



Winter Semester 2020/21

Advanced Algorithms

<http://www14.in.tum.de/lehre/2020WS/ada/index.html.en>

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Lectures: 3 SWS
Online, recorded lectures; available via Moodle.

Exercises: 2 SWS
Online sessions

Teaching assistants:

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Problem sets: Made available on Monday by 10:00 am via Moodle and on the course webpage.

Must be turned in one week later by 10:00 am via Moodle.

Submissions by teams of two students are encouraged.

- Bonus:** If at least 50% of the maximum number of points of the homework assignments are attained, then the grade of the final exam, if passed, improves by 0.3 (or 0.4).
- Exam:** Written exam, on site (Präsenzprüfung), date will be announced.
- Valuation:** 6 ECTS (3 + 2 SWS)
- Prerequisites:** Grundlagen: Algorithmen und Datenstrukturen (GAD)
Diskrete Strukturen (DS)
Diskrete Wahrscheinlichkeitstheorie (DWT)

Literature

- Th. Cormen, C. Leiserson, R. Rivest, and C. Stein. Introduction to Algorithms, Third Edition, MIT Press, 2009.
- J. Kleinberg and E. Tardos. Algorithm Design. Pearson, Addison Wesley, 2006.
- M. Mitzenmacher and E. Upfal. Probability and Computing: Randomization and Probabilistic Techniques in Algorithms and Data Analysis. Second Edition, Cambridge University Press, 2017.
- Th. Ottmann und P. Widmayer: Algorithmen und Datenstrukturen. 6. Auflage, Springer Verlag, 2017.
- Research papers

Design and analysis techniques for algorithms

- Divide and conquer
- Greedy approaches
- Dynamic programming
- Randomization
- Amortized analysis

Problems and application areas:

- Geometric algorithms
- Algebraic algorithms
- Graph algorithms
- Data structures
- Algorithms on strings
- Optimization problems
- Complexity

01 - Divide and Conquer



The divide-and-conquer paradigm

- Quicksort
- Formulation and analysis of the paradigm
- **Geometric divide-and-conquer**
 - Closest pair problem
 - Line segment intersection
 - Voronoi diagrams

Quicksort: Sorting by partitioning



```

function Quick (S: sequence): sequence;
{returns the sorted sequence S}
begin
  if #S ≤ 1 then Quick:=S;
  else { choose pivot/splitter element v in S;
        partition S into Sl with elements ≤ v,
        and Sr with elements ≥ v;
        Quick:= Quick(Sl) | v | Quick(Sr) }
  end;
  
```

Formulation of the D&C paradigm

Divide-and-conquer method for solving a problem instance of size n :

1. Divide

$n > c$: Divide the problem into k subproblems of sizes n_1, \dots, n_k ($k \geq 2$).

$n \leq c$: Solve the problem directly.

2. Conquer

Solve the k subproblems in the same way (recursively).

3. Merge

Combine the partial solutions to generate a solution for the original instance.

$T(n)$: maximum number of steps necessary for solving an instance of size n

$$T(n) = \begin{cases} a & n \leq c \\ T(n_1) + \dots + T(n_k) \\ \quad + \text{cost for divide and merge} & n > c \end{cases}$$

