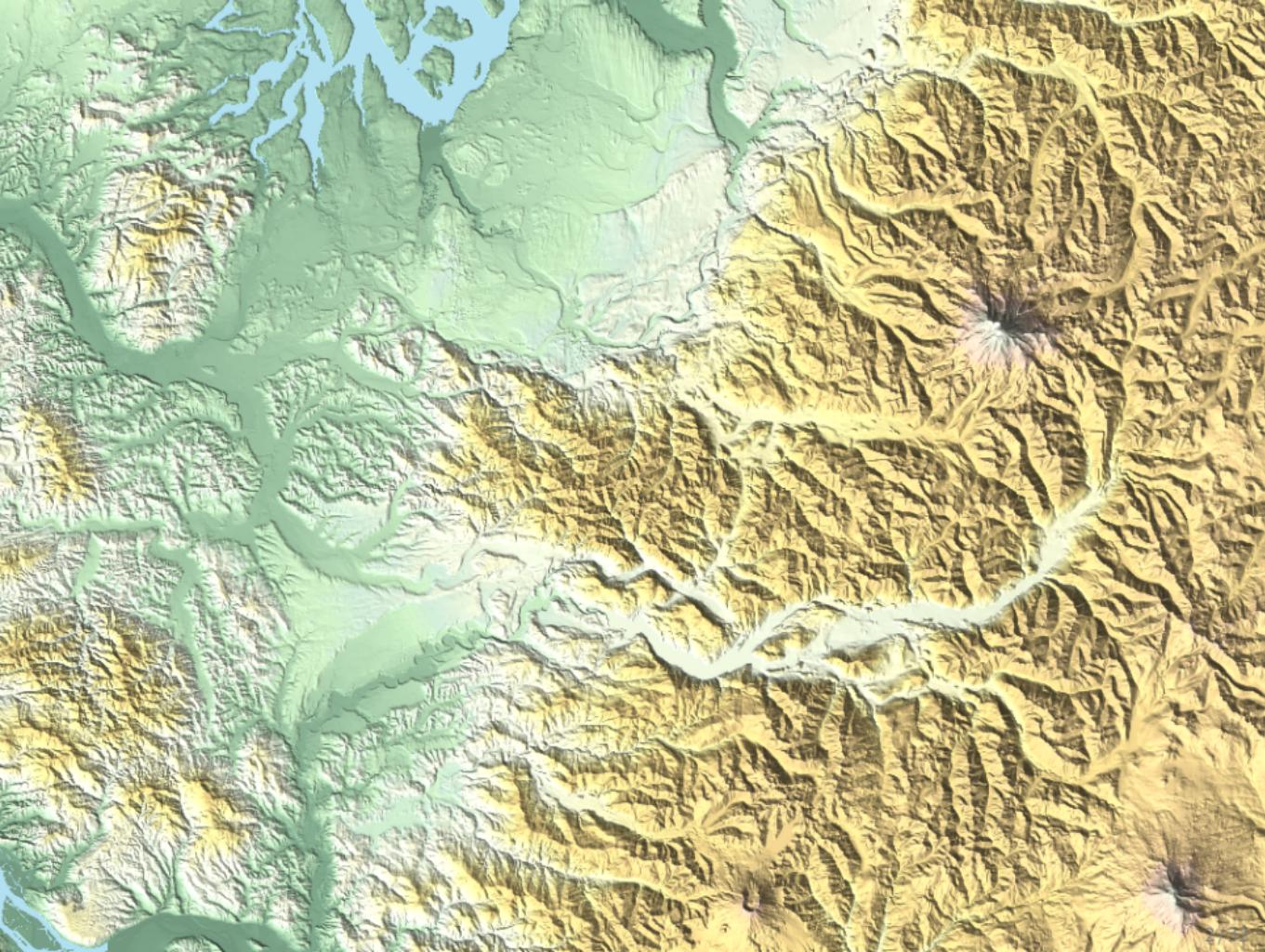


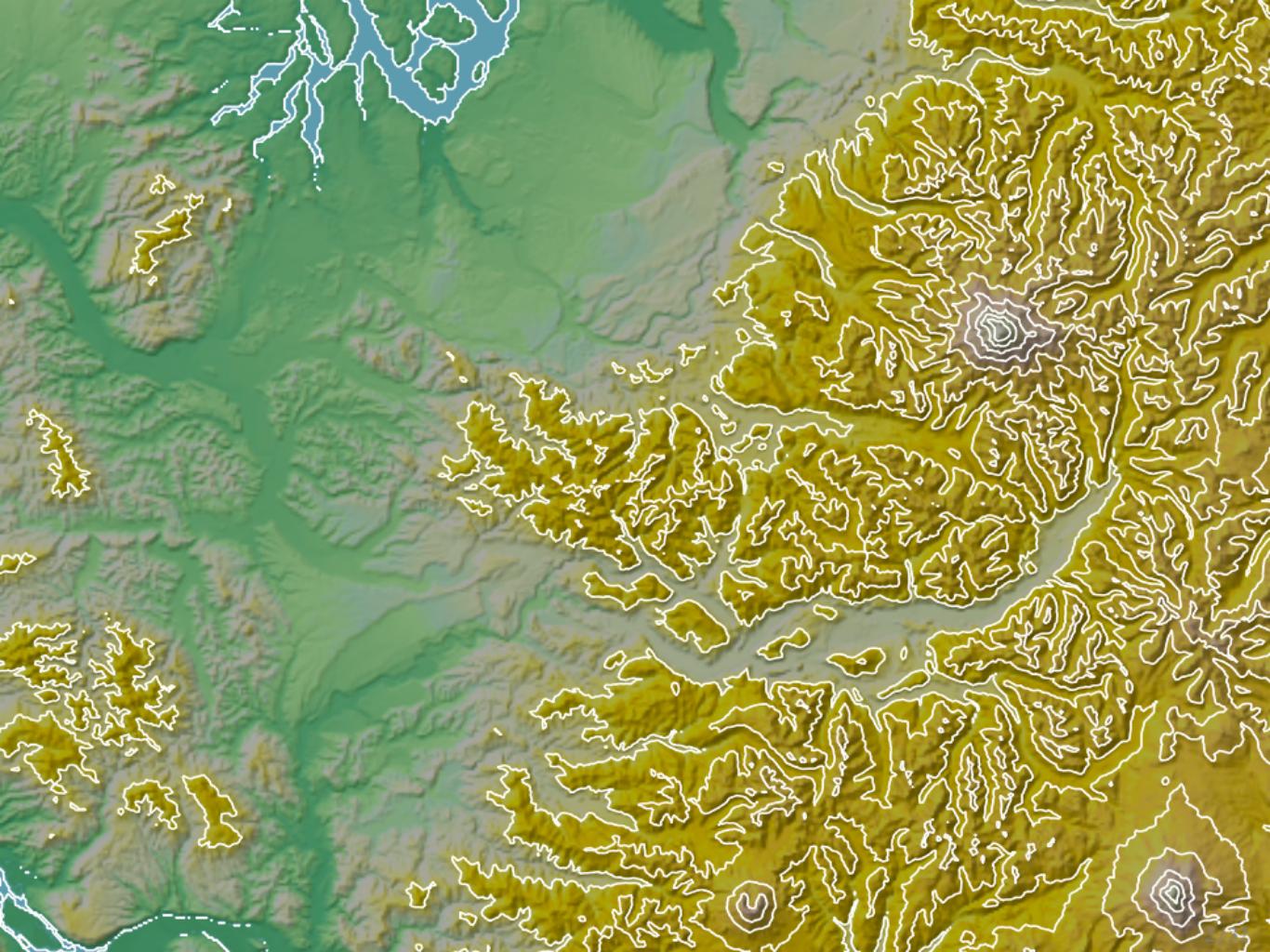
# Persistence in discrete Morse theory

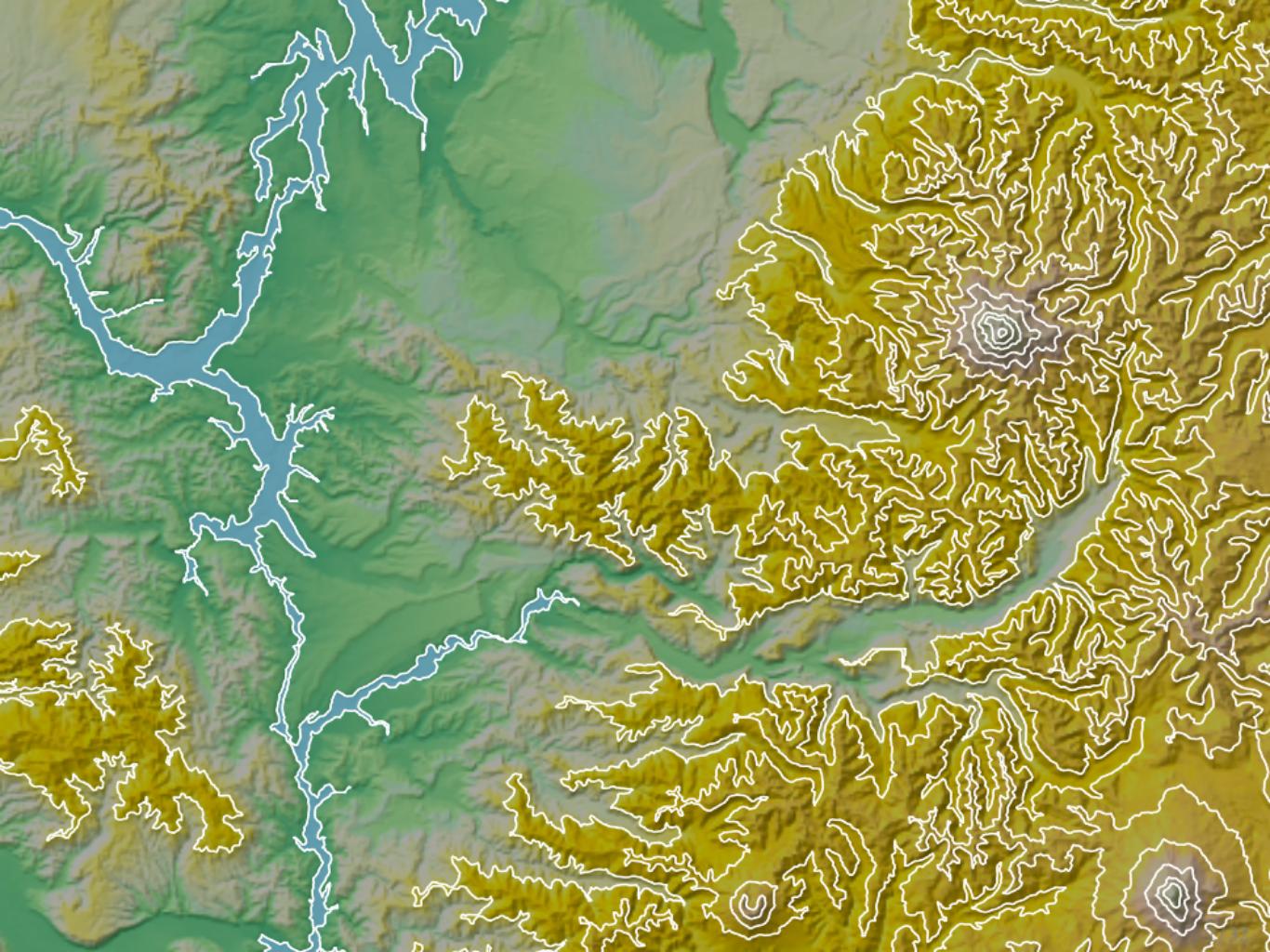
Ulrich Bauer

Georg-August-Universität Göttingen

April 14, 2011







# Goal

Given a function  $f$  on a surface and  $\delta > 0$ , find a function  $f_\delta$  that:

