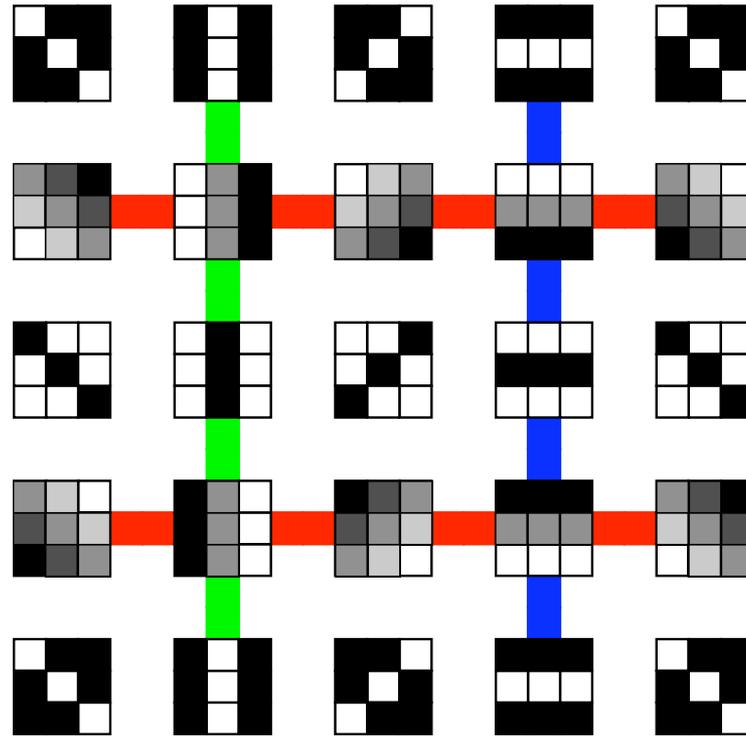


Applied Topology



Henry Adams

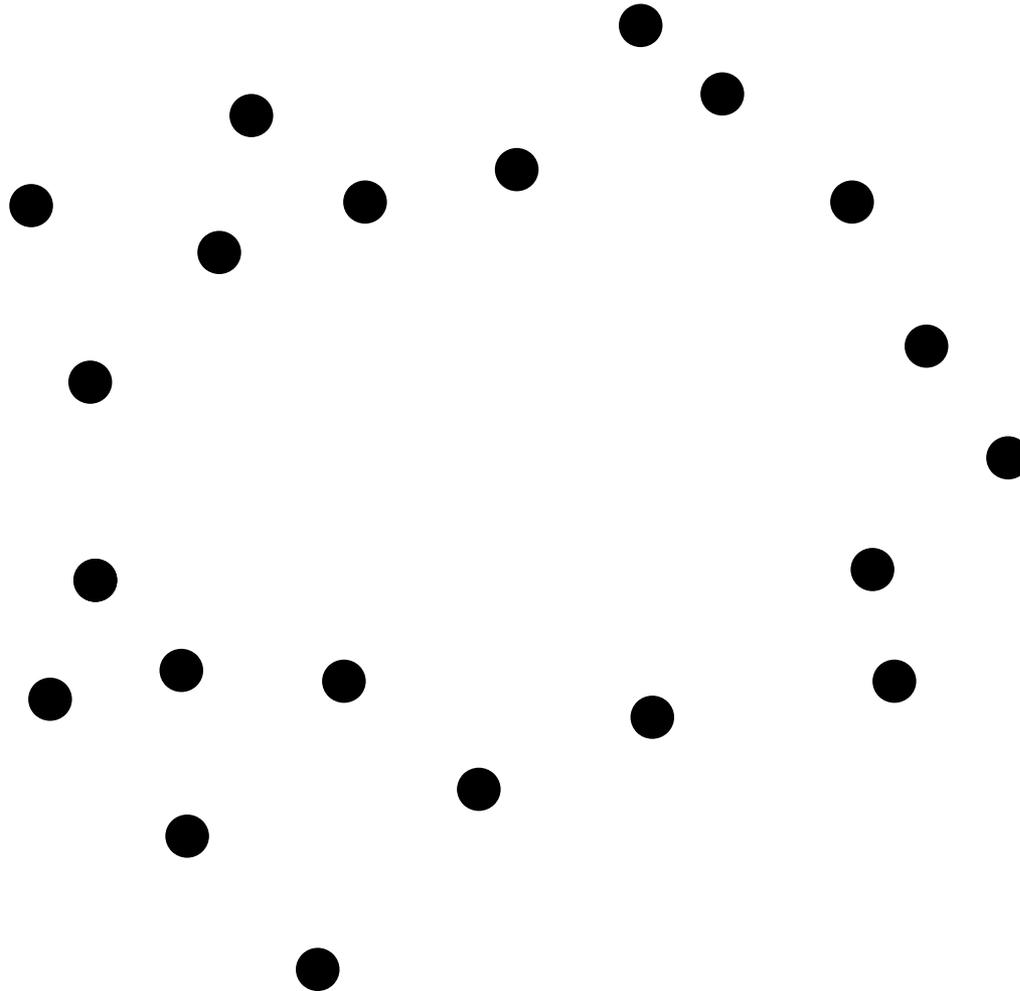
July 18, 2013

Stanford University Mathematics Camp



Datasets have shapes

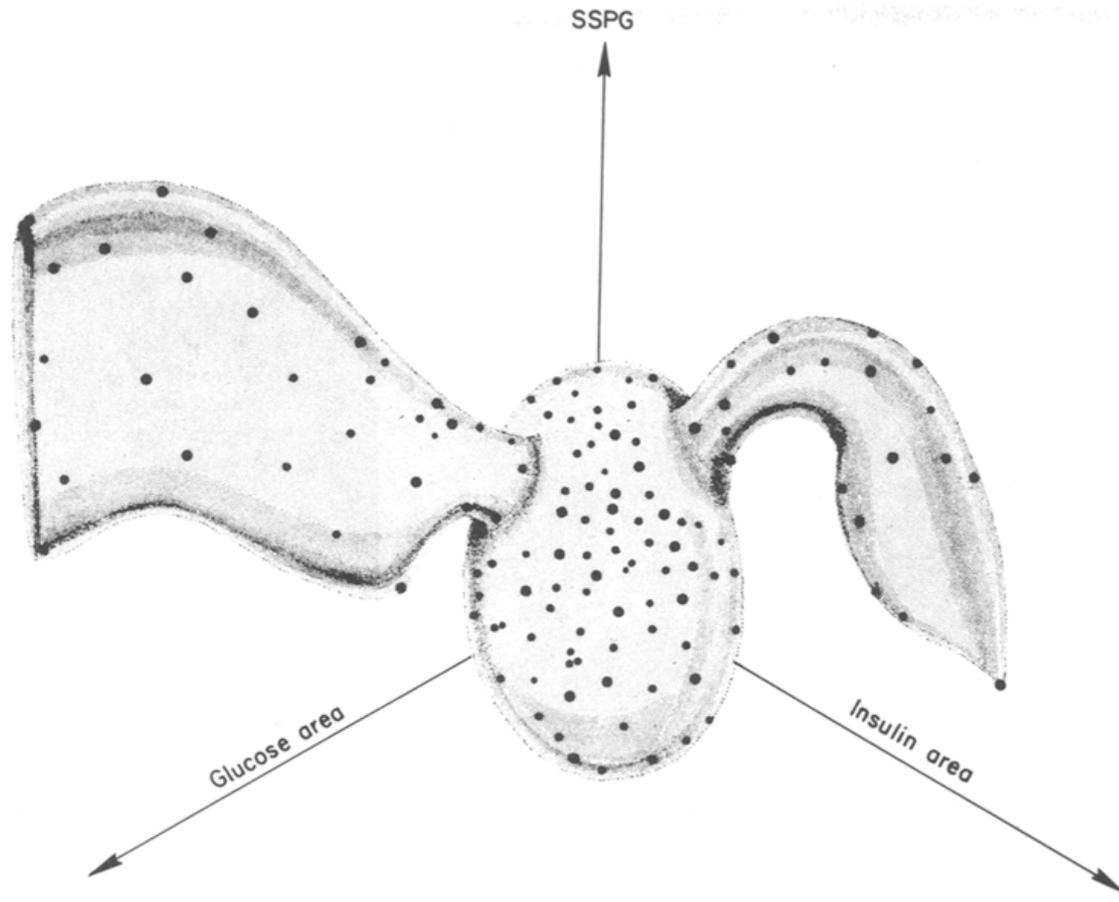
What shape is this?



Datasets have shapes

Example: Diabetes study

145 points in 5-dimensional space



An Attempt to Define the Nature of Chemical Diabetes Using a Multidimensional Analysis by G. M. Reaven and R. G. Miller, 1979.

Datasets have shapes

Example: Cyclo-Octane (C_8H_{16}) data

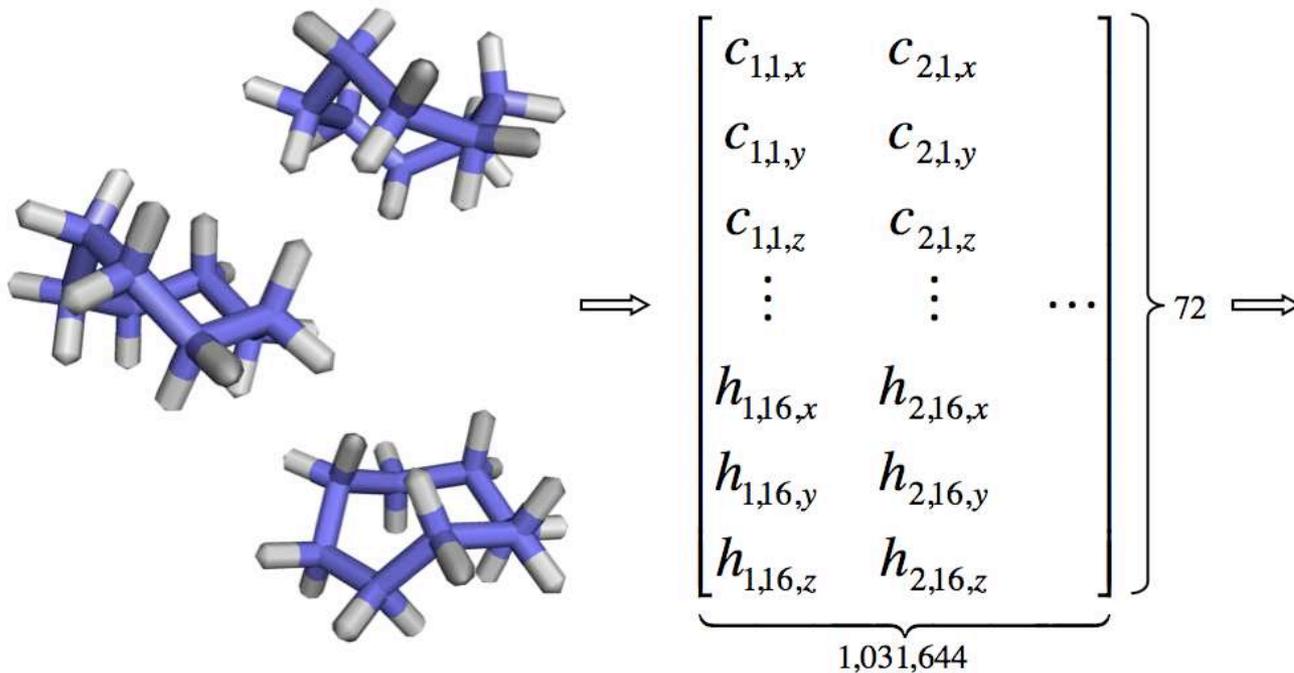
1,031,644 points in 72-dimensional space

Non-Manifold Surface Reconstruction from High Dimensional Point Cloud Data by
Shawn Martin and Jean-Paul Watson, 2010.

Datasets have shapes

Example: Cyclo-Octane (C_8H_{16}) data

1,031,644 points in 72-dimensional space

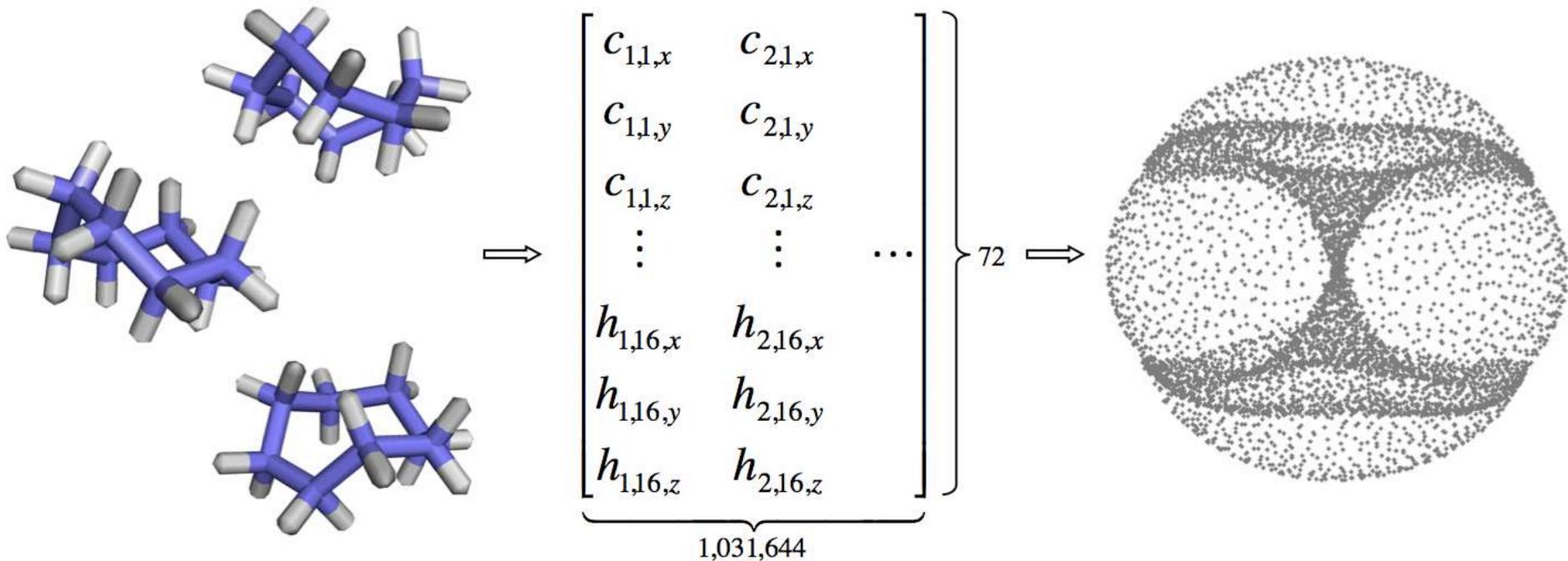


Non-Manifold Surface Reconstruction from High Dimensional Point Cloud Data by Shawn Martin and Jean-Paul Watson, 2010.

Datasets have shapes

Example: Cyclo-Octane (C_8H_{16}) data

1,031,644 points in 72-dimensional space

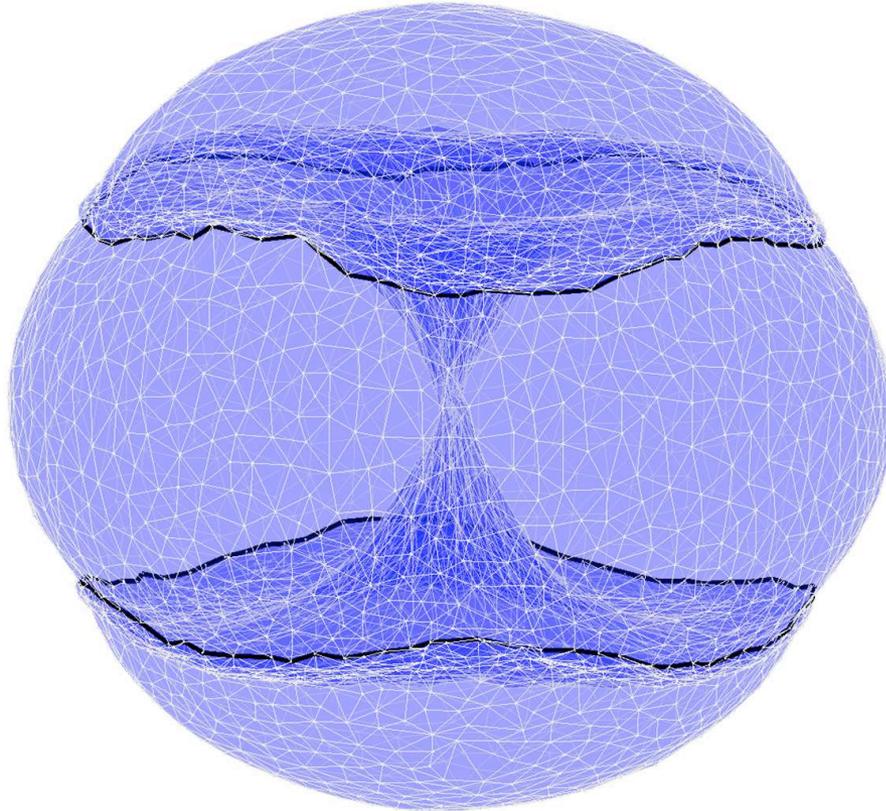


Non-Manifold Surface Reconstruction from High Dimensional Point Cloud Data by Shawn Martin and Jean-Paul Watson, 2010.

Datasets have shapes

Example: Cyclo-Octane (C_8H_{16}) data

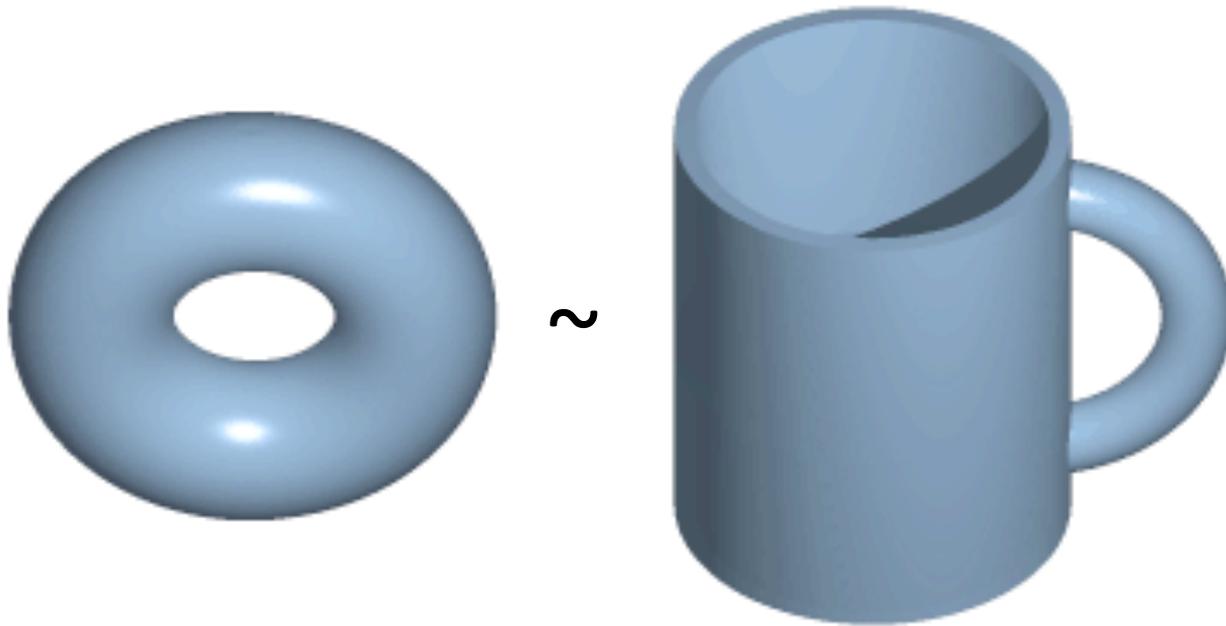
1,031,644 points in 72-dimensional space



Non-Manifold Surface Reconstruction from High Dimensional Point Cloud Data by
Shawn Martin and Jean-Paul Watson, 2010.

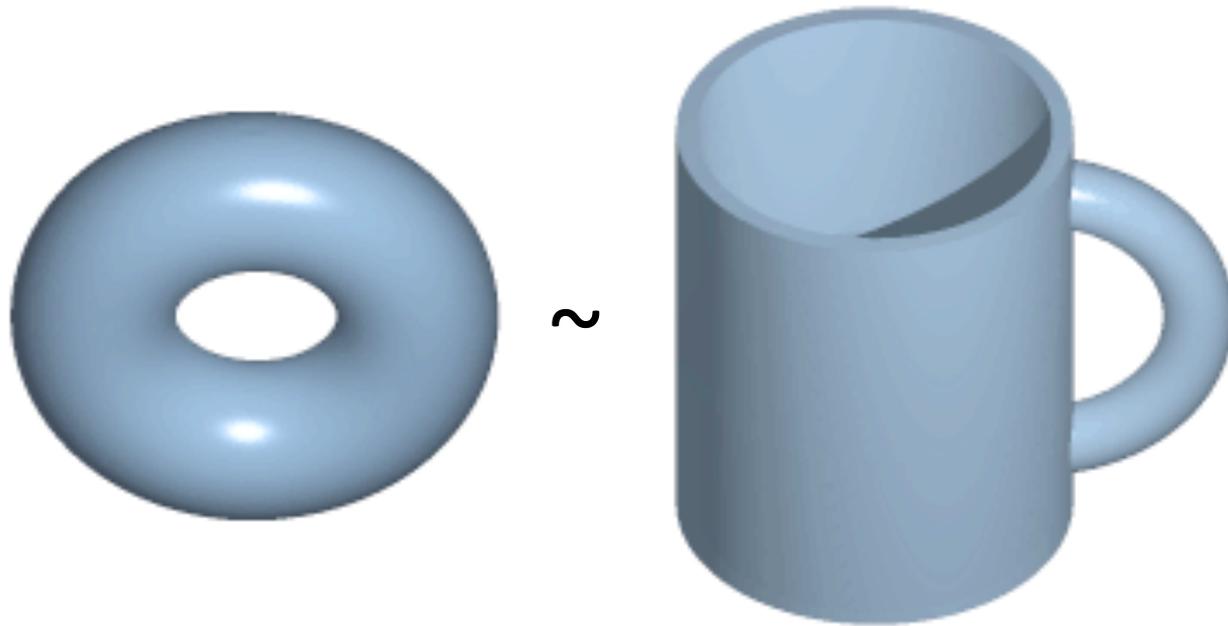
Topology studies shapes

A donut and coffee mug are “homotopy equivalent.”

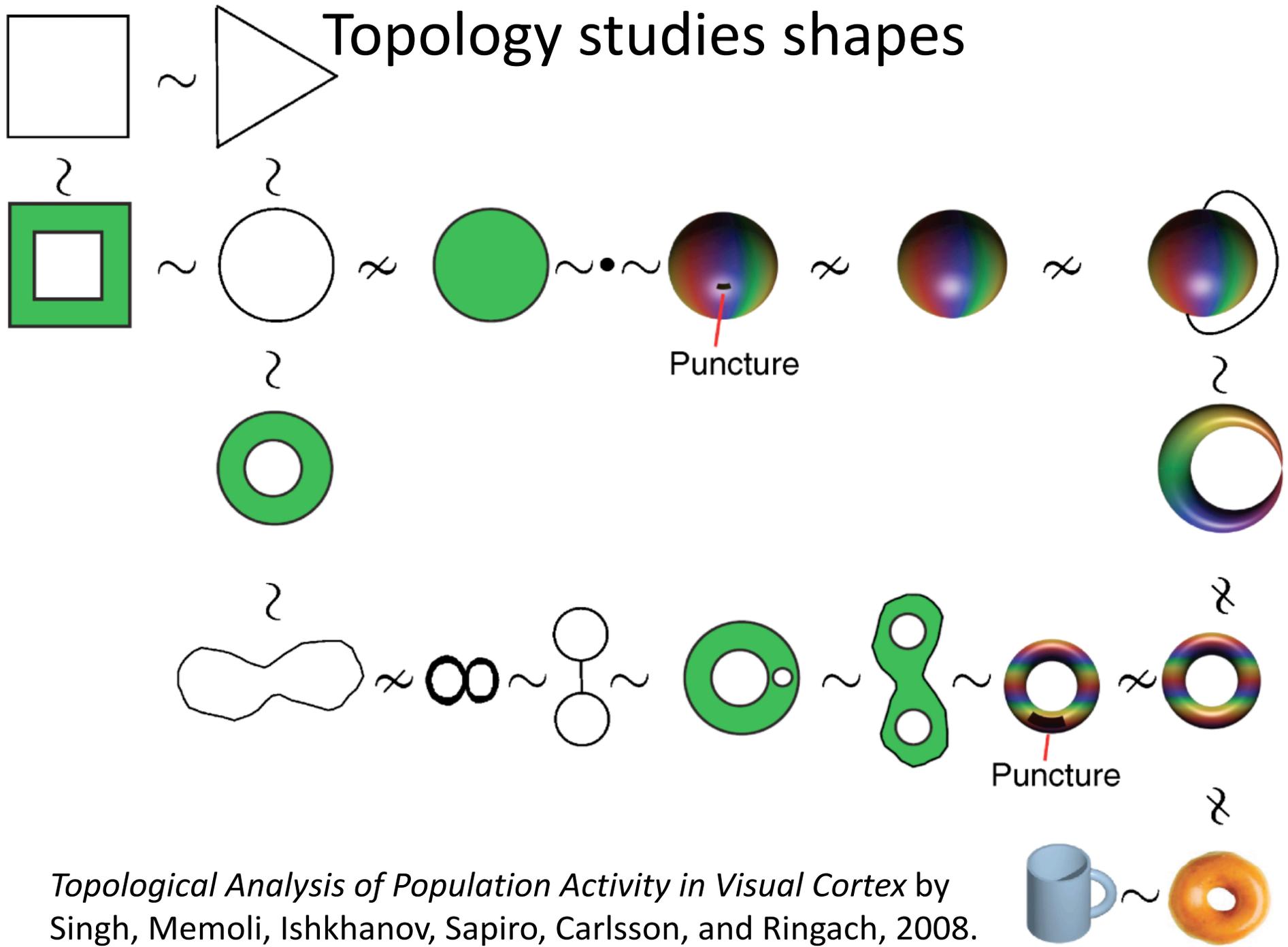


Topology studies shapes

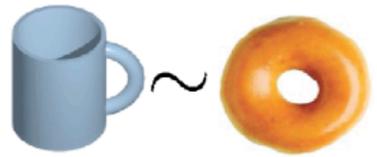
A donut and coffee mug are “homotopy equivalent.”



Topology studies shapes

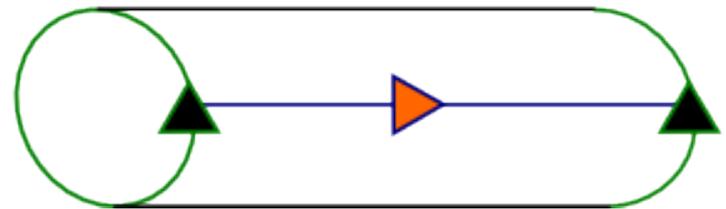
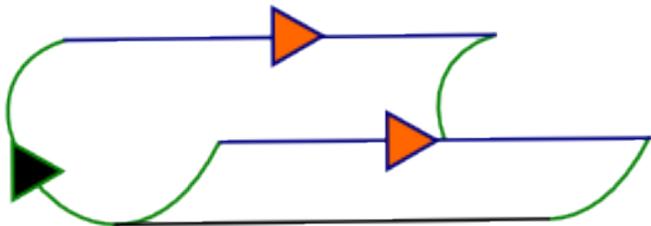
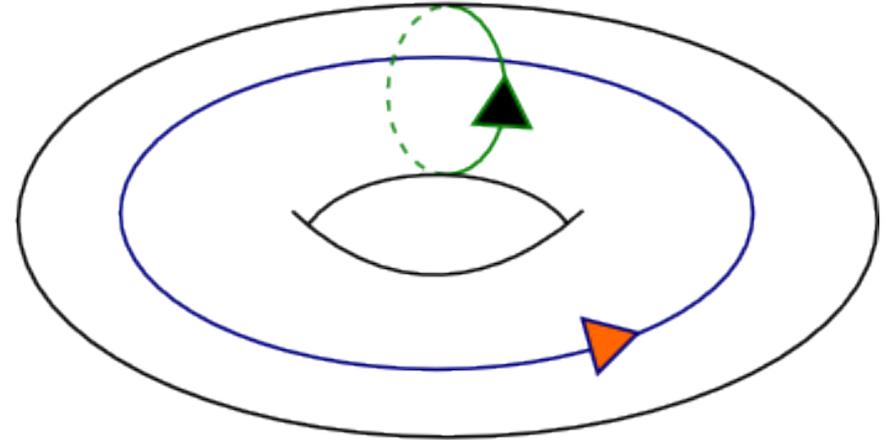
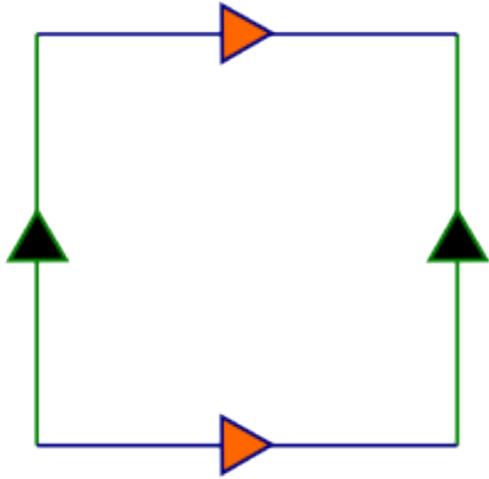


Topological Analysis of Population Activity in Visual Cortex by Singh, Memoli, Ishkhanov, Sapiro, Carlsson, and Ringach, 2008.

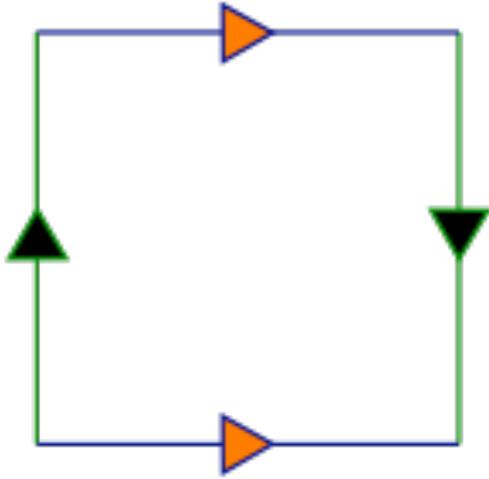


Topology studies shapes

Torus

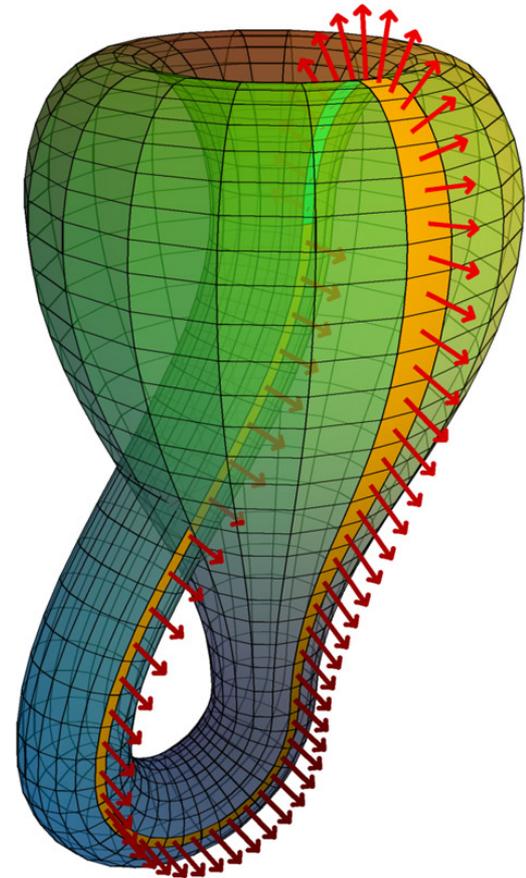
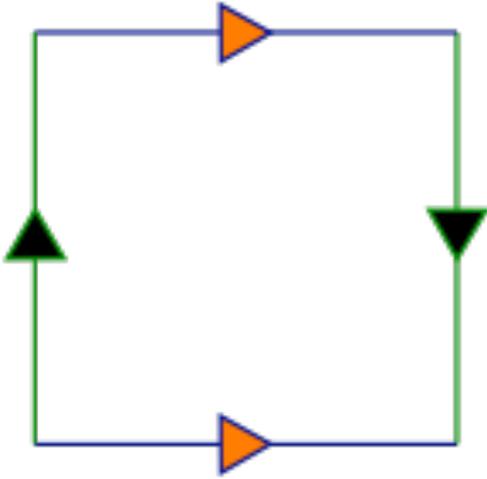


Topology studies shapes



Topology studies shapes

Klein bottle



Topology studies shapes

Homology ($\mathbb{Z}/2\mathbb{Z}$)

$$\begin{array}{ccccccc}
 & \vdots & & \vdots & & \vdots & \\
 & \downarrow & & \downarrow & & \downarrow & \\
 0 & \longrightarrow & A_{n+1} & \xrightarrow{\alpha_{n+1}} & B_{n+1} & \xrightarrow{\beta_{n+1}} & C_{n+1} \longrightarrow 0 \\
 & & \downarrow \partial_{n+1} & & \downarrow \partial'_{n+1} & & \downarrow \partial''_{n+1} \\
 0 & \longrightarrow & A_n & \xrightarrow{\alpha_n} & B_n & \xrightarrow{\beta_n} & C_n \longrightarrow 0 \\
 & & \downarrow \partial_n & & \downarrow \partial'_n & & \downarrow \partial''_n \\
 0 & \longrightarrow & A_{n-1} & \xrightarrow{\alpha_{n-1}} & B_{n-1} & \xrightarrow{\beta_{n-1}} & C_{n-1} \longrightarrow 0 \\
 & & \downarrow & & \downarrow & & \downarrow \\
 & & \vdots & & \vdots & & \vdots
 \end{array}$$

$$\begin{array}{ccccc}
 & & & \vdots & \\
 & & \swarrow & & \\
 H_{n+1}(\mathcal{A}) & \xrightarrow{\alpha_*} & H_{n+1}(\mathcal{B}) & \xrightarrow{\beta_*} & H_{n+1}(\mathcal{C}) \\
 & & \swarrow \delta_{n+1} & & \\
 H_n(\mathcal{A}) & \xrightarrow{\alpha_*} & H_n(\mathcal{B}) & \xrightarrow{\beta_*} & H_n(\mathcal{C}) \\
 & & \swarrow \delta_n & & \\
 H_{n-1}(\mathcal{A}) & \xrightarrow{\alpha_*} & H_{n-1}(\mathcal{B}) & \xrightarrow{\beta_*} & H_{n-1}(\mathcal{C}) \\
 & & \swarrow & & \\
 & & \vdots & &
 \end{array}$$

Topology studies shapes

Homology ($\mathbb{Z}/2\mathbb{Z}$)

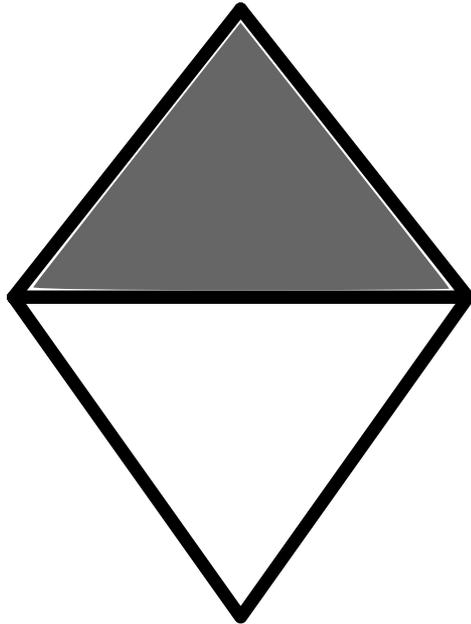
Homology groups $H_0, H_1, H_2, H_3, \dots$

H_k “counts the number of k -dimensional holes”.

