

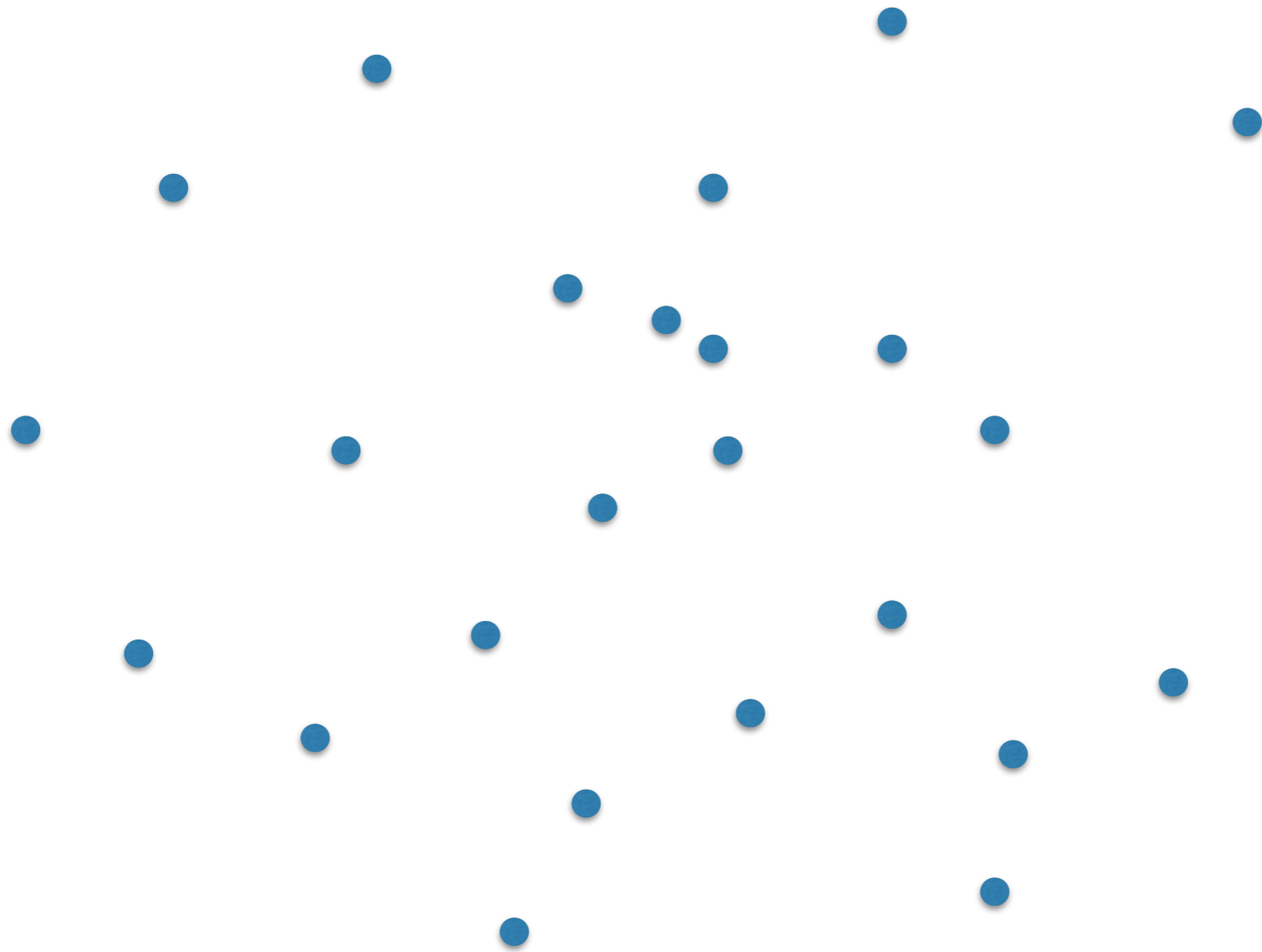


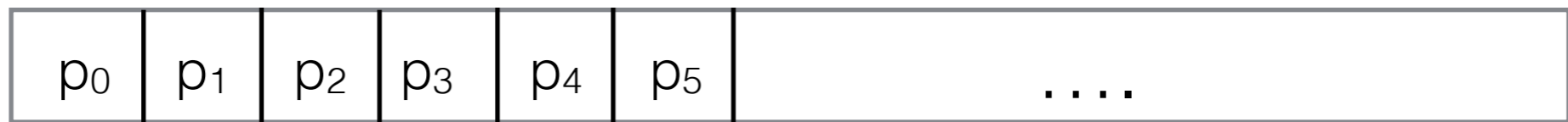
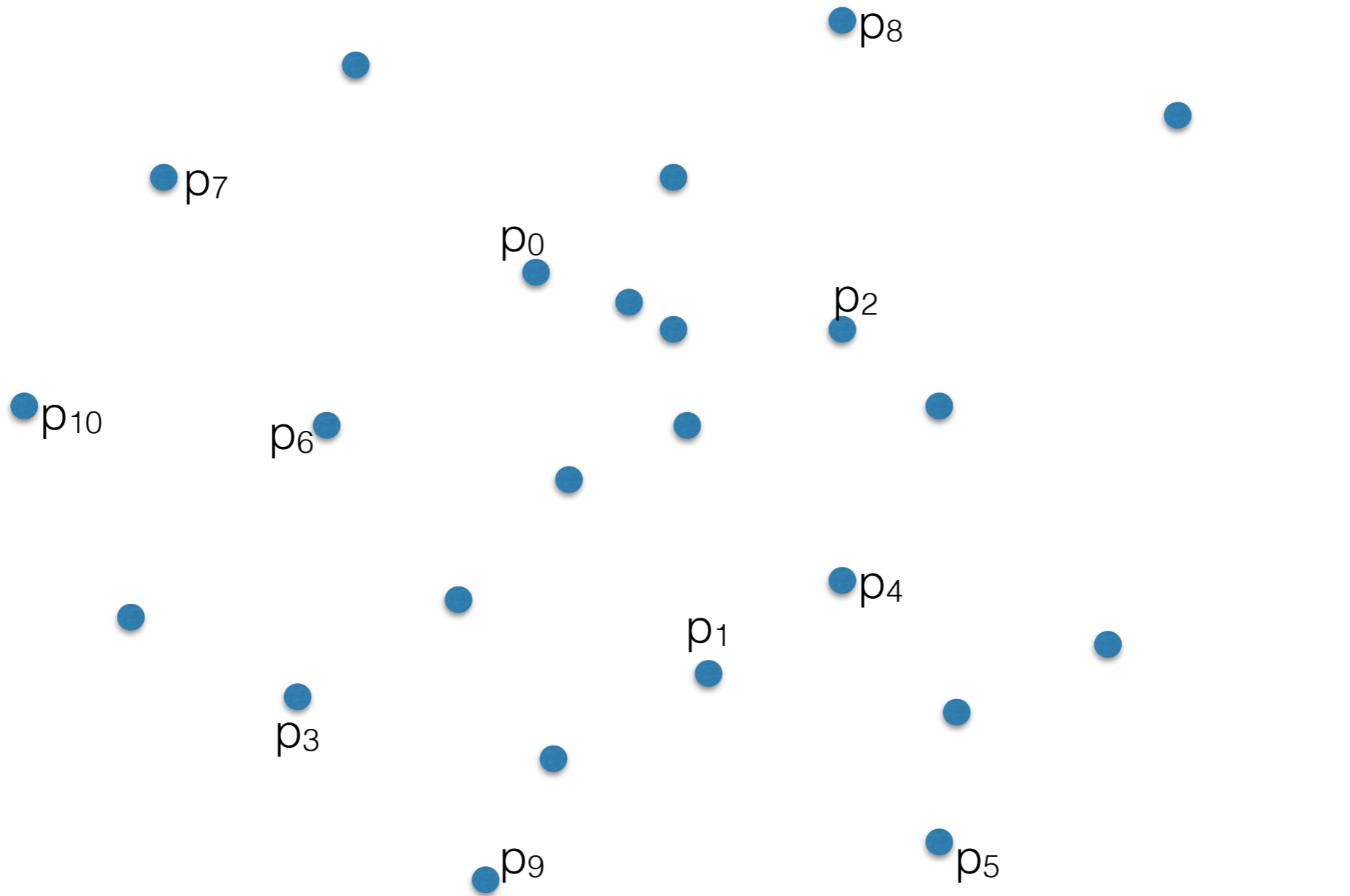
# Finding closest pair

