# I/O-Efficient Algorithms for Computing Contours on a Terrain

Bardia Sadri University of Toronto

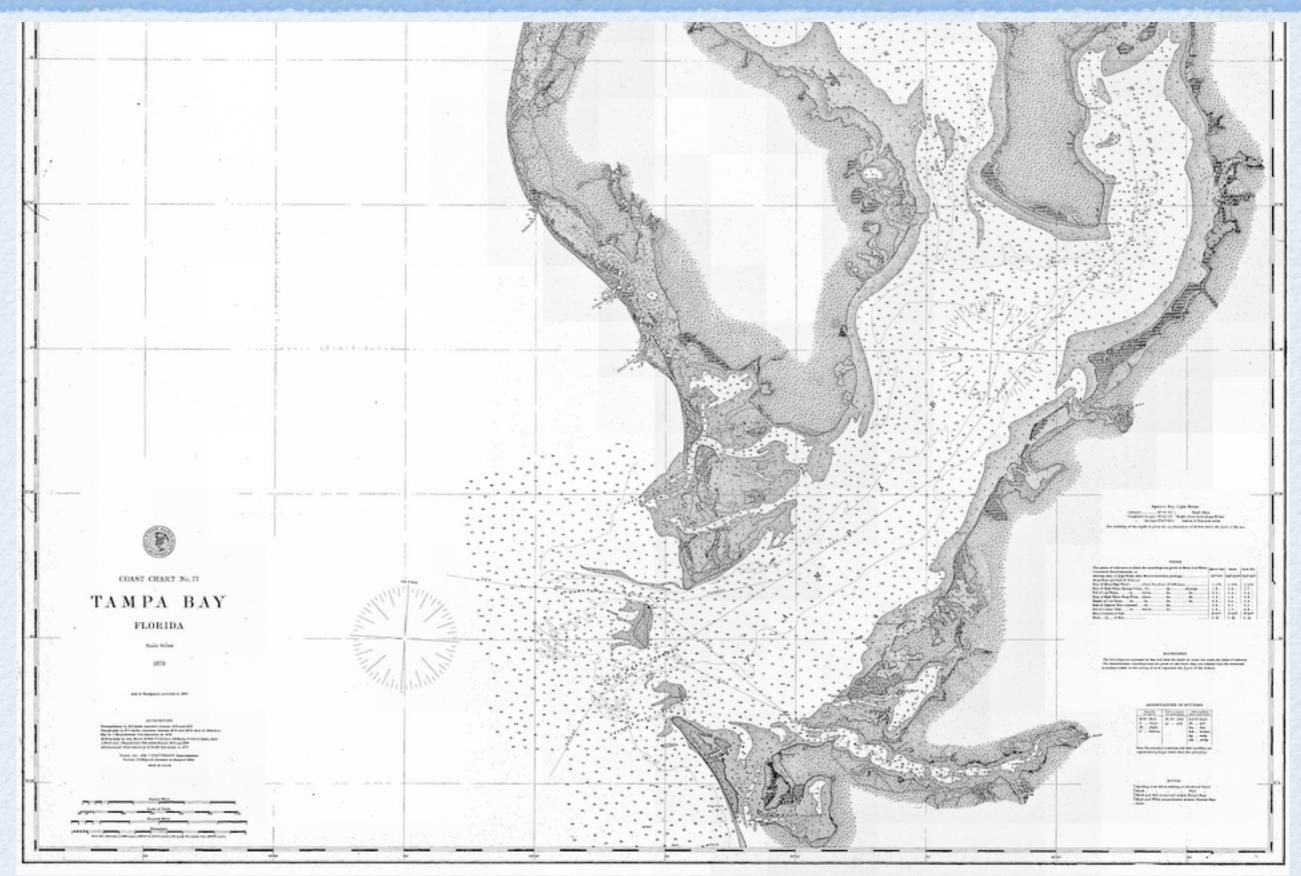
joint work with:

Pankaj K. Agarwal
Duke University

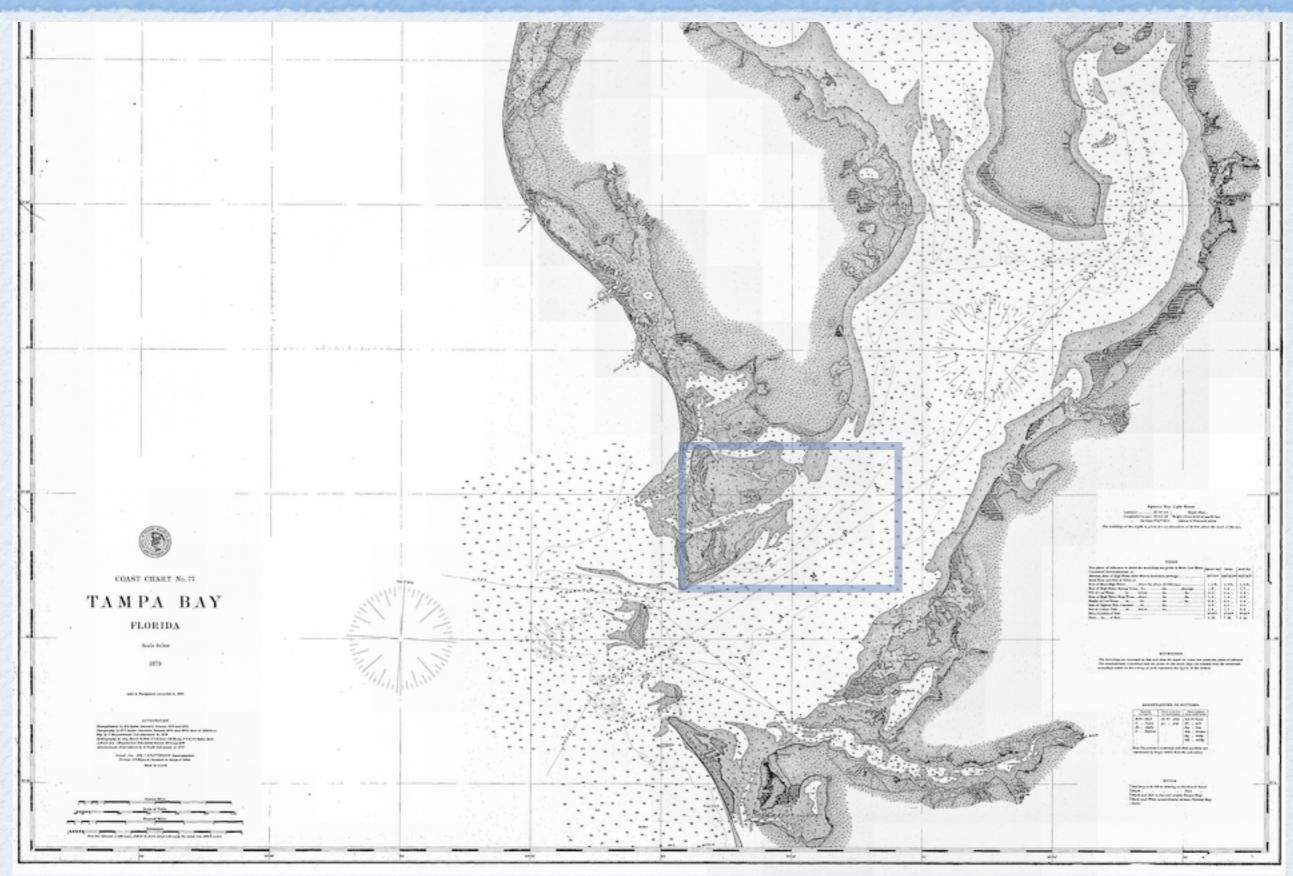
Lars Arge MADALGO

Thomas Mølhave MADALGO

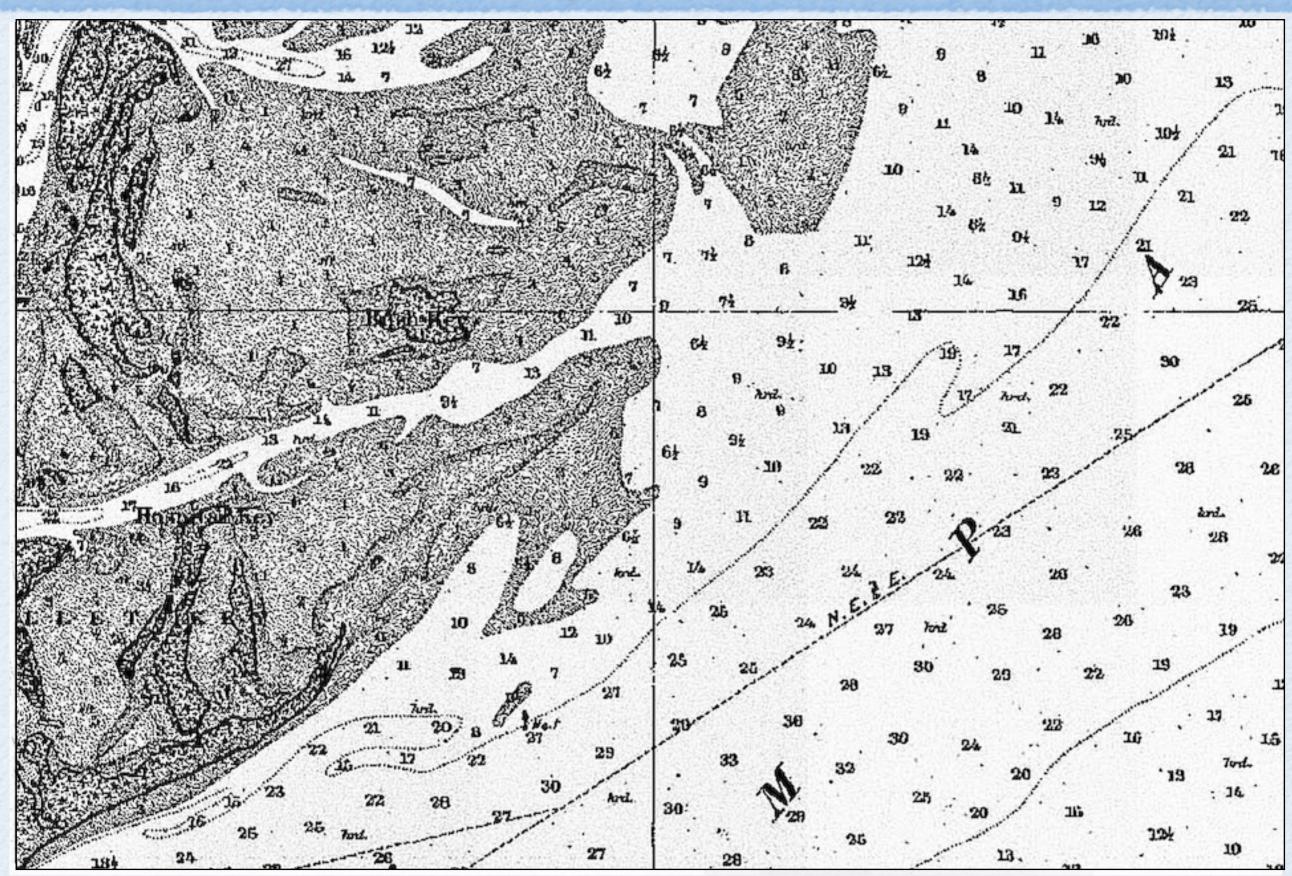
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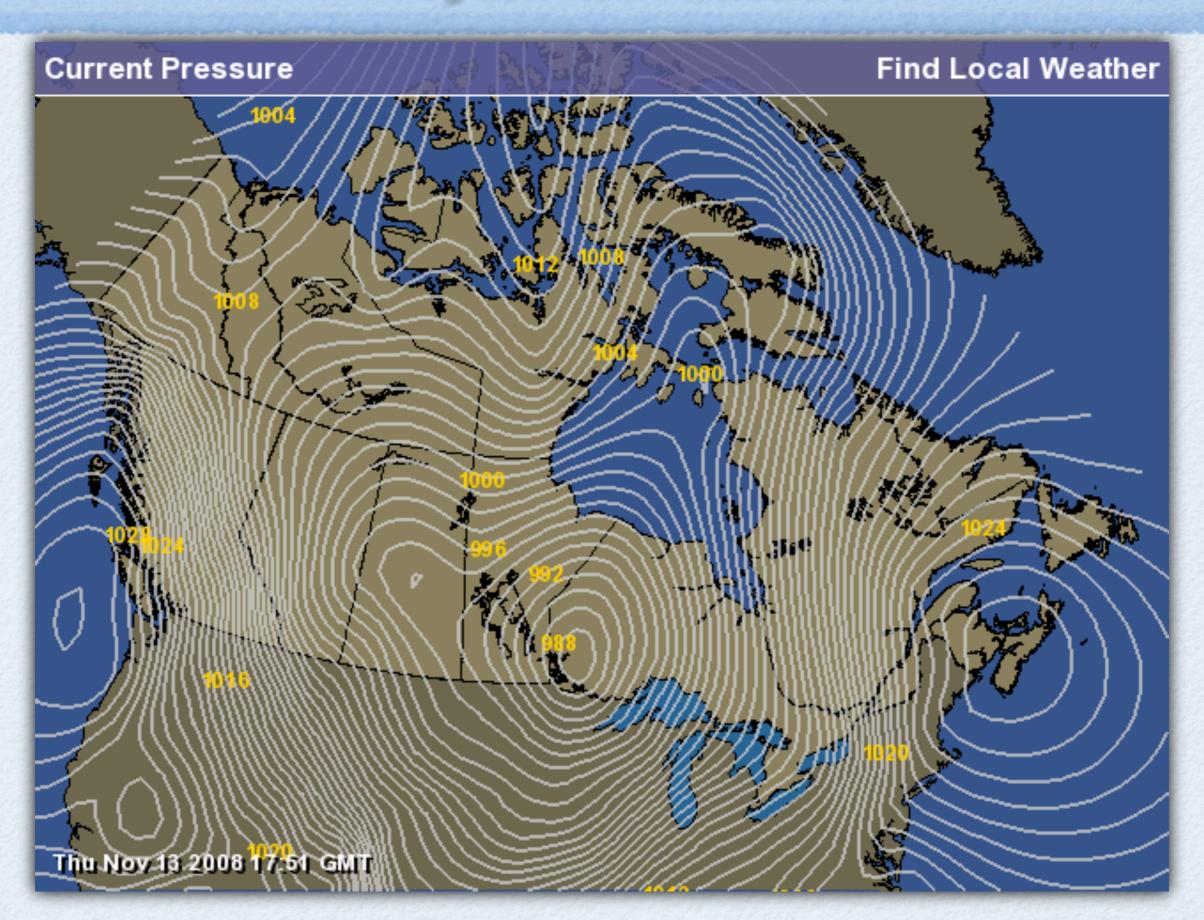


XXXIII. An Account of the Calculations made from the Survey and Measures taken at Schehallien, in order to ascertain the mean Density of the Earth. By Charles Hutton, Esq. F. R. S.

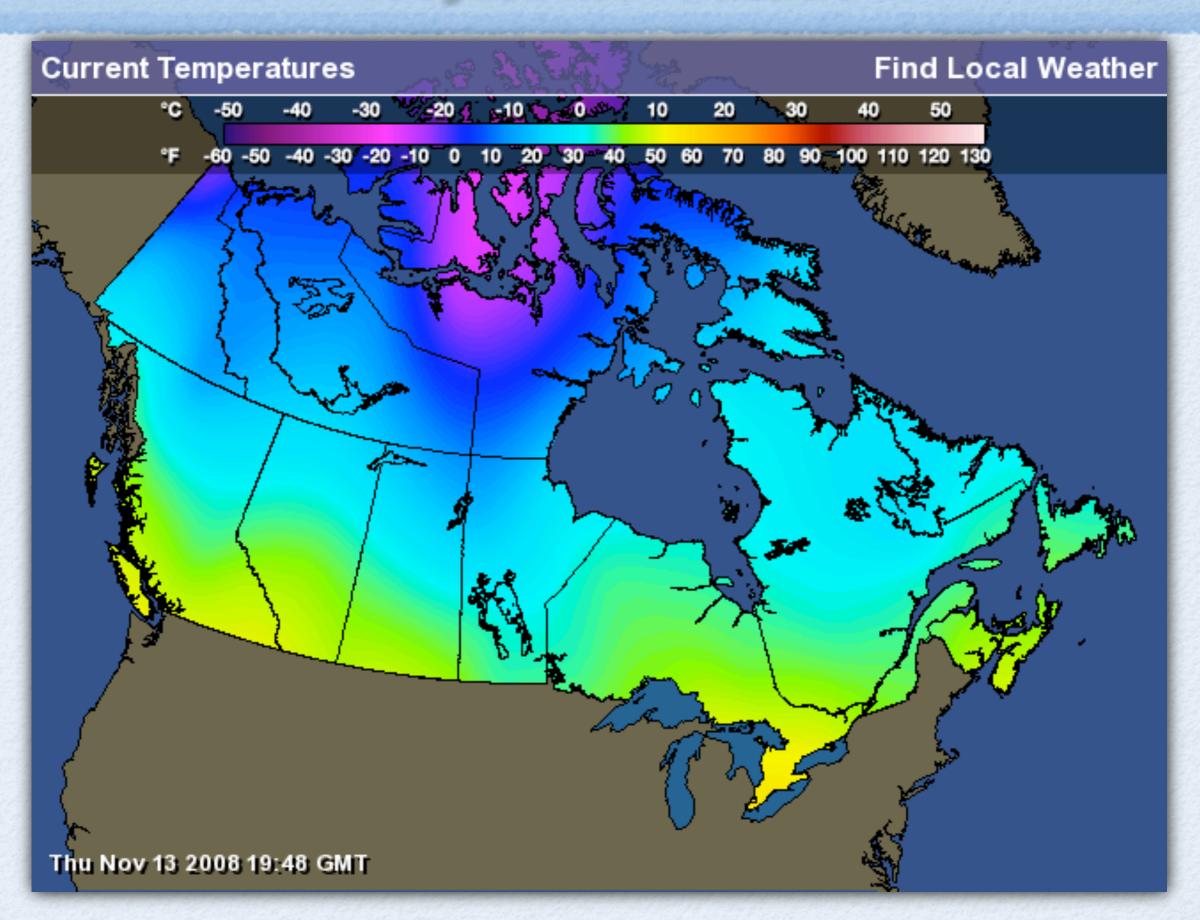
This circumstance at first gave me much trouble and diffatisfaction, till I fell upon the following method by which the defect was in a great measure supplied, and by which I was enabled to proceed in the estimation of the altitudes both with much expedition and a confiderable degree of accuracy. This method was the connecting together by a faint line all the points which were of the same relative altitude: by so doing, I obtained a great number of irregular polygons lying within, and at some distance from, one another, and bearing a considerable degree of resemblance to each other: these polygons were the figures of fo many level or horizontal fections of the hills, the relative altitudes of all the parts of them being known; and as every base or little space had

> Philosophical Transactions of Royal Society of London, 1779

# Not Just for Altitude

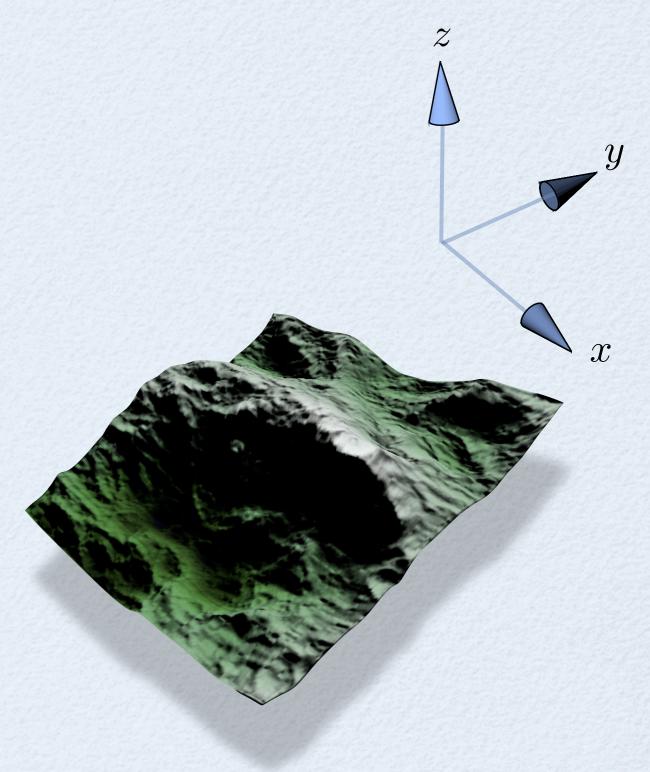


# Not Just for Altitude



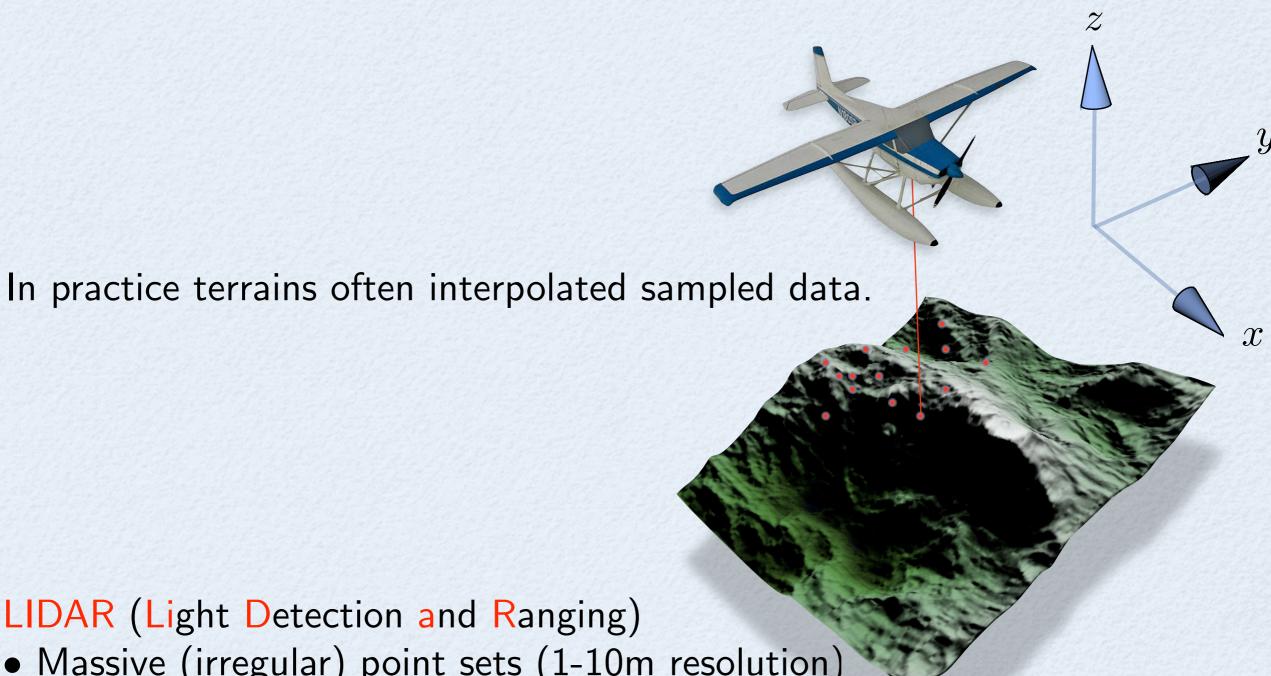
# Terrains

A terrain is the graph of a continuous bivariate function.

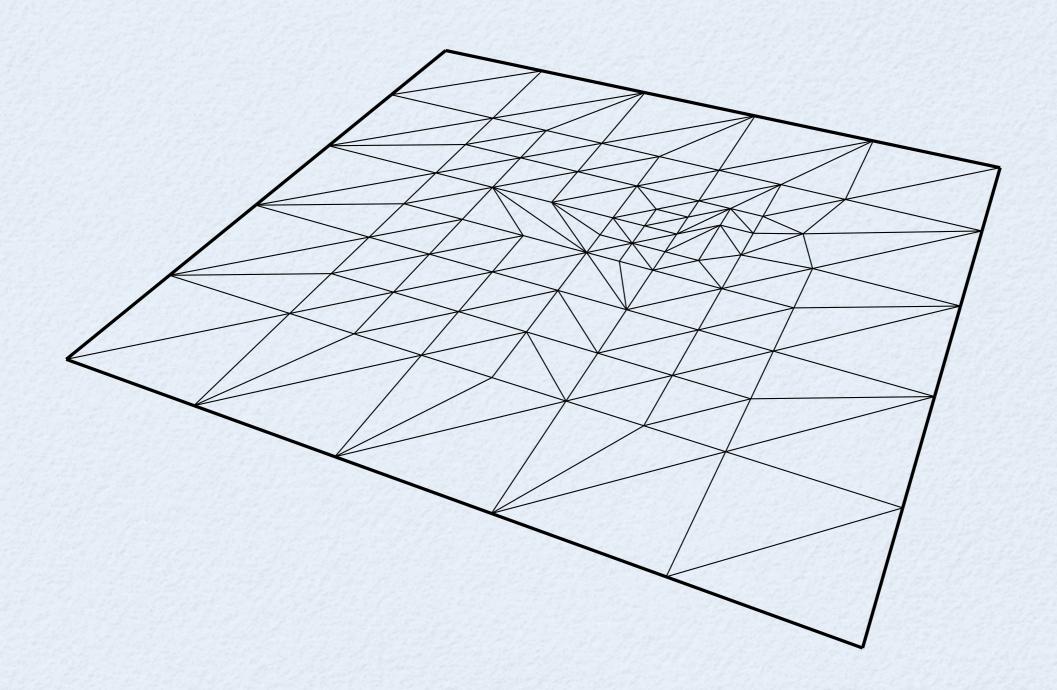


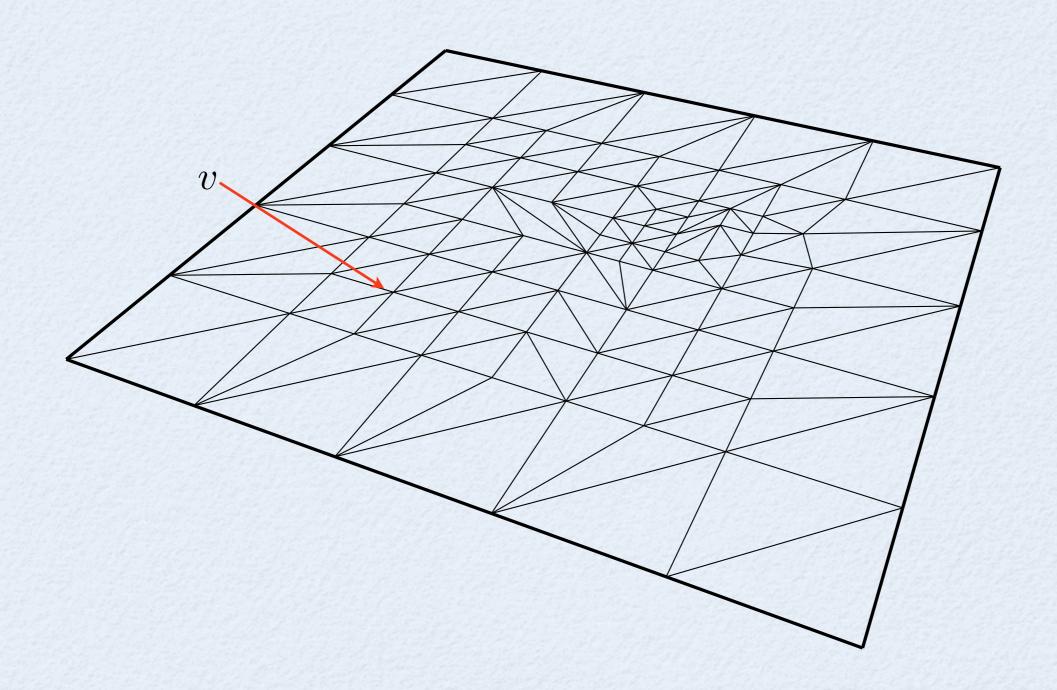
#### **Terrains**

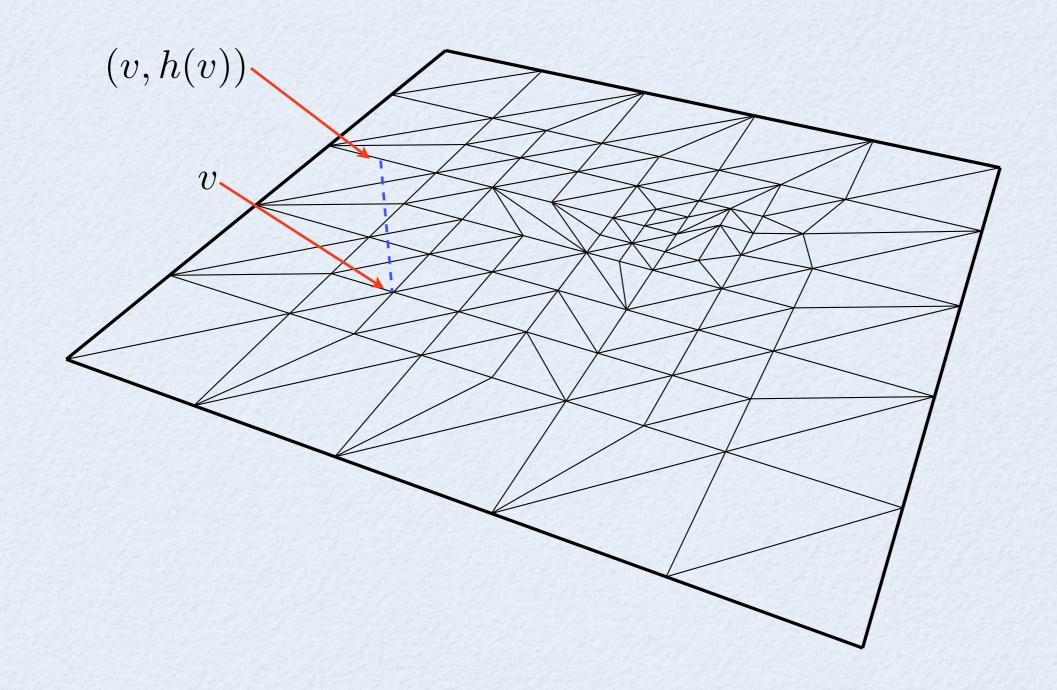
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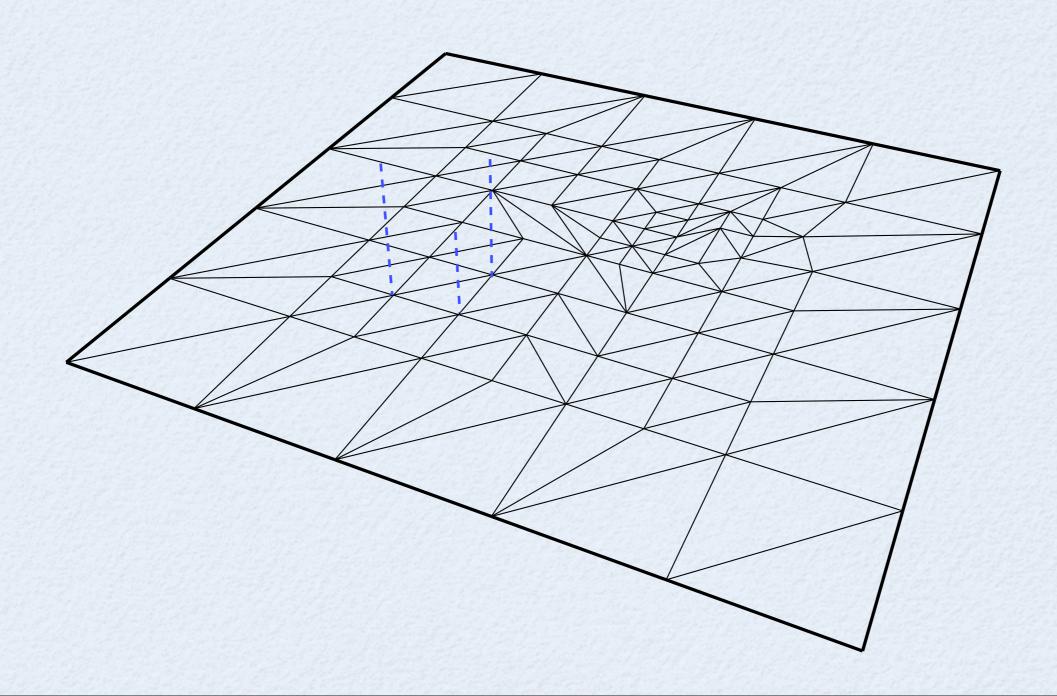


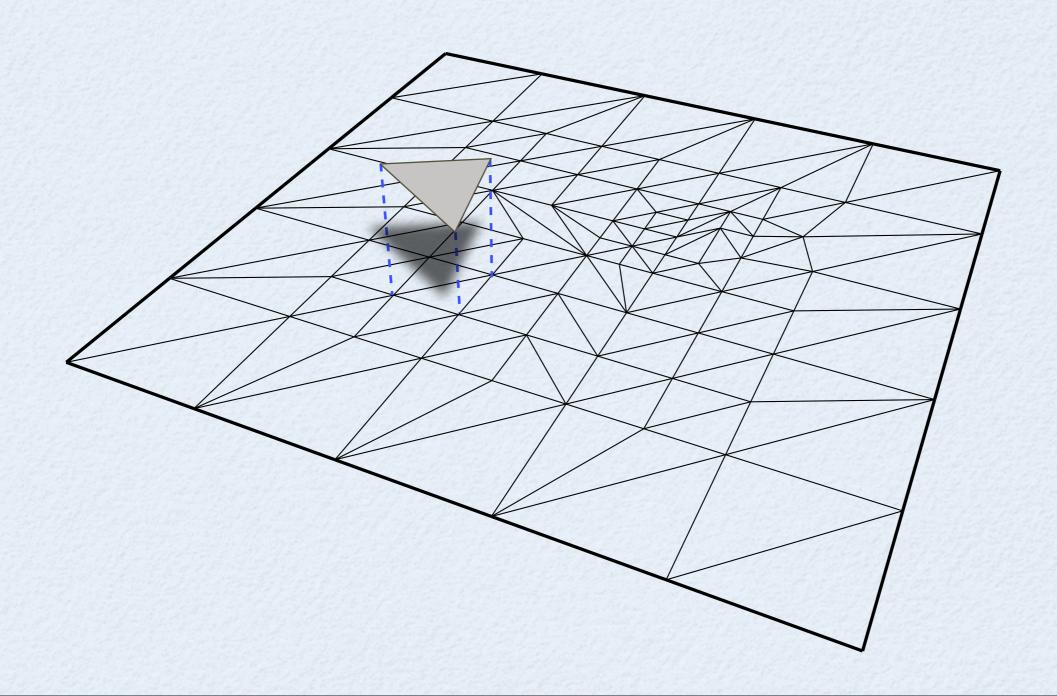
- Massive (irregular) point sets (1-10m resolution)
- Becoming relatively cheap and easy to collect
- Appalachian mountains between 50GB to 5TB

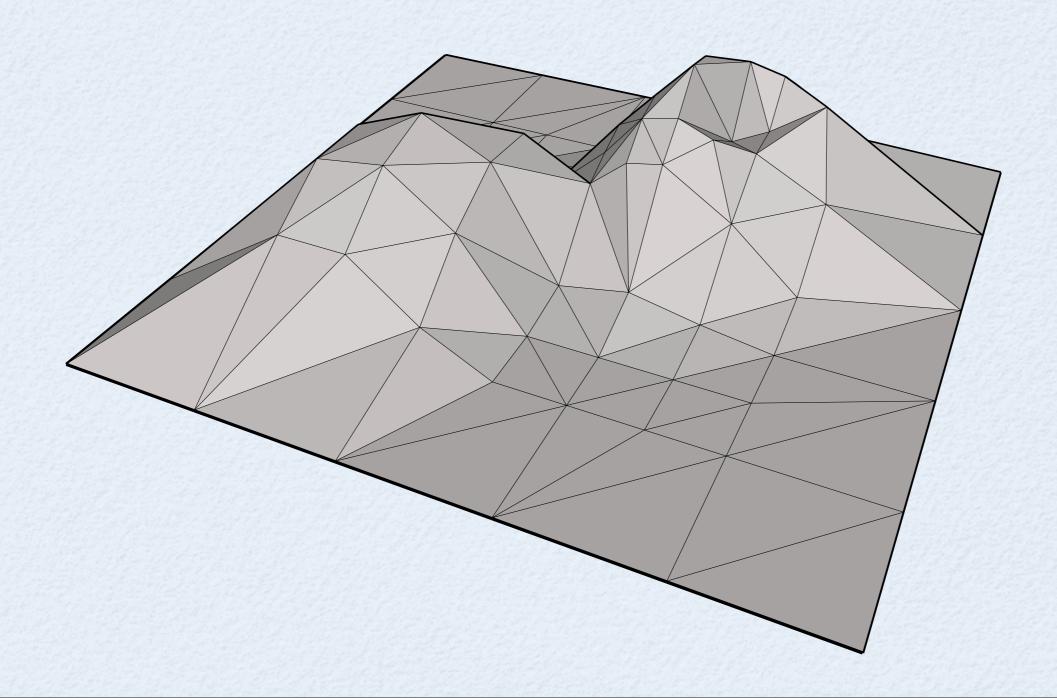


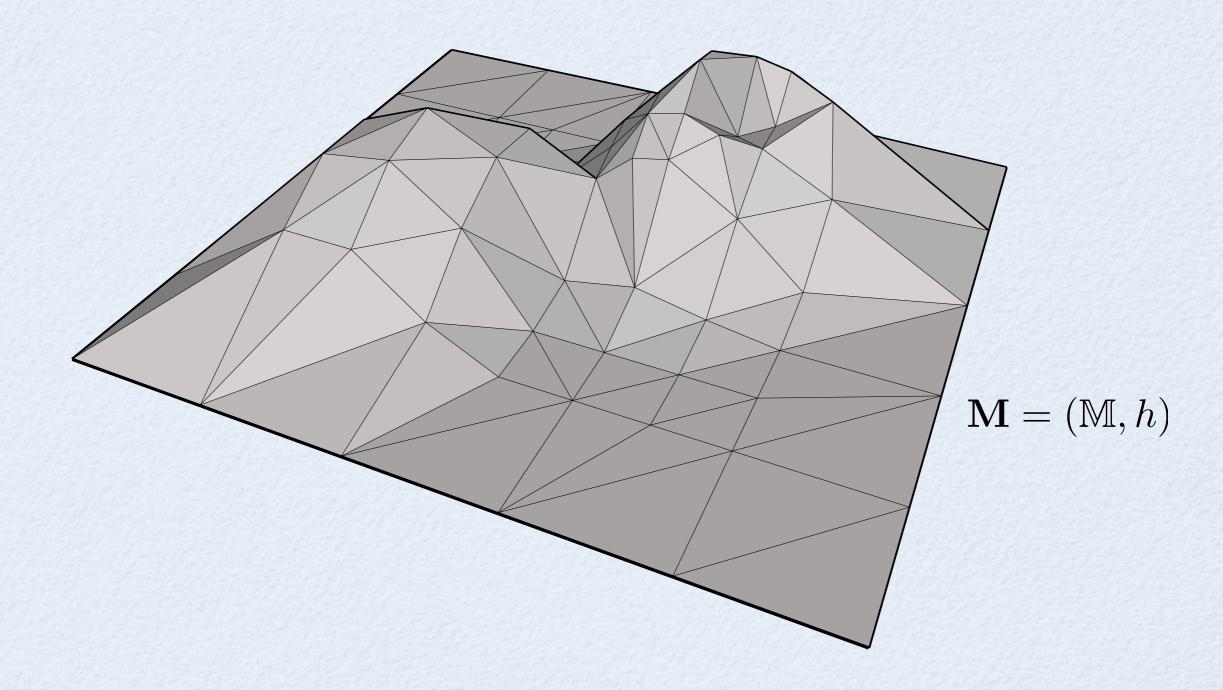




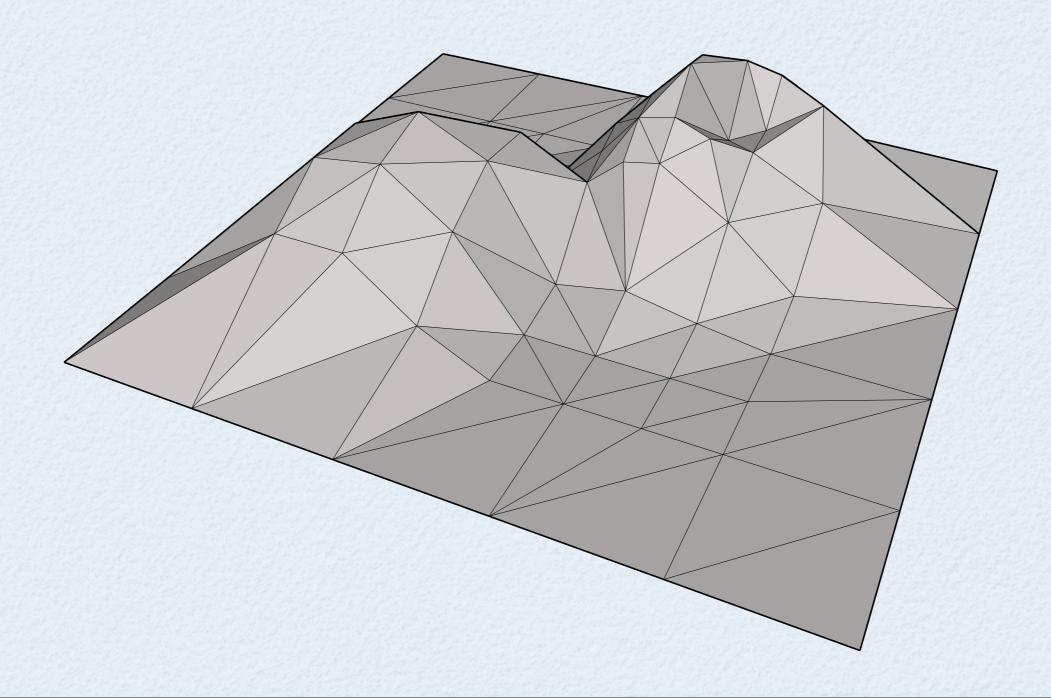




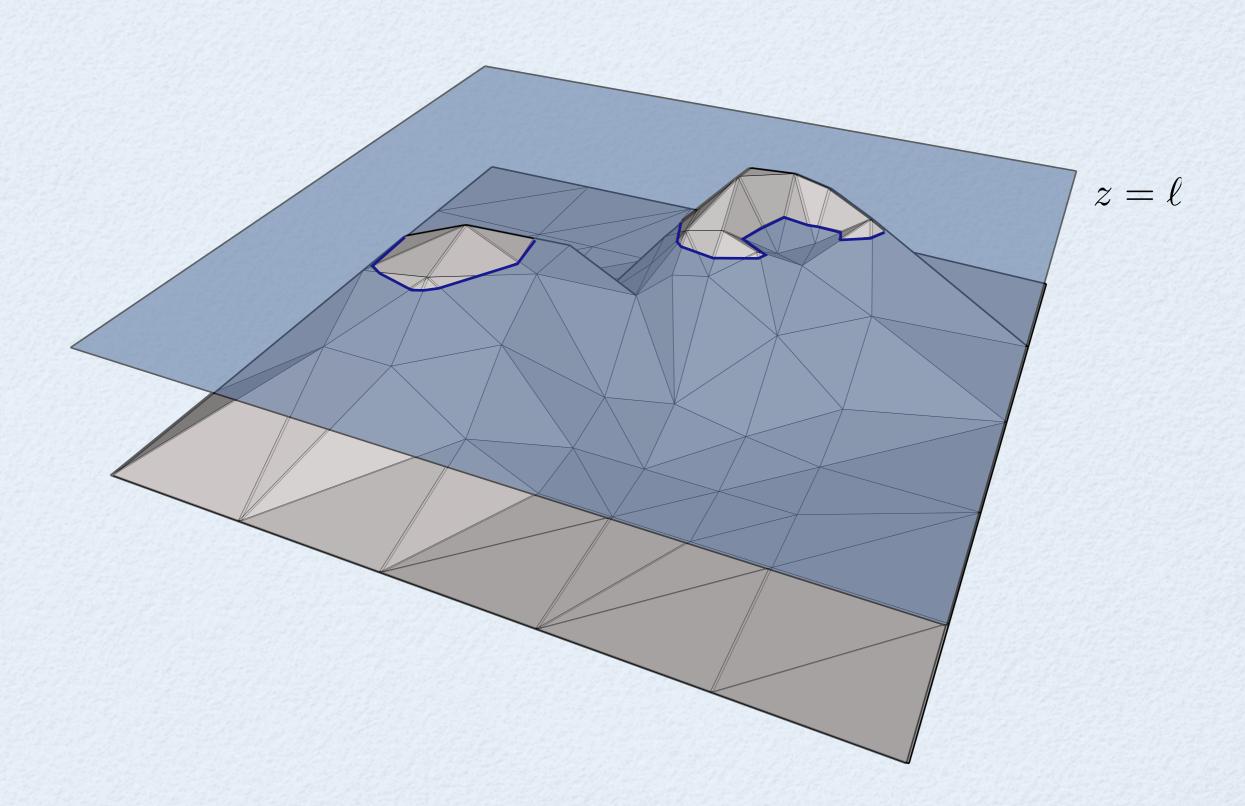




The level-set  $\mathbb{M}_{\ell}$  at height  $\ell$  is  $h^{-1}(\ell)$ .