Homotopy equivalent shapes have the same homology groups.

Topology studies shapes

Homology ($\mathbb{Z}/2\mathbb{Z}$)



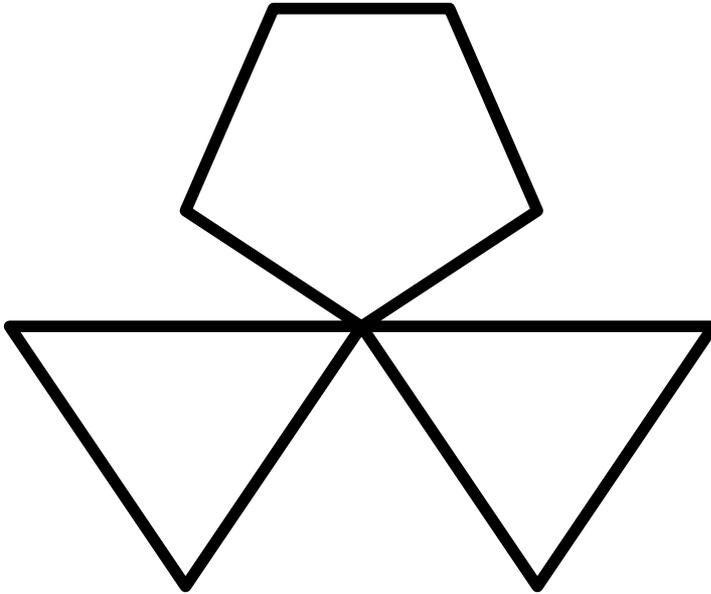
H_0 has rank 1.

H_1 has rank 1.

H_2 has rank 0.

Topology studies shapes

Homology ($\mathbb{Z}/2\mathbb{Z}$)



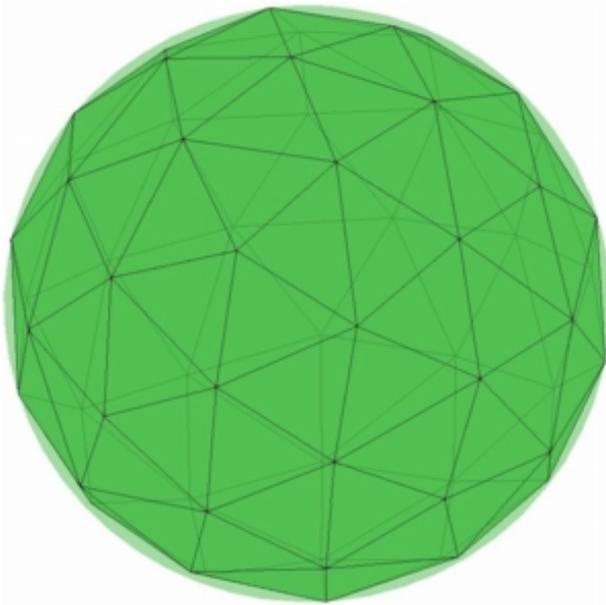
H_0 has rank 1.

H_1 has rank 3.

H_2 has rank 0.

Topology studies shapes

Homology ($\mathbb{Z}/2\mathbb{Z}$)



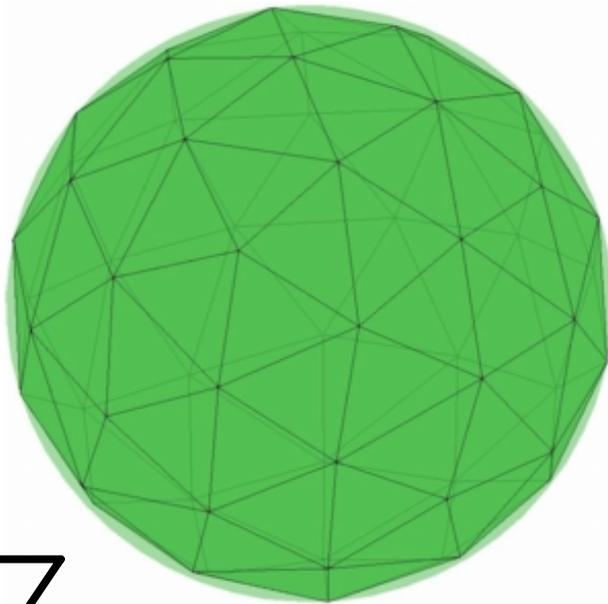
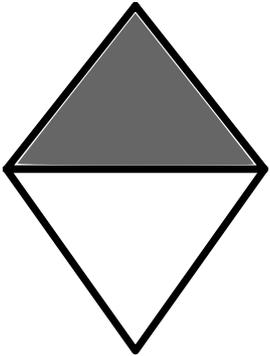
H_0 has rank 1.

H_1 has rank 0.

H_2 has rank 1.

Topology studies shapes

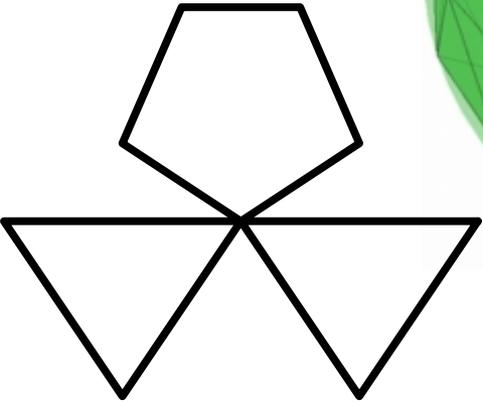
Homology ($\mathbb{Z}/2\mathbb{Z}$)



H_0 has rank 3.

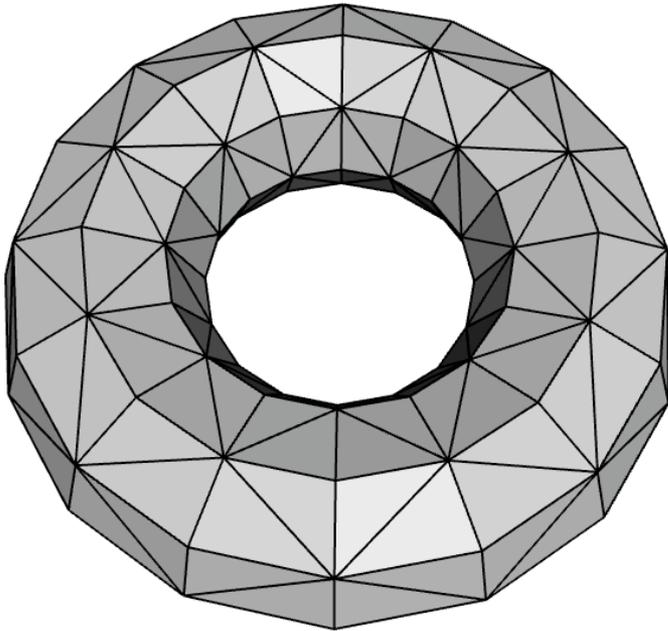
H_1 has rank 4.

H_2 has rank 1.



Topology studies shapes

Homology ($\mathbb{Z}/2\mathbb{Z}$)



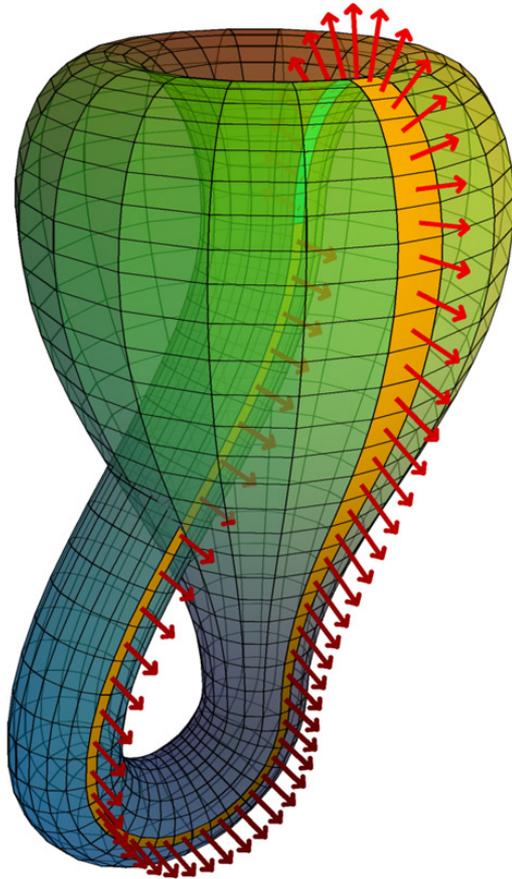
H_0 has rank 1.

H_1 has rank 2.

H_2 has rank 1.

Topology studies shapes

Homology ($\mathbb{Z}/2\mathbb{Z}$)



H_0 has rank 1.

H_1 has rank 2.

H_2 has rank 1.

Topology studies shapes

Homology ($\mathbb{Z}/2\mathbb{Z}$)

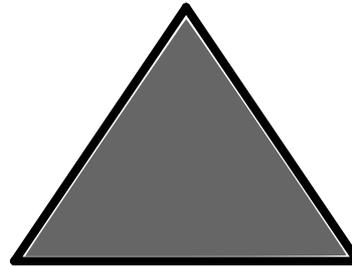
0-simplex



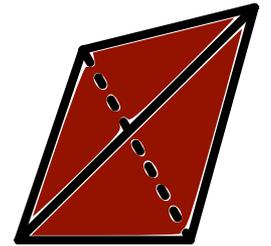
1-simplex



2-simplex



3-simplex



Topology studies shapes

Homology ($\mathbb{Z}/2\mathbb{Z}$)

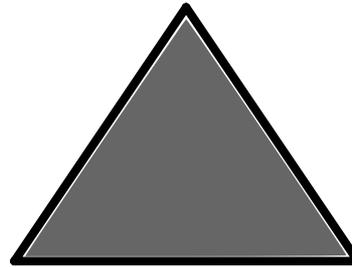
0-simplex



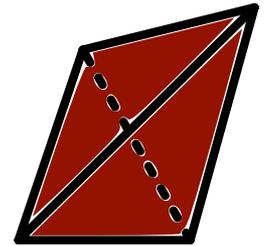
1-simplex



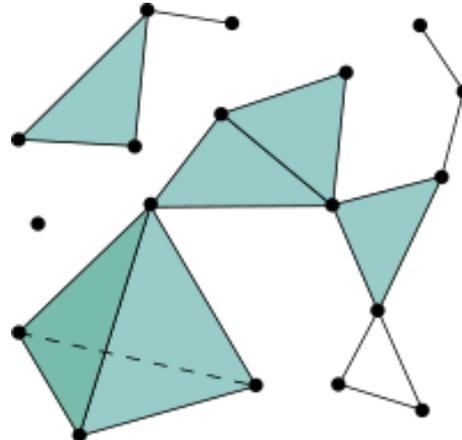
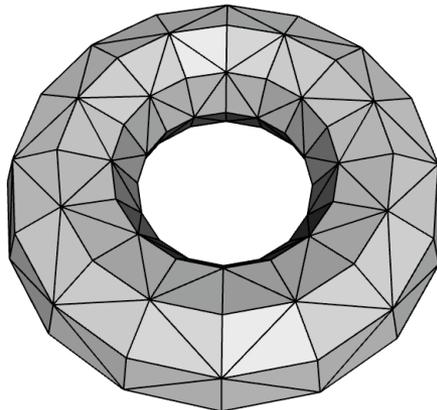
2-simplex



3-simplex



Simplicial complexes



Topology studies shapes

Homology ($\mathbb{Z}/2\mathbb{Z}$)

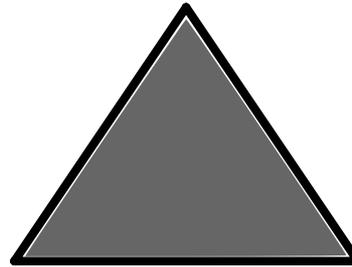
0-simplex



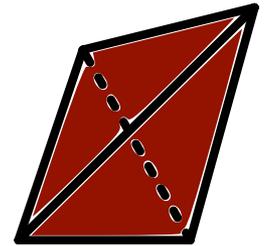
1-simplex



2-simplex



3-simplex



Topology studies shapes

Homology ($\mathbb{Z}/2\mathbb{Z}$)

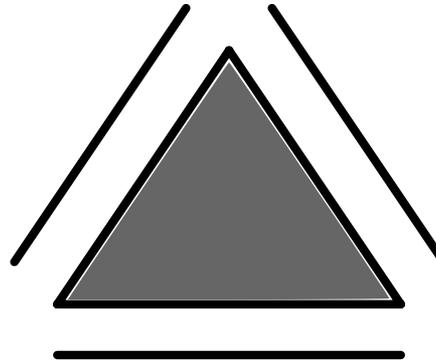
0-simplex



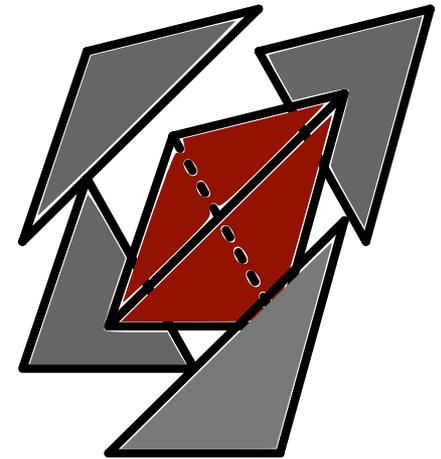
1-simplex



2-simplex



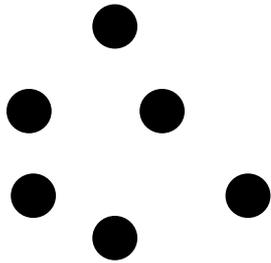
3-simplex



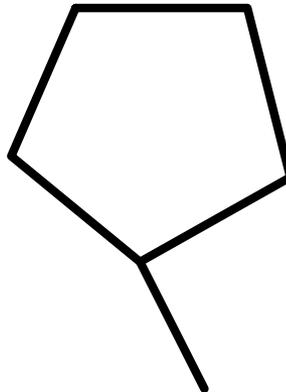
Topology studies shapes

Homology ($\mathbb{Z}/2\mathbb{Z}$)

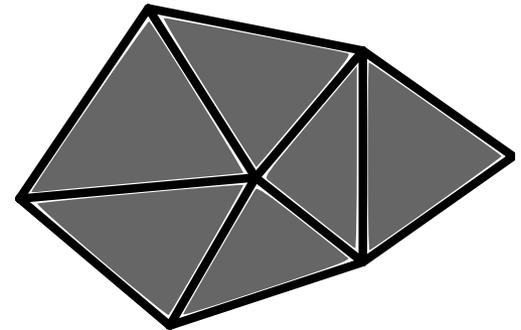
0-simplices



1-simplices



2-simplices



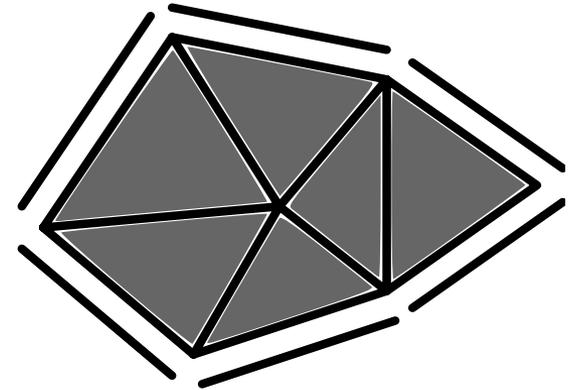
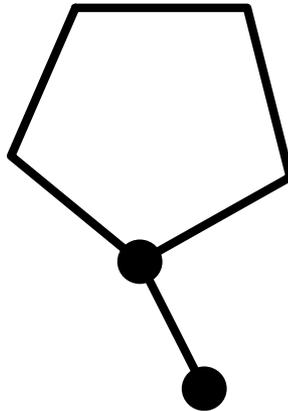
Topology studies shapes

Homology ($\mathbb{Z}/2\mathbb{Z}$)

0-simplices

1-simplices

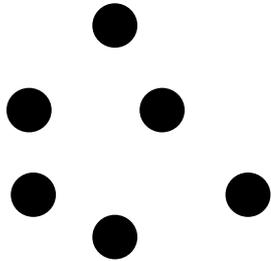
2-simplices



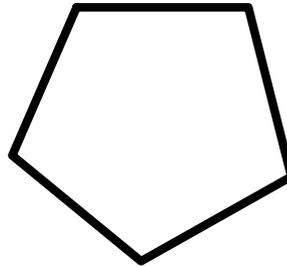
Topology studies shapes

Homology ($\mathbb{Z}/2\mathbb{Z}$)

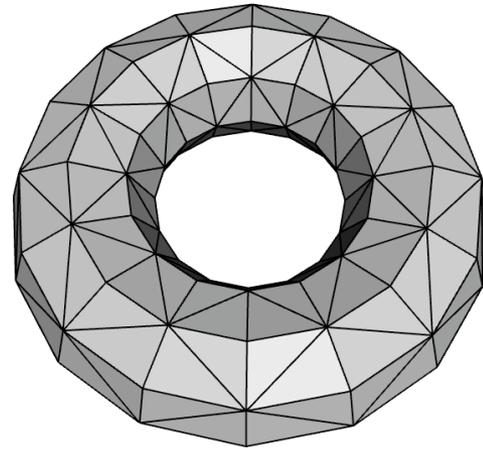
0-cycle



1-cycle



2-cycle

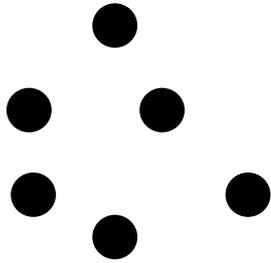


A cycle has no boundary.

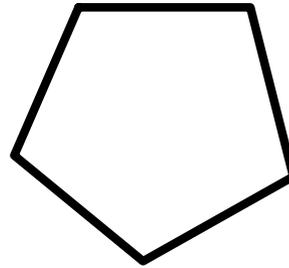
Topology studies shapes

Homology ($\mathbb{Z}/2\mathbb{Z}$)

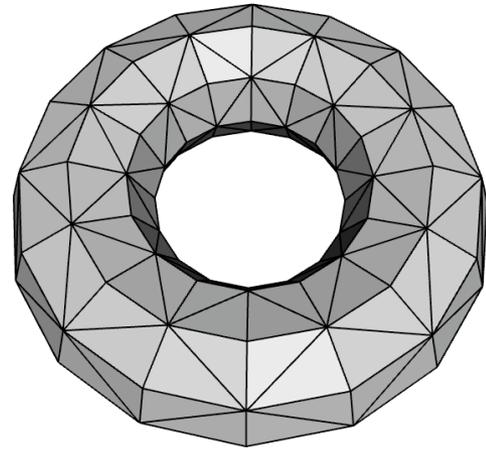
0-cycle



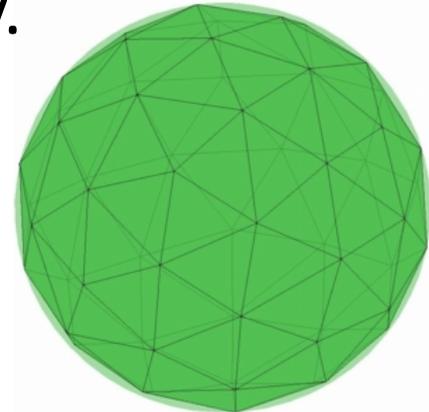
1-cycle



2-cycle

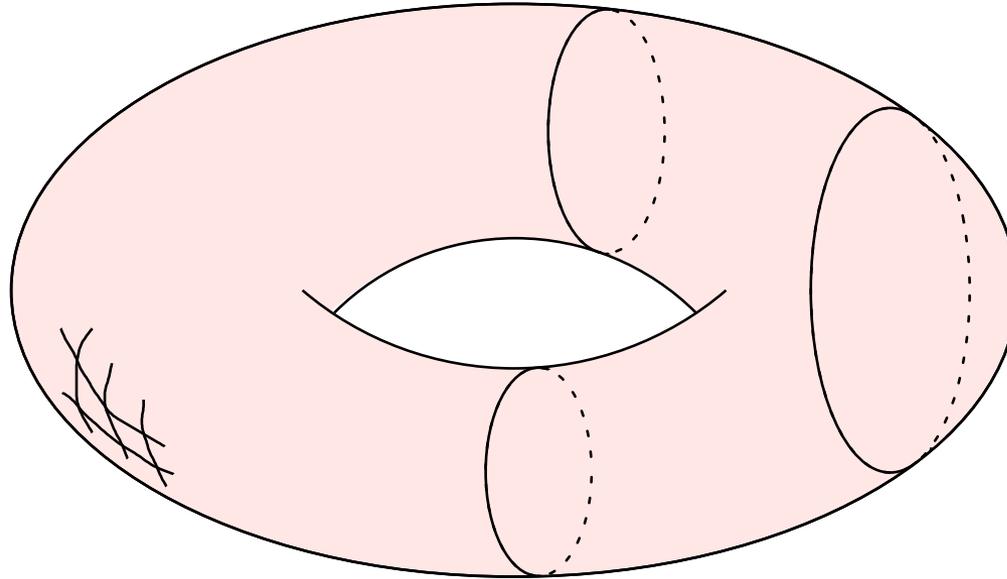


A cycle has no boundary.



Topology studies shapes

Homology ($\mathbb{Z}/2\mathbb{Z}$)

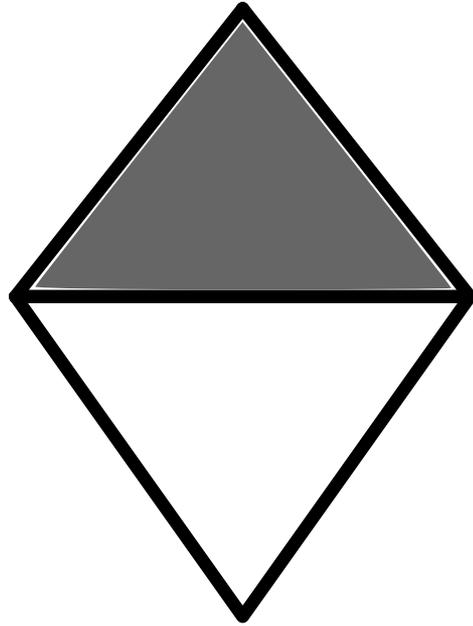


Two cycles are equivalent if they differ by a boundary.

H_k measures equivalence classes of k -cycles.

Topology studies shapes

Homology ($\mathbb{Z}/2\mathbb{Z}$)



H_0 has rank 1.

H_1 has rank 1.

H_2 has rank 0.

Two cycles are equivalent if they differ by a boundary.

H_k measures equivalence classes of k -cycles.

Topology studies shapes

Homology ($\mathbb{Z}/2\mathbb{Z}$)

Homology groups $H_0, H_1, H_2, H_3, \dots$

H_k “counts the number of k -dimensional holes”.

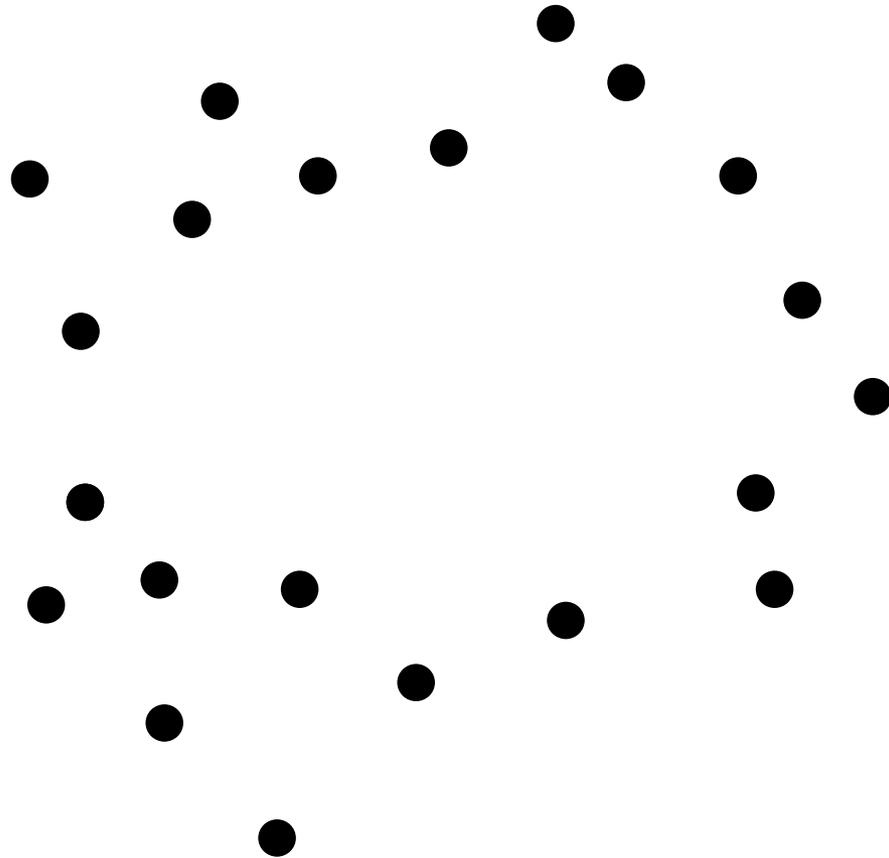
Homotopy equivalent shapes have the same homology groups.

“Topology! The stratosphere of human thought! In the twenty-fourth century it might possibly be of use to someone ...”

-Aleksandr Solzhenitsyn, *The First Circle*

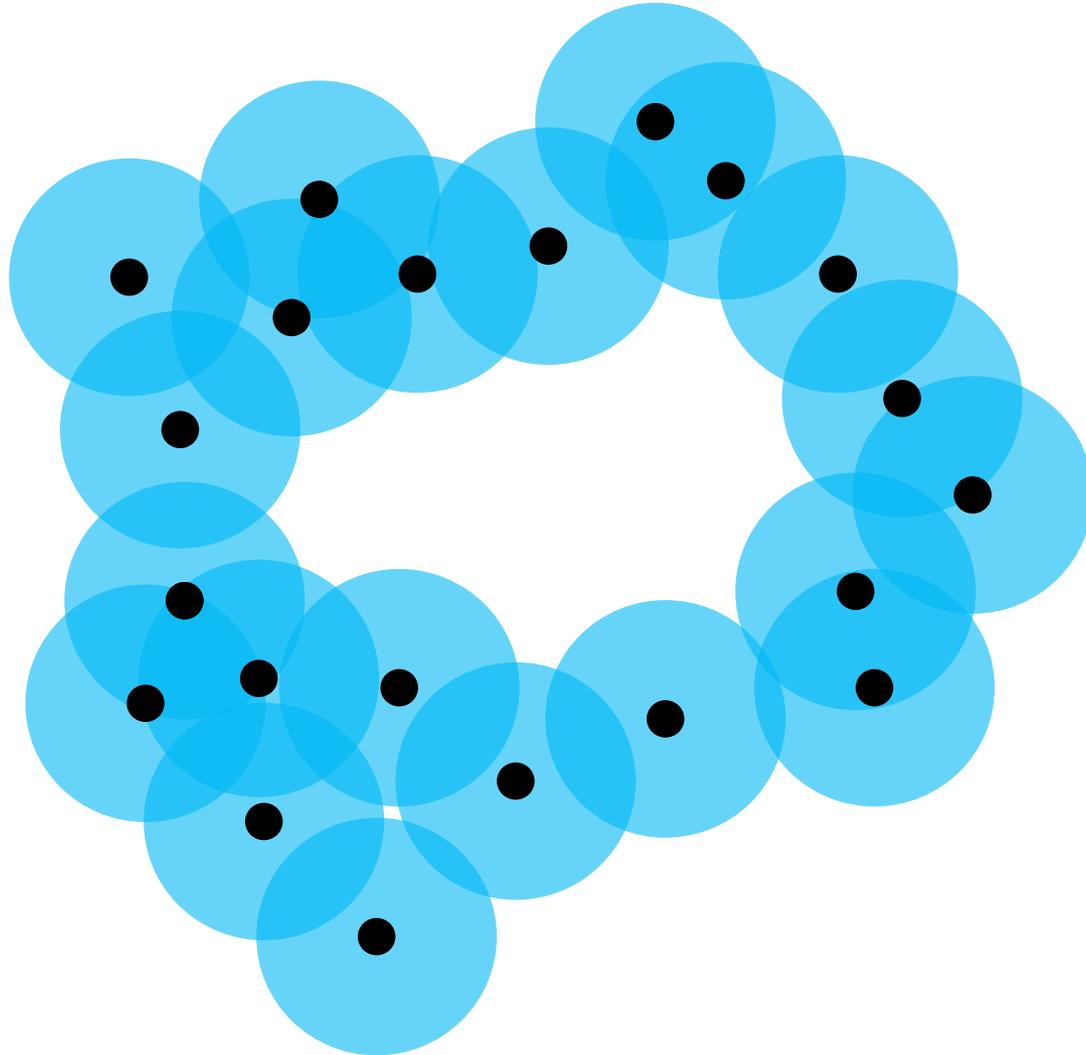
Topology applied to data analysis

What shape is this?



Topology applied to data analysis

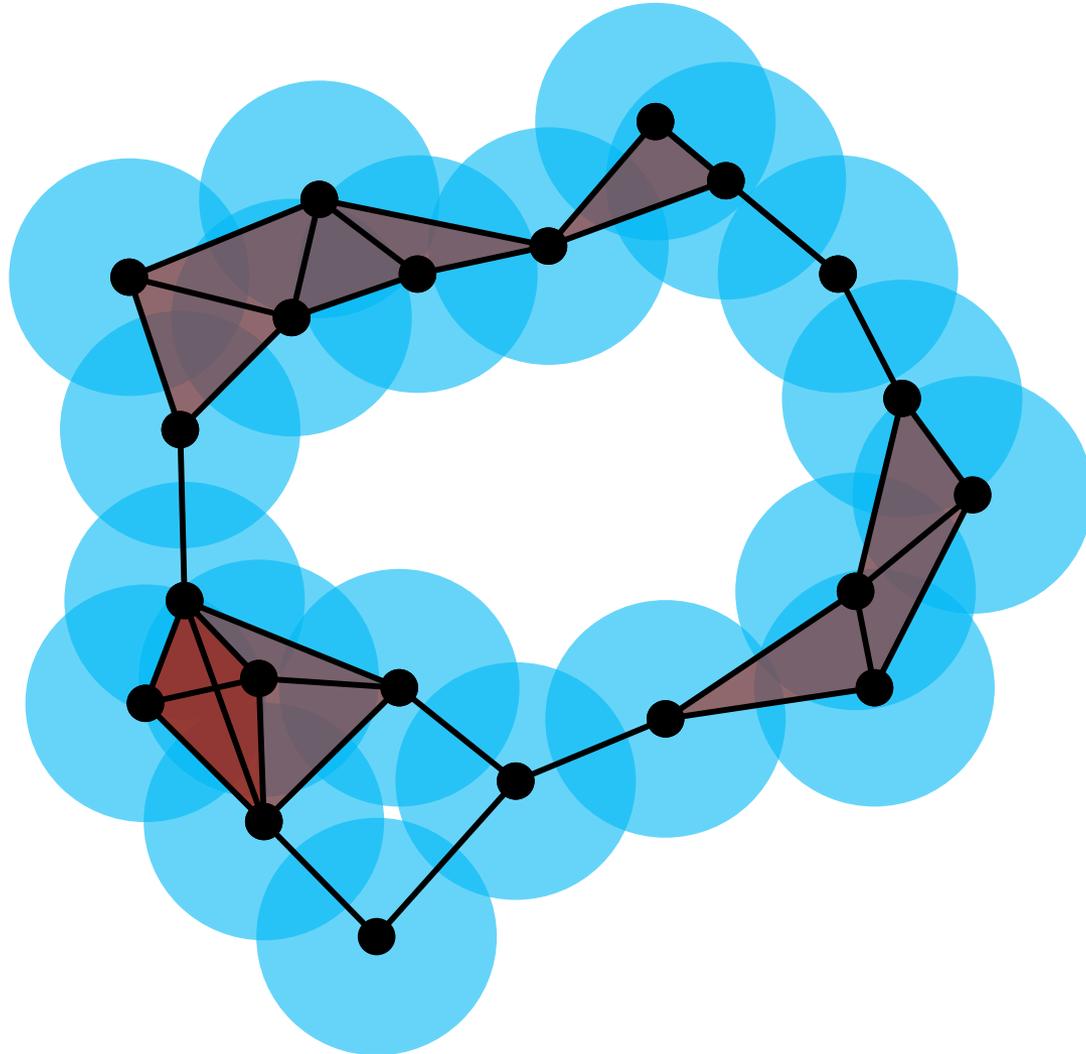
What shape is this?



Topology applied to data analysis

What shape is this?

