B-morphs between b-compatible curves

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1 ABSTRACT

We define *b*-compatibility for planar curves and propose three 2 ball morphing techniques (b-morphs) between pairs of b-3 compatible curves. B-morphs use the automatic ball-map correspondence, proposed by Chazel et al. [11], from which 5 they derive vertex trajectories (*Linear*, *Circular*, *Parabolic*). 6 All are symmetric, meeting both curves with the same angle, which is a right angle for the *Circular* and *Parabolic*. 8 We provide simple constructions for these *b*-morphs using 9 the maximal disks in the finite region bounded by the two 10 curves. We compare the *b*-morphs to each other and to other 11 simple morphs (Linear Interpolation (LI), Closest Projec-12 tion (CP), Curvature Interpolation (CI), Laplace Blend-13 ing (LB), Heat Propagation (HP)) using seven measures of 14 quality deficiency (travel distance, distortion, stretch, local 15 acceleration, surface area, average curvature, maximal cur-16 vature). We conclude that the ratios of these measures de-17 pends heavily on the test case, especially for LI, CI, and 18 LB which compute correspondence from a uniform geodesic 19 parameterization. Nevertheless, we found that the Linear b-20 morph has consistently the shortest travel distance and that 21 the Circular b-morph has the least amount of distortion. 22

23 Categories and Subject Descriptors

I.3.7 [Computer Graphics]: Two-Dimensional Graphics
 —Animation

26 Keywords

Morphing, Curve Interpolation, Medial Axis, Curve Aver aging, Surface Reconstruction from Slices, Ball map

²⁹ 1. INTRODUCTION

30 1.1 Problem statement

A variety of techniques have been proposed for computing automatically a morph between two curves P and Q in the plane (see [28] and [2] for examples). In this paper, we present a new family of morphs, which we call the *b*-morphs, and discuss two related issues: (1) How to compare different Jarek Rossignac Georgia Institute of Technology Atlanta, GA 30332 jarek@cc.gatech.edu



Figure 1: A morph between an apple and pear along *Circular b-morph* trajectories (top left).

morphing solutions and (2) How do the *b*-morphs introduced here compare to other approaches.

1.2 Motivation and applications

Morphing is a fundamental tool in animation design where in-between [10] frames are produces from a sparse set of keyframes that are often designed by lead artists [48]. Although several successful attempts at automating the construction of in-between frames have been proposed [33], the artist responsible for in-betweening like to have control over correspondence and the trajectories selected landmarks or stroke end-points. These specifications are difficult to automate because they involve aesthetic judgement, style guidelines, and context semantics about the relative 3D motions of the strokes and their mutual occlusions.

Once these matching and control trajectories are given, the overall problem is naturally broken into a series of tight inbetweening taskss [38]. These are viewed as tedious and hence are a prime candidate for artist-supervised automation. In most of such tight in-between tasks, the goal is to generate a small number of intermediate frames between two reasonably simple and aligned curve segments.

57 At this point, it is unreasonable to ask the artist to identify 58 a good set of candidate techniques that promise to gener-

- ⁵⁹ ate acceptable morphs. Then, rather than offloading upon
- the artist the burden of choosing the best one in each case,
- 61 one may want to compare these techniques to better assess

the strength of each. This paper is a modest-although we 62 hope useful-step in this direction. It may not be the final 63 answer to tight in-betweening for several reasons: (1) The 64 quantitative quality measures that we use may not reflect 65 artistic concerns. (2) For practical reasons, we compare the 66 proposed *b*-morphs to our simple and un-optimized imple-67 mentations of candidate techniques, and not to state of the 68 art solutions. (3) We do not take into account the broader 69 context of the whole animation, but instead focus on inter-70 polating only the instances of the same stroke in two consec-71 utive key-frames. Nevertheless, we feel that the experiments 72 described here are useful and that the conclusions we draw 73 from them about the specific benefits of the *b*-morphs will 74 help the reader appreciate their potential. 75

116 Furthermore, the problem (encountered in the segmentation 76 of medical scans) of constructing a surface in 3D that in-77 118 terpolates between each pair of consecutive planar cross-78 119 sections may be solved [14] using the morphing between the 79 projection, onto the same plane, of the two cross-section 80 120 curves. This problem of surface reconstruction has been 81 studied extensively [16][6][1][25][17]. 82 121

122 As it was the case for tight in-betweening, our investigation 83 of the benefit of *b*-morphs to the problem of cross-section 84 123 interpolation has limitations. For example, it only considers 85 124 two consecutive slices, instead of building a smooth surface 86 125 through the whole series, as proposed in [7]. However, be-87 126 cause the *b*-morph reach the interpolated contours at right 88 angles, the projection of these trajectories on the slice plane 89 127 in C^1 . We expect that this property may help researches 90 128 devise solutions that smooth connect surface sections gener-91 129 ated by *b*-morphs. 92 130

Furthermore, the approach is limited to *b*-compatible curves 93 and hence is not suited for dealing with topological changes, 94 95 as discussed for example in [26].

