

Largest and Smallest Area Triangles on Imprecise Points¹

Vahideh Keikha^a, Maarten Löffler^b, Ali Mohades^a

^a*Department of Mathematics and Computer Science, Amirkabir University of Technology, Tehran, Iran*

^b*Department of Information and Computing Sciences, Utrecht University, Utrecht, The Netherlands*

Abstract

Assume we are given a set of parallel line segments in the plane, and we wish to place a point on each line segment such that the resulting point set maximizes or minimizes the area of the largest or smallest triangle in the set. We analyze the complexity of the four resulting computational problems, and we show that three of them admit polynomial-time algorithms, while the fourth is NP-hard. Specifically, we show that maximizing the largest triangle can be done in $O(n^2)$ time (or in $O(n \log n)$ time for unit segments); minimizing the largest triangle can be done in $O(n^2 \log n)$ time; maximizing the smallest triangle is NP-hard; but minimizing the smallest triangle can be done in $O(n^2)$ time. We also discuss to what extent our results can be generalized to polygons with $k > 3$ sides.

Keywords: Computational Geometry; Imprecise points; Maximum area triangle; Minimum area triangle, k -gon.

1. Introduction

In this paper we study two classical problems in computational geometry in an imprecise context. Given a set P of n points in the plane, let the *largest-area triangle* $T_{\max}(P)$ and the *smallest-area triangle* $T_{\min}(P)$ be defined by three points of P that form the triangle with the largest or smallest area, respectively. When P is uncertain, the areas of T_{\max} and T_{\min} are also uncertain. Our aim is to compute tight bounds on these areas given bounds on the locations of the points in P . As a natural extension, we also study all the above questions for k -gons instead of triangles.

Motivation. Data uncertainty is paramount in present-day geometric computation. Many different ways to model locational uncertainty have been introduced over the past decades, and can be mainly categorized by whether the uncertainty is *discrete* or *continuous* [26], and whether we assume the uncertainty is governed by an underlying probability distribution or not [45, 1]. In this paper, we assume the uncertainty in each point is captured by a continuous set of possible locations; we call such a set an *imprecise* point. This model can

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Email addresses: `va.keikha@aut.ac.ir` (Vahideh Keikha), `m.loffler@uu.nl` (Maarten Löffler), `mohades@aut.ac.ir` (Ali Mohades)

be traced back to early attempts to create robust geometric algorithms in the 80s [42], and has attracted considerable attention since [4, 27, 31, 32, 37, 44]. Nagai and Tokura [38] first introduced the idea of analyzing the computational complexity of computing tight error bounds on an output value based on a set of imprecise points, and Löffler and van Kreveld formalized this notion to calculate bounds on the area of the convex hull [33].

The special case of using vertical line segments as uncertainty regions has received special attention in the literature. First, it is a natural first step towards general 2- or 3-dimensional uncertainty regions. Many geometric problems were first studied on segments and later generalized to squares or disks, and this is also true for imprecision [11, 12, 33]. However, 1-dimensional uncertainty already occurs naturally in several application areas. For instance laser scanners output points on a known line but the distance between the scanner and the scanned object has an error; this is especially significant when the distance is large, such as in LIDAR (Light Detection and Ranging) data [46] leading to distinct geometric challenges [24].

The same geometric problems also show up in, and are sometimes studied from the point of view of, different applications. In imaging, the problem of whether a set of vertical (or horizontal) scan lines are stabbed by a geometric object has been studied extensively several decades ago. When the object is to test whether the set of segments may be *stabbed* by a convex polygon [23], this is equivalent to asking whether a set of imprecise points, modeled as vertical segments, could possibly be in convex position [5, 30]. Computing the largest inscribed/inscribing polygons plays an important role in heuristic motion planning [22]; robots increasingly operate in uncertain environments.

Related work. There is a large body of research on the existence and computation of *empty* k -gons in a set of points [7, 39]; the best known time for finding such a k -gon for arbitrary k is $O(T(n))$, where $T(n)$ is the number of empty triangles in the set of points—we know this value can vary from $\Omega(n^2)$ to $O(n^3)$ [14].

There has been some work which focuses on constant values of k . The special case $k = 2$ is the classical problem of finding the diameter of a given set of points. Shamos presented an algorithm for the diameter problem which can find the diameter in linear time, if the convex hull of the points is given [43].

Dobkin and Snyder [15] claimed a linear-time algorithm for finding the largest-area triangle inscribed in a convex polygon. Their claim has recently been shown to be incorrect by Keikha *et al.* [29]; see also [25, 28]. There exists, however, another linear-time algorithm for this problem [9], originally intended to solve the parallel version of the problem.

Boyce *et al.* [8] presented a dynamic programming algorithm for the problem of finding the largest possible area and perimeter convex k -gon on a given set P of n points in $O(kn \log n + n \log^2 n)$ time and linear space, that Aggarwal *et al.* [3] improved to $O(kn + n \log n)$ by using a matrix search method. Both algorithms still rely on the correctness of the Dobkin and Snyder algorithm for triangles [15], and hence, also fail by the analysis in [29]. There is also an $\Omega(n \log n)$ time lower bound for finding the maximum possible area and perimeter inscribed k -gon [16].

The problem of finding the *smallest* possible area and perimeter k -gon has received considerable attention as well. Dobkin *et al.* presented an $O(k^2 n \log n + k^5 n)$ time algorithm

[13] for finding minimum perimeter k -gons. Their algorithm was improved upon by Aggarwal *et al.* to $O(n \log n + k^4 n)$ time [2]. Eppstein *et al.* [40] studied three problems: finding the smallest possible k -gon, finding the smallest empty k -gon, and finding the smallest possible convex polygon on exactly k points, where the smallest means the smallest possible area or perimeter. They presented a dynamic programming approach for these problems in $O(kn^3)$ time and $O(kn^2)$ space, that can also solve the maximization version of the problem as well as some other related problems. Afterwards, Eppstein [21] presented an algorithm that runs in $O(n^2 \log n)$ time and $O(n \log n)$ space for constant values of k .

Finally, we mention a large body of related research, such as stabbing problems or convex transversal problems, and proximity problems. In the two first aforementioned areas, the general problem is that we are given a set of geometric input objects and we want to find another object which intersects with all or most of the given input objects, such that some measure on that object is optimized [5, 6, 12, 23, 30, 33]. Also the input of such problems can be considered as a set of colored points, e.g., Daescu *et al.* [10] studied the following related problem: we are given a set of n points with $k < n$ colors, and we want to find the convex polygon with the smallest possible perimeter such that the polygon covers at least one of the given colors. They presented an $\sqrt{2}$ -approximation algorithm with $O(n^2)$ time for this problem, and proved that this problem is NP-hard if k is a part of the input.

Similarly, there are many studies in proximity problems, where the general question is the following: given a set of n points in the plane $P = \{p_1, \dots, p_n\}$, for each point p_i find a pair p_j, p_k , where $i \neq j \neq k$, such that a defined measure α on the triplet p_i, p_j, p_k is maximized or minimized. In [35] the authors studied the problem of computing the maximum value of α , where α defined by the distance of each point $p_i \in P$ from a segment $p_j p_k$, where the distance from a point p_i to a segment is the minimum distance from p_i to this segment. Their algorithm runs in $O(nh + n \log n)$, where h is the number of vertices on the convex hull of P . Their running time improved to $O(n \log n)$ [17]. Recently the problem of computing all the largest/smallest area/perimeter triangles with a vertex at $p_i \in P$ for $i = 1, \dots, n$ was studied in [36] (see also the references there), where the presented running times for the largest/smallest area triangle problems were quadratic in the worst case (we also achieve similar running times with uncertain input).

It is natural to ask how uncertainty of data affects the solutions of those problems. Motivated by this, we are interested in computing some lower bound and upper bound on the area of the smallest and largest k -gons with vertices on a given set of imprecise points modeled as parallel line segments.

In the imprecise context, Löffler and van Kreveld studied the diameter problem ($k = 2$) on a given set of imprecise points modeled as squares or as disks, where the problem is choosing a point in each square or disk such that the diameter of the resulting point set is as large or as small as possible. They presented an $O(n \log n)$ time algorithm for finding the maximum/minimum possible diameter on a given set of squares, and presented an $O(n \log n)$ time algorithm for the largest possible diameter, and an approximation scheme with $O(n^{\frac{3\pi}{\sqrt{\epsilon}}})$ time for the smallest possible diameter on a given set of disks.

These authors also computed some lower and upper bounds on the smallest/largest

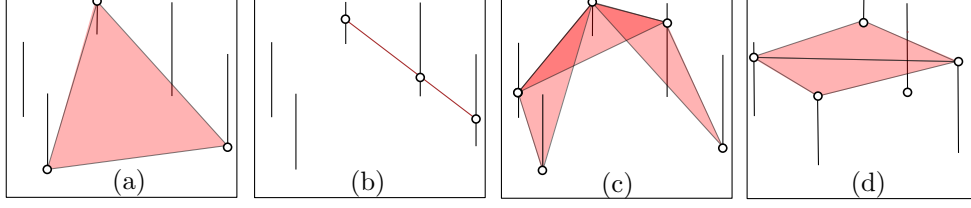


Figure 1: Problem definition and optimal solutions. (a) **MaxMaxArea**: the largest possible area triangle. (b) **MinMinArea**: the smallest possible area triangle, here degenerate. (c) **MaxMinArea**: the largest smallest-area triangle, here determined by three triangles simultaneously. (d) **MinMaxArea**: the smallest largest-area triangle, here determined by two triangles simultaneously.

area/perimeter convex hull, smallest/largest area bounding box, smallest/largest smallest enclosing circle, smallest/largest width and closest pair, where the input was imprecise, and modeled by convex regions which include line segments, squares or disks [33, 34]. The running times of the presented algorithms on the convex hull problem vary from $O(n \log n)$ to $O(n^{13})$. Their results on computing some bounds on the maximum area convex hull were later improved upon by Ju *et al.* [27].

Contribution. In this paper, we consider the problems of computing the largest-area triangle and smallest-area triangle under data imprecision. We are given a set $L = \{l_1, l_2, \dots, l_n\}$ of imprecise points modeled as disjoint parallel line segments, that is, every segment l_i contains exactly one point $p_i \in l_i$. This gives a point set $P = \{p_1, p_2, \dots, p_n\}$, and we want to find the largest-area triangle or smallest-area triangle in P , T_{max} and T_{min} . But because L is a set of imprecise points, we do not know where P is, and the areas of these triangles could have different possible values for each instance P . We are interested in computing a tight lower and upper bound on these values. Hence, the problem becomes to place a point on each line segment such that the resulting point set maximizes or minimizes the size of the largest or smallest possible area triangle. Therefore four different problems need to be considered (refer to Figure 1).

- **MaxMaxArea** What is the largest possible area of T_{max} ?
- **MinMinArea** What is the smallest possible area of T_{min} ?
- **MaxMinArea** What is the largest possible area of T_{min} ?
- **MinMaxArea** What is the smallest possible area of T_{max} ?

Results. We obtain the following results for triangles.

- For a given set of equal length parallel line segments, **MaxMaxArea** can be solved in $O(n \log n)$ time² (Section 2.1).

²In a preliminary version of this paper, we claimed a faster method, which relied on the correctness of the Dobkin and Snyder algorithm for finding the largest-area inscribed triangle [15]. That paper has since been shown incorrect [29], and our present results reflect this.

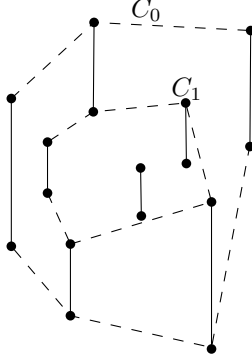


Figure 2: C_0 and C_1 on a given set of line segments.

- For arbitrary length parallel line segments, **MaxMaxArea** can be solved in $O(n^2)$ time (Section 2.2).
- **MinMinArea** can be solved in $O(n^2)$ time (Section 3).
- **MaxMinArea** is NP-hard (Section 4).
- For arbitrary length parallel line segments with fixed points as the leftmost and rightmost segments, **MinMaxArea** can be solved in $O(n \log n)$ time (Section 5.2).
- For arbitrary length parallel line segments **MinMaxArea** can be solved in $O(n^2 \log n)$ time (Section 5.3).

We also discuss to what extent our results can be generalized to polygons with $k > 3$ sides.³ As we discuss in Section 6, not all problems are well-posed anymore, but we can ask for the possible sizes of the largest convex shape with *at most k vertices*. We obtain the following results.

- **MaxMaxArea** for *at most k points* can be solved in $O(kn^3)$ time (Section 6.1).
- **MinMaxArea** for *at most k points* can be solved in $O(kn^8 \log n)$ time (Section 6.2).

