

# Advanced Data Visualization

**CS 6965**

**Spring 2018**

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**University of Utah**



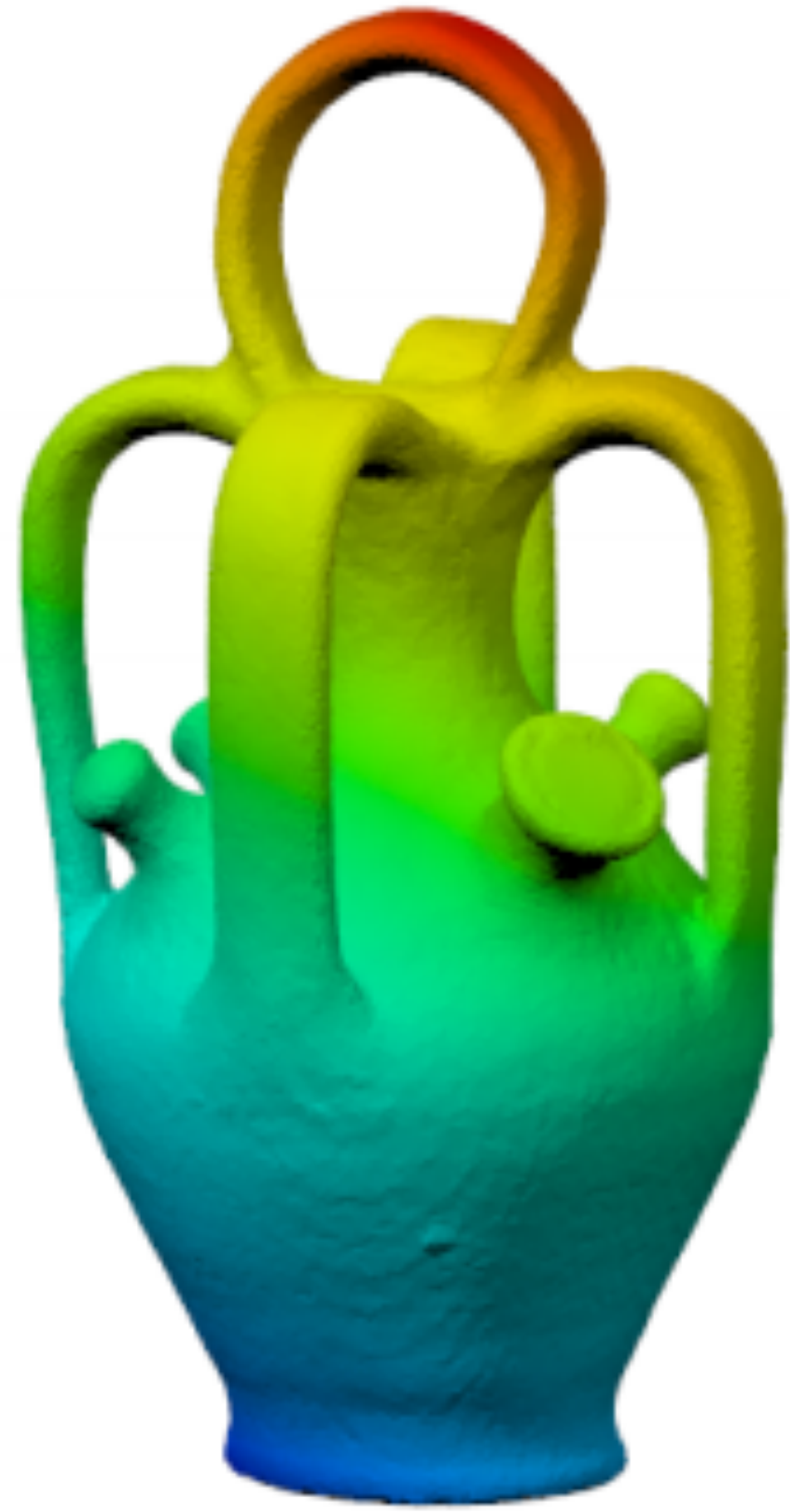
**Lecture 18**

# Structural Inference of High-dim Data

HD+TOPO

# More case studies...

- Study of low-dimensional data inspires techniques for high-dimensional data



# Handles of 3D models

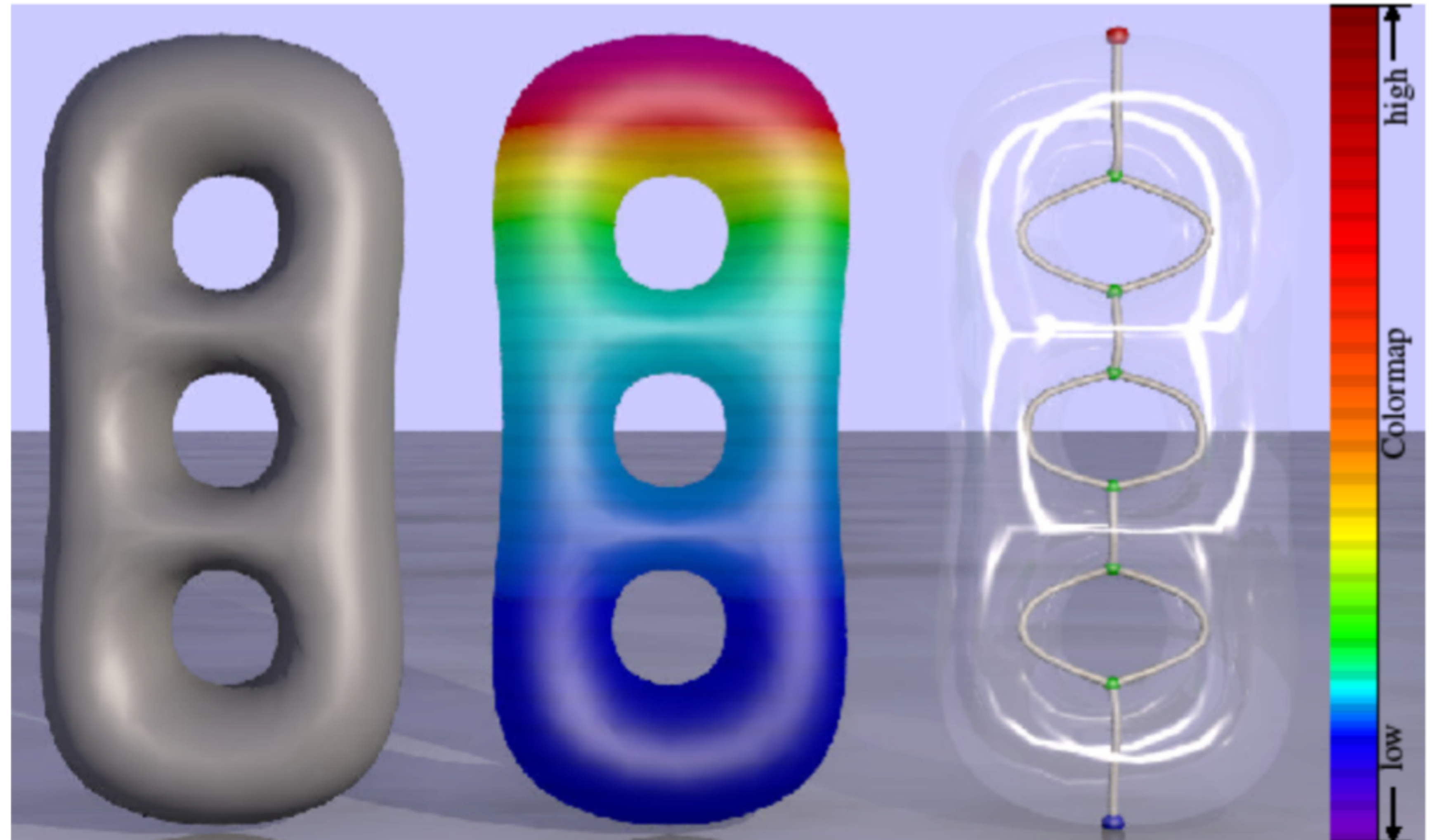
[DeyFanWang2013]

<http://web.cse.ohio-state.edu/~wang.1016/papers/sig2013-loops.pdf>

Graph obtained by continuous contraction of all the contours in a scalar field, where each contour is collapsed to a distinct point.

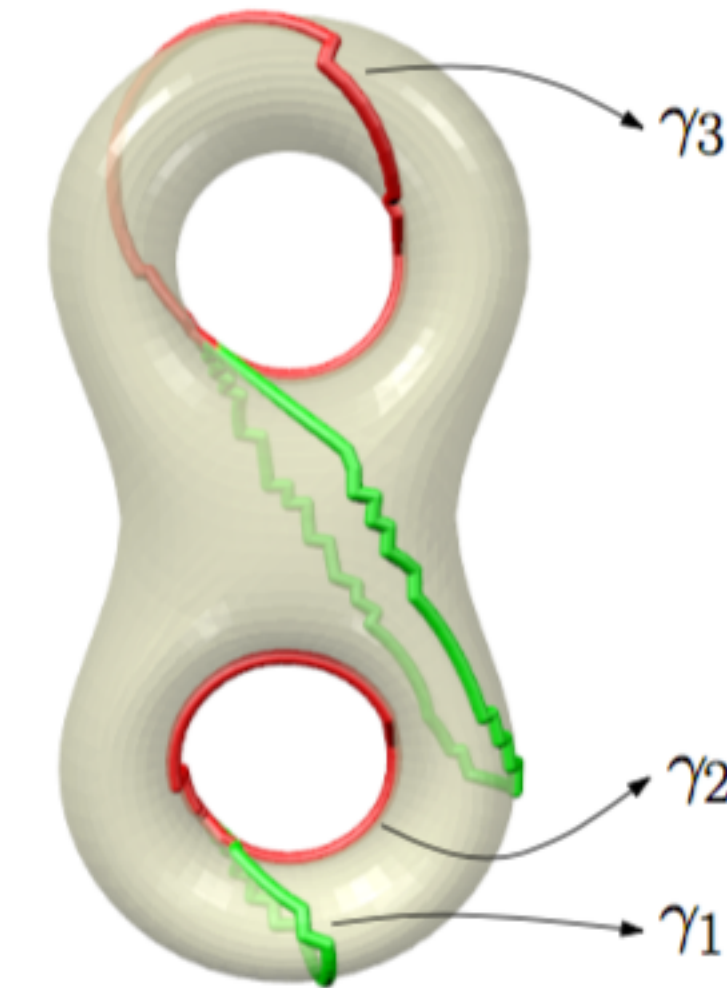
# Review: Reeb Graph

A generalization of  
contour tree

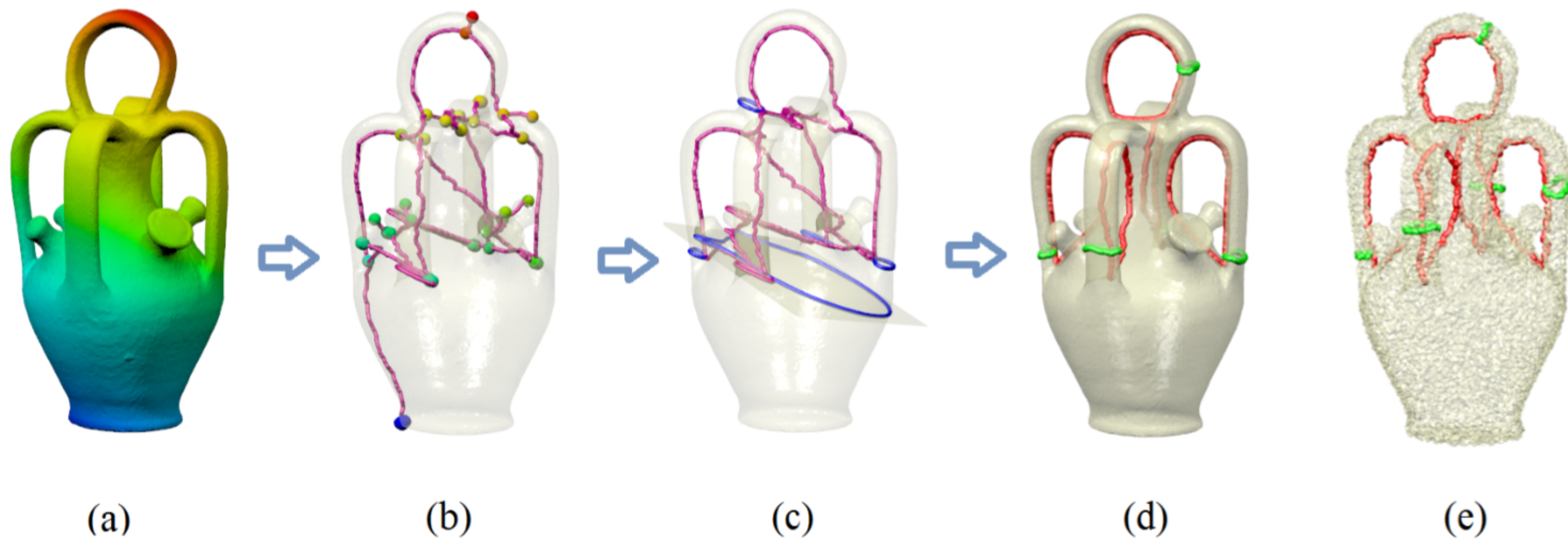


# High-level techniques

- Using Reeb Graph to find initial nontrivial loops/tunnels/handles
- Using optimization to find the ideal ones

