

# Graphics Seminar Series 2021

A presentation on paper title :

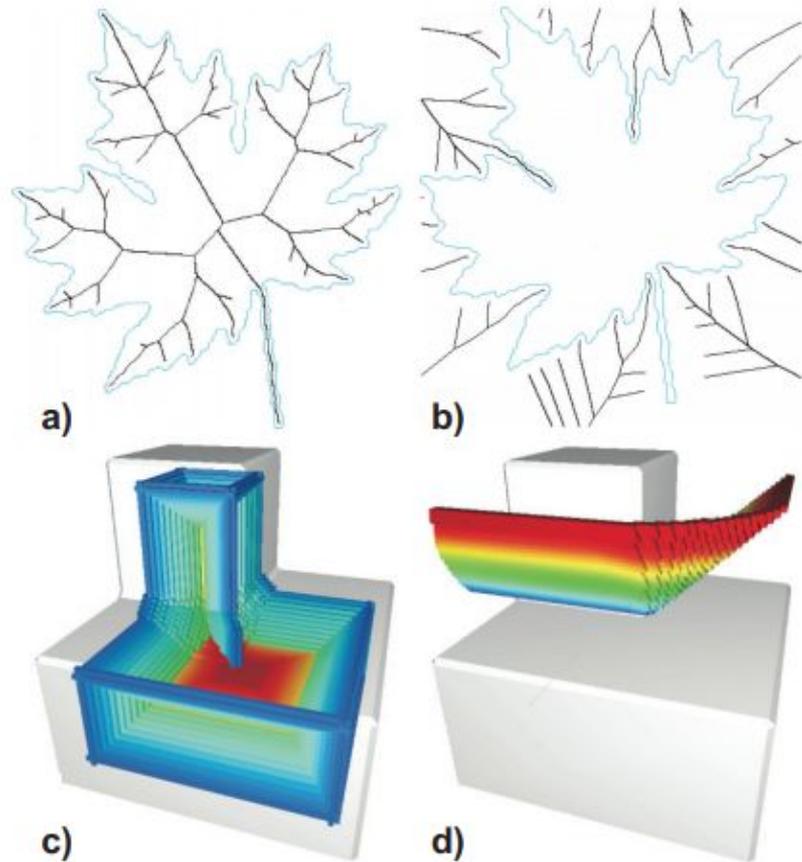
## 3D Skeletons: A State-of-the-Art Report

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## Skeleton :

- Skeleton is a thin centered structure which jointly describes the topology and the geometry of the shape. Skeletons provide an alternative to classical boundary or volumetric representations.
- Object, or shape is a compact spatial subset  $O \subset \mathbb{R}^n$  with a 2-manifold boundary  $S = \partial O$ , with a focus on three-dimensional shapes ( $n = 3$ ). In  $\mathbb{R}^2$ , we refer to  $S$  as the shape's contour; the medial skeleton of  $O$  is called the medial axis or 2D skeleton. In  $\mathbb{R}^3$ ,  $S$  will be referred to as the surface of  $O$ ; the corresponding medial skeleton of  $O$  is called the medial surface or surface skeleton.
- Skeletons have known many definitions. These definitions are, usually, equivalent, i.e., they imply a unique 'formal' skeleton for a given shape  $O$ .

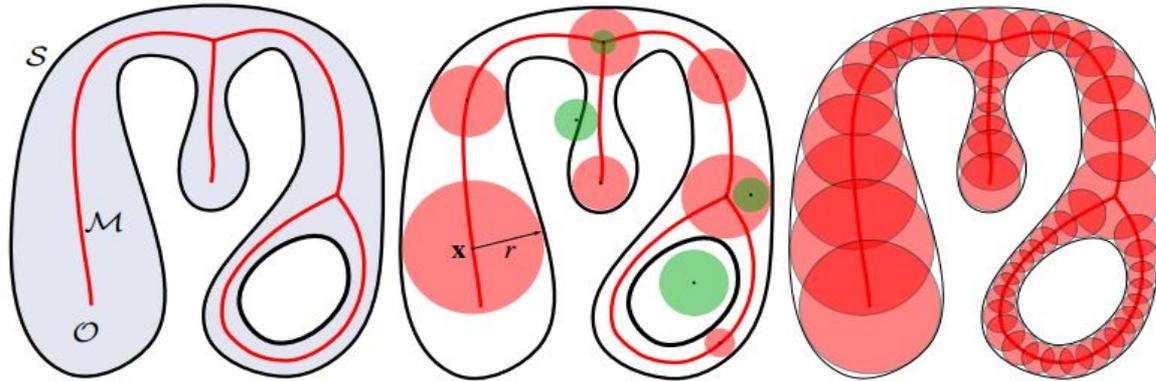


**Figure 1:** Skeletons (a,c) and their complements (b,d) for 2D shapes (a,b) and 3D shapes (c,d).

## Medial Skeleton :

The medial skeleton of a shape knows several equivalent definitions.