Definitions. Without loss of generality, assume the parallel segments in L are vertical. Let $Z = \{l_1^-, l_1^+, l_2^-, l_2^+, \dots, l_n^-, l_n^+\}$ be the set of all endpoints of L , where l_i^+ denotes the upper endpoint of l_i , and l_i^- denotes the lower endpoint of l_i . Let $CH(Z)$ and $\partial CH(Z)$ denote the convex hull and the boundary of the convex hull of Z , respectively. We define $C_0 = CH(Z)$ as the convex hull of Z , and $C_1 = CH(Z \setminus \partial CH(C_0))$, that is C_0 and C_1 are the first two layers of the onion decomposition of Z , as shown in Figure 2. A *true* object is an object such that all its vertices lie on distinct line segments in L . In particular we use the terms *true triangle*, *true convex hull*, *true chord* and *true edge* throughout the paper. Note that an optimal solution to any of our problems is always a true object.

Boyce *et al.* [15] defined a *rooted* triangle (or more generally, a rooted polygon) as a triangle with one of its vertices fixed at a given point (in a context where the rest of the

³As said before, for the case $k = 2$, the problem becomes computing the smallest/largest diameter of L which is studied in [34].

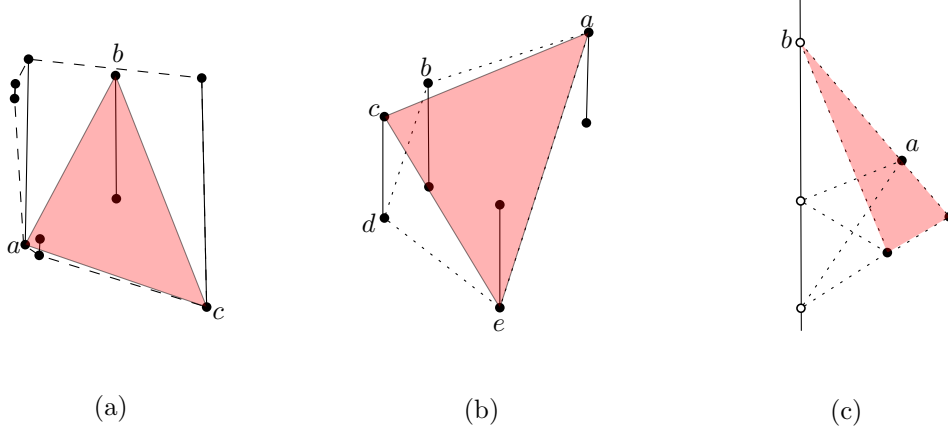


Figure 3: Three examples. In (a,b) the largest-area triangle is shown in red. The dashed polygon in (a) is the convex hull of the line segments; the dotted polygon in (b) is the largest-area convex hull possible by selecting a single point on each segment. (a) The largest-area true triangle selects its vertices from the endpoints of the line segments, but not necessarily from those on the convex hull. (b) The largest-area true convex hull ($abde$) does not contain the maximum-area true triangle (ace). (c) A set of one imprecise point and three fixed points, and the resulting largest-area strictly convex 4-gon. The inner angle at a approaches π . Note that any convex 4-gon must include the fixed points, so the largest area occurs as the point on the segment approaches b .

vertices are to be chosen from a fixed set of candidates). Here, we define a *root* as a given point on a specific line segment in L . In this case we throw out the remainder of the root's region and try to find the other two vertices in the remaining $n - 1$ regions. For a given point a on some line segment, we denote this segment by l_a . Also l_l and l_r denote the leftmost and rightmost line segments, respectively.

2. MaxMaxArea problem

In this section, we will consider the following problem: given a set $L = \{l_1, \dots, l_n\}$ of parallel line segments, choose a set $P = \{p_1, \dots, p_n\}$ of points, where $p_i \in l_i$, such that the size of the largest-area triangle with corners at P is as large as possible among all possible choices of P (see Figure 1(a)). Observe that this is, in fact, equivalent to finding three points on three different elements of L that maximize the area of the resulting triangle.⁴ First we review several related previous results, then we discuss some difficulties that occur when dealing with imprecise points.

Boyce *et al.* [15] consider the problem of computing the largest-area k -gon whose vertices are restricted to a given set of n points in the plane, and prove that the optimal solution only uses points on the convex hull of the given point set (if there exist at least k points on the convex hull). Löffler and van Kreveld [33] proved that the maximum-area convex polygon on a given set of imprecise points (modeled as line segments) always selects its vertices from the convex hull of the input set. As a result, one might lead to conjecture that

⁴Note that a similar statement will be true for MinMinArea, but not for MaxMinArea and MinMaxArea.

the maximum-area triangle selects its vertices from the endpoints of regions on the convex hull. This is not the case, as can be seen in Figure 3(a) (notice that the number of vertices of the convex hull is not fixed). Also, unlike in the precise context, the largest-area triangle is not inscribed in the largest possible convex hull of the given set of imprecise points, as illustrated in Figure 3(b). This problem is further complicated for larger values of k , as illustrated in Figure 3(c); even for $k=4$, we cannot find the area of the maximum strictly convex k -gon, as the angle at a approaches π and we can enlarge the area of the convex 4-gon arbitrarily. We elaborate in Section 6.

Observation 1. *Let L be a given set of imprecise points modeled as arbitrary length parallel line segments, and let Z be its set of endpoints. If the largest-area triangle on Z is not a true triangle in L , then the segment $l \in L$ that contributes two vertices to the largest-area triangle on Z , does not necessarily contribute a vertex to the largest-area true triangle on L .*

Proof. The proof is done through providing a counter-example. Consider a set of one imprecise point bd and three points a , c and e , as illustrated in Figure 4(a). The largest-area triangle is abd , but the largest-area true triangle is ace , where e (resp. c) is located within the (gray) apex of the wedge which is constructed by emanating two rays at d (resp. b) parallel to ac and ab (resp. ad and ae). \square

Observation 2. *Let L be a given set of imprecise points modeled as parallel line segments. There is an optimal solution to the **MaxMaxArea** problem, such that all the vertices are chosen at endpoints of the line segments.*

Proof. Suppose there exist three points p , q and r that form a true triangle, which has maximal area, and suppose that p is not at an endpoint of l_p . If p is not at an endpoint of its segment, we can consider a line ℓ through p and parallel to qr . If we sweep ℓ away from qr , it will intersect l_p until it leaves l_p in a point p' . Clearly the triangle $p'qr$ has larger area than pqr , and p' can be substituted for p to give us a larger area true triangle, and thus pqr cannot be the largest-area true triangle (if ℓ and l_p are parallel, we can choose either endpoints and the area is the same). \square

Observation 3. *If at most two distinct line segments appear on C_0 , there is an optimal solution to the **MaxMaxArea** problem, such that the two segments which appear on C_0 always appear on the largest-area true triangle.*

Proof. From the previous observation we know that the largest-area true triangle selects its vertices from the endpoints of the line segments. Now we will prove that if at most two distinct segments appear on C_0 , these segments always contribute to the largest-area true triangle. Suppose this is not true. Then there are two cases. First, suppose that there exist three points p , q and r at the endpoints of three different segments, such that pqr has maximal area, and (w.l.o.g) p and r , respectively, have the lowest and highest x -coordinates among the vertices of pqr , and none of the vertices of pqr are selected from the vertices of C_0 , as illustrated in Figure 4(b). We consider a line ℓ through r and parallel to pq . If we sweep ℓ away from pq , it will intersect C_0 until ℓ leaves C_0 at a point r' , such that r' should

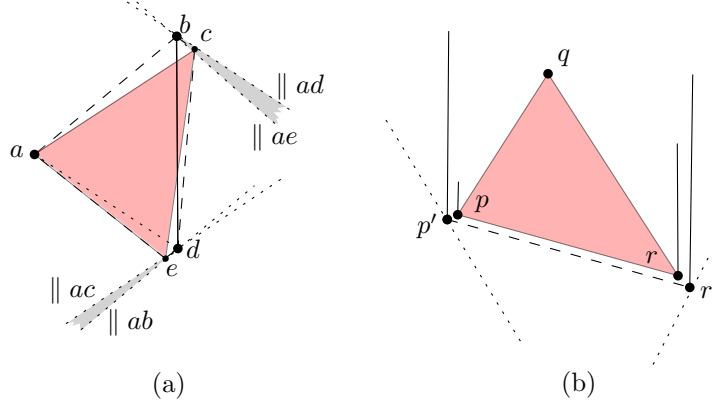


Figure 4: (a) If the largest-area triangle is not a true triangle, then the segment that contributes two vertices to the largest-area triangle, does not necessarily contribute a vertex to the largest-area true triangle. (b) If at most two distinct line segments appear on C_0 , the two regions which appear on C_0 , always appear on the largest-area true triangle.

belong to one of the two segments that currently appeared on C_0 . We also consider a line ℓ' through p and parallel to qr . If we sweep ℓ' away from qr , it will intersect C_0 until ℓ' leaves C_0 at a point p' , and thus p' and r' can be substituted for p and r to give us a larger area true triangle, a contradiction.

Second suppose there exist three points p , q and r that form a true triangle, has maximal area, and selects only one of its vertices, e.g., p , from C_0 . Then p either is the leftmost or the rightmost vertex of the triangle pqr . We will show that one of the other vertices of pqr should also be on C_0 . We consider a line ℓ through r and parallel to pq . If we sweep ℓ away from pq , it will intersect C_0 until ℓ leaves C_0 at a point r' , that belongs to the other segment that currently appears on C_0 , and thus r' can be substituted for r to give us a larger area true triangle. Contradiction. \square

From now on, we assume more than two distinct segments appear on C_0 . Because otherwise we can easily solve the problem in $O(n)$ time; two distinct endpoints of the line segments appearing on C_0 determine the base of the largest-area true triangle.

2.1. Equal-length parallel line segments

We show that for a set of equal-length parallel line segments, the largest-area triangle selects its vertices from the vertices on C_0 and is almost always a true triangle. The only possible configuration of the line segments that makes the largest-area triangle a non-true triangle is collinearity of all the upper (or lower) endpoints, in which case the largest-area true triangle will always select one vertex at the leftmost segment and one vertex at the rightmost one. Clearly, we can test whether this is the case in $O(n)$ time. In the following we show that if the upper endpoints are not collinear, we can directly apply any existing algorithm for computing the largest-area triangle on a point set.

Lemma 1. *Let L be a set of equal-length parallel line segments (not all the upper endpoints collinear). The largest-area true triangle selects its vertices from the vertices on C_0 .*

Proof. In observation 2 we have proved that the vertices of largest-area true triangle are selected from the endpoints of their segments.

Now we prove that the vertices of largest-area true triangle are selected from the vertices on C_0 . Suppose this is false. Let abc be the largest possible area true triangle, such that at least one of its vertices, e.g., a , is not located on C_0 , as illustrated in Figure 5(a). Then a would be at the endpoint of l_a , but it is not on the convex hull. Also l_a cannot be the leftmost or the rightmost line segment, because otherwise at least one of the endpoints must appear on C_0 . First suppose a does not have the lowest or highest x -coordinate among the vertices of abc . But then either l_a is located completely inside C_0 , or it has an endpoint a'' on C_0 (see Figure 5(a,b)).

We consider a line ℓ through a and parallel to bc . If we sweep ℓ away from bc , ℓ will intersect C_0 until it leaves C_0 in a vertex q . If $q \notin \{l_b, l_c\}$, q can be substituted for a to give us a larger area true triangle, a contradiction.

Now suppose $q \in \{l_b, l_c\}$, as illustrated in Figure 5(a,b). Let b' and c' denote the other endpoints of l_b and l_c , respectively. But then there always exists another segment l_p which shares a vertex p on C_0 . Note that since the segments have equal length, $l_p \notin \{l_b, l_c\}$, (but l_p can coincide with l_a). Thus p can be substituted for a , b' can be substituted for b and c' can be substituted for c to give us a larger area true triangle, a contradiction.

Now suppose (w.l.o.g) a has the lowest x -coordinate, as illustrated in Figure 5(c). Consider the supporting line of l_a , ℓ . This crosses the upper and lower hull boundary at a'' and a' , respectively. Then abc is interior to one half plane on ℓ . Because of a convexity argument, and because a is strictly interior to the C_0 , there will be a point p that lies in the opposite half plane from the one which contains b and c , such that either a lies in the strip defined by bc and a line through p parallel to bc , in which case $pbc > abc$, or a does not lie in that strip and $a''bc > abc$. Both give a contradiction. □

Note that relations between triangles refer to their areas.

Lemma 2. *Let L be a set of equal-length parallel line segments. Unless the upper (and lower) endpoints of L are collinear, the largest-area triangle is always a true triangle.*

Proof. Suppose the lemma is false. Let $l_l^- l_r^- l_l^+$ be the largest-area triangle on a given set L of imprecise points modeled as equal-length parallel line segments, and let l_l and l_r be the line segments that have the largest-area triangle constructed on them, as illustrated in Figure 5(d). There cannot be any other line segments to the left of l_l and to the right of l_r , because otherwise we can construct a larger area triangle by using one of those line segments. Thus, all the other line segments must be located between l_l and l_r . Suppose l_p be one of them. It is easy to observe that $l_l^+ l_p^- l_r^+$ (or $l_l^- l_p^+ l_r^-$) will have a larger area than $l_l^- l_r^- l_l^+$, because with a fixed base length $l_l^- l_r^-$, $l_l^+ l_p^- l_r^+$ has a height longer than the length of the given input line segments, but $l_l^- l_r^- l_l^+$ has a height smaller than the length of the input line segments. Contradiction. □

Recall that a rooted polygon is a polygon with one of its vertices fixed at a given point in a specific line segment.

