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## High-quality Compatible Triangulations and their Application in Interactive Animation

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## ABSTRACT

We propose a new method to compute compatible triangulations of two polygons in order to create smooth geometric transformations between them. Compared to existing methods, our approach creates triangulations of better quality, that is, triangulations with fewer long thin triangles and Steiner points. This results in visually appealing morphings when transforming the shape from one into another. Our method consists of three stages. First, we use a common valid vertex pair to uniquely decompose the source and target polygons into pairs of sub-polygons, in which each concave sub-polygon is triangulated. Second, within each sub-polygon pair, we map the triangulation of a concave sub-polygon onto the corresponding sub-polygon using a linear transformation, thereby generating compatible meshes between the source and the target. Third, we refine the compatible meshes, which creates better quality planar shape morphing with detailed textures. In order to evaluate the quality of the resulting mesh, we present a new metric that assesses the deformation of each triangle during the shape morphing process. Finally, we present an efficient scheme to handle compatible triangulations for a shape with self-occlusion, resulting in an interactive shape morphing system. Experimental results show that our method can create compatible meshes of higher quality as compared to existing methods with fewer long thin triangles and smaller triangle deformation values during shape morphing. These advantages enable us to create more consistent rotations for rigid shape interpolation algorithms and facilitate a smoother morphing process. The proposed algorithm is both robust and computationally efficient. It can be applied to produce convincing transformations such as interactive 2D animation and texture mapping. The proposed interactive shape morphing system enables normal users to generate morphing video easily without any professional knowledge.

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#### 1. Introduction

Planar shape morphing, also known as metamorphosis or shape blending, allows smoothly transforming a source shape into a target one [1, 2, 3]. Shape morphing techniques have been used widely in animation and special effects packages, such as Adobe After Effects and HTML5, generating visual effects for both the film and television. The key research focus here is to synthesize high-quality character animations that can handle shapes with self-occlusion and avoid collapsing of polygons during the morphing process.

2D image deformation algorithms such as rigid shape deformation in [4, 5] have been extensively explored in the research community. With these algorithms, users can manipulate constrained handlers to deform a given image. However, such image warping techniques offer a limited
 range of transformations. Transforming a shape into a
 significantly different one is difficult due to the lack of feature
 correspondence.

Planar shape morphing methods offer solutions that determine the trajectory along which the source vertex will travel to 6 the target one. Previous attempts to tackle the shape morphing 7 problem by linearly interpolating the coordinates of each R corresponding vertex pair between the source and the target polygons. However, simple linear interpolation sometimes 10 creates intermediate polygons that overlap with each other, 11 resulting in geometrically incorrect transformations. While 12 other image space techniques such as [5, 6] achieve pleasant 13 14 blending results, they usually suffer from overlapping problems due to the lack of topology information. 15

Previous work [7, 8, 9, 10] has shown that comput-16 ing compatible triangulation can successfully create smooth 17 transformations for both the boundary and the interior of a 18 shape. Two triangulations are compatible if they have the 19 same combinatorial structure, i.e., if their face lattices are 20 isomorphic [11]. However, in many situations, compatible 21 meshes can be generated only if additional points, known 22 as Steiner points, are added. Thus, one challenge of 23 building compatible triangulation is to use a small number of 24 Steiner points such that we can reduce the shape morphing 25 complexity. Another challenging problem of computing 26 compatible triangulation is to avoid the generation of some 27 long thin triangles using a computationally efficient algorithm. 28 The long thin triangles can cause inconsistent rotation problems 29 and create artifacts when applied to shape interpolation 30 algorithms [12]. Therefore, a good compatible triangulation 31 contains a small number of Steiner points and keeps a small 32 percentage of long thin triangles. In this paper, we propose 33 a heuristic polygon decomposition method that reduces the 34 overall algorithm complexity. 35

We observed that most existing compatible triangulation 36 approaches either create a large number of skinny triangles 37 or are too complicated for real-time shape morphing. 38 In this paper, we propose an efficient framework to compute 39 compatible triangulation of two simple polygons defined as 40 planar shapes with non-intersecting edges that form a closed 41 path. Our method produces compatible meshes with fewer long 42 thin triangles and fewer Steiner points, thereby enabling smooth 43 transformations from one shape into another. The proposed 44 method applies to any 2D shape without holes. Here, we use 45 the human shape as an example to illustrate our interactive 46 animation system. We demonstrate an interactive entertainment 47 system that transforms a human into a bird or other objects that 48 people may never experience in real life. 49

<sup>50</sup> The major contributions of this paper are summarized as <sup>51</sup> follows:

- First, we propose a new algorithm to calculate the compatible polygon decomposition based on the common valid vertex pairs that results in a flexible decomposition of the source and target polygons.
- Second, we present a new metric to measure the quality of

the resulting mesh during the shape morphing process.

Finally, we propose an enhanced scheme that can compute a compatible triangulation for a shape with self-occlusion by introducing a calibration image. To demonstrate the effectiveness of the proposed algorithm, we present an interactive morphing system that uses human silhouette as the source input shape.
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Our preliminary research documented in [12] proposed a 64 basic system to construct the compatible triangulation for 65 two simple polygons. Compared with this work, our new 66 compatible polygon decomposition algorithm is more flexible 67 and leads to better mesh quality with fewer number of Steiner 68 points, as illustrated in Fig. 8 and Table 2. The method 69 of [12] generates different triangulation results depending on 70 whether we start the convex decomposition from the source 71 or target polygon. However, our method always produces the 72 same triangulation results even when started from different 73 directions. This is because we consider the source and target 74 polygons at the same time using the common valid vertex 75 pairs. Generally, our algorithm is faster than [12], as shown 76 in Section 5. Compared to [13], we proposed a new metric 77 to measure the quality of the resulting meshes during the rigid 78 shape deformation process. We have also conducted extensive 79 experiments to analyze the influence of the mesh quality on 80 shape morphing such as texture mapping. Finally, to produce 81 sensible transformations, we proposed an improved scheme to 82 deal with compatible triangulations with self-occlusion, and we 83 tested the proposed interactive animation system using a human 84 silhouette as our source shape input.

## 2. Related Work

Planar shape morphing involves two sub-problems: vertex correspondence and vertex path computation [14]. Vertex correspondence determines how the vertex u of source polygon P matches the vertex v of target polygon Q. The vertex path determines the trajectory along which the vertex u will travel to the vertex v. In this paper, we concentrate on the vertex correspondence problem, i.e., computing compatible meshes.