In both applications, the quality of the morph is impor-96 tant as one typically favors a solution where the anima-¹³⁵ 97 tion or interpolating surface is smooth and free from self- 136 98 intersections [20] and unnecessary distortions. We show that 137 99 when the curves are *b*-compatible, the *b*-morph always satis- ¹³⁸ 100 fies these properties. 139 101

1.3 **Contributions** 102

We propose a family of three new morphing techniques (that 103 143 we call *b*-morphs) for which the correspondence and the ver-104 144 tex trajectories are both derived from the maximal disks and 105 their tangential contact points with the curves. 106

146 We propose seven measures of quality inadequacy: travel 107 147 distance, distortion, stretch, local acceleration, surface area. 108 148 average curvature, and maximal curvature. 109

149 We use these measures to compare the *b*-morphs to each 110 150 other and also five simple morphing techniques which we 111 151 have implemented (Linear Interpolation (LI), Closest Pro-112 152 jection (CP), Curvature Interpolation (CI), Laplace Blend-113 ing (LB), Heat Propagation (HP)). 114

Limitation 1.4 115



Figure 2: Maximal disks (left) and medial axis (right) with bifurcation disks shown in green

Our *b*-morph constructions assume that the two curves have been registered and are sufficient similar. We provide a formal definition of compatibility that captures these assumptions for the two situations considered here:

- 1. P and Q are each a simple closed loop.
- 2. P and Q are open curve segments and share the same two end-points.

Loosely speaking, our compatibility conditions require that each maximal disk [46] in the finite region bounded by the union of the two curves have exactly one contact point with each curve (see Fig. 2).

Where P and Q are similar but not properly registered, one may consider combining a b-morph with the animation of a rigid or non-rigid registration [50] or of a smooth space warp [8], as was done for image morphs [9]. Numerous solutions to the automatic registration problem have been proposed using ICP [21], automatically identified landmarks [36] [27] [37], or distortion minimizing parameterization [51] [42].

Structure of the paper 1.5

Section 2 briefly reviews prior art in curve morphing and slice interpolation. Section 3 provides a precise definition of *b*-compatibility and contrasts it with a previous discussed notion of normal compatibility. Section 4 presents our three *b*-morphs and compares their properties with the closest projection morphs. Section 5 defines the seven measures we compute and explains our strategy for sampling and for a fair integration of these measures over the set of all trajectories. Section 6 discusses our results.

2. **PRIOR ART**

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A large variety of techniques have been investigated for the automatic generation of in-betweening frames or animations that morph between two planar curves.

We only discuss techniques that are appropriate to the tight in-betweening problem addressed here. Hence, we do not discuss the problems of registration or landmark (salient feature) identification.

First, we consider techniques that assume that the corre-153 spondence between vertices or samples on both curves is 155 either given by the artist or computed automatically using



Figure 3: Example Minkowski morphs between convex (left) and non-convex (right) shapes.

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uniform geodesic sampling, minimization of area or travel [25],
 curvature-sensitive sample [19], or optimization of match ing to affine transformations extracted from an example
 morph [47].

If the correspondence is given, the simplest approach is to 160 use a linear interpolation between corresponding pairs. Lin-161 200 ear trajectories are computed between these pairs of points 162 210 points on P and Q in order to produce morph curves with 163 211 vertices $v_i = p_i + t(q_i - p_i)$. We include this *Linear Inter-*164 212 polation (LI) in our benchmark set of approaches that we 165 213 compare to the *b*-morphs. This naïve approach may lead to 166 unpleasant artifacts, such as self-intersections in the inter-167 214 mediate frames (as for example pointed out by [44]). The 168 215 Linear Interpolation fails to take into account the relative 169 216 orientation and curvature of the curves at the correspond-170 217 ing points. A Poisson equation method [54] may be used to 171 218 produce better vertex trajectories. 172 219

