# Determining Curves in Convex Hull from a Set of Planar Closed Convex Curves 

Vishwanath A.V. and Ramanathan M.<br>Department of Engineering Design, Indian Institute of Technology Madras, Chennai, India \{vishwanathavin, emry01\}@gmail.com


#### Abstract

Convex hull, a minimum enclosing convex envelope is a popular construction in the field of computational geometry. Typical convex hull include not just the points in the hull but also the connectivity between them. However, at times, it may be sufficient to get only points contributing to the hull, which can then be employed in constructions such as positive $\alpha$-hull. Algorithms for convex hull primarily focus on point-set as input. Very few algorithms handle input curves as such, without discretization. In this paper, algorithm for determining curves that belong to convex hull using minimum spanning tree (MST) is proposed. The edges of the MST can be considered as a rubber-band connecting all the curves with zero enclosed area. Valency of nodes in the MST is used to define curve triplets. Maximum inscribed circle (MIC) for all triplets is identified (and stored in a triplet matrix) and its minimum is then picked to identify the starting triplet. The triplet is then deleted, updating the triplet matrix. The deletion of the triplet is akin to leaving out curves in the interior to the convex hull. Updating a triplet matrix emulates the pushing out the rubber-band (edges of MST) and moving towards the curves in the convex hull. Repeating the process of deleting a triplet and updating the triplet matrix will eventually form pairs of curves that lie in the convex hull. Connectivity information is then derived using re-ordering. Results are presented that show curves belonging to convex hull.


Keywords: convex hull, freeform curves, minimum spanning tree, maximum inscribed circle.

## 1. INTRODUCTION

Convex hull $[5,17$ ] of a set is defined as a minimal area convex enclosure of the set. Quite a few algorithms exist for computing the convex hull of a point set [17], both in $\mathrm{R}^{2}$ as well as in $\mathrm{R}^{3}$. Convex hull has found numerous applications, ranging from interference checking [15] to shape matching [4].

Convex hull typically imply that it consists of not just few elements from the set but also polygon (consisting of both points and connecting edges). Moreover, in some applications such as positive $\alpha$-hull, only points on the convex hull play a role and hence it may be sufficient to determine them.

Problems such as convex hull are usually considered for a set of points, and belong to the filed known as computational geometry. Fields such as CAD, geometric modelling which deal typically with domains like closed curves and surfaces are now being used as input to study such problems. Curved inputs have been used in various forms. For example, splinegons, where the straight edges in the polygons are
replaced by curved edges have been employed (for eg. [13] studied the art-gallery problem and whereas [20] computed the medial axis). Single non-convex closed curve without discontinuities [3] (Voronoi diagram) as well as a set of such curves (examples, convex hull [8], minimum enclosing hypershpere [16], minimum enclosing ellipse [2], smallest enclosing ball of a set of balls [11]) have also been considered. Few other works used the input which can be termed as pseudo-circles - a set of disjoint convex curves having no discontinuities. Computation of Vornoi cell for such input has been presented in [12], Voronoi diagram for ellipses in [10], Delaunay graph for ellipses [9], and Visibility graph [18].

Inputs such as curves also call for different kind of approach for the same problem for a set of points. For example, for the computation of convex hull of a set of curves, tangents and bi-tangents computations are required [8]. Similarly, computations of visibility graph [18], shortest path [19] etc. also requires tangents and bi-tangents for a set of curves, which is not the case for a set of points. The computations
are typically much more numerically intensive than its point-set counterpart.

To the best of the knowledge of the authors, very few algorithms compute the convex hull for a set of curves represented exactly (i.e. without approximating the curves using sample points). An algorithm for computing the convex hull of a set of freeform curves has been provided in [8] which was then extended to freeform surfaces [21].

It has been shown that the boundary of Delaunay triangulation results in convex hull. However, it should be noted that, though the theoretical foundation as well as algorithms for Voronoi diagram of a set of freeform curves has been well-developed in the recent past (for example, please refer to [12] for computing Voronoi cell), computing Voronoi diagram for such input is still a topic of active research. Moreover, Delaunay triangulation for a set of curves is not well known (under the condition that the curves are not discretized into set of points).

A set of disjoint curves is a useful representation in computing Voronoi diagram, $\alpha$-hull, convex hull and in applications such as profile milling. Convex hull of the set of curves is very useful in applications such as collision detection when a cutter is used for profile milling.

One approach to find the convex hull for a set of curves is to generate set of points on the curves and then use an existing algorithm. However, this approach may result in a very coarsely approximated hull (depending on the sampling on each curve) of the input curves which might impede the accuracy of the results (this argument has been shown to be true for algorithms such as Delaunay graph [10] and medial axis [20]). A bi-arc based approximation of the curves has shown to improve efficiency in computing the convex hull [14], though with an error bound.