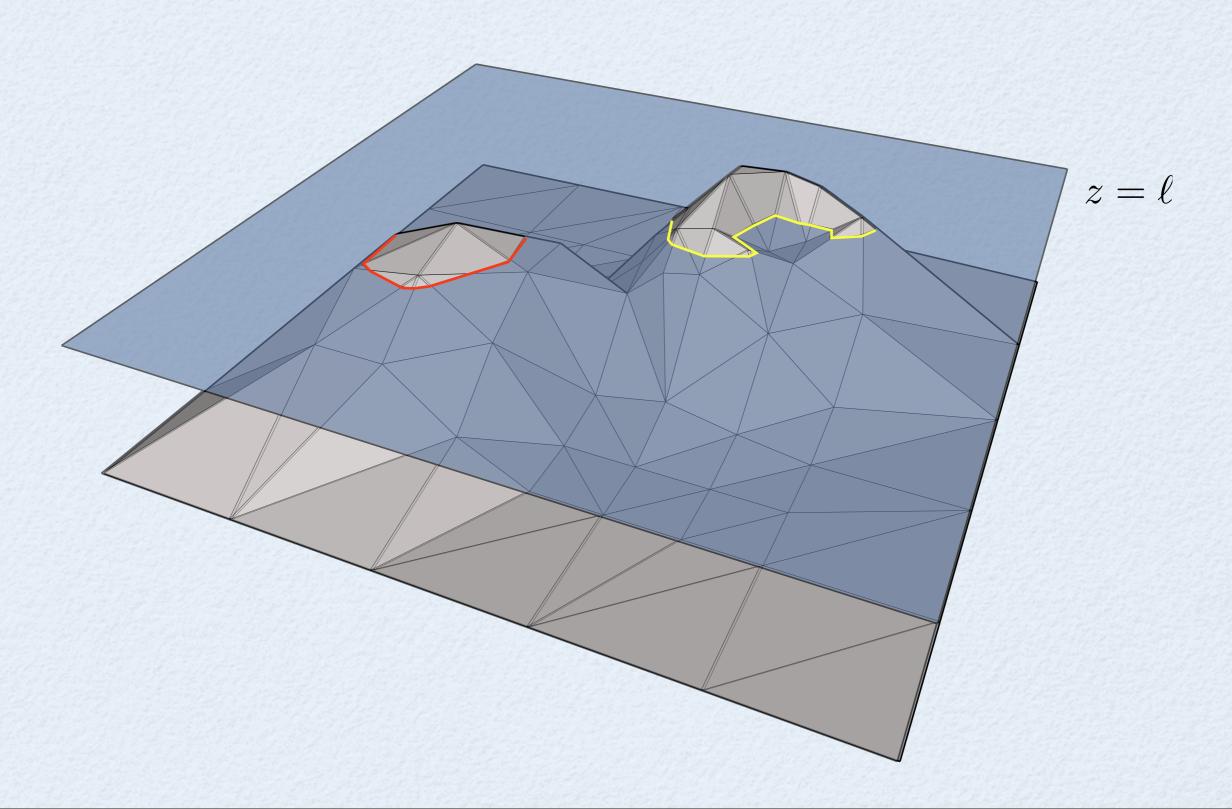


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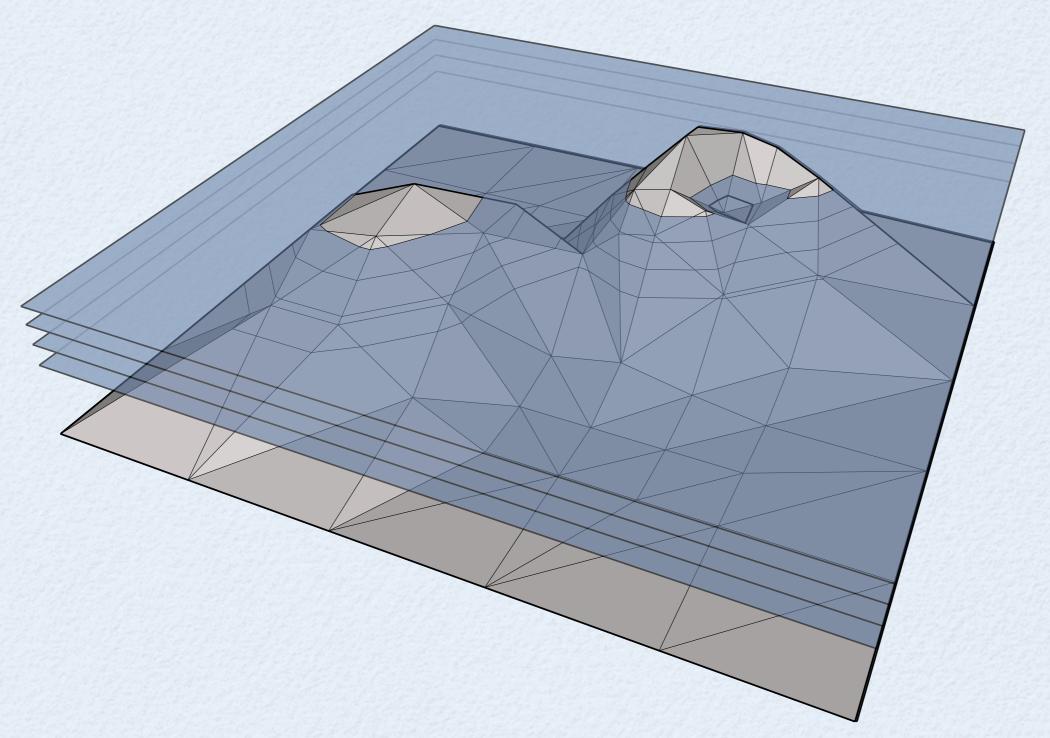
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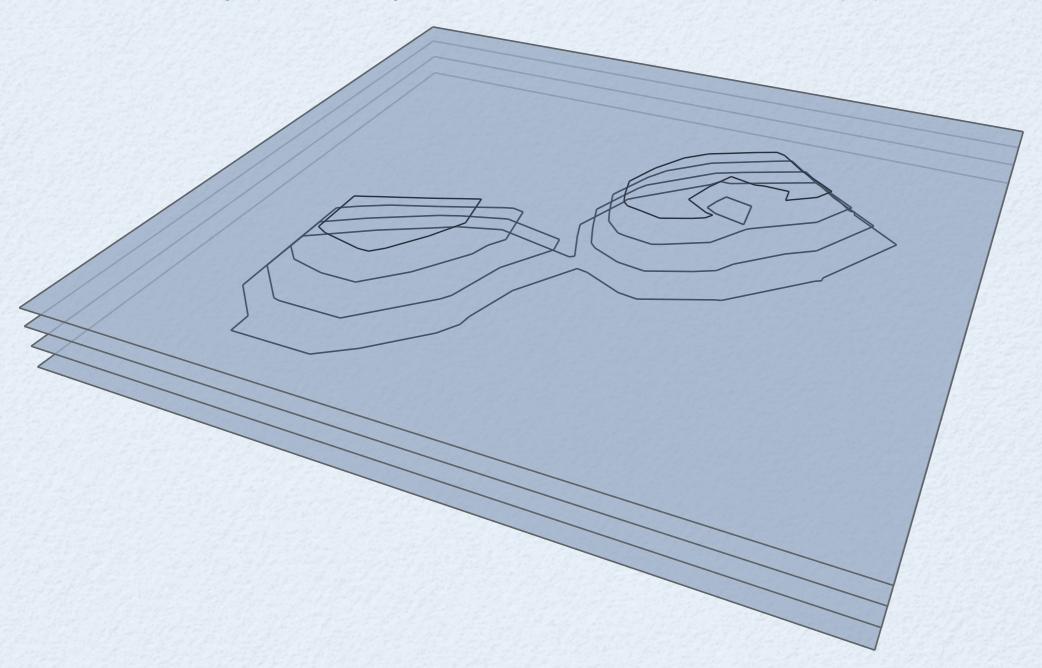
Given levels  $L = \{\ell_1, \dots, \ell_k\}$ , the contour map is  $h^{-1}(L)$ .



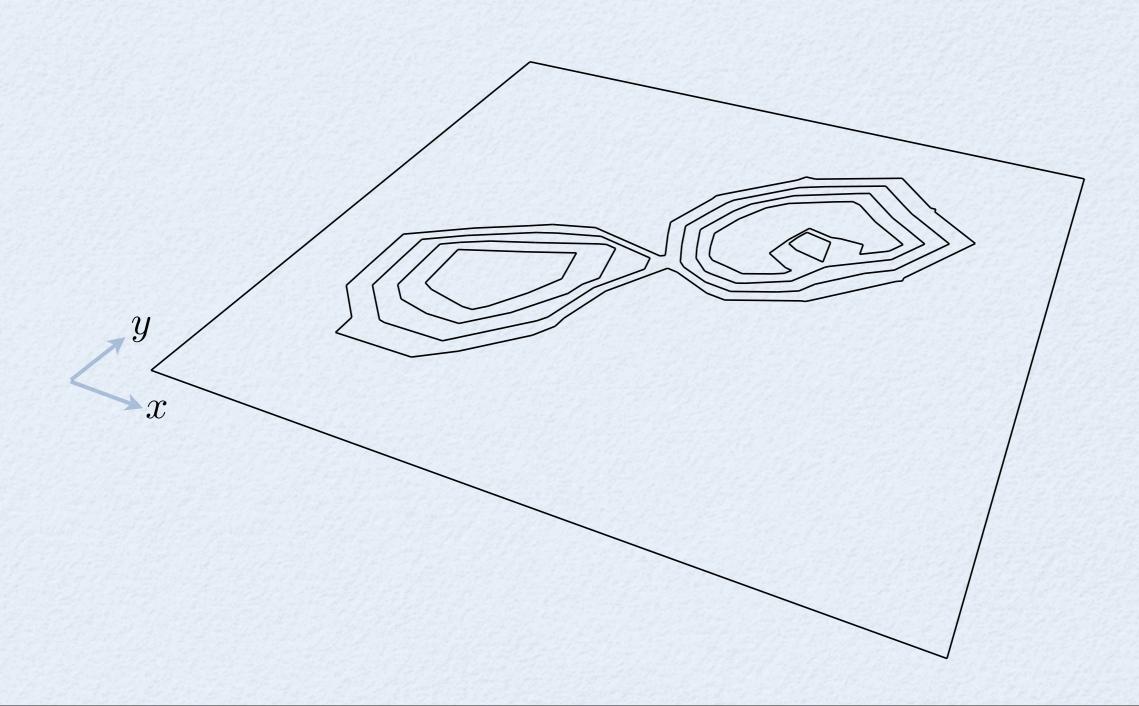
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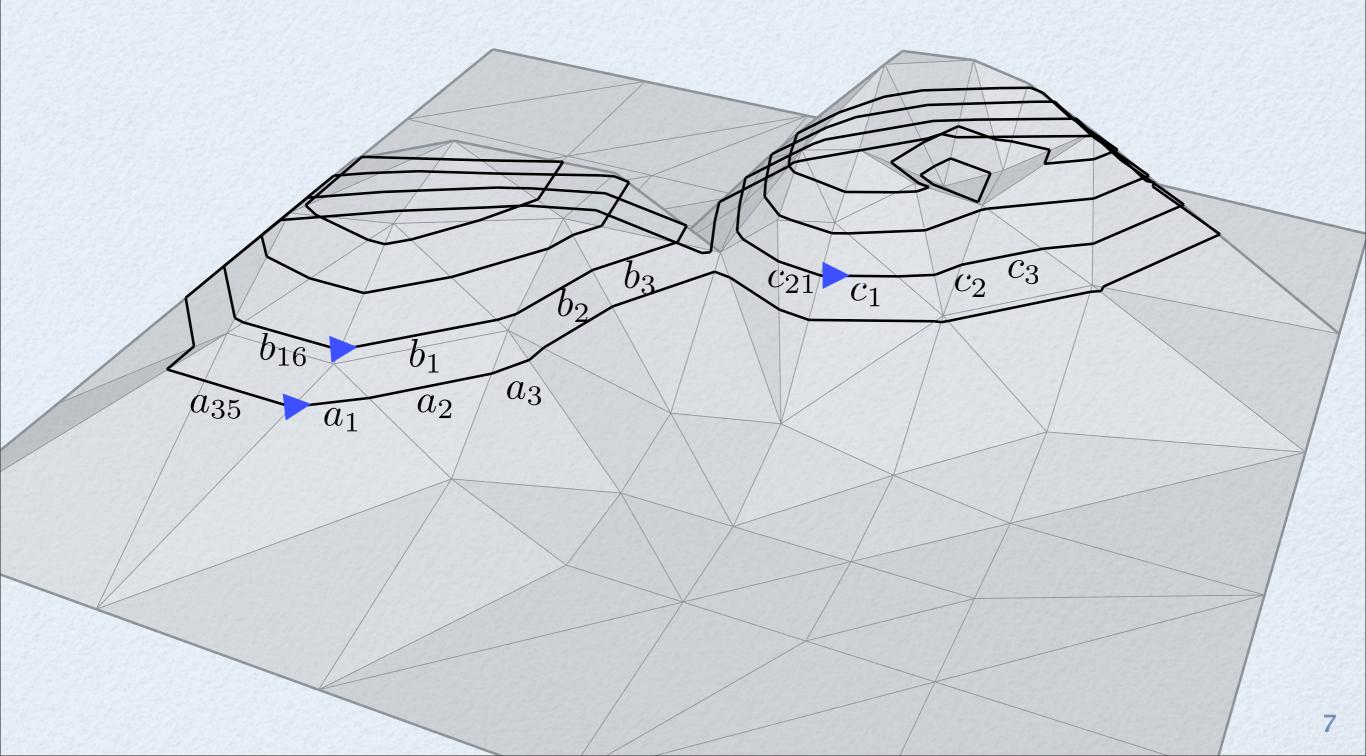
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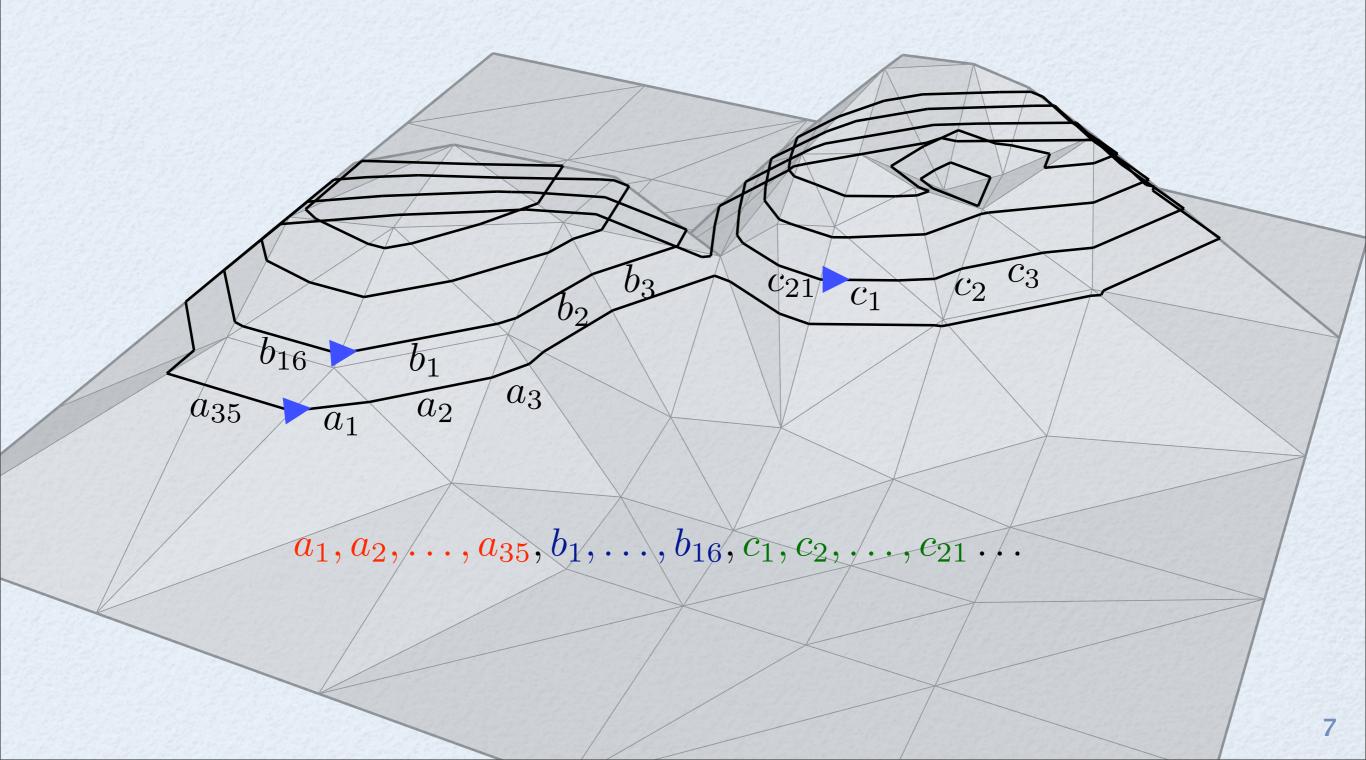
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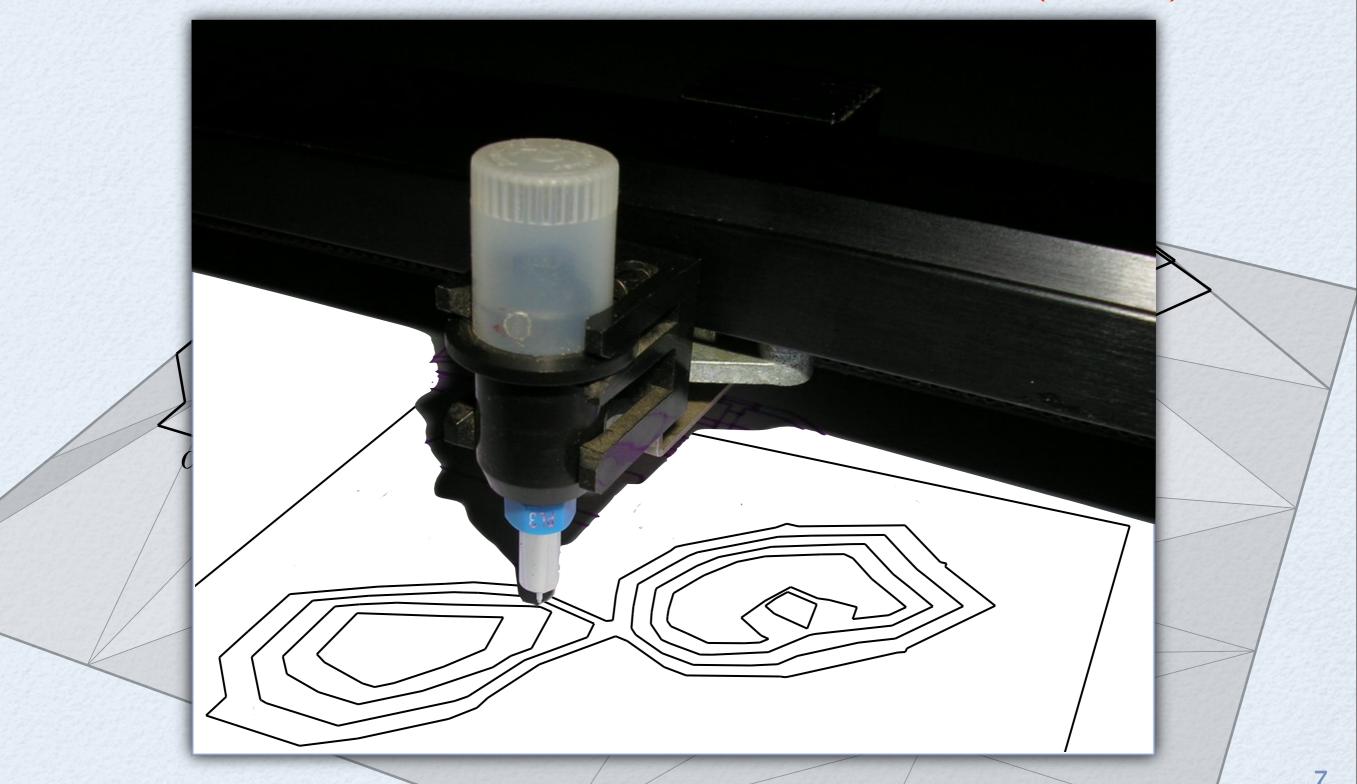


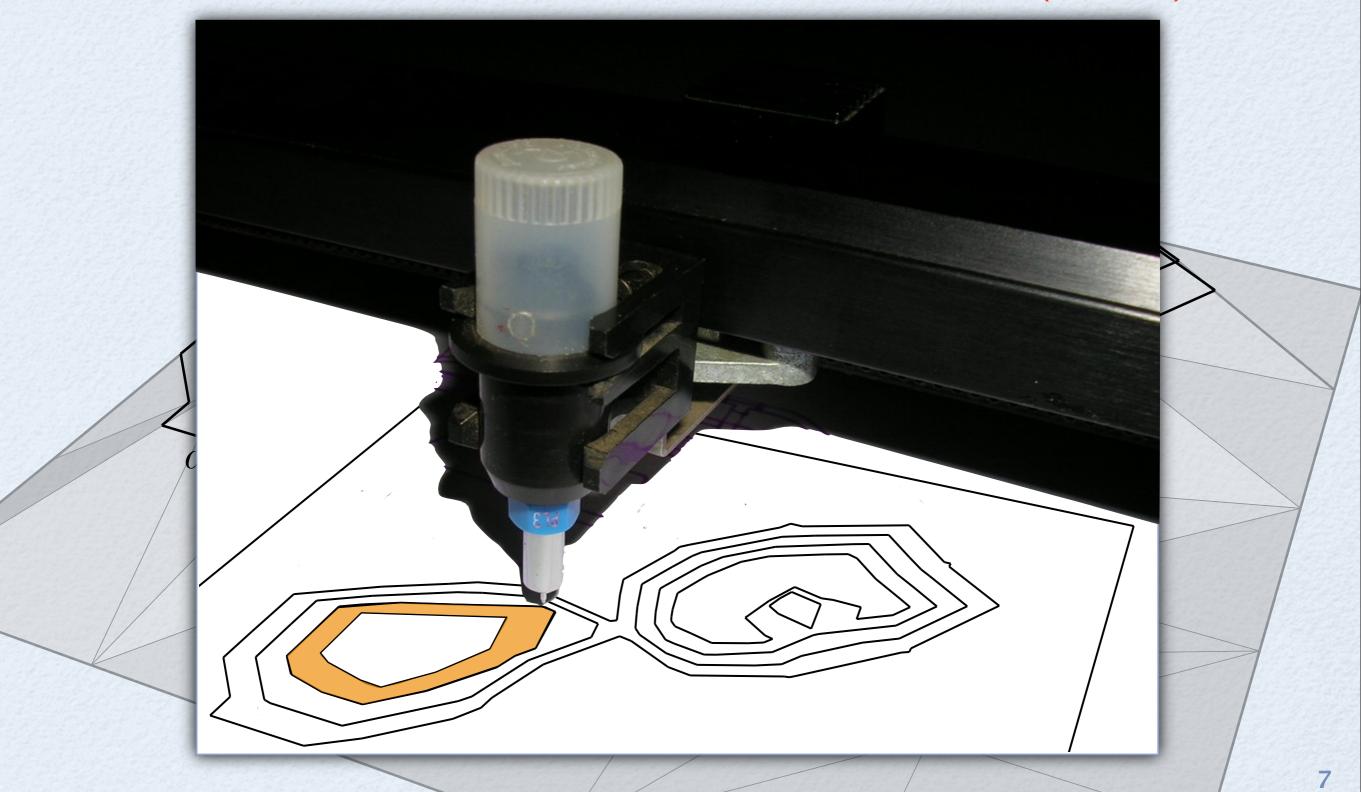
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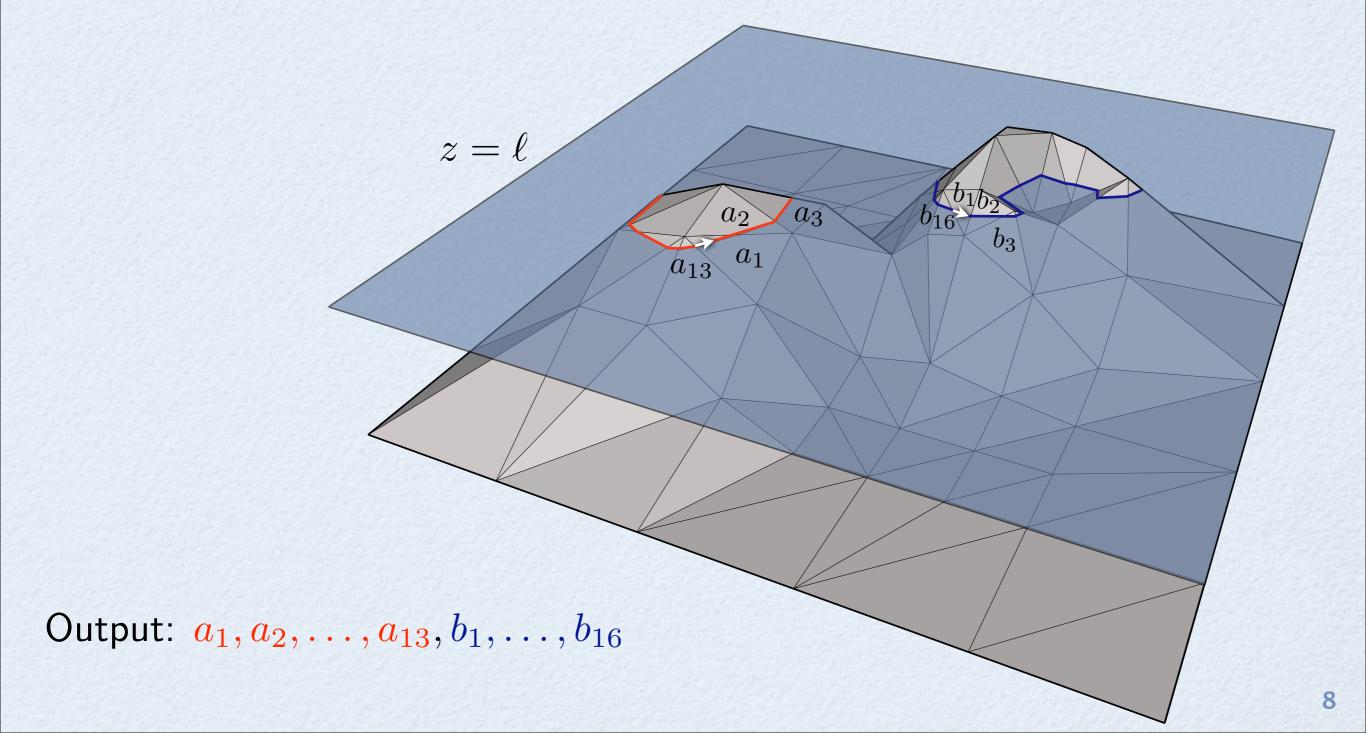


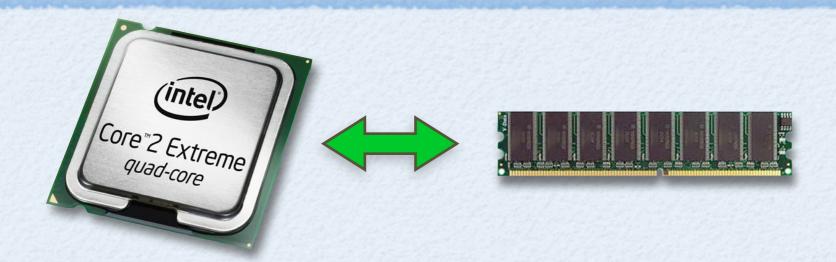




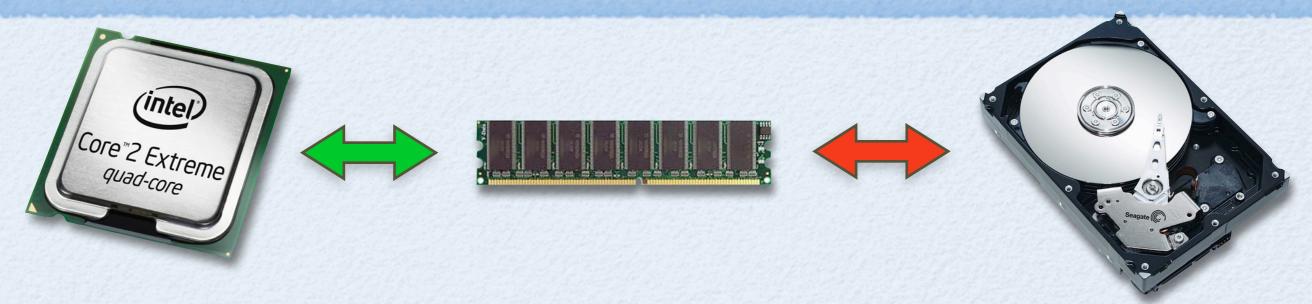
#### **Answering Contour Queries**

Preprocess the terrain to answer contour queries efficiently: Given a level  $\ell \in \mathbb{R}$ , return the level set  $h^{-1}(\ell)$  such that each contour is reported separately and in sorted (circular) order.



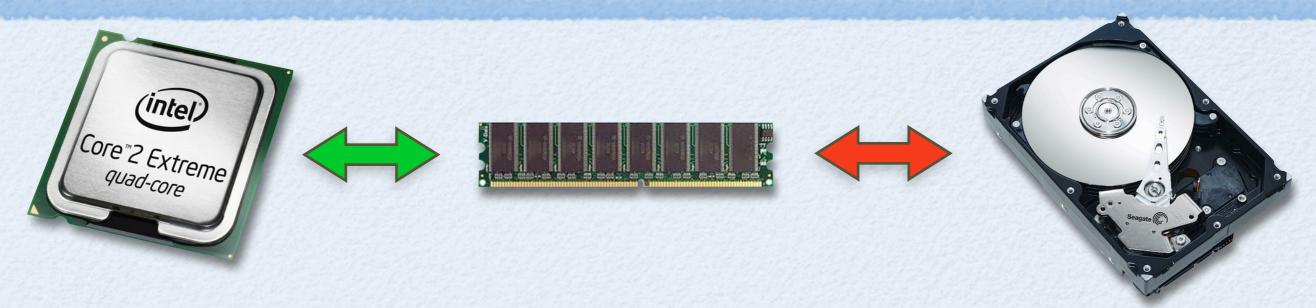


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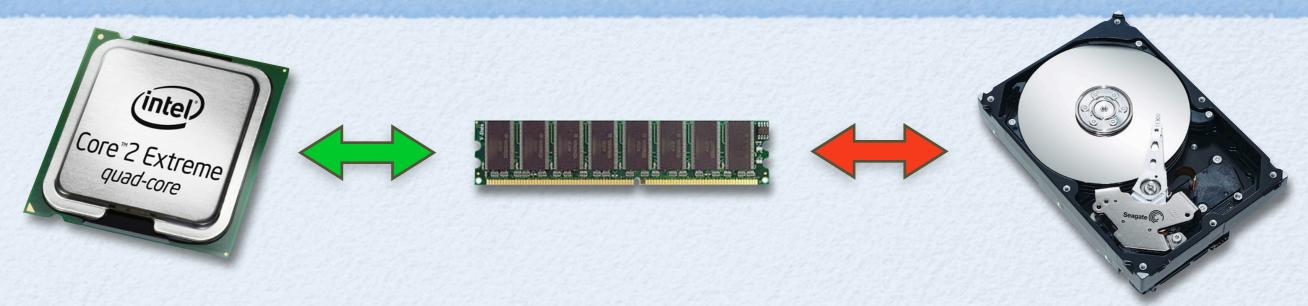
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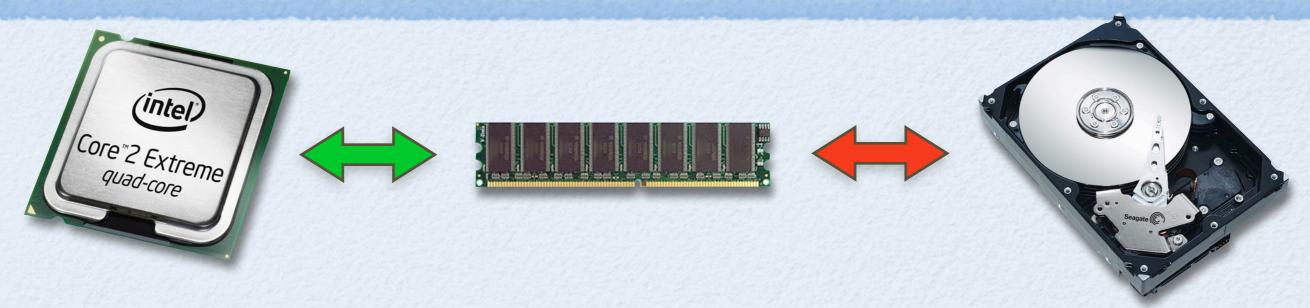
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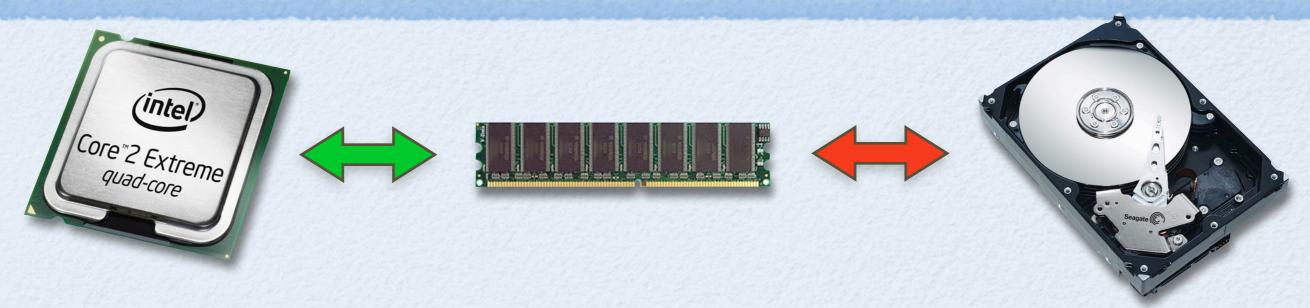
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	Scanning	N	N/B
Class Disk	Sorting	$N \log N$	$\frac{N}{B}\log_{\frac{M}{B}}\frac{N}{B}$
	Permuting	N	$\min\left\{N, \frac{N}{B}\log_{\frac{M}{B}}\frac{N}{B}\right\}$
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## **Previous Work**

Answering contour queries I/O-efficiently:

	Preprocessing I/Os	Structure Size	Query I/Os
Chiang, Silva'97	O(Sort(N))	O(N)	$O(\log_B N + T/B)$
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# Previous Work