Computational Geometry [csci 3250]

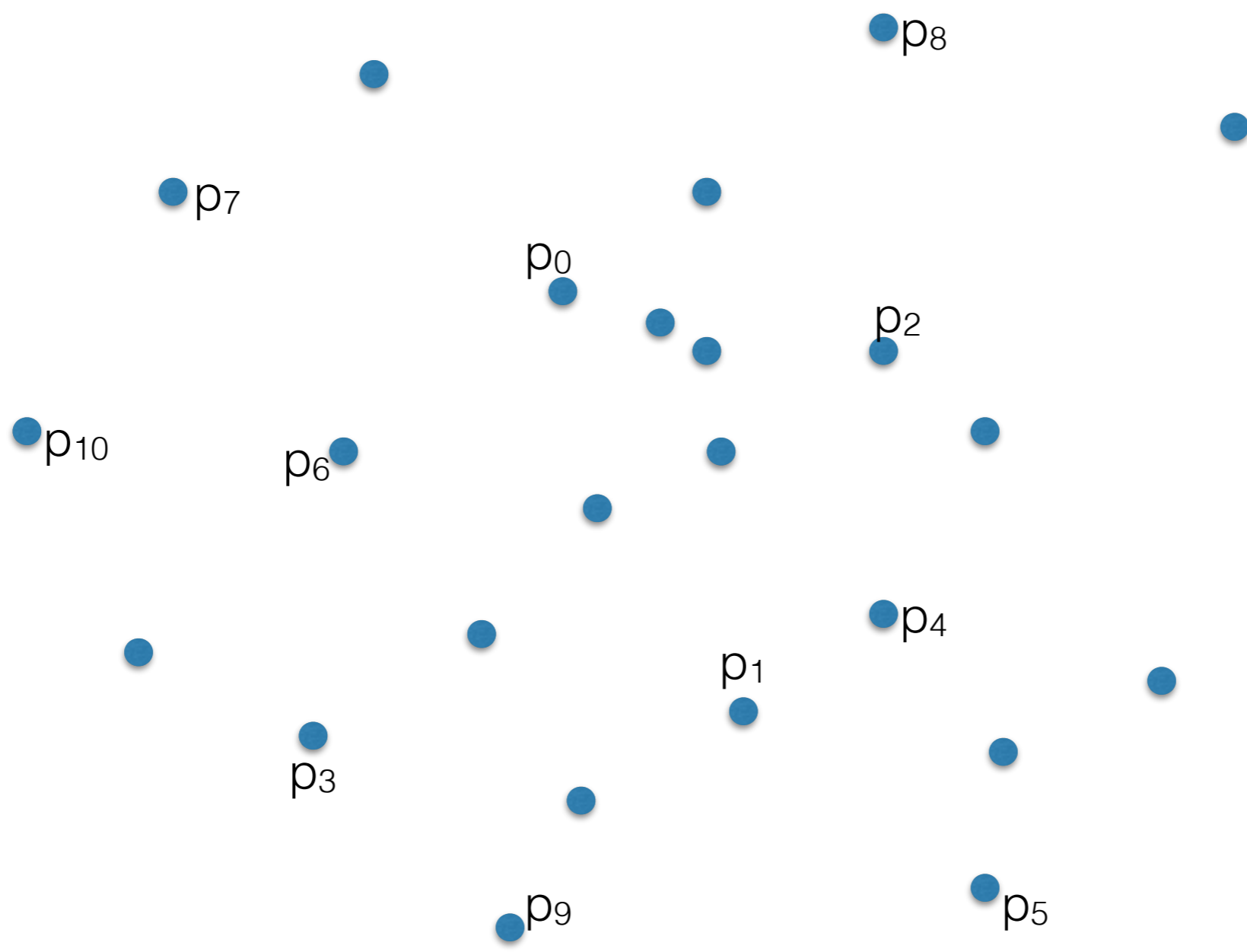
Laura Toma

Bowdoin College



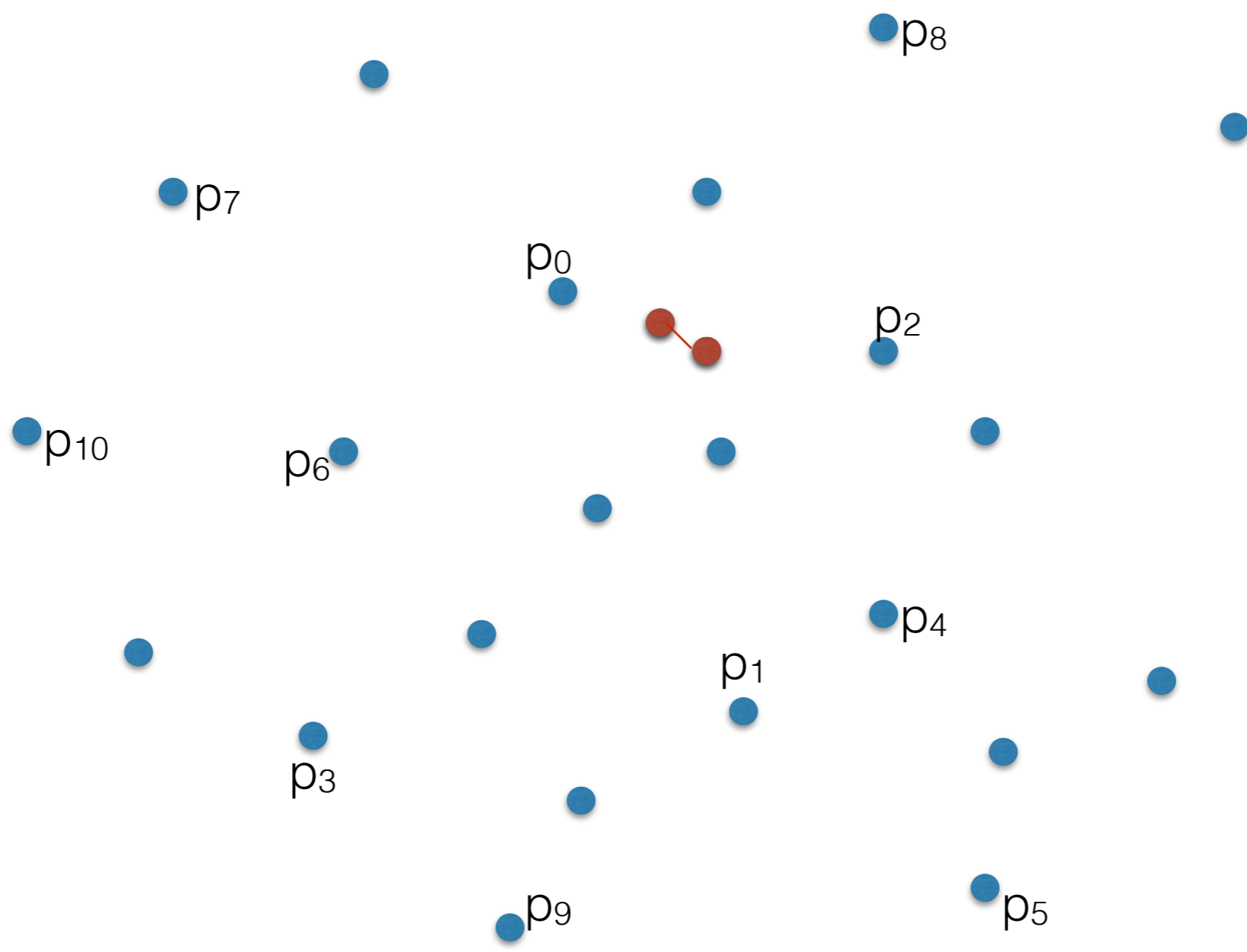


Given an array of points in 2D, find the closest pair.



$p_0$	$p_1$	$p_2$	$p_3$	$p_4$	$p_5$	...
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Brute force:

- mindist = VERY\_LARGE\_VALUE
- for all distinct pairs of points  $p_i, p_j$ 
  - $d = \text{distance}(p_i, p_j)$
  - if ( $d < \text{mindist}$ ): mindist=d

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Can we do better than  $O(n^2)$ ?



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Can we do better than  $O(n^2)$ ?

Hint: divide-and-conquer

# Divide-and-conquer

## **mergesort(array A)**

- if A has 1 element, there's nothing to sort, so just return it
- else

//divide input A into two halves, A1 and A2

- A1 = first half of A
- A2 = second half of A

//sort recursively each half

- sorted\_first\_half = **mergesort**(array A1)
- sorted\_second\_half = **mergesort**(array A2)

//merge