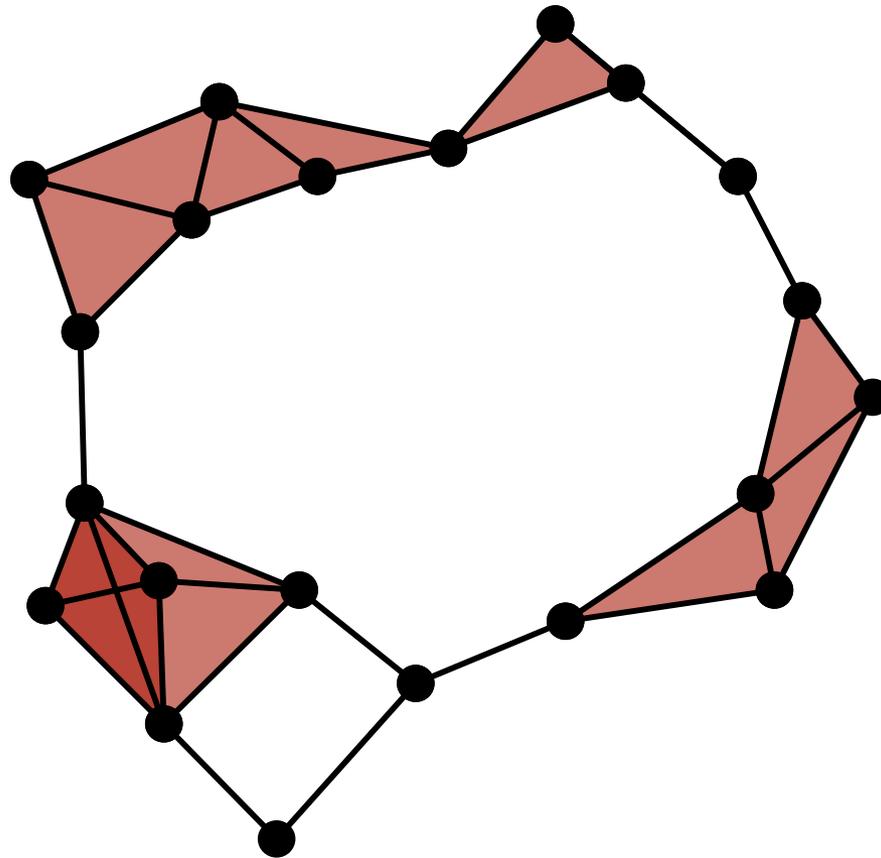
Cech complex



Topology applied to data analysis

What shape is this?

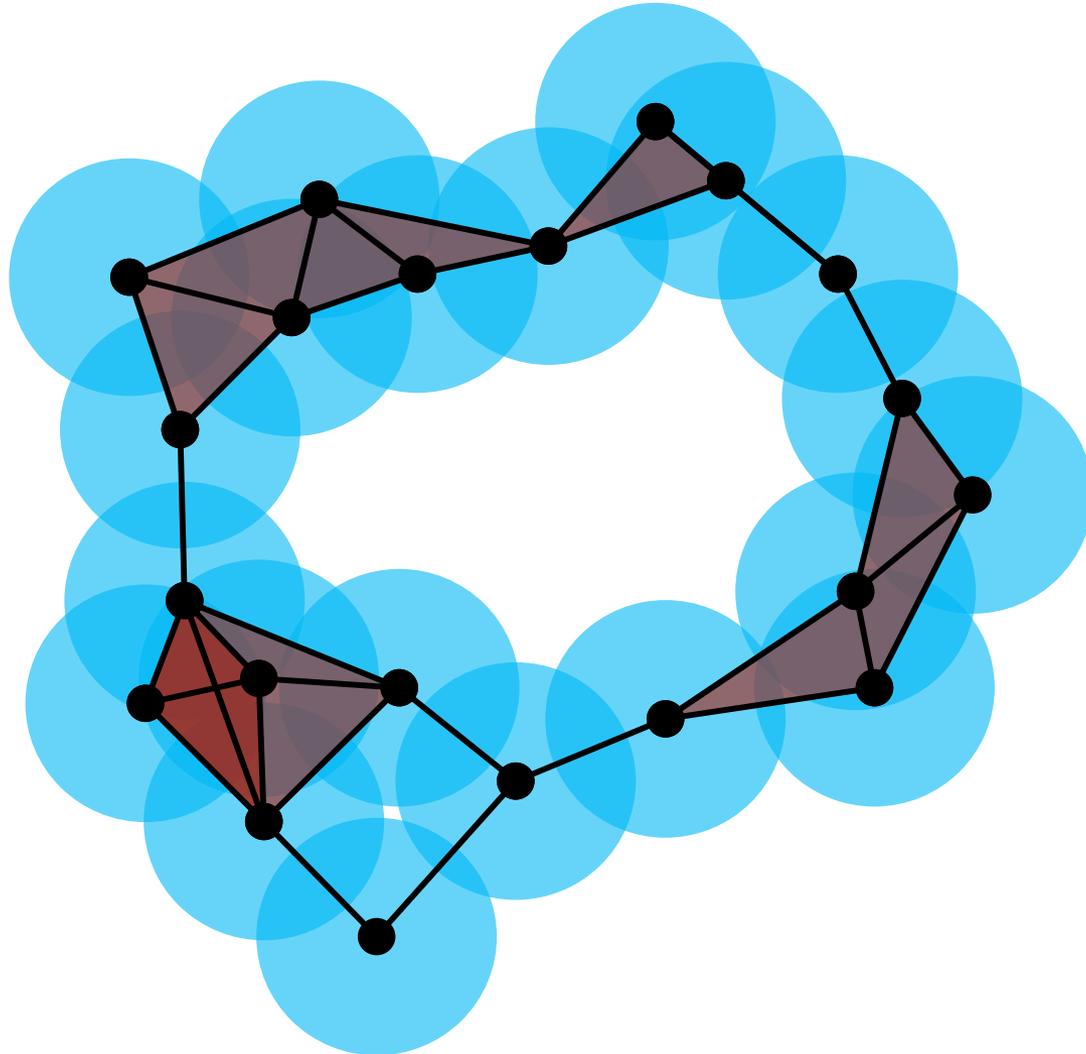
Cech complex



Topology applied to data analysis

What shape is this?

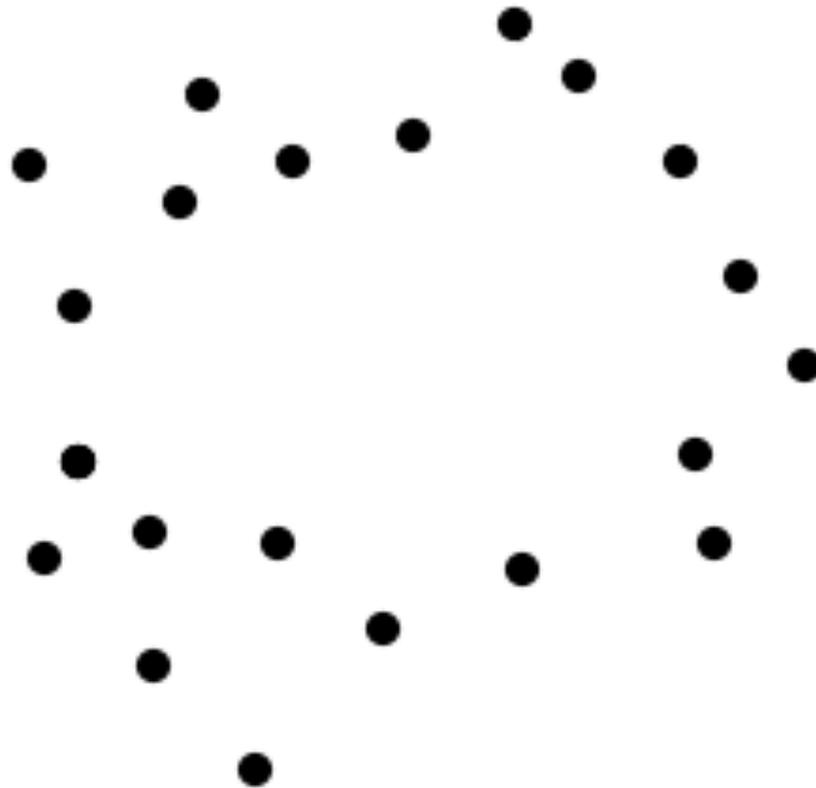
Cech complex



Topology applied to data analysis

What shape is this?

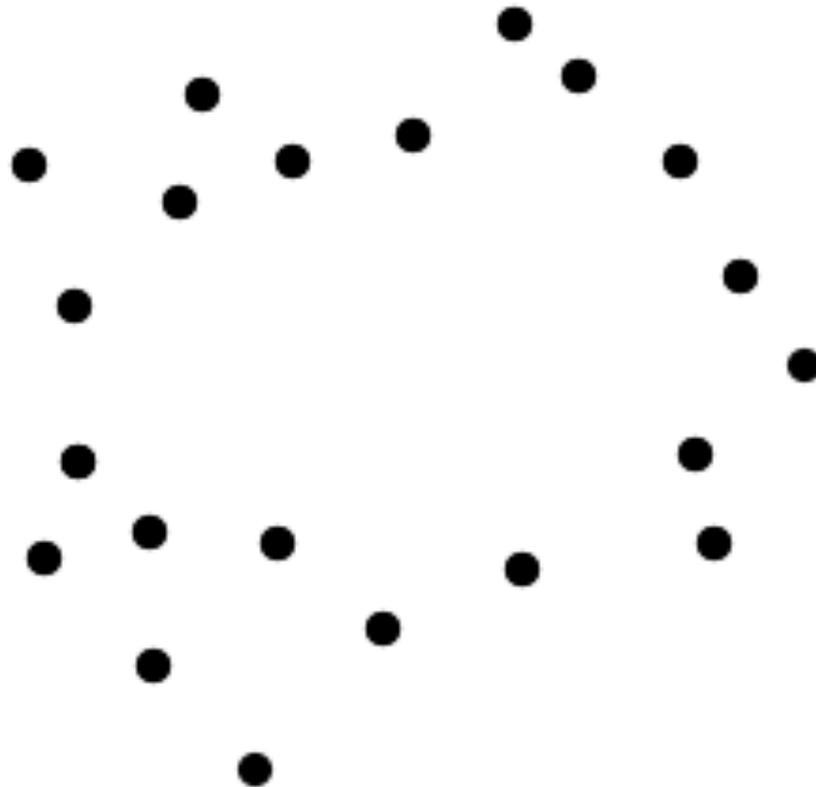
Cech complex



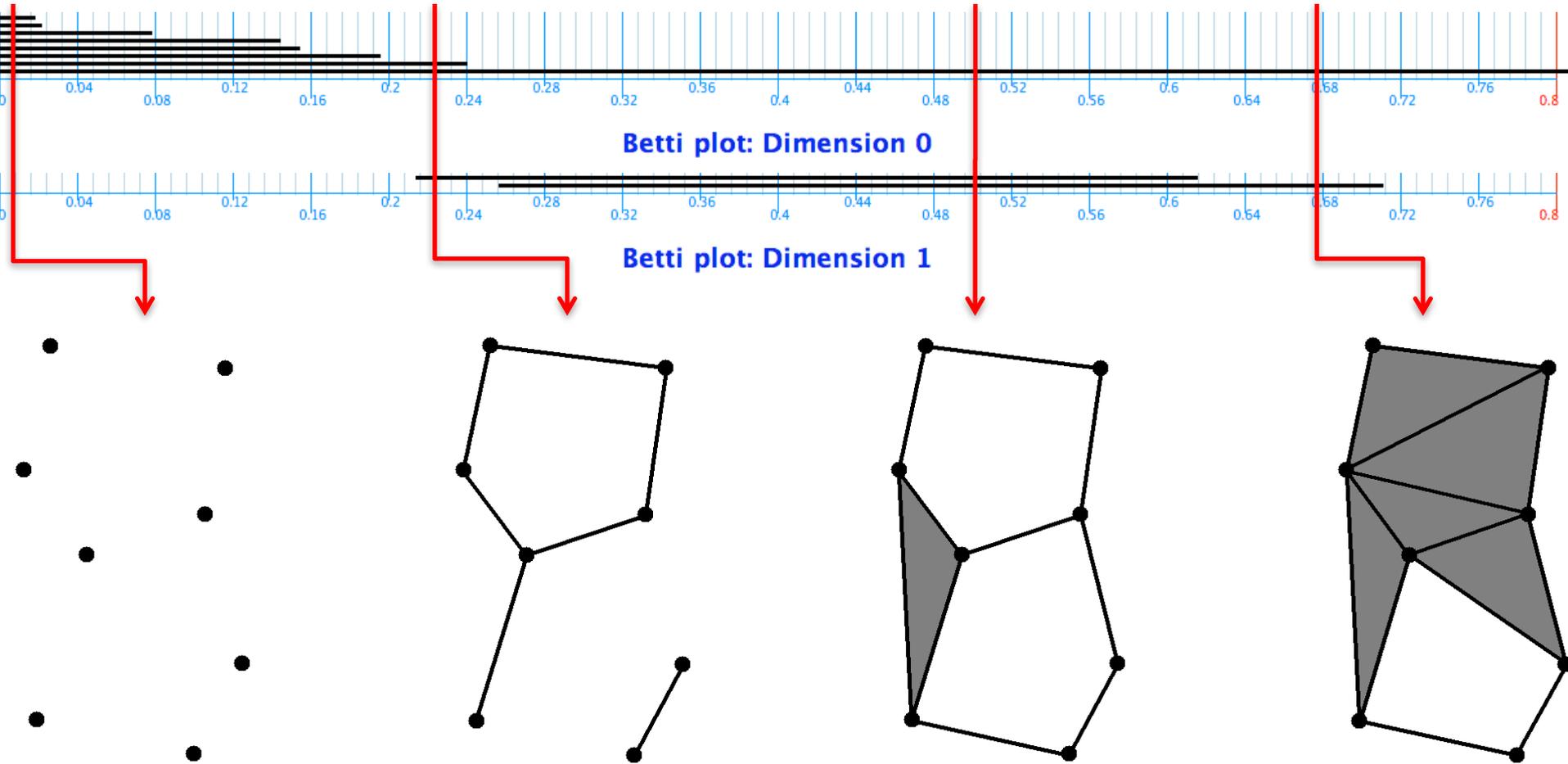
Topology applied to data analysis

What shape is this?

Cech complex



Topology applied to data analysis

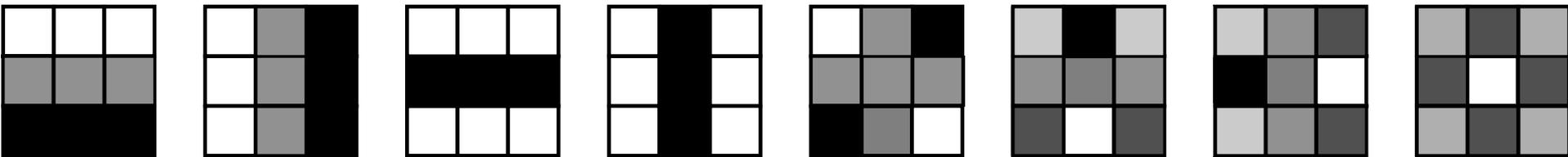


Significant features persist.

Image patch example

Study 3x3 high-contrast patches from images

Points in 9-dimensional space

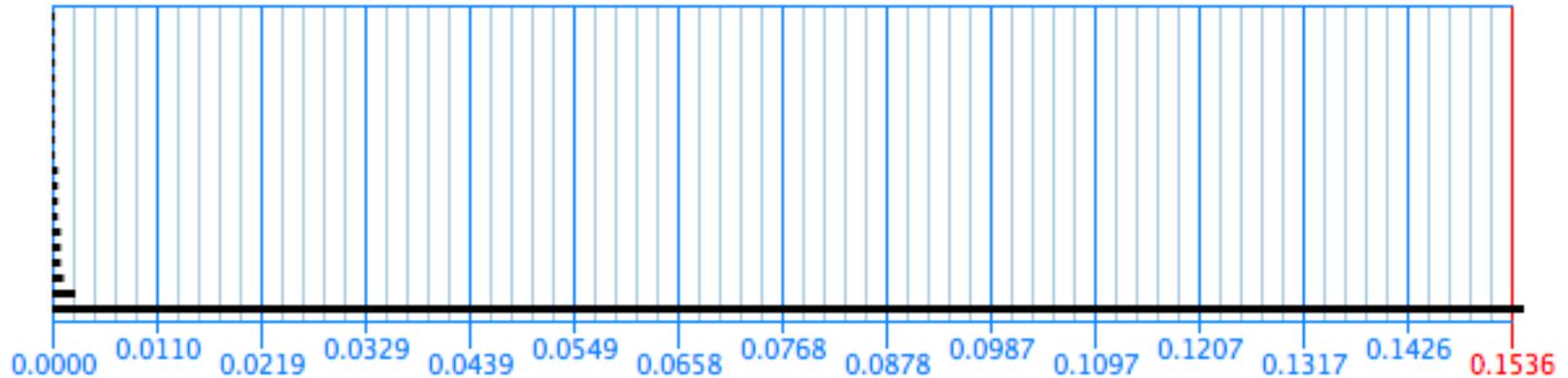


On the Local Behavior of Spaces of Natural Images by Gunnar Carlsson, Tigran Ishkhanov, Vin de Silva, and Afra Zomorodian, 2008.

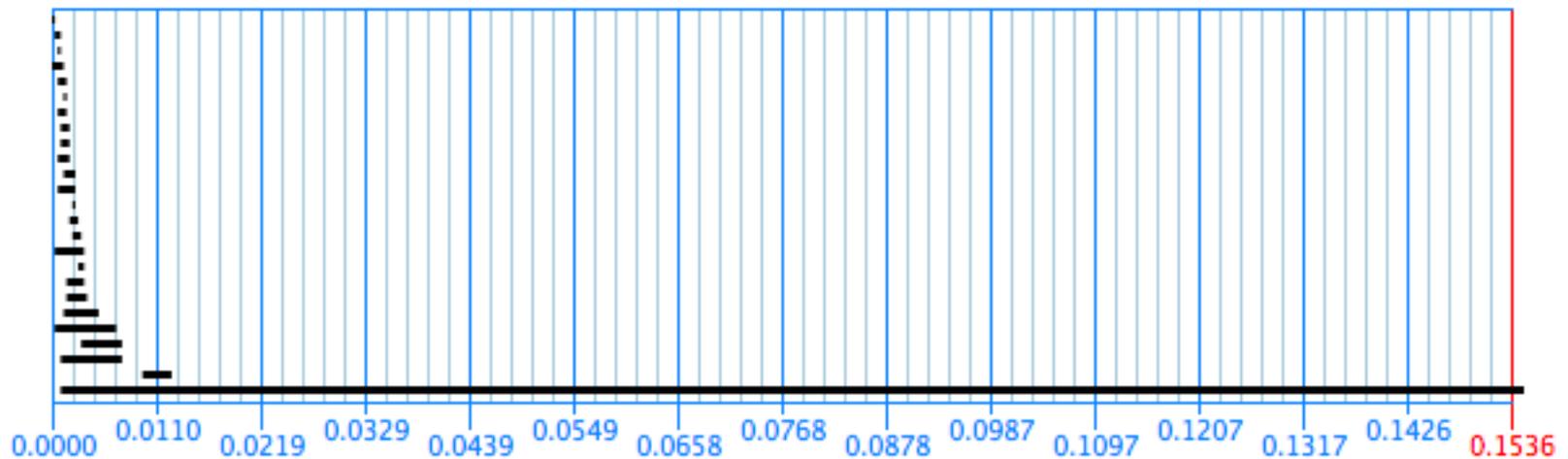
Image patch example

1st densest group of patches

lazyWitness_nk300c30Dct (Dimension: 0)



lazyWitness_nk300c30Dct (Dimension: 1)



lazyWitness_nk300c30Dct (Dimension: 2)

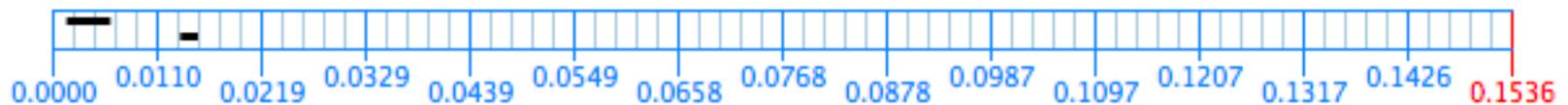
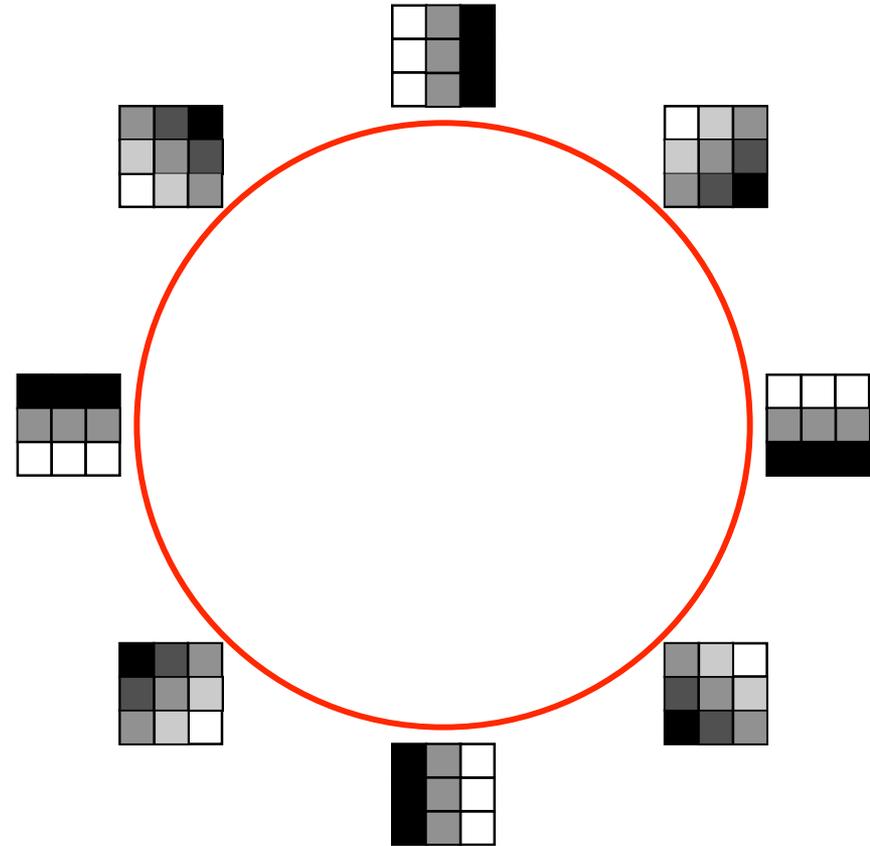
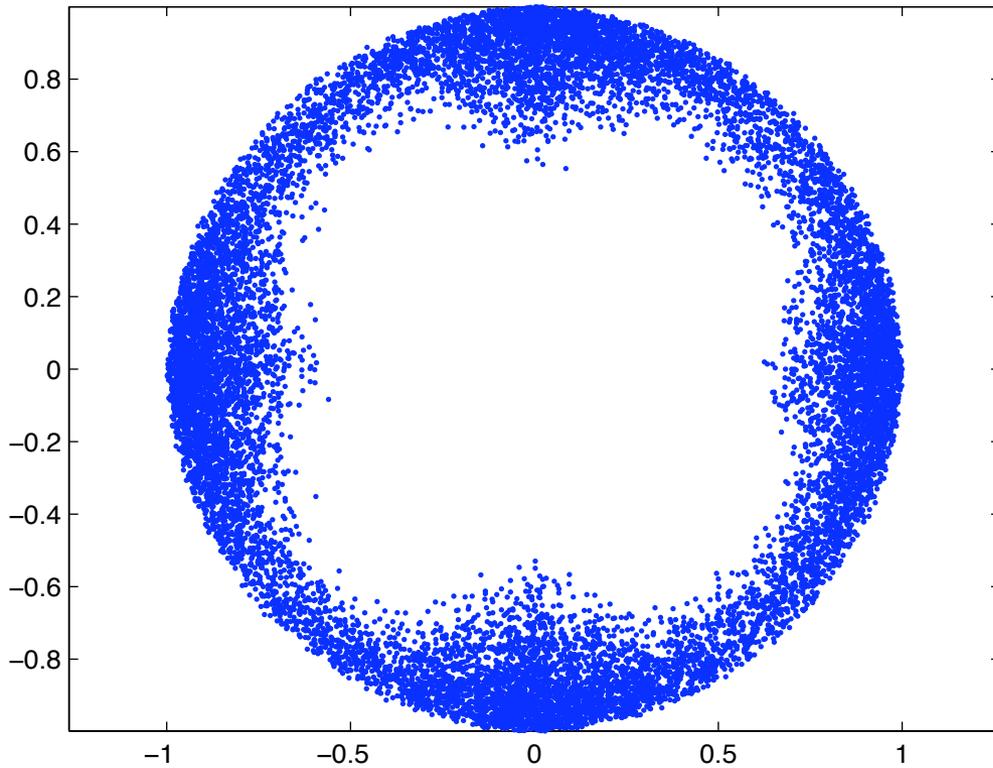


Image patch example

1st densest group of patches

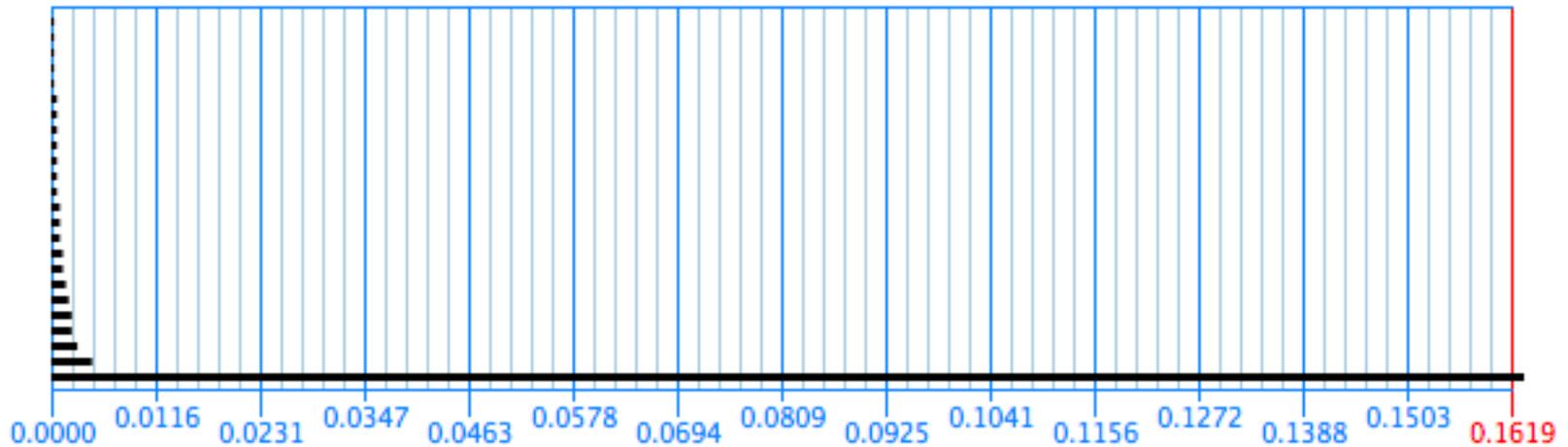


Interpretation: nature prefers linearity

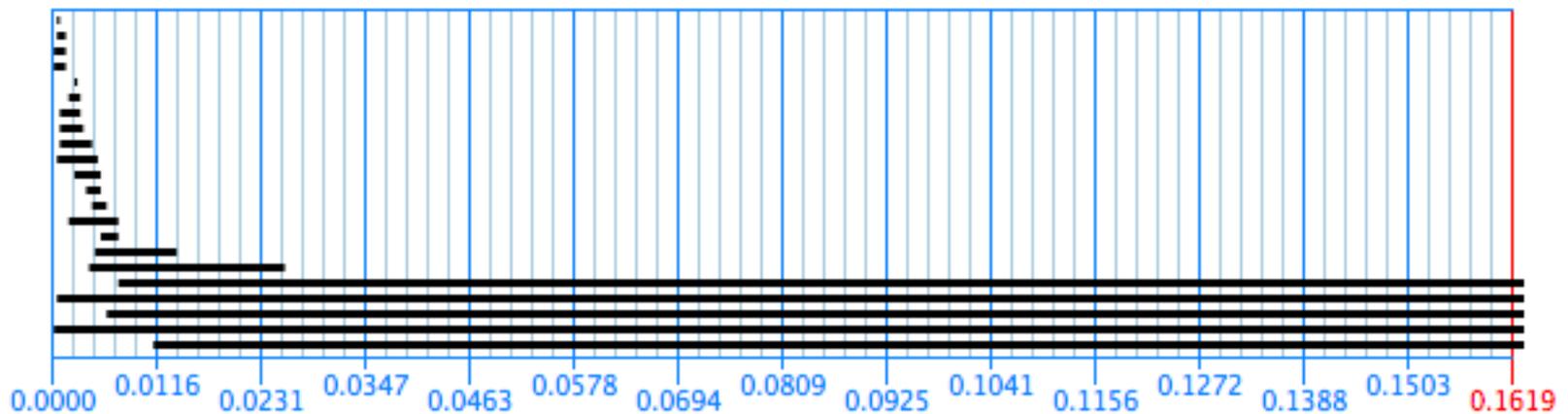
Image patch example

2nd densest group of patches

lazyWitness_nk15c30Dct (Dimension: 0)



lazyWitness_nk15c30Dct (Dimension: 1)



lazyWitness_nk15c30Dct (Dimension: 2)

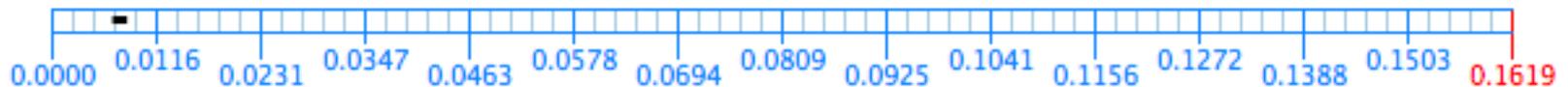
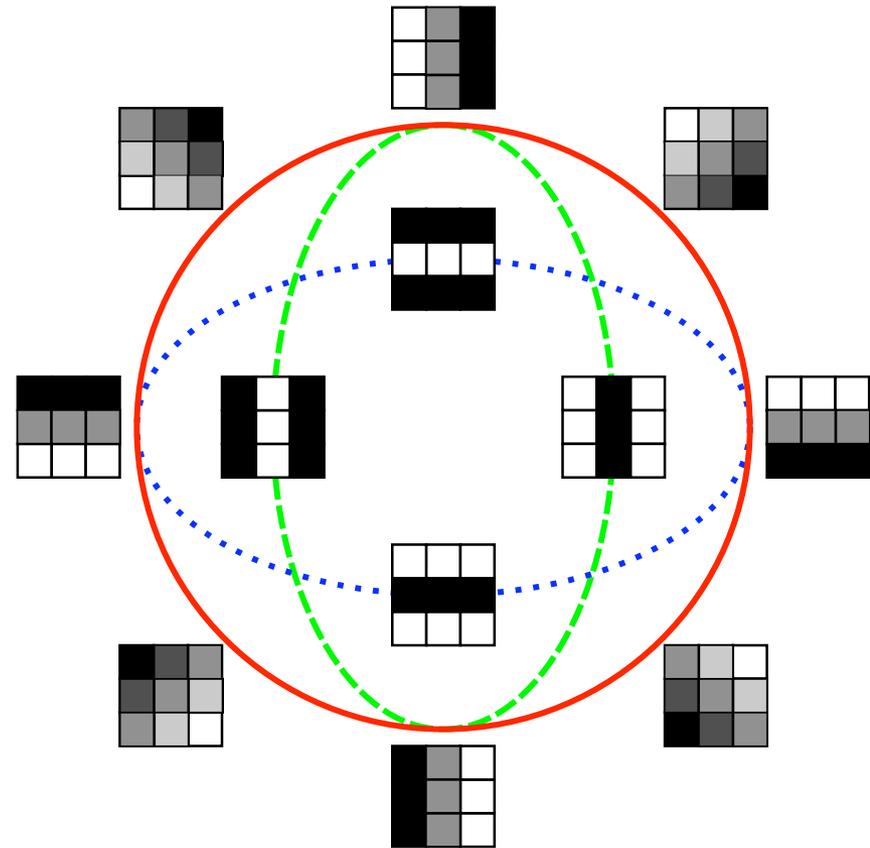
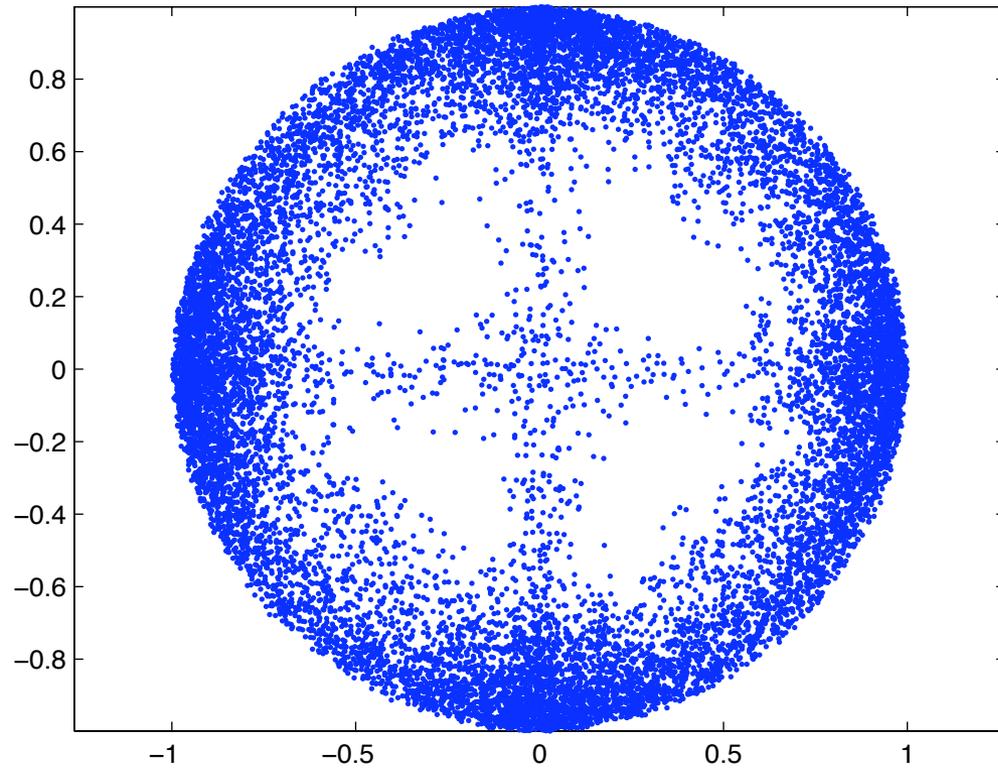


