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Dual-primal skeleton: a thinning scheme for vertex sets lying on a surface mesh

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Abstract. We present a new algorithm for the skeletonization of shapes lying on surface meshes, which is based on a thinning scheme with a granularity that is twice as fine as that of other thinning methods, since the proposed approach uses dual-primal iterations in the region of interest to perform the skeleton extraction. This dual operator is built on specific construction rules, and it is applied until idempotency, which provides a better geometric positioning of the skeleton compared to other thinning methods. Moreover, the skeleton has the property of ensuring the same topological guarantees as other homotopic thinning approaches: the skeleton is thin, connected and can include Y-branches and cycles if the input region contains holes.

Keywords: skeletonization, surface mesh, homotopic thinning, shape description, topology preservation.

1 Introduction

1.1 Context, problem and related work

The skeleton is a well-known shape descriptor. It is an entity that is globally centered in a 2D or 3D object, and it characterizes its topology and its geometry. This structure is widely used in various applications (video tracking [4], shape recognition [13], surface sketching [9], etc.). Several techniques exist in order to extract the skeleton from binary 2D images [14], 3D closed volume meshes [2], or 3D cubic grids [8].

Nevertheless, very few approaches have been dedicated to the extraction of skeletons from binary information located on an arbitrary triangulated mesh (see [3,12,11] for the state of the art). Therefore, the task of computing the skeleton of the subset of a discrete surface embedded in \mathbb{R}^3 remains. Rössl *et al.* [10] have presented the first method that uses the elementary mathematical morphology *opening* operator, ported to triangulated meshes. However, the operator's definition is incomplete, and the underlying algorithm presents some issues. Therefore, several drawbacks have been pointed out, which mainly lead to unexpectedly disconnected skeletons [5]. Kudelski *et al.* have later proposed a modified algorithm that produces topologically robust skeletons by generalizing the notion of *morphological erosion* to arbitrary meshes [7,6]. This approach takes, as an input, a subset lying on a triangulated surface mesh in 3D, and as

outputs, thin lines corresponding to the skeleton obtained by homotopic thinning. The main idea is to transpose the notion of neighborhood from the classical thinning algorithms where the adjacency is constant (e.g., 26-adjacency in digital volumes, 8-adjacency in 2D grids) to the mesh domain where the neighborhood is variable due to the adjacency of each vertex.

1.2 Contribution

Our work continues the idea of homotopic thinning using a generalized adjacency described in [6]. Instead of iteratively removing nonrelevant vertices of the subset (topologically speaking, i.e., the *simple vertices*), the erosion step is replaced by a *dual-primal* operation. The area of interest is converted to the dual space, and all semi-infinite edges are removed from the structure. This process is repeated (dual to primal to dual) until idempotency. It produces a lineal skeleton with a resolution increased by a factor 2, as the resulting structure is not only composed of initial vertices and edges but also composed of dual vertices and edges. This skeletonization is more general because it can address nondevelopable surfaces (the operations are local, and there is no need to have a $[i, j]$ indexing such as in 2D grids). Moreover, the resulting skeleton preserves the topology of the original shape lying on the surface.

This paper is divided as follows: section 2 briefly develops some basic notions and definitions. Then, section 3 explains in detail our approach of dual-primal skeletonization using a specific thinning scheme on surface meshes. Section 4 is dedicated to the validation of the method, including tests on irregular meshes and an application to the extraction of feature lines.

2 Basic notions

Let \mathcal{M} be an unstructured mesh patch representing an arbitrary manifold surface \mathcal{S} , such as $\mathcal{M} = (\mathcal{V}, \mathcal{E}, \mathcal{T})$. The sets \mathcal{V} , \mathcal{E} and \mathcal{T} correspond, respectively, to the vertices, the edges, and the triangles composing \mathcal{M} , a piecewise linear approximation of \mathcal{S} . We denote p_i the vertices, with $i \in [0; n[$ and $n = |\mathcal{V}|$ being the number of vertices in \mathcal{M} . The neighborhood \mathcal{N} of a vertex p_i is defined as follows:

$$\mathcal{N}(p_i) = \{q_j \mid \exists (p_i, q_j) \in \mathcal{E}\}. \quad (1)$$