Let $S$ be a set of disjoint free-form (parametric) convex curves (curves without inflection points) with no straight line portions and having no discontinuities in $\mathrm{R}^{2}$. It is to be noted that as the closed curves have well defined exterior and interior unlike that of points. It is assumed that the interior of a closed curve lies to its left as we travel along the increasing direction of parametrization.

In this paper, an algorithm for computing the curves that belong to the convex hull from the set S, has been presented. The algorithm starts from a triplet of curves (say C1 (t1), C2 ( t 2 ), and C3 ( t 3 ) having counter clockwise direction of parametrization. Maximal inscribed circle (MIC), which is the maximum radius circle that touches all the curves and not containing any of them is employed. Using constraint equations (Equations (1) and (2)) and then the radius of MIC (RMIC) is first computed for a triplet. This triplet is then removed and updated. In general, at each iteration of the algorithm, one curve in left out from further computation. Constraint equations to identify where MIC lies is also formulated. It is to be noted that an algorithm for convex hull of a set of
points need not return the points in the convex hull in an ordered manner [17]. In this paper, the output from the algorithm gives the connectivity information of the curves forming the convex hull of the set.

## 2. CONSTRAINTS

Definition 1 Bitangent (BT) - It is the line segment connecting a pair of points that is tangent to the curves $C 1(t)$ and $C 2(r)$, forming the end points of the line segment.

Definition 2 Touchpoint - It is the point on a curve at which a circle/disc of radius $R$ touches the curve.

### 2.1. Constraint for Three Curves

Consider three curves $\mathrm{C}_{0}(\mathrm{t}), \mathrm{C}_{1}(\mathrm{r})$, and $\mathrm{C}_{2}(\mathrm{~s})$. For a circle to be touching the three curves (in this paper, it is assumed that each touchpoint are from distinct curves), the following constraints have to be satisfied;

$$
\begin{align*}
<C_{0}^{\prime}(t), P(x, y)-C_{0}(t)> & =0, \\
<C_{1}^{\prime}(r), P(x, y)-C_{1}(r)> & =0, \\
<C_{2}^{\prime}(s), P(x, y)-C_{2}(s)> & =0, \\
\left\|P(x, y)-C_{0}(t)\right\| & =\left\|P(x, y)-C_{1}(r)\right\| \\
\left\|P(x, y)-C_{1}(r)\right\| & =\left\|P(x, y)-C_{2}(s)\right\| \tag{1}
\end{align*}
$$

where $\mathrm{P}(\mathrm{x}, \mathrm{y})$ is the center of the disc and ' denote the tangent at a point on the curve. First three equations denote that the circle is tangent to the curves and the last two denote that touch points are equidistant from the center. Constraints in Equation (1) will lead to finite set of solutions. A containment check is used to decide the validity of solution set that then determines the touchpoints.

### 2.2. Containment Check: Is a Curve Outside the Disc of Radius $R$

The following constraint is used to determine if a curve $\mathrm{C}(\mathrm{t})$ is outside (Equation (2)) the disc

$$
\begin{equation*}
\|D(x, y)-P(x, y)\|>=R \tag{2}
\end{equation*}
$$

where $\mathrm{D}(\mathrm{x}, \mathrm{y})$ is the minimum distance point on the curve $\mathrm{C}(\mathrm{t})$ from the center $\mathrm{P}(\mathrm{x}, \mathrm{y})$ of a circle with radius R.

## 3. ALGORITHM DETAILS

### 3.1. MST of a Set of Curves

As the set of curves are disjoint, MST is used to make a connectivity between them. Moreover, the edges in the MST act as a part of a rubber-band that enclose the curves. MST also guarantees that no other edge

(b)

(c)


Fig. 1: MST for a set of curves and dilation of edges: (a) Initial set of curves, (b) MST of the set, (c) Edges e and $\mathbf{f}$ replace to form $\mathbf{g}$.
obstruct the edge between two curves. Establishing connectivity through MST also determines the starting set of triplets of curves. The minimal spanning tree (MST) of a set of curves is defined as follows: each curve corresponds to a node and the minimum distance line joining two curves corresponds to an edge. To determine the minimum distance line between two curves, it can be noted that they have to be antipodal to both curves [16]. For two planar closed $\mathrm{C}^{1}$-continuous curves $\mathrm{C}_{1}(\mathrm{t})$ and $\mathrm{C}_{2}(\mathrm{r})$, the antipodal constraints are:

$$
\begin{align*}
& <C_{1}^{\prime}(t), C_{1}(t)-\left(C_{1}(t)+C_{2}(r)\right) / 2>=0 \\
& <C_{2}^{\prime}(r), C_{2}(r)-\left(C_{1}(t)+C_{2}(r)\right) / 2>=0 \tag{3}
\end{align*}
$$