Special case: $k = 2, n_1 = n_2 = n/2$
cost for divide and merge: $DM(n)$

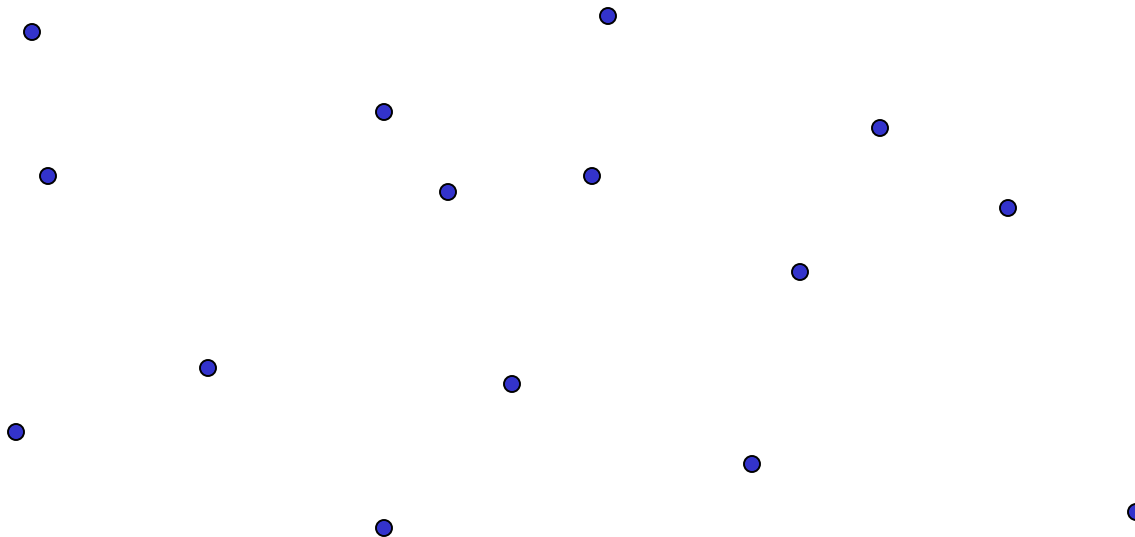
$$T(1) = a$$

$$T(n) = 2T(n/2) + DM(n)$$

Geometric divide-and-conquer

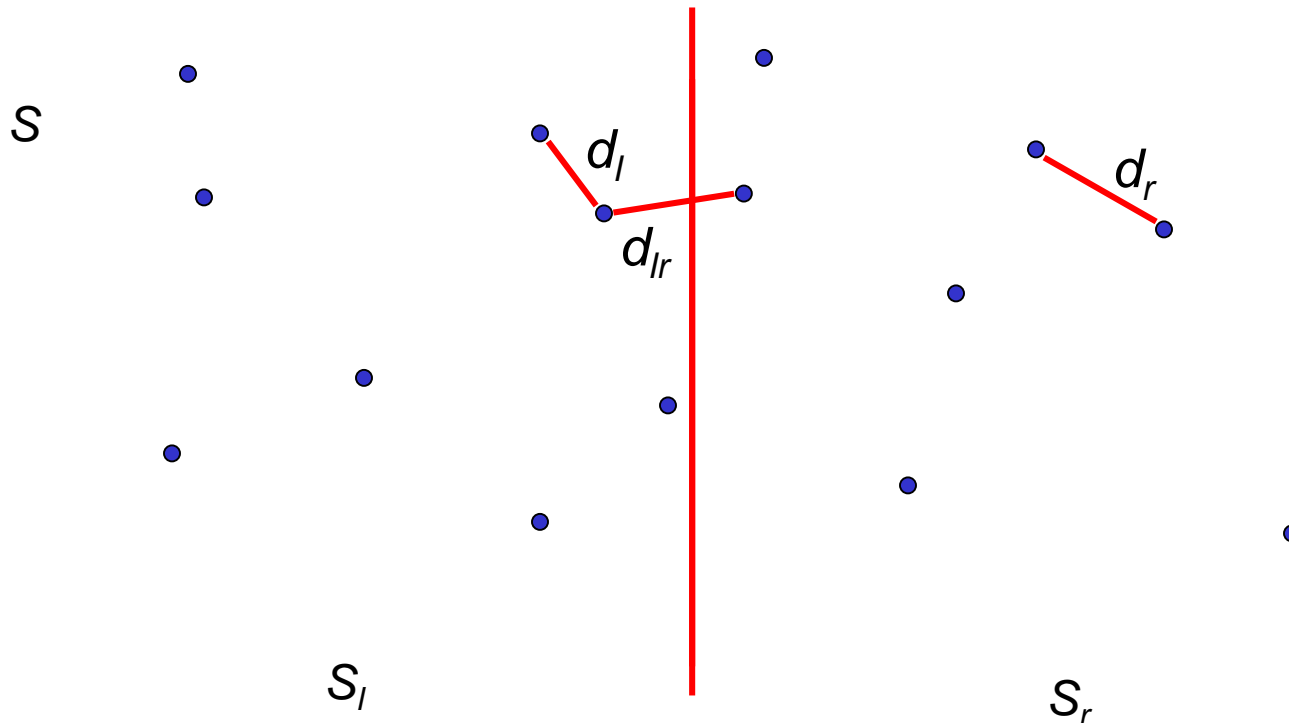
Closest Pair Problem:

Given a set S of n points in the plane, find a pair of points with the **smallest distance**.



Divide-and-conquer method

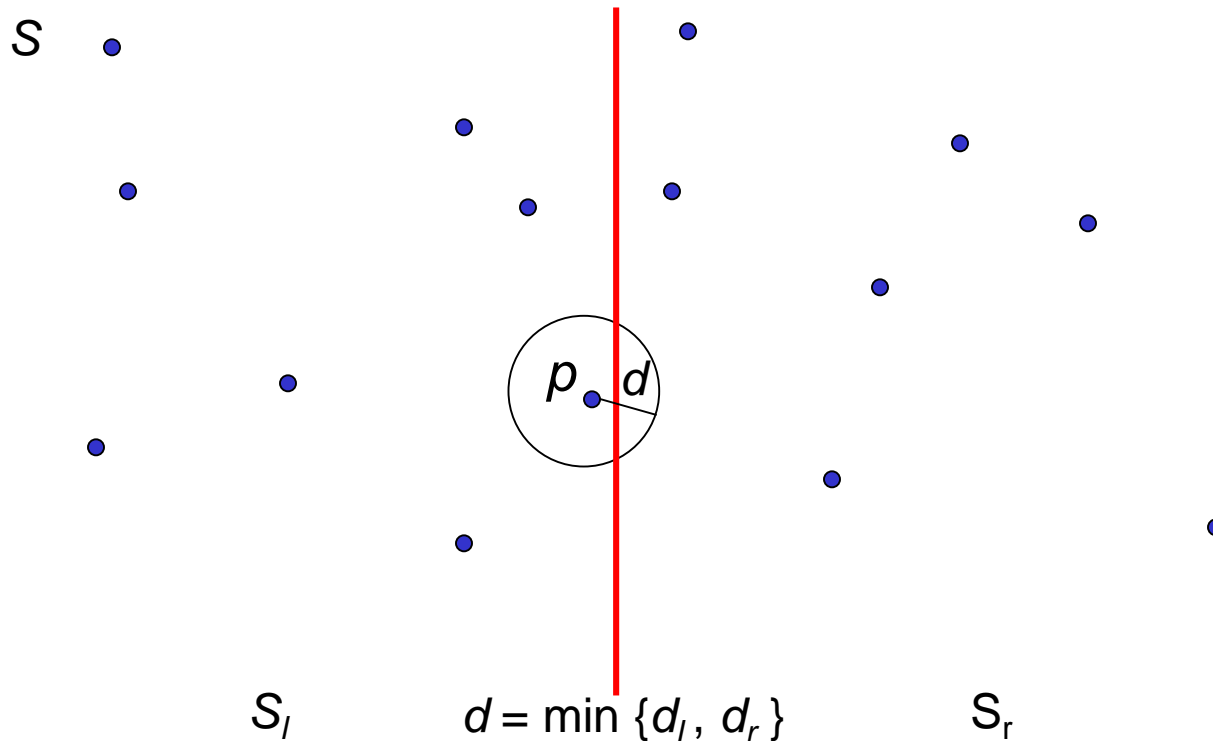
1. **Divide:** Divide S into two equal sized sets S_l und S_r .
2. **Conquer:** $d_l = \text{mindist}(S_l)$ $d_r = \text{mindist}(S_r)$
3. **Merge:** $d_{lr} = \min\{ d(p_l, p_r) \mid p_l \in S_l, p_r \in S_r \}$
return $\min\{d_l, d_r, d_{lr}\}$



