# Exact medial axis of quadratic NURBS curves

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#### **Abstract**

We study the problem of the exact computation of the medial axis of planar shapes the boundary of which is defined by piecewise conic arcs. The algorithm used is a tracing algorithm, similar to existing numeric algorithms. We trace the medial axis edge by edge. Instead of keeping track of points on the medial axis, we are keeping track of the corresponding footpoints on the boundary curves, thus dealing with bisector curves in parametric space. We exploit some algebraic and geometric properties of the bisector curves that allow for efficient trimming and we represent bifurcation points via their associated footpoints on the boundary, as algebraic numbers. The algorithm computes the correct topology of the medial axis identifying bifurcation points of arbitrary degree.

#### 1 Introduction

The medial axis (MA) of an object can be defined as the locus of the centres of maximal bitangent disks and was originally introduced by [1]. The medial axis of a simple closed shape has a tree-like structure that provides an efficient shape representation. Along with a radius function, the MA allows for restoration of the original object, an operation called medial axis transform (MAT).

Due to its wide range of applications in biology, path planning and pattern analysis it has been studied extensively [4, 3, 11]. However most efforts consist of numerical algorithms to trace the bisector curves. Another approach is to approximate the boundary of the shape with simpler curves or line segments. However the resulting MA may require expensive post-processing, or be incorrect, as it is very sensitive to perturbations of the boundary of the shape.

Recently, with the availability of algebraic libraries and faster CPUs, there has been interest in exact algorithms following the exact computation paradigm. Successful examples of this approach are the exact and efficient arrangement of conic arcs and the Voronoi diagrams of circles and ellipses [7].

Following this trend, we apply exact computation techniques to the problem of medial axis computation. In theory, one can study some algebraic system and map the problem to the study of an arrangement of algebraic curves, parts of which are the medial axis

edges. However, this can lead to highly inefficient computations due to the degree and bitsize explosion of the computed quantities. Therefore, we focus on the parametric representation of the shape, trying to understand the deeper relation between simple geometric constructions (like the tangent line and the circle of curvature) and the parametric bisector curves.

We chose to use a simple  $O(N^2)$  algorithm that also works with objects with holes. The algorithm includes a tracing step which we substitute with an exact one. Therefore, no tracing is included and all critical points are guaranteed to be identified. The idea is to start tracing the medial axis, always computing the next branching or terminal point in one step. The algorithm used is adapted from [12]. The branching point is the center of a maximal disk that is tangent to at least three distinct footpoints, while a terminal point corresponds to a local curvarture maximum ([4]). We work in the parametric space, in a manner similar to [13], however for efficient trimming of the bisector curves we exploit some algebraic and geometric properties.

## 2 Representation

The input is a simply connected closed shape consisting of a sequence of NURBS curves of degree 2, that is, conic arcs. The shape may contain holes, that are also piecewise conic arcs themselves. We follow the notation of [10]. The reason we focus on degree 2 NURBS curves is that they are powerful enough to express a wide variety of curves (elliptic, circular, hyperbolic, parabolic arcs) while keeping the algebraic complexity within reasonable bounds at the same time (comparison of algebraic numbers of degree 184 in the worst case). Given three control points  $\bf P_0$ ,  $\bf P_1$ ,  $\bf P_2$  and a shape factor s (cf. Fig. 1), we represent a conic arc, parametrized by t, from  $\bf P_0$  to  $\bf P_2$  through  $\bf P_1$  as

$$\mathbf{C}(t) = \frac{(1-t)^2 \mathbf{P_0} + 2t(1-t) \frac{s}{1-s} \mathbf{P_1} + t^2 \mathbf{P_2}}{(1-t)^2 + 2t(1-t) \frac{s}{1-s} + t^2}, \ t \in [0,1].$$

As parameter t traces the arc, we assume that the interior of the shape lies always on the left. Therefore, convex boundary arcs have positive or CCW orientation, while concave boundary curves have negative or CW orientation. The control points have the property that the segments  $\mathbf{P_0P_1}$  and  $\mathbf{P_1P_2}$  are tangent to  $\mathbf{P_0}$  and  $\mathbf{P_2}$  respectively. Note that  $\mathbf{C}(0) = \mathbf{P_0}$  and  $\mathbf{C}(1) = \mathbf{P_2}$ . When s < 1/2 we have an ellipse, when

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s = 1/2 we have a parabola, and 1/2 < s < 1 yields a hyperbola, as shown in Fig. 1.

