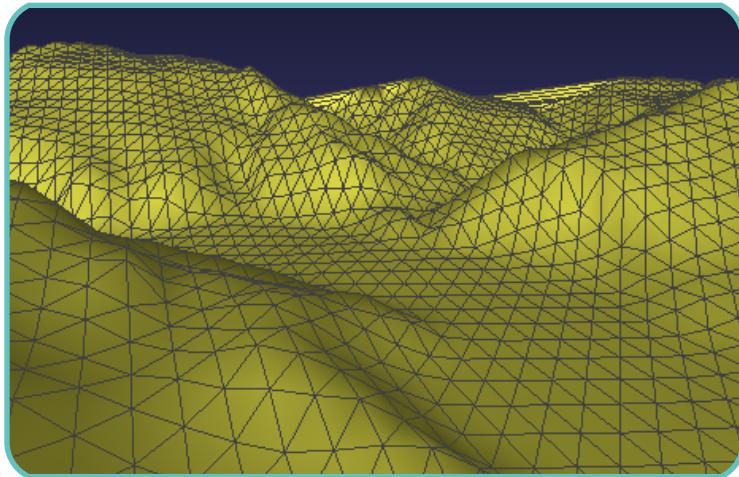
*low-persistence pairs* of critical points considered as *topological noise*



Output can be affected by *geometrical oversampling*

# Motivations

We propose a different approach



- ◆ **Reduce** the *size* of the terrain
- ◆ **Maintain** favorable properties:
  - ❖ *Persistent homology* (i.e. critical points)
  - ❖ *Geometric closeness* to the original surface

# Simplification Algorithm

**Problem:**

Given  $\varepsilon > 0$ , a base terrain  $B$  and a terrain  $T$  with  $\|B - T\|_{\infty} \leq \varepsilon$ , compute a terrain  $S$  with fewer vertices than  $T$ , such that  $\|B - S\|_{\infty} \leq \varepsilon$  and  $S$  has the *same persistent homology* of  $T$

**Algorithm:**

Initialize  $S \leftarrow T$  and  $C \leftarrow \text{Vertices of } T$

**while**  $C \neq \emptyset$ ,

**pick** a vertex  $v$  in  $C$  (uniformly at random) and **remove** it from  $C$

**if**  $\text{link}(v)$  can be *re-triangulated maintaining* the condition on *persistent homology* and *L<sub>∞</sub>-distance* **then**

**remove**  $v$  from  $S$  and **re-triangulate** its link by the found triangulation

**insert** the vertices of  $\text{link}(v)$  in  $C$  (if not already contained)

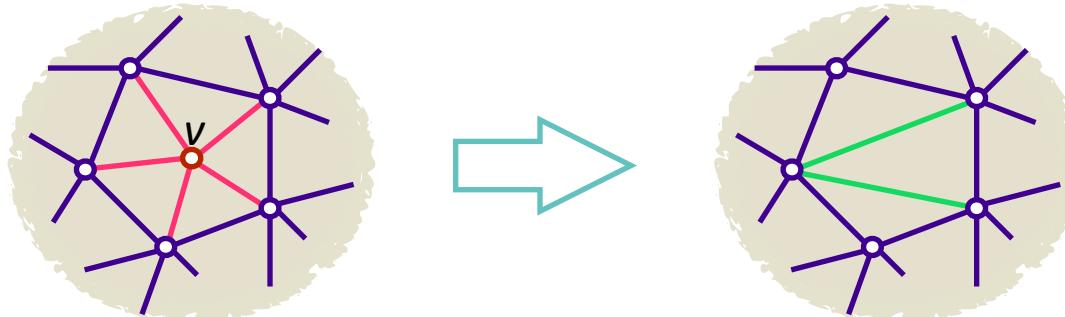
**return**  $S$

# Simplification Algorithm

## Theorem:

Given a vertex  $v$  of  $S$ , a **re-triangulation of its link maintains** the condition on:

- ◆  **$L_\infty$ -distance if** all the **diagonals** and the **triangles** of the re-triangulated link are  **$L_\infty$ -aware**
- ◆ **persistent homology iff**  $v$  is **not a critical point** and all the **diagonals** of the re-triangulated link are **persistence-aware**



A vertex satisfying the above conditions is called **removable**

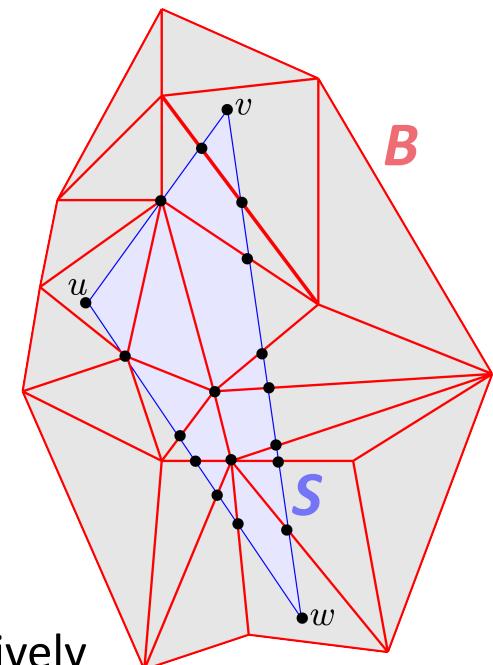
# Simplification Algorithm

## $L_\infty$ -Awareness:

Let  $u, v, w$  be vertices of  $S$ ,

- ◆  $uv$  is called  $L_\infty$ -aware if for any point  $x = \lambda u + (1 - \lambda)v$  of  $uv$ ,
$$|(\lambda s(u) + (1 - \lambda)s(v)) - b(x)| \leq \varepsilon$$
- ◆  $uvw$  is called  $L_\infty$ -aware if for any point  $x = \lambda u + \mu v + (1 - \lambda - \mu)w$  of  $uvw$ ,
$$|(\lambda s(u) + \mu s(v) + (1 - \lambda - \mu)s(w)) - b(x)| \leq \varepsilon$$

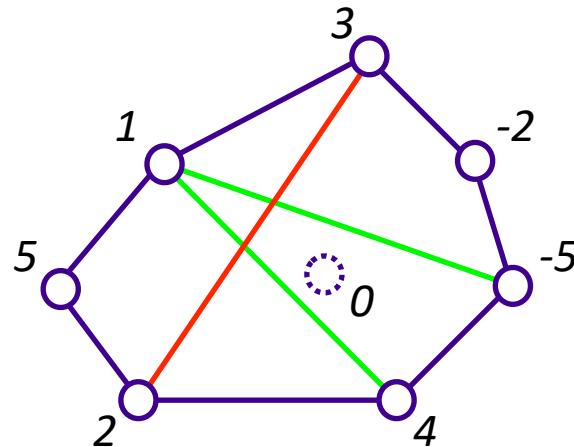
where  $s$  and  $b$  denote the height functions of  $S$  and  $B$ , respectively



# Simplification Algorithm

## Persistence-Awareness:

Let  $v$  be a vertex of  $S$  with two adjacent vertices  $u, w$  such that  $s(u) < s(w)$ ,  $uw$  is called ***persistence-aware*** if one of the following conditions holds:

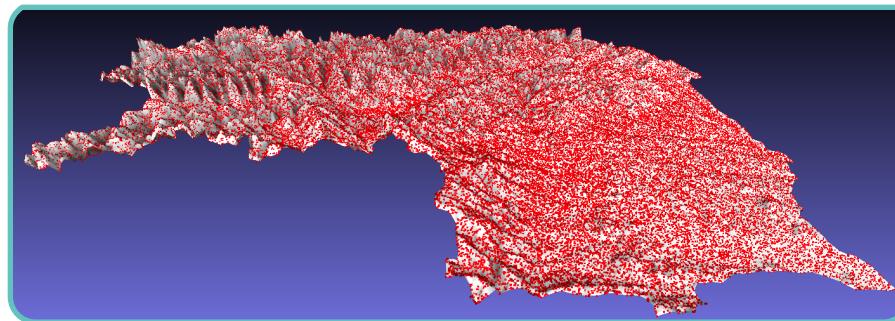


- ◆  $s(u) < s(v) < s(w)$
- ◆  $s(w) < s(v)$  and there is a path on  $\text{link}(v)$  from  $u$  to  $w$  with ***maximal height  $s(w)$***
- ◆  $s(v) < s(u)$  and there is a path on  $\text{link}(v)$  from  $u$  to  $w$  with ***minimal height  $s(u)$***

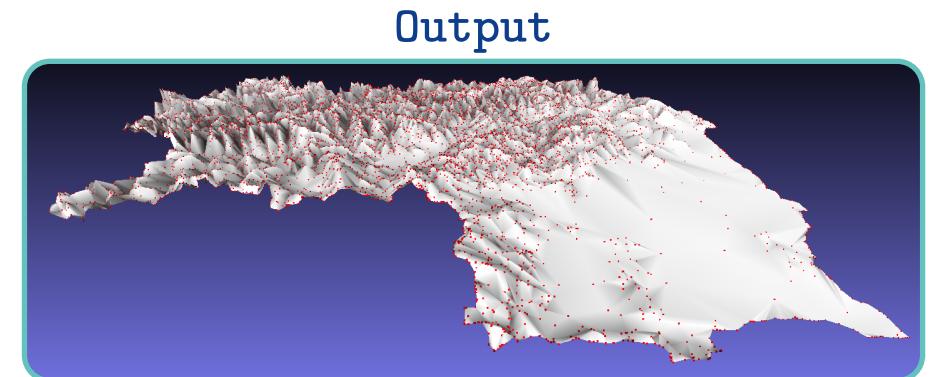
# Implementation & Experiments

Based on the proposed simplification, an algorithm has been **implemented in C++** and it is available in a **public repository** (<https://bitbucket.org/mkerber/terrain simplification>)

Given an **input terrain  $B$**  and some  $\epsilon > 0$ , the algorithm returns a **terrain  $S$**  that is  $\epsilon$ -close to  $B$  in  $L_\infty$ -distance and has the **smallest number of critical points possible**



Input



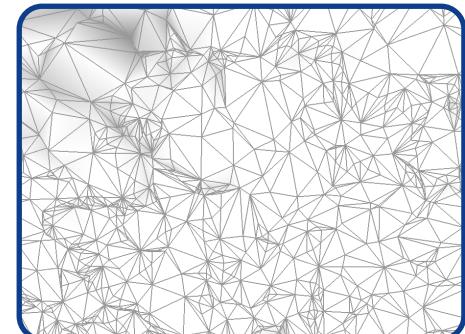
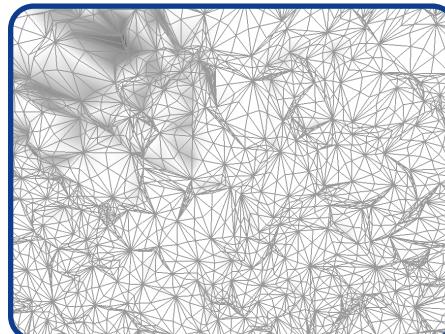
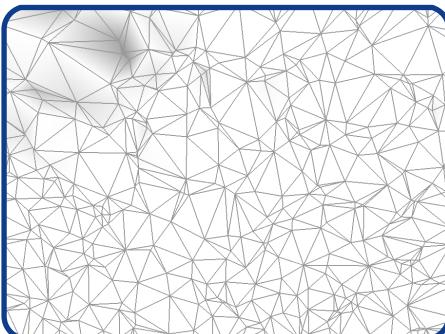
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- ◆ Apply an improved version of the **topological simplification** of [Bauer et al. 2012] on  $(B, \epsilon)$  to get a terrain  $T$  with the specified properties

