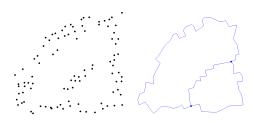
# Homologically Persistent Skeleton for a 2D cloud of features

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# **Motivation:** fast and robust recognizing visual markers



- simple pictures like hieroglyphs are easily readable by humans;
- machines should correctly reconstruct skeletons from noisy scans.

## Skeletonization problem:

Given only a cloud *C* of points, find a graph representing the topology of *C* across all scales.

**All past methods** use extra input parameters: a scale, noise bound.

**New solution:** Homologically Persistent Skeleton HoPeS(*C*)

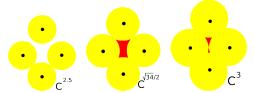
- extends a Min Spanning Tree;
- depends only on the cloud *C*;
- has *min length* among all graphs that span *C* at any scale and also have most persistent 1D cycles;

• has derived subgraphs with the correct topological type of a graph  $G \subset \mathbb{R}^2$  given only by a sample *C*;

• is *globally stable* under perturbations of *C*, remains in an offset  $C^{\alpha}$ within a distance  $\alpha$  from  $C \subset \mathbb{R}^2$ .

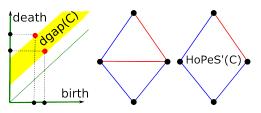
# **Def:** HoPeS(*C*) of a cloud *C*

When the scale  $\alpha$  is increasing, the offset  $C^{\alpha}$  is growing, cycles in  $C^{\alpha}$  are born and die (become filled).

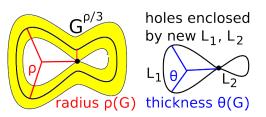


The pairs (birth, death) form the 1D *persistence diagram*  $PD\{C^{\alpha}\}$ .

**Earlier applications** of persistence: counting holes in clouds [2], auto-completing closed contours [3].



**HoPeS**(*C*) is a Min Spanning Tree of *C* plus all red edges giving birth to new cycles in  $C^{\alpha}$  across all  $\alpha$ .



If cycle  $L \subset G$  encloses a hole, its *radius*  $\rho$  is min  $\alpha$  when  $L^{\alpha}$  is contractible. The *thickness*  $\theta(G)$  is max radius of all newborn cycles in  $G^{\alpha}$ .

### **Reconstruction guarantees**

An  $\varepsilon$ -sample C of a graph  $G \subset \mathbb{R}^2$ is a cloud  $C \subset G^{\varepsilon}$  with  $C^{\varepsilon} \supset G$ .

**Th** (VK). Let *C* be an  $\varepsilon$ -sample of a graph  $G \subset \mathbb{R}^2$  with  $\theta(G) \ge 0$  and radii  $\rho_1 \le \ldots \le \rho_m$ . If  $\rho_1 > 7\varepsilon + \theta(G) + \max_{i=1,\ldots,m-1} \{\rho_{i+1} - \rho_i\}$ , then

HoPeS'(*C*) ~ *G* is 2 $\varepsilon$ -close to *G*.

[4]: extension to a metric space.

#### **Summary and References**

**input**: a noisy point cloud  $C \subset \mathbb{R}^2$ 

**output**: full skeleton HoPeS(*C*) with all derived subgraphs;

**running time**:  $O(n \log n)$  for any *n* points with real 2D coordinates;

more details: C++ code, papers,
examples at http://kurlin.org.

[1] H. Edelsbrunner and J. Harer. *Computational topology*. AMS'10.

[2] V. Kurlin. A fast and robust algorithm to count persistent holes in noisy 2D clouds. *CVPR* 2014.

[3] V. Kurlin. Auto-completion of contours in sketches, maps and sparse 2D images. *CTIC 2014*.

[4] V. Kurlin. Homologically Persistent Skeleton of a point cloud in any metric space. *Computer Graphics Forum*, v. 34-5 (2015), 253-262.

1) cloud *C* of Canny edge points. 2)  $PD{C^{\alpha}}$ . 3) HoPeS<sub>1,1</sub>(*C*) for 1st widest gap. 4) HoPeS<sub>2,1</sub>(*C*) for 2nd widest gap.

