# Quality Meshing of a Forest of Branching Structures

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joint work with

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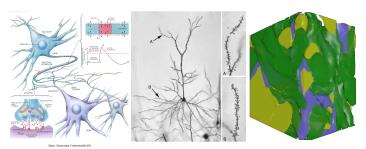
### **Outline**

- Motivation and Problem Statement
- Prior Work and Background
- 3 Approach
- Initial Results

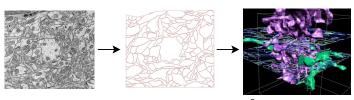
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# Motivation: Neuronal Modeling



Neurons in vivo are packed very densely and have many small geometric features known to affect voltage decay.

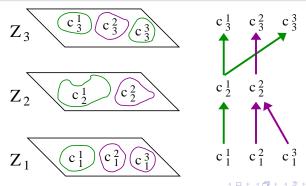


Neuron length  $\sim$  100  $\mu$ m; Neuropil dataset  $\sim$  2  $(\mu$ m) $^3$ ; in-plane resolution  $\sim$  5-10 nm

#### Formal Problem Statement

#### Input (for a *K* component forest):

- M horizontal planes  $Z_1, ..., Z_M$ .  $(Z_m$  given by  $z = z_m$ )
- ② K functions  $g_m^1, \ldots, g_m^K : \mathbb{R}^2 \to \mathbb{R}$  such that  $\bigcup_{k=1}^K \{g_m^k = 0\}$  is a 1-manifold.
- 3 Contours  $\{c_m^k\}$  of the set  $\{g_m^k=0\}$ .
- 4 An acyclic directed graph G with vertices  $\{c_m^k\}$ , indicating connectivity.



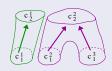
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### Output K functions $h_1, \ldots, h_K : \mathbb{R}^3 \to \mathbb{R}$ such that:

- **1** Each  $h_k$  restricts to  $g_m^k$  on  $Z_m$ , i.e.  $h_k(x, y, z_m) \equiv g_m^k(x, y)$ .
- **2** Each surface  $h_k(x, y, z) = 0$  is a compact, connected, smooth 2-manifold with local connectivity corresponding to the graph G.
- The K component surface  $\prod_{k=1}^{K} h_k(x, y, z) = 0$  is a 2-manifold, i.e. the component surfaces do not intersect.



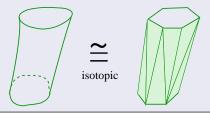
# Simplifying Assumptions

### Assumptions for Reduction to Meshing:

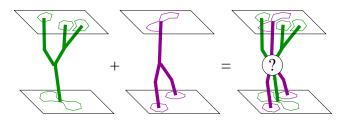
Ontours are simple polygons and can be refined if necessary.



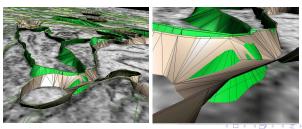
A mesh of the polygonal contours satisfying the output properties is isotopic to a smooth solution.



# The Multi-Component Difficulty



Independent solutions to the reconstruction problem for each component may produce topological or geometrical inaccuracies when aggregated.



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# Selected Prior Work on Single Component Problem

FUCHS, KEDEM AND USELTON Optimal surface reconstruction from planar contours Communications of the ACM 20:10, 1977.

Seminal work in reconstruction from polygonal contours.

MEYERS, SKINNER AND SLOAN Surfaces from contours ACM Transactions on Graphics 11:3, 1992.

Identified subproblems of correspondence, tiling, and branching.

BAREQUET AND SHARIR *Piecewise-linear interpolation between polygonal slices* Symposium on Computational Geometry 1994.

Developed an algorithm for CT, MRI, and other medical applications.

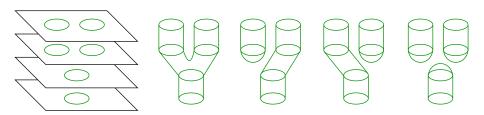
BAJAJ, COYLE AND LIN *Arbitrary topology shape reconstruction from planar cross sections* Graphic Models and Image Processing 58:6, 1996.

