

# Divide and Conquer

# Find closest pair of points given a set of points

- The problem statement: Given  $n$  points in the plane, find the pair that is closest together.
- Let us denote the set of points by  $P = \{p_1, \dots, p_n\}$ , where  $p_i$  has coordinates  $(x_i, y_i)$ ; and for two points  $p_i, p_j \in P$ , we use  $d(p_i, p_j)$  to denote the standard Euclidean distance between them.
- Our goal is to find a pair of points  $p_i, p_j$  that minimizes  $d(p_i, p_j)$ .

## **Brute force method:**

Try every pair  $(p_i, p_j)$  and report minimum

Complexity:  $O(n^2)$

# Studying One Dimensional problem first..

- A point  $p$  is given by  $x$  coordinate  $x_p$  only
- $d(p_i, p_j) = |p_j - p_i|$
- Given  $n$  points  $(p_1, p_2, \dots, p_n)$ , how to find closest pair
- Sort the points (Complexity —  $O(n \log n)$ )
- Compute minimum separation between adjacent points after sorting
- We can walk through the sorted list, computing the distance from each point to the one that comes after it. We can pick the minimum out of these.
- Complexity of finding minimum distance after sorting is  $:O(n)$
- Overall complexity:  $O(n \log n)$

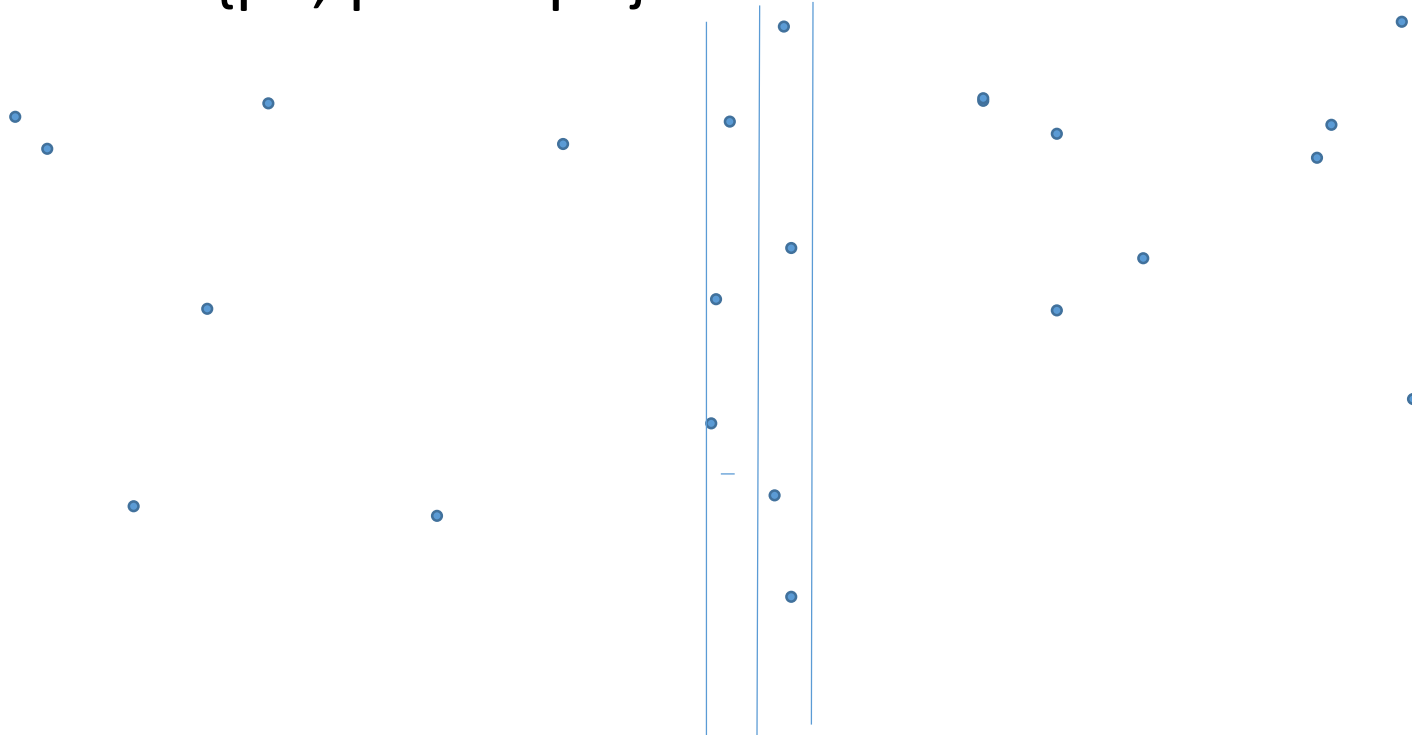
# 2 dimensional, Using Divide and conquer

## **Divide and Conquer algorithm:**

- Split set of points into two halves by vertical line
- Recursively compute closest pair in the left and right half
- Also compute closest pairs across separating line
- How can we do this efficiently?

