# Lecture Notes: Minimum Enclosing Disc

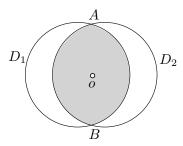
Yufei Tao Department of Computer Science and Engineering Chinese University of Hong Kong taoyf@cse.cuhk.edu.hk

March 16, 2021

Let P be a set of n points in  $\mathbb{R}^2$ . We want to find a disc D with the smallest radius to cover all the points in P. We refer to D as the *minimum enclosing disc* (MED) of P and denote it as med(P). The lemma below explains why calling D the MED is appropriate.

**Lemma 1.** There is only one disc with the smallest radius covering all the points in P.

*Proof.* Assume, on the contrary, that there are two such discs  $D_1$  and  $D_2$ ; see the figure below. Then, P must be covered by the shaded area. Let A and B the intersection points of the two discs. Consider the disc D centering at the midpoint o of the segment AB and having a radius equal to the length of segment oA. D covers the shaded area (and hence, also P) but is smaller than  $D_1$  and  $D_2$ , giving a contradiction.



Today we will learn a randomized algorithm for solving the problem in O(n) expected time. As we will see, this is another beautiful application of backward analysis.

# 1 Geometric Facts

**Lemma 2.** The boundary of med(P) passes at least two points of P.

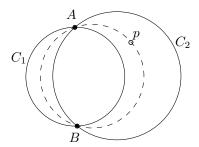
*Proof.* Let C be the boundary of med(P). If C passes no points of P, shrink C infinitesimally to obtain a smaller disc still covering P, which contradicts the definition of C.

Suppose that C passes only one point  $p \in P$ . Let o be the center of C. Consider sliding a point o' from o towards p infinitesimally, and look at the circle C' centered at o' with radius equal to the length of segment o'p. C' is smaller than C but still contains P in the interior. This is also a contradiction.

The following geometric fact will be useful:

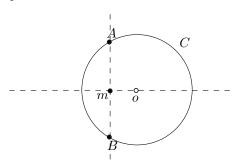
**Lemma 3.** Let  $C_1$  and  $C_2$  be two intersecting circles such that the radius of  $C_2$  is larger than or equal to that of  $C_1$ . Let  $\alpha$  be the area inside both circles. Let p be an arbitrary point that is in  $C_2$  but not in  $C_1$ . Then, there exists a circle C that is smaller than  $C_2$ , passes p, and contains the area  $\alpha$ .

The figure belows gives an illustration of the lemma, where C is the circle in dash line.



*Proof.* The lemma can be proved using basic geometry. We give only a sketch here (the complete proof is tedious and rudimentary).

Let us first discuss a relevant fact. Fix two distinct points A, B. Consider all the circles passing both A and B. The centers of these circles must be on the perpendicular bisector of segment AB. Every such circle C can be divided into (i) a left arc, which is the part of C on the left of segment AB, and (ii) a right arc, which is the part of C on the right. As the center o of C moves away from the midpoint m of segment AB towards right, the left arc "sweeps" towards segment AB, while the right arc "sweeps" away from the segment; furthermore, C grows continuously. The behavior is symmetric when o moves away from m towards left.



Going back to the context of the lemma, let A and B be the intersection points of  $C_1$  and  $C_2$ . Imagine morphing a circle C from  $C_2$  to  $C_1$  while making sure that C passes A and B. Stop as soon as the right arc of C hits p. This is the circle we are looking for.

### 2 Two Points Are Known

Let us first look at a variant of the MED problem. Let  $p_1, p_2$  be two points in P such that there is at least one disc which has  $p_1, p_2$  on the boundary and covers the entire P. We want to find the smallest such disc, denoted as  $med(P, \{p_1, p_2\})$ . Algorithm 1 presents our solution in pseudocode. Its running time is clearly O(n). To prove its correctness, it suffices to show:

**Lemma 4.** Define, for each  $i \in [1, n]$ ,  $P_i = \{p_1, ..., p_i\}$ . For  $i \geq 3$ , let  $D = med(P_{i-1}, \{p_1, p_2\})$ . If  $p_i$  is not covered by D, then the boundary of  $med(P_i, \{p_1, p_2\})$  must pass  $p_i$ .