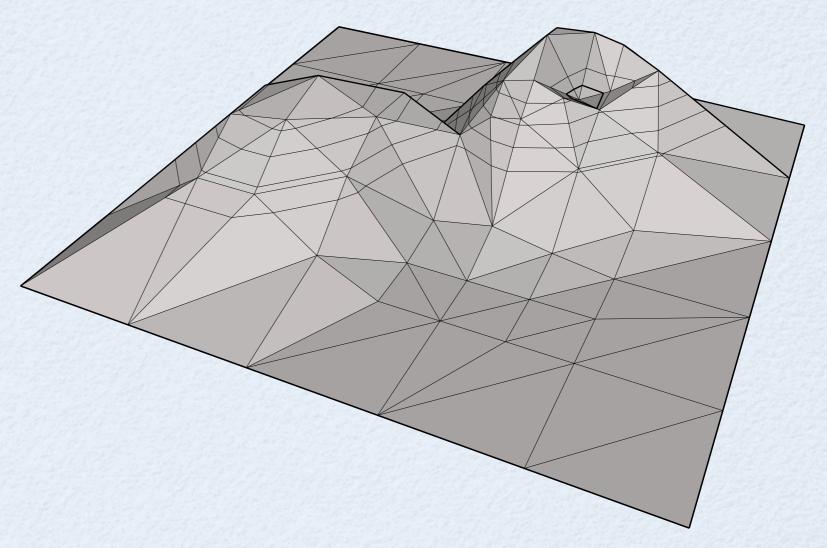
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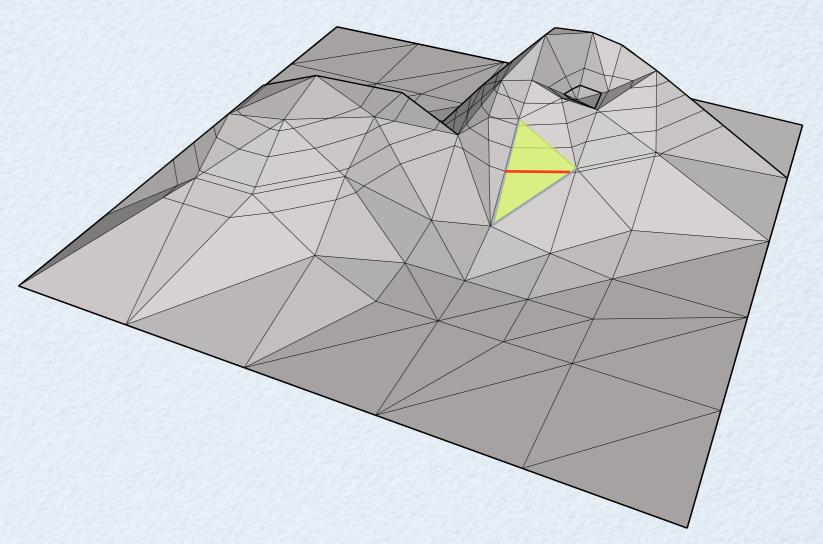
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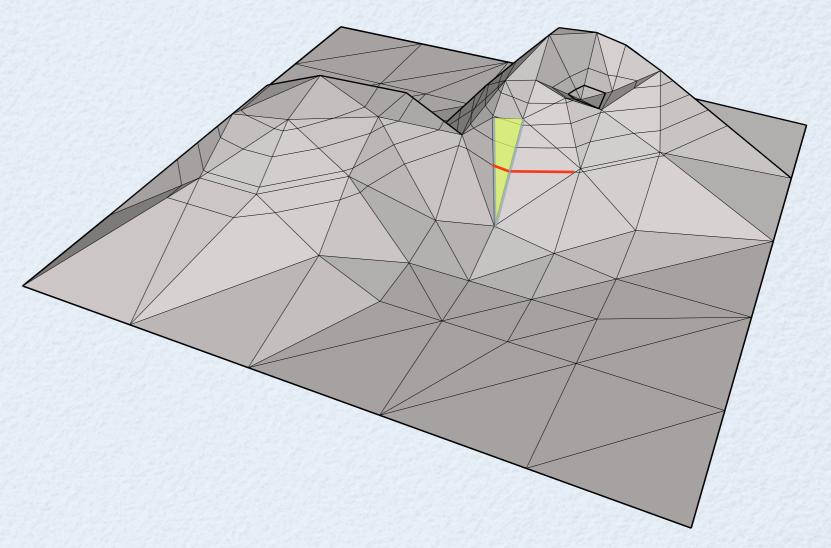
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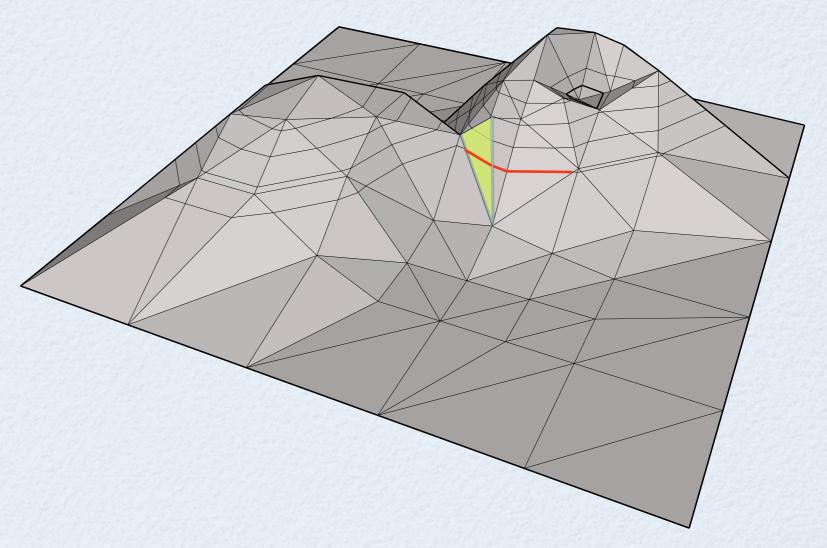
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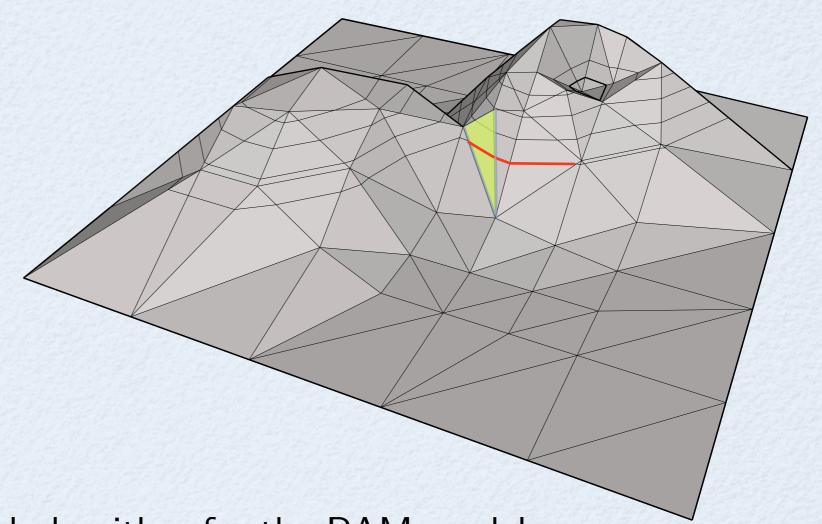






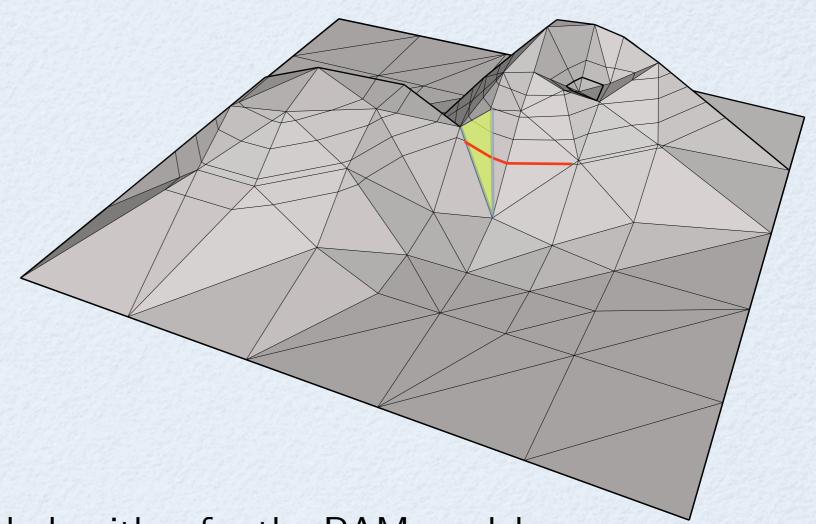


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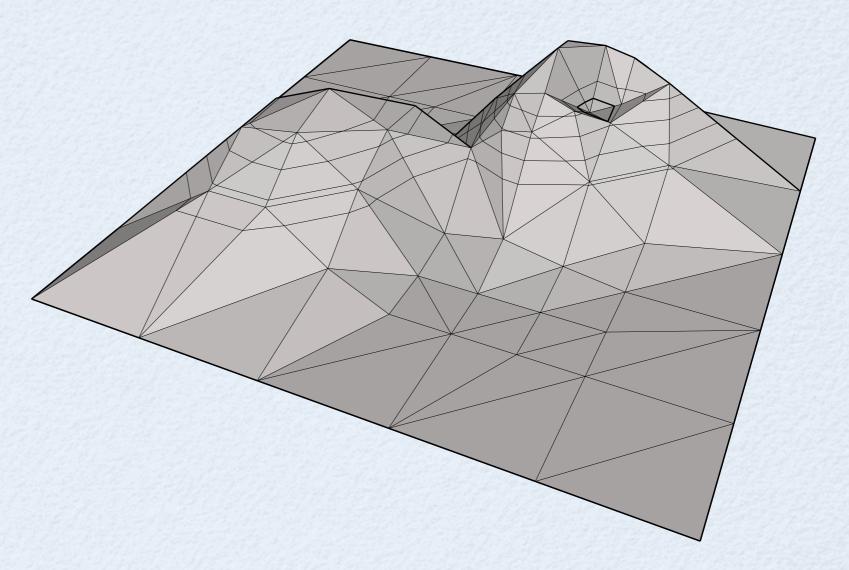


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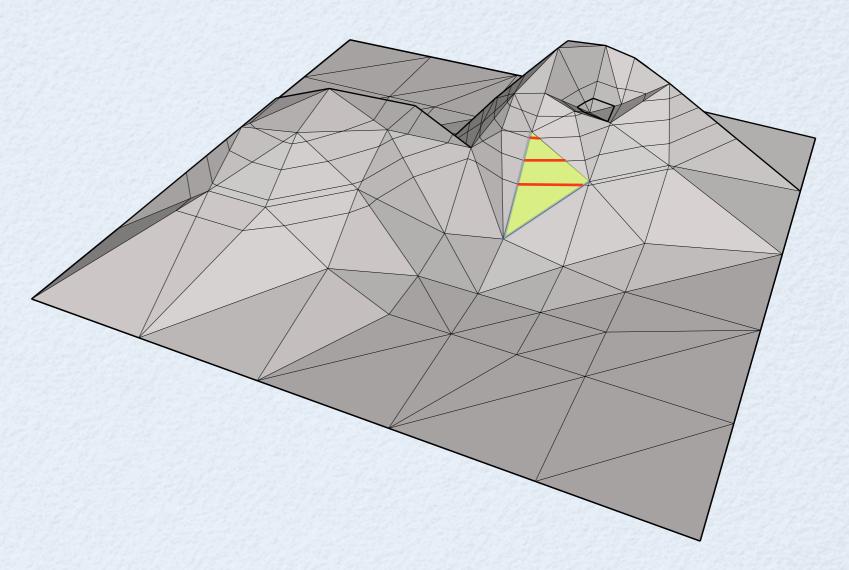
$$O(N/B \cdot \log_B |L| + T)$$
.

# segments in the output

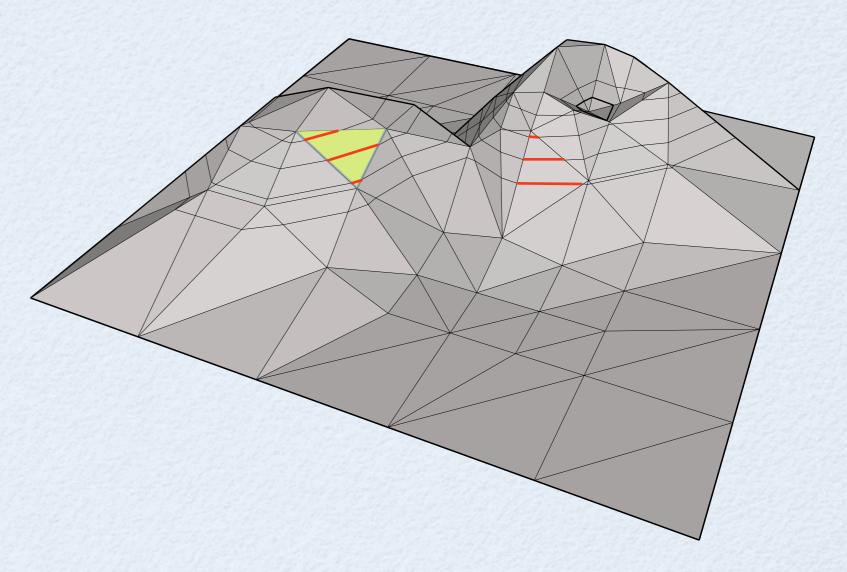
Scan the triangles (in the order laid out on the disk) and generate all segments. Then sort the output.



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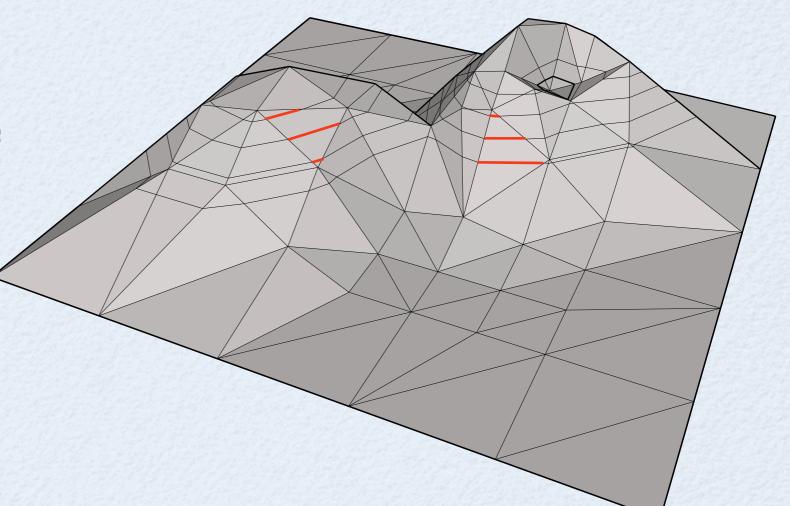


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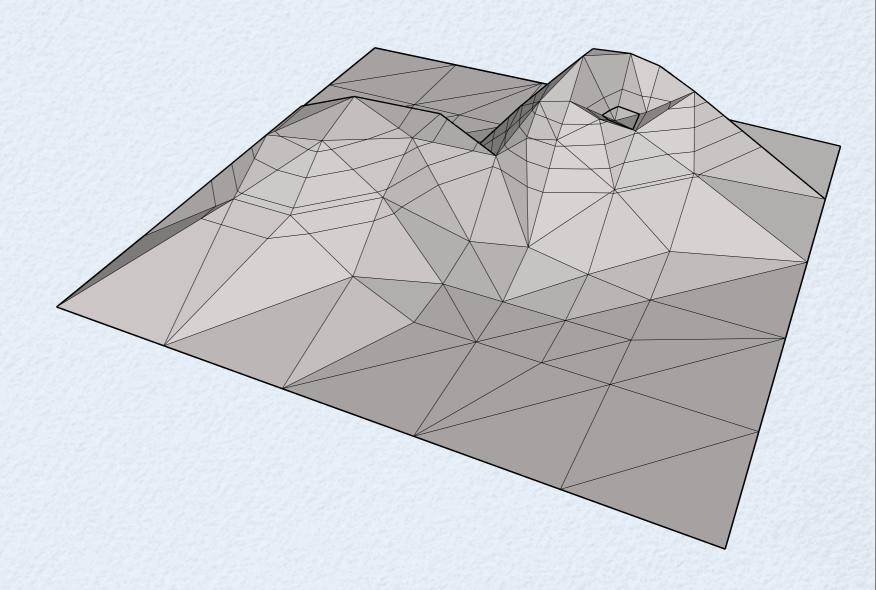
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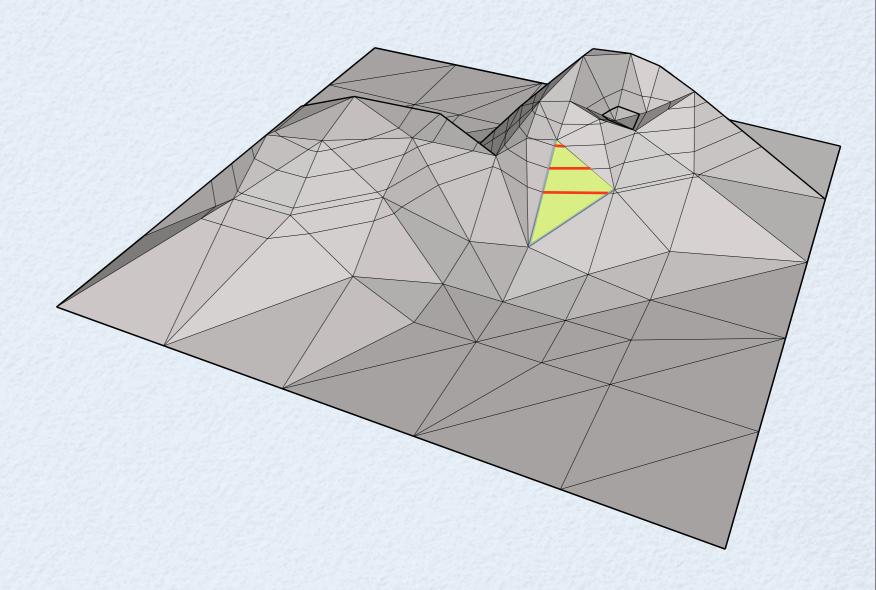
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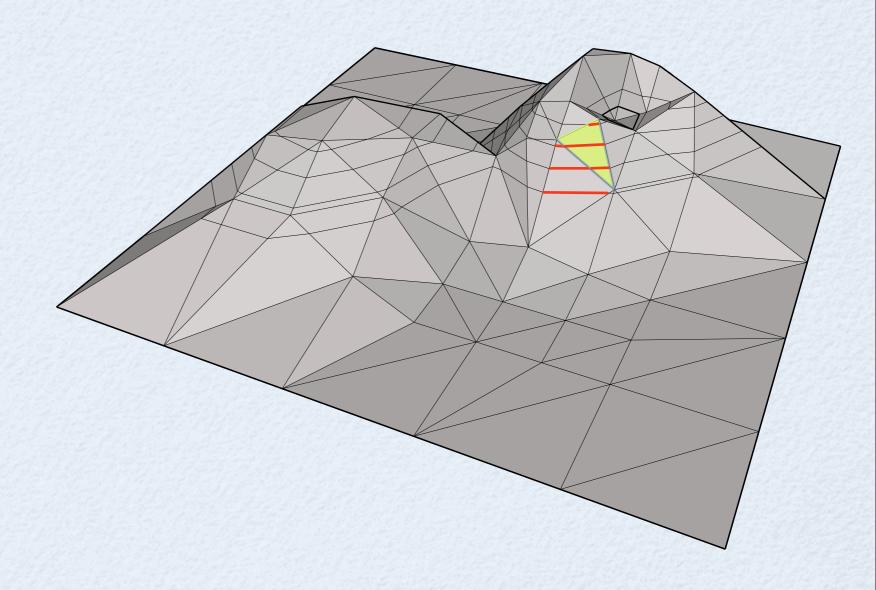
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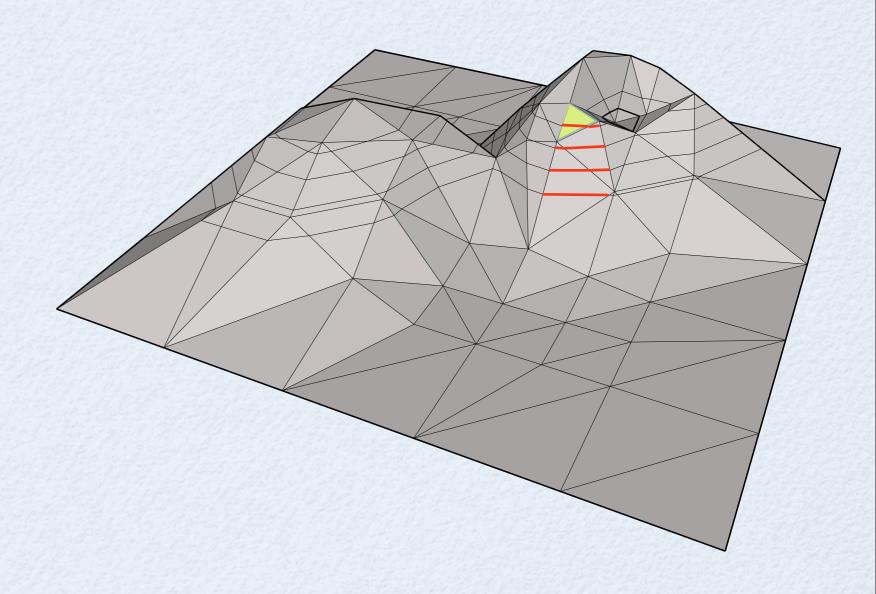
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This talk:  $O(\operatorname{Sort}(N) + T/B)$ .



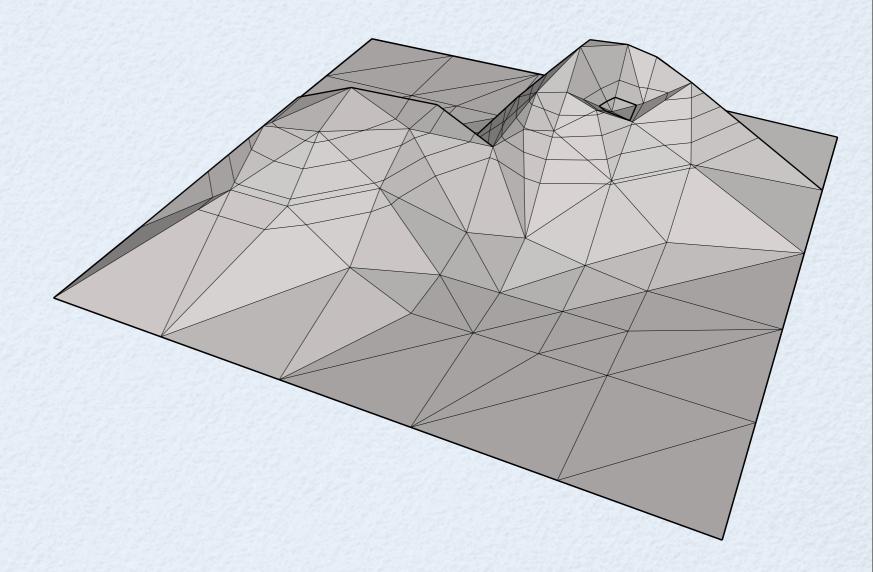






If triangles were ordered on disk such that all partially generated contours in "less naïve" algorithm stayed connected, no succ/pred sorting would be needed.

≺: such an ordering



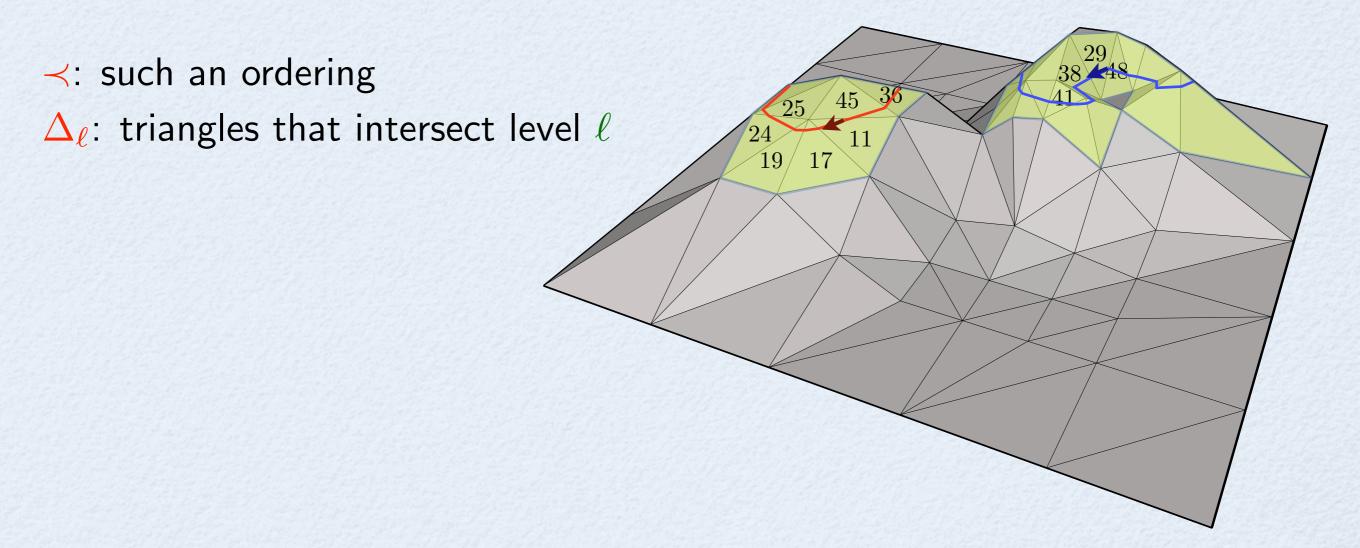
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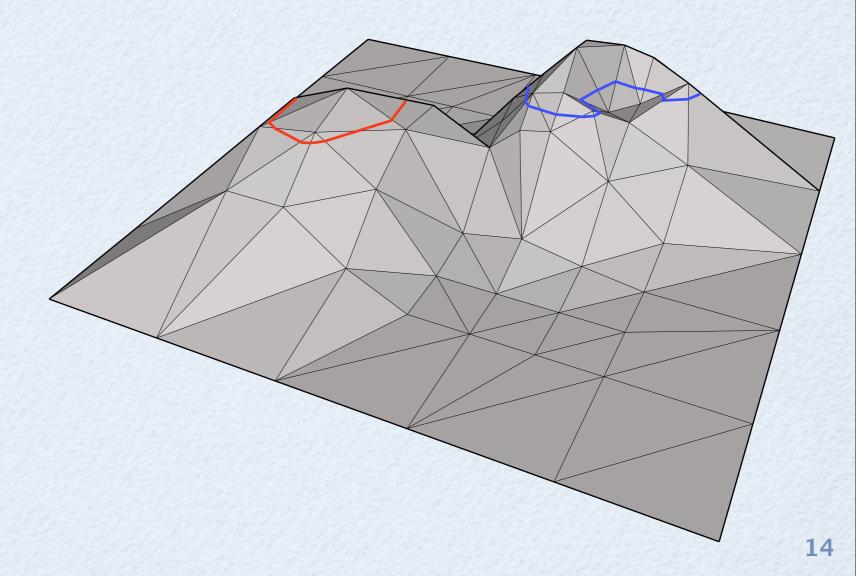
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The restriction of  $\prec$  to  $\Delta_{\ell}$  traverses each contour of M in circular order.

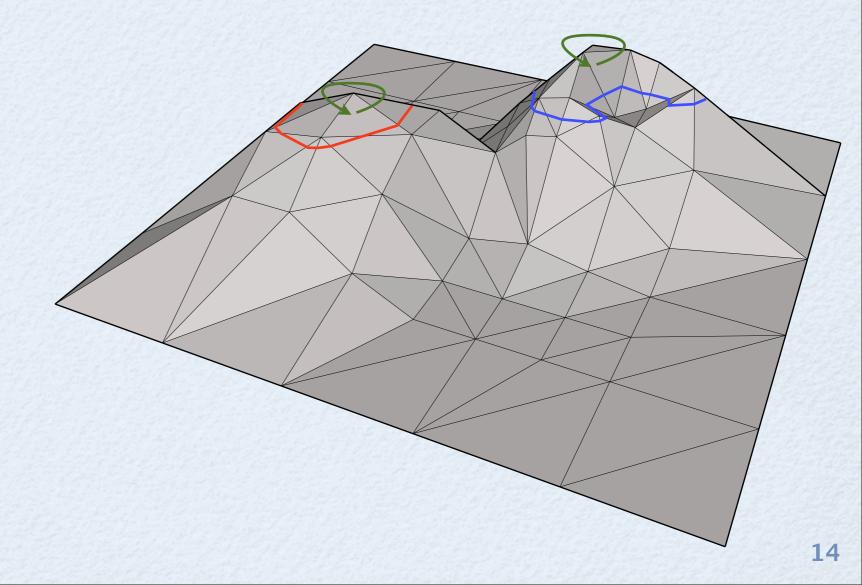
**Theorem.** For any terrain  $\mathbb{M}$ , there is a total ordering " $\prec$ " of triangles of  $\mathbb{M}$ , s.t. for any  $\ell$ :

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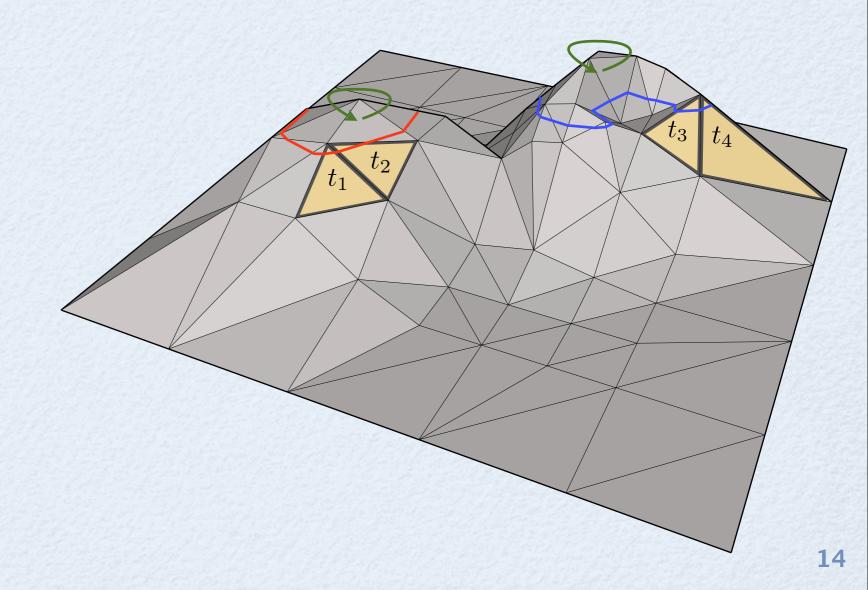


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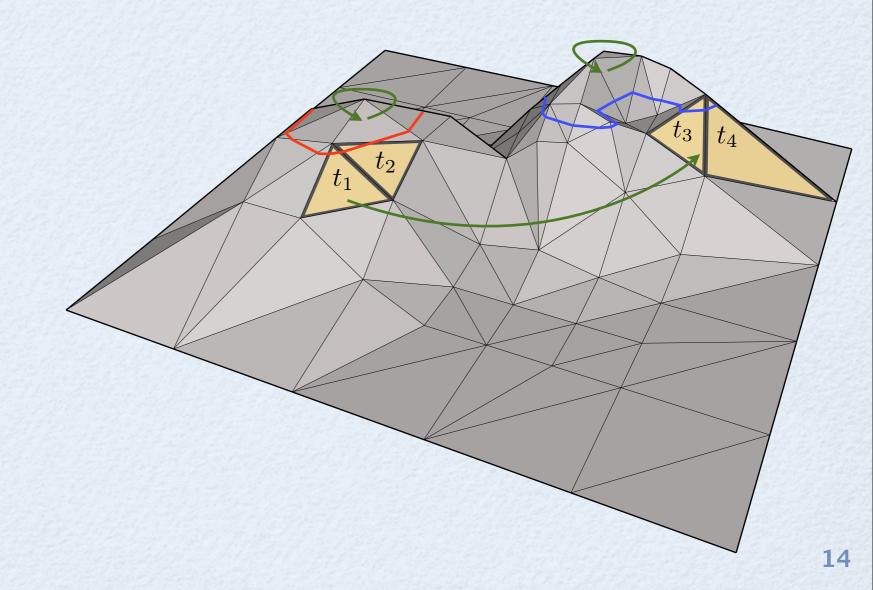
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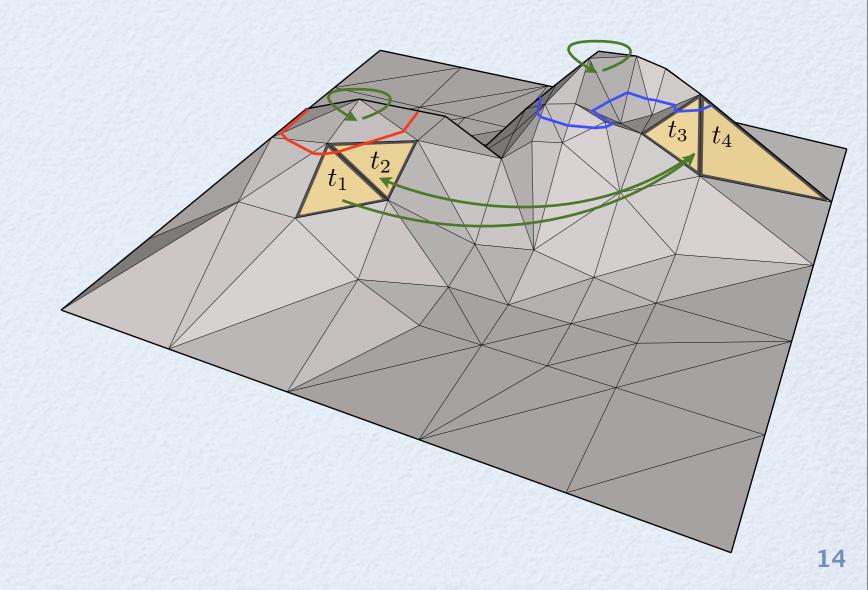
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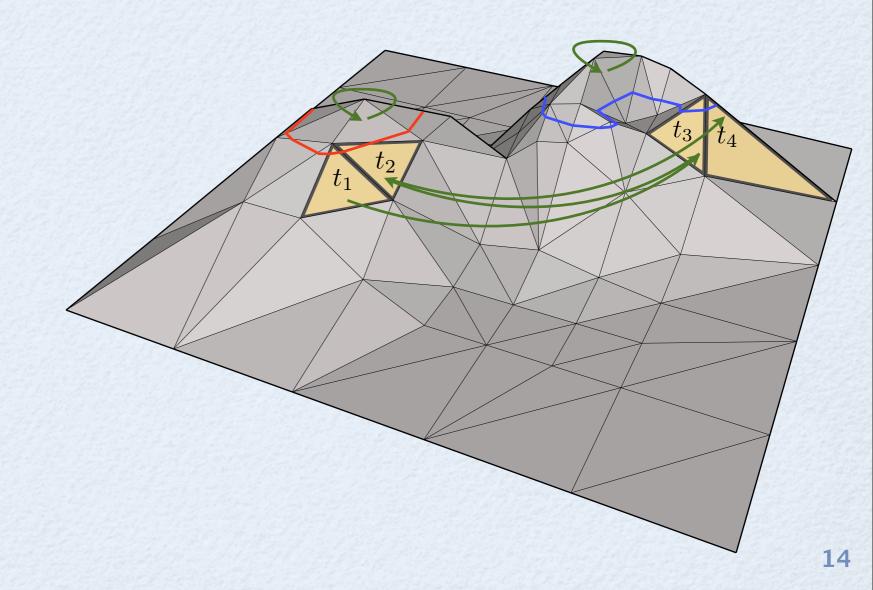
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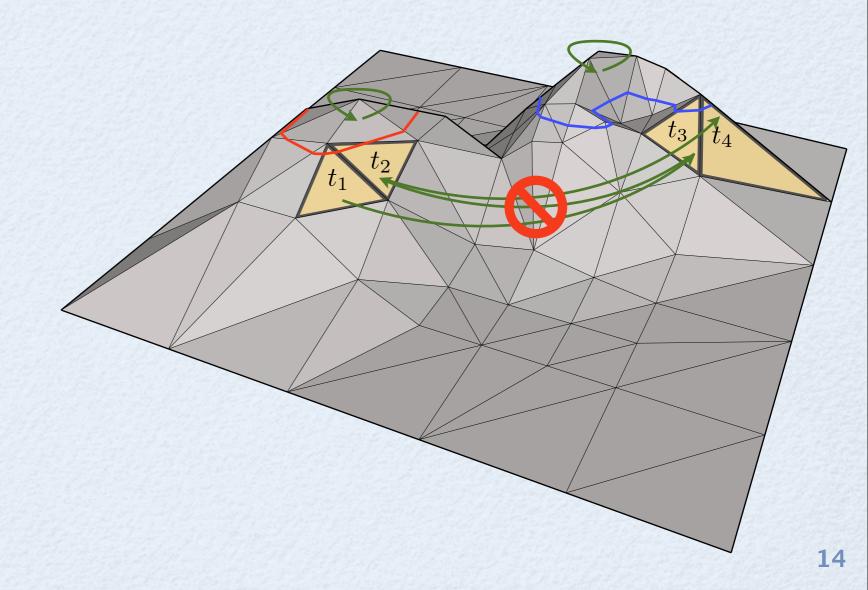
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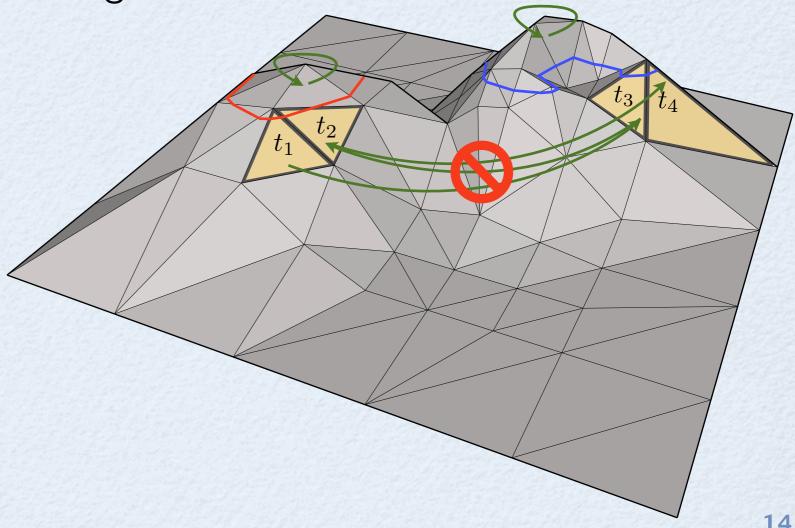
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We call  $\prec$  a "level-ordering" of triangles in  $\mathbb{M}$ .

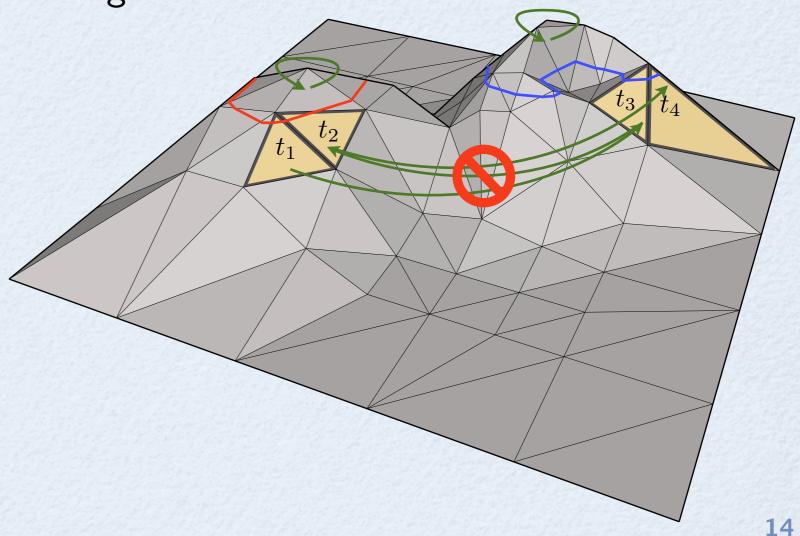


**Theorem.** For any terrain  $\mathbb{M}$ , there is, and can be found in  $O(\operatorname{Sort}(N))$  I/Os, a total ordering " $\prec$ " of triangles of  $\mathbb{M}$ , s.t. for any  $\ell$ :

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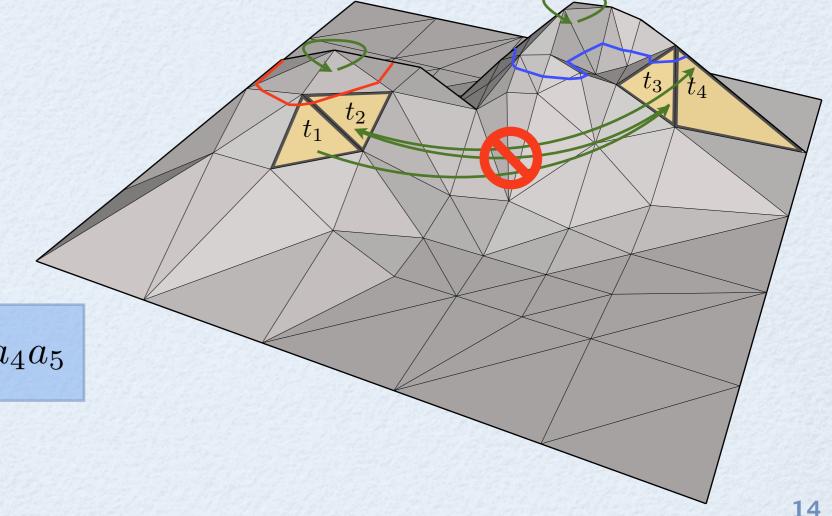


**Theorem.** For any terrain M, there is, and can be found in  $O(\operatorname{Sort}(N))$  I/Os, a total ordering " $\prec$ " of triangles of M, s.t. for any  $\ell$ :

- 1. Triangles of each contour in  $\Delta_{\ell}$  are  $\prec$ -sorted in cw or ccw order.
- 2. For contours C and D of  $\Delta_{\ell}$  and  $t_1, t_2 \in C$  and  $t_3, t_4 \in D$ :

$$t_1 \prec t_3 \prec t_2 \implies t_1 \prec t_4 \prec t_2$$

We call  $\prec$  a "level-ordering" of triangles in M.