where $\mathrm{C}_{1}^{\prime}(\mathrm{t})$ and $\mathrm{C}_{2}^{\prime}(\mathrm{r})$ denote the tangent of the curves at the respective parameters $t$ and r. Equation (3) will generate all the sets of antipodal points, the least of which forms an edge of MST. Prim's algorithm is used to generate the MST for a set of curves (Algorithm 1). Figure 1(b) shows the MST for the set of curves given in Figure 1(a).

```
Algorithm \(1 \operatorname{MST}\left(S=C_{1}, C_{2}, \ldots, C_{n}\right)\)
    Add curve \(C_{1}\) to a set \(C\).
    while \(C \neq S\) do
        for Each curve \(C_{i}\) belonging to \(C\) do
        Find antipodal line to every curve \(C_{j}\) in \(S\) not
        belonging to \(C\)
        end for
        Find min line \(M_{L}\) and add \(S_{j}\) and \(M_{L}\) to C.
    end while
    return(c)
```


### 3.2. Forming Triplets using MST

For the MST of a set of curves shown in Figure 1(b), the adjacent edges (e and $f$ ) are then dilated to form a new edge (g) as shown in Figure 1(c). However each time the dilation is performed, a portion of the curves is left from further computation. In the case of Figure 2, curve $C_{2}$ has edges to curves $C_{1}$ and $C_{3}$ in the MST which are replaced by a new edge, a portion of curve $\mathrm{C}_{2}$ is omitted from further computation whereas the other portion is still considered. Thus the curves have to be divided into segments to denote the portions
(a)

(b)


Fig. 2: Segmenting Curves: (a) Minimum area enclosure, (b) Newly created edge.
of the curve. In the current case, the curve $C_{2}$ is called the 'central' curve. The central curve is split into two segments using the antipodal points. Once the curve is split into two segments, it is denoted by the triplet which has the included angle (with respect to the central curve) in the counter clockwise sense. For example (Figure 2(b)), the curve $C_{2}$ is split into $\mathrm{C}_{21}$ (portion of $\mathrm{C}_{2}$ from the point a to b ) and $\mathrm{C}_{22}$ (portion of $\mathrm{C}_{2}$ from b to a ). The corresponding triplets are represented as $\left[\begin{array}{lll}C_{1} & C_{2} & C_{3}\end{array}\right]$ and $\left[\begin{array}{lll}C_{3} & C_{2} & C_{1}\end{array}\right]$ respectively. In the case of curve $C_{3}$ in Figure 2(a), the entire curve is stored as a single segment and denoted as $\left[\begin{array}{lll}C_{2} & C_{3} & C_{2}\end{array}\right]$.

### 3.3. Triplet Matrix

For a set of curves as shown in Figure 1(a), the triplets of each of the curves form a triplet matrix (TM). The valency of a curve is determined by the number of MST edges attached to it. A curve in a MST is split into segments equal to the valency of the curve. For each such segment obtained, triplets are generated as described in section 3.2. In a similar way, all the triplets identified are stored in TM. Table 1 shows the triplet matrix of each central curve at the start using the MST (Figure 1(b)). Algorithm 2 explains the formation of TM from MST.

### 3.4. Updating Triplet Matrix

Suppose a triplet be picked from the triplet matrix (say $\left[C_{7} C_{1} C_{4}\right]$ ). Though the triplet denotes the segment of the curve $C_{1}$, it should be noted that from the triplet $\left[C_{7} C_{1} C_{4}\right]$, pairs of curves $\left[C_{7} C_{1}\right]$ and $\left[\begin{array}{ll}C_{1} & C_{4}\end{array}\right]$ may be part of another triplet in TM (see

| $C_{1}$ | $C_{2}$ | $C_{3}$ | $C_{4}$ | $C_{5}$ | $C_{6}$ | $C_{7}$ |
| :---: | :---: | :---: | :---: | :---: | :---: | :---: |
| $\left[\begin{array}{lll}C_{3} & C_{1} & C_{7}\end{array}\right]$ | $\left[\begin{array}{llll}C_{1} & C_{2} & C_{1}\end{array}\right]$ | $\left[\begin{array}{lll}C_{1} & C_{3} & C_{1}\end{array}\right]$ | $\left[\begin{array}{llll}C_{6} & C_{4} & C_{1}\end{array}\right]$ | $\left[\begin{array}{llll}C_{7} & C_{5} & C_{7}\end{array}\right]$ | $\left[^{C_{4}} C_{6} C_{4}\right]$ | $\left[C_{5} C_{7} C_{1}\right]$ |
| ${ }_{\left[\begin{array}{lll}C_{7} & C_{1} & C_{4}\end{array}\right]}$ |  |  | $\left[\begin{array}{lll}C_{1} & C_{4} & C_{6}\end{array}\right]$ |  |  | $\left[\begin{array}{llll}C_{1} & C_{7} & C_{5}\end{array}\right]$ |
| $\left[\begin{array}{lll}C_{4} & C_{1} & C_{2}\end{array}\right]$ |  |  |  |  |  |  |
| $\left[\begin{array}{lll}C_{2} & C_{1} & C_{3}\end{array}\right]$ |  |  |  |  |  |  |