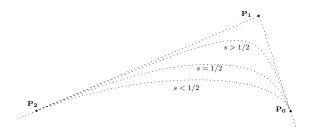


Figure 1: Definition of a quadratic NURBS arc.

#### 3 Bisector curves

Each point on the medial axis is the center of a disk tangent to at least two points of the boundary of the shape. Therefore, the points of the medial axis lie on bisector curves of planar rational curves, or on bisector curves of a point and a curve. They may also lie on the self-bisector of a single curve. The bisector curve of planar rational curves is an algebraic curve and can be defined implicitly in the parametric space as the common intersection of the normal lines at the footpoints and the segment bisector of the footpoints themselves [5]. It is of lower degree than the implicit equation in the cartesian space. We can verify that for conics, the bisector equation in the parametric space is of total degree 12 in the worst case, 6 in each parameter. See [6] for the case of ellipses and [9, 5] for a study of point-curve or curve-curve bisectors. We represent a point on the medial axis by the corresponding footpoints on the boundary curves, therefore we can represent parts of the medial axis by properly trimming the bisector curves. In [13] the bisector curves are split in monotone pieces by using a subdivision technique. In the section that follows we improve this technique by proving and exploiting some algebraic and geometric properties of the bisector curves themselves. This is a generalization of the properties observed and exploited in [6].

## 4 Maximal bitangent disk

The boundary of the shape consists of two types of arcs. Convex and concave ones. We consider the general case where the tangency points of a maximal bitangent disk are not a concave joint. Let  $a_1$  and  $a_2$  be two arcs and  $\mathbf{P_1}$  and  $\mathbf{P_2}$  the corresponding footpoints of a maximal bitangent disk B (Fig. 2). Given  $\mathbf{P_1}$ , since the bisector curve is of degree 6 in each parameter, there may be up to 6 candidate points for  $\mathbf{P_2}$ . We can select the proper solution by applying the following lemmas.

**Lemma 1** If  $a_1$  is concave, then the tangent line T

of  $a_1$  at  $\mathbf{P_1}$  separates  $\mathbf{P_2}$  and  $a_1$  (Fig. 2 cases (i) and (ii)). If  $a_1$  is convex, then the circle of curvature of  $a_1$  at  $\mathbf{P_1}$  contains  $\mathbf{P_2}$  (Fig. 2 cases (iii) and (iv)).

**Proof.** If  $a_1$  is concave, then  $a_1$  and the maximal disk B have opposite curvatures. Therefore all points of  $a_1$  (except  $\mathbf{P_1}$ ) and B are separated by T. (In this case, T can be seen as a circle with an infinite radius.) If  $a_1$  is convex, then the circle of curvature of  $a_1$  at  $\mathbf{P_1}$  is the circle of maximum radius that lies locally inside  $a_1$ . Therefore its radius bounds from above the radius of B.

Applying the above lemma for  $P_2$  yields the following.