Previous methods for computing compatible triangulations usually fall into two categories: (1) Transforming the source and target polygons into another common space [11, 7, 15]. (2) Iteratively partitioning the source and the target polygons until both inputs become a set of triangles [16, 17, 9, 10].

Aronov et al. [11] constructed the compatible triangulations 99 by overlaying the triangulations of the source and target 100 polygons in a convex polygon. The intersections of the two 101 triangulations built a piecewise-linear homeomorphism, which 102 introduced a large number of Steiner points. To solve this 103 problem, [7] employed Delaunay triangulation to reduce the 104 number of Steiner points. Kranakis and Urrutia [15] proposed 105 another method by which the number of Steiner points can be 106 determined by the number of inflection vertices. While their 107 method can reduce the number of Steiner points, it sometimes 108 results in Steiner points on the edge of a polygon. 109

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Gupta and Wenger [17] used the divide-and-conquer method to partition the source and target polygons iteratively. Their algorithm introduced a small number of Steiner points by using the link paths. However, it is not suitable for polygons with a small number of vertices. Surazhsky and Gotsman [9] simplified the algorithm of [17] and proposed a new remeshing method that greatly improves the mesh quality by adding a few number of Steiner points. Their algorithm requires the implementation of many data structures and algorithms in [16], and therefore is algorithmically complex. Baxter et al. [10] 10 proposed a new way to find compatible link paths. Based on this 11 new link path generation algorithm, they used a similar scheme 12 as in [9] to compatibly partition the two polygons. Although 13 their algorithm for computing link paths is faster than [9], the 14 proportion of regular-shaped triangles (as opposed to long thin 15 triangles) still needs to be improved. 16

A lot of work has been proposed for interpolating two 17 shapes. Alexa et al. [7] proposed a method that attempted 18 to preserve rigidity. They separately interpolated the rotation 19 and the scale/shear components of an affine transformation 20 matrix, which generated pleasing results with small rotations 21 for most of the cases. Inspired by [7], [18] presented a 22 3D morphing method based on the Poisson's equation that 23 generated visually pleasing morphing sequences. However, 24 their method suffered from the inherited problem of rigid 25 interpolation methods that the rotations may be incorrectly 26 As a solution, [19] proposed a method to interpolated. 27 consistently assign rotations. Sumner and Popovic [20] 28 proposed a method that transferred the 3D deformation of 29 a source triangle mesh onto a different target triangle mesh. 30 However, their algorithm is designed for the case where there is 31 a clear semantic correspondence between the source and target. 32 Li et al. [21] introduced a new type of coordinates for Hermite 33 interpolation that can be applied to shape deformation. Other 34 methods such as [22] try to preserve certain properties such as 35 the smoothness and the distortion for 2D shape interpolation. 36

In this paper, we propose a new method to construct 37 the compatible meshes of two simple polygons. 38 Our approach draws inspiration from [23], which uses barycentric 39 coordinates to map a spatial surface triangulation to a planar 40 triangulation. However, [23] requires that every Steiner point 41 of the target polygon Q must be a strict convex combination 42 of its neighbors, which cannot always be satisfied in practice. 43 As a solution, we propose an efficient compatible polygon 44 decomposition algorithm that simultaneously partitions the 45 source and target polygons into a set of sub-polygon pairs such 46 that we can solve the compatible mapping with a sparse linear 47 system for each sub-polygon pair. On the other hand, the 48 resulted initial triangulation may still contain long thin triangles 49 that need to be improved. We propose some efficient schemes 50 to further improve the mesh quality. 51

#### 3. Compatible Triangulations 52

As illustrated in Fig. 1 (a-b), the input data of our system 53 are two simple polygons P and Q with corresponding vertices 54 ordered in counter-clockwise. We denote  $P = \{U, E^P\}$  and 55

 $Q = \{V, E^Q\}$  as the source and target polygons with point set 56  $u \in U$  and  $v \in V$ , together with the edge set  $E^P$ ,  $E^Q$  respectively. P and Q are assumed to be simple polygons without holes, in 58 which the edges do not cross each other and form a closed 59 contour enclosing each polygon. We define  $\mathcal{T}_{\mathcal{P}}$  and  $\mathcal{T}_{O}$  as 60 the triangulation of the polygon P and Q.  $\mathcal{T}_{\mathcal{P}}$  and  $\mathcal{T}_{Q}$  are 61 compatible if they have an equivalent topology, which is defined 62 as: 63

- 1. There is a one-to-one correspondence between the vertices of  $\mathcal{T}_P$  and that of  $\mathcal{T}_Q$ .
- 2. There is a one-to-one correspondence between the edges of  $\mathcal{T}_P$  and  $\mathcal{T}_O$ , meaning that if there is an edge connecting two vertices of  $\mathcal{T}_P$ , then there is an edge connecting the corresponding vertices of  $\mathcal{T}_{O}$  and vice versa.
- 3. The boundary vertices of both  $\mathcal{T}_P$  and  $\mathcal{T}_Q$  are traversed in the same clockwise or counter-clockwise order.

The core of our framework is a new algorithm for partitioning 72 the source and target polygon pairs, which is more flexible 73 to increase the mesh quality. Given two simple polygons P74 and O with a boundary vertex correspondence as illustrated 75 in Fig. 1 (a-b), our algorithm works in three stages. First, 76 we decompose the source polygon P and the target polygon 77 Q into compatible sub-polygons  $(p,q) = \bigcup (p_i,q_i)$  as shown in Fig. 1 (c-g), where either the target sub-polygon  $q_i$  or the 79 corresponding source sub-polygon  $p_i$  is convex. Considering 80 a sub-polygon,  $p_i$  of P, we triangulate  $p_i$  using Delaunay 81 triangulation as illustrated in Fig. 1 (h-i). Second, we map 82 the triangulation  $\mathcal{T}_{p_i}$  of the source sub-polygon  $p_i$  onto the 83 corresponding target sub-polygon  $q_i$  using a sparse linear system as shown in Fig. 1 (j-k). Third, we refine the compatible 85 meshes to improve the mesh quality shown in Fig. 1 (l-m), 86 which is important for high-quality morphing in 2D animation, 87 special effects for movies and texture mapping. 88

#### 3.1. Compatible Decomposition of the Target and Source Polygons

In the first phase, we compatibly decompose the source and 91 target polygons, P and Q, into pairs of sub-polygons. In a 92 simple polygon, a vertex  $u \in U$  is *convex* if the angle  $\alpha$  formed 93 by the two edges at u is less than  $\pi$  radians. Otherwise u is considered to be *concave*. Our goal is to turn some concave 95 vertices into convex ones through the decomposition and to construct pairs of sub-polygons from the source and target 97 polygons such that each of the sub-polygon pair contains at 98 least one convex sub-polygon. 99