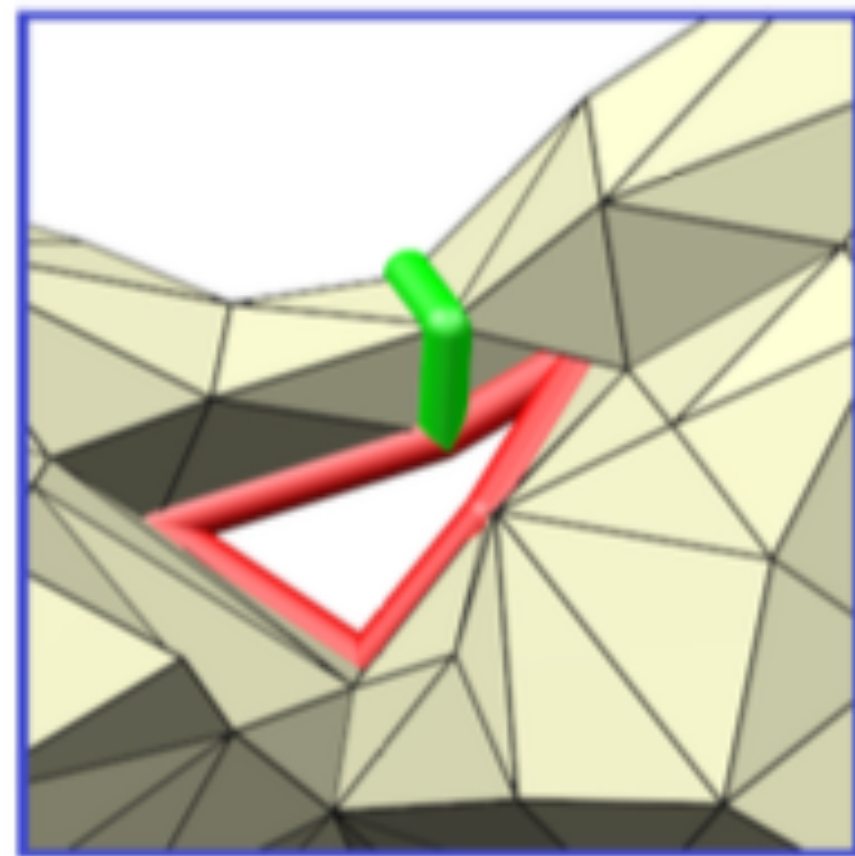
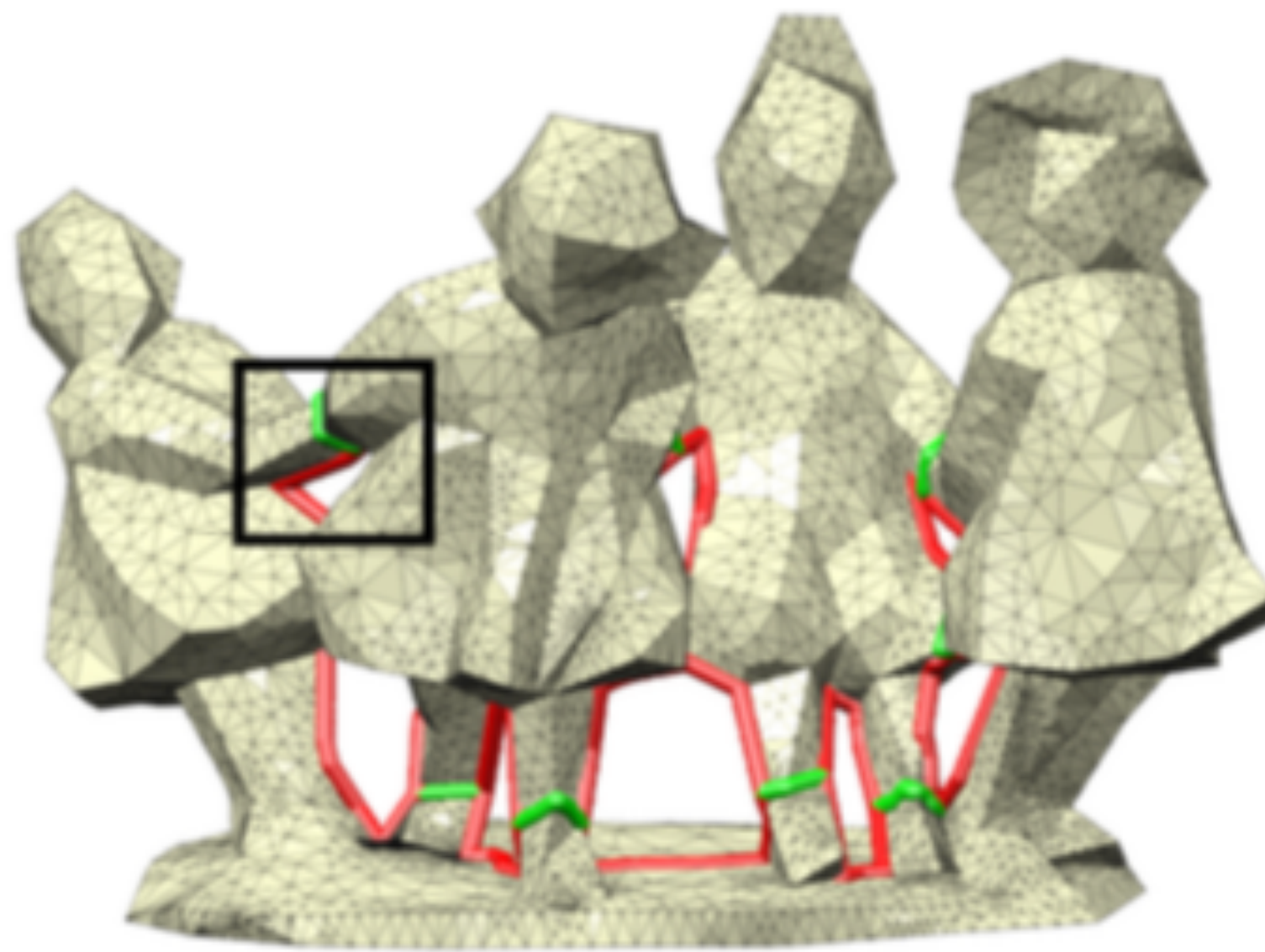
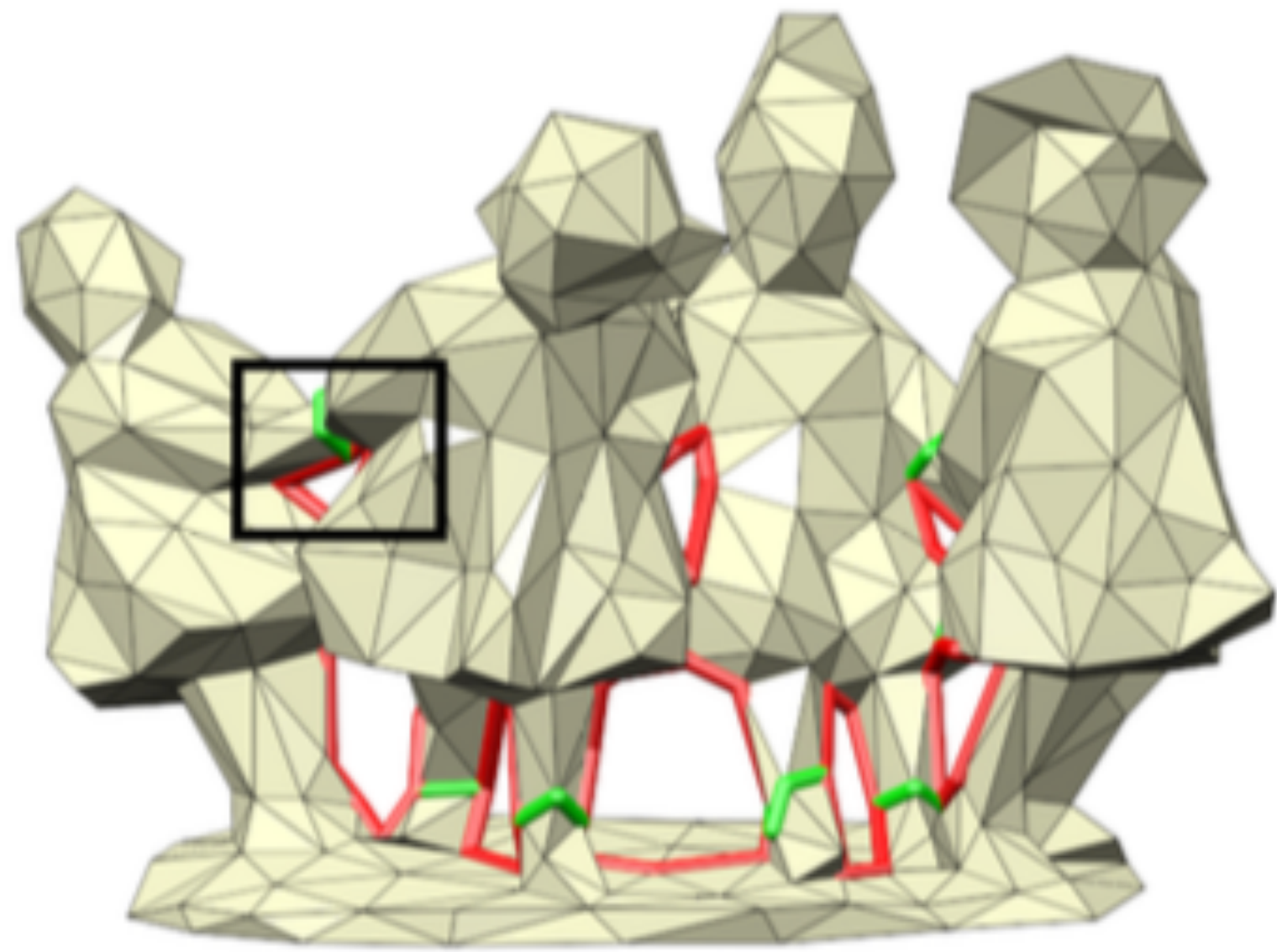


**Figure 2:**  $\gamma_1$  is a handle loop and  $\gamma_2$  a tunnel loop.  $\gamma_3$  is neither.

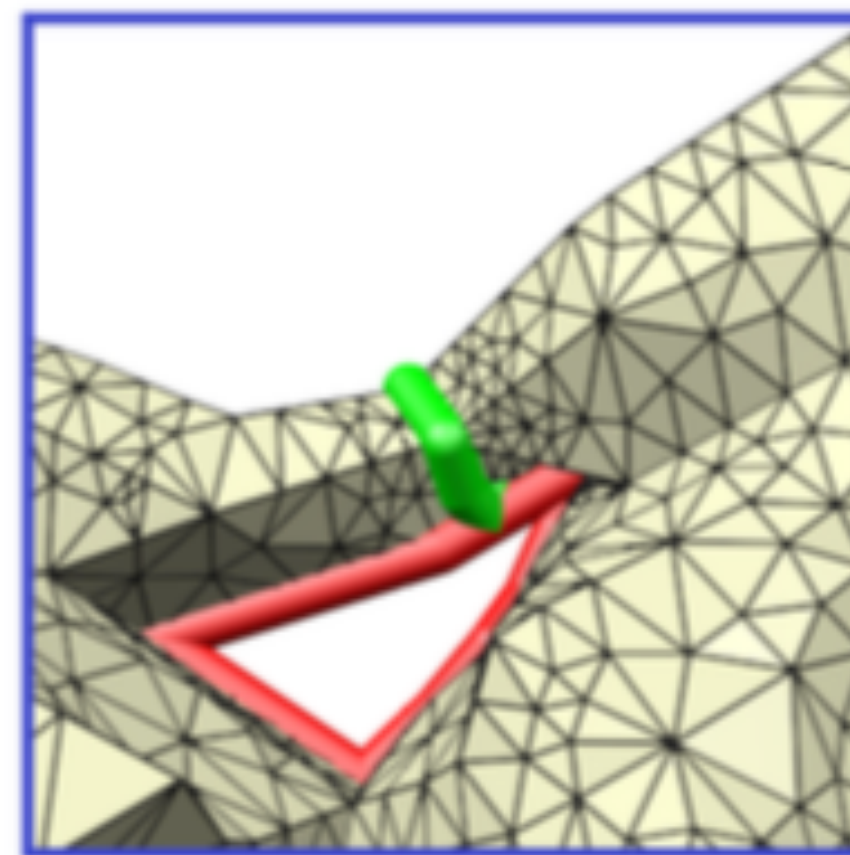


**Figure 1:** (a) – (d) shows the pipeline of our algorithm: (a) The height function on the input surface. (b) Reeb graph w.r.t. the height function. (c) Initial handle and tunnel loops. (d) Final handle / tunnel loops after geometric optimization. (e) The output is stable under noise.