In such a case, $m_i = |\mathcal{N}(p_i)|$ represents the total number of neighbors of p_i . As we consider obtaining a skeleton of a subset of \mathcal{M} , let us now define a binary attribute F on each vertex of \mathcal{V} . The set $R \subseteq \mathcal{V}$ is then written as follows:

$$\forall p_i \in R \iff F(p_i) = 1. \quad (2)$$

The attribute F may be defined from a previous process such as manual selection, thresholding based on geometric properties (triangle area, principal curvatures, *etc.*) or any binarization process. Then, an edge $e = (p, q)$ belongs to R if and only if $p, q \in R$. Similarly, a triangle $t = (p, q, r)$ belongs to R if and only if $p, q, r \in R$.

3 Dual-primal skeletonization

Our approach is based on a robust dual-primal erosion algorithm that preserves the topology of the original mesh. In the next sections, we present an overview of our algorithm and a detailed explanation of each part of our algorithm.

3.1 Overview of the approach

The input to our algorithm can be any triangular mesh \mathcal{M} that is a set of triangular faces connected by edges and vertices as defined in section 2. As in section 2, this mesh must have the vertices marked with a function in order to define regions of interest. \mathcal{M} can contain several connected components, and it can have one or several borders. Hereafter, we will call the input mesh the *initial primal mesh (IPM)*. Our approach is straightforward; it starts by extracting the dual representation of the *IPM*. Then, it detects the faces that can be eliminated by exploring the dual mesh. Finally, it computes the intermediate primal representation of the mesh by eliminating the primal faces that are not going to affect the topology of the final skeleton. Then, we repeat the dual-primal iteration over this new primal mesh. Finally, it stops when the primal mesh in iteration N is equal to the primal mesh in iteration $N+1$. The main steps of our approach are illustrated in figure 1.

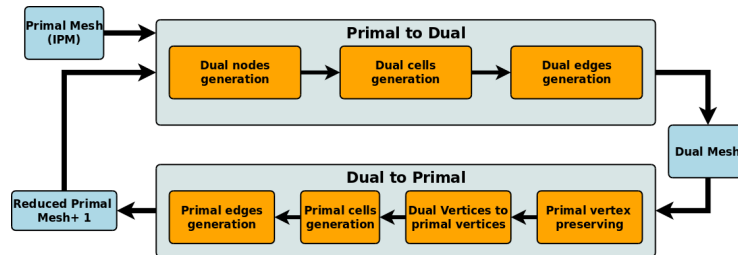


Fig. 1: General structure of the workflow of our approach. The initial mesh is provided as input. A dual representation is computed. Then, a primal mesh is obtained by eliminating those dual cells that are not totally contained in the areas of interest. The new primal mesh can contain edges representing the thin features of the input mesh. Finally, the reduced mesh is provided as input to the next iteration until idempotency.

The primal-to-dual and dual-to-primal transformations are performed by following a well-defined set of rules that guarantee that the final mesh will preserve the topology of the *IPM*.

3.2 Primal-Dual-Primal computation

In classic dual extraction algorithms, the dual mesh is extracted based on an edge adjacency relationship between cells. For each edge in the primal mesh,

a dual edge is generated. However, this narrow definition is not sufficient to obtain a 1-dimensional skeleton because it does not consider vertex adjacencies between edges and vertex adjacency between faces. Vertex adjacency is necessary to detect all connected components in the area of interest in the original mesh. Furthermore, as our algorithm applies an erosion to the input mesh, it will eventually lead to the creation of mixed meshes containing 2-dimensional (faces) and 1-dimensional (edges) cells that are uniquely connected by vertices. Our approach addresses these cases in order to keep the consistency and fidelity of the final mesh with respect to the *IPM*.

3.3 General rules for dual mesh generation

These rules follow classic definitions of dual meshes extracted from polygonal meshes.

