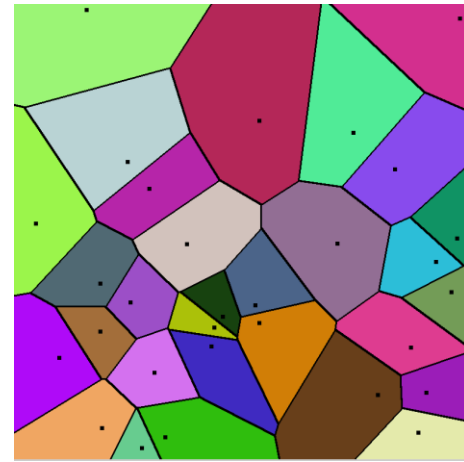
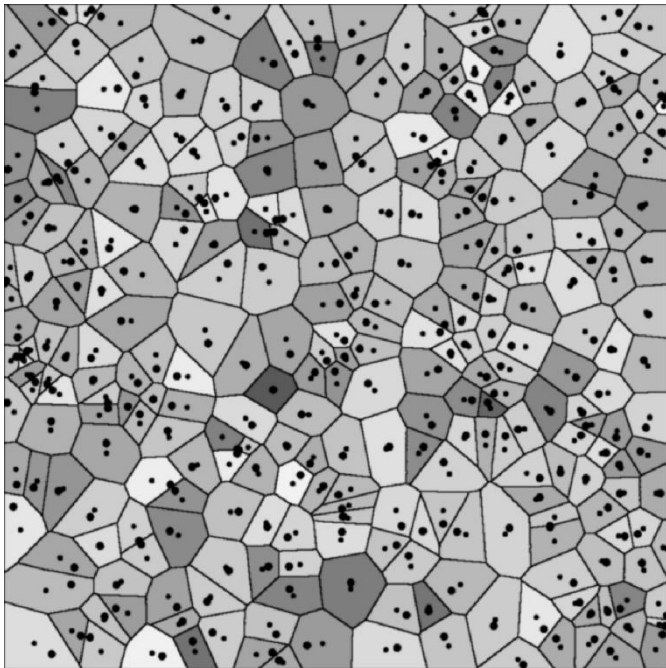


[www.grasshopper3d.com](http://www.grasshopper3d.com)

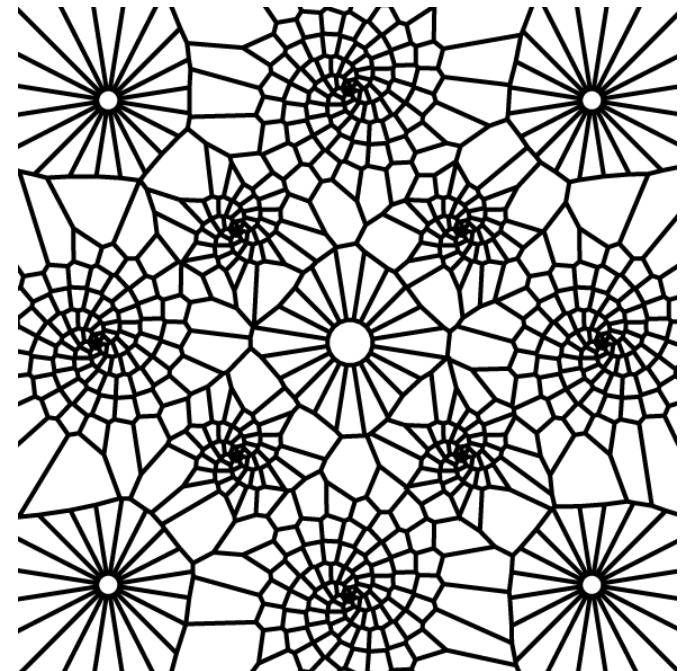


[www.sonycsl.co.jp](http://www.sonycsl.co.jp)

# Voronoi diagrams



[cs.nyu.edu](http://cs.nyu.edu)



<http://newtextiles.media.mit.edu/?p=1906>

# Motivation

- Solves so-called **post office problem**
  - The goal is to plan a placement of new post office/supermarket/...
  - How many people will find the new supermarket attractive?
  - Let's consider the following simplified requirements:
    - The price of all goods is the same in all supermarkets
    - Total cost = cost for the goods + travelling cost to the supermarket
    - Travelling cost to the supermarket = Euclidean distance to the supermarket x fixed cost per distance unit
    - The goal of the customer is to minimize the costs
  - Consequence: the customers are using the service of the nearest supermarket

# Motivation

- This model induces the division of the space to subregions according to the location of the supermarkets – each subregion contains **all points** being **closer** to the given supermarket than to any other supermarket
- Such a space division is called **Voronoi diagram**

# Euclidean distance

- **Euclidean distance** between two points  $P = [p_x, p_y]$  and  $Q = [q_x, q_y]$  is defined as

$$|PQ| = \text{dist}(P, Q) = \sqrt{(p_x - q_x)^2 + (p_y - q_y)^2}$$

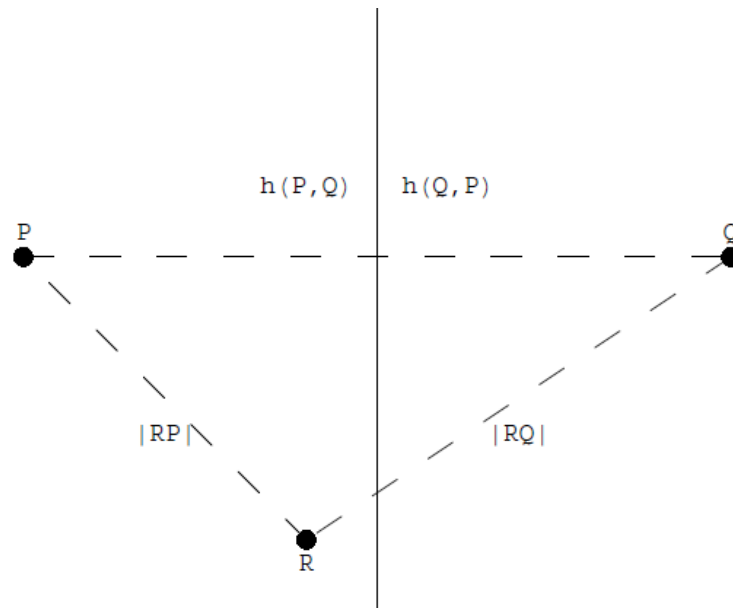
# VD definition

- Let  $P = \{P_1, \dots, P_n\}$  be a set of  $n$  different points in space, called **generating points**.
- Voronoi diagram of  $P$  is the division to  $n$  cells connected with points  $P_i$  in that way that an arbitrary point  $Q$  lies in the cell of  $P_i$  only when

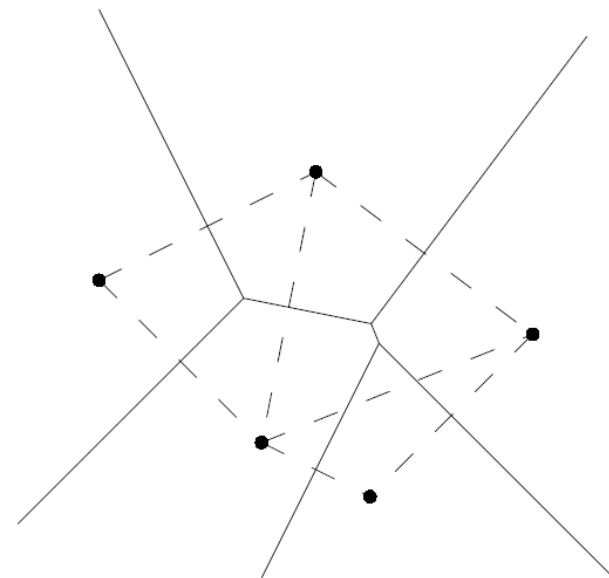
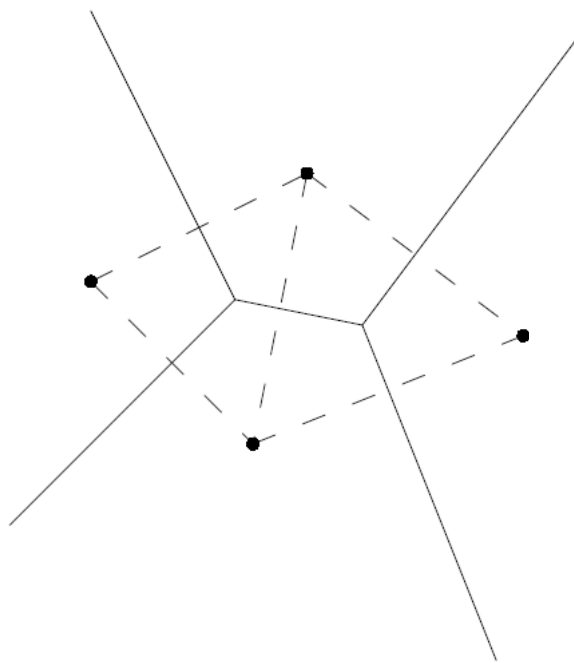
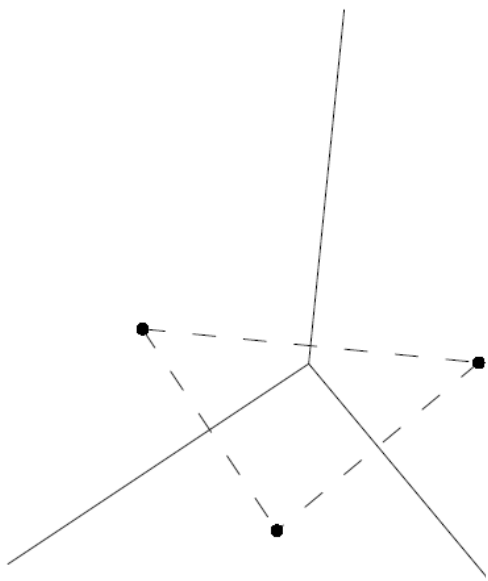
$$|QP_i| < |QP_j| \quad \text{for all } P_j \in P, j \neq i$$

# VD definition

- Lets denote the Voronoi diagram of  $P$  as  **$\text{Vor}(P)$**
- A cell of  $\text{Vor}(P)$ , belonging to point  $P_i$ , is denoted as  $\gamma(P_i)$  and we call it a **Voronoi cell of point  $P_i$**

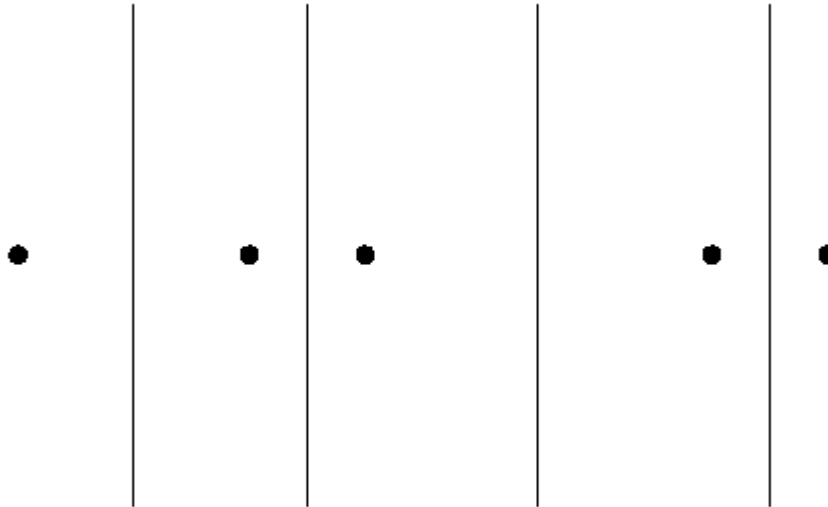


# VD examples



# VD properties

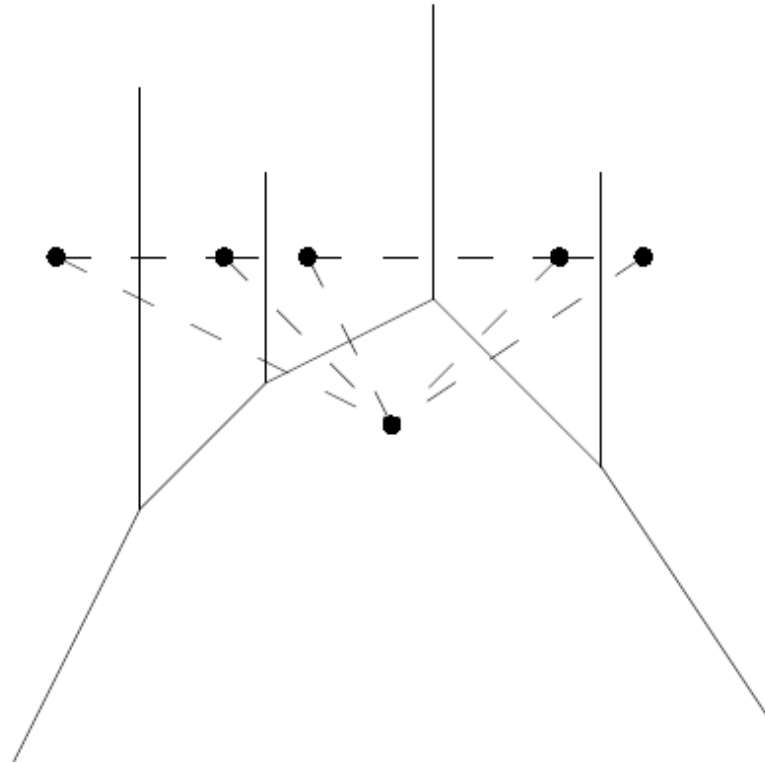
- If all points in  $P$  are colinear,  $\text{Vor}(P)$  consists of  $n - 1$  parallel lines





# VD properties

- If the points are not colinear,  $\text{Vor}(P)$  is continuous and its edges are line segments or half-segments

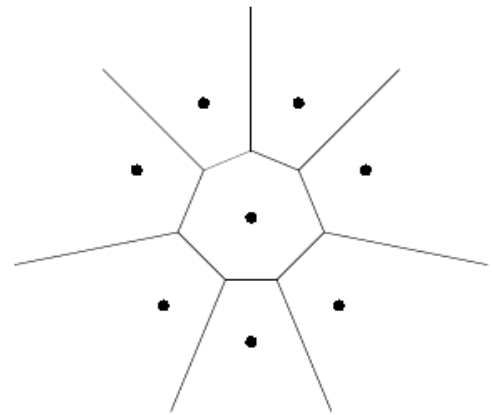
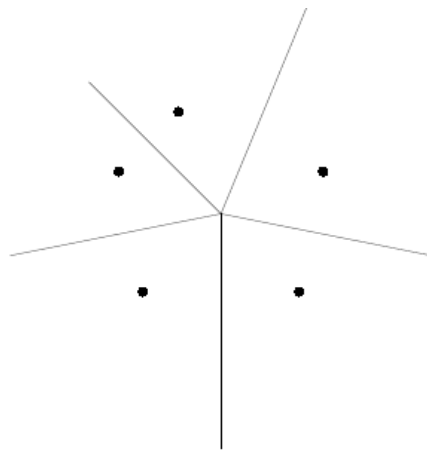


# VD properties

- Voronoi cell  $v(P_i)$  is **unlimited** only when the point  $P_i$  belongs to an edge of the convex hull of  $P$

# VD properties

- If  $P$  contains 4 or more vertices lying on one circle, there is a Voronoi vertex formed by the intersection of Voronoi edges whose number corresponds to the number of points on that circle – we call it a **degenerated Voronoi diagram**



# Algorithms for VD construction

- Generally, creating VD for  $n$  points lies in  $O(n \log n)$
- Algorithms:
  - Naïve approach
  - Incremental algorithm
  - Divide and conquer
  - Sweep line (Fortune's algorithm)
  - ...