# Fast processing with original mesh



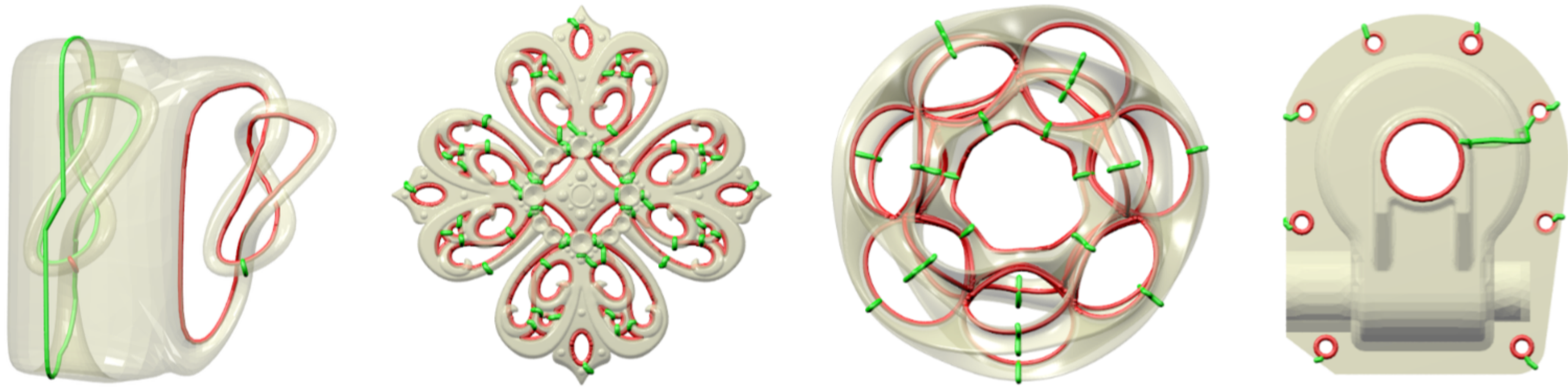
(a)



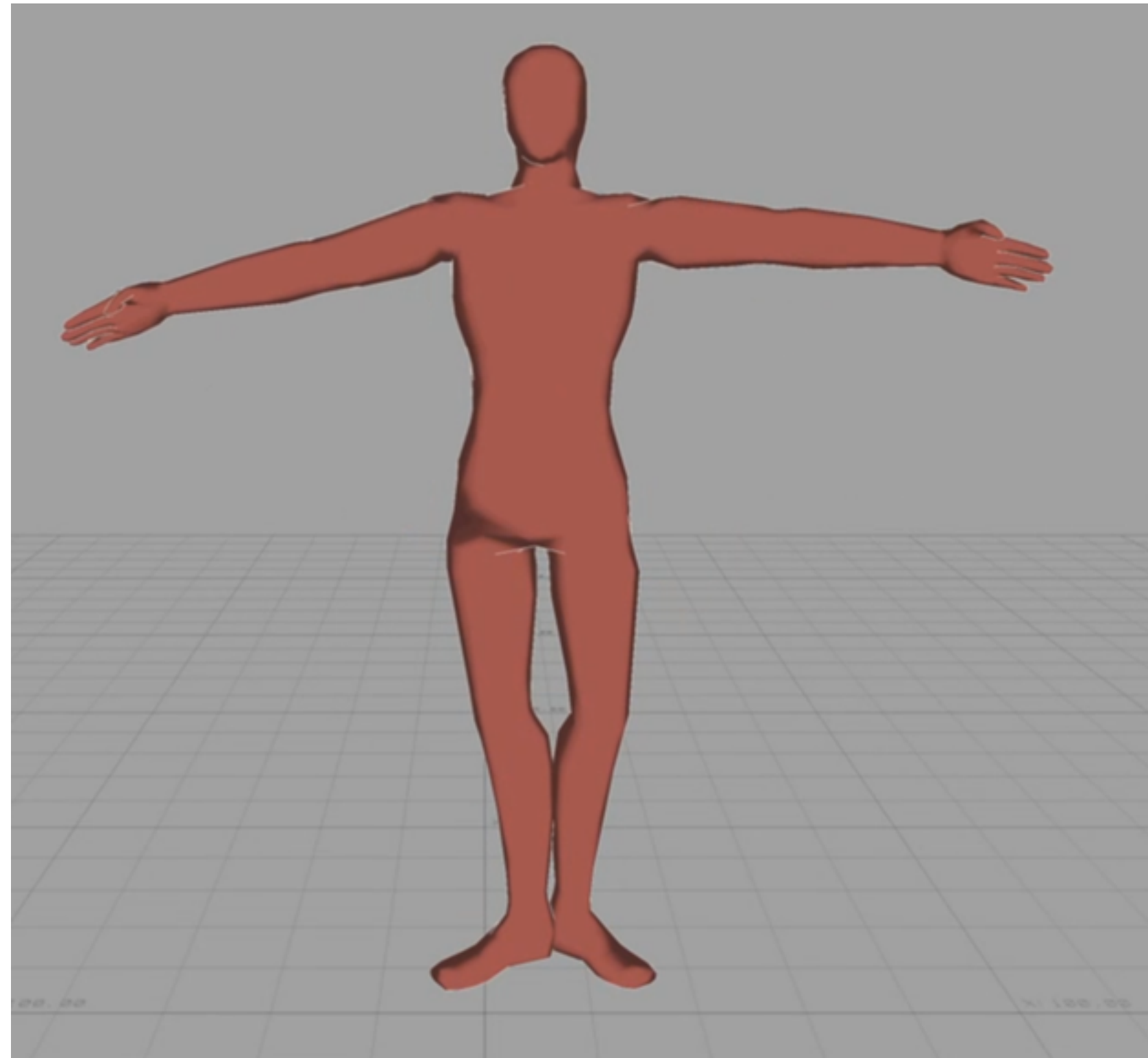
(b)

**Figure 3:** The output of (a) our algorithm and (b) the algorithm of [Dey et al. 2008] for an input mesh with 449 vertices. Note that due to the tetrahedral meshing, the algorithm of [Dey et al. 2008] changes the input surface mesh and significantly increases its complexity to 7943 vertices. Our algorithm obtained handle and tunnel loops of good quality from the original sparse mesh.





**Figure 6:** *Various examples. From left to right: KNOTTY-CUP, FILIGREE, HEPTOROID and CASTING.*



# Circular and Branching Structures in High-dim

[WangSummaPascucci2011]

[http://www.sci.utah.edu/~beiwang/publications/Branching\\_BeiWang\\_2011.pdf](http://www.sci.utah.edu/~beiwang/publications/Branching_BeiWang_2011.pdf)

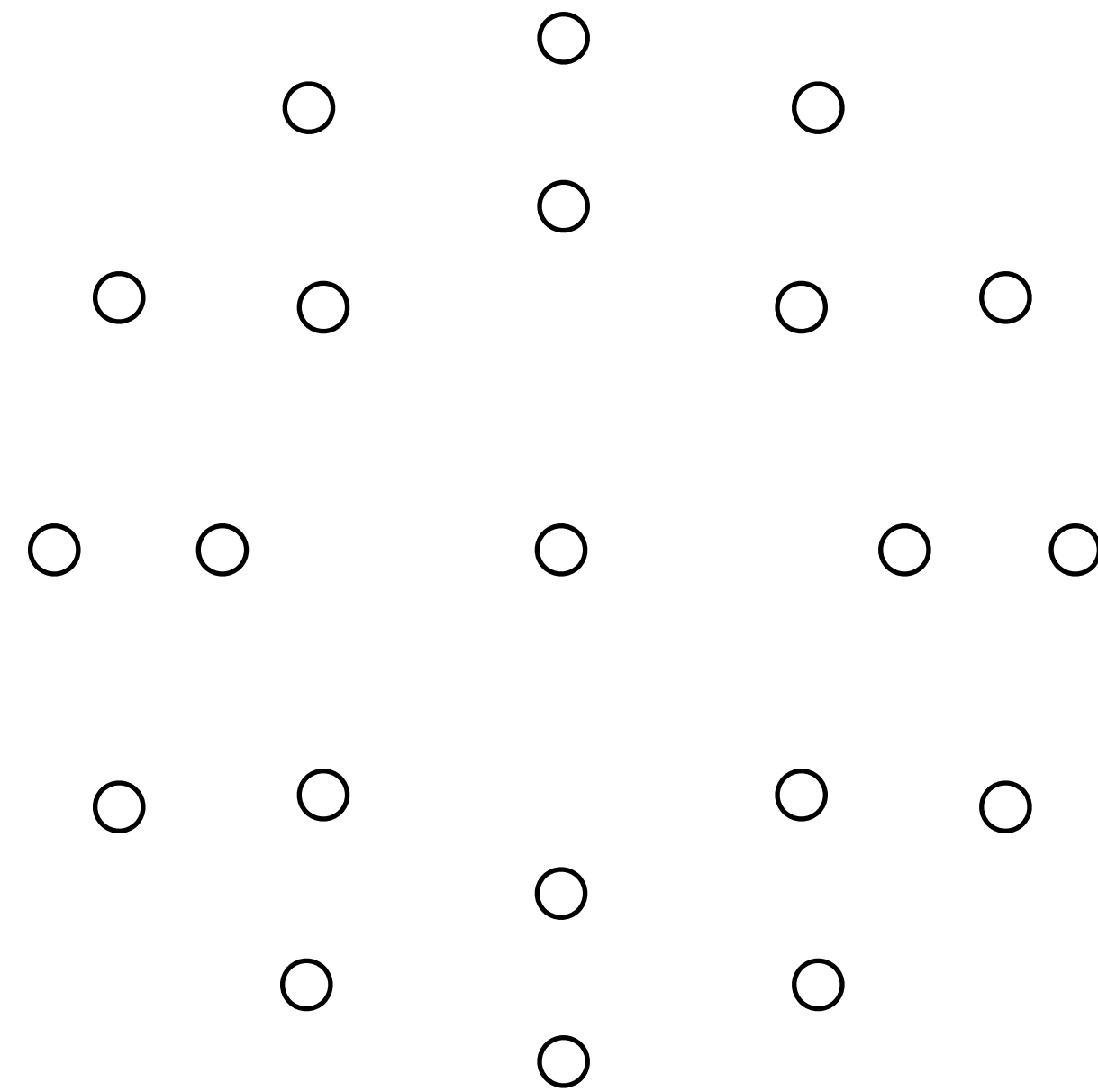
# Inferring circular structure



# High-level techniques

- Persistent homology (PH), persistent cohomology (dual version)
- Circular parametrization

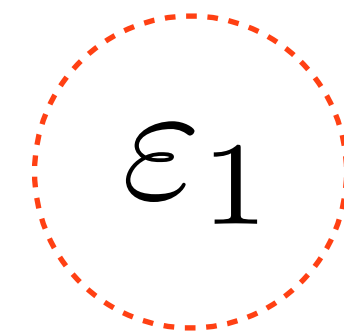
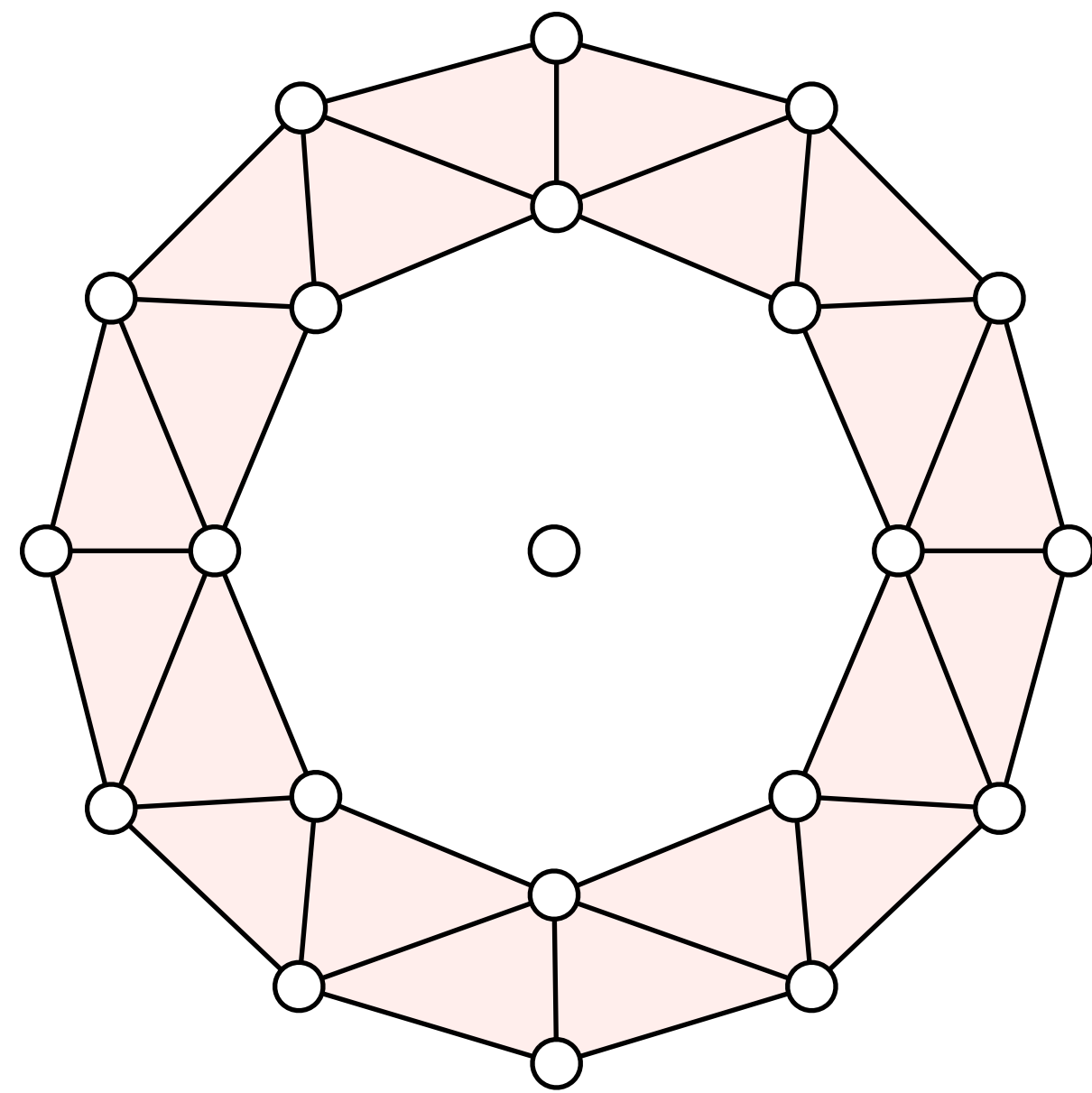
# PH and parametrization