Image patch example

2nd densest group of patches



Interpretation: nature prefers horizontal and vertical directions

Image patch example

3rd densest group of patches

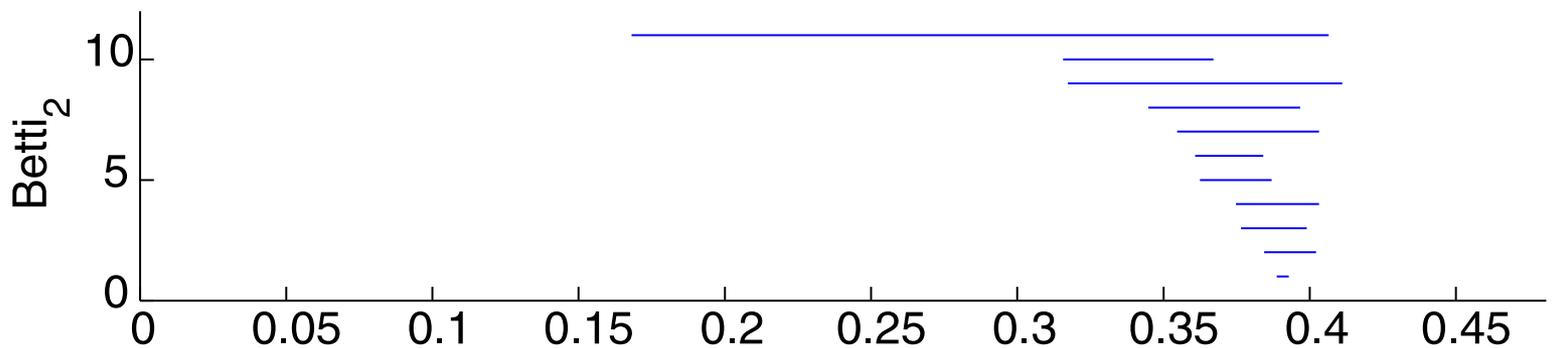
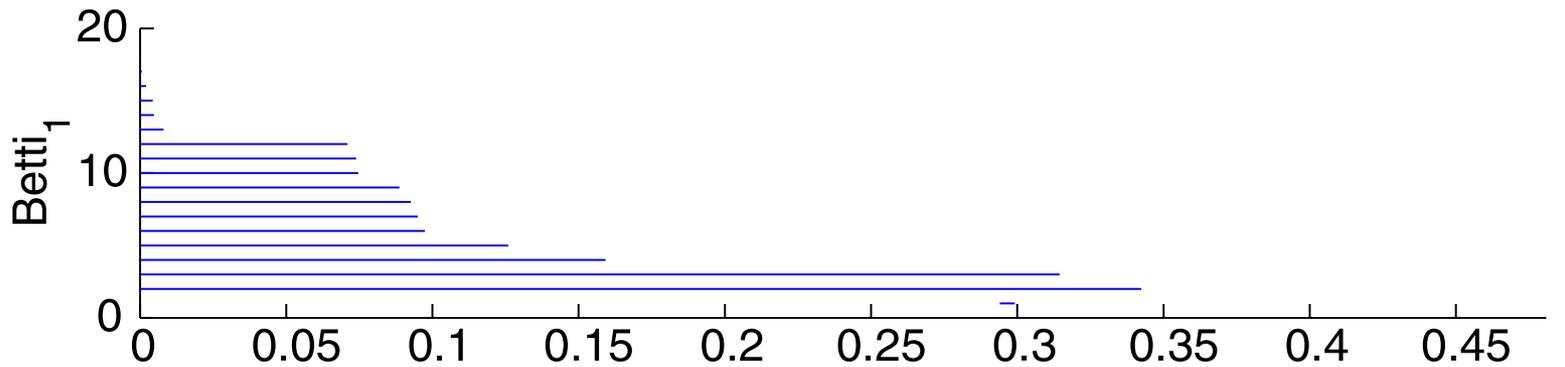
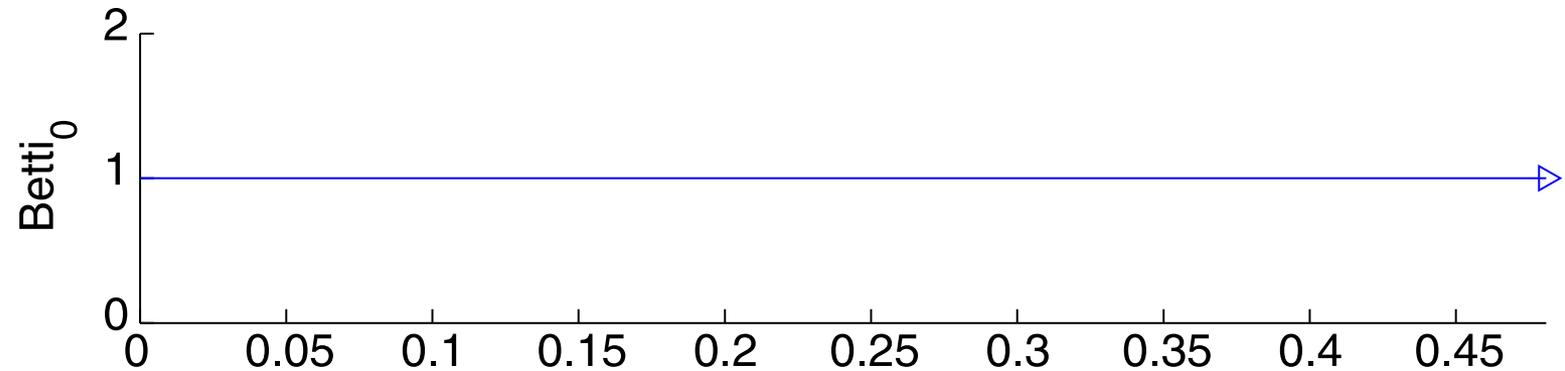


Image patch example

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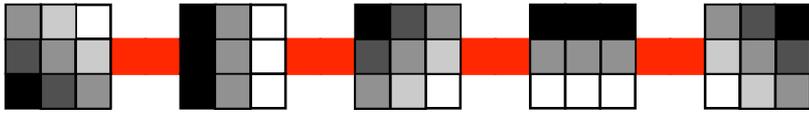
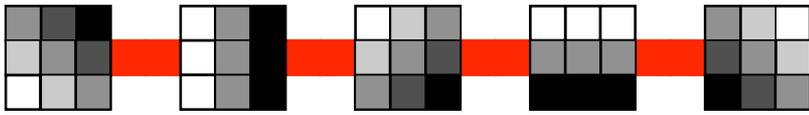


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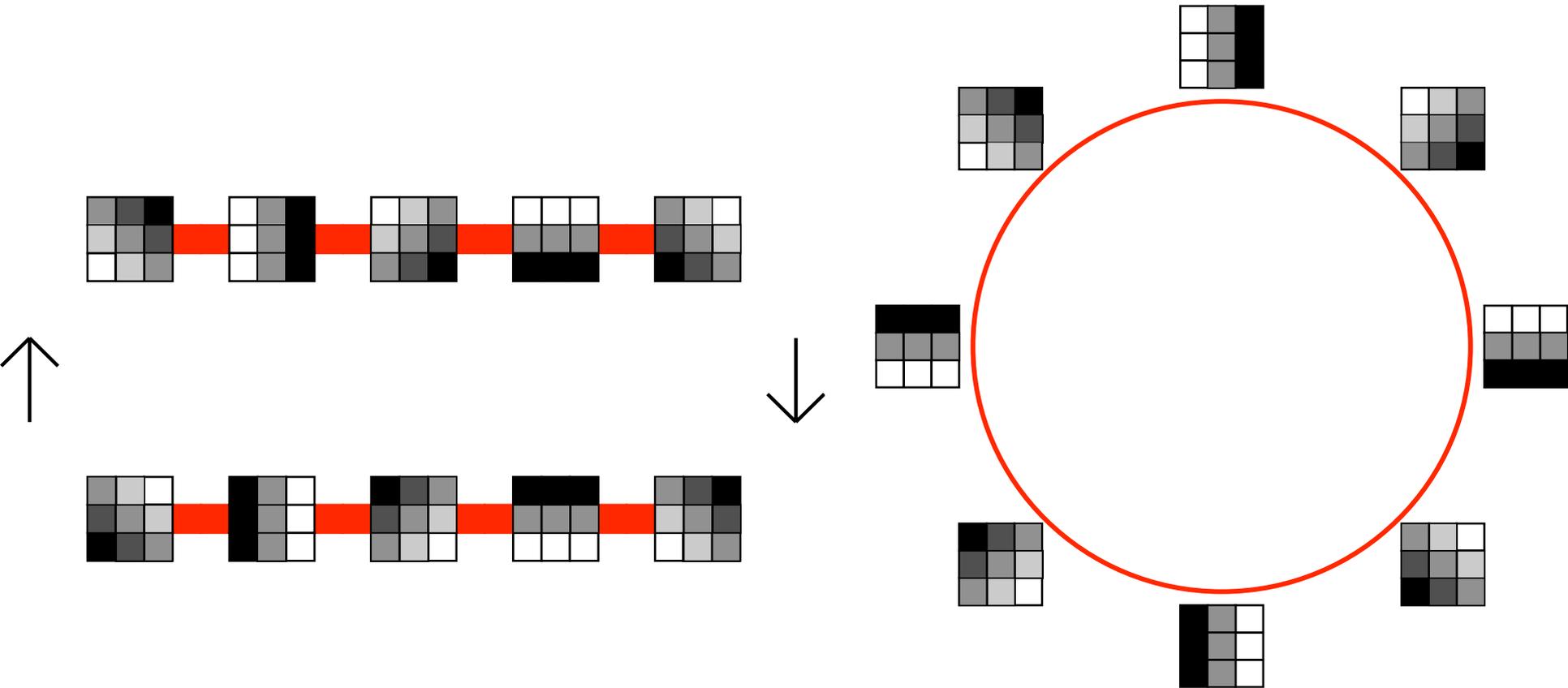


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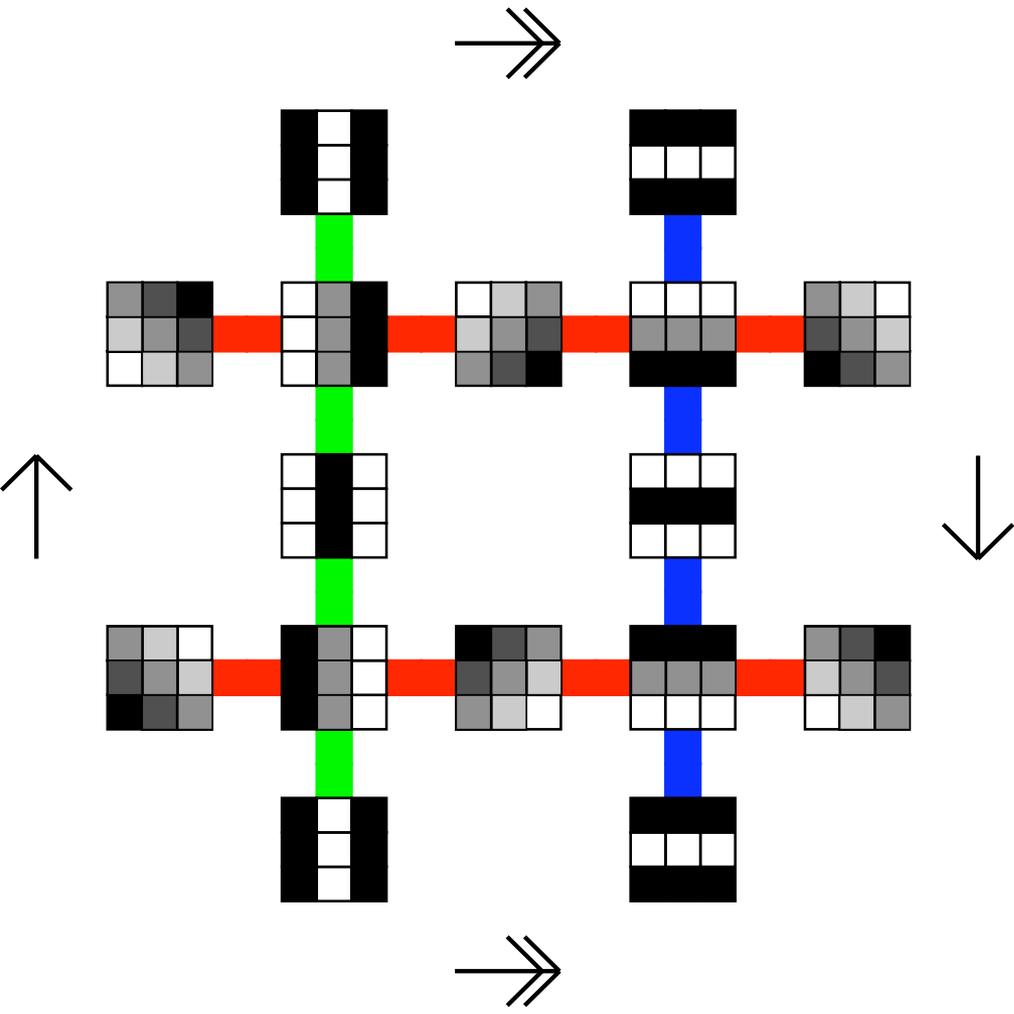


Image patch example

3rd densest group of patches

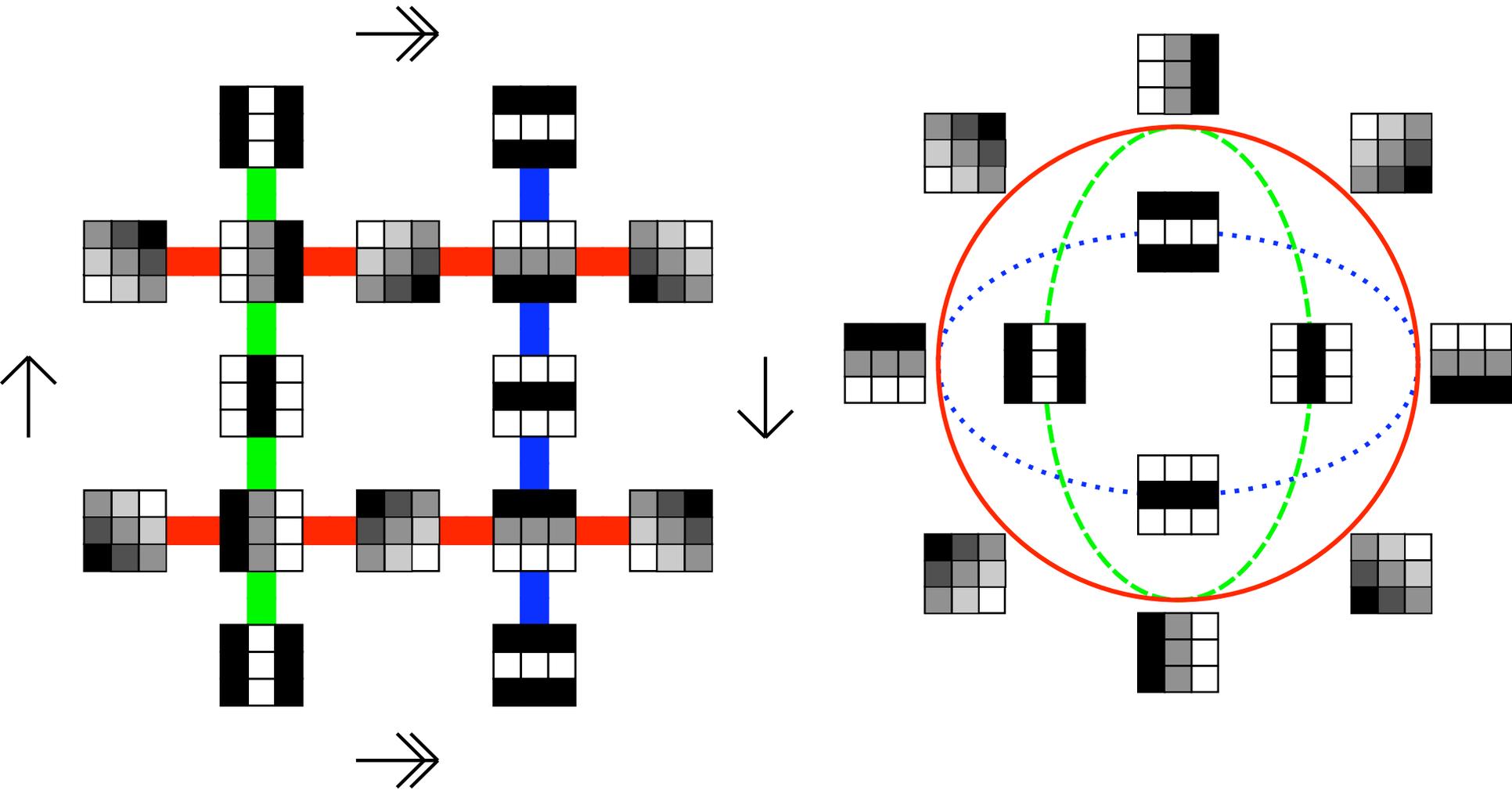


Image patch example

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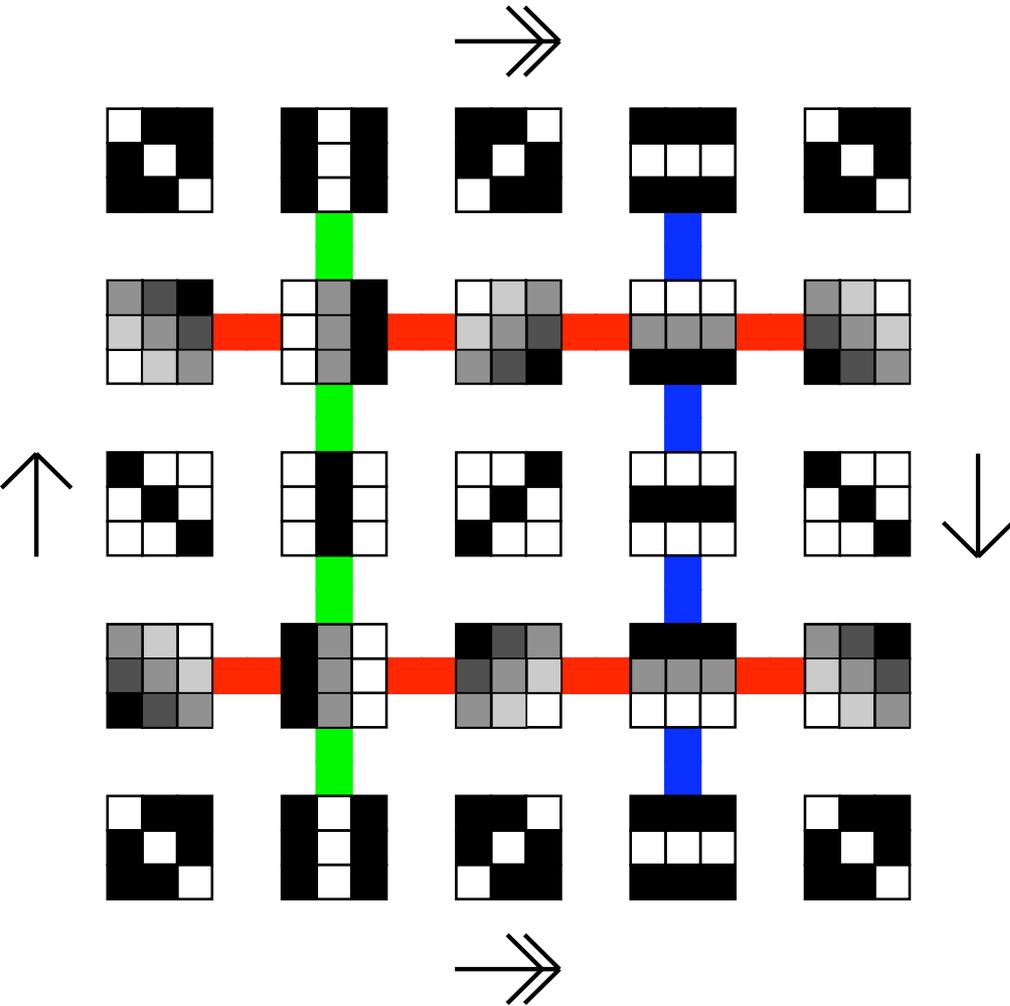


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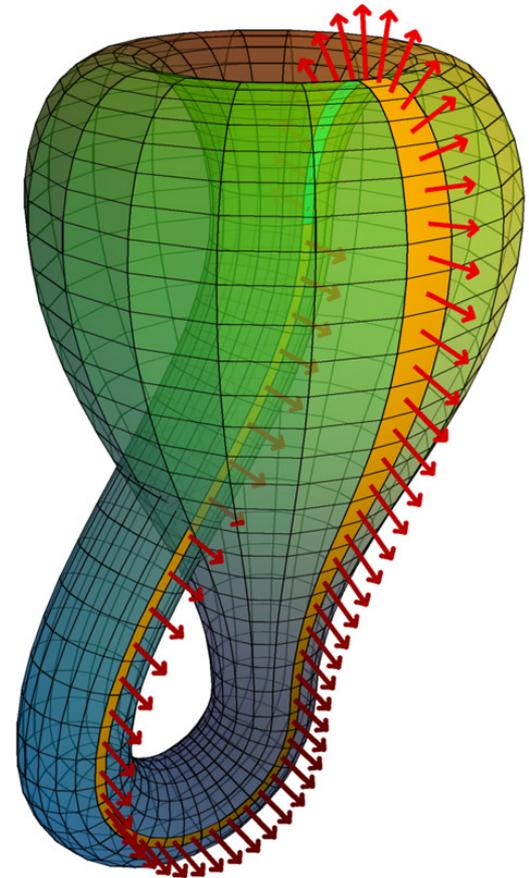
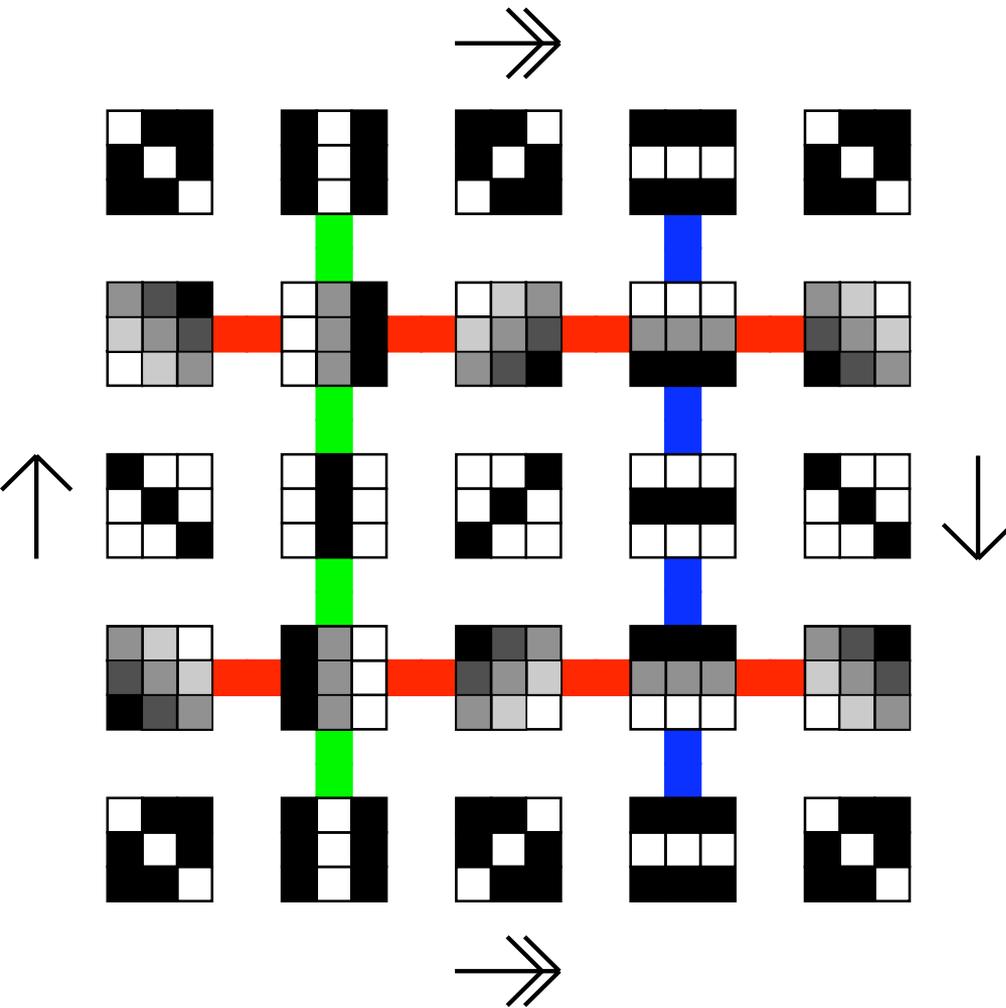
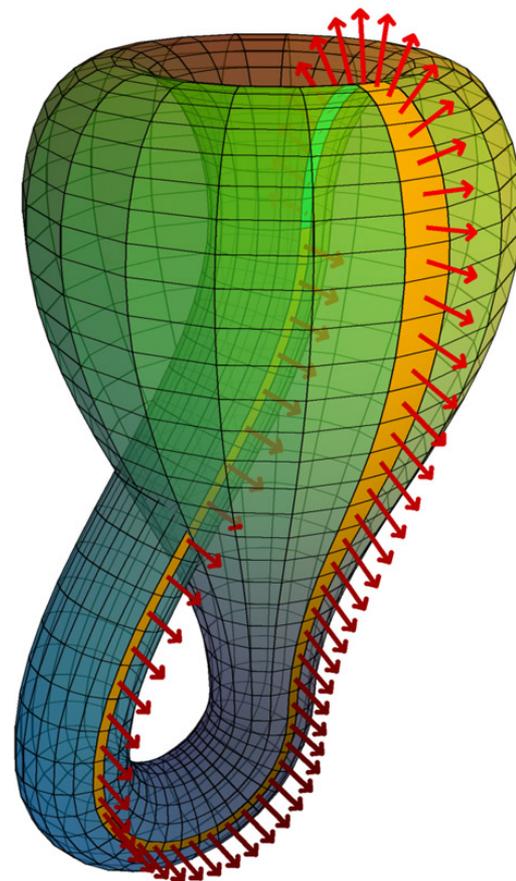
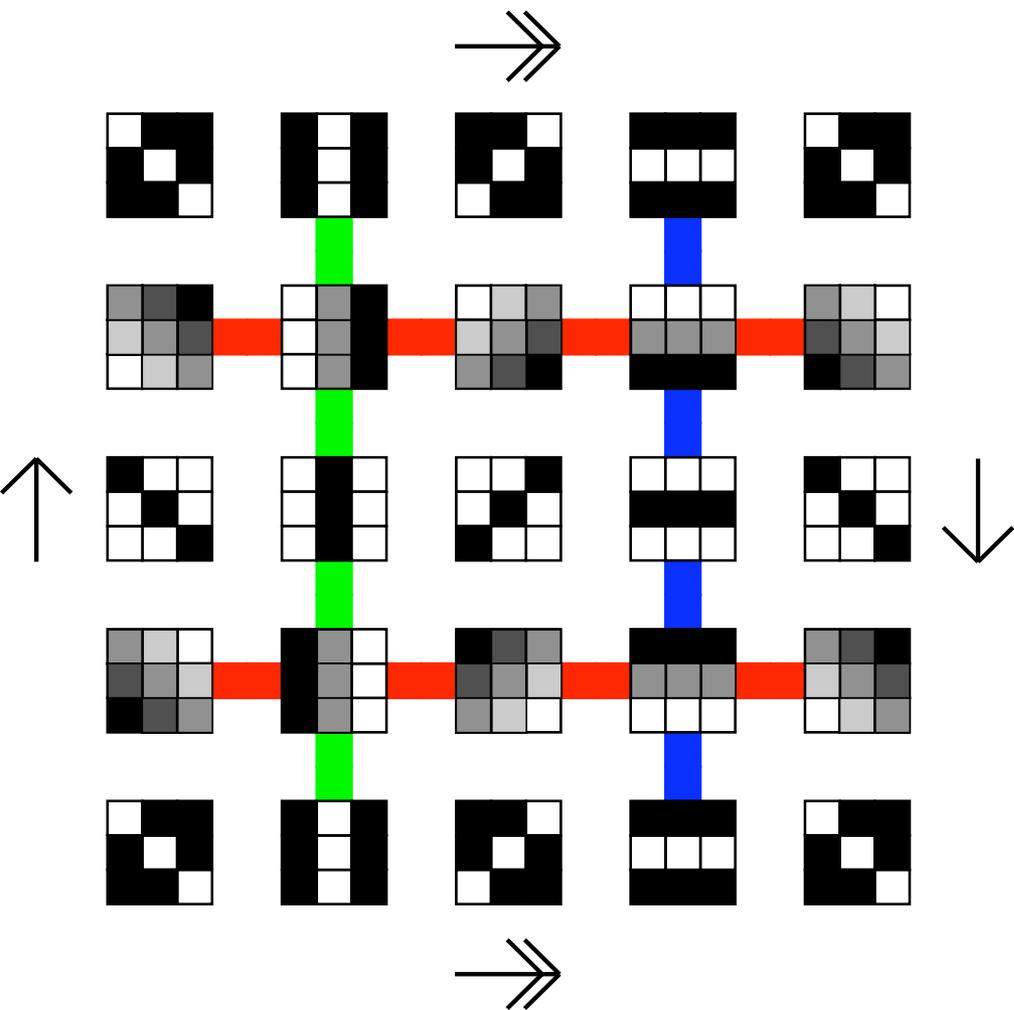


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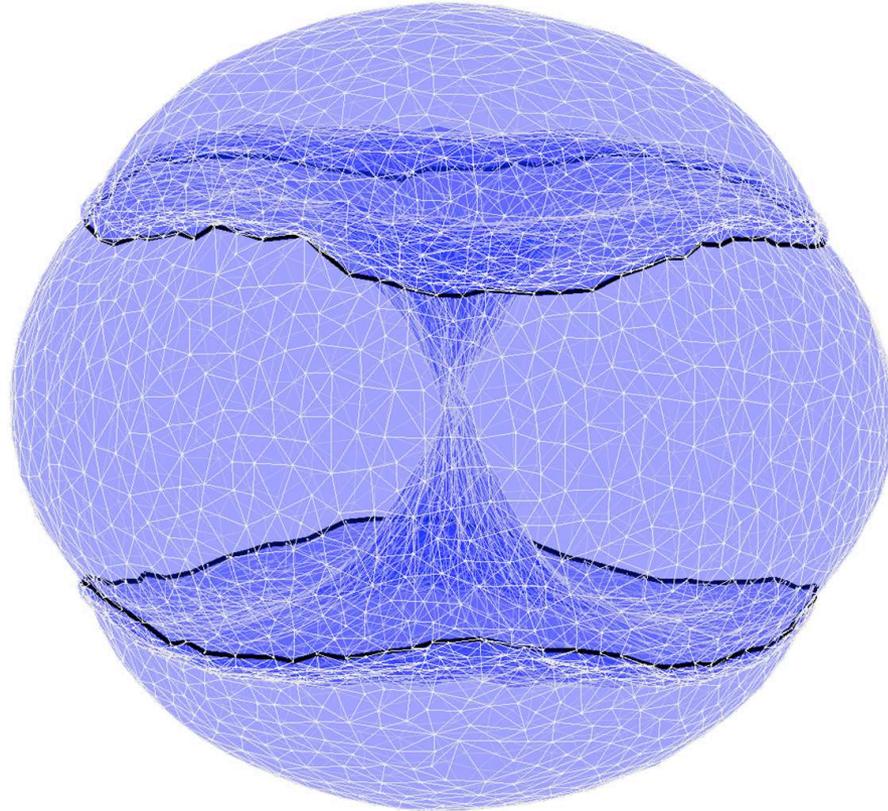


Interpretation: nature prefers linear and quadratic patches at all angles

Datasets have shapes

Example: Cyclo-Octane (C_8H_{16}) data

1,031,644 points in 72-dimensional space



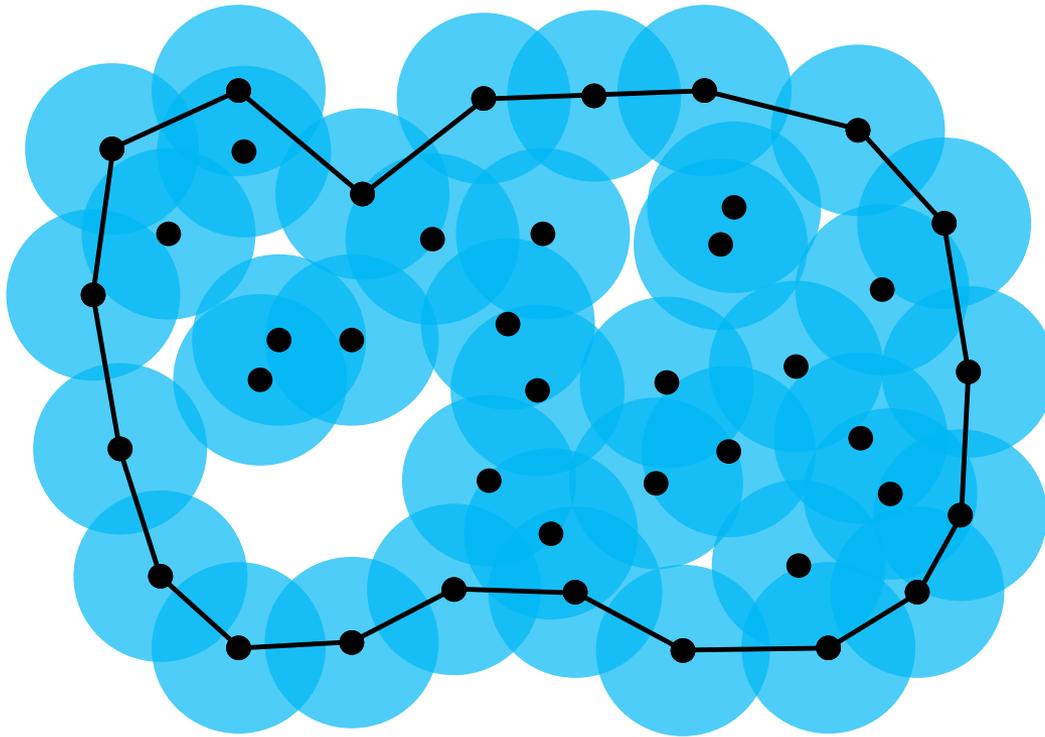
Non-Manifold Surface Reconstruction from High Dimensional Point Cloud Data by
Shawn Martin and Jean-Paul Watson, 2010.

References

- *An Attempt to Define the Nature of Chemical Diabetes Using a Multidimensional Analysis* by G. M. Reaven and R. G. Miller, 1979.
- *Non-Manifold Surface Reconstruction from High Dimensional Point Cloud Data* by Shawn Martin and Jean-Paul Watson, 2010.
- *On the Local Behavior of Spaces of Natural Images* by Gunnar Carlsson, Tigran Ishkhanov, Vin de Silva, and Afra Zomorodian, 2008.