Divide-and-conquer method

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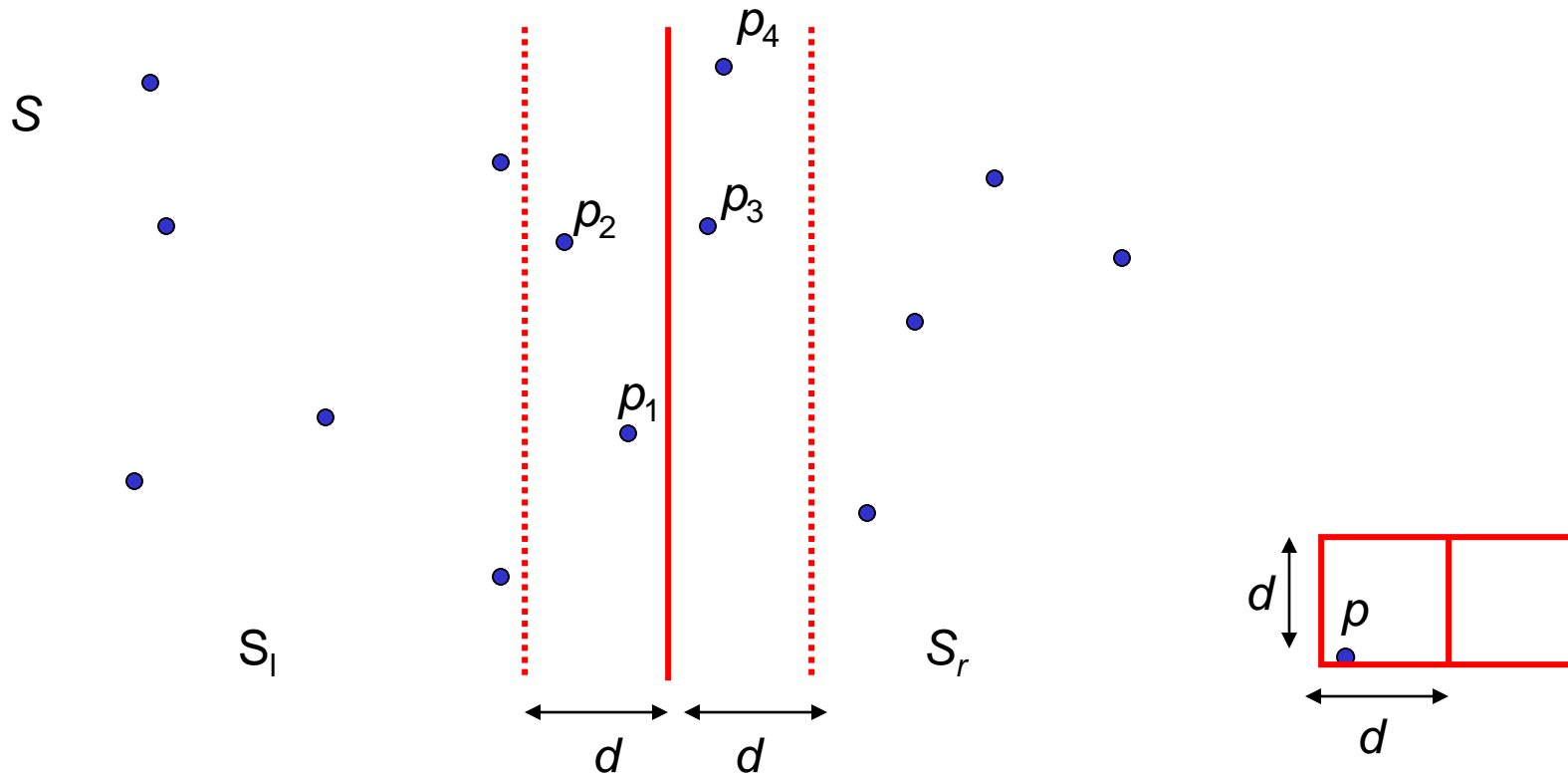
Computation of d_{lr} :



Merge step

1. Consider only points **within distance d of the bisection line**, in the order of increasing y-coordinates.
2. For each point p consider all points q **within y-distance at most d** ; there are at most 7 such points.

Merge step



$$d = \min \{ d_l, d_r \}$$

Implementation

- Initially sort the points in S in order of increasing x -coordinates $O(n \log n)$.
Each bisection line can be determined in $O(1)$ time.
- Once the subproblems S_l, S_r are solved, generate a list of the points in S in order of increasing y -coordinates.
This can be done by **merging the sorted lists of points** of S_l, S_r (merge sort).

Running time (divide-and-conquer)

$$T(n) = \begin{cases} 2T(n/2) + an & n > 3 \\ a & n \leq 3 \end{cases}$$

- Guess the solution by repeated substitution.
- Verify by induction.

Solution: $O(n \log n)$

Guess by repeated substitution

$$T(n) = \begin{cases} 2T(n/2) + an & n > 3 \\ a & n \leq 3 \end{cases}$$

$$\begin{aligned} T(n) &= 2T(n/2) + an = 2(2T(n/4) + an/2) + an \\ &= 4T(n/4) + 2an = 4(2T(n/8) + an/4) + 2an \\ &= 8T(n/8) + 3an = 8(2T(n/16) + an/8) + 3an \\ &= 16T(n/16) + 4an \end{aligned}$$

Verify by induction

$$T(n) \leq an \log n \quad T(n) = \begin{cases} 2T(n/2) + an & n > 3 \\ a & n \leq 3 \end{cases}$$