- ▶ minimizes number of critical points
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Using:

- ▶ Discrete Morse theory [Forman 1998]
  - ▶ provides notion of critical point in the discrete setting
- ▶ Homological persistence [Edelsbrunner et al. 2002]
  - ▶ quantifies significance of critical points

# Regular CW complexes

Think of generalized simplicial complexes

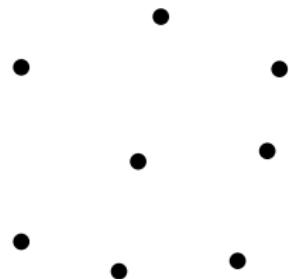
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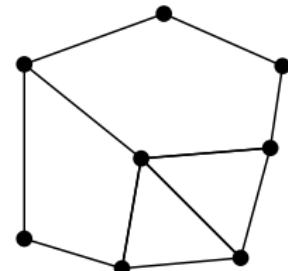


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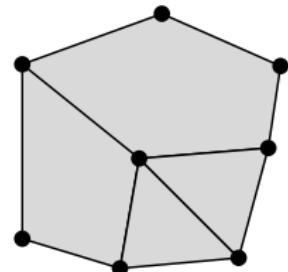


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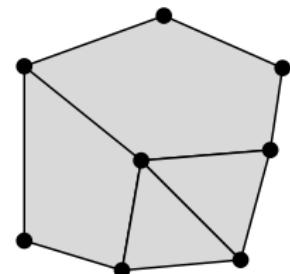


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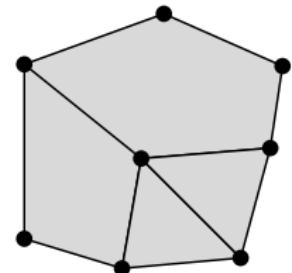
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- ▶ start with a set of points (0-skeleton)
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- ▶ *regular* CW complex: all attaching maps are topological embeddings



# Discrete Morse theory [Forman, 1998]

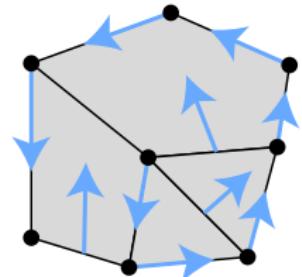
Finite regular CW complex  $\mathcal{K}$



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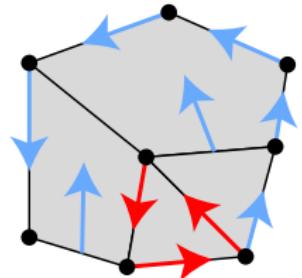
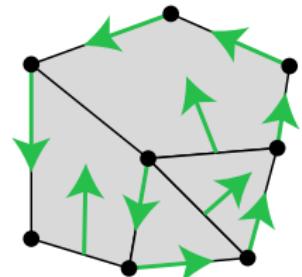
- Discrete vector field:
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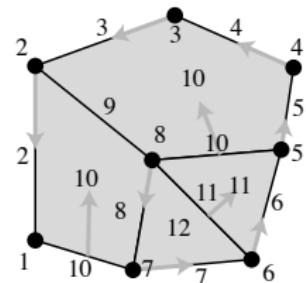
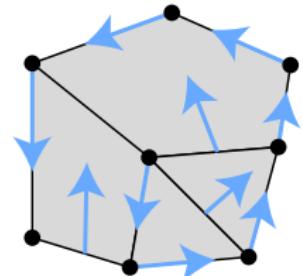
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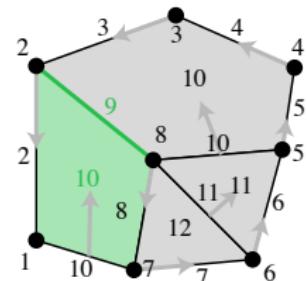
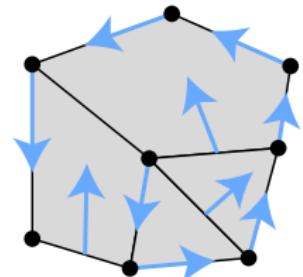
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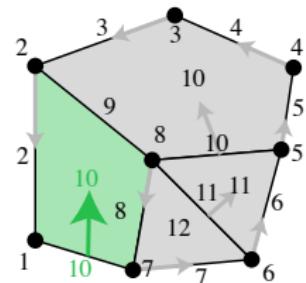
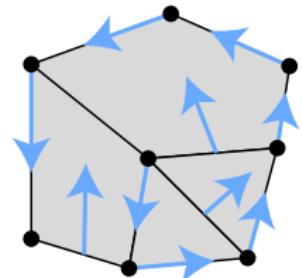
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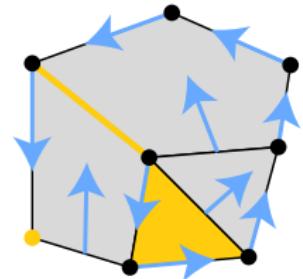
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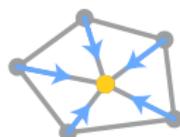
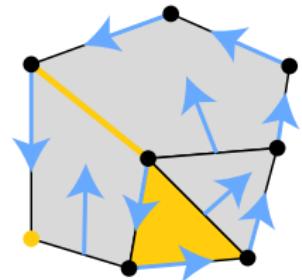
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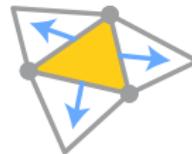
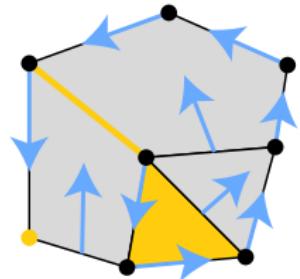
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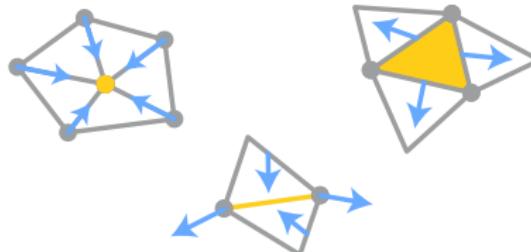
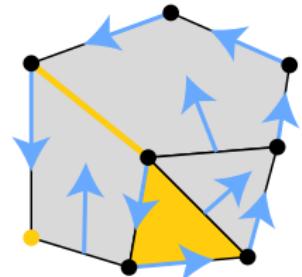
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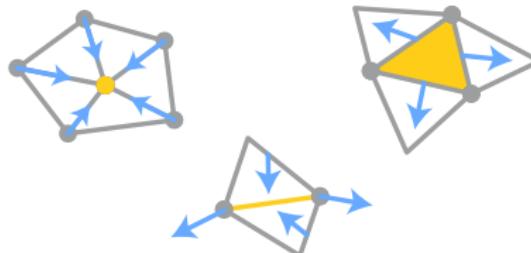
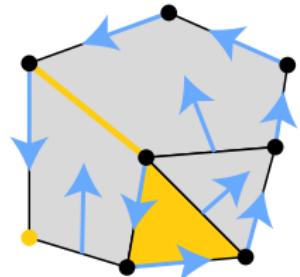
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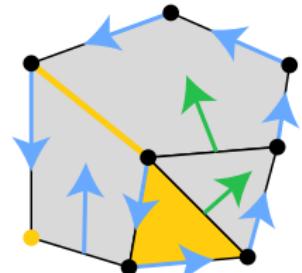
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- ▶ No multi-saddle by definition!

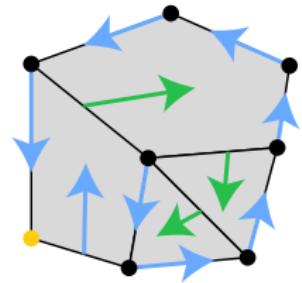
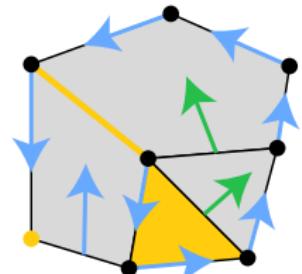
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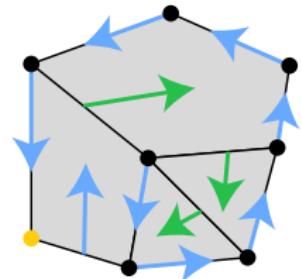
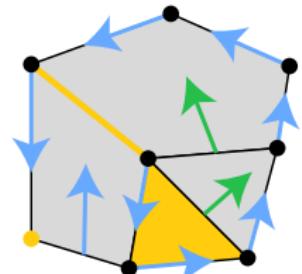
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(of gradient vector fields, *not functions*)



# The Morse complex of a gradient vector field

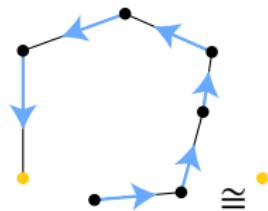
A gradient vector field  $V$  on  $\mathcal{K}$  defines a *Morse complex*  $\mathcal{M}_V$  (homotopy equivalent to  $\mathcal{K}$ )

