

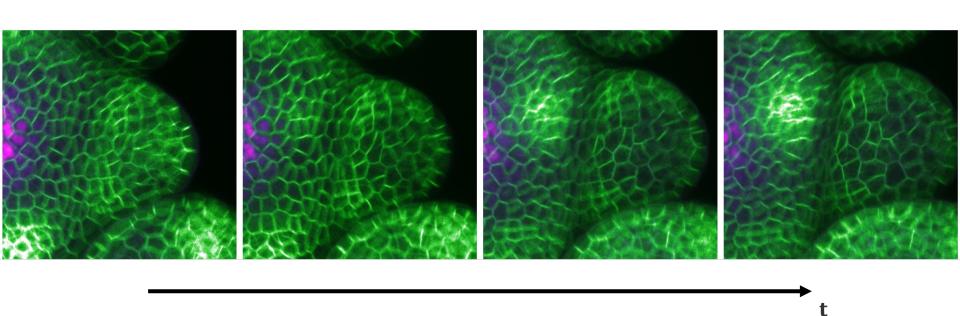
# Plant Tissues as Topological Complexes: Reconstruction & Other Combinatorial Challenges



## Data-driven models of plant tissue morphogenesis

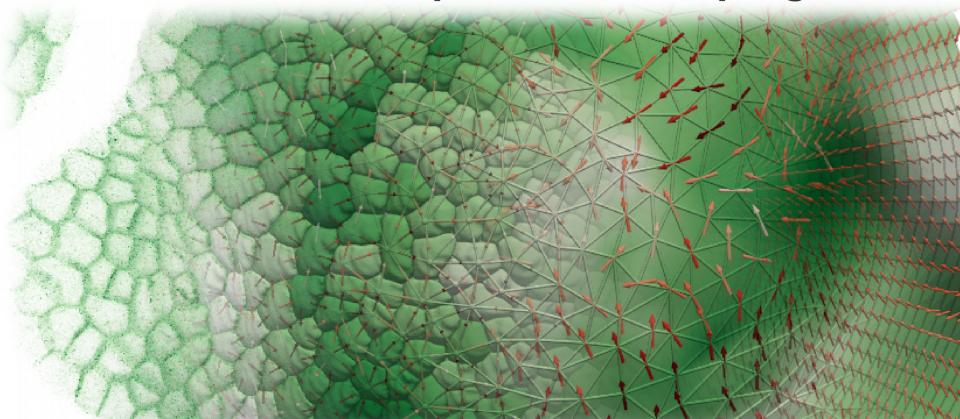


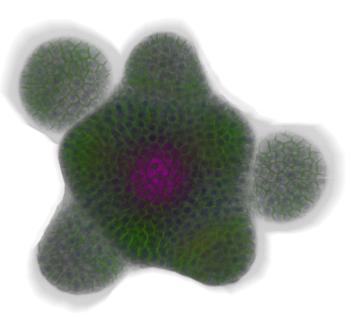
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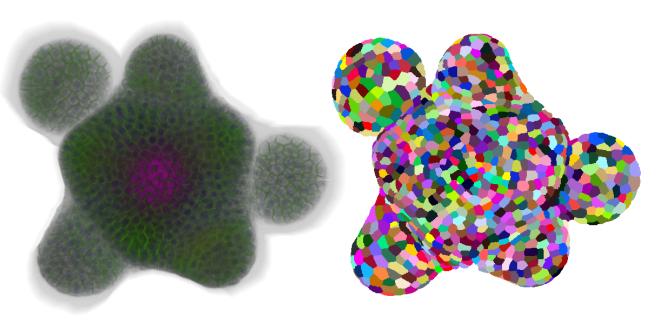


# Data-driven models of plant tissue morphogenesis



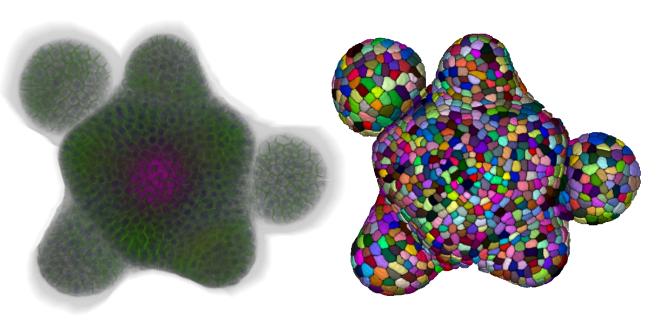


3D Confocal Images



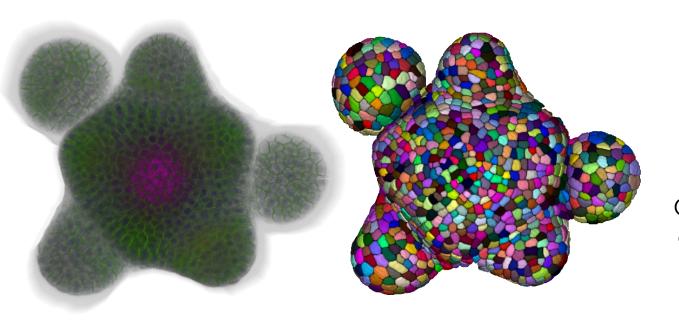
3D Confocal Images

3D Watershed Segmentation



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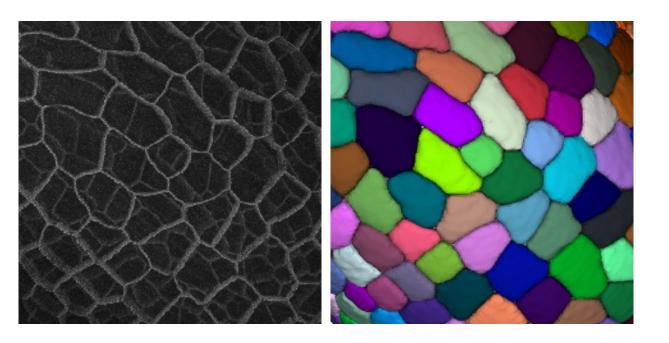
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Realistic templates for numerical simulations (tissue mechanics FEM, discrete network ODEs)

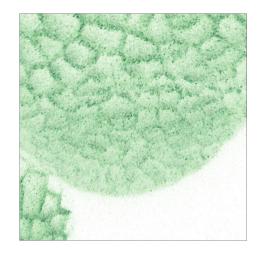
Comparison of simulation outputs with quantitative measures computed on experimental data

## Multicellular Tissue = Dual of a Simplicial Complex

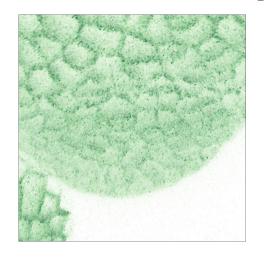


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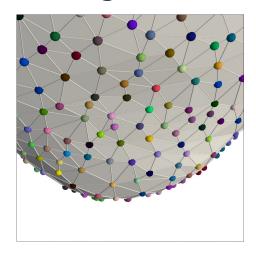


