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On Deletion in Delaunay Triangulation.

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Abstract: This paper present how space of spheres and shelling can be used to delete efficiently a point from $d$-dimensional triangulation. In 2-dimension, if $k$ is the degree of the deleted vertex, the complexity is $O(k \log k)$, but we notice that this number apply only to low cost operations; time consuming computations are done only a linear number of times.

This algorithm can be viewed as a variation of Heller algorithm [Hel90, Mid93] which is popular in the geographic information system community. Unfortunalty Heller algorithm is false as explained in this paper.

Key-words: computational geometry, geometric computing, Delaunay triangulation, dynamic algorithms.

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Suppressions dans la triangulation de Delaunay.

Résumé : Cet article montre comment l’espace des sphères et l’effeuillage (shelling) peuvent être utilisés pour implémenter efficacement la suppression d’un point dans la triangulation de Delaunay. En dimension 2, si $k$ est le degré du sommet supprimé, la complexité est de $O(k \log k)$. On peut remarquer que cette complexité ne s’applique qu’à des opérations assez bon marché, les calculs les plus coûteux n’étant qu’en nombre linéaire.

Cet algorithme peut être vu comme une variation d’un algorithme proposé par Heller [Hei90, Mid93] populaire dans le domaine des systèmes d’information géographique. Malheureusement l’algorithme original de Heller est faux.

Mots-clés : géométrie algorithmique, calcul géométrique, triangulation de Delaunay, algorithmes dynamiques.
1 Introduction

The computation of the Delaunay triangulation of a set \( S \) of \( n \) points in the plane is one of the classical problems in computational geometry.

Many structures and algorithms have been proposed in the past to compute Delaunay triangulations. Some of these algorithms have the two following properties: they are incremental and they do not use complicated data structure in addition to the triangulation itself. Among these algorithms we can cite the historical algorithm of Green and Sibson [GS78], or some other variants [MSZ96, BD95, Dev98, DLM98, Lem97]. All walk in the triangulation to accelerate point location.

The advantage of that category of Delaunay incremental algorithm is that they can be easily turned in fully dynamic Delaunay algorithm. Since there is no complicated data structure for point location, the deletion of a point is reduced to the deletion in the triangulation itself.

Definition and notations

Given a set \( S \) of points in \( d \) dimensional space, \( \mathcal{DT}(S) \) the Delaunay triangulation of \( S \) is defined by the following property: \( d + 1 \) points of \( S \) are the vertices of a Delaunay simplex if and only if the sphere passing through these points does not contain any point of \( S \) (see Figure 1 for a Delaunay triangulation in two dimensions).

Given the Delaunay triangulation \( \mathcal{DT}(S) \) and a vertex \( p \) in \( \mathcal{DT}(S) \), we address the problem of finding \( \mathcal{DT}(S \setminus \{p\}) \).

In two dimension, the natural parameter to evaluate the complexity of this problem is the degree \( k \) of \( p \) in \( \mathcal{DT}(S) \) since the deletion of \( p \) means that \( k \) triangles must be removed from the triangulation and \( k - 2 \) new triangles must be created to fill this hole. In the worst case, \( k \) can be linear, but if \( p \) is chosen randomly in \( S \), then it is well known that the expected value of \( k \) is 6, without any assumptions on the point distribution.

In higher dimension, the number of simplices incident to \( p \) is not directly related to the number of created simplices to fill the hole; we will let \( f \) denote the sum of these two numbers. In the worst case, the whole Delaunay triangulation can be affected and \( f = O(n^{\frac{d+1}{d-1}}) \). This distribution does not reflect practical configurations and a constant value of \( f \) is more likely in practice. For a uniform point distribution, the expected value of \( f \) can be proven to be constant. In three dimension, the expected number of deleted tetrahedron for Poisson distribution is \( \frac{127}{50} \pi^2 \approx 27 \) [OBS92].

Thus, even if we do not want to neglect the possible case of big value of \( k \), we have to keep in mind that a good algorithm must perform well on small value of \( k \).

Previous related work
Classical computational geometry have already addressed the problem of deleting point in Delaunay triangulation. This can be done with optimal asymptotic complexity $O(k)$ in 2 dimensions [Che87, AGSS89]. But these algorithms are a little bit too intricate and the big $O$ hide a too important constant to be good algorithms for reasonable values of $k$ (see Section 5.3).