$\varepsilon_0$

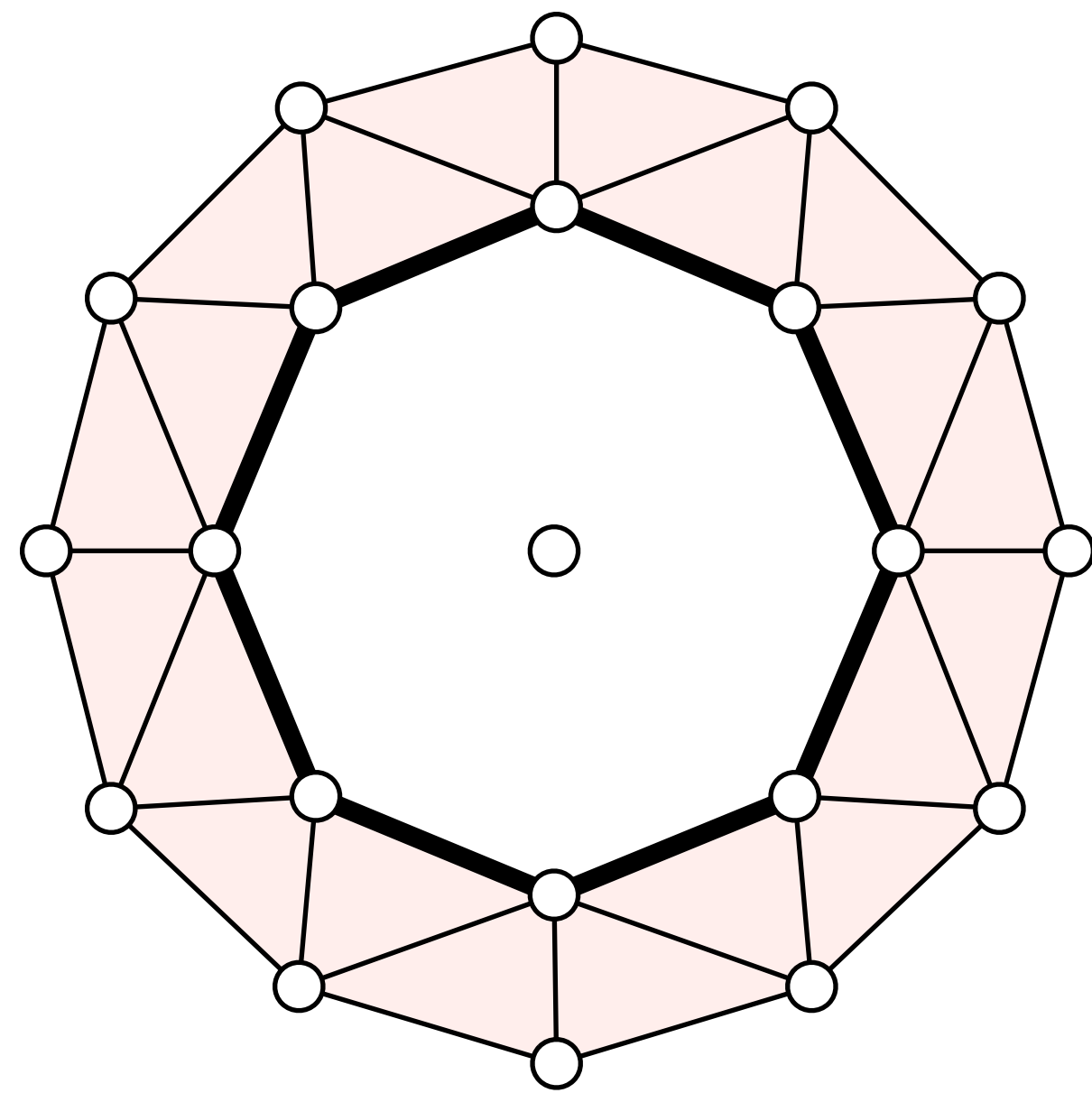
$Rips(X, \varepsilon_0)$

# PH and parametrization



$$Rips(X, \varepsilon_0) \subseteq Rips(X, \varepsilon_1)$$

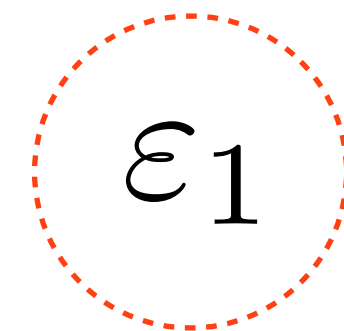
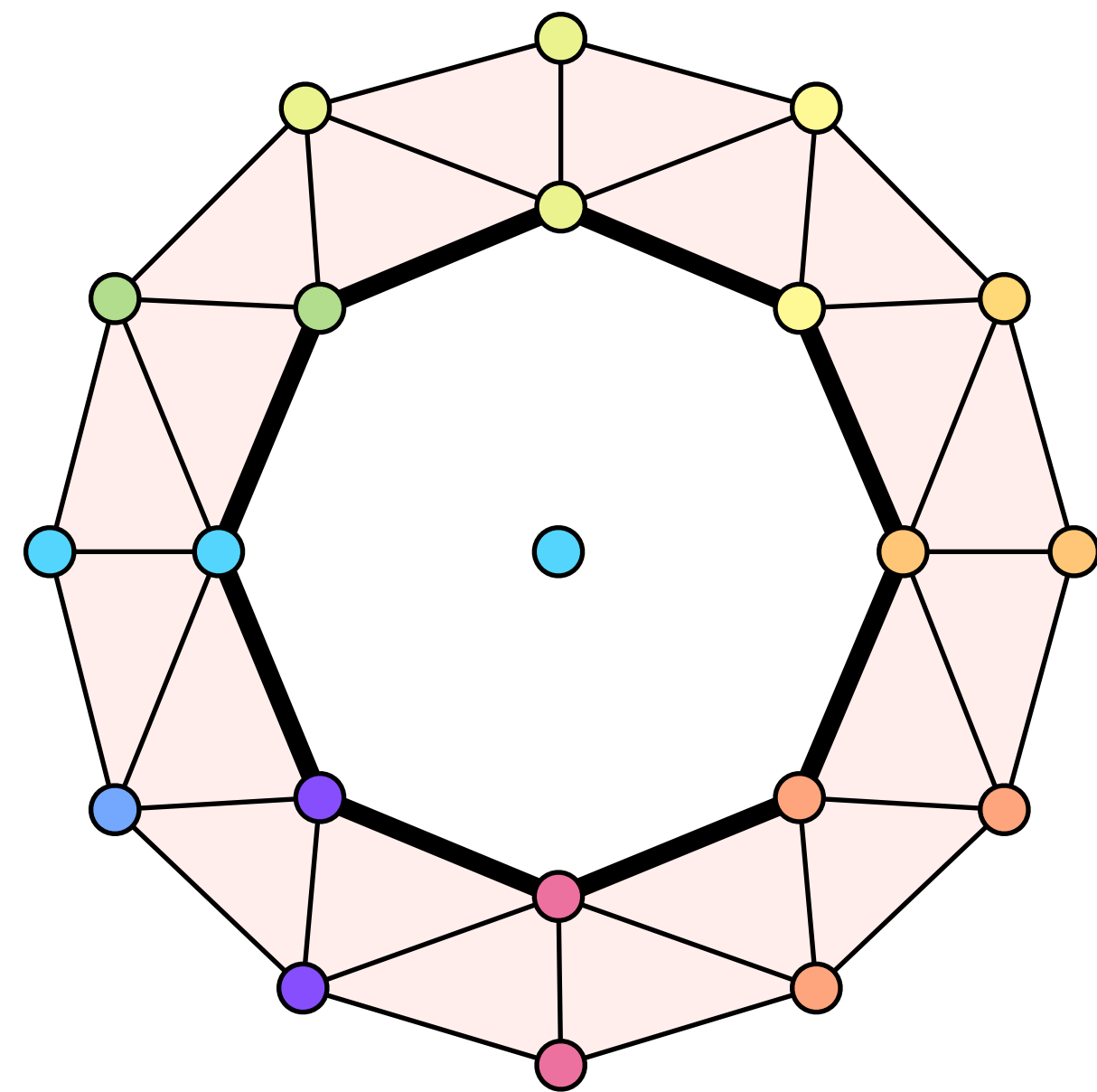
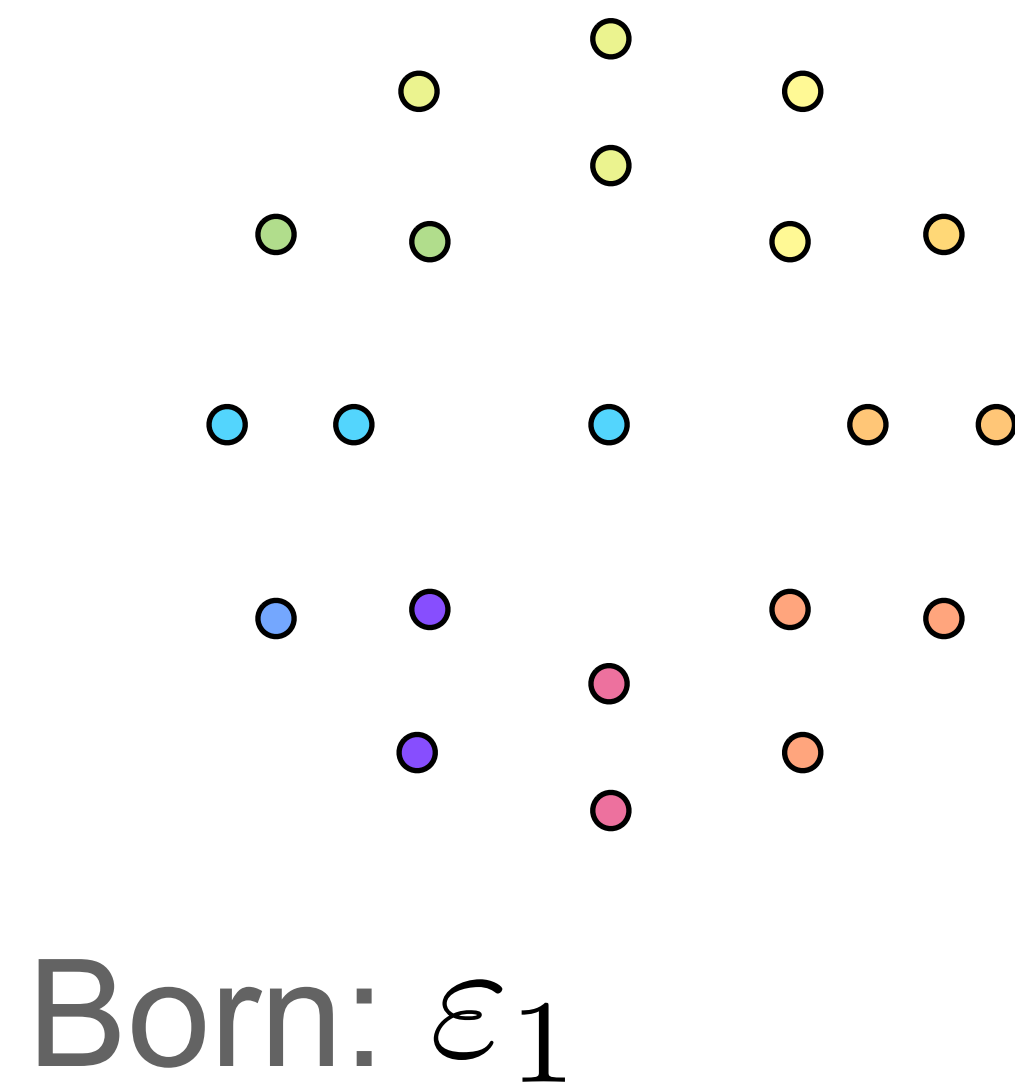
# PH and parametrization