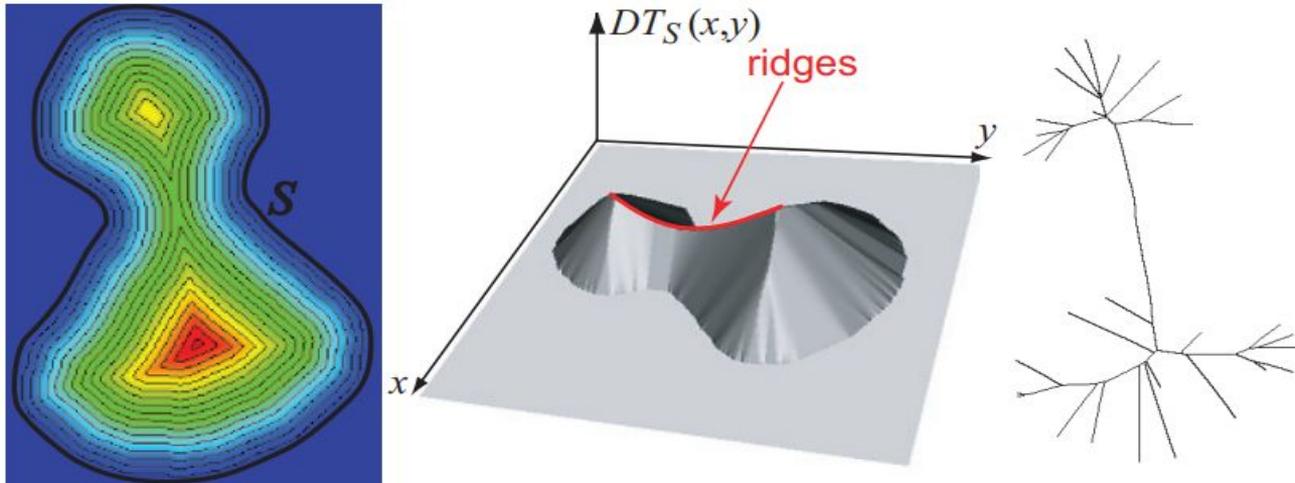
- 1. Maximally Inscribed Ball :** The Medial Axis Transform  $MAT(O)$  of  $O$  is the set of centers  $M$  and corresponding radius  $R$  of all maximal inscribed balls in  $O$ .



**Figure 2:** (a) The MAT skeleton  $M$  of the shape  $O$  with contour  $S$ . (b) Examples of maximally inscribed balls (red), a medial atom  $(x,r)$ , and balls which are neither maximal nor inscribed, thus not contributing to  $M$  (green). (c) Approximate reconstruction of  $O$  by the union of balls  $B(x,r)$  given by a sparse sampling of  $M$ .

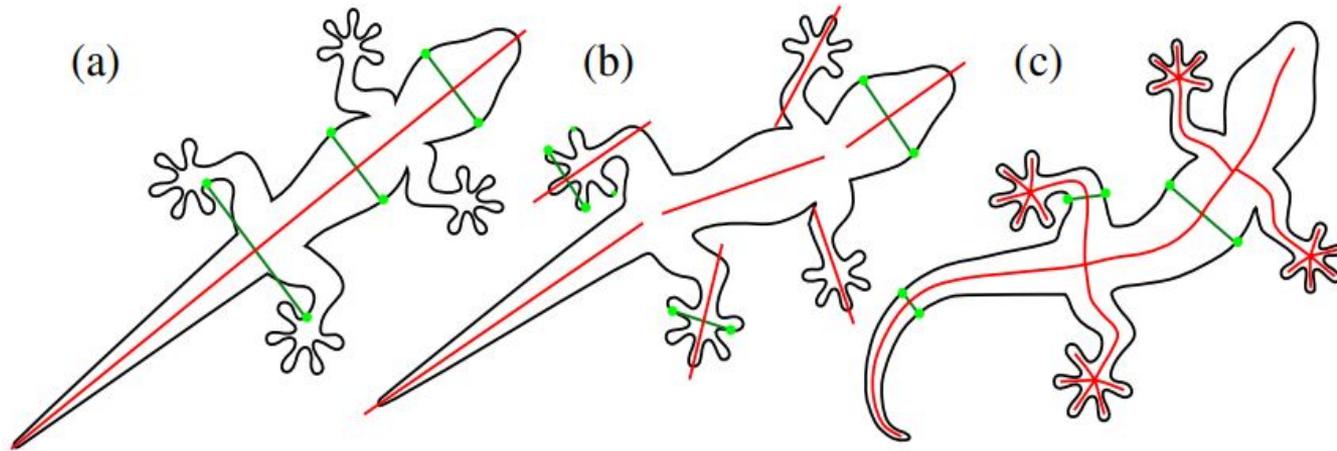
**2. Grassfire Analogy :** The Medial Axis Transform of  $O$  with boundary  $S$  is given by the shock graph of the motion  $S'(t) = -n(t)$  and the time  $t$  when a shock is formed.