1. Each primal cell is replaced by a dual vertex. It includes primal faces and primal edges. Initially, we always place the dual vertex in the barycenter of the primal cell as illustrated in figures 2a and 2b.
2. Each primal vertex is replaced by a dual cell. In the case of vertices surrounded by 2-dimensional cells, the dual cell is a polygon. In the case of a vertex surrounded by edges, it is replaced by a dual edge. These cases are illustrated in figures 2c and 2d.

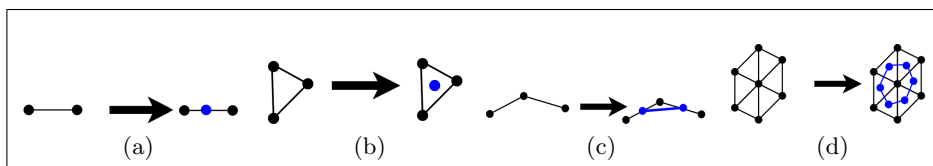


Fig. 2: Basic transformations from a primal mesh to a dual mesh. (a) Primal edge to dual vertex. (b) Primal face to dual vertex. (c) Primal vertex to dual edge. (d) Primal vertex to dual cell (a polygon).

As a consequence of the previous rules, starting from a primal mesh $\mathcal{M}_k = \{\mathcal{V}, \mathcal{E}, \mathcal{C}\}$, its dual mesh $\mathcal{D}_k = \{\mathcal{V}_d, \mathcal{E}_d, \mathcal{C}_d\}$ (in the general case) is defined by equations:

$$\mathcal{V}_d = \{v_{d_i} \mid \exists c_i \in \mathcal{C} \text{ so that } v_{d_i} \text{ is located at the barycenter of } f_i\} \quad (3)$$

$$\mathcal{E}_d = \{e_{d_i} \mid \exists e_i \in \mathcal{E}\} \quad (4)$$

$$\mathcal{C}_d = \{c_{d_i} \mid \exists v_i \in \mathcal{V}\} \quad (5)$$

These definitions apply, as mentioned, in the general case of a closed mesh without borders. The *IPM* can have borders, and thus, the intermediate meshes

can contain borders. Therefore, the previous definitions have to be expanded to consider these special cases. For example, the region \mathcal{R} can contain thin structures; hence, it is not possible to generate the classic dual cell, but it is possible to generate linear dual cells. We will explain these cases in more detail in the next section.

3.4 Generation of dual cells in particular cases

To address all possible cases in a region with borders and to prove its topological correctness, it is necessary to expand our definition of a dual mesh.

Dual vertex generation Our algorithm simply traverses each cell in the primal mesh \mathcal{M} and computes a dual vertex placed in the barycenter of the current cell. This algorithm is easily applied over 1-dimensional and 2-dimensional cells. There is no need to extend the current definitions.

Dual cell generation In the general case, it is possible to build the dual cell d_i around a primal vertex c_i by extracting its face neighborhood as defined in equation 6

$$\mathcal{N}_f(c_i) = \{f_j \mid c_i \in \mathcal{V}(f_j) \text{ where } \mathcal{V}(f_j) \text{ is the set of vertices of cell } f_j\}. \quad (6)$$

From $\mathcal{N}_f(c_i)$, it is possible to generate the dual vertices that will be connected to generate the dual cell. However, it is necessary to ensure that the faces are ordered counterclockwise in order to obtain a well oriented dual mesh. To do this, our algorithm extracts the ordered neighborhood of the primal vertices around c_i by traversing all faces incidents to c_i . Then, we extract all edges in those faces not containing c_i . Finally, we order these edges to create a closed path. This algorithm only works in well oriented surfaces. Thus, this vertex neighborhood can be redefined as follows.

$$\mathcal{N}_v(c_i) = \{c_j \in \mathcal{V}(f_k) \mid \exists f_k \in \mathcal{N}_f(c_i) \text{ and } c_j \neq c_i\}. \quad (7)$$

The vertices contained in $\mathcal{N}_v(c_i)$ can be ordered to check if the current vertex c_i is actually surrounded by a closed path of vertices. If it is the case, it is possible to generate the dual cell. If it is not the case, the current vertex belongs to a thin structure or a border. Our algorithm to process these cases will be explained in the next section.