Tab. 1: Starting Triplet Matrix for convex hull.

| $C_{1}$ | $C_{2}$ | $C_{3}$ | $C_{4}$ | $C_{5}$ | $C_{6}$ | $C_{7}$ |
| :---: | :---: | :---: | :---: | :---: | :---: | :---: |
| $\left[\begin{array}{lll}C_{3} & C_{1} & C_{7}\end{array}\right]$ | $\left[\begin{array}{lll}C_{1} & C_{2} & C_{1}\end{array}\right]$ | $\left[\begin{array}{llll}C_{1} & C_{3} & C_{1}\end{array}\right]$ | $\left[\begin{array}{llll}C_{6} & C_{4} & C_{1}\end{array}\right]$ | $\left[\begin{array}{llll}C_{7} & C_{5} & C_{7}\end{array}\right]$ | $\left[\begin{array}{llll}C_{4} & C_{6} & C_{4}\end{array}\right]$ | $\left[\begin{array}{lll}C_{5} & C_{7} & C_{1}\end{array}\right]$$\left[\begin{array}{lll}C_{1} & C_{7} & C_{5}\end{array}\right]$ |
| $\left[\begin{array}{llll}C_{4} & C_{1} & C_{2}\end{array}\right]$ |  |  | $\left[\begin{array}{llll}C_{7} & C_{4} & C_{6}\end{array}\right]$ |  |  |  |
| $\left[\begin{array}{lll}C_{2} & C_{1} & C_{3}\end{array}\right]$ |  |  |  |  |  |  |

Tab. 2: Updated Triplet Matrix convex-hull.

```
Algorithm 2 Triplet Matrix (MST)
    for Each curve Ci}\\mathrm{ 票T(S) do
        if Valency (Ci)\geq2 then
        for Each pair of adjacent MST edges }\mp@subsup{L}{m}{}\mathrm{ and }\mp@subsup{L}{n}{
        connecting Ci
            The segment of the curve between Lm}\mathrm{ and }\mp@subsup{L}{n}{
            is denoted as [ }\mp@subsup{C}{j}{}\mp@subsup{C}{i}{}\mp@subsup{C}{k}{}
            Add [ }\mp@subsup{C}{j}{}\mp@subsup{C}{i}{}\mp@subsup{C}{k}{}\mathrm{ ] to triplet matrix TM
            corresponding to Ci.
        end for
        else
            Add [C }\mp@subsup{C}{j}{}\mp@subsup{C}{i}{}\mp@subsup{C}{j}{\prime}\mathrm{ ] to triplet matrix TM
            corresponding to Ci
        end if
    end for
    return TM
```

Table 1). Thus, when concavities are removed by deleting triplets, other dependent triplets have to be updated. The triplet matrix is updated in the following way: we check to see if the pair $\left[\mathrm{C}_{7} \mathrm{C}_{1}\right]$ exists as a part of any other triplet under $C_{7}$ and replace $C_{1}$ by $C_{4}$. Similarly we check for $\left[C_{1} C_{4}\right]$ under $C_{4}$ and replace $C_{1}$ by $C_{7}$ as shown in Table 2. At each iteration, one triplet gets eliminated from the matrix and two triplets are updated.

Effect of the changes in the Table 2, edges in the initial MST now dilates as shown in Figure 1(c) (newly formed edge is shown in grey). The dilation of the initial MST is a result of deletion of the triplet or in other words the segment of the curve from the triplet matrix. This is akin to pushing out the rubber-band formed by MST towards the exterior (this can also be thought of eliminating right oriented triplets until only left oriented triplets remain, which will then correspond to the convex chain). Also, the segment of the curve will play no role in the further computations. Algorithm 3 describes the procedure for updating the triplet matrix.

```
Algorithm 3 Update \(T M\left(T M,\left[C_{i} C_{j} C_{k}\right]\right)\)
    if The pair \(\left[C_{i} C_{j}\right]\) is present in the triplets under \(\left[C_{i}\right]\)
    then
        Replace the triplet \(\left[C_{n} C_{i} C_{j}\right]\) by \(\left[C_{n} C_{i} C_{k}\right]\)
    end if
    if The pair \(\left[C_{j} C_{k}\right.\) ] is present in the triplets under
    [ \(C_{k}\) ] then
        Replace the triplet \(\left[C_{j} C_{k} C_{m}\right.\) ] by \(\left[C_{i} C_{k} C_{m}\right.\) ]
    end if
    Delete \(\left[C_{i} C_{j} C k\right]\) from TM.
```


### 3.5. Starting Triplet

Section 3.4 described how to update the triplet. However, algorithm for updating a triplet matrix typically needs a starting triplet. At the start of the updating step of the algorithm in each stage till the triplet matrix becomes empty and pairs are formed, the maximum inscribed circle is found for all triplets in the current triplet matrix. The minimum radius out of the maximum inscribed circle and its corresponding triplet is chosen as the starting triplet. Also, if no circle is available from the triplets in the triplet matrix, then it means that all the curves in the triplets are a part of the convex hull. Union of all the pairs of curves will form the convex hull. The reason for picking the triplet with smallest radius of MIC is very similar to the empty circumcircle of a Delaunay triangulation. Since our aim is to push the rubber band out, the smallest radius MIC is picked.