To take these into account, a popular morphing technique 173 proposed by [43] for polygonal curves interpolates the lengths 174 221 of corresponding edges and the angles at corresponding ver-175 222 176 tices and use optimization to ensure that the curve closes 223 properly. We include a simple version of this approach, 177 224 which we call *Curvature Interpolation* (CI) in our bench-178 225 mark set. When it is applied to open curve segments, we 179 226 ensure that the interpolating frames meet at end-point con-180 227 straints by retrofitting them through a trivial similarity trans-181 formation (rotation, scaling, and translation). 182 228

229 A different approach that takes into account the relative 183 230 orientation and curvature of the two curves at the corre-184 sponding samples is to compute the local coordinates of each 185 vertex in the coordinate system defined by its neighbors on 231 186 each curve. Then, the corresponding local coordinates are 187 232 average linearly to produce a *desired* set of local coordinates 188 for a given frame. Iterative techniques may be used to con- 233 189 struct a curve that satisfies the two endpoint constraints 234 190 and minimizes the discrepancy between the actual and de-235 191 sired local coordinates. Variations of these techniques have 236 192 been successfully used [24]. We include a simple version of 193 this approach, which we call *Laplace Blending* (LB), in our ²³⁷ 194 benchmark set. 238 195

Vertex trajectories and correspondences may also be solved 240
by solving a PDE or by computing a gradient field that inter- 241

by solving a PDE or by computing a gradient field that inter polates the two contours and then following the steepest gra 242

dient to obtain the trajectory of each point or equivalently,

the in-between frames may be obtained as iso-contours of 243

²⁰¹ that field. A heat propagation formulation may be used to ²⁴⁴



Figure 4: A morph between two offset circles along *Circular b-morph* trajectories (top left).

characterize the desired field [18]. We include a simple version of this approach, which we call *Heat Propagation* (HP), in our benchmark set.

Several approaches for morphing closed curves use compatible triangulations [4] of their interior [52][29][2] or compatible skeletons to ensure rigidity [45][13]. Other approaches blend distance fields to both surfaces [32][17].

We separate the approaches that establish correspondence using a direct geometric criterion (as opposed to a global optimization or feature recognition as discussed above) into three categories: (1) Proximity-based, (2) Orientation-based, and (3) both Proximity- and Orientation-based.

The popular distance-based approach is the closest point projection, which to each point p on P maps a point q on Qthat minimizes the distance to p. Variations of this approach are used for Iterative Closest Point (ICP) registration [15]. We include a simple version of this approach, which we call *Closest Projection* (*CP*) in our benchmark set.

An orientation-based approach is the Minkowski morph [39] and yields satisfying results, even when the shapes are not aligned (see Fig. 3 left). For smooth curves, the approach establishes a correspondence between points with the same normal. Unfortunately, as shown in Fig. 3 (right), the approach may yield surprising and self-intersecting frames when the two curves are not convex. Hence, we do not include it in our benchmark.

The *b-morphs* proposed here take into account both proximity and orientation. We discuss them in detail between and compare then against our benchmark set.

3. COMPATIBILITY

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In this section, we define compatibility between curves.

A curve is *simple* if it is planar, connected, free from selfintersections, and if it is topologically closed. A simple curve is either a *loop* (no end-points) or a *stroke* (two endpoints). We consider two simple curves, P and Q.

Given a closed and regularized [49] set X, following [46], we say that a disk in X is maximal if it is not contained in any other disk in X and we define the medial axis as the closure of the union of the maximal disks in X. The closest projection of a point m onto a curve P is a set of points $p \in P$ for which ||m - p|| = distance(m, P).

 $Definition \ 1.$ B-compatibility: Let P and Q be simple curves, such that $P\cap Q$ is zero-dimensional, P and Q are



Figure 5: Two curves that are *b*-compatible, but not c-compatible.