Coverage problem

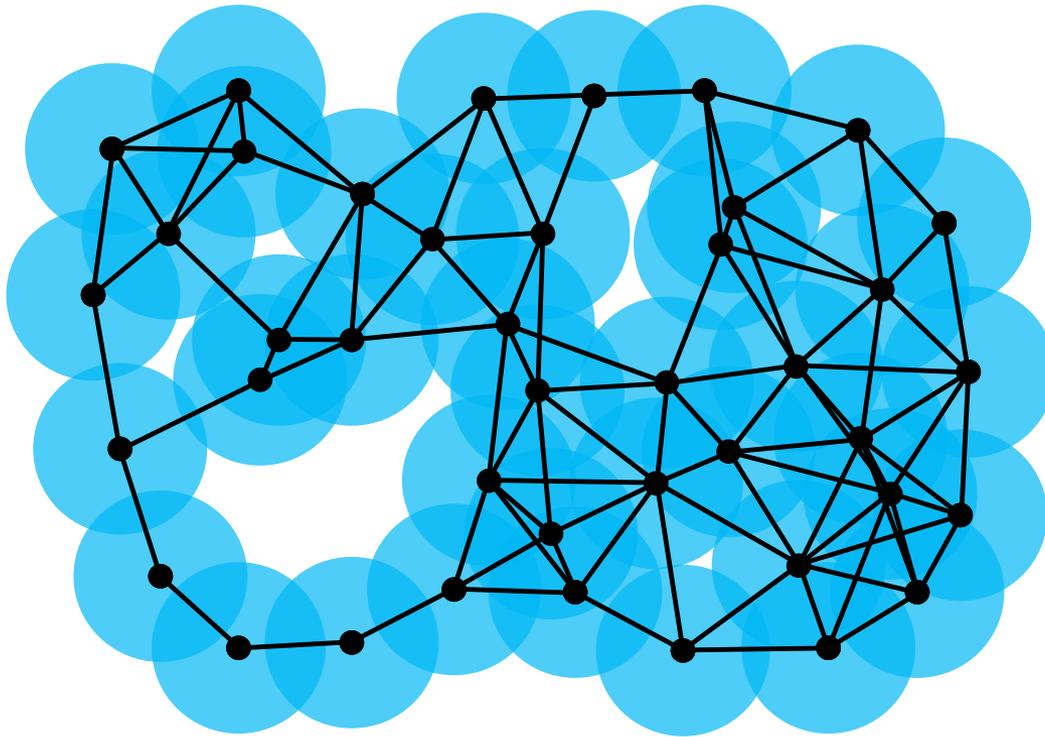
- Sensors in a domain $\mathcal{D} \subset \mathbb{R}^n$.



Coordinate-free Coverage in Sensor Networks with Controlled Boundaries via Homology by V. de Silva and R. Ghrist

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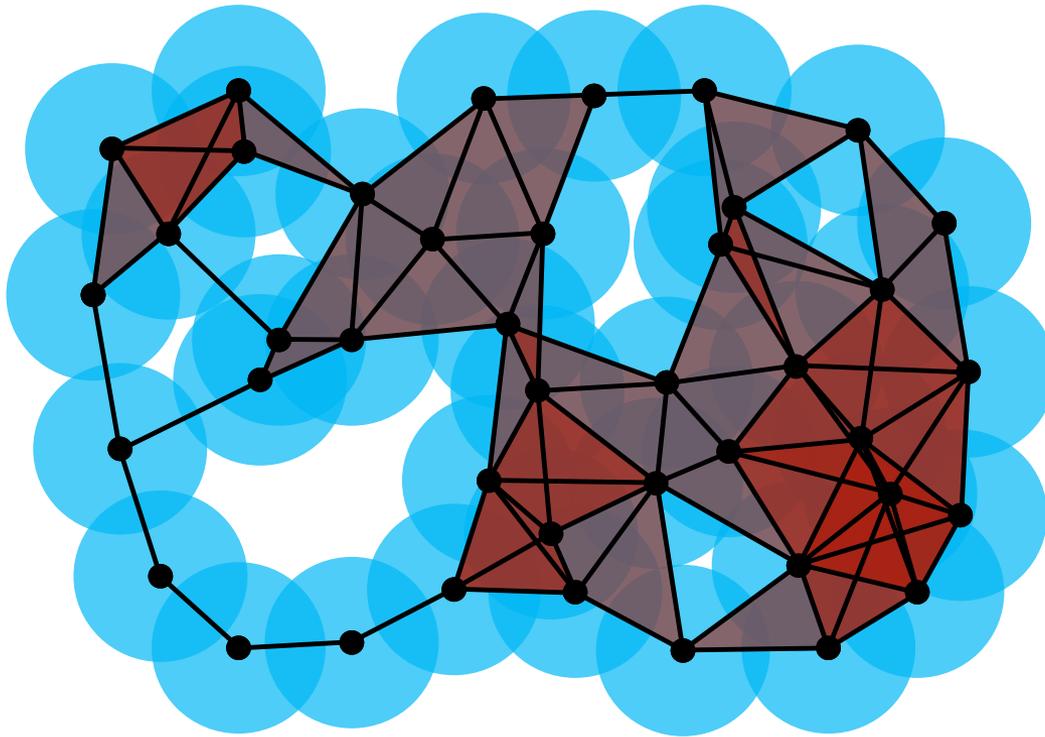
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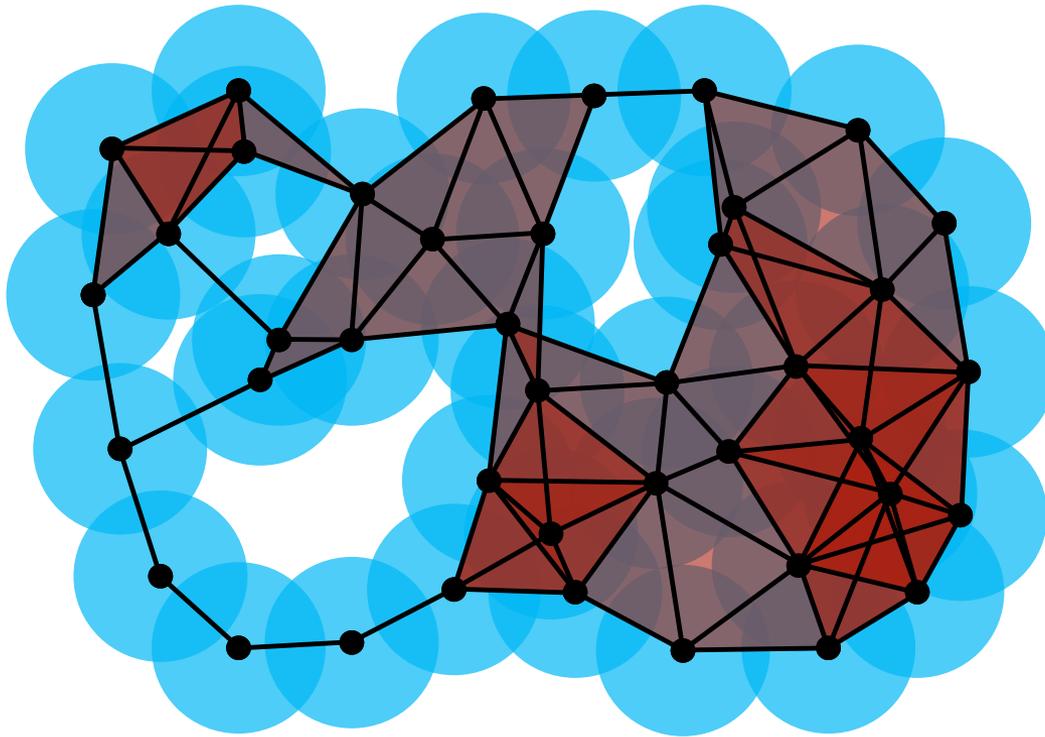
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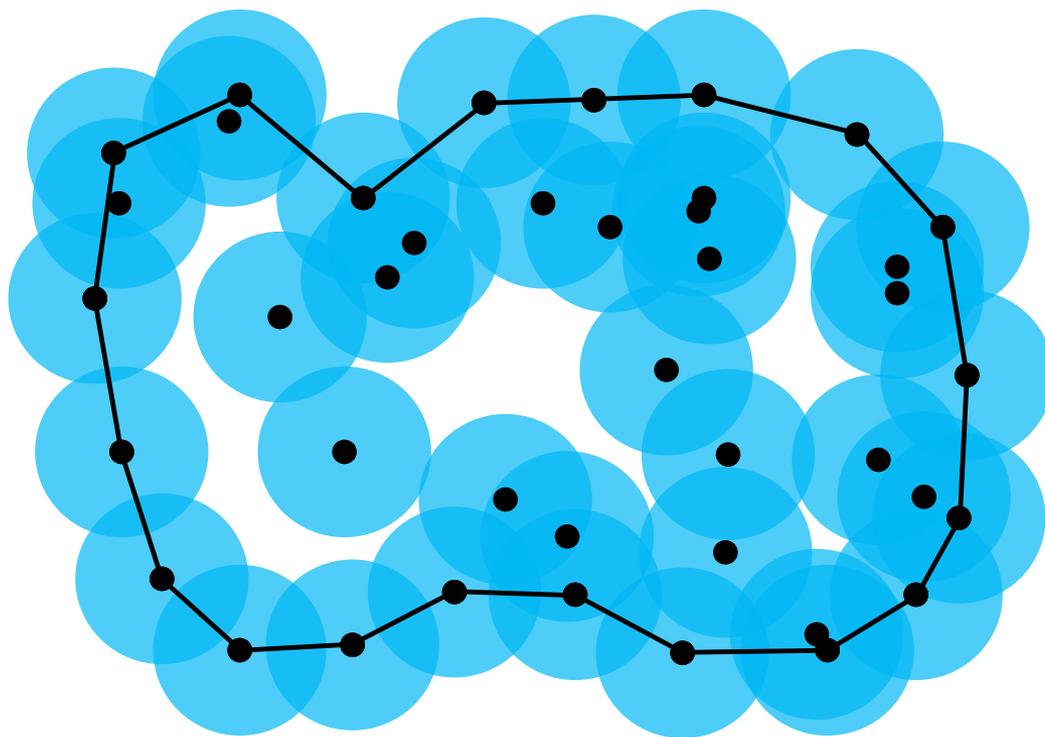
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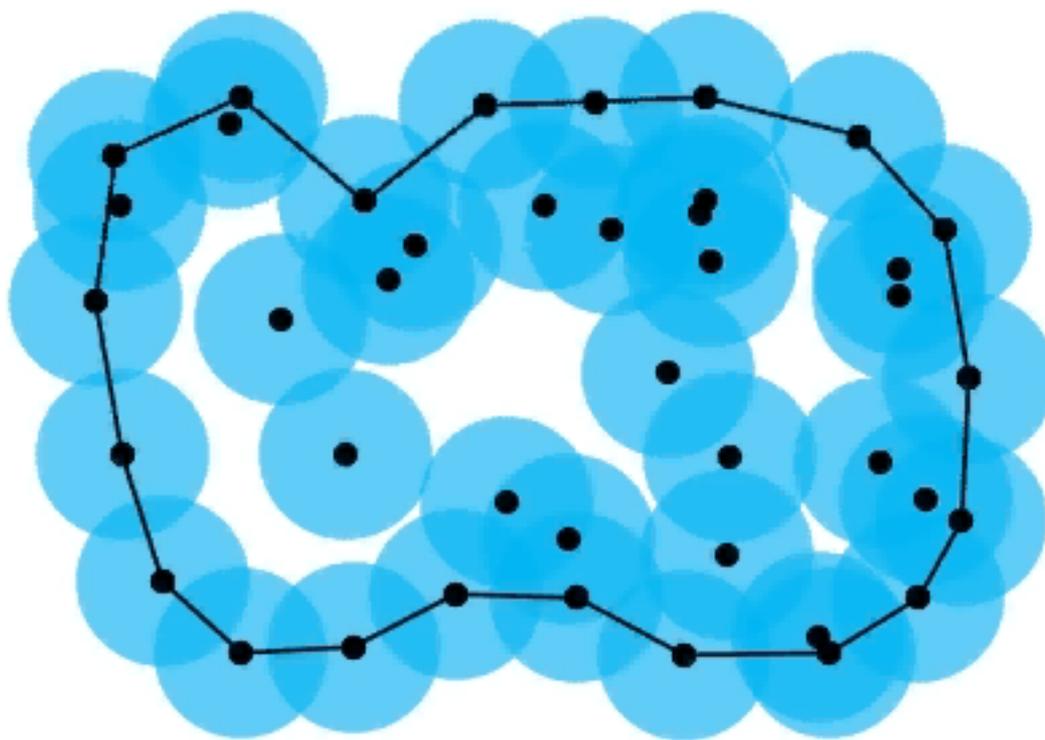
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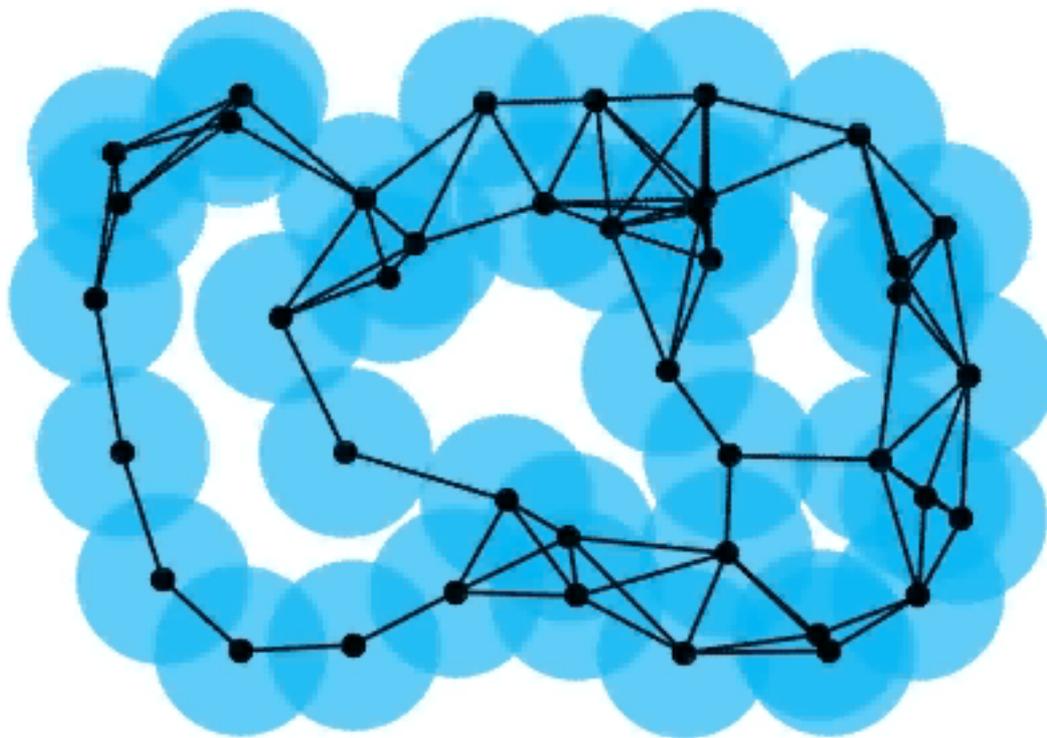
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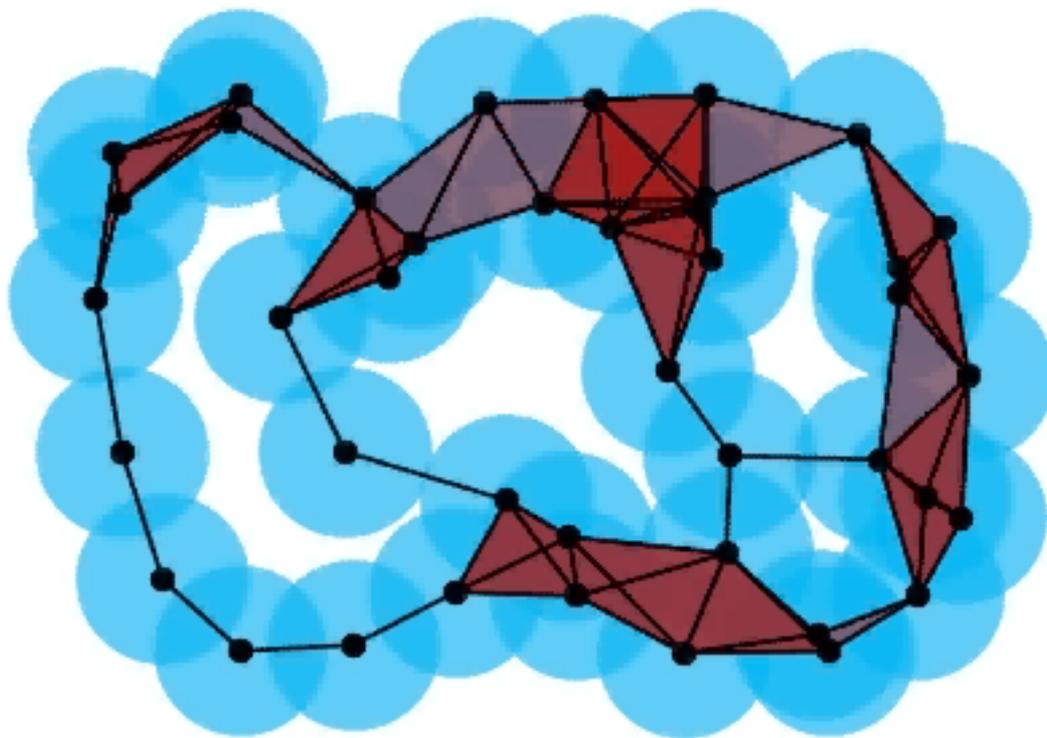
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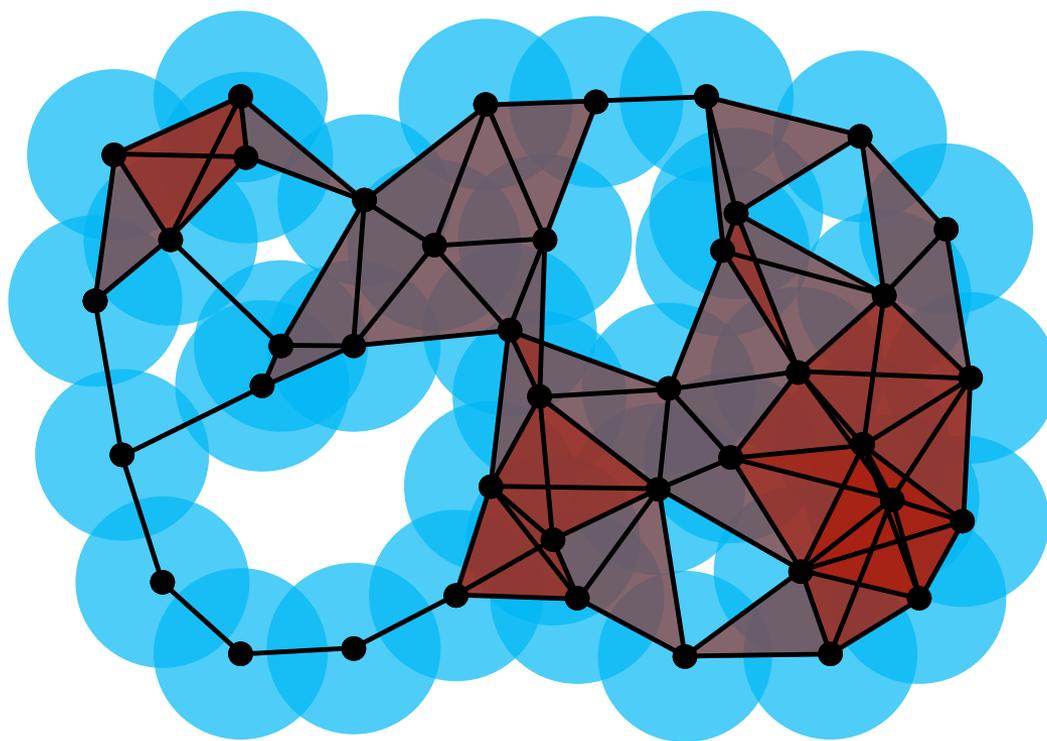
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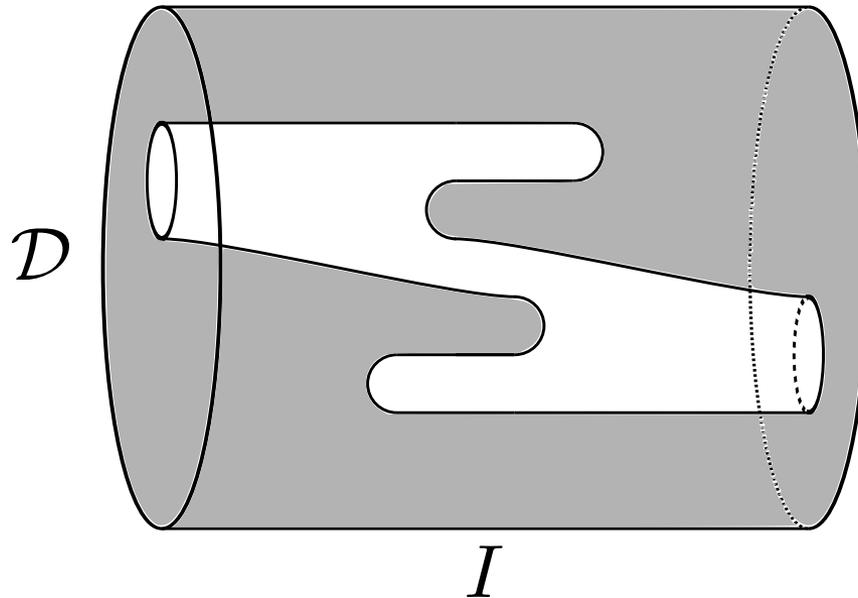
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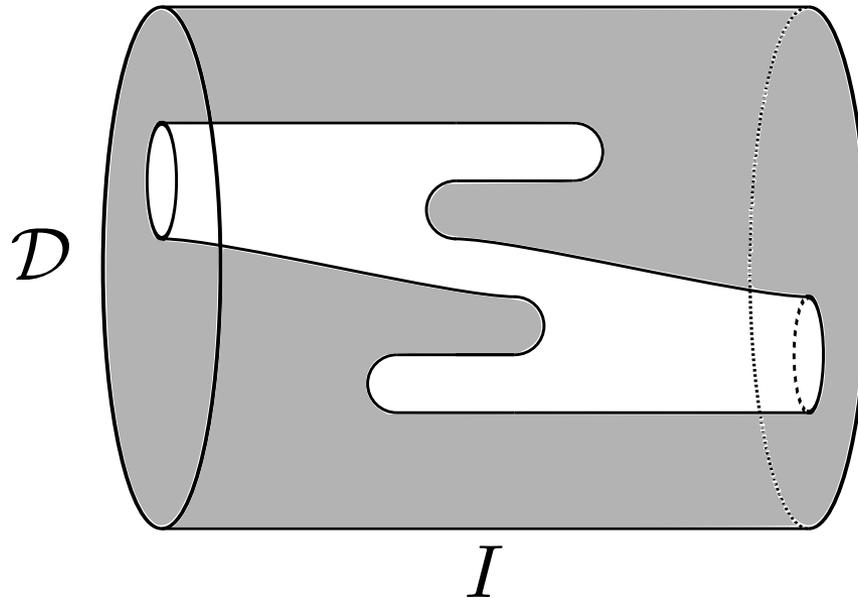
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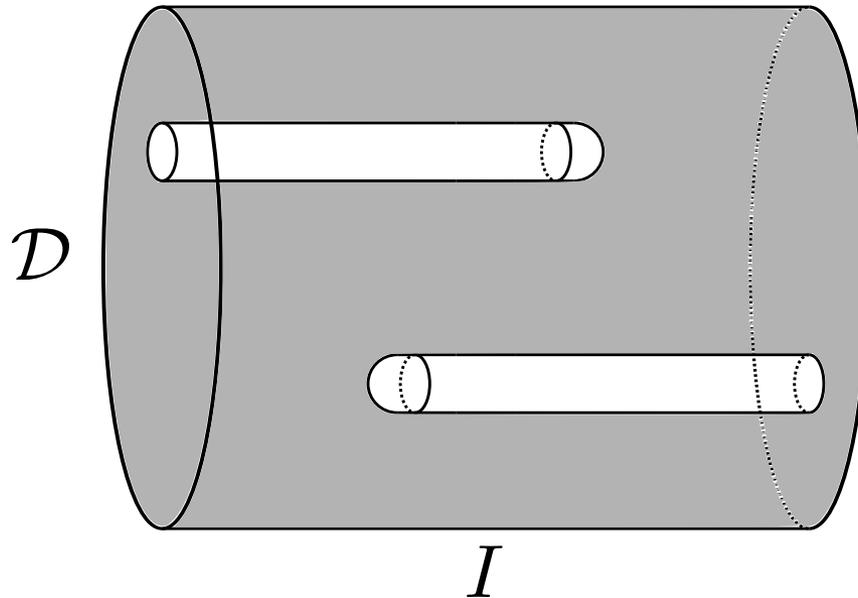
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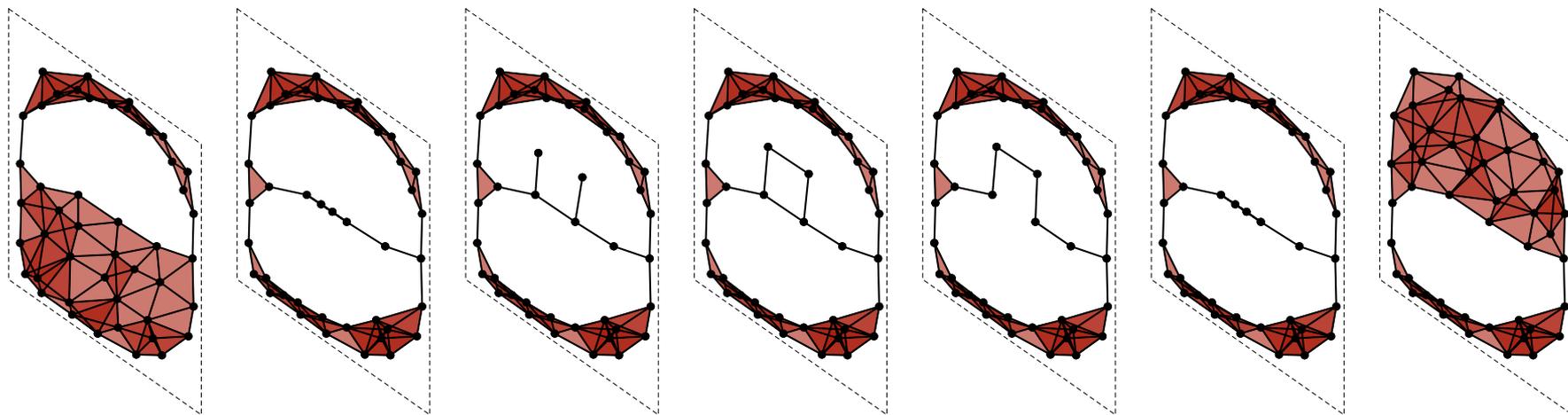
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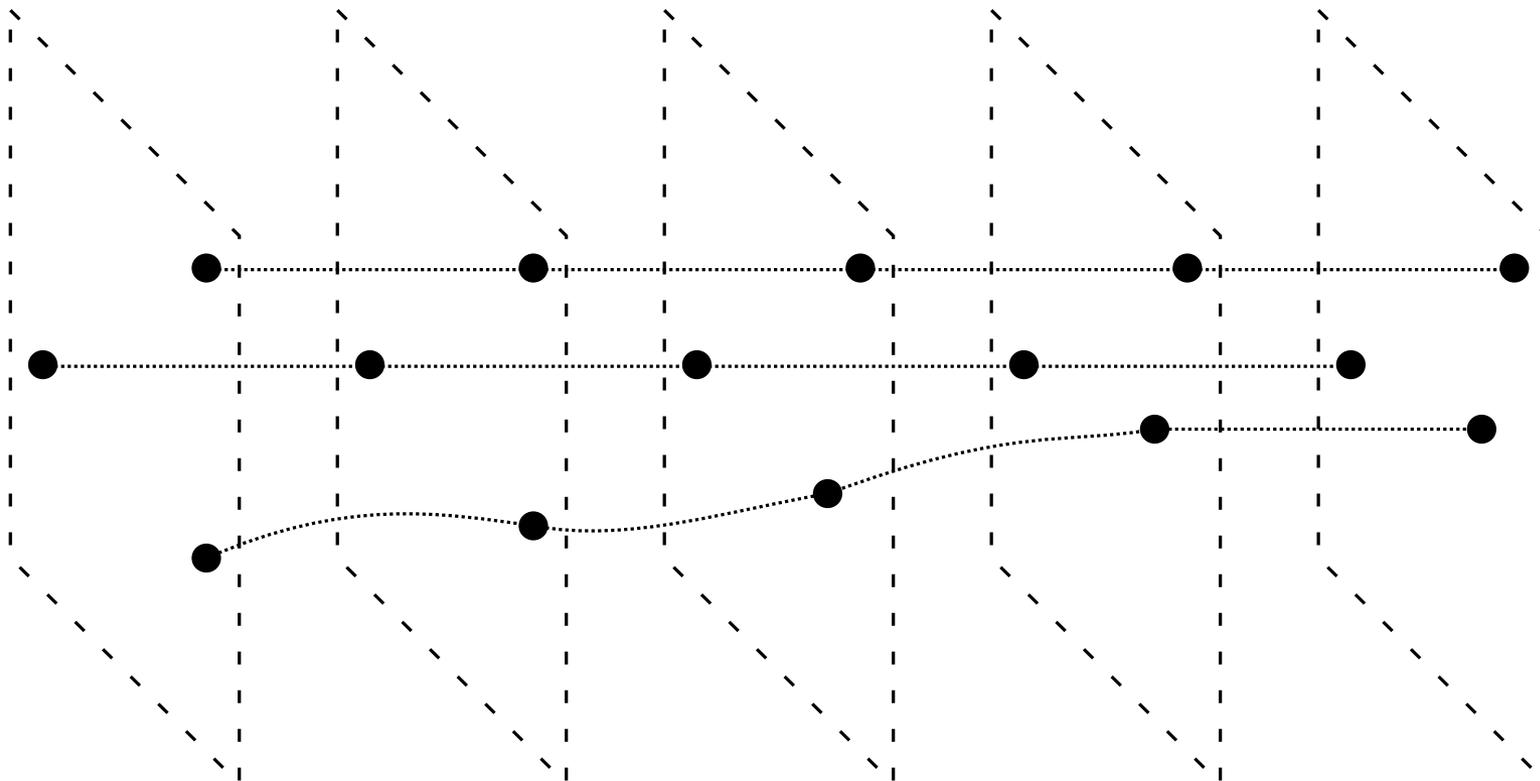
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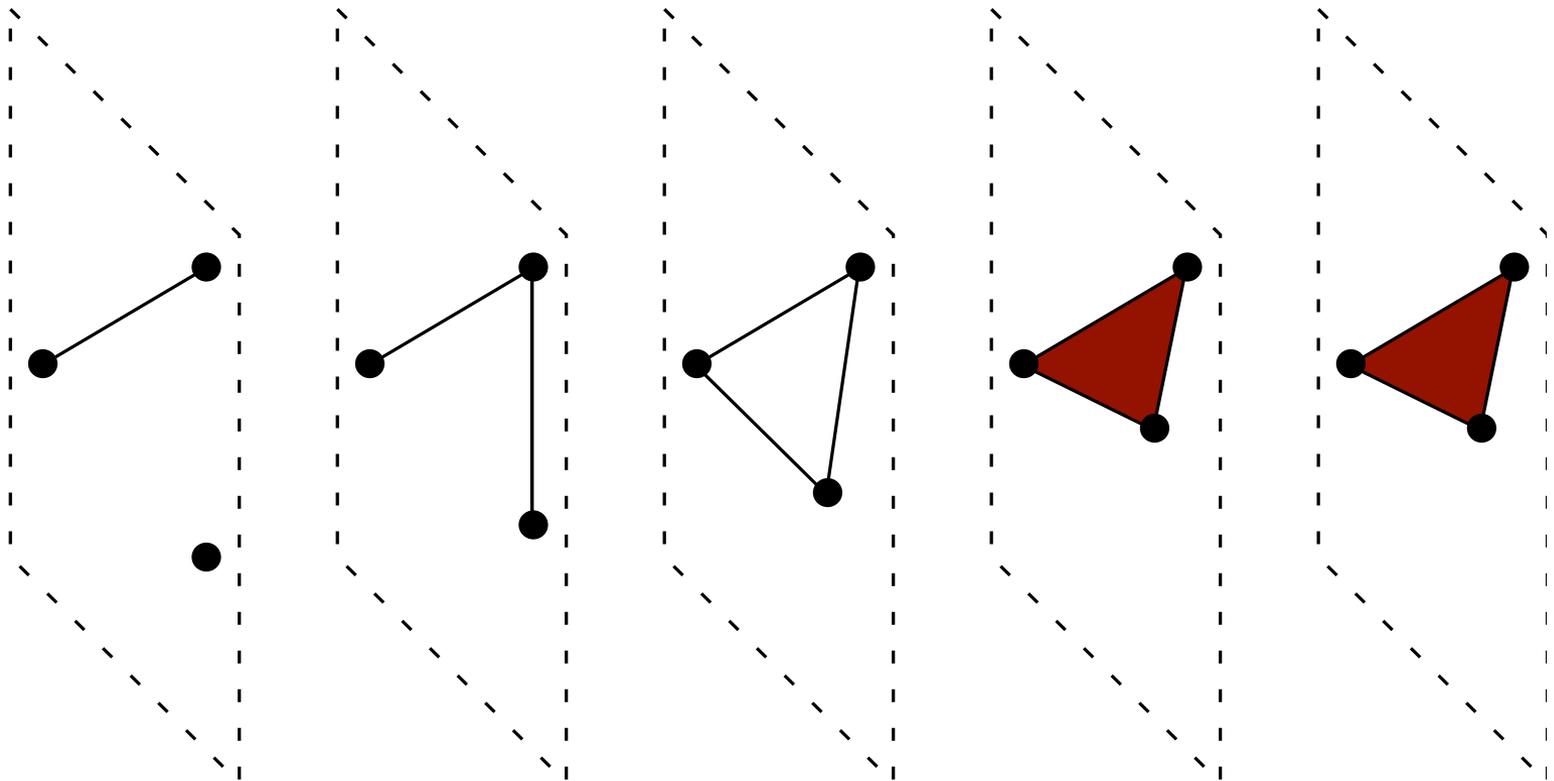
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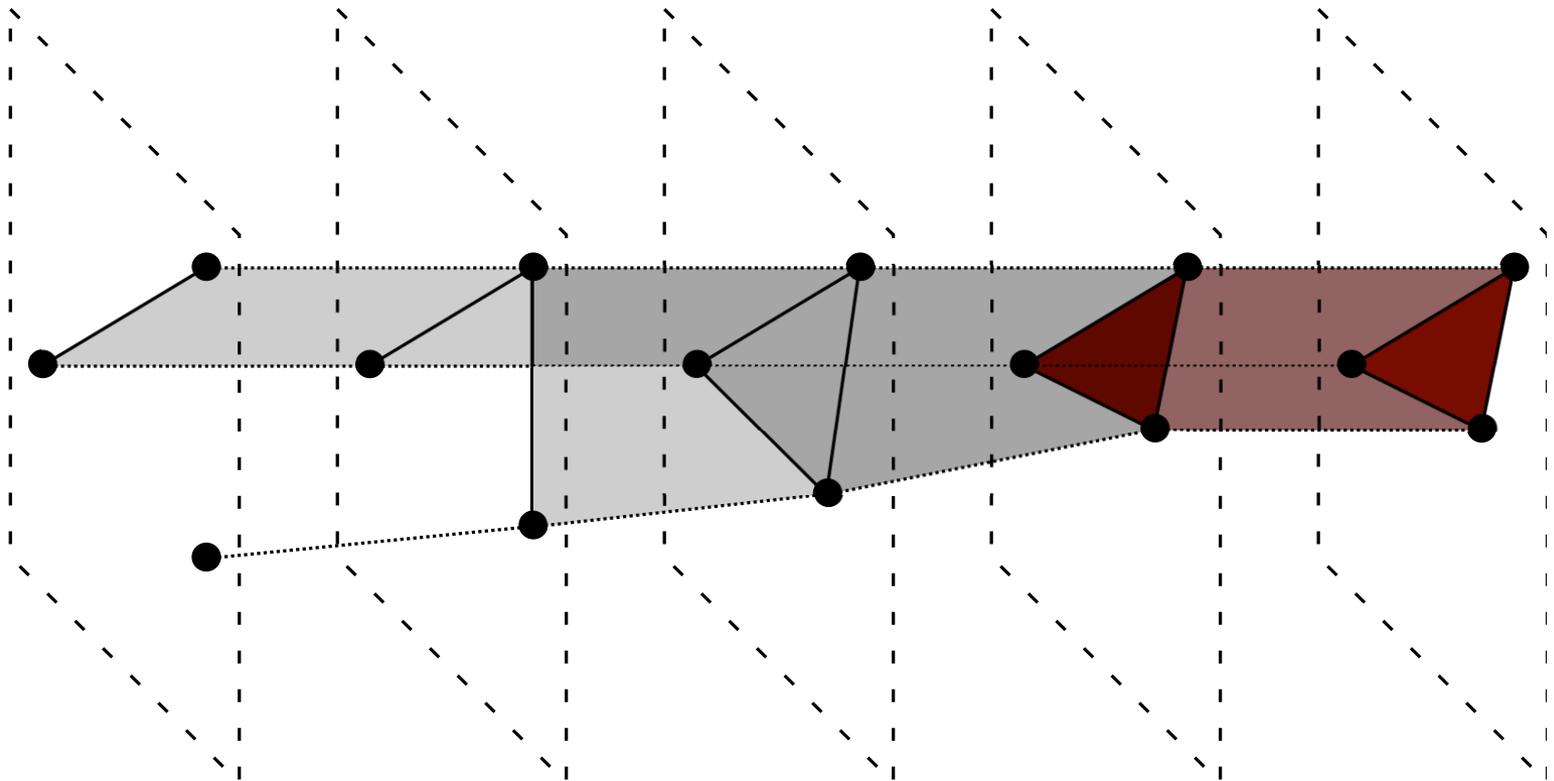
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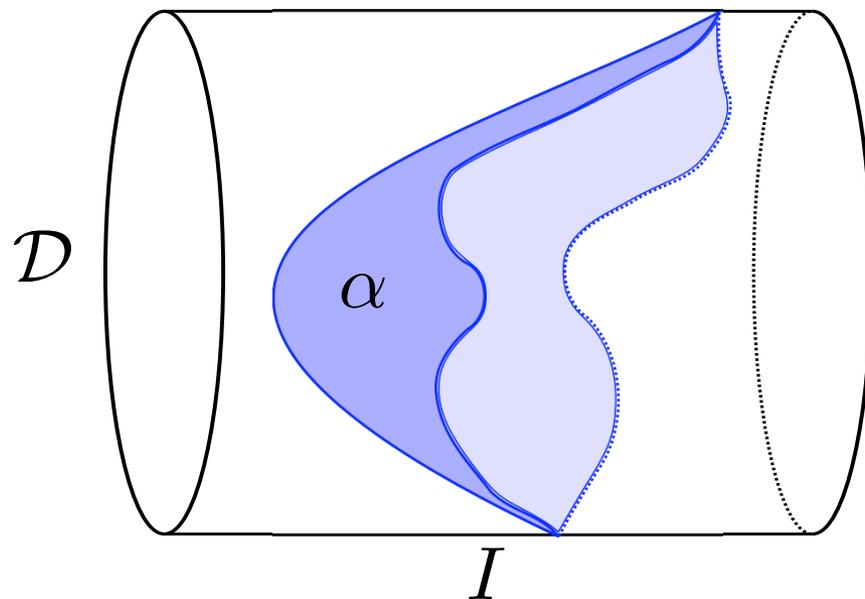
Coordinate-free Coverage in Sensor Networks with Controlled Boundaries via Homology by V. de Silva and R. Ghrist