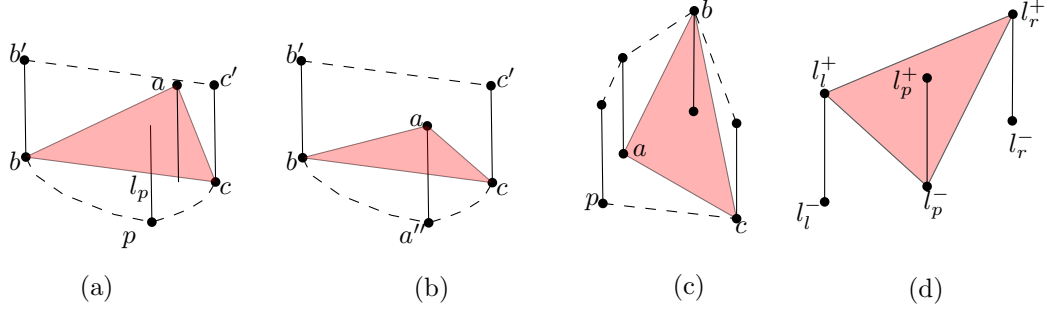


Figure 5: (a,b,c) The largest-area true triangle on a given set of equal-length parallel line segments selects its vertices from the vertices on C_0 . (d) In a given set of equal-length parallel line segments, the largest possible area triangle almost is always a true triangle.

Theorem 1. *Let L be a set of n imprecise points modeled as a set of disjoint parallel line segments with equal length. The solution of the problem **MaxMaxArea** can be found in $O(n \log n)$ time.*

Proof. We first compute C_0 . From Lemma 2 we know the largest-area triangle for a given set of equal-length parallel line segments is always a true triangle. Then, we can apply the existing linear time algorithm to compute the largest-area inscribed triangle [9]. \square

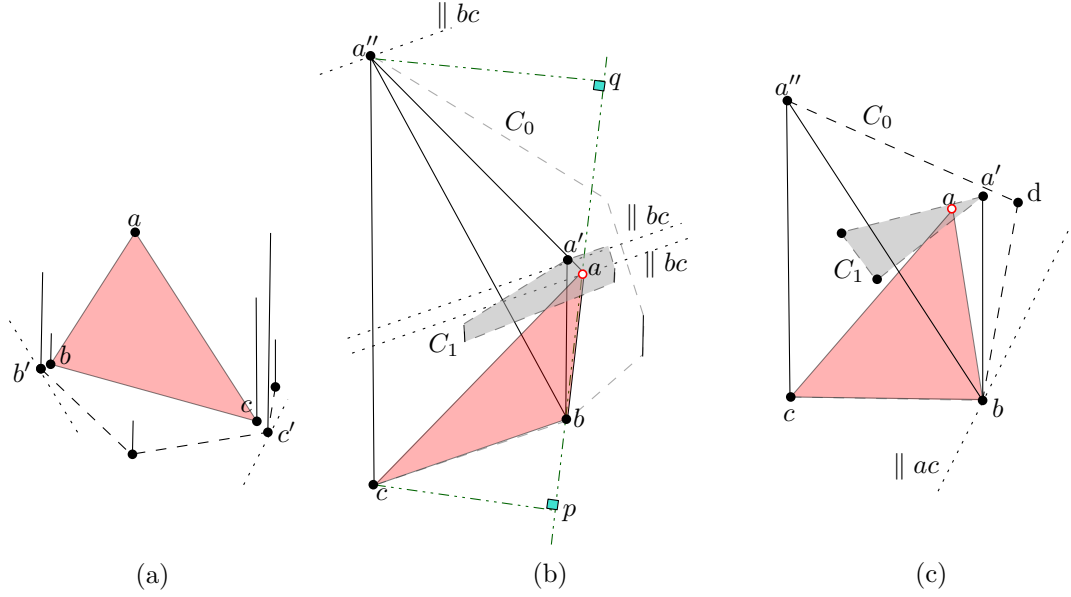


Figure 6: (a) The largest-area true triangle selects at least two vertices from the vertices of C_0 : if not, we can improve the area. (b,c) The largest-area true triangle cannot have a vertex inside C_1 .

2.2. Arbitrary length parallel line segments

In this section, we consider the **MaxMaxArea** problem for a given set of arbitrary length parallel line segments. For simplicity we assume no two vertical line segments have the same x -coordinates.

Lemma 3. *At least two vertices of the largest-area true triangle are located on C_0 , and at most one of its vertices is located on C_1 , and all three are on $C_0 \cup C_1$.*

Proof. First we will prove that at least two vertices of the largest area true triangle are located on C_0 . Suppose this is not true, so the largest-area true triangle can have fewer vertices on C_0 .

In the beginning, we prove that it is not possible that none of the vertices of the largest-area true triangle are located on C_0 . Let abc be the largest-area true triangle that does not select any of its vertices from C_0 , and let b and c have the lowest and highest x -coordinates, respectively, as illustrated in Figure 6(a). We consider a line ℓ through c (resp. b) and parallel to ab (resp. ac). If we sweep ℓ away from ab (resp. ac), it will intersect C_0 , until it leaves C_0 in a point c' (resp. b'), and b' and c' can be substituted for b and c , respectively, to give us a larger area true triangle. Contradiction.

Again let abc be the largest-area true triangle that selects only one of its vertices, e.g., a , on C_0 . We will show that at least one of the other vertices of abc must also be located on C_0 . Suppose the x -coordinate of a is between the x -coordinates of b and c (since otherwise with the same argument we had above, at least another vertex will also be located on C_0). We consider a line ℓ through c and parallel to ab . If we sweep ℓ away from ab , it will intersect C_0 until it leaves C_0 in a point c' , that does not belong to the regions of l_a and l_b . We can

also do the same procedure for the point b and find another point b' , and thus, b' and c' can be substituted for b and c , respectively, to give us a larger area true triangle. Contradiction. Thus, at least two vertices of the largest-area true triangle should be located on C_0 .

Second we will prove that if the third vertex of the largest-area true triangle is not located on C_0 , it must be located on C_1 . Suppose this is false.

Let abc be the largest-area true triangle, and (w.l.o.g) let a be the vertex that is not located on C_0 . Suppose this is not true, that a cannot be located interior to C_1 . Notice that b and c must be located on C_0 . We consider a line ℓ through a and parallel to bc . If we sweep ℓ away from bc , it will intersect C_1 until it leaves C_1 in a point a' . If this point does not belong to l_b or l_c , we are done. Suppose $a' \in l_b, l_c$. We continue sweeping ℓ until it leaves C_0 in a vertex a'' . Suppose again that it belongs to one of l_b or l_c (since otherwise we have found a larger area true triangle and we are done). Note that we also did not find any other vertex during the sweeping ℓ away from bc .

Suppose that $a''q$ and cp are the perpendicular segments to the supporting line of ab from a'' and c , respectively, as illustrated in Figure 6(b). First suppose both of the l_b and l_c are located to the left (or right) of l_a . Since c and a'' belong to the same segment, and from the slope of the supporting line of ba we understand that the intersection of the supporting lines of $a''c$ and ba would be to the right of the supporting line of \overrightarrow{cb} . It follows that the triangle $aa''b > abc$, since with a fixed base ab , the height $a''q$ is longer than cp . Contradiction.

Now suppose only one of the line segments l_b or l_c is located to the left (or right) of l_a . Without loss of generality, suppose l_c is located to the left of l_a , as illustrated in Figure 6(c). Let d be the next vertex of a'' on the cyclic ordering of C_0 (note that d always exists since C_0 and C_1 are disjoint). Obviously $a''db$ is always a true triangle. Since $a'a''b = a'cb$, $a'cb > acb$ and $a''bd > a''ba'$, we would have $a''db > abc$. Contradiction. \square

Corollary 1.1. *Let $C_0 = \{p_1, \dots, p_m\}$ be a convex polygon, constructed at the endpoints of a set of arbitrary-length parallel line segments. There exists an i ($1 \leq i \leq m$) such that the largest-area true triangle rooted at p_i is the largest-area true triangle inscribed in C_0 .*

We start solving the **MaxMaxArea** problem by considering the case where all the vertices of the largest-area true triangle are the vertices on C_0 . The case where one of the vertices of the optimal solution is located on C_1 will be considered later.

2.2.1. Algorithm: Largest-area true triangle inscribed in C_0

We first compute $C_0 = \{p_1, \dots, p_m\}$, in a representation where vertices are ordered along its boundary in counterclockwise (ccw) direction. The idea is to find the largest-area true triangle with base on all the chords of C_0 . We start our algorithm from an arbitrary vertex p_1 as the root. We check which of the possible true chords p_1p_i , where $i = 2, \dots, m$, will form a larger-area true triangle. Let p_j be the furthest vertex (in vertical distance) from true chord p_1p_i , then either p_j , or one of the two previous or next neighbors of p_j will construct the largest-area true triangle in the base p_1p_i . If $p_1p_ip_j$ is not true, at most four triangles $p_1p_ip_{j-1}$, $p_1p_ip_{j+1}$, $p_1p_ip_{j-2}$ and $p_1p_ip_{j+2}$ are candidates of constructing the largest-area true triangle on the base p_1p_i . Note that a chord always divides a convex polygon into two convex

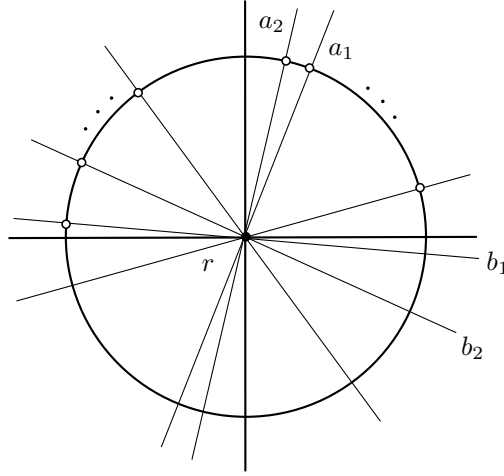


Figure 7: Illustration of the reduction from set disjointness problem.

polygons. We look for the largest-area true triangle on the base p_1p_i on both halves of C_0 simultaneously.

In the next step of the algorithm, we start looking for the furthest vertex of p_1p_{i+1} (if it is a true chord) linearly from p_j and in counterclockwise direction. We stop looking on p_1 when we reach to the chord p_1p_m .

We repeat the above procedure in counterclockwise order, where in each step, we consider one vertex of C_0 as the root. We stop the algorithm when we return to p_1 , and report the largest-area true triangle we have found. This algorithm is outlined in Algorithm 1 and illustrated in Figure 8. It is easy to observe that Algorithm 1 takes $O(n^2)$ time.

Now we give a lower bound for computing the largest-area triangle rooted at a given vertex r .

Theorem 2. *There exists a lower bound $\Omega(n \log n)$ for computing the largest-area true triangle rooted at a given vertex r .*

Proof. Our reduction follows the set disjointness problem which has an $\Omega(n \log n)$ lower bound in the algebraic decision tree model [41]: Given two sets $A = \{a_1, a_2, \dots, a_n\}$, $B = \{b_1, b_2, \dots, b_n\}$, determine whether or not $A \cap B = \emptyset$.

We map each a_i to the line $y = a_i x$. Also each b_i is mapped to the line $y = -1/b_i x$. Consider the set of $2n$ intersection points of these lines with the first and second quadrants of the unit circle, centered at the origin r of the coordinate system, as illustrated in Figure 7. Clearly, the maximum size of the largest-area triangle rooted at r can be $1/2$. But a triangle of this size appears if and only if there exists two elements $a_i \in A$ and $b_j \in B$, where $a_i = b_j$.⁵ Thus there exist two elements $a_i \in A$ and $b_j \in B$, where $a_i = b_j$, if and only if either the size of the largest-area triangle rooted at r equals $1/2$. \square

⁵We assume w.l.o.g that A and B do not include 0.

Note that our algorithm runs in $O(n^2)$ time, while $O(n)$ points are considered as root r .⁶ Also notice that this lower bound is only for the case where we do not know the sorted order of the points on C_0 , and the line segments are very short.