- result = merge\_sorted\_arrays(sorted\_first\_half, sorted\_second\_half)
- return result

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- return result

Analysis:  $T(n) = 2T(n/2) + O(n) \Rightarrow O(n \lg n)$

# In general

## **DC(input P)**

if P is small, solve and return

else

*//divide*

divide input P into two halves, P1 and P2

*//recurse*

result1 = **DC(P1)**

result2 = **DC(P2)**

*//merge*

do\_something\_to\_figure\_out\_result\_for\_P

return result

Analysis:  $T(n) = 2T(n/2) + O(\text{merge phase})$

# In general

## DC(input P)

if P is small, solve and return

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result1 = DC(P1)

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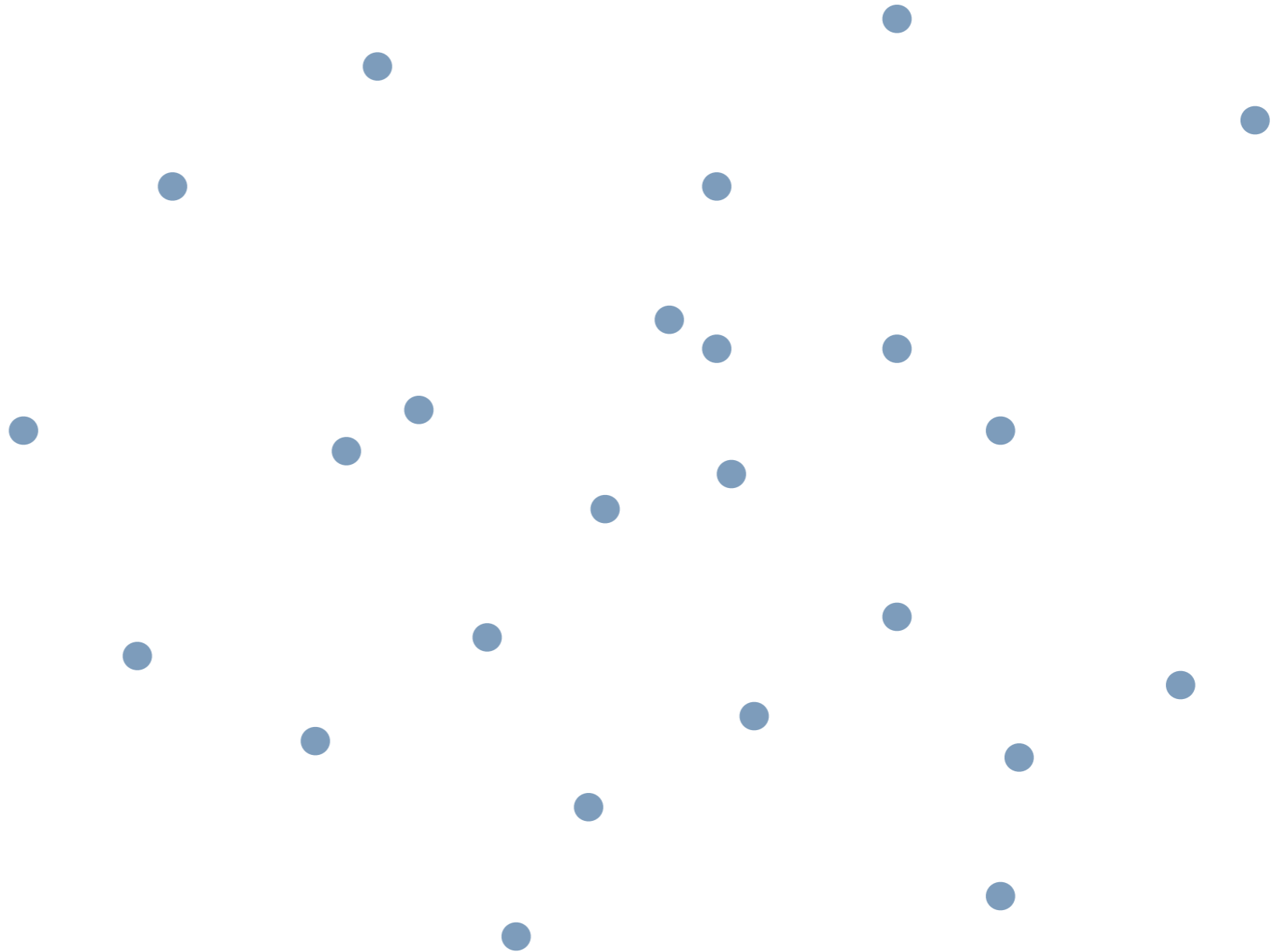
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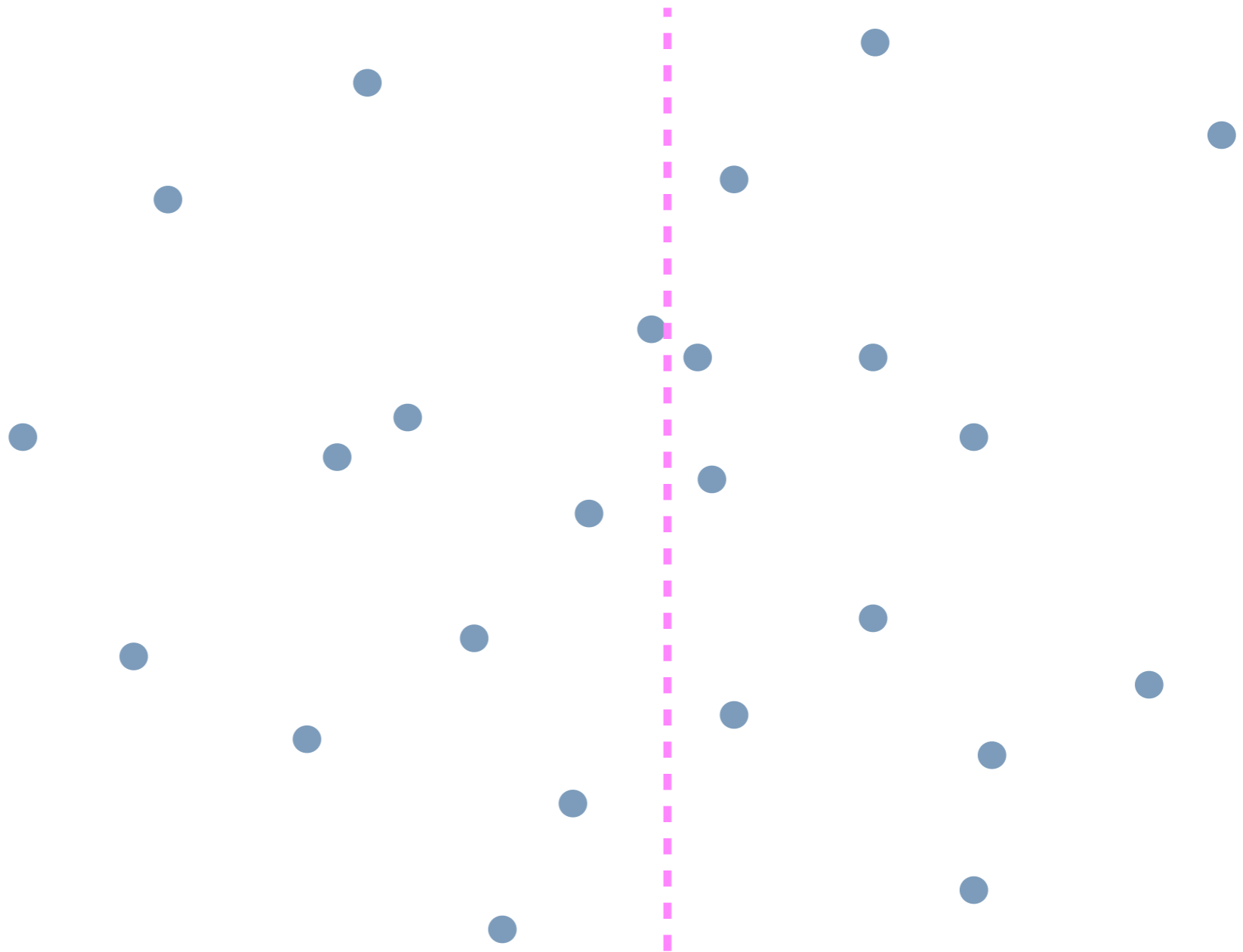
- if merge phase is  $O(n)$ :  $T(n) = 2T(n/2) + O(n) \Rightarrow O(n \lg n)$
- if merge phase is  $O(n \lg n)$ :  $T(n) = 2T(n/2) + O(n \lg n) \Rightarrow O(n \lg^2 n)$