 $a_1 a_2 b_1 c_1 c_2 c_3 b_2 b_3 d_1 d_2 b_4 a_3 a_4 a_5$ 

**Theorem.** For any terrain  $\mathbb{M}$ , there is, and can be found in  $O(\operatorname{Sort}(N))$  I/Os, a total ordering " $\prec$ " of triangles of  $\mathbb{M}$ , s.t. for any  $\ell$ :

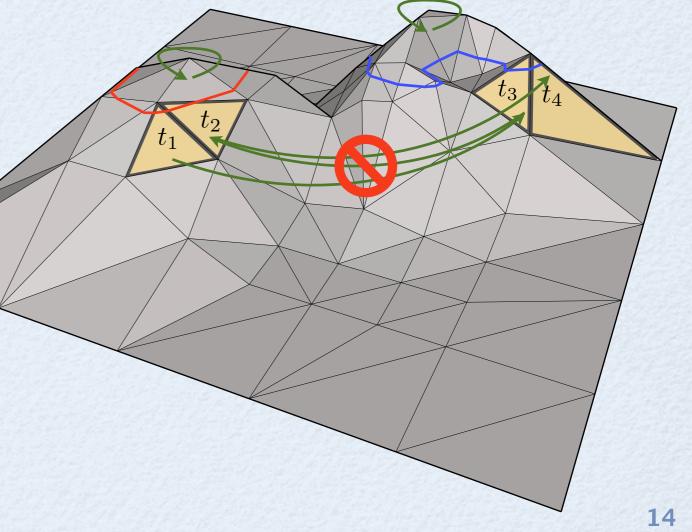
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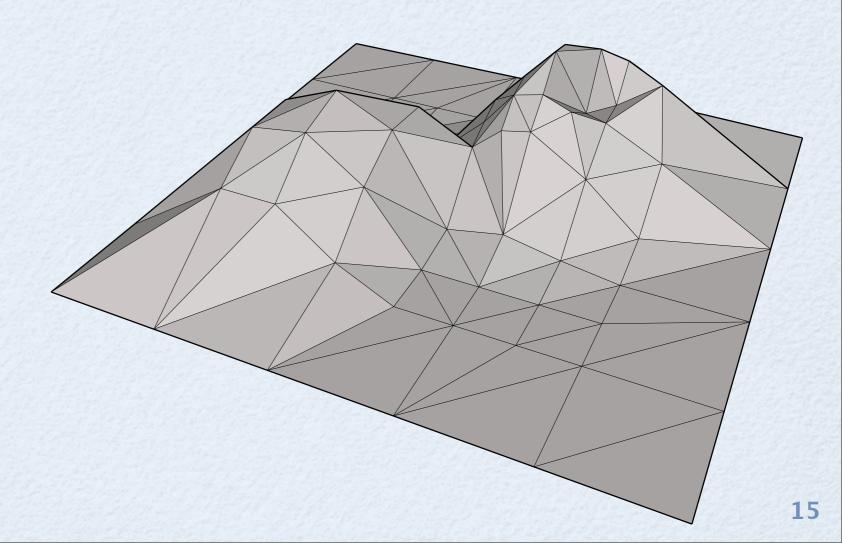
Can separate contours using a stack in O(T/B) I/Os.

 $a_1a_2b_1c_1c_2c_3b_2b_3d_1d_2b_4a_3a_4a_5 \ a_1a_2a_3a_4a_5b_1b_2b_3b_4c_1c_2c_3d_1d_2$ 

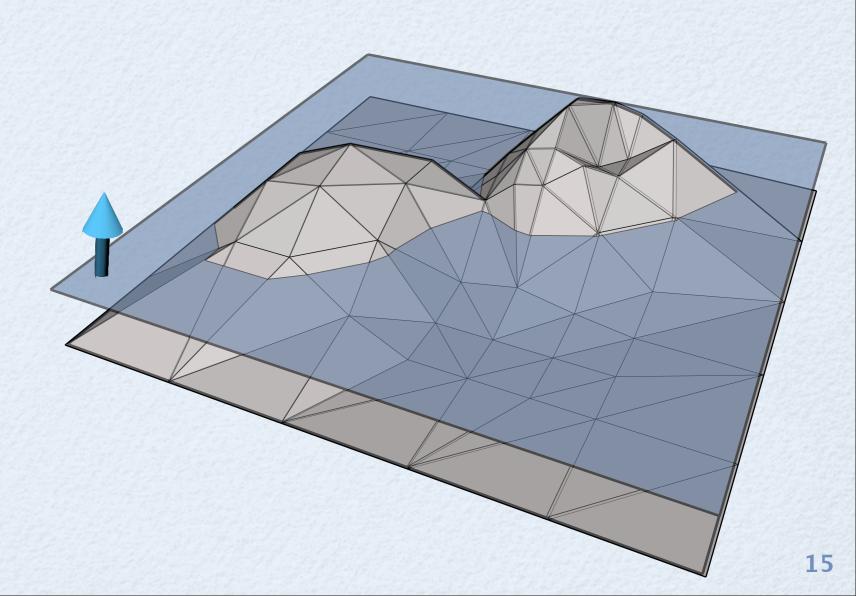


# The Algorithm

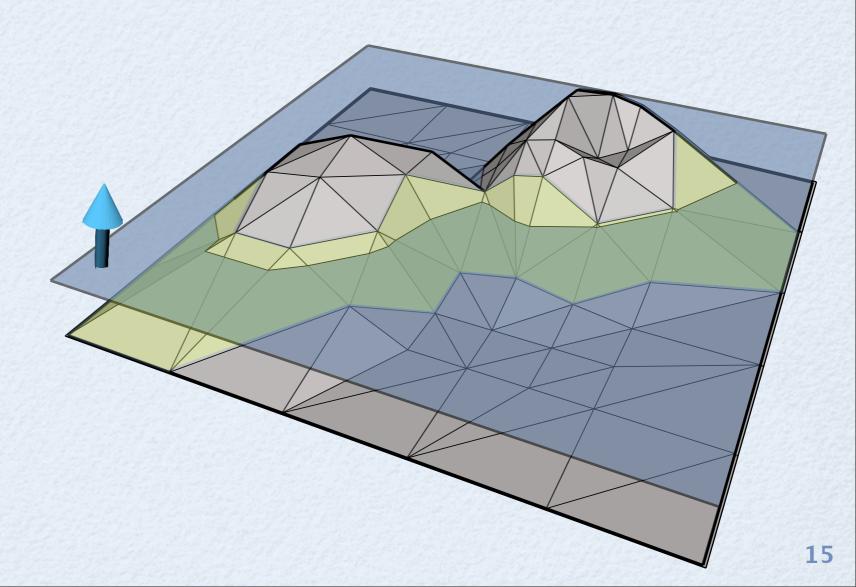
1. Sweep the terrain by a horizontal plane in the  $\pm z$  direction.



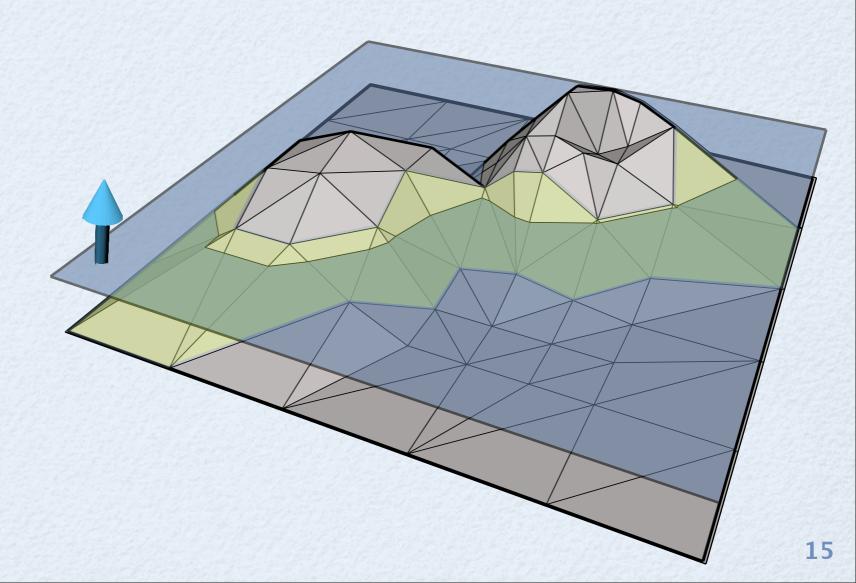
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- 1. Sweep the terrain by a horizontal plane in the +z direction.
- 2. Keep triangles that intersect the sweep plane in a search tree ordered by



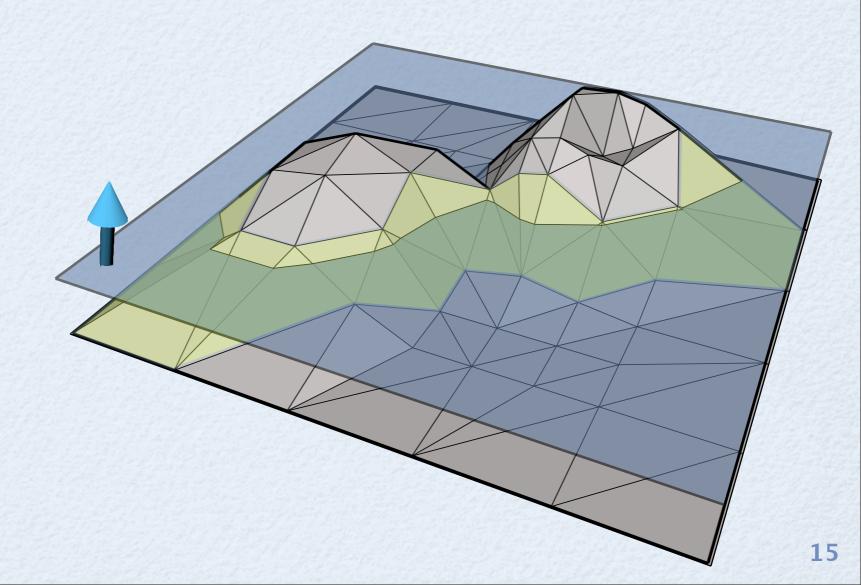
- 1. Sweep the terrain by a horizontal plane in the +z direction.
- 2. Keep triangles that intersect the sweep plane in a search tree ordered by \( \times \).
- 3. When passing target level  $\ell_i \in L$ , dump contents of tree to disk.



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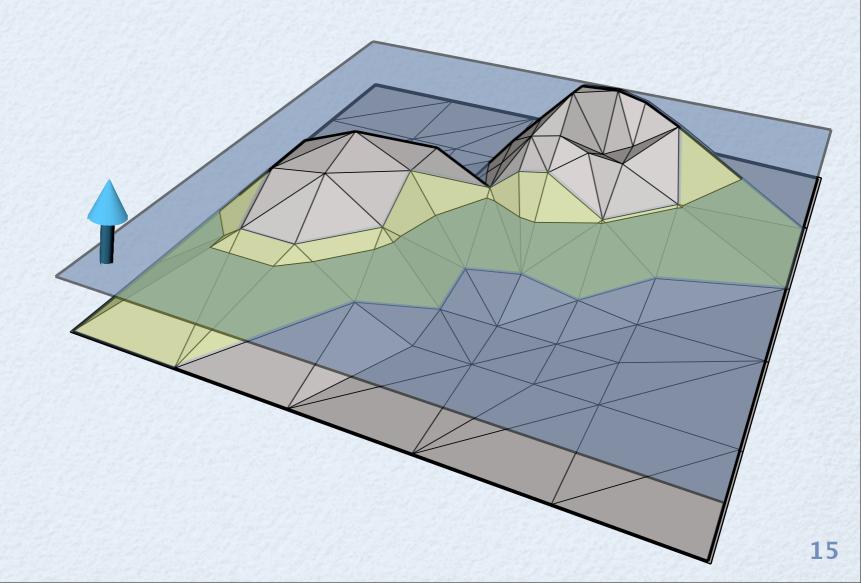
 $\mathsf{Sort}(N)$ 

2. Keep triangles that intersect the sweep plane in a search tree ordered by

 $\prec$ .

Buffer Tree [Arge'95]

3. When passing target level  $\ell_i \in L$ , dump contents of tree to disk.



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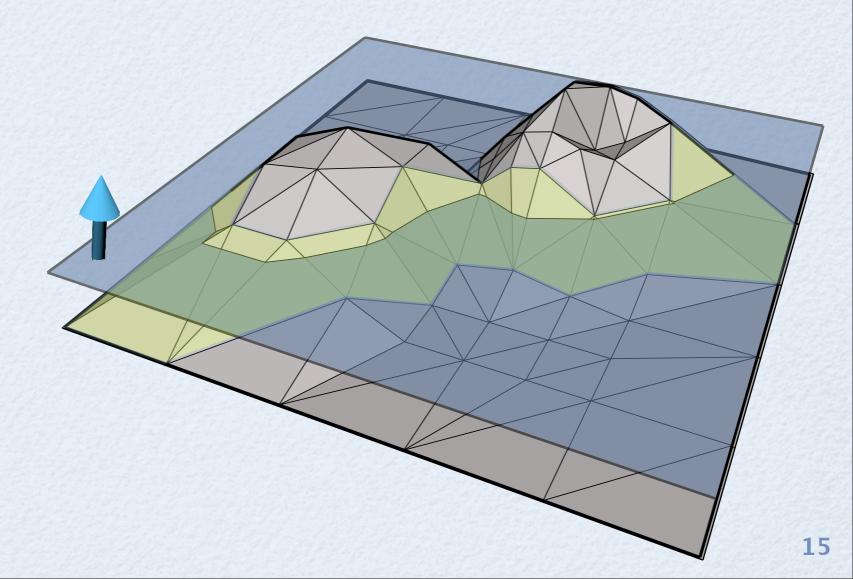
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 $\prec$  Amortized Sort(N)

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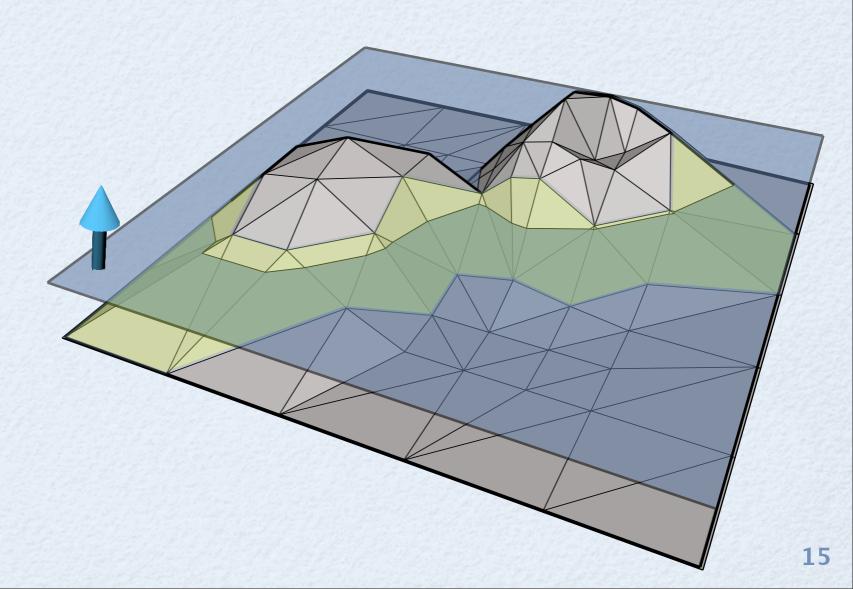
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3. When passing target level  $\ell_i \in L$ , dump contents of tree to disk.  $\sqrt{T/B}$ 



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Using a persistent search tree, we can answer contour queries in  $O(\log_B N + T/B)$  I/Os.

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 $\mathsf{Sort}(N)$ 

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Using a persistent search tree, we can answer contour queries in  $O(\log_B N + T/B)$  I/Os.

Preprocessing needs  $O(\operatorname{Sort}(N))$  I/Os and O(N) space.

#### **Buffer Tree**

Buffer Tree is an I/O-efficient search tree introduced by Arge [Arge'95].

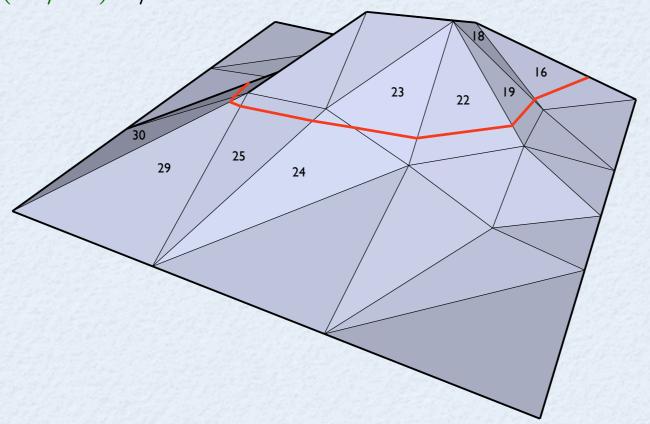
The amortized cost of N intermixed insert and delete operations on an initially empty buffer tree is  $O\left(\frac{N}{B}\log_{M/B}\frac{N}{B}\right) = O(\mathsf{Sort}(N))$  I/Os.

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Flushing the tree writes the entire content of the tree in sorted order on disk, and this takes O(N/B) I/Os.

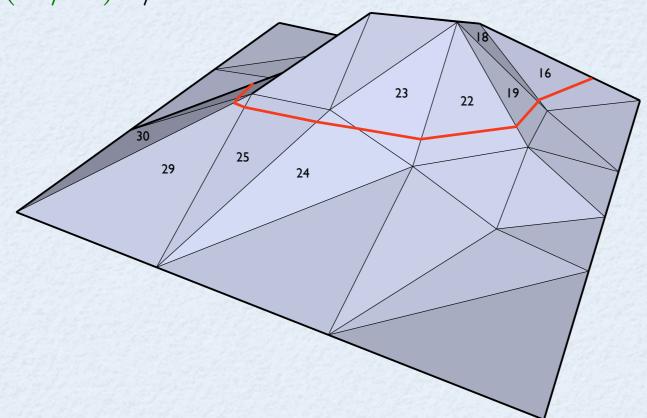


#### **Buffer Tree**

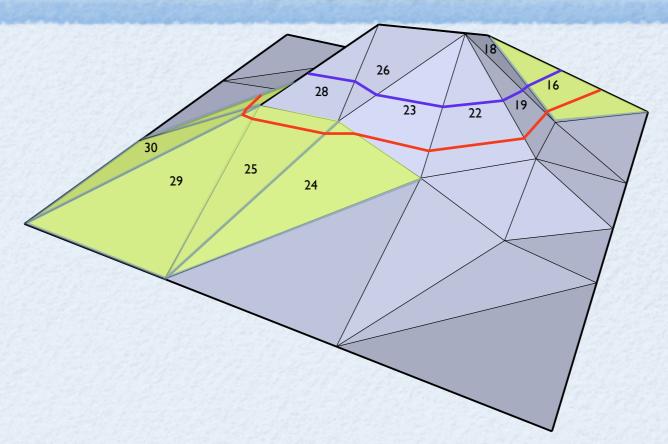
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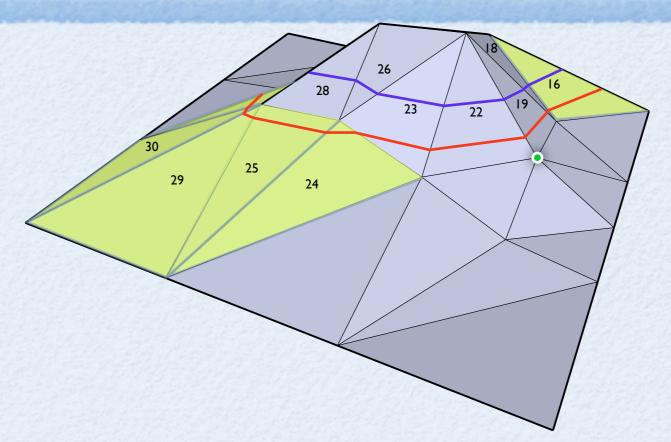
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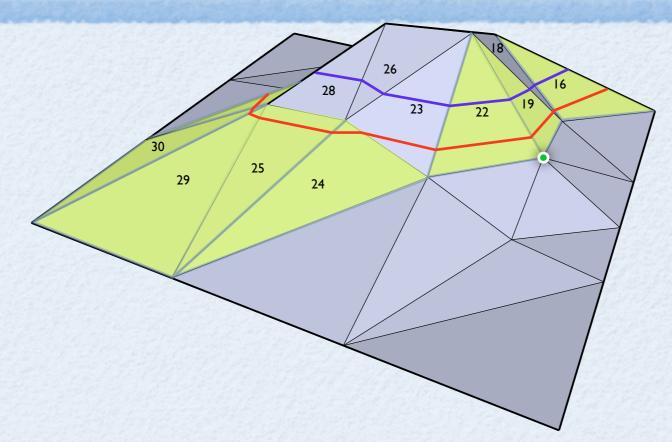
It is possible to make a persistent tree such that each version can be retrieved in  $O(\log_B N)$  I/Os.



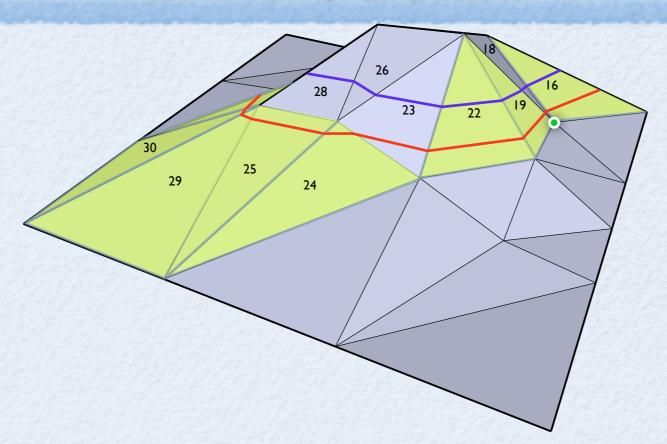
- 0. Compute a level ordering of M and the rank of each triangle.
- 1. Sort the vertices in the ascending order of their heights.
- 2. Let  $\ell = \ell_1$  be the first level of interest in  $L = \{\ell_1, \dots, \ell_k\}$ .
- 3. Scan the sorted list of vertices: at vertex v
- 4. If  $h(v) > \ell$ :
- 5. Flush the buffer tree; set  $\ell$  to the next level in L.
- 6. For each triangle t for which v is the lowest vertex:
- 7. If t intersects level  $\ell$  insert t into the buffer tree.
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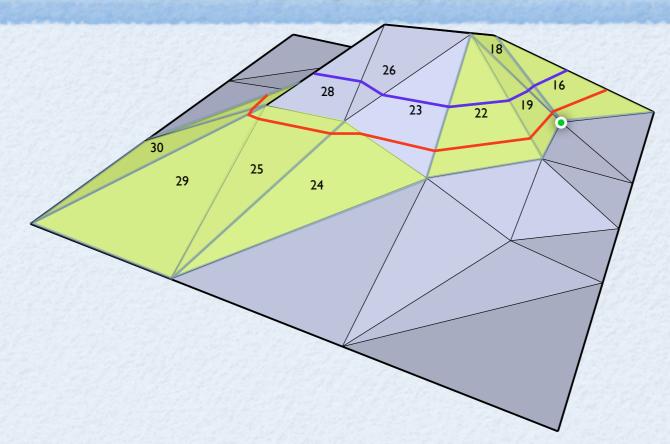
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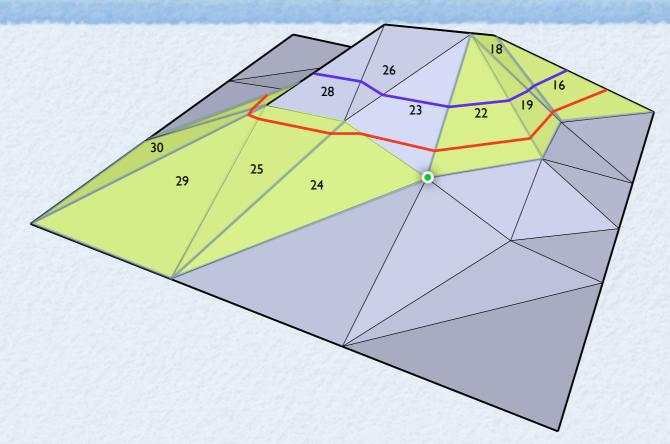
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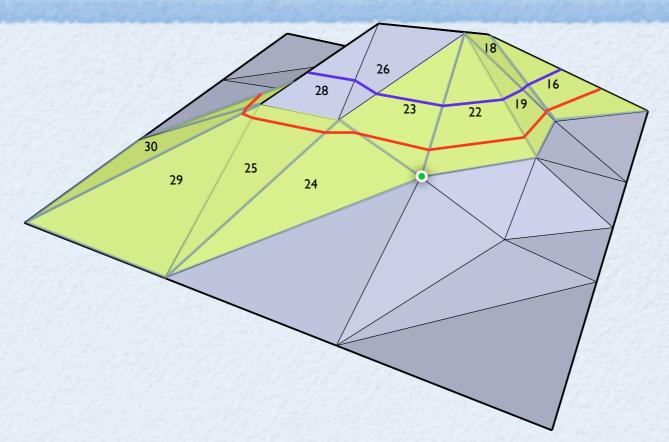
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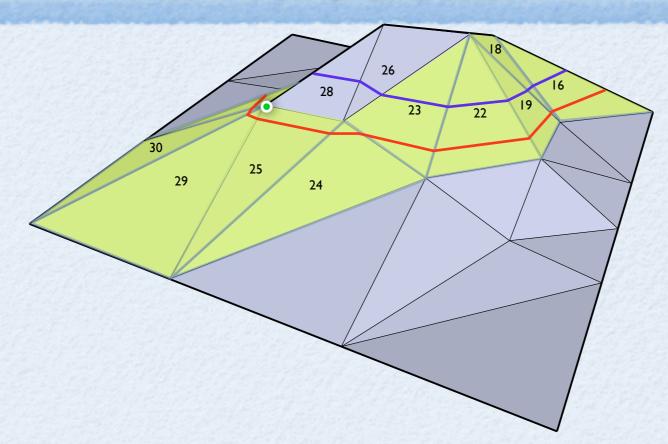
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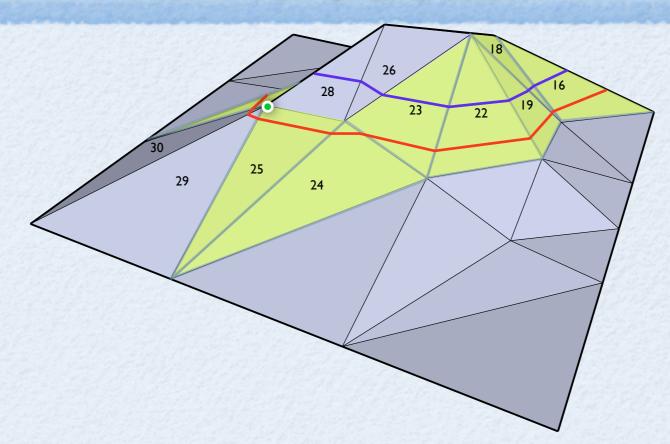
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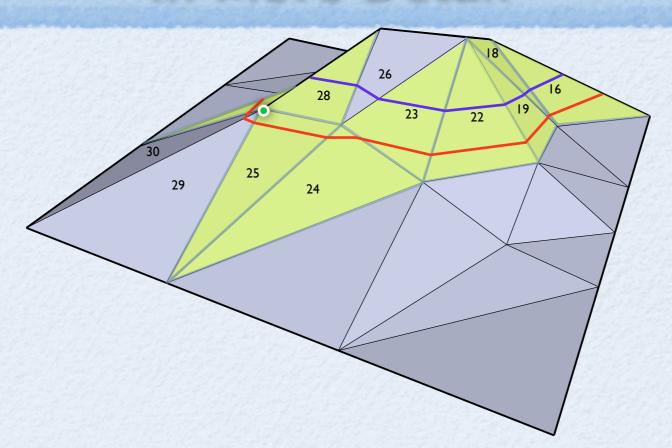
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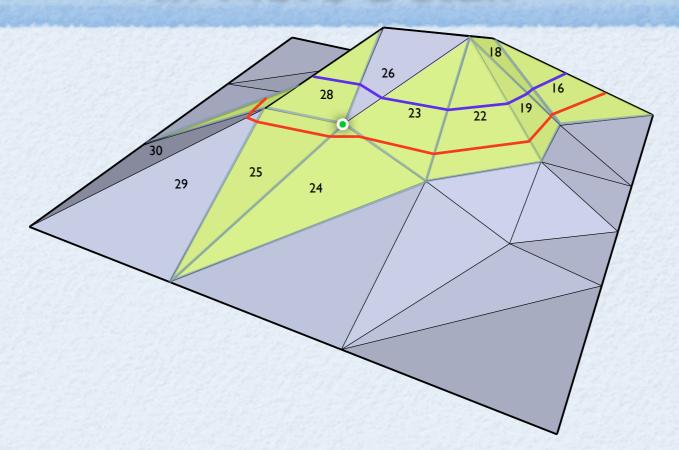
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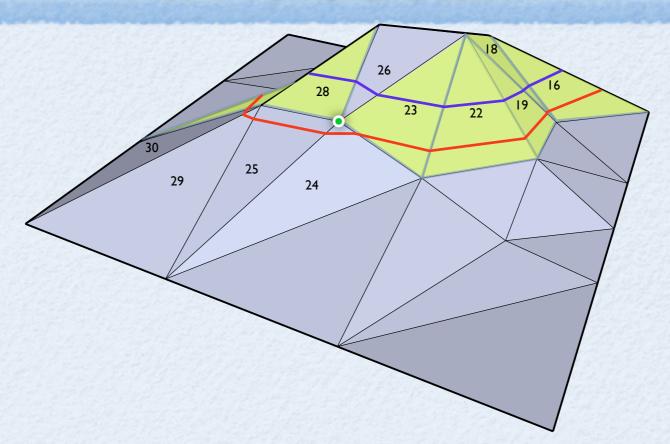
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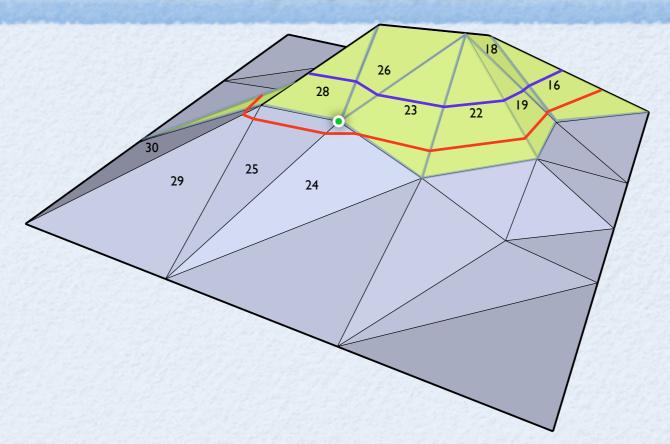
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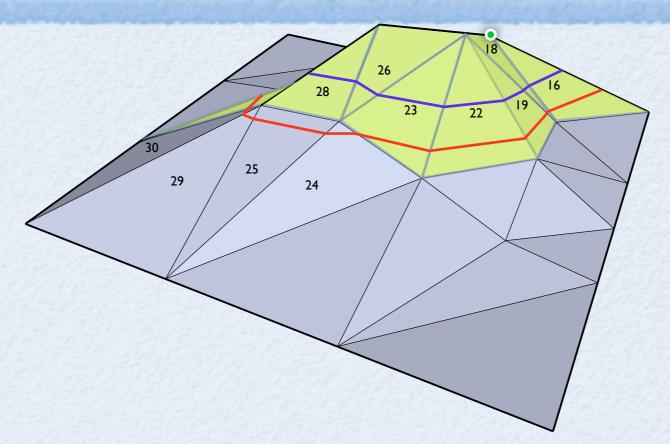
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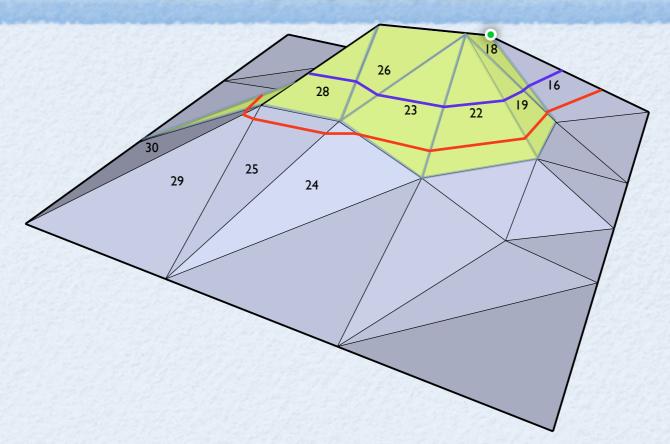
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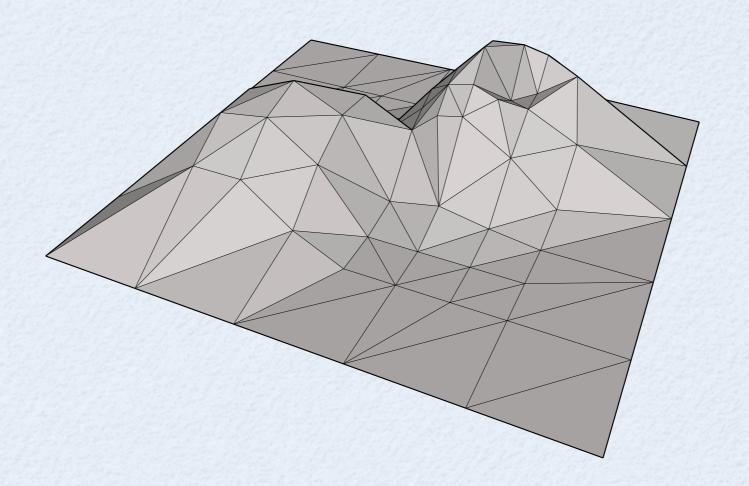
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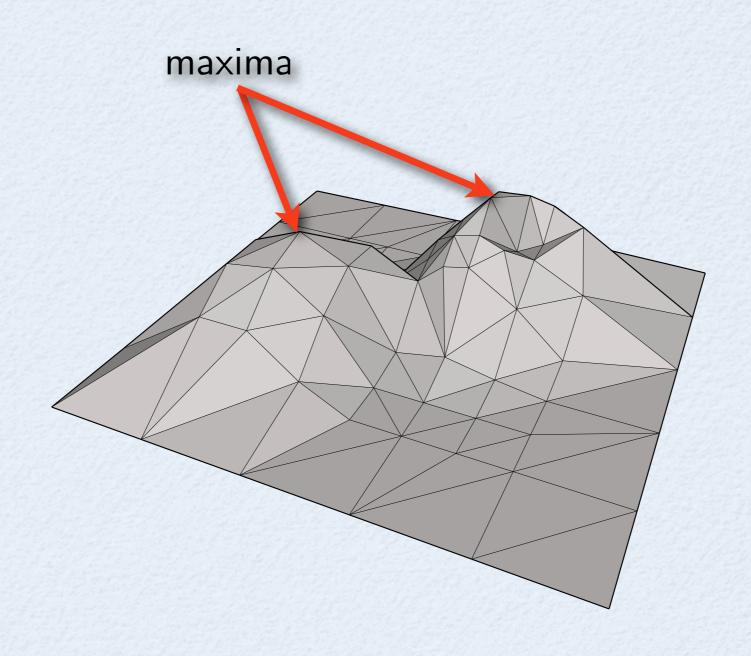


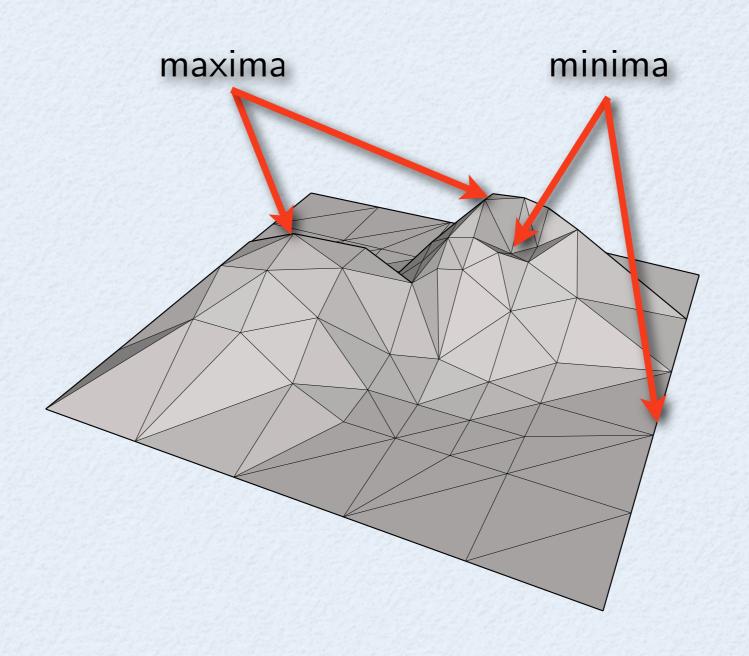
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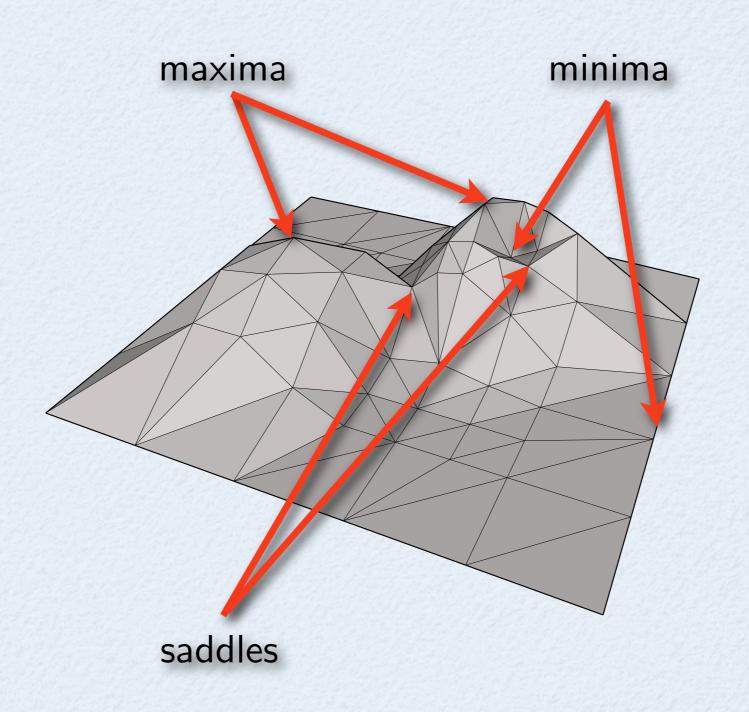


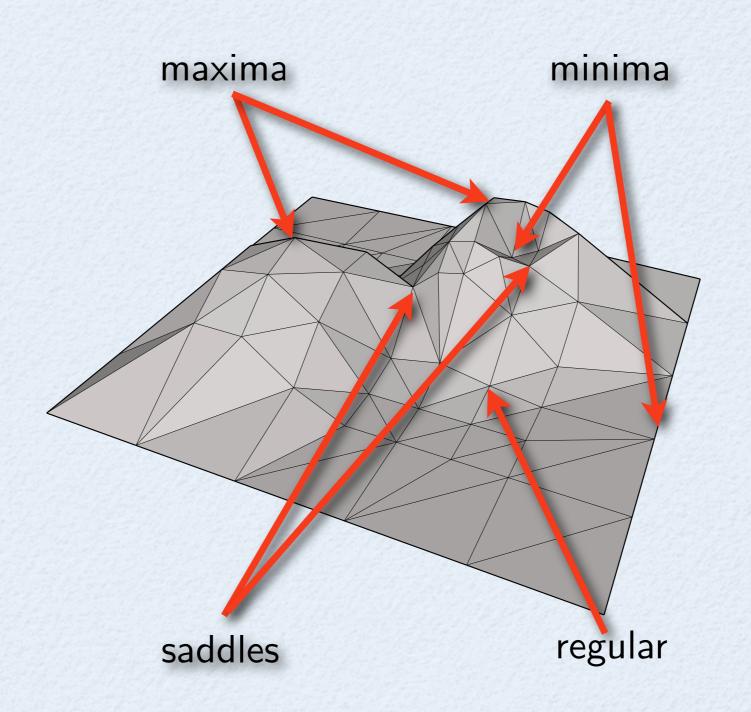
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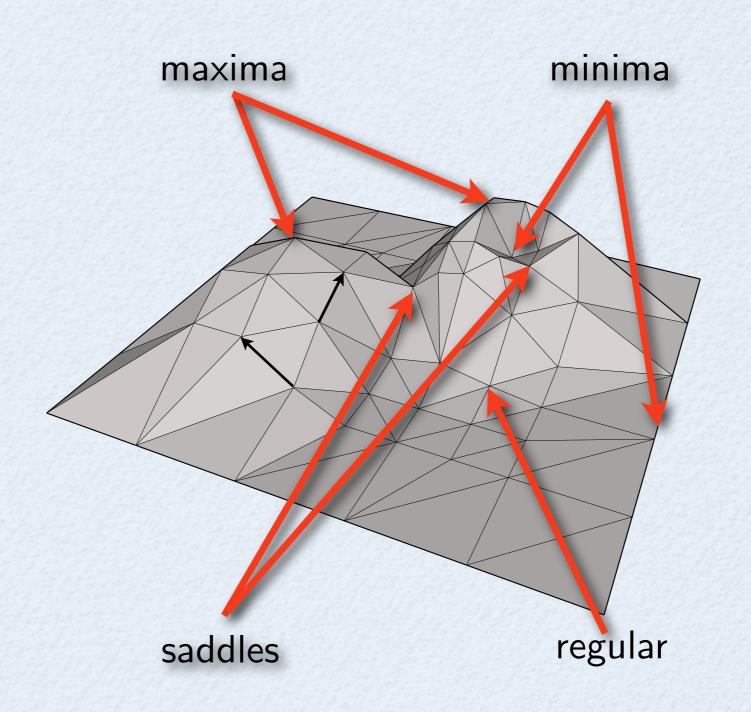