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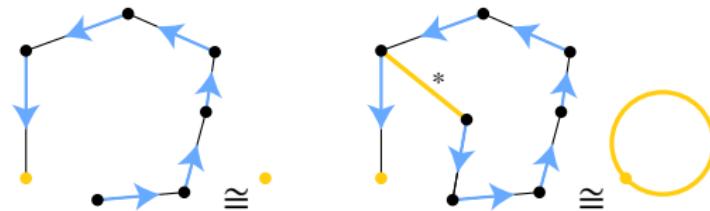
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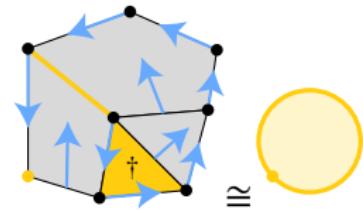
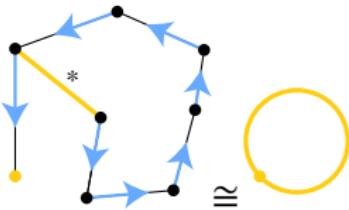
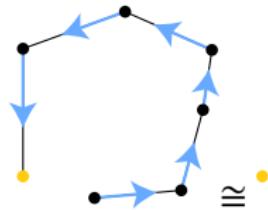
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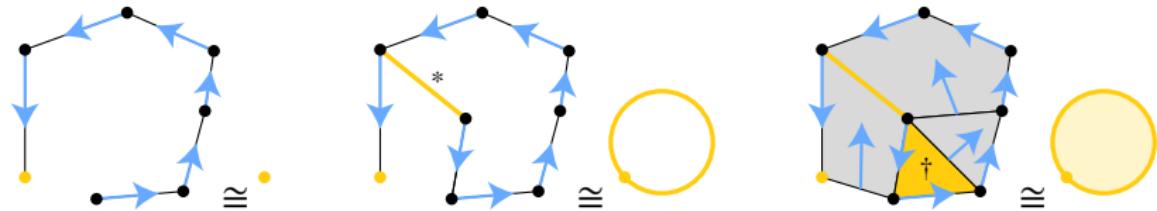
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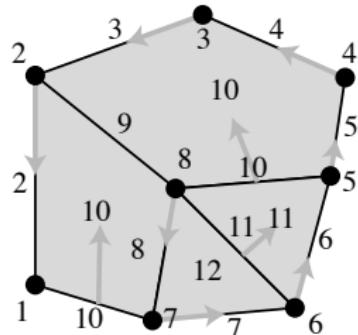
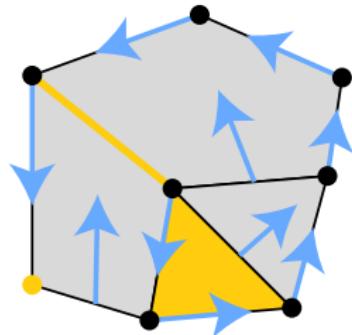


In general, the Morse complex is not regular

- ▶ definitions can be extended to non-regular CW complexes

# Level subcomplexes

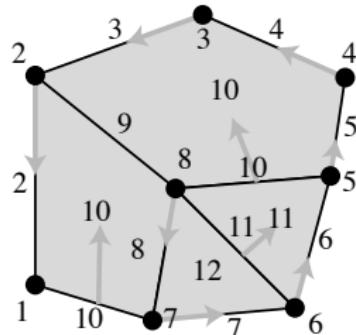
*Level subcomplex:* union of all closed cells below a certain value



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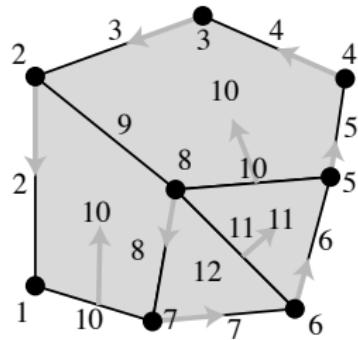
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• \*



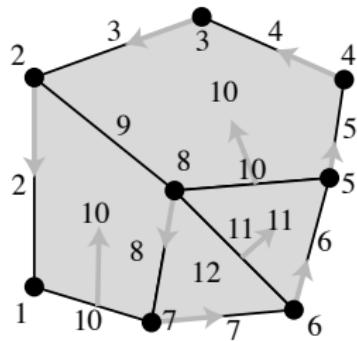
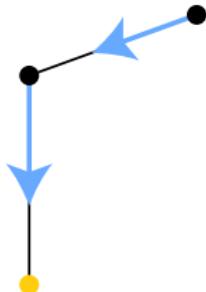
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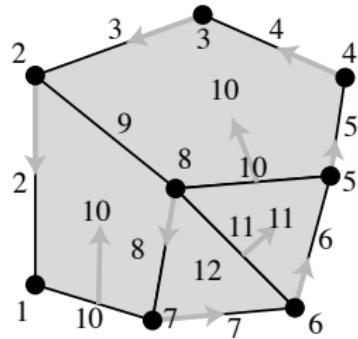
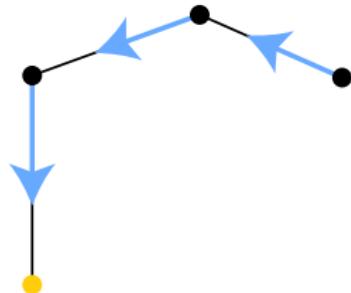
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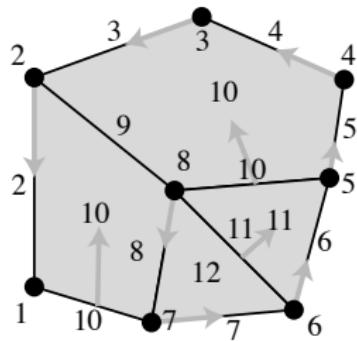
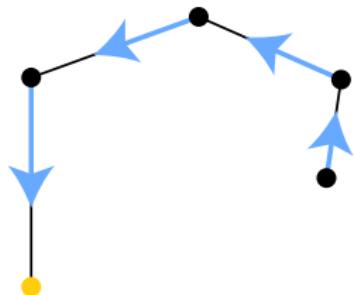
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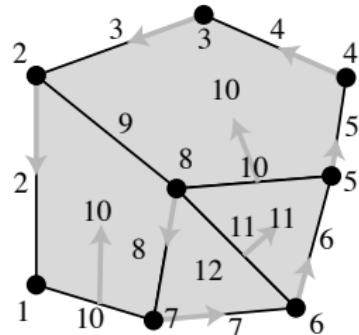
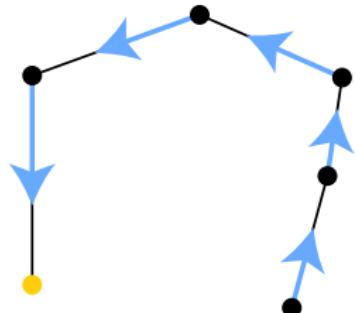
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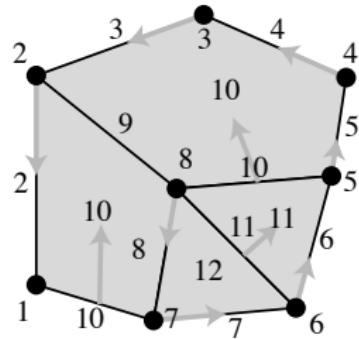
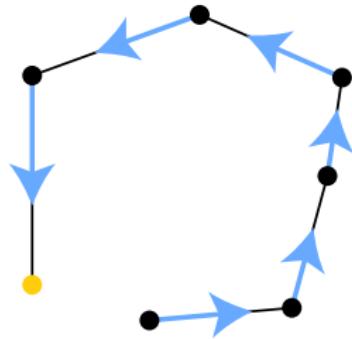
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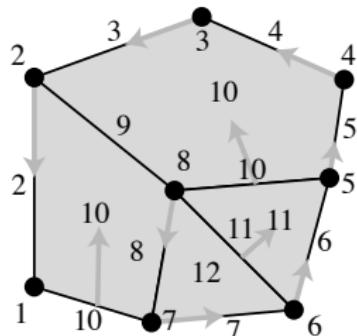
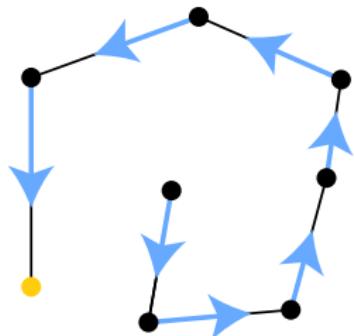
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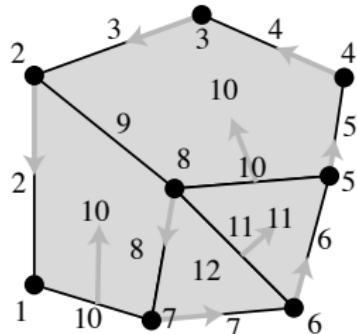
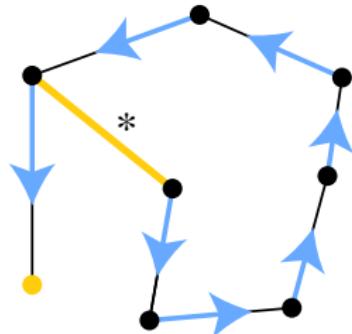
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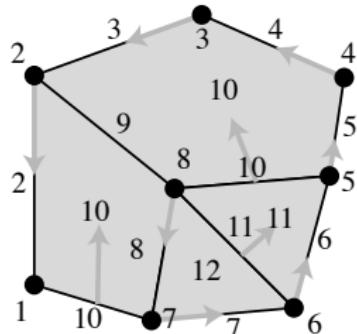
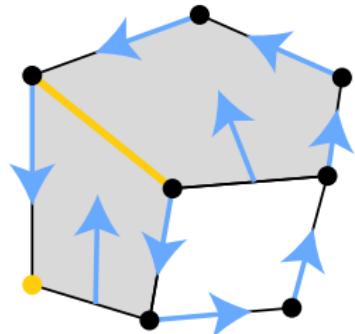
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Homotopy type (and hence homology) changes only at critical cells

