

# Endpoints for multiparameter persistence

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Topological Data Analysis

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# Outline

1. Persistent homology
2. Fruit fly wing veins
3. Probability distributions
4. Intervals
5. Functorial endpoints over  $\mathbb{R}$
6. Socles in multiple parameters
7. Birth and death posets
8. QR codes
9. Applications

# Collaborators

- Faculty



Paul Bendich  
Math  
Duke



David Houle  
Biology  
Florida State



Steve Marron  
Stat/OR  
UNC



Sean Skwerer  
AV Robotics  
Cruise

- Postdocs



Woojin Kim  
Math  
Duke



Maggie Regan  
Math  
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Ashleigh Thomas  
Math Bio  
Georgia Tech

- Graduate students



Shreya Arya  
Math  
Duke



Samantha Moore  
Math  
UNC



Alex Pieloch  
Math  
Columbia



Xiaojun Zheng  
Stats  
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- Undergraduates



Surabhi Beriwal  
Math  
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William He  
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Joey Li  
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All items labeled “[–]” are joint with some subset

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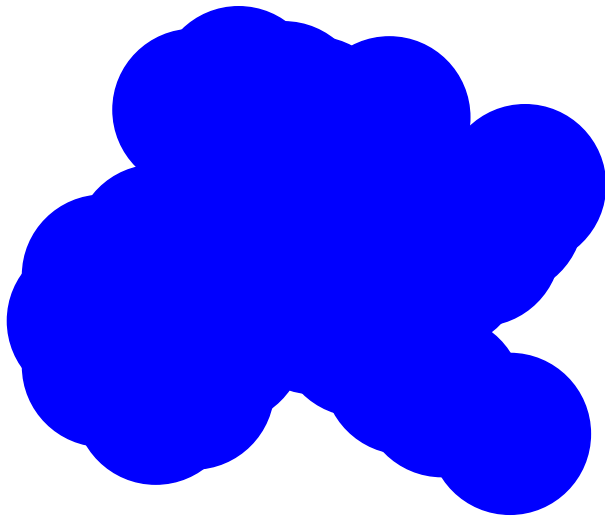
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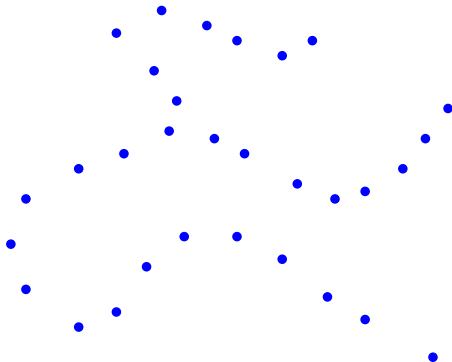
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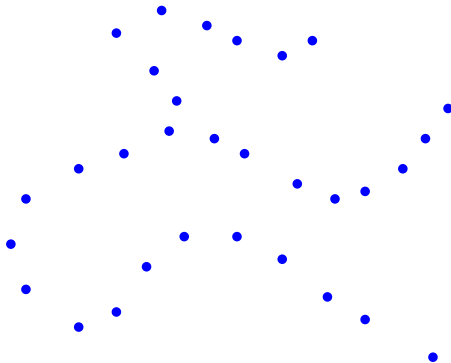
## Example: expanding balls



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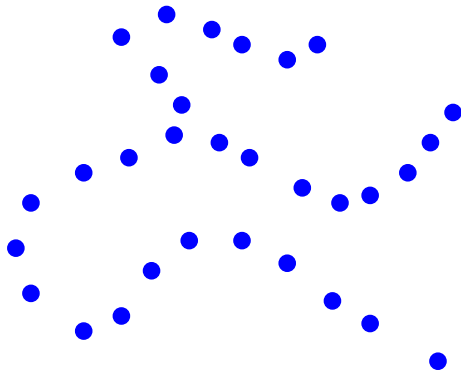


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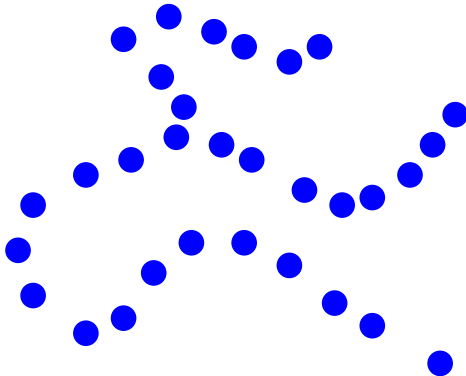
$$\dim(H_0) = 31$$

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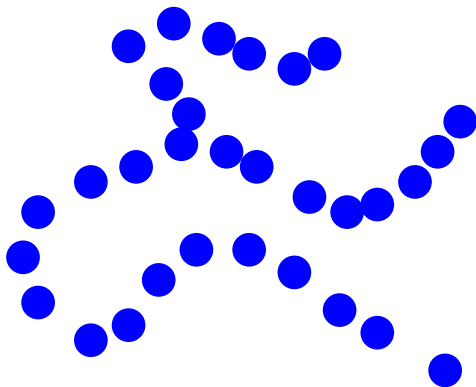
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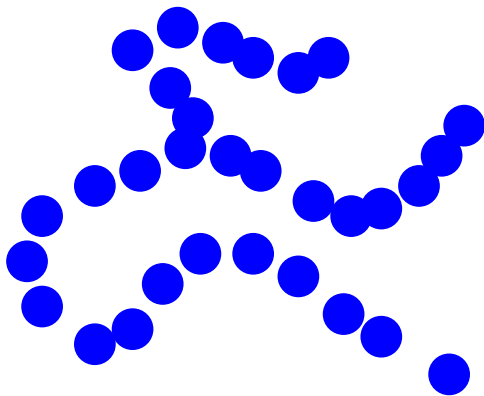
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$$\dim(H_0) = 26$$

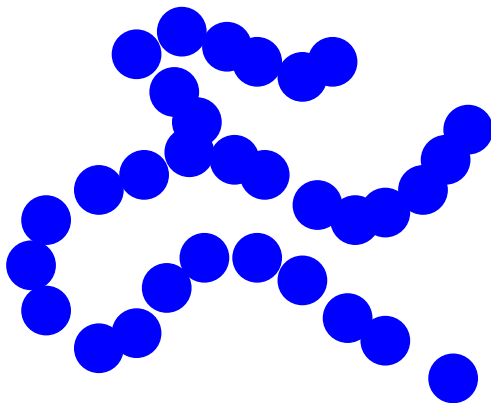


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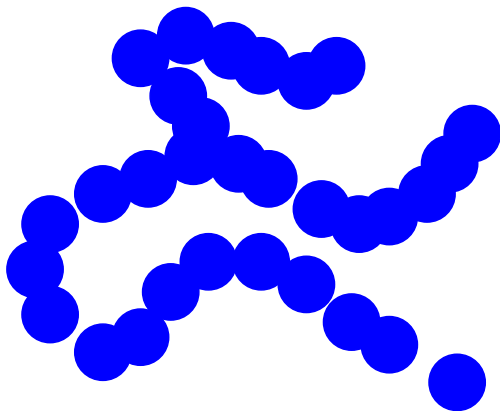
$$\dim(H_0) = 21$$

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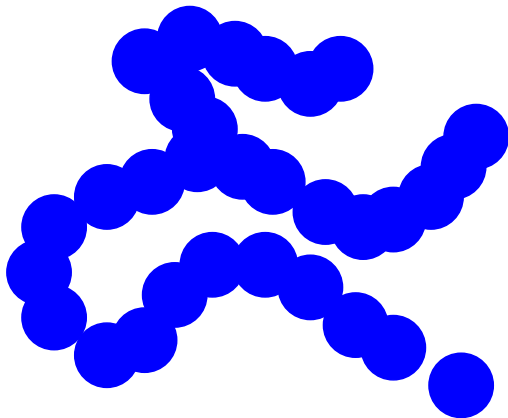
$$\dim(H_0) = 12$$

## Example: expanding balls



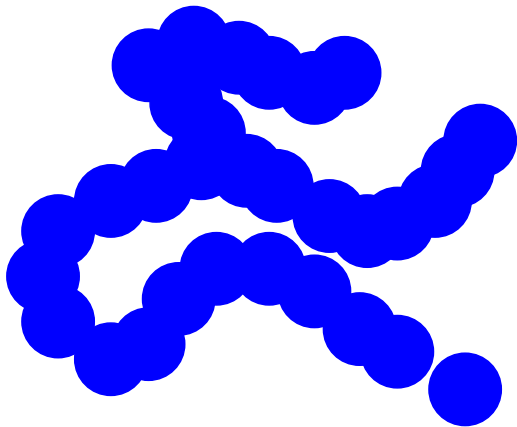
$$\dim(H_0) = 6$$

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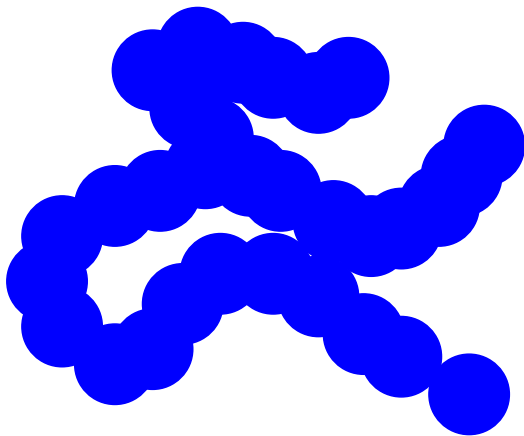
$$\dim(H_0) = 2$$

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$$\dim(H_0) = 2$$

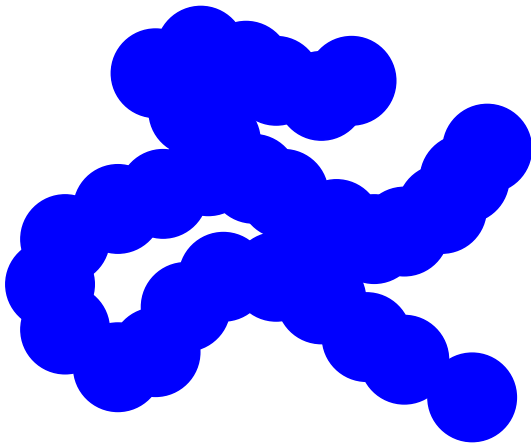
## Example: expanding balls



$$\dim(H_0) = 1$$

$$\dim(H_1) = 2$$

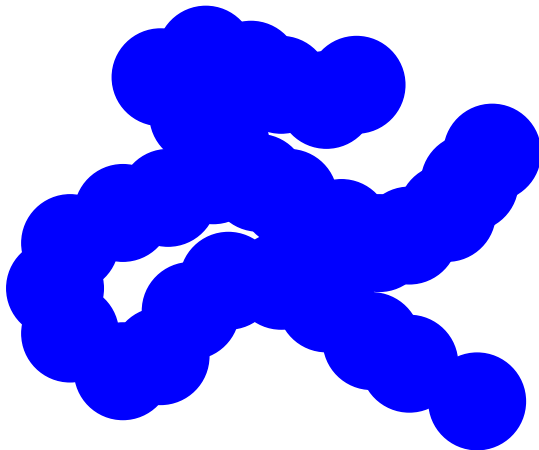
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$$\dim(H_0) = 1$$