Without loss of generality, we assume the source and target 100 polygons P and Q each to be a simple polygon with N 101 vertices arranged in counter-clockwise order. Here, we label 102 the concave vertices of Q as  $v_1, ..., v_c$  and the convex vertices 103  $v_{C+1}, ..., v_N$ . Similarly, we label  $u_1, ..., u_C$  as the concave vertices 104 and  $u_{C'+1}, ..., u_N$  as the convex vertices of P. We call a vertex 105 pair (i, j) of P valid if  $u_i$  is visible from  $u_j$ , and at least one 106 of the two vertices is a concave vertex, e.g., (1, 4) is valid 107 as shown in Fig. 2. If two vertices are visible to each other 108 while not being a valid pair, then it implies that both vertices 109 are convex such as vertex pair (2, 4) as illustrated in Fig. 2. A 110

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Fig. 1. The overview of the proposed framework to compatibly triangulate two simple polygons. (a) The target polygon Q. (b) The source polygon P. (c) We compute the valid vertex pairs for both the source and target polygons. (d) We collect the common valid vertex pairs. (e) We use the common valid vertex pair for compatible decomposition if the common vertex pair exists; otherwise, we calculate the link path, e.g., the 2-link path between vertex  $u_2$  and  $u_5$  with the blue color shown in (h). (f-h) We use the polyline found in (e) that maximizes the minimum angle to decompose the source and target polygons. (i) We triangulate each sub-polygon  $p_i$  of source polygon P using Delaunay triangulation. (j) We may need to add some Steiner points on the edge of sub-polygon  $q_i$  to keep equivalent topology. (k) We solve a linear system to map the triangulation of sub-polygon  $p_i$  onto the corresponding sub-polygon  $q_i$  of target polygon Q. (1-m) We finally refine the compatible meshes by operations such as splitting long edges and flipping interior edges to improve the interior angles of the mesh.

diagonal  $u_a u_b$  of *P* is a line segment that joins vertex  $u_a$  and  $u_b$  of *P* and remains strictly inside *P*. A diagonal such as  $u_2 u_4$ in Fig. 2 that connects two convex vertices is redundant in our compatible decomposition algorithm because it can be removed and the two convex sub-polygons on its sides can be merged into a convex polygon. Therefore, for the construction of a compatible decomposition, we consider only the diagonals that







In some cases, the compatible triangulation can be con-9 structed only if Steiner points are added. In order to introduce 10 the minimum number of Steiner points, we need to search for 11 all the potential decomposition combinations in the solution 12 space. As a result, there can be an exponential number of 13 ways to decompose a simple polygon into convex sub-polygons 14 using the valid vertex pair, which forbids the practical use 15 of the algorithm. Previous work converted the compatible 16 triangulation problem into a common base domain [11, 7] or 17 used a divide-and-conquer methods [24, 10, 12] to iteratively 18 partition the source and target polygons. However, these 19 methods may either be too complex for a real-time application 20 or produce a mesh of poor quality. This motivates us to design 21 an efficient compatible triangulation algorithm with improved 22 mesh quality. 23

We start from the source polygon P and find all the valid

vertex pairs  $VP_P$  for P. Similarly, we find the valid vertex pairs  $VP_Q$  for the target polygon Q. Among all the valid vertex pairs in  $VP_P$  and  $VP_Q$ , we collect the common valid vertex pairs  $VP = VP_P \cap VP_Q$  that appear in both  $VP_P$  and  $VP_Q$ . The best partition for P and Q is the common valid vertex pair that generates the maximum minimum interior angle *IntAng* by:

$$(a,b) = \arg\max_{\substack{v_a,v_b \in V\\u_a,u_b \in U\\a \neq b}} \min\{IntAng_P(a,b), IntAng_Q(a,b)\}$$
(1)

where the  $IntAng_P(a, b)$  contains four angles formed by the intersection of the source polygon *P* and the diagonal  $u_a u_b$  that connects a valid vertex pair (a, b). For example,  $IntAng_P(1, 4)$  contains  $\angle \alpha$ ,  $\angle \beta$ ,  $\angle \gamma$  and  $\angle \delta$  in Fig. 2.

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Decomposing polygons with Equation 1 generates a balanced 28 angle partition for both the source and target polygons, which 29 maximizes the interior angle of both the source and target sub-30 polygons in the current iteration. Liu et al. [12] only considered 31 a balanced angle partition for the target polygon; however, 32 the source polygon may still generate small interior angles. 33 Previous methods such as [9, 10] only considered balanced 34 index partition of the source and target polygons, which is likely 35 to decrease the mesh quality regarding the proportion of small 36 angles in the compatible meshes, which will be discussed in 37 Section 6.2. 38

In practice, the common valid vertex pair may not always be 39 available in some cases. For example, as shown in Fig. 1(c-40 d), the intersection of two valid vertex pair sets  $\{(2, 4), (2, 5)\} \cap$ 41  $\{(3, 1), (3, 5)\}$  is empty. Here, we apply a link path to determine 42 the partition line between two vertices instead of using the 43 common valid vertex pair. A link path between vertex  $u_a$ 44 and  $u_b$  is a polyline within the polygon that joins the vertex 45 pair (a, b) such as vertex pairs (2, 6) and (6, 5) in Figure 1(h), 46 which defines a 2-link path between vertex  $u_2$  and  $u_5$ . A 47 minimum link distance for vertex pair (a, b),  $linkDist(u_a, u_b)$ , 48 is the minimum number of line segments in a polyline, for 49

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Algorithm 1: Compatible decomposition of the source and the target polygons

1	<b>Input</b> : The source and target polygons, <i>P</i> and <i>Q</i>
2	<b>Output</b> : A decomposition of <i>P</i> , $p = \bigcup p_i$ , and <i>Q</i> , $q = \bigcup q_i$ ,
	where either $p_i$ or $q_i$ is a convex sub-polygon
3	convexDecomposition(P, Q)
4	if P or Q is convex then
5	exit
6	end
7	Compute valid vertex pairs $VP_P$ and $VP_Q$
8	Find common valid vertex pairs
9	$VP = VP_P \cap VP_Q$
10	if VP is not empty then
1	Calculate the best partition by:
2	(a,b) =
	$\arg \max_{\substack{v_{a},v_{b}\in V\\u_{a},u_{b}\in U\\a\neq b}} \min\{IntAng_{P}(a,b), IntAng_{Q}(a,b)\}$
3	Decompose P and Q using $(a, b)$ that creates
	two sets of sub-polygons:
4	$\{p_i, p_{i+1}\}, \{q_i, q_{i+1}\}$
15	else
6	Decompose $P$ or $Q$ using link path that creates
	two sets of sub-polygons:
7	$\{p_i, p_{i+1}\}, \{q_i, q_{i+1}\}$
18	end
19	$convexDecomposition(p_i, q_i)$
20	$convexDecomposition(p_{i+1}, q_{i+1})$

example, the minimum link distance for vertex pair (2, 5) in Figure 1(h) is 2. We follow [10] to compute the link path with the minimum link distance for all vertex pairs in  $O(H \cdot N_i^3)$ , where H is the number of sub-polygon pairs and  $N_i$  is the number of vertices for the *i-th* sub-polygon. Algorithm 1 summarizes our recursive polygon decomposition algorithm.