# Divide-and-conquer for closest pair



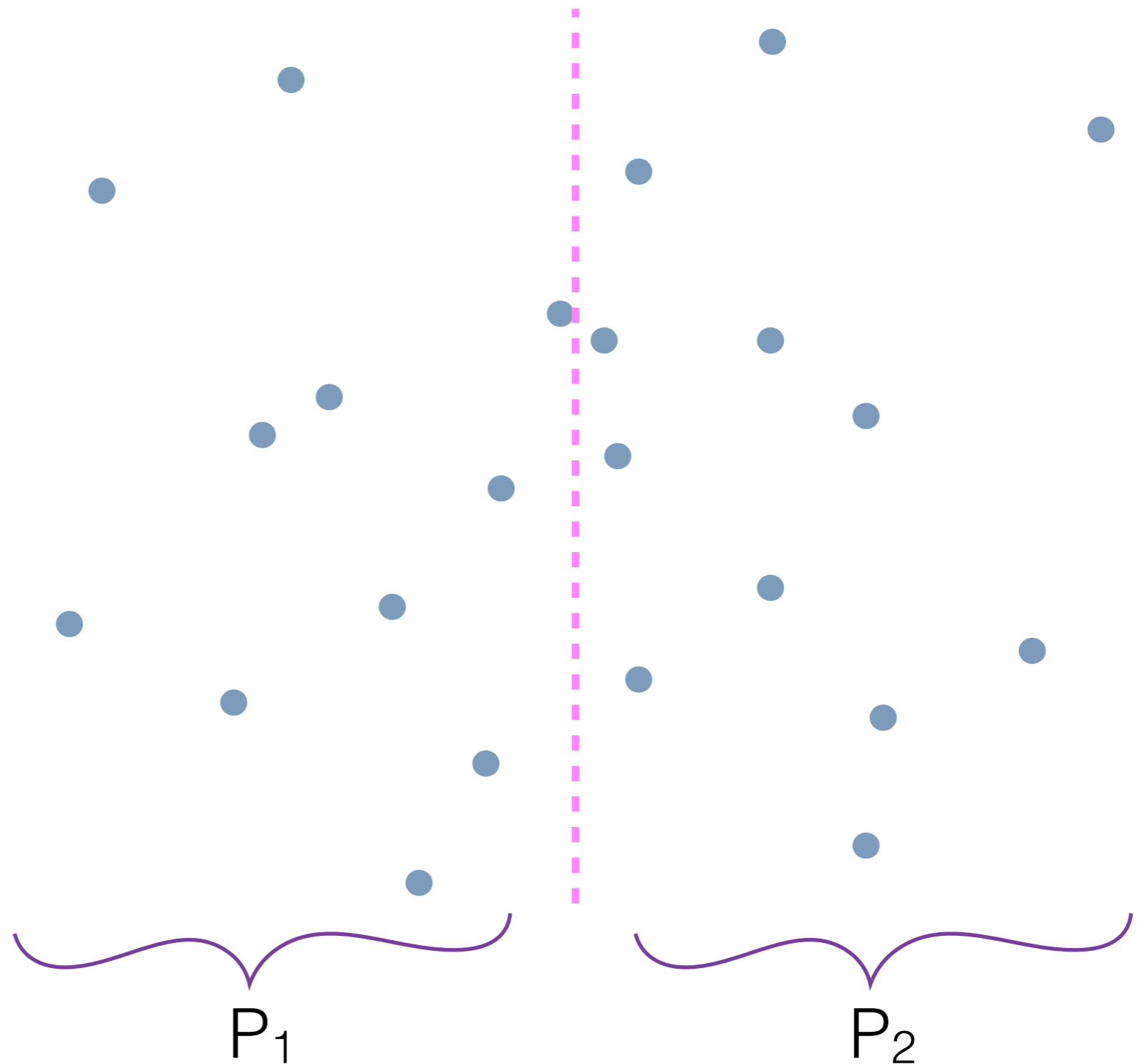
# Divide-and-conquer for closest pair

- find vertical line that splits  $P$  in half



# Divide-and-conquer for closest pair

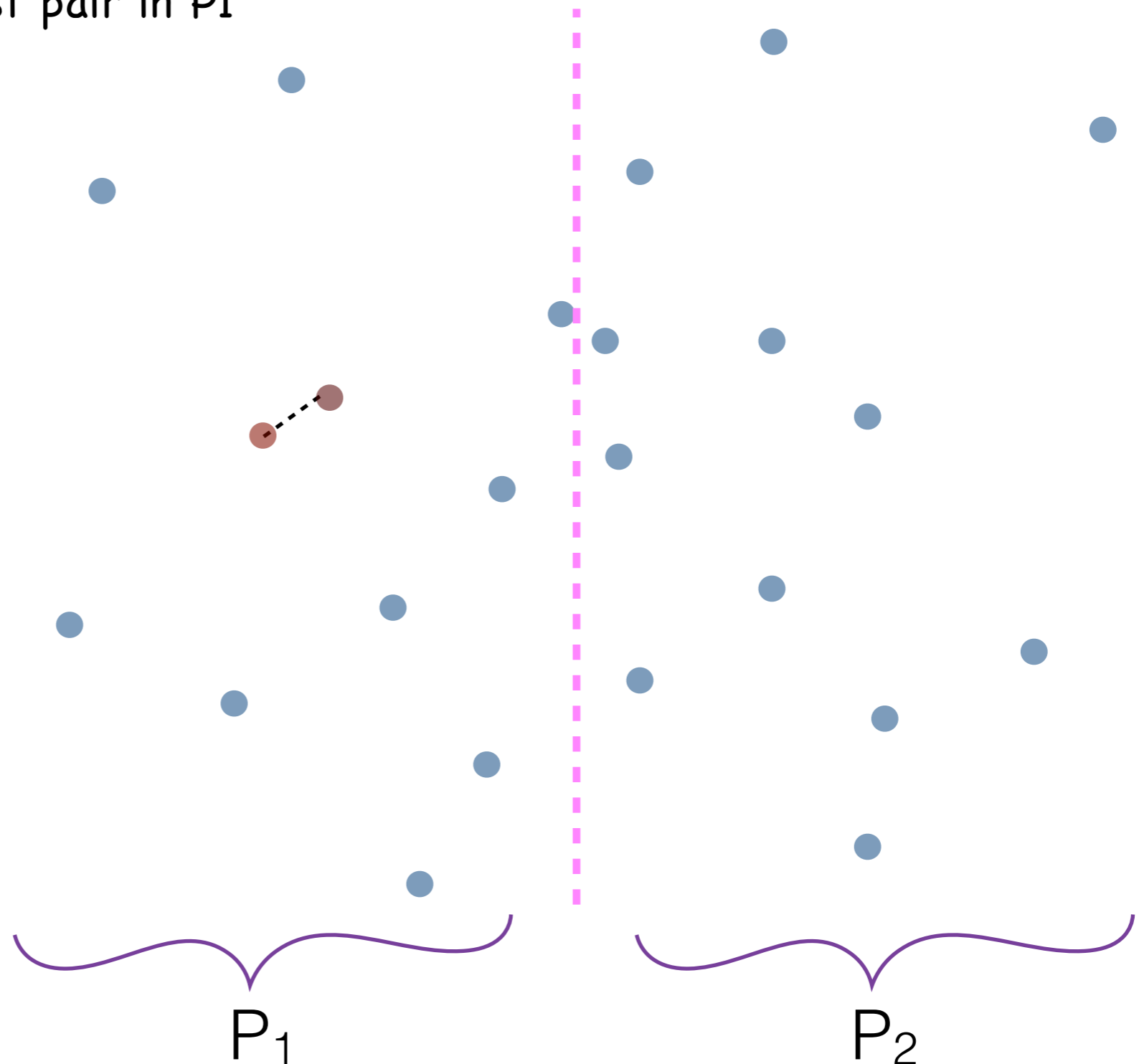
- find vertical line that splits  $P$  in half
- let  $P_1, P_2$  = set of points to the left/right of line