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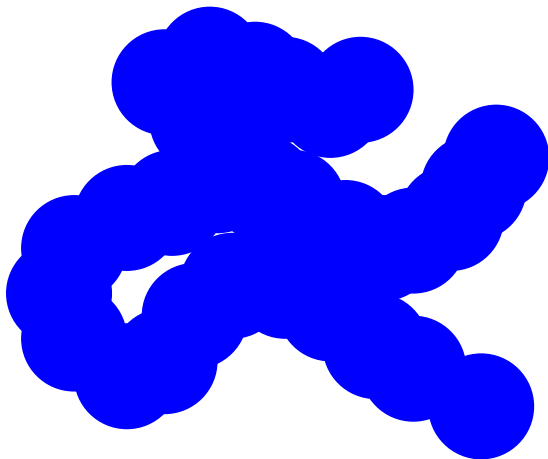


$$\dim(H_0) = 1$$

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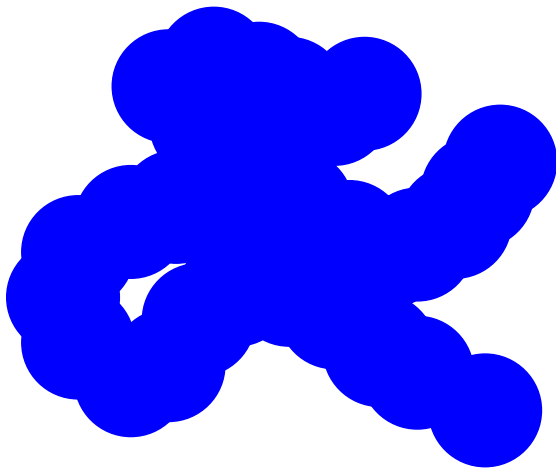
## Example: expanding balls



$$\dim(H_0) = 1$$

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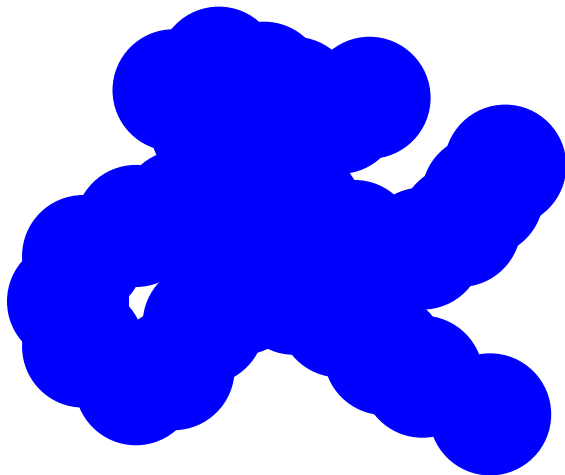
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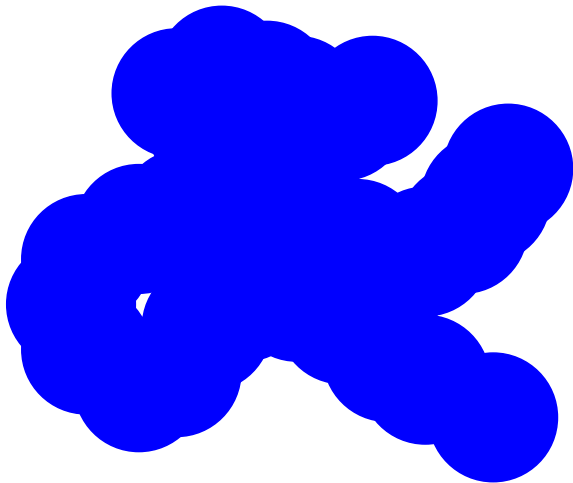
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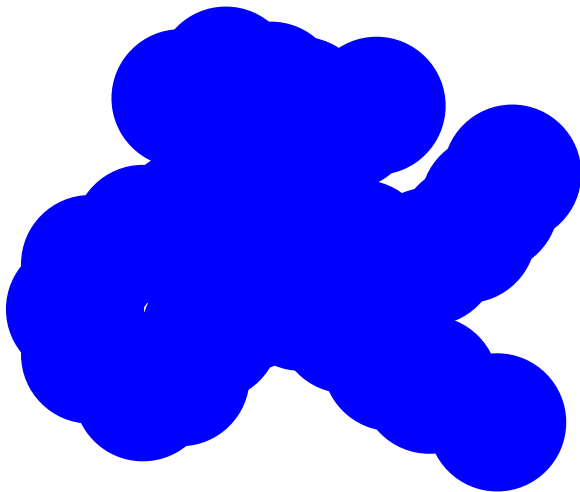
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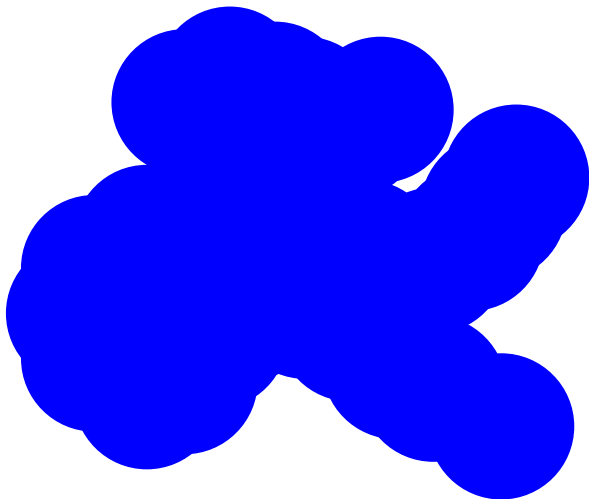
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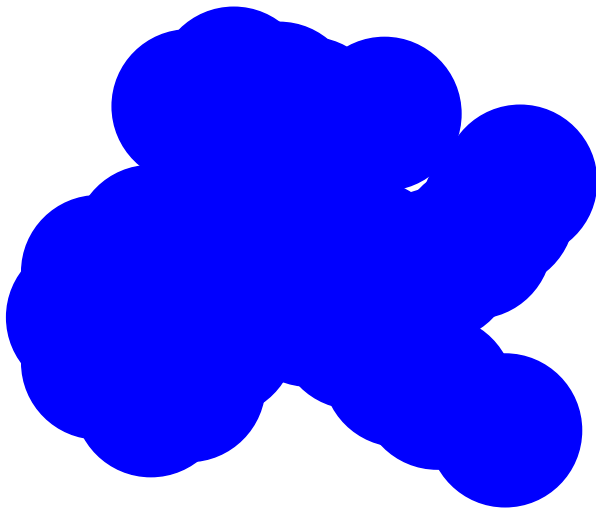
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$$\dim(H_0) = 1$$

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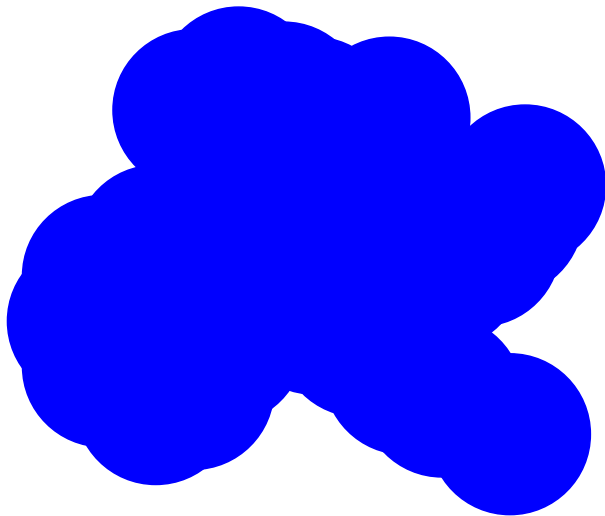
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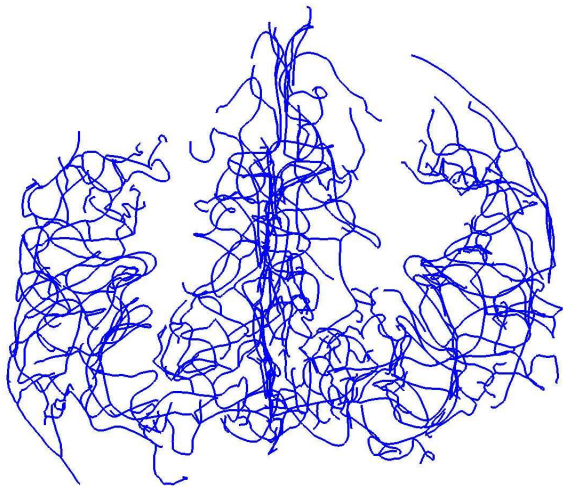
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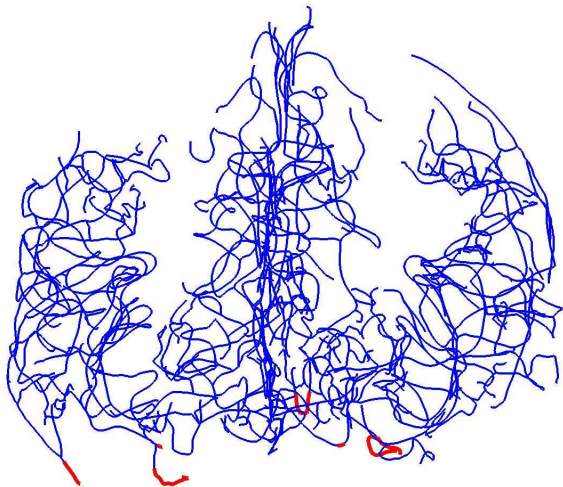
## Example: filling brains [w/Bendich, Marron, Pieloch, Skwerer]