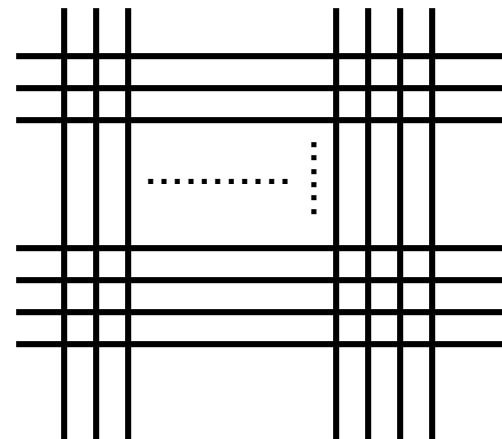
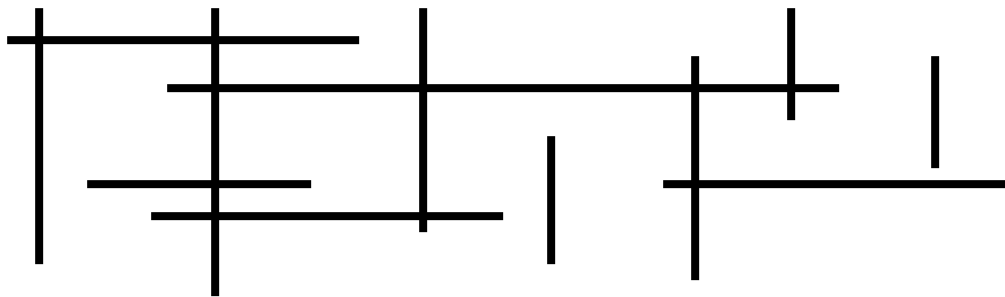
$$n = 2^i$$

$$i = 1: \text{ ok}$$

$$\begin{aligned} i > 1 \quad T(2^i) &= 2T(2^{i-1}) + a2^i \\ &\leq 2a2^{i-1}(i-1) + a2^i \\ &= a2^i(i-1) + a2^i \\ &= a2^i i \\ &= an \log n \end{aligned}$$

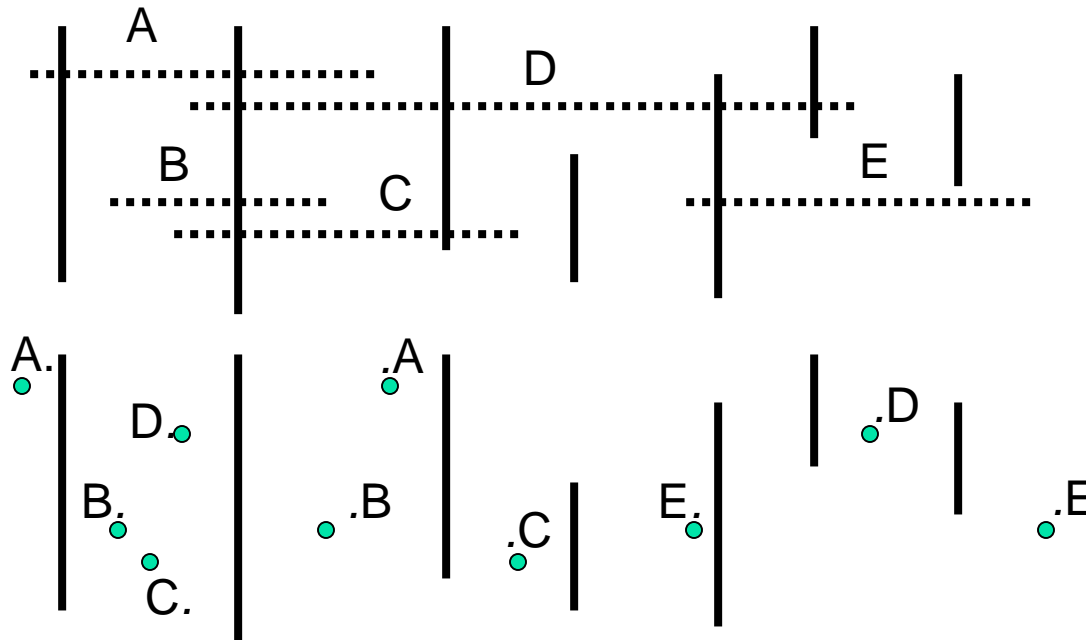
Line segment intersection

Find all pairs of intersecting line segments.



Line segment intersection

Find all pairs of intersecting line segments.



The representation of the horizontal line segments by their endpoints allows for a vertical partitioning of all objects.

Input: Set S of vertical line segments and endpoints of horizontal line segments.

Output: All intersections of vertical line segments with horizontal line segments, for which at least one endpoint is in S .

1. Divide

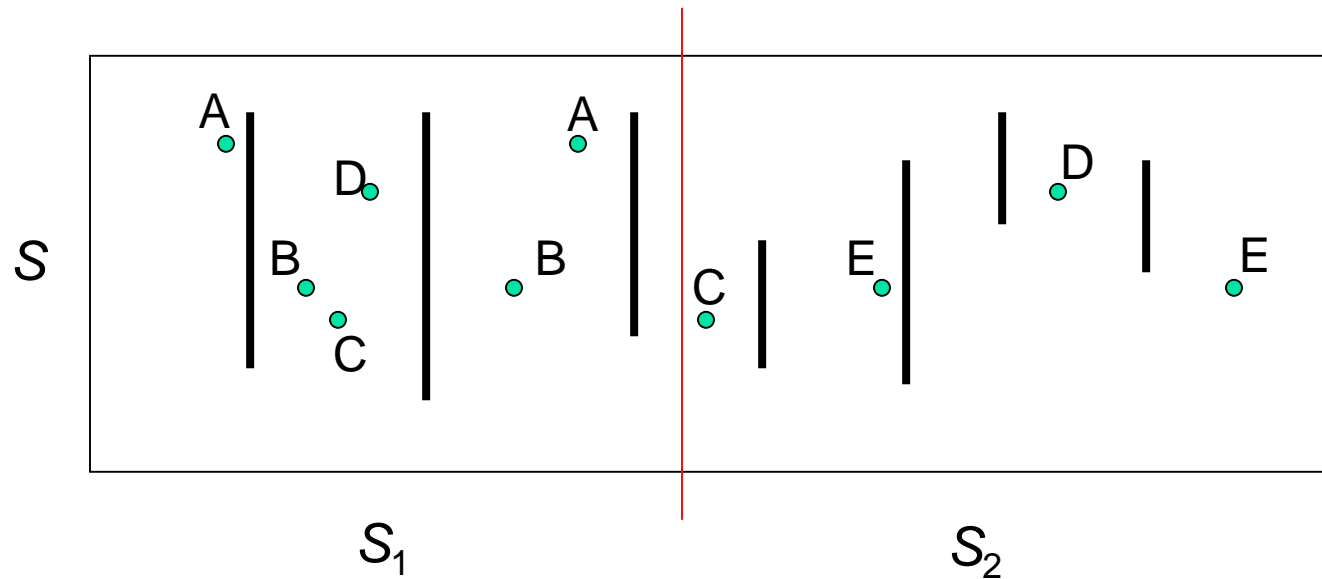
if $|S| > 1$

then using vertical bisection line L , divide S into equal size sets S_1 (to the left of L) and S_2 (to the right of L)