# Cont....

Set of points =  $\{p_1, p_2, \dots, p_n\}$



# How do we split?

Given  $n$  points  $P = \{p_1, \dots, p_n\}$ , we compute:

- $P_x$ ,  $P$  sorted by  $x$  co-ordinate
- $P_y$ ,  $P$  sorted by  $y$  co-ordinate
- Divide  $P$  by vertical line into two equal sets  $Q$  and  $R$
- Vertical line will be at the mid point of  $P_x$ , so we take median of  $x$ -coordinates and that divides points into half
- So we have  $Q$  and  $R$  separately each of size  $n/2$

# Building up the recursion...

- For recursive calls, we have Q and R and we have to have Qx and Qy, Rx and Ry
- Finding Qx and Rx is easy but Qy and Ry is not so straight forward
- Qx is first half of Px and Rx is second half of Px
- To find Qy, we will scan R and all the points having  $x < x_q$  are put in Qy and others in Ry.
- ***Note: Px is sorted on x axis and Py is sorted on y-axis***
- This can be done in linear time

# Related Theorems

Th1: If there exists  $q \in Q$  and  $r \in R$  for which  $\text{dist}(q,r) < d$  then each of  $q$  and  $r$  lies within a distance of  $d$  of  $L$  (separating line of  $Q$  and  $R$ )

Th2: If  $s$  and  $s' \in S$  and have the property that  $\text{dist}(s,s') < d$ , then  $s$  and  $s'$  are within 15 positions of each other in the sorted list  $S_y$ .

$S$ : Set of points in the band ' $d$ ' of separating line of  $Q$  and  $R$

$S_y$ : The list consisting of the points in  $S$  sorted by increasing  $y$ -coordinate



## Cont...

- Suppose  $d = \min(d_1, d_2)$  where  $d_1$  = minimum distance in left partition and  $d_2$  = minimum distance in right partition
- Now we have to examine the points across the separating line
- What are the candidate points (one from left and one from right) which can have distance less than  $d$ ?
- All the points have to be within the distance  $d$  from the dividing line
- But do we have to consider all the points in that distance? (in the worst case all  $n/2$  points may lie there)

# Claim...

- Suppose we sort according to y-coordinate for all those points which are in the band of separating lines at distance  $d$  then

If points are arranged in sorted order of y-coordinate like ...

Sorted list  $L = P'_1, P'_2, P'_3, \dots, P'_{30}$  then

For every point  $P'_i$ , we need to calculate its distance with the next 7 consecutive points in list  $L$  and if there exist any two points having distance less than  $d$ , it will be found within this window only.

Hence: the complexity of finding two points in the band of separating line is  $7 * O(n)$  or we can say  $O(n)$

# Explanation..

- Actually for a point  $p$  in the band of separating line of left half, we can draw two squares of depth  $d$ , one below the point  $p$  along  $y$  axis and another above the point  $p$  along the  $y$ -axis
- Let us examine it for one point in the left band of separating line
- Suppose point is  $p_{\text{left}}$  and now with how many points in right band we need to calculate the distance for this point such that there are chances that the distance is less than  $d$
- Let us draw a square of length  $d$  first
- Now in this square how many relevant points can be there...

## Cont...

- Let us see how many points can be within each square:
- If we divide a square into 4 parts then the length of diagonal of each will be  $d/\sqrt{2}$  which is less than  $d$
- So there can be at most four points which will have distance more than  $d/2$  or equal to.
- Pigeonhole principle can be applied here. If there is any 5<sup>th</sup> point in this square then it will lie in one of the smaller squares of size  $n/2$  only and then the distance between two points will be less than  $d$  which is contradiction to our assumption.

## Cont..

- Hence, if we take any point in the left band of depth  $d$ , we have to take points bottom to top from that point.
- For this we have to maintain a sliding window and check points in that window
- So if we sort the points in that band by  $y$ -axis then we can look at each point in the direction of window and then correspondingly move the window up
- This takes linear time
- Also we have to check maximum 8 points for distance

## Cont..

- Hence recurrence relation will look like this:
- $T(n) = 2T(n/2) + n \log n$
- This comes out to be of order:  $O(n(\log n)^2)$
- This can be reduced to  $O(n \log n)$  by making the second term of recurrence relation to  $O(n)$ .
- This can be done by pre-sorting the pairs with respect to x and then sorting them with respect to y so that we do not have to sort the points in the band with respect to y axis
- So recurrence relation will look like this:
- $T(n) = 2T(n/2) + O(n)$  giving overall complexity  $O(n \log n)$

# Algorithm...(assume all points are distinct, no two points can lie on same line)

- Split  $X$  into  $XL$  and  $XR$
- Points in  $XL$  have  $x$  co-ordinates less than  $x_{med}$  and  $XR$  contains other points
- Similarly split  $Y$  into  $YL$  and  $YR$
- But  $YL$  contains same points as  $XL$  and  $YR$  contains same points as  $XR$
- Input is divided into  $XL, YL$  and  $XR, YR$
- Recurse on both
- Find  $dL$  and  $dR$  and compute minimum  $d$

## Cont...

- Now we have to check the band of width  $d$  on both sides
- $XL'$ : points from  $XL$  whose  $x$  co-ordinates are  $\geq x_{med}-d$
- $YL'$ : sorted on  $y$ -coordinates but same points as  $XL'$
- $XR'$ : points from  $XL$  whose  $x$  co-ordinates are  $\leq x_{med}+d$
- $YL'$ : sorted on  $y$ -coordinates but same points as  $XR'$
- For each point in  $YL'$  we will find points whose  $y$ -coordinate are in the range  $y'-d$  to  $y'+d$
- Compute distances and take the minimum say  $m$
- Return  $\min(d, m)$



# Recursive calls

- Basic recursive call is  $\text{Closestpair}(P_x, P_y)$
- Set up recursive calls  $\text{Closestpair}(Q_x, Q_y)$  and  $\text{Closestpair}(R_x, R_y)$   
(recursive call for left half and right half of  $P$ )  
(complexity  $= O(n)$ )
- How to combine these