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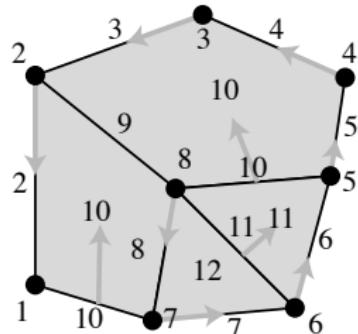
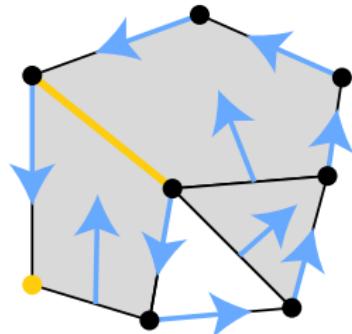
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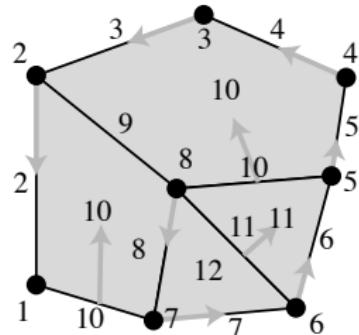
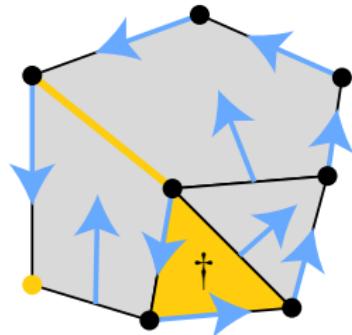
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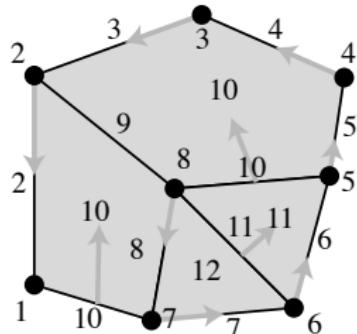
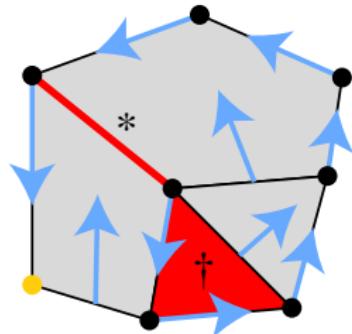
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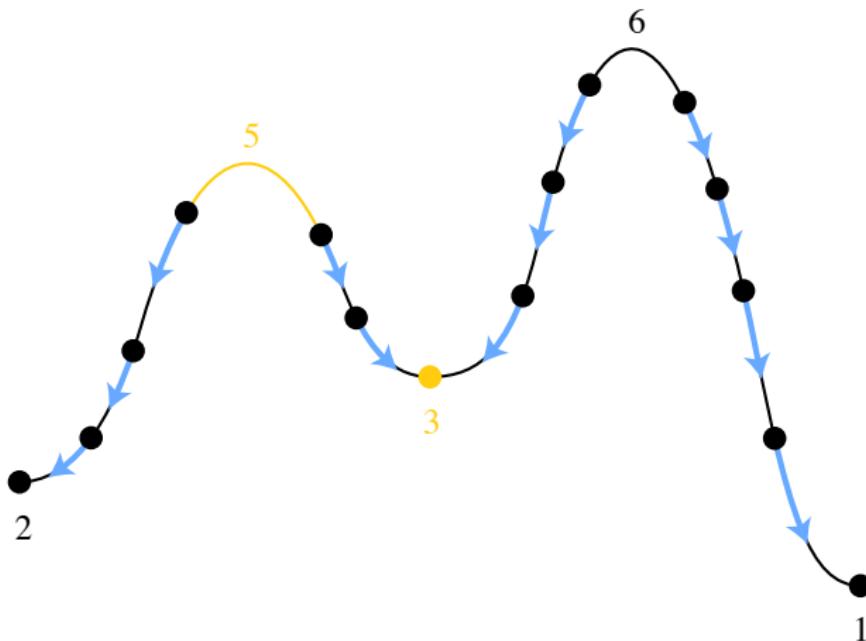
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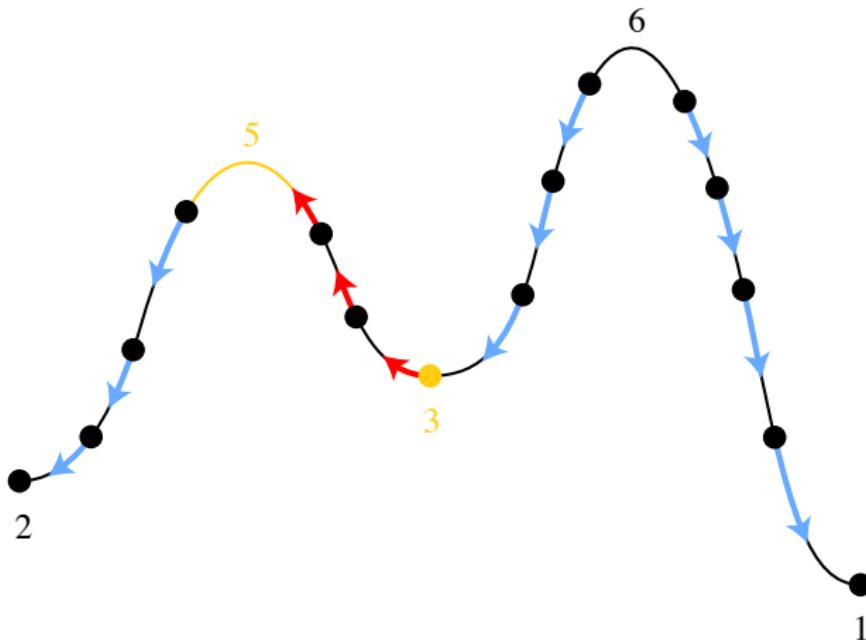


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# Cancelling critical points of a gradient vector field



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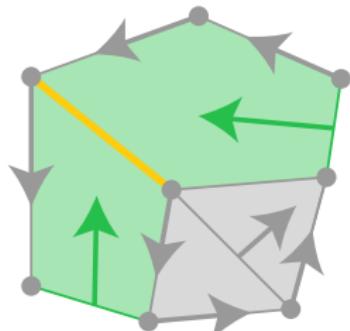


# Ascending and descending sets

A gradient vector field  $V$  imposes inequalities on values of a consistent function

- ▶ *Ascending set* of a cell  $\sigma$ :

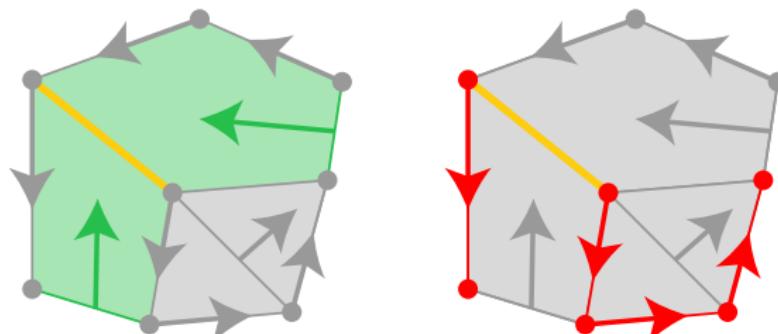
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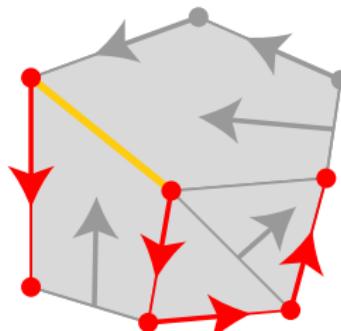
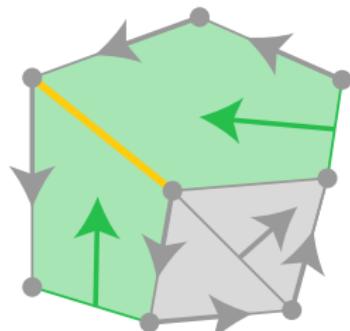


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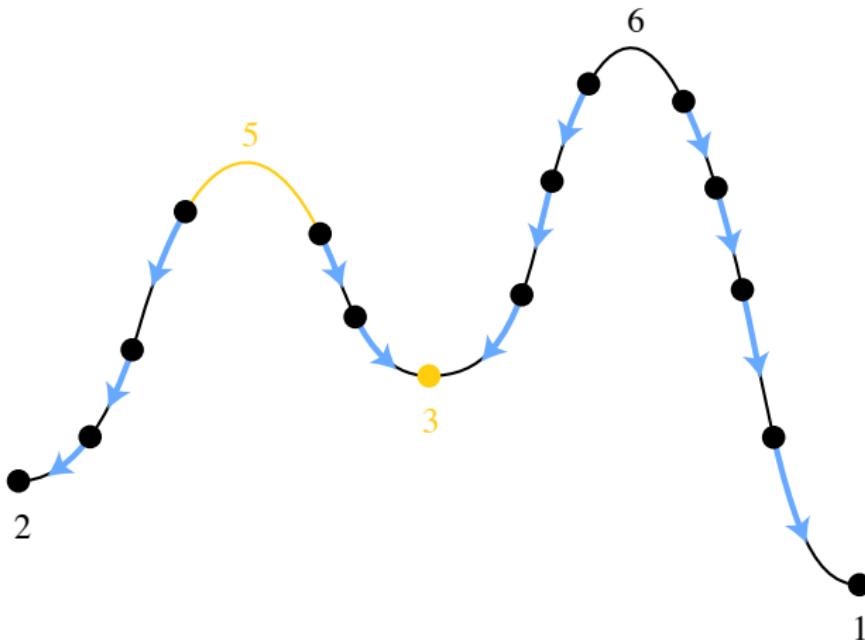
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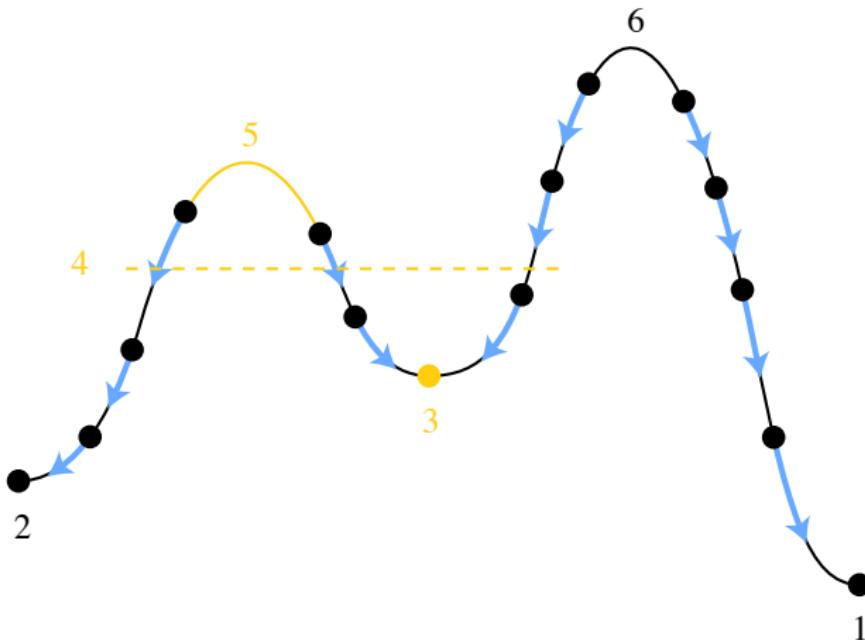
$V$  induces partial order  $\prec_V$  on cells: write  $\sigma \prec_V \rho$  and  $\phi \prec_V \sigma$