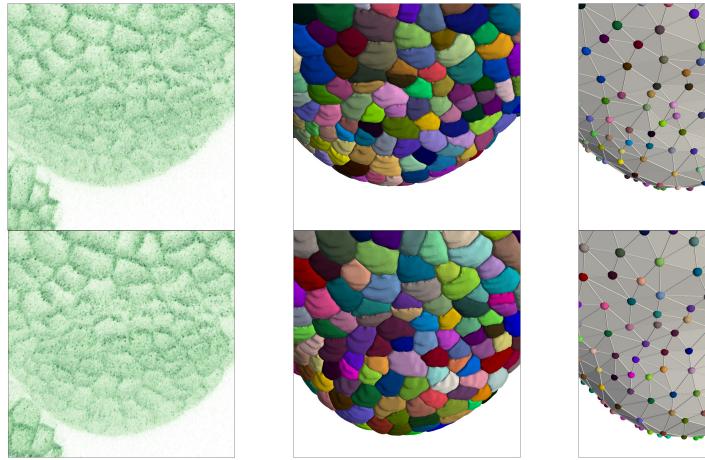


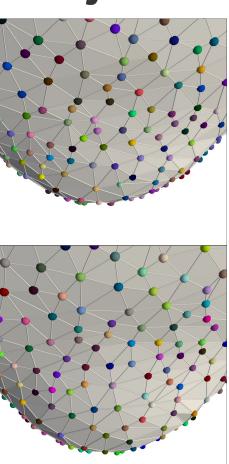


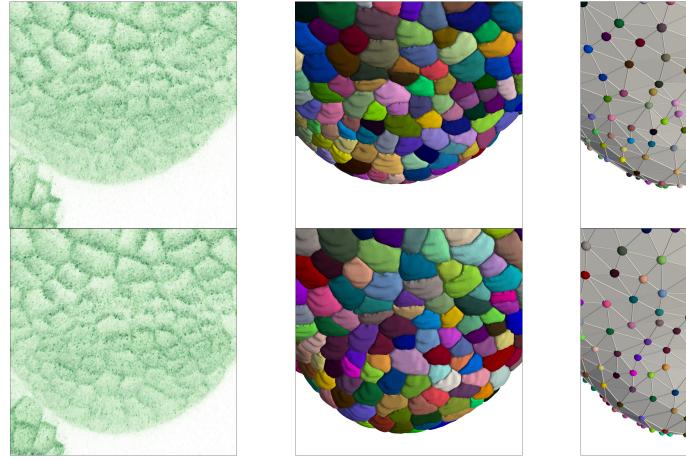


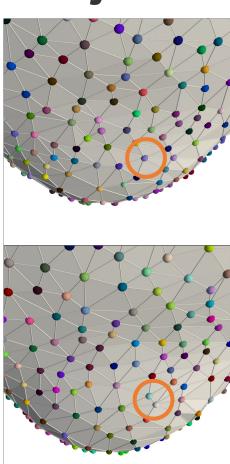


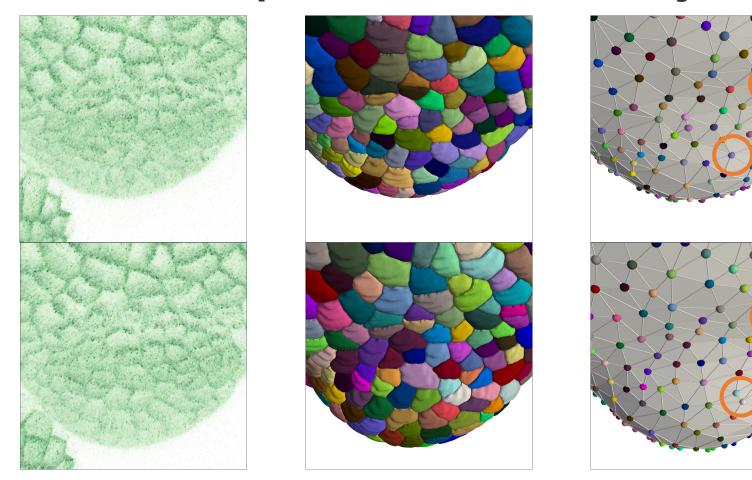


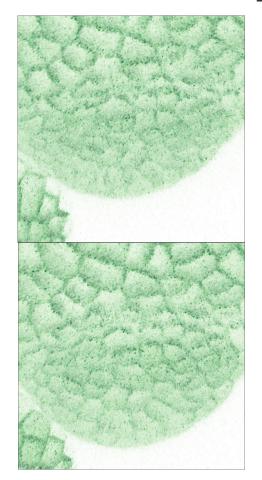


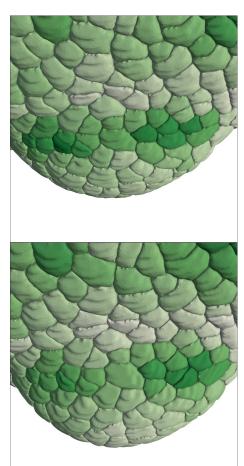


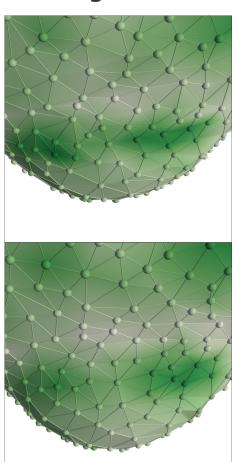












#### Tissue simplicial complex reconstruction problem

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Given a tissue represented by a 2D / 3D labelled (segmented) image



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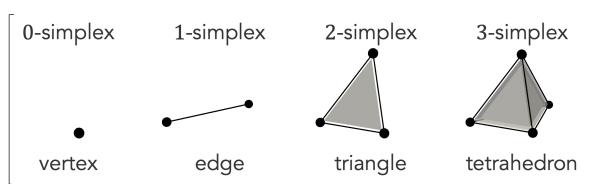
Given a tissue represented by a 2D / 3D labelled (segmented) image



Build the set of simplices corresponding to the adjacency between tissue cells (ensuring they form a valid triangulation / tetrahedralization)

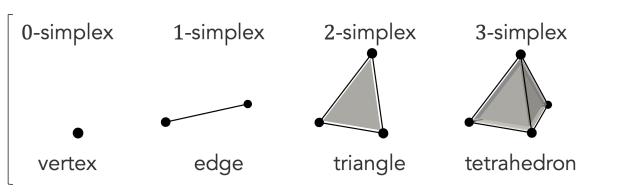
• n-simplicial complex : **partitioning** of a subset of  $\mathbb{R}^d$   $(m \ge n)$  into n-simplices

Convex hull of n+1 geometrically independent points



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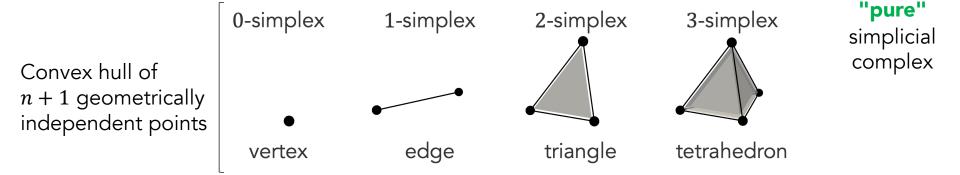
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"pure"

simplicial complex

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Convex hull of n+1 geometrically independent points n+1 edge n+1 edge n+1 edge n+1 edge n+1 tetrahedron n+1 edge n+1 edge n+1 tetrahedron

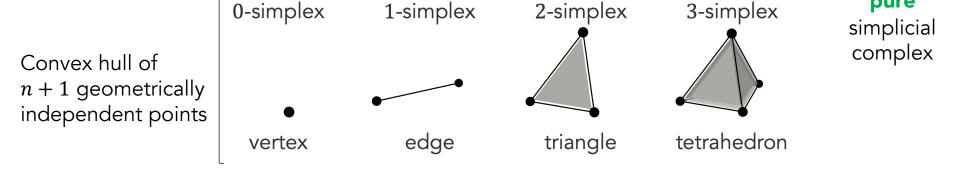
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Convex hull of n+1 geometrically independent points 0-simplex 1-simplex 2-simplex 2-simplex 3-simplex 3-simplex 2-simplex 3-simplex 3-simplex 2-simplex 3-simplex 2-simplex 2-simplex

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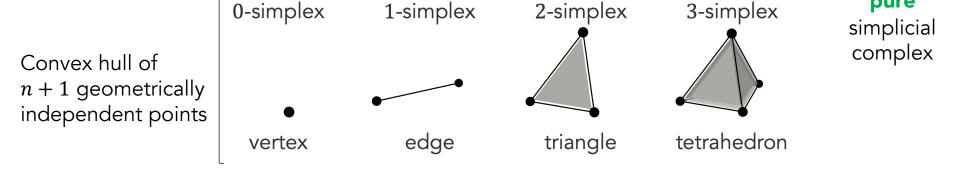
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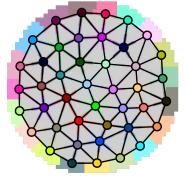
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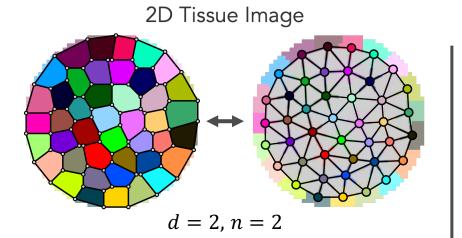
2D Tissue Image

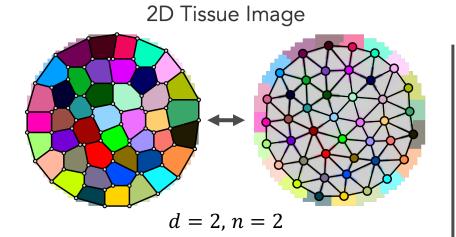


2D Tissue Image



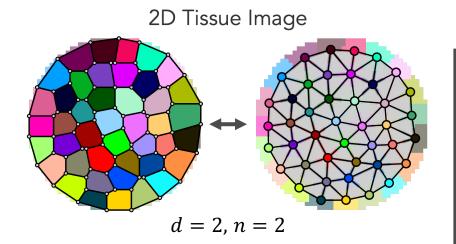
$$d = 2$$
,  $n = 2$ 



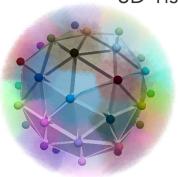


3D Tissue Image

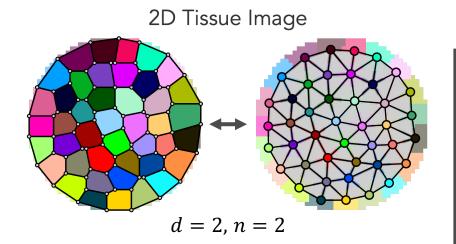


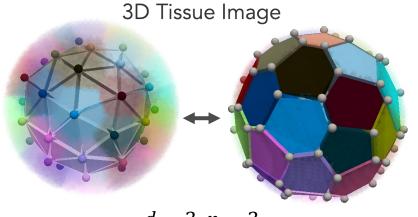


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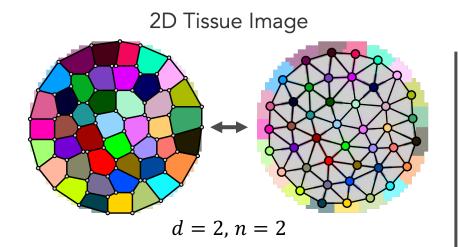


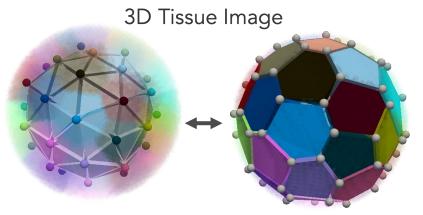
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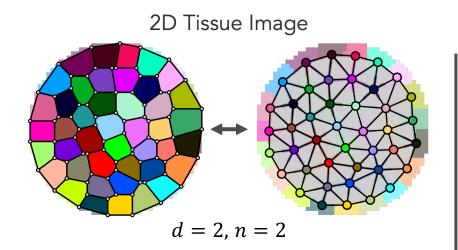