- Expanded this algorithm by providing topological guarantees on the output.
- We use this method for our approach.



### The Correspondence Problem

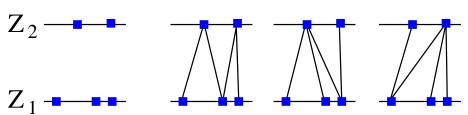
How should contours on adjacent slices connect?



Remark: This is resolved by the connectivity graph G in our case.

## The Tiling Problem

How should corresponding contours be tiled?



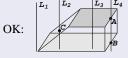
Definition: A **slice chord** is an edge connecting vertices on adjacent slices. A **tiling triangle** is formed by two slice chords and a contour edge.

What are the criteria of a "good" tiling?

## The Tiling Problem

### Desired Tiling Criteria

- 1 The reconstructed surface forms a piecewise closed surface of polyhedra.
- Any vertical line segment between two adjacent slices intersecting the reconstructed surface does so at exactly one point or along exactly one line segment.



not OK:



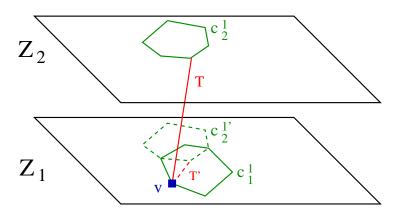


Resampling of the reconstructed surface on any slice reproduces the original contours.

Remark: The last criterion implies that aside from contour refinement, any edges or vertices added to the mesh must lie outside the  $Z_i$  planes.

### The Tiling Problem Resolved

- Let v be a vertex in contour  $c_1^1 \subset Z_1$  corresponding to  $c_2^1 \subset Z_2$ .
- Let T be a slice chord from v to  $c_2^1$ .
- Let the "prime" notation denote vertical projection to  $Z_1$ .

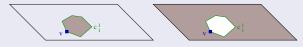


## The Tiling Problem Resolved

### Theorem [Bajaj, Coyle, Lin 1996]:

If a tiling satisfies the three criteria, the following hold:

i) T' lies in exactly one of these regions:



ii) If  $v \notin {c_2^1}'$  then T' lies in exactly one of these regions:



iii) If  $v \in c_2^{1'}$  then T' lies in exactly one of these regions:



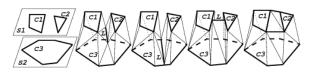
# The Tiling Problem Resolved

### Tiling Algorithm [Bajaj, Coyle, Lin 1996]:

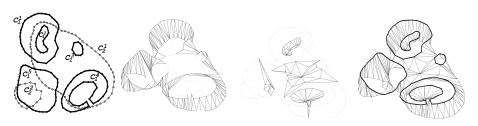
- For each vertex  $v \in \{c_1^j\}$ , make a list of all the slice chords that could be formed to a vertex of  $\{c_2^k\}$  (based on the resolution of the correspondence problem).
- Select the shortest length chord from this list which satisfies the results of the Theorem.
- If no chord from the list satisfies the theorem, tag the vertex as "untiled."
- Collect boundaries of untiled regions for subsequent meshing when resolving the branching problem.

# The Branching Problem

How should tiling be done when a contour in  $Z_1$  corresponds to more than one contour in  $Z_2$ ?

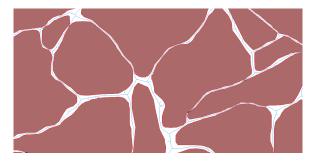


To ensure the criteria are sastisfied, we add vertices to a plane half way between  $Z_1$  and  $Z_2$  and then mesh.



#### The Medial Axis

For our approach, we will use the medial axis of the region exterior to the contours on each slice.

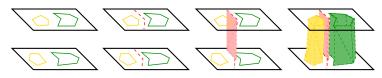


Definition: The *medial axis*  $\mathfrak{M}$  of an open set  $O \subset \mathbb{R}^n$  is the set of points  $x \in O$  for which there are at least two closest points to x on the complement  $O^c$ .