else S contains no intersections

ReportCuts

1. Divide:



2. Conquer:

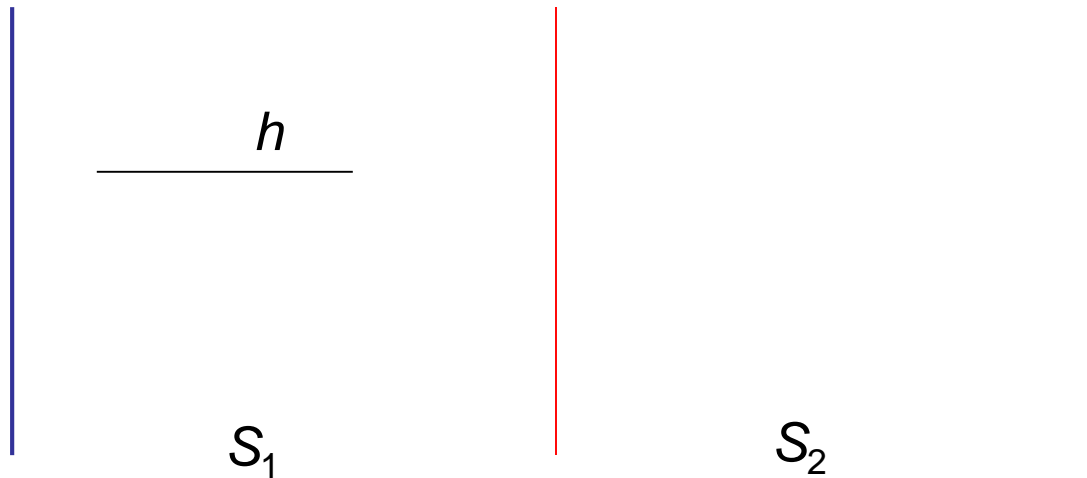
ReportCuts(S_1); ReportCuts(S_2)