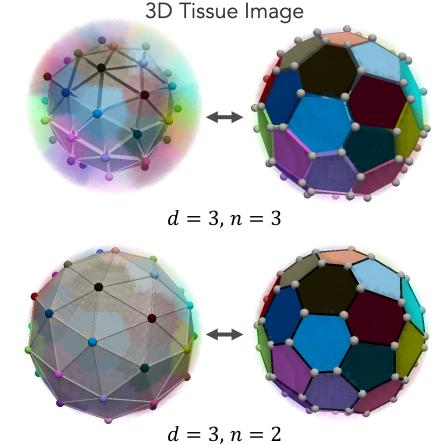
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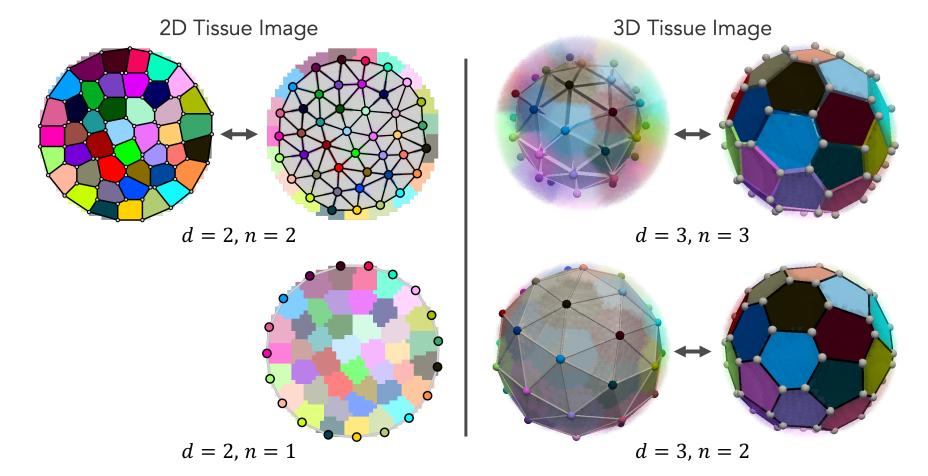
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## Topological complexes from labelled tissue images

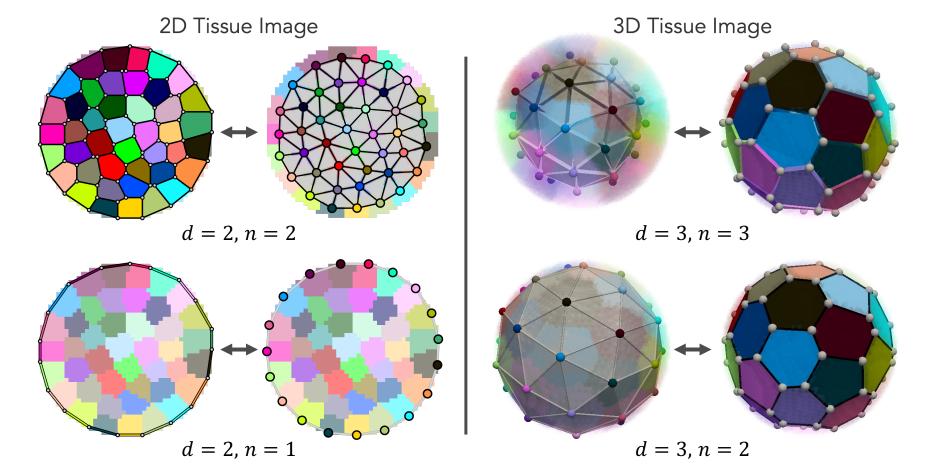




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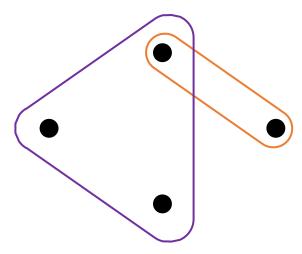
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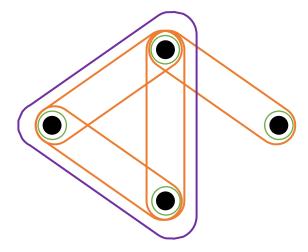
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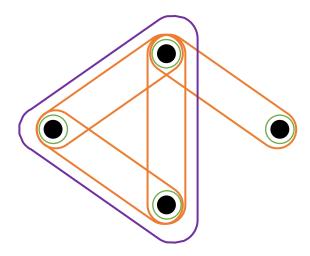
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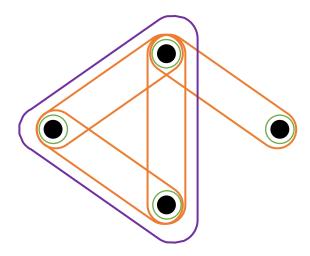
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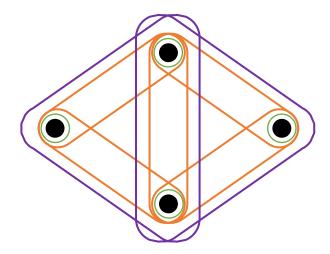
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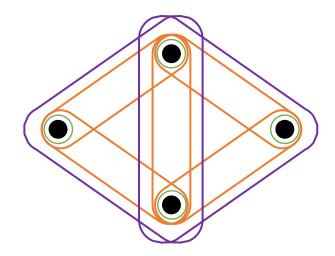
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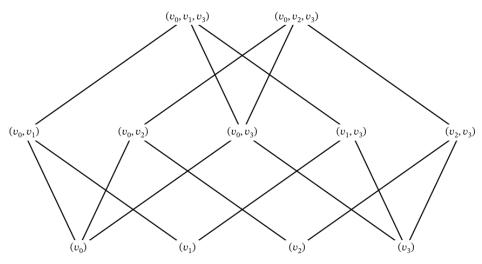
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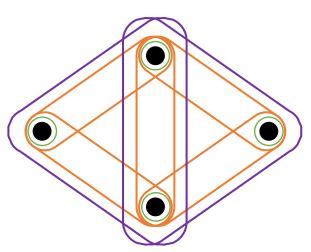


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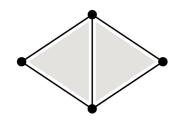


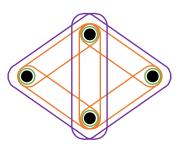
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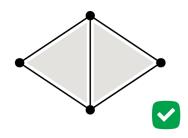


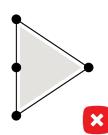
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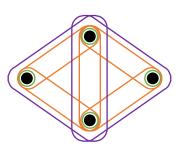




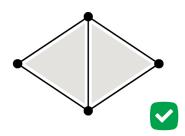
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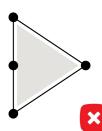


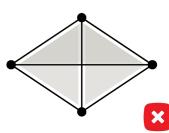




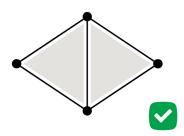
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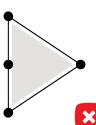


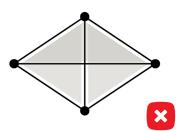


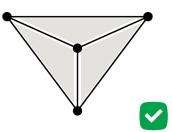


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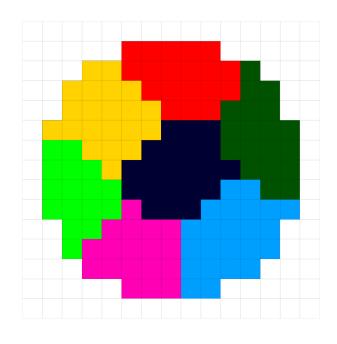




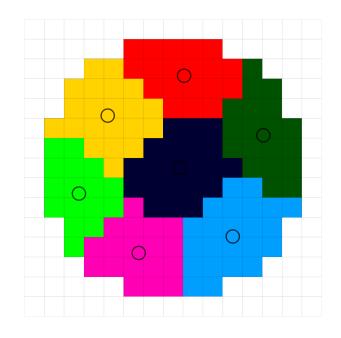
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Not all embeddings of an ASC lead to a geometric realization (invalid geometric SC)

2D Tissue Image

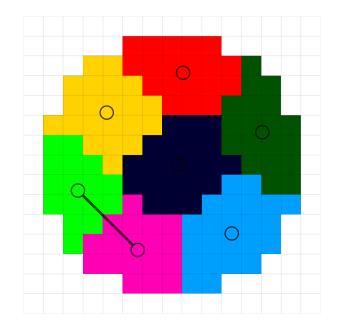


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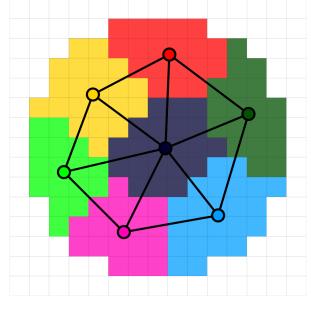