## 4. ILLUSTRATION OF THE ALGORITHM

The pseudo-code to compute the curves in the convex hull is presented in Algorithm 4. The algorithm is illustrated for the set of curves shown in Figure 1. Table 3 to Table 8 explain the various deletions and updating that happen in the triplet matrix at every step. In each table, the triplet to be deleted is shown

| $C_{1}$ | $C_{2}$ | $C_{3}$ | $C_{4}$ | $C_{5}$ | $C_{6}$ | $C_{7}$ |
| :---: | :---: | :---: | :---: | :---: | :---: | :---: |
| $\left[\begin{array}{llll}C_{4} & C_{1} & C_{2}\end{array}\right]$ | $\left.{ }_{\left[C_{1}\right.} C_{2} C_{1}\right]$ | $\left[\begin{array}{llll}C_{1} & C_{3} & C_{7}\end{array}\right]$ | $\left[\begin{array}{llll}C_{6} & C_{4} & C_{1}\end{array}\right]$ | $\left[{ }_{[ } C_{7} C_{5} C_{7}\right]$ | $\left[\begin{array}{llll}C_{4} & C_{6} & C_{4}\end{array}\right]$ | $\left[C_{5} C_{7} C_{4}\right]$ |
| $\left[\begin{array}{lll}C_{2} & C_{1} & C_{3}\end{array}\right]$ |  |  | $\left[\begin{array}{llll}C_{7} & C_{4} & C_{6}\end{array}\right]$ |  |  | $\left[C_{3} C_{7} C_{5}\right]$ |

Tab. 3: Updated Triplet Matrix cvx-hull-2.

| $C_{1}$ | $C_{2}$ | $C_{3}$ | $C_{4}$ | $C_{5}$ | $C_{6}$ | $C_{7}$ |
| :---: | :---: | :---: | :---: | :---: | :---: | :---: |
| $\begin{aligned} & {\left[\begin{array}{lll} C_{6} & C_{1} & C_{2} \end{array}\right]} \\ & {\left[\begin{array}{lll} C_{2} & C_{1} & C_{3} \end{array}\right]} \end{aligned}$ | $\left[\begin{array}{llll}C_{1} & C_{2} & C_{1}\end{array}\right]$ | $\left[\begin{array}{llll}C_{1} & C_{3} & C_{7}\end{array}\right]$ | $\left[\begin{array}{llll}C_{7} & C_{4} & C_{6}\end{array}\right]$ | $\left[C_{7} C_{5} C_{7}\right]$ | $\left[\begin{array}{llll}C_{4} & C_{6} & C_{1}\end{array}\right]$ | $\left.\begin{array}{lll} {\left[C_{5}\right.} & C_{7} & C_{4} \end{array}\right]\left[\begin{array}{lll} C_{3} & C_{7} & C_{5} \end{array}\right]$ |

Tab. 4: Updated Triplet Matrix cvx-hull-3.

| $C_{1}$ | $C_{2}$ | $C_{3}$ | $C_{4}$ | $C_{5}$ | $C_{6}$ | $C_{7}$ |
| :---: | :---: | :---: | :---: | :---: | :---: | :---: |
| $\begin{aligned} & {\left[\begin{array}{lll} C_{6} & C_{1} & C_{2} \end{array}\right]} \\ & {\left[\begin{array}{lll} C_{2} & C_{1} & C_{3} \end{array}\right]} \end{aligned}$ | $\left[\begin{array}{lll}C_{1} & C_{2} & C_{1}\end{array}\right]$ | $\left[\begin{array}{llll}C_{1} & C_{3} & C_{5}\end{array}\right]$ | $\left[\begin{array}{llll}C_{7} & C_{4} & C_{6}\end{array}\right]$ | $\left[\begin{array}{llll}C_{3} & C_{5} & C_{7}\end{array}\right]$ | $\left[C_{4} C_{6} C_{1}\right]$ | $\left[C_{5} C_{7} C_{4}\right]$ |