Practitioners often prefer algorithmic simplicity to theoretical optimality, and prefer simple suboptimal $O(k^2)$ implementation of the deletion algorithm. It can be done, for example by flipping to reduce the degree of the deleted vertex to 3, and flipping again to restore the Delaunay property. Another simple algorithm consists in finding the Delaunay triangle incident to an edge of the hole in $O(k)$ time which also yields an $O(k^2)$ time algorithm.

An very simple $O(k \log k)$ solution have been suggested by Heller [Hel90, Mid93], where ears of the hole are filled in turn. In that way during the algorithm we always have a simple polygon of decreasing size to triangulate. Unfortunately, this solution is wrong, but we will show in this paper how to correct it.

**Overview**

In this paper, we provide a very simple and efficient $O(k \log k)$ algorithm to delete a vertex in a planar Delaunay triangulation based on shelling [BM71, Sei86] and duality [DMT92, Ped70]. We also discuss the effective complexity of this algorithm and of a few others for small values of $k$. We will study the different kinds of geometric predicates necessary for these algorithms.

This algorithm well generalize in higher dimensions, its time complexity becomes $O(f \log f)$ where $f$ is the number of created tetrahedron, and it generalizes also to regular triangulations (power diagrams).

## 2 Two dimensional algorithm

A deletion algorithm has to remove all triangles incident to $p$ and retriangulate the star-shaped polygon $H = \{q_0, q_1, \ldots, q_{k-1}, q_k = q_0\}$ created by these removals (see Figure 1).

### 2.1 Ears, and a wrong algorithm

We first define what an ear of a polygon is. Three consecutive vertices along $H$ boundary $q_iq_{i+1}q_{i+2}$ are said to form an ear of $H$ if the line segment $q_iq_{i+2}$ is inside $H$ and does not intersect its boundary. An ear of $H$ will be said Delaunay, if the circle passing through $q_iq_{i+1}q_{i+2}$ does not contain any other vertices of $H$. Heller
[Hel90] and Midtbø [Mid93] claimed (without proof) that among all the potential ears \( q_iq_{i+1}q_{i+2} \) of \( H \) the ear having the circumcircle of smallest radius is a Delaunay ear. This claim is false as illustrated by Figure 2, the left of Figure 2 shows the Delaunay triangulation \( DT(S) \) and the hole \( H \) to be retriangulated; the right of the figure shows two potential ears \( q_0q_1q_2 \) and \( q_1q_2q_3 \). Ear \( q_0q_1q_2 \) is the one with smallest circumcircle among all ears of \( H \), but it contains \( q_3 \) which invalidates Heller and Midtbø claim. The error of Heller and Midtbø is to assume that when we deform a circle through \( q_1q_2 \) to grow its part inside \( H \) the radius is increasing, but this is true only if the center of the circle is inside \( H \) which is not the case in Figure 2.

In fact, the idea of finding an ear that belongs to the Delaunay triangulation works, but with another criterion as explained below.

### 2.2 Delaunay and convex hull

There exist a well known duality between Delaunay triangulation in dimension \( d \) and convex hull in dimension \( d + 1 \) [Aur87, DMT92]. If we associate to a point \( p = (x, y) \in S \) a point \( p^* = (x, y, x^2 + y^2) \) on the paraboloid \( \Pi \) of equation \( z = x^2 + y^2 \), the Delaunay triangulation of \( S \) is the projection of the convex hull of the 3D points.

The reason is that for \( p, q, r, s \in S \), \( p \) is inside the circle \( C_{qrs} \) through \( qrs \) if and only if \( p^* \) is below the plane \( P_{qrs} \) through \( q^*r^*s^* \) (\( \Pi \cap P_{qrs} \) projects on circle \( C_{qrs} \)). We even have the equality between the power of \( p \) with respect to \( C_{qrs} \) and the signed vertical distance between \( p^* \) and \( P_{qrs} \).

\[ \text{power}(p, C) = |xp| - r^2 = \overline{pC} \overline{CZ} \text{ where } \overline{CZ} \text{ is the signed length of } yz. \]

\[ \text{power}(p, C) \]