Algorithm 1: Largest-area true triangle inscribed in C_0

Legend Operation *next* means the next vertex in ccw order

Procedure LARGEST-INSCRIBED-TRIANGLE(C_0)

Input $C_0 = p_1, \dots, p_m$: convex polygon of the segments, p_1 : a vertex of C_0

Output T_{max} : Largest-area true triangle

$a = p_1$

$max = 0$

while *true* **do**

$b = \text{next}(a)$

if $b \in l_a$ **then**

$b = \text{next}(b)$

end

$c_l, c_r =$ farthest vertices from ab (in vertical distance and on both halves of C_0)

while $c_l \neq a$ **do**

if c_l (resp. c_r) $\in \{l_a, l_b\}$ **then**

 update c_l (resp. c_r) with another vertex with farthest distance from ab
 (among two previous or next neighbors of c_l), such that abc_l (resp. abc_r)
 is true.

end

$max = \max(abc, abc_l, abc_r)$

$b = \text{next}(b)$

if $b \in l_a$ **then**

$b = \text{next}(b)$

end

while c_l (resp. c_r) is not the farthest vertex from ab **do**

$c_l = \text{next}(c_l)$ (resp. $c_r = \text{next}(c_r)$)

end

end

$a = \text{next}(a)$

if $a = p_1$ **then**

return max

end

end

Lemma 4. *Algorithm 1 finds the largest-area true triangle inscribed in C_0 .*

Proof. From Lemma 3 and Corollary 1.1 we know the largest-area true triangle inscribed on C_0 will be constructed on a true chord of C_0 . In Algorithm 1 we consider all the vertices

⁶Reducing this running time is an interesting open problem, even when the input is a set of points (see, e.g., [36]).

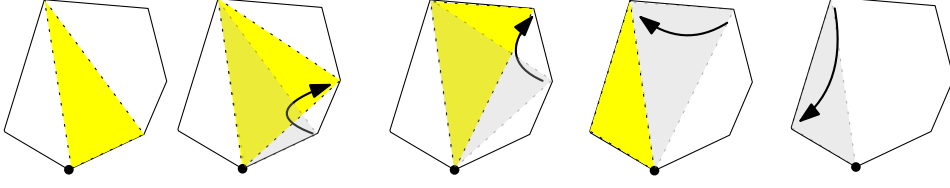


Figure 8: The first step of Algorithm 1

of C_0 as the root, and we compute the largest-area true triangle on each true chord of C_0 . Thus the algorithm works correctly. \square

Corollary 2.1. *Let L be a set of imprecise points modeled as a set of n parallel line segments with arbitrary length. The largest-area true triangle which selects its vertices from the vertices on C_0 can be found in $O(n^2)$ time.*

2.2.2. Algorithm: Largest-area true triangle

From Lemma 3 we know the combinatorial structure of the largest-area true triangle: it can be the largest-area true triangle inscribed in C_0 , or the largest-area true triangle that selects two neighboring vertices on C_0 and one vertex on C_1 , or the one that selects two non-neighboring vertices on C_0 and one vertex on C_1 . The largest-area true triangle is the largest-area triangle among them.

In the first case, from Corollary 2.1 the largest-area true triangle can be found in $O(n^2)$ time.

In the second case, we consider all the true edges of C_0 as the base of a triangle. The third vertex of each triangle can be found by a binary search on the boundary of C_1 . Let bc be a true edge of C_0 . If a triangle abc on the base bc is not true, one of the next or previous neighbors of a on the cyclic ordering of C_1 may construct the largest-area true triangle on bc (see Figure 9(a,b)). In fact if the next or previous neighbor of a also belongs to l_b or l_c , then there always exists a vertex a' on C_0 that makes a larger true triangle on bc , as illustrated in Figure 9(b). Thus, in this case again, the largest-area true triangle can be computed in $O(n \log n)$ time.

In the third case, there are $O(n^2)$ chords to be considered as the base of the largest-area true triangle. Since a chord of C_0 may decompose C_1 into two convex polygons, we should do a binary search on each half of C_1 , separately. This method costs $O(n^2 \log n)$ time totally. But we can still do better.

Let r be any vertex on C_1 ; we will search for the largest-area rooted triangle on r . An axis system centered on r will partition C_0 into four convex chains, so that the largest-area true triangle should be rooted at r and two points on the other quadrants, as illustrated in Figure 9(c).

From Corollary 2.1 we know if one quadrant, or two consecutive quadrants include the other vertices of the largest-area true triangle, we can find the largest-area true triangle in $O(n^2)$ time, since it will be constructed on the vertices of the boundary of a convex polygon.

Suppose two other vertices belong to two diagonal quadrants, e.g., quadrant one and quadrant three, as illustrated in Figure 9(d). Let the cyclic ordering of C_0 be counterclockwise,

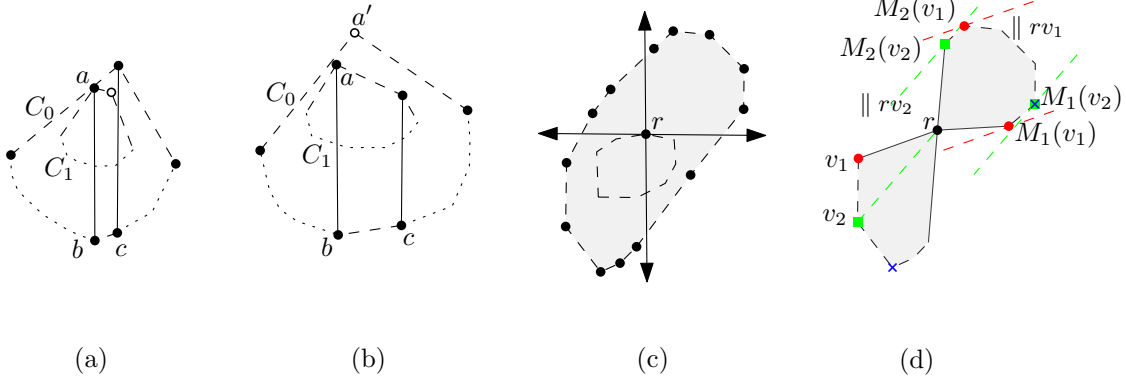


Figure 9: (a,b) Possible cases of observing a non-true triangle abc during a binary search on the boundary of C_1 . (b) If the next or previous neighbor of a belongs to l_b or l_c , there always exists a vertex $a' \in C_0$ which makes a larger true triangle on the base bc . (c) Selection of point r on C_1 as the origin. (d) In the diagonal quadrants, for a vertex v_2 in the third quadrant, we only need to look for the third vertex of the largest-area true triangle (on the base v_2r) in the first quadrant from $f_1(v_1)$ and $f_2(v_1)$.

and let v_1 and v_2 be the first and second vertices of the third quadrant in the cyclic ordering of C_0 . Then we can find $f_1(v_1)$ and $f_2(v_1)$ on quadrant one, so that v_1, r and each of $f_1(v_1)$ and $f_2(v_1)$ construct the largest-area true triangle on the base v_1r , as we can see in Figure 9(d). We named $f_1(v_1)$ and $f_2(v_1)$ the *starting points*. The starting points determine the starting position of looking (in ccw direction) for $f_1(v_2)$ and $f_2(v_2)$, so that v_2, r and each of $f_1(v_2)$ and $f_2(v_2)$ construct the largest-area true triangle on the base v_2r , etc.

Thus, for any fixed $r \in C_1$ and any vertex $v_i \in C_0$ on the third quadrant, we start looking for $f_1(v_i)$ and $f_2(v_i)$ from $f_1(v_{i-1})$ and $f_2(v_{i-2})$ (in ccw direction) on the first quadrant, respectively.

Note that for any vertex r on C_1 , the rooted triangle at r can also be a non-true triangle. Suppose we are looking for $f_1(v_1)$ and $f_2(v_1)$ of vertex v_1 in quadrant three. If r belongs to l_{v_1} , we discard v_1 . Let $r \in l_{f_1(v_1)}$ (or $r \in l_{f_2(v_1)}$). Then one of the next or previous neighbors of $f_1(v_1)$ should be the area-maximizing vertex on the base v_1r , and this point cannot belong to l_{v_1} or l_r .

Therefore, in the case where we are looking on diagonal quadrants, e.g., quadrant one and quadrant three, for any vertex $r \in C_1$, we first find the starting points for the first vertex in quadrant three in $O(\log n)$ time, and then we only wrap around C_0 in at most one direction and never come back. Thus, for any $r \in C_1$, the largest-area true triangle can be found in $O(n)$ time, and the largest-area true triangle can be found in $O(n^2)$ time totally. The whole procedure of computing the largest-area true triangle is outlined in Algorithm 2.

Observation 4. *Let L be a set of n imprecise points modeled as parallel line segments with arbitrary length. The largest-area rooted true triangle can be found in $O(n \log n)$ time.*

Proof. Let r be the root. In Corollary 1.1 we considered the case where r is a vertex on the boundary of C_0 . If r is a point inside C_0 , we set r as the origin and compute the four possible quadrants of C_0 . It is easy to observe that the largest-area true triangle rooted at r can be found in $O(n \log n)$ time.

□

Algorithm 2: MaxMaxArea

Legend Operation **next** means the next vertex in counterclockwise order

Input $L = \{l_1, \dots, l_n\}$

Output : largest-area true triangle

$Z =$ the set of all the endpoints of elements of L

$C_0 = CH(Z)$

$C_1 = CH(Z \setminus \partial CH(C_0))$

$T_{C_0} = \text{LARGEST-INScribed-TRIANGLE}(C_0)$

while *there is an unprocessed vertex r on C_1* **do**

$Q_1, Q_2, Q_3, Q_4 =$ Partitioning C_0 into four convex chains (in ccw direction) by considering an axis system centered on r .

$T_{C_0, C_1} = \text{Max}(\text{Largest-Inscribed-Triangle}(Q_1 \cup Q_2 \cup \{r\}),$

$\text{LARGEST-INScribed-TRIANGLE}(Q_2 \cup Q_3 \cup \{r\}),$

$\text{LARGEST-INScribed-TRIANGLE}(Q_3 \cup Q_4 \cup \{r\}),$

$\text{LARGEST-INScribed-TRIANGLE}(Q_4 \cup Q_1 \cup \{r\}))$

$v =$ the first vertex of Q_3

while *there is an unprocessed vertex $v \in Q_3$* **do**

if $v \in l_r$ **then**

$v = \text{next}(v)$

end

$f_1(v), f_2(v) =$ the farthest vertices from vr on Q_1

if $f_1(v)$ or $f_2(v) \in \{l_r, l_v\}$ **then**

update $f_1(v)$ or $f_2(v)$ with its next or previous neighbor which has the farthest vertical distance from vr

end

$T_{C_0, C_1} = \text{Max}(vr f_1(v), vr f_2(v), T_{C_0, C_1})$

$v = \text{next}(v)$

end

repeat above while loop for Q_2 and Q_4

$r = \text{next}(r)$

end

return $\text{Max}(T_{C_0}, T_{C_0, C_1})$

Theorem 3. *Let L be a set of n imprecise points modeled as a set of parallel line segments with arbitrary length. The solution of the problem **MaxMaxArea** can be found in $O(n^2)$ time.*

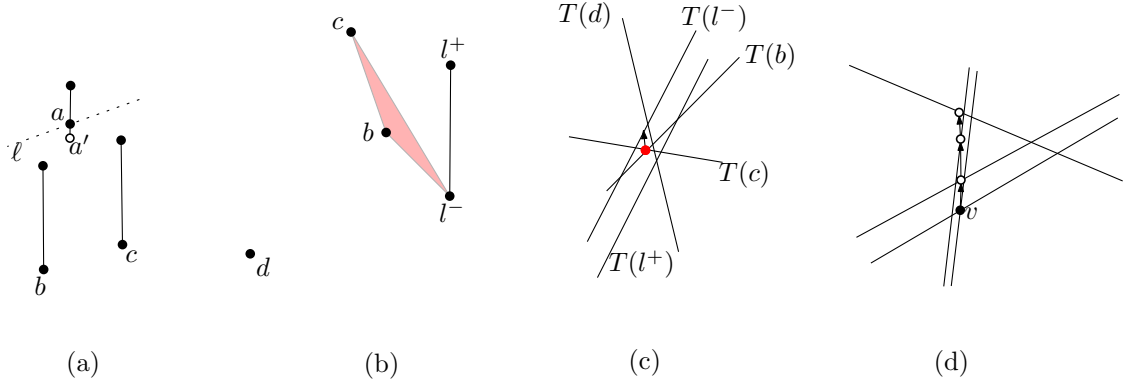


Figure 10: (a) The smallest-area true triangle selects its vertices at the endpoints of line segments. (b,c) The smallest-area true triangle on a set consists of one imprecise and three single points, and the optimal solution in the dual space. (d) We need to continue the movements in the up and down direction, when we encounter a line which is parallel to the ones intersecting at v .

3. MinMinArea problem

In this section, we will consider the following problem: given a set $L = \{l_1, \dots, l_n\}$ of parallel line segments, choose a set $P = \{p_1, \dots, p_n\}$ of points, where $p_i \in l_i$, such that the size of the smallest-area triangle with corners at P is as small as possible among all possible choices of P (see Figure 1(b)). As in the case of **MaxMaxArea**, this problem is equivalent to finding three points on distinct elements of L that minimize the area of the resulting triangle.