ReportCuts

3. Merge: ???

Possible intersections of a horizontal line segment h in S_1

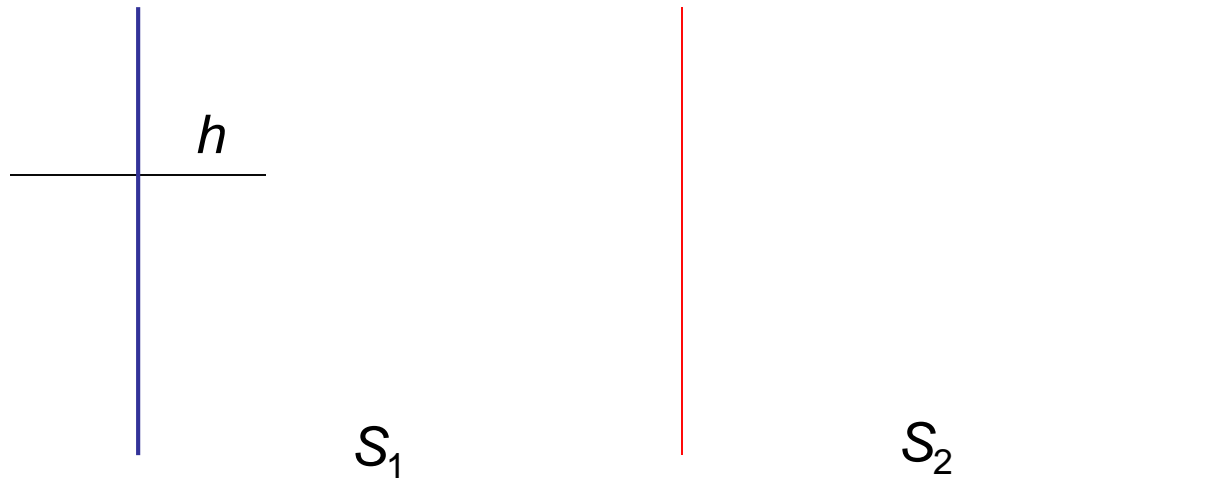
Case 1: both endpoints in S_1



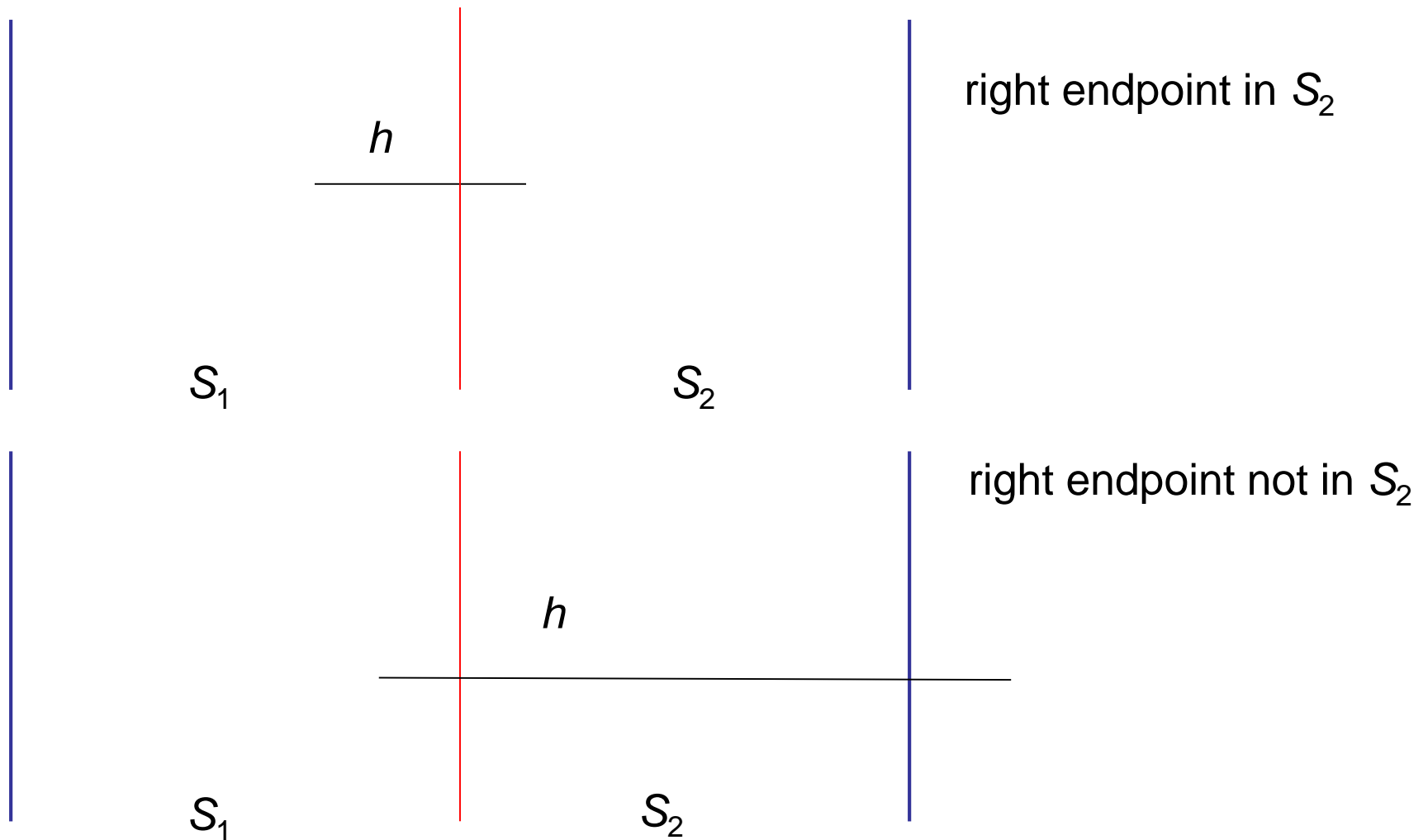
ReportCuts

Case 2: only one endpoint of h in S_1

2 a) right endpoint in S_1



2 b) left endpoint of h in S_1

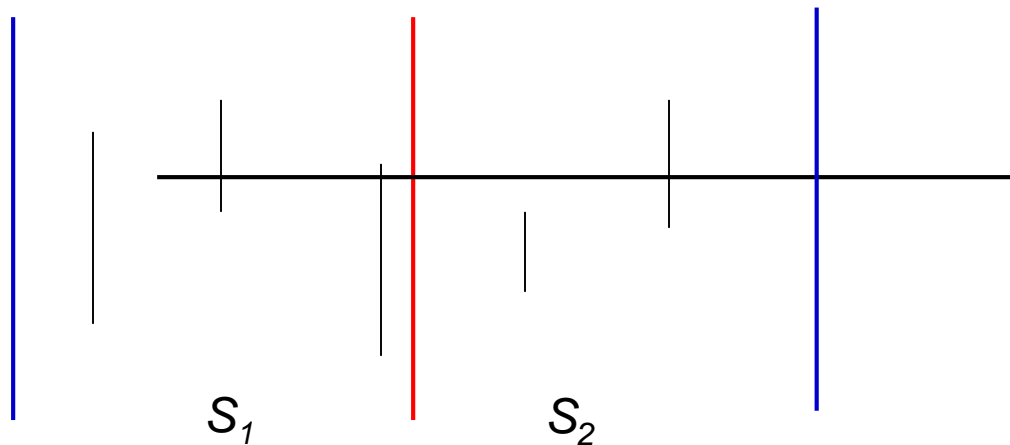


Procedure: ReportCuts(S)

3. Merge:

Return the intersections of vertical line segments in S_2 with horizontal line segments in S_1 , for which the left endpoint is in S_1 and the right endpoint is neither in S_1 nor in S_2 .

Proceed analogously for S_1 .



Implementation

Set S

$L(S)$: y -coordinates of all segments whose left endpoint is in S , but right endpoint is not in S .

$R(S)$: y -coordinates of all segments whose right endpoint is in S , but left endpoint is not in S .

$V(S)$: y -intervals of all vertical line segments in S .

Base cases

S contains only one element e.

Case 1: $e = (x, y)$ is a left endpoint of horizontal line segment s

$$L(S) = \{(y, s)\} \quad R(S) = \emptyset \quad V(S) = \emptyset$$

Case 2: $e = (x, y)$ is a right endpoint of horizontal line segment s

$$L(S) = \emptyset \quad R(S) = \{(y, s)\} \quad V(S) = \emptyset$$

Case 3: $e = (x, y_1, y_2)$ is a vertical line segment s

$$L(S) = \emptyset \quad R(S) = \emptyset \quad V(S) = \{([y_1, y_2], s)\}$$

Merge step

Assume that $L(S_i)$, $R(S_i)$, $V(S_i)$ are known for $i = 1, 2$.

