

# DIVIDE + CONQUER: CLOSEST POINTS

## Learning Goals

- Analyze runtime of D&C alg [D&C 1]
- Create a D&C alg [D&C 2]
- Benchmark algorithm with brute force / easier problem
- Build intuition with easier problems
- Analyze ethics of alg using ethical matrix [Eth 1]
- Prove correctness of divide + conquer using strong induction [DC 3]

## Warm-Up

go/cs302 → hand written notes → review <sup>closest pts</sup> proof so far.  
(can use computer)

# CloPts(P)

(P list of 2-D pts,  $|P| \geq 2$ )

// Base Case

1. If  $|P| \leq 3$ :

2. Check distance of each pair + return smallest found

// Divide

3. Sort P by x-coordinate

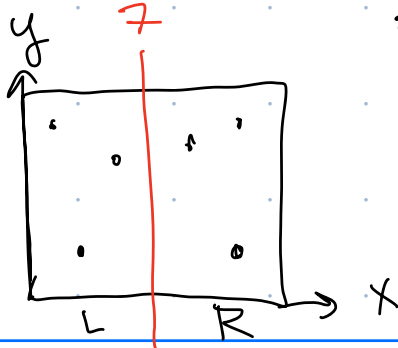
4. midline  $\leftarrow$  x-value between L + R halves

ex

midline  $\leftarrow 7$

(1, 5) | (2, 2) | (4, 0) | (10, 20) | (12, 3) | (20, 6)

L R



We will prove using Strong induction that CloPts(P) correctly returns the distance between the closest points all  $n \geq 2$  where  $n = |P|$ .

(Fill in blanks for other divide + cong.)

Base Case: When  $n = 2$  or  $3$ , the base case of the algorithm correctly finds the smallest distance via brute force in lines 1+2.

Inductive Step: Let  $k \geq 3$  and assume CloPts is correct for all input sizes  $j$  for  $2 \leq j \leq k$ . Consider an input of size  $k+1$ .

// Conquer

$\delta_1 \leftarrow \text{CloPts}(L)$

$\delta_2 \leftarrow \text{CloPts}(R)$

$\delta \leftarrow \min \{ \delta_1, \delta_2 \}$

// Combine

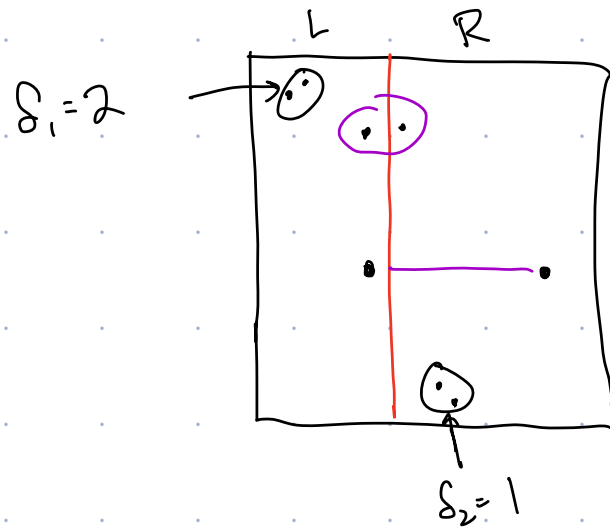
Since  $k+1 \geq 4$ , we skip the base case and go to the divide step. (line 3.)

[Since  $k+1 \geq 4$ , when we divide into  $L + R$ ,  $L, R$  each have at least 2 but less than  $k+1$  pts, so by inductive assumption,  $\text{CloPts}(L)$  and  $\text{CloPts}(R)$  each correctly return the closest distance among their respective points. Thus  $\delta$  contains the smallest distance between points where both pts are to the left of the midline or both are to the right.

Next we need to find if there is a closer pair with one pt in  $L$  and one in  $R$ .

Combine:

Let's think about this:



What points do we need to worry about in combine step?  
Those within

A)  $s/2$  of midline

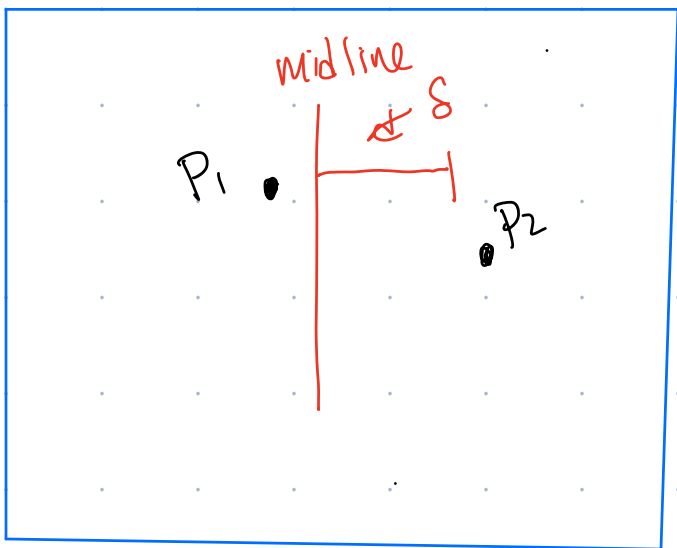
C)  $s$  of midline ~~←~~

B)  $\sqrt{s}$  of midline

D)  $2s$  of midline

// Combine

8.  $Y_\delta \leftarrow$  Pts within  $\delta$  of midline ... sorted by  $y$



However, we only need concern ourselves with pts that are within  $\delta$  (t.b.d) of the midline. To see this, consider  $p_1$  in  $L$ , and  $p_2$  in  $R$ , but at least  $\delta$  away from the midline. Then  $x_1 < \text{midline}$  and  $x_2 > \text{midline} + \delta$ ,

and so

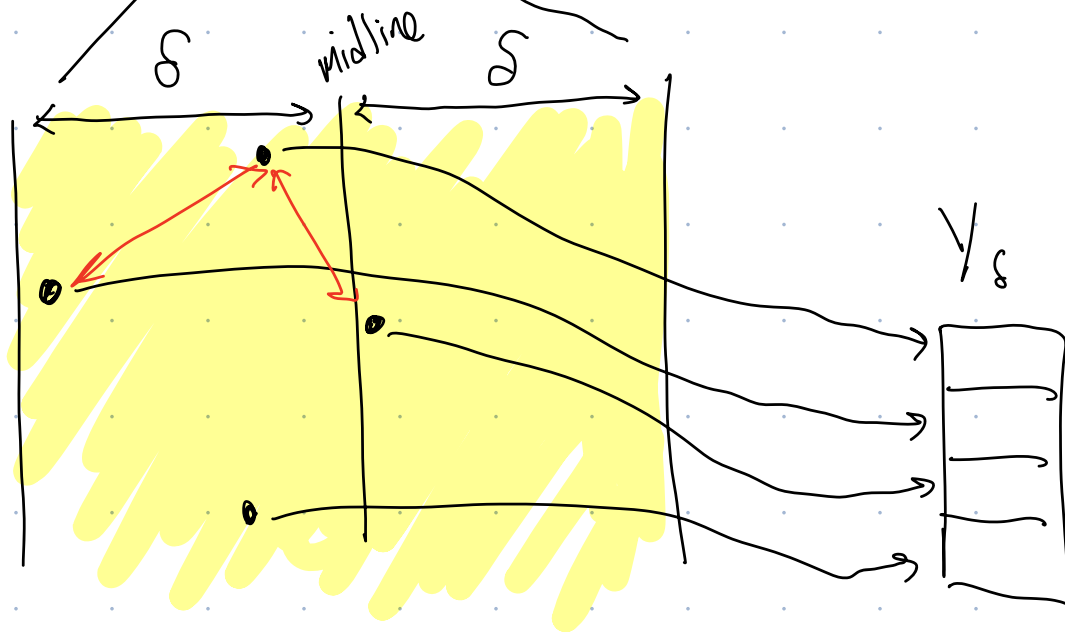
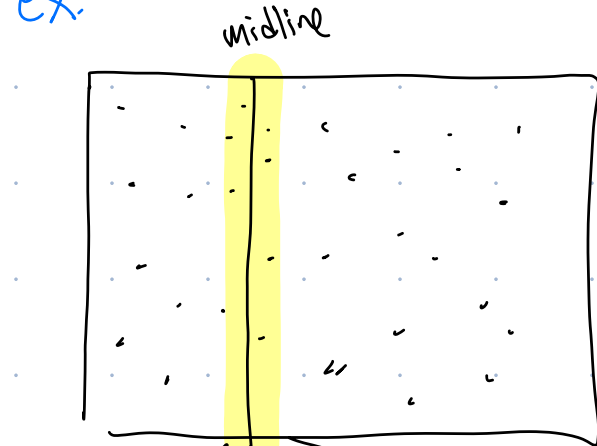
$$\begin{aligned} d(p_1, p_2) &= \sqrt{(x_1 - x_2)^2 + (y_1 - y_2)^2} \\ &\geq \sqrt{(x_1 - x_2)^2} = |x_1 - x_2| \\ &= x_2 - x_1 \\ &> \delta \end{aligned}$$

Thus  $p_1$  and  $p_2$  have distance larger than  $\delta$ , so can not be the closest pair. (A similar

argument holds for pts  
to the left of the midline.)