$\varepsilon_1$

$$Rips(X, \varepsilon_0) \subseteq Rips(X, \varepsilon_1)$$

# PH and parametrization



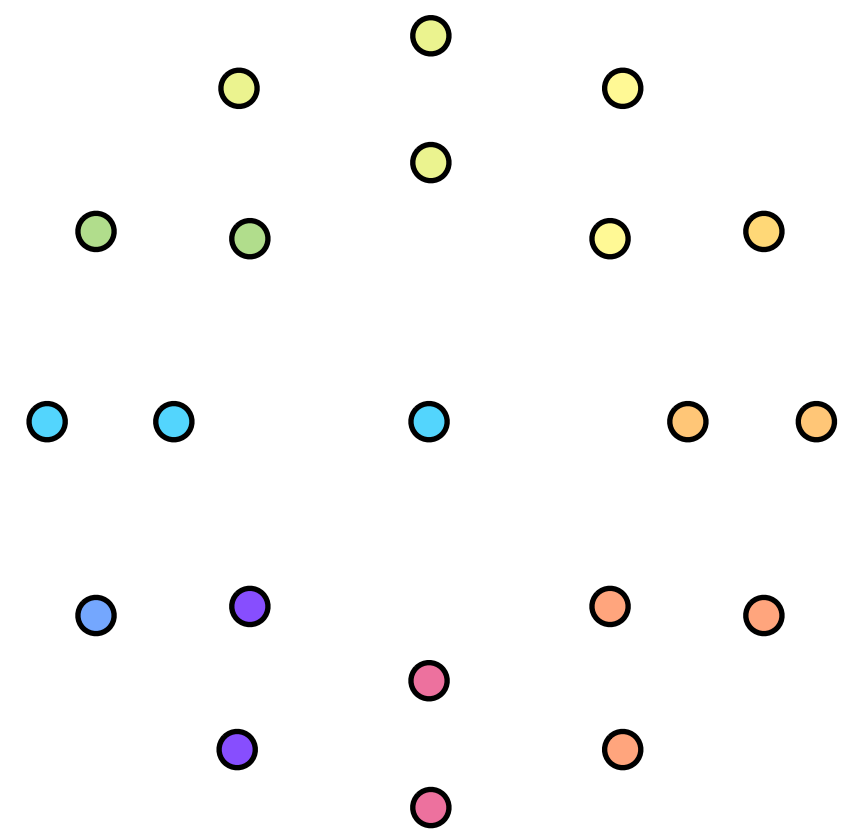
$$Rips(X, \varepsilon_0) \subseteq Rips(X, \varepsilon_1)$$

Parameter Space:

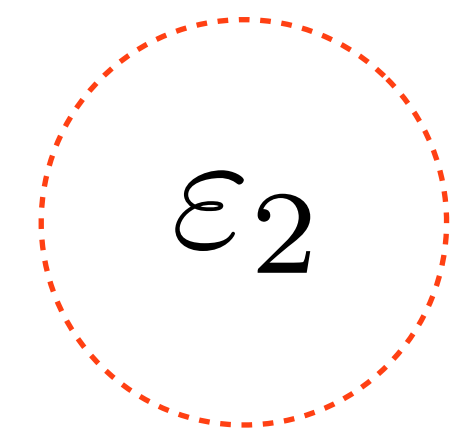
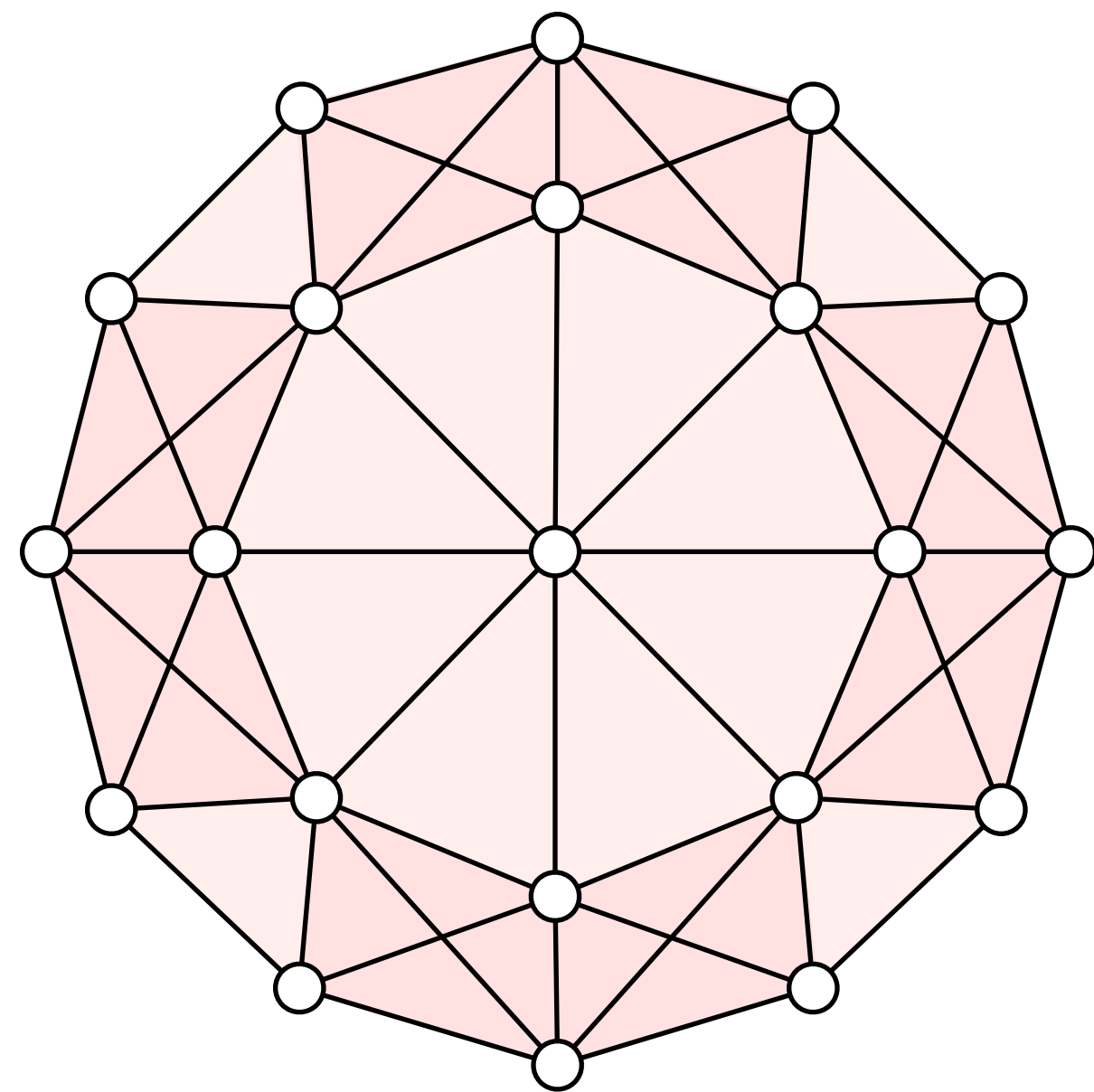




# PH and parametrization

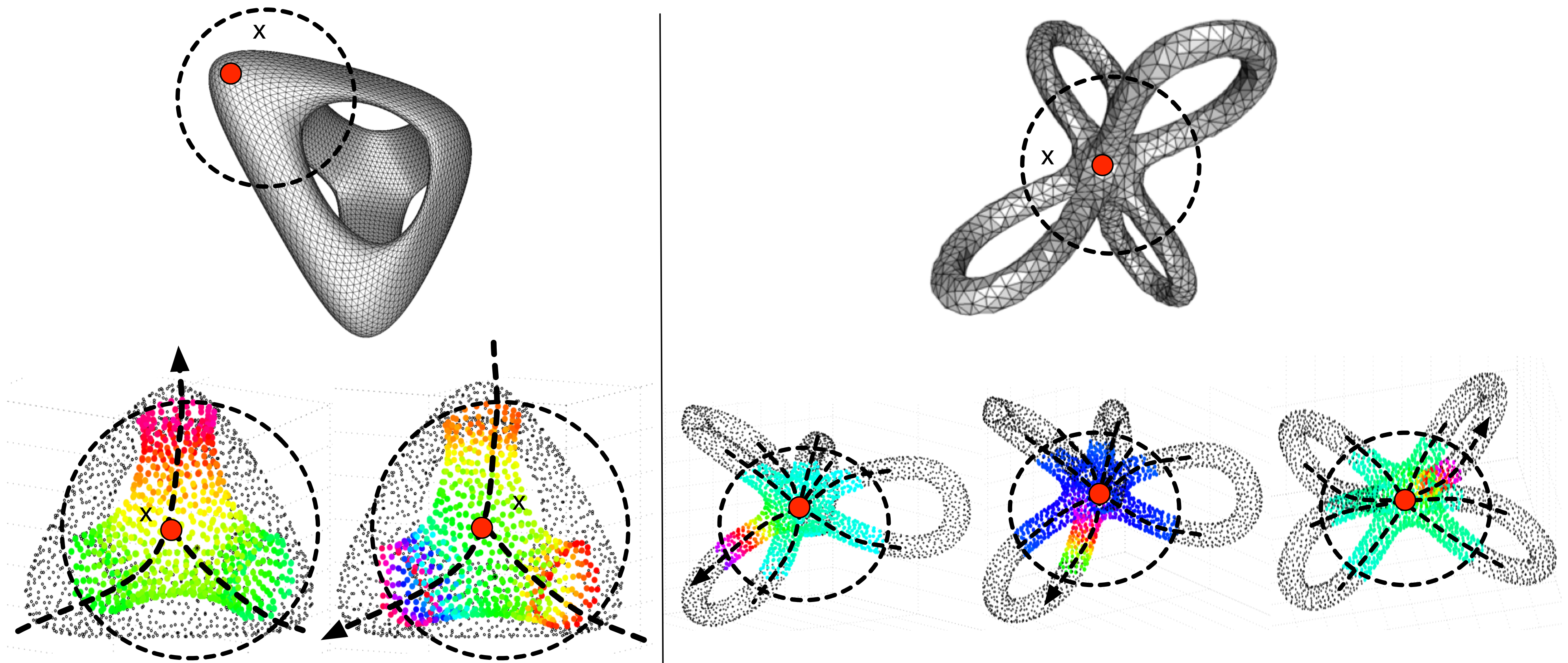


Born:  $\varepsilon_1$  Died:  $\varepsilon_2$   
Persistence:  $\varepsilon_2 - \varepsilon_1$

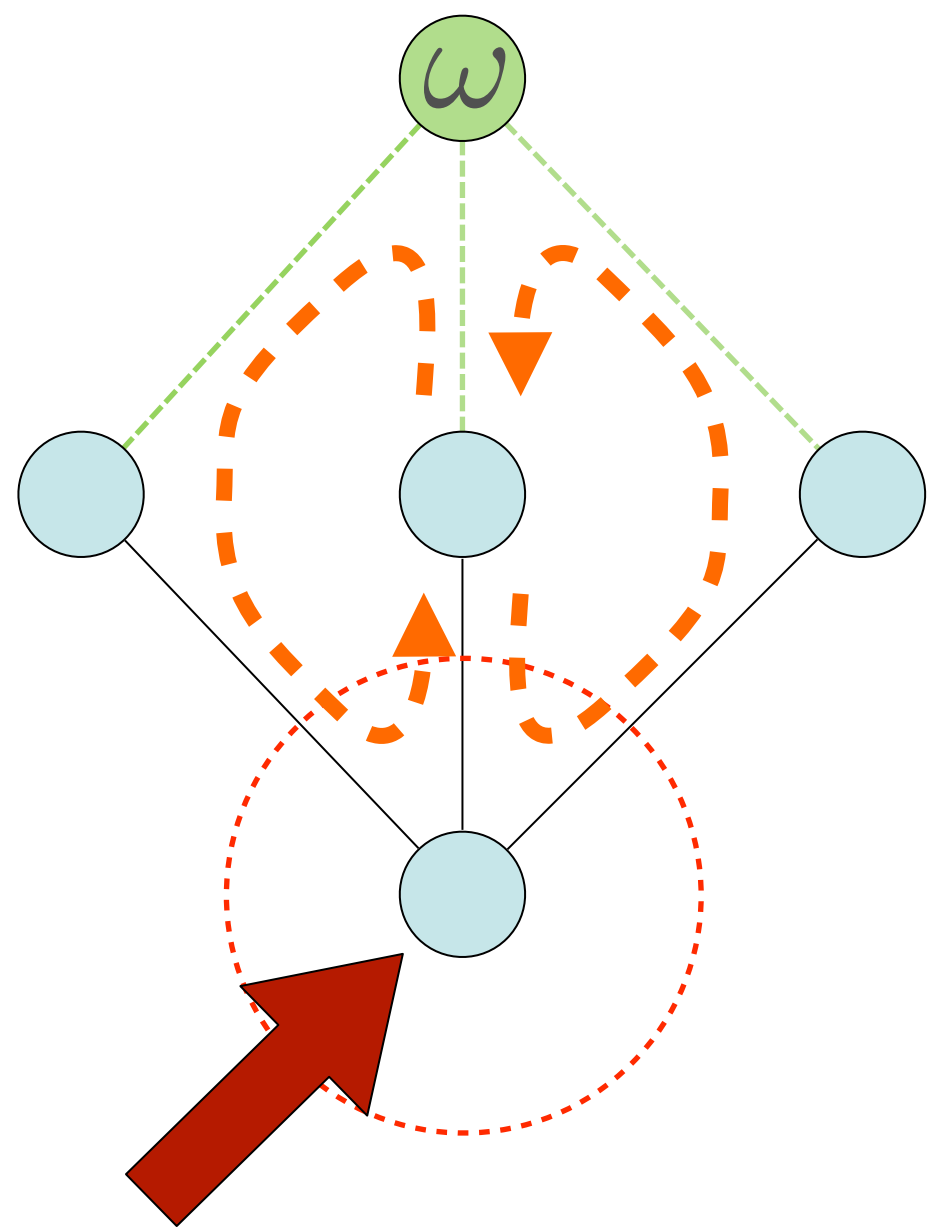


$$Rips(X, \varepsilon_0) \subseteq Rips(X, \varepsilon_1) \subseteq Rips(X, \varepsilon_2)$$