It is necessary to also handle the cases where 1-dimensional and 2-dimensional cells are adjacent. In these cases, it is necessary to make a decision about the way how these cells have to be connected, which occurs in both the primal space and in the dual space, and the method used to solve this is presented in the next section.

3.5 Handling mixed regions

Mixed regions usually appear when large components encounter thin structures. It can happen in the transition from primal to dual and in the dual-to-primal transformation. Therefore, we develop these two transitions separately.

Primal to Dual Transformation Once the dual vertices have been generated, it is necessary to detect thin structures to avoid the separation of components connected by a strip of triangles or a set of vertices. To detect if a primal face f is contained in a thin structure, we traverse each of its primal vertices checking if a ring can be built around each one. If this is not possible for any of them, this primal face is marked as comprising part of a thin structure. Then, each dual vertex in every face is connected to the dual vertex in the edge-adjacent cell in order to generate a dual edge. This process is repeated until all dual vertices in the thin structure are connected. It is important to clarify that edges generated in thin structures are 1-dimensional dual cells and are stored explicitly, in contrast to edges comprising part of 2-dimensional dual cells, which are stored implicitly. This process is illustrated in figure 3.

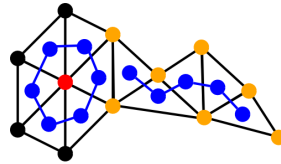


Fig. 3: Detection of thin structures. For each primal vertex, we check the 1-ring built from its incident faces. In red, a primal vertex in a larger structure. In yellow, these primal vertices do not have a 1-ring around them. Consequently, all primal faces containing only these kinds of vertices are part of a thin structure. In blue are dual vertices, dual faces and dual edges.

As seen in figure 3, dual vertices in thin structures are still not connected to dual vertices in the larger structure. Our algorithm traverses all dual vertices belonging to thin structures to detect end points, which is done by checking if the dual vertex is only adjacent to one 1-dimensional cell. Then, for each end point $v_{endpoint}$, we obtain its primal cell c_p , and we check if c_p is an edge-adjacent to another primal cell c_a so that it contains a dual vertex belonging to a 2-dimensional dual cell. We do this only once in order to avoid connecting the thin structure with the larger structure multiple times. This procedure is listed in the algorithm 1.

As mentioned previously, our algorithm connects vertex-adjacent regions in order to preserve the topology of a region of interest defined with marked vertices, which is implemented in the primal-to-dual phase. Dual vertices in vertex-adjacent primal vertices are always connected by an edge. It is important to remember that a primal cell can be edge-adjacent to several structures. Consequently, it is necessary to detect all components that have to be connected with the current dual vertex, which is illustrated in figure 4a.

To connect these structures, it is necessary to detect one of the end points v_a or v_b . Then, the algorithm extracts the set of primal cells C that are adjacent to the shared primal vertex v . Next, we extract the connected components of C . Finally, we choose one of the primal cells belonging to each connected component

Algorithm 1: Connecting the dual vertices in a thin structure with the dual vertices in larger structures.

Data: Dual mesh with thin and large structures disconnected.
Result: Dual mesh with thin structures connected to large structures.

```

dualVertices ← GetDualVerticesInThinStructure(...)
forall dualVertices as v do
  if IsEndPoint(v) then
    cp ← GetPrimalCell(v)
    adjacentCells ← GetAdjacentCells(cp)
    forall adjacentCells as c do
      vd ← GetDualVertex(c)
      if BelongTo2DDualCell(vd) then
        GenerateDualEdge(v, vd)
        Break
      end
    end
  end
end
end