Tab. 5: Updated Triplet Matrix cvx-hull-4.
$\left.\begin{array}{cccccccc}\hline C_{1} & C_{2} & C_{3} & C_{4} & C_{5} & C_{6} & C_{7} \\ \hline\left[\begin{array}{llllll}C_{2} & C_{1} & C_{3}\end{array}\right] & {\left[C_{6}\right.} & C_{2} & \left.C_{1}\right] & {\left[\begin{array}{llll}C_{1} & C_{3} & C_{5}\end{array}\right]} & {\left[C_{7}\right.} & C_{4} & C_{6}\end{array}\right]\left[\begin{array}{llll}C_{3} & C_{5} & C_{7}\end{array}\right]$

Tab. 6: Updated Triplet Matrix cvx-hull-5.

| $C_{2}$ | $C_{3}$ | $C_{4}$ | $C_{5}$ | $C_{6}$ | $C_{7}$ |
| :---: | :---: | :---: | :---: | :---: | :---: |
| $\left[{ }_{C} C_{6} C_{2} C_{3}\right]$ | $\left[C_{2} C_{3} C_{5}\right]$ | $\left[\begin{array}{llll}C_{7} & C_{4} & C_{6}\end{array}\right]$ | $\left[C_{3} C_{5} C_{7}\right]$ | $\left[C_{4} C_{6} C_{2}\right]$ | $\left[C_{5} C_{7} C_{4}\right]$ |

Tab. 7: Updated Triplet Matrix cvx-hull-6.
$\left.\begin{array}{ccccc}\hline C_{2} & C_{3} & C_{4} & C_{5} & C_{6} \\ \hline\left[\begin{array}{llllll}C_{6} & C_{2} & \left.C_{3}\right] & {\left[C_{2}\right.} & C_{3} & \left.C_{5}\right]\end{array}\right. & {\left[C_{5}\right.} & C_{4} & \left.C_{6}\right] & {\left[C_{3}\right.} \\ \hline\end{array} C_{5} C_{4}\right] ~\left[\begin{array}{lll}4 & \left.C_{6} C_{2}\right] \\ \hline\end{array}\right.$

Tab. 8: Updated Triplet Matrix cvx-hull-7.
in red color and the triplets to be updated are shown in blue color. At each stage, the edges connecting the curves (the rubber-bands) gets pushed out and at the last stage, the edge connectivity will give the curves that will be on the convex hull. Figures 3(a) to 3(f) indicate the process of formation of the curves in the convex hull. Since no more MIC is possible from the triplets in Table 8, the triplets are split pair-wise and are added to the pair matrix ( PM ) which gives the curves in the convex hull.

## 5. RESULTS AND DISCUSSIONS

Implementation of the algorithm (Algorithm 4) has been carried out using IRIT [6], a solid modeling kernel. The constraint equations were solved using the
geometric constraint solver [7] in IRIT. Figure 3(f) shows the result for the curves in Figure 1(b), which shows the MST of the set. Figure 4 shows the set of curves with MST in the top row with corresponding output (curves in the convex hull in the bottom row). Fig. 4(e) shows the results for a human modeled as set of closed curves and its convex curves are in Fig. 4(j).

### 5.1. Complexity of the Algorithm

Using Algorithm 4, the complexity can be derived as follows: MST computation starts from the antipodal ones, which is a complete graph and takes $\mathrm{O}\left(\mathrm{n}^{2}\right)$. Hence, the MST computation of the prim's algorithm will be of $O\left(n^{2} \operatorname{logn}\right)$ [1]. Assume constraint equations are performed in constant time $\mathrm{O}(1)$. If there are e
(a)


(b)


(d)

Fig. 3: Dilation of the MST edges through the various stages of the algorithm.
(a)
(b)

(f)

(c)


(g)
(h)
(i)




Fig. 4: Test results showing MST (top) and curves in convex hull (bottom).

```
Algorithm 4 Curves In ConvexHull( \((S)\)
    TM = nil
    \(\mathrm{PM}=\) nil.
    MST \(=\) MST(S).
    TM = TripletMatrix(MST).
    while \(\mathrm{TM} \neq\) NULL do
        for Each element in TM do
            Find MIC (Maximum inscribed circle) using
            Equations (1) and (2)
        end for
        if Number of MIC \(\neq 0\) then
            Circ \(_{\text {min }}=\) Minimum (MIC).
            Let \(\left[C_{i} C_{j} C_{k}\right.\) ] be the triplet corresponding
            to \(\mathrm{Circ}_{\text {Min }}\)
            Call UpdateTM(TM,[ \(\left.\left.C_{i} C_{j} C_{k}\right]\right)\)
        else
            for Each Element \(T_{X}\) in TM do
                Split \(T_{X}=\left[\begin{array}{lll}C_{i} & C_{j} & C_{k}\end{array}\right]\) into \(\left[C_{i} C_{j}\right]\) and \(\left[\begin{array}{ll}C_{j} & C_{k}\end{array}\right]\)
and
            add to PM
            delete \(T_{X}\)
            end for
        end if
    end while
    for Every pair [ \(C_{i} C_{j}\) ] in PM do
        Merge the pairs to get curves in the convex hull
    end for
```

edges in the MST, in the worst case, the number of triplets is 2 e . At the most, the updating of the triplet matrix has to be carried out e times. This implies that that Algorithm 4 runs in $\mathrm{O}\left(\mathrm{n}^{2} \operatorname{logn}\right)$ in the worst case.