**3. Maxwell Set :** The Medial Axis Transform associates to a shape  $O$  the set of locations  $M \in O$  with more than one corresponding closest point on the boundary  $S$  of  $O$  and their respective distances  $R$  to  $S$ .



**Figure 3:** (a) 2D shape boundary  $S$  with its distance transform shown by color-coding and level sets. (b) Ridges of the distance transform plot. (c) Corresponding shape skeleton.

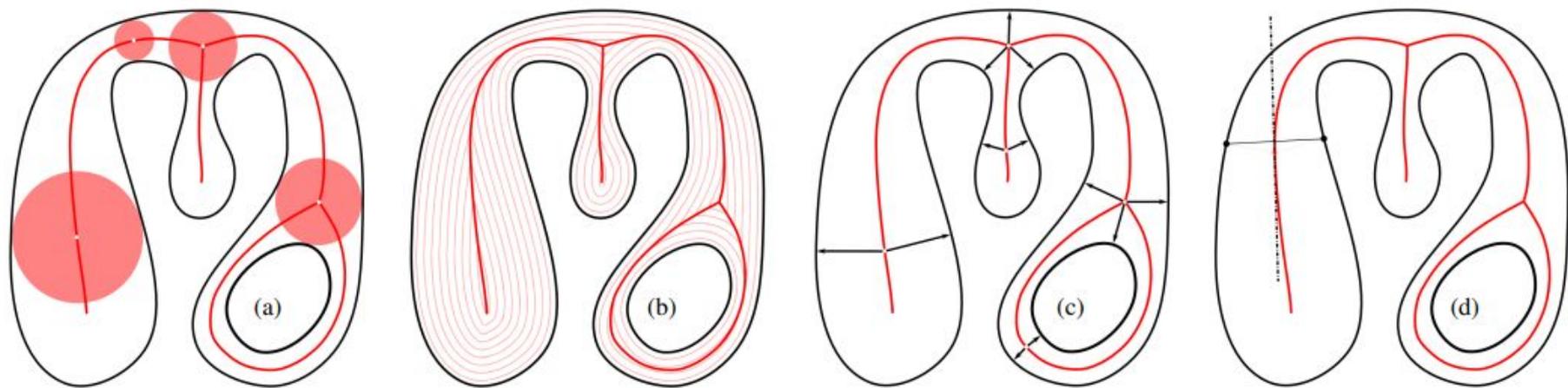
**4. Symmetry Set :** The Medial Axis Transform associates to  $O$  the set of centers  $M$  and radii  $R$  of all inscribed balls in  $O$  which are bi-tangent to its boundary  $S$ .



**Figure 4:** Three planar shapes  $O_a$ ,  $O_b$  and  $O_c$  and their (a) global, (b) piecewise, and (c) local symmetry axes. Planar symmetry relations (green lines) between a few point-pairs (green dots) are highlighted. The medial axis encodes local reflectional symmetry.

## Four alternative definitions of medial skeletons :

- (a) Centers of maximally-inscribed balls
- (b) Shock graph of the grassfire surface flow
- (c) As points with more than one corresponding images on the surface
- (d) Local axis of reflectional symmetry.



**Figure 5:** Four alternative definitions of medial skeletons: (a) centers of maximally-inscribed balls; (b) shock graph of the grassfire surface flow; (c) as points with more than one corresponding images on the surface; (d) local axis of reflectional symmetry.

**Skeleton Properties** : MAT can be seen as a dual representation which captures all shape aspects that a volumetric or boundary representation captures.