- 292 *b*-compatible if and only if the following conditions are sat-245 293 246 isfied:
- 1. P and Q are either both loops or both strokes. 247
- 2. If P and Q are strokes, the endpoints of Q are identical 297 248 to the endpoints of P. 298 249 299
- 3. The medial axis M of the finite and closed set X300 250 bounded by $P \cup Q$ is simple. 301 251

4. Each point $m \in M$ has a unique closest projection p 303 252 on P and a unique closest projection q on Q. 253

306 We contrast *b*-compatibility with the following definition of 254 307 *c*-compatibility. 255 308

Definition 2. C-compatibility: Two curves, P and Q are 309 256 c-compatible if for every point p on any one of them, the 310 257 311 closest projection onto the other is a single point. 258 312

- A more precise definition of c-compatibility is discussed in [12].³¹³ 259 314
- The term *B*-compatibility stands for "ball-compatibility" and 260 *c-compatibility* stands for "closest-point compatibility". 261

Two curves are *c-compatible* when each one can be expressed 317 262 as the normal offset of the other. Two curves are defined as 318 263 $b\mathchar`-compatible$ when each can be expressed as the ball-offset 319 264 of the other, i.e., as the envelope swept by a variable radius 320 265 disk as it rolls on the other curve. 266 321

As shown in Fig. 5, one may easily find cases where two 267 strokes are *b*-compatible, but not *c*-compatible. In such cases, 268 the *b*-morphs proposed here will work, while the Closest Pro-269 *jection* (*CP*) morph may not. 270

Let h be the Hausdorff distance [30] between P and Q. Re-327 271 call that h is the smallest r for which $P \subset Q^r$ and $Q \subset P^r$, 328 272 where the offset [41] X^r is the set of points at distance r or 329 273 less from X. 330 274

We use the term *minimum feature size* (or reach [22]) as the $_{332}$ 275 set X defined as the largest r for which $F_r(X) = X$, where 333 276 the mortar [53] $F_r(X)$ of X is the set not reachable by an 334 277 open ball of radius r that does not intersect X. 335 278

Chazel et al. [11] show that if P and Q are smooth loops 337 279 280 and their Hausdorff distance is less than the minimum fea-338

ture size (mfs) of both P and Q, then P and Q are bcompatible. Note that this is a sufficient, but not necessary condition. In contrast, Chazel et al. [12] show that two curves are c-compatible when their minimum feature size fand their Hausdorff distance h satisfy the following relation: $h < (2 - \sqrt{2})f.$

Finally, it has been shown [11] that when two curves are *b-compatible*, their Hausdorff distance and their Fréchet distance [3] are identical.

Through the rest of the paper, we assume that P and Q are *b-compatible* and that M is their medial axis.

4. **B-MORPHS**

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In this section, we describe the correspondence used for our *b*-morphs and present the various options for *b*-morph trajectories between corresponding pairs of points. The definitions are independent of the nature of the two curves and of their representation. We have implemented these techniques for two domains: (1) smooth (C^1) piecewise circular curves [40], and (2) relatively smooth polygons (such as those obtained through smoothing or subdivision). Our implementation on pairs of b-compatible piecewise-circular curves is numerically precise and yields the theoretically correct *b*-morph. Clearly, the implementation for polygons is not theoretically correct. Indeed, the polygonized versions of two b-compatible curves are not b-compatible, because the region they bound must have convex vertices and hence bifurcations in its medial axis. Nevertheless, when the polygonal curves are reasonably smooth and densely sampled, our polygonal algorithm computes *b*-morphs that closely approximate the *b*-morphs of the original smooth curves and are acceptable for animation or surface reconstruction. Because most other morphing schemes to which we compare our *b*-morphs work on polygonal curves, we use the polygonal *b*-morph implementation to ensure consistency.

4.1 **Ball-map correspondence**

Consider the maximal disk centered at point $m \in M$. The ball-map [11] establishes the correspondence between the closest projection p of m onto P and the closest projection of q of m onto Q. The maximal disk D centered at m touches P at p and Q at q, as shown in Fig. 6. The ball-map may be viewed as a continuous version of an approach proposed by [32] for establishing correspondences between surfaces by considering their distance fields.

A uniform sampling of the ball-map correspondence may be computed in several ways: (1) By initially computing M as the medial axis of the symmetric difference between the two curves using efficient medial axis construction techniques [23][55] and then generating the closest projections pand q for a set of uniformly spaced sample points $m \in M$; (2) By computing the radii of the maximal disks that touch p at a set of uniformly spaced samples p; or (3) By simultaneously advancing the corresponding points, p and q, until one of them has travelled from the previous sample on its curve by a prescribed geodesic distance along the corresponding curve. To ensure a fair comparison with techniques that lack the symmetry of the *b*-morphs, we will use the second (asymmetric) approach, although the first one yields the best results.