### 5.2. Correctness Proof of the Algorithm

A convexity exists between three curves C1, C2 and C3 only if a straight line can be drawn between curves C1 and C3 which does not intersect curve C2 (Figure 5(a)).

Lemma 1 Maximum inscribed circle exists between three curves C1, C2 and C3 exist if and only if the convexity exists.

Proof Let us assume that there exists a MIC between curves C1, C2 and C3 which does not have convexity (Figure 5(b)). Maximum inscribed circle between three curves is always tangential to the curves. A general property of circles is that any point in the circumference of a circle should be visible from any other point. In other words there must be some point in each of the three curves from which the other two curves are visible. In Figure 5(b) there exist no straight line connecting curves C1 and C3 that does not intersect C2. This means that no MIC is possible between curves where there is no convexity. If there exists two points on C1 and C3 (say a and c), consider the intersection point of the normals from the two points (let the point be I). From I, circles can be drawn using I as center and Ia and Ib as respective radii. If at least one of the circles cut the curve C2, then it can be shrunk to find mic, since the curves are c1-continuous and hence the normal field is also continuous (if both circles do not cut c2, then one can find a pair of different set of points and then use a similar argument). In our algorithm, each time the triplet matrix is updated, the rubber band enclosure surrounding the set of curves reduces in length. In actual terms, two edges of a triangle are replaced by a single edge as shown in


Fig. 5: Concavity and convexity between three curves: (a) Bi-tangent line L1 does not intersect curve C2 (b) No Line exists between c1 and c3 that does not intersect C2.
figure 1(c). Since the algorithm is terminated at a stage when there are no more triplets with concavity, it is concluded that the remaining set of curves will be in the convex hull of the set.

### 5.3. Comparison

Though there are numerous algorithms to compute the points on a convex hull from a set of points, to the best of the knowledge of the author, only [8] handle curves without approximating them (it should be noted our algorithm does not actually compute the hull). Algorithm in [8] uses point-curve tangents and bi-tangents, formulation constraint equations to obtain them. They are then processed for transversal intersection with a curve, either to be part of the convex hull or reject them. Complexity of the algorithm appears to be $\mathrm{O}\left(\mathrm{d}^{2}\right)$, where d is the number of bitangents. The number of bitangents used in [8] to compute convex hull seems to be quite high as it involves all curves in the set. Using the algorithm in this paper, the number can be substantially reduced as we know which curves contribute to the convex hull and also the connectivity, essentially requiring 4 n bitangents, where n is the number of curves in the convex hull.

It is also to be noted the algorithms such as giftwrapping can be extended to the curve domain as well. In any case, it appears that the computation of bitangent is not avoidable along with the predicate computation of whether the curve is right or left of a bitangent. Curves in the convex hull presented here will reduce the number of curves that have to be used in the computation of convex hull thereby reducing the number of bitangents and a possible elimination of the predicate tests. The algorithm in [14] has been shown to improve the efficiency of the computation of the convex hull. However, the algorithm requires a pre-processing step that approximates the curves into a set of bi-arcs with an error bound. Moreover, this kind of approximation does not seem to generalize
for higher dimensions such as in three dimensions, where as the constraints proposed in this paper are extendable to higher dimensions.

### 5.4. Limitation

Though it has been assumed that the disc touches only one point on a curve, computing multi-touching point within the same curve is still possible. For example, in the case of two points lying on the same curve, the constraint equations can be solved considering $\mathrm{C} 1=\mathrm{C} 2$. However, as the same curve can play a role in multiple touchpoints, maintaining and updating triplet matrix has to be appropriately done.

## 6. CONCLUSION

In this paper, an algorithm for determining curves that belong to the convex hull from a set of planar closed disjoint curves based on MST computation. It has been shown that the curves in convex hull can be obtained without geometrical structures such as Voronoi diagram or Delaunay triangulation, that are traditionally proven to be difficult to compute for curves. The curves are assumed to be simplyconnected convex curves, having no straight line portions and no discontinuities. Results indicate that the algorithm is very amenable for implementation. Possible future work can include GPU-based computation and also handling of intersecting curves.