The problem of finding the smallest-area triangle in a set of n precise points is 3SUM-hard⁷, as it requires testing whether any triple of points is collinear. In our case, if we find three collinear points on three distinct segments, the smallest-area true triangle would have zero area.

Observation 5. *Let L be a set of n vertical line segments. Deciding whether there are three collinear points on three distinct line segments can be done in $O(n^2)$ time.*

Proof. The idea is look at the vertical segments in the dual space, where each vertical segment is transformed to a strip. Then, if there exists a common point in the strips corresponding to three distinct line segments, this point denotes a line passing through those segments in the primal space. This can easily be checked by a topological sweep of the arrangement of strips in which a curve l sweeps over the intersection points, e.g., from left to right in the dual space, while l keeps track of the required information about the intersected strips by l . Since a topological sweep of an arrangement can be done in $O(n^2)$ time [19], we can test whether there are three collinear points on three distinct segments in $O(n^2)$ time. \square

In the following we will show that when the smallest-area true triangle has non-zero area, it selects its vertices on the endpoints of the line segments.

⁷The class of problems which is unknown to be solvable in $O(n^{2-\epsilon})$ time for some $\epsilon > 0$.

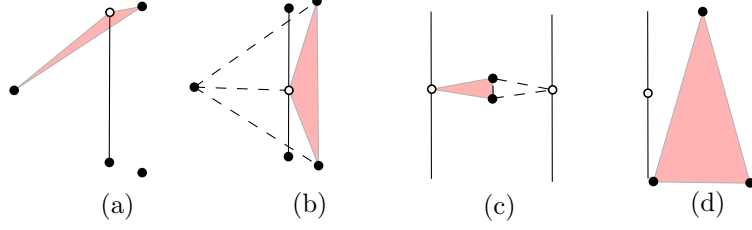


Figure 11: Some observations on the **MaxMinArea** and the **MinMaxArea** problems. (a) The solution of the largest smallest-area triangle on a set consisting of one imprecise point and three single points, where it must be located at the endpoints. (b) The largest smallest-area triangle of (a). (c) The solution of smallest largest-area triangle on a set consisting of two imprecise points and two fixed points selects the interior points of the line segments. (d) The smallest largest-area triangle on a set consisting of two imprecise points and three fixed points.

Lemma 5. *Let L be a set of imprecise points modeled as a set of parallel line segments. Suppose there is no zero-area triangle in L . The smallest-area true triangle selects its vertices on the endpoints of the line segments.*

Proof. Suppose the lemma is false. Let abc be the smallest-area true triangle, and suppose at least one of its vertices e.g., a , is not located at the endpoints of l_a (see Figure 10(a)). Consider a line ℓ through a and parallel to bc . If we sweep ℓ towards bc , it will intersect l_a until it leaves l_a at a point a' . Thus a' can be substituted for a to give us a smaller area true triangle, a contradiction. \square

We now introduce some notation. Let L be a set of imprecise points modeled as parallel line segments, and let Z be the set of all endpoints of L . For a given point $p = (p_x, p_y)$, we consider $T(p) = p_x - p_y$ as a transformation of p to a dual space, and $A(Z)$ as the arrangement of the lines that are the transformation of Z in dual space, as Edelsbrunner *et al.* [20] defined for a given set of points in the plane. Let $T(l_a^+)$ (resp. $T(l_a^-)$) denote the transformation of the upper (resp. lower) endpoint of l_a in the dual space. $A(Z)$ partitions the plane into a set of convex regions, and $A(Z)$ has total complexity of $O(n^2)$.

3.1. Algorithm

From Lemma 5 we know that we only need to consider the endpoints of the line segments. For a given set L of imprecise points with the endpoints in Z , we first construct $A(Z)$. Let abc be the smallest-area triangle in the primal space. Each vertex $v = \{T(l_a^{+,-}) \cap T(l_b^{+,-})\}$ in a face F in $A(Z)$ belongs to two different segments, since the endpoints of a line segment are mapped to two parallel lines in the dual space, (see Figure 10(c)). For $v \in F$, we first consider the true edges of F (which belong to distinct segments in the primal space). If edge $e \subset T(l_c^{+,-})$ is the first candidate for constructing the smallest-area triangle on v , it should be immediately located above or below v among all the lines, as our duality preserves the vertical distances. If e does not determine a distinct segment in the primal space, we should continue our movement in both up and down directions until we reach a line in dual space which determines a distinct line segment in primal space. In this situation, we may need to cross among two neighboring faces of F , as illustrated in Figure 10(d). Note that since

we can use our procedure to determine if 3 points of n distinct line segments in the primal space are collinear, this problem is also 3SUM-hard.

Thus we can compute the smallest-area true triangle that can be constructed on each vertex $v \in A(Z)$. If it is smaller than previously computed optimal solution, T_{min} , we remember it. If we store $A(Z)$ in a reasonable data structure (e.g. doubly connected edge list), the time required to find the answer is $O(n^2)$ [20, Corollary 2.5].

Lemma 6. *Let L be a set of imprecise points modeled as parallel line segments, and let $A(Z)$ be the arrangement of the transformation of Z (which consists of the endpoints of L). There exists a face F in $A(Z)$ such that the smallest-area true triangle uses one of its vertices.*

Proof. The correctness proof of this lemma comes from these facts: all the vertices of $A(Z)$ belong to distinct segments in primal space, our duality preserves the vertical distances and it is order preserving, and we will find the smallest-area true triangle on each vertex of $A(Z)$, even when we encounter to non-distinct segments. \square

Theorem 4. *Let L be a set of n imprecise points modeled as parallel line segments. The solution of the problem **MinMinArea** can be found in $O(n^2)$ time.*

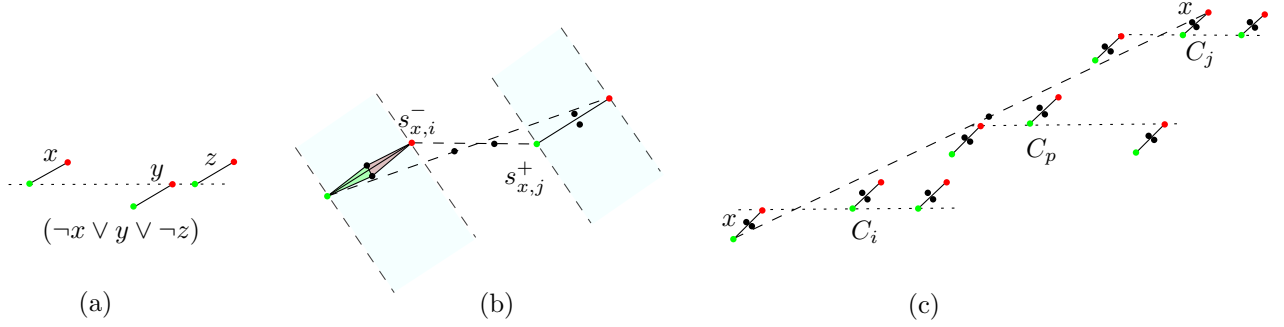


Figure 12: (a) A clause gadget. (b) The structure of a common variable x between two clauses C_i and C_j . (c) Three clause gadgets in a SAT instance.

4. MaxMinArea problem

The problem we study in this section is the following: given a set $L = \{l_1, \dots, l_n\}$ of parallel line segments, choose a set $P = \{p_1, \dots, p_n\}$ of points, where $p_i \in l_i$, such that the size of the smallest-area triangle with corners at P is as large as possible among all possible choices of P (see Figure 1(c)). As we can see in Figure 11(a,b), the solution does not necessarily select its vertices on the endpoints of the line segments. We show this problem is hard.

4.1. MaxMinArea problem is NP-hard

We reduce from SAT. Given a SAT instance, we choose a value α and create a set of line segments such that if the SAT instance is satisfiable, there exists a point placement with a smallest-area triangle of area α , but if the SAT instance is not satisfiable, every possible point placement will admit a triangle of area smaller than α .

We define a variable gadget for each of the variables in a clause, and a clause gadget, that includes all of its variable gadgets. A variable gadget for a variable x in a clause C_i consists of a segment $s_{x,i}$ and two fixed points (degenerate line segments) on the bisector and close to the center of $s_{x,i}$ (see Figure 12).⁸ These fixed points determine two small triangles (the green and purple triangles) of area α , and one of them must be part of any point placement. We choose α small enough such that in the remainder of the construction, every other possible triangle either has an area larger than α , or a zero area.

Let $s_{x,i}^+$ represent the value *True* and $s_{x,i}^-$ represent the value *False*, where $s_{x,i}^+$ and $s_{x,i}^-$ are endpoints of $s_{x,i}$. We place these endpoints in such a way that if a clause is not satisfied, the corresponding endpoints will form a triangle with zero area. For example, if the clause C_i is $(\neg x \vee y \vee \neg z)$, the endpoints $s_{x,i}^+$, $s_{y,i}^-$ and $s_{z,i}^+$ will be collinear. So, setting x and z to *True* and y to *False* will result in a zero area triangle, as we can see in Figure 12(a). In order to ensure segments representing the same variable will be assigned the same value, we place a fixed point on every line through the *True* end of one and the *False* end of another such segment. For instance, if variable x occurs in C_i and C_j , we place a fixed point on the segments

⁸For ease of construction, we draw the segments diagonal and the clauses horizontal, a simple rotation yields a construction for vertical segments.

connecting $s_{x,i}^+$ to $s_{x,j}^-$, and one on the segment connecting $s_{x,i}^-$ to $s_{x,j}^+$ (see Figure 12(b)). If x selects both of the values of *True* and *False* simultaneously, it will construct a zero area triangle. We will construct such structures for all the common variables of the clauses, see Figure 12(c).

We must take care when placing all the endpoints of the line segments in the variable gadgets and the fixed points, that there are no three collinear points other than those that are collinear by design. We must also make sure to not place any fixed points or endpoints of segments in the perpendicular strips which are determined by each line segment in the variable gadgets (see Figure 12(b)), as such a point would form a triangle of area less than α with the two fixed points in the corresponding variable segment. After placing all the line segments and fixed points, the area of the smallest possible triangle will determine the value α .

Let L be the set of imprecise points including all the fixed points and all the segments in the variable gadgets. Now an assignment to the variables to satisfy the SAT instance can be made if and only if a solution for maximizing the area of the minimum possible area triangle of L of area α exists. In the following we show how to ensure that all coordinates in L are polynomial, and we prove that the reduction takes polynomial time.

4.2. Correctness of polynomial-time reduction

We use an incremental construction method, such that when inserting a new fixed point or the endpoints of a line segment, we do the placement in such a way that the new point is not collinear with two other previously inserted fixed points or the endpoints of two other line segments. Also each new precise point or the endpoints of a new line segment should not be located in the strips which are determined by the endpoints of previously inserted line segments.

Suppose we have n variables and m clauses in the SAT instance. Since each variable can occur at most one time in each clause, we need to place $O(nm)$ fixed points on the lines connecting the common variables in the clause gadgets. Also we need to place $O(nm)$ other fixed points close to the center of the segments in the variable gadgets. Therefore we observe that a value for α of $O(\frac{1}{nm^2})$ suffices.

It is easy to observe that for a given set of $k - 1$ points in the plane, we can insert the k th point in $O(k^2)$ time, such that no zero-area triangle exists in the resulting set, and the new point is not placed in any of the $O(k)$ strips (of the variable gadgets). We conclude that our reduction can be performed in $O(m^6n^6)$ time in total.

Theorem 5. *Given a set of n parallel line segments, the problem of choosing a point on each line segment such that the area of the smallest possible triangle of the resulting point set is as large as possible is NP-hard.*

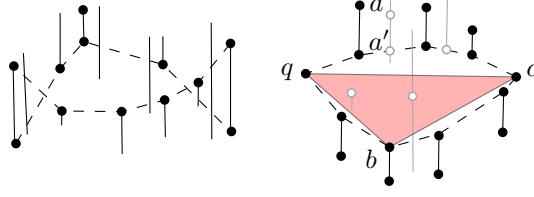


Figure 13: (a) Top chain and bottom chain. (b) For any line segment in $L \setminus L'$ (gray line segment), any arbitrary point interior to the convex hull is chosen as the candidate point.

5. MinMaxArea problem

In this section, we will consider the following problem: given a set $L = \{l_1, \dots, l_n\}$ of parallel line segments, choose a set $P = \{p_1, \dots, p_n\}$ of points, where $p_i \in l_i$, such that the size of the largest-area triangle with corners at P is as small as possible among all possible choices of P (see Figure 1(d)).