Figure 6: To obtain the point q on Q that corresponds, through the ball-map, to point p on P, we compute the smallest positive r such that m = $p+rN_n(q)$ is at distance r from Q and return its closest projection q on Q. Point m is on the median M (red) and defines the center of the circle tangent at both pand q. The Circular (black) and Parabolic (purple) *b*-morph trajectories are defined by the inscribing isosceles triangle (p, m, q). The Linear b-morph trajectory is the line segment (p,q).

372 The details of the construction of this mapping for the case 330 373 when P and Q are piecewise-circular and when they are 340 374 polygonal approximations of smooth curves are provided in 341 the Appendix. 342 376

B-morph trajectories 4.2 343

- For each maximal disk, we consider five paths (curve seg-344 378 ments) from p to q (Fig 2): 345
- 380 Hat: The broken line segment from p to m to q (Fig 6 346 green). 347 381
- *Linear*: The straight line segment from p to q (Fig 6 yel-348 383 low). 349 384
- Tangent: The shorter of the two circular arc segments of 350 the boundary of D that joins p and q (Fig 6 green). 351
- 387 *Circular*: The circular arc segment that is orthogonal to P352 at p and to Q at q (Fig 6 black). 353
- **Parabolic:** The parabolic arc segment that is orthogonal to 389 354 P at p and to Q at q (Fig 6 violet). 390 355

The *Circular* and *Parabolic* paths are trivially defined by 392 356 their enclosing isosceles triangle (Δpmq) . For example, the 303 357 Parabolic path is the quadratic Bézier curve with control 394 358 vertices p, m and q and the center of the circle supporting 395 359 the *Circular* path is the intersection of the tangent to P at 396 360 p and the tangent to Q at q. 397 361

All paths, including the *Linear* path, are symmetric in that 398 362 the angles where they meet P and Q are the same. Swapping 399 363 the role of P and Q does not affect these segments. Hence, 400 364 the *b*-morphs derived here are symmetric and may be in- 401 365



Figure 7: The associated average curves for the various *b*-morph constructions.

verted easily by swapping the role of P and Q and reversing time.

Let l be the midpoint of the *Linear* path and let L be the set of all points l. Note that L is the midpoint locus proposed by Asada and Brady [5]. Let t be the midpoint of the tangent path and T be the set of all points t. Note that T is the PISA proposed by Layton [34] as a variation of the medial axis. Let n be the midpoint of the *Circular* path and N the set of all points n. Let b be the midpoint of the *Parabolic* path (quadratic B-spline) and B be the set of all points b. The construction of these 4 points, along with m is illustrated in Fig. 6.

The curves M, L, T, N and B usually differ from one another, but may all be viewed as *averages* of P and Q. The are shown superimposed in Fig. 7.

A b-morph advances each point p according to uniform arclength parameterization along one of the aforementioned paths. A result, sampled at 7 intermediate points along each path of the *Circular b-morph* is shown in Fig. 4.

5. MEASURES

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We first discuss how we sample space and time. Then, we provide details of the measures used here to compare morphs.

5.1 Measure normalization

Three of the studied morphs (Linear Interpolation, Curvature Interpolation, and Laplace Blending) assume a given correspondence. For simplicity, we use a uniform arc-length sampling to produce the same number of uniformly distributed samples on each curve. The three *b*-morphs use the ball-map correspondence. The other morphs compute their own correspondence. This sampling disparity makes it difficult to compute measures for a fair comparison.

Consider for example the problem of measuring the average travel distance. This should be the integral of travel distances. The problem is how to fairly select the integration element. If for example we use LI morph, then the average 402 distance measured for a set of uniformly distributed samples

403 will depend on whether we start form P or Q. Since the av-

 $_{404}$ $\,$ erage $travel\ distance$ is a property of the mapping, and not

 $_{405}$ $\,$ the sampling, a measure that so blatantly depends on the

406 sampling is clearly incorrect.