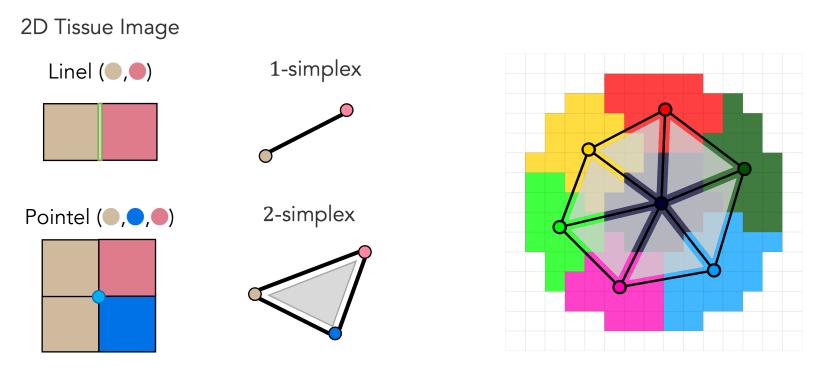
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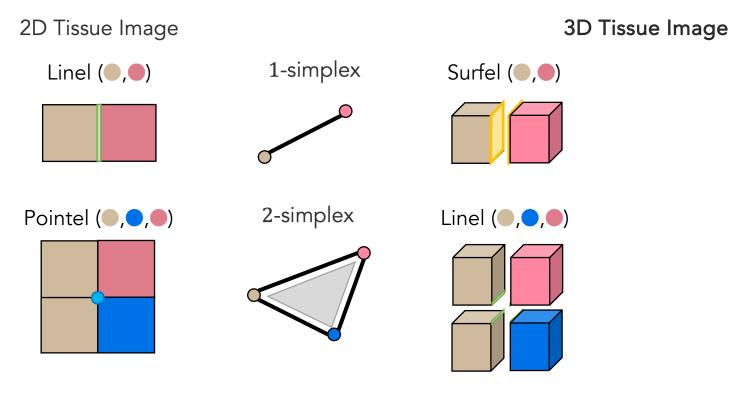
Linel (•,•)

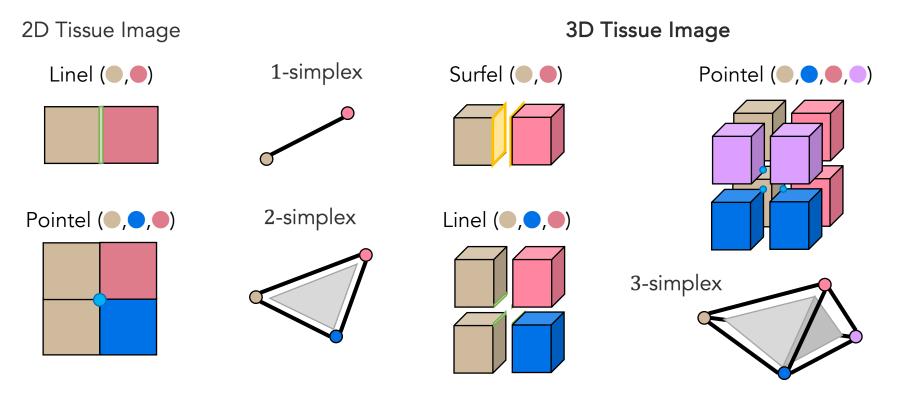
1-simplex

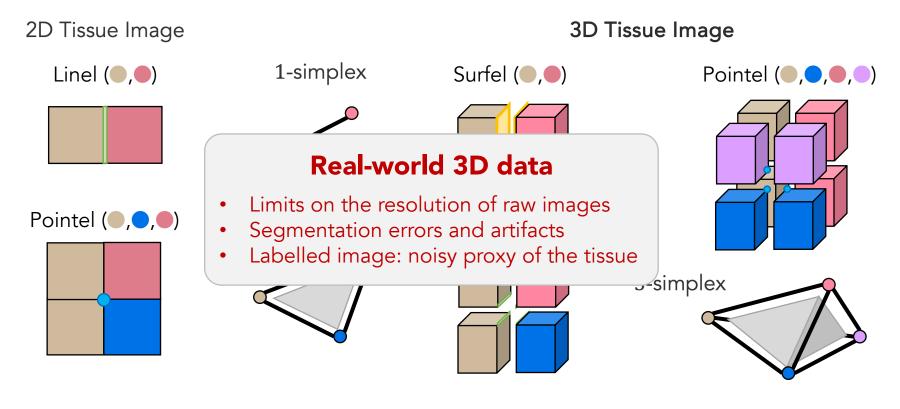


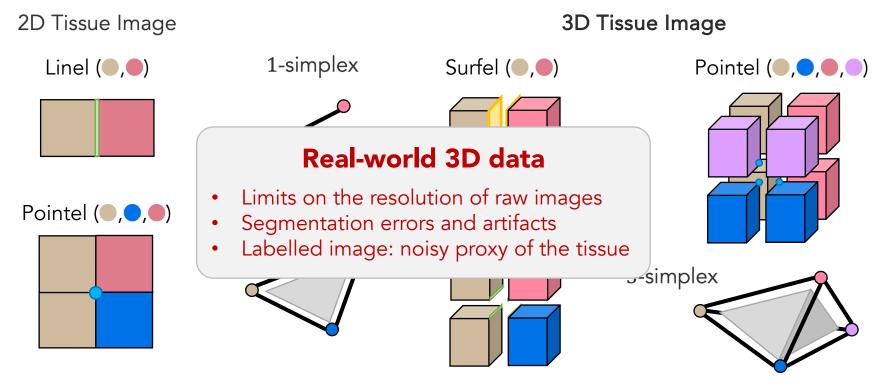
Adjacency Graph









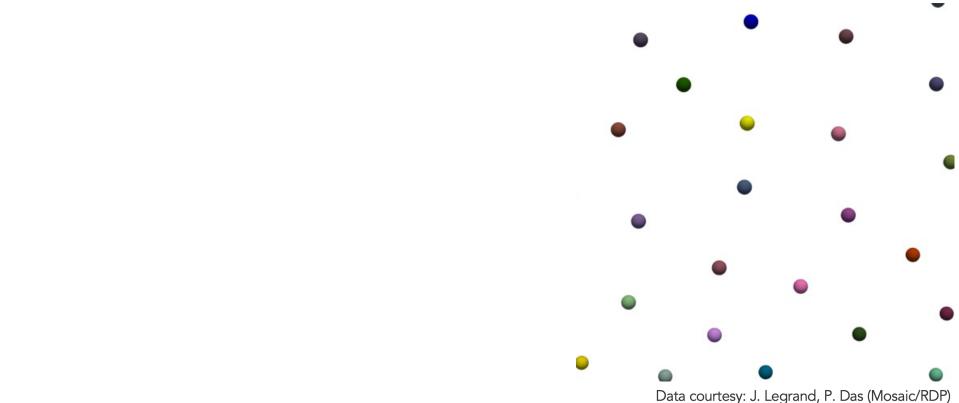


Collection of image adjacency simplices: not necessarily a **valid simplicial complex** Dealing with **non-simplicial** image adjacencies (4-label linels, 5+-label pointels)



Data courtesy: J. Legrand, P. Das (Mosaic/RDP)

Given a set of space-embedded vertices  $\{\mathbf{p}(v) \in \mathbb{R}^d, v \in V\}$  (e.g. image cell centers)



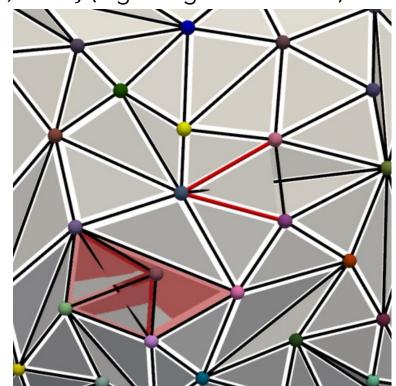
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Construct a n-simplicial complex K on V such that:

*K* is a **valid** (geometric) simplicial complex (pure, non-overlapping, simplicial manifold)



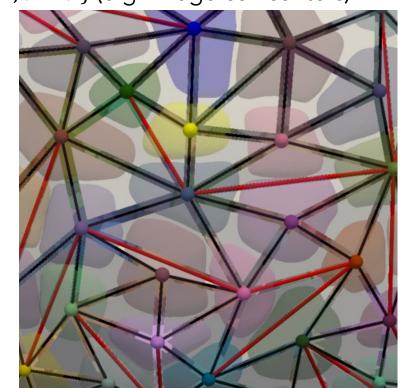
Data courtesy: J. Legrand, P. Das (Mosaic/RDP)

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The 1-simplices match as much as possible the **cell-to-cell adjacencies** from the image



Data courtesy: J. Legrand, P. Das (Mosaic/RDP)

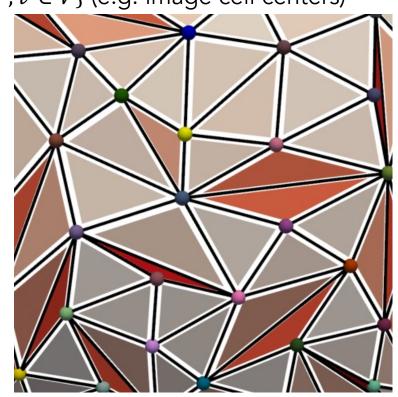
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The **geometric "quality"** of the n-simplices (e.g. measured as eccentricity) is maximized



Data courtesy: J. Legrand, P. Das (Mosaic/RDP)

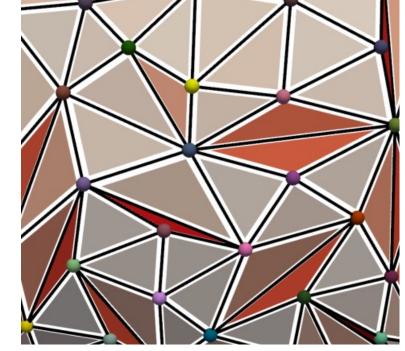
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**Constrained Optimization** 

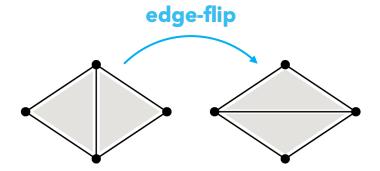
Data courtesy: J. Legrand, P. Das (Mosaic/RDP)

