# Spanning Trees for Colored Point Sets

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# Outline

#### Preliminaries

#### Problem Definition

#### MinST of $K_{R,B}$

# $O(n \log^3 n) \to O(n \log n)$

#### Plane Spanning Trees

#### **Open Problems**

# VD, DT, and MST

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A Point Set *P*:

**Preliminaries** Problem Definition MinST of  $K_{R,B}$   $O(n \log^3 n) \rightarrow O(n \log n)$  Plane Spanning Trees Open Problems

#### VD, DT, and MST

Complete Graph  $K_{|P|}$ :



3/31

Problem: Compute MST of  $K_{|P|}$ 

**Preliminaries** Problem Definition MinST of  $K_{R,B} = O(n \log^3 n) \rightarrow O(n \log n)$  Plane Spanning Trees Open Problem

#### VD, DT, and MST

Voronoi Diagram of P:



#### $O(n \log n)$ [SH75]

 **Preliminaries** Problem Definition MinST of  $K_{R,B}$   $O(n \log^3 n) \rightarrow O(n \log n)$  Plane Spanning Trees Open Problems

### VD, DT, and MST

Delaunay Triangualtion of P:



# VD, DT, and MST

#### Euclidean MST of Complete Graph $K_{|P|}$ :



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3/31

# Empty Circle property of Edges in DT(P)



**Preliminaries** Problem Definition MinST of  $K_{R,B}$   $O(n \log^3 n) \rightarrow O(n \log n)$  Plane Spanning Trees Open Problems

# $MST \subseteq DT$



All edges of MST satisfy the empty-circle property. All edges satisfying the empty-circle property  $\in DT$ .  $\Rightarrow MST \subseteq DT$ .

# Algorithm for computing MST

Algorithm:

- Compute Delaunay Triangulation of P. Let G be the graph corresponding to DT(P).
- Compute MST of G by executing any of Kruskal or Prim or <u>Borůvka's</u> algorithm.

Time Complexity:

- Let n = |P|.
- DT(P) is plane and has O(n) edges.
- MST can be computed in  $O(n \log n)$  time.

**Theorem**: Euclidean MST of *n* points in plane can be computed in  $O(n \log n)$  time.

#### **Problem Definition**

Input: P = A set of *n* coloured points in plane.

 $\underline{\mathsf{Graph:}} \ G = (V, E)$ 

1. 
$$V = P$$
.

2. Edge between every pair of points of different colors.

3. Weight of  $e = (uv) \in E$  is |uv|.

Output: A minimum/maximum Euclidean Spanning Tree of G.

#### Minimum and Maximum Spanning Trees



#### Note:

*G* is complete bipartite graph  $K_{R,B}$  for Min/Max-2-ST problems. *G* is complete multipartite graph for Min/Max-4-ST problems.

#### MST for Bichromatic Point Sets

Input:  $P = R \cup B$  a collection of Red and Blue points.

Graph: A Complete Bipartite graph  $G = K_{R,B}$ .

Output: Euclidean Minimum Spanning Tree of G.

Algorithm: Execute Borůvka's MST algorithm on G.

#### Borůvka's algorithm

Input: G

Output: T := MST(G)

1.  $T := \emptyset$ 

 For each vertex v, find the edge with minimum weight incident on v (say vw).

$$3. T := T \cup \{vw\}.$$

- 4. Identify v and w.
- 5. Repeat Steps 2-4 till G has more than one vertex.











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Observation: Steps 2-4 execute at most  $O(\log n)$  times. Why? Question: How to use geometry to execute Step 2 efficiently?



NN(p) = Nearest blue point to p exterior to its component



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Find NN(p) among blue points corresponding to components labelled with significant bit = 0



NN(p) among blue points with components with middle bit = 1



#### NN(p) among blue points with components with LSB = 0



#### Choose the nearest among $O(\log n)$ potential nearest neighbours:





### Complexity Analysis

For each phase (Steps 2-4) of Borůvka's algorithm, we compute

- 1.  $O(\log n)$  Voronoi diagrams of subsets of blue points.
- 2. For each red point *p*, we perform *NN*(*p*) queries in blue-Voronoi diagrams.
- 3. We do the same computation where the roles of red and blue colors are reversed.