Therefore, we only need  
consider pts in  $\gamma_S$  as in  
line 8.

ex:



Looks almost 1-D?

Sort by  $y$  and check next pt?

closest pts not adjacent

9 for  $p \in Y_S$ :

10 • Check distance from  $p$  to next 7 pts in  $Y_S$

11 •  $S_{LR} \leftarrow$  Smallest distance found

12 return  $\min\{S, S_{LR}\}$

What goes in blank?

Show can't cram too

many pts near  $p$

because closest pts in  $L_1$

$R$  have distance  $S$

With  $Y_S$  sorted by  $y$ -coordinate, given a pt  $p$  in  $Y_S$ , we will show any pt closer than  $S$  to  $p$  must be within 7 pts of  $p$  in  $Y_S$ . To see this,

imagine placing a grid of  $\frac{S}{2} \times \frac{S}{2}$  boxes

in the region within  $S$

of the midline, starting at pt  $p$ , as in Fig 4.

We will argue by

contradiction that at most

7 pt can be in each box.

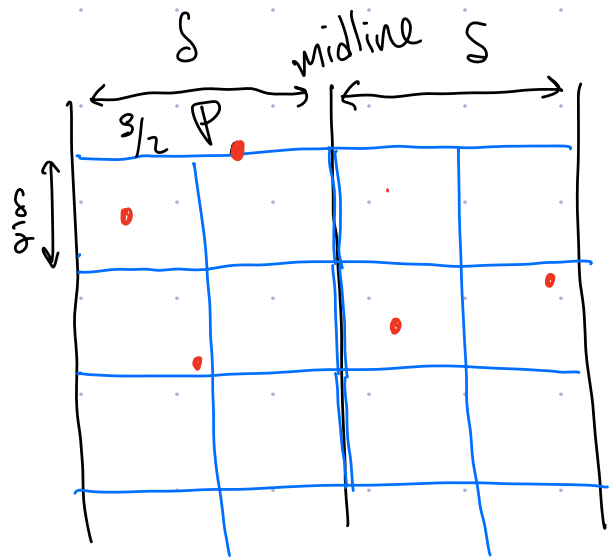


Fig 1: Imagined grid overlaying  $1/8$  starting at  $P$ .

Suppose for contradiction there are 2 pts in a box. Then the distance between pts is

$$d(p_1, p_2) = \sqrt{(x_1 - x_2)^2 + (y_1 - y_2)^2}$$

$$\leq \sqrt{\left(\frac{S}{2}\right)^2 + \left(\frac{S}{2}\right)^2}$$

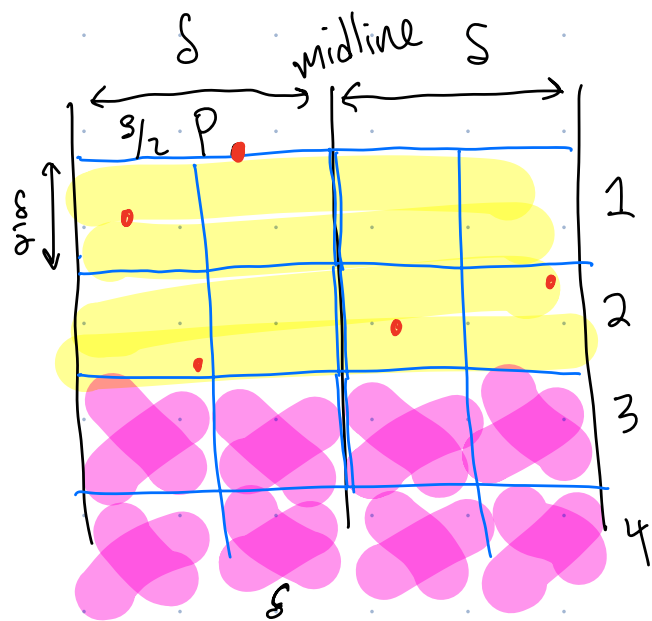
$$= \sqrt{\frac{S^2}{4} + \frac{S^2}{4}}$$

$$= \sqrt{\frac{2S^2}{4}}$$

$$= \frac{S}{\sqrt{2}}$$

$$< S$$

But each box is in  $L$  or  $R$ , so their distance must be at least  $S$ , a contradiction.