By this stage, we have compatibly decomposed the source polygon P and the target polygon Q into sub-polygons  $\{p_i =$  $(U^{p_i}, E^{p_i})$  and  $\{q_i = (V^{q_i}, E^{q_i})\}$ , where  $(p_i, q_i)$  is a pair of suba polygons and either  $p_i$  or  $q_i$  is convex. We apply Delaunay 10 triangulation as the initial triangulation of a sub-polygon, which 11 can maximize the minimum interior angle with no extra Steiner 12 points in  $O(N_i \log N_i)$  [25]. Here, we denote  $\mathcal{T}_{p_i}$  as the 13 triangulation of the sub-polygon  $p_i$  and aim to construct the compatible triangulation  $\mathcal{T}_{q_i}$  of  $q_i$  based on  $\mathcal{T}_{p_i}$ . 15

#### 3.2. Compatible Triangulations Mapping 16

The compatible decomposition process may introduce 17 Steiner points on the link path of either the source polygon 18 P or the target polygon Q. Moreover, to improve the mesh 19 quality, the mesh refinement process detailed in Section 3.3 20 creates Steiner points within each sub-polygon. Therefore, we 21 have two types of Steiner points: (1) Steiner points that lie on 22 the link path of source sub-polygon  $p_i$ , and (2) Steiner points 23 that lie within  $p_i$ . For (1), we map the Steiner points onto the 24 corresponding edges of the target sub-polygon  $q_i$  based on the 25

simple line-segment-length proportion principle. For (2), we solve the mapping with a sparse linear system.

## 3.2.1. Mapping the Steiner Points onto the Link Path of the Source Polygon

We denote  $u_s$  as a Steiner point that lies on the link path 30 between vertex  $u_a$  and  $u_b$  in the source sub-polygon  $p_i$  such 31 as the vertex  $u_6$  for vertex pair  $(u_2, u_5)$  in Figure 1(h). We 32 add a Steiner point  $v_s$  for the target sub-polygon  $q_i$  on the corresponding line segment  $v_a v_b$  based on the linear ratio with 34 the following equation:

$$v_{s} = \frac{polylineLength(u_{b}, u_{s})}{polylineLength(u_{a}, u_{b})}v_{a} + \frac{polylineLength(u_{s}, u_{a})}{polylineLength(u_{a}, u_{b})}v_{b}$$
(2)

where  $polylineLength(u_a, u_b)$  is the summation of the length of all line segments on the link path between  $u_a$  and  $u_b$ .

As shown in Figure 1(h), the length of the polyline for vertex pair  $(u_2, u_5)$  is polylineLength $(u_2, u_5)$  $polylineLength(u_2, u_6) + polylineLength(u_6, u_5)$ . We place the vertex  $v_6$  on the line segment  $v_2v_5$  using Equation (2).

#### 3.2.2. Mapping the Steiner Points Within the Source Polygon

In this section, we will explain how to map the Steiner points 43 inside the source polygon onto the corresponding locations 11 inside the target polygon. As shown in Figure 3, we have to decide how to map the Steiner point  $u_1$  and  $u_2$  onto  $v_1$  and  $v_2$ 46 inside the target polygon. Here, we calculate the barycentric 47 coordinates of  $u_1$  and  $u_2$ . We then compute the proper locations 48 for Steiner point  $v_1$  and  $v_2$  using the barycentric coordinates 49 found in the source polygon. 50



Fig. 3. Mapping the Steiner points within the source sub-polygon onto the target sub-polygon. (a) The source sub-polygon with the Steiner points  $u_1$  and  $u_2$ . (b) The corresponding target sub-polygon with the unknown Steiner points v<sub>1</sub> and v<sub>2</sub>.

Denoting  $u_i, j \in \{1, ..., S_i\}$  as a Steiner point that lies within the source sub-polygon  $p_i$ , where  $S_i$  is the number of the Steiner points within  $p_i$ . We use the barycentric coordinates  $\lambda$  to map the Steiner point  $u_i$  of the source sub-polygon  $p_i$  onto the Steiner point  $v_i$  of the target sub-polygon  $q_i$ . Here, we employ the Floater's mean value coordinates [26] to calculate the barycentric coordinates  $\lambda$ . The barycentric coordinates  $\lambda$  of vertex  $u_i$  can be seen as a weight of its neighboring vertices, which allow us to generate continuous data from these adjacent vertices. We represent the Steiner point  $u_i$ , including the Steiner points on the link path of source polygon and Steiner points inside the source polygon, as a weighted average of its neighboring vertices:

$$u_j = \sum_{k=1}^M \lambda_{j,k} u_k, \quad \sum_{k=1}^M \lambda_{j,k} = 1$$
(3)

where *M* is the total number of points including the boundary vertices and the Steiner points for source sub-polygon  $p_i$ , i.e.  $M = N_i + S_i$ .

We now explain how to map the Steiner point  $u_j \in U^{p_i}$ ,  $j \in \{1, ..., S_i\}$  of the source sub-polygon  $p_i$  onto the corresponding Steiner point  $v_j \in V^{q_i}$  of the target sub-polygon  $q_i$ , where  $S_i$  is the number of Steiner points within  $p_i$ . We define  $v_1, ..., v_{S_i}$  to be the solutions of linear equations with  $S_i$  variables.

$$v_j = \sum_{k=1}^{M} \lambda_{j,k} v_k, \quad \sum_{k=1}^{M} \lambda_{j,k} = 1$$
 (4)

where

$$\begin{split} \lambda_{j,k} &= 0, \quad (j,k) \notin E^{q_i} \\ \lambda_{j,k} &> 0, \quad (j,k) \in E^{q_i} \end{split}$$

<sup>4</sup> Note that the barycentric coordinates  $\lambda_{j,k}$  can be uniquely <sup>5</sup> determined by Equation (3).