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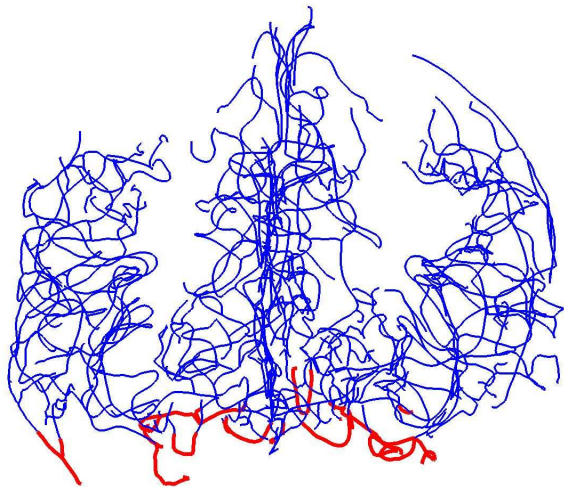
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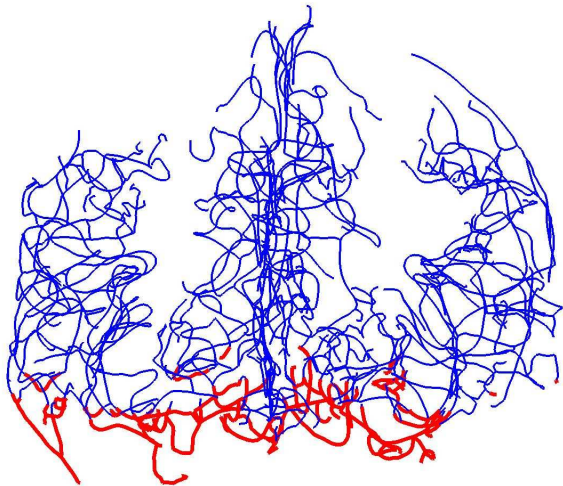
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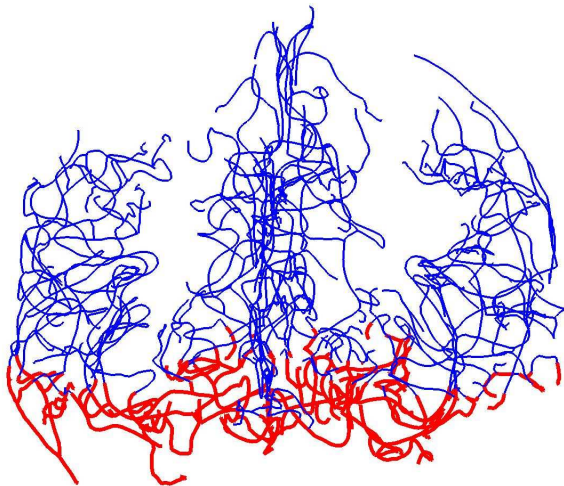
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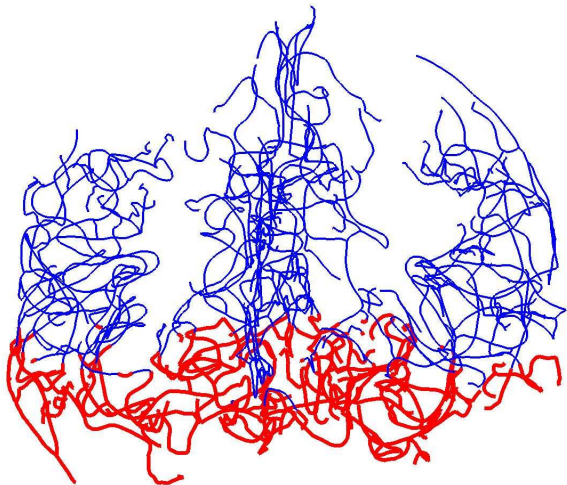
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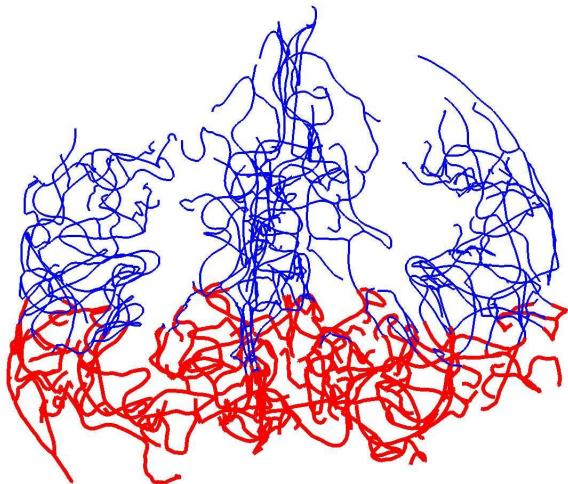
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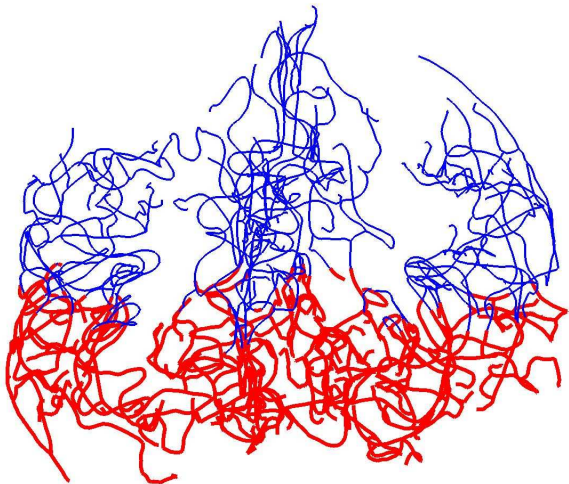
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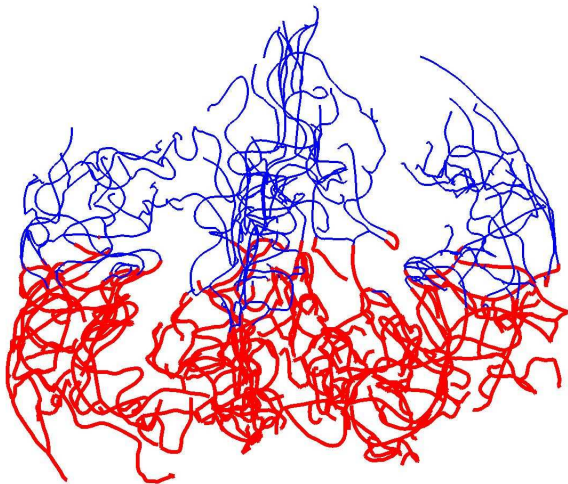
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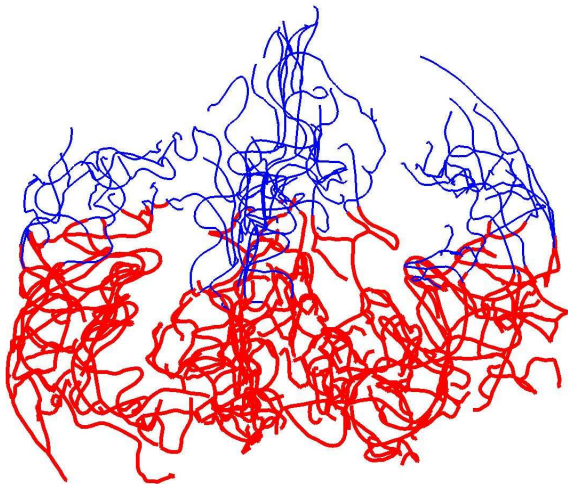
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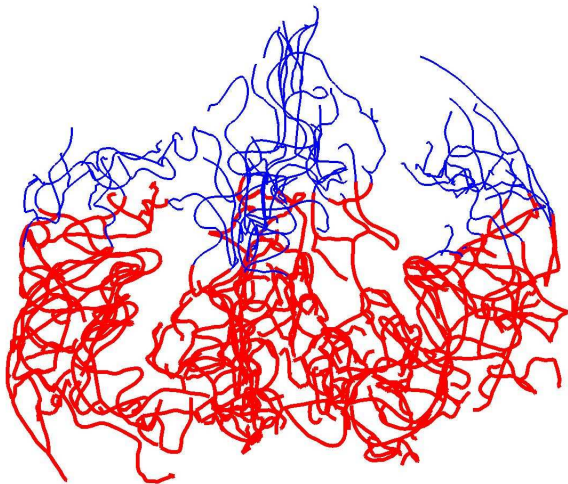
## Example: filling brains [w/Bendich, Marron, Pieloch, Skwerer]

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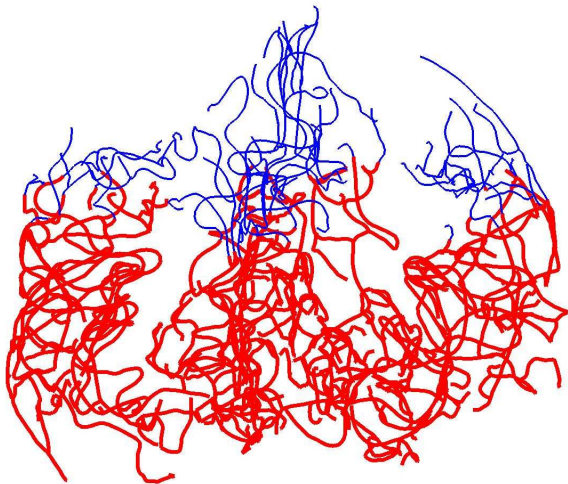
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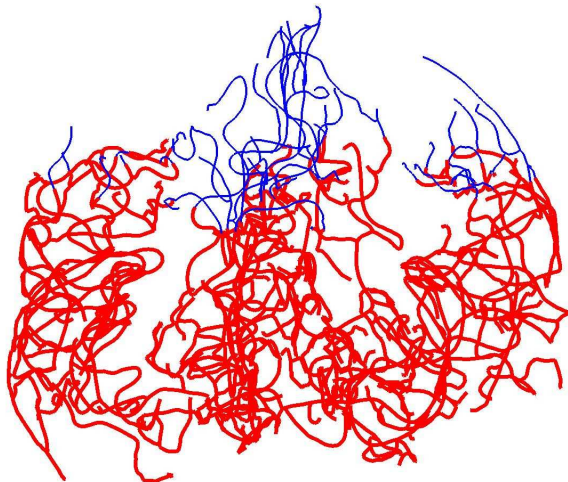
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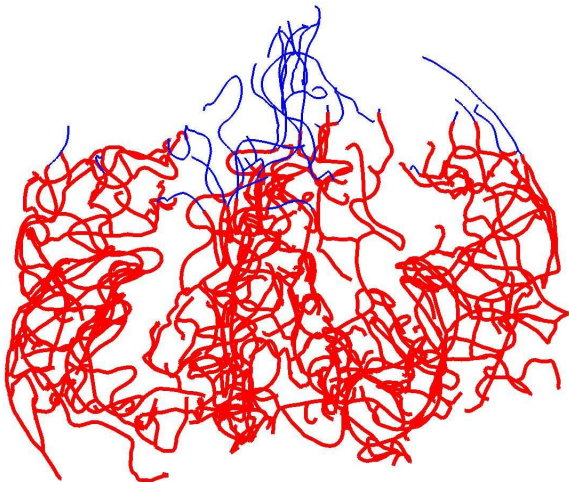
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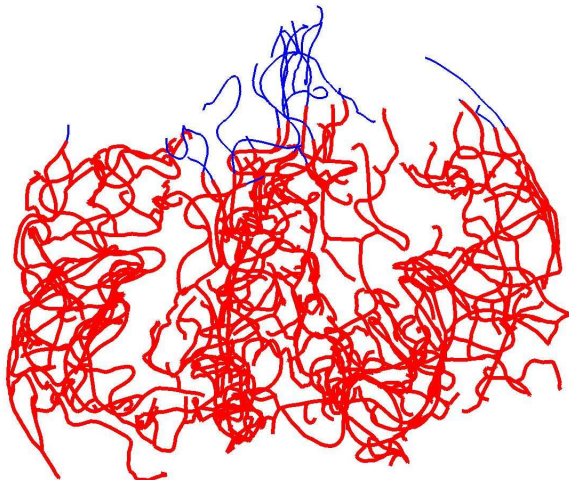
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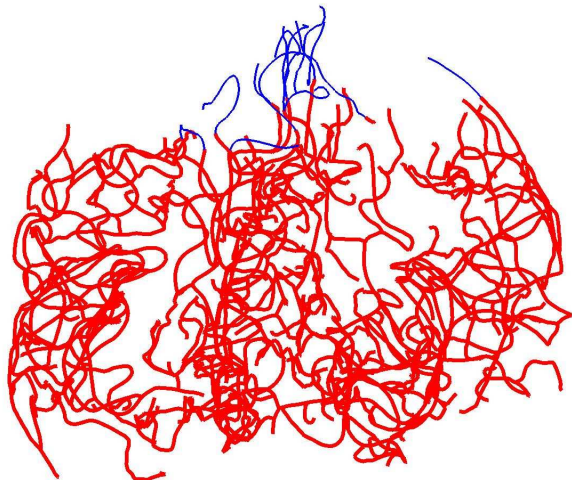
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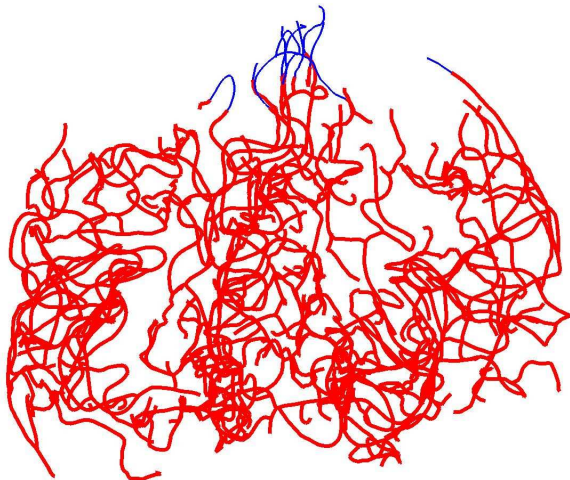
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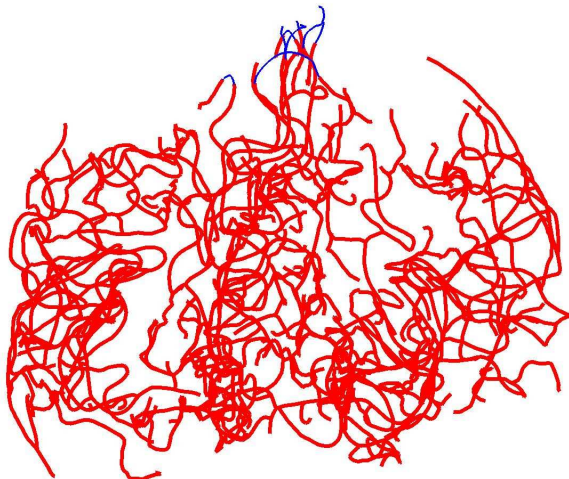
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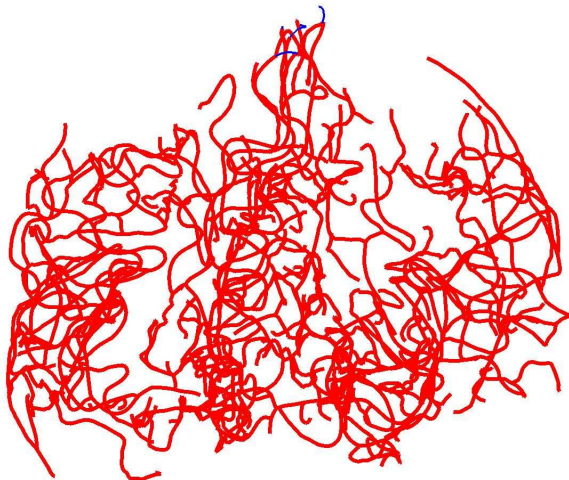
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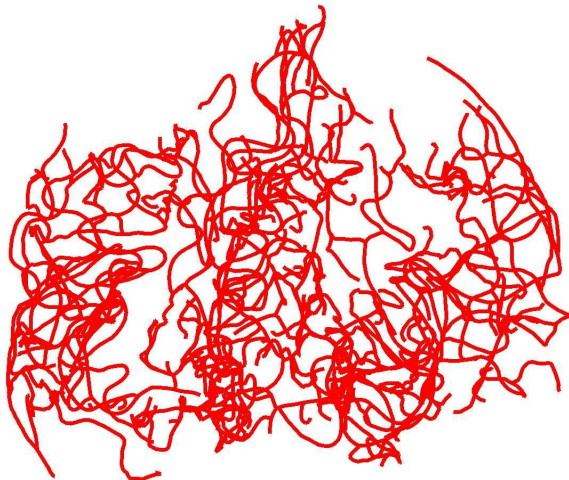
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---