Further, we note that only boxes in the two rows immediately below  $p$  can contain a pt. closer than  $S$  to  $p$ , because the  $y$ -coordinate difference to pts in further rows is at least  $S$ .

There are 8 boxes in the first two rows, the points in the first two rows will appear in  $\frac{1}{8}$  before any later points b/c  $\frac{1}{8}$  is sorted by  $y$ , so checking the next 7 pts we will

find a pt closer than  $S$  to  $p$ , if it exists.

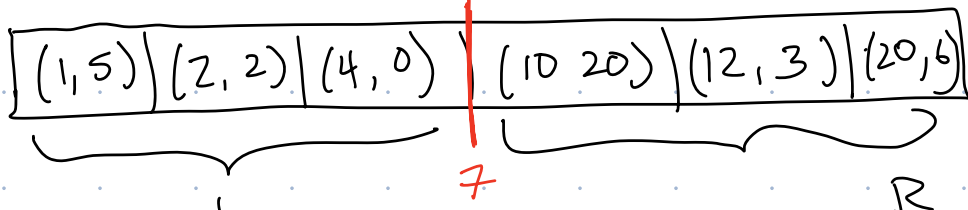
Therefore our combine step will find any pair with distance less than  $\delta$  in  $Y_S$ .

Thus, our algorithm will correctly find the closest distance of any pair.

# CloPts(P) (Divide + Conquer 2D Closest Pts)

Base Case: If  $|P| \leq 3$ , then do brute force

Divide: Sort by X



Divide into L, R by midline

Conquer:

$$S_1 = \text{CloPt}(L)$$

$$S_2 = \text{CloPt}(R)$$

$$S = \min(S_1, S_2)$$

Combine:

$Y_S \leftarrow$  pts w/in  $S$  of midline, sorted by  $y$ -coordinate

for  $p_i \in Y_S$ :  $\leftarrow O(n)$

for  $j \leftarrow i+1$  to  $i+7$ :

if  $d(p_i, p_j) < S$ , then  $S \leftarrow d(p_i, p_j)$

return  $S$

$$T(n) = \begin{cases} O(1) & \text{if } n \leq 3 \\ 2T(\frac{n}{2}) + O(n \log n) & \text{otherwise} \end{cases}$$

$$\hookrightarrow O(n \log^2 n)$$

- Create recurrence relation for runtime.

- Explain why correct
- Q's about correctness

Problem: Sorting at each recursive step takes too long. Pre sort!

PreSort(P)

$X \leftarrow P$  sorted by  $x$

$Y \leftarrow P$  sorted by  $y$

return  $X, Y$

↓  
 $O(n \log n)$

Close Pts (X, Y)

1. If  $|X| \leq 3$ , do Brute Force

2. Divide into  $X_L, Y_L, X_R, Y_R$   $O(n)$

3.  $S = \min \{ \text{Close Pts}(X_L, Y_L), \text{Close Pts}(X_R, Y_R) \}$

4. Create  $Y_S$   $O(n)$

5. For  $p_i \in Y_S$ :

    | For  $j \leftarrow i+1$  to  $i+7$

    | | if  $\text{dist}(p_i, p_j) < S$ ,  $S \leftarrow \text{dist}(p_i, p_j)$   $O(n)$