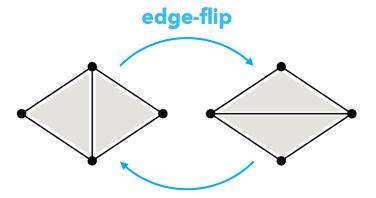
# Walking the space of (abstract) simplicial complexes

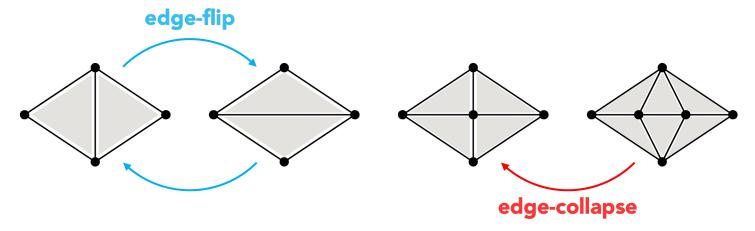
• Modify the combinatorial structure through elementary edit operations: e.g. in 2D

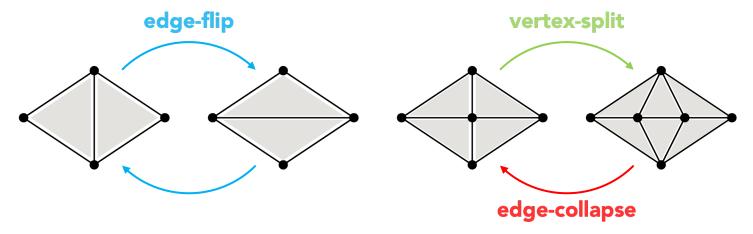
## Walking the space of (abstract) simplicial complexes

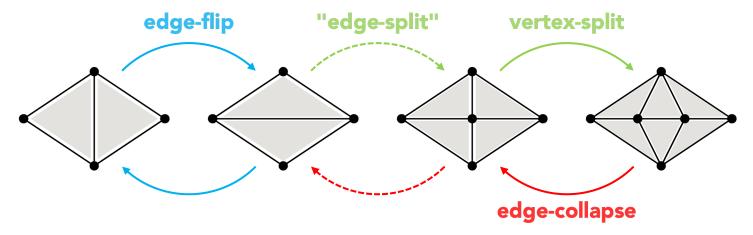
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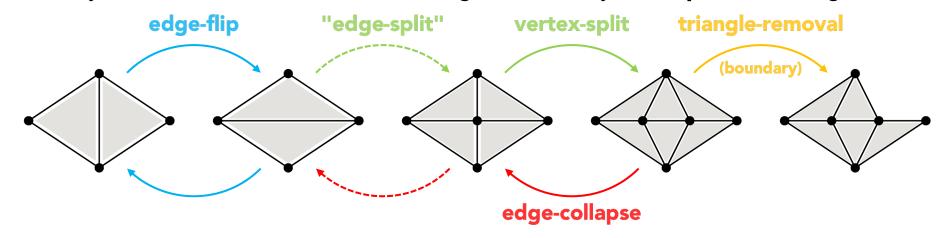


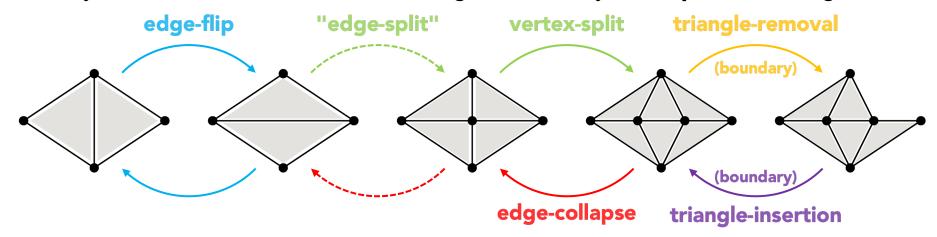




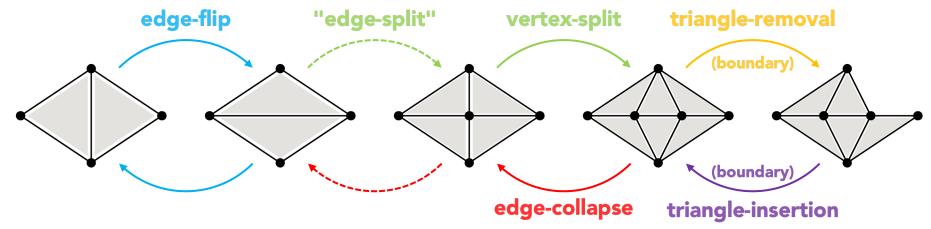






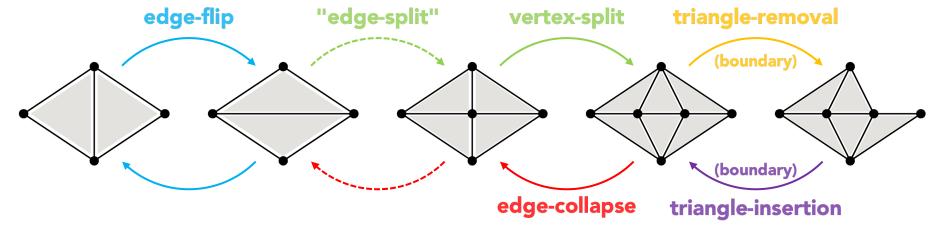


Modify the combinatorial structure through elementary edit operations: e.g. in 2D



• Only allowed if they **preserve the validity** of the complex

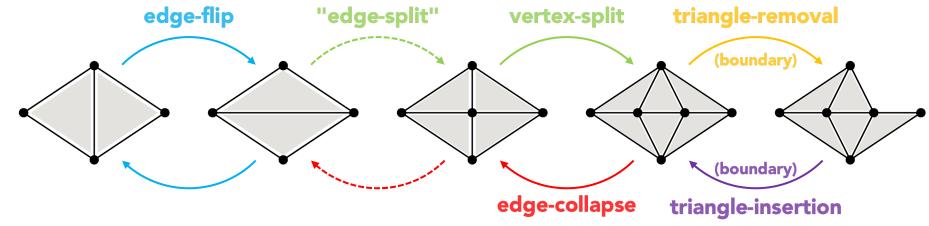
Modify the combinatorial structure through elementary edit operations: e.g. in 2D



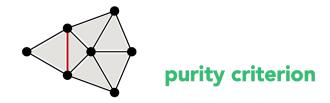
• Only allowed if they **preserve the validity** of the complex

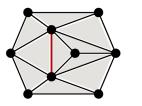


Modify the combinatorial structure through elementary edit operations: e.g. in 2D

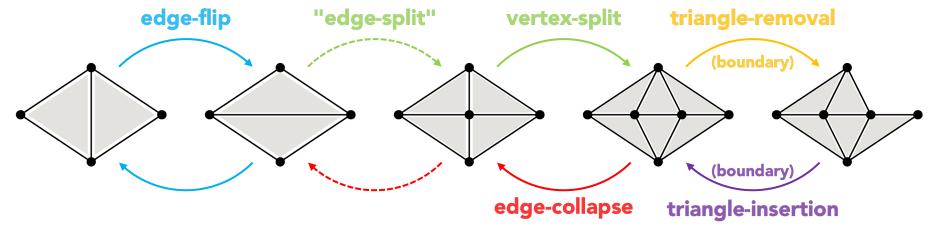


• Only allowed if they **preserve the validity** of the complex

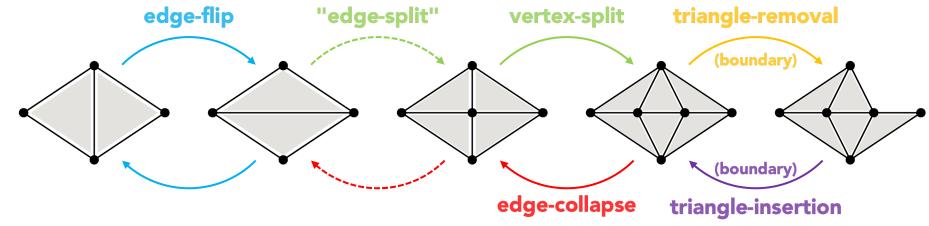




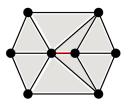
manifold criterion

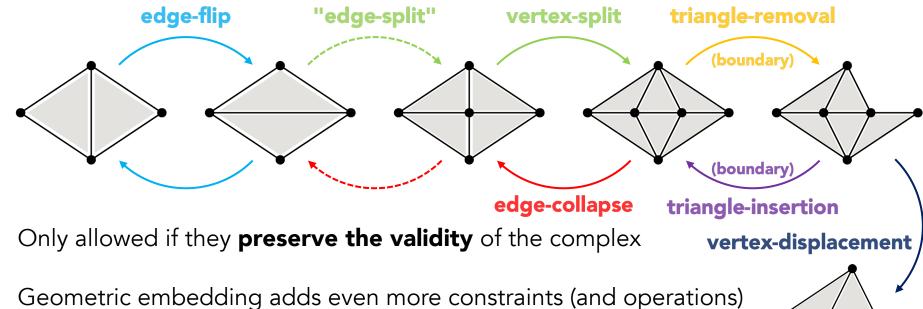


- Only allowed if they **preserve the validity** of the complex
- Geometric embedding adds even more constraints (and operations)