# Inferring branching structure



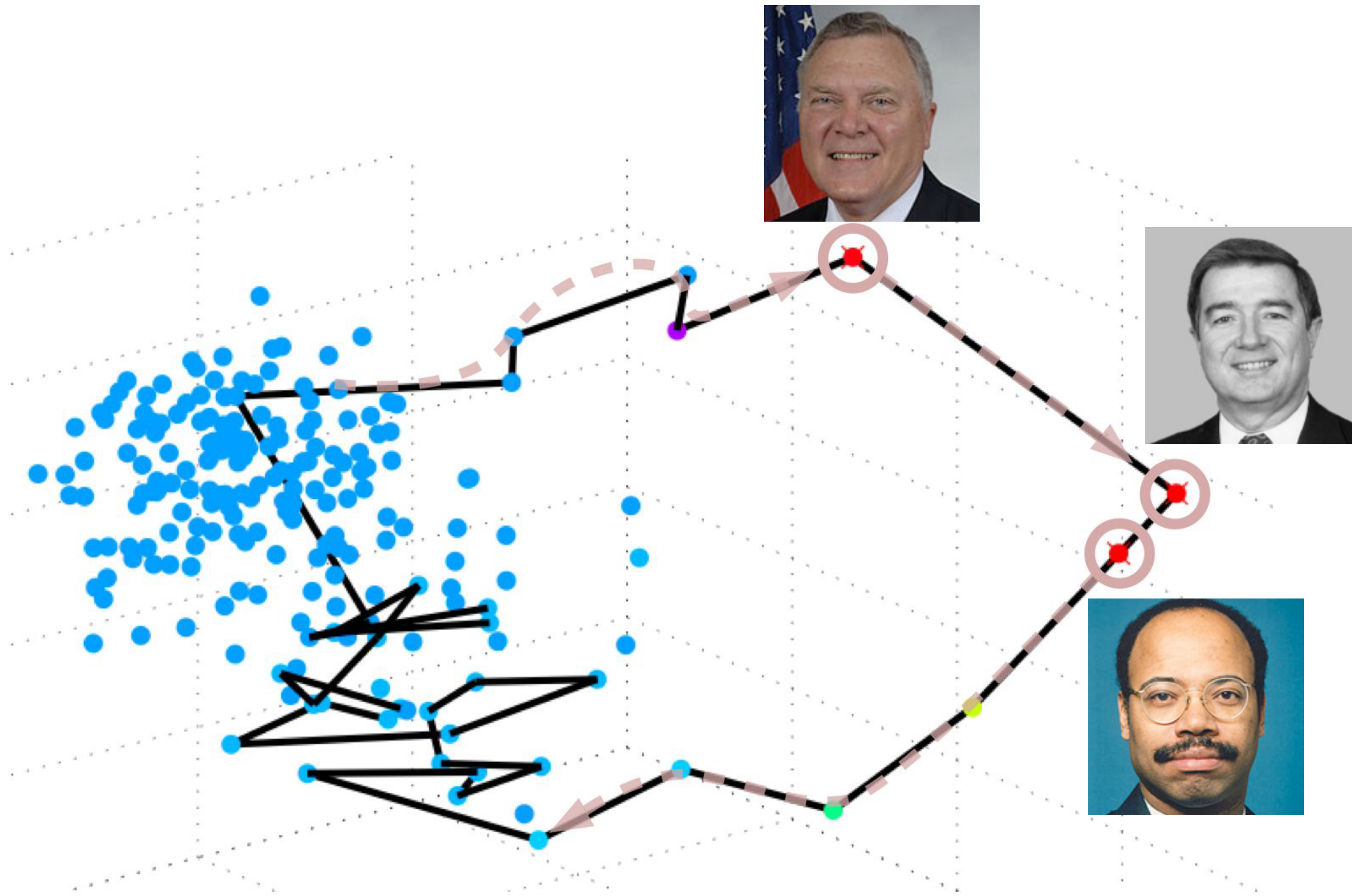
# Branching and parametrization



Given a neighborhood around a point, attach simplicies which cross the neighborhood threshold to a dummy vertex  $\omega$ .

In this way, we turn local branching features into circular structures.

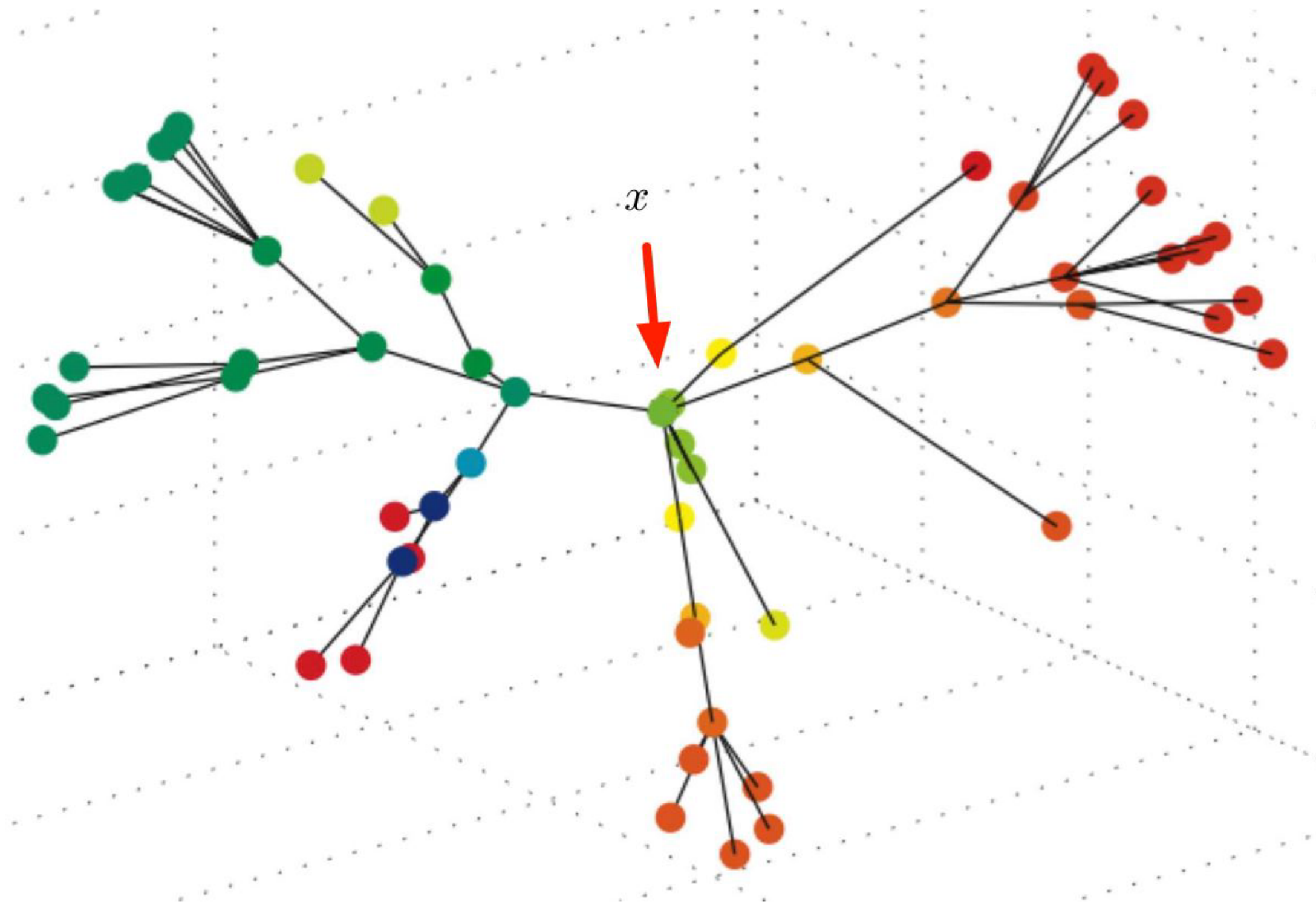
# Voting Data



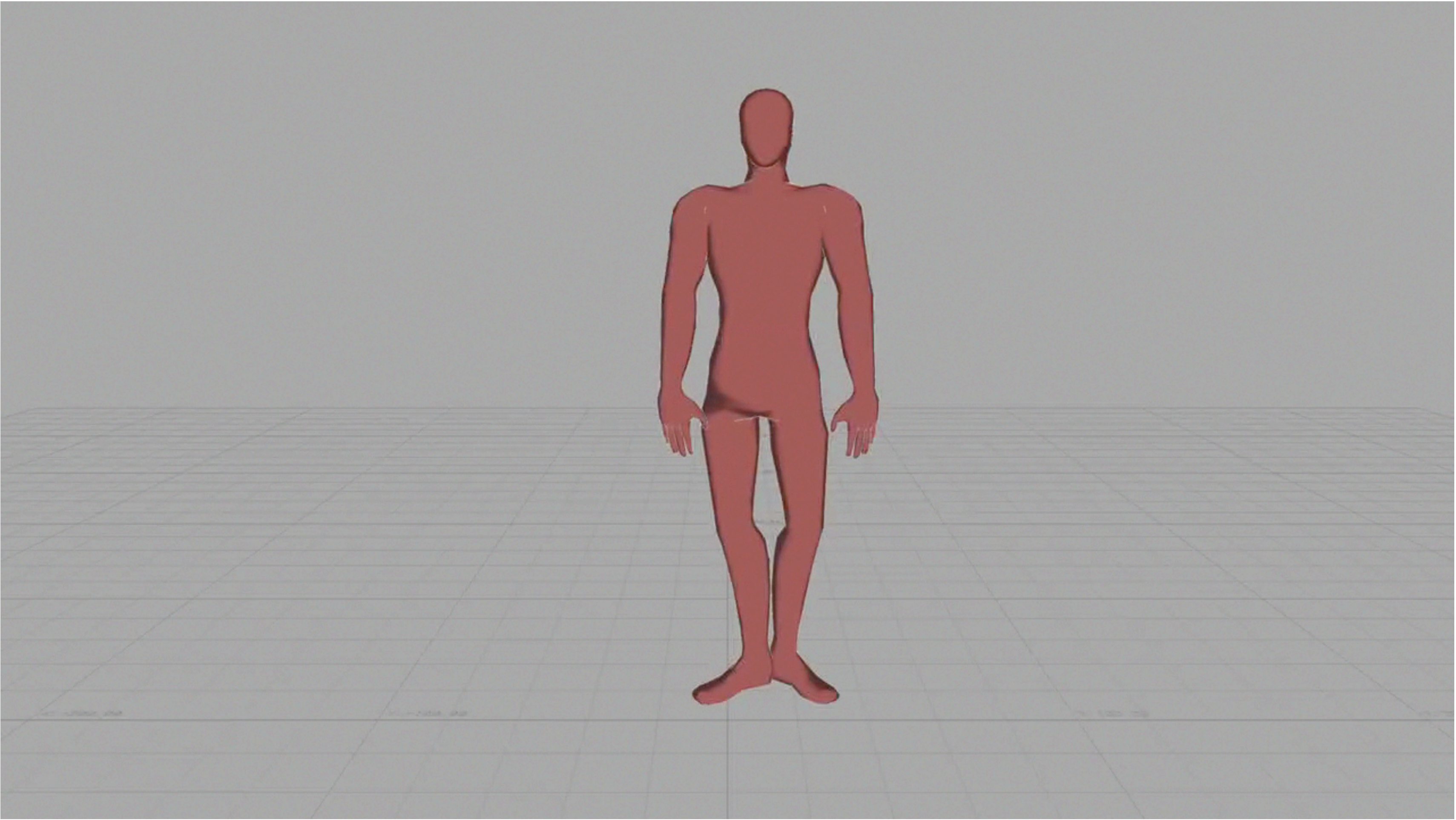
1995 House of Representatives Voting Record  
885 votes (dimension)  
205 Democratic congresspeople (points)  
Record: (Yea/Nay/Absent)  
94.27 seconds to compute  
(92.15 Rips, 1.76 Persistence)