14/31

Complexity of each phase =  $O(n \log^2 n)$ .

Total Complexity =  $O(n \log^3 n)$ .

#### Bi-chromatic Closest Pair Problem

For each component, find the closest red-blue pair, where one point is outside the component.

Problem: Find  $BCP(B_i, R \setminus R_i)$  and  $BCP(R_i, B \setminus B_i)$ .



# Algorithm for computing $BCP(B_i, R \setminus R_i)$

Input: A set of  $R \cup B$  points, partitioned among components  $\overline{P_i} = R_i \cup B_i$ . Output: For each  $P_i = R_i \cup B_i$ ,  $\overline{BCP(B_i, R \setminus R_i)} = \text{its nearest red point in } R \setminus R_i$ 

- 1. Construct DT(R)
- 2. For each component *i* do
  - 2.1 Compute

 $T_i = \{ p \in \mathbb{R} \setminus \mathbb{R}_i : \text{ in } DT(\mathbb{R}), p \text{ is adjacent to a point in } \mathbb{R}_i \}$ 

- 2.2 Construct  $DT(B_i \cup T_i)$
- 2.3  $BCP(B_i, R \setminus R_i)$  = the endpoints of a shortest red-blue edge in  $DT(B_i \cup T_i)$

# Computation of $BCP(B_i, R \setminus R_i)$

 $T_i$  from DT(R):



# Computation of $BCP(B_i, R \setminus R_i)$

Isolating  $T_i \cup B_i$ :



# Computation of $BCP(B_i, R \setminus R_i)$

 $BCP(B_i, R \setminus R_i)$  from  $DT(T_i \cup B_i)$ :



 $DT(T_i \cup B_i)$ 

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#### Proof of Correctness

Why is  $BCP(B_i, R \setminus R_i) = BCP(B_i, T_i)$ ? Let  $b \in B_i$  and  $p \in R \setminus R_i$ , such that  $\{b, p\} = BCP(B_i, R \setminus R_i)$ . Why DT(R) has an edge from some point  $q \in R_i$  to p?



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### Complexity Analysis

For  $BCP(B_i, R \setminus R_i)$  computation:

- $-\sum_{i} |T_{i}| = \sum_{\substack{r \in R \\ O(D)}} degree(r) \text{ in } DT(R) = O(|R|)$
- $-\sum_{i}|B_{i}|=O(|B|)$
- $\forall i, DT(T_i \cup B_i)$  can be computed in  $O(n \log n)$  time
- $\Rightarrow \forall i, BCP(B_i, \mathbb{R} \setminus \mathbb{R}_i)$  can be computed in  $O(n \log n)$  time
- Same holds for  $BCP(R_i, B \setminus B_i)$ .

Borůvka's algorithm has  $O(\log n)$  phases.  $\Rightarrow$  MST of  $\mathbb{R} \cup \mathbb{B}$  can be computed in  $O(n \log^2 n)$  time.

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19/31

Preliminaries Problem Definition MinST of  $K_{R,B}$   $O(n \log^3 n) \rightarrow O(n \log n)$  Plane Spanning Trees Open Problems

### MinST of $B \cup R$

- Computation of BCP uses  $DT(T_i \cup B_i)$ .
- $DT(T_i \cup B_i)$ , for each *i*, can be computed by the algorithms for maintaining DT under merge/split operations.
- Apply Dynamic Data Structures + Amortization Arguments:

**Theorem:** MST of  $R \cup B$  can be computed in  $\Theta(n \log n)$  time.

### MaxST of $B \cup R$

I: For every edge (r, b) in MaxST, either  $r \in CH(R)$  or  $b \in CH(B)$ .

**II**: Longest edge between R and B has an endpoint in CH(R) and an endpoint in CH(B).



Borůvka's algorithm + above observations + fartherst-point VD + BFP( $B_i, R \setminus R_i$ ) and BFP( $R_i, B \setminus B_i$ ) leads to **Theorem:** MaxST of  $R \cup B$  can be computed in  $\Theta(n \log n)$  time.