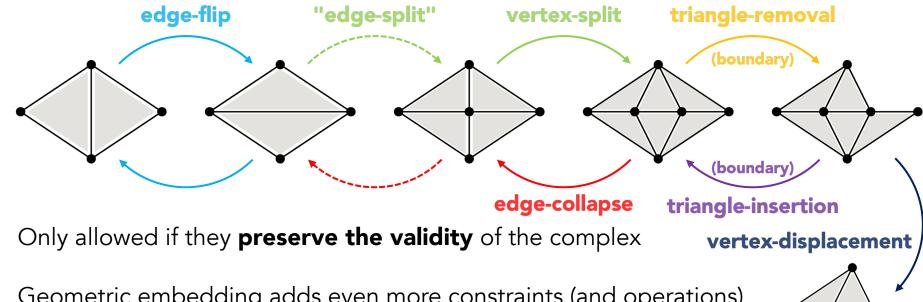


- Only allowed if they **preserve the validity** of the complex
- Geometric embedding adds even more constraints (and operations)
  - Check for intersections (and degeneracy) for all operations





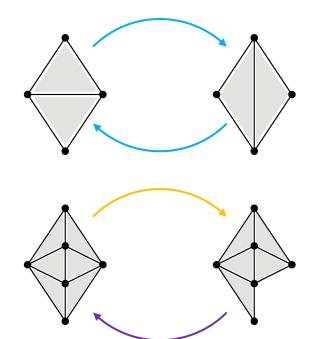
- Check for intersections (and degeneracy) for all operations



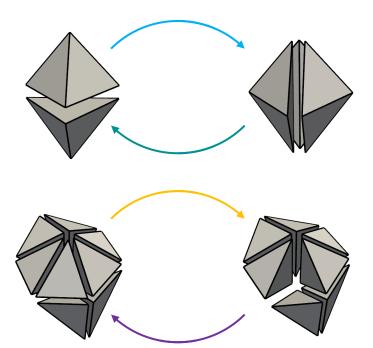
- Geometric embedding adds even more constraints (and operations)
  - Check for intersections (and degeneracy) for all operations
  - Update embedding for vertex-inserting/removing operations

• Optimization problem: given V and  $\mathbf{p}$ , and an initial (valid) simplicial complex K

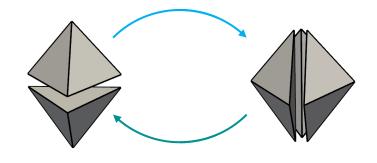
- Optimization problem: given V and  $\mathbf{p}$ , and an initial (valid) simplicial complex K
  - Maximize an objective function with only vertex-preserving edit operations



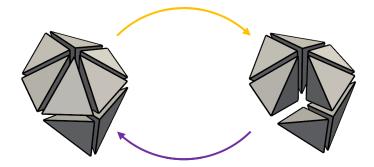
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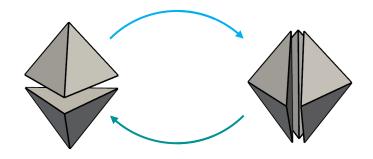
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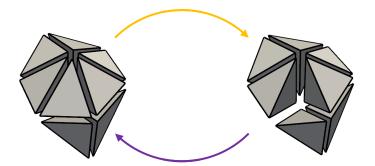


- Geometric constraints are imposed by **p**
- Govern the feasibility of edit operations



- Optimization problem: given V and  ${f p}$ , and an initial (valid) simplicial complex K
  - Maximize an objective function with only vertex-preserving edit operations



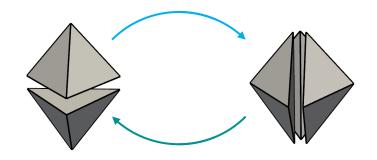


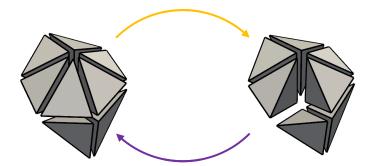
- Geometric constraints are imposed by p
- Govern the feasibility of edit operations

#### Restricted "walkable" space

- Discrete SC space: combinatorial graph
- Valid edit operations define edges
- Pruned by geometric constraints!

- Optimization problem: given V and  ${f p}$ , and an initial (valid) simplicial complex K
  - Maximize an objective function with only vertex-preserving edit operations



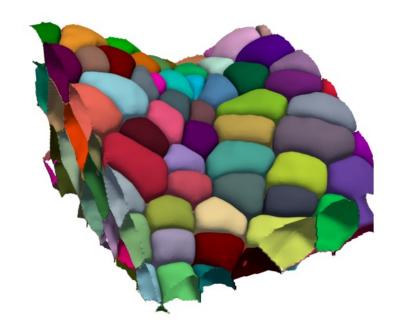


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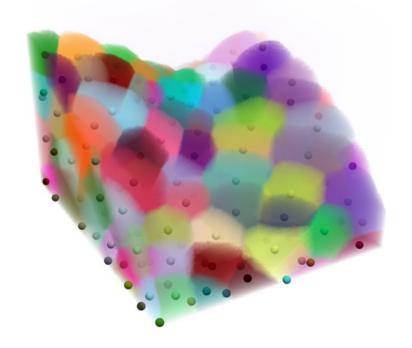
#### Restricted "walkable" space

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Limits the accessibility of the optimal SC?

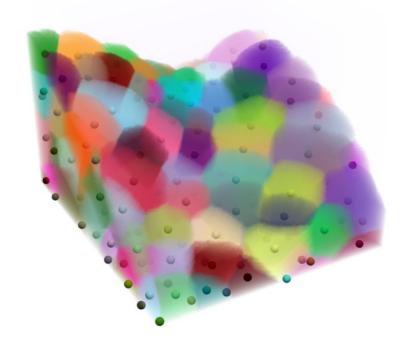


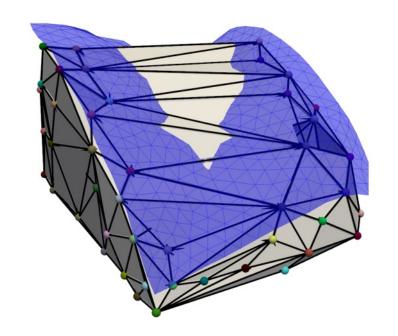
Compute the Delaunay tetrahedralization of cell centers



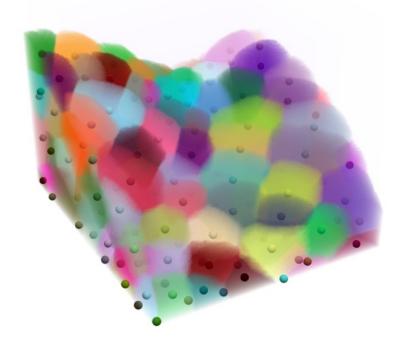


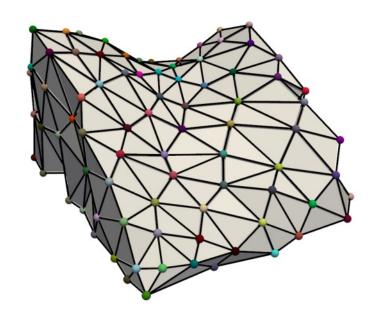
Compute the Delaunay tetrahedralization of cell centers + removal w/r tissue surface





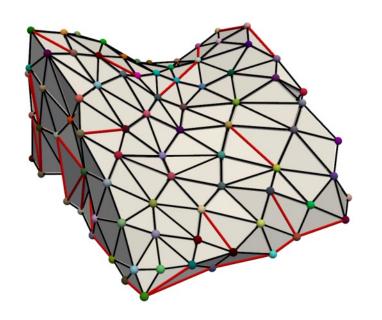
Compute the Delaunay tetrahedralization of cell centers + removal w/r tissue surface





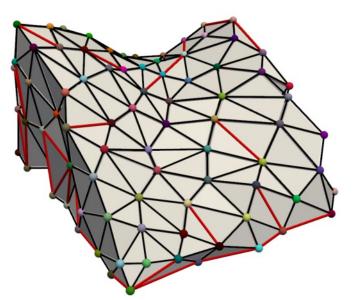
- Compute the Delaunay tetrahedralization of cell centers + removal w/r tissue surface
- Objective function: maximize overlap with image adjacencies + tetrahedron quality





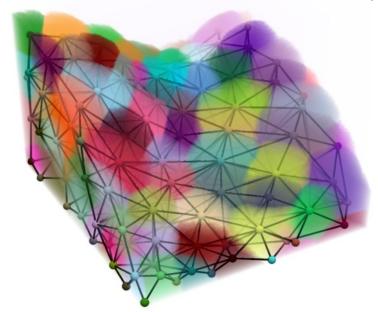
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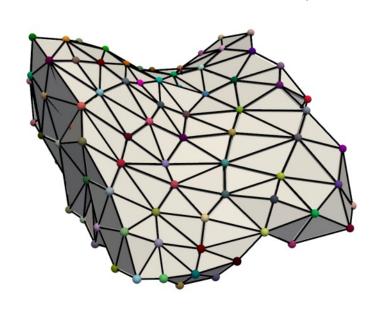