Outliers: switched party or resigned

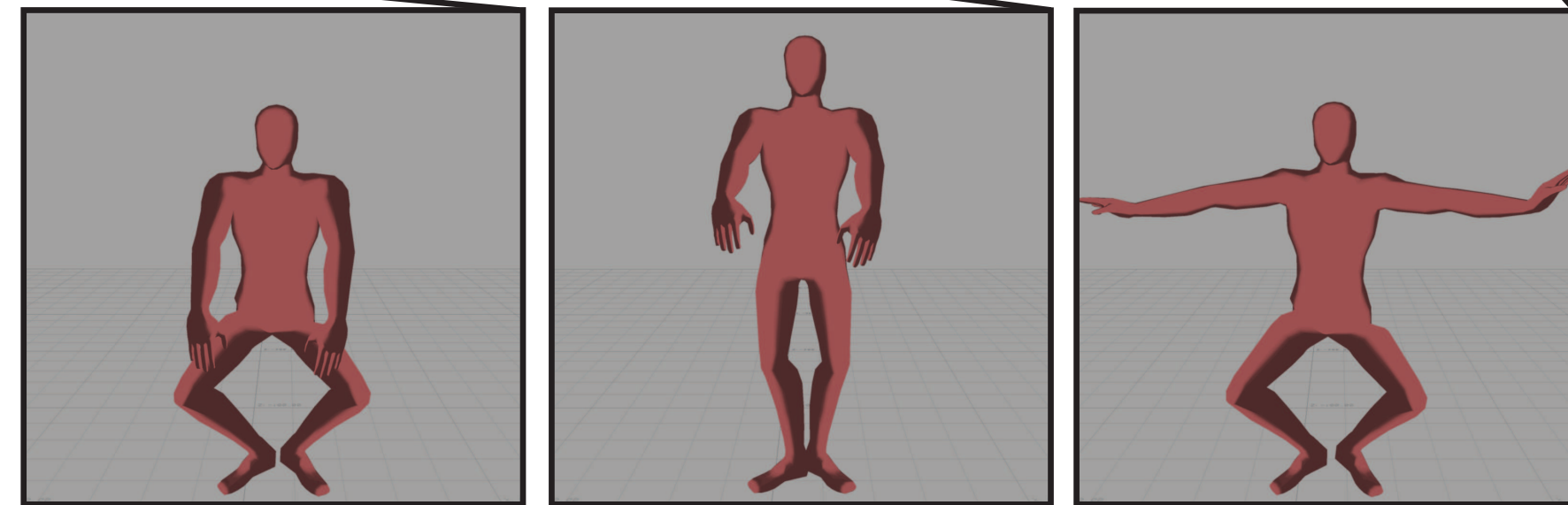
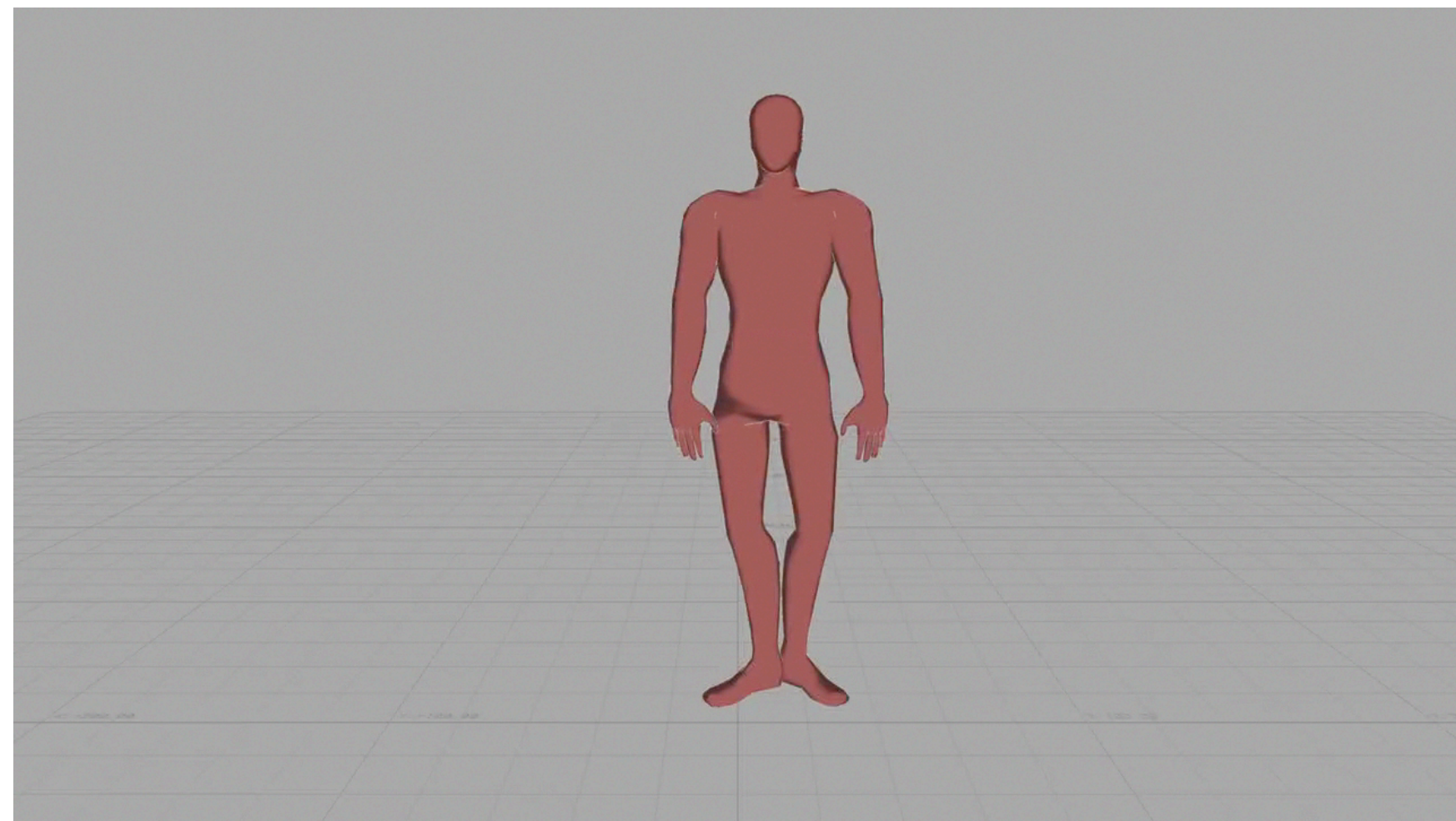
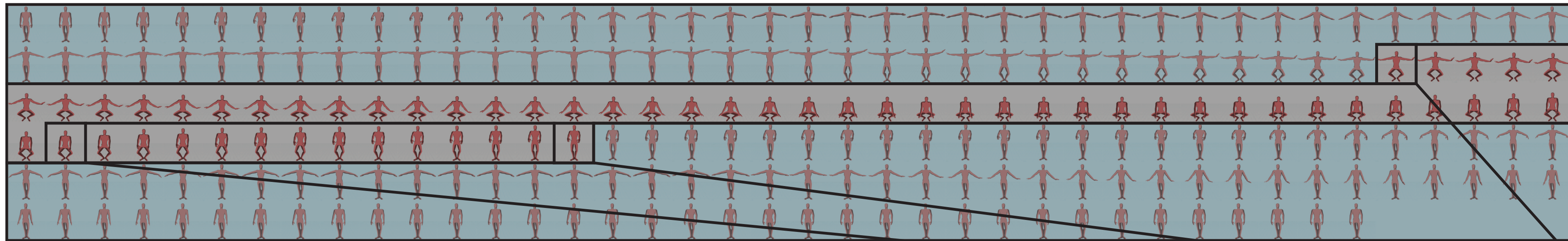
# Virus Data



1045 nucleotides (dimensions)  
58 mutated genetic sequences  
(points)  
0.09 seconds to compute  
(0.05 Rips, 0.02 Persistence)

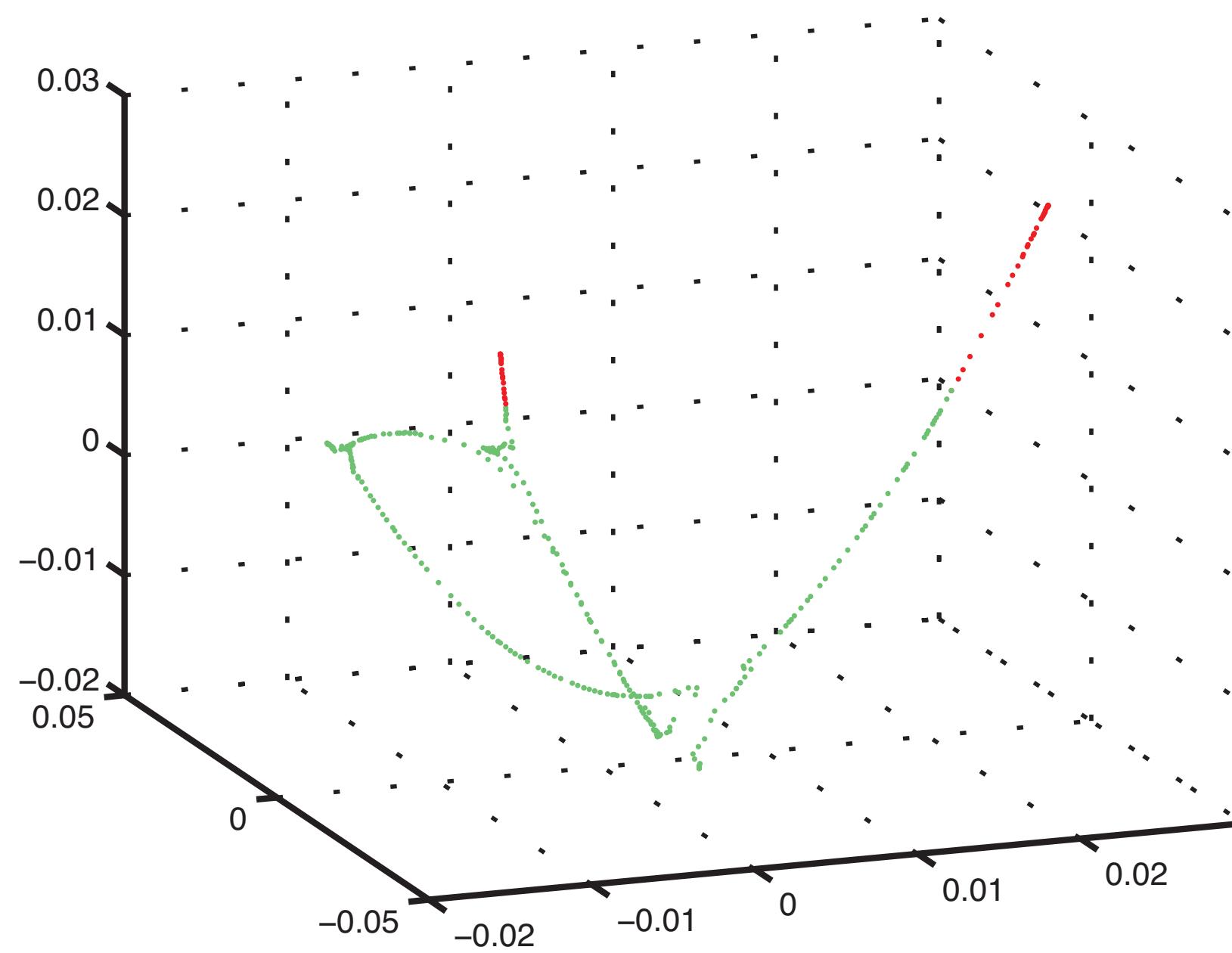


# Motion Capture: Ballet

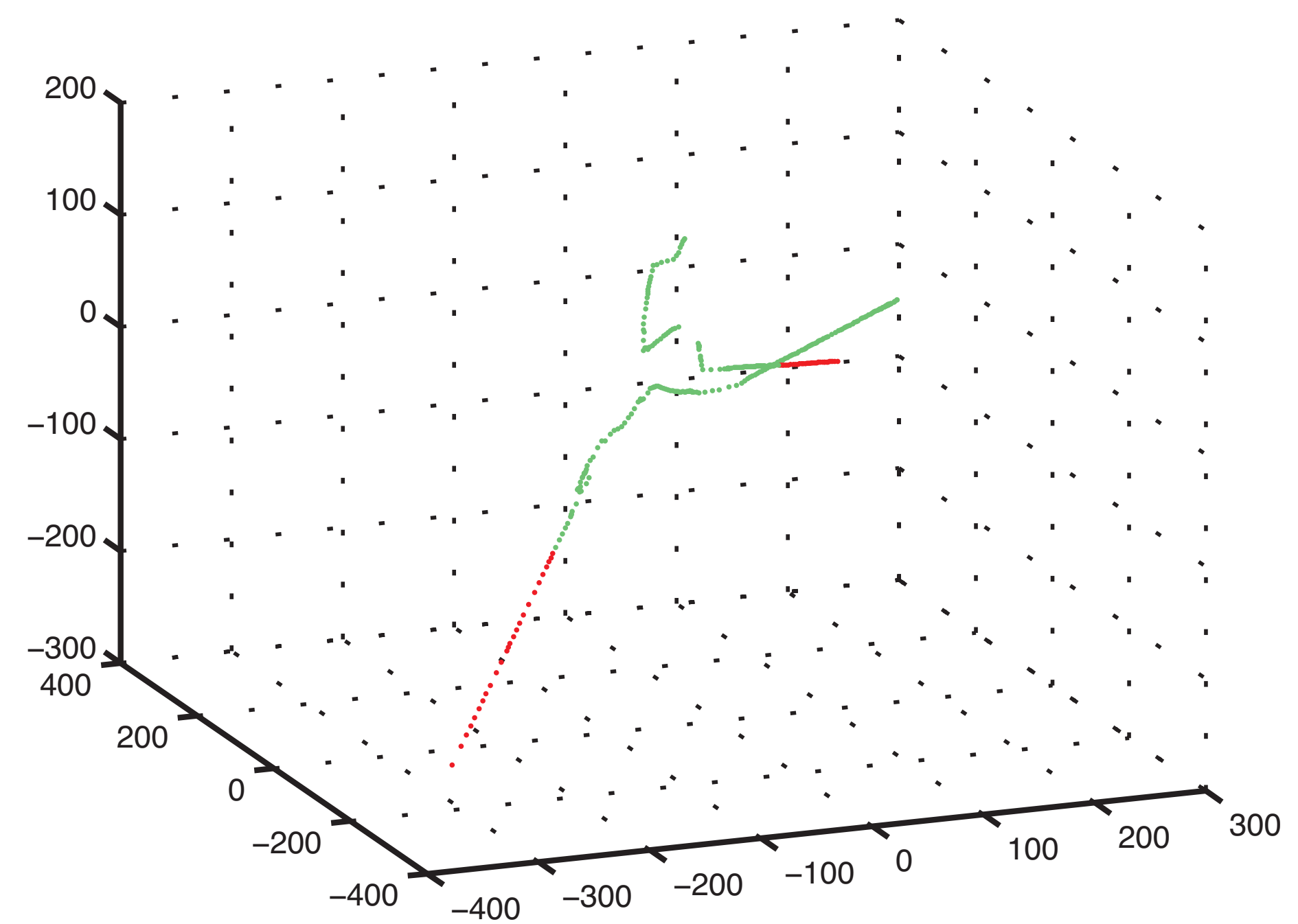


54 joint angles (dimensions)  
471 frames (points)  
417.38 seconds to compute  
(363.67 Rips, 30.47 Persistence)