# Naïve approach

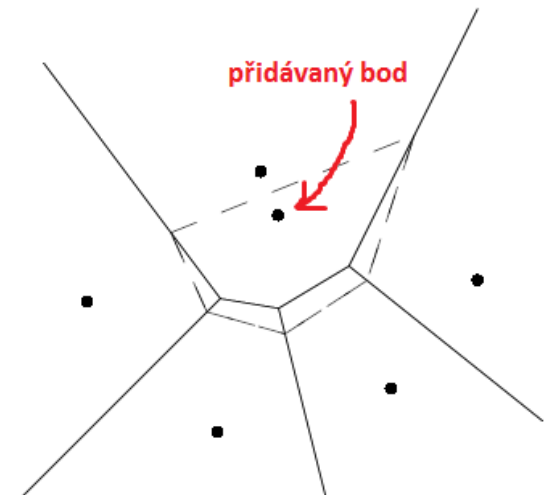
- Each region  $\gamma(P_i)$  of Voronoi diagram is generated as an intersection between halfplanes  $h(P_i, P_j)$ , for all  $j \neq i$ .
- The complexity of finding one region =  $O(n \log n)$
- Total complexity =  **$O(n^2 \log n)$**

# Incremental algorithm

1. For all points  $P$ :
  1. In the current VD, we localize the corresponding Voronoi cell containing  $P_{i+1} \rightarrow \gamma(P_{i1})$
  2. We create the axis of line segment  $P_{i+1}P_{i1}$
  3. We determine the intersections of this axis of line segment  $P_{i+1}P_{i1}$  with the boundary of  $\gamma(P_{i1})$
  4. We select one of the intersections which determines the Voronoi cell with which our algorithm will continue in the next step  $\rightarrow \gamma(P_{i2})$

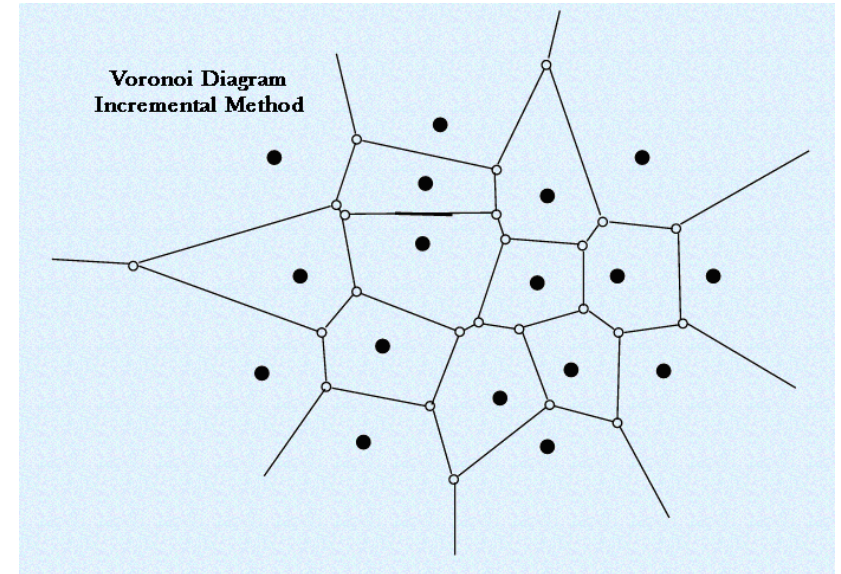
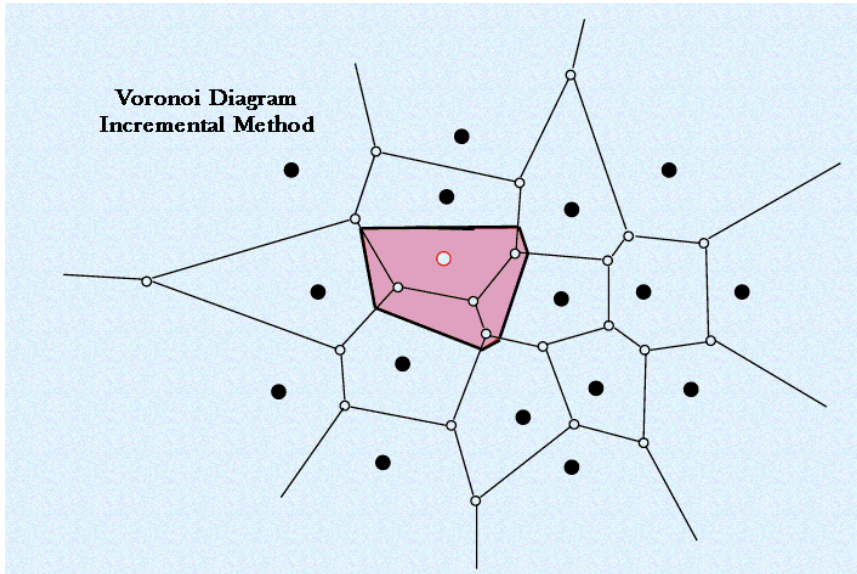
# Incremental algorithm

5. We create the axis of the line segment  $P_{i+1}P_{i2}$  and its intersections with the boundary of  $y(P_{i2})$ . We select an intersection not lying on the common edge of  $y(P_{i1})$  and  $y(P_{i2})$  and we continue
6. We repeat step 5, until we reach the second intersection of the axis of line intersection  $P_{i+1}P_{i1}$  with the boundary of  $y(P_{i1})$
7. We remove the edges inside the newly created Voronoi cell



# Incremental algorithm

- Complexity  $O(n^2)$ , in special cases even  $O(n)$



<http://www.personal.kent.edu/~rmuhamma/Compgeomtry/MyCG/Voronoi/Incremental2/incremental2.htm>

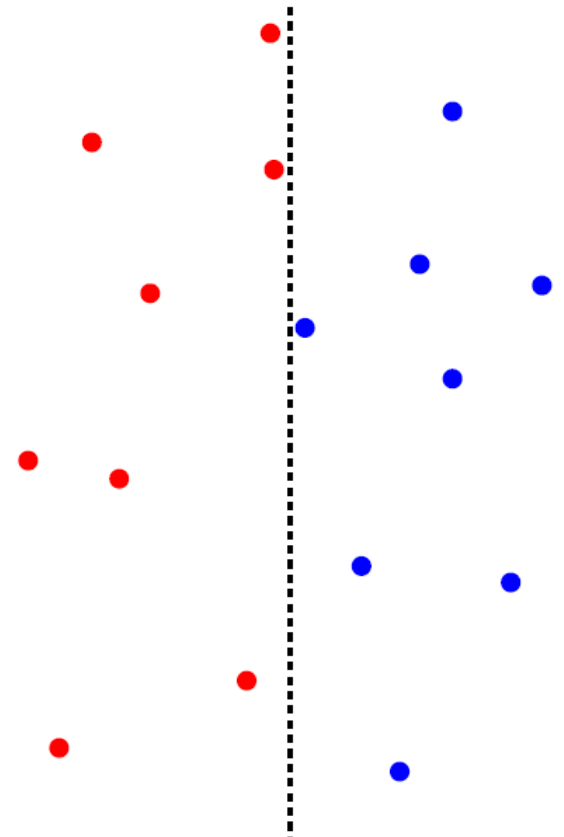


# Divide and conquer

- The input set is recursively divided to two subsets until we reach the set of three points for which we construct the VD easily
- The crucial part is the „backtracking step“, where the individual solutions have to be merged to one VD
- Complexity  $O(n \log n)$

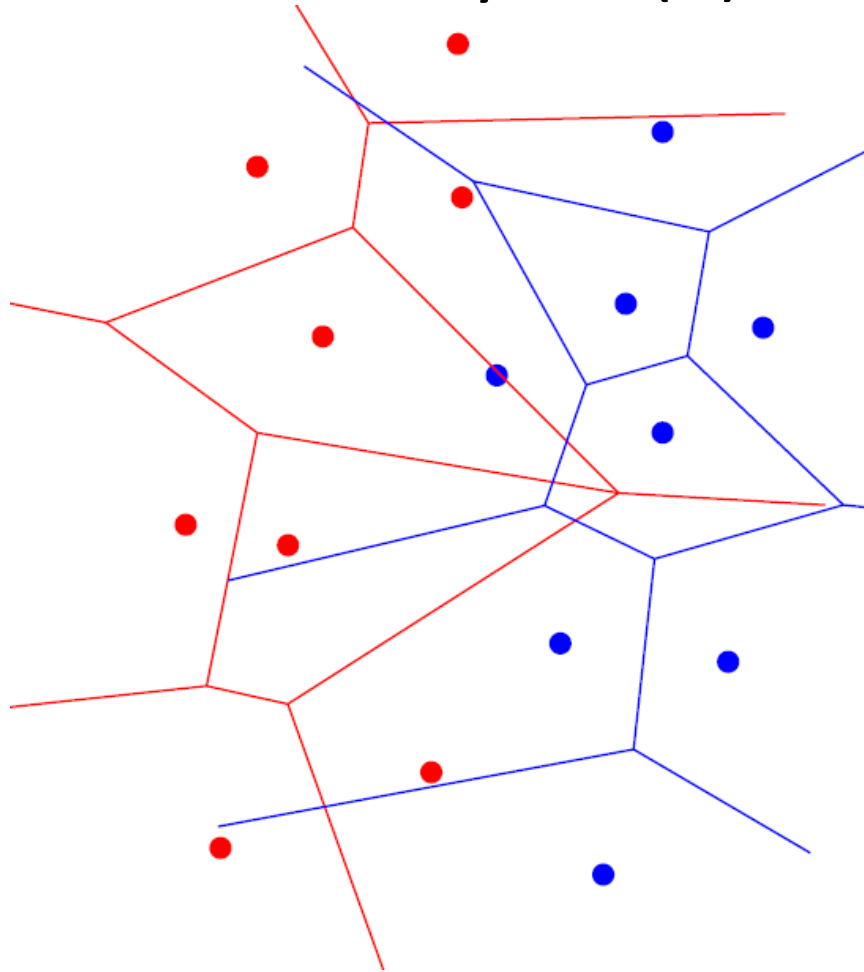
# Divide and conquer

- We sort the input points and divide them vertically to two subsets  $R$  and  $B$  of approximately the same size



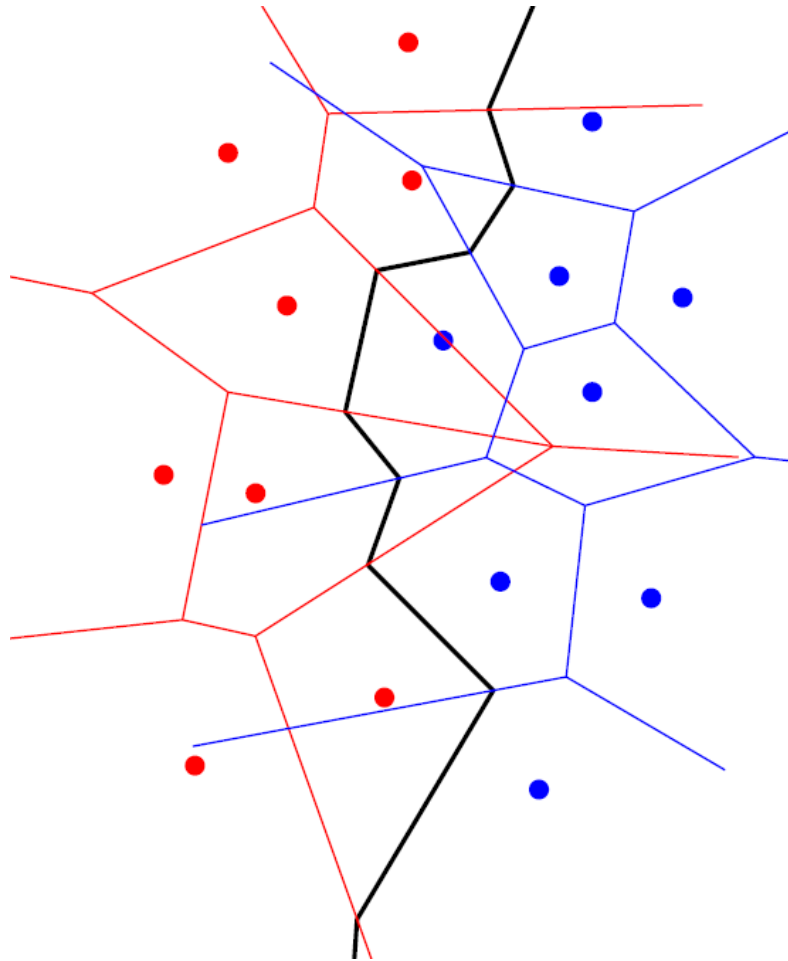
# Divide and conquer

- We calculate recursively  $\text{Vor}(R)$  and  $\text{Vor}(B)$



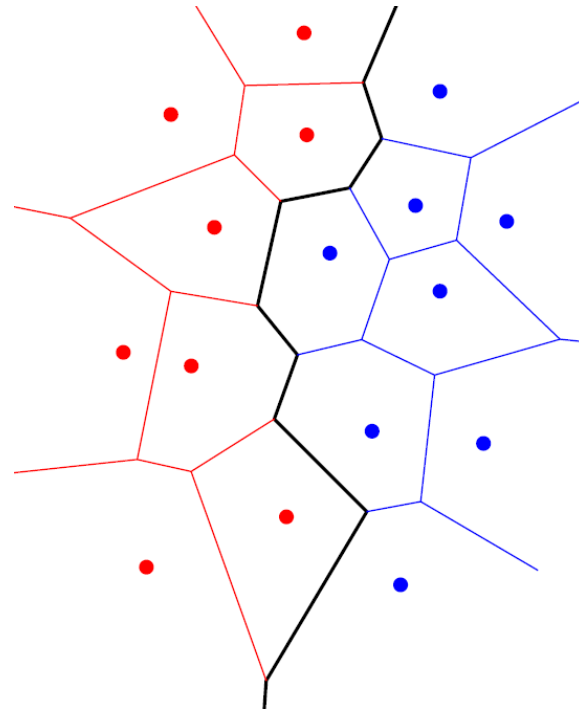
# Divide and conquer

- We determine so called **separating chain**



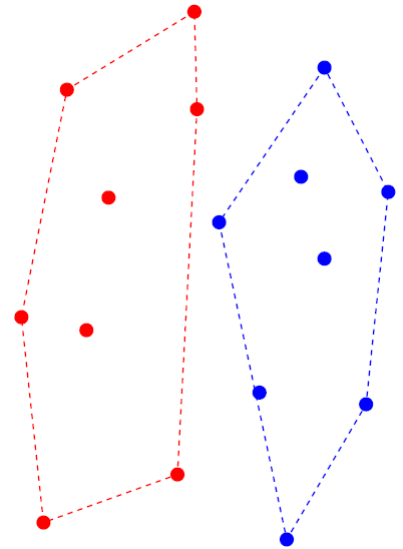
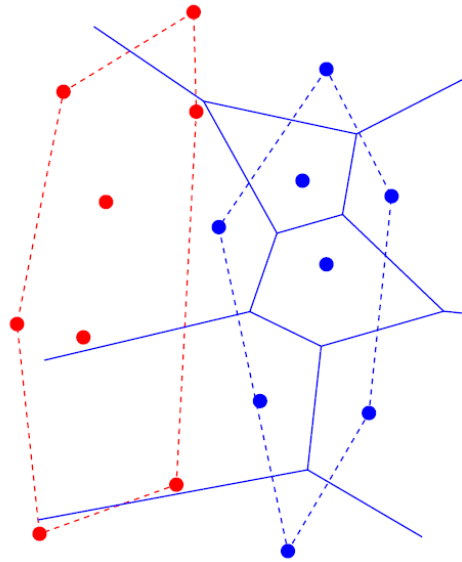
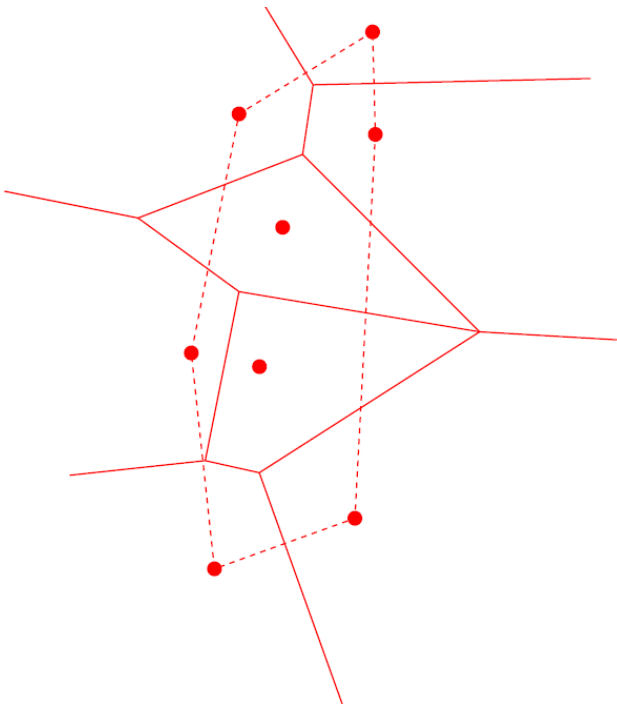
# Divide and conquer