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---



# Persistent homology

**Input.** Topological space  $X$  filtered by set  $Q$  of subspaces:  $X_q \subseteq X$  for  $q \in Q$   
 $\Rightarrow Q$  is a partially ordered set:  $X_q \subseteq X_{q'} \Leftrightarrow q \preceq q'$

**Def.**  $\{X_q\}_{q \in Q}$  has **persistent homology**  $\{H_q = H(X_q; \mathbb{k})\}_{q \in Q}$ . This is a

**Def.**  **$Q$ -module** over the poset  $Q$ :

- family  $M = \{M_q\}_{q \in Q}$  of vector spaces over the field  $\mathbb{k}$  with
- homomorphism  $M_q \rightarrow M_{q'}$  whenever  $q \preceq q'$  in  $Q$  such that
- $M_q \rightarrow M_{q''}$  equals the composite  $M_q \rightarrow M_{q'} \rightarrow M_{q''}$  whenever  $q \preceq q' \preceq q''$

## Examples

- points in  $\mathbb{R}^n$ :  $Q = \{0, \dots, m\}$  or  $\mathbb{R}$  1-parameter (“ordinary”) persistence
- brain arteries:  $Q = \{0, \dots, m\}$  or  $\mathbb{R}$  1-parameter (“ordinary”) persistence
- wing veins:  $Q = \mathbb{Z}^2$  or  $\mathbb{R}^2$  2 discrete or continuous parameters
- probability distributions:  $Q = \mathbb{R}^2$  2 continuous parameters
- $Q = \mathbb{Z}^n \Leftrightarrow M = \mathbb{Z}^n$ -graded  $\mathbb{k}[x_1, \dots, x_n]$ -module
- $Q = \mathbb{R}^n \Leftrightarrow M = \mathbb{R}^n$ -graded  $\mathbb{k}[\mathbb{R}_+^n]$ -module

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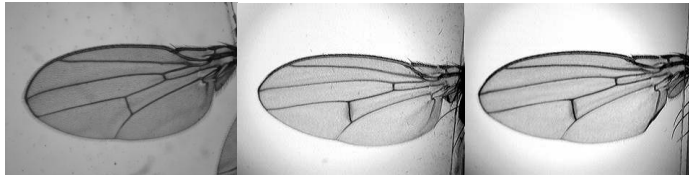
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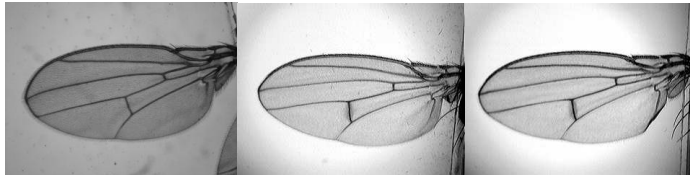
# Fruit fly wings

Normal fly wings [images from David Houle's lab]:

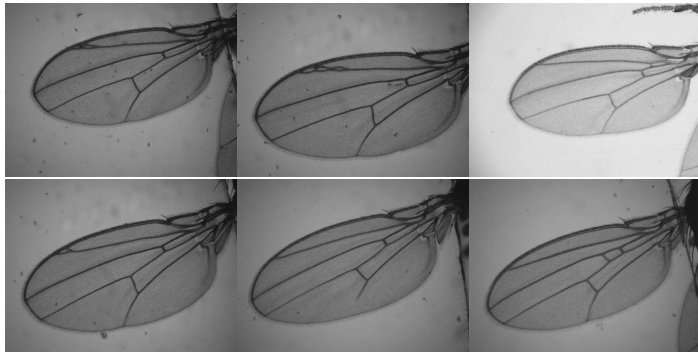


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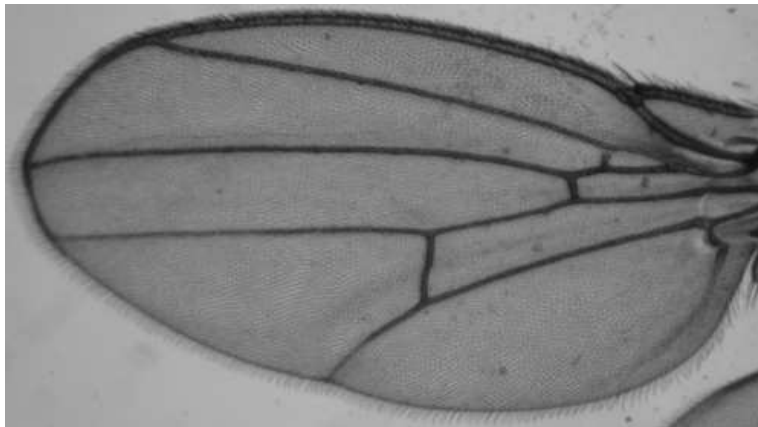


Topologically abnormal veins:



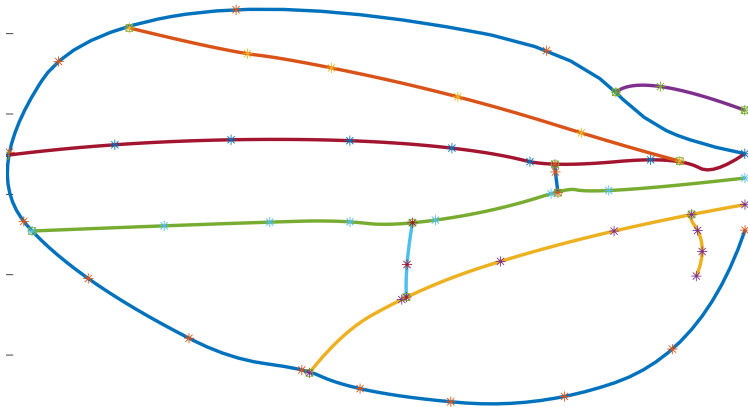
# Fruit fly wings

photographic image



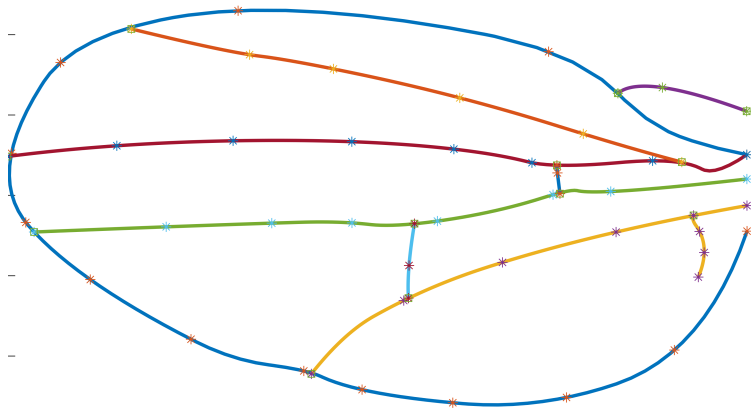
# Fruit fly wings

spline



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spline

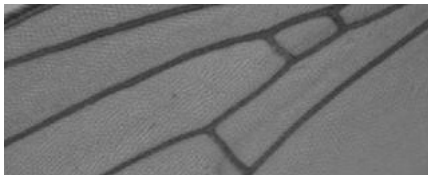


**Hypothesis.** Topological novelty arises when directional selection pushes continuous variation in a developmental program beyond a certain threshold.

# Example: wing vein persistence [w/Houle, Thomas, Beriwal]

**Example 1.** Encode fruit fly wing with 2-parameter persistence

- **1st parameter:** distance from vertex set
- **2nd parameter:** distance from edge set



Sublevel set  $W_{r,s}$  is **near edges** but **far from vertices**

**Multiscale summary.** Set  $H_{r,s} = H_0(W_{r,s})$  or  $H_1(W_{r,s})$

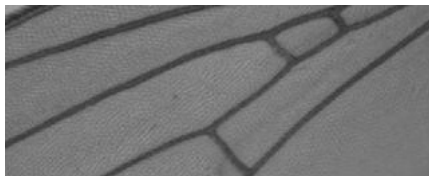
$\mathbb{Z}^2$ -module:

$$\begin{array}{ccccc}
 & \uparrow & & \uparrow & & \uparrow & \\
 \rightarrow & H_{r-\varepsilon, s+\delta} & \rightarrow & H_{r, s+\delta} & \rightarrow & H_{r+\varepsilon, s+\delta} & \rightarrow \\
 & \uparrow & & \uparrow & & \uparrow & \\
 \rightarrow & H_{r-\varepsilon, s} & \rightarrow & H_{r, s} & \rightarrow & H_{r+\varepsilon, s} & \rightarrow \\
 & \uparrow & & \uparrow & & \uparrow & \\
 \rightarrow & H_{r-\varepsilon, s-\delta} & \rightarrow & H_{r, s-\delta} & \rightarrow & H_{r+\varepsilon, s-\delta} & \rightarrow \\
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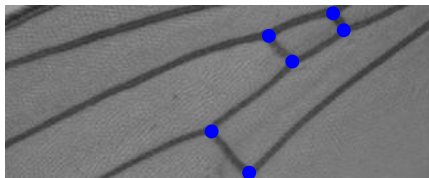
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 & \uparrow & & \uparrow & & \uparrow & \\
 \rightarrow & H_{r-\varepsilon, s+\delta} & \rightarrow & H_{r, s+\delta} & \rightarrow & H_{r+\varepsilon, s+\delta} & \rightarrow \\
 & \uparrow & & \uparrow & & \uparrow & \\
 \rightarrow & H_{r-\varepsilon, s} & \rightarrow & H_{r, s} & \rightarrow & H_{r+\varepsilon, s} & \rightarrow \\
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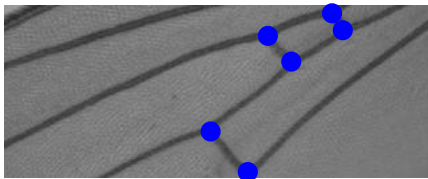
$$\begin{array}{ccccc}
 & \uparrow & & \uparrow & & \uparrow & \\
 \rightarrow & H_{r-\varepsilon, s+\delta} & \rightarrow & H_{r, s+\delta} & \rightarrow & H_{r+\varepsilon, s+\delta} & \rightarrow \\
 & \uparrow & & \uparrow & & \uparrow & \\
 \rightarrow & H_{r-\varepsilon, s} & \rightarrow & H_{r, s} & \rightarrow & H_{r+\varepsilon, s} & \rightarrow \\
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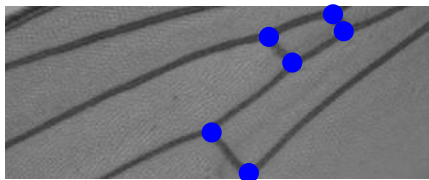
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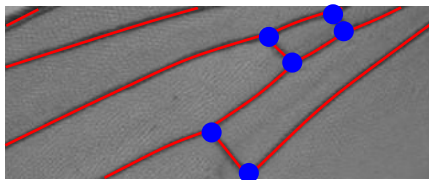
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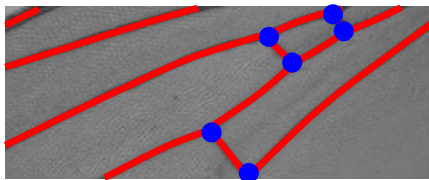
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 & \uparrow & & \uparrow & & \uparrow & \\
 \rightarrow & H_{r-\varepsilon, s+\delta} & \rightarrow & H_{r, s+\delta} & \rightarrow & H_{r+\varepsilon, s+\delta} & \rightarrow \\
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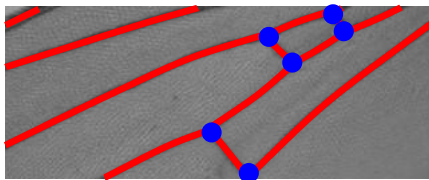
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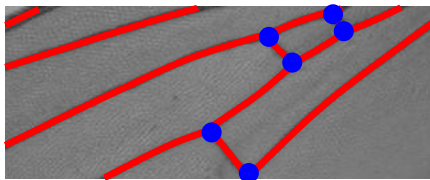
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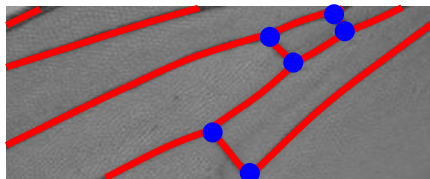
$\mathbb{Z}^2$ -module:

$$\begin{array}{ccccc}
 & \uparrow & & \uparrow & & \uparrow & \\
 \rightarrow & H_{-r-\epsilon, s+\delta} & \rightarrow & H_{r, s+\delta} & \rightarrow & H_{r+\epsilon, s+\delta} & \rightarrow \\
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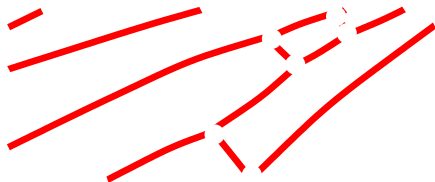
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 & & \uparrow & & \uparrow & & \uparrow \\
 \rightarrow & H_{r-\varepsilon, s+\delta} & \rightarrow & H_{r, s+\delta} & \rightarrow & H_{r+\varepsilon, s+\delta} & \rightarrow \\
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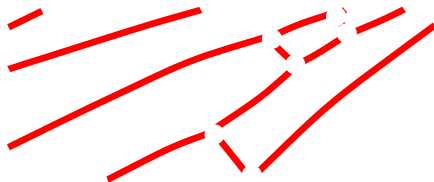
$$\begin{array}{ccccccc}
 & & \uparrow & & \uparrow & & \uparrow \\
 \rightarrow & H_{r-\epsilon, s+\delta} & \rightarrow & H_{r, s+\delta} & \rightarrow & H_{r+\epsilon, s+\delta} & \rightarrow \\
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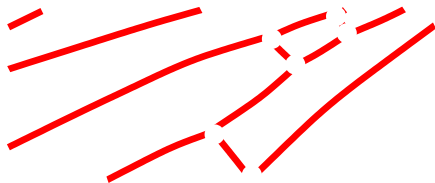
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Sublevel set  $W_{r,s}$  is near edges but far from vertices

Multiscale summary. Set  $H_{r,s} = H_0(W_{r,s})$  or  $H_1(W_{r,s})$

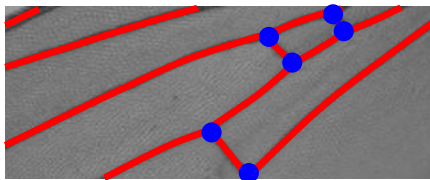
$\mathbb{Z}^2$ -module:

$$\begin{array}{ccccccc}
 & & \uparrow & & \uparrow & & \uparrow \\
 \rightarrow & H_{r-\epsilon, s+\delta} & \rightarrow & H_{r, s+\delta} & \rightarrow & H_{r+\epsilon, s+\delta} & \rightarrow \\
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 \end{array}$$

# Example: wing vein persistence [w/Houle, Thomas, Beriwal]

**Example 1.** Encode fruit fly wing with 2-parameter persistence

- **1st parameter:** distance from vertex set (require distance  $\geq -r$ )
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**Input.** Topological space  $X$  filtered by set  $Q$  of subspaces:  $X_q \subseteq X$  for  $q \in Q$   
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- points in  $\mathbb{R}^n$ :  $Q = \{0, \dots, m\}$  or  $\mathbb{R}$  1-parameter (“ordinary”) persistence
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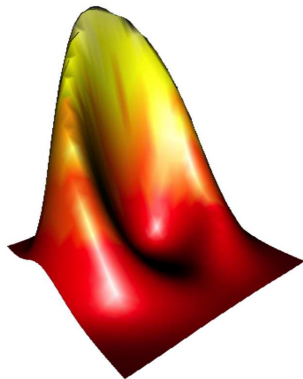
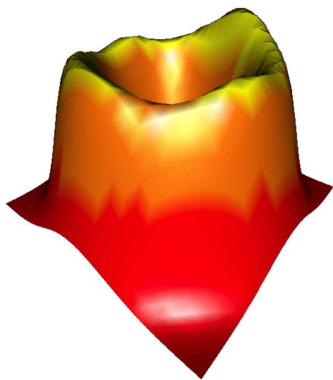
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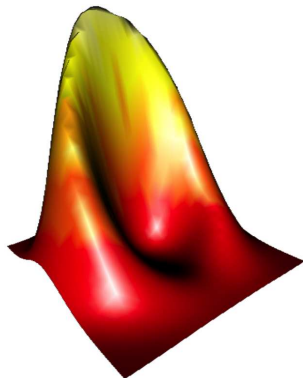
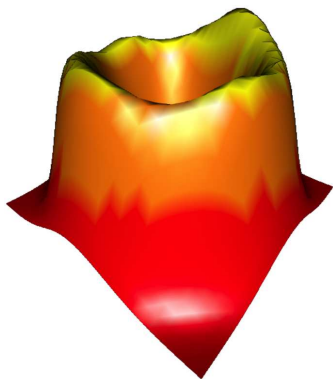
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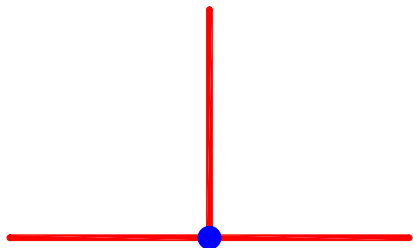
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## Example: toy model fly wings



A piece of fly wing vein

$\rightsquigarrow$

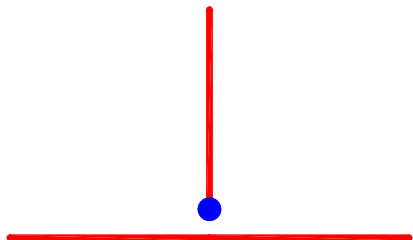


The  $(r, s)$ -plane  $\mathbb{R}^2$

### Observations

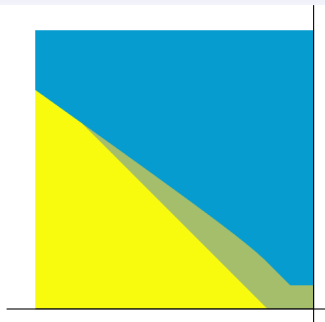
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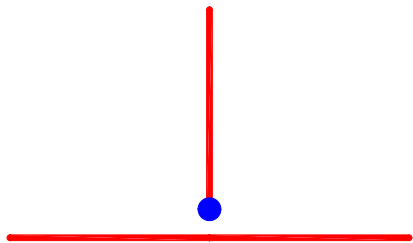


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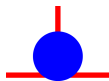
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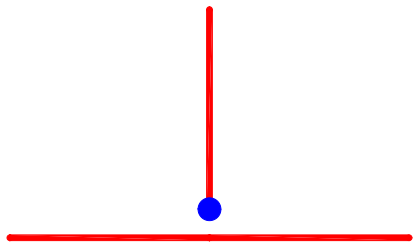


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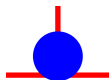
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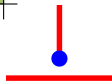


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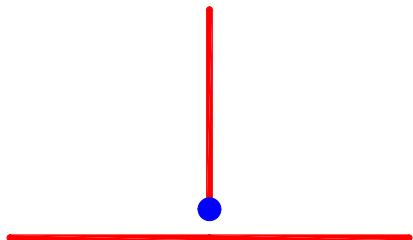
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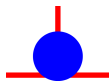
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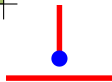


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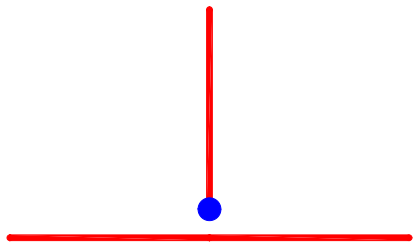
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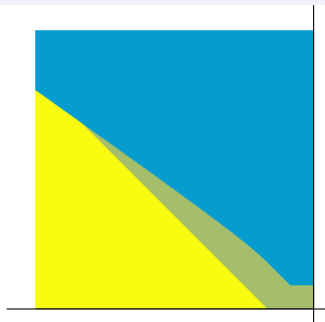
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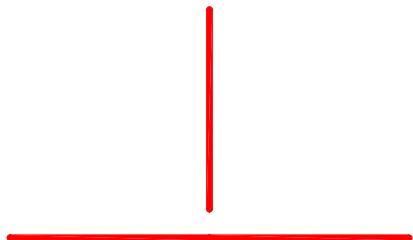
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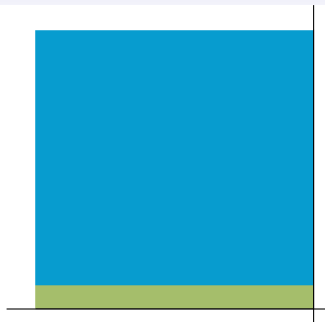


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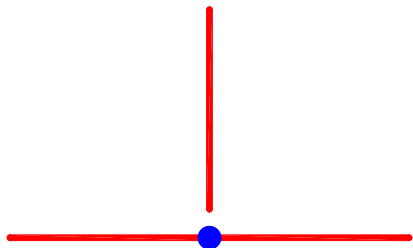


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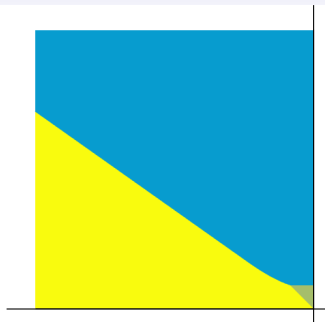
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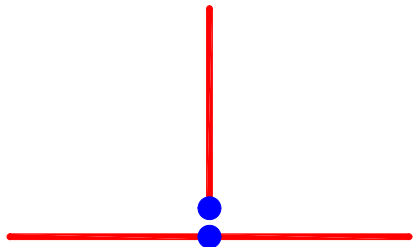


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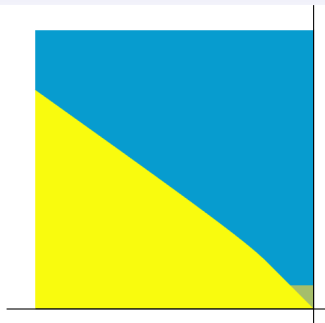
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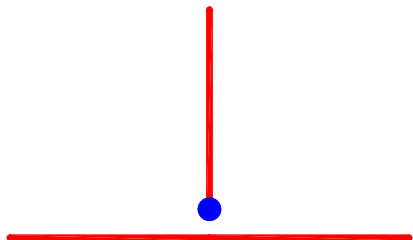


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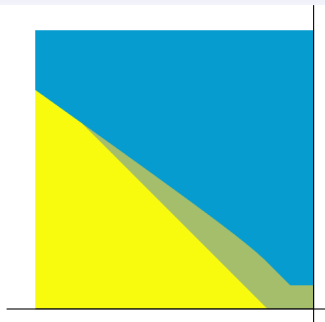
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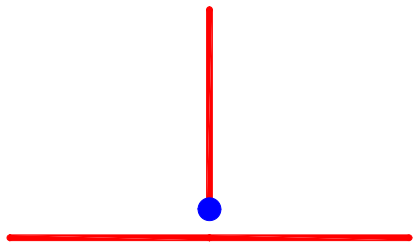


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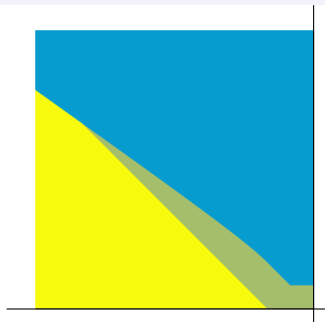
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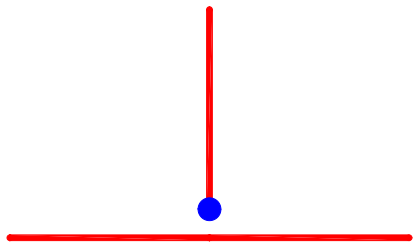


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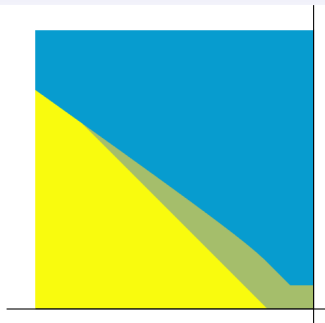
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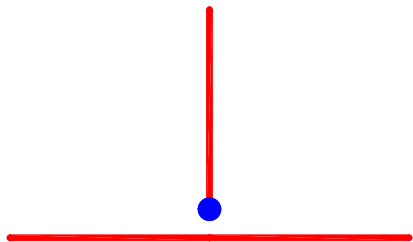