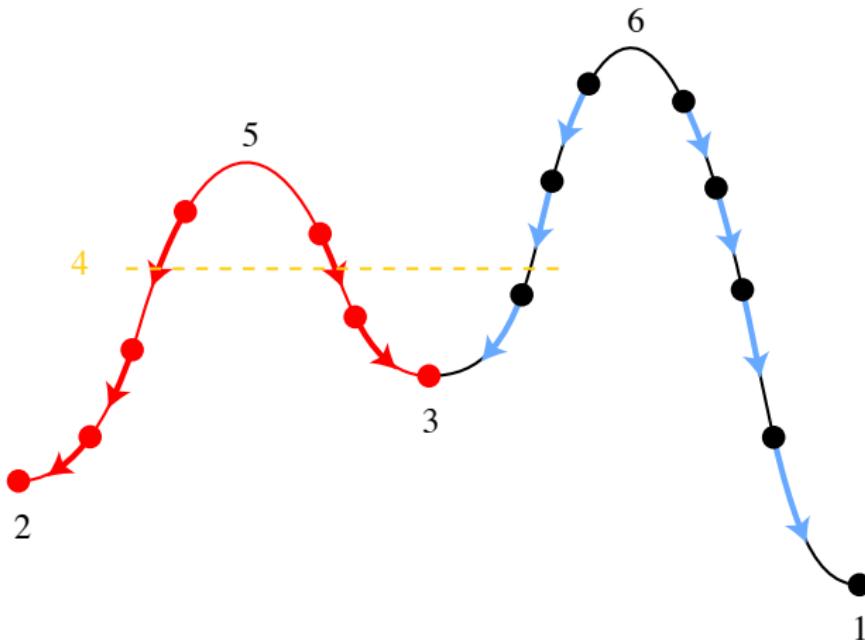
# Cancelling critical points of a function



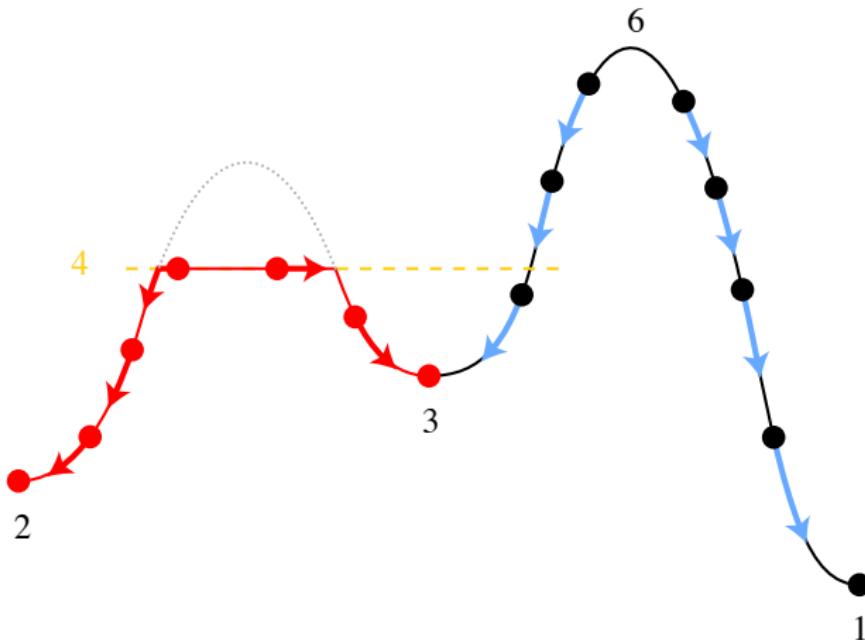
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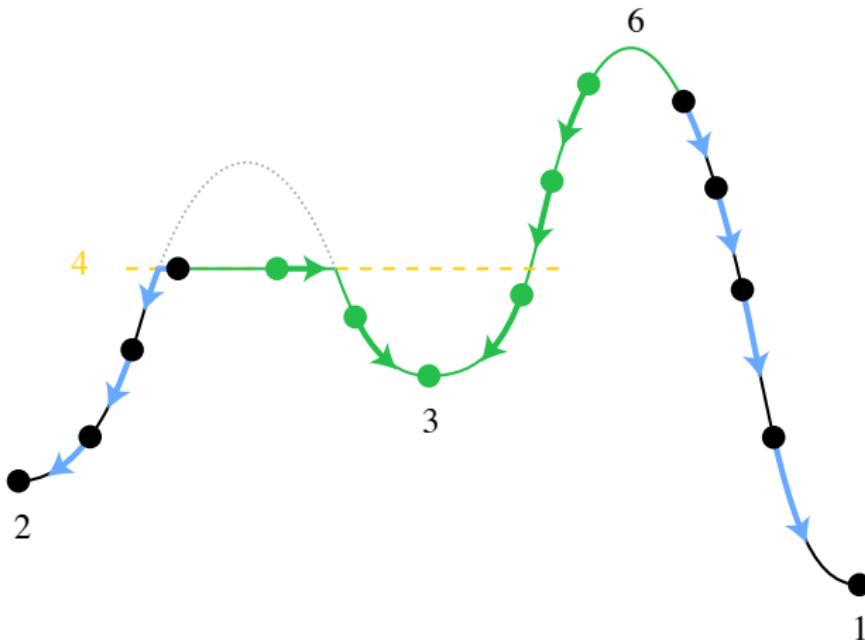
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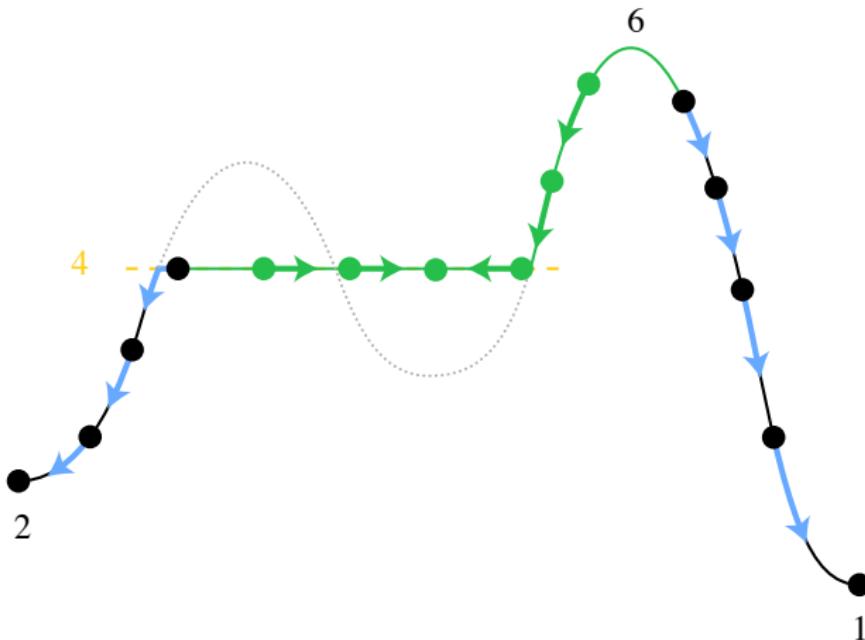
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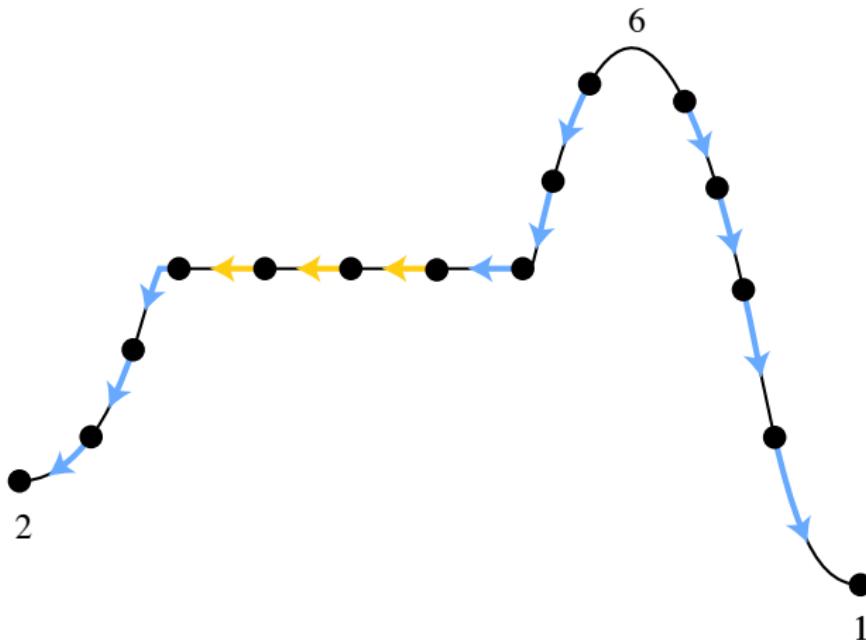
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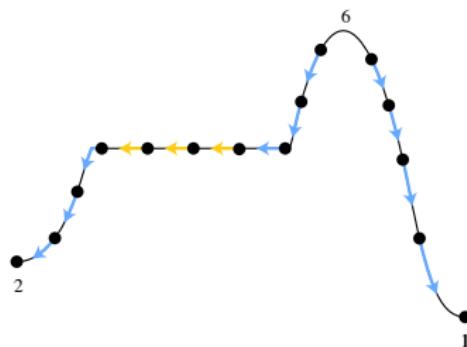
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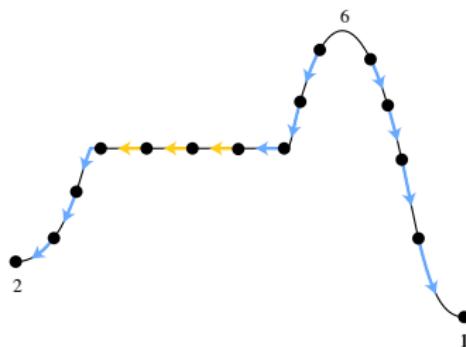


# Pseudo-Morse functions



After cancelation, function is no longer Morse

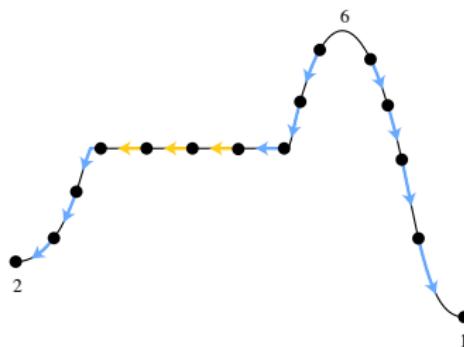
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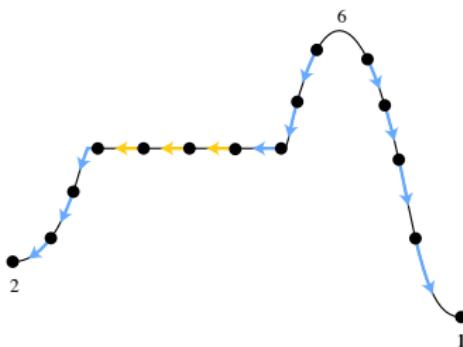
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  - ▶ Gradient vector field is no longer unique in general

# A symbolic perturbation scheme

## Lemma

*A function  $f$  is a pseudo-Morse function consistent with  $V$  if and only if*

