

## Approximating the Minimum Weight Steiner Triangulation

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Let  $P$  be a set of points in  $\mathbb{R}^2$ .

**Definition:** A **triangulation** of  $P$  is a plane graph such that

- the set of vertices is  $P$
- the planar embedding uses only straight lines
- all faces, **except perhaps the outer face**, are triangles

**Definition:** The **weight** of a triangulation  $T$ , denoted by  $|T|$ , is the sum of the Euclidean lengths of its edges.

**Definition:** A **minimum weight triangulation** of  $P$  ( $\text{MWT}(P)$ ) is a triangulation of  $P$  of minimum weight.

**Definition:** A **minimum weight Steiner triangulation** of  $P$  ( $\text{MWST}(P)$ ), is a triangulation of  $P \cup S$  of minimum weight over all point sets  $S$ .

**Definition:** The points in  $S$  are called **Steiner points**.

**Definition:** An  $\alpha$ -**approximate**  $\text{MWT}(P)$  (resp.  $\text{MWST}(P)$ ) is a triangulation of  $P$  such that  $|T| \leq \alpha |\text{MWT}(P)|$  (resp.  $|T| \leq \alpha |\text{MWST}(P)|$ ).

### Quadtrees Triangulation Algorithm

**Definition:** A **balanced quadtree** is a quadtree in which the side lengths of any two horizontally or vertically adjacent leaf squares differ by at most a factor of two.

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- (1) Compute a balanced quadtree on  $P$
  - (2) Compute a convex hull of  $P$ ,  $H(P)$
  - (3) Let  $S$  be the union of the following two sets
    - the set of quadtree vertices inside  $H(P)$
    - the quadtree points and the boundary of  $H(P)$
  - (4) For each leaf square in the quadtree, compute the  $\text{MWT}$  of the subset of  $P \cup S$  contained in its interior or on its boundary.
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**Observation:** In (4), the size of the subset is  $O(1)$ , because

- there is at most one point in each square (interior and the boundary)

- the balance condition (at most one subdivision point on each side of the square)
- the boundary of  $H(P)$  can intersect the square at most four times

**Consequence:** In (4), can compute the MWT of the subset in  $O(1)$  time.

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**Definition:** The triangulation constructed from  $P$  by the above algorithm is called the **quadtrees triangulation** of  $P$  ( $QT(P)$ ).

**Note:**  $QT(P)$  always includes

- the boundary of  $H(P)$ , because  $H(P \cup S) = H(P)$
- parts of quadtree edges inside  $H(P)$

**Observation:** Running time is inherently super-polynomial, since the size of the quadtree is not bounded in  $|P|$ .

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### Proof of Approximation Ratio

**Roadmap:**

- (1)  $|QT(P)| \leq O(1) \cdot |MWT(P)|$ .
  - (2) The weight of  $QT(P \cup S)$  is non-increasing in  $S$ .
  - (3)  $|QT(P)| \leq O(1) \cdot |MWST(P)|$ .
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**Proof** (1)  $\wedge$  (2)  $\Rightarrow$  (3)

Let  $S$  be the optimal set of Steiner points.

By (2),  $|QT(P)| \leq |QT(P \cup S)|$ .

By (1),  $|QT(P \cup S)| \leq O(1) \cdot |MWT(P \cup S)|$ .

By the choice of  $S$ ,  $|QT(P \cup S)| \leq O(1) \cdot |MWST(P)|$ . ■

**Consequence:** In general, any  $O(1)$ -approximate MWT( $P$ ) which is non-increasing under addition of points inside  $H(P)$  is also an  $O(1)$ -approximate MWST( $P$ ).

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**Proof** (2)

Inserting new points inside  $H(P)$  can only create more subdivisions in the quadtree.

The claim follows because the total weight of the per-square MWTs is non-decreasing in the number of points (proof?).

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**Proof** (1)  $|QT(P)| \leq O(1) \cdot |MWT(P)|$

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**Lemma 1:** The cost of  $QT(P)$  within a leaf square of side  $l$  is  $O(l)$ .

**Proof:**

A leaf square contains  $O(1)$  points (in the interior and on the boundary).

The length of any edge in the  $QT(P)$  restricted to the square is clearly  $O(l)$ .

The claim follows. ■

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**Assume:** All input points are in squares of side length  $O(\epsilon/n \cdot \text{diam}(P))$  (otherwise, further subdivision only increases the cost of  $QT(P)$ ).

**Observation:** By the above Lemma, the weight of the  $QT(P)$  in the all squares that contain input points is  $O(\epsilon) \text{diam}(P)$ .

**Observation:** The weight of  $MWT(P) \geq \text{diam}(P)$ .

**Consequence:** The cost of the quadtree triangulation in the squares that contain the input points is at most  $O(\epsilon) MWT(P)$ , and thus can be disregarded in the following analysis.

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A charging scheme – distributing the weight of  $QT(P)$  onto some  $MWT(P)$ .