Optimization: perform edit operations in a simulated-annealing iterative process

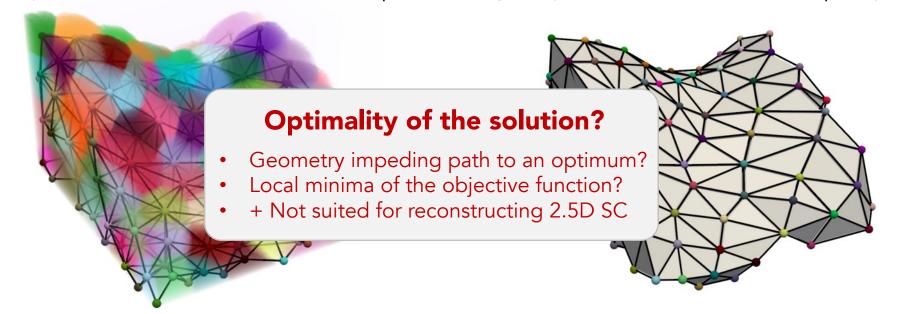
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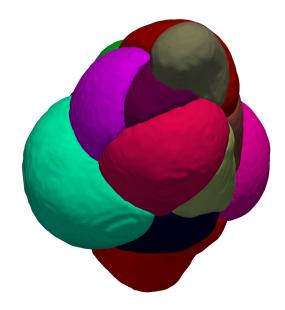


Optimization: perform edit operations in a simulated-annealing iterative process

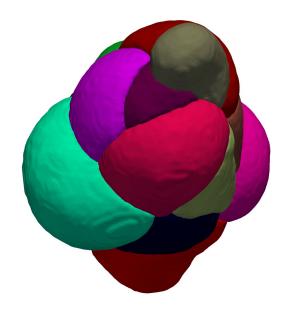
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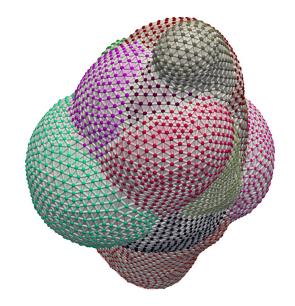


• Optimization: perform edit operations in a simulated-annealing iterative process

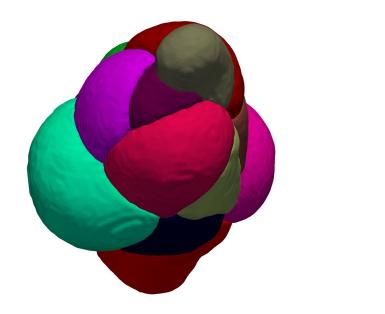


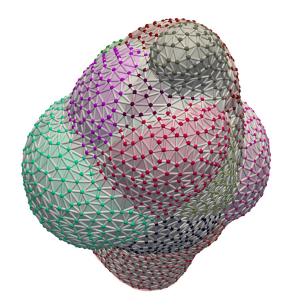
Mesh the image domain & project cell labels on vertices



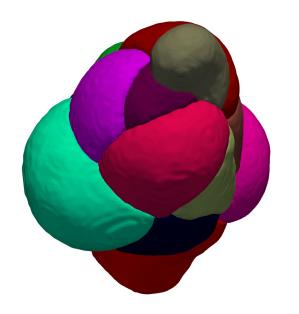


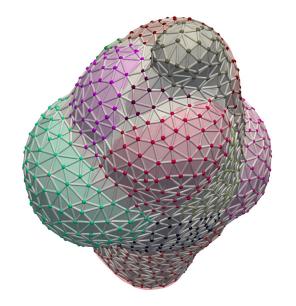
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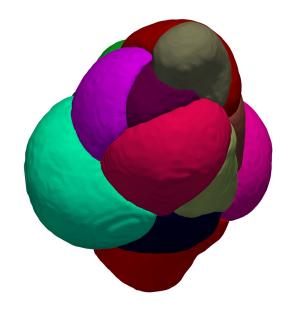


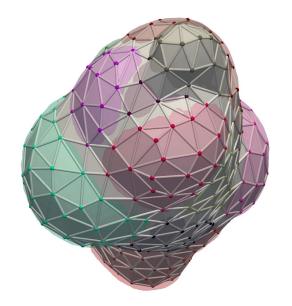
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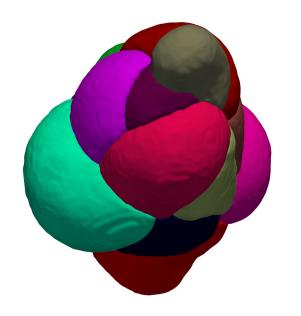


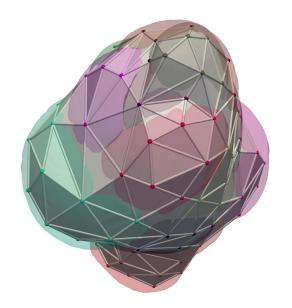
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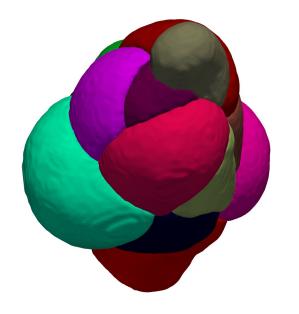


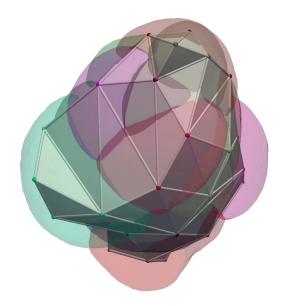
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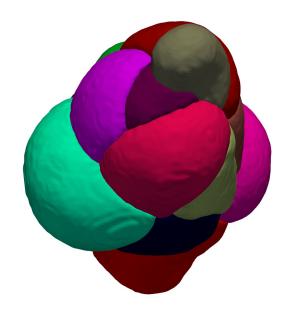


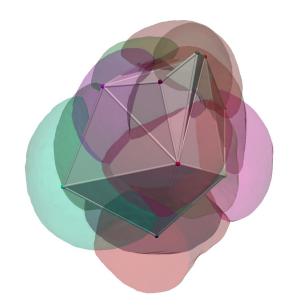
Mesh the image domain & project cell labels on vertices





Mesh the image domain & project cell labels on vertices

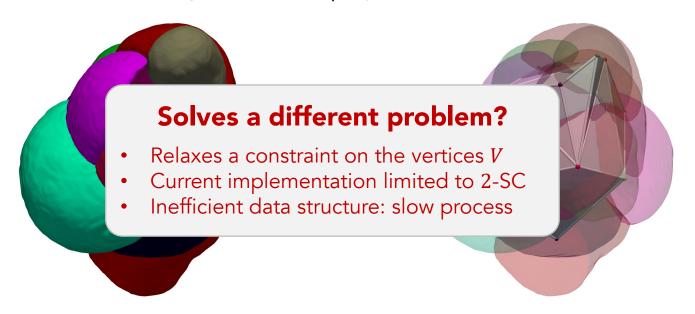




Apply edge-collapses on 1-simplices including identically labelled vertices

(Use as initial SC to iteratively optimize the previous objective function)

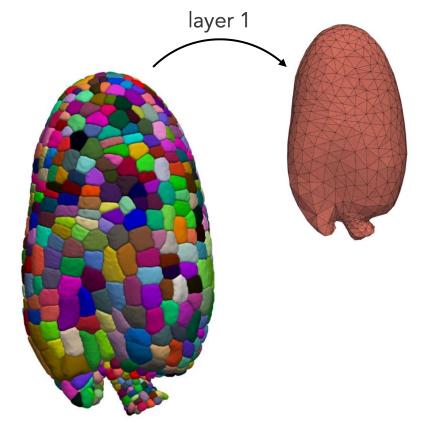
Mesh the image domain & project cell labels on vertices

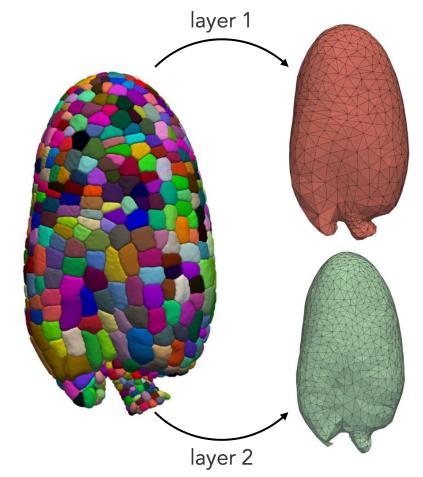


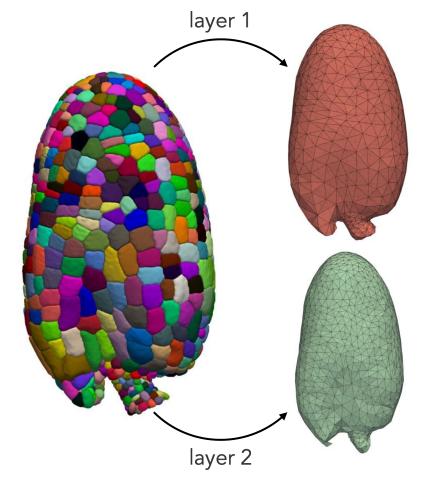
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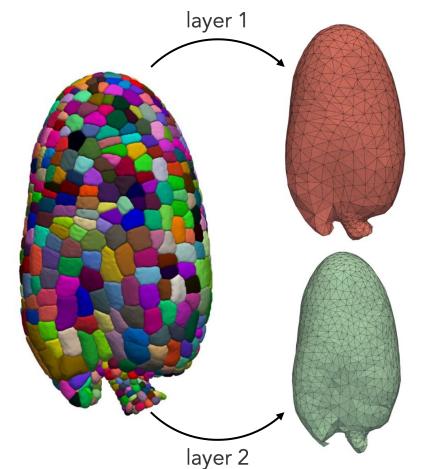