## REFERENCES

[1] Aho, A. V.; Hopcroft, J. E.; Ullman J. D.: Data Structures and Algorithms. Addison-Wesley, 1983.
[2] Albocher, D.; Elber, G.: On the computation of the minimal ellipse enclosing a set of planar curves, In Shape Modeling International, 2009, 185-192. 10.1109/SMI.2009.5170147
[3] Chou, J. J.: Voronoi diagrams for planar shapes, IEEE Comput. Graph. Appl., 15(2), 1995, 52-59. 10.1109/38.365006
[4] Corney, J.; Rea, H.; Clark, D.; Pritchard, J.; Breaks, M.; MacLeod, R.: Coarse filters for shape matching, IEEE Computer Graphics and Applications, 22, 2002, 65-74. 10.1109/MCG.2002. 999789
[5] De Berg, M.; Cheong, O.; van Kreveld, M.; Overmars, M.: Computational geometry: algorithms and applications, Springer, 2008.
[6] Elber, G.: IRIT 10.0 User's Manual, The Technion-Israel Institute of Technology, Haifa, Israel, 2009.
[7] Elber, G.; Kim, M.-S.: Geometric constraint solver using multivariate rational spline functions, In SMA '01: Proceedings of the sixth ACM symposium on Solid modeling and applications, 1-10, New York, NY, USA, 2001. ACM. 10.1145/376957.376958
[8] Elber, G.; Kim, M.-S.; Heo, H.-S.: The convex hull of rational plane curves, Graph. Models, 63(3), 2001, 151-162. http://dx.doi.org/10.1006/ gmod. 2001.0546
[9] Emiris, I. Z.; Tsigaridas, E. P.; Tzoumas, G. M.: Exact Delaunay graph of smooth convex pseudo-circles: general predicates, and implementation for ellipses. In 2009 SIAM/ACM Joint Conference on Geometric and Physical Modeling, SPM '09, 211-222, New York, NY, USA, 2009. ACM. 10.1145/1629255.1629282
[10] Emiris, I. Z.; Tzoumas, G. M.: A real-time and exact implementation of the predicates for the Voronoi diagram of parametric ellipses, In Proceedings of the 2007 ACM symposium on Solid and physical modeling, SPM '07, 133142, New York, NY, USA, 2007. ACM. 10.1145/ 1236246.1236266
[11] Hanniel, I.; Muthuganapathy, R.; Elber, G.; Kim, M.-S.: Precise Voronoi cell extraction of freeform rational planar closed curves. In SPM '05: Proceedings of the 2005 ACM symposium on Solid and physical modeling, 51-59, New York, NY, USA, 2005. ACM. 10.1145/ 1060244.1060251
[12] Fischer, K.; Gartner, B.: The smallest enclosing ball of balls: combinatorial structure and algorithms, In Proceedings of the nineteenth annual
symposium on Computational geometry, SCG '03, 292-301, New York, NY, USA, 2003. ACM. 10.1142/S0218195904001500
[13] Karavelas, M. I.: Guarding curvilinear art galleries with edge or mobile guards, In Proceedings of the 2008 ACM symposium on Solid and physical modeling, SPM '08, 339345, New York, NY, USA, 2008. ACM. 10.1145/ 1364901.1364950
[14] Kim, Y.-J.; Lee, J.; Kim, M.-S.; Elber, G.: Efficient convex hull computation for planar freeform curves, Computers \& Graphics, 35(3), 2011, 698-705, Shape Modeling International (SMI) Conference 2011. http://dx.doi.org/10.1016/ j.cag.2011.03.028
[15] Lee, Y.-S.; Chang, T.-C.: 2-phase approach to global tool interference avoidance in 5-axis machining, Computer-Aided Design, 27(10), 1995, 715-729. http://dx.doi.org/10.1016/ 0010-4485\%2894\%2900021-5
[16] Muthuganapathy, R.; Elber, G.; Barequet, G.; Kim, M.-S.: Computing the minimum enclosing sphere of free-form hypersurfaces in arbitrary dimensions, Comput. Aided Des., 43, 2011, 247-257. 10.1016/j.cad.2010.12.007
[17] O’Rourke, J. Computational Geometry in C, Cambridge University Press, New York, NY, USA, 1998.
[18] Pocchiola, M.; Vegter, G.: Computing the visibility graph via pseudo-triangulations, In Proceedings of the eleventh annual symposium on Computational geometry, SCG '95, 248-257, New York, NY, USA, 1995. ACM. 10.1145/220279.220306
[19] Ram, S. B.; Ramanathan, M.: The shortest path in a simply-connected domain having a curved boundary, Computer-Aided Design, 43(8), 2011, 923-933. http://dx.doi.org/10. 1016/j.cad.2011.03.007
[20] Ramanathan, M.; Gurumoorthy, B.: Constructing medial axis transform of planar domains with curved boundaries, Computer-Aided Design, 35(7), 2003, 619-632. http://dx.doi. org/10.1016/S0010-4485\%2802\%2900085-4
[21] Seong, J.-K.; Elber, G.; Johnstone, J. K.; Kim M.-S.: The convex hull of freeform surfaces, Computing, 72(1-2), 2004, 171-183. 10.1007/ s00607-003-0055-x