Separate treatment for the squares entirely inside  $H(P)$  and those that are cut by the boundary of  $H(P)$ .

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**Squares inside  $H(P)$**

Will eventually be charged to various edges of the  $MWT(P)$ , but through a two-stage process.

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First charging to the quadtree inside the convex hull.

**Lemma:** The weight of  $QT(P)$  restricted to the quadtree squares inside  $H(P)$  is at most  $O(1)$  times the weight of the edges of those squares.

**Proof:** Consider such a square.

By Lemma 1, the weight of  $QT(P)$  inside the square is at most an  $O(1)$  times its side length.

Charge this weight to the bottom and right edges of the square  $\Rightarrow O(1)$  charge per unit length.

Leaf nodes disjoint  $\Rightarrow$  sets of bottom and right edges disjoint  $\Rightarrow$  each edge charged at most once.

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Charging the quadtree to  $MWT(P)$

**Lemma:** The weight of the quadtree squares entirely inside  $H(P)$  is at most  $O(1) \cdot |MWT(P)|$ .

**Proof:** Consider a square  $s$  of side length  $l$  which is entirely inside  $H(P)$ .

**Intuition:** Charge  $s$  to pair of “long” edges of the  $MWT$  whose common endpoint is “close” to  $s$ .

**One key insight of the paper:** such two edges always exist.

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**Claim:** For any square of size  $l$ , there is a point in  $P$  within  $O(l)$  from the square which is incident on two edges in the  $MWT(P)$  whose total length is  $\Omega(l)$ .

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**Proof** [Claim  $\Rightarrow$  Lemma]:

Charge the weight of  $s$  to the two edges proportional to their length. A  $MWT$  edge of length  $\lambda$  is charged an  $O(l/\lambda)$  amount by  $s$ .

The Claim implies that the only size  $l$  squares that may charge some edge of  $MWT(P)$  are those that are within  $O(l)$  of any of the two endpoints. Clearly, there is  $O(1)$  of such squares.

An edge of length  $\lambda$  can be charged by squares of size  $l = C\lambda$  for a constant  $C$  (also by Claim), and smaller.

The number of squares of any size is bounded by the same constant.

The total charge  $O(1)[O(l/\lambda)+O(l/(2\lambda))+\dots] = O(l/\lambda) = O(C) = O(1)$ . ■

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**Proof** [Claim]: There is a node within  $O(l)$ ...

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Induction on the size  $l$ .

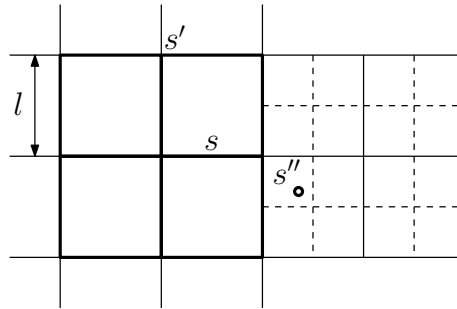
Base case: smallest squares contain points  $\Rightarrow$  holds trivially.

Assume that the claim holds for all sizes smaller than  $l$ , consider a square  $s$  of size  $l$ .

If there is a point in one of the siblings of  $s$ , we are done.

Otherwise, the parent square  $s'$  was subdivided because of the balance condition.

There must be at least one sibling of  $s'$  which is subdivided strictly one level more (see the figure below).



Let  $s''$  be a leaf square in the subtree of this sibling.

All squares involved in the above argument are within  $O(l)$  from  $s$ .

The claim for  $s$  now follows from the induction hypothesis applied to  $s''$ .

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Let  $c$  be the center of  $s$ .

Let  $x$  be some point within  $O(l)$  from  $s$ , whose existence is guaranteed by the first part.

Let  $s'$  be the smallest square that contains  $s$  and whose two sides are parallel to the line through  $c$  and  $x$ .

Consider the segment  $cx$  and all the edges of the MWT that intersect it, ordered according to the intersection points from  $c$  to  $x$ .

Any two consecutive edges share exactly one vertex.

Number the endpoints  $t_1, t_2, \dots, x$ , and add  $t_0$ , the third vertex of the MWT triangle containing  $c$ .

Clearly, there must be one of the points in the sequence within  $s'$ . Let  $t$  be the first such point.

**Case 1:**  $t \in \{t_0, t_1, t_2\}$  (figure below, left)

Then  $t$  satisfies the conditions of our Claim.

It is inside  $s'$ , thus within  $O(l)$  from  $s$ .