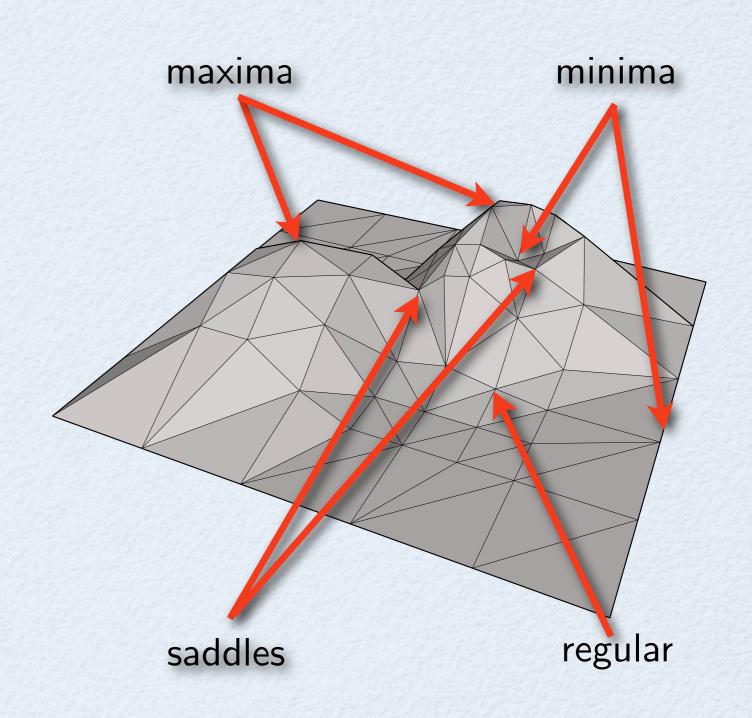


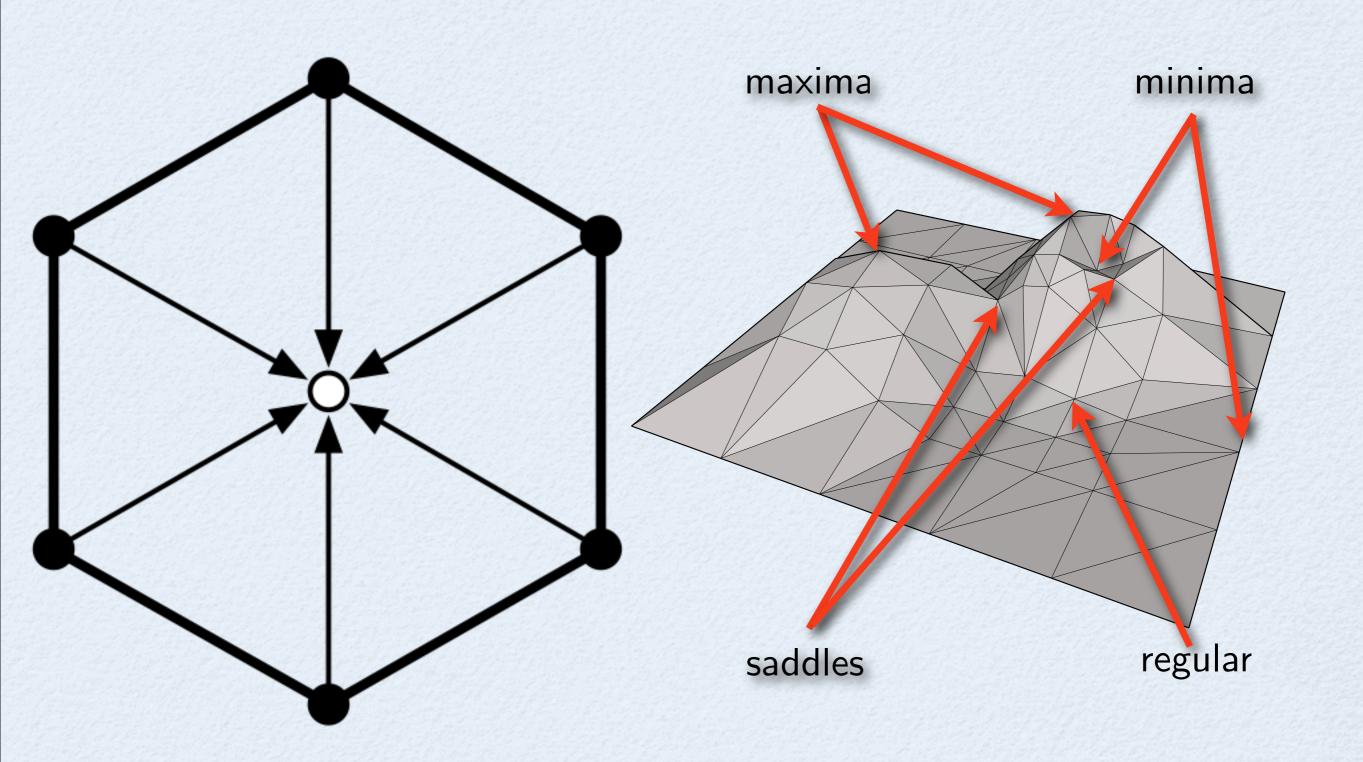


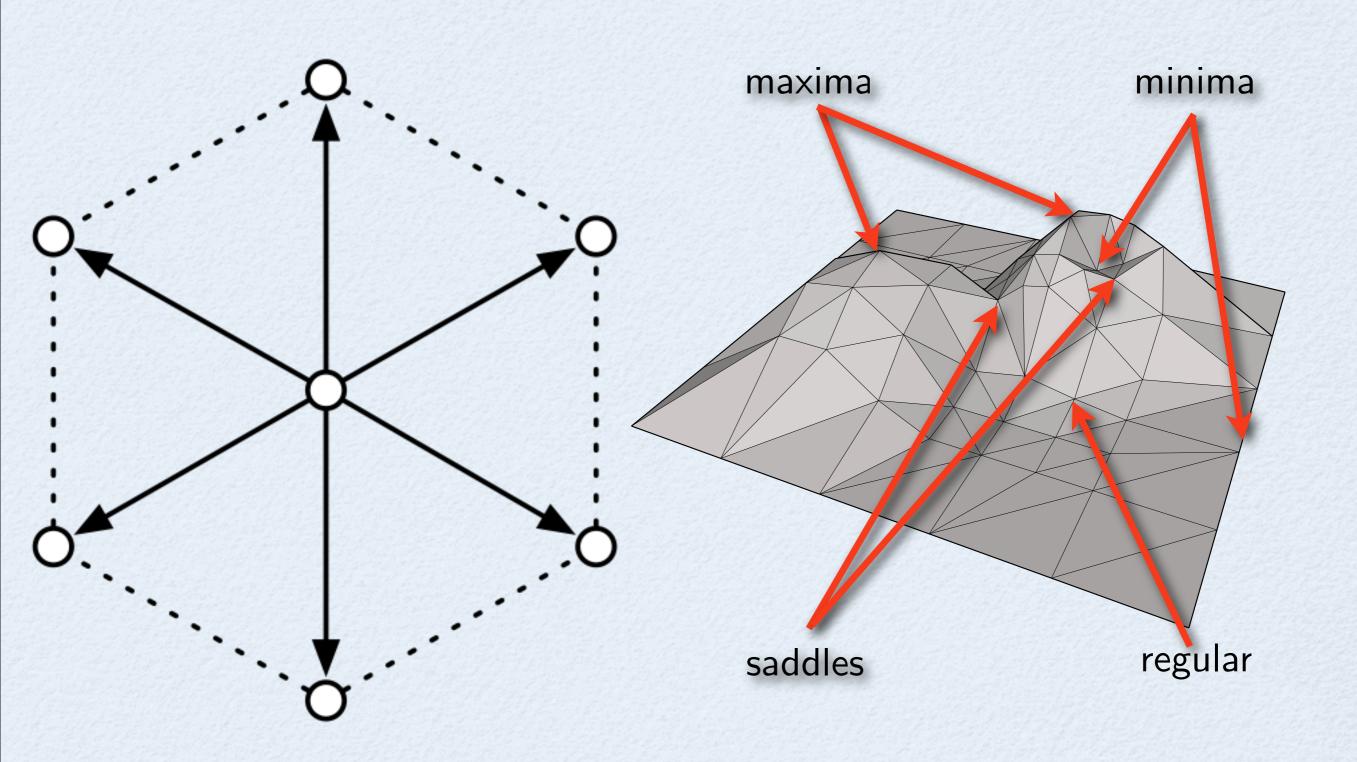




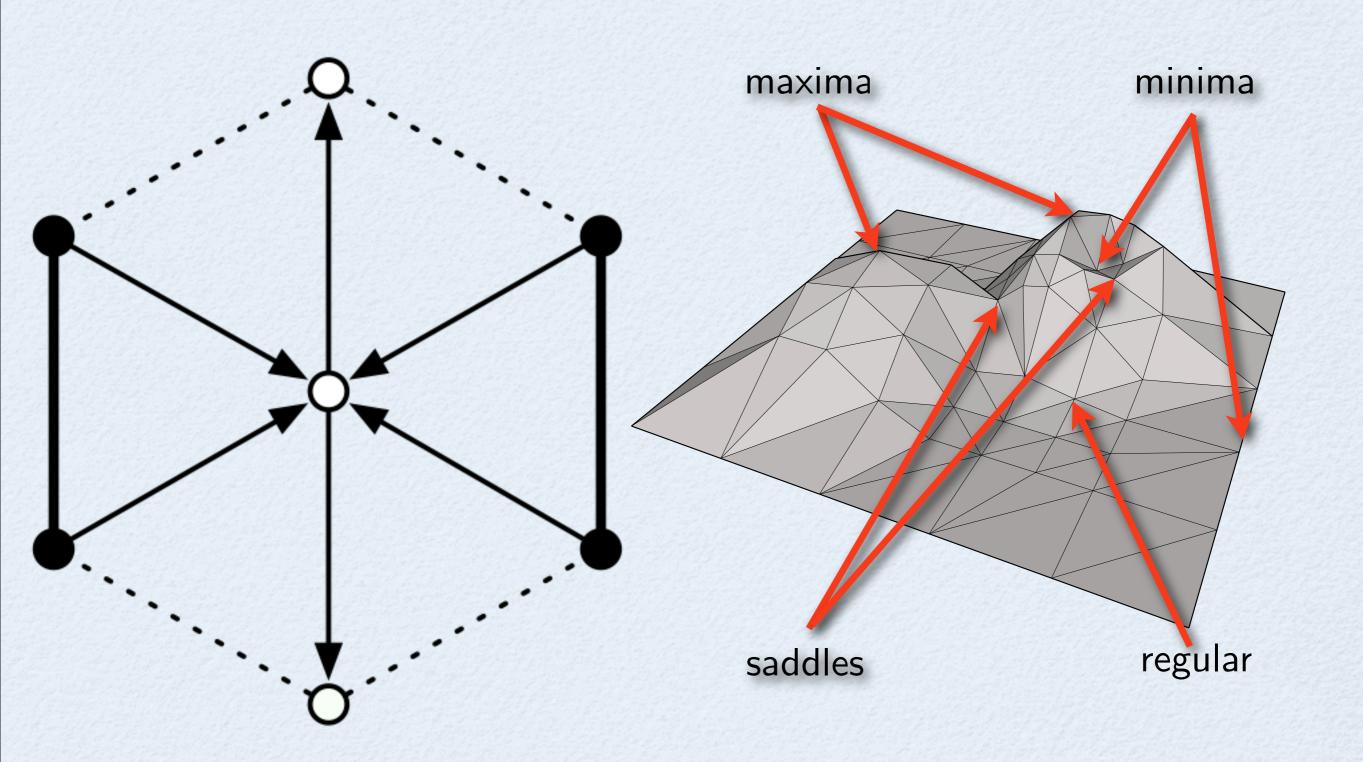




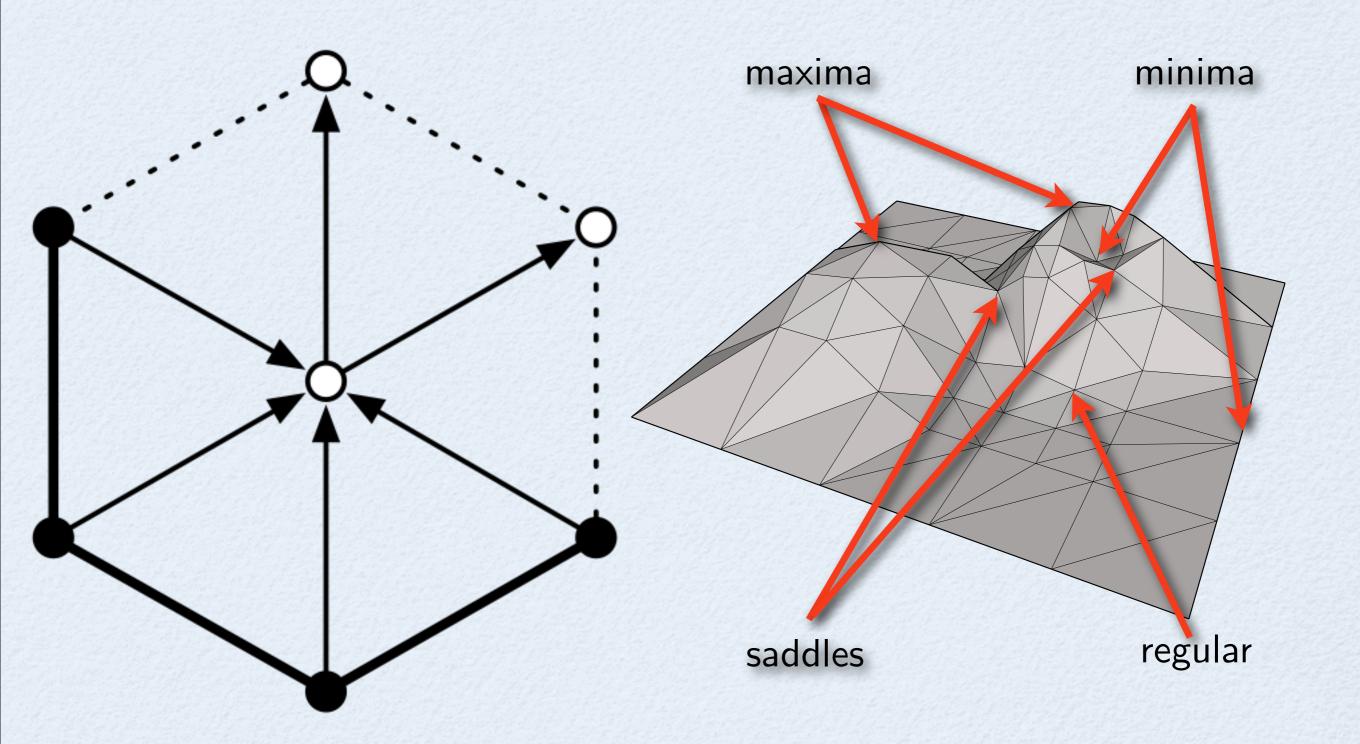


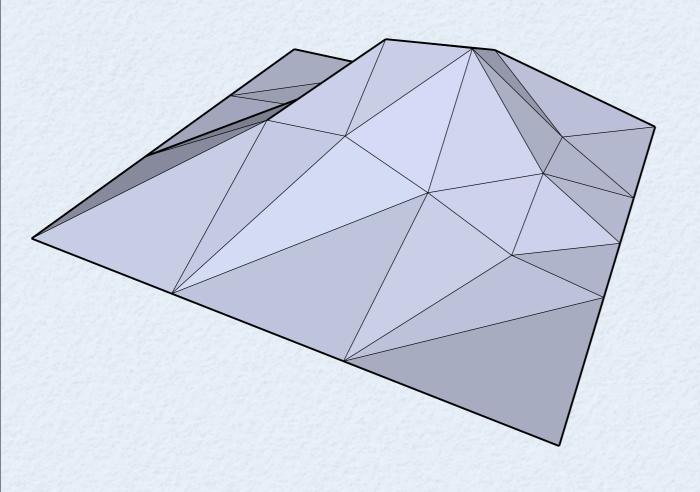


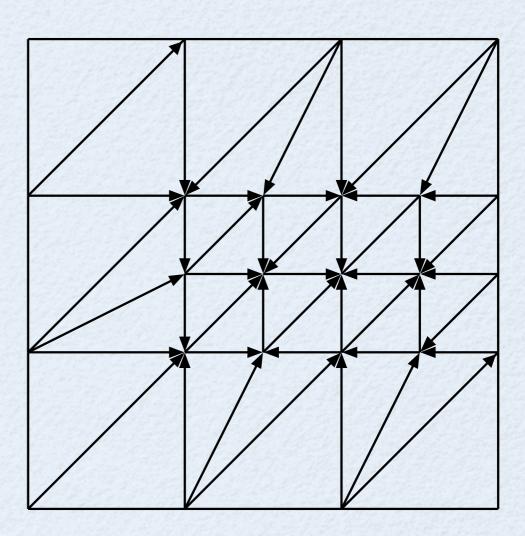
# Critical Points of a Terrain

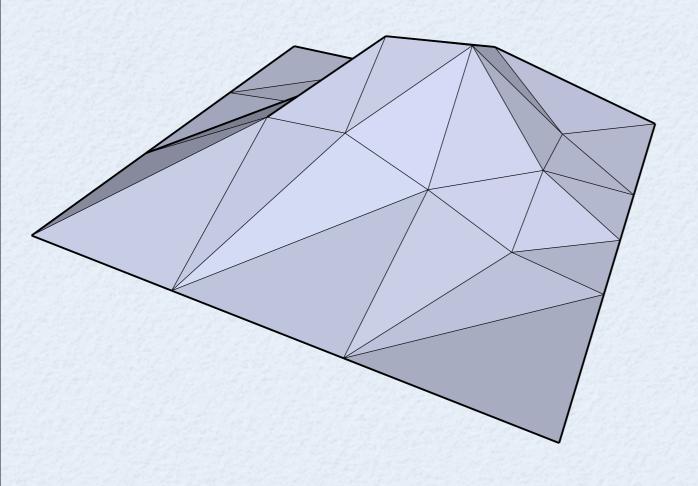


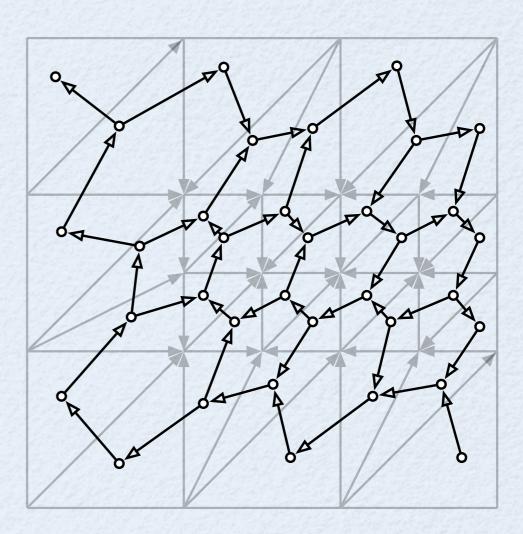
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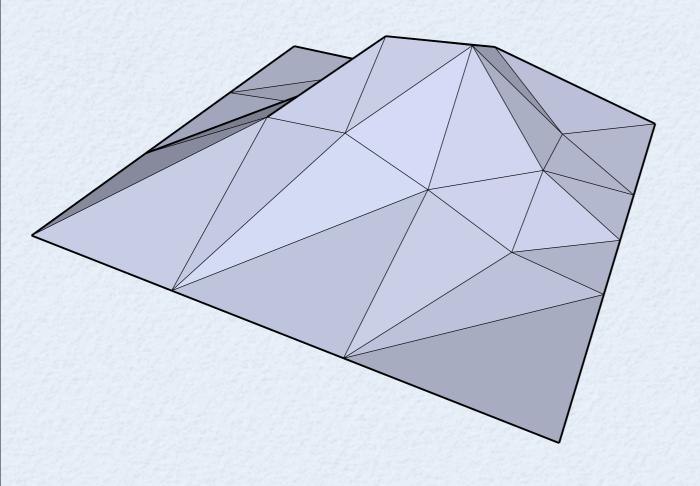


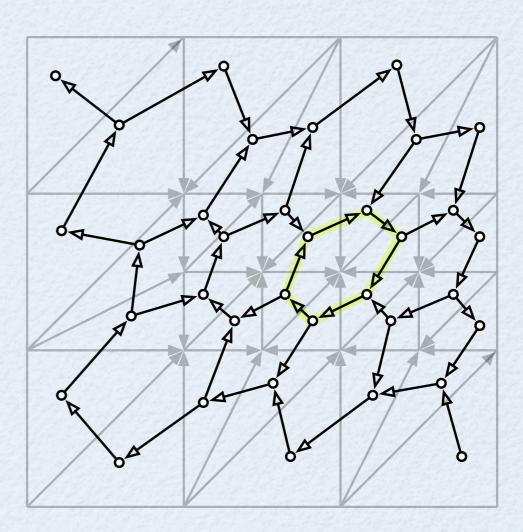




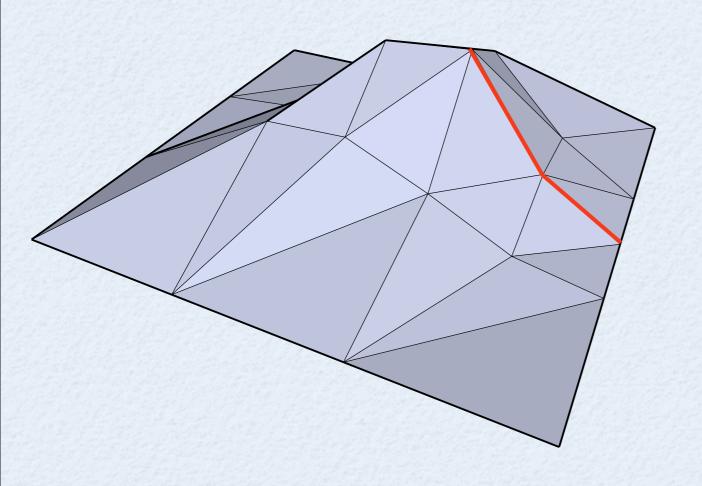


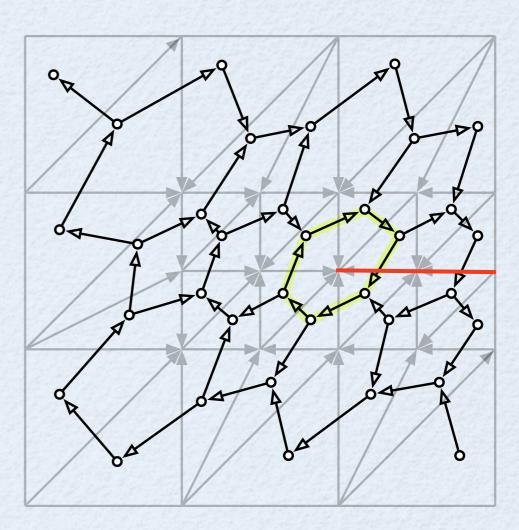




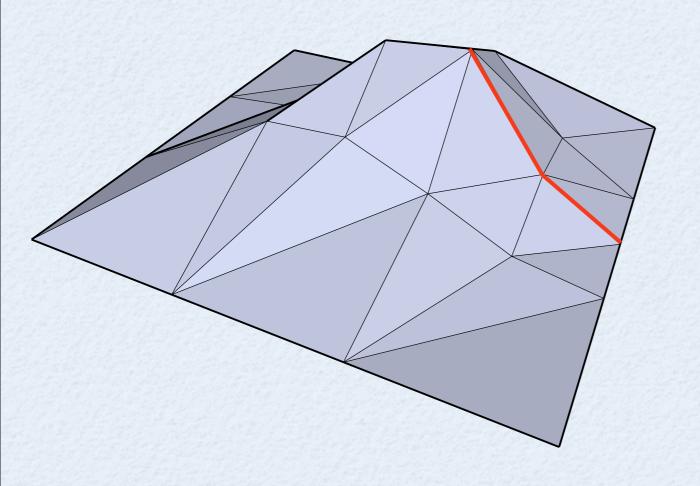


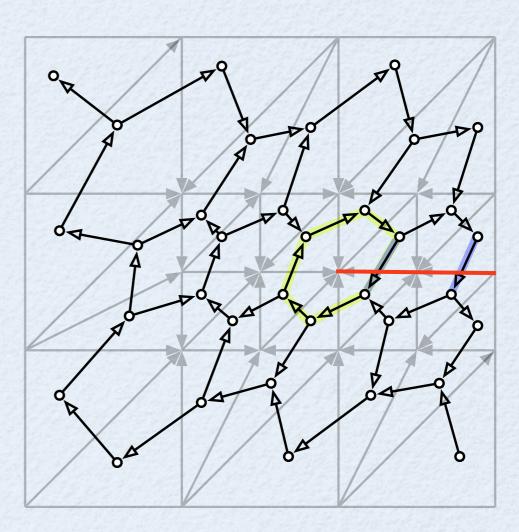
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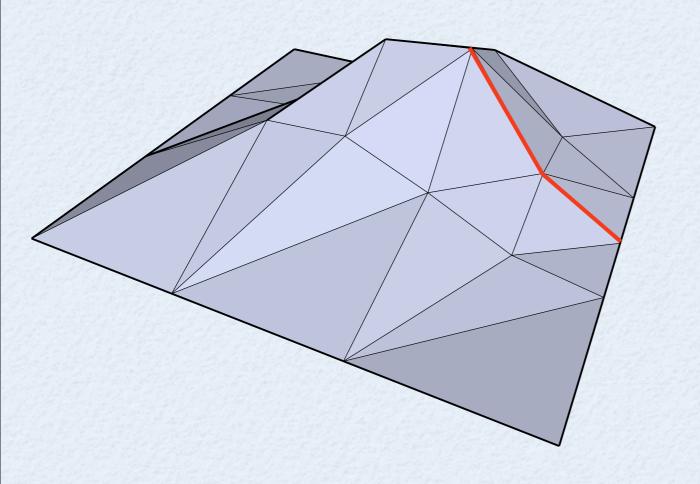


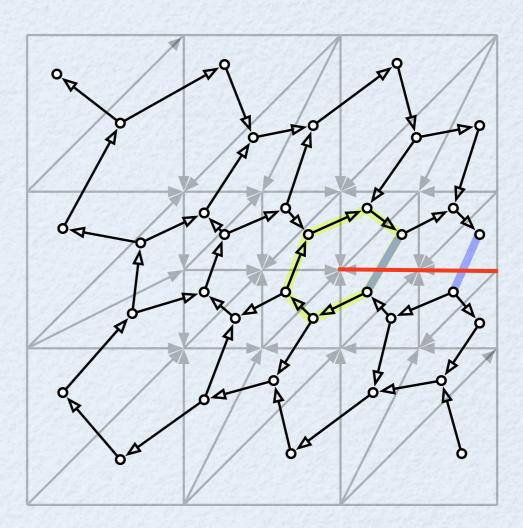
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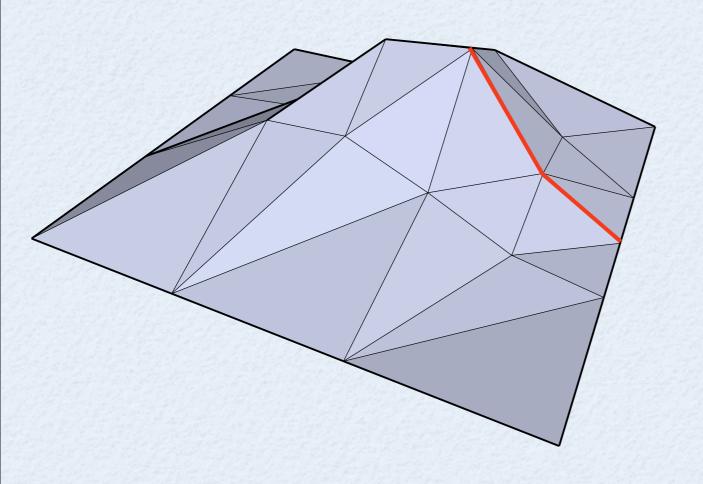


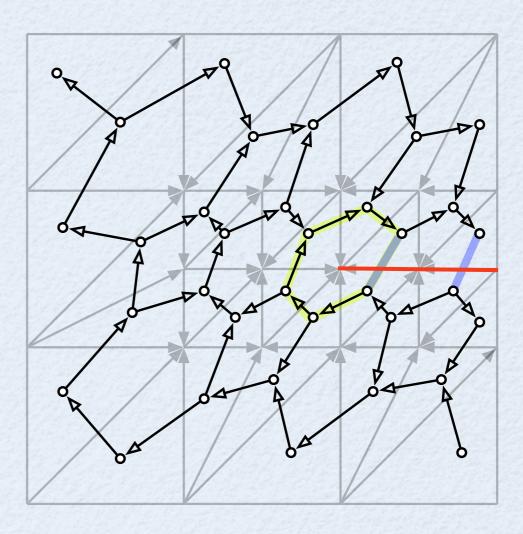
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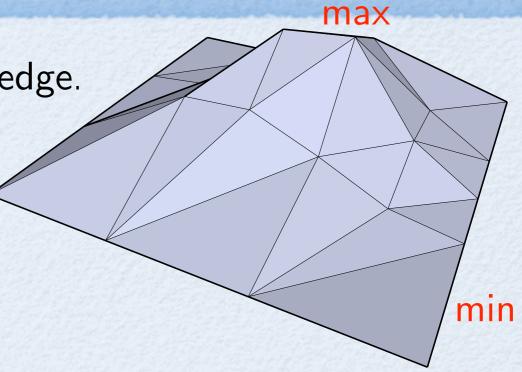
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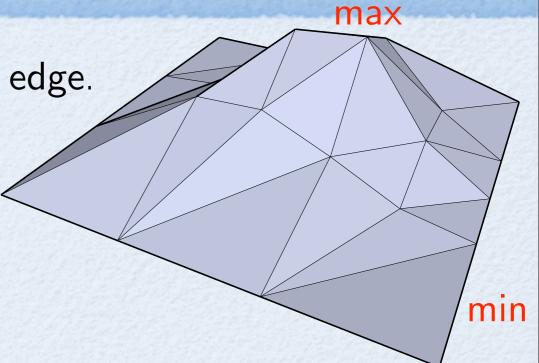
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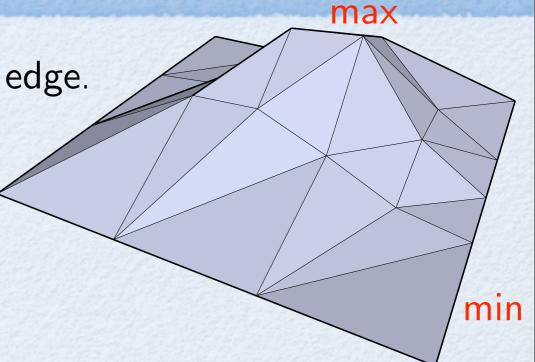
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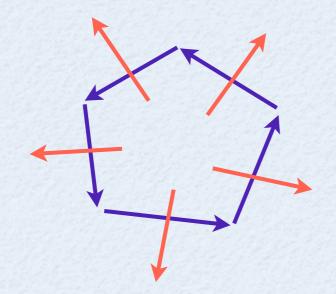
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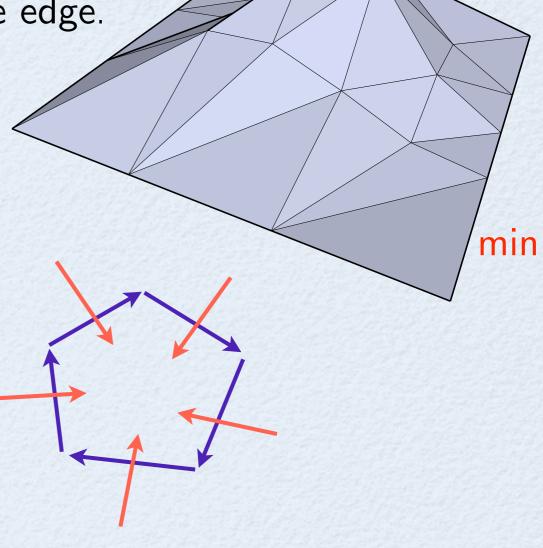
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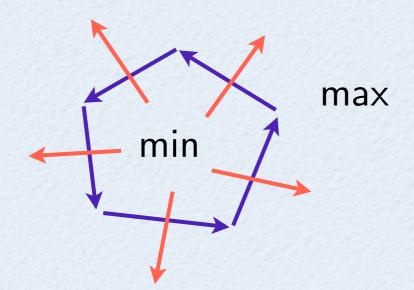


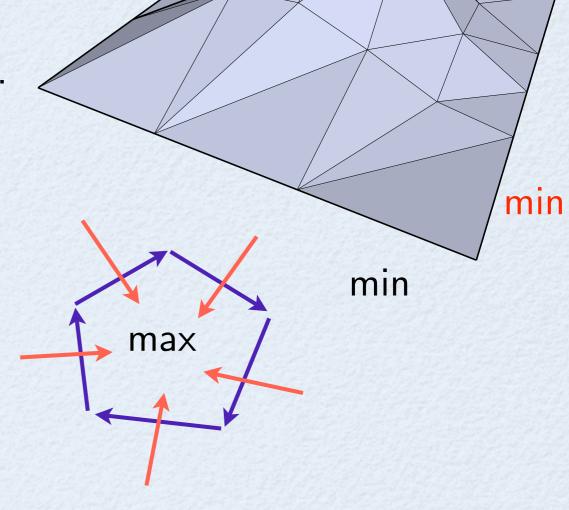


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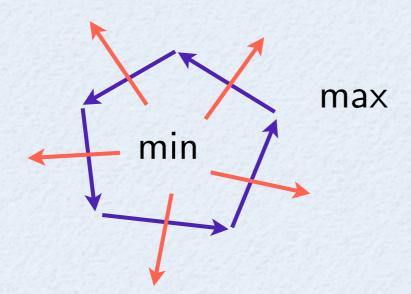


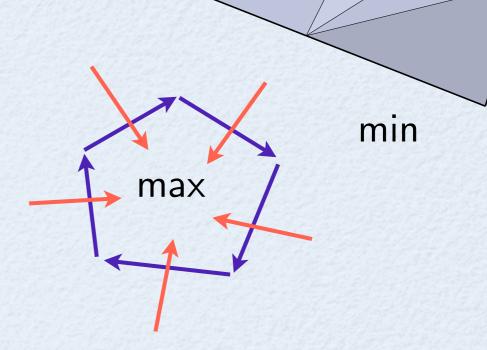


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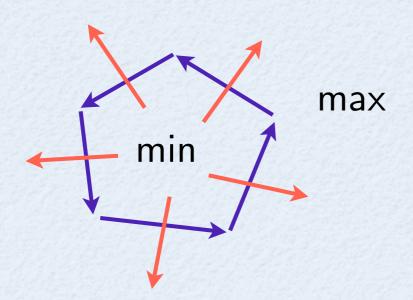
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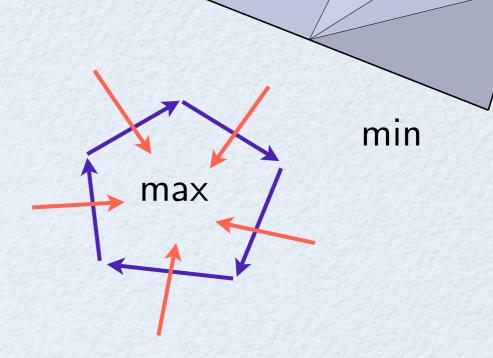
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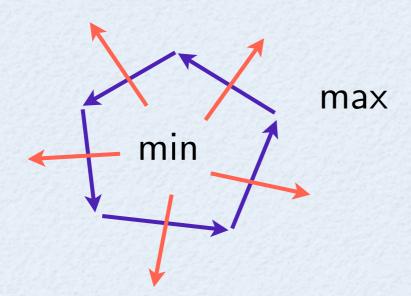
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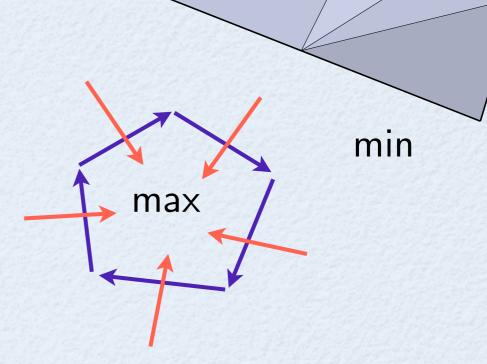
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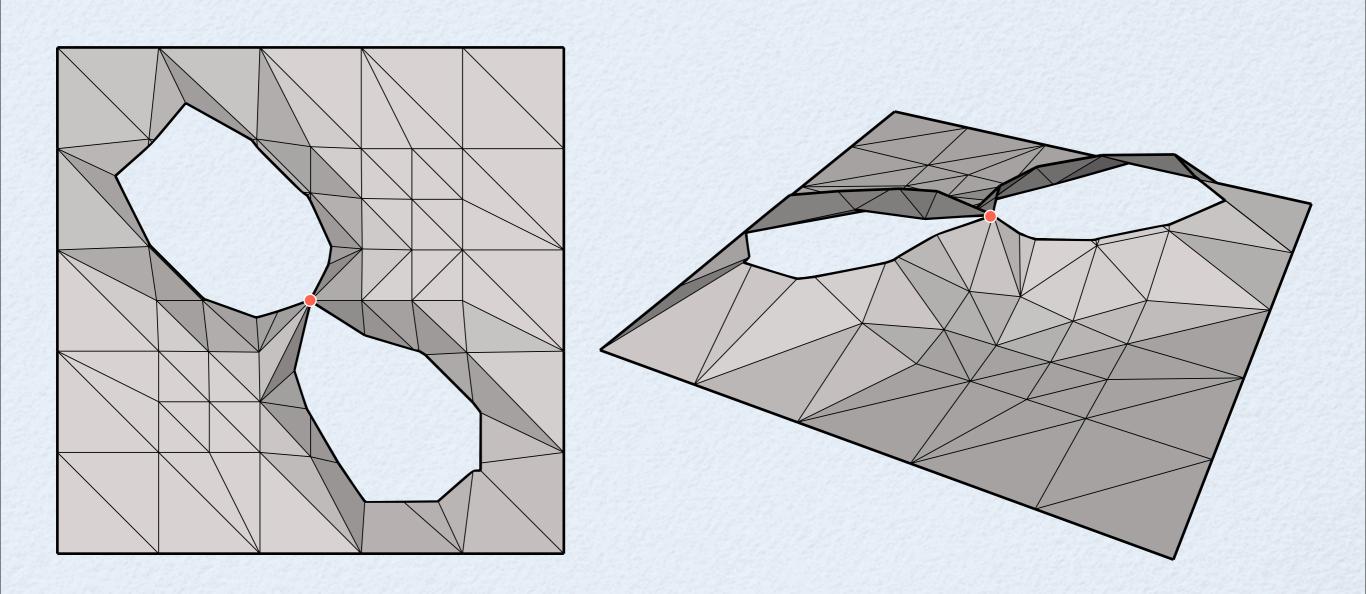
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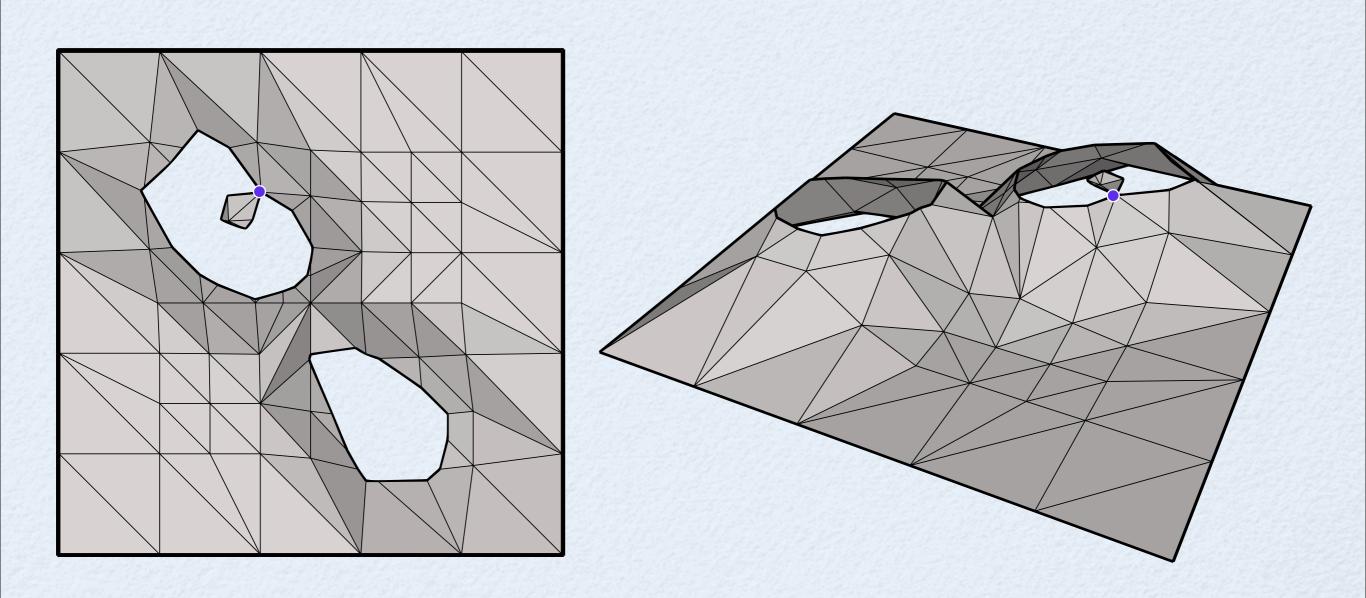
[Arge, Toma, Zeh'03]

min

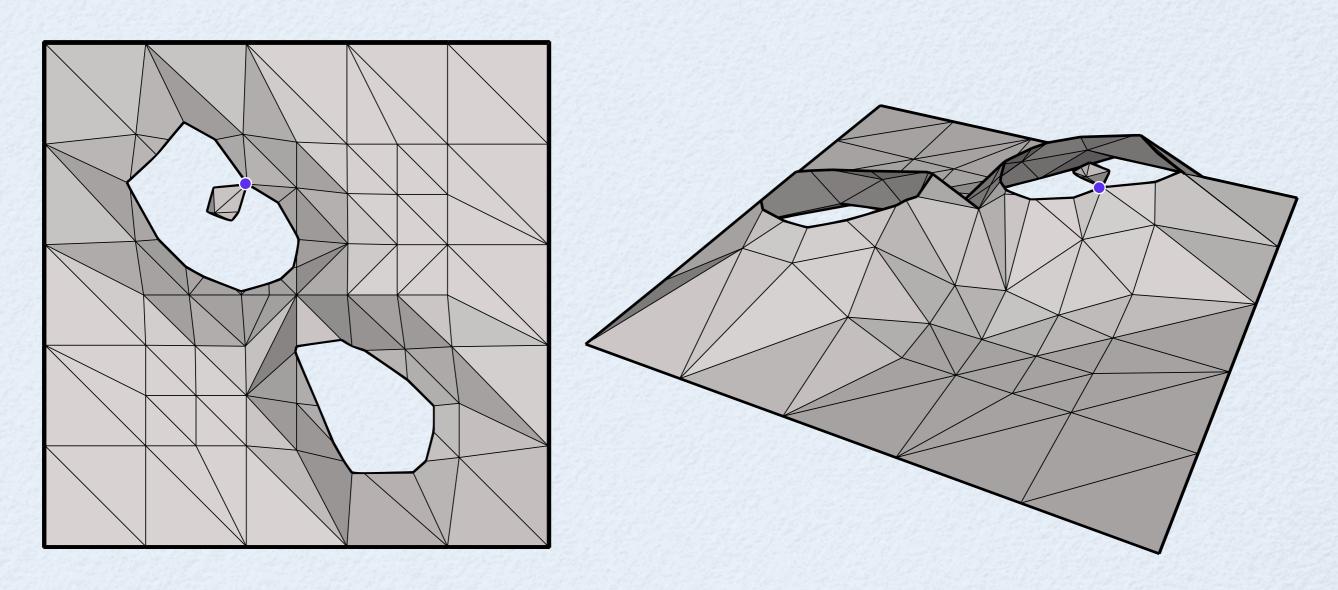
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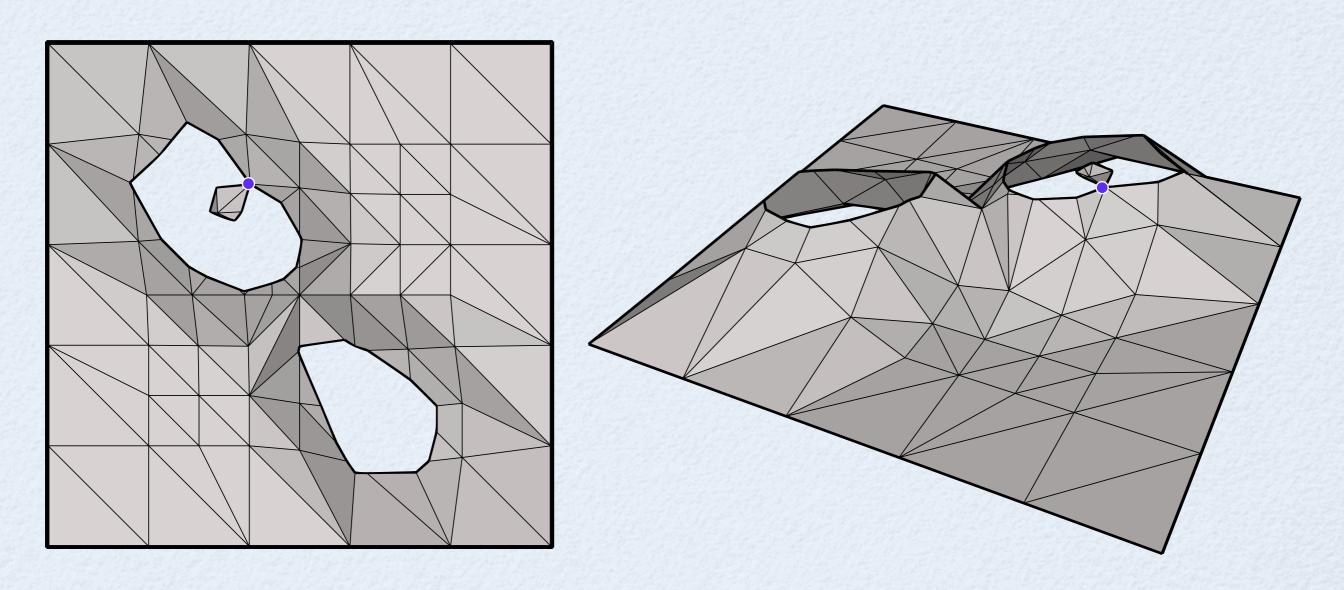