Lemma 2 If  $a_2$  is concave (Fig. 2 cases (i) and (iii)), we consider the tangent lines of  $a_2$  along the arc. At some point  $\mathbf{Q}$ , the tangent line may pass through  $\mathbf{P_1}$  and this will be a boundary condition, that is before  $\mathbf{Q}$ ,  $\mathbf{P_1}$  will be on the correct side (left) of the tangent line, while after  $\mathbf{Q}$ ,  $\mathbf{P_1}$  will be on the right of the tangent line, thus points after  $\mathbf{Q}$  on  $a_2$  are rejected. If  $a_2$  is convex (Fig. 2 cases (ii) and (iv)), we consider the circles of curvature of  $a_2$  along the arc. At some point  $\mathbf{Q}$ , the circle of curvature may pass through  $\mathbf{P_1}$  and this will be a boundary condition, that is before  $\mathbf{Q}$ ,  $\mathbf{P_1}$  will be inside the circle of curvature, while after  $\mathbf{Q}$ ,  $\mathbf{P_1}$  will be outside the circle of curvature, therefore points after  $\mathbf{Q}$  on  $a_2$  are rejected.

Algebraically, the tangent line of  $a_1$  evaluated at a point of  $a_2$  is a bivariate polynomial of total degree 4, 2 in each parameter. The circle of curvature of  $a_1$ , evaluated at a point of  $a_2$  is a bivariate polynomial of total degree 10, 6 in  $t_1$  and 4 in  $t_2$ . Fig. 3 (i) shows an instance of Fig. 2, case (iii), where  $a_1$  is a convex arc and  $a_2$  is a concave one. The graph of Fig. 3 (ii) shows a plot of the parametric bisector (solid line graph). The dashed line graph is a plot of the circle of curvature of  $a_1$  evaluated at a point of  $a_2$ . Note that the bisector critical points are separated by the graph of the circle of curvature, providing automatically a subdivision in monotone pieces. This is because at those critical points, the circle of curvature is also a maximal bitangent disk. Similar properties hold for all cases of Fig. 2. Location of the bisector extrema via the circle of curvature is more efficient, because purely algebraic techniques study the bisector curve itself via a discriminant, which has some spurious factors [2]. The reason is that the bisector is not an arbitrary curve but it is computed as some resultant of an algebraic system [5, 6, 7].

## 5 Critical points

Three-prong points (Fig. 4). A three-prong point on the medial axis is a point where the associated maximal disk is tangent to three points of the boundary of

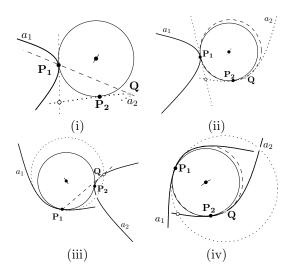


Figure 2: Isolating the proper footpoint.

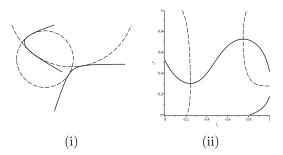


Figure 3: (i) A convex and a concave arc with the circles of curvature corresponding to parametric bisector extrema. (ii) Parametric bisector and circle of curvature evaluated.

the shape. The points of tangency can be described by an algebraic system. The system can be formulated and solved in a way similar to [7].

Terminal points. They are associated with the circle of curvature at points where the curvature attains a local maximum. These can be considered as degenerate cases of (iii), (iv) and (v) in Fig. 4.

Arc joints. These points are in fact artifacts, due to the fact that a single curve is considered as two or more subcurves. Thus, combinatorially, one has to take into account the MA points corresponding to the arc joints.

Let  $a_1, a_2, a_3$  be three conic arcs on the boundary of the shape, with parameters  $t_1, t_2, t_3$  respectively. We express a tritangent circle to  $a_1, a_2, a_3$  by an algebraic system. Footpoint parameter value  $t_1$  can be expressed as a resultant polynomial the degree of which is shown in table 1. The most difficult case is for three conic arcs, where the degree of the polynomial is 184, as in the case for the Voronoi diagram of ellipses [6]. Table 1 also summarizes the simpler cases, when the second footpoint lies on the same arc, or when one footpoint corresponds to an arc endpoint and therefore it is a fixed rational point. The equations used to describe each algebraic system are i) the normal lines  $N_i$  at the footpoint of arc  $a_i$ , ii) the segment bisector  $M_{ij}$  which is perpendicular to the segment joining the footpoints of  $a_i$  (or endpoint  $p_i$ ) and  $a_j$  (or  $p_j$ ), iii) the bisector curve  $B_{ij}$  of arcs  $a_i$  and  $a_j$  or the self-bisector curve  $B_{ii}$  of arc  $a_i$ .