*for every  $\epsilon > 0$  there is a discrete Morse function  $f_\epsilon$  consistent with  $V$  and  $\|f_\epsilon - f\|_\infty \leq \epsilon$ .*

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(PL → pseudo-Morse → PL: barycentric subdivision)

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- ▶ New choices may appear after each step
- ▶ Keep in mind the tolerance

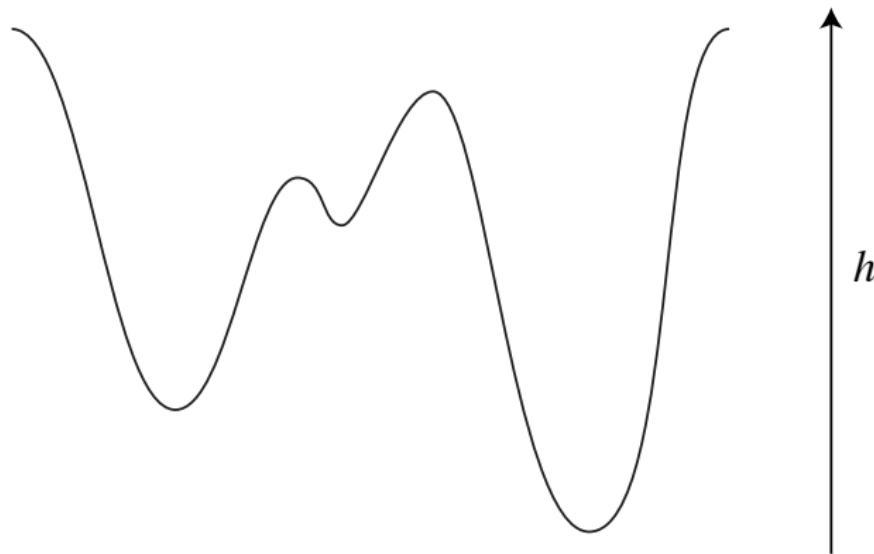
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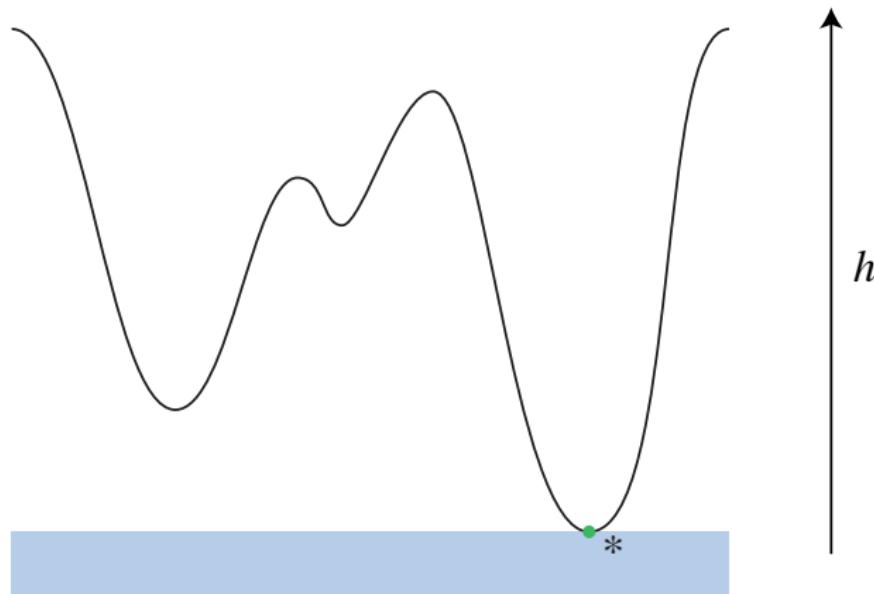
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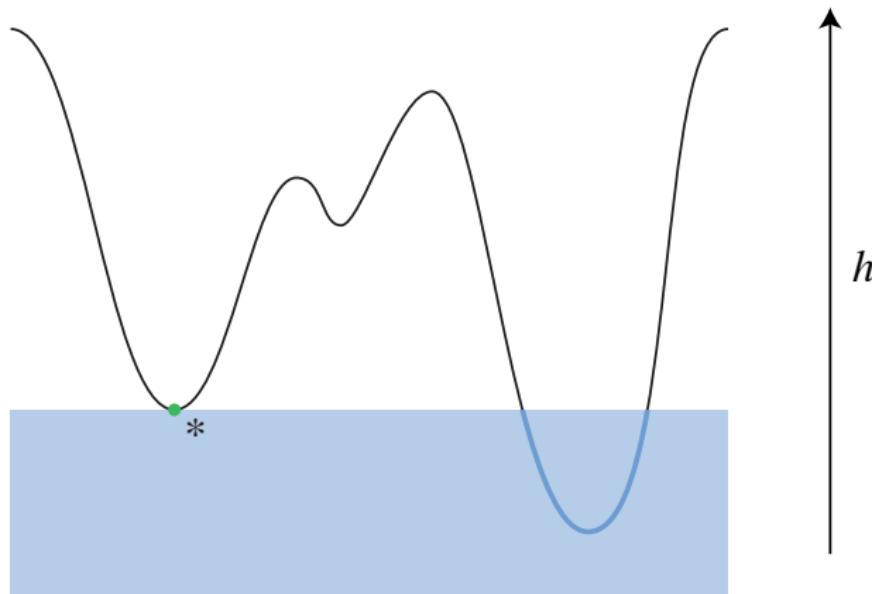
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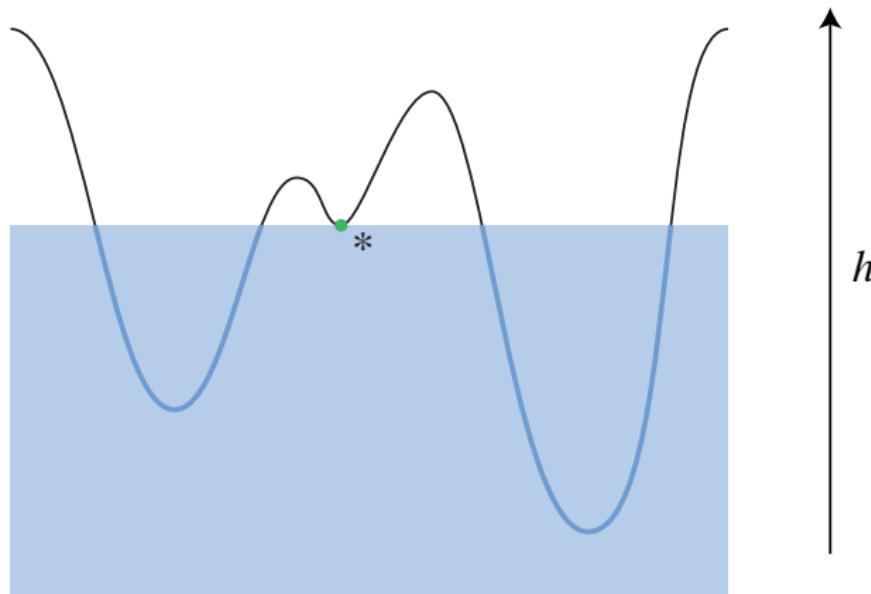
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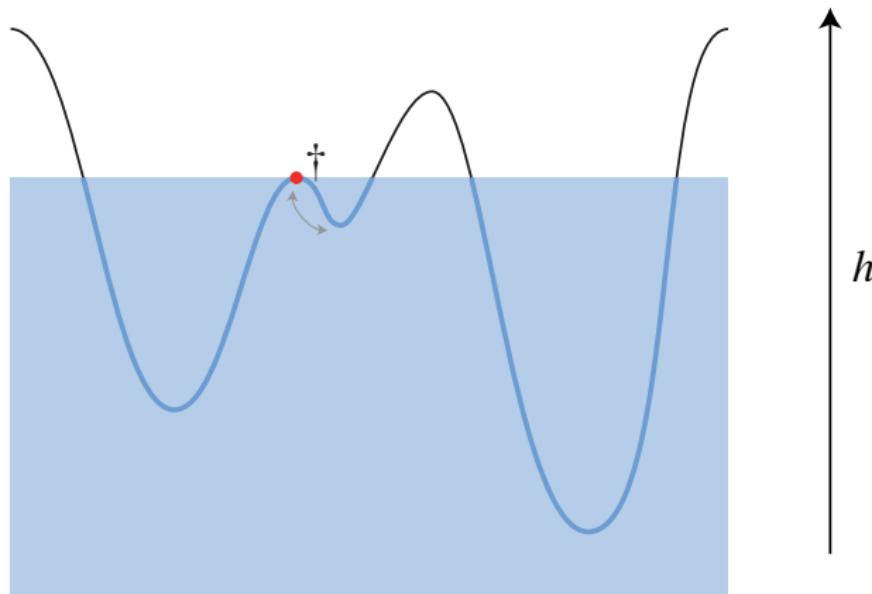
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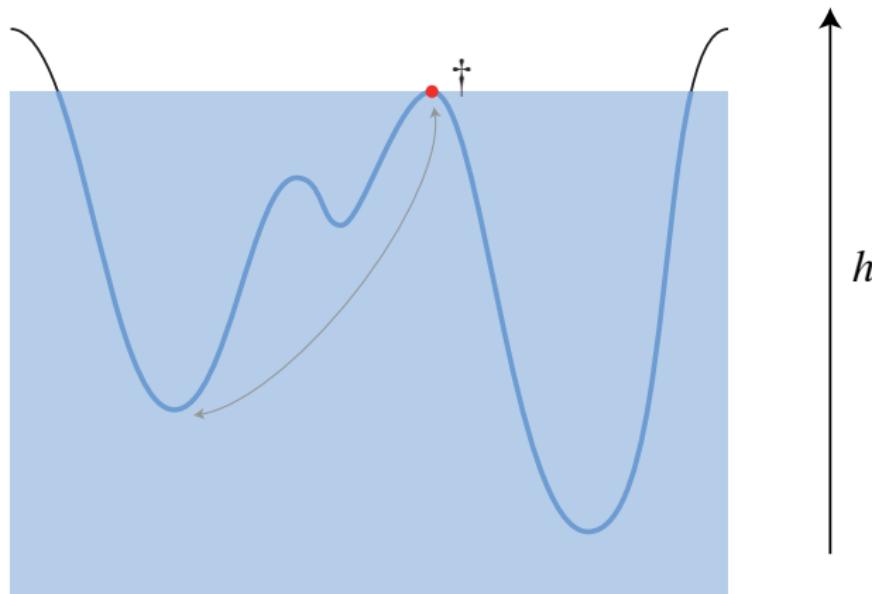
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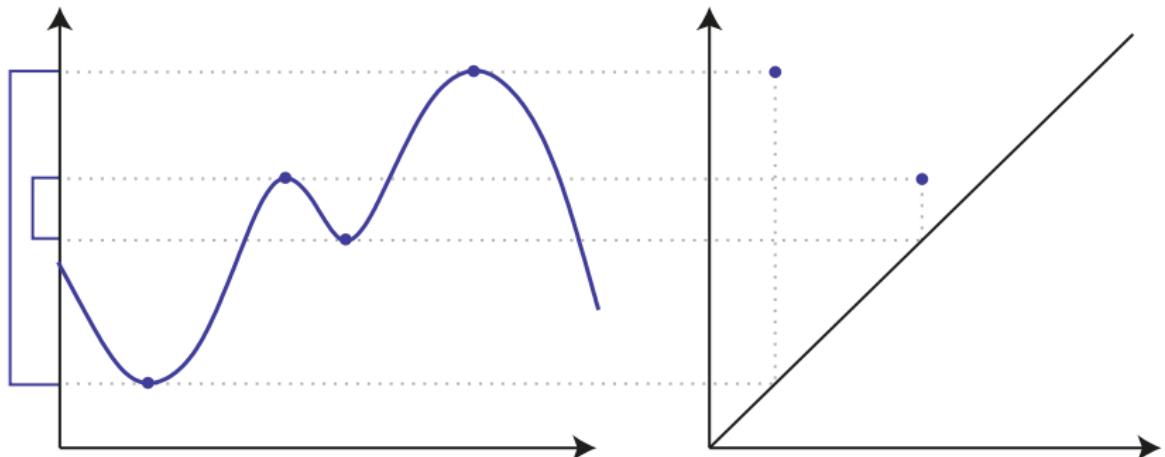
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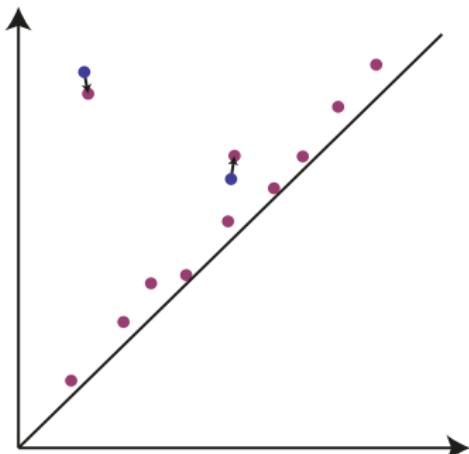
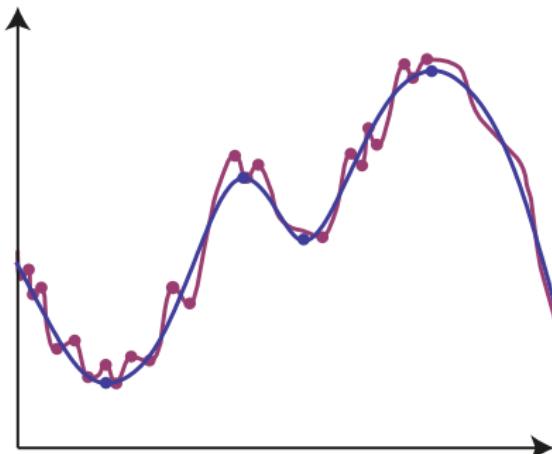
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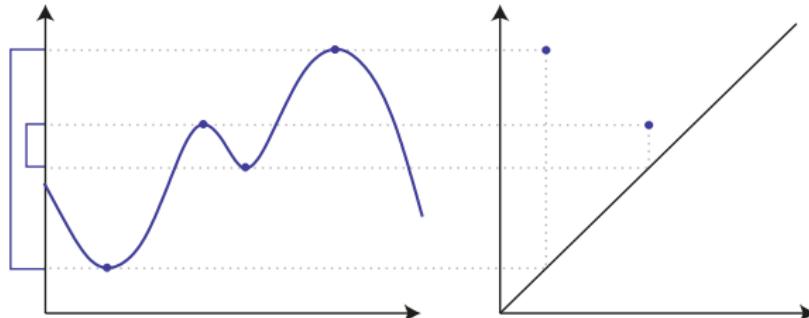