```

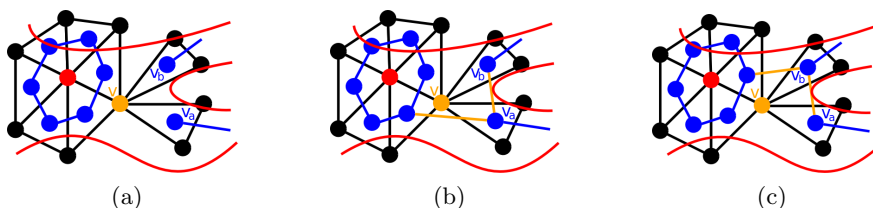


Fig. 4: In red, we illustrate potential borders for the structure approximated by the area of interest. (a) Vertex-adjacent components in the Dual cells and dual vertices are in blue. The large structure is composed of a dual cell in blue. This structure is connected to two thin structures by the primal vertex in orange. (b) The three components are connected by the orange edges from v_a . It is clear, however, that we can obtain different meshes depending on the initial dual vertex (c). As explained later, we do not consider this as a limitation for our approach because the topology of the area of interest is preserved.

that contains a dual vertex, and we connect v_a (or v_b) with each one of these dual vertices. This procedure is listed in algorithm 2 and illustrated in figure 4b.

By using this method, it is possible to obtain different meshes from the same input depending on the dual vertex that is first detected (v_a or v_b). However, as this choice does not change the topology (but the connectivity) of the final mesh. As our objective is to preserve the topology in the sense of connected components, holes and voids and not in terms of connectivity of the mesh, this result is correct.

Dual-to-Primal Transformation Once a dual mesh has been generated, our approach detects which primal cells can be eliminated without affecting the topology of the final linear structure. To do this, we apply the following rule:

Algorithm 2: Connecting the dual vertices of vertex-adjacent primal cells. This algorithm can connect multiple dual vertices from multiple vertex-adjacent primal cells (see figure 4).

Data: Dual mesh with vertex-adjacent structures disconnected.
Result: Dual mesh with vertex-adjacent structures connected.

```

dualVertices ← GetDualVerticesInEdges(...)
forall dualVertices as v do
  if IsEndPoint(v) then
    cp ← GetPrimalCell(v)
    vshared ← GetSharedVertex(cp)
    vertexAdjacentCells ← GetAdjacentCellsByVertex(vshared)
    connectedComponents ← ExtractConnectedComponents(vertexAdjacentCells)
    forall connectedComponent as cc do
      vd ← GetOneDualVertexInComponent(cc)
      GenerateDualEdge(v, vd)
    end
  end
end
end

```

Rule 1 A primal cell must be preserved if and only if its dual vertex is shared by three 2D dual cells.

The rule 1 is intended to preserve primal cells that are part of large structures. This rule also implies that all primal cells corresponding to a dual vertex shared uniquely by one or two 2D dual cells must be eliminated. These primal cells are, evidently, always located in the frontiers of the structure. Therefore, the application of rule 1 results in an erosion of the larger structures from the border to the inside, similar to the prairie fire algorithm used in topological thinning methods. It is implemented by traversing all dual vertices and obtaining its adjacent dual cells.

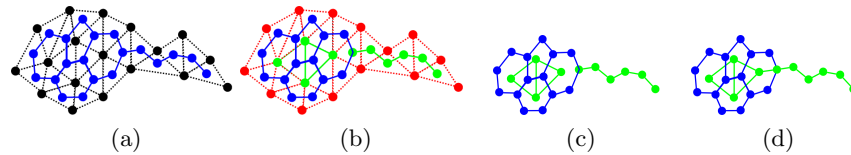


Fig. 5: General illustration of the transition from dual to primal. This example shows a large structure connected to a thin structure.

The rule 1 is only intended to preserve interior faces. The connectivity between large and thin structures is represented as a dual edge sharing a dual vertex with a 2-dimensional dual cell, as explained in the previous section. To preserve this topology in the next primal mesh, we proceed as follows. In the case of primal faces belonging to thin structures and, as consequence, represented in the dual mesh by dual vertices, they are not preserved; however, each one is replaced by its dual vertex, which is added to the next primal mesh. Dual edges inside these thin structures are all preserved as primal edges. Finally, dual edges connecting to 2-dimensional dual cells are also preserved by adding the shared

dual vertex to the primal vertices and connecting it to the primal vertex at the origin of the primal 2-dimensional cell.

This process is illustrated in figure 5 with the original mesh in black and the initial dual mesh in blue. In figure 5b, green faces and vertices are preserved, all primal faces and vertices that are going to be eliminated (by using the complement of rule 1) are in red. In 5c, thin and large structure are still not connected. In 5d, These structures are connected by using the primal vertex at the origin of the 2-dimensional dual cell and the dual vertex in the same dual cell connected to the thin structure.