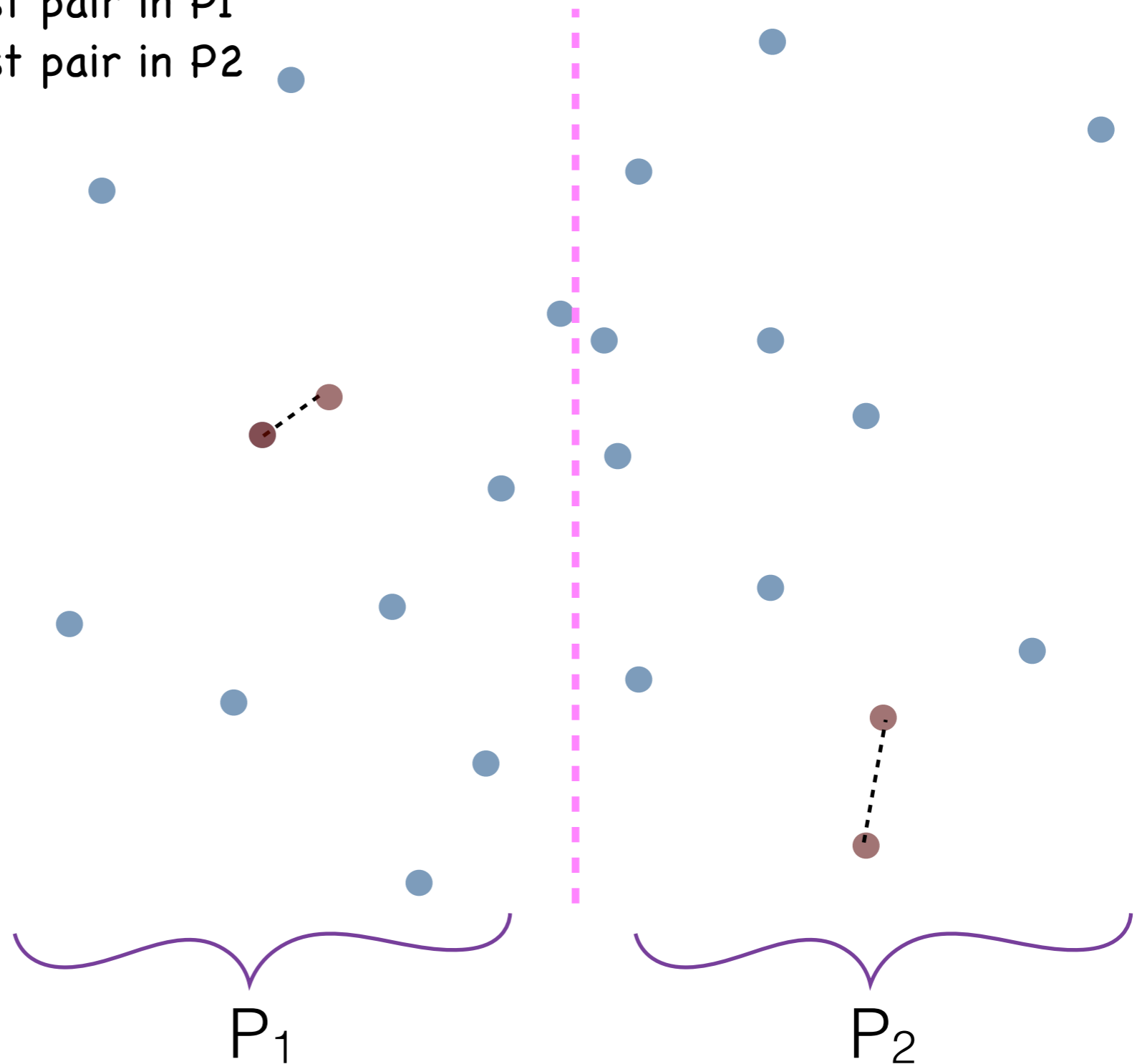
# Divide-and-conquer for closest pair

- find vertical line that splits  $P$  in half
- let  $P_1, P_2$  = set of points to the left/right of line
- recursively find closest pair in  $P_1$



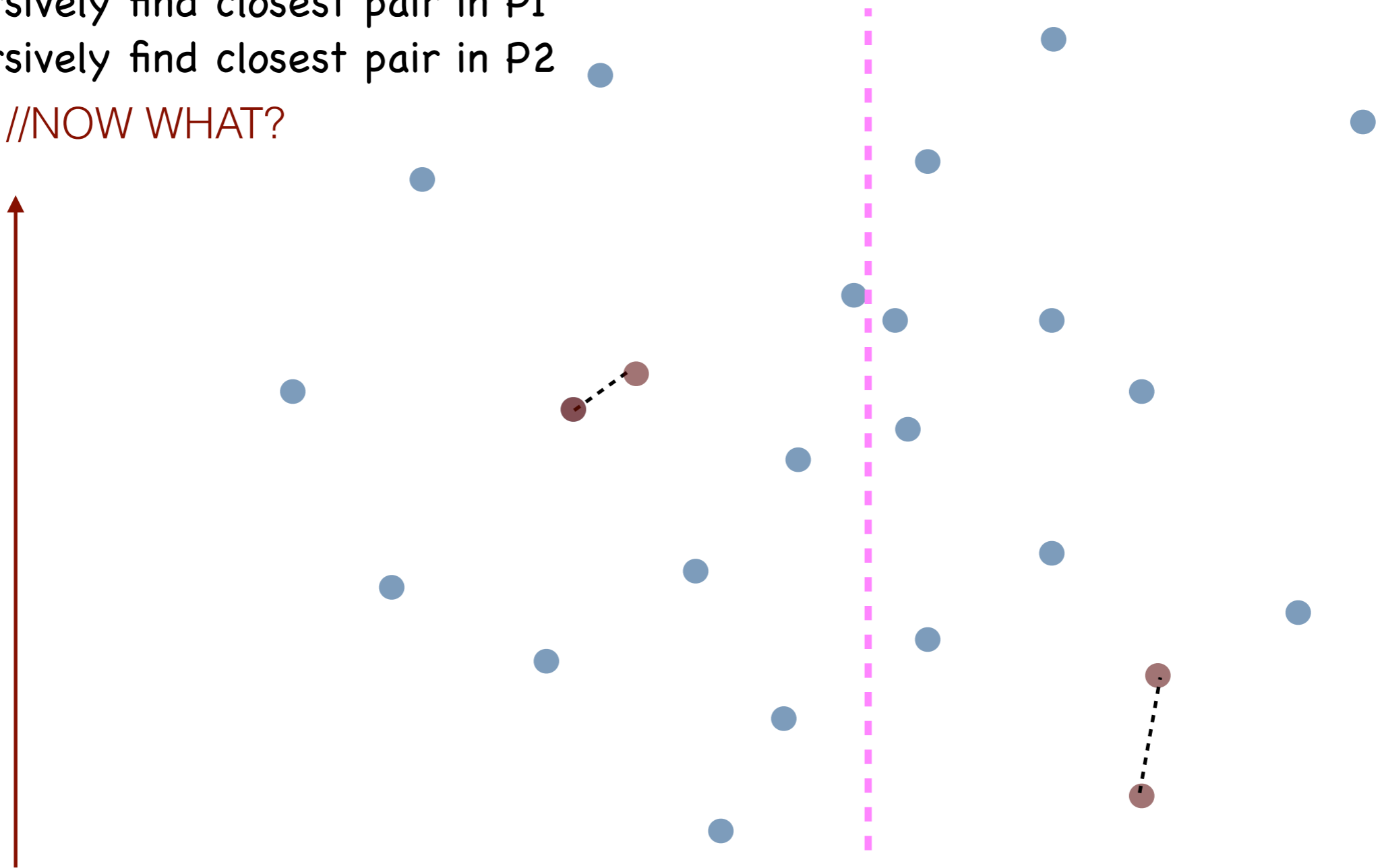
# Divide-and-conquer for closest pair

- find vertical line that splits  $P$  in half