To overcome this problem, each reported measures is the 407 average of two measures, one computed by sampling P and 408 one computed by sampling Q. For the first measure, we 409 sample the departure curve P using a dense set of samples 410 that are uniformly distributed on each curve so as to be 411 separated by a prescribed geodesic distance u. For each 412 sample p_i on P, we compute the corresponding point q_i on 413 the arrival curve Q so that q_i is the image of p_i by the 414 mapping associated with the particular morphing scheme. 415 We compute a measure m_i associated with the trajectory 416 448 from p_i to q_i and the associated weight $w_i = (d(p_i - 1, p_i) +$ 417 $d(q_{i-1}, q_i) + d(p_i, p_{i+1}) + d(q_i, q_{i+1}))/4$. Then, we report the 418 normalized weighted average $(\Sigma w_i a_i)/(\Sigma w_i)$. For the second 419 measure, we sample the arrival curve Q as before using the 420 same geodesic distance u. For each sample q_i on Q, we 449 421 compute the corresponding point p_i on the departure curve 450 422 P, so that q_i is the image of p_i by the mapping associated $_{451}$ 423 with the particular morphing scheme. Then, we proceed as 424 above. 425

426 5.2 Morph Measures

⁴²⁷ We have implemented the following seven measures.

⁴²⁸ *Travel distance.* For each sample p_i , we measure m_i as the ⁴²⁹ arc length of the trajectory to the corresponding point q_i . ⁴³⁰ Then, as explained in Section 5.1, we report the weighted

 $_{\rm 431}$ $\,$ average of these from P to Q and vice-versa.

432 Stretch. We define stretch S(P,Q) as the average of the 433 integral over time of the stretch factor for an infinitesimal 434 portion of the curve. We compute its discrete approximation 435 as follows. Let p and p' be consecutive samples on P. Let 436 L(p,t) be the length of the segment of P(t) between p(t)437 and p'(t). We compute S(P,Q) as

$$\begin{split} S(P,Q) &= \sum_{t \in [0,1-\epsilon]} \left(\sum_{p \in P} |L(p,t+\epsilon) - L(p,t)| \right) \\ &+ \sum_{t \in [0,1-\epsilon]} \left(\sum_{q \in Q} |L(q,t+\epsilon) - L(q,t)| \right) \end{split}$$

Acceleration. Acceleration, or unsteadiness [50], is defined
as the derivative of the expression of velocity in the local,
time-evolving frame, and which measures the lack of steadiness of the motion.

442 To compute *acceleration*, let p_t denote the position of a sam-

 $_{443}$ ple p at a time t. We approximate the instantaneous veloc-

444 ity of p_t by the vector $p_t p_{t+\epsilon}$. For each such velocity on a 461 445 morph trajectory, we compute two barycentric coordinate 462

⁴⁴⁵ morph trajectory, we compute two barycentric coordinate ⁴⁶² ⁴⁴⁶ vectors $B_L(p_t p_{t+\epsilon})$ and $B_R(p_t p_{t+\epsilon})$ relative to the left and ⁴⁶³

447 right neighboring triangles L_t and R_t as shown in Fig. 8. 464



Figure 8: Computation of *acceleration* (steadiness) for a given vector v of the morph trajectory is computed relative to the neighboring triangles (green).

The steadiness at a point p_t is then computed as:

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$$g_t = \frac{1}{2} \|B_L(p_{t-\epsilon}p_t) - B_R(p_{t-\epsilon}p_t)\| \\ + \frac{1}{2} \|B_L(p_tp_{t+\epsilon}) - B_R(p_tp_{t+\epsilon})\|$$

We compute the acceleration measure m_i as the sum of the g_i terms over the trajectory of each point p_i and report their weighted average, as described above.

Distortion. At each point along the evolving curve and at each time, the amount of distortion is proportional to $1/\cos\theta$, where θ is the angle between the direction of travel and the normal to the evolving curve.



Figure 9: The *b-morph* produces a pure rotation with zero distortion between linear segments in 2D (left) and planar segments (in 3D).

Let p and p' be consecutive samples on P and L(p, t) define the length of the segment pp'. Let V(p, t) define the length of the segment $p_t p_{t+\epsilon}$. We compute

$$R = \sum_{t \in [0,1-\epsilon]} \left(\frac{\frac{1}{2} (L(p,t) + L(p,t+\epsilon)) \cdot \frac{1}{2} (V(p,t) + V(p',t))}{Area(p_t p'_t p'_{t+\epsilon} p_{t+\epsilon})} \right)$$

It was shown in [11] that (1) the *b*-morph is a C^{k-1} isotopy when the inputs are C^k for $k \ge 2$ and (2) that the Circular *b*morph is free from distortion when morphing between line segments (in 2D) or planar portions (in 3D) of P and Q(Fig. 9).