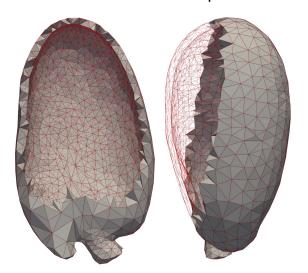




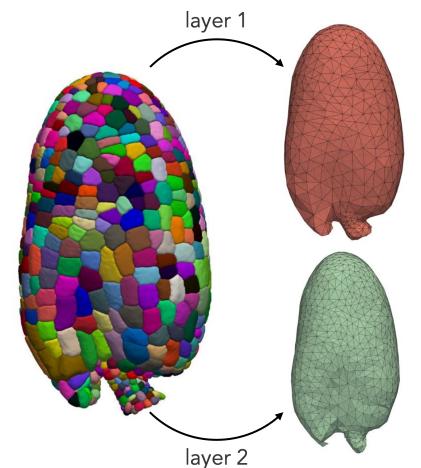
Given 2 "concentric" 2-simplicial complexes



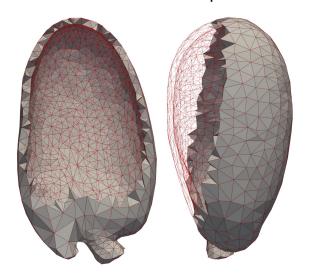
Given 2 "concentric" 2-simplicial complexes



Reconstruct a 3-SC including all 2-simplices



Given 2 "concentric" 2-simplicial complexes

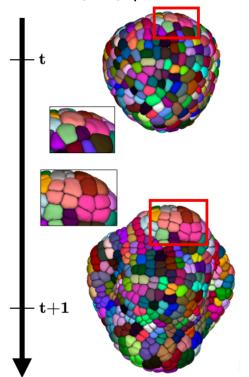


Reconstruct a 3-SC including all 2-simplices Match image adjacencies and ensure quality

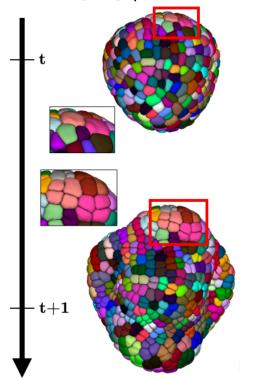
E. Gascon: Ph.D. Work (Mosaic/RDP)

# **Beyond reconstruction:**

Lineaging problem: find a mapping function between cells at consecutive times

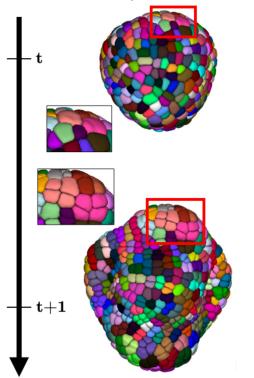


Lineaging problem: find a mapping function between cells at consecutive times



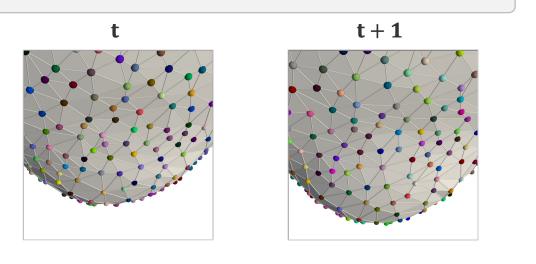
Rely (mostly) on geometry through image registration

Lineaging problem: find a mapping function between cells at consecutive times

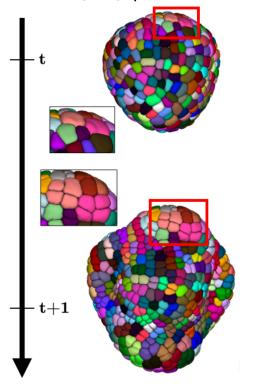


Rely (mostly) on geometry through image registration

#### Reformulated as a SC edition problem?

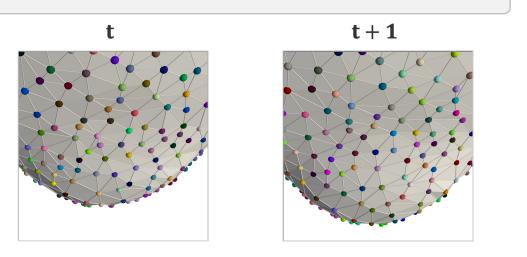


Lineaging problem: find a mapping function between cells at consecutive times



Rely (mostly) on geometry through image registration

#### Reformulated as a SC edition problem?

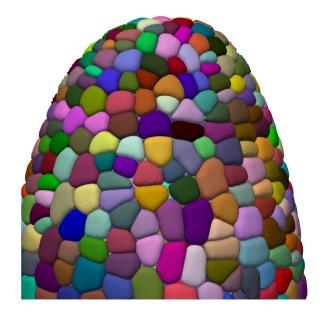


• Min. cost path of SC edit operations: mapping  $V_{\mathsf{t+1}}$  to  $V_{\mathsf{t}}$ 

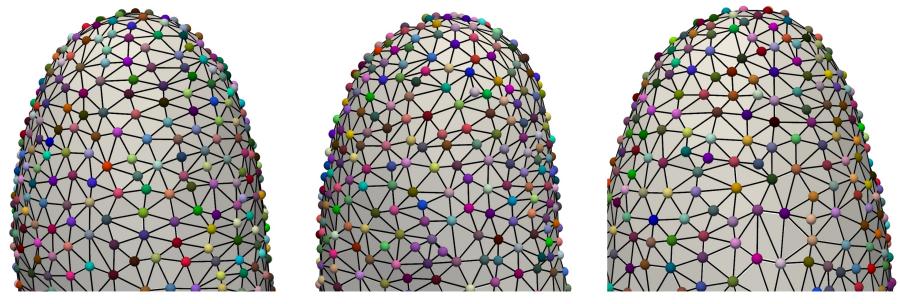
Different acquisitions (individuals) of the same biological tissue





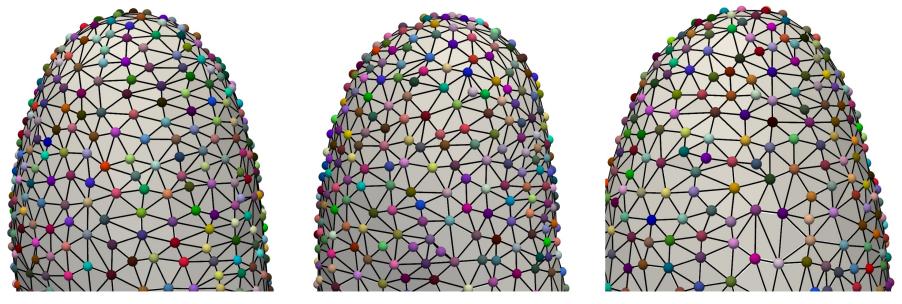


Different acquisitions (individuals) of the same biological tissue



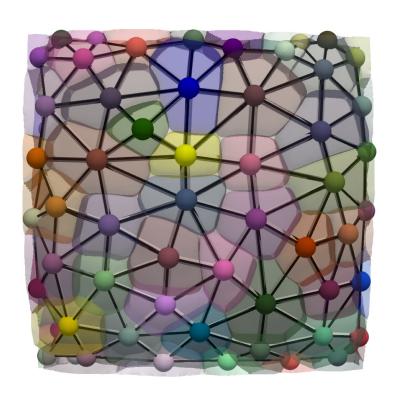
Could we compute the pairwise edit paths between their simplicial complexes?

Different acquisitions (individuals) of the same biological tissue



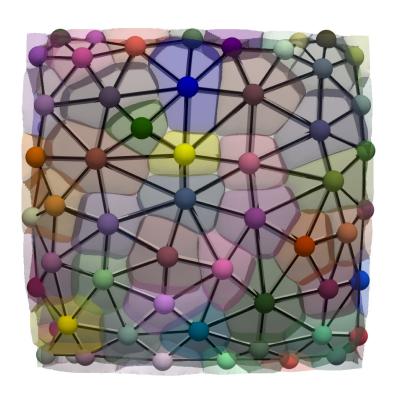
Could we compute the pairwise edit paths between their simplicial complexes?

Use mappings and edit costs to quantify local variability of cellular organization



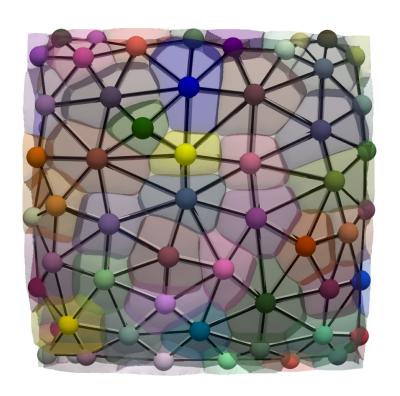


Versatile representations of multicellular tissues, suited for many applications



Versatile representations of multicellular tissues, suited for many applications

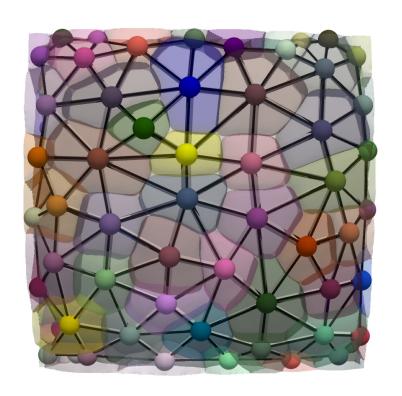
Higher order combinatorial space ...with an extra layer of geometric constraints



Versatile representations of multicellular tissues, suited for many applications

Higher order combinatorial space ...with an extra layer of geometric constraints

Lack of (expertise on) efficient algorithmic tools to build & compare



Versatile representations of multicellular tissues, suited for many applications

Higher order combinatorial space ...with an extra layer of geometric constraints

Lack of (expertise on) efficient algorithmic tools to build & compare

Open exciting challenges on both biological and combinatorial sides





# Thank you for your attention!









