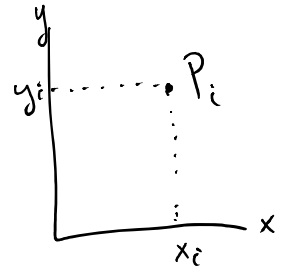


# Quiz

- How are you feeling about proofs
  - Cumulative
  - What do you think will be on quiz?
  - How to practice (\*not study\*)
- ← PS1 and earlier Problems from class
- binary search
  - Merge sort
  - Codingbat



## Closest Pair Problem:

Distance between 2 points:

$P_1(x_1, y_1)$     $P_2(x_2, y_2)$

$P_3(x_3, y_3)$

$$d(P_i, P_j) = \sqrt{(x_i - x_j)^2 + (y_i - y_j)^2}$$

Input: Array containing locations of n points (unique x,y coordinates)

Output: Closest pair of points

## Applications:

- Air traffic control
- Robotics
- Detecting repeated sequences of DNA
- Creating 3-D images out of stereo images (matching regions that are the same)
- Geography Info Systems: detect doubled boundaries

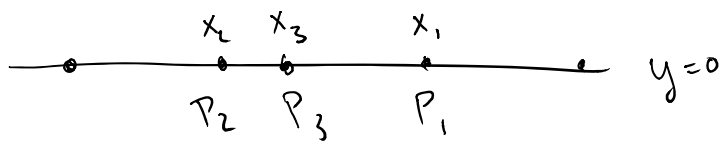
Q. What is the runtime of an exhaustive search algorithm for closest pair on n points?

A)  $O(\sqrt{n})$     $O(n)$     $O(n^2)$     $O(2^n)$

↳ Need to check each pair.  $\binom{n}{2} = O(n^2)$  pairs. Calculating distance for each pair is  $O(1)$ .