5.3 Mesh measures

In addition to the 2D measures, we also present results of 3D measures of surface area and also average and maximum squared mean curvature [35] of the resulting triangle mesh



Figure 10: We show the slice-interpolating surface reconstructed using a *Closest Projection* morph from-green-to-blue (left), the reverse *Closest Projection* morph from-blue-to-green (center), and the symmetric *Circularb-morph* (right) which appears smoother. The amount of local *distortion* is shown in red on the 2D drawings.

 $_{465}$ $\,$ surfaces. In applications of surface reconstruction from 2D $_{520}$

planar contours, minimizing the surface area and smoothness of the resulting reconstruction is often desirable (see 521

468 Fig. 10).

469 6. RESULTS

⁴⁷⁰ We first compare the *b*-morphs to our benchmark set' us-⁴⁷¹ ing two different test cases, as shown in Figures 11 and 12.

⁴⁷¹ ing two different test cases, as shown in Figures 11 and 12. $_{526}$ ⁴⁷² Then, we compare two of the *b*-morphs to the best two other $_{527}$

473 morphs (Laplace and Heat) on a test case between an apple $_{528}$ 474 and a pear. The *CP* morph is not used since it is incompat- $_{599}$

⁴⁷⁵ ible for the cases shown here (Fig. 5).

531 The first test case (Fig. 11) shows a morph between two 476 532 offset circles. The *b*-morphs work even if the two curves 477 533 478 intersect. Some of the benchmark morphs do not. Hence, 534 479 to accommodate their limitations, we have split the curves 535 at their intersections and performed morphs independently 480 536 on corresponding strokes. 481 537

538 Our experiments demonstrate that the average travel dis-482 539 tance is the shortest when using the Linear b-morph and 483 540 that the Circular b-morph has the least amount of distor-484 541 tion. The HP morph is the closest in terms of appearance 485 542 and measure to the Circular b-morph. 486 543

544 The second test case (Fig. 12) shows a set of symmetric 487 545 'S' shaped curves. This example highlights the strength of 488 546 the morphs which compute their own correspondence (HP, 489 547 *b*-morphs). The other results, which define correspondence 490 through uniform arc-length parameterization exhibit extreme 548 491 distortion and travel lengths and produce self-intersections 549 492 with the original curves. Again, the HP morph is closest to 550 493 the family of *b*-morphs in terms of measure and appearance. 551 494 552

The final test case (Fig. 13) uses contours representing an 553 495 apple and a pear. We show the best four morphs (*Linear* b-554 496 morph, Circular b-morph, Heat Propagation and Laplace 555 497 Blending) and compare their measures. The measures for 498 556 these four are quite similar. Travel distance and distortion 557 499 are still minimized for the *Linear* and *Circular b-morphs*, 558 500 respectively. The LB approach comes wins in terms of ac-501 559 502 celeration, stretch and curvature. 560

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8. CONCLUSION

We have proposed a family of morphs between curves which are *b*-compatible. All are based on variations of the medial axis construction. We have compared them to one another and to several other simple morphs. We used four measures of morph quality in our comparison, as well as surface measures for comparing them as surface reconstruction techniques.

Although the Heat morph produces very similar results to the *b-morph*, it has the disadvantage of requiring several steps, including rasterization to a grid, PDE solve, and point tracking. Due to the rasterization, it would also be sensitive to inputs which intersect or self-intersect. This method would be desirable for more extreme cases that are not *bcompatible*.

We conclude that for the cases of *b*-compatible shapes, the *b*-morphs offer a precise and desirable result in terms of distortion, travel distance, as well as curvature. The Circular *b*-morph is guaranteed to produce morph curves of C^{k-1} continuity for inputs of C^k for $k \geq 2$.

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Figure 11: Morph results for offset circles, showing the morph curves (top), the morph trajectories (middle) and the surface created by linearly interpolating the morph curves along the z-axis (bottom). Also displayed are the measures for each (bottom-right). Each measure is normalized independently for easy comparison.

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Figure 12: Morph results for a set of 'S'-shaped curves, showing the morph curves (top), the morph trajectories (middle) and the surface created by linearly interpolating the morph curves along the z-axis (bottom). Also displayed are the measures for each (bottom-right). Each measure is normalized independently for easy comparison. Note that some of the morphs do not remain within the bounds of the inputs.