# Motion Capture: Ballet



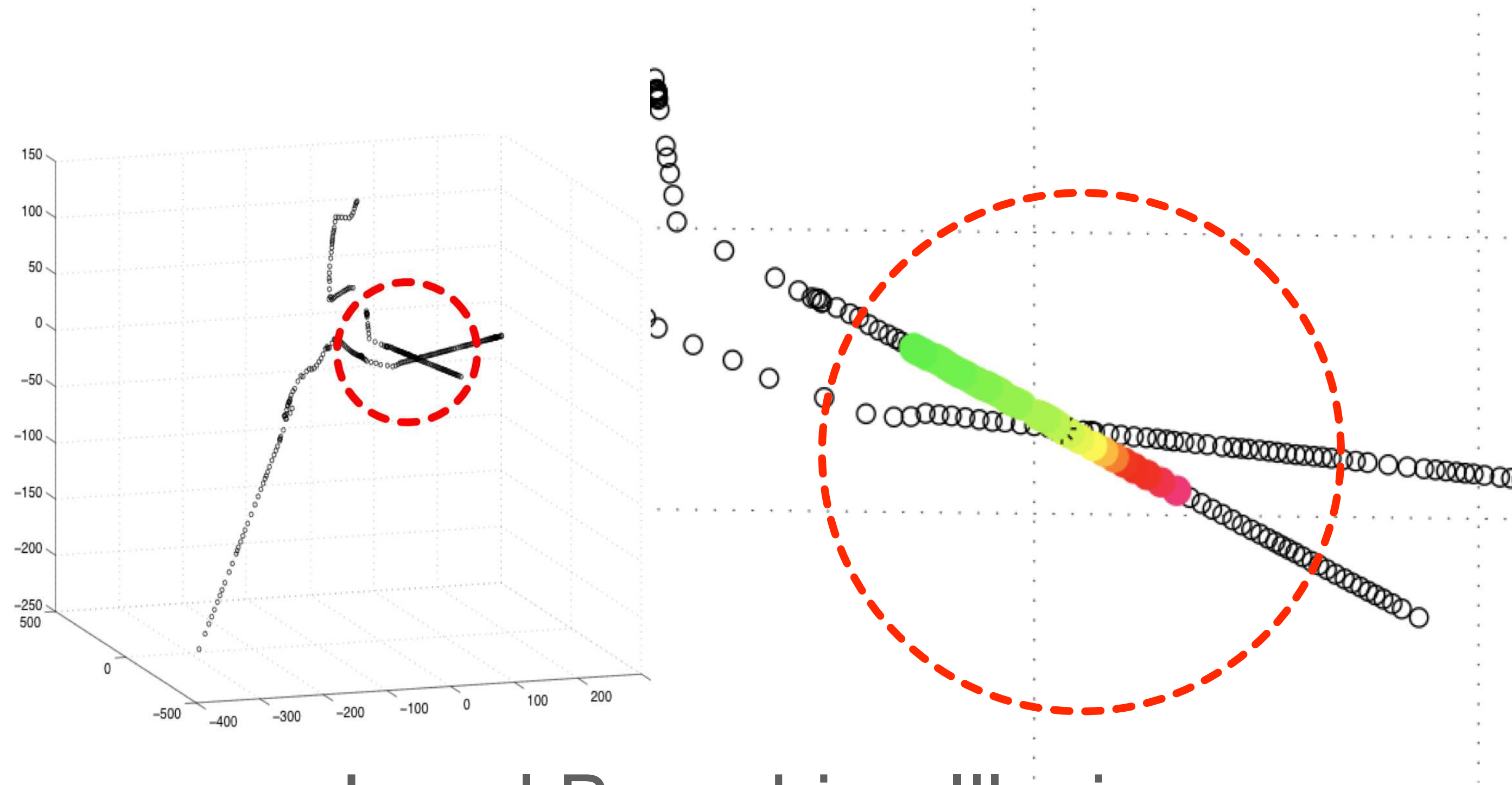
Laplacian Eigenmaps



3D Isomap

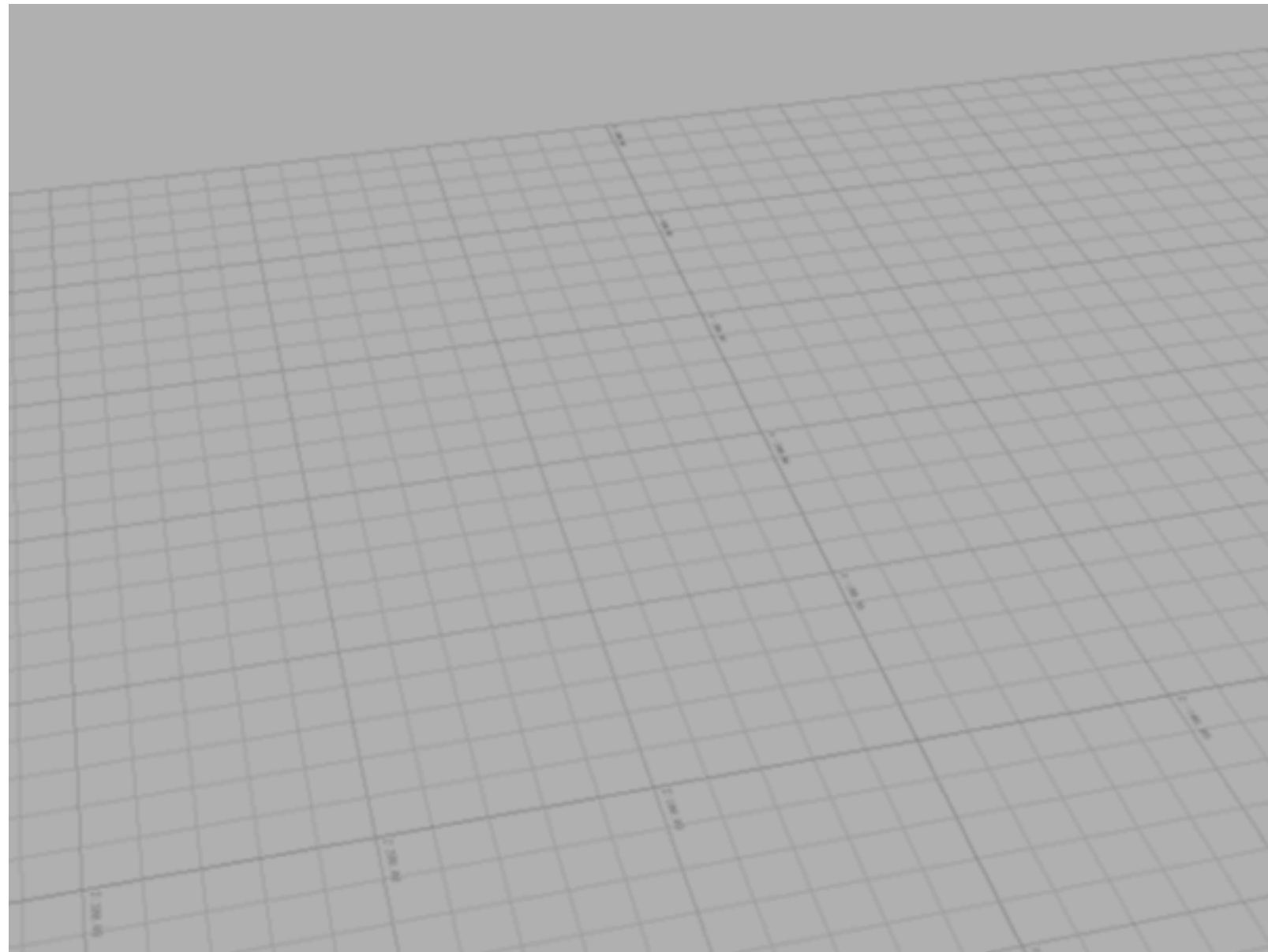


# Motion Capture: Ballet

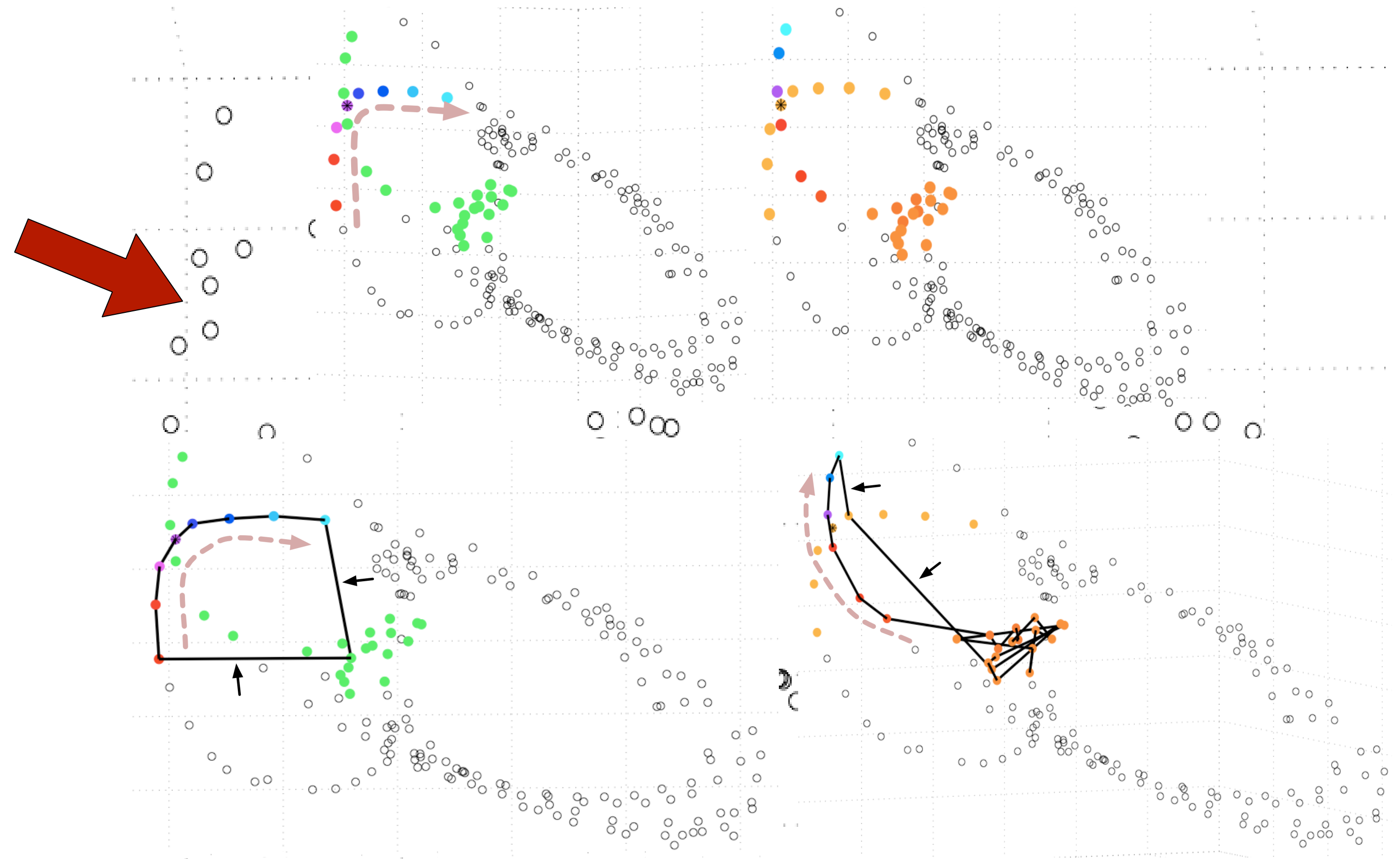


Local Branching Illusion

# Motion Capture - Walk/Hop/Walk



66 joint angles (dimensions)  
189 frames (points)  
0.08 seconds to compute  
(0.08 Rips)





# Thanks!

Any questions?

You can find me at: [beiwang@sci.utah.edu](mailto:beiwang@sci.utah.edu)

# CREDITS

Special thanks to all people who made and share these awesome resources for free:

- ☐ Presentation template designed by [Slidesmash](#)
- ☐ Photographs by [unsplash.com](#) and [pexels.com](#)
- ☐ Vector Icons by [Matthew Skiles](#)

# Presentation Design

This presentation uses the following typographies and colors:

## Free Fonts used:

<http://www.1001fonts.com/oswald-font.html>

<https://www.fontsquirrel.com/fonts/open-sans>

## Colors used