- We remove the part of  $\text{Vor}(R)$  lying on the right side from the separating chain and the part of  $\text{Vor}(B)$  lying on the left side from the separating chain



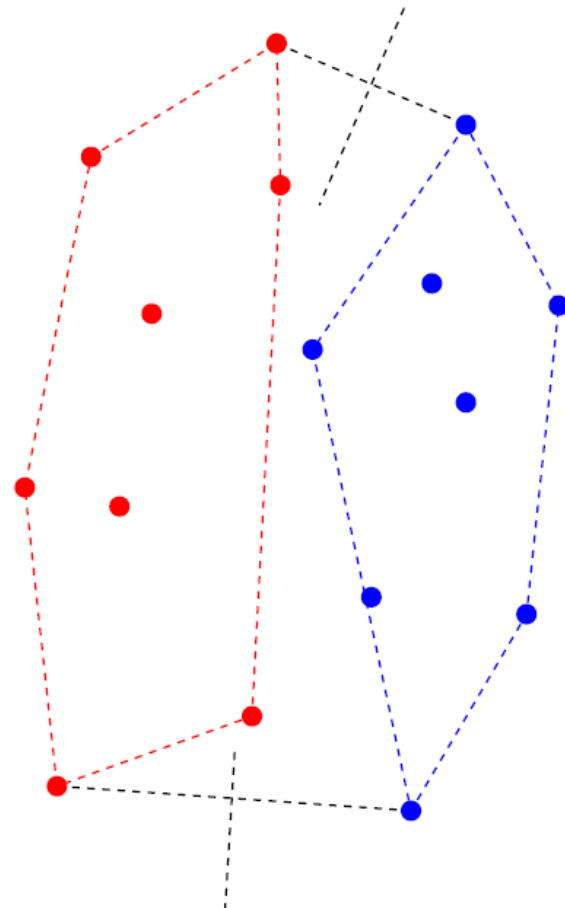
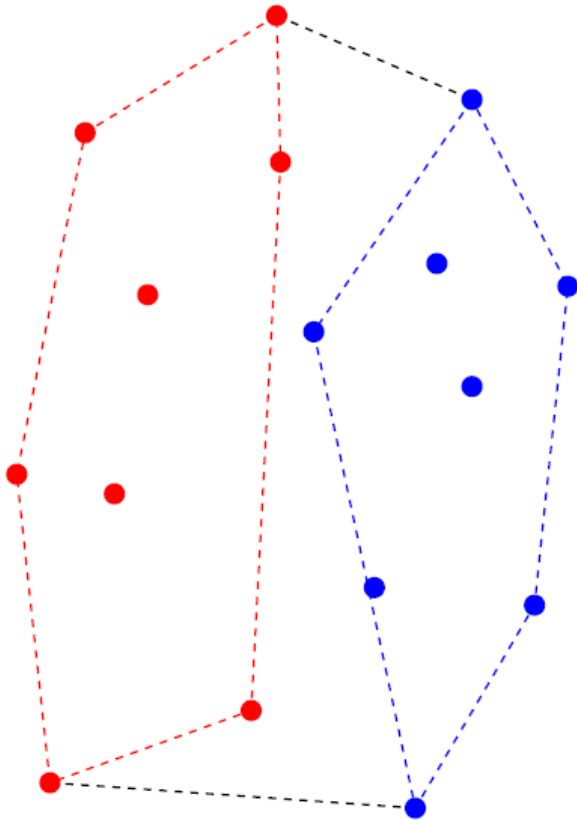
# Divide and conquer

- Defining the separating chain:
  - First, we find two convex hulls ...



# Divide and conquer

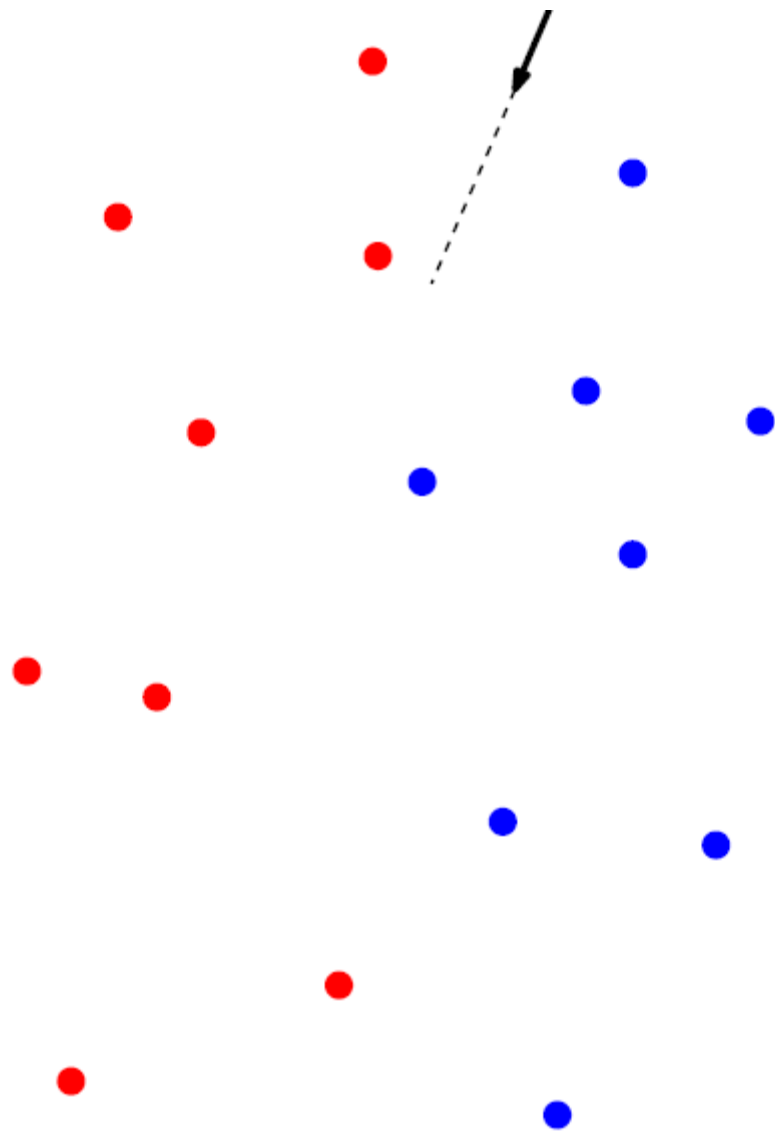
... and the upper and lower tangent and their perpendicular half-lines