- let  $P_1, P_2$  = set of points to the left/right of line
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# Divide-and-conquer for closest pair

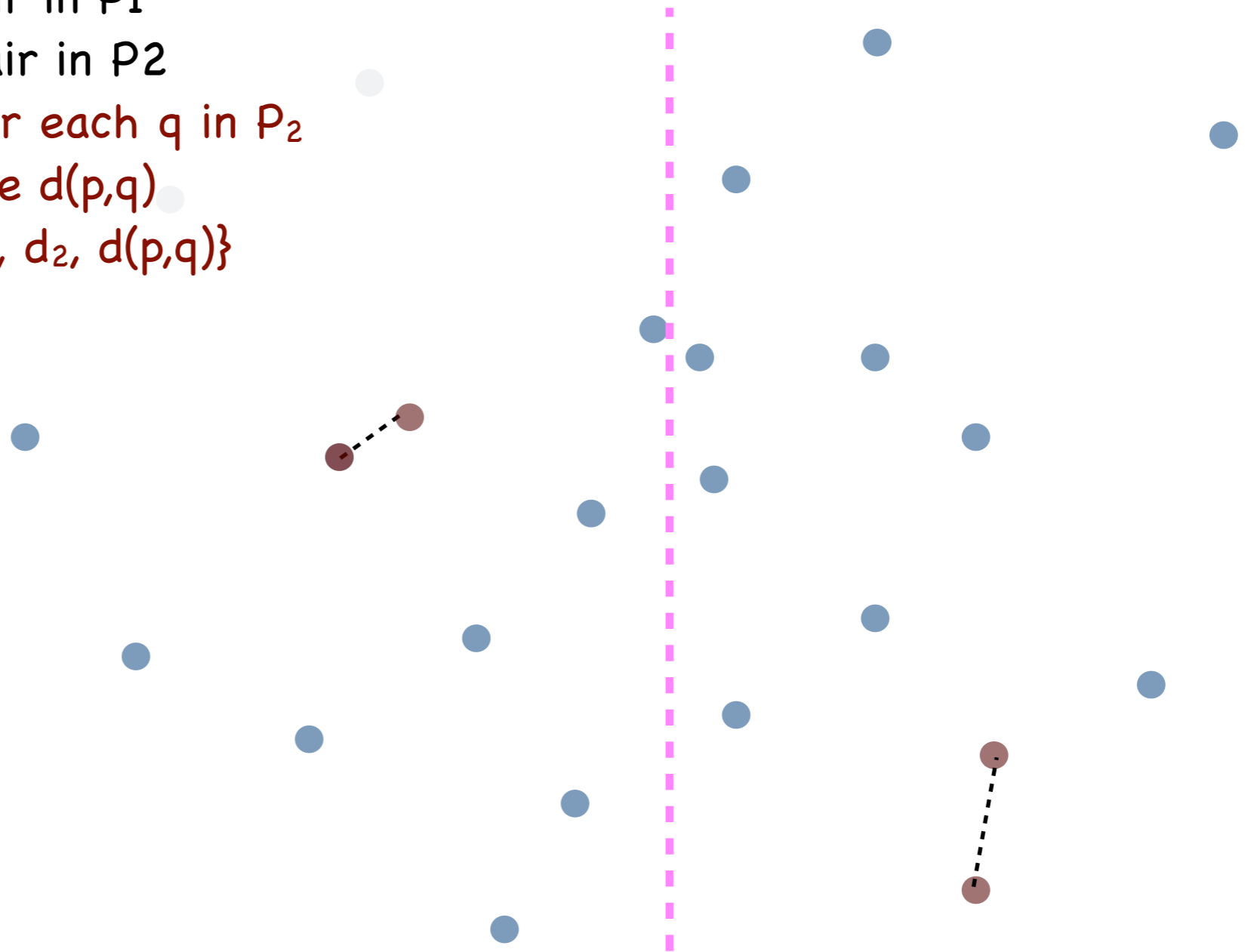
- find vertical line that splits  $P$  in half
- let  $P_1, P_2$  = set of points to the left/right of line
- recursively find closest pair in  $P_1$
- recursively find closest pair in  $P_2$
- ..... //NOW WHAT?