Computing the footpoint as an algebraic number allows for detection of n-prong points, that is bifurcation points of degree  $\geq 3$ , simply by comparing such algebraic numbers. For example, if there exist a maximal disk tangent to  $a_1, a_2, a_3, a_4$  then the footpoints of the tritangent disks of  $a_1, a_2, a_3$  and  $a_1, a_2, a_4$  on arc  $a_1$  are identical.

Finally, the solution of the algebraic systems of table 1 can be accelerated by incorporating the subdivision technique of [8], because after applying lemmas 1 and 2, the bisectors are split in monotone parts.

	$t_2$	$t_3$	deg.	equations				
(i)	$a_2$	$a_3$	184	$N_1$	$N_2$	$N_3$	$M_{12}$	$M_{13}$
(ii)	$p_2$	$a_3$	36	$N_1$	$N_3$	$M_{12}$	$M_{23}$	
(iii)	$a_1$	$a_2$	32	$N_1$	$N_2$	$M_{12}$	$B_{11}$	
(iv)	$a_2$	$a_2$	16	$N_1$	$N_2$	$M_{12}$	$M_{22}$	$B_{22}$
(v)			8	$B_{12}$	$B_{22}$			
(vi)	$p_2$	$p_3$	6	$N_1$	$M_{12}$	$M_{13}$		

Table 1: Degree of footpoints for 3-prong MA points (Fig. 4.)

### 6 Computing the medial axis

The MA is constructed in a way similar to [12]. Instead of tracing the MA via the boundary of the shape with a predefined precision, we check explicitly each critical point, expressed with an algebraic system, as discussed in the previous section. Thus, we trace the MA in a constant number of steps, depending only on the number of input arcs (and not on some precision threshold).

We conclude with an example applying the Consider the 9 control points above techniques.  $\mathbf{P_0} \dots \mathbf{P_7}, \mathbf{P_8} \equiv \mathbf{P_0}$  with coordinates (1, 5), (-5, 3),(2,-1), (0,-1), (1,-6), (3,0), (10,0), (3,3), (1,5)defining 4 arcs with shape factors 2/3, 1/4, 4/5, 3/5 respectively, where arc  $a_{i+1}$  has control points  $(\mathbf{P_{2i}}, \mathbf{P_{2i+1}}, \mathbf{P_{2i+2}}), i = 0...3, \text{ as shown in Fig. 5.}$ We may start from a convex vertex (i.e.,  $P_8$ ) and trace the boundary of the shape, checking for critical points of the medial axis. This way the medial axis is traced edge by edge. Note that there exist two tritangent disks of  $a_1, a_3, a_4$ . However, the dashed one is rejected, as its associated footpoint on  $a_4$  lies after the footpoint of the other tritangent disk, as we move from  $P_8$  to  $P_0$ .

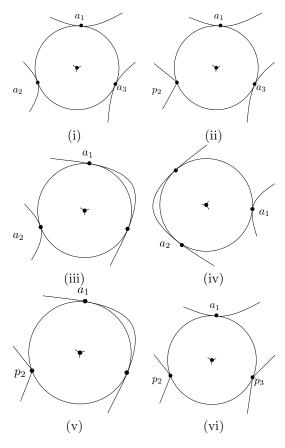


Figure 4: Various types of three-prong points

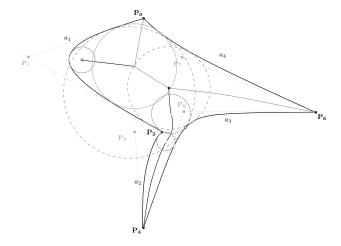


Figure 5: Medial axis of a shape and the maximal disks at its critical points.

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