We rewrite Equation (4) by breaking the summation term into
 two sub-terms:

$$v_{j} = \sum_{k=1}^{S_{i}} \lambda_{j,k} v_{k} + \sum_{k=S_{i}+1}^{S_{i}+N_{i}} \lambda_{j,k} v_{k}, j \in \{1, ..., S_{i}\}$$
$$v_{j} - \sum_{k=1}^{S_{i}} \lambda_{j,k} v_{k} = \sum_{k=S_{i}+1}^{S_{i}+N_{i}} \lambda_{j,k} v_{k}$$
(5)

<sup>8</sup> where  $S_i$  is the number of Steiner points within the target sub-<sup>9</sup> polygon  $q_i$  and  $N_i$  is the number of boundary vertices of  $q_i$ .

Denoting  $v_j = (x_j, y_j)$  to be a Steiner point within target subpolygon  $q_i$  that we want to solve, Equation (5) is equivalent to the following form:

$$Ax = b_1, \quad Ay = b_2 \tag{6}$$

where  $x = (x_1, ..., x_{S_i})^T$ ,  $y = (y_1, ..., y_{S_i})^T$ , and the matrix  $A_{S_i \times S_i}$  is in the form:

$$\begin{aligned} a_{j,j} &= 1, j \in \{1, ..., S_i\} \\ a_{j_1, j_2} &= -\lambda_{j_1, j_2} \ (j_1, j_2 \in \{1, ..., S_i\}, j_1 \neq j_2). \end{aligned}$$

This linear system in Equation 6 has  $S_i$  unknown variables and  $S_i$  equations. The solution to Equation (6) is unique as the matrix *A* is non-singular. We apply *LU* decomposition to solve Equation (6) in  $O(S_i^3)$  [27], where  $S_i$  is the number of Steiner points within target sub-polygon  $q_i$ .

In practice, the source sub-polygon  $p_i$  maybe concave and we cannot guarantee that any point inside  $p_i$  can be mapped onto its corresponding point inside the target sub-polygon  $q_i$  using the barycentric coordinates. Our decomposition algorithm generates a pair of sub-polygons in which at least one of the sub-polygons is convex. As shown in Fig. 1 (g) and (h), although the source sub-polygon  $P_{2345}$  is concave, its corresponding target sub-polygon  $Q_{2345}$  is convex. We can triangulate the target sub-polygon  $Q_{2345}$  and map it onto the source sub-polygon  $P_{2345}$ . Because the target subpolygon  $Q_{2345}$  is convex, we can map the points inside  $Q_{2345}$ onto the countering-points inside  $P_{2345}$  using the barycentric coordinates.

#### 3.3. Compatible Mesh Refining

While the compatible meshes generated by our method introduce a small number of Steiner points, there may still be some long thin triangles such as the second column in Figure 7(a). In practice, we found that these long thin triangles can cause numerical problems such as inconsistent rotations for shape morphing. Therefore, we have to refine the compatible meshes to avoid numerical problems.

To refine the compatible meshes, we apply a variation of the remeshing method in [9]. We only smooth those triangles with small interior angles and long edges. Specifically, we smooth the mesh using area and angle based remeshing, splitting long edges, and flipping interior edges to improve the interior angles. We follow [28] to employ the minimum interior angle as a criterion to measure the mesh quality. We want to increase the minimum interior angle for both the source and target meshes. We apply the refinement operations to improve a pair of meshes only if these operations can further improve the mesh quality for both the source and target meshes. The smoothed results can be found in Figure 7(b).

### 4. Computing Compatible Triangulation with Selfocclusion

### 4.1. The Problem of Shape Morphing with Self-occlusion

As shown in Fig. 4(t=0), the user adopts a pose with self-occlusions, e.g., with the right hand placed in front of the torso and the left hand behind it. We apply the compatible triangulation method discussed in Section 3, which generates the compatible meshes. However, these meshes cannot distinguish the hands and the other body parts due to self-occlusion. We apply the rigid shape interpolation method introduced in [7] to blend the mesh, which results in the transformations shown in Fig. 4. We can see the transformations of the in-between images such as the time slice t=0.2, which dose not make sense because we want the hands of the user to be gradually transformed into the wings of the butterfly.

#### 4.2. Enhancing Shape Morphing with Self-occlusion

To generate sensible transformation, we need to enable 65 our compatible triangulation method to deal with the shape 66 with self-occlusion. However, the shape extracted from an 67 image with self-occlusion does not contain any overlapping 68 information, which makes it hard to compute the compatible 69 triangulation between two shapes with self-occlusion. Thus, 70 we propose an improved scheme to tackle triangulation with 71 self-occlusion by introducing a calibration image. 72

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Fig. 4. An example of shape morphing with self-occlusion. The transformation does not make sense as the limbs of the user are not transformed into the corresponding wings of a butterfly due to self-occlusion.



Fig. 5. The overview of compatible triangulation for shapes with selfocclusion using a human posture as an example. Our inputs are the source

shape with self-occlusion (a) and the target shape (c). (b) We introduce a calibration shape without self-occlusion. (d-e) We build the compatible triangulation between the calibration shape (b) and target shape (c). We deform the calibration mesh (e) into the source shape with occlusion (a) using the four color-coded control points.

Our inputs are the RGB image of the source object, together with its deformation control points, and the target shape with 2 texture. Here are the steps to build the compatible triangulation 3 between the source shape with self-occlusion and the target shape: (1) We capture a calibration shape of the source object that gives us the full body texture of the source object. Here, the calibration shape is used to extract the topology information, e.g., the deformation control points, and it requires the shape to have no overlapping parts. Additionally, the calibration shape enables us to synthesize texture for transformation with 10 overlapping as it contains the full texture of the source shape. In 11 particular, the calibration shape for human in this case is the full 12 body image as shown in Fig. 5(b). (2) We build the compatible 13 triangulation between the calibration and target shapes, which 14 bridges the shape with self-occlusion and the target shape. (3) 15 We use the control points to deform the mesh of the calibration 16 shape into the source shape with occlusion, which implicitly 17 builds the compatible triangulation between the source shape 18 with occlusion and the target shape. As illustrated in Fig. 5, we 19 take the human posture as an example to explain the process of 20 computing compatible triangulation with self-occlusion. 21



Fig. 6. Collision detection and depth adjustment. Without appropriate depth assignment, one can see interpenetration (b). We detect overlapping regions and adjust depth on the fly (c).