In the following we first give some definitions, then we state our results. Let the *top chain* denote the lowest convex chain connecting the lower endpoint of the leftmost line segment to the lower endpoint of the rightmost line segment, and which passes over or through the lower endpoints of the other line segments. In other words, it is the top half of the convex hull of the lower endpoints of the segments. Similarly, we define the *bottom chain* as the highest convex chain connecting the upper endpoint of the leftmost line segment to the upper endpoint of the rightmost line segment, and which passes under or through the upper endpoints of the other line segments. These two convex chains can either be disjoint or intersect and enclose a *convex body region* (see Figure 13(a)). The convex body region can be found in $O(n \log n)$ time. If this region is empty, a single line segment will pass through all the segments, and the smallest largest-area triangle will have zero area by placing all points collinear. This case can be distinguished in linear time [18]. From now on, we assume the convex body region has non-zero area. Note that one of the top chain or bottom chain can also be a single line segment. By *extreme* line segments we mean the leftmost and rightmost line segments.

We first make some observations in Section 5.1. Then in Section 5.2 we solve the special case where the extreme segments are single points. Finally we extend the solution to the general case in Section 5.3.

5.1. General Observations

We start with some observations. Suppose we have a set of line segments and we know what is the candidate point⁹ on each segment. It is easy to observe that if we add more line segments, the changes on the size of the area of the smallest largest triangle is non-decreasing.

Lemma 7. *Suppose we are given a set L of line segments and we know the set P which consists of the candidate points on L to make the largest-area triangle as small as possible. Then we insert another line segment l , such that l has a point x which is located on a line*

⁹For each l_i , the point $p_i \in l_i$ in set P is the candidate point of l_i .

segment passing through two points of P . Then, x will be chosen as the candidate point of l and this selection will not increase the area of the smallest largest-area triangle.

Proof. Suppose the lemma is false. Then x is increased the size of the smallest largest-area triangle. It follows that x is a vertex of the smallest largest-area triangle (Also notice that the largest-area triangle selects all its vertices on the convex hull; no matter we want to minimize its area). Suppose b and c are the other vertices of the smallest largest-area triangle. Since x is located on a line segment passing through two points of P , it is located on a chord on an edge of $CH(P)$. First suppose x is located on a chord of $CH(P)$. We consider a line ℓ through x and parallel to bc . If we sweep ℓ away from bc , it will intersect the convex body region until it leaves it at a vertex x' . But then x' can be substituted for x to give us a larger smallest largest-area triangle. Contradiction with the previous selection of the smallest largest-area triangle.

Now suppose x is located on the boundary of $CH(P)$. Again consider the line ℓ through a and parallel to bc . If we sweep ℓ away from bc , it will intersect the convex body region until it leaves it at a vertex x' . But then again x' can be substituted for x to give us a triangle which its area is either greater-than or equals to the area of xbc . It is again a contradiction with the previous selection of the smallest largest-area triangle. Thus x cannot increase the size of the smallest largest-area triangle. □

We will observe later that the smallest largest-area triangle is always a true triangle.

Corollary 5.1. *Suppose we are given a set L of line segments and we know the set P which consists of the candidate points on L to make the largest-area triangle as small as possible. If a new line segment l intersects the convex hull of P without sharing a vertex on it, then l does not have a role in the construction of the smallest largest-area triangle.*

5.2. Points as the extreme regions

In the case where the leftmost and rightmost line segments are fixed points, these fixed points always appear on the convex hull of P . Also, for some line segments that intersect the convex hull of P ¹⁰ without sharing a vertex on it, they share their candidate points somewhere on or within the convex hull (see Figure 13(b)). Let $L' \subseteq L$ be the set of line segments from L that share a vertex on the convex body region. In the following, we will prove that the smallest largest-area triangle of L' equals the smallest largest-area triangle of L .

Observation 6. *Any $l_i \in L \setminus L'$ intersects the convex body region.*

Proof. Suppose this is not the case. First suppose the convex body region has non-zero area. Then there exists a segment l_i that does not intersect the convex body region. The segment l_i has to be located completely above (or below) the convex body region. But then l_i has to share a vertex on the top chain (or the bottom chain), contradiction. □

¹⁰Note that $CH(P)$ consists of interior and boundary.

As an immediate consequence, we can throw away all the regions in $L' \subseteq L$. In the following, we show that the largest-area triangle which is inscribed in the convex body region is the smallest largest-area triangle of L . In other words, we will prove that in the case where the leftmost and rightmost line segments are fixed points, the convex body region is the convex hull of the candidate points.

Lemma 8. *Suppose the leftmost and rightmost line segments are points (degenerate segments), and the convex body region has non-zero area. Only the upper endpoints on the bottom chain or the lower endpoints on the top chain are candidates for including the vertices of the smallest largest-area triangle of L' .*

Proof. Suppose the lemma is false. Let abc be the smallest largest-area triangle of L' , that selects one of its vertices, a , at a point on one of the line segments of L' , so that a is not a lower endpoint on the top chain, or an upper endpoint on the bottom chain, or a fixed point. W.l.o.g, assume l_a shares a vertex on top chain. Let a' be the lower endpoint of l_a (see Figure 13(b)). We will prove that we can substitute a' for a without increasing the size of the smallest largest-area triangle.

We consider a line ℓ through a and parallel to bc . If we sweep ℓ toward bc , it will intersect the top chain. Let q be the first vertex that ℓ visits on the top chain. Suppose $q \neq a'$, because otherwise we are done. Suppose $q \notin \{l_b, l_c\}$. Now we will prove that if we substituted a' for a , the area of no other triangles with a vertex at a would be increased.

If exactly one of b or c belongs to the bottom chain and the other one belongs to the top chain, or both b and c belong to bottom chain, obviously moving a to a' will reduce the area of abc , and qbc is smaller than abc , which contradicts the optimality of abc .

Now let both of b and c belong to the top chain, then the largest-area triangle that we want to minimize its area will never select its third vertex a on top chain, unless one of a , b or c is an intersection point of the top chain and bottom chain. Note that point a cannot be a fixed point, because otherwise we have a contradiction. It follows that $a'bc \leq abc$, and also $qbc \leq abc$, which contradicts the optimality of abc . Note that the smallest largest-area triangle has to be a true triangle (we will discuss it later).

Now suppose $q \in \{l_b, l_c\}$. Since a is located above the convex body region, q is the first visited point during sweeping ℓ toward bc . Thus l_a must intersected an edge of the convex body, contradicting the fact that l_a shares a vertex on the convex body. \square

Corollary 5.2. *Suppose the leftmost and rightmost line segments are fixed points and the convex body region has non-zero area. Only the fixed points, the lower endpoints on top chain and the upper endpoints on bottom chain are candidates for including the smallest largest-area triangle's vertices.*

Lemma 9. *The smallest largest-area triangle of L' is equal to the smallest largest-area triangle of L .*

Proof. From Lemma 8 and Observation 5.2 we know the smallest largest-area triangle selects its vertices from the endpoints of L' , and the convex body region is the convex hull of the candidate points on L to minimize the size of the largest-area triangle. As we saw in

Observation 6, the line segments in $L \setminus L'$ always intersect the convex body region and they do not have a role in the construction of the smallest largest-area triangle. Thus, from Lemma 7 and Corollary 5.1 we can throw away the set of line segments in $L \setminus L'$. If the convex body region has non-zero area, obviously we cannot reduce the size of the largest-area triangle that is inscribed in it. Also from [8, Theorem 1.1] we know the largest-area triangle will select its vertices on the convex hull, and it does not matter that we want to minimize its area. Consequently the smallest largest-area triangle of L equals to the smallest largest-area triangle of L' . □

As an immediate consequence of Lemma 9, since all the vertices of L' are selected from distinct segments, the smallest largest-area triangle is always a true triangle.

5.2.1. Algorithm

Suppose we are given set L of line segments. After sorting L , we can compute the top and bottom chains in linear time. Also, we can compute $L' \subseteq L$, the convex body region and also its vertices, P' , in linear time. For each $l_i \in L \setminus L'$, we can choose $p_i \in l_i$ to be an arbitrary point within the convex body region (or on its boundary). Obviously all such points can be found in linear time. Then we can apply any existing algorithm to compute the largest-area inscribed triangle of $CH(P')$. This procedure is outlined in Algorithm 6.

Algorithm 3: MinMaxArea where the extreme line segments are single points

Input $L = \{l_1, \dots, l_n\}$: a set of vertical segments

Output $MinMax$: smallest largest-area true triangle

I = convex body of L

P' = vertices of I

return LARGEST-TRIANGLE(P')

The procedure LARGEST-TRIANGLE(p') is the algorithm presented in [9] which can compute the largest inscribed triangle in linear-time.

Theorem 6. *Let L be a set of n parallel line segments with two fixed points as the leftmost and rightmost line segments. The solution of MinMaxArea problem on L can be found in $O(n \log n)$ time.*

5.3. Line segments as the extreme regions

In this section we study the case where the leftmost and rightmost line segments are not fixed points. Note that the extreme line segments do not necessarily share a vertex at the endpoints or even on the optimal solution (see Figure 11(c,d)).

Two polygons that are constructed by the leftmost and rightmost line segments and the parts of the top chain and bottom chain which do not contribute to the boundary of the convex body region (hatched regions in Figure 14(a)) are called the *tail regions*. In this case, L' also includes the line segments which share vertices on the tail regions. In a similar fashion, $L \setminus L'$ consists of the line segments that have two intersection points with the tail regions without sharing a vertex on it, and also the line segments that are intersected by the convex body region without sharing a vertex on it.

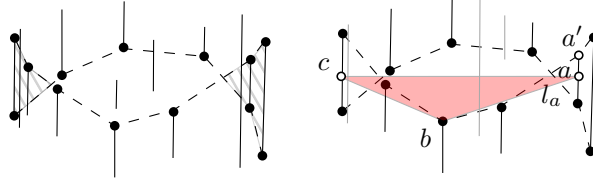


Figure 14: (a) Hatched regions illustrate the tail regions. (b) For any segment in L' , only the shared vertices are the candidates of including the vertices of the smallest largest-area triangle.

Lemma 10. *Let L be a given set of imprecise points. Let P be the set of points that minimizes the size of the largest-area triangle. Then $CH(P)$ always intersects the line segments in $L \setminus L'$.*

Proof. Suppose the lemma is false. Then there exists a line segment $l_p \in L \setminus L'$, such that l_p is not intersected by $CH(P)$. First notice that $CH(P)$ includes the convex body, and consequently it is intersected by all the line segments which are intersecting by the convex body without sharing a vertex on it. Thus l_p must be a line segment which is intersecting a tail region, say the right tail, while it does not share any vertex on it. Notice that $CH(P)$ selects also some vertices on the leftmost and rightmost line segments. Two cases can happen. First, suppose $CH(P)$ selects an endpoint of l_r . W.l.o.g., suppose it is selected the upper endpoint of l_r , but then it must also include all the vertices of the upper concave chain of the right tail (we discuss it in next lemma), and in which case it must intersect l_p which gives a contradiction.

Now consider the case where $CH(P)$ selects a point somewhere on the middle of l_r . In this case again it has to be intersected by l_p . Contradiction. \square

Consequently, with the same argument we had in Section 5.2 the candidate point of any line segment with two intersection points with a tail region (without sharing any vertex on it) can be chosen to be any point within or on the boundary of the convex hull of candidate points. For this, it suffices to find the candidate points of the leftmost and rightmost segments. Notice that with the same argument that we have proven in Lemma 8, all the vertices of the convex body and tail regions should be involved in the convex hull of the candidate points. In Lemma 11 we will prove that for the line segments in $L' \setminus \{l_l, l_r\}$ which share some vertex on the tail regions, there is no other interesting point to be candidate for a vertex of the smallest largest-area triangle.

Lemma 11. *Suppose the convex body region has non-zero area. For any line segment in $L' \setminus \{l_l, l_r\}$ only the shared vertices are candidates for the vertices of the smallest largest-area triangle.*

Proof. Suppose the lemma is false, then the smallest largest-area triangle abc selects a vertex a on l_a , such that l_a shares some vertex on e.g., the right tail region. First suppose a is located interior to the right tail region. W.l.o.g., suppose l_a shares some vertex l_a^- on the bottom chain. Let l_a^+ be the upper endpoint of l_a and let a be any point of l_a with a lower y -coordinate than l_a^+ and interior to the right tail region (as illustrated in Figure 14(b)).

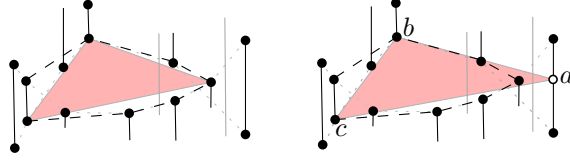


Figure 15: (a) The smallest largest-area triangle which is inscribed in the convex hull (dashed polygon) of the top and bottom chain excluding l_l, l_r . (b) Triangle abc is the solution of **MinMaxArea** which selects one vertex on the rightmost segment.