---

\(^1\) If \( C \) is a circle of center \( x \) and radius \( r \), \( p \) is a point and \( t \) is a line through \( p \) intersecting \( C \) in \( t \) and \( u \), then \( \text{power}(p, C) = |xp|^2 - r^2 = \overline{pC} \overline{CZ} \) where \( \overline{CZ} \) is the signed length of \( yz. \)
Figure 2: The smallest potential ear may not belong to Delaunay. The shaded triangle is the ear with smallest radius, but it contains $q$ and thus do not belong to Delaunay.
2.3 Shelling

Convex hull can be computed by the shelling algorithm [Sei86]. The shelling [BM71] of a convex polyhedron $P$ is the enumeration of its faces in some sympathetic order. We imagine that an observer is moving along a line $l$ going through the polyhedron, starting at the intersection of $P$ and $l$. At the starting position, the observer can see only one face of $P$ (the face intersecting its trajectory) and when it moves away from the $P$ it discovers other faces one by one; at the infinity the observer see “half” of $P$. Then the observer restart at infinity on the opposite side of $l$ (where it see the other half of $P$), and then moves on $l$ enumerating the faces of $P$ when they disappear from its view. This order is called the shelling order of $P$ with respect to $l$; it has the property that the set of enumerated faces remain simply connected during the enumeration. Seidel algorithm for convex hull reports the faces of the convex hull in that order maintaining a priority queue of potential new faces. These new faces have two kinds depending if the next face contains a new vertex or links already visible vertices.

2.4 Deletion in Delaunay

We can now, reuse the idea of finding Delaunay ears to retriangulate the hole created by the deletion of a point $p$ in $DT(\mathcal{S})$. Using duality with convex hull, the problem is transformed in filling the hole in the convex hull created by the deletion of $p^*$. Then we can remark that if we use the shelling order with respect to the vertical line through $p^*$, an observer (going up) reaching $p^*$ see exactly the boundary of this hole; thus the end of the shelling correspond exactly to the triangulation of the hole. This partial shelling is easier to implement than Seidel algorithm, since all the vertices are already visible and thus only one kind of potential new faces have to be found. The already noticed correspondence between vertical distance and power yields to the following lemma.

**Lemma:** Given a polygon $H = \{q_0, q_1, \ldots, q_k = q_0\}$ and a point $p$ such that the edges of $qq_{i+1}$ belongs to the Delaunay triangulation of $\{q_0, q_1, \ldots, q_k\}$. If $|power(p, circle(q_i, q_{i+1}, q_{i+2}))|$ is minimal, then $qq_{i+2}$ is an edge of the Delaunay triangulation of $q_0, q_1, \ldots, q_k$.

is zero on $C$ boundary, negative inside and positive outside. When $C$ is given by three points, the power can be computed without computing the radius as explained in Section 3.1. Power is negative inside the circle and positive outside.

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Thus the deletion of a point can be implemented in a simple way, maintaining a structure to store the ears. The ears are naturally ordered along the boundary of the hole, and each have a priority. This structure must support the following operations: find next and previous ear, delete ear with minimum priority and modify the priority of an ear. This structure can be implemented with any dictionary structure augmented by next and previous pointers.

**Algorithm** Delete\( (\mathcal{DT}(S), p) \)

1. Let \( q_0 q_1 \ldots q_{k-1} \) the vertices incident to \( p \) in \( \mathcal{DT}(S) \) in ccw order around \( p \);
2. Let \( Q \) be a priority queue;
3. for \( i = 0 \) to \( k - 1 \)
4. do \( ear \leftarrow q_i q_{i+1} q_{i+2} \);
5. if counterclockwise\( (q_i q_{i+1} q_{i+2}) \)
6. then \( p \leftarrow \infty \); //not an ear
7. else \( p \leftarrow \text{power}(p, ear) \); //inside circle \( \text{power} < 0 \)
8. \( Q.\text{insert}(p, ear) \); //priority/key
9. while size\( (Q) > 3 \)
10. do \( ear \leftarrow Q.\text{minimum}() \);
11. create triangle \( ear \) and linked it to its two existing neighbors;
12. \( ear0 \leftarrow ear.\text{previous} \);
13. \( ear1 \leftarrow ear.\text{next} \);
14. \( ear0.\text{vertex}(2) \leftarrow ear.\text{vertex}(2) \); \( ear0.\text{next} \leftarrow ear1 \);
15. \( ear1.\text{vertex}(0) \leftarrow ear.\text{vertex}(0) \); \( ear1.\text{previous} \leftarrow ear2 \);
16. \( Q.\text{delete}(ear) \);
17. \( Q.\text{modify-priority}(ear0) \);
18. \( Q.\text{modify-priority}(ear1) \);
19. \( ear \leftarrow Q.\text{minimum}() \); //the three last ears are identical
20. create triangle \( ear \) and linked it to its three existing neighbors;