Using as-rigid-as-possible shape morphing, the points on 22 the medial axis of a shape experience only rotations [7, 29]. 23 Therefore, it is reasonable to use a sparse set of points on 24 the media axis as the deformation control points. Methods 25 such as [30, 31] have been proposed to extract the skeleton 26 of a shape. Since we are using the human as an example, we 27 follow the Kinect's posture estimation method [32] to identify 28 the skeleton of human and use these skeleton joints as our 29 deformation control points. In addition, Kinect also simplifies 30 the work of capturing the silhouette and texture of the source 31 object. 32

#### 4.3. Collision Detection and Depth Adjustment

As the searching sequence of our polygon decomposition algorithm is similar to the breadth-first search method, the triangles are not stored in sequence. We must be careful when different parts of the shape overlap. If we assign depths inappropriately, the overlapping parts may interpenetrate as shown in Fig. 6(b). We continuously monitor the mesh for self-intersection and assign appropriate depth values to the overlapping parts. The depth value we assigned to each triangle is estimated from the posture reconstruction algorithm studied in [33]. As we have recovered the joint positions for each joint, we know if the hands are in front of or behind the spine as shown in Fig. 6(c).

As shown in the second row of Fig. 12, we blend the human with self-occlusion and the butterfly. Compared with the transformations that do not consider body parts overlap as shown in Fig.4, the results in the second row of Fig. 12 make more sense as we now transform the human's limbs into the butterfly's wings.

#### 5. Method Complexity

In this section, we will analyze the computational complexity 53 of our method. It takes O(N) time to determine the concave vertices and O(N) time to find a valid vertex pair using the 55 visibility polygon algorithm [34], where N is the number of vertices of a polygon. Finding the common valid vertex pairs 57 using methods like hash table usually requires O(1) time. 58 Thus, the time cost of decomposing the source and target 59 polygons into pairs of sub-polygons is  $O(N^2)$ . Finding a 60 corresponding link path for a sub-polygon, e.g.,  $p_i$  in source 61 polygon P, is  $O(N_i^3)$ , where  $N_i$  is the number of vertices of 62

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a source sub-polygon  $p_i$ . The Delaunay triangulation can be finished in  $O(N_i log N_i)$ . The compatible mapping between a 2 pair of sub-polygons requires solving a linear equation using 3 LU decomposition that leads to  $O(S_i^3)$  operations, where  $S_i$  is 4 the number of Steiner points in the sub-polygon  $p_i$ . 5

Table 1 compares the computational complexity between our 6 method and alternative approaches. The main computation of 7 our algorithm is dominated by computing link paths and solving 8 a linear system, i.e.,  $O(H \cdot max(N_i^3, S_i^3)))$ , where H is the number 9 of sub-polygon pairs. In practice, the most time-consuming part 10 of our algorithm is building the link path as  $S_i$  is often smaller 11 than  $N_i$ . Generally, our algorithm is faster than [12]. This is 12 because our method simultaneously decomposes the source and 13 target polygons, and we will stop partitioning a polygon pair if 14 one of them is convex. However, [12] keeps partitioning the 15 target polygon until all the target sub-polygons are convex. Our 16 method is much faster than [9, 10] as we solve a small linear 17 sparse system within each sub-polygon pair. 18

Table 1. The computational complexity: the main computational cost of our method is computing the link paths, where N is the total number of boundary vertices of source polygon P,  $C_P$  is the number of concave vertices of P, L and H are the number of sub-polygon pairs created by Liu et al. and our method,  $N_i$  and  $S_i$  are the number of boundary vertices and the number of Steiner points of the *i*-th sub-polygon respectively.

Surazhsky-	Gotsman, 04	$O(N^3 log N)$		
Baxter et a	l., 09	$O(2N^{3})$		
		$O(L \cdot \max(N_i^3, S_i^3)), S_i, N_i \ll N$		
Liu et al., 1	5	$\left\lceil \frac{1}{2}C_{\mathcal{Q}} \right\rceil + 1 \le L \le C_{\mathcal{Q}} + 1$		
Dronosod	Convex decomposition	Common valid vertex pairs computation	$O(N^2)$	
Method		Link paths generation	$O(HN_i^3), N_i \ll N$	
	Linear system computation		$O(HS_i^3), S_i \ll N, H \leq L$	

The matrix A in Equation (6) is sparse and non-symmetric. 19 Therefore, we further speed it up by using iterative methods 20 such as Bi-CGSTAB [35]. Here, we apply an open library 21 Eigen [36] to solve the sparse linear system. The compatible 22 mapping process of a sub-polygon pair can be even faster 23 before the mesh refinement operations, and it can be completed 24 in  $O(S_i)$ . This is because the Delaunay triangulation can 25 triangulate the sub-polygon  $p_i$  with no Steiner points such that 26 we only need to map the Steiner points on the link path as 27 28 discussed in Section 3.2.1.

#### 6. Experimental Results 29

In this section, we will show the experimental results 30 and present the comparisons with the alternative approaches 31 including [9], [10] and [12]. Qualitative analysis is conducted 32 to evaluate the mesh quality between the proposed method and 33 other alternatives. The experiments are conducted on an Intel 34 Core i3-2350M 2.3 GHz PC with 4GB RAM. 35

#### 6.1. Compatible Triangulations 36

To demonstrate the effectiveness of our method, we im-37 plemented the as-rigid-as-possible shape interpolation method 38



Fig. 7. Compatible triangulation results. (a) The initial tessellations of two polygons. (b) Mesh refinement and morphing. Note that our compatible meshes can be used to blend shapes with large rotations, e.g., shapes in the third row.

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introduced in [7]. Figure 7 and 8 show some compatible triangulation results and some challenging polygon pairs that are quite different such as the shark and the seahorse in the third row of Figure 7. More examples of comparing morphing against previous triangulation strategies can be found in Figure 13. In practice, in order to create good correspondences between two polygons, shape matching algorithms such as [37] and [38] can be employed to automatically construct a few key correspondences between the source and target polygons, e.g., the vertices around the head, the hands and the feet of the human. Then, the remaining vertices between the user selected key points can be aligned based on linear interpolation. The user can specify a small number of matching points to ensure that the matching points are selected with similarity context. The mismatched correspondences can be detected by observing the generated transformations.

Figure 7(a) shows that our initial compatible triangulation contains few long thin triangles and we only need to flip some edges of such triangles to enlarge the minimum interior angles. Figure 7(b) shows that our compatible meshes can be further refined by methods such as splitting long edges and averaging the area of adjacent triangles. However, it should also be noted that not every long thin triangle can be further enhanced with our refinement method. For example, in the third row of Figure 7, some thin triangles around the head of the seahorse cannot be improved.