Evasion problem

- Theorem 7 (reformulated)

If there is an $\alpha \in H_n(\mathcal{SC}, \partial\mathcal{D} \times I)$ with

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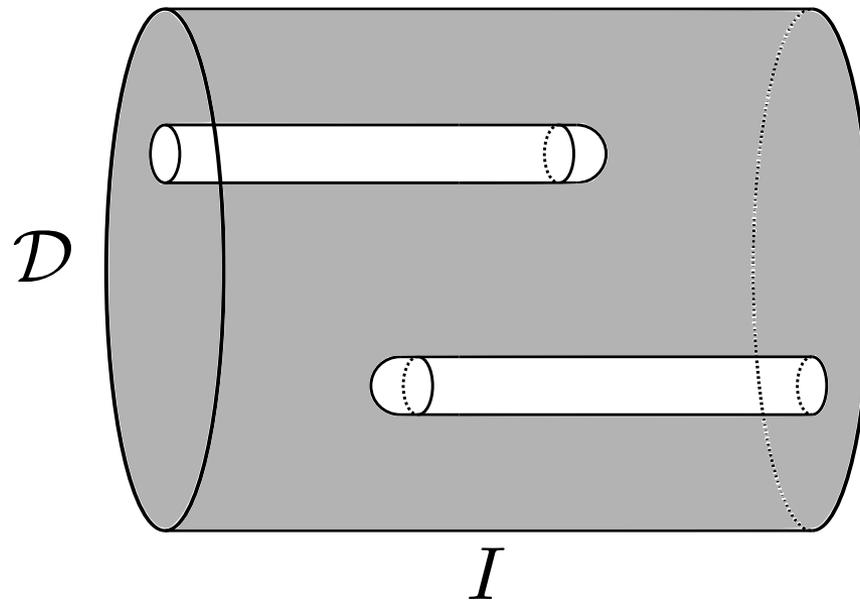
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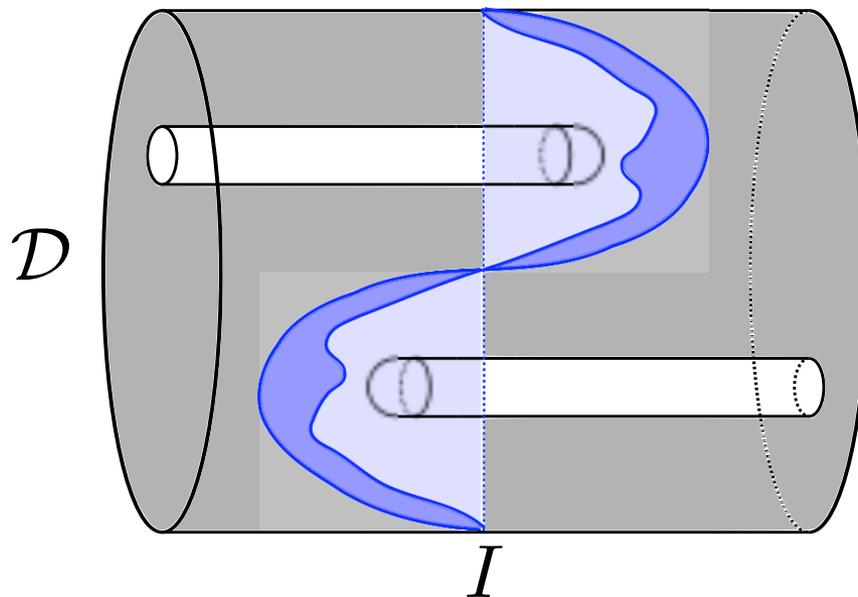


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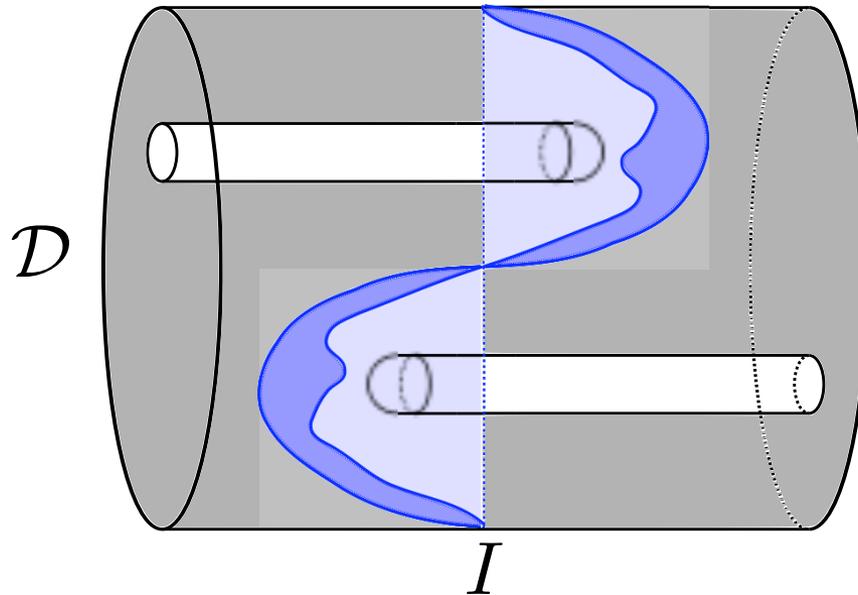
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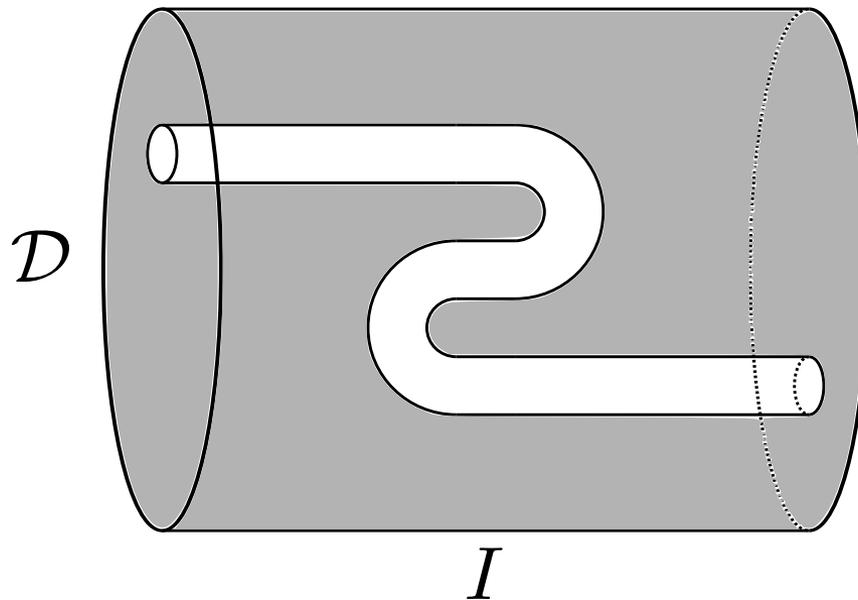
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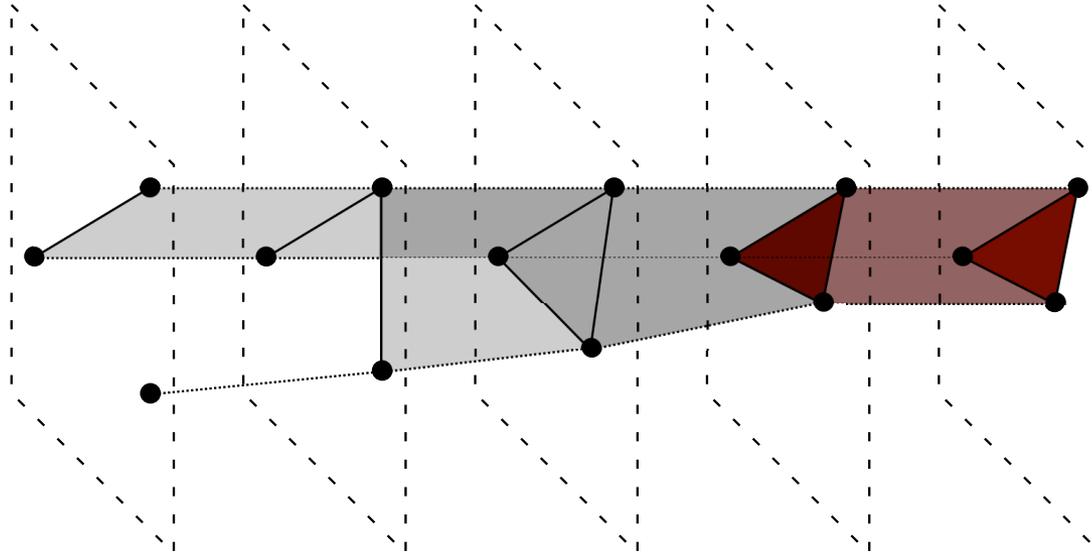
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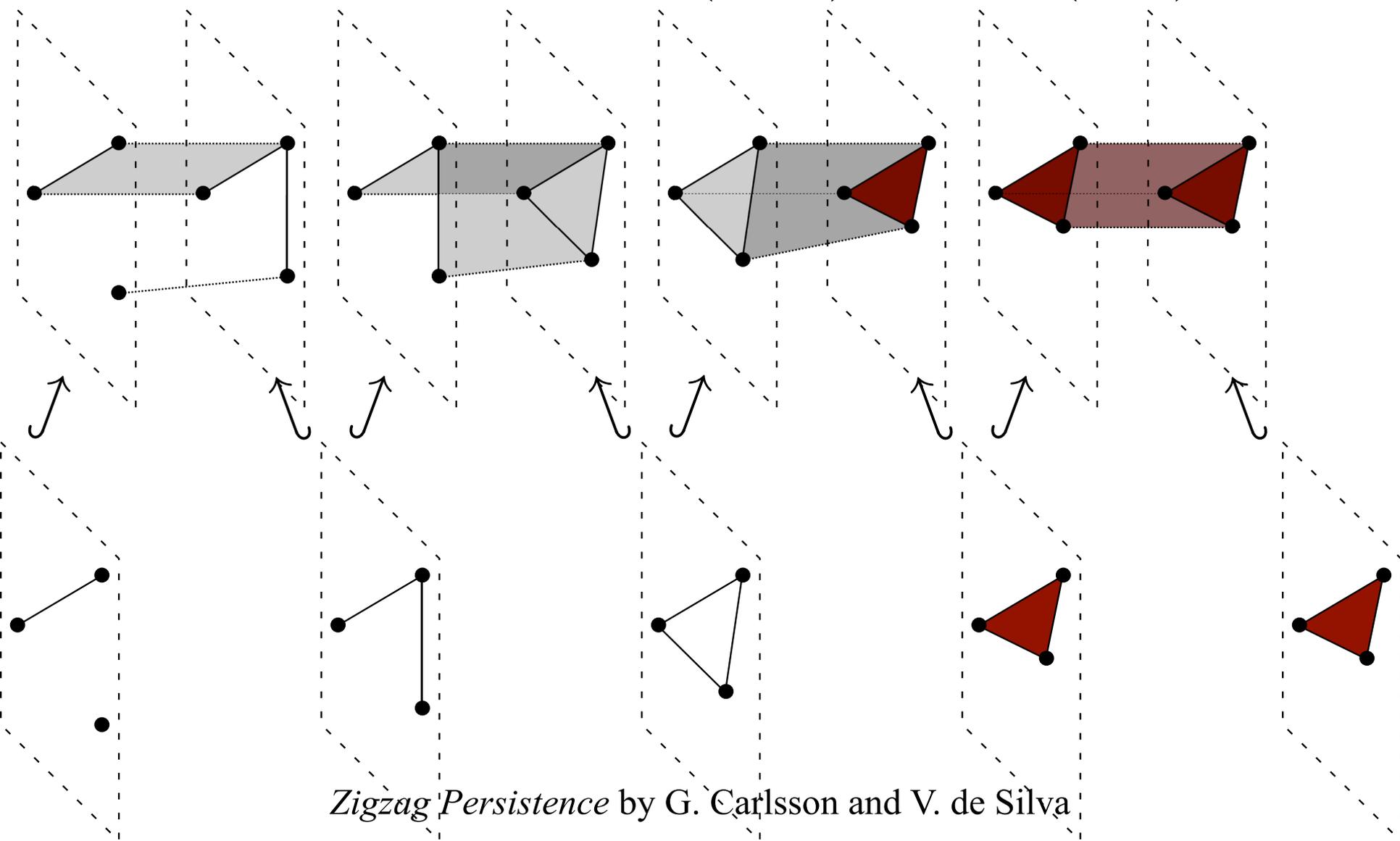
Zigzag persistence

- Form ZSC and take $H_{n-1}(ZSC) \cong H_{n-1}(ZX)$.



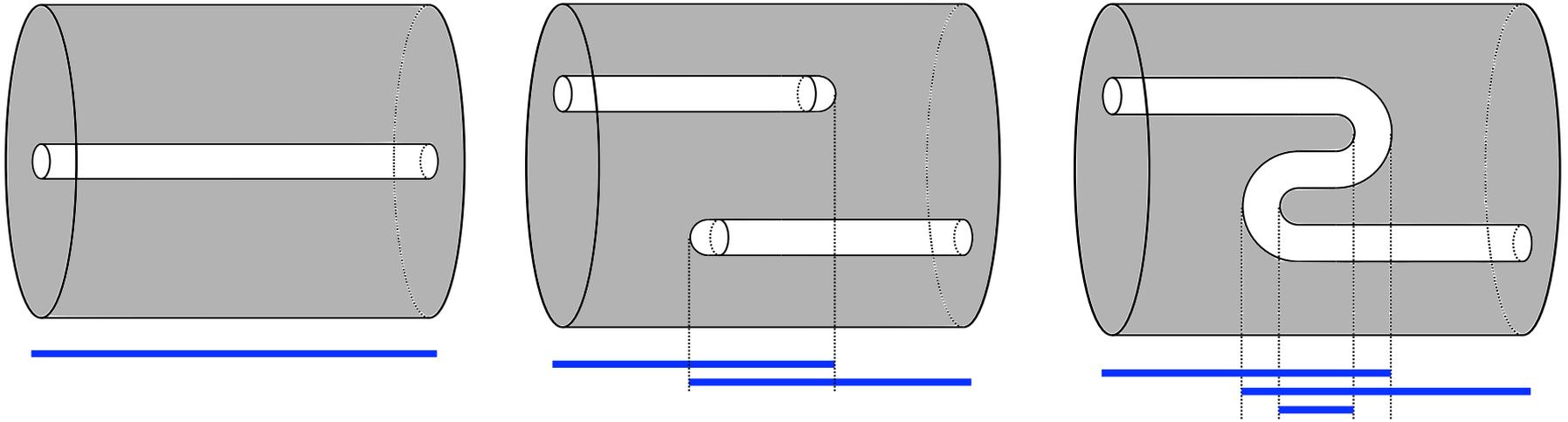
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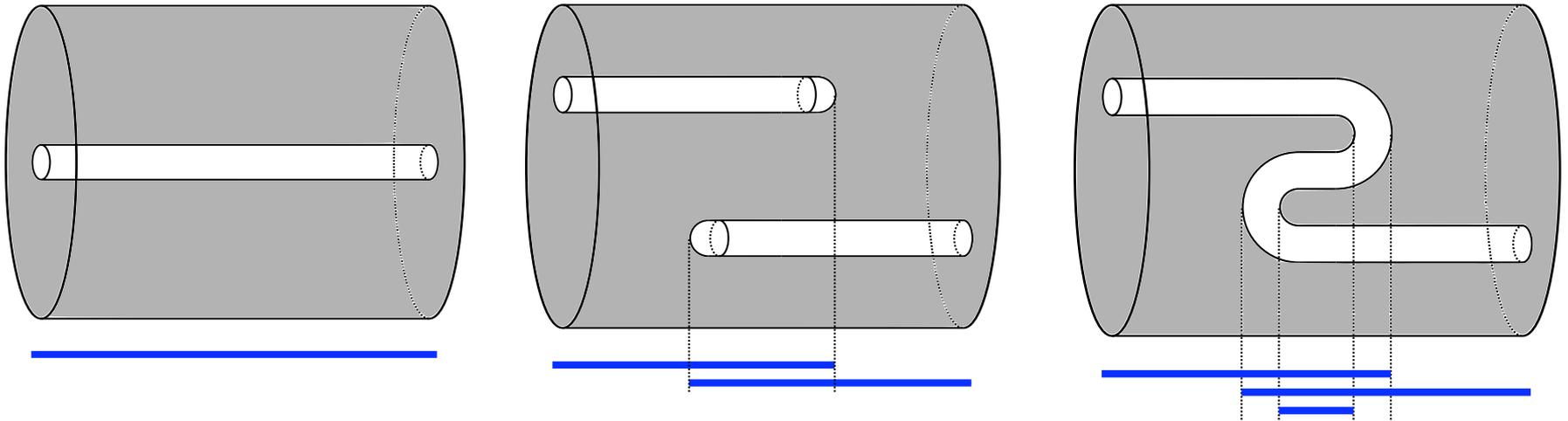
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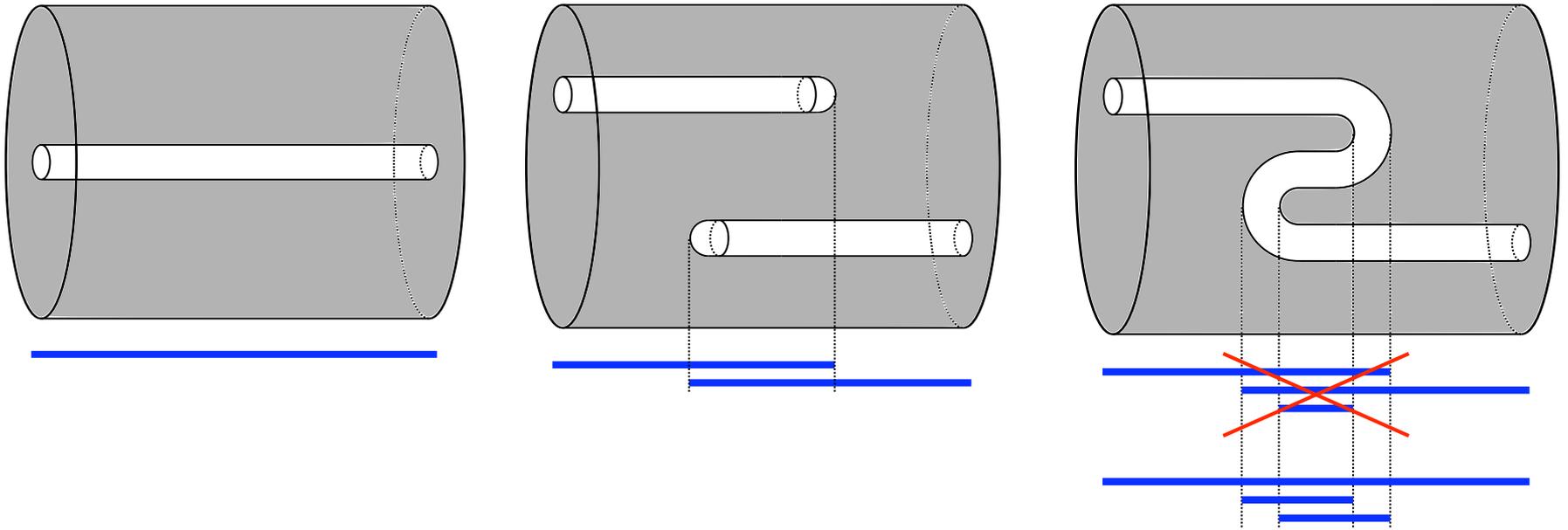
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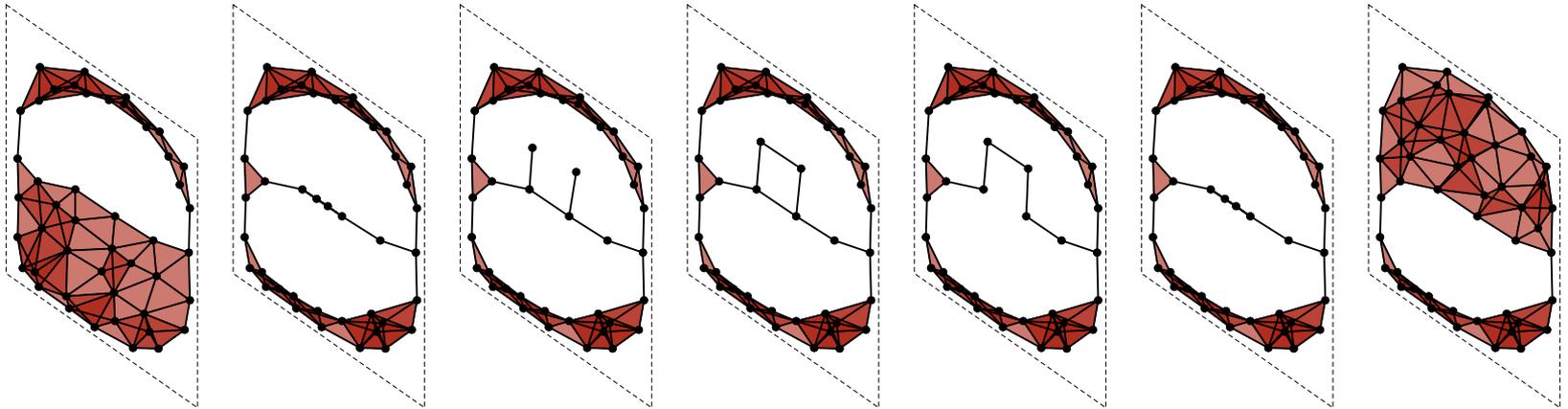
- Hypothesis: there is an evasion path \Leftrightarrow there is a long bar.
- \Rightarrow is true, but \Leftarrow is false.

Dependence on embedding $X \hookrightarrow \mathcal{D} \times I$

- \mathcal{SC} alone does not determine if an evasion path exists.
- Two networks with the same \mathcal{SC} . Top contains evasion path while bottom does not.

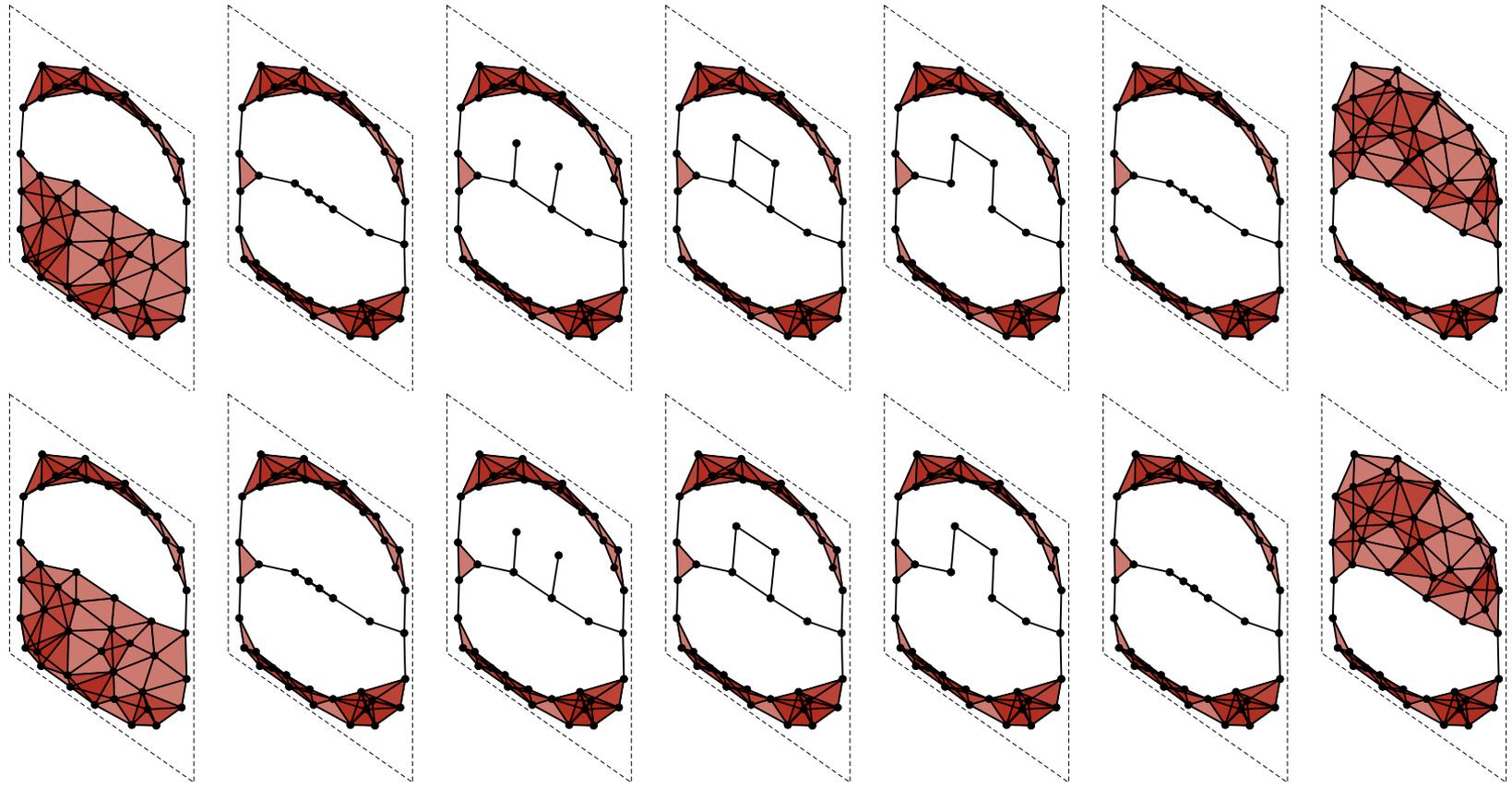
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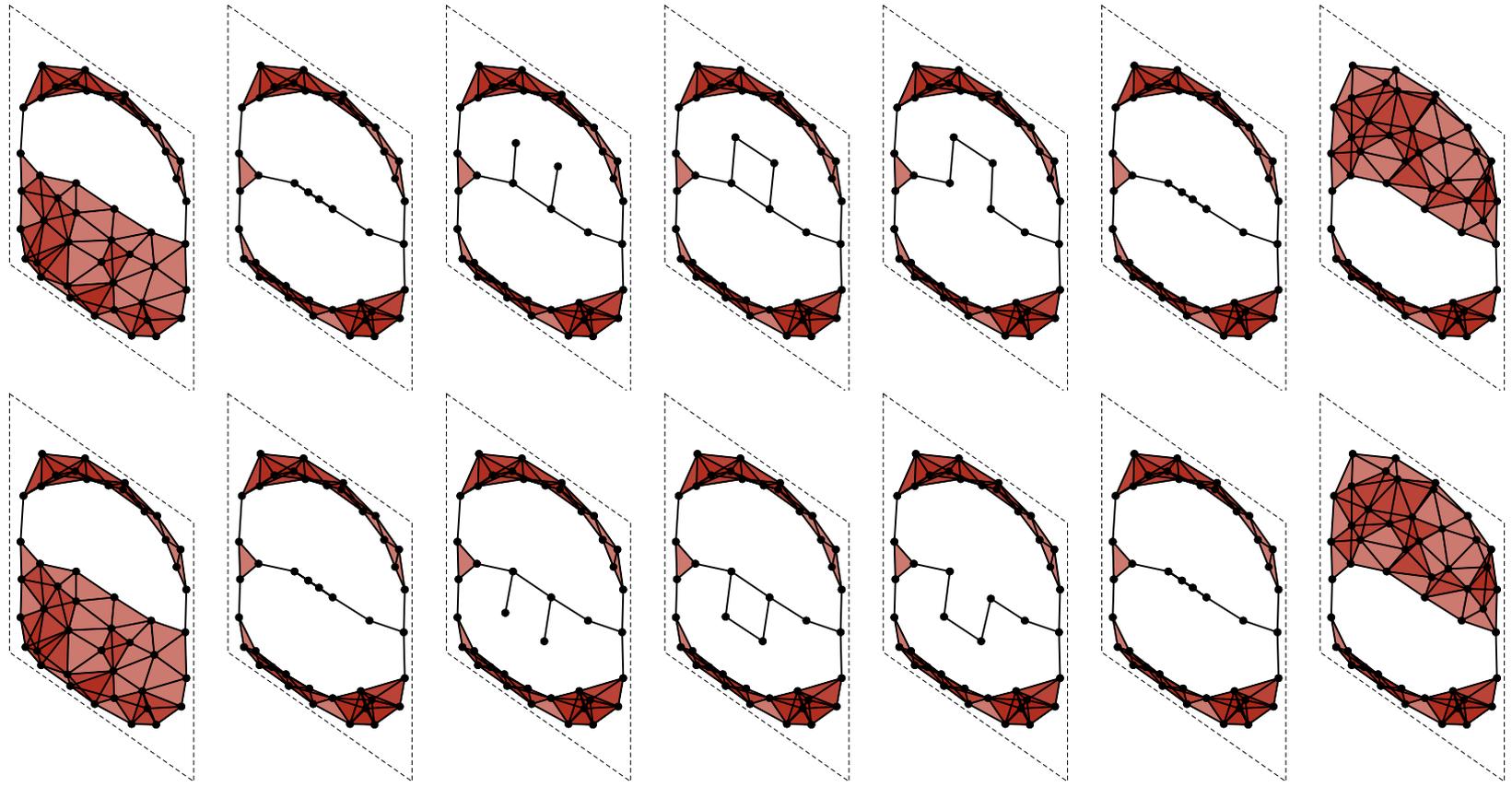
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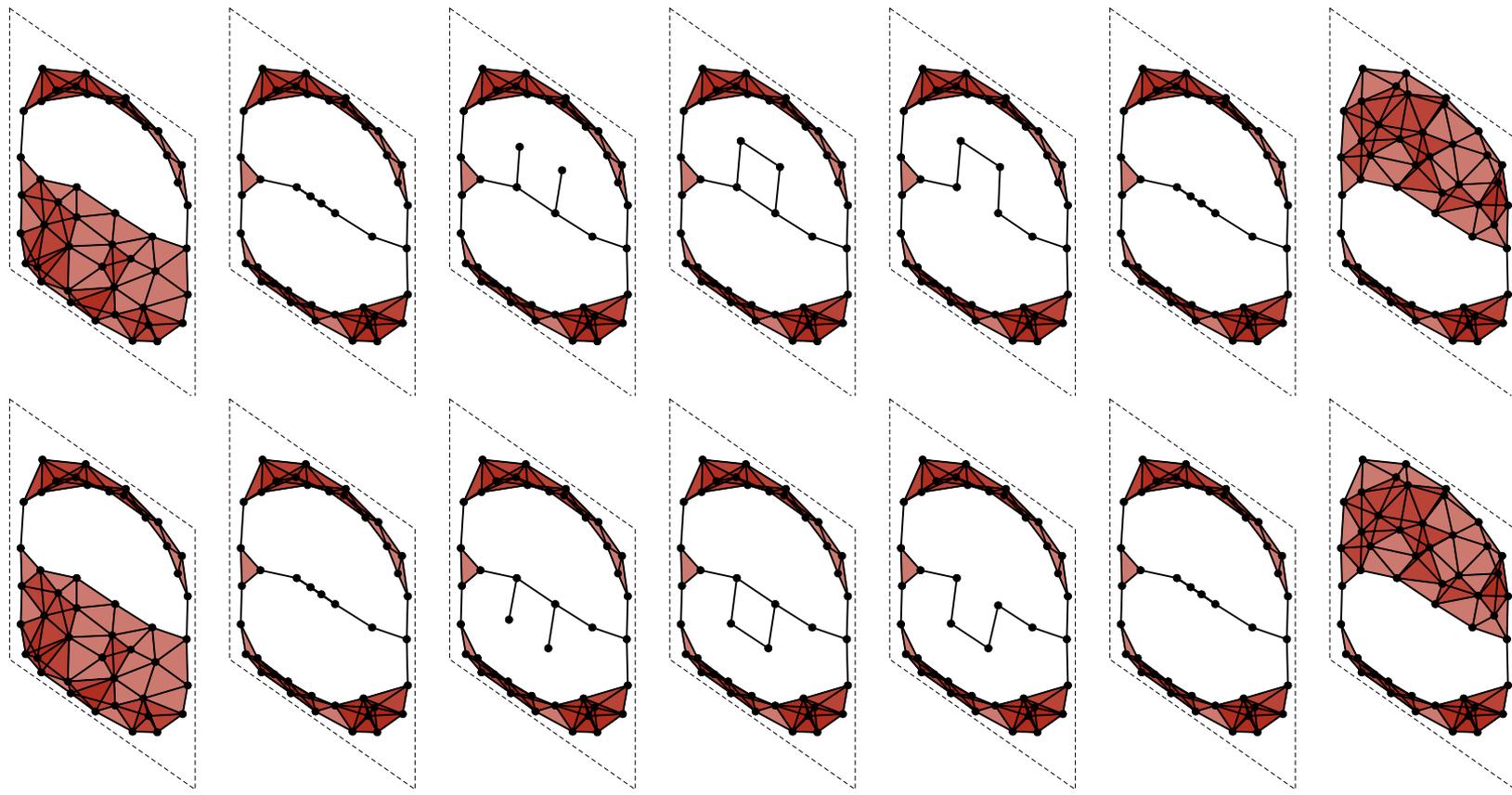
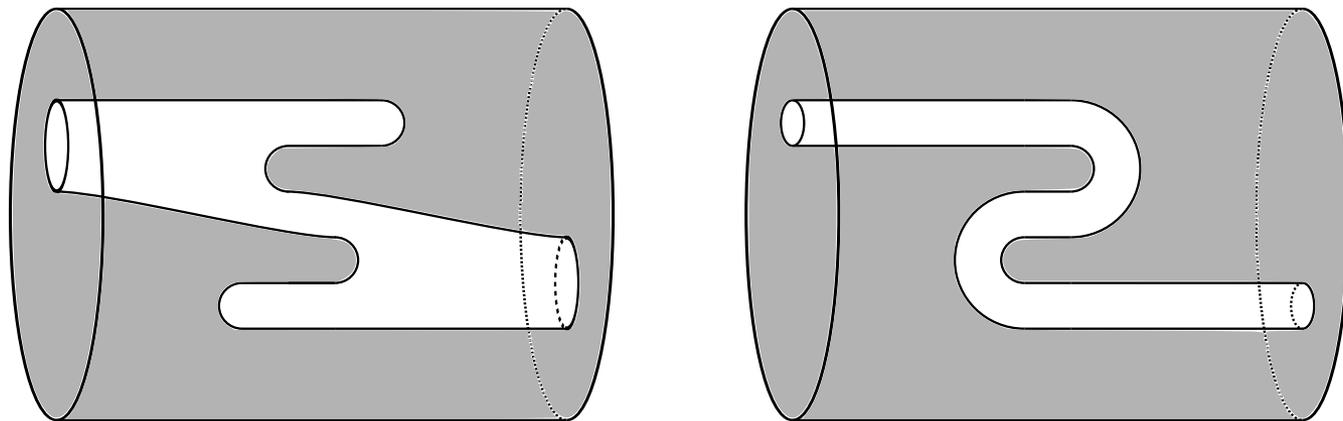