**Higher dimension** The generalization to \( d \) dimensions is easy, the boundary of the region to retriangulate is a simple polyhedron \( H \), and the ears are simplices formed by the vertices of two incident facets of \( H \). The difference is that the same simplex may correspond to \( O(d^2) \) pair of incident facets, and that the creation of an ear may modify \( O(d^2) \) other ears in the priority queue.
3 2D Analysis

3.1 Power computation

An analytical expression of the power of \( p \) with respect to \( q_0q_1q_2 \) is

\[
\text{power}(p, \text{circle}(q_0, q_1, q_2)) = \begin{vmatrix}
 x_{q_0} & x_{q_1} & x_{q_2} & x_p \\
x_{q_0}^2 + y_{q_0}^2 & x_{q_1}^2 + y_{q_1}^2 & x_{q_2}^2 + y_{q_2}^2 & x_p^2 + y_p^2 \\
1 & 1 & 1 & 1
\end{vmatrix}
\]

The \( 3 \times 3 \) determinant is the orientation test of \( q_0q_1q_2 \) and the \( 4 \times 4 \) determinant the incircle test of \( p \) with respect to \( q_0q_1q_2 \). We have to notice first that if \( q_0q_1q_2 \) has the wrong orientation, then it is not an ear and thus the \( 4 \times 4 \) determinant does not need to be computed, second that the orientation test is a minor of the incircle test and thus the power computation just needs one division in addition to the usual incircle test.

Using dynamic programming development of the determinant, the power computation need 14 additions, 15 multiplications and one division.

Notice if just \( q_2 \) changes, we do not need to recompute everything. In fact we can do it with 6 additions, 7 multiplications and one division.

3.2 Complexity

The theoretical asymptotic complexity, this algorithm is clearly \( O(k \log k) \), but this complexity is involved only for the management of the priority queue which involve relatively cheap operations (pointer manipulations and comparisons of computed power).

Since the most expensive geometric operations are the power computations, we will count exactly the number of such operations. The initial size of the priority queue is \( k \), and thus its initialization needs at most \( k \) power computation. Each ear creation, modified two other ears and thus two powers need to be recomputed, and the deletion is completed when the size of the queue is 3, thus the total number of power computations is \( k + 2(k - 4) = 3k - 8 \).

It is possible, as noticed above, to update the power of \( p \) with respect to \( q_iq_{i+1}q_{i+2} \) when ear \( q_{i+1}q_{i+2}q_{i+3} \) is processed. In the new polygon \( H \setminus \{q_i + 2\} \), \( q_iq_{i+1}q_{i+3} \) is an ear and the power of \( p \) with respect to \( q_iq_{i+1}q_{i+3} \) can be obtained by updating
the power of $p$ with respect to $q_i q_{i+1} q_{i+2}$ for a cheaper cost. Then the total number of computations becomes $2k - 4$ power computations and $k - 4$ power updates.

### 3.3 Robustness issue and degeneracies

The algorithm presented above do not address robustness issues. If the floating point arithmetic is used to perform power computations, the results are rounded and their comparisons could be evaluated in a wrong way. We can first observe that the deletion algorithm will terminate even with incorrect arithmetic: it fill ears in turn and thus construct a topological triangulation, which can be non Delaunay, or even have a non-planar embedding. But, even if producing a non-exact Delaunay triangulation may be acceptable for the deletion algorithm, it is unacceptable for many insertion algorithms which are not able to process unexact triangulation.

The usual way to solve robustness issues consists in using exact arithmetic. To ensure good performance, we can use arithmetic filter to use exact computations in power comparisons only in difficult cases where the two powers are close. Some exact computations are used to take the right decision. This approach of filtering out easy cases has been proven efficient on the orientation and incircle tests [DP98]. Degeneracies can be solved using perturbation techniques [Sei98, ADS97].

### 4 Experimental results

#### 4.1 Code and data

We implement this algorithm inside the simple hierarchical structure of the author [Dev98]. Various kind of data points have been tested. The Delaunay triangulation of the points is computed first, and then points are all removed in a random order. The coordinates are 24 bits integers and we use static and semi-static filters to ensure exactness of the evaluation of geometric predicates.