# **Algorithm 1:** Two-Points-Fixed-MED $(P, \{p_1, p_2\})$

```
/* suppose P = \{p_1, p_2, ..., p_n\} */

1 D \leftarrow the smallest disc covering p_1, p_2

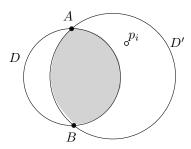
2 for i = 3 to n do

3 | if p_i not in D then

4 | D \leftarrow the disc whose boundary passes p_1, p_2, p_i

5 return C
```

Proof. Let  $D' = med(P_i, \{p_1, p_2\})$ . Assume on the contrary that the boundary of D' does not pass  $p_i$ . Hence,  $p_i$  falls inside D'; see the figure below. The radius of D' cannot be smaller than that of D because the latter was the MED on  $P_{i-1}$  whereas D' is just one disc covering  $P_{i-1}$ . The entire  $P_{i-1}$  must fall in the shaded area. By Lemma 3, there exists a disc smaller than D' covering  $P_i$ , giving a contradiction.



#### 3 One Point Is Known

Next, we will generalize the two-points-fixed problem a bit. Let  $p_1$  be a point in P such that there is at least one disc covering P whose boundary passes  $p_1$ . We want to find the smallest such circle, denoted as  $med(P, \{p_1\})$ .

```
Algorithm 2: One-Point-Fixed-MED(P, \{p_1\})
```

```
/* suppose P = \{p_1, p_2, ..., p_n\}

1 randomly permute p_2, ..., p_n

2 D \leftarrow the smallest disc covering p_1, p_2

3 for i = 3 to n do

4 | if p_i not in D then

5 | D \leftarrow Two-Points-Fixed-MED(\{p_1, ..., p_i\}, \{p_1, p_i\})

6 return D
```

The algorithm's correctness is ensured by:

**Lemma 5.** For  $i \geq 3$ , let  $D = med(P_{i-1}, \{p_1\})$ . If  $p_i$  is not covered by D, then the boundary of  $med(P_i, \{p_1\})$  must pass  $p_i$ .

*Proof.* Left as an exercise.

Let us analyze the running time of the algorithm. Let  $t_i$  be the expected running time of the for-loop (Lines 3-5) for a specific i. Thus, the total expected running time is  $O(\sum_{i=3}^n \mathbf{E}[t_i])$ . Now, focus on  $t_i$  for a specific i. Set  $D = med(P_i, \{p_1\})$ . We know that, besides  $p_1$ , the boundary of D is determined by at most 2 other points in P— let them be  $\pi_1, \pi_2$  (if the boundary passes more than 2 points of P other than  $p_1$ , set  $\pi_1, \pi_2$  to 2 arbitrary points of them). Hence, if  $p_i \neq \pi_1$  and  $p_i \neq \pi_2$ , then  $t_i = O(1)$ ; otherwise,  $t_i = O(i)$  (Lemma 4). Standard backward analysis shows that  $\mathbf{E}[t_i] \leq \frac{2}{i-1}O(i) + O(1) = O(1)$ . Therefore, the expected running time of Algorithm 2 is O(n), which subsumes the time of random permutation at Line 1.

## 4 No Point Is Known

We are ready to tackle the MED problem in its most general form:

```
Algorithm 3: MED(P)

/* suppose P = \{p_1, p_2, ..., p_n\}

1 randomly permute p_1, ..., p_n

2 D \leftarrow the smallest disc covering p_1, p_2

3 for i = 3 to n do

4 | if p_i not in D then

5 | D \leftarrow One-Point-Fixed-MED(\{p_1, ..., p_i\}, \{p_i\})

6 return C
```

**Lemma 6.** For  $i \geq 3$ , let  $D = med(P_{i-1})$ . If  $p_i$  is not covered by D, then the boundary of  $med(P_i)$  passes  $p_i$ .

*Proof.* Left as an exercise.  $\Box$ 

We can once again apply backward analysis to prove that Algorithm 3 runs in O(n) expected time. The details are left as an exercise.