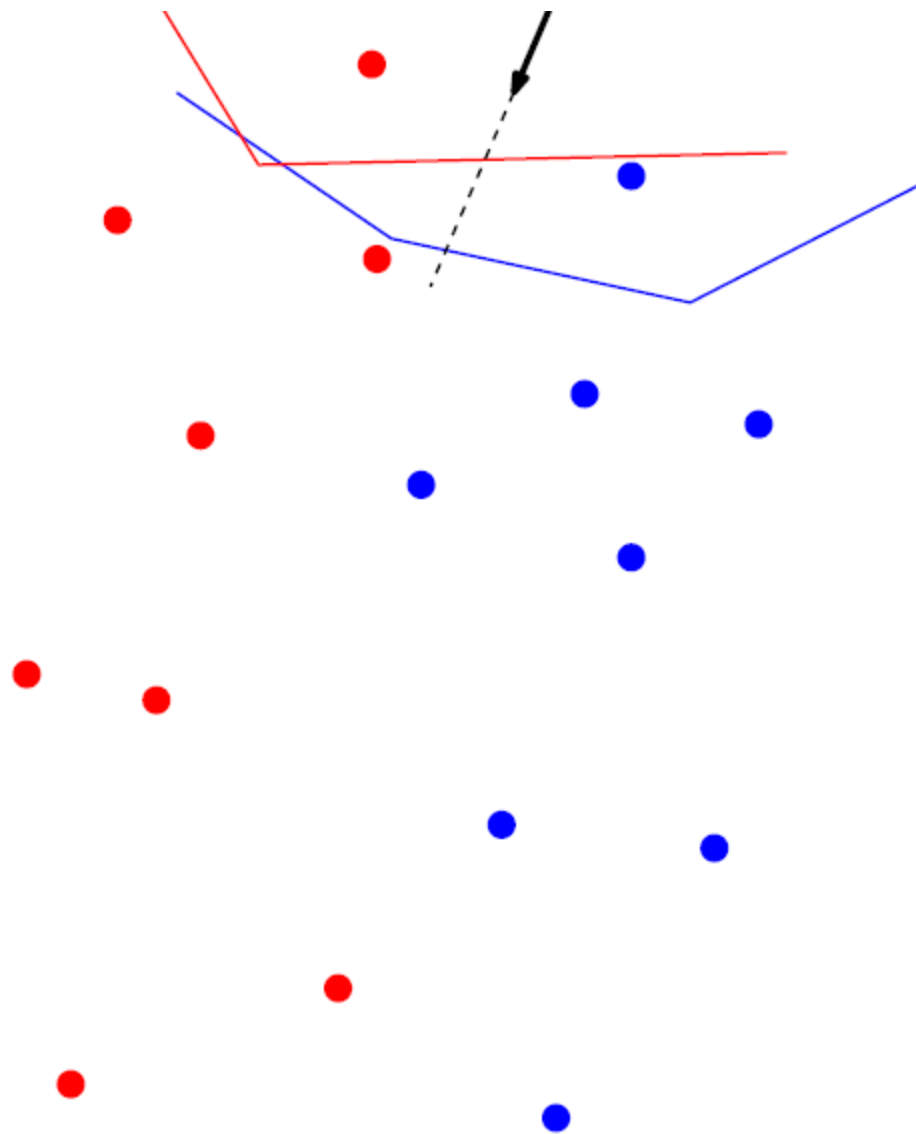


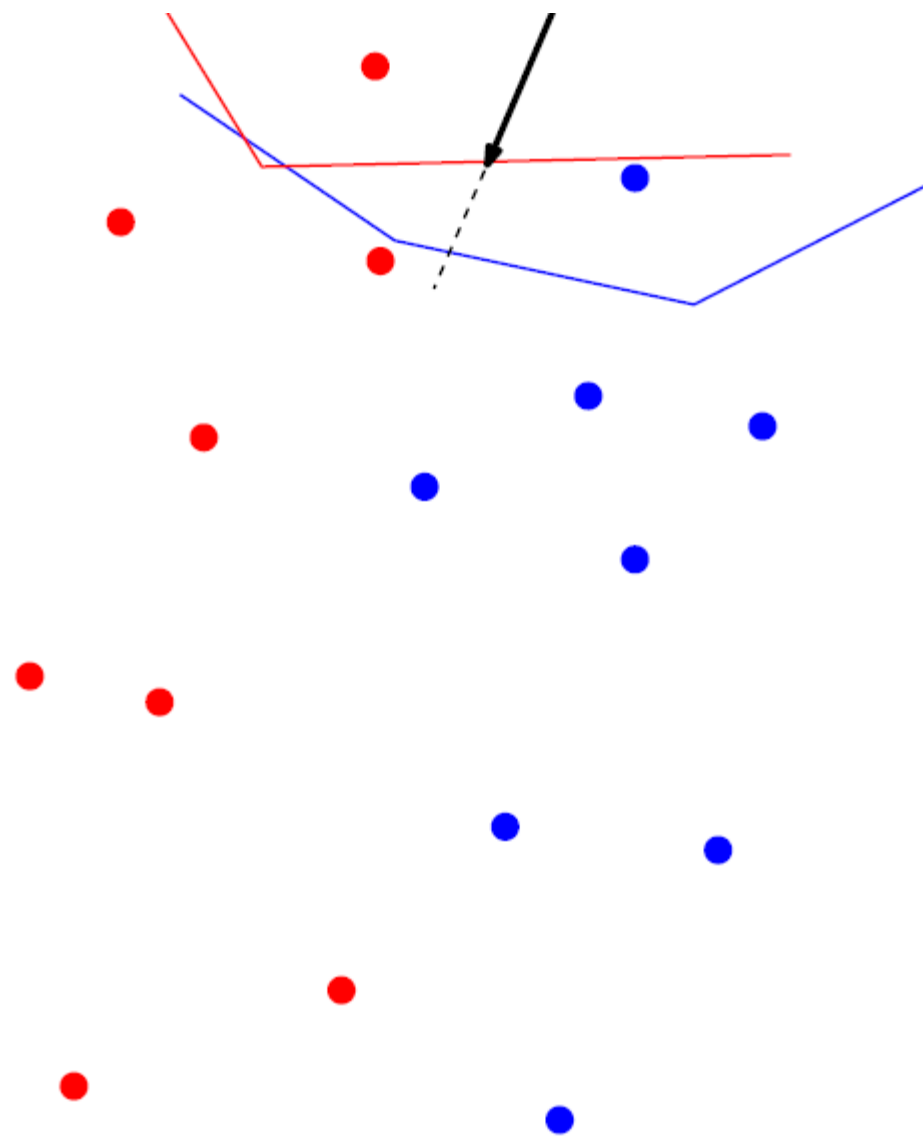
# Divide and conquer

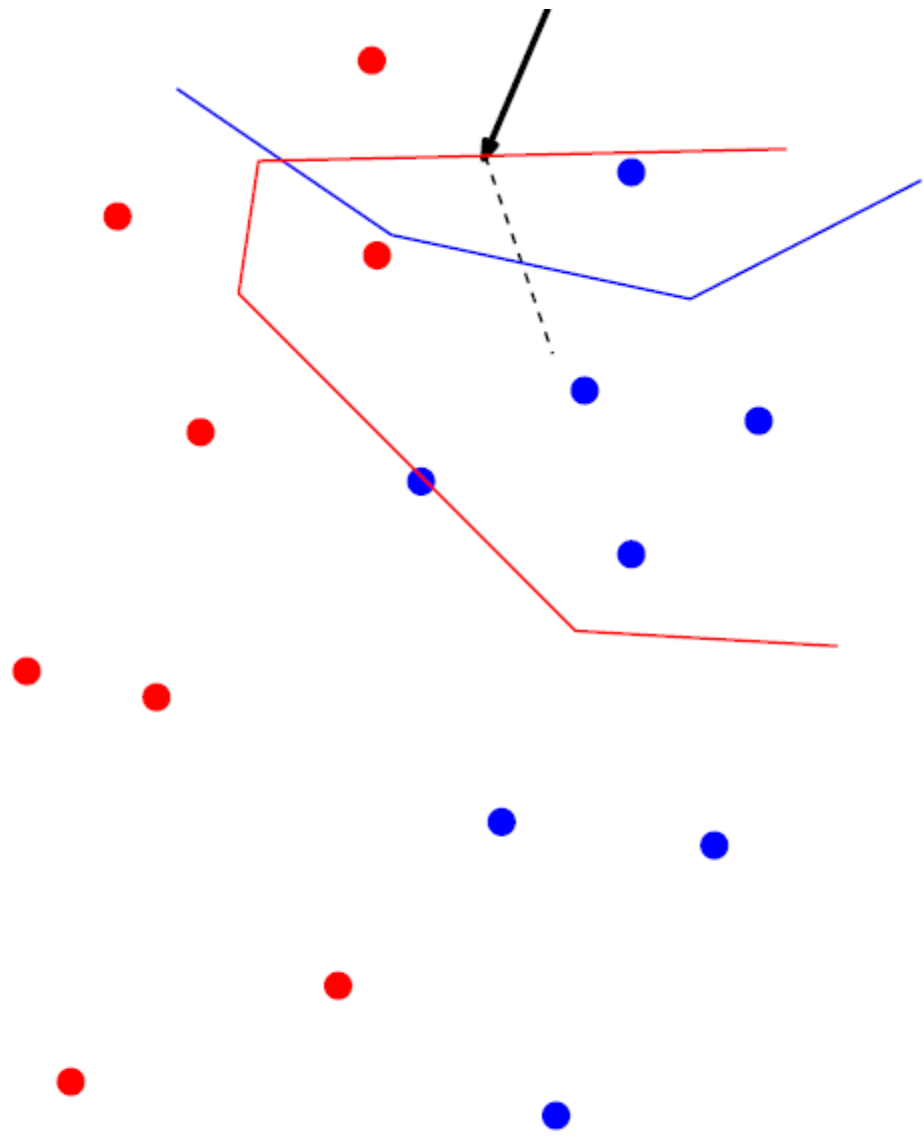
- We start from one of these half-lines and continue with the following procedure, until we reach the second half-line:
  - Always when there starts an edge  $e \in b(R, B)$  for which  $e \subset b_{ij}$ ,  $p_i \in R$ ,  $p_j \in B$ :
    - Search for the intersection of edge  $e$  with  $\text{Vor}_R(p_i)$
    - Search for the intersection of edge  $e$  with  $\text{Vor}_B(p_j)$
    - Select one of these intersections
    - Determine  $p_k$  corresponding to a new starting region
    - Replace  $p_i$  or  $p_j$  (according to the selected point) by new  $p_k$
    - Repeat this step with the new edge