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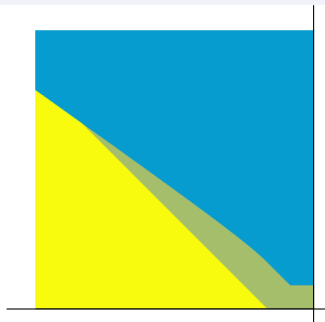
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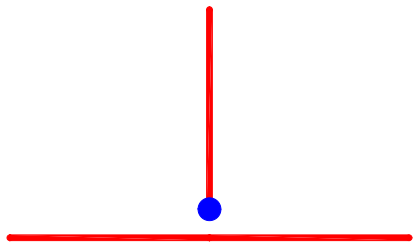


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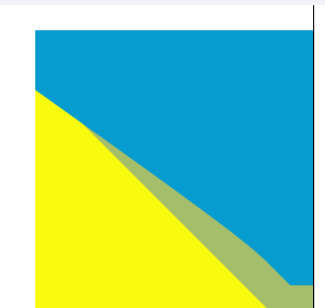
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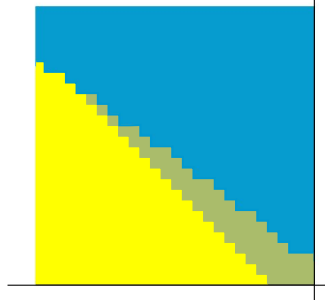
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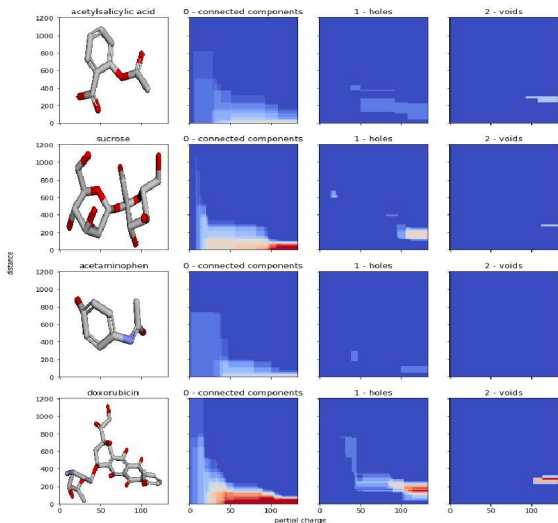
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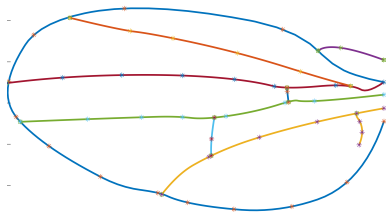


# Example: molecular screening [Keller, Lesnick, Willke 2018]

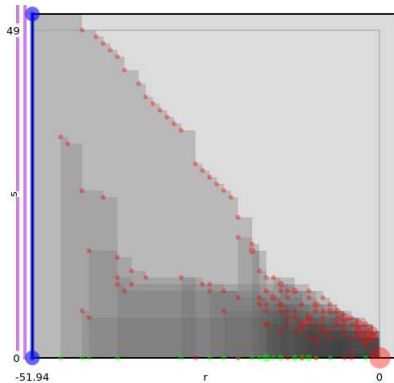


Output computed by RIVET [Lesnick–Wright 2015–]

# Example: fly wings, fully discretized



$\rightsquigarrow$



spline

RIVET output

slow pipeline (spline  $\rightsquigarrow$  RIVET output)

want instead:

- direct description of algebraic boundary curves for
- parallel computation—or better, single preprocessing step

# Intervals in posets

Thm [Crawley–Boevey 2012].  $\mathbb{R}$ -module  $M \Rightarrow M \cong \bigoplus_{I \in \mathcal{I}} \mathbb{k}[I]$  with  $\mathcal{I}$  a set of intervals

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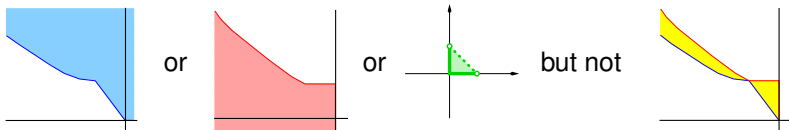
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## Examples

- In  $\mathbb{R}^2$ :



- In  $\mathbb{R}^3$ :

# Intervals in posets

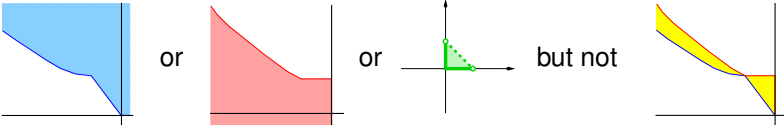

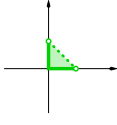
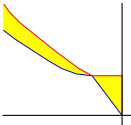
Thm [Crawley–Boevey 2012].  $\mathbb{R}$ -module  $M \Rightarrow M \cong \bigoplus_{I \in \mathcal{I}} \mathbb{k}[I]$  with  $\mathcal{I}$  a set of intervals

Def. An **interval**  $I$  in a poset  $Q$  is a **convex connected** subset:  $a, b \in I \Rightarrow$

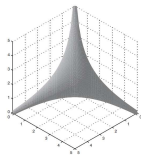
- $q \in I$  whenever  $a \preceq q \preceq b$  and
- there is a (zigzag) chain in  $I$  of comparable elements from  $a$  to  $b$ .

For any subset  $S \subseteq Q$ , let  $\mathbb{k}[S] = \{\mathbb{k}_s\}_{s \in S}$ .

## Examples

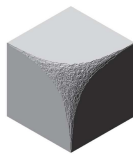
- In  $\mathbb{R}^2$ :  or  or  but not 

- In  $\mathbb{R}^3$ :



semialgebraic

or



piecewise linear

# Intervals in posets

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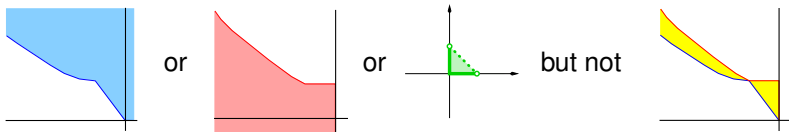
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- In  $\mathbb{R}^2$ :



## However:

Thm fails in multiple parameters [Carlsson–Zomorodian 2009]

- every module  $\cong \bigoplus$  indecomposables [Botnan–Crawley-Boevey 2020]
- indecomposable is arbitrarily worse than interval [Buchet–Escobar 2018]

# Functorial endpoints over $\mathbb{R}$

$\mathbb{R}$ -module interval decomposition works up to isomorphism:

*“Bases can be chosen so that . . .”*

but not in multipersistence  $\Rightarrow$  crucial to extract endpoints functorially.

## Right endpoint

- is a basis element for something, so
- look for “subspace of right endpoints”

**Closed** right endpoint at  $a \in \mathbb{R}$

- element in  $M_a$  that dies when pushed up to  $M_{>a}$
- submodule  $\mathbb{k}_a \subseteq M$

**Def.**  $\text{Hom}(\mathbb{k}_a, M) = \sum(\text{submodules } \mathbb{k}_a \subseteq M)$   
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- $\varinjlim_{a' < a} M_{a'}$  picture:

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## Finite endpoints: unify

- **upper boundary**  $\mathbb{R}$ -module  $\delta M = \bigoplus \delta^\sigma M$ , the sum over faces  $\sigma$  of cone  $\mathbb{R}_+$
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- submodule  $\mathbb{k}[a + \mathbb{R}_+]$  for any  $a \gg 0$
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- submodule  $\mathbb{k}[a + \mathbb{R}_+] \supseteq \mathbb{k}[a' + \mathbb{R}_+]$  for any  $a \leq a' \leftrightarrow$  same  $\infty$ -endpoint
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## Note. $H \rightsquigarrow H_{\mathbb{R}_+}$

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## Def. $H \rightsquigarrow H_{\mathbb{R}_+}/\mathbb{R}$ is **quotient-restriction**.

# Functorial endpoints over $\mathbb{R}$

## Finite endpoints: unify

- **upper boundary**  $\mathbb{R}$ -module  $\delta M = \bigoplus \delta^\sigma M$ , the sum over faces  $\sigma$  of cone  $\mathbb{R}_+$
- has natural maps  $\delta^{\mathbb{R}_+} M \rightarrow \delta^{\{0\}} M \rightarrow 0$ ;
- take kernels of these and closed socles  $\underline{\text{Hom}}(\mathbb{k}, -) = \bigoplus_a \text{Hom}(\mathbb{k}_a, -)$
- $\rightsquigarrow$  finite endpoint vector spaces: open in  $\delta^{\mathbb{R}_+} M$  and closed in  $M = \delta^{\{0\}} M$

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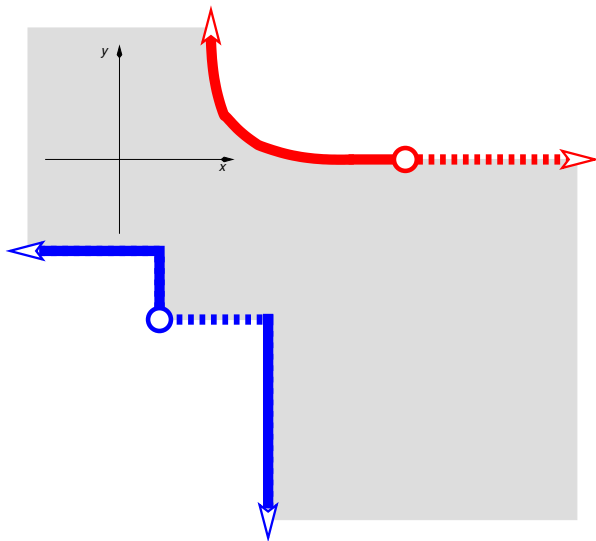
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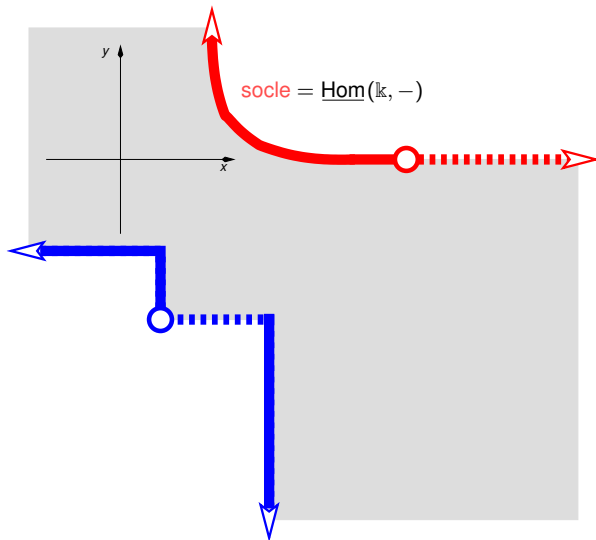
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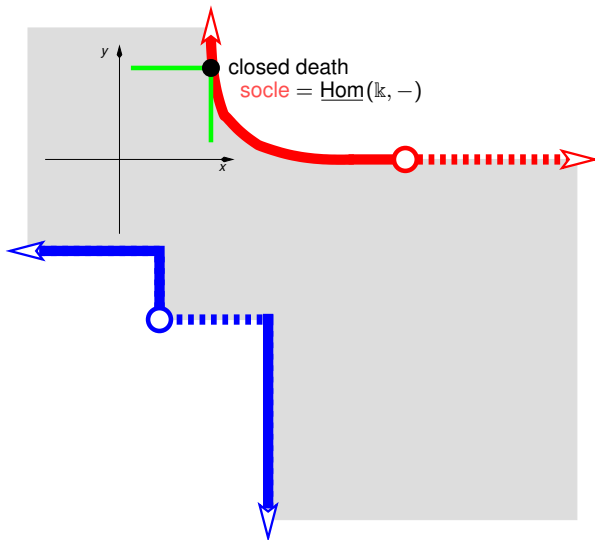
# Socles in multiple parameters