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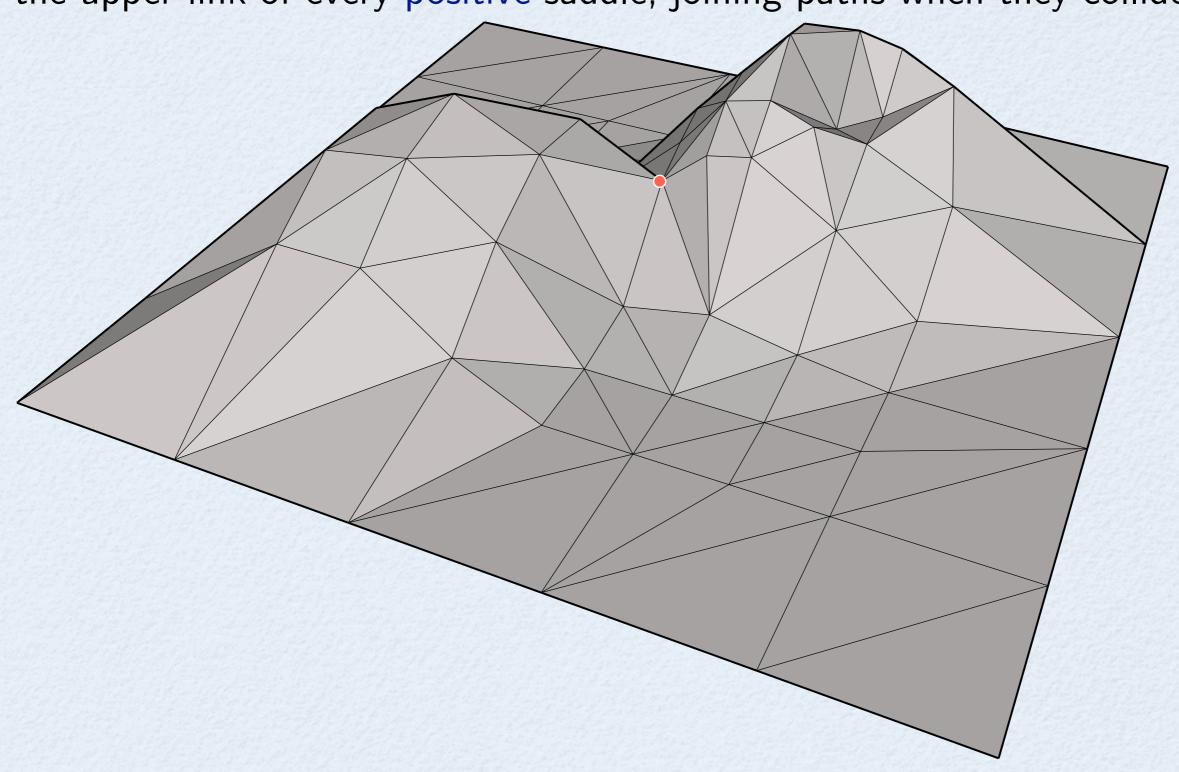
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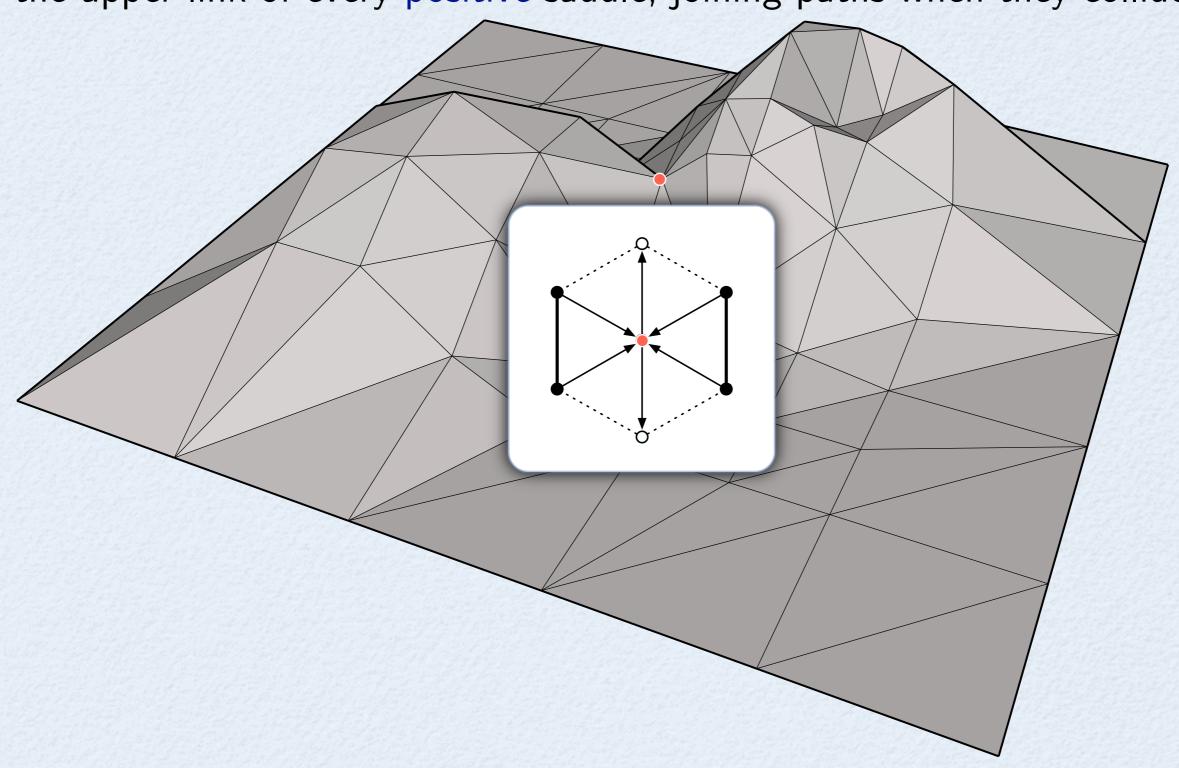
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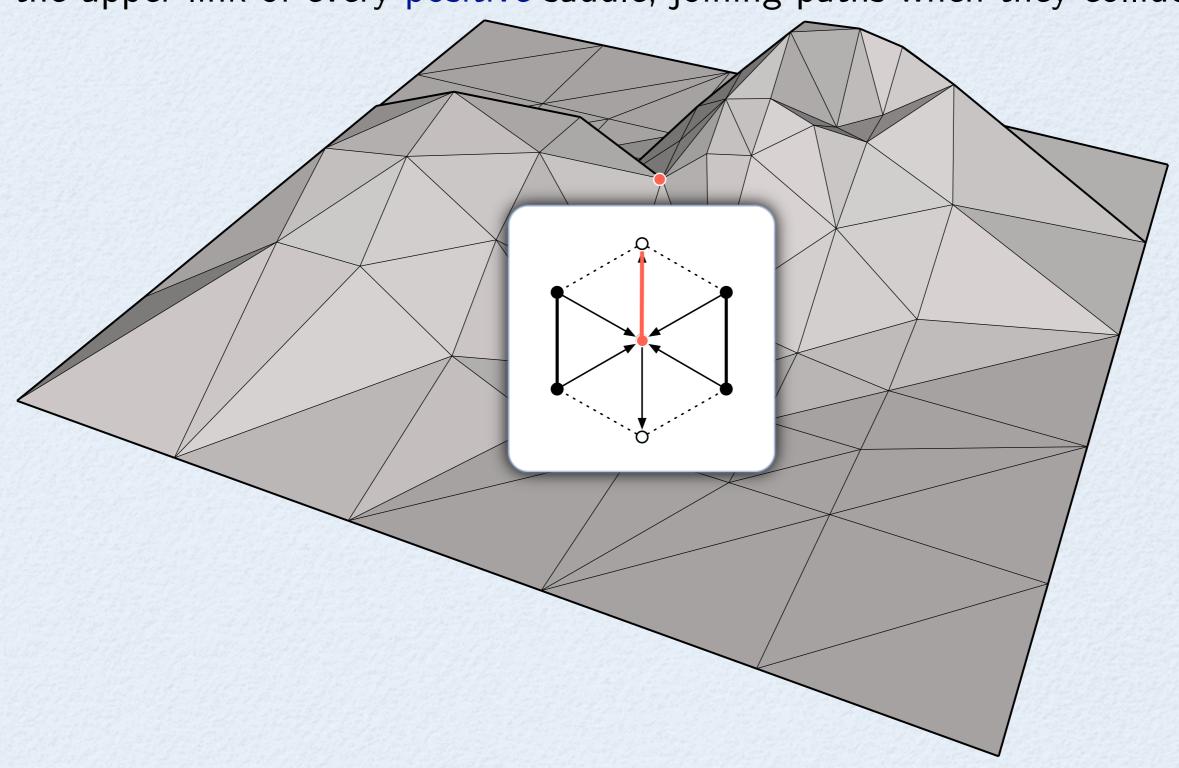


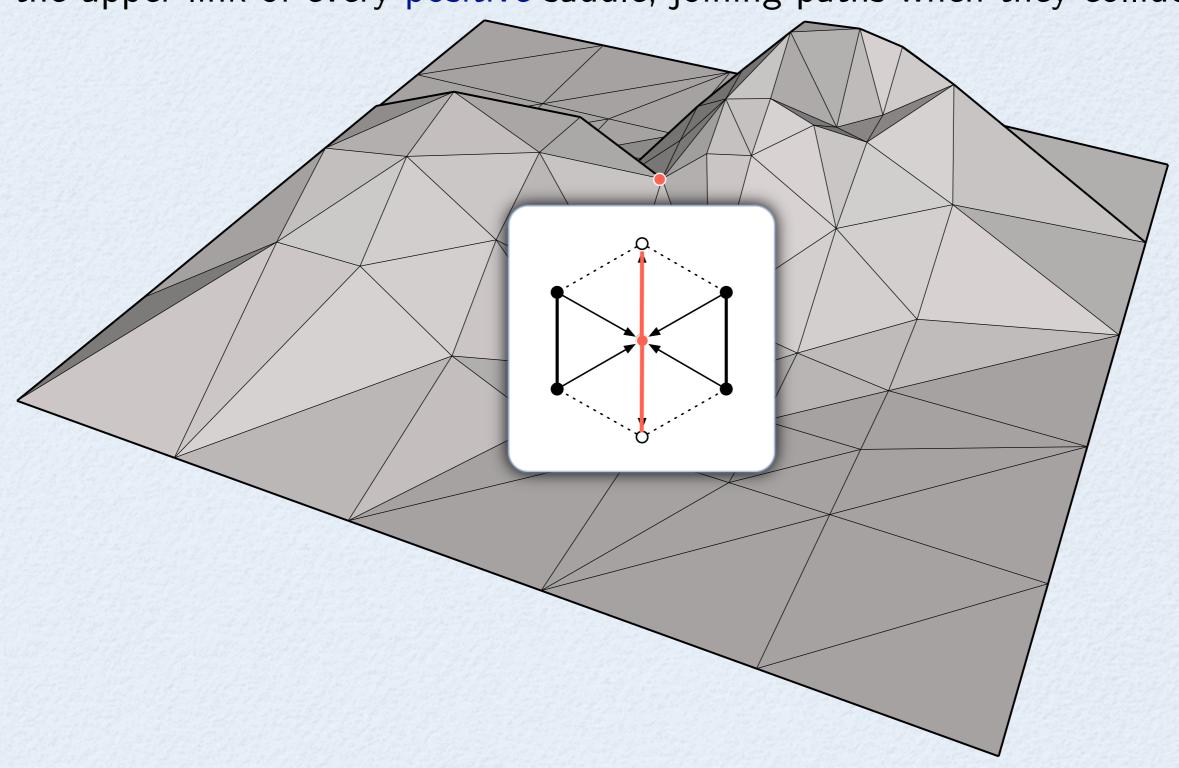
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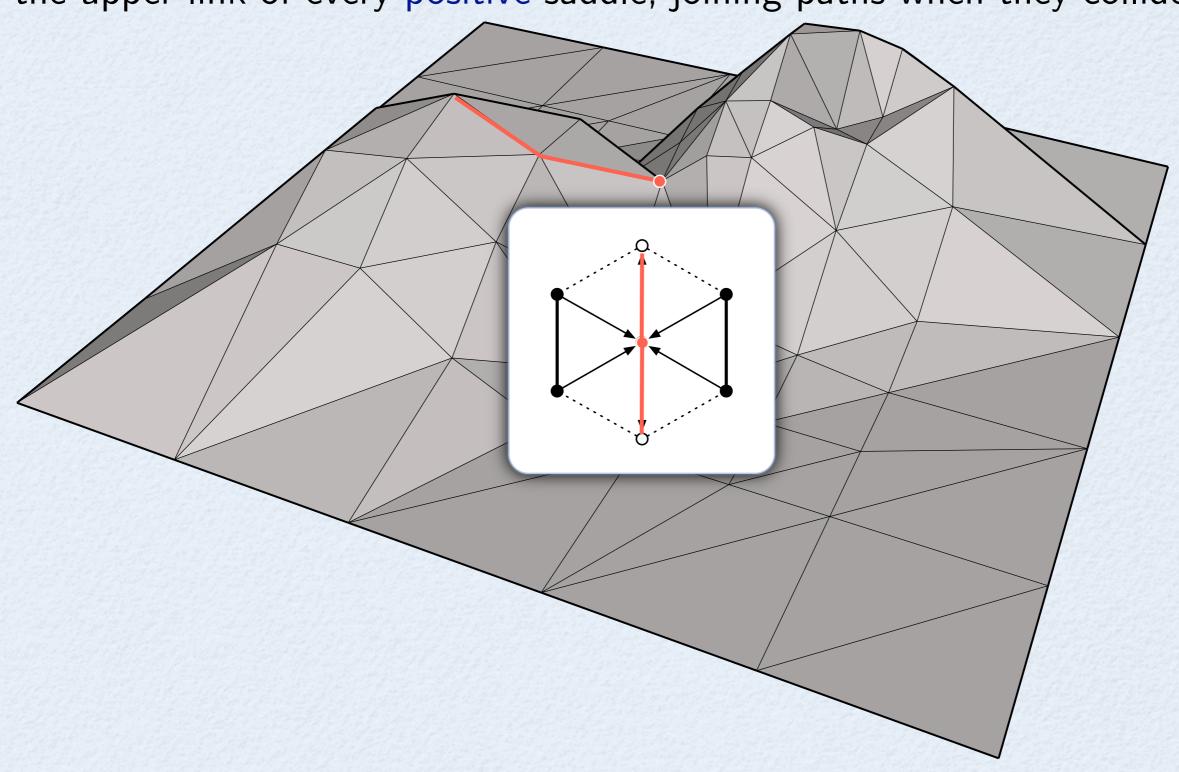
[Agarwal, Arge, Yi '06] Positive and negative saddle points can be found in  $O(\operatorname{Sort}(N))$  I/Os.

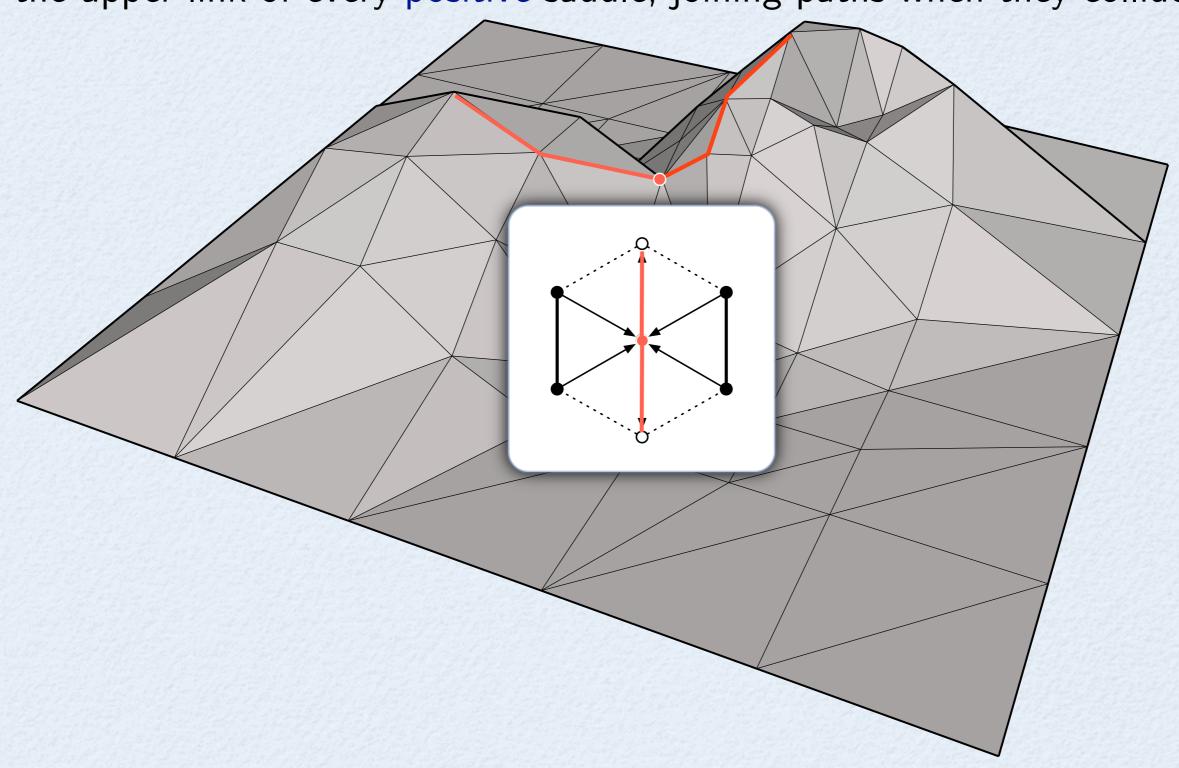




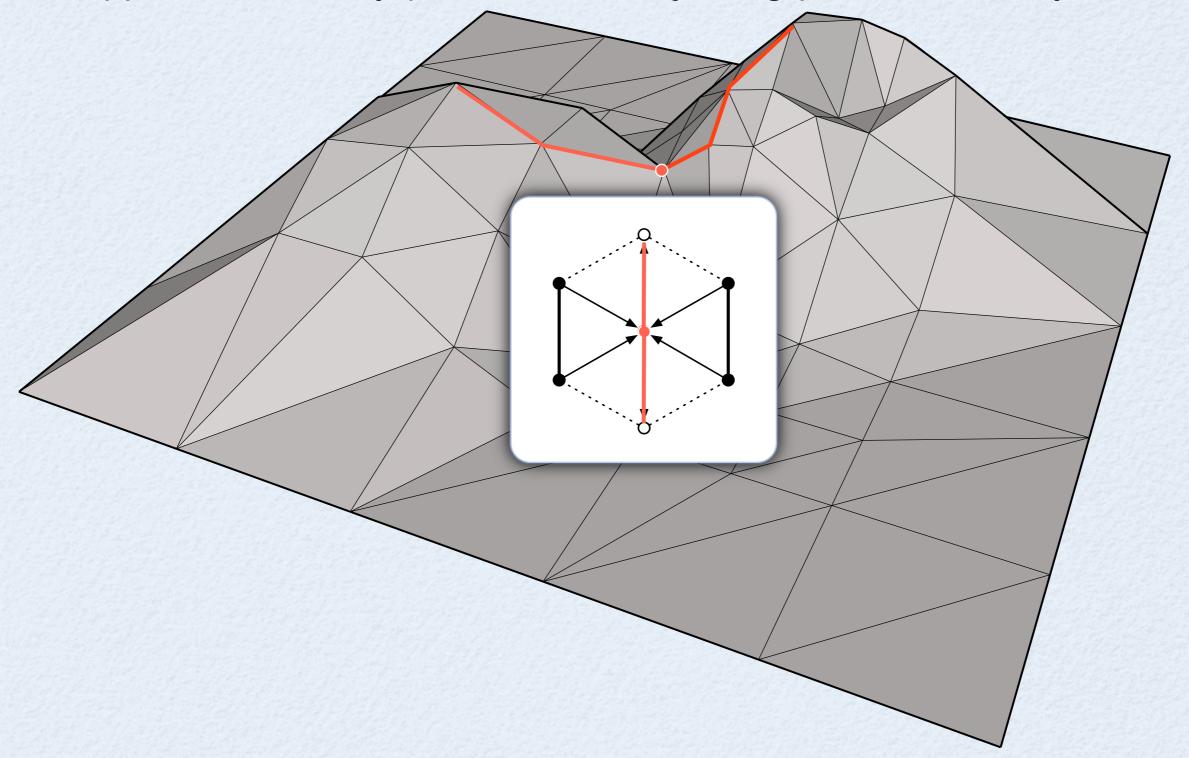




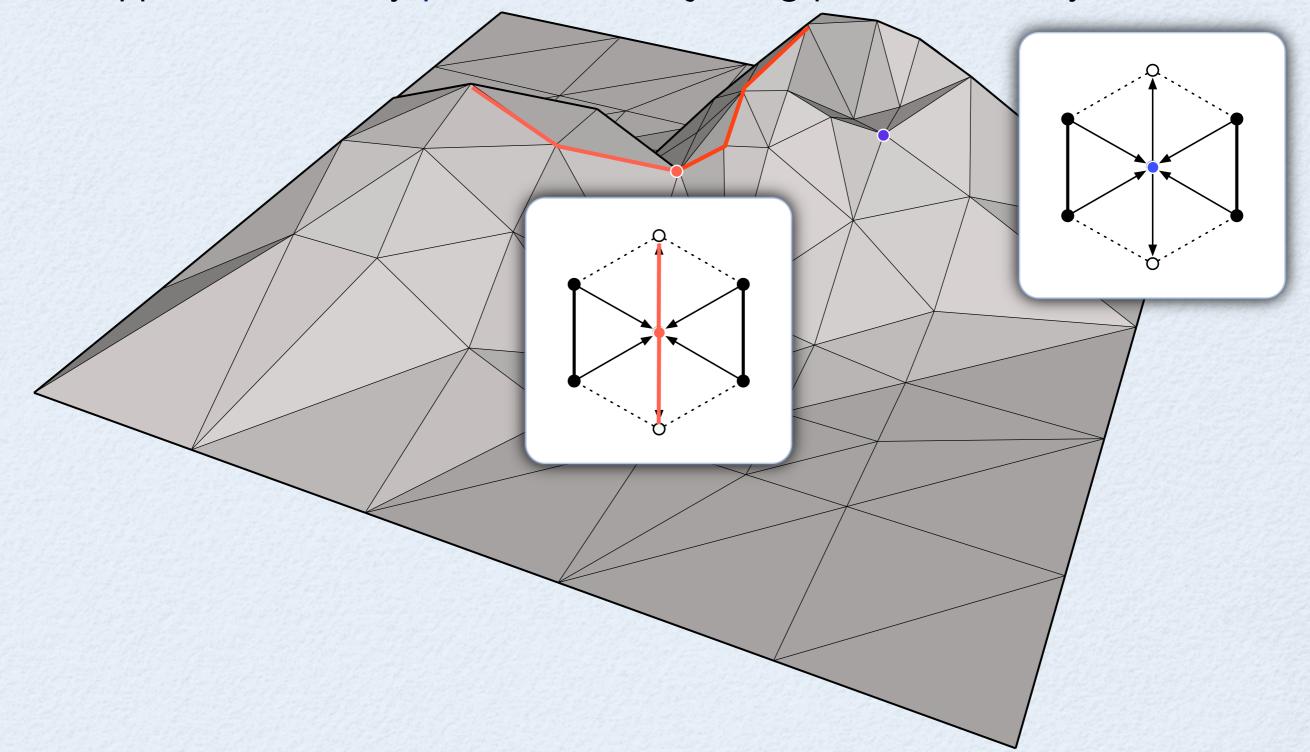




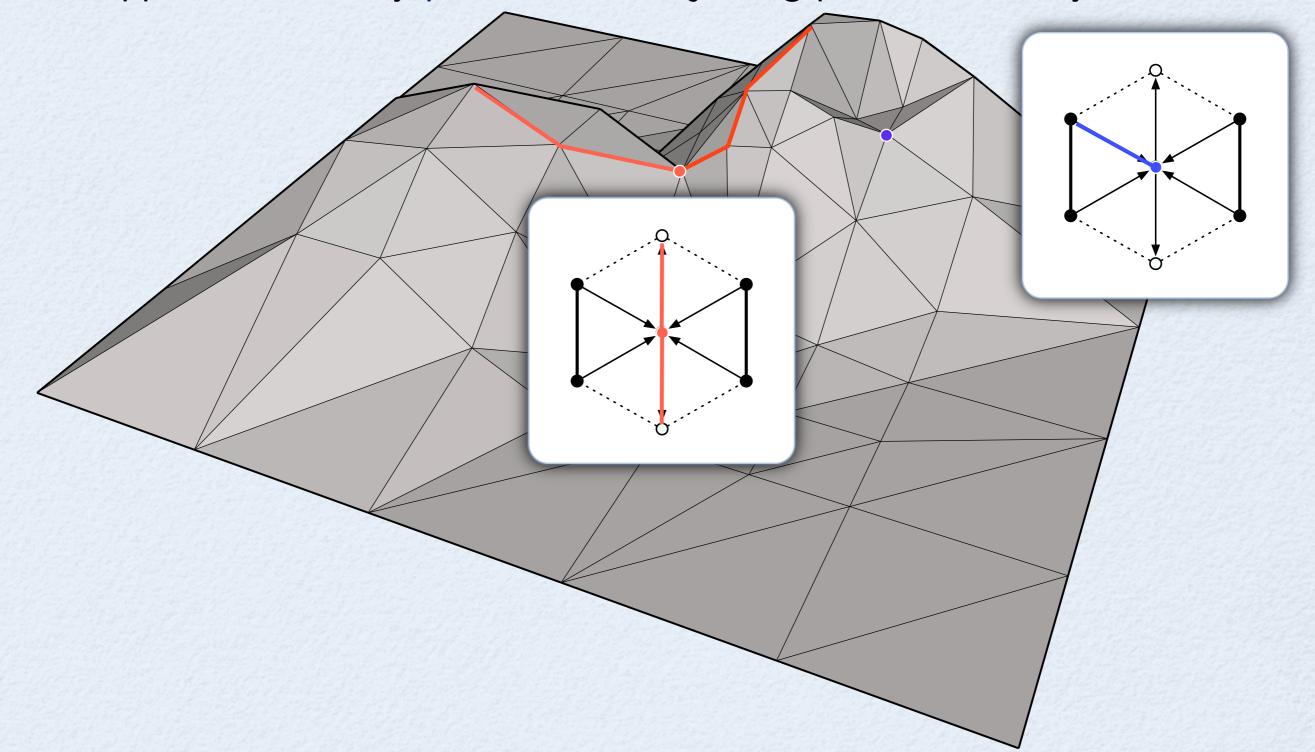
Positive Cut-Tree: follow an ascending path in every connected component of the upper link of every positive saddle, joining paths when they collide.