Figure 13: Morph results for a set of apple and pear shaped curves, showing the morph curves (top), the morph trajectories (middle) and the surface created by linearly interpolating the morph curves along the z-axis (bottom). Also displayed are the measures for each (bottom-right). Each measure is scaled independently for easy comparison.

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APPENDIX

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742 A. ADDITIONAL DETAILS

A.1 Case of partly overlapping curves

In Section 3, we state that one of the requirements for *b*compatibility is that the $P \cap Q$ is zero dimensional. This constraint is overcome by removing sections of the curves that overlap, breaking them into sub-curves and computing morphs on them. This is because the overlapping sections of the curves would be static through time and the correspondence is already explicitly defined.

A.2 Details of the B-morph construction

The contributions reported here are primarily theoretical and independent of dimension, representation, and implementation. However, to convince the reader that the *bmorph* provides a practical solution, we include here the details of an exact implementation (Expect for numerical round-off errors) for the case of piecewise-circular curves [40] in 2D, where P and Q are each a series of smoothly connected circular-arc edges.

Now assume $p \notin Q$. We compute the corresponding point qfrom p as follows. Consider the parameterized offset point $m = rN_P(p)$, whose distance from p is defined by the parameter r. Here, we have oriented $N_P(p)$ so that it points



Figure 14: Computing r, m and q from p for a circular arc Q_i .



Figure 15: Lacing steps that divide the gap into slabs

towards the interior of the gap. m is the center of a circle of radius r that is tangent to P at p. We want to compute the smallest positive r for which m is at distance r from Q, and hence for which the circle is tangent to Q. Note that when P and Q are *b*-compatible, to each p corresponds a unique point q. The set of points m is the median of the two shapes.

⁷⁷⁰ First consider a circular edge Q_i of Q with center c and ⁷⁷¹ radius s (Fig. 14). We compute r_1 and r_2 as the roots $(s^2 - cp^2)/(2N_P(p) \cdot cp \pm 2s)$ of $cm^2 = (r \pm s)^2$ and keep the ⁷⁷³ smallest positive solution for which the ball-map $(q_1 \text{ or } q_2)$ ⁷⁷⁴ lies in Q_i .

We apply the above approach to all edges Q_i of Q. We compute the r-value for a circle supporting each edge, compute the corresponding candidate point q on the circle, discard it if it falls outside of the edge, and select amongst the retained (r,q) pairs with the smallest r-value.

We assume that P and Q are *b*-compatible. There is exactly one (r, q) pair for each point $p \in P$. The above process computes the *b*-morph correspondence for any desired sampling of P or Q.

To accelerate the computation of the *b*-morph and produce 784 000 a sampling-independent representation from which different 785 000 samplings densities can be quickly derived, we perform a 786 810 "lacing" process (Fig. 15), to split the gap into *slabs*, each 787 811 bounded by 4 circular arcs: one being a segment of an edge 788 of P, one being an edge-segment of Q, and two being Cir-789 cular b-morph trajectories from a vertex of P or Q to its 790 image on the other curve. 791

To perform the lacing, we first pick a vertex $p \in P$, where two edges of P meet and compute its image $q \in Q$ as described above. Then, we perform a synchronized walk to "lace" the gap, one vertex of P or Q at a time. At each step, p is the start of an edge-segment P_i of P not yet laced and qis the start of an edge-segment Q_k of Q not yet laced. Let p'



Figure 16: Lacing splits the gap into slabs. Each one is bounded by 4 circular arcs (2 edge-segments and 2 trajectories) and defines a *b-morph* from an edge-segment of P to an edge segment of Q.



Figure 17: The equations for computing the ballmap radius r given an initial point P and direction (normal) V for mapping to a point Q (left), an edge AB (center), and a circle C (right).

be the end of P_i and q' be the end of Q_k . Let q'' be the corresponding point for p' and p'' be the corresponding point for q'. If p'' falls on P_i , we record that the edge-segment [q,q'] of Q_k maps to the edge-segment [p,p''] of P_i , close the current slab with the trajectory from q' to p'', and set p to p'' and q to q' to continue the lacing process, as shown in Fig. 15.

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This lacing process splits the edges of P and Q into edgesegments and establishes a bijective mapping between edgesegments of P and edge-segments of Q that bound the same slab. The cost of this pre-computation is O(n) in the number of edges in P and Q. It can be performed in real-time, as the curves are edited, which is convenient for the interactive design of a 2D morph.