6. Return  $S$ .

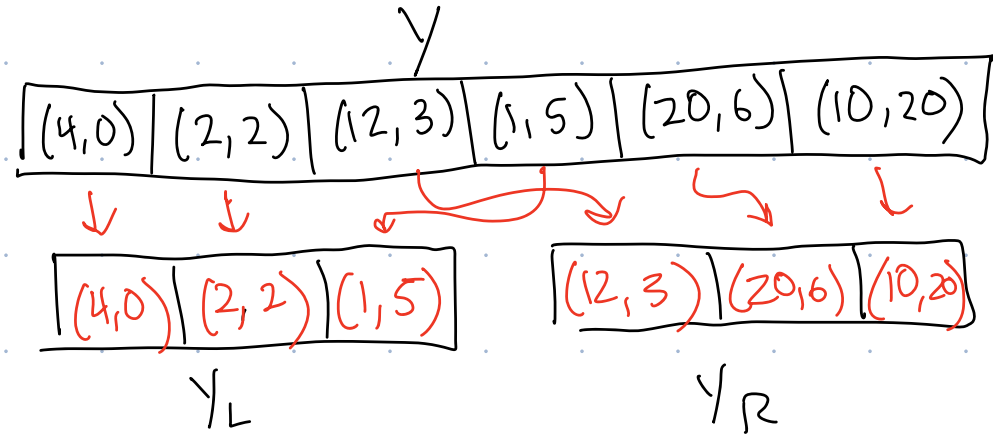
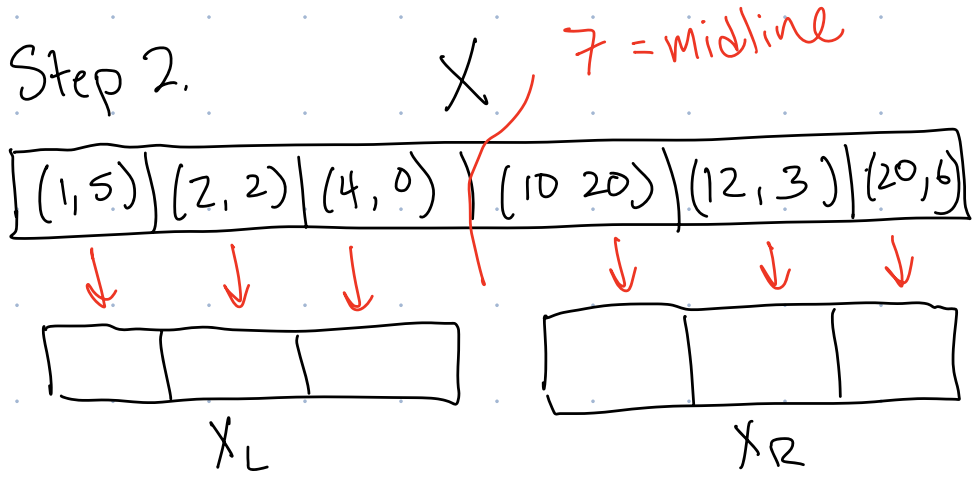
✓  
 $O(n \log n)$  Yay!

$$T(n) = \begin{cases} O(1) & n \leq 3 \\ 2T\left(\frac{n}{2}\right) + O(n) \end{cases}$$

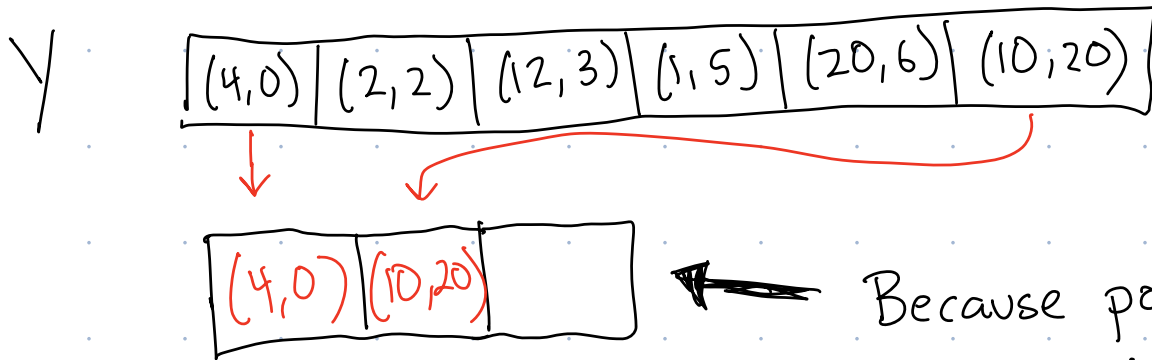
↳  $O(n \log n)$

# Dividing Arrays Efficiently

Step 2.



Step 4:  $S = 4$  want  $x$  from 3 to 11



Because points in L and R are grouped together in one array, until we look at the pt, we don't know if in L or R

- Where did we use our assumption that  $x, y$  points are unique?  
Difficult to divide into  $L$  and  $R$  using  $O(n)$  time.
- You can do Prog. Assign. 1!

Honor Code Conversation!

gen AI

- use to check code / look for error / write tests
- help with explaining error messages
- generating main function
- Syntax
- Data wrangling / IO
- Optimizing, improving existing code

No-ethics

No - copy/paste output, asking for advice before starting  
- use without understanding

# Peers

- Work with others if  
list names (2-4?)
  - Brainstorming
  - Pair Code (alternate  
who's coding)
  - Code review
  - Conceptual problems  
with others

Course Assistants + Shelby  
Readme done on own

Copy? "Write in own words"  
AI?  
Peers?  
Course Assistants?  
Other resources?  
Me?

OK