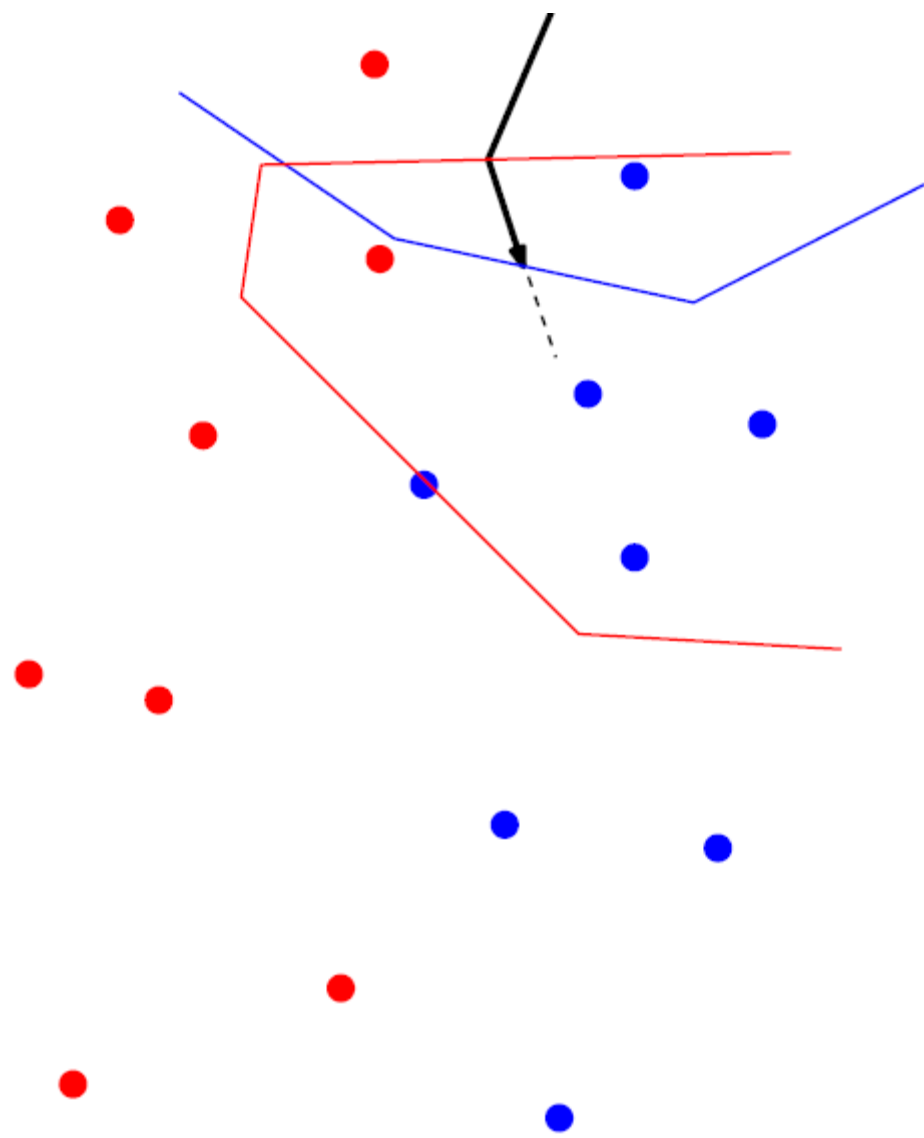


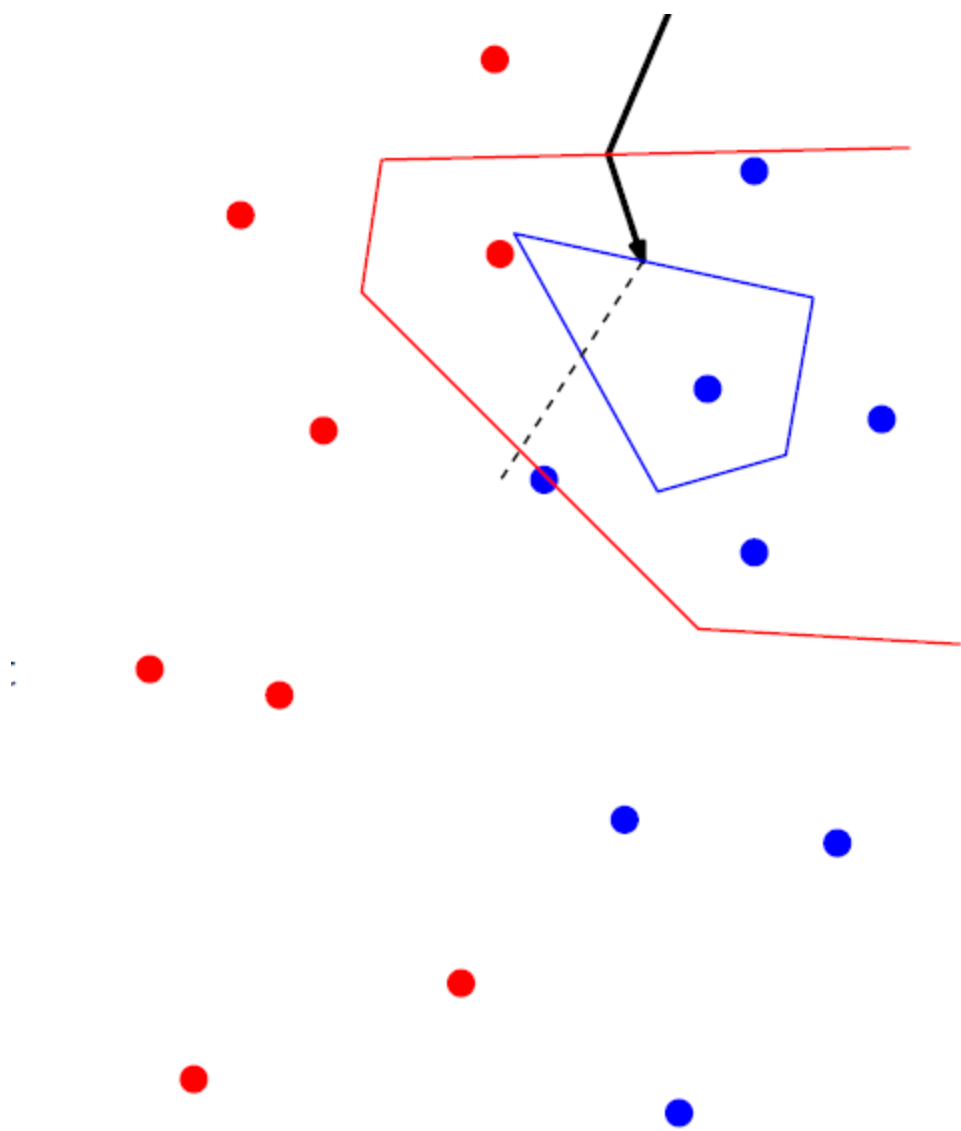


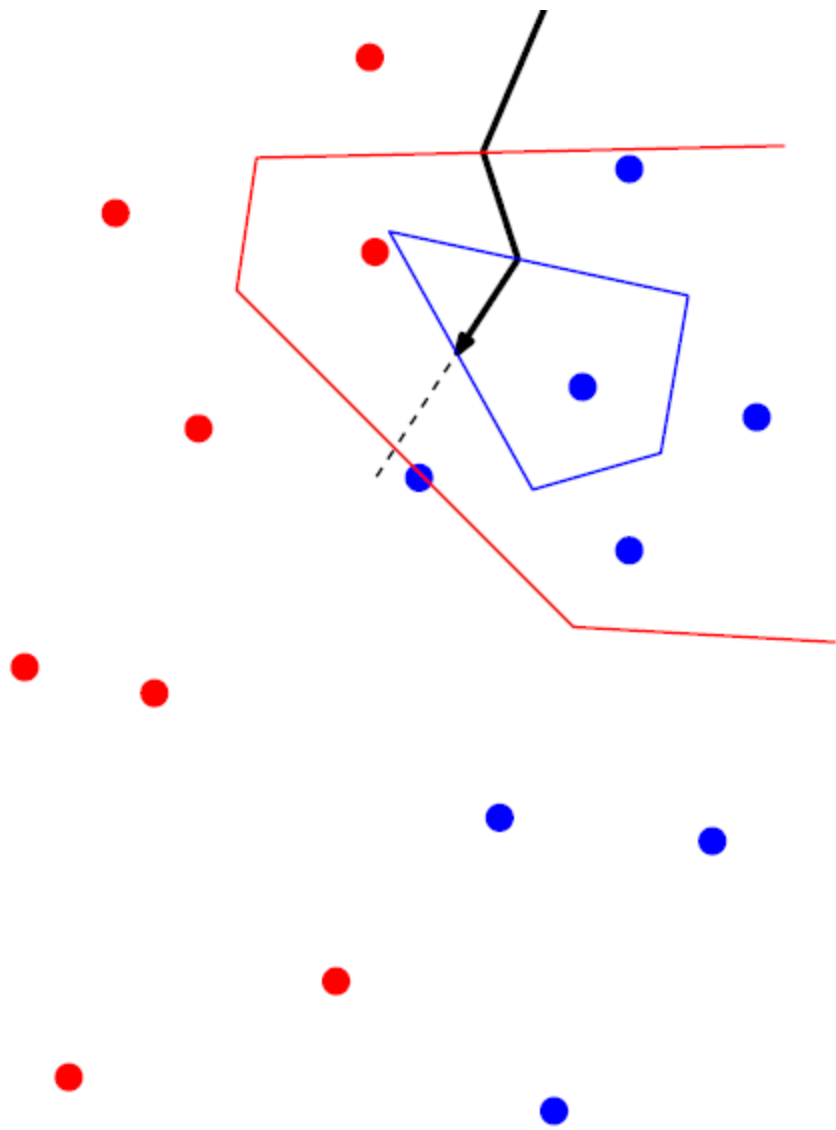


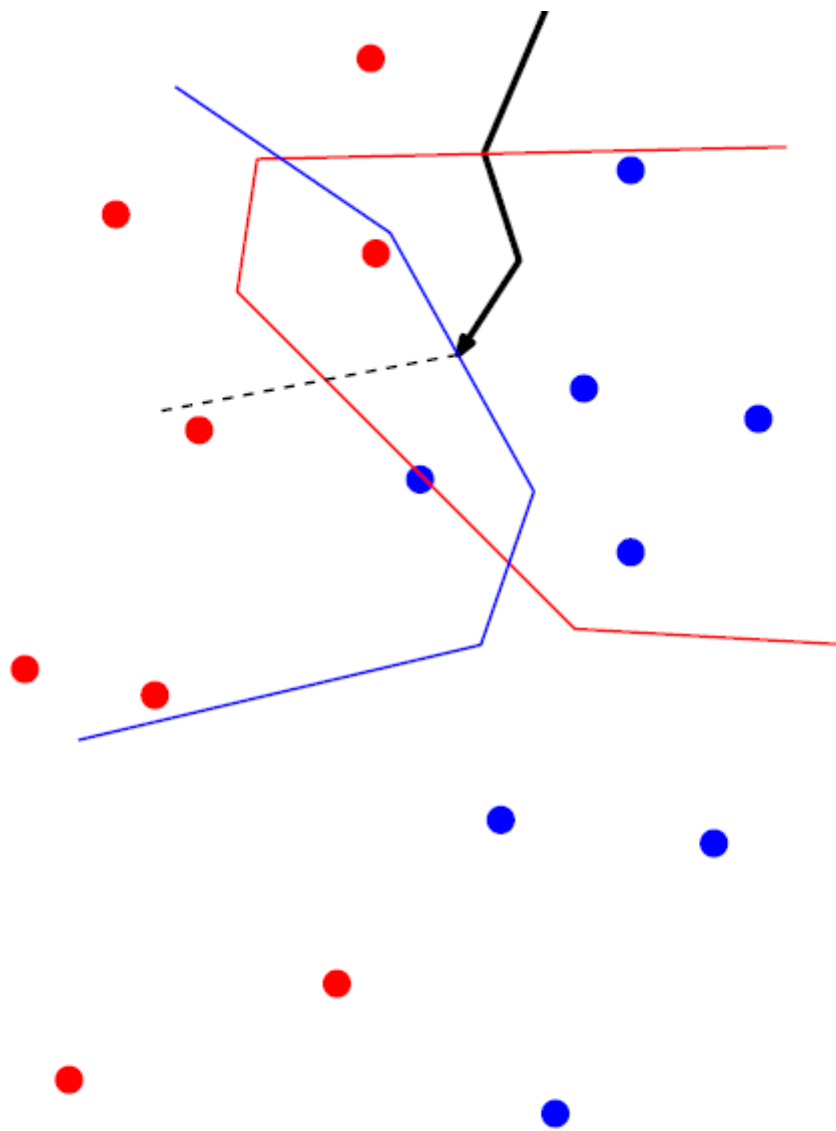




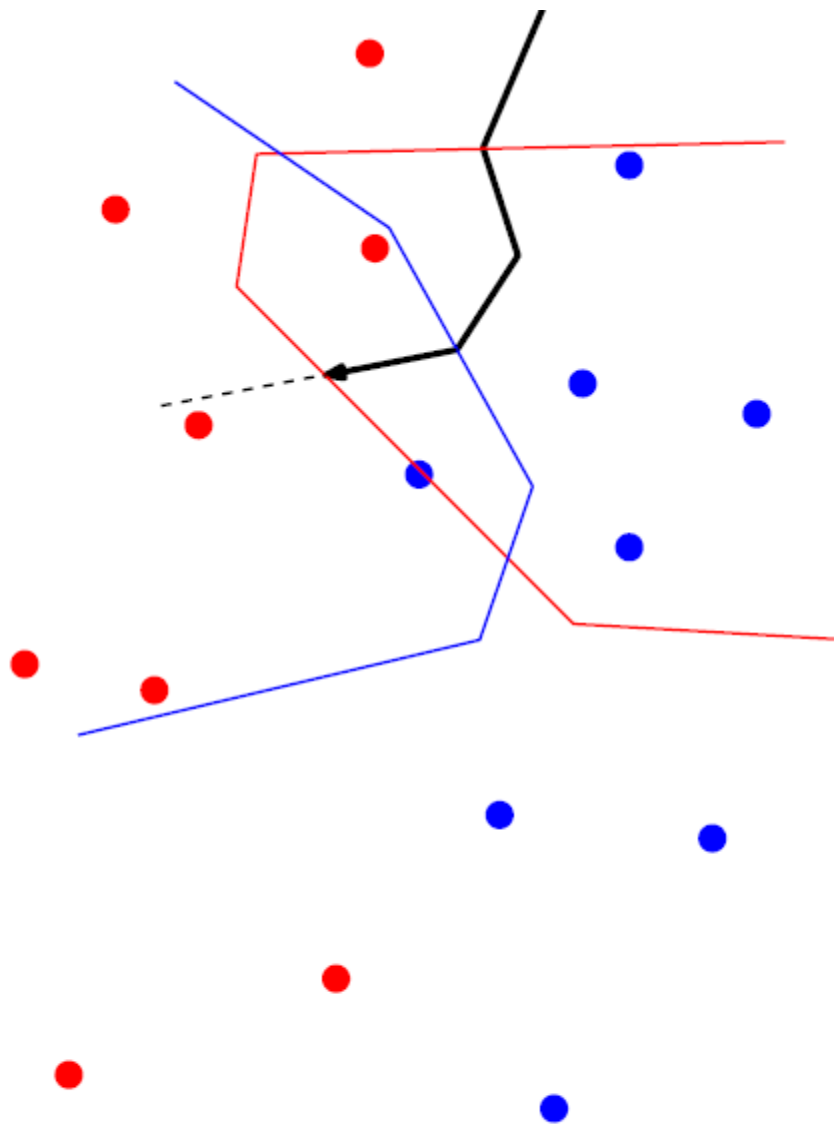


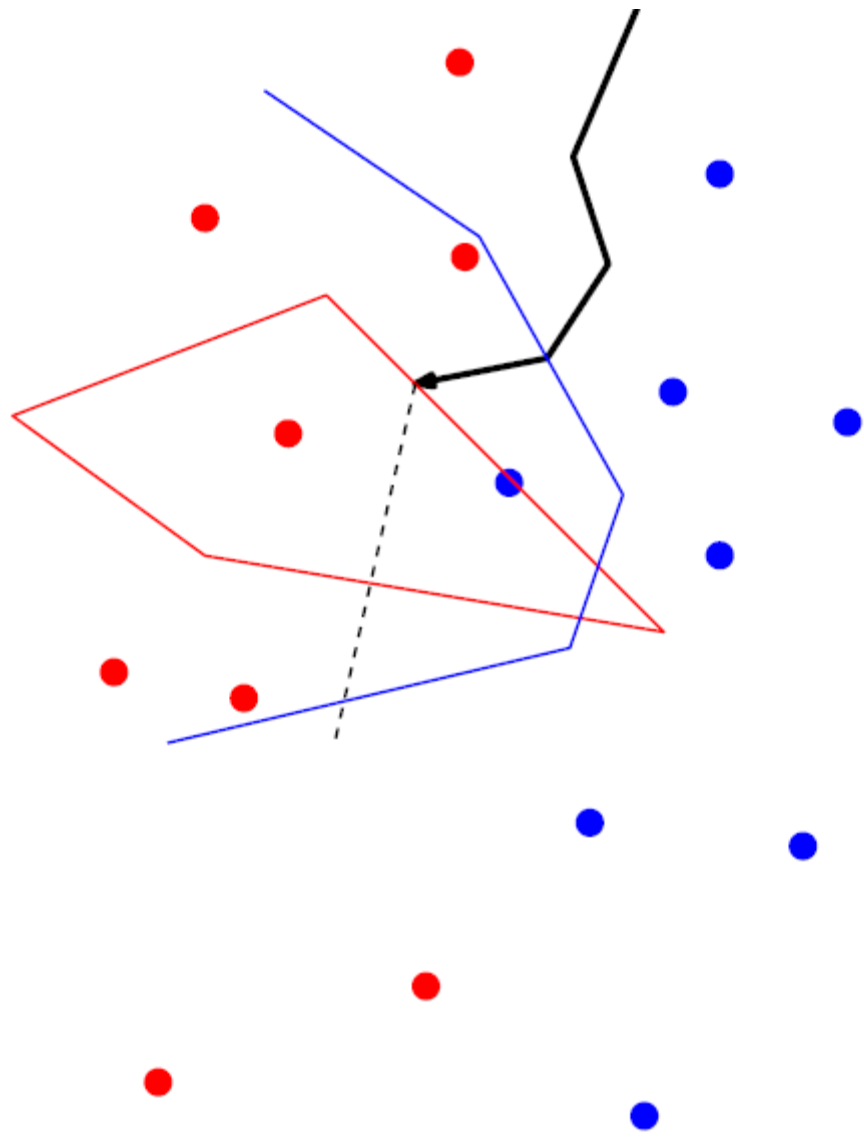


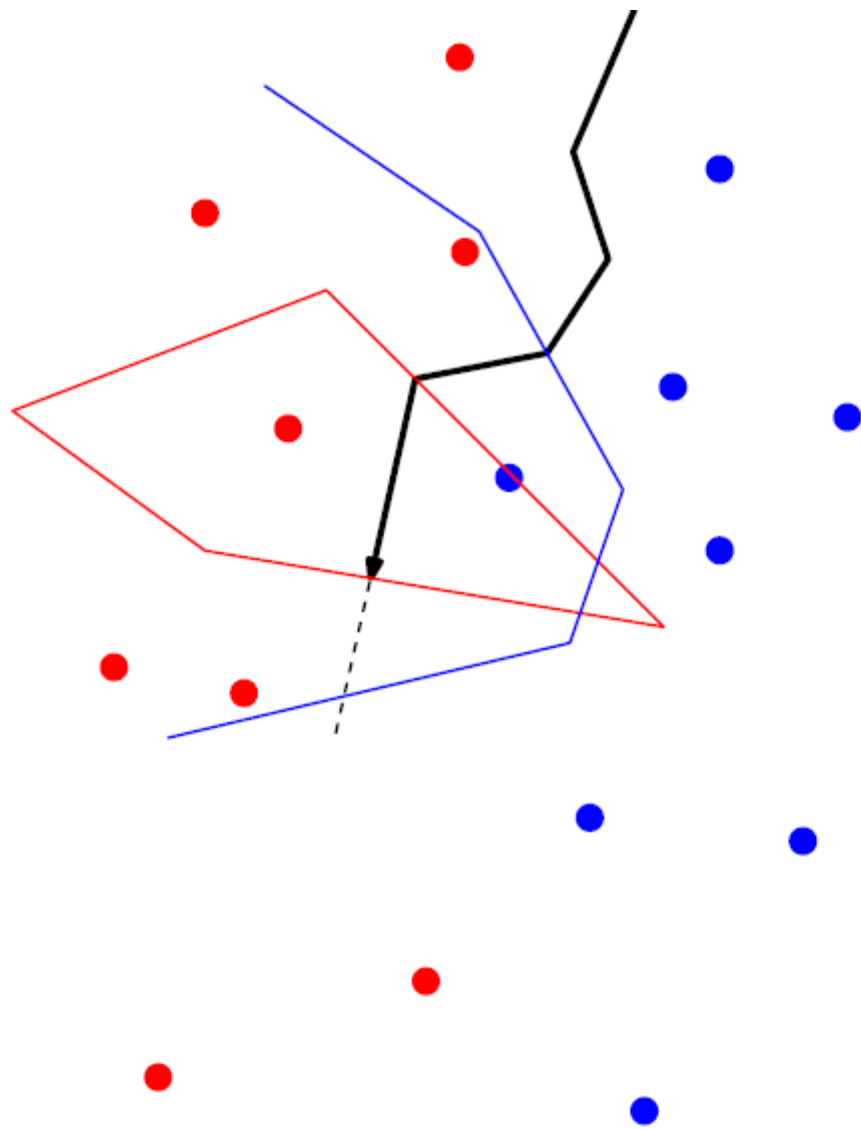


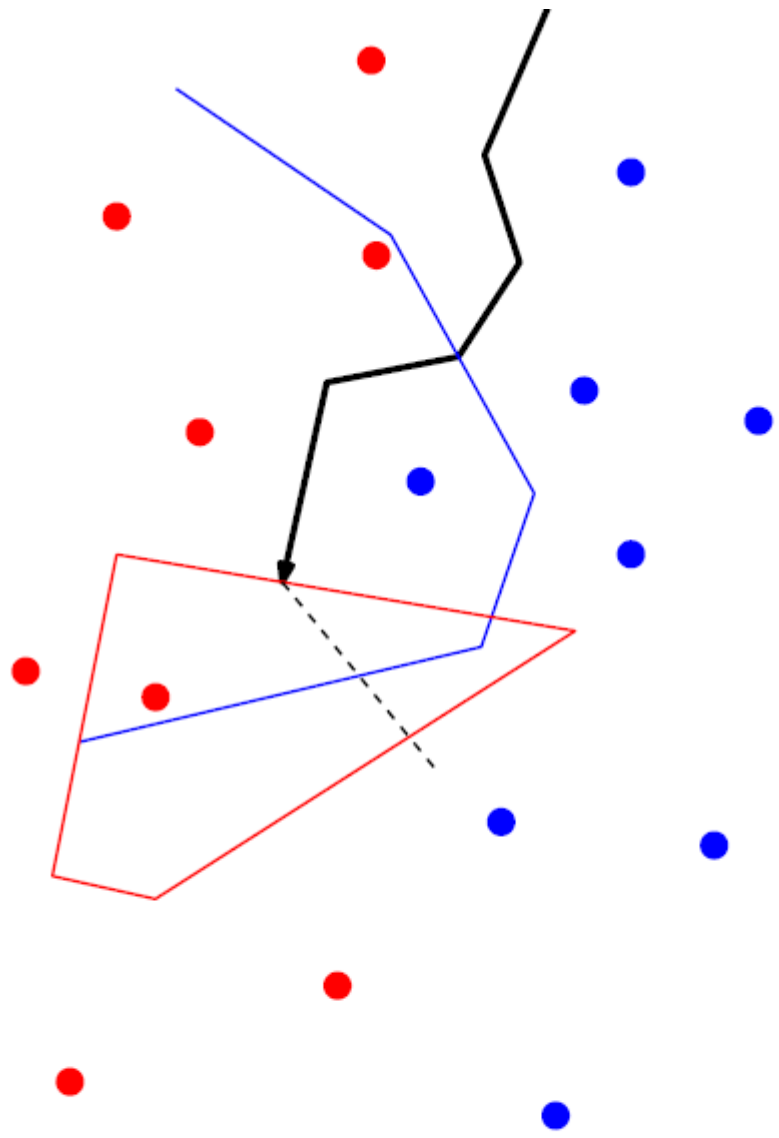


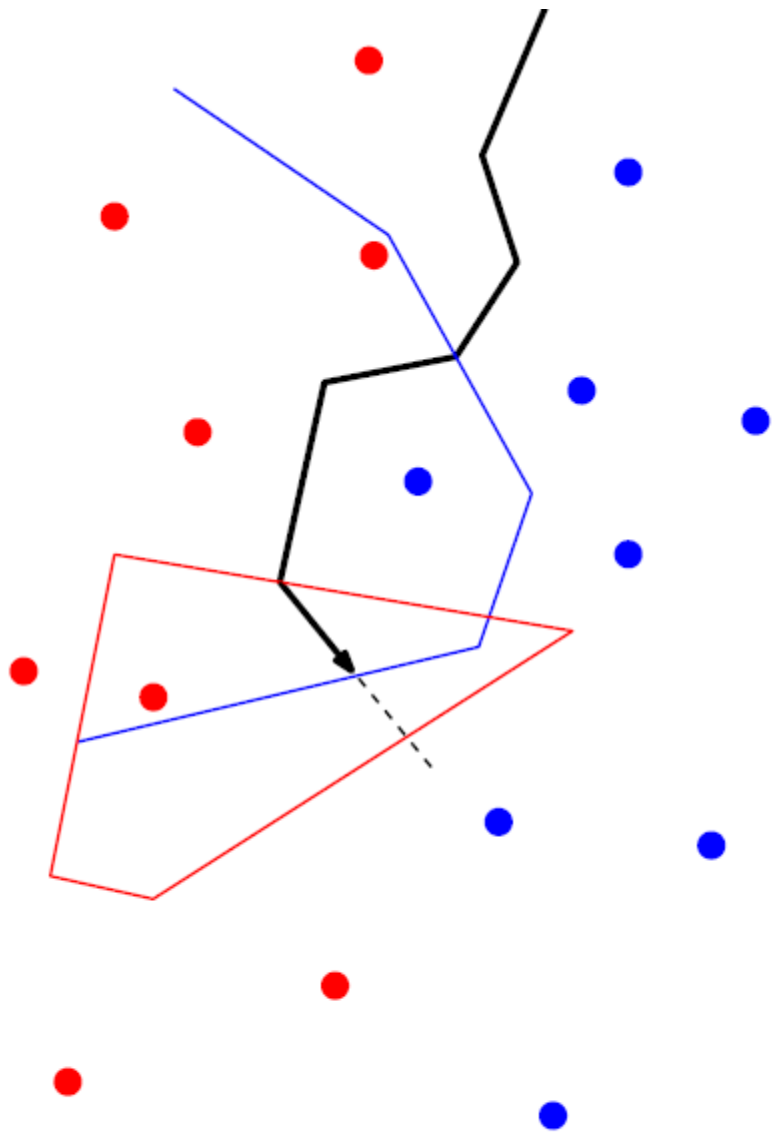


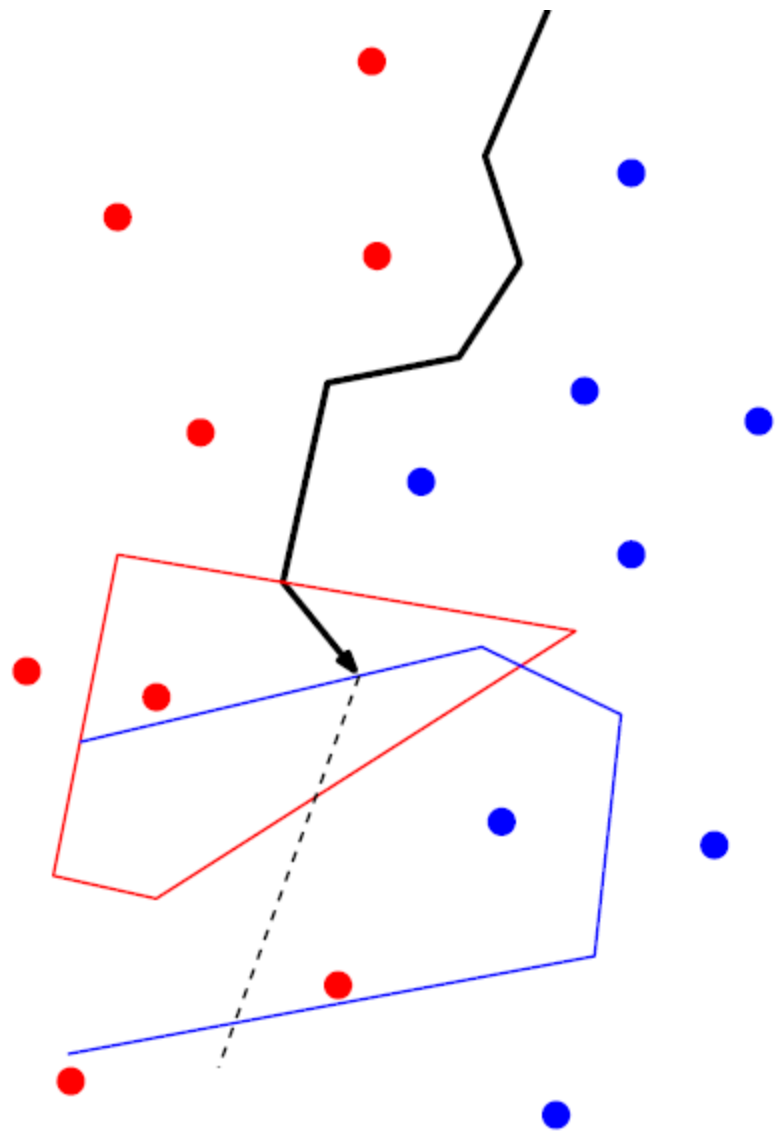