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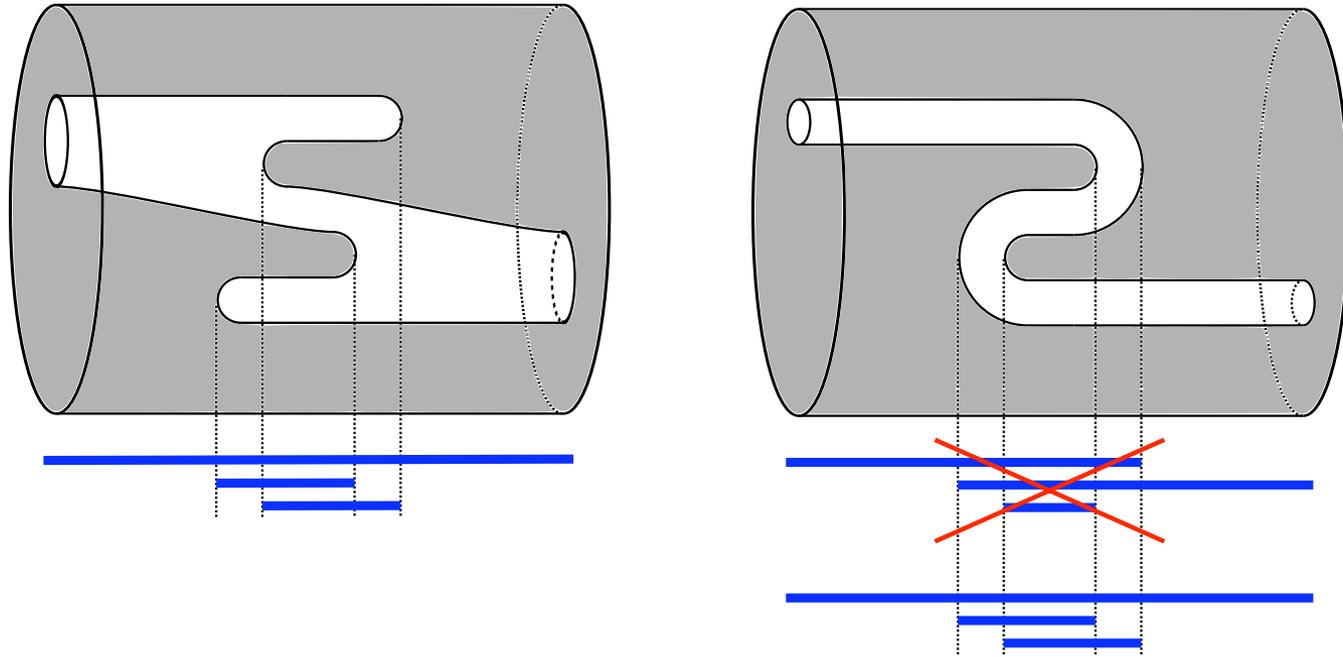
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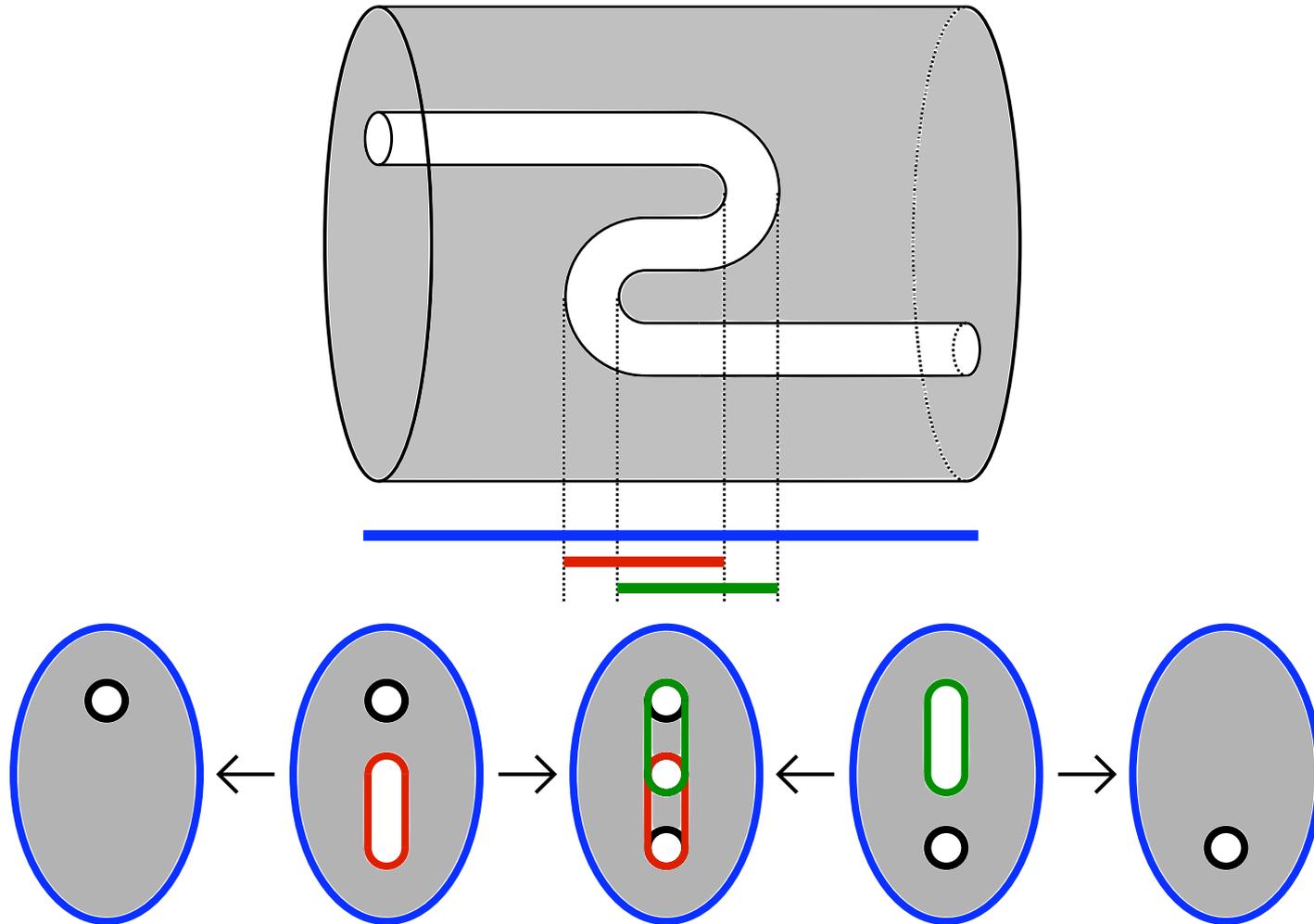


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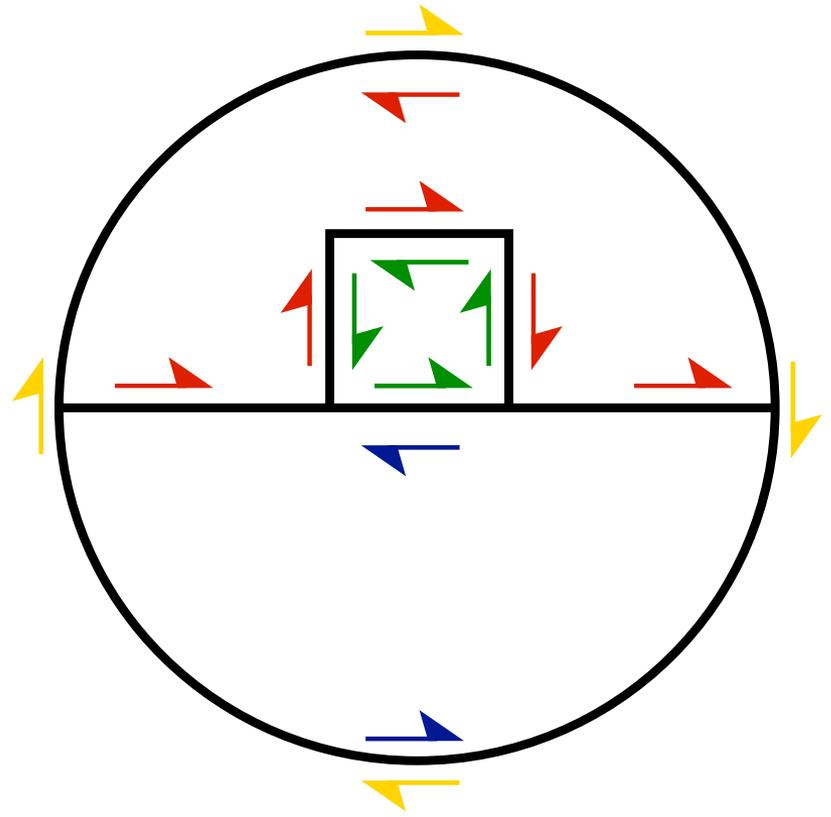
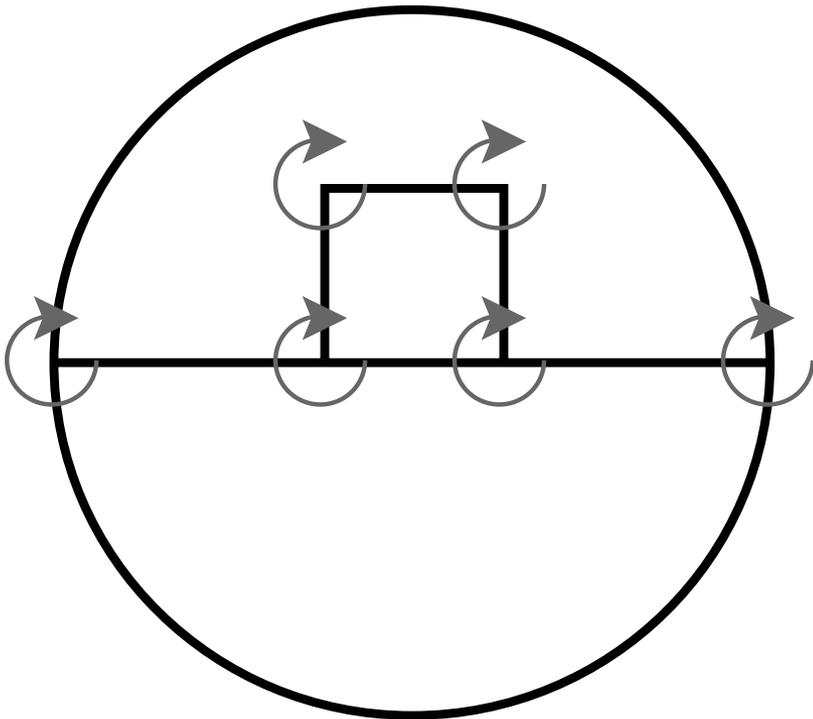
- The two covered regions are fibrewise homotopy equivalent but their complements are not.

Zigzag persistence



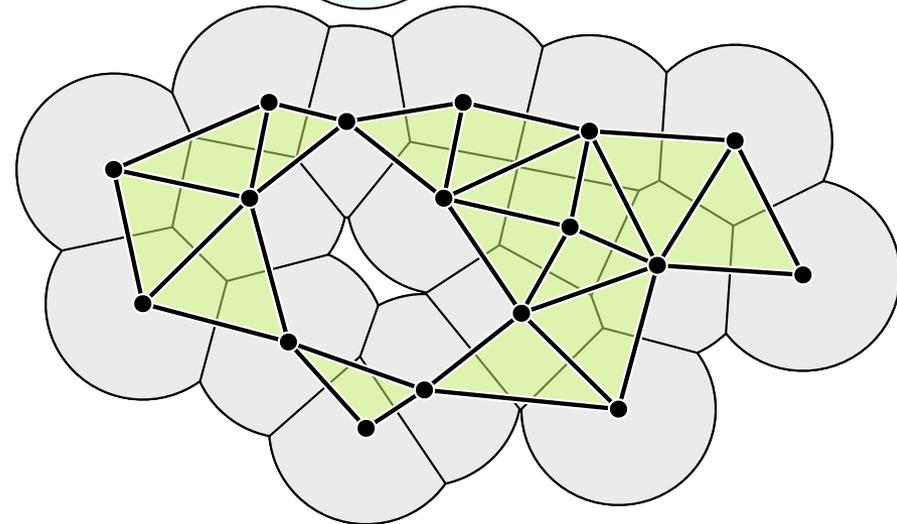
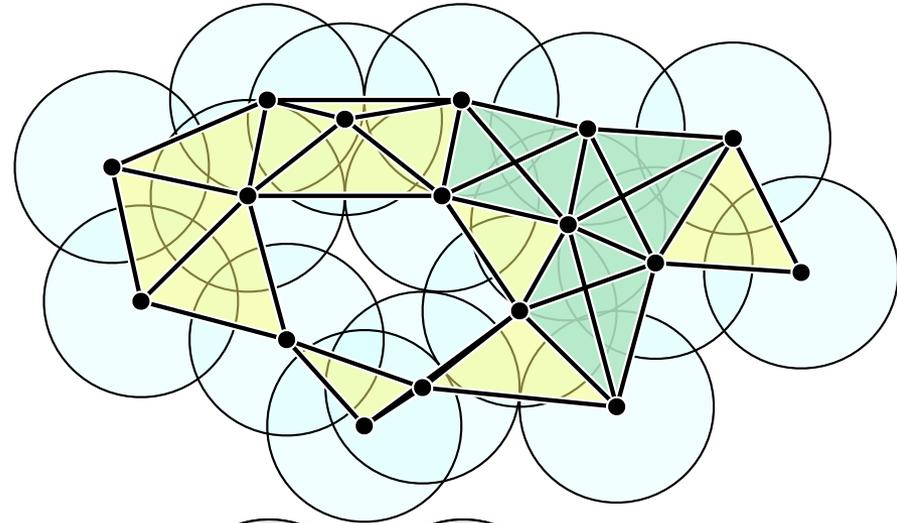
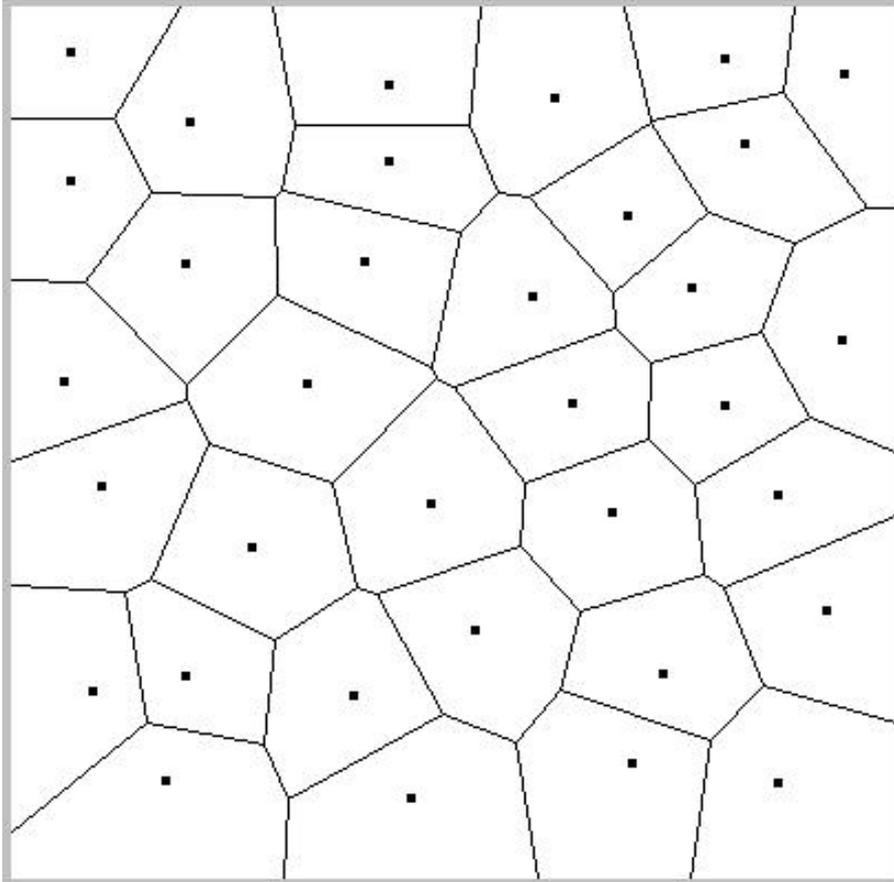
Fat graphs

- What minimal sensing capabilities might we add?
- Let $\mathcal{D} \subset \mathbb{R}^2$. A fat graph structure specifies the cyclic ordering of edges adjacent to each vertex.
- Equivalent to a set of boundary cycles.



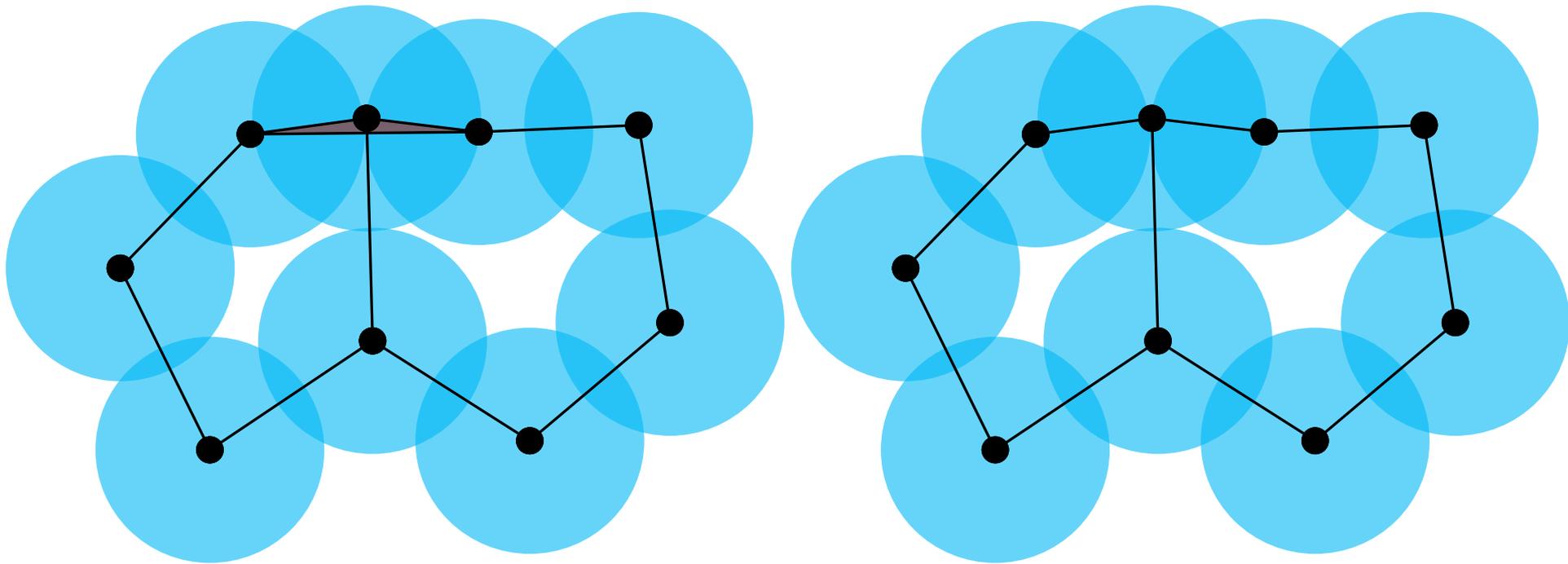
Fat graphs

- The alpha complex and fat graph structure of a connected sensor network determine if an evasion path exists.