We used sets of size 1,000,000 points described in Figure 3.

- **random**: points evenly distributed in a square.
- **ellipse2**: 95% points evenly distributed on an ellipse plus 5% points evenly distributed in a square.
- **circle**: points evenly distributed on a circle.
- **parabola**: points evenly distributed on a parabola,
On deletion in Delaunay triangulation

![Data sets](image)

**Figure 3: Data sets.**

<table>
<thead>
<tr>
<th>distribution</th>
<th>size</th>
<th>insertion time</th>
<th>deletion time</th>
</tr>
</thead>
<tbody>
<tr>
<td>random</td>
<td>1,000,000</td>
<td>63s</td>
<td>36s</td>
</tr>
<tr>
<td>ellipse2</td>
<td>1,000,000</td>
<td>102s</td>
<td>136s</td>
</tr>
<tr>
<td>ellipse</td>
<td>1,000,000</td>
<td>123s</td>
<td>56s</td>
</tr>
<tr>
<td>circle</td>
<td>1,000,000</td>
<td>78s</td>
<td>56s</td>
</tr>
<tr>
<td>parabola</td>
<td>1,000,000</td>
<td>100s</td>
<td>87s</td>
</tr>
</tbody>
</table>

**Figure 4: Running times**

If the circle and parabola examples can be considered as pathological inputs, the ellipse2 example is more realistic. Delaunay triangulation of points distributed on a curve occurs in practical applications, for example in shape reconstruction (see Figure 3).

### 4.2 Running times

Running times are given in Figure 4. They are obtained on a Sun Ultra1 200MHz 128Mo main memory. The code is written in C++ and compiled with AT-T compiler with optimizing options. Times have been obtained with the clock command and is given in seconds. The time that is measured is just for Delaunay computation; it does not take into account the time for input or output.

The more expensive running time for deletions on ellipse2 data sets is mainly due to the fact that some points have an important degree (points which are random in the square but close to the ellipse).

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5 Practical remarks and alternative methods

In two dimensions, some alternative methods are of some interest.

5.1 Diagonal flipping

One of the interest of a method using diagonal flipping is that it does not introduce new geometric predicates, it uses only incircle tests and thus has lower degree and generalize easily to various metrics. However such a method may need $O(k^2)$ incircle tests in the worst case and it is not so simple to code efficiently. A good implementation of a flipping method [Sno98] will retriangulate $H$ by basically linking all $q_i$ to $q_0$ and flipping the edges turning around $q_0$. In the worst case, such a method may use $(k - 3) + (k - 4) + \ldots + 1 = \frac{(k - 2)(k - 3)}{2}$ incircle tests.

This flipping method is not so easy to code, an simpler solution consist in maintaining a queue of edges to be tested for potential flip. Each time the diagonal of a quadrilateral is flipped, the four edges of the quadrilateral are inserted in the queue. This simpler algorithm will make much more incircle tests since the flip are not performed in some relevant order as above.

5.2 Edge completion

A second method consists in finding $q_i$ such that $q_0q_1q_i$ is a Delaunay triangle, which can be done in $k - 3$ incircle tests, and triangulating recursively the two holes. In the worst case, the number of incircle tests is exactly the same that in the flipping method. An implementation of this technique is intrinsically recursive and thus imply some costs here.

5.3 Randomized algorithm

In Chew [Che87] randomized algorithm, each point to reinsert need an expected number of about 5 incircle tests, which yields a total of $5k + O(1)$.

5.4 On alternative methods

For small value of $k < 9$, flipping or edge completion need less incircle tests computations, but the simplicity of our algorithm and its good performance for $k \geq 9$ make it a very good candidate for edge deletion. Nevertheless, it can be interesting to treat as special cases some small $k$ values such as $k = 4$ and $k = 5$. 
5.5 Higher dimensions

In higher dimensions, flipping, edge completion and shelling algorithms generalize but things became more difficult. The flipping must be done in higher dimension which made it more intricate to implement [ES96]. Edge completion transforms in facet completion and must deal with the triangulation of non simply connected polyhedron. Shelling is the most easy to generalize. Furthermore the increase in the average value of $k$ with the dimension reinforce its advantage on alternative candidates in higher dimensions.

Code
A compiled demo version is available at http://www.inria.fr/prisme/logiciel/del-hierarchy/.

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References