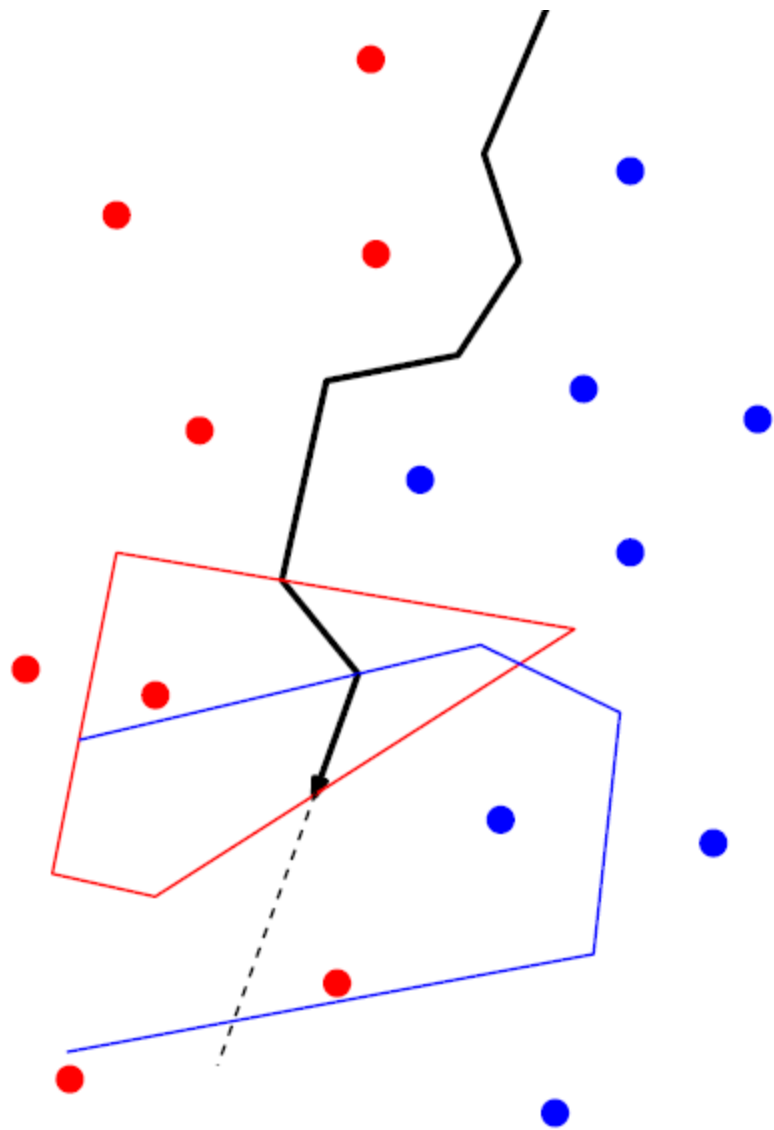


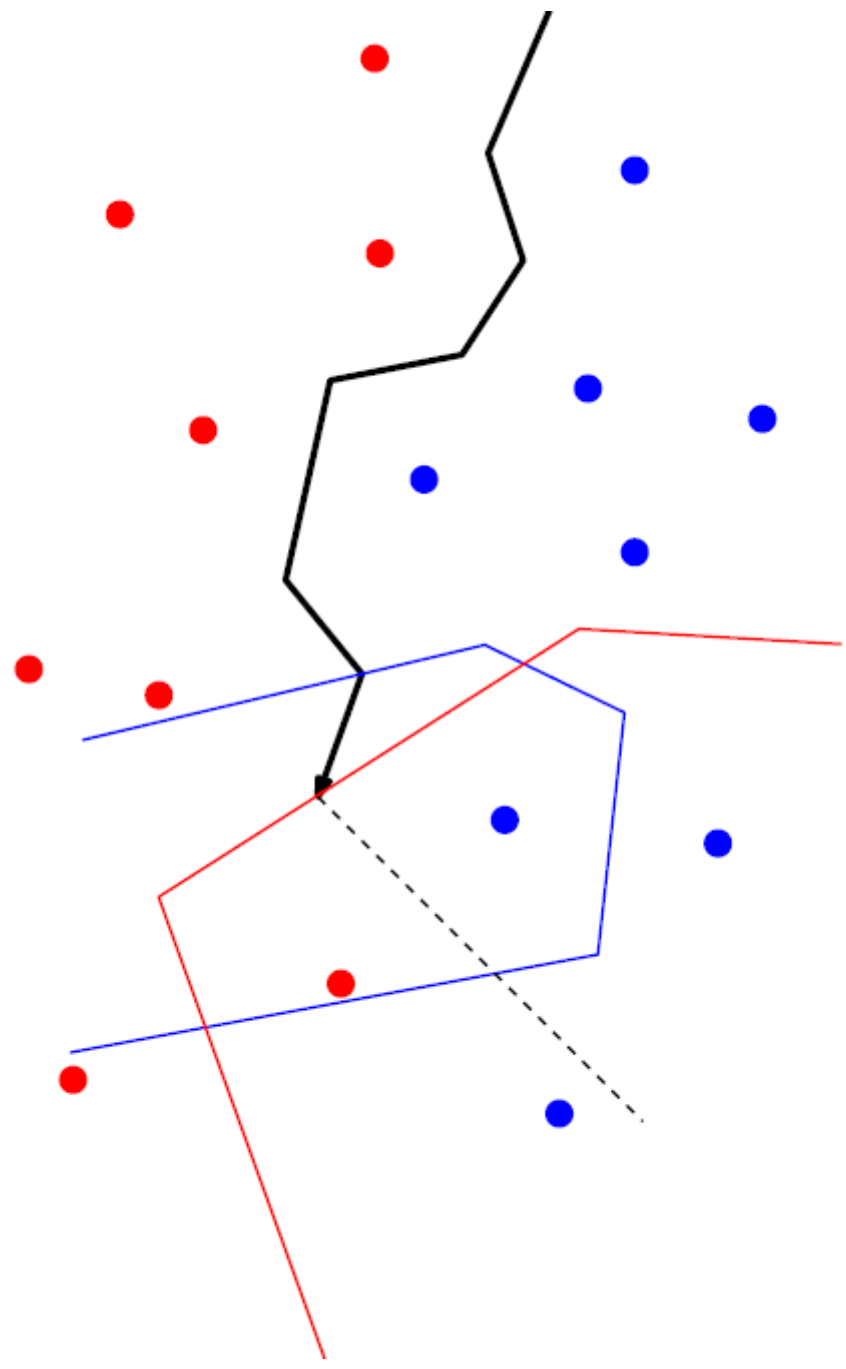




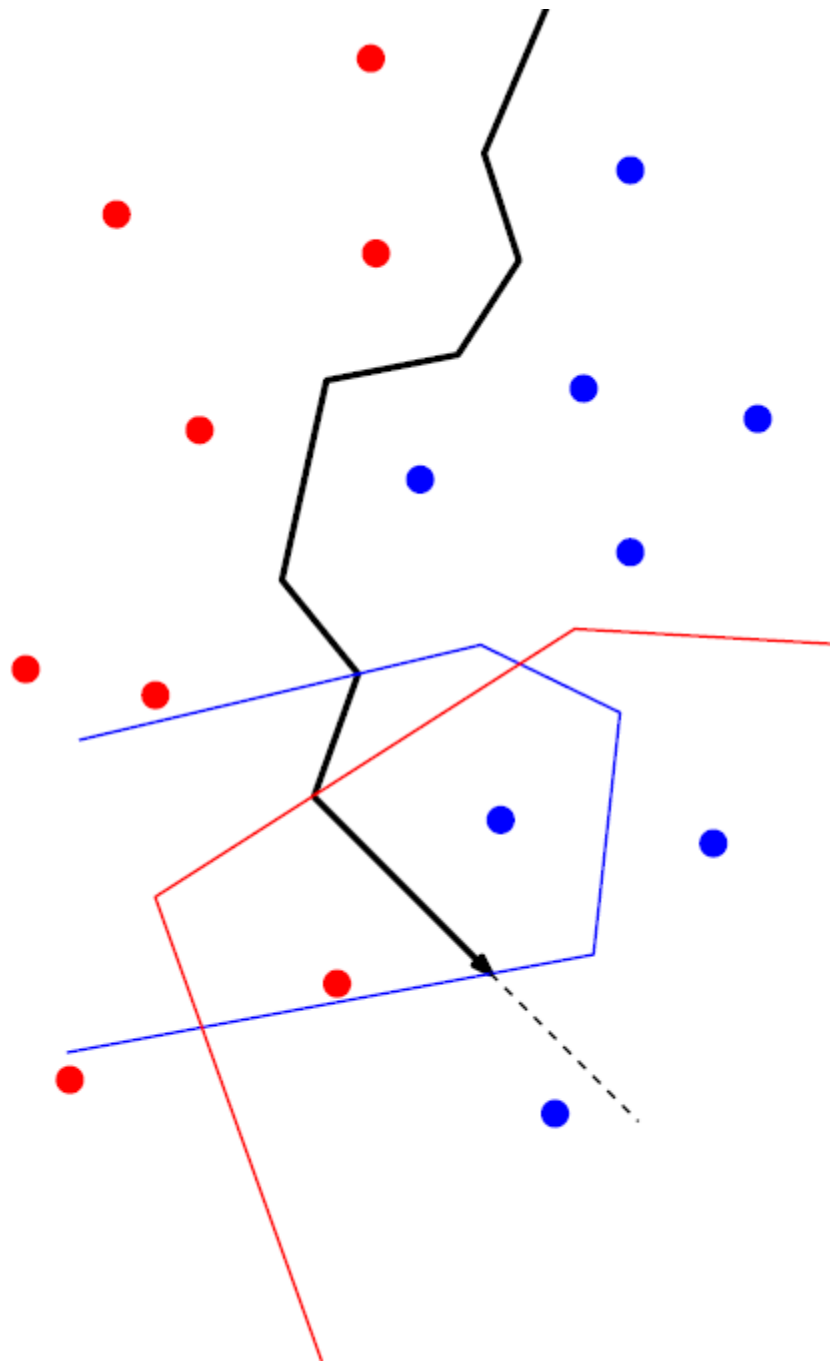


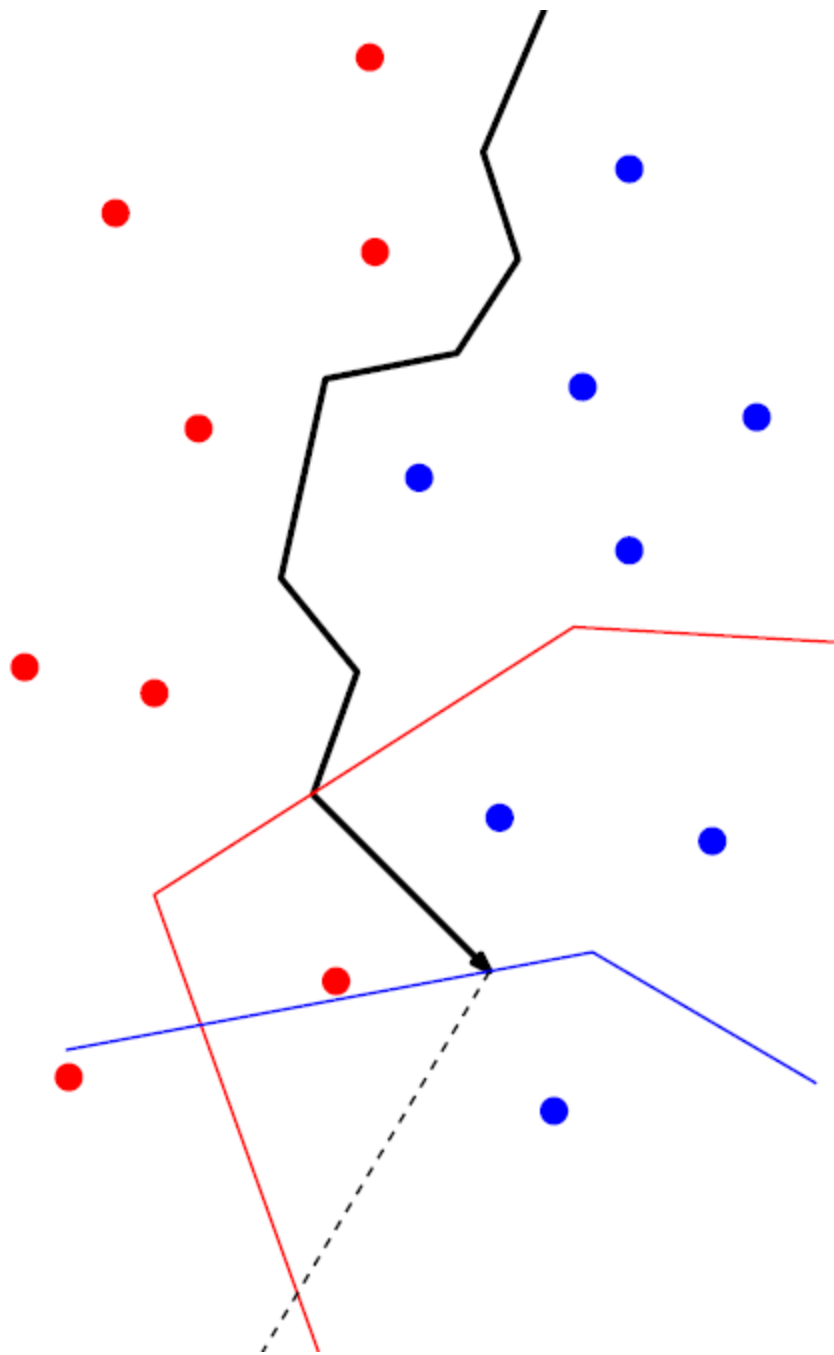


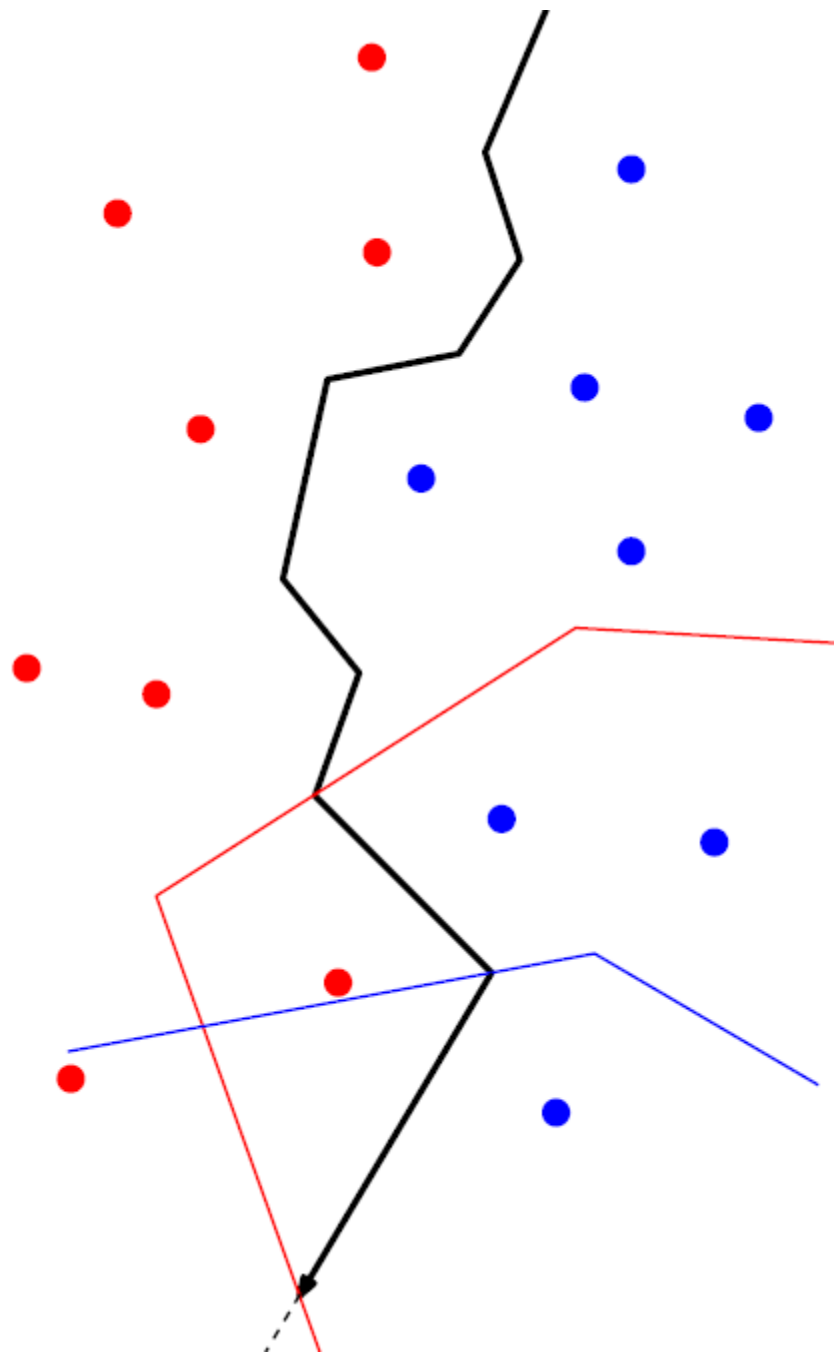


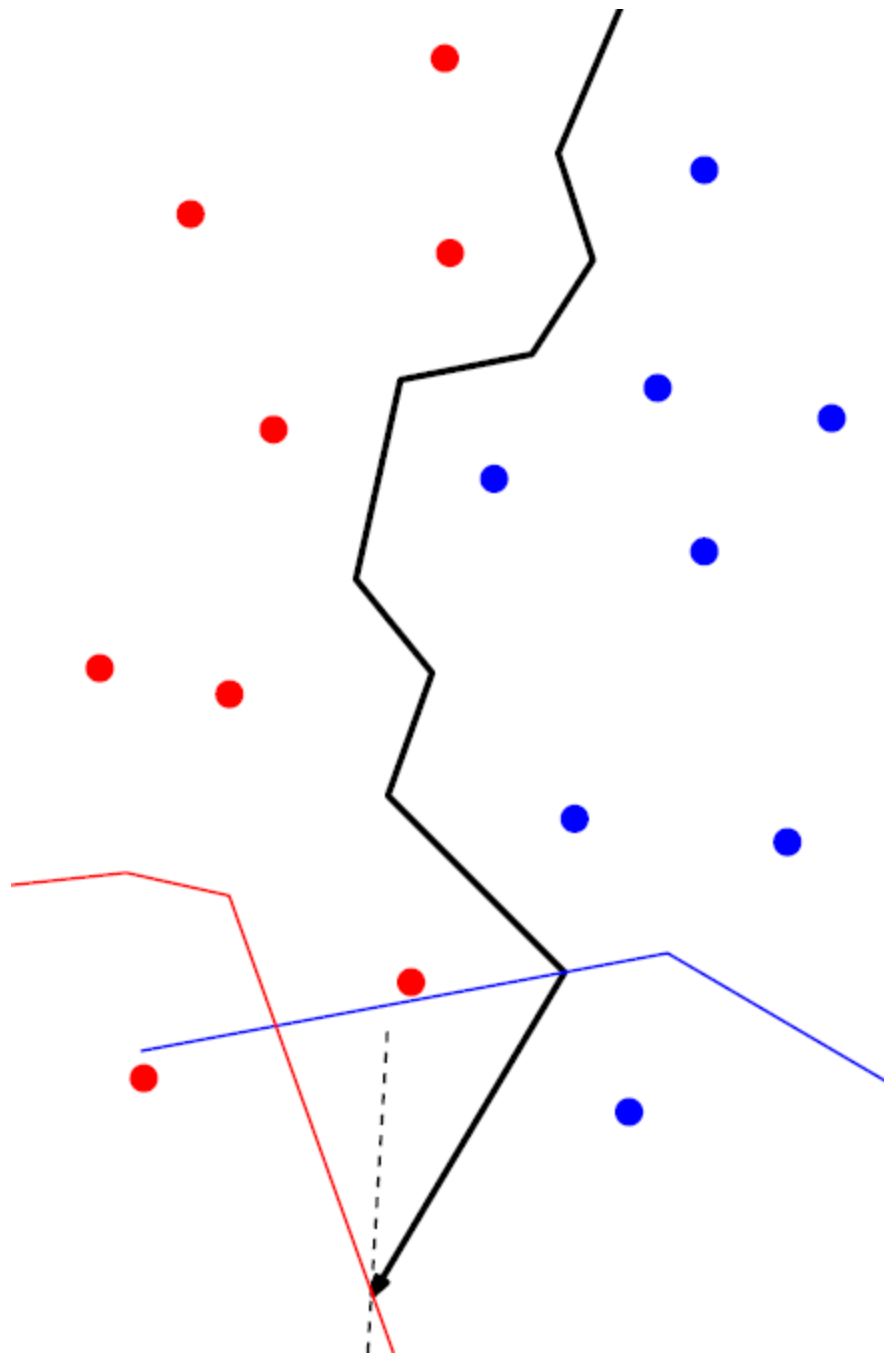


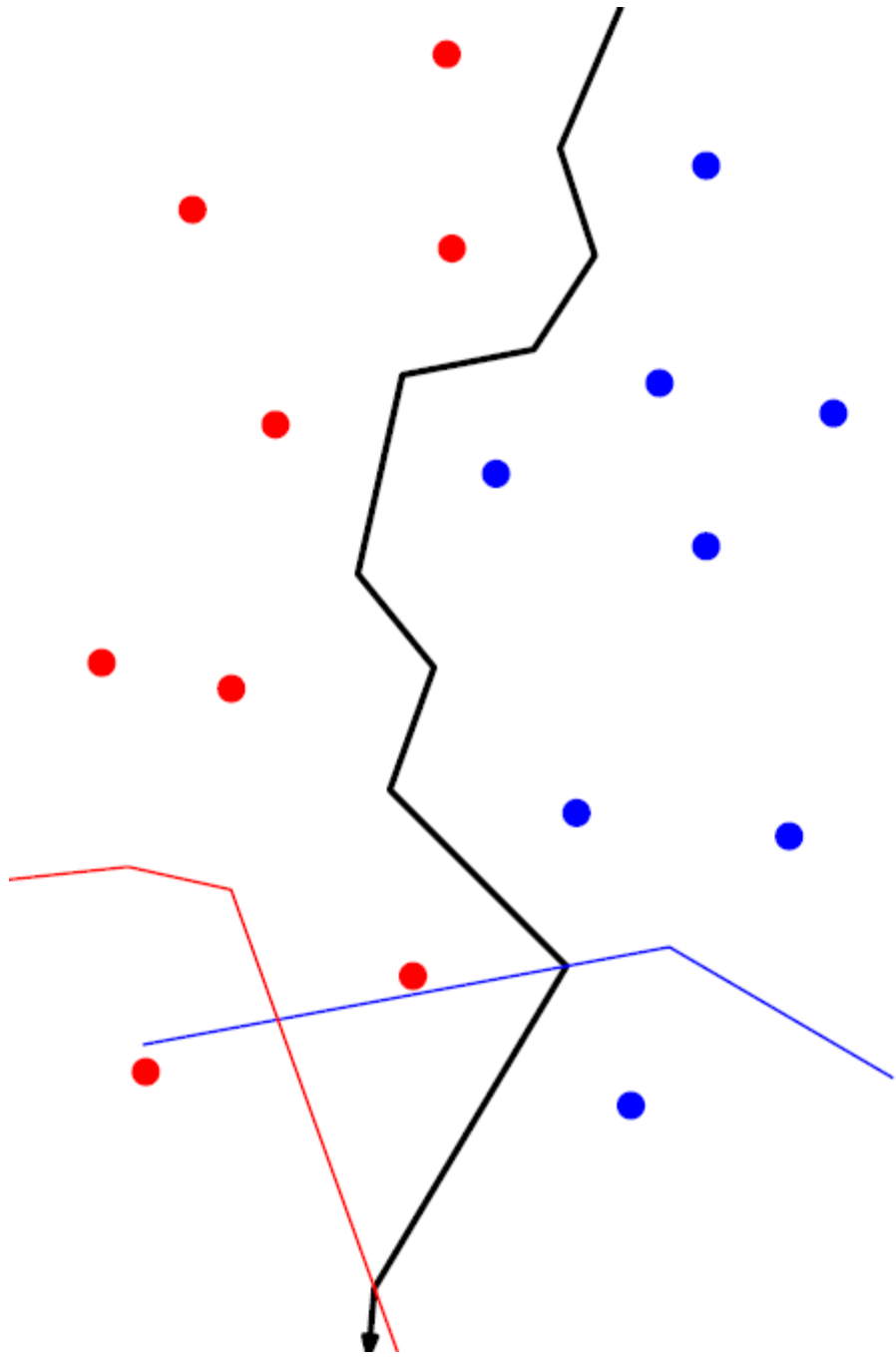


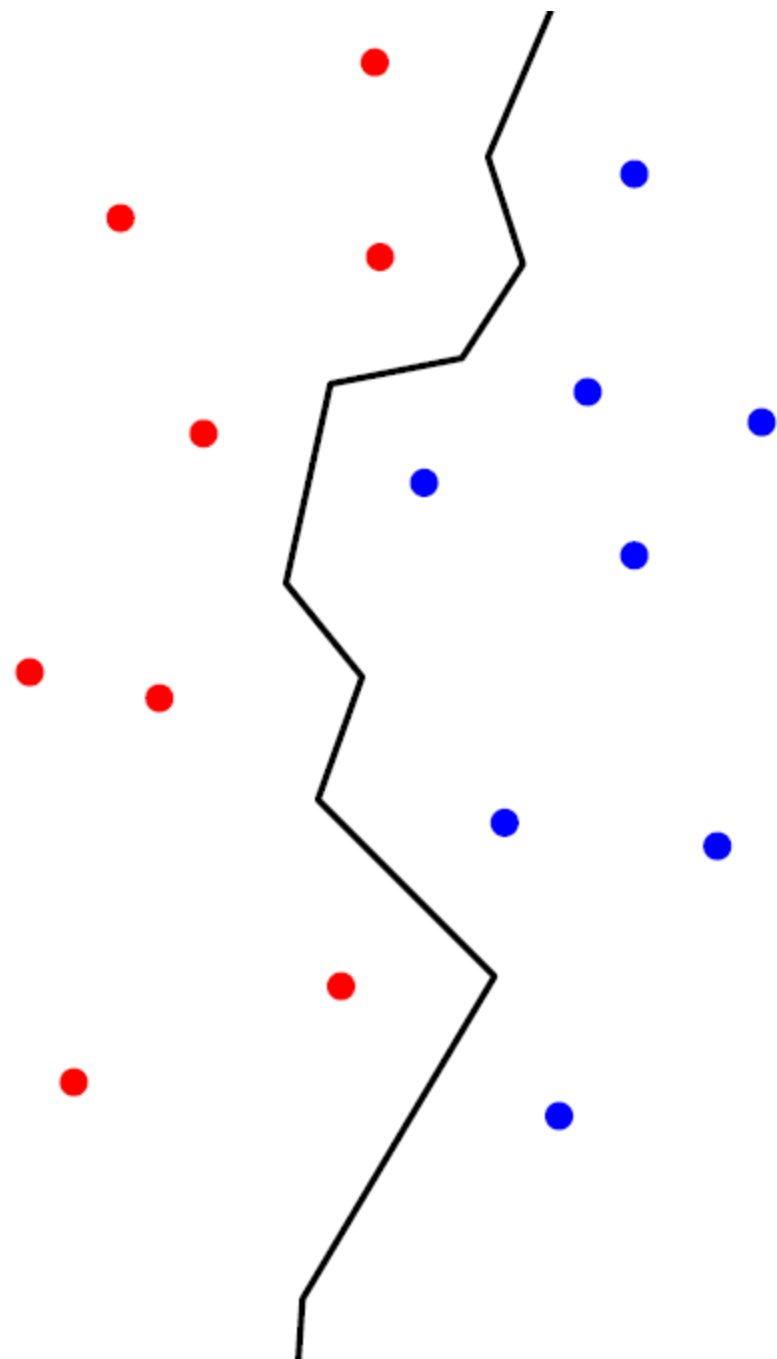












# Sweep line (Fortune's algorithm)

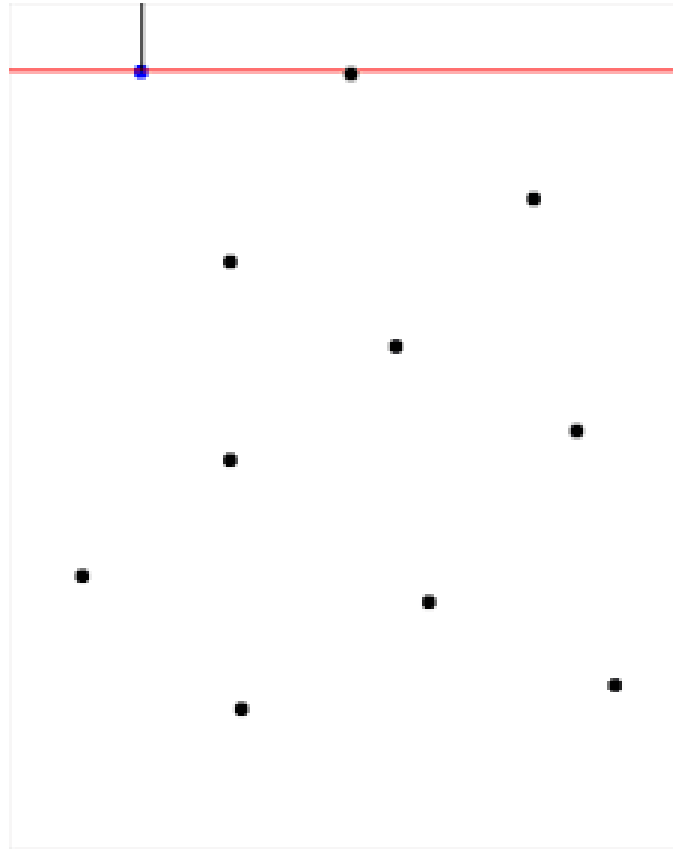
- Algorithm uses so-called „sweep line“ and „beach line“, both of them traversing the space containing the input points
- The sweep line can be horizontal or vertical, heading from top to bottom or vice versa
- Invariant of the algorithm = for the input points already traversed by the sweep line we have already a correct VD constructed, the rest of the points was not processed yet