How can you find closest pair in  $P$ ?

# Divide-and-conquer for closest pair

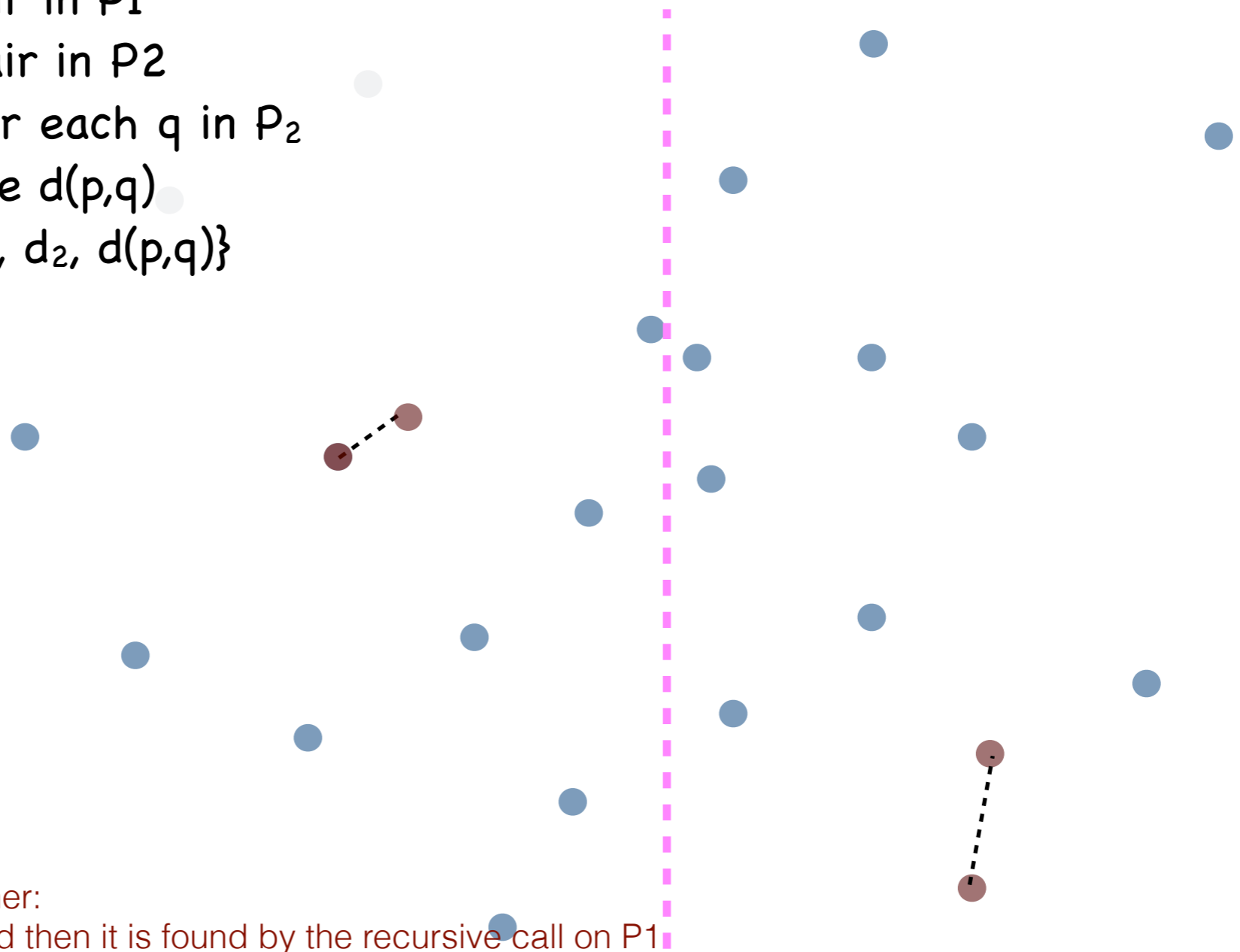
- find vertical line that splits  $P$  in half
- let  $P_1, P_2$  = set of points to the left/right of line
- $d_1$  = find closest pair in  $P_1$
- $d_2$  = find closest pair in  $P_2$
- for each  $p$  in  $P_1$ , for each  $q$  in  $P_2$ 
  - compute distance  $d(p,q)$
  - $\text{mindist} = \min\{d_1, d_2, d(p,q)\}$