1. Topology Encoding
2. Skeletal Structure
3. Surface-Skeleton Correspondence
4. Semi-Continuity and instability

## Properties of Skeletonization Method :

- 1. Invariance** : Skeleton definition depends only on the shape  $O$ , and not on its position and/or size in the embedding space, skeletons should be invariant under isometric transforms  $T$  of the  $O$ , i.e.,  $\text{MAT}(T(O)) = T(\text{MAT}(O))$ .
- 2. Thinness** : Practical skeletons should be as thin as allowed by the space sampling used to model them. Mesh-based skeletons achieve the desired zero thickness by construction.
- 3. Centeredness** : Each skeleton point should be at equal distance from at least two different points of the shape surface  $S$ . Voxel-based skeletons cannot always be perfectly centered, even for simple shapes. In contrast, mesh based surface skeletons can be computed with arbitrarily accurate centeredness.

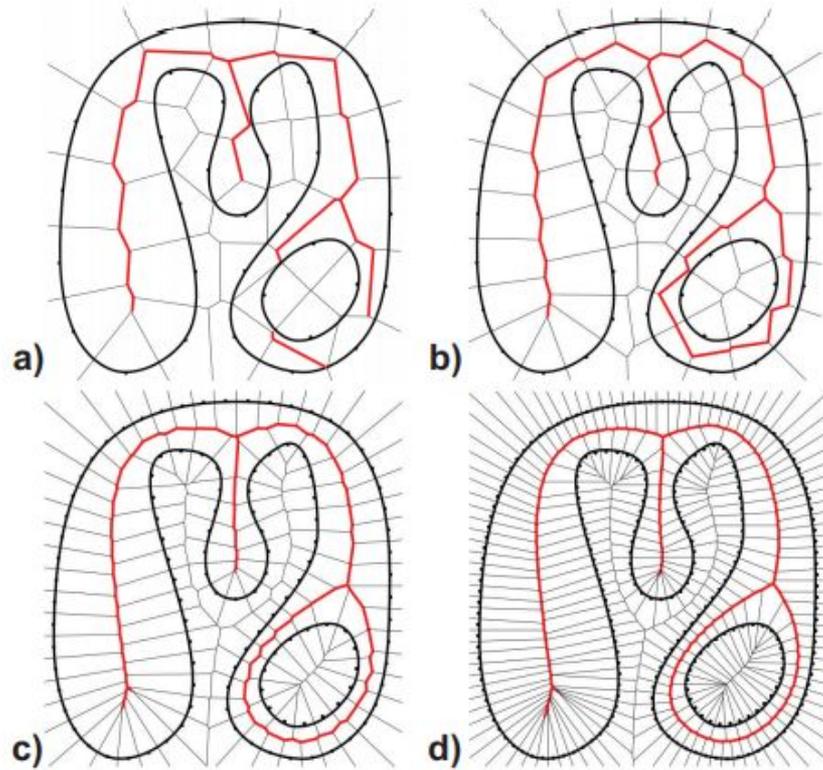
**4. Details Resolution** : Skeletons should effectively and accurately capture all shape topology and geometry. This property is also known as the ability of skeletons to detect junctions or perform component-wise differentiation of the input shape parts, as well as detail preservation.

**5. Regularization** : Regularization can be seen as a filter  $F(\cdot, \tau)$  which, when applied to  $MAT(O)$ , yields a skeleton  $F(MAT(O))$  that is Cauchy or Lipschitz continuous with respect to variations of  $O$  smaller than  $\tau$ .

**6. Scalability** : Skeletons have been used in many applications. 2D skeletons require a relatively limited computing power, as typical input shapes are in the order of  $1000^2$  pixels. Voronoi-based methods typically achieve a complexity of  $O(n \log n)$  for  $n$  sample points on  $S$ .

## Taxonomy of Skeleton :

1. **Surface Skeletons** : These methods aim to produce skeletons that follow the equivalent medial definitions. Such methods deliver skeletons which have a good correspondence to the input shape, and thereby a high reconstruction power.
  - a) **Analytic Surface Skeletons** : These methods represent both the input shape  $O$  and its surface skeleton analytically.
    - Voronoi Method
    - Bisector Method
    - Shrinking Ball Method
  - b) **Image Surface Skeletons** : These methods use an image model of both the input shape  $O$  and the produced surface skeleton.
    - Topological Thinning Method
    - Distance Field Method



**Figure 6:** Voronoi diagram of a boundary with increasing and uniform sampling density. Voronoi vertices and edges completely enclosed in the boundary approximate the medial axis. As density increases, the approximation improves. A minimal sampling density is needed to obtain skeletons homotopic to the input shape.