# Sweep line (Fortune's algorithm)

- „Beach line“ is not in fact a line but a curve above the sweep line, consisting of parts of parabolas
- A set of all points being closer to some of the points above the sweep line than to the sweep line itself is delineated by parabolic arcs – their connection forms the beach line



# Sweep line (Fortune's algorithm)



# Sweep line (Fortune's algorithm)

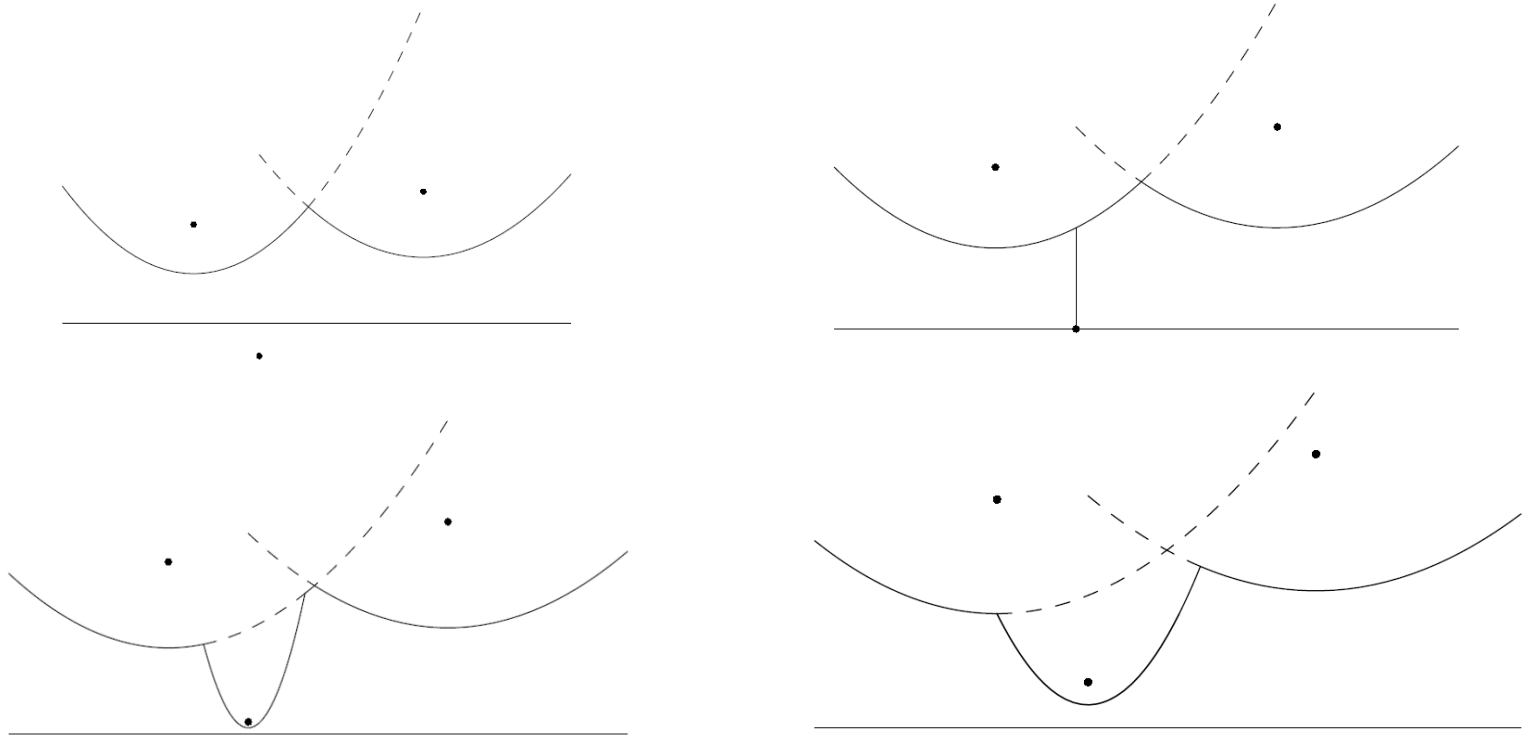
- The intersection of arcs lying on the beach line lie on the edges of the VD. With moving the sweep line, these intersections create the edges of VD  $\text{Vor}(P)$
- The algorithm contains the following two operations:

# Sweep line (Fortune's algorithm)

- **Site event** – a new generating point emerges on the beach line, we have to add it to the VD structure
- **Circle event** – when one of the parabolic arcs is terminated

# Site event

- This event generates a new parabolic arc on the beach line and its intersection with the current beach line starts to create a new VD edge



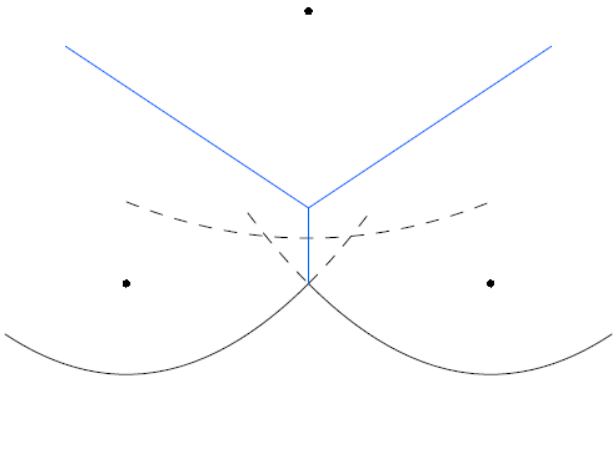
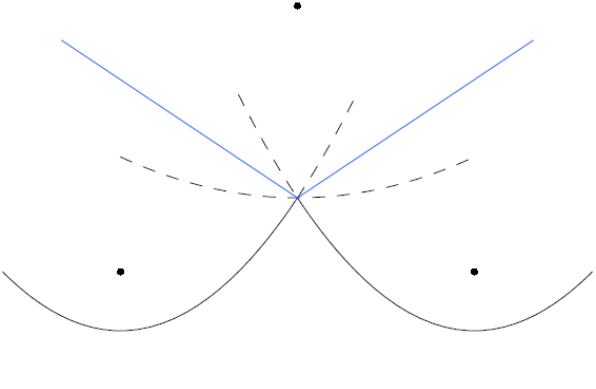
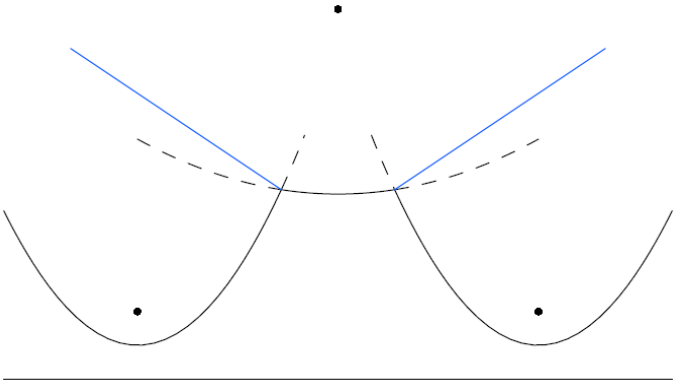
# Site event

- Beach line consists of maximally  $2n - 1$  parabolic arcs, because each generating point creates one parabola and divides maximally one existing parabolic arc to two parts

# Circle event

- When some of the parabolic arcs is terminated
- This happens when three parabolas generated by points  $P_i$ ,  $P_j$ ,  $P_k$  all intersect in point  $Q$  – then this point  $Q$  forms the new Voronoi vertex

# Circle event



# Sweep line (Fortune's algorithm)

- More information, details for implementation:
  - <http://blog.ivank.net/fortunes-algorithm-and-implementation.html>



# Weighted Voronoi diagrams

- One of possible generalizations of VD, when each generating point is assigned to a weight. This weight influences the size and shape of the VD cell.
- Let's assign weight  $w_i \in R$  to point  $P_i$ . Then we define the corresponding metrics as

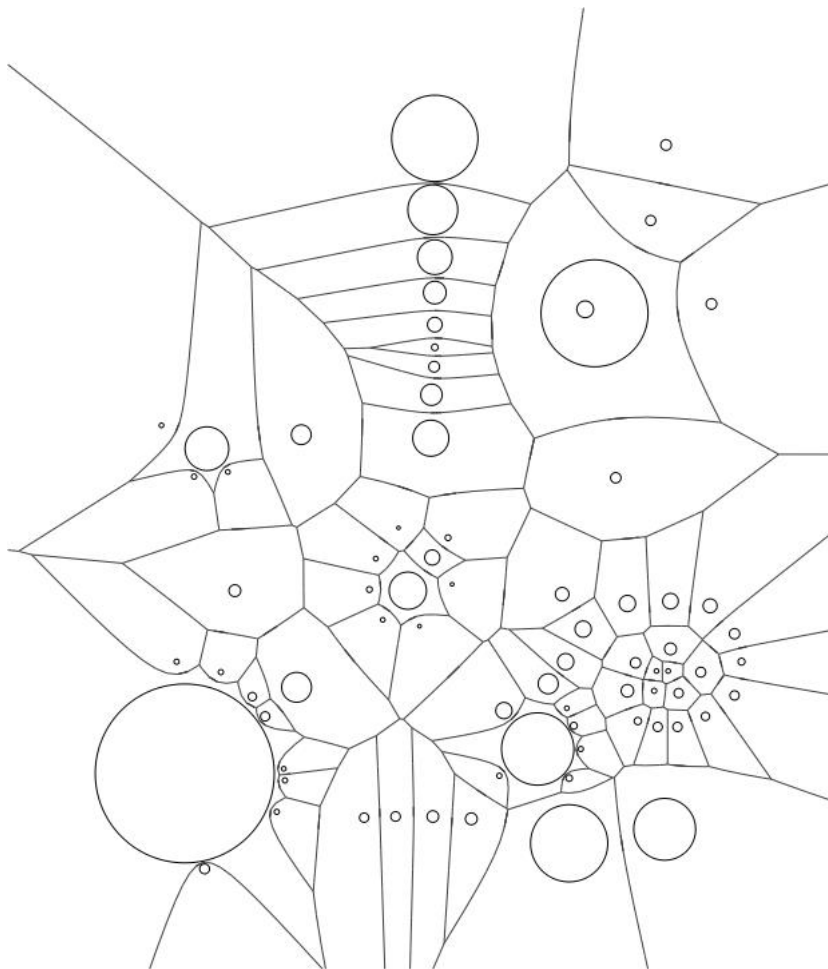
$$\text{dist}_{\text{WVD}}(P, Q) = \text{dist}(P, Q) - w_i$$

where  $\text{dist}$  can be an arbitrary metrics

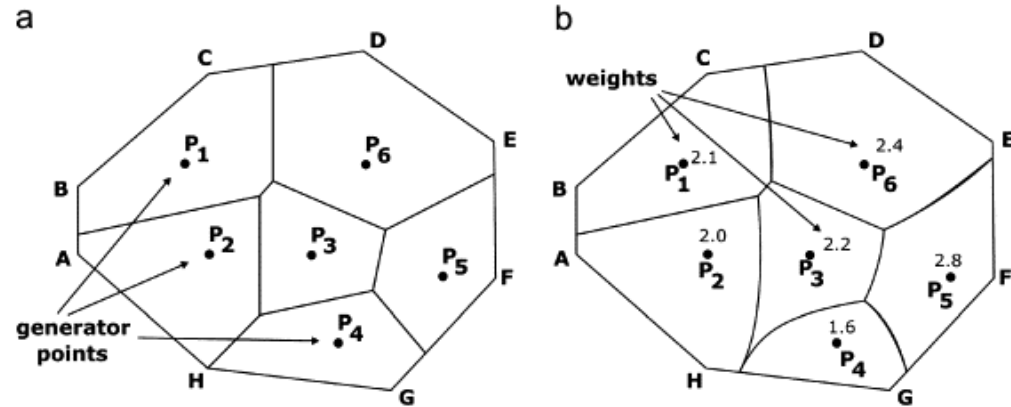
# Weighted Voronoi diagrams

- When increasing the weight of a given point the corresponding VD cell is increasing which correspond to the given metric
- When the dist metric is the Euclidean distance, then  $\text{dist}_{\text{WVD}}(P, P_i)$  can be interpreted as the distance of point  $P$  from a circle with center in  $P_i$  and radius  $w_i$
- Voronoi edges are in this case parts of hyperbolas

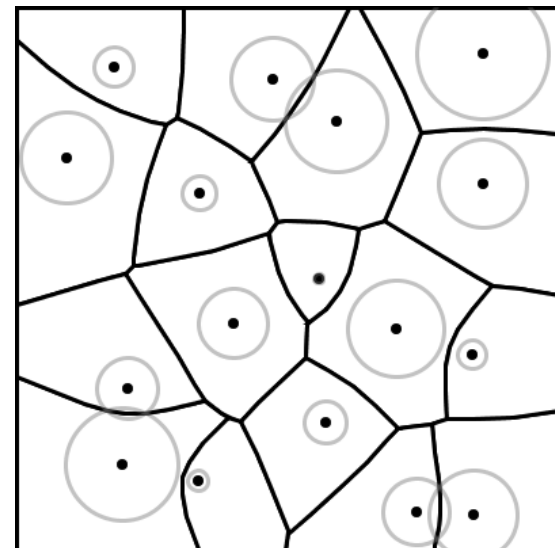
# Weighted Voronoi diagrams



[www.cgal.org](http://www.cgal.org)



[www.sciencedirect.com](http://www.sciencedirect.com)



[d.hatena.ne.jp](http://d.hatena.ne.jp)

# Assignment

- Use the already constructed Delaunay triangulation for the construction of Voronoi diagram
- Visualize it