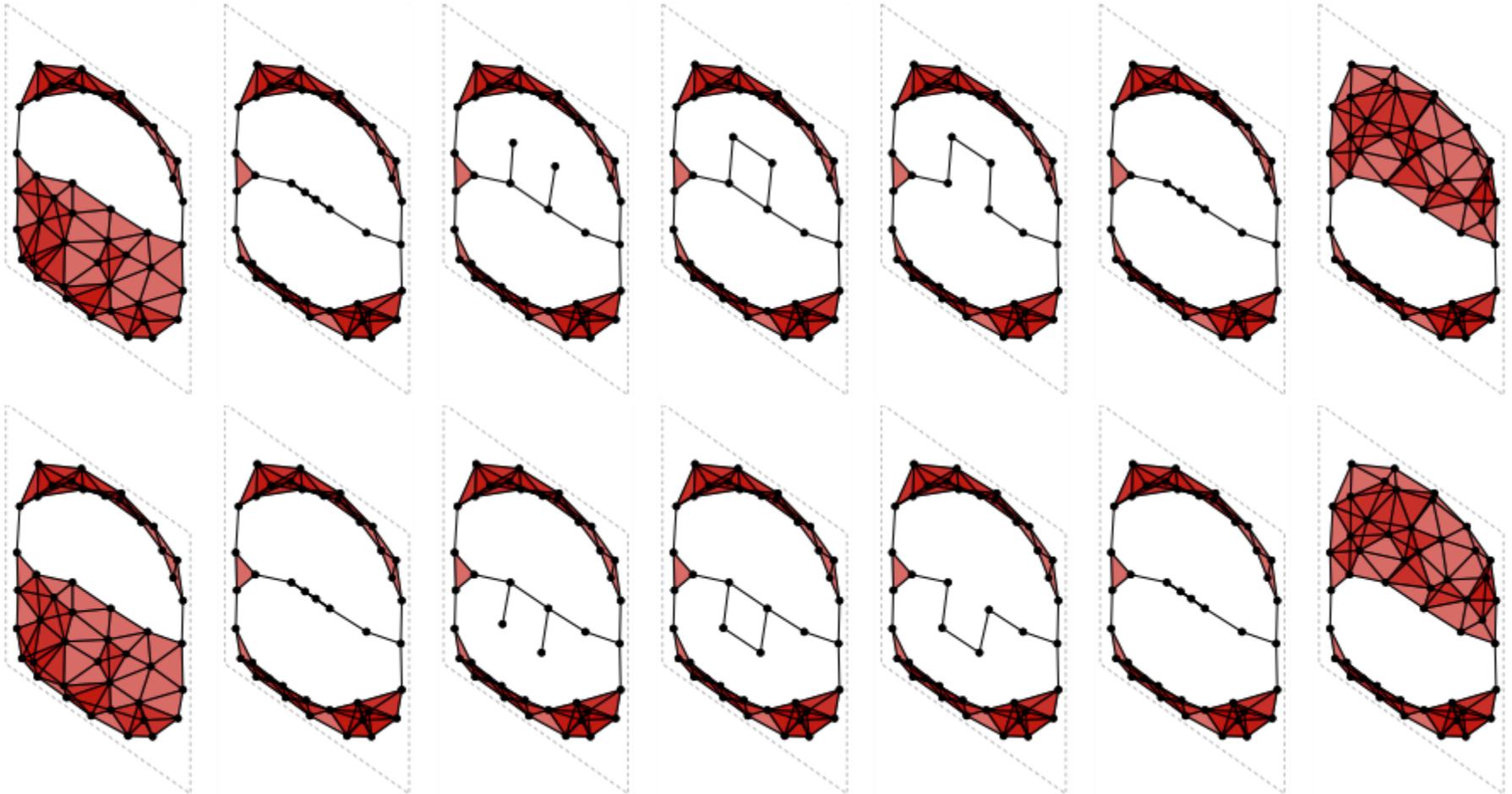
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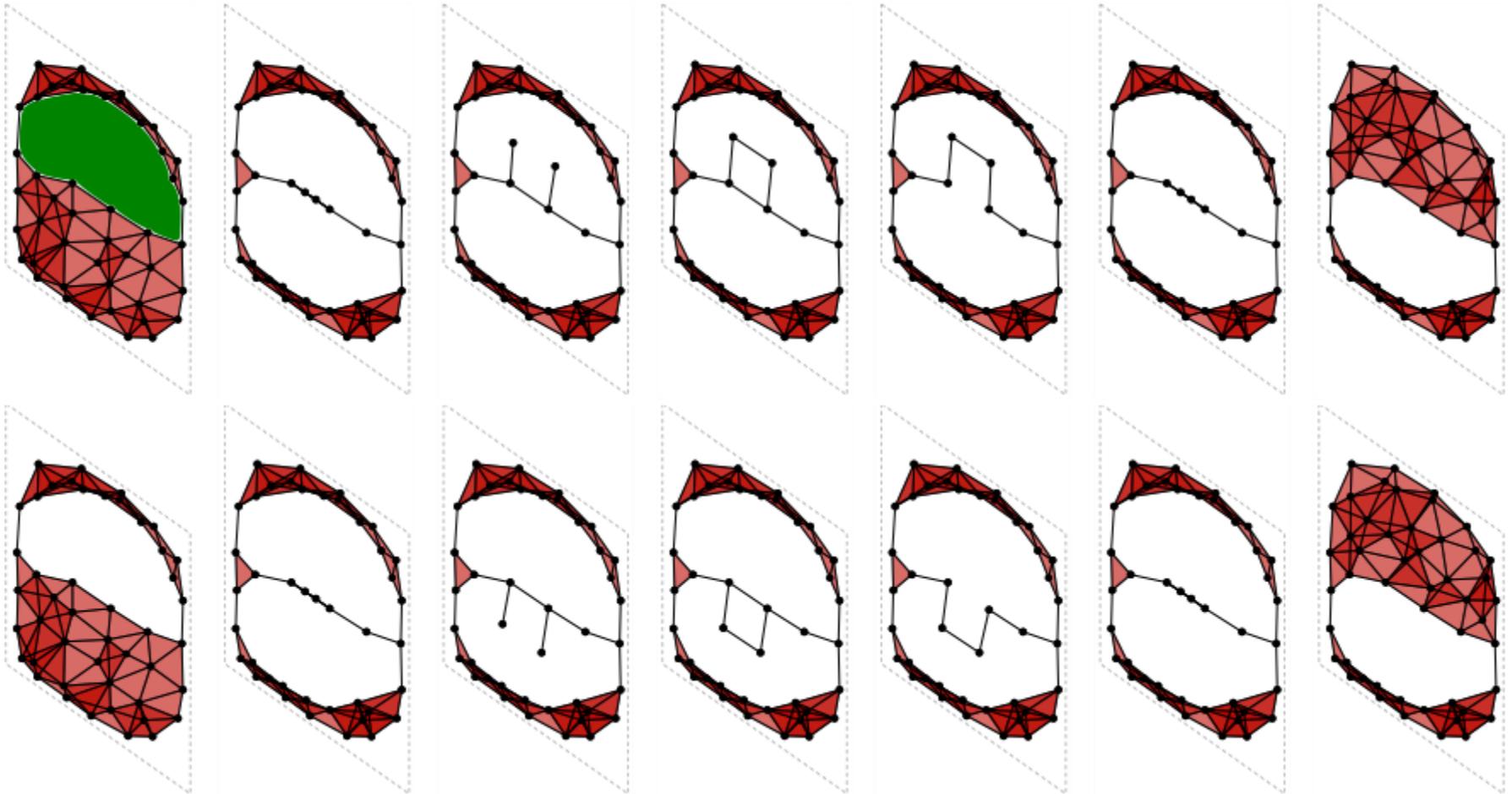
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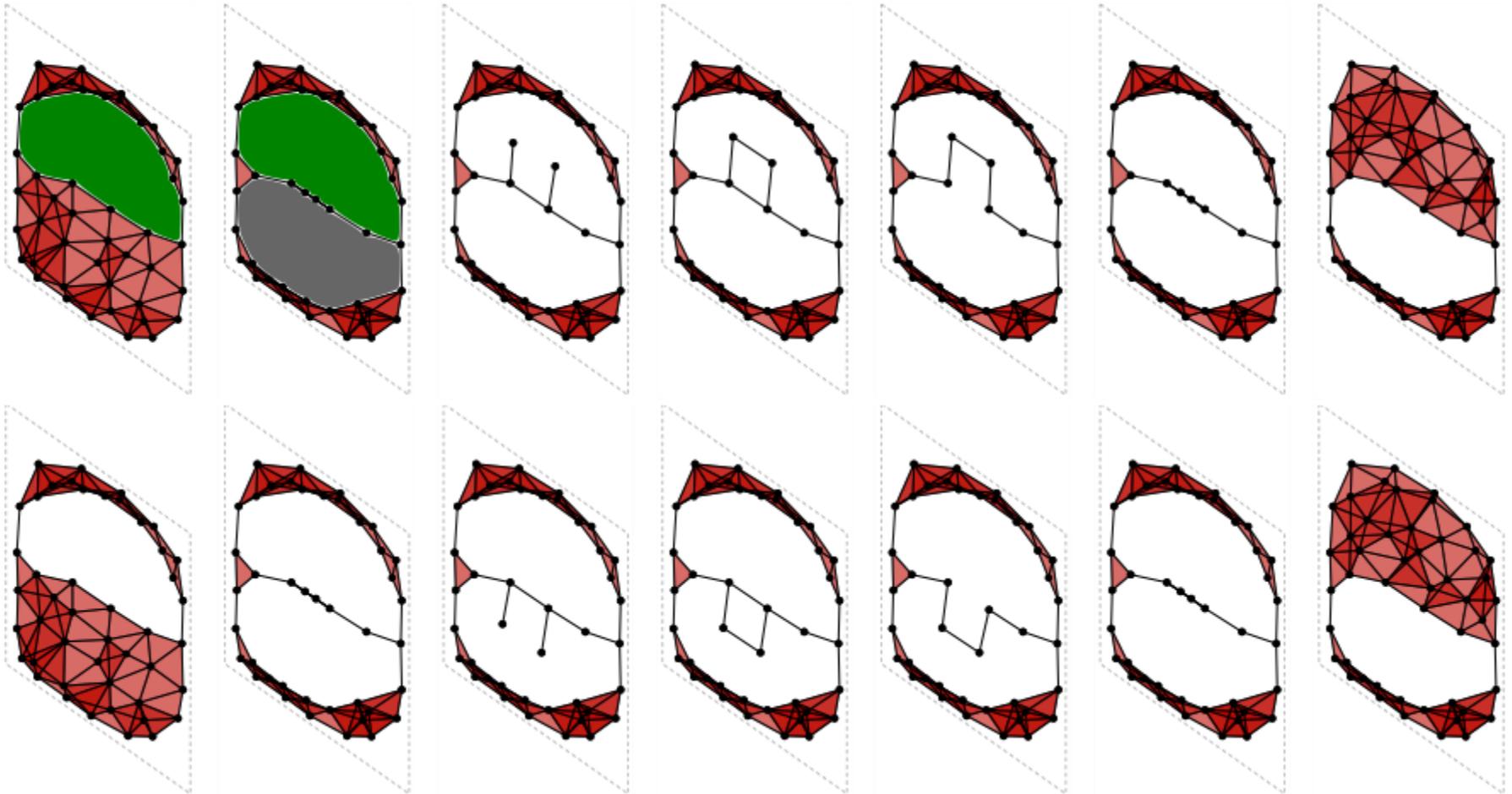
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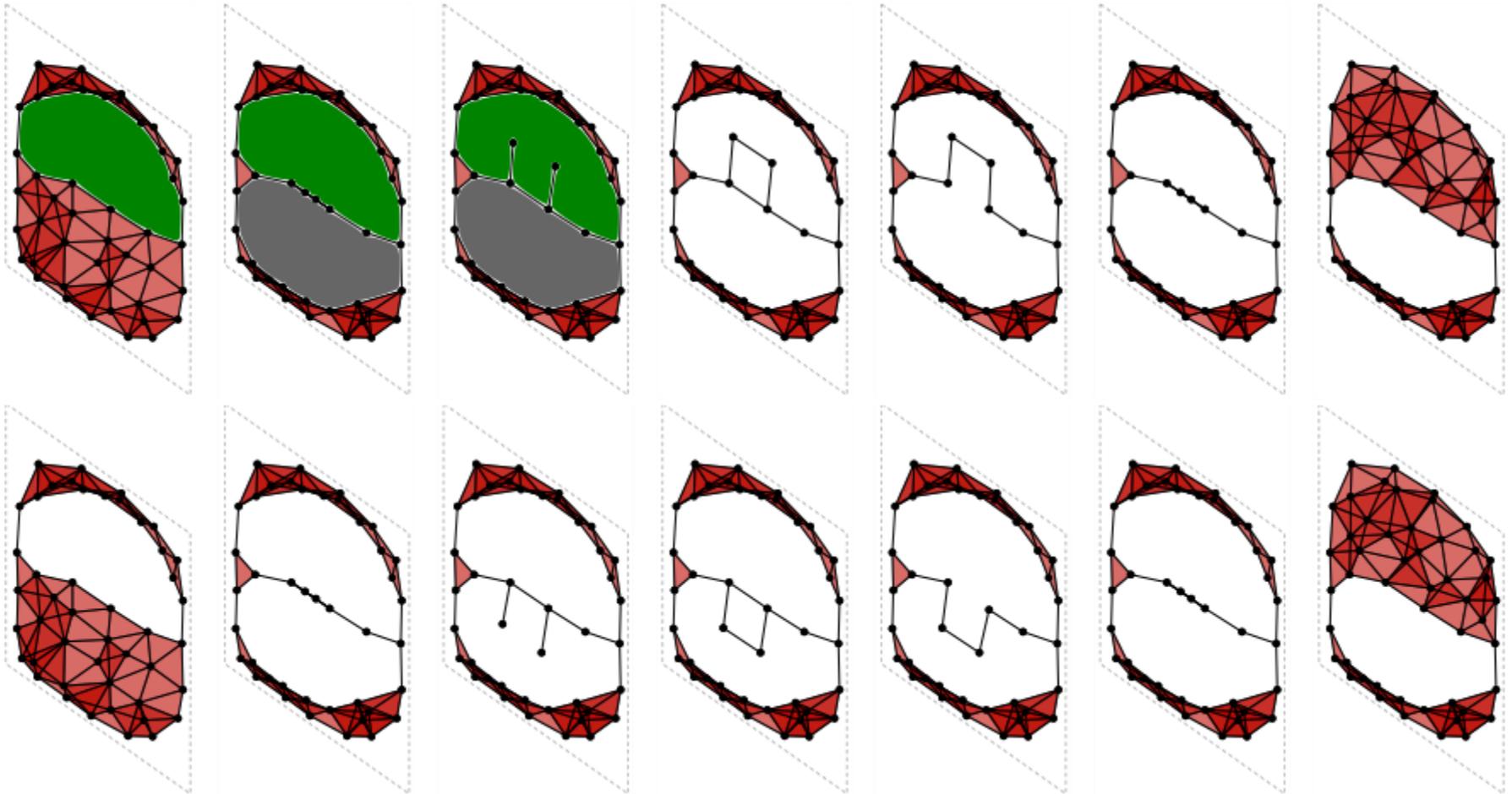
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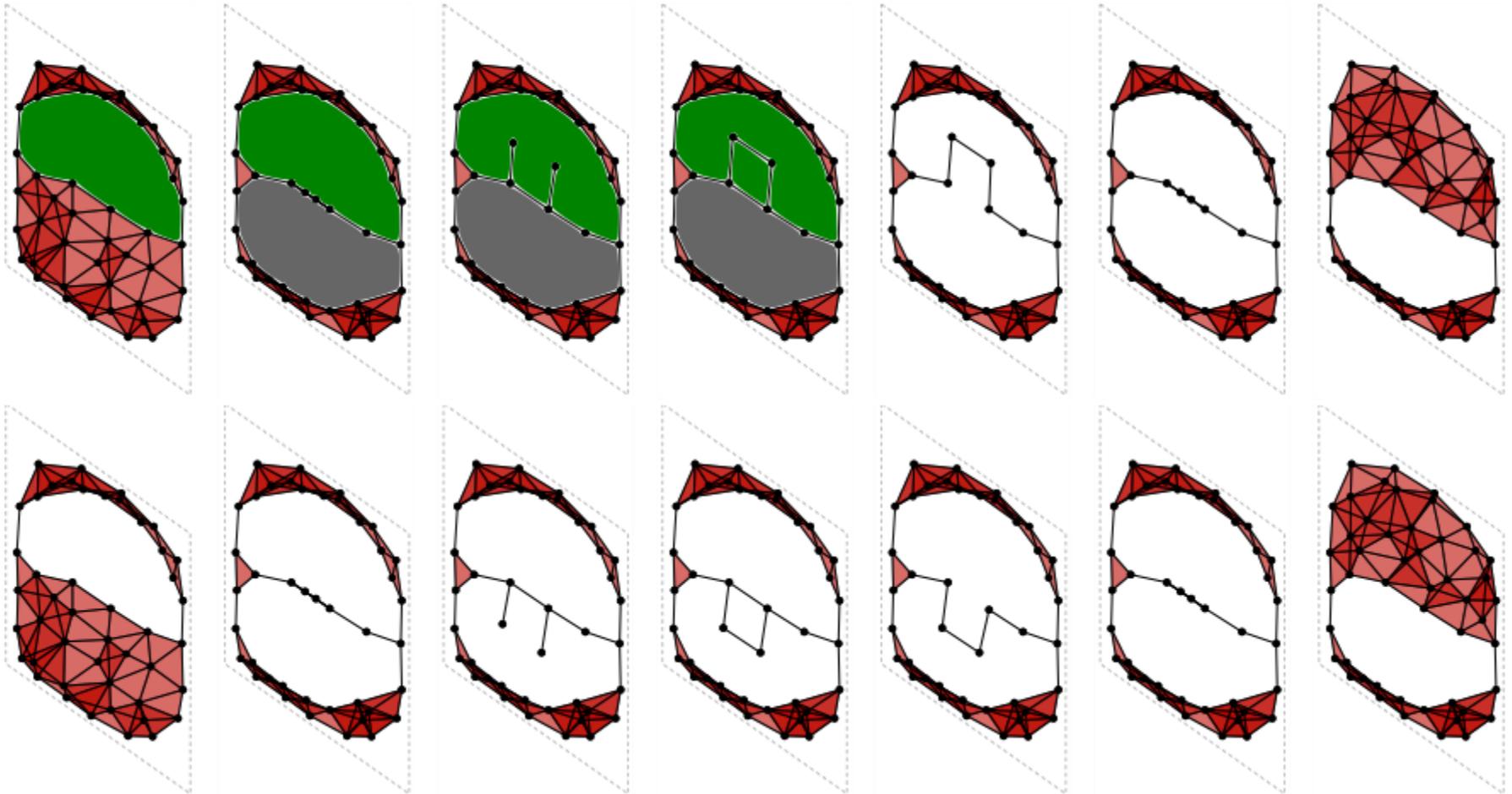
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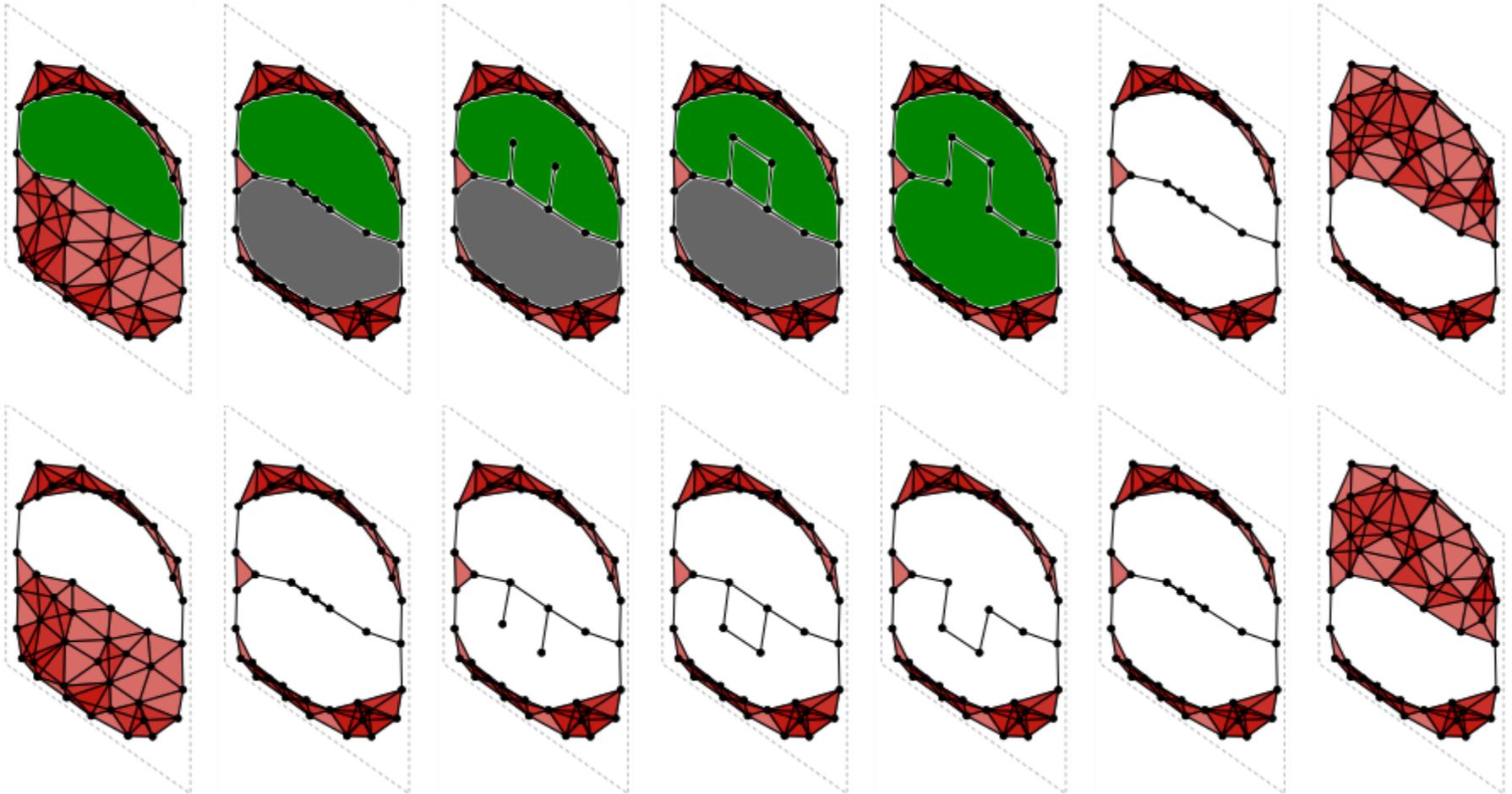
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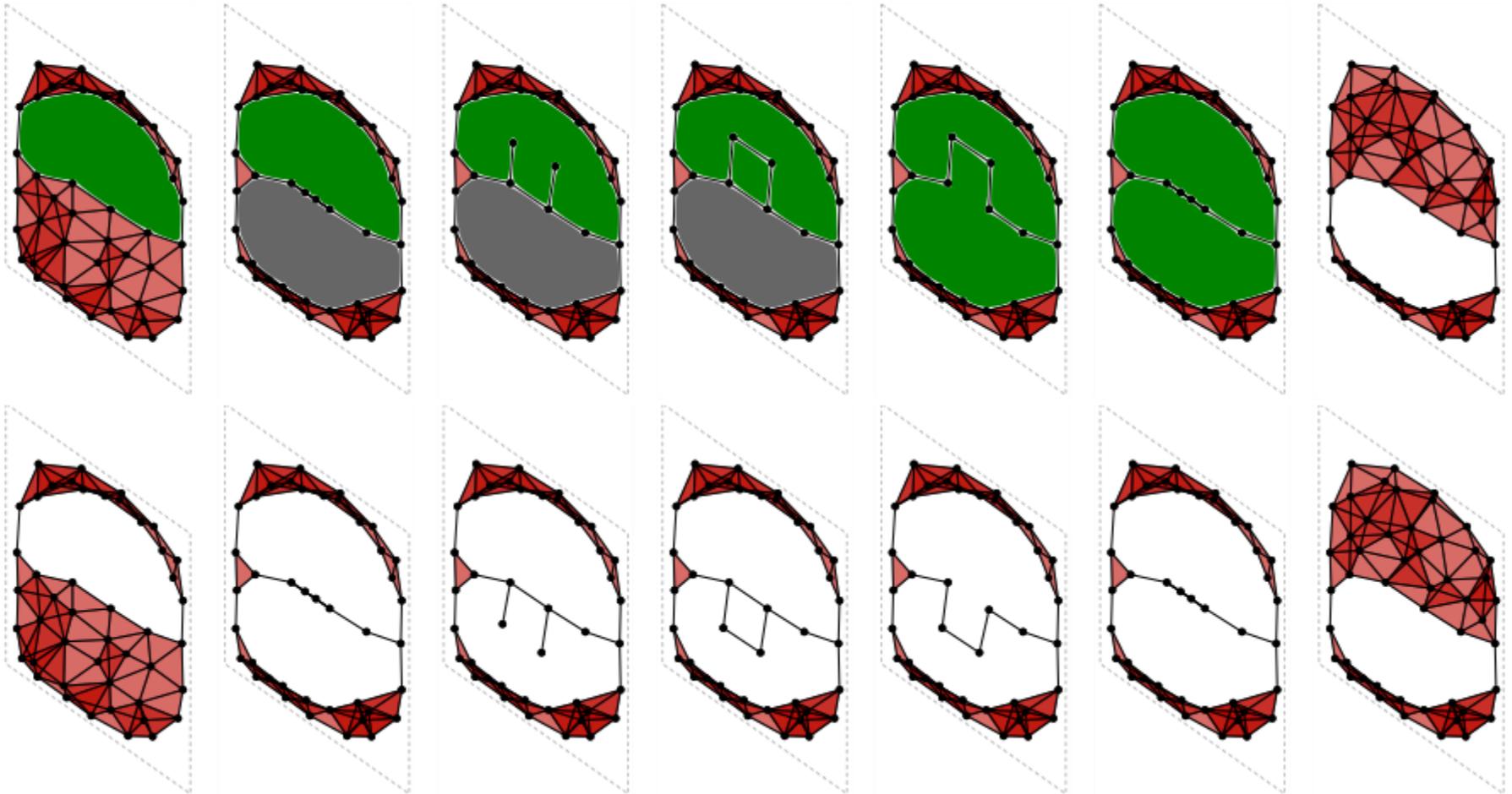
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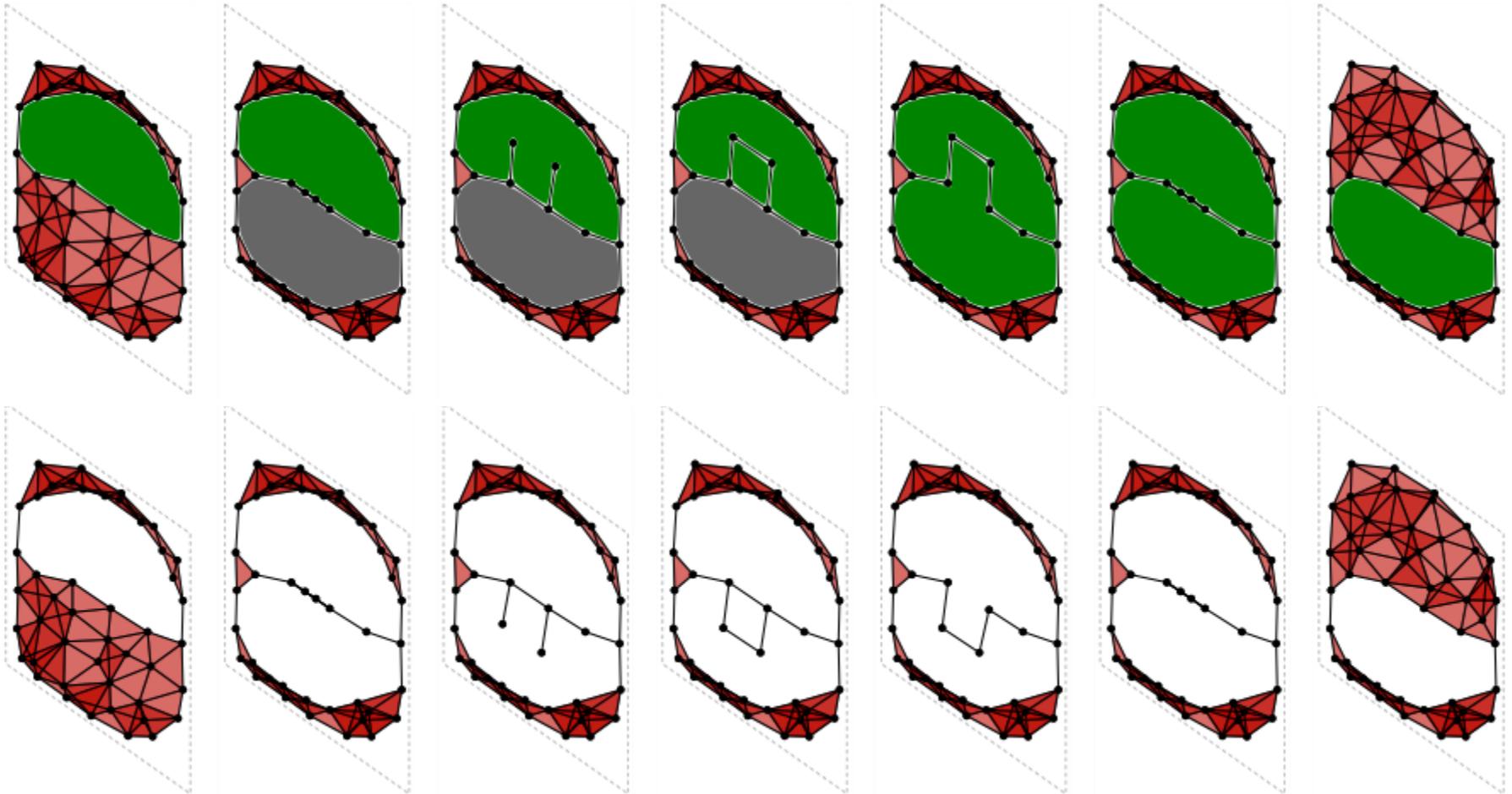
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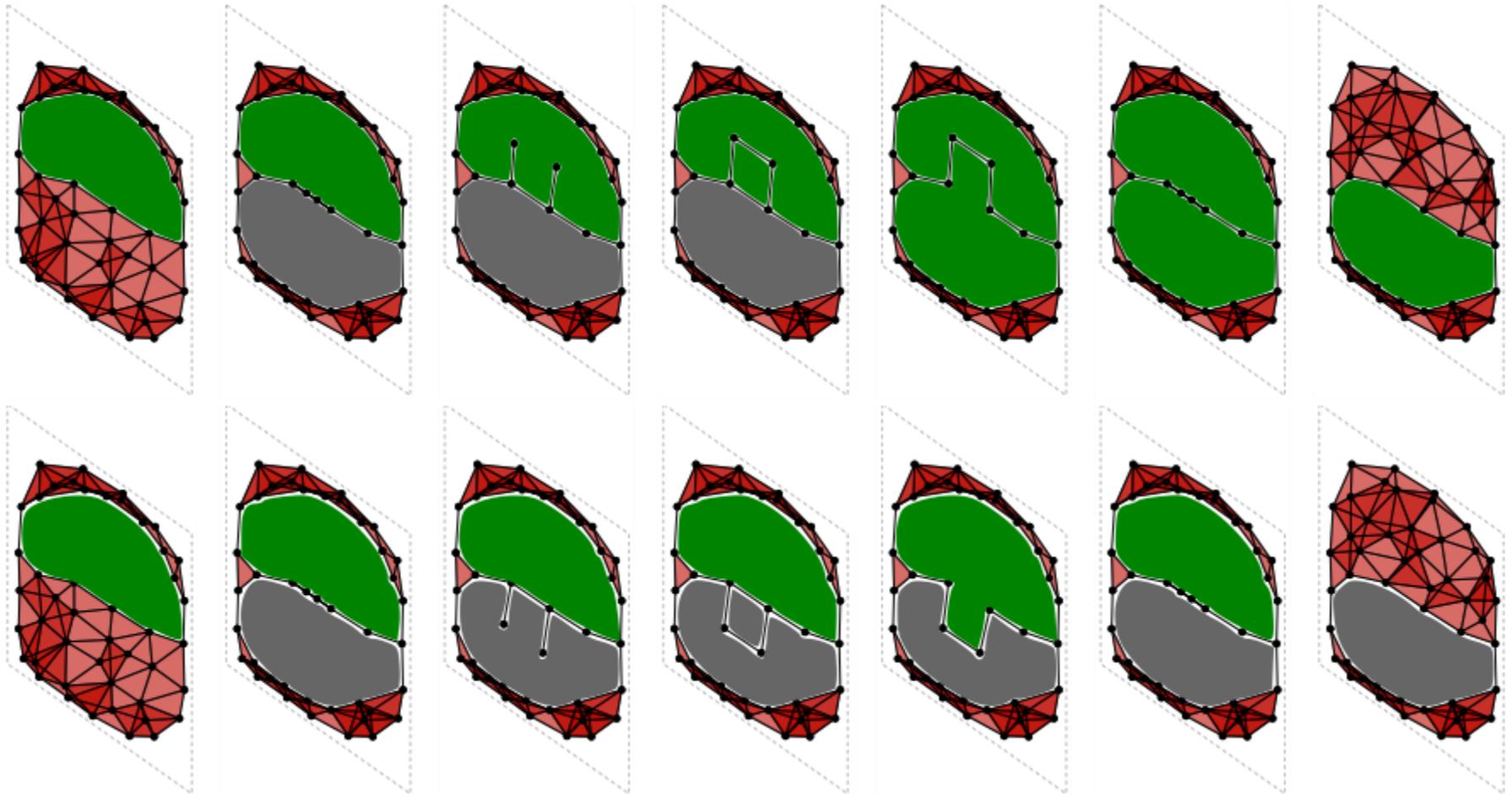
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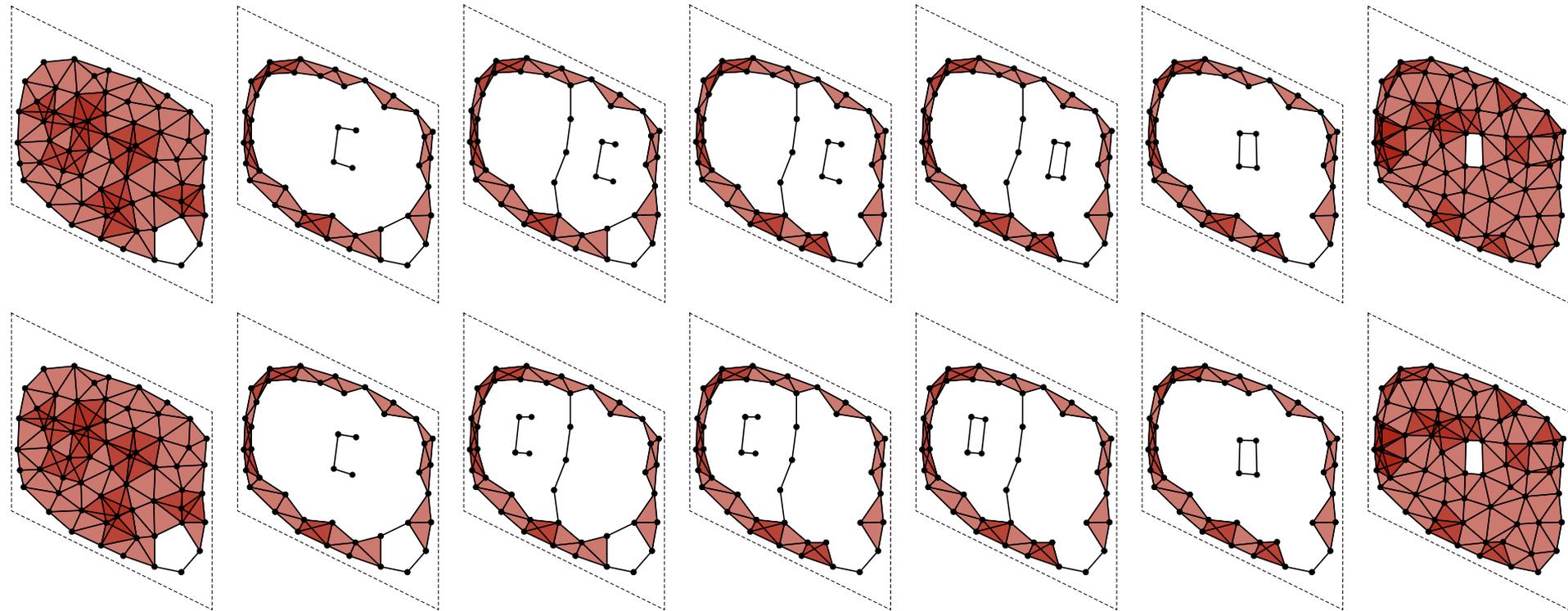
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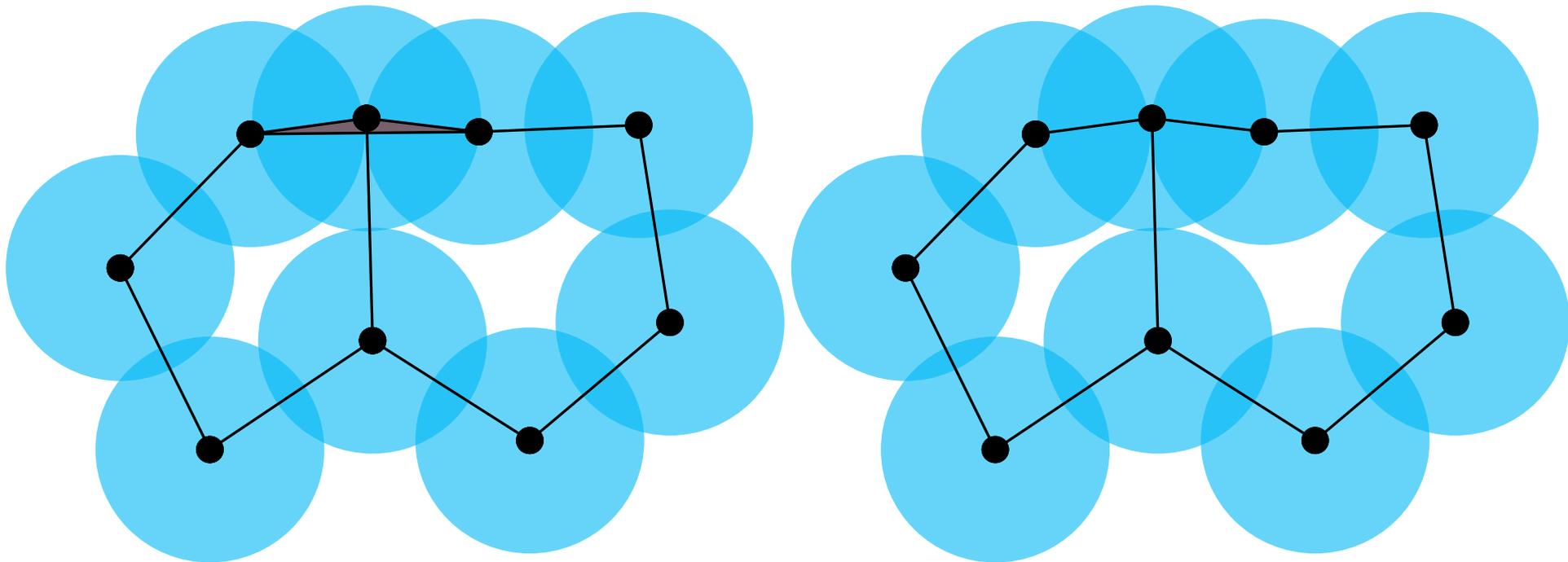
Fat graphs

- The alpha complex and fat graph structure of a connected sensor network determine if an evasion path exists.



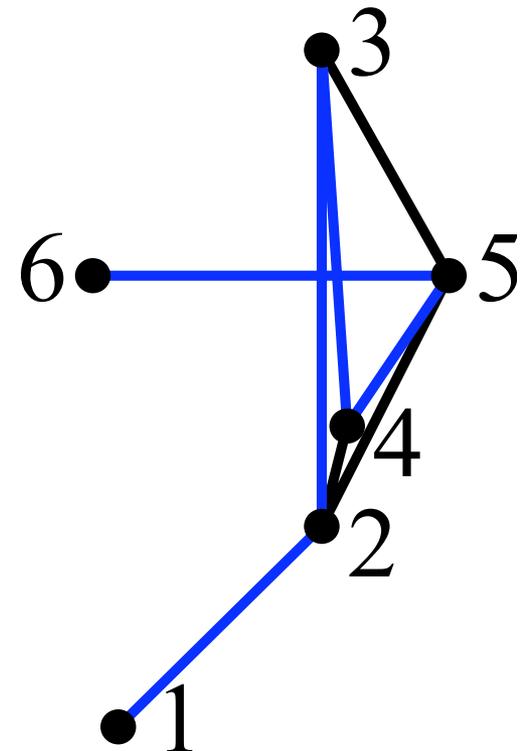
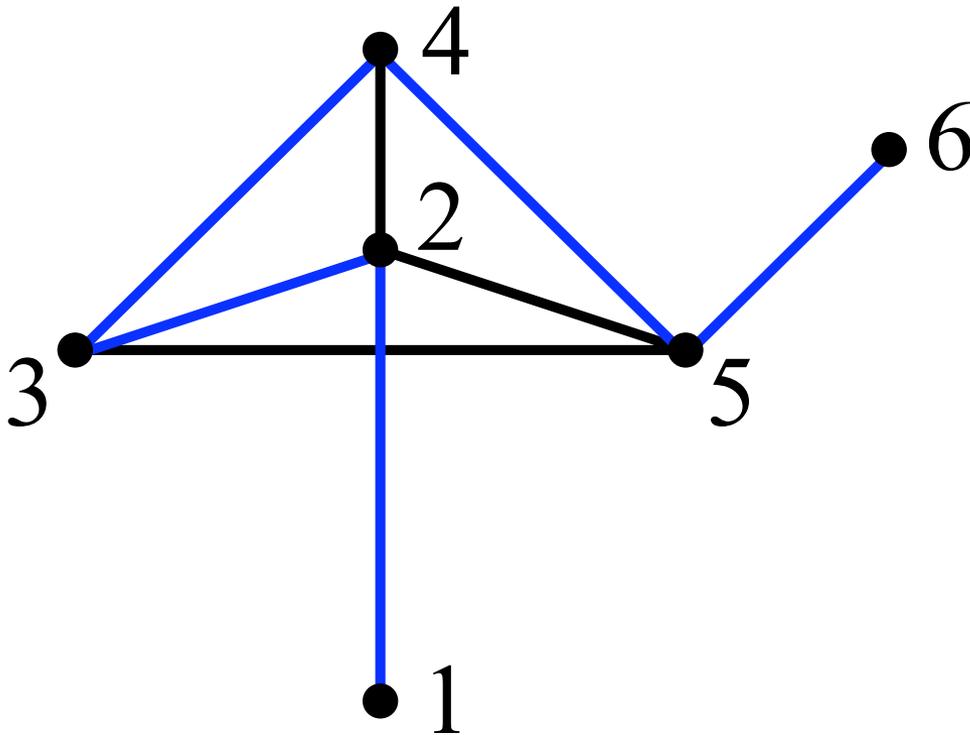
Fat graphs

- The alpha complex and fat graph structure of a connected sensor network determine if an evasion path exists.
- Are the Čech complex and fat graph structure sufficient?

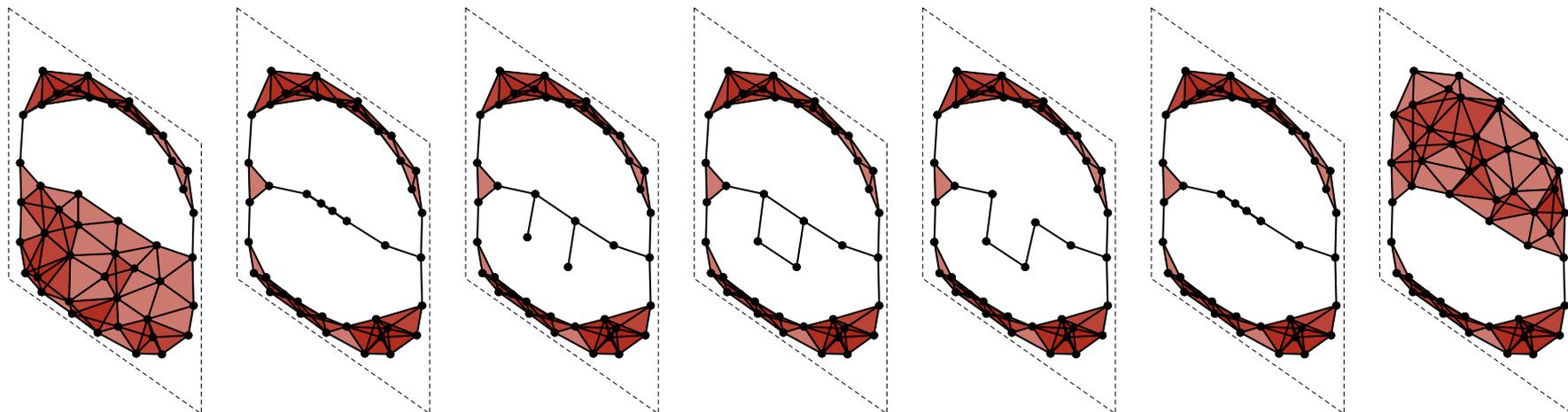


Fat graphs

- The alpha complex and fat graph structure of a connected sensor network determine if an evasion path exists.
- Are the Čech complex and fat graph structure sufficient?



- Final thought: ideas from pure mathematics are often helpful in tackling problems arising from more applied settings.



Thank you!