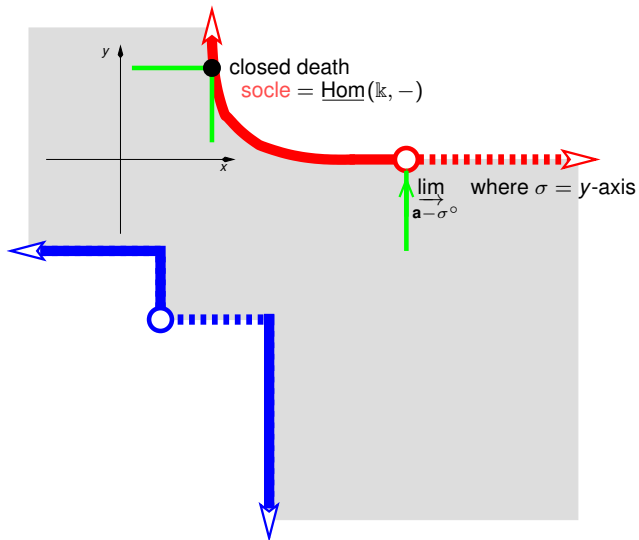
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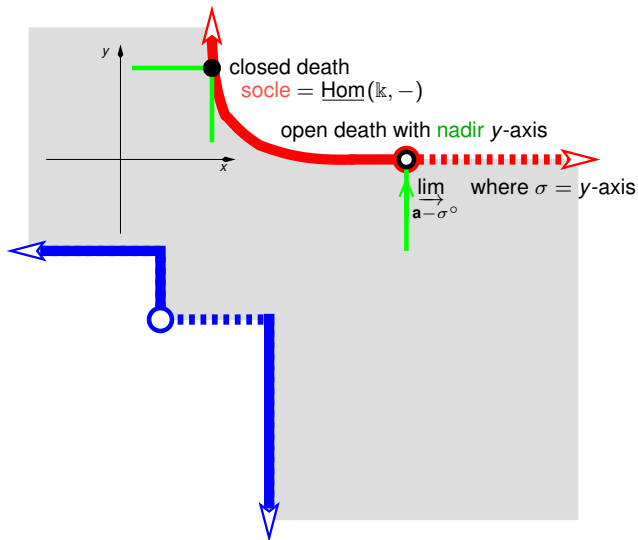
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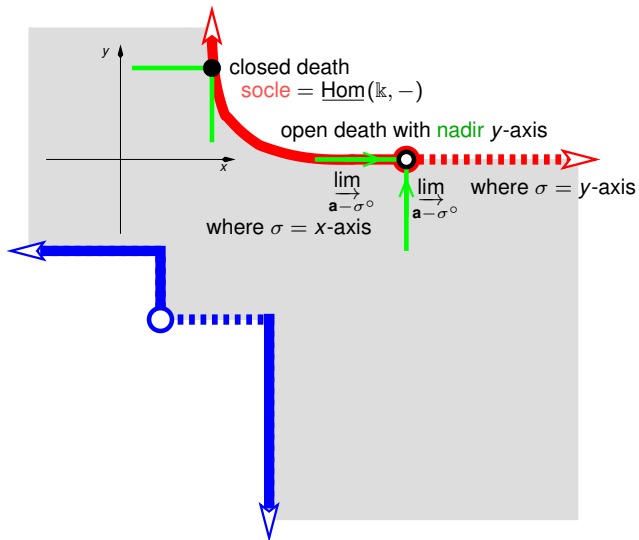
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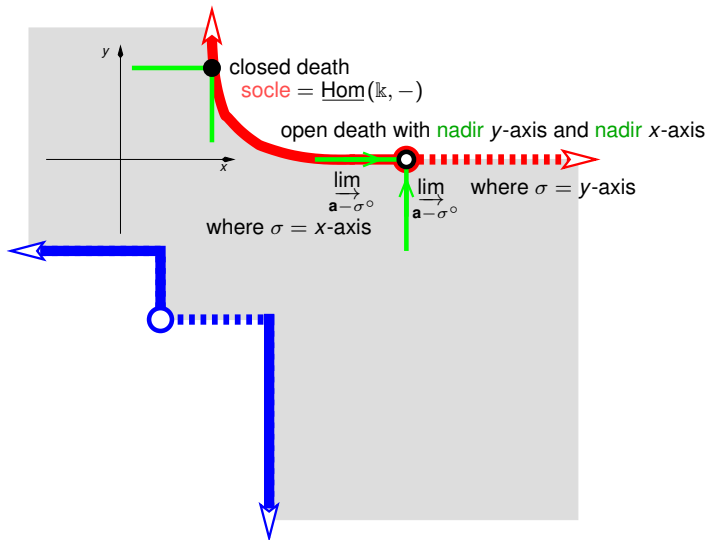
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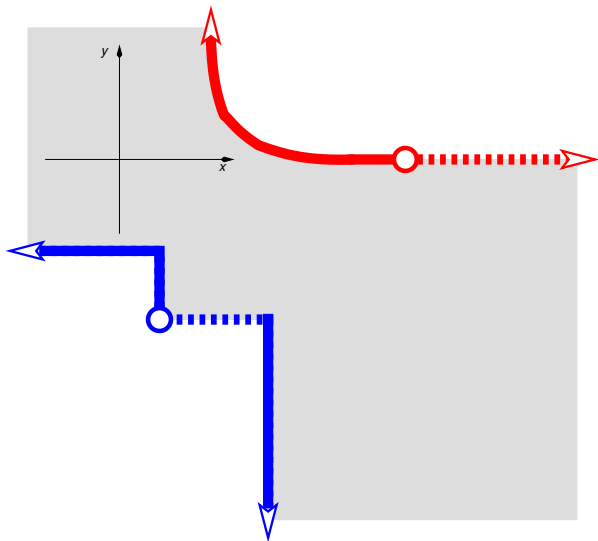


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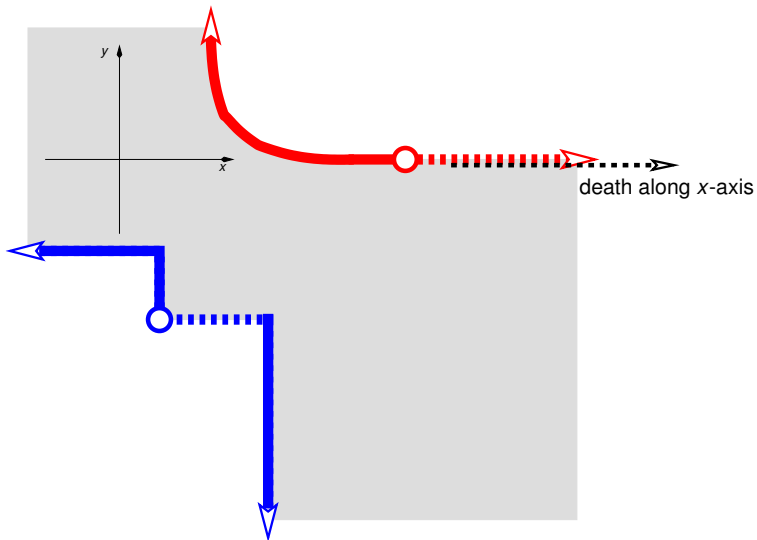




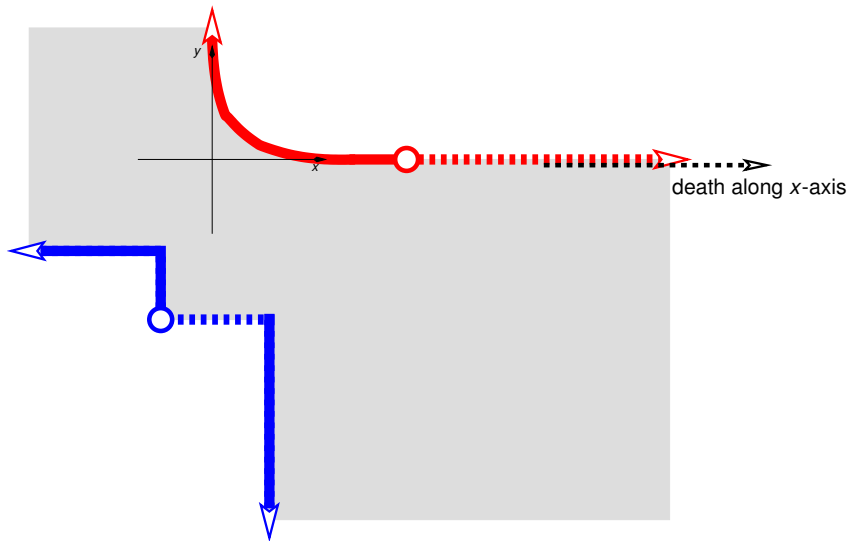
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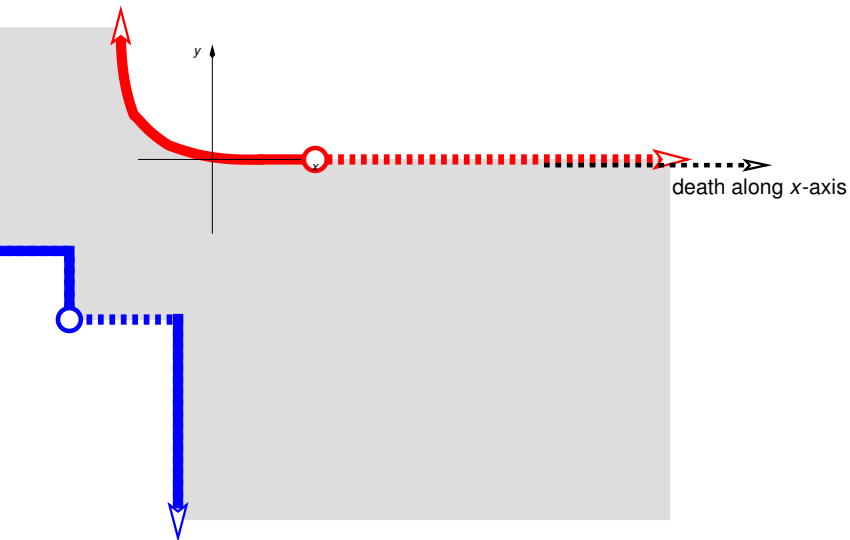
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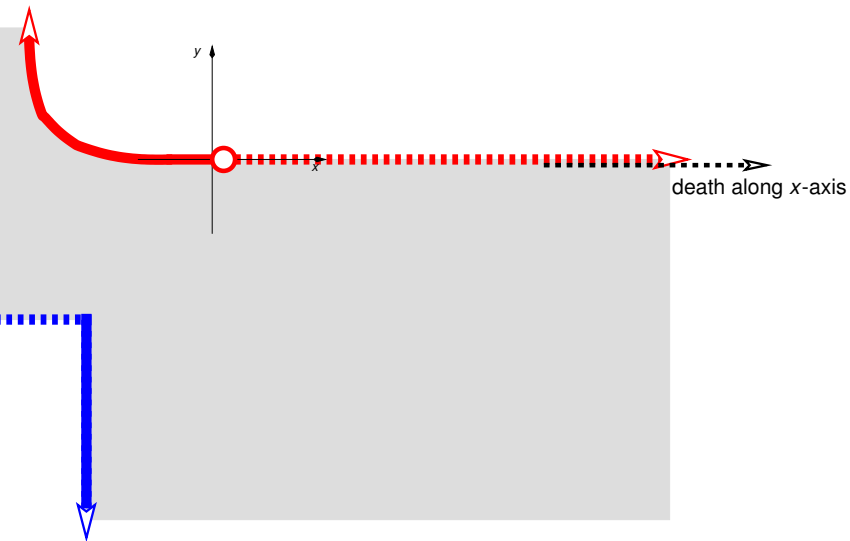
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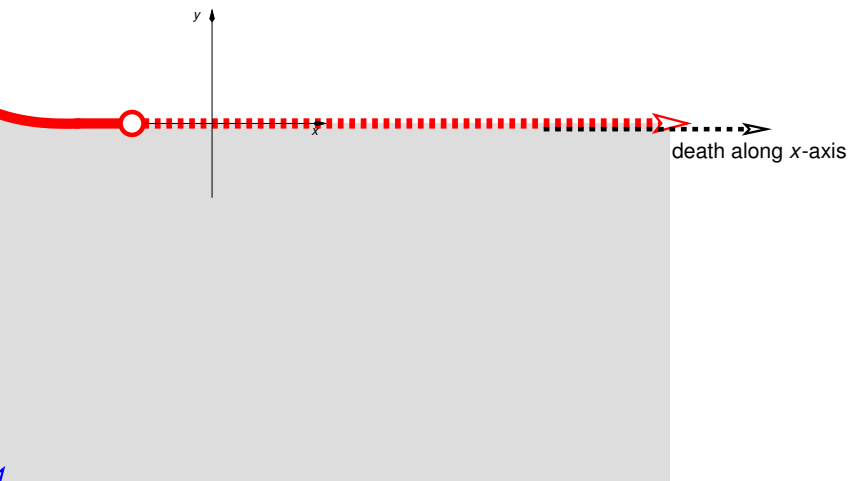
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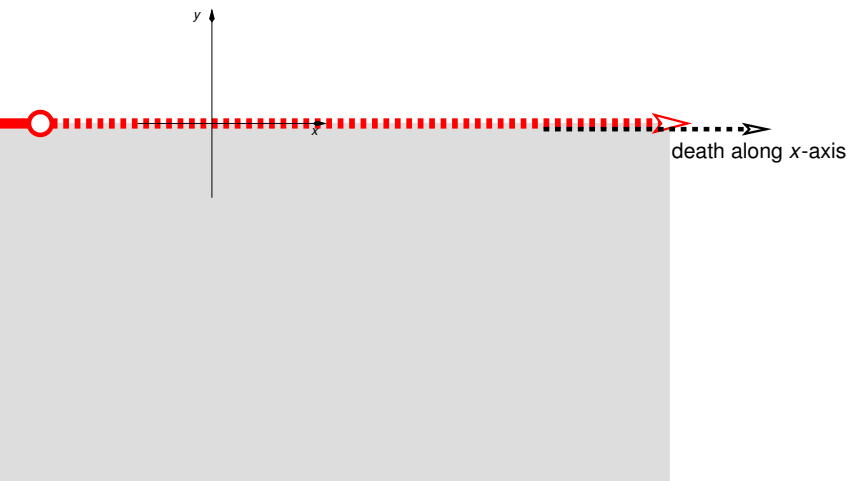
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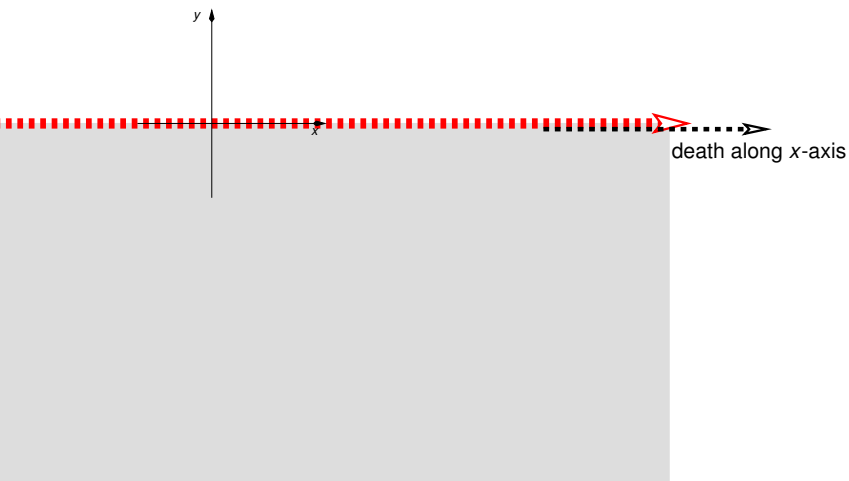
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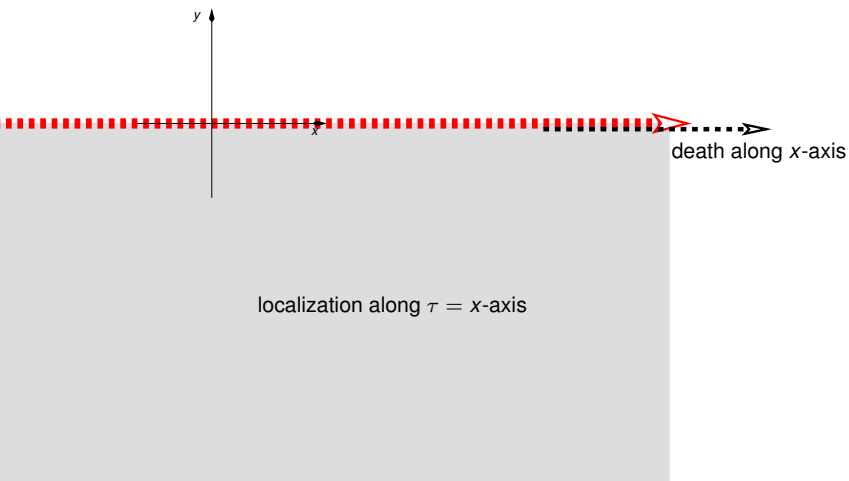