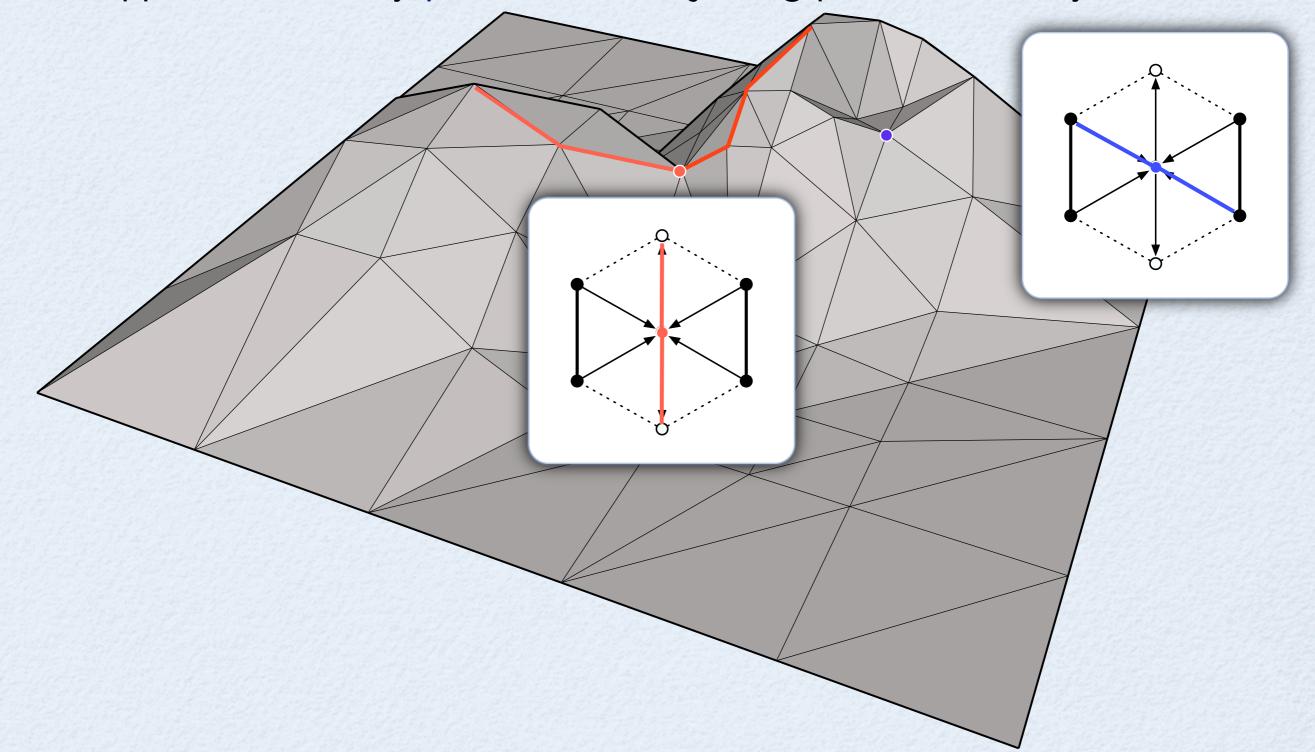
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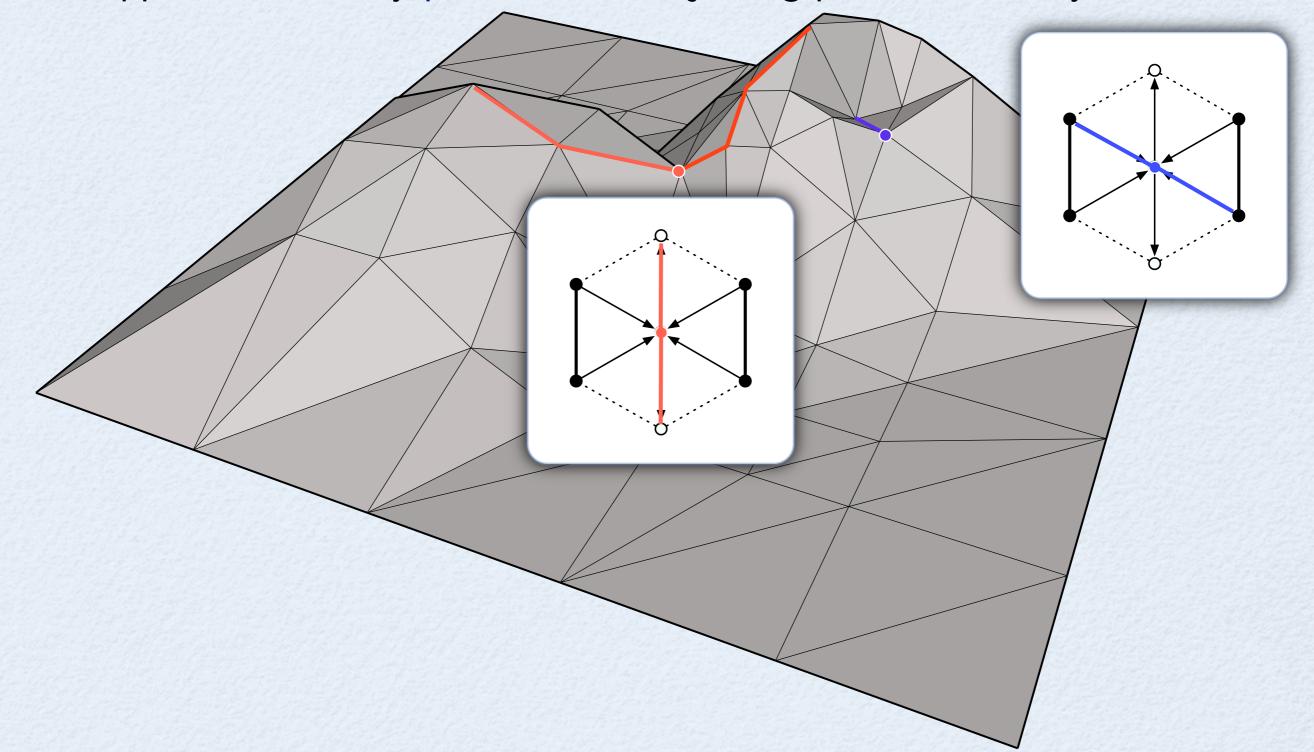
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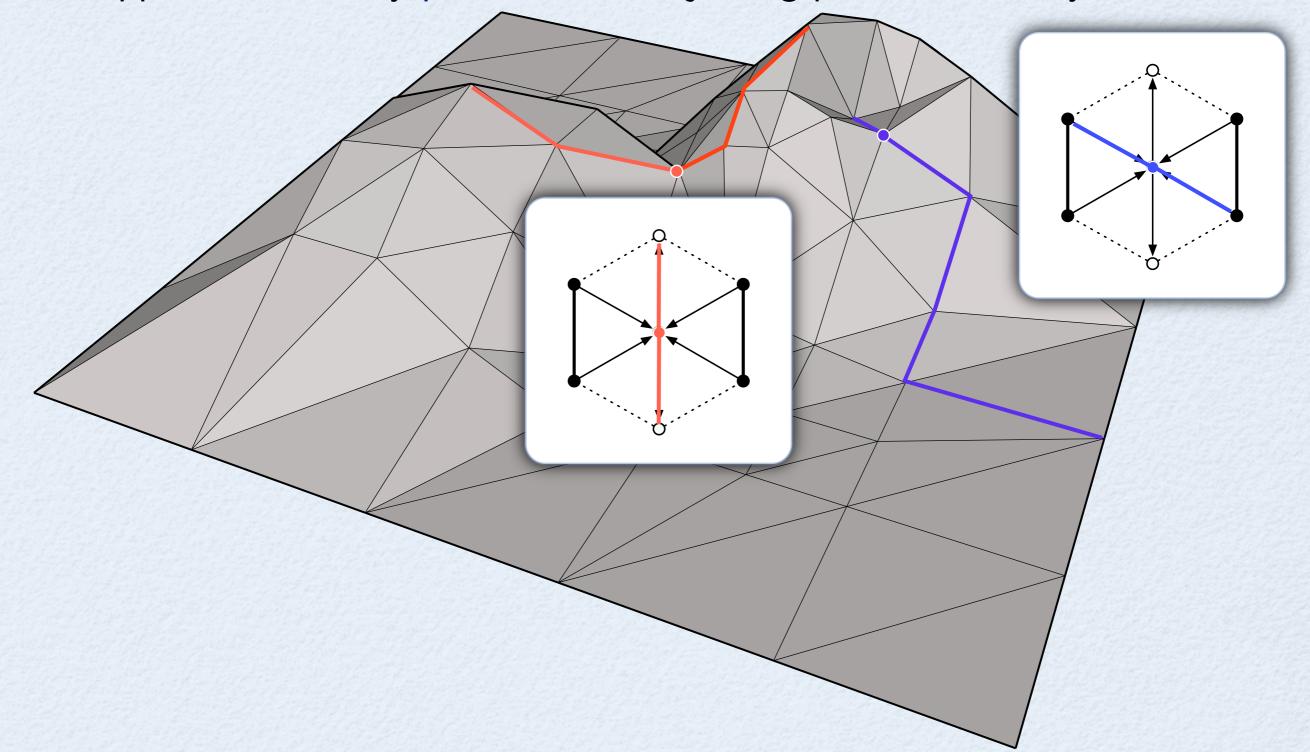
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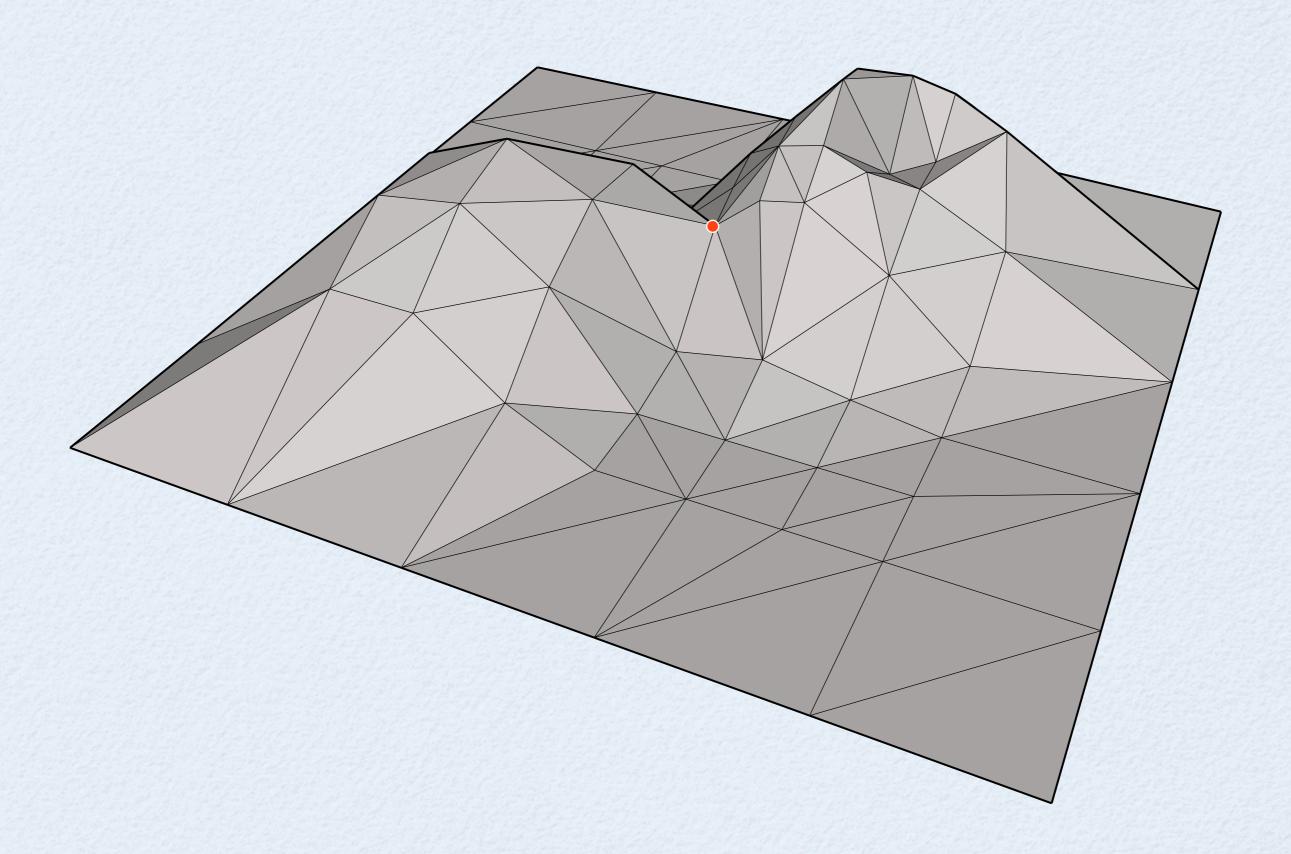
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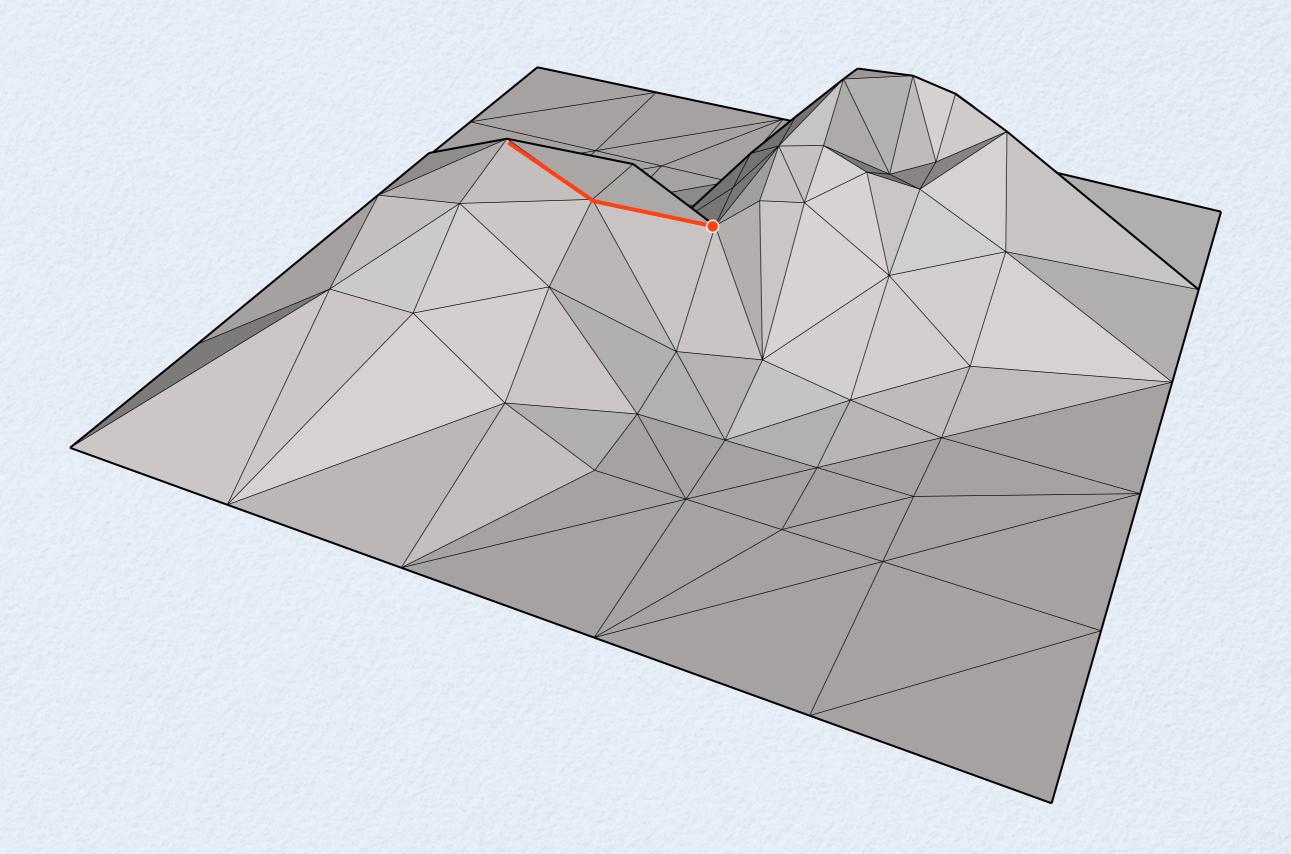
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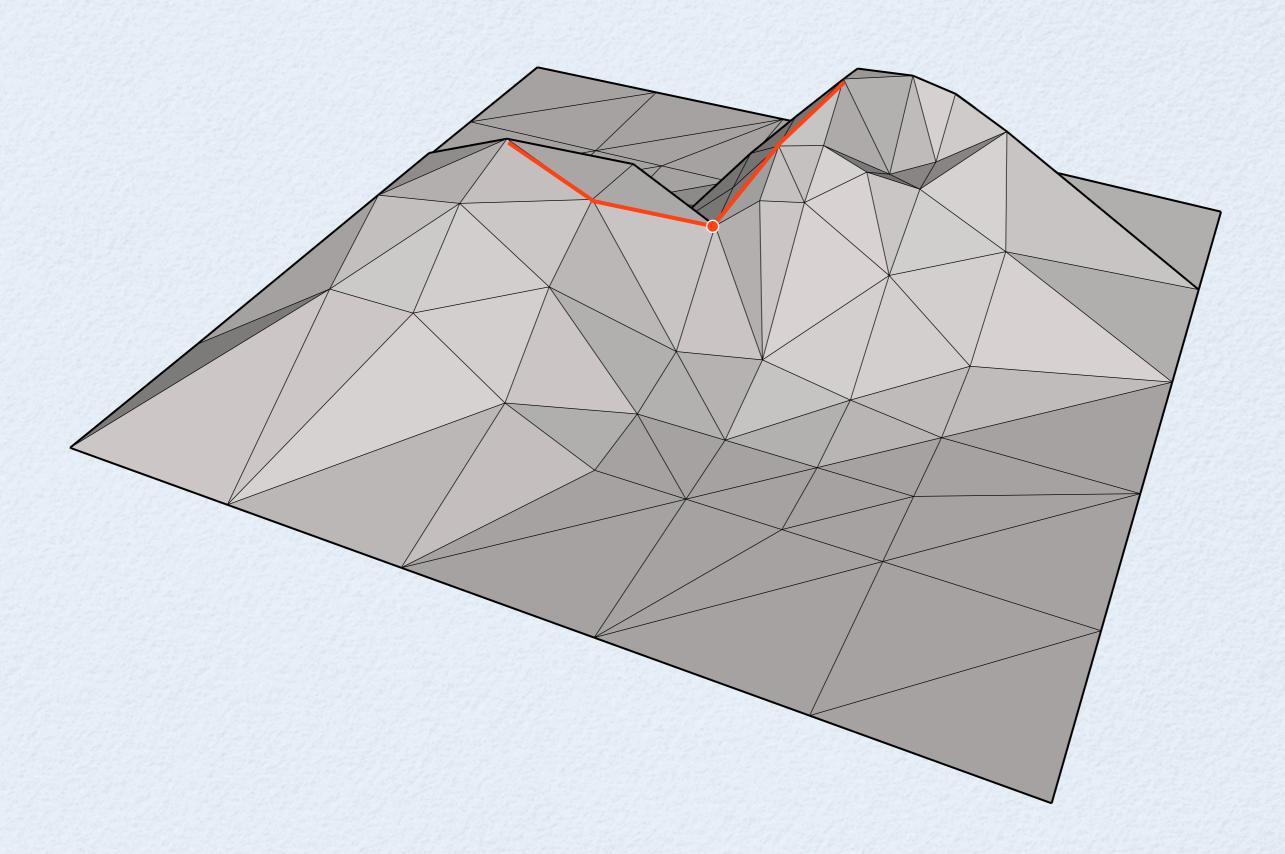


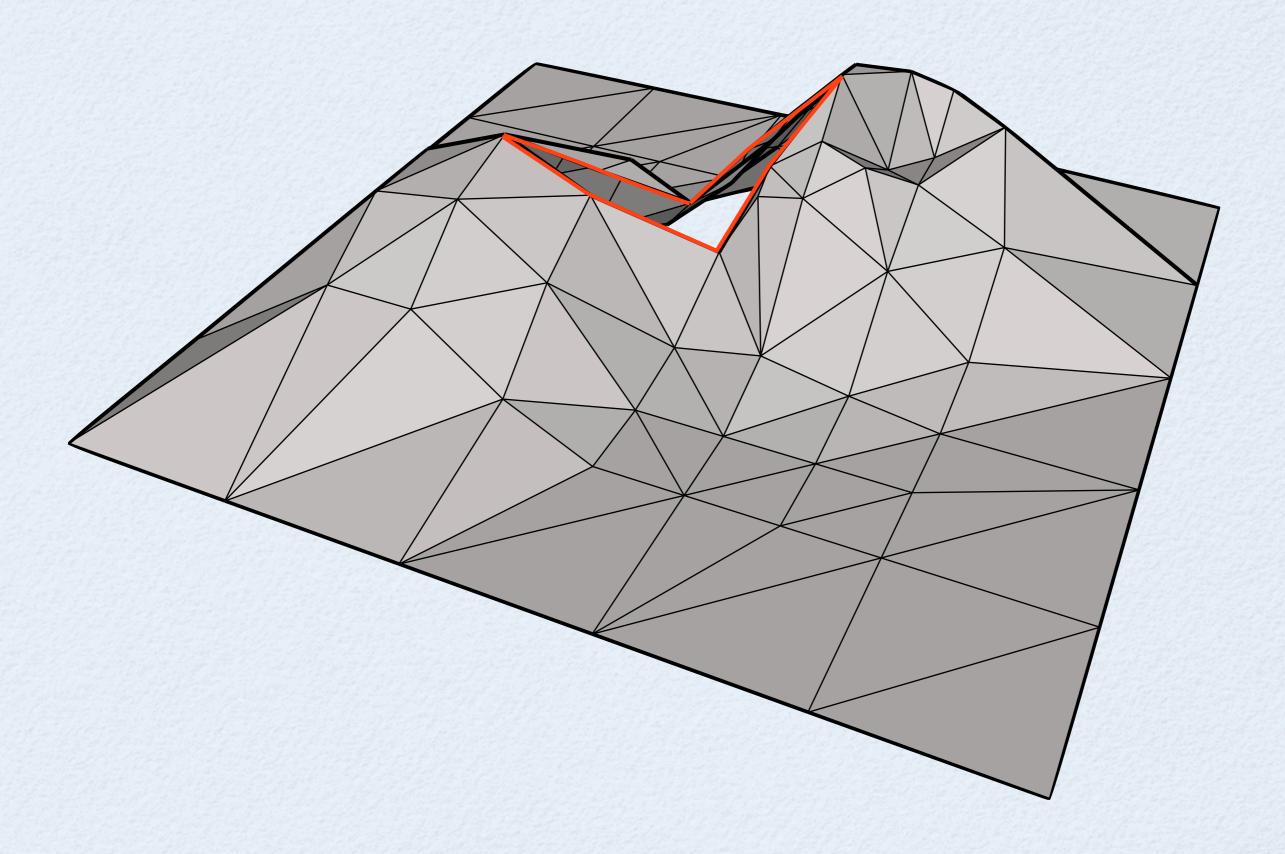
### Turning a terrain into an elementary one by surgery

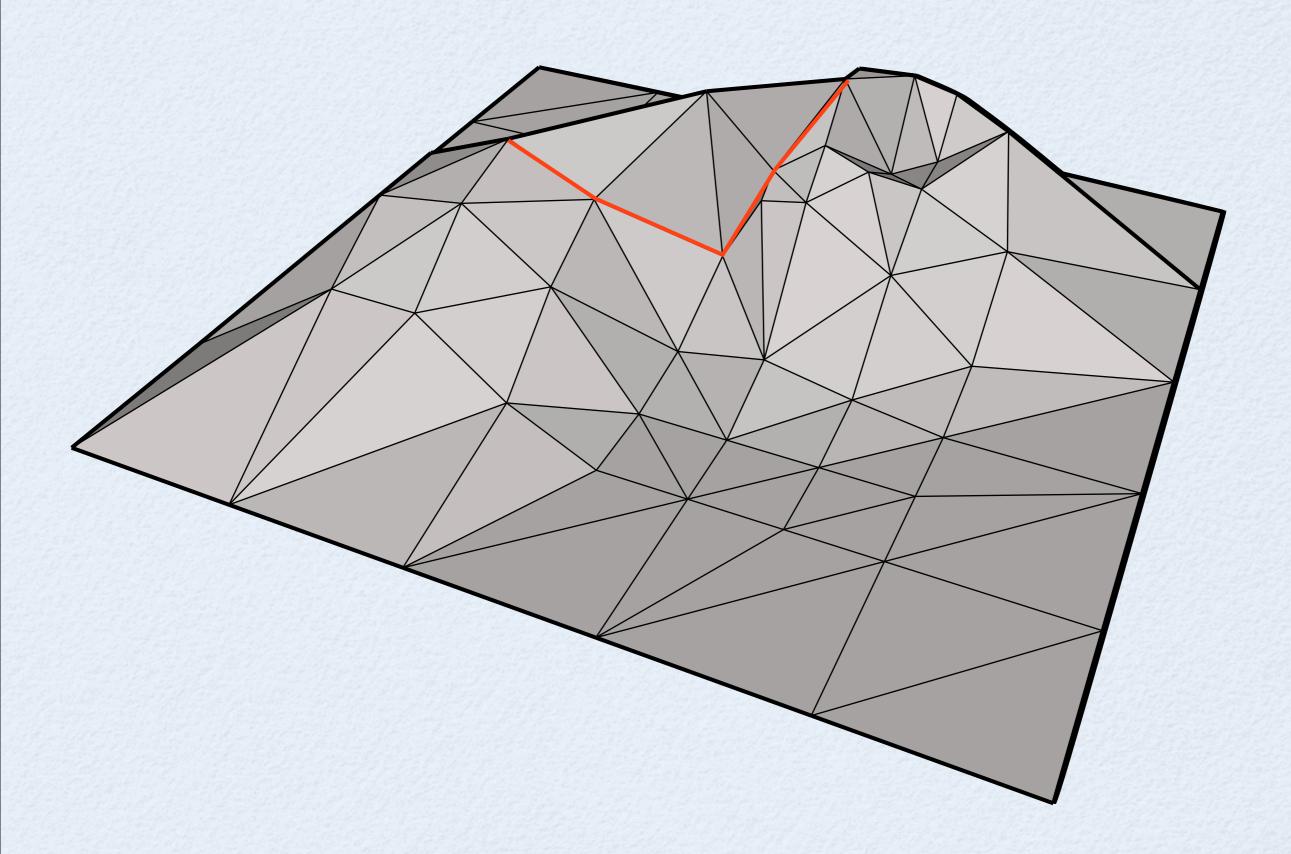


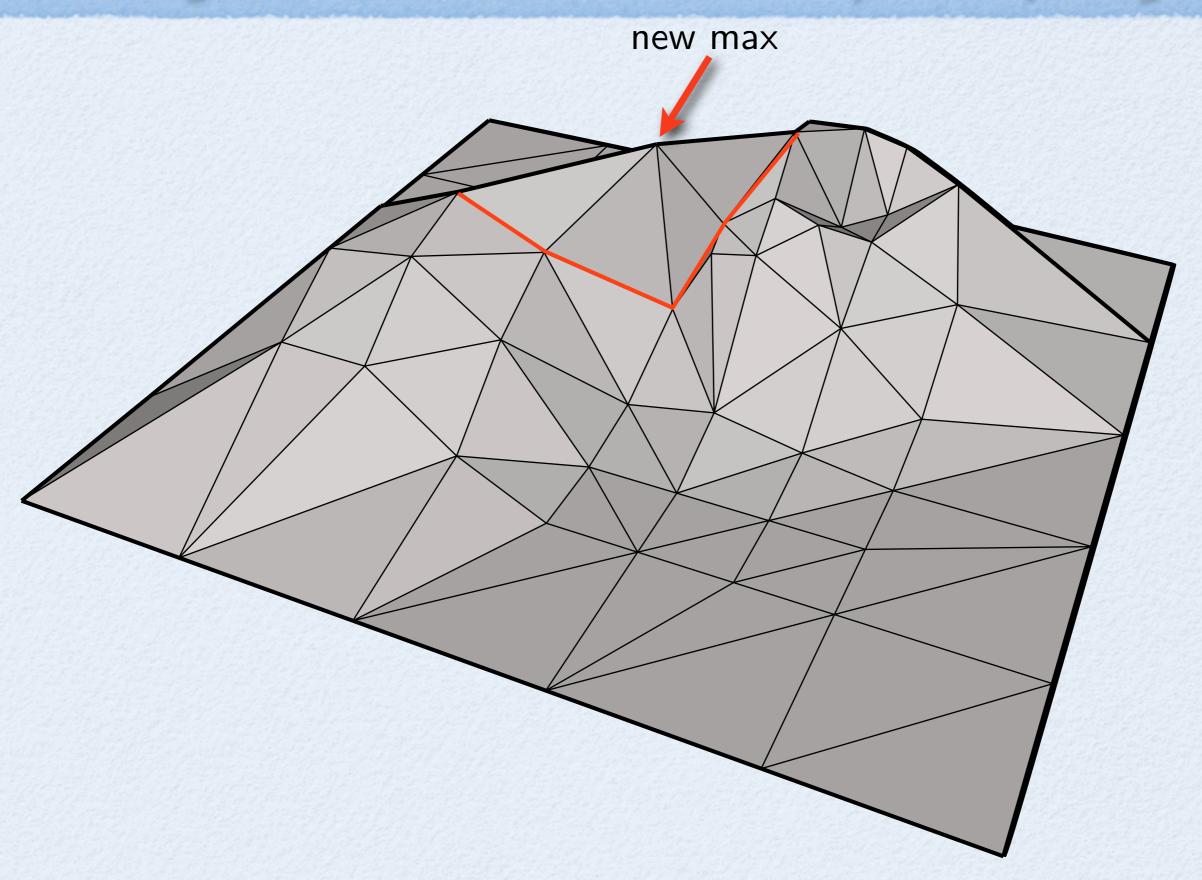
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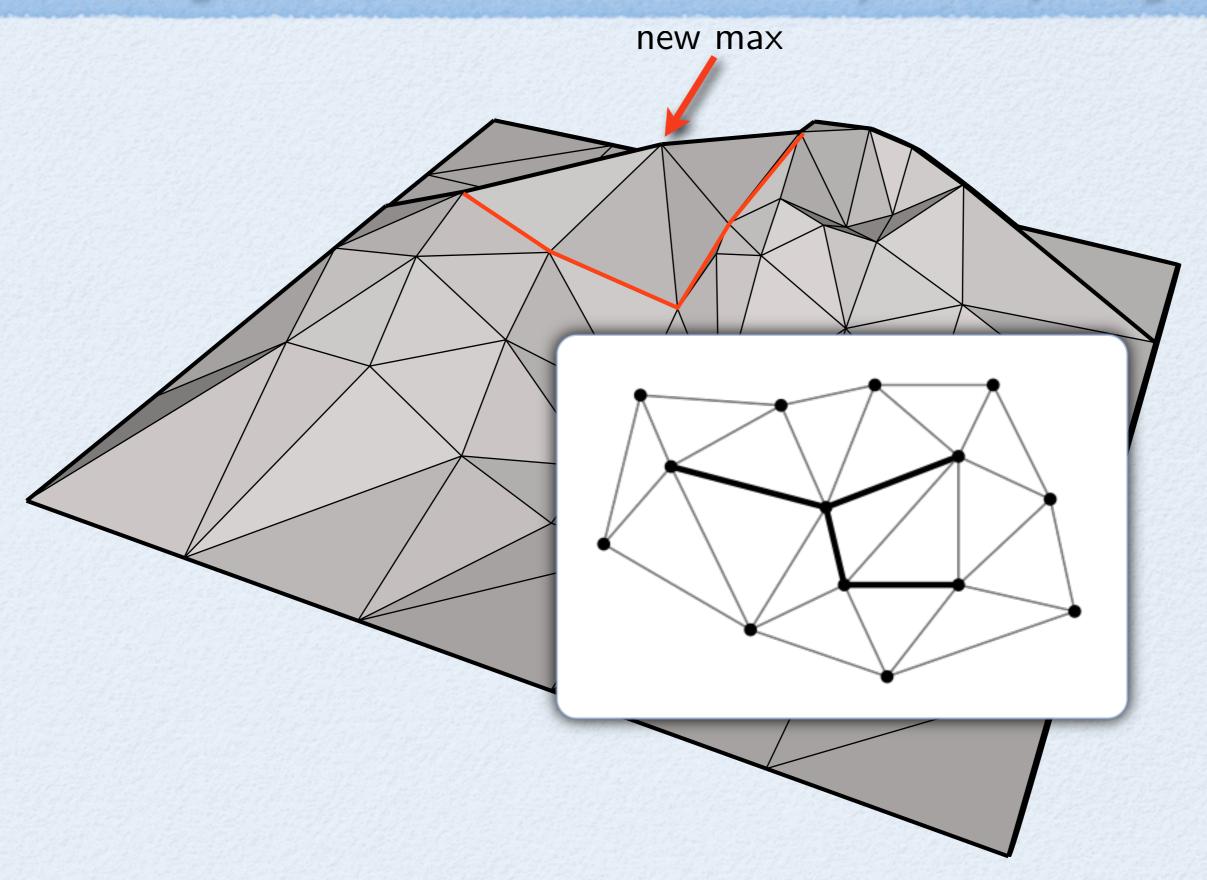


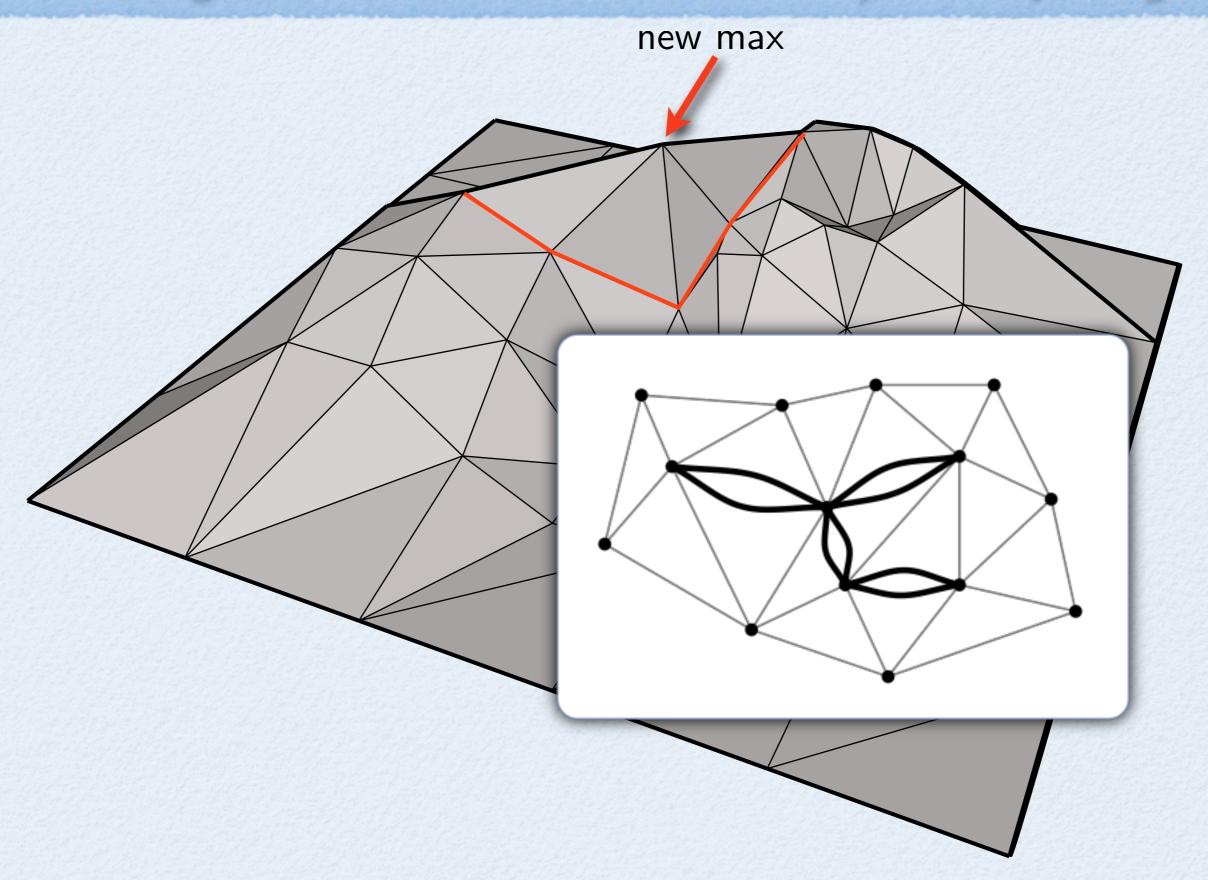


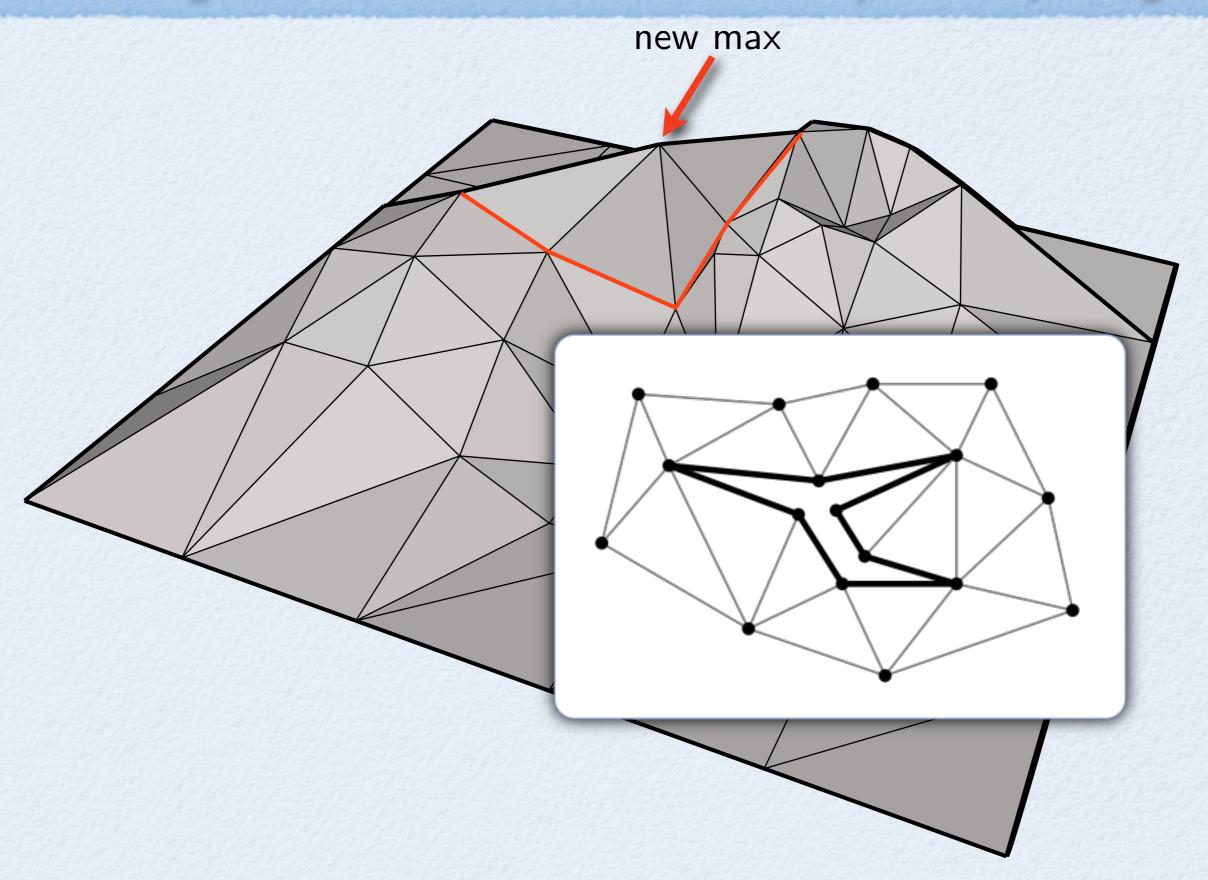


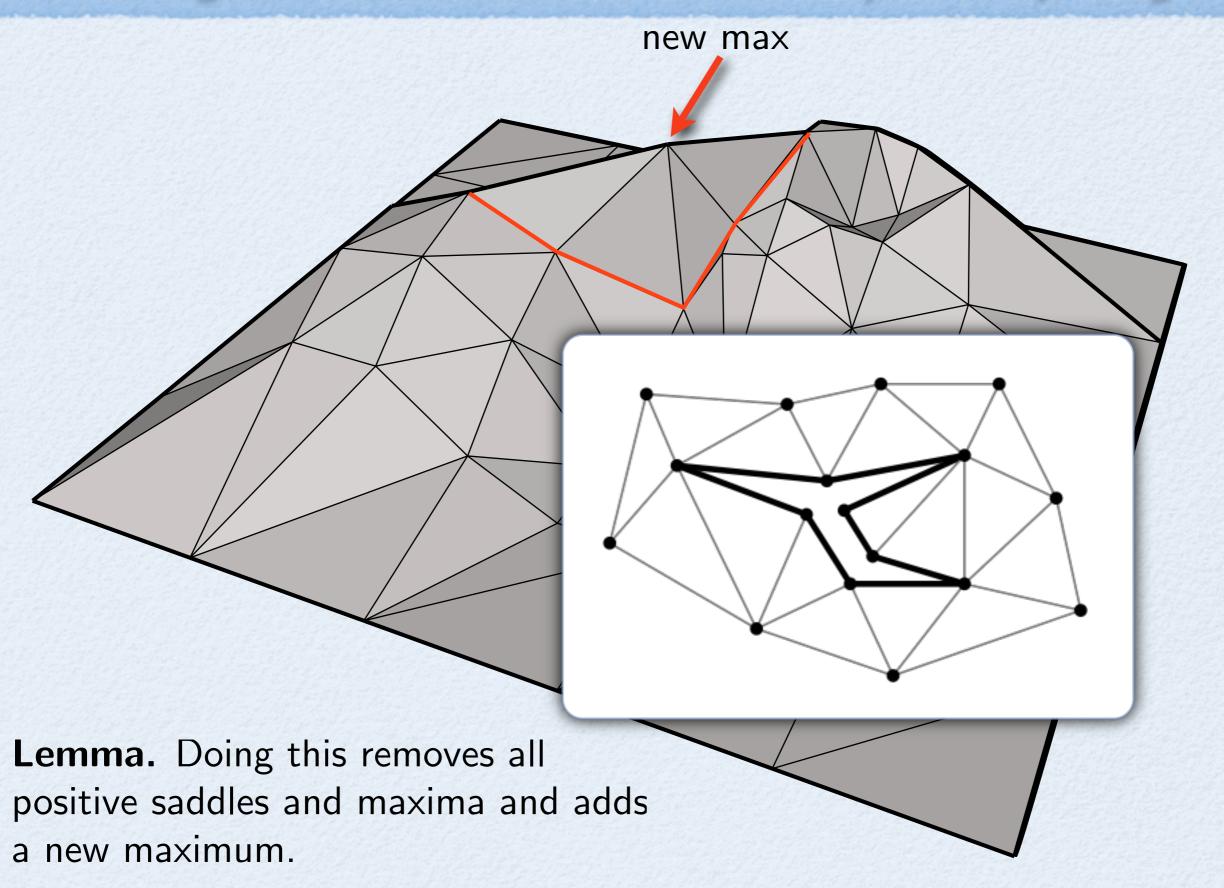




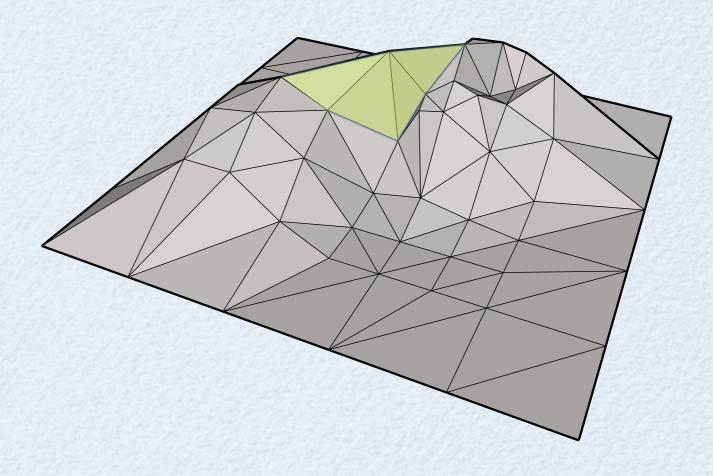






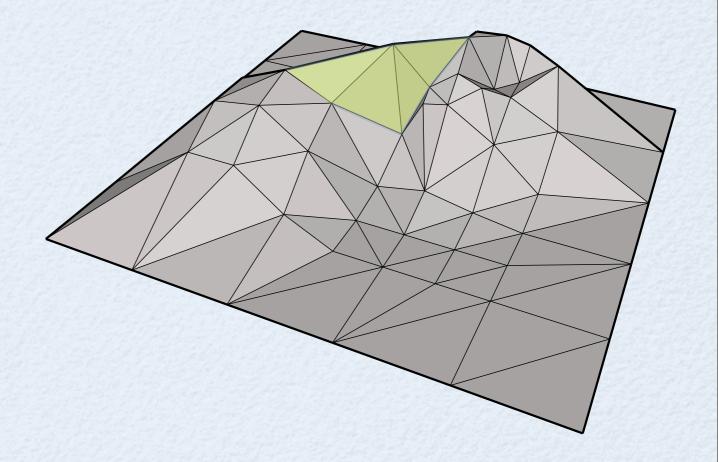


The elementary terrain  $\mathbb{M}'$  has all the triangles of  $\mathbb{M}$  plus some of "new" triangles.



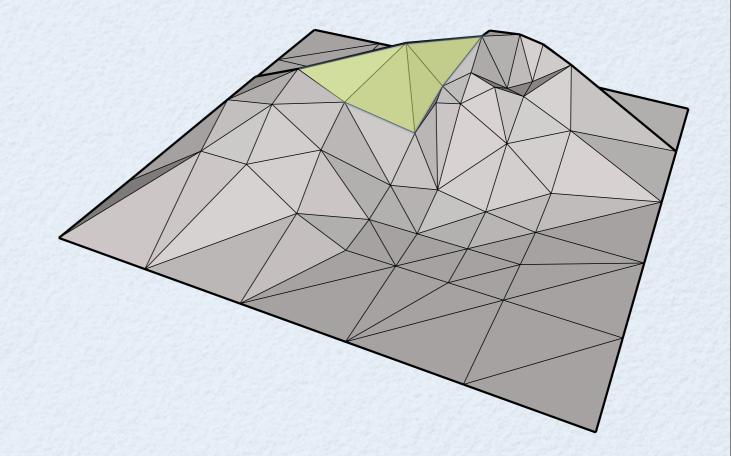
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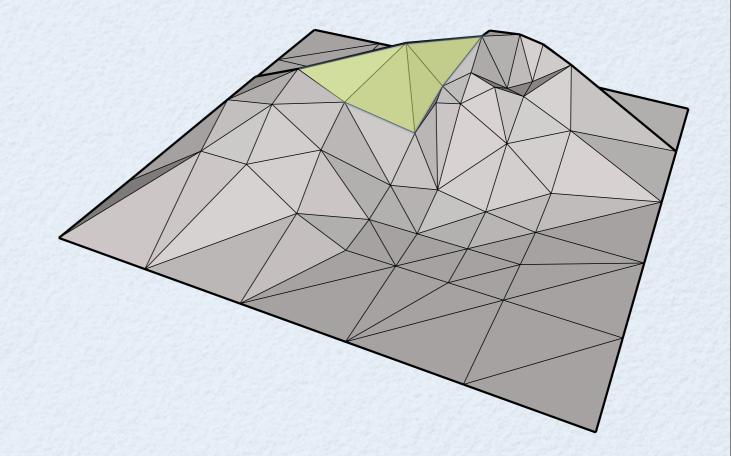


**Theorem.** In a contour of  $\mathbb{M}'$ , corresponding contours of  $\mathbb{M}$  are broken (by segments from new triangles) in a nested (parenthesized) manner.