We know that the convex hull of the candidate points has a vertex r on l_r , and abc is the largest-area true triangle among other possible triangles. Consider a line ℓ through a and parallel to bc . If we sweep ℓ toward bc we will visit r . It is easy to observe that removing vertices from the convex hull of a set of points may only decrease the area of the largest-area triangle that is inscribed in the convex hull (notice that the smallest largest-area triangle is the largest triangle which is inscribed in the convex hull of the candidate points). By the optimality of the area of abc we know that all the other triangles which are rooted at a are not larger than abc . Thus we just omit the vertex a of the convex hull, while the convex hull is still intersected by l_a and by all the other segments which were intersected by the removed ear of the hull, since the removed ear is completely located within the right tail region. Thus abc could not be the smallest largest-area triangle. Contradiction.

Now suppose a is located outside the tail region and w.l.o.g above it. Suppose l_a shares a vertex l_a^- on the bottom chain (obviously if it also shares l_a^+ , l_a^+ is a better choice with respect to a and we are done). In which case again l_a is intersected by the convex hull of the candidate points. Once again by removing the vertex a of the convex hull, the convex hull is still intersected by l_a and by all the other segments which were intersected by the removed ear of the hull. Thus again abc could not be the smallest largest-area triangle. Contradiction. \square

5.3.1. Algorithm

Suppose we are given a set L of line segments. After sorting L we can compute the top and bottom chain in linear time. Also, we can compute the set L' , the convex body region, the tail regions and also their vertices P' in linear time. In the following, we consider the procedure of finding the solution to the **MinMaxArea** problem of L' in several possible configurations.

We proceed by parameterizing the problem in the location of the points on the leftmost and rightmost line segment. The area of each potential triangle is linear in these parameters, yielding a set of planes in a 3-dimensional space. We are looking for the lowest point on the upper envelope of these planes; see Figure 16(b). In the case where only one of the leftmost or rightmost line segments share a vertex on the optimal solution, $O(n^2)$ triangles may have a common third vertex on the leftmost or rightmost line segments; see Figure 16(a). Since the lowest vertex of the upper envelope can be found in $O(n^2 \log n)$ time, the solution of the **MinMaxArea** problem in this case can be computed in $O(n^2 \log n)$ time.

From Lemma 11 we know that for each line segment $l_i \in L \setminus \{L'\}$, we can choose an arbitrary point $p_i \in l_i$ within the convex hull of the convex body and the determined candidate points of the extreme segments.

If the smallest largest-area triangle does not use the leftmost and rightmost line segments, by the same argument as in Lemma 9, the smallest largest-area triangle is inscribed in the convex hull of the top and bottom chain excluding the extreme segments (as illustrated in Figure 15). But since here the convex hull of the candidate points is not necessarily a true convex hull (see Figure 15(a)), we apply Algorithm 1. This procedure is outlined in

Algorithm 6.

Algorithm 4: MinMaxArea with one vertex at extreme segments

Procedure ONE-EXTRSEG(l_e)

Input $L = \{l_1, \dots, l_n\}$: A set of vertical segments

Output : smallest largest-area true triangle with one vertex at l_e

I =convex body of L

T_l, T_r =tails of L

P' =vertices of $CH(I \cup T_l \cup T_r \setminus \{\{l_l, l_r\} \setminus l_e\})$

for each pair $x, y \in P'$

 compute the area function $f(x, y)$ with third vertex at l_e

 add $f(x, y)$ to an arrangement A

end

v = the lowest vertex of the lower envelop of A

$Area(v)$ =the determined area on the arrangement A by v

return $Area(v)$

Algorithm 5: MinMaxArea with two vertices at extreme segments

Procedure TWO-EXTRSEG(l_l, l_r)

Input $L = \{l_1, \dots, l_n\}$: a set of vertical segments

Output : smallest largest-area true triangle with two vertices at l_l and l_r

I =convex body region of L

P' =vertices of $CH(I)$

for each $x \in P'$

 compute the area function $f(x)$ with two vertices at l_l, l_r

 add $f(x)$ to an arrangement A

end

v =lowest vertex of the lower envelop of A

$Area(v)$ =the determined area on the arrangement A by v

return $Area(v)$

Algorithm 6: MinMaxArea where the extreme line segments are not single points

Input $L = \{l_1, \dots, l_n\}$: a set of vertical segments

Output : smallest largest-area true triangle

U =top chain of L

L =bottom chain of L

I =convex body of U and L

T_l, T_r =tails of L

P' =vertices of $CH(I \cup T_l \cup T_r \setminus \{l_l, l_r\})$

return Max(LARGEST-INScribed-TRIANGLE(P'), ONE-EXTRSEG(l_l),
ONE-EXTRSEG(l_r), TWO-EXTRSEG(l_l, l_r))

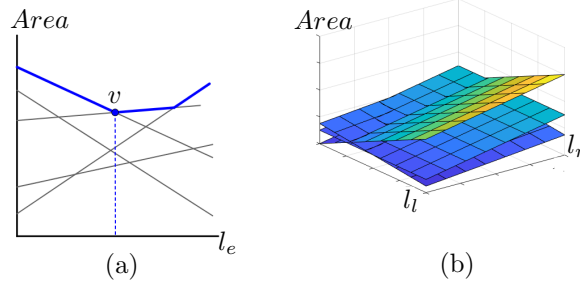


Figure 16: (a) Image of v on l_e determines the point that minimizes the area of all possible triangles with one vertex on l_e , where $l_e \in \{l_l, l_r\}$. (b) A vertex on the upper envelope of the half planes determines the point that minimizes the area of all possible triangles with two vertices on l_l and l_r .

5.4. Correctness Proof

The correctness of the algorithm comes from the correctness of Lemma 11, which states that we can find the optimal position of the candidate points on the line segments which are located between the leftmost and rightmost line segments, and on the leftmost and the rightmost line segments as well.

If the smallest largest-area triangle does not use the leftmost and rightmost line segments, changing the position of its vertices on their segments may only increase its area. If the smallest largest-area triangle does use the leftmost and/or rightmost line segments, as it is the largest possible triangle among all the other possible triangles, its area determines the optimal position of the vertices on the leftmost and/or rightmost line segments. Thus, changing the position of its vertices on the leftmost and/or rightmost segments can just increase its area. Such points are in balance between the area of at least two triangles, they could move in one direction to decrease the area of one triangle but only by increasing the area of another triangle. Thus, the algorithm finds the optimal solution.

Theorem 7. *Let L be a set of n imprecise points modeled as parallel line segments. The solution of the problem **MinMinArea** can be found in $O(n^2 \log n)$ time.*

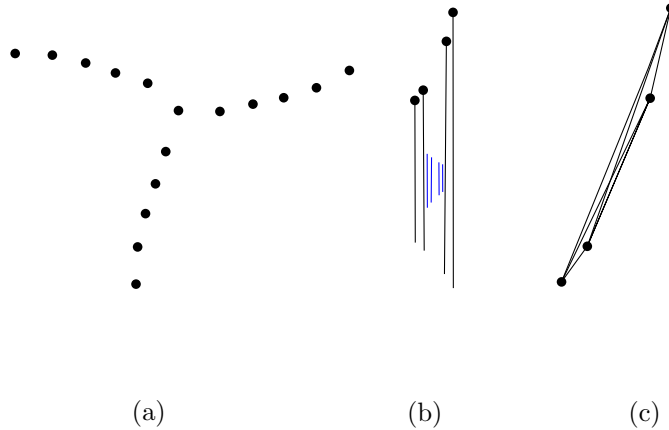


Figure 17: (a) A set P of $n = 3k$ points, in which there is no convex k -gon determined by a subset of P with any value of $k \geq 5$. (b) An example of a set of parallel line segments, in which at most $k = 4$ points can be selected at the endpoints to make a convex k -gon. Note that the blue short line segments at the middle of the long line segments are rescaled copies of the long segments. This configuration can be repeated arbitrarily. (c) The close-up of upper endpoints of long line segments. In any configuration of the same color four line segments, at most two endpoints at the lower or upper endpoints can contribute to the boundary of a convex k -gon.

6. Extension to $k > 3$

It is natural to ask the same questions posed in Section 1 for polygons with $k > 3$ sides, in which case we look for tight lower bounds and upper bounds on the area of the smallest or largest convex k -gon with corners at distinct line segments. Note that even in the precise version of finding an optimal area k -gon, not every point set will contain a convex k -gon for all values of k , as illustrated in Figure 17(a). Clearly, the same is true for the imprecise version, since the points in Figure 17(a) can be a set of very short line segments.

In addition, note that by insisting on using exactly k vertices in our convex polygon, we may introduce unexpected behavior, forcing some vertices to lie in the interiors of their segments just to ensure there are sufficiently many vertices in convex position, as illustrated in Figure 17(b).

The question of whether there are k points in convex position or not is studied in [30], where the question was “given a set $L = \{l_1, \dots, l_n\}$ of parallel line segments, decide whether or not there exist k points on distinct segments, such that all the points are in convex position”. Similarly, this problem is also studied for many other geometric planar objects in the same paper. The authors showed that for a set of parallel line segments, the above decision question can be answered in polynomial time, but for general regions, the problem becomes NP-hard.

As an immediate consequence of our present results, e.g., Section 2.2, the above decision question for some small values of k , (for example $k = 3$) can be answered in polynomial time; however, in general, the problem appears to quickly become difficult.

Nonetheless, we take the apparent difficulty of the problem and its unexpected results as motivation to relax the problem definition; in Sections 6.1 and 6.2 we study the largest

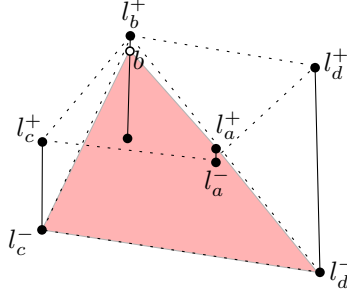


Figure 18: For $k = 4$, $l_a^+ b l_c^- l_d^-$ is the largest-area k -gon, where the inner angle at l_a^+ approaches π , and $Q = l_b^+ l_c^- l_d^-$ is the largest-area convex polygon with at most k vertices. Note that there are some k -gons which can be constructed at the endpoints (e.g., $l_b^+ l_c^+ l_a^+ l_d^+$), but they were not reported since they are smaller than Q .

convex polygon with *at most* k vertices. Note that asking for the *smallest* convex polygon on at most k vertices is not a sensible question; for any point set, the smallest m -gon ($m < k$) has area 0, since we chose $m = 2$. So the maximum over all possible sets is still 0.

6.1. MaxMaxArea problem for polygons with $k > 3$ sides

In this section we study the following problem.

MaxMaxArea: given a set $L = \{l_1, \dots, l_n\}$ of parallel line segments, and an integer k ($k \leq n$), choose a set $P = \{p_1, \dots, p_n\}$ of points, where $p_i \in l_i$, such that the size of the largest-area polygon Q with corners at P is as large as possible among all choices of P . See Figure 18 for an example.

Lemma 12. *There is an optimal solution to MaxMaxArea for a convex polygon with at most k vertices, such that all vertices are chosen at the endpoints of line segments.*

Proof. Suppose the lemma is false. Then there exists an m -gon ($m \leq k$) Q with maximum possible area, and a minimal number of vertices that are not at the endpoint of their line segments. Any vertex p of Q which is not located at an endpoint of its segment can be moved to one of its endpoints and increase the area of Q . It is possible that Q is no longer convex or some vertices of Q lie no longer on the boundary of Q . But correcting these by removing these points from Q can only increase the area of Q , contradicting the choice of Q . \square

6.1.1. Algorithm

In the following, we provide a dynamic programming algorithm for MaxMaxArea. For $p \neq q$, we define an array $A[l_p^-, l_q^+, m]$ which denotes the area of the largest true m -gon with the bottommost vertex l_p^- , such that l_q^+ is the next vertex of l_p^- on the counterclockwise ordering of the boundary of m -gon (see Figure 19). This m -gon is constructed on the largest-area $m - 1$ -gon $A[l_p^-, l_r^+, m - 1]$ with the bottommost vertex l_p^- , where the triangle $l_p^- l_q^+ l_r^+$ is the largest-area triangle among all possible choices for l_q^+ .

For finding the optimal solution, we should compute all such m -gons, where $m \leq k$, and the largest-area polygon for some value of m will determine the largest-area convex polygon with at most k vertices.

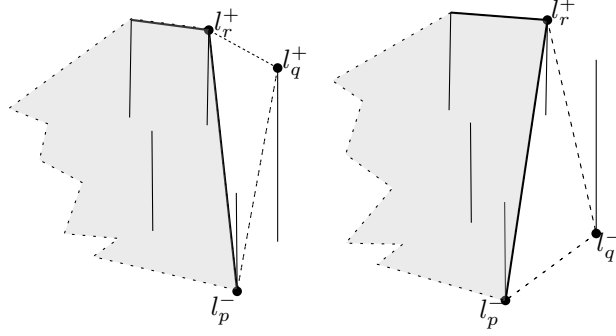


Figure 19: The directed segment $l_p^- l_r^+$ indicates which of the upper or lower endpoints of l_q should be selected.

Note that our dynamic programming can also report whether there exists a convex polygon with exactly k vertices to be constructed at the endpoints of the line segments¹¹. As said above, in the original setting of our dynamic programming, we will report the largest convex polygon with at most k vertices.