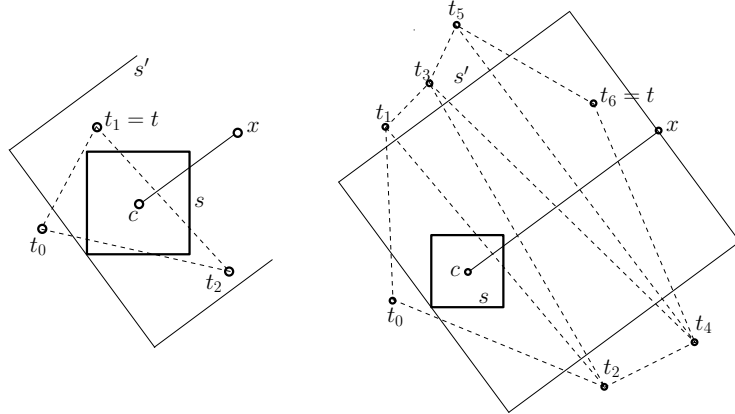
Consider the segments  $ct_0, ct_1, ct_2$ .

The maximum angle formed by them is between  $120^\circ$  (averaging argument) and  $180^\circ$  (containment).

The vertices corresponding to these two segments are the endpoints of the desired edge.

By triangle inequality, the sum of the lengths of any two edges is at least  $l$ .

**Case 2:**  $t = t_i$  for  $i \geq 3$  (figure below, right)



By choice of  $t$ , it follows that the length of  $(t_{i-1}, t_{i-2})$  is  $O(l)$ .

By triangle inequality,  $t_i$  satisfies the conditions of the Claim. ■

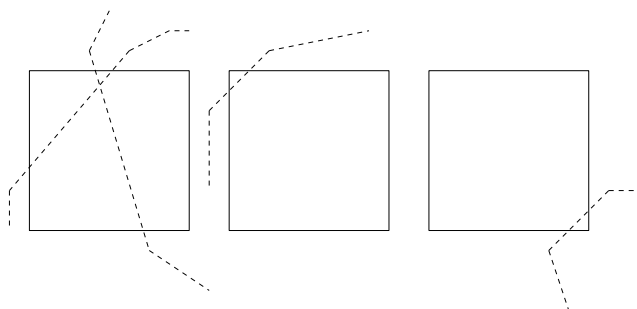
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### Squares crossed by the boundary of $H(P)$

Charging directly to the boundary of  $H(P)$ , without intermediate charging to the quadtree edges.

**Note:** No vertices of  $H(P)$  inside any square, because we are only considering empty squares.

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**Case 1:** If  $s$  is cut at least  $l/3$  away from any vertex, then the intersecting segment is at least  $l/3$  long

Charge the weight of the triangulation to the segment,  $O(1)$  charge per unit length. Each intersecting segment charged only by one square across all scales (the one that it intersects).

**Case 2:** If  $s$  is cut near a corner (both segments are less than  $l/3$  from some corner), and  $c$  is outside  $H(P)$ , the triangulation is trivial.

Charge to the intersecting segment,  $2 = O(1)$  charge per unit length. Each segment charged only once across all scales, as in Case 1.

**Case 3:** If  $s$  is cut near a corner, and  $c$  is inside  $H(P)$ , then the two orthogonal neighbors closest to the corner are in Case 1 (have “long” intersecting segments).

**Note:** These neighbors are taken to be leaf squares. By balance condition, they are at least half the size of  $s$ . The lengths of their intersecting segments of  $H(P)$  are thus  $\Omega(l)$ .

Charge to the two intersecting segments proportional to their length.

The new charge per unit length is again  $O(1)$ .

Each square can be charged by  $O(1)$  squares across all scales (only by the neighboring leaf nodes, whose scale must differ by one).

That concludes the proof of the lemma. ■

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**Note:** There is still the issue of non-polynomial running time and quadtree size.

### Truncated Quadtree Triangulation Algorithm

Let  $r$  be the side length of the smallest bounding square of  $P$ .

Everything is the same, except the quadtree squares are not subdivided once their side length becomes at most  $r/n$ .

**Definition:** The triangulation produced by the algorithm described above is called the *truncated quadtree triangulation*.

**Intuition:** The weight of an arbitrary triangulation on the points inside such small square is negligible.

**Lemma:** The weight of any triangulation on  $k$  input points inside a square of side length  $l$  (together with the  $O(1)$  corner points and subdivision points on the boundary of the square) is  $O(kl)$ .

**Proof:** Easy – any triangulation of  $O(k)$  points has  $O(k)$  edges (by Euler's Theorem), each one of which is of length  $O(l)$ . ■

**Theorem:** The truncated tree triangulation described above can be constructed in time  $O(n \log n)$ , has  $O(n \log n)$  Steiner points, and is an  $O(1)$ -approximate MWST( $P$ ).

**Proof:** The number of levels is clearly  $O(\log n)$ .

Fix a level.

By the same reasoning as before (proof of Claim), for any square at this level on of the following holds

- The square contains a point
- One of the square's siblings contains a point
- One of the square's parent's siblings contains a point (the balance condition)

**Consequence:** The number of squares at each level is  $O(n)$ . Thus, the number of squares at all levels, and thus the construction time, is  $O(n \log n)$ .

The triangulation within each square can be constructed in  $O(k \log k)$  time, where  $k$  is the number of points in the square.

There are  $n$  points total, thus the time for computing the triangulations, and the total running time, is  $O(n \log n)$ . ■