Q. Suppose the points are on a line:

Given array:  $\begin{bmatrix} x_1 \\ x_2 \\ x_3 \end{bmatrix}$



• Design an  $O(n \log n)$  algorithm to find the closest distance

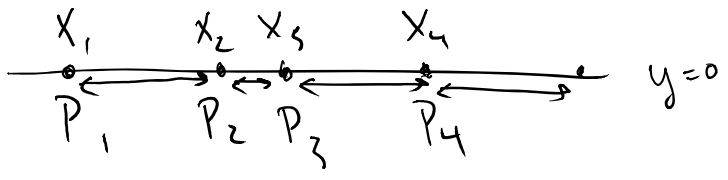
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1. Sort  $\leftarrow O(n \log n)$ 
2.  $\text{minDist} = \infty$ 
   for  $i = 1$  to  $n-1$ 
     if  $(x_{i+1} - x_i) < \text{minDist}$ 
        $\text{minDist} = x_{i+1} - x_i$ 

```

$\left. \begin{matrix} O(n \log n) \\ O(n) \end{matrix} \right\} O(n \log n)$

||  
Loop over sorted points, check distance only between adjacent points. Return min distance found.



\* Closest pair is adjacent... why?

\* Naive still uses  $O(n^2)$ , if try to check all pairs

What if sort along X axis, Y axis?

• pts are closest, but are not consecutive if sort by X or Y coordinate

## Algorithm Sketch

1. Sort points by X coordinate

2. Divide: Split X into left half + right half



3. Conquer: Find closest distance in each of L, R

Q: What size set of points should trigger base case of recursive algorithm?

A) 0

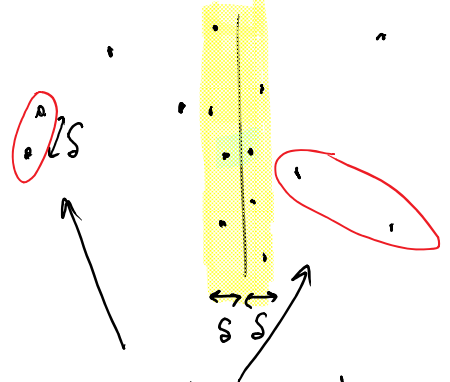
B) 1

C)  $\leq 2$

D)  $\leq 3$

Otherwise: 3 gets split into 2 and 1.  
Can't compare one point to itself

### 4. Combine:

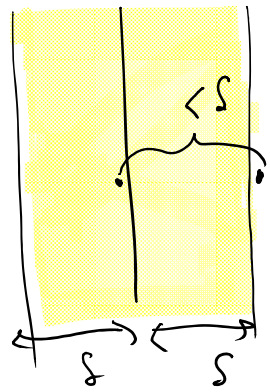


If overall closest pair is on either side ☺. But in trouble if closest pair crosses ☹

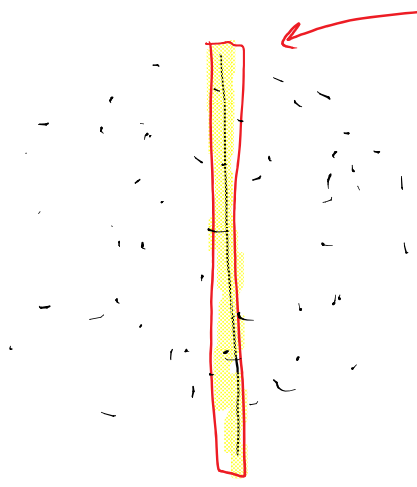
Let  $S$  be  $\min\{CP(L), CP(R)\}$

Claim ★: Only need to look  $1$ -region within  $S$  of line

Otherwise: contradiction



not closest pair!



If squint, looks like points on a line!

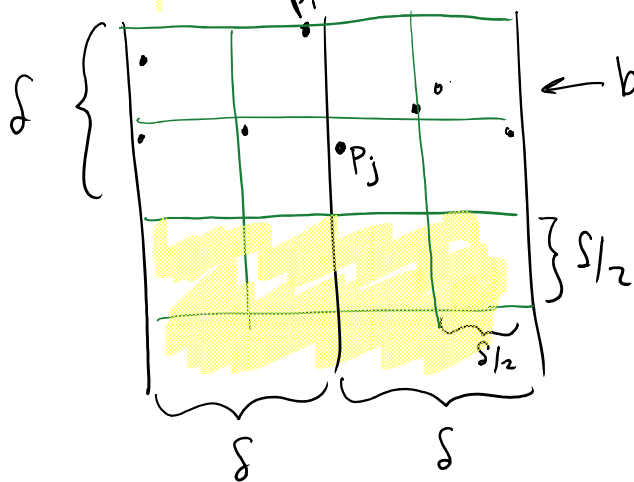
1. Sort
2. For-loop to look at nearest neighbors

Let

- $Y_S$  be array of points, within  $S$  of midline line, sorted by  $y$ -coordinate
- $p_i$  be  $i^{\text{th}}$  smallest of  $Y_S$

Claim ♡: If  $d(p_i, p_j) < S$ , then  $|i - j| \leq 7$

Proof: Imagine dividing into squares of  $\frac{S}{2} \times \frac{S}{2}$ , starting at  $p_i$

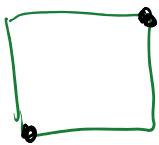


← boxes where  $p_j$  might be

\*  $p_j$  can't be more than 2 rows of boxes down. Otherwise  $d(p_i, p_j) > S$ , a contradiction

NOTE: there is  $\leq 1$  pt in each square

For contradiction, suppose 2 pts in square:



Largest distance when on opposite corners. Then have distance  $\sqrt{(\frac{S}{2})^2 + (\frac{S}{2})^2} = \frac{S}{\sqrt{2}} < S$ .

But each box is in L or R region, so 2 points must have distance  $\geq S$  by inductive assumption. Contradiction!

Therefore, all points with  $y$  coordinate between  $p_i$  and  $p_j$  must be in one of these boxes, and there can only be 6 other points, so  $|i - j| \leq 7$

Alg Sketch

1. Base case (2 or 3 pts): Brute force
2. Otherwise, Divide L & R, conquer let  $\delta$  be smaller distance returned.
3. Create  $Y_\delta$  (sorted list of pts w/in  $\delta$  of midline) and loop over pts, checking distance between each point and the next 7 pts, let  $\delta'$  be smallest distance found in this step
4. Return  $\min\{\delta, \delta'\}$ .

Proof of Correctness Sketch

We will prove correctness using strong induction on  $n$ , the # of points

Base case: If  $n=2$  or  $3$ , brute force search is correct.

Inductive step: Assume algorithm is correct for  $k$  points, for all  $k$  such that  $n > k \geq 2$ . Thus  $\delta$  is minimum distance between 2 pts in L or R. So only need to check distance between points where one is in L and one is in R.

$\mathbb{P}$  Then Claim  $\star$  and Proof.  $\mathbb{P}$  Then Claim  $\heartsuit$  and Proof

$\mathbb{P}$  Thus step 3 above finds closest pair of points where one is in L and one is in R if such a pair has distance less than  $\delta$ .

$\mathbb{P}$  Thus by strong induction,  $\delta$  or  $\delta'$  is the smallest distance, and the algorithm returns the correct value.