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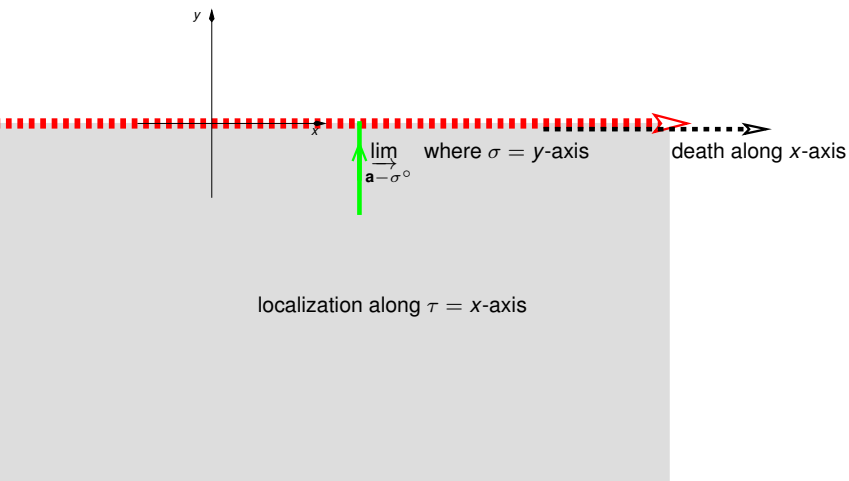




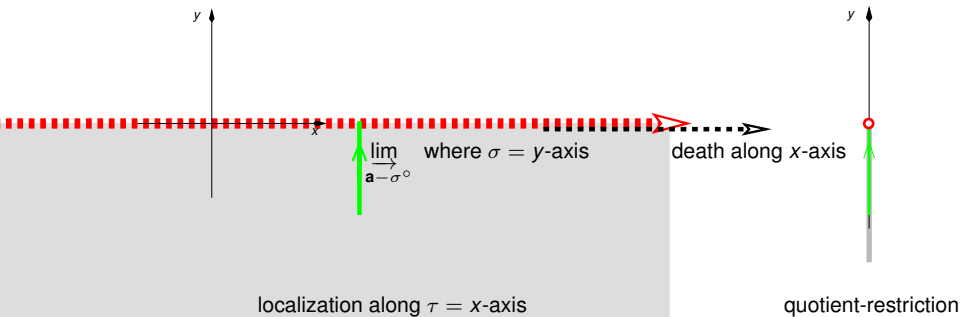
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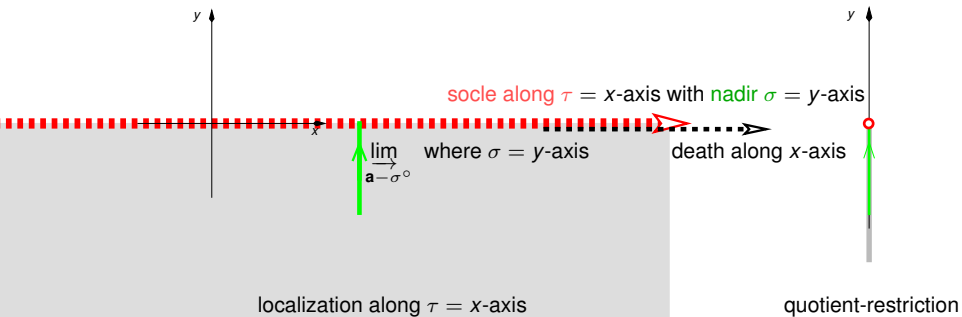
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**Def.** Fix a face  $\sigma$  of the cone  $\mathbb{R}_+^n$ . The **upper boundary** of  $M$  **atop**  $\sigma$  is the  $\mathbb{R}^n$ -module  $\delta^\sigma M$  whose fiber over  $\mathbf{a} \in \mathbb{R}^n$  is the vector space

$$(\delta^\sigma M)_{\mathbf{a}} = M_{\mathbf{a}-\sigma} = \lim_{\mathbf{a}' \in \mathbf{a}-\sigma^\circ} M_{\mathbf{a}'}$$

**Def.** Fix a face  $\tau$  of the cone  $\mathbb{R}_+^n$ .

- Let  $\nabla_\tau =$  poset of faces containing  $\tau$ .
- The **upper boundary** of  $M$  **along**  $\tau$  is the  $(\mathbb{R}_+^n \times \nabla_\tau)$ -module

$$\delta_\tau M = \bigoplus_{\sigma \in \nabla_\tau} \delta^\sigma M$$

**Def.** The **socle** of  $M$  **along**  $\tau$  is

$$\text{soc}_\tau M = \underline{\text{Hom}}_{\mathbb{R}_+ \times \nabla_\tau}(\mathbb{k}[\tau], \delta_\tau M) / \tau$$

- take upper boundary of  $M$  along various faces of  $\mathbb{R}_+^n$
- look for copies of  $\mathbb{k}[\tau]$  in there, as  $\mathbb{R}^n$ -modules
- ensure these copies can't be pushed down in face poset  $\nabla_\tau$
- take quotient-restriction along  $\tau$

# Comments on endpoints

**Left endpoints** are dual to right

- closed left: quotient module  $M \otimes \mathbb{k}_a = (M/M_{<a})_a$
- open left:  $\text{coker}\left(M_a \rightarrow \varprojlim_{a < a'} M_{a'}\right)$
- infinite left: quotient module  $\mathbb{k}[a - \mathbb{R}_+]$

**Question.** Is there a distinction between open and closed endpoints?

## Answers

- For metrics and distances, no: [Berkouk–Petit 2021]; cf. Berkouk’s talk at least for metrics based on  $\gamma$ -topology [Kashiwara–Schapira 2018–]
- But a module isn’t handed to you as "closed" or "open"; often, it turns out, it has closed left and open right endpoints (from free presentation or from  $\gamma$ -topology, for instance).
- Boundary components, present or not, crucial for derived category computation: module  $\rightsquigarrow$  concrete complex representing it.
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**Note.** Socles, minimal generators, resolutions, etc.: completely new fundamental commutative algebra of real-exponent polynomial rings.

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- nadir  $\sigma$ .

**To visualize:** Let  $\mathcal{O}(\mathbb{R}^n)$  be the poset of orthants in  $\mathbb{R}^n$  partially ordered by inclusion, where an **orthant** is a translate of  $\mathbb{R}_+^n$  missing a set of closed faces. Then  $B_M$  is a subposet of the disjoint union  $B_n = \bigcup_{\text{faces } \tau} \mathcal{O}(\mathbb{R}^n / \mathbb{R}\tau)$ .

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- $\mathbb{Z}^n$ -module  $M$  with  $\dim_{\mathbb{k}}(M) < \infty \Rightarrow QR(M)$  is essentially equivalent to the restriction of  $M$  to the *nondisjoint* union  $B_M \cup D_M \subseteq \mathbb{Z}^n$ .

**Thm.**  $M$  can be functorially recovered from its QR code.

**Pf.** Use socle and its dual notion of top to construct a fringe presentation.

# Applications

## 1. Direct computation with real parameters

- multipersistence often uses semialgebraic or even PL geometry
- Thm: QR codes inherit such geometry, plus tameness
- Current project: use this to implement semialgebraic computation
- potential payoff 1: single preprocessing step for many similar multipersistence computations; e.g., fly wings
- potential payoff 2: data structure for multipersistence is amenable to distance computation of the sort we typically see; in essence it thinks like Lebesgue instead of Riemann

## 2. Algorithmic indecomposable decomposition

- functorial reduction to QR codes  $\Rightarrow$  decompose QR codes
- birth-death perspective lends insight into how to extend [Dey–Xin 2018] to work for arbitrary birth and death degrees

## 3. Distances

- use just the endpoints, or
- "corresponding parts" of the endpoints, e.g. same associated prime (history or mortality type)



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Thank You