The method previously described is sufficiently general to address several thin structures or branches converging toward a single 2-dimensional dual cell and can generate multiple junctions at the same point; it preserves the topology of the original area of interest.

As evident from the primal mesh obtained in figure 5d, our approach generates intermediary meshes that are a mixture of faces and edges as illustrated in figure 6a. Therefore, this kind of configuration has to be addressed in the primal-to-dual transition. In these cases, the algorithm connects the dual vertex in the primal edge with the dual vertex belonging to the adjacent primal face, forming a junction as shown in figure 6b.



Fig. 6: General illustration of the extraction of a dual mesh in areas of the mesh where primal faces and edges are connected. (a) This primal mesh has been generated from a previous iteration. It generates mixed meshes with edges and faces. (b) The dual mesh in blue is generated mostly by using the standard rules explained earlier. However, in mixed areas, dual vertices in edges have to be connected to dual vertices in primal faces generating a junction.

The previous primal-to-dual and dual-to-primal processes are applied iteratively until idempotency. In this final stage, we obtain a mesh containing edges only. These edges are positioned approximately at the center of the topological structures of the original area of interest. This fact will help to better understand the next section.

3.6 Geometric positioning

The algorithm generates linear meshes well positioned in the center of the main structures of the original object, which is possible because of the symmetrical erosion procedure that is used to progressively eliminate the most external primal faces in the mesh. As explained above, our algorithm advances from the borders of the mesh to the interior. Thus, the final structure converges slowly towards the center of the structure. Additionally, we use the primal vertices if possible;

however, if necessary, we generate and add dual vertices to the next primal mesh. These dual vertices are placed in the barycenter of primal faces, thus increasing the centering of the final structure, especially in thin structures.

Concerning the geometric position with respect to the original surface, we use, if possible, the original primal vertices. If dual vertices are used in the final mesh, they are strictly located over the primal faces. Therefore, the vertices of the final mesh are always located over the original mesh. By contrast, final edges are not always located on the surface. It is only the case when the edge is relying two initial primal meshes. In any other case, all the points of the edge are not necessarily on the surface.

3.7 Topological guarantees

The topological guarantees offered by our approach can be proven by analyzing the different cases that can appear in the primal-to-dual and dual-to-primal transitions.

Lemma 1. *In the transition from the primal mesh to the dual mesh, all topological structures are represented through their dual counterparts.*

Proof. Let $A_p = \{V_p, F_p, E_p\}$ with V_p be a set of primal vertices, F_p be a set of primal faces and E_p be a set of edges. We consider \mathcal{S}_p a *conformal* mesh so that N-dimensional cells only intersect on (N-1)-dimensional cells. Triangles only intersect in an edge or a vertex and edges only intersect in a vertex. Therefore, we consider that A_p is also conformal.

First, let the dual mesh be defined equivalently as $A_d = \{\mathcal{V}_d, \mathcal{F}_d, \mathcal{E}_d\}$. As our algorithm generates one dual vertex for each primal cell or edge, we find that the set of dual vertices \mathcal{V}_d is composed of dual vertices centered at their corresponding primal cell, as illustrated in figure 2a and 2b. Hence, each face $f_p^i \in F_p$ or edge $e_p^i \in E_p$ in the region A_p is represented by a dual vertex $v_d^i \in \mathcal{V}_d$.

Uniform regions : In the case of 2 edges connected by a primal vertex, dual vertices are connected by a dual edge (see 2c). In the case of primal vertices surrounded by faces, dual vertices are connected as illustrated in figure 2d. This construction guarantees that linear structures will still be represented by linear (but dual) structures. In the case of triangulations, they will be represented by at least one dual cell.