# Stability of persistence diagrams

Theorem (Cohen-Steiner et al., 2005)

Let  $\|f - g\|_\infty \leq \delta$ .

The persistence pairs of  $f$  that have persistence  $> 2\delta$  can be mapped injectively to the persistence pairs of  $g$  such that corresponding points  $p_f, p_g$  in the persistence diagrams have distance  $\|p_f - p_g\|_\infty \leq \delta$ .

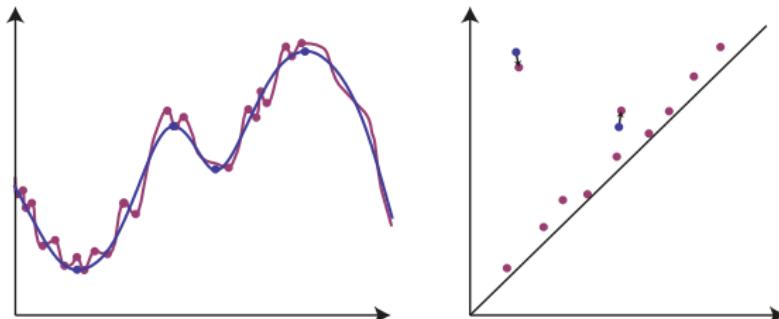


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## Corollary

*Let  $f$  be a discrete Morse function on a surface and let  $\delta > 0$ .*

*Then for every function  $f_\delta$  with  $\|f_\delta - f\|_\infty \leq \delta$  we have:*

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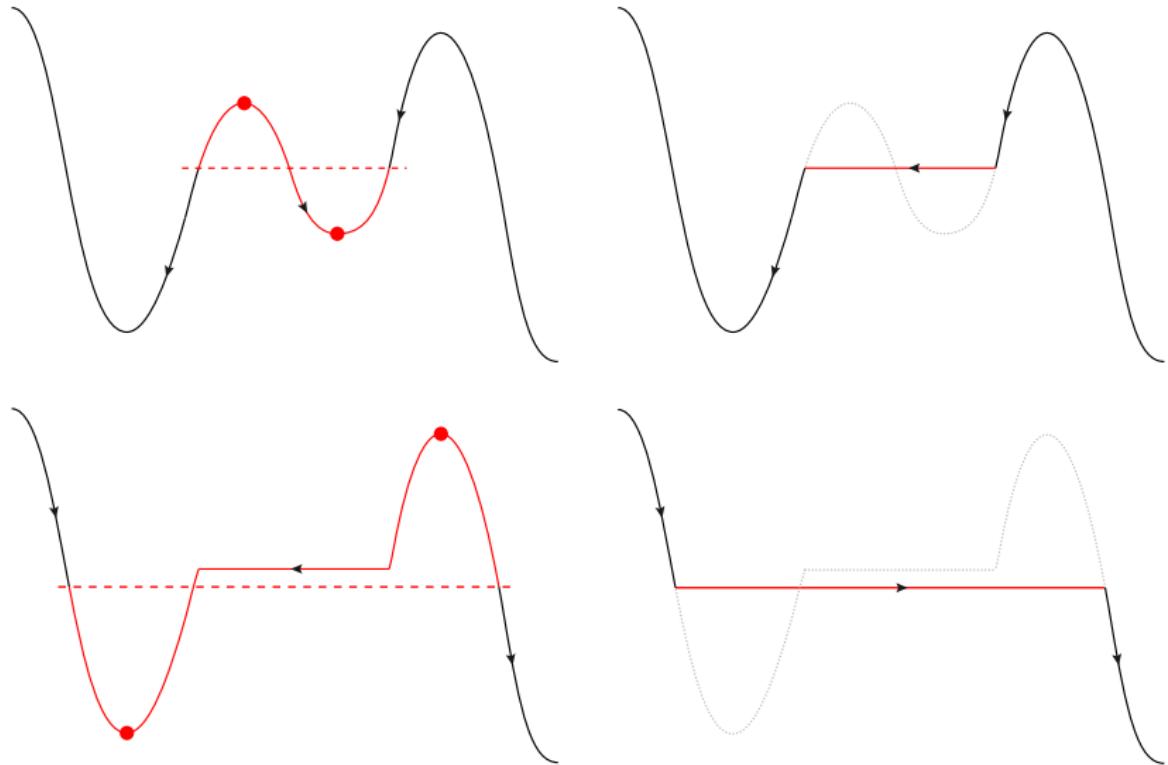
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- ▶ Is cancelation always allowed?
- ▶ Order of cancelation?

# Canceling two nested persistence pairs



# Connecting persistence and Morse theory

Theorem (B., Lange, Wardetzky, 2010)

*Consider a persistence pair  $(\sigma, \tau)$  of a discrete Morse function on a surface. Then  $(\sigma, \tau)$  can be canceled after all persistence pairs  $(\tilde{\sigma}, \tilde{\tau})$  with  $f(\sigma) < f(\tilde{\sigma}) < f(\tilde{\tau}) < f(\tau)$  have been canceled:*

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What about the tolerance? Does the error accumulate?

# Tightness of the stability bound

Theorem (B., Lange, Wardetzky, 2010)

*Let  $f$  be a pseudo-Morse function on a surface and let  $\delta > 0$ .*

*Then a nested cancelation sequence yields a function  $f_\delta$  with:*

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This function achieves the minimal number of critical points.

# Proof of the tightness theorem

## Lemma

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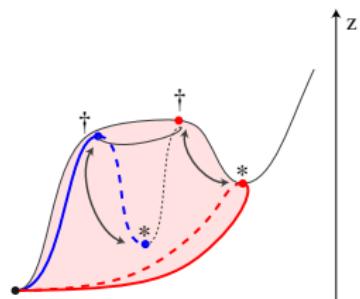
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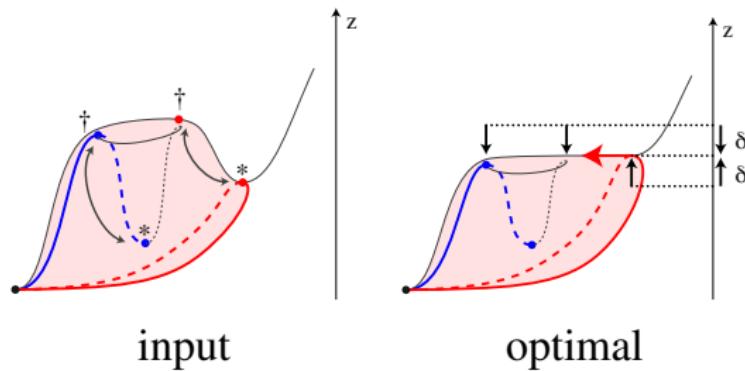
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Need to consider interplay between dimensions!