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**Idea:** Compute the medial axis on each slice, scaffold it to a three dimensional partitioning, and use this to detect and remove intersections between components.



MULTISURFRECON $\left(\left\{Z_{i}\right\},\left\{c_{i}^{j}\right\},\left\{P_{i}\right\},G\right)$ 

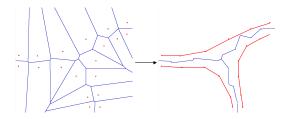
 $(P_i = \text{vertices of the contours } c_i^j)$ 

- Construct and partition medial axes on each slice.
- Construct a medial surface.
- Create single component surfaces.
- Remove overlaps on intermediate planes.
- Improve mesh quality.

For subsequent explanation, suppose G has only two components, yellow and green, so that each  $c_i^j$  is either a yellow contour (YC) or green contour (GC).



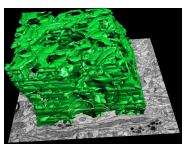
- Construct and partition medial axes on each slice.
- Compute the Voronoi diagram Vor P<sub>i</sub> of the sample points P<sub>i</sub> of the contours on slice i.
- Discard all Voronoi edges intersecting the contours.
- Discard all remaining vertices and edges interior to the contours.
- ullet The remaining vertices and edges approximate the medial axis  ${\mathfrak M}$  of extracellular space.
- Let E<sub>GY</sub> = {edges of M defined by a point of YC and a point of GC}

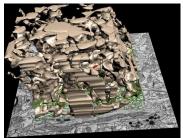


Construct a medial surface.

Dilate the edges in  $E_{\rm GY}$  so that they form contours and color these contours red. Create a partial, approximate medial surface  $\mathfrak{M}S$  by running the SINGLESURFRECON code on  $E_{\rm GY}$ .

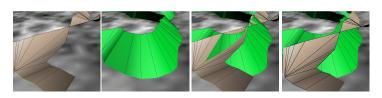
Oreate single component surfaces.



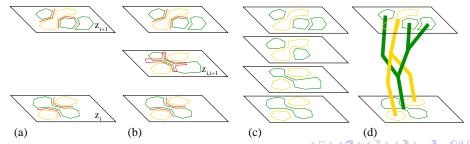


Remove overlaps on intermediate planes.

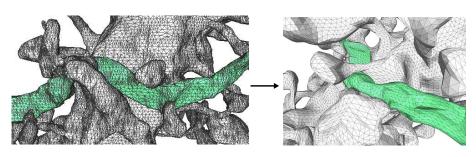
Simple overlap:



#### Exotic overlap:



Improve mesh quality.



- Decimation: QSlim software by Michael Garland.
- Shape Improvement: Geometric Flow library from LBIE Mesher, part of Volume Rover software by CVC lab.

#### Correctness Results

#### Lemma 1:

Suppose that for each i, there are no pairwise overlaps between the original contours on plane  $Z_i$ . Then the output of SINGLESURFRECON run on any subset of the original contours is not self-intersecting.

Proof: This is a consequence of the three tiling criteria; if the original contours do not overlap, SINGLESURFRECON cannot create self-intersections.

#### Lemma 2:

If there are no overlaps of any of the intermediate planes where branching occurs, then the output of MULTISURFRECON has no self-intersections in the entire volume. Conversely, if the output has no self-intersections in the volume, it does not have any overlap on any intermediate plane.

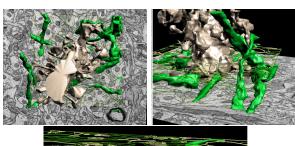
Proof: ⇒: The output is a linear interpolation between consecutive planes. If the contours do not overlap, their interpolation does not intersect.

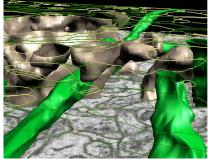
 $\Leftarrow: \text{If the output is not self-intersecting, the components cannot intersect on any plane}.$ 

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### **Initial Results**





### Acknowledgements



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