Mixed regions : these are regions where a triangulation representing a large structure L_p is connected to a thin structure T_p by at least a primal vertex. These thin structures can be a strip of triangles or a set of edges. Two cases can be considered:

- **If $L_p \cup T_p$ is an edge:** The dual vertices belonging to the edge-adjacent triangles are connected by a dual edge, thus connecting the two regions.
- **If $L_p \cup T_p$ is a primal vertex:** L_p and T_p are either two primal faces or a primal face and a primal edge. Then, the dual vertex in T_p is connected to the first primal cell of each vertex-adjacent connected component as illustrated in figure 4.

Mixed regions in the primal mesh only transform into dual edges in the dual mesh. As we have assumed that the area of interest is a conformal surface, the cases explained above connect all cells that are at least connected by a primal vertex. Consequently, this algorithm preserves the topology of the original surface.

Lemma 2. *In the transition from the dual mesh to the primal mesh, all topological structures are preserved.*

Proof. To prove lemma 2, we need to proceed by case:

- **Dual edges:** Dual edges are only converted to primal edges. Therefore, thin structures are preserved.
- **Large structures:** As mentioned previously, all internal dual vertices are transformed to primal cells. All noninternal dual vertices and their corresponding primal faces are eliminated. If no internal dual vertices exist, it means it is a thin structure; in any other case, primal faces will be conserved, and this structure will be present in the next iteration.
- **Mixed structures:** A 2-dimensional dual cell connected to a dual edge. In this case, the connection between the components is always conserved because the primal vertex at the center of the dual edge will be connected to the primal vertex at the origin of the 2-dimensional dual cell.

In conclusion, no components that have been connected during the primal-to-dual process are separated in the dual-to-primal transition. All connections are preserved in the edge and vertex adjacency. Consequently, the topology of the original region of interest is preserved.

3.8 Post-processing

Pruning Our algorithm uses a simple criterion to eliminate parasite branches. It consists of the detection of ending vertices of the structure. For each of these ending vertices, it checks if it belongs to the original mesh. If this is the case, this branch is preserved because it can represent an important feature of the region. If the ending vertex does not belong to the initial mesh, it means that it has been created during the primal-dual-primal iteration process. In this case, it is not sure that the vertex reflects a thin structure in the initial mesh. In this article, we have decided to keep these branches if they have a minimum length (a parameter) but more research is needed to establish if they really have to be conserved.

Smoothing As our approach is based entirely on the geometrical information of the mesh, it can produce highly oscillating structures. To improve these results, we apply a simple smoothing algorithm that moves every vertex to the barycenter of the vertices composing its topological neighborhood similar to the "Beatifying" algorithm proposed in [1].

Evidently, as this process can affect the approximation quality of the final skeleton, we bound the maximum approximation error from the original mesh.

4 Results and validation

These results have been obtained in the Ubuntu 16.04 LTS 64-bit environment with the processor, Intel i7-7820HQ CPU @ 2.90 GHz \times 8 and 32 GBytes of internal memory. It has been implemented in C++, and the mesh data structure used was the vtkPolyData. We used VTK built-in methods to traverse the mesh and access to its properties. Our approach is intended to work in 2-dimensional simplex meshes that can be mapped in 3D in order to represent volumes. For this, we have started applying it to 2D planar meshes and the results are discussed in the next section.

4.1 Application on planar meshes

In figure 7, our implementation is applied to four different meshes. These meshes are regular meshes with relatively well-formed faces. In the figure, we show the original mesh and the extracted skeleton after cleaning and some iterations of the smoothing process. Table 1 shows relevant information about the examples presented in figure 7.

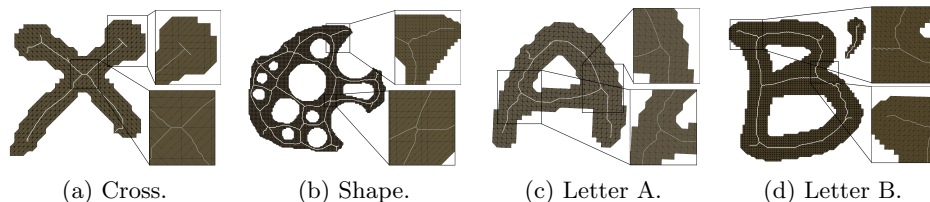


Fig. 7: Application of our algorithm to 2D meshes. The cleaned skeleton is shown after a smoothing process.