$$S = S_1 \cup S_2$$

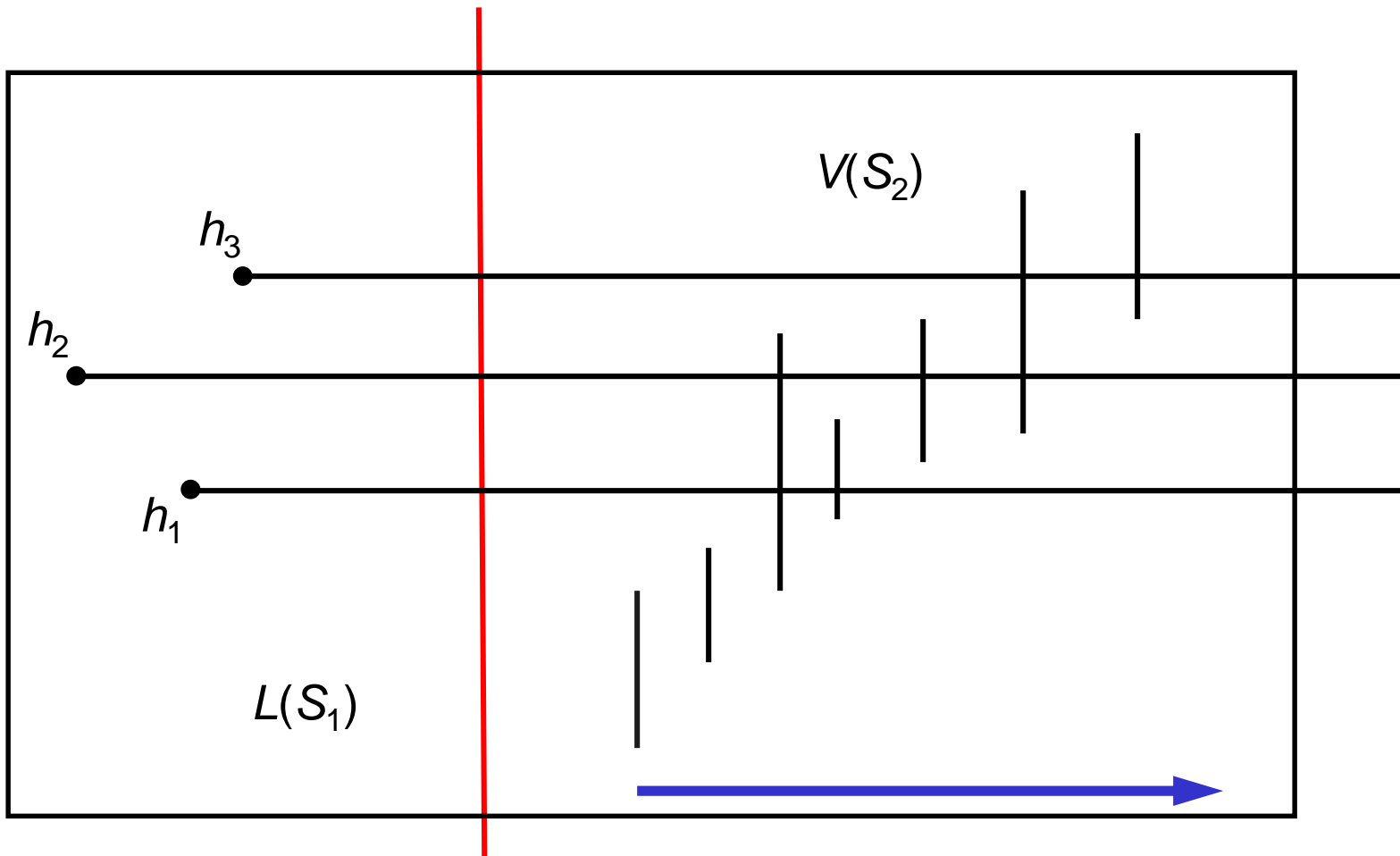
$$L(S) = L(S_1) \setminus R(S_2) \cup L(S_2)$$

$$R(S) = R(S_2) \setminus L(S_1) \cup R(S_1)$$

$$V(S) = V(S_1) \cup V(S_2)$$

- L , R : ordered by increasing y-coordinates (and segment number)
linked lists
- V : ordered by increasing lower endpoints
linked list

Output of the intersections



Running time

Initially, the input (vertical line segments, left/right endpoints of horizontal line segments) has to be **sorted and stored in an array**.

Divide-and-conquer:

$$T(n) = 2T(n/2) + a \cdot n + \text{size of output}$$

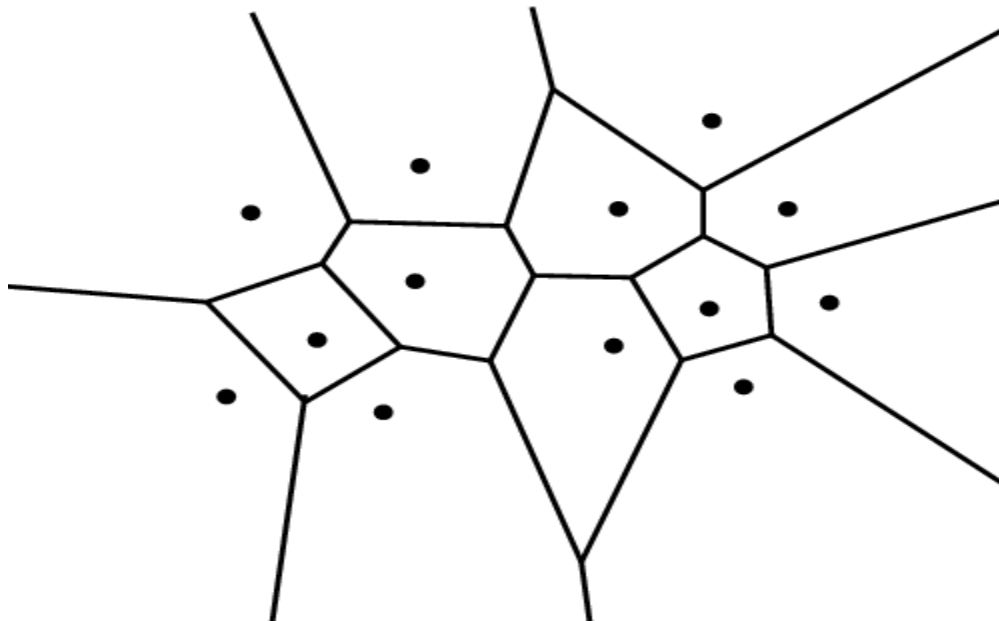
$$T(1) = O(1)$$

$$O(n \log n + k) \quad k = \# \text{ intersections}$$

Computation of a Voronoi diagram

Input: Set of sites

Output: Partition of the plane into regions, each consisting of the points closer to one particular site than to any other site.