Given the compatible triangulations of two input polygons, shape interpolation can be applied to create animations showing the transitions from one shape to another. Figure 7(b) shows some interpolation results using our compatible meshes. For more transformations, please see our supplemental demo video.

#### 6.2. Mesh Quality Evaluation

The quality of the compatible meshes greatly influences the intermediate shapes generated by morphing techniques. In particular, meshes with those long and skinny triangles would suffer from the inconsistent rotation problem [7, 19].



Fig. 8. Compatible triangulations comparisons. We compare our results with [9], [10] and [12]. While we generally use fewer number of Steiner points than the others, our algorithm creates high-quality compatible meshes concerning the proportion of long thin triangles.

We employ the following criteria to measure the mesh quality: (1) the minimum interior angle of a given mesh; and (2) the proportion of angles that are smaller than a certain constant value, which is known to be a reasonable mesh quality criteria [28]. We want to increase the minimum interior angle of a mesh and decrease the percentage of small angles.

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Table 2 shows a quantitative comparison between our algorithm and three alternative methods. [9] tends to create more long thin triangles than the others. Compared with the

Shape	Method	#Steiner Point	Minimum	Angles <10°	Angles <15°	Angles <20°	Computation time(second)
	Surazhsky-Gotsman, 04	0	1.6730°	11.57%	16.12%	31.27%	21
	Baxter et al., 09	0	3.3052°	10.61%	14.39%	30.30%	12
	Liu et al., 15	3	3.7557°	5.35%	11.90%	22.02%	7
	Ours	0	6.4161°	8.75%	12.87%	26.93%	3
$\sim 0$	Surazhsky-Gotsman, 04	2	0.0441°	27.43%	36.81%	42.36%	24
MEZ >	Baxter et al., 09	5	0.9779°	21.91%	29.32%	37.96%	14
111	Liu et al., 15	2	0.9913°	15.27%	22.91%	32.29%	6
$\sim$ $\circ$	Ours	1	1.3653°	12.49%	21.08%	26.37%	5
. 5	Surazhsky-Gotsman, 04	6	0.4837°	8.60%	13.03%	20.59%	27
RIN	Baxter et al., 09	4	0.5849°	6.49%	12.42%	18.64%	15
	Liu et al., 15	3	0.6120°	5.29%	11.64%	17.46%	8
0-0- P	Ours	1	1.6855°	5.18%	9.11%	15.72%	7
5-5-5	Surazhsky-Gotsman, 04	0	0.0347°	28.96%	35.47%	44.88%	35
	Baxter et al., 09	0	0.0229°	21.45%	29.21%	35.48%	18
	Liu et al., 15	0	0.3294°	16.01%	23.77%	29.54%	6
$\sim v$	Ours	0	5.6835°	3.99%	7.63%	12.11%	4
	Surazhsky-Gotsman, 04	0	0.8893°	12.43%	19.16%	24.13%	29
	Baxter et al., 09	0	2.1933°	10.95%	14.68%	21.89%	16
UUU	Liu et al., 15	0	2.6746°	9.95%	14.18%	20.15%	9
	Ours	0	2.9338°	6.21%	10.94%	15.92%	5

Table 2.	Quantitative	comparisons	between ti	riangulation	quality
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results of [9], [10] improves the minimum interior angle. [12] 10 enhances the proportion of regular triangles but sometimes 11 introduces a few more Steiner points than [9]. While our 12 results are similar to [9] regarding the number of Steiner 13 points, our algorithm creates a much smaller percentage of 14 small angles than [9, 10]. Compared with [9, 10, 12], the 15 minimum angle of our method has been improved greatly 16 while we generally add a fewer number of Steiner points than 17 the alternative methods. Regarding our computational time, 18 most of the examples in this paper take less than 5 seconds. 19 Additionally, as the compatible decomposition and mapping are 20 highly independent, our method can potentially benefit from 21 the parallel computing of GPU, and hence the entire computing 22 process may be done in real-time. 23

#### 6.3. Triangle Deformation Evaluation

We apply the rigid shape interpolation algorithm [7] to transform a source mesh  $\mathcal{T}_{\mathcal{P}}$  into the target one  $\mathcal{T}_{Q}$ . Here, we define an edge deformation function to measure the deformation of each triangle face during the transformation. Given the vertices of a source triangle  $\mathcal{T}_{\mathcal{P}_1} = \{u_1, u_2, u_3\}$  and the target triangle  $\mathcal{T}_{Q_1} = \{v_1, v_2, v_3\}$ , the edge deformation function is defined as:

$$E_{u_a u_b} = \frac{|\|u_a u_b\| - \|v_a v_b\||}{\|u_a u_b\|}, \ a, b \in \{1, 2, 3\}, \ a \neq b$$
(7)

where  $||u_a u_b||$  is the length of the edge that connects vertex  $u_a$  25 and  $u_b$ .



Fig. 9. Mesh deformation evaluation. (top) Dog and cat. (bottom) Alligator.

The deformation of the triangle  $\mathcal{T}_{P_f}$  is defined as:

$$E_f = \frac{1}{3} \sum_{u_a, u_b \in \mathcal{T}_{P_f}} E_{u_a u_b} \tag{8}$$

where  $u_a$  and  $u_b$  are vertices of the *f*-th source triangle in  $\mathcal{T}_P$ .

The deformation function  $E_f$  measures the deformation 2 degree of each triangle. A source triangle  $\mathcal{T}_{P_f}$  will experience 3 very small deformation to transform into the target triangle  $\mathcal{T}_{Q_f}$  as  $E_f$  approaches 0; Otherwise, a source triangle will 5 experience a big distortion as  $E_f$  becomes larger. For a 6 good compatible triangulation, a larger percentage of small 7 deformation E is preferred, which benefits applications such 8 as shape morphing and texture mapping. The horizontal axis 9 of Fig. 9(bottom) shows the deformation values that range 10 from the smallest to the largest deformation values in a mesh. 11 12 For some specific deformation amount of the horizontal axis, the value of vertical axis demonstrates the percentage of 13 triangles that need a deformation smaller than such a particular 14 deformation value. For example, one triangle in the mesh needs 15 a deformation value of 0.5, and more than 90% of triangles 16 generated by our method experience the deformation values less 17 than 0.5. Fig. 9 shows that our method generally creates the 18 compatible meshes with a higher percentage of triangles that 19 experience small deformation E. On the other hand, our method 20 generates fewer triangles that need large deformation during the 21 shape morphing. 22