Table 1: Information on the execution of the algorithm in the four previous planar meshes. This table shows the number of primal-to-dual and dual-to-primal iterations, the execution time and the total number of edges in the final skeleton.

Data set	# Triangles	# Iterations	Exec. Time (in ms)	Lines Final skeleton
Cross	819	5	246	108
Shape	8556	13	4529	1009
A letter	812	6	261	103
B Letter	4307	9	2049	361

From figure 7, it is clear that the algorithm is able to extract skeletons from arbitrary triangular meshes while preserving the topology of the original mesh. It keeps junctions and holes, and places the final skeleton at approximately the center of the topological structure. However, the method is entirely based on the geometry and the connectivity of the mesh, and consequently, a different triangulation of the same object will produce a different skeleton.

Concerning the execution time, our implementation is not optimal because of the choice of the vtkPolyData structure. The vtkPolyData depends on a logarithmic data structure to traverse neighboring cells and adjacent vertices. Having

into account the vtkPolyData data structure, the complexity of the dual vertex generation process is $\mathcal{O}(N\frac{1}{K}(F+V))$ and including the complexity of the dual cell generation, the final complexity of our method is $\mathcal{O}(N[\frac{1}{K}[(F+V)+V\log F]])$. As seen, the execution time of our algorithm is highly dependent of the size and connectivity of the input mesh. As optimization and with a half-edge data structure, the $\frac{1}{k}V\log F$ part of our approach can be optimized to a constant factor.

4.2 Application on surfaces

We have applied our approach to surfaces mapped in 3D that represent volumes. These surfaces have to be marked in order to define areas of interest. In figure 8, we show two surface meshes where areas of maximum curvature are marked. Our approach has extracted skeletons close to the center of interest areas.

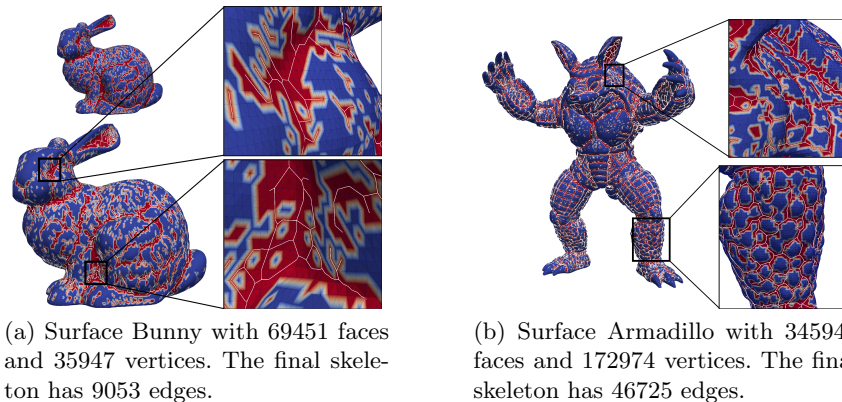


Fig. 8: Application to the high curvature areas of a surface (in red). Two closeups show how the skeleton (in white) is located in the middle of the region of interest.

As seen in figure 8, our algorithm is robust enough to be applied to any 2D mesh with complex topology. It is able to connect connected components with edge and vertex connectivity, allowing us to preserve the topology of thin structures connected only by 1-dimensional cells or edges. However, our current implementation does not guarantee that the skeleton is located in the center of the connected component but tends to place it close to it. To offer guarantees on the location of the skeleton, it will likely be necessary to follow closely the position of dual vertices, thus minimizing its distance to the center of mass of the current component. This kind of implementation can be used to extract the main features of surface meshes in the future.

5 Conclusion and future work

We have tested our approach and we have confirmed that the algorithm is robust and capable of extracting a 1-dimensional structure from any region lying on a mesh with arbitrary topology. However, this approach is highly dependent on

the size and connectivity of the mesh. Thus, we think that a more efficient mesh data structure can strongly improve the complexity and the execution time of our method.

As future work, we consider that our approach is not limited to 2D triangular meshes, and it can be easily extended to simplicial meshes in higher dimensions.

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