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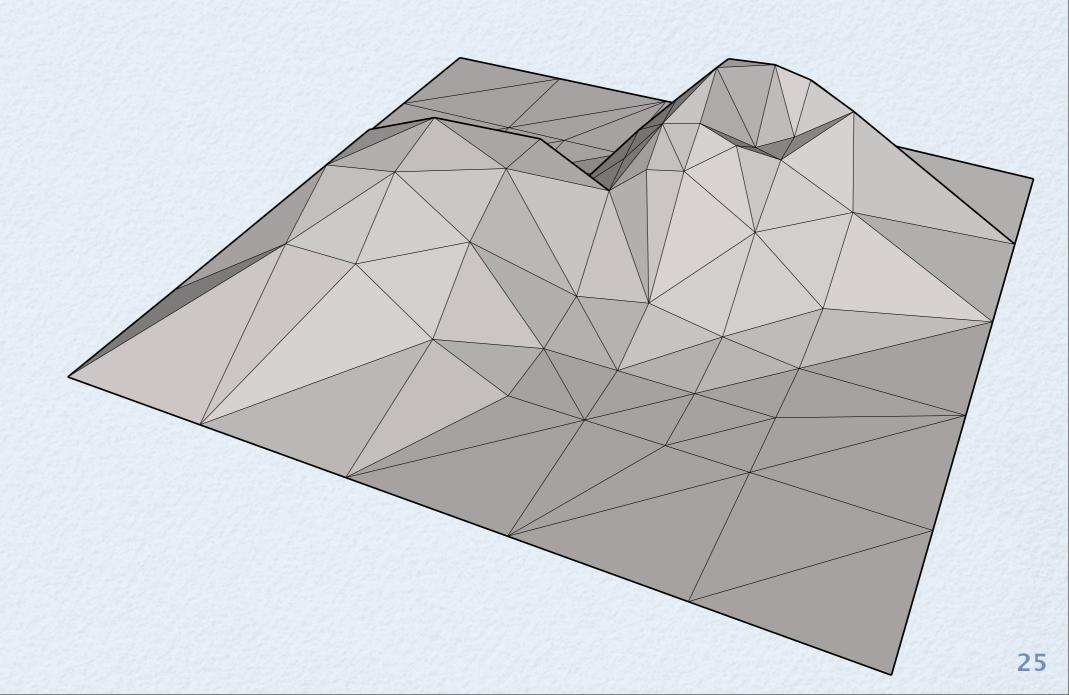
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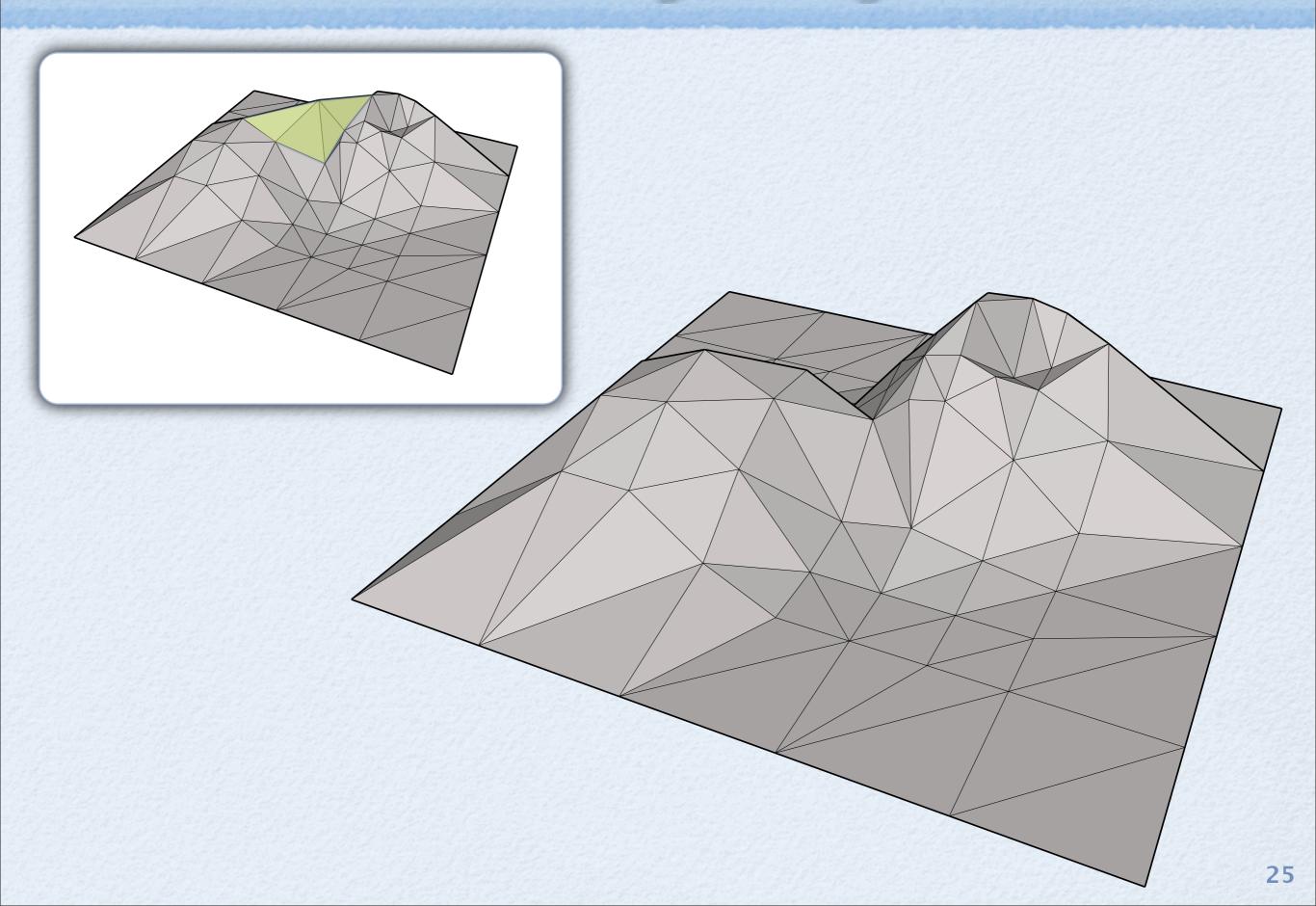
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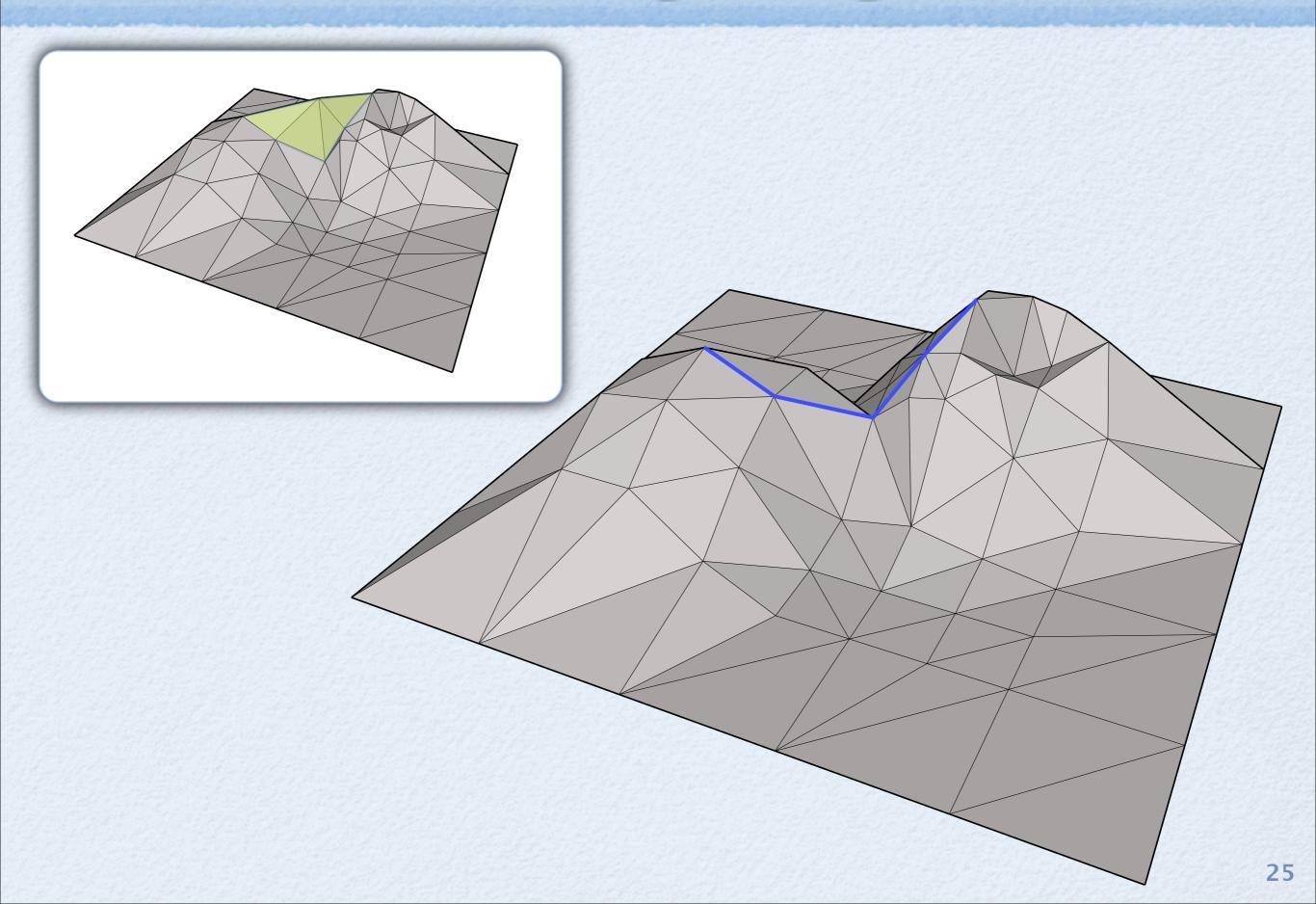


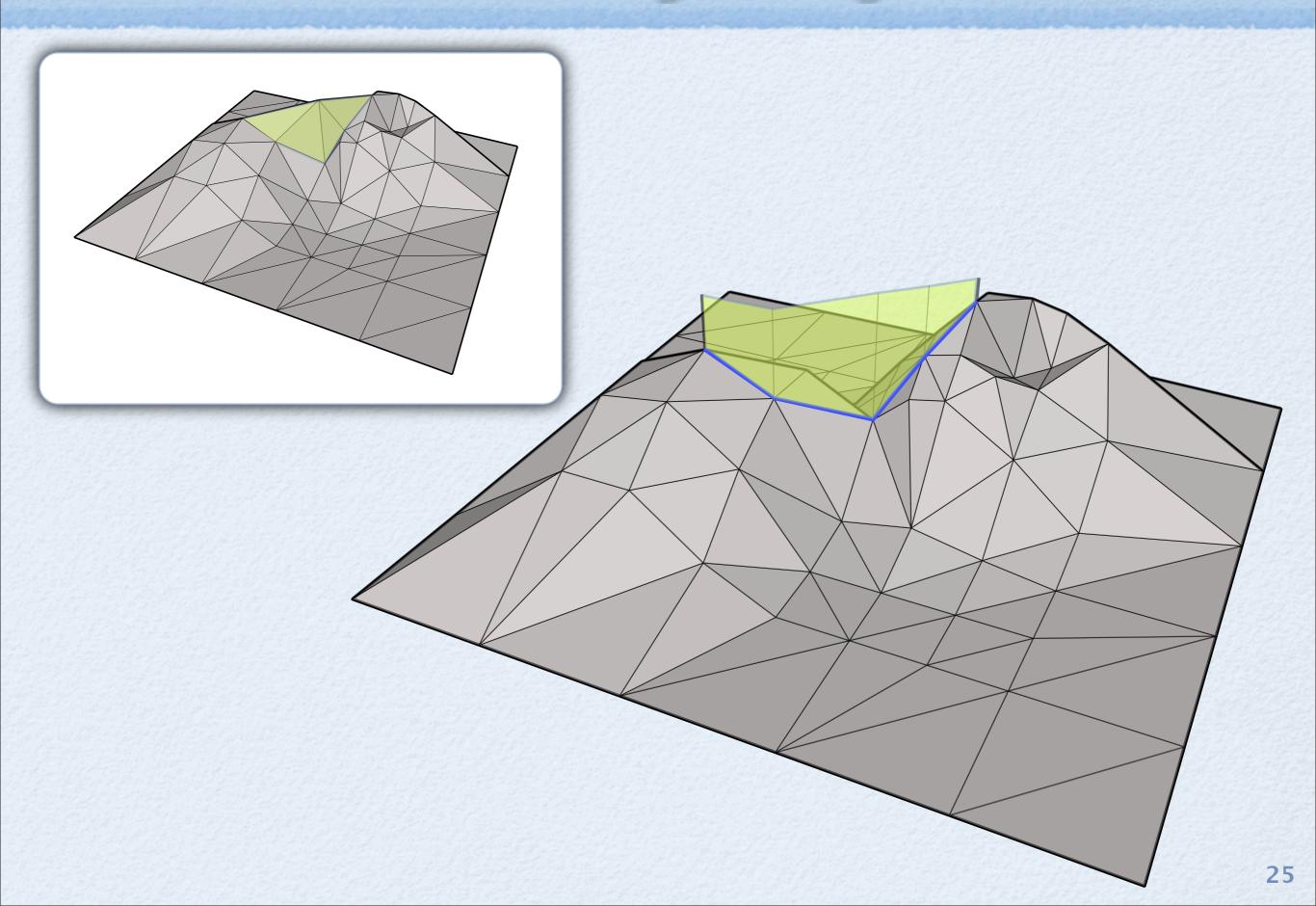
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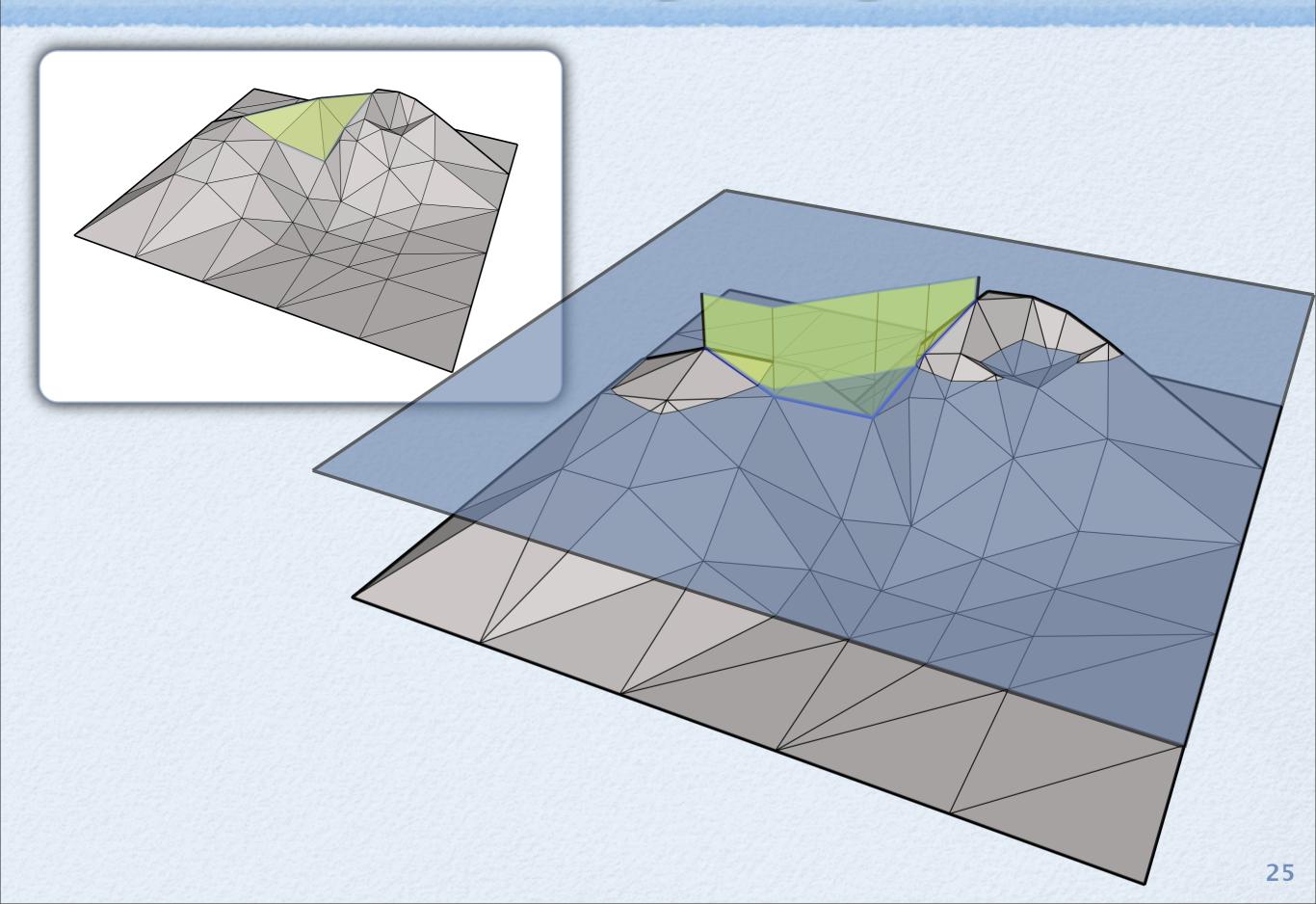
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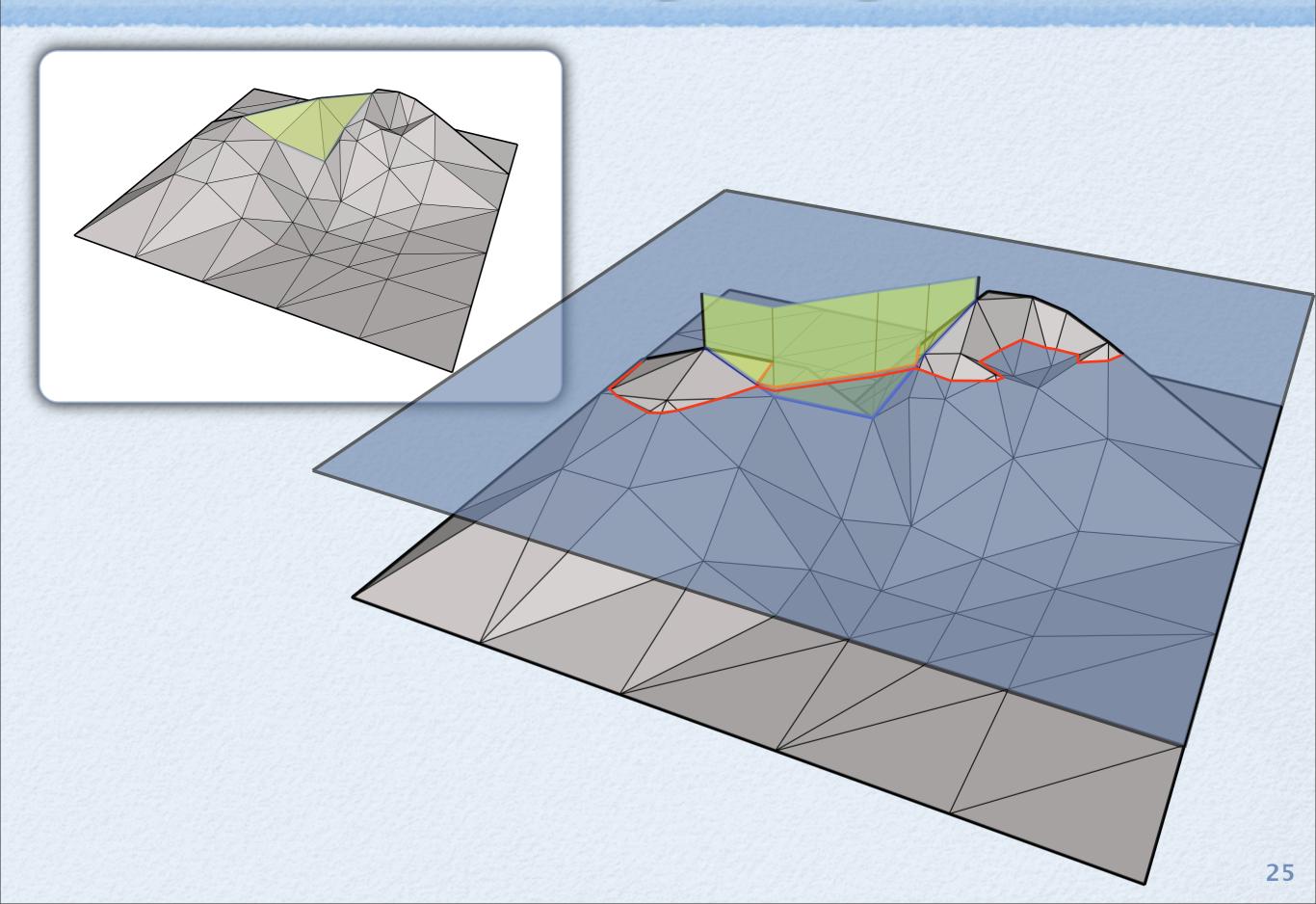




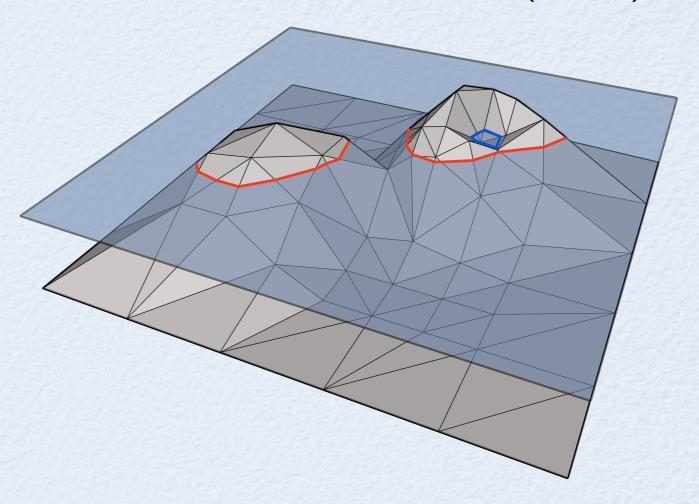




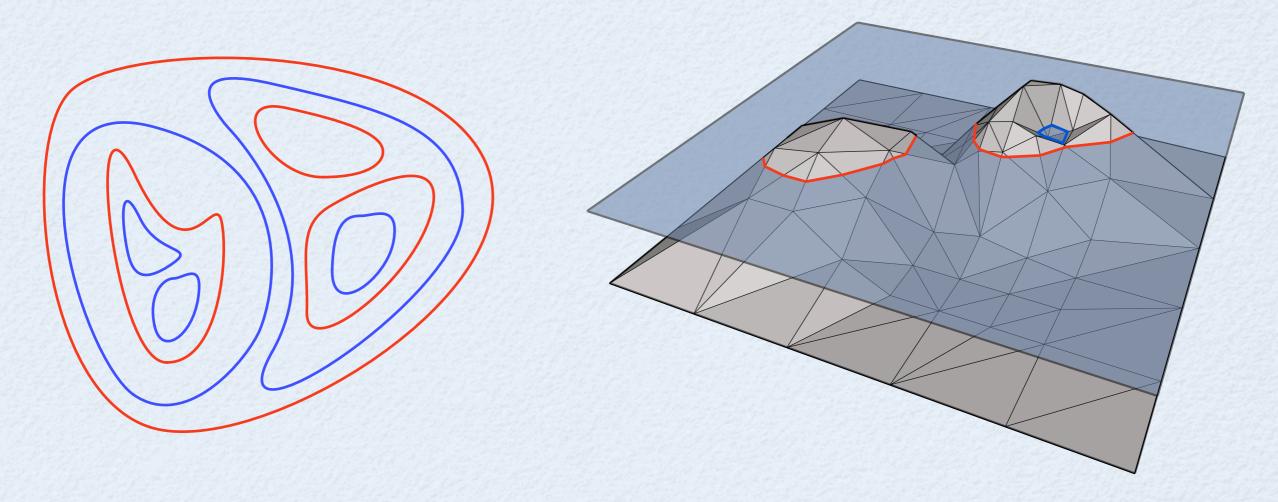




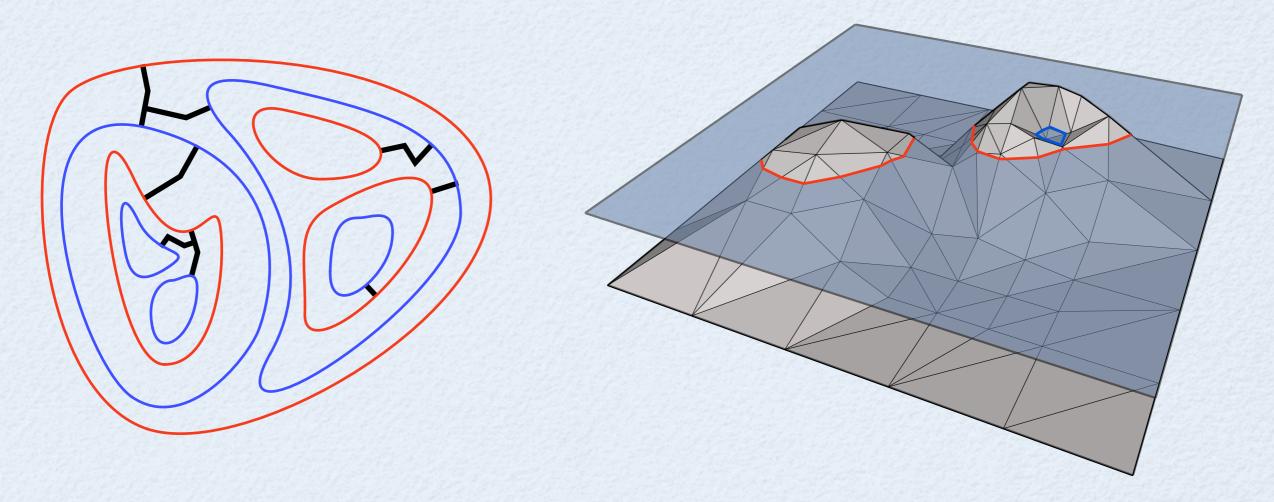
A contour is red (blue) if "locally" the sublevel set is in its outside (inside).



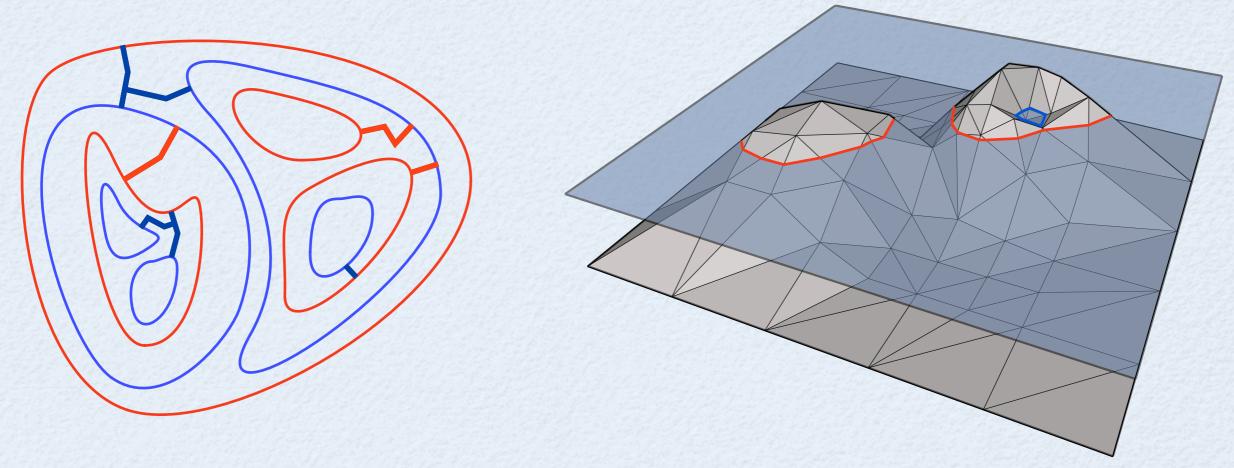
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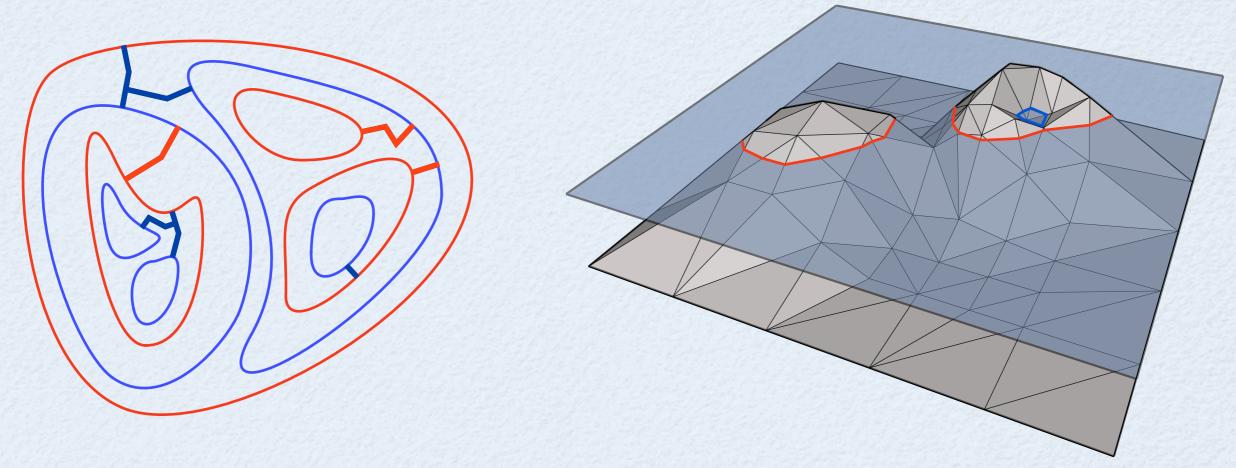


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**Theorem.** Only the red tree connects a blue contour and its red children.

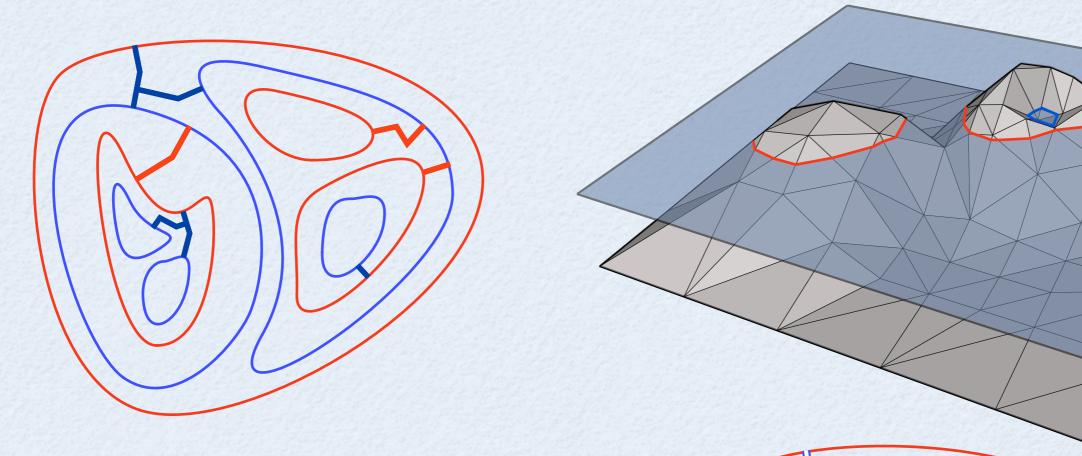
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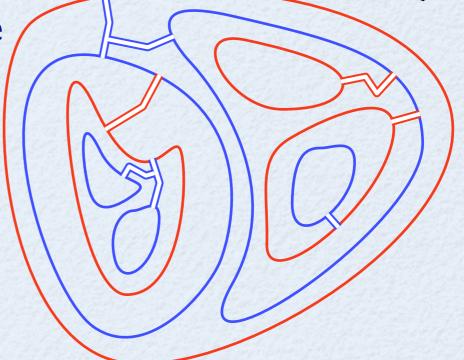
**Theorem.** If we contract each contour to a point, the result is a tree.

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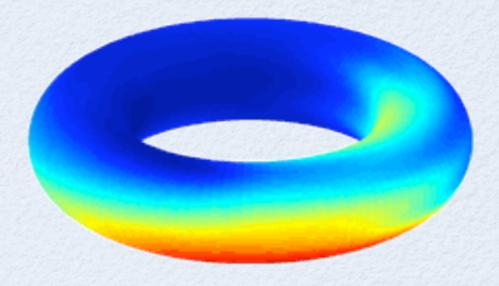
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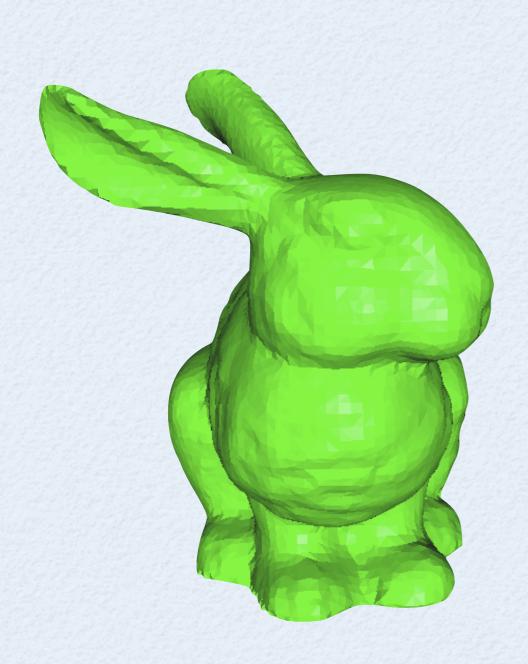
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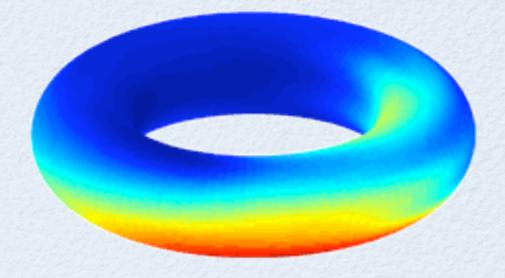
What about surfaces of genus  $\geq 1$ ? (Orientable or not)



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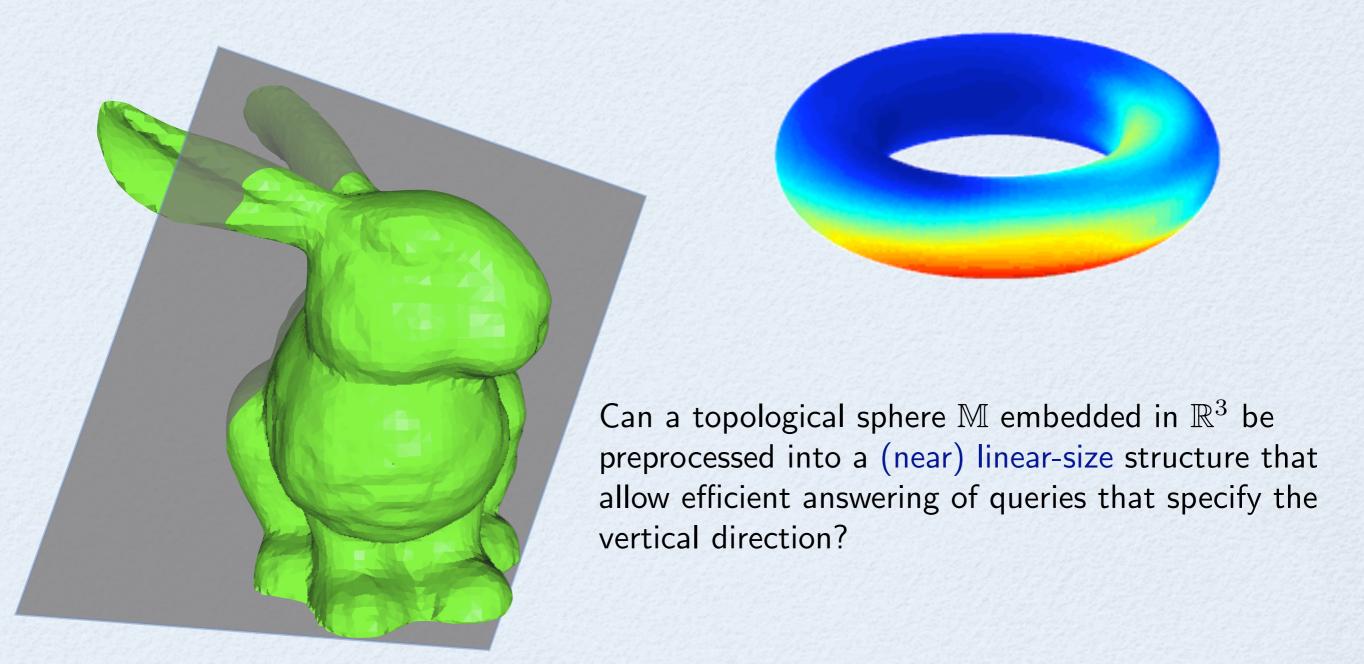




Can a topological sphere  $\mathbb{M}$  embedded in  $\mathbb{R}^3$  be preprocessed into a (near) linear-size structure that allow efficient answering of queries that specify the vertical direction?

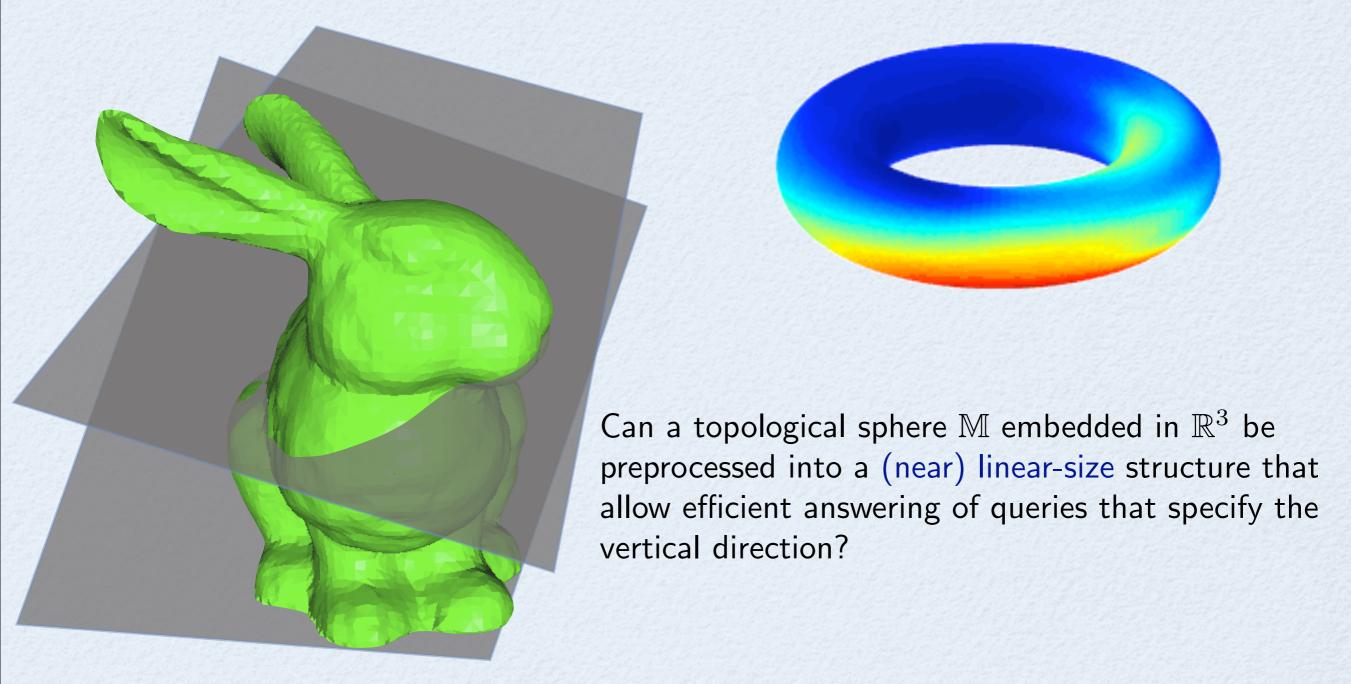
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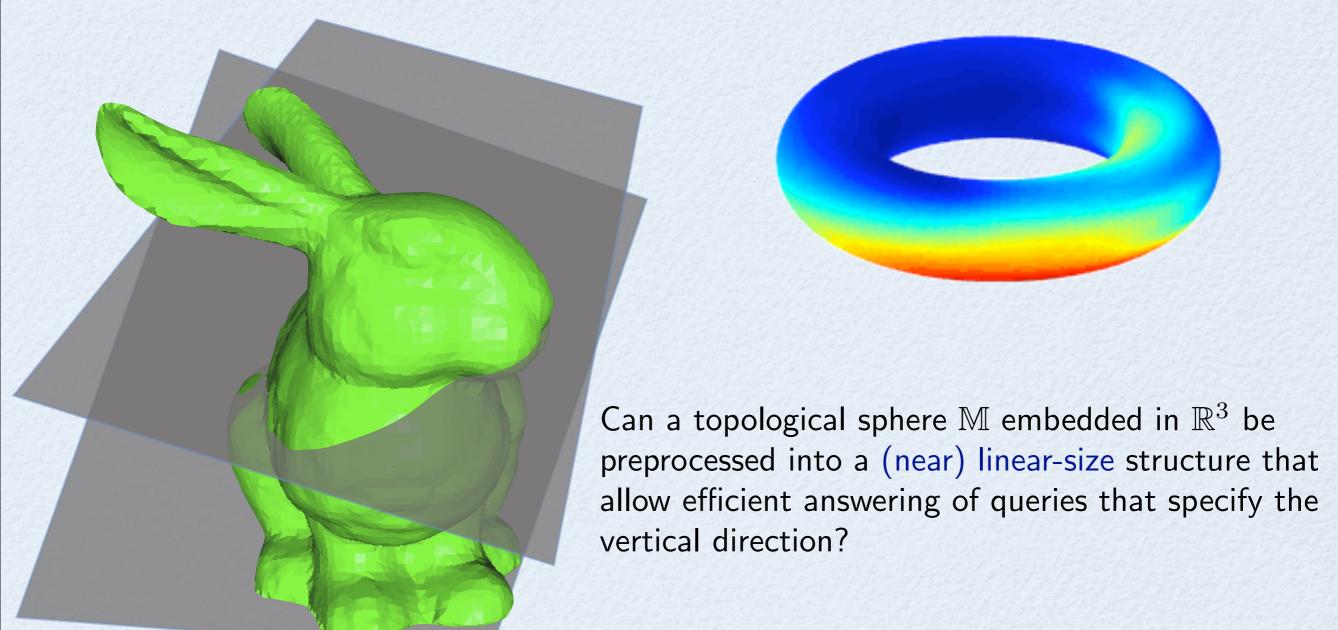
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Thank You!