[37, 38] 23

As illustrated in Fig. 10, we demonstrate the texture 24 mapping using compatible triangulations generated by methods 25

of [9], [10], [12] and ours. The system inputs are a source 26 polygon with texture and a target polygon without texture. We 27 first build the compatible triangulations of two shapes with 28 alternative approaches, as shown in the third and fourth rows 29 in Fig. 8. Based on the compatible meshes, we map the texture 30 of a source shape onto the target one. In general, mapping the 31 texture of a shape onto another very different one always suffers 32 from the texture stretching. As shown in the dog-cat example in 33 Fig. 10 (b-e), nearly all the squares experience some distortion 34 due to the creation of some long thin triangles as shown in the 35 third example in Fig. 8. These long thin triangles need large 36 distortion to be transformed into the target triangles. We can 37 still observe that both [12] and our method preserved some 38 regular squares around the upper body of the cat while our 39 method only generates 1 Steiner point. We then try to map the 40 texture of an alligator between two postures. For the method 41 of [9] in Fig. 8(b), we can see some distortions appear around 42 the abdomen of the alligator. The stretched pattern can also be 43 observed at the back of the alligator for both methods of [10] 44 and [12] as shown in Fig. 8(c) and Fig. 8(d) respectively. 45 Compared with the other methods, ours generates a smoother 46 pattern around the back of the alligator, and the deformation of 47 the abdomen makes more sense. This is because our method 48 generates much more regular triangles that only involve small 49 deformation during the shape morphing process, as shown in 50 Fig. 9(b). 51

#### 6.4. Interactive Shape Morphing System

To test the effectiveness of our approach, we have implemented a prototype of the proposed interactive shape morphing system using a human posture as the input of source shape. Fig. 11(a) shows the setup of our interactive shape morphing system. We use Kinect as the input device of the source shape. The user stands in front of the Kinect, and the system can be controlled by gesture command. For example, the system starts to capture and extract the shape of the user when the user in the scene raises his/her left hand over the head. More commands such as raising two hands to go back to the default capture view have been implemented.

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Fig. 11(b) and 11(c) show the interface of the interactive shape morphing system. As shown in the bottom left of Fig. 11(b), the user adopts a pose as the source input shape. The user can select the target shape in the shape database with a certain gesture such as waving the hand, and then the target shape is rendered in the right of *Edit* window in Fig. 11(b). We then compute the compatible triangulation between the source and target shapes. Finally, we transform the source shape into the target shape based on the compatible meshes. The intermediate results are shown in the Transformation window as shown in Fig. 11(c). More animations generated by our system can be found in Fig. 12.

On the other hand, our interactive shape morphing system can be applied to create animation, movie and even special The typical users may not have the professional effects. resources to create some interesting morphing video, our method and system can simplify the work to produce the 80 interactive morphing video. 81



Fig. 10. Texture mapping comparisons. (a) The source shape with texture. Adding texture to the target shape using the compatible meshes generated by methods of (b) Surazhsky-Gotsman, 04. (c) Baxter et al., 09. (d) Liu et al., 15. (e) Ours.



Fig. 11. The interactive shape morphing system. (a) The system setup. The system interface for capturing the source object image (b) and generating transformations (c).

#### 7. Conclusions

We propose a new method to compute the compatible triangulations of two simple polygons and apply them to 3 2D shape morphing. Our method compatibly decomposes the source and target polygons into sub-polygon pairs and maps 5 the triangulation between a pair of sub-polygons using a sparse linear system. We present a new metric to measure the quality of the resulting mesh during the transformation. In addition, we propose an enhanced scheme to fix compatible triangulations with self-occlusion that benefits sensible transformations. 10 Finally, to demonstrate the proposed algorithm, we build an 11 interactive shape morphing system using the human silhouette 12 as the source shape input. 13

Comparing with previous methods, our compatible polygon 14 decomposition algorithm offers a more flexible way to 15 decompose the source and target polygons such that the 16 minimum interior angle can be maximized at each iteration. 17 This leads to compatible triangulations with more regular-18 shaped triangles as opposed to long thin triangles. This is 19 supported by the analysis that we generate fewer triangles 20 whose minimum angles are small under our approach when 21 compared to methods in [9, 10, 12]. Second, compared to 22

our preliminary work [12], the proposed method generates the<br/>same compatible meshes whether we start the decomposition23from the source or target polygon. Another advantage is the<br/>simplicity of our system that involves only three stages. All we<br/>need is to decompose a polygon, to calculate link paths, and to<br/>solve a sparse linear system, enabling real-time morphing.23

While our method handles well the mapping between shapes, 29 the morphing results need to be further improved. As we focus on generating the compatible meshes, we simply crossfade 31 between textures in the image space. More sophisticated 32 texture blending or image warping algorithms such as [5] 33 can be incorporated into our technique. Currently, the 34 intermediate images interpolated are uniquely determined by 35 a rigid interpolation method [7], which offers no means of 36 control. It would thus be desirable to modify some parts of the 37 intermediate shapes if the users were not satisfied with them. We can explore possible solutions such as the linear constraints 39 proposed in [19] to increase the user controllability. 40

Another drawback of our method is that we cannot deal with 41 polygons with holes. One possible solution would be adding 42 a bridge between the outer polygon and the inner polygons 43 (i.e., the holes). We may connect the outer polygon to all the 44 holes to treat such a polygon with holes as a single polygon. 45 We can then apply our method to decompose the source and 46 target polygons compatibly. While we have shown many 47 examples of compatible triangulations both in the paper and 48 the supplemental video, we also want to test our algorithm on 49 shapes with a more complex structure or completely different 50 topologies in the future. 51

Finally, we want to make better use of the features afforded 52 by commodity depth cameras. It is possible to detect self-53 occlusions in a video sequence using the depth image captured 54 by commodity depth cameras automatically. However, it is hard 55 to recover the occluded textures for human figures with self-56 occlusion, which makes it difficult to compute the cross-fade textures for each in-between transformation. That is why we 58 need a calibration image that offers the full body texture for 59 shape morphing with occlusions. An interesting direction of 60 future work would be to skip the calibration image and compute 61 the compatible triangulation directly from shapes with self-62 occlusions using data from a commodity depth camera. 63



Fig. 12. Producing interactive animation using our interactive animation system: transforming a man into one wolf beast (first row), butterfly (middle row), and bat monster (bottom row).

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Fig. 13. Shape morphing comparisons by using different triangulation algorithms

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