Definition of Voronoi diagrams

P : Set of sites

$$H(p \mid p') = \{x \mid x \text{ is closer to } p \text{ than to } p'\}$$

Voronoi region of p :

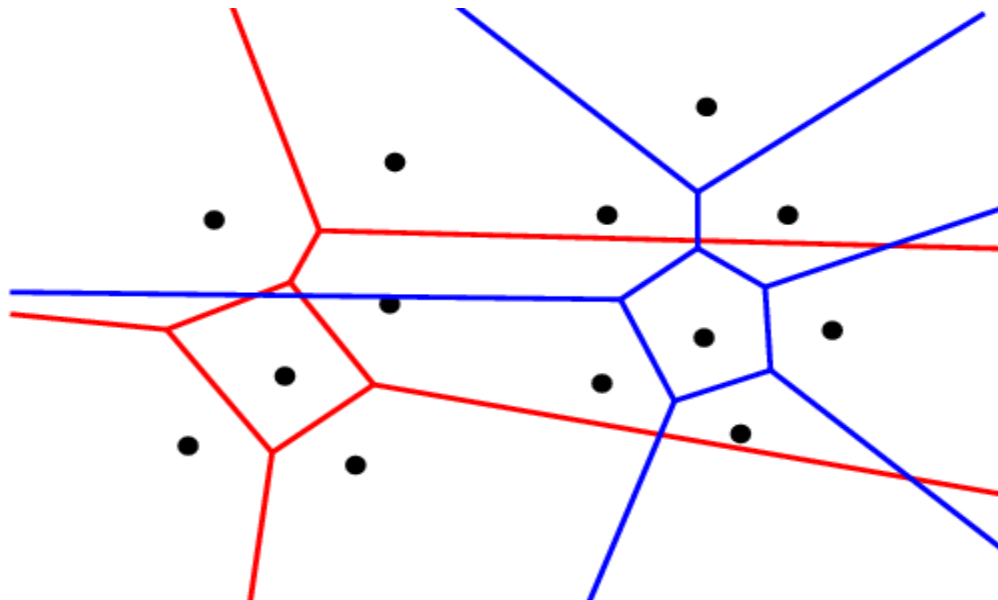
$$VR(p) = \bigcap_{p' \in P \setminus \{p\}} H(p \mid p')$$

Computation of a Voronoi Diagram

Divide: Partition the set of sites into two equal sized sets.

Conquer: Recursive computation of the two smaller Voronoi diagrams.

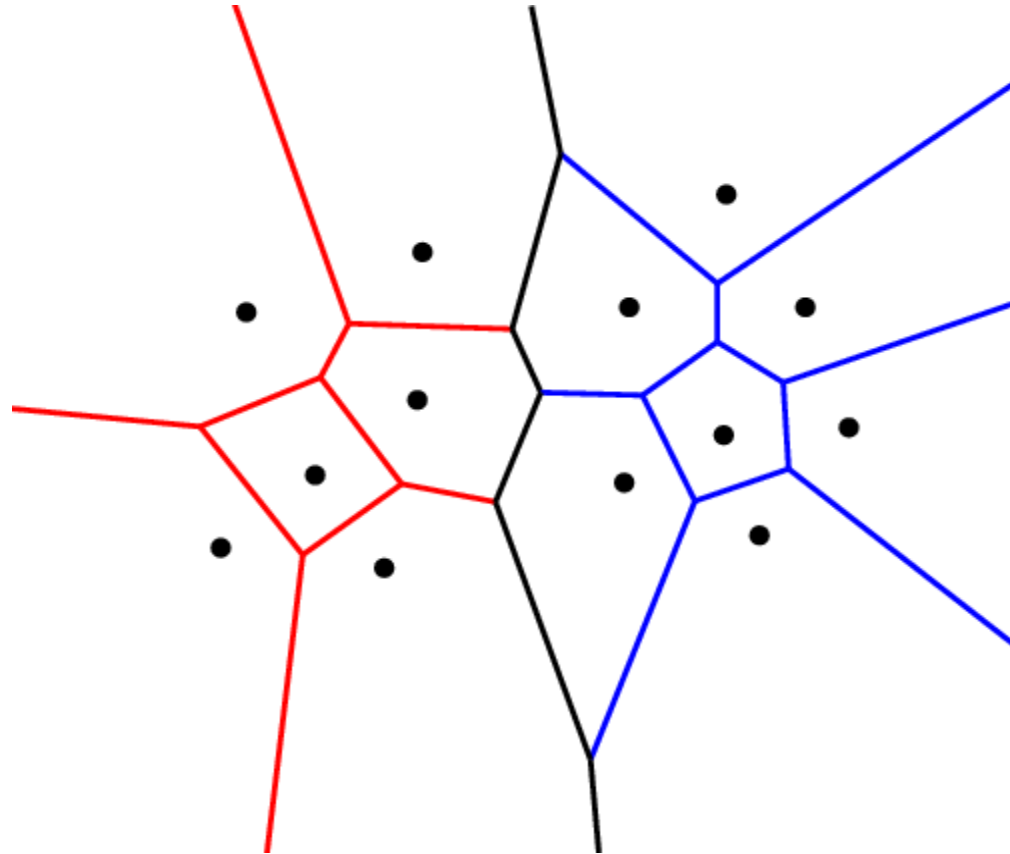
Stopping condition: The Voronoi diagram of a single site is the whole plane.



Merge: Connect the diagrams by adding new edges.

Computation of a Voronoi diagram

Output: The complete Voronoi diagram.



Running time: $O(n \log n)$, where n is the number of sites.