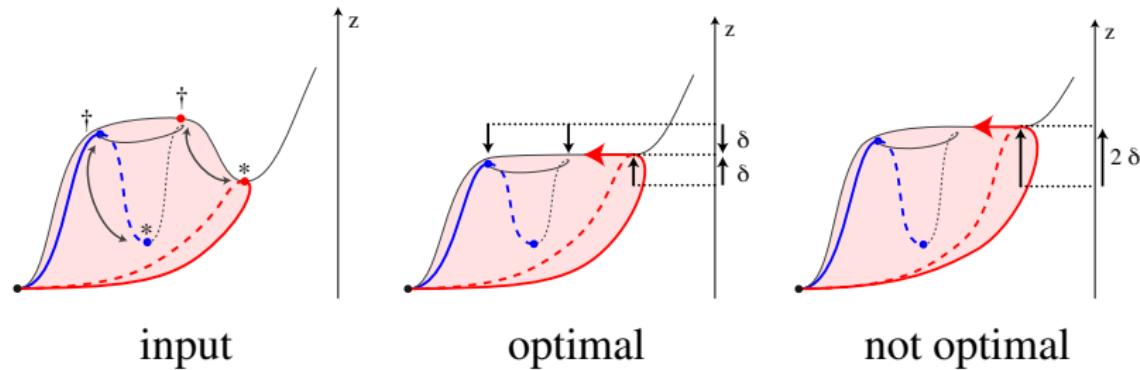
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On surfaces, cancelation may affect other critical values!

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Proof of correctness requires previous theorem!

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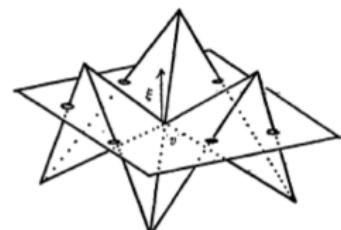
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Difficulty comes from multi-saddles



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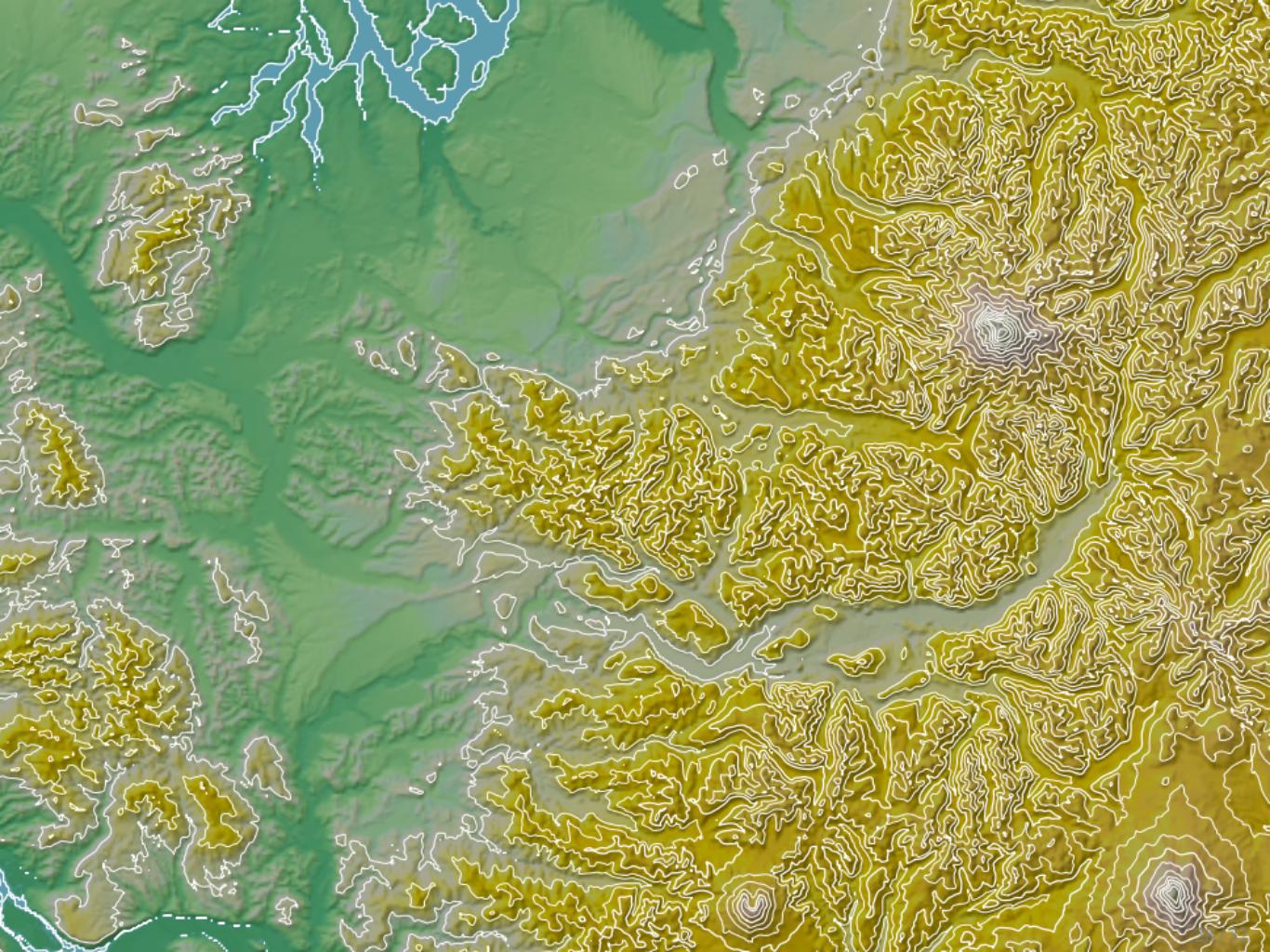
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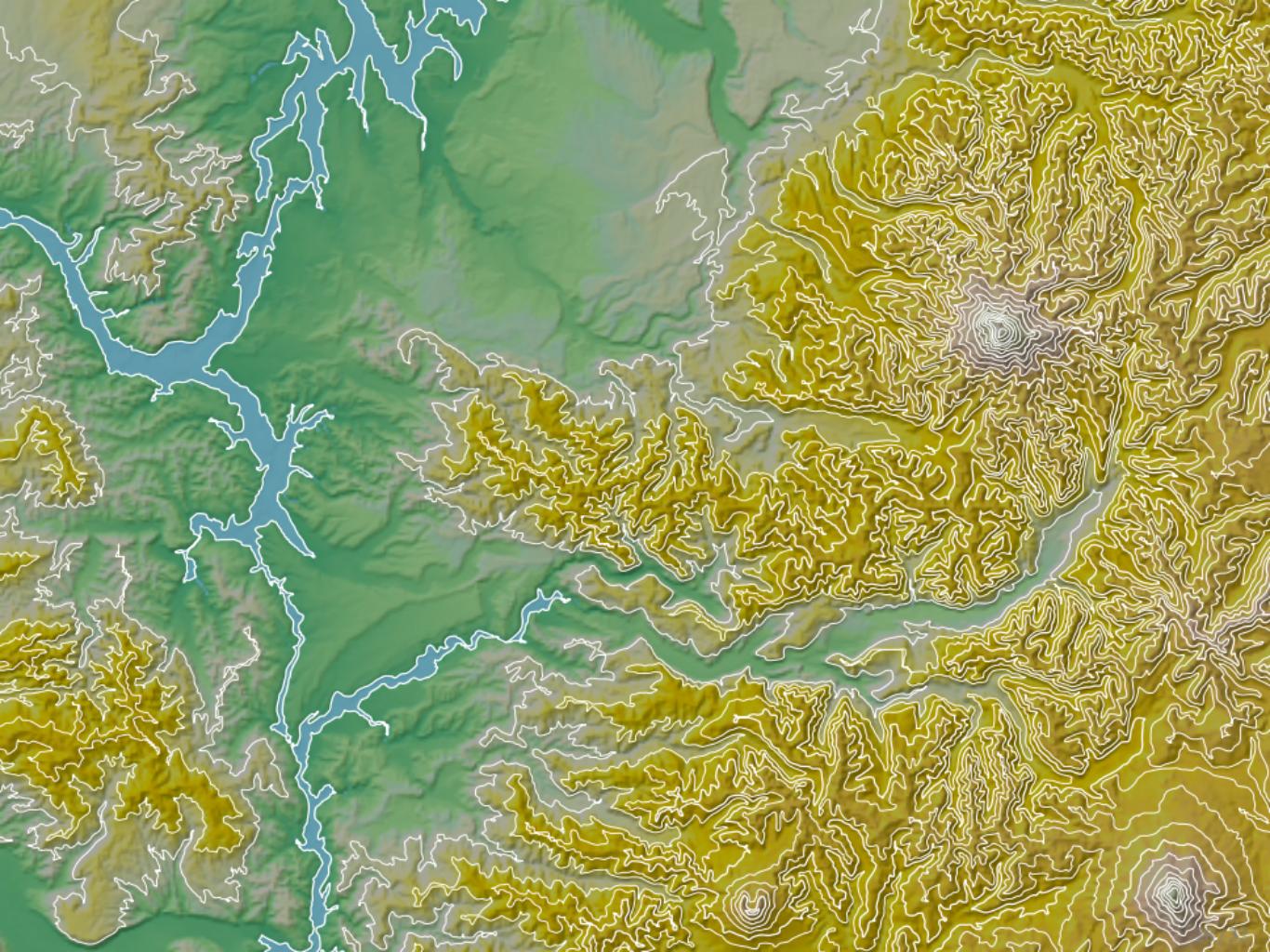
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- ▶ defines convex set of solutions
- ▶ find the “best” solution using your favorite energy functional







# Future work

- ▶ Connection to total variation denoising
- ▶ Extension to higher dimensions (weaker assumptions on critical points)
- ▶ Connection to singularity theory?

# Present work

 U. Bauer.

*Persistence in Discrete Morse Theory.*

PhD thesis, University of Göttingen, 2011.

 U. Bauer, C. Lange, and M. Wardetzky.

Optimal topological simplification of discrete functions on surfaces.

*arXiv preprint*, 2010. To appear in *Discr. Comp. Geometry*.

[arXiv:1001.1269](https://arxiv.org/abs/1001.1269)

 U. Bauer, C.-B. Schönlieb, and M. Wardetzky.

Total variation meets topological persistence: A first encounter.

*Proceedings of ICNAAM 2010*, 1022–1026.

[doi:10.1063/1.3497795](https://doi.org/10.1063/1.3497795)

# Past work



R. Forman.

A user's guide to discrete Morse theory.

*Sém. Loth. de Combinatoire*, B48c:1–35, 2002.



H. Edelsbrunner, D. Letscher, and A. Zomorodian.

Topological Persistence and Simplification.

*Discr. Comp. Geometry*, 28(4):511–533, 2002.



D. Cohen-Steiner, H. Edelsbrunner, and J. Harer.

Stability of Persistence Diagrams.

*Discr. Comp. Geometry*, 37(1):103–120, 2007.

# Thanks for your attention!