#### Plane Max ST

Input: A set of coloured points P (and a complete multi-partite graph G on P).

Output: A Plane Maximum Spanning Tree of G.



### Results on Plane Min/Max ST

#colors	Min/Max	Exact	Approx.	Reference
	Min	$\Theta(n \log n)$		SH75
	Max	NP-Hard?	2	ARS93
			1.993	DT10
			1.989	BBdCCEMS17
2	Min	NP-Hard	$\sqrt{n}$	BvKLLMSV09
	Max		4	BBdCCEMS17
3	Max		6	BBdCCEMS17
$\geq$ 4	Max		8	BBdCCEMS17

#### 4-approx for Bichormatic Plane Max ST



**Output:** Max of  $\{T_a, T_b, T_c, T_d\}$ 

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# Analysis

- $T^*$  = an optimal tree.
- Root  $T^*$  at a red vertex r.
- Orient edges away from r.
- $E_r$  = Edges from red vertices to blue vertices.
- $E_b = Edges$  from blue vertices to red vertices.
- $Cost(T^*) = Cost(E_r) + Cost(E_b)$
- Let  $Cost(E_r) \leq Cost(E_b) \Rightarrow Cost(T^*) \leq 2Cost(E_b)$
- Let *ab* be a diameter of red points.
- We show: For each blue vertex b', its distance to any red vertex r' satisfies |b'r'| < |b'a| + |b'b|.
- $\Rightarrow Cost(E_b) < Cost(T_a) + Cost(T_b)$
- $\Rightarrow$  Cost(T<sup>\*</sup>) < 4Max(T<sub>a</sub>, T<sub>b</sub>, T<sub>c</sub>, T<sub>d</sub>)

#### 8-approx for multi-coloured Plane Max ST

We compute 8 different stars.

- $\alpha\beta$  = chromatic diameter of point set *P*
- ab = red diameter; cd = blue diameter
- ef = chromatic diameter of  $(P \setminus \{ \text{Red} \cup \text{Blue} \})$ .



**Output**: Max of  $\{T_{\alpha}, T_{\beta}, T_{a}, T_{b}, T_{c}, T_{d}, T_{e}, T_{f}\}$ 

 $\begin{array}{ccc} \mbox{Preliminaries} & \mbox{Problem Definition} & \mbox{MinST of } K_{R,B} & O(n\log^3 n) \rightarrow O(n\log n) & \mbox{Plane Spanning Trees} & \mbox{Open Problems} \end{array}$ 

#### Plane Bi-chromatic ST for Convex Point Sets

- Assume  $P = R \cup B$  and  $|R| \ge |B|$
- Min/Max Spanning Plane Tree in  $O(|\mathbf{R}|^2|\mathbf{B}|)$  time.
- Based on Dynamic Programming.

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#### Plane Bi-chromatic ST for Semi-collinear Point Sets



 $O(|R|^3|B|^2)$  dynamic programming algorithm for Min/Max/Bottleneck/... Plane bi-chromatic Spanning Trees.

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28/31

#### Problems to Ponder

- For k-coloured versions, Min-k-ST is computed in  $O(n \log n \log k)$  time. Optimal for k = 2 and k = n. What about other values of k?
- For plane Min/Max ST
  - 1.  $O(\sqrt{n})$ -approximation for Min ST is known in  $K_{|P|}$ . Improvements?

2. Is ratio of 
$$\frac{wt(Plane Min ST)}{wt(MST)} \le 1.5$$
 in  $K_{R,B}$ ?

- 3. Characterization of edges in  $K_{R,B}$  in Plane Min/Max ST?
- 4. Given a Plane ST of  $K_{R,B}$ , is it optimal?
- 5. Semi-collinear case: Red points on both sides of the line?

Preliminaries Problem Definition MinST of  $K_{R,B} = O(n \log^3 n) \rightarrow O(n \log n)$  Plane Spanning Trees **Open Problems** 

# Thanks a lot for listening Questions/Comments?

# February(avg): Ottawa: -9.2C; Snowfall 35cm