**2. Curve Skeletons :** Curve skeletons are loosely defined as 1D structures “locally centered” in a shape.

**a) Analytic Curve Skeletons :** These methods represent both the shape  $O$  and its curve skeleton analytically.

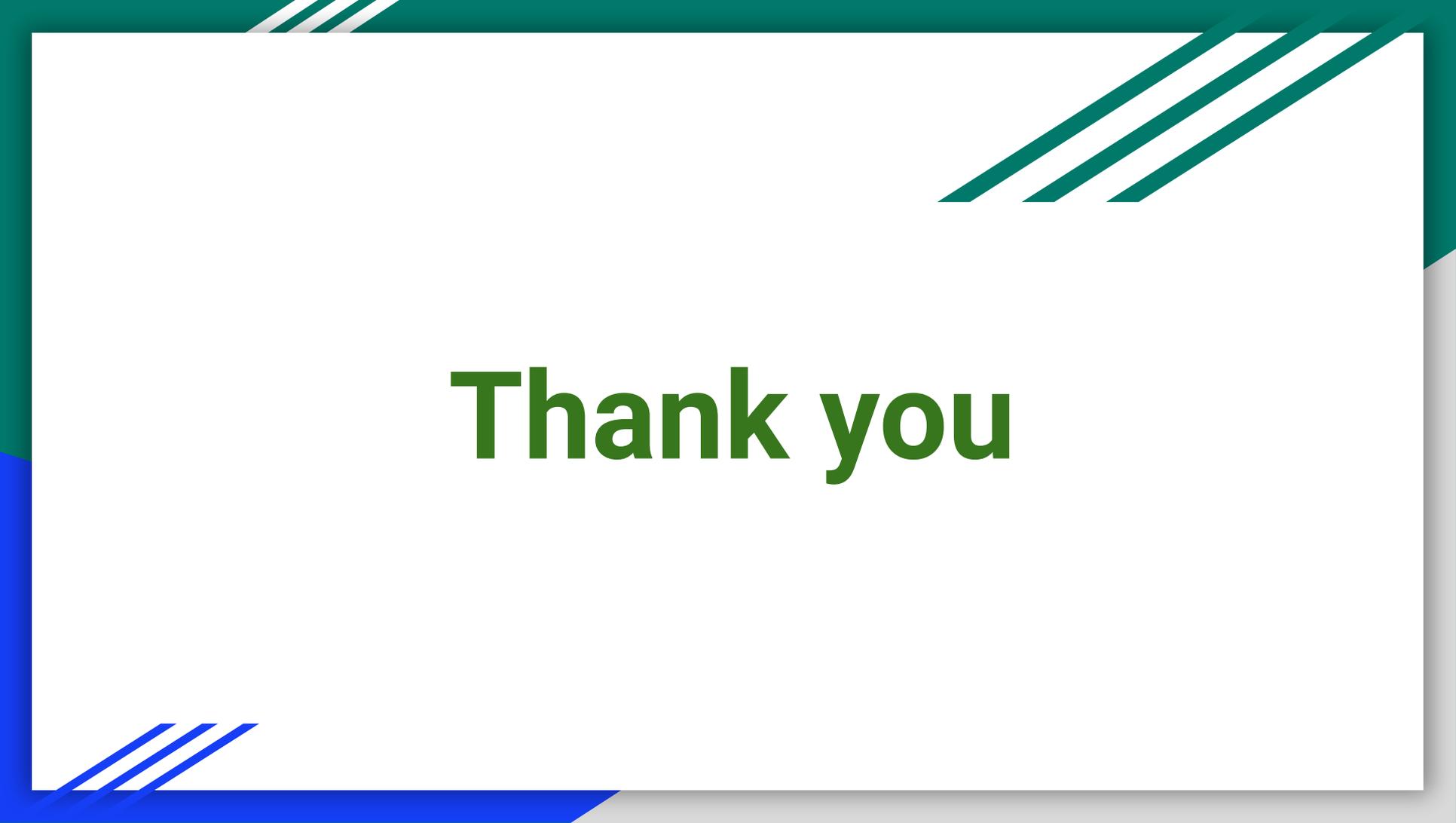
- Medial-Surface-Based Methods
- Contraction Methods

**b) Image Curve Skeletons :** Image Curve Skeleton methods use an image model for both the input shape and the produced curve skeleton.

- Topological Thinning Methods
- Distance Based Methods

## Reference :

- Tagliasacchi, Andrea, Thomas Delame, Michela Spagnuolo, Nina Amenta, and Alexandru Telea. "3d skeletons: A state-of-the-art report." In *Computer Graphics Forum*, vol. 35, no. 2, pp. 573-597. 2016.



**Thank you**