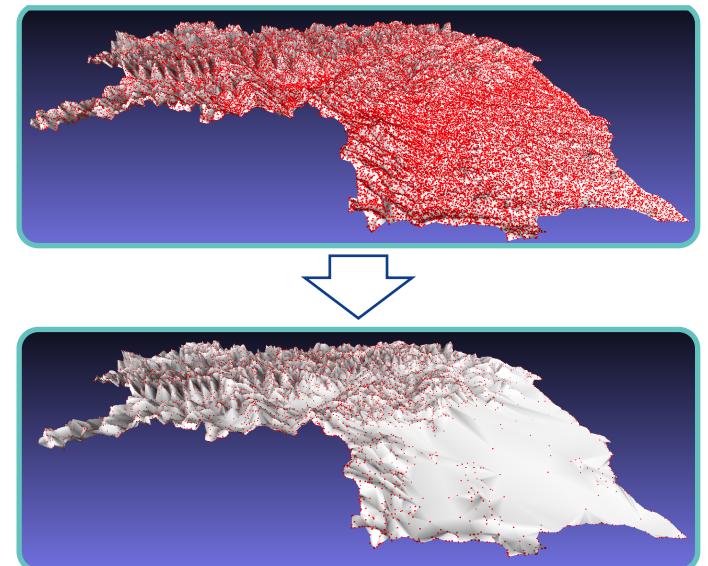


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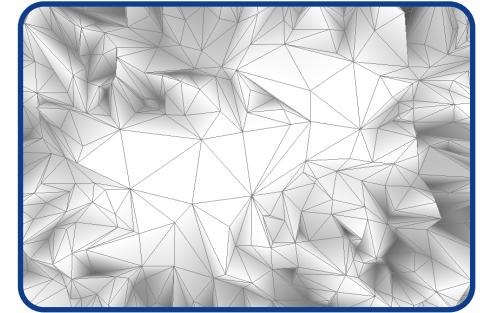


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- ◆ Apply a **mesh improvement** algorithm on  $(B, S, \varepsilon)$



# Implementation & Experiments

## Benchmark Results for Styria Dataset:

I	S	C	O	T
10K	17K	407	4100.6 ( $\pm 9.6$ )	8.90 ( $\pm 0.18$ )
20K	33K	543	6114.2 ( $\pm 49.2$ )	19.96 ( $\pm 0.37$ )
40K	64K	547	8654.2 ( $\pm 27.2$ )	38.96 ( $\pm 0.36$ )
80K	124K	597	11223.2 ( $\pm 74.8$ )	81.19 ( $\pm 1.79$ )
160K	239K	611	13160.2 ( $\pm 65.8$ )	168.54 ( $\pm 3.74$ )
320K	455K	637	15019.0 ( $\pm 61.0$ )	342.40 ( $\pm 6.12$ )

**I:** size of the input (*number of vertices*)

**S:** size of the output of the topological simplification algorithm (*number of vertices*)

**C:** critical points of the output of the topological simplification algorithm

**O:** size of the final output (*number of vertices*)

**T:** running time (*in seconds*)

# Conclusions

## In Summary:

*Based on necessary and sufficient criteria for elementary operations in a terrain to preserve the persistent homology,*

*we have developed a method to reduce the total size of a topologically simplified terrain overcoming a major drawback of previous simplification methods without giving up on its guarantees*

## Future Developments:

- ◆ *Investigate how far our output is from an optimal solution*
- ◆ *Extend our implementation to piecewise-linear functions on triangulated surfaces*
- ◆ *Find other interesting application domains*



# Thank you

Ulderico **Fugacci**

*CNR - Imati*