Let $H_{l_p^-, l_q^+}$ be the half plane to the left of supporting line of $\overrightarrow{l_p^- l_q^+}$. We sort for each point l_r^+ , all the other endpoints in clockwise order around l_r^+ and store these orderings. Computing the clockwise order of all points around any point in a set can be done in quadratic time totally [20]. For any l_p^- and l_r^+ we consider all the line segments l_q which have an endpoint that is sorted clockwise around the point l_r^+ . If l_r^+ is located to the right of the supporting line of $\overrightarrow{l_p^- l_q^+}$, then no new point can be used. The decision about the candidate endpoint of l_q will be made according to the direction of the edge $l_p^- l_r^+$ (see Figure 19).

Note that $A[l_p^-, l_r^-, m]$ is also considered. We suppose (w.l.o.g) the optimal m -gon selects the endpoint l_r^+ . We will start by initializing all the values of the array by zero, as the area for any $m = 2$ is zero. Then we have

$$A[l_p^-, l_q^+, m] = \max_{l_r^+ \in H_{l_p^-, l_q^+}} (A[l_p^-, l_r^+, m-1] + \text{area}(l_p^- l_q^+ l_r^+))$$

Moreover, for any computation $A[l_p^-, l_q^+, m]$ for $m > 3$, we check for convexity, that may reduce the value of m . Note that if there exists a non-convex at most m -gon with area A , then there also exists a convex polygon with area more than A and still at most m vertices.

It is obvious that the above recursion can be evaluated in linear time for each value of l_p^- , l_q^+ and l_r^+ . Thus it will cost $O(kn^3)$ time and $O(n^2)$ space totally.

Theorem 8. *Let L be a set of n imprecise points modeled as parallel line segments. The solution to the **MaxMaxArea** problem for a convex polygon with at most k vertices can be found in $O(kn^3)$ time.*

¹¹If there is no candidate for l_q to increase the area of the current m -gons for some values of $m < k$, then there is no larger $m+1$ -gon to be constructed at the endpoints.

6.2. MinMaxArea problem for polygons with $k > 3$ sides

In this section we study the following problem:

MinMaxArea: given a set $L = \{l_1, \dots, l_n\}$ of parallel line segments, and an integer k ($k \leq n$), choose a set $P = \{p_1, \dots, p_n\}$ of points, where $p_i \in l_i$, such that the size of the largest-area polygon Q with corners at P is as small as possible among all choices of P , and we extend the approach from Section 5. Again, we first solve the problem for the special case where l_l and l_r are single points. Then in Section 6.2.2 we extend the solution to the general case.

6.2.1. Single points as the extreme regions

For the MinMaxArea problem, when the leftmost and rightmost line segments are fixed points, the solution of MinMaxArea with at most k vertices cannot have an area smaller than the area of the largest at most k -gon which is inscribed in the convex body region, since moving the vertices of the solution among their line segments can only increase the area.

Similar to the case $k = 3$, in this case also the solution is always a true convex polygon.¹²

Thus, the algorithm presented by Boyce *et al.* [8] can be applied to find the largest inscribed k -gon in the convex body region. This algorithm runs in $O(kn + n \log n)$ time. If the convex body region has $m < k$ vertices, clearly it is not possible to minimize the size of this m -gon any more, and thus the convex body region is the smallest largest-area polygon with at most k vertices.

Theorem 9. *Let L be a set of n imprecise points modeled as parallel line segments, where the leftmost and rightmost line segments are points. The solution of the problem MinMaxArea for a convex polygon with at most k vertices can be found in $O(kn + n \log n)$ time.*

¹²Note that a zero area solution can only occur when the convex body region has zero area. As said before, this case can be distinguished in linear time [18].

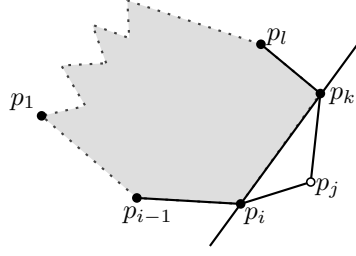


Figure 20: Chain $C = p_i p_j p_k$ supports polygon $P = p_1, p_2, \dots, p_n$, where the line $p_i p_k$ supports the convex polygon $p_1, \dots, p_{i-1} p_i p_k p_l, \dots, p_n$ on the convex side of C .

6.2.2. Line segments as the extreme regions

As we saw in Figure 15(a), if the leftmost and rightmost line segments are not single points, then the convex hull of the top chain and bottom chain (without using the endpoints of the extreme line segments) is not necessarily a true convex hull. We called this convex polygon δ . Assume the convex body region has non-zero area. First suppose the optimal solution is inscribed in δ . If there are no k different vertices on δ , then the largest-area true convex hull which is constructed on all the vertices is the smallest largest convex polygon with at most k vertices, as we cannot shrink its area anymore. In this case, the dynamic program algorithm which is presented in Section 6.1.1 will find the optimal solution in $O(kn^3)$ time.

Now we consider the case where the extreme line segments can share a vertex on the optimal solution. It is easy to observe that the method presented for the case $k = 3$ costs $O(n^{k-1} \log n)$ time for general values of k . We design a dynamic programming algorithm that can solve the problem in $O(n^8 \log n)$ time.

We start the description of the algorithm by a definition. We say a convex chain C is a *supporting chain* of a convex polygon P , where C is an ordered subset of the vertices of P in counterclockwise direction, and the line passes through the endpoints of C supporting the polygon $P \setminus C$ on the convex side of C (see Figure 20).

First suppose the optimal solution selects only one vertex at an extreme line segment, e.g., the rightmost line segment; the other case is similar. Then it suffices to find the largest triangle to the right of a clockwise convex chain C consisting of three line segments, such that C supports the largest-area convex polygon with at most $k - 1$ vertices at the convex side of C (see Figure 20).

Indeed for any k we look for a counterclockwise chain C with three line segments¹³ which supports the largest-area polygon with at most $k - 1$ vertices to the left of C . For each chain C , the optimal position of the at most k -th vertex of the optimal convex polygon which is supported by C should be computed. Thus we write our dynamic programming according to this observation. Let p_j be the optimal position of the candidate point at the rightmost line segment. For a counterclockwise ordered set of vertices p_{i-1}, p_i, p_k and p_l , where $p_{i-1} \neq p_l$ we define the array $A[p_{i-1}, p_i, p_k, p_l, m - 1]$ which denotes the largest-area convex polygon with

¹³In our dynamic program, we also consider the case where only one or two line segments exist on the convex chain, since the solution might includes only one triangle.

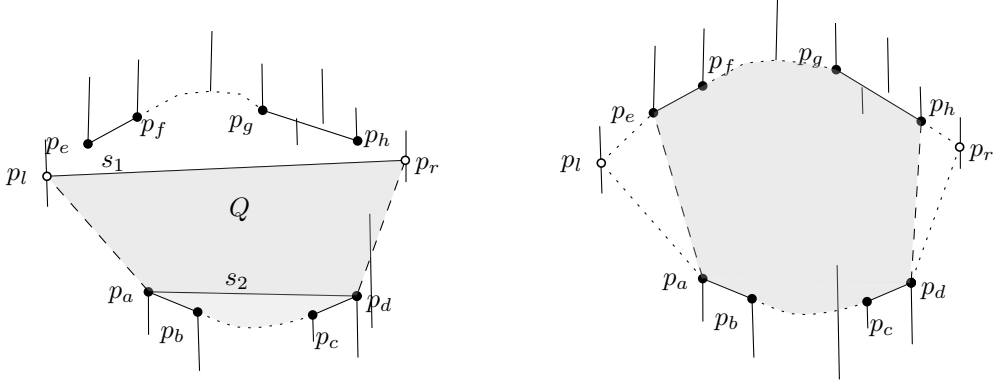


Figure 21: (a) The smallest largest-area at most k -gon is located below the line segment connecting the extreme segments. The quadrilateral $p_a p_d p_r p_l$ has a common edge $p_a p_d$ with convex chain $p_c p_d p_a p_b$. (b) Two convex chains $p_c p_d p_h p_g$ and $p_f p_e p_a p_b$ are supporting the smallest largest-area convex polygon with at most $k - 2$ vertices.

at most $m - 1$ vertices, which is supported by the convex chain $p_{i-1} p_i p_k p_l$, where p_k is the rightmost vertex of the chain.

$$A[p_{i-1}, p_i, p_j, p_k, m'] = \max(A[p_{i-1}, p_i, p_k, p_l, m - 1] + \text{area}(p_i p_j p_k), \text{area}(p_{i-1} p_j p_l))$$

Note that for any p_{i-1}, p_i, p_k and p_l we know that they are at the lower endpoints or upper endpoint of their corresponding line segments, since they are the vertices of the top and bottom chain. When the convex body region has non-zero area, the above equation considers the correct solution which consists of at least a triangle.

Obviously the above equation can be evaluated in $O(mn^4)$ time. The vertex p_j can be computed in constant time for fixed p_i and p_k . The triangle $p_{i-1} p_j p_l$ should also be evaluated separately while the triangle $p_{i-1} p_j p_l$ may cover the convex chain. In this case $m' = 3$, otherwise $m' = m$.

In the case where the optimal solution can select its vertices at both of the leftmost and the rightmost line segments, two different cases should be considered:

- The case where the candidate points of the leftmost and the rightmost line segments are directly connected together via a line segment s_1 , in which case the optimal solution is located above or below s_1 . An example is illustrated in Figure 21(a). Consider a quadrilateral Q with edge s_1 . Let s_2 be the opposite side of s_1 . In this case, we should consider all the convex chains which support a largest-area convex polygon with at most $k - 2$ vertices, and have an edge coinciding with s_2 . We selected two vertices of Q on the leftmost and rightmost line segments so that we minimize the area of all possible quadrilaterals Q on different convex chains.
- The case where the candidate points at the leftmost and rightmost line segment are not directly connected together. Thus we should consider two convex chains which are supporting a largest-area convex polygon with at most $k - 2$ vertices from two sides

top and bottom, and find the two other vertices at the leftmost and rightmost line segments so that this selection minimizes the area of the convex polygon with at most k vertices. An example is illustrated in Figure 21(b).

We handle these cases separately. First suppose the optimal solution is located below the line segment $p_l p_r$ which is connecting the leftmost and the rightmost line segment, as illustrated in Figure 21(a). Note that the optimal position of the vertices at the extreme line segments should be computed by considering all the largest-area at most $k - 2$ -gons that might be constructed on both sides of $p_l p_r$.

We start by computing a set of surfaces, such that each surface is constructed on a line segment $p_d p_a$, which determines by connecting the endpoints of the convex chain $p_a p_b \dots p_c p_d$, which supports the smallest largest-area polygon with at most $k - 2$ vertices, as illustrated in Figure 21(a). This convex chain starts at the line segments $p_a p_b$ and ends at another line segment $p_c p_d$ in counterclockwise direction. After computing all such surfaces, we draw all of them as an area function of the positions of the vertices of p_l and p_r (leftmost and rightmost vertices, respectively), such that the lowest vertex in the lower envelope of the surfaces will determine the optimal position of the vertices on the leftmost and the rightmost line segments.

As said above, we also consider all the possible surfaces which can be constructed on some convex chains above $p_l p_r$, e.g., $p_h p_g \dots p_f p_e$. In this case, the lowest vertex of the upper envelope can be computed in $O(n^4 \log n)$ time. It is easy to observe that the computed solution is always true, since all the considered vertices below the line segment $p_l p_r$ are located at distinct line segments.

In the case where the extreme line segments are not connected directly, the optimal position of the vertices at the extreme line segments can be determined by computing all surfaces corresponding to convex polygons with at most $k - 2$ vertices, which are supported by two convex chains from left and right, as illustrated in Figure 21(b). It is easy to observe that in this case the lowest vertex of the upper envelope of the surfaces can be computed in $O(kn^8 \log n)$ time. Note that in the extra $O(k)$ time cost we check whether the vertices of any potential solution are located at different line segments, and thus the computed solution is always a true convex polygon.

Theorem 10. *Let L be a set of n imprecise points modeled as parallel line segments. The solution to the problem **MinMaxArea** for a convex polygon with at most k vertices can be found in $O(kn^8 \log n)$ time.*

7. Conclusions and open problems

In this paper we studied smallest and largest triangles on a set of points, a classical problem in computational geometry, in the presence of uncertainty. Many open problems still remain, even aside from the obvious question of whether our algorithms have optimal running times. The choice of parallel line segments as the imprecision regions already leads to a rich theory which will serve as a first step towards solving the problem for more general models of uncertainty. It is unclear to what extent our results generalize; It is conceivable that some

technique (e.g. based on convex hulls) do while others (e.g. based on dynamic programming) do not. One intriguing open question concerns the **MaxMinArea** problem, where the question is to find k points on distinct regions, such that the selected vertices maximizes the size of the area of the k -gon. We conjecture that this problem is NP-hard even in a discrete model of imprecision (in which each region is a finite set of points).

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