1. Is this correct?
2. Running time?

# Divide-and-conquer for closest pair

- find vertical line that splits  $P$  in half
- let  $P_1, P_2$  = set of points to the left/right of line
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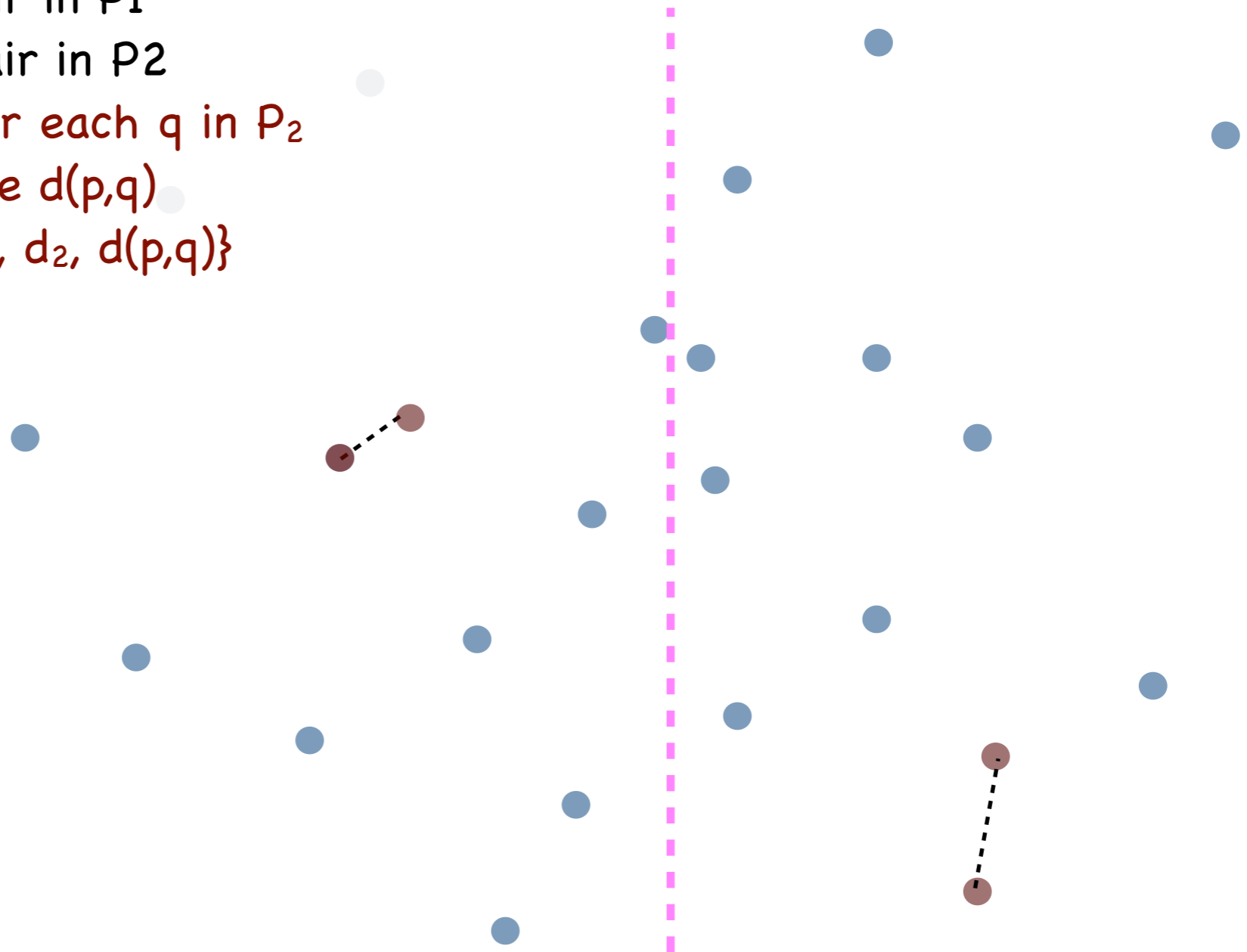
Is this correct?

YES. The closest pair is either:

- both points are in  $P_1$ , and then it is found by the recursive call on  $P_1$
- both points are in  $P_2$ , and then it is found by the recursive call on  $P_2$
- one point is in  $P_1$  and one in  $P_2$ , and then it is found in the merge phase, because the merge phase considers all such pairs

# Divide-and-conquer for closest pair

- find vertical line that splits  $P$  in half
- let  $P_1, P_2$  = set of points to the left/right of line
- $d_1$  = find closest pair in  $P_1$
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  - $\text{mindist} = \min\{d_1, d_2, d(p,q)\}$

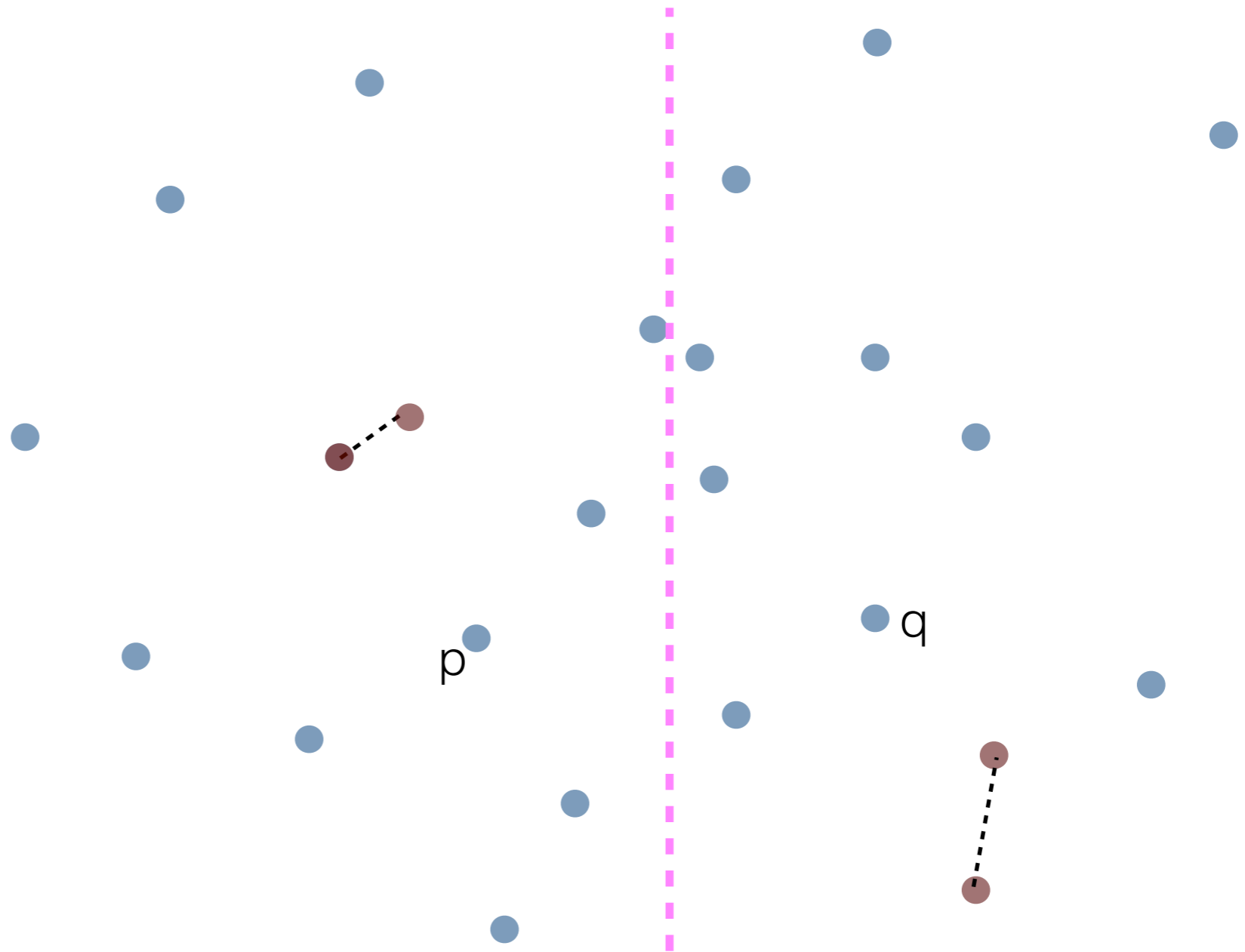


Running time?

- $T(n) = 2T(n/2) + O(n^2) \Rightarrow$  solves to  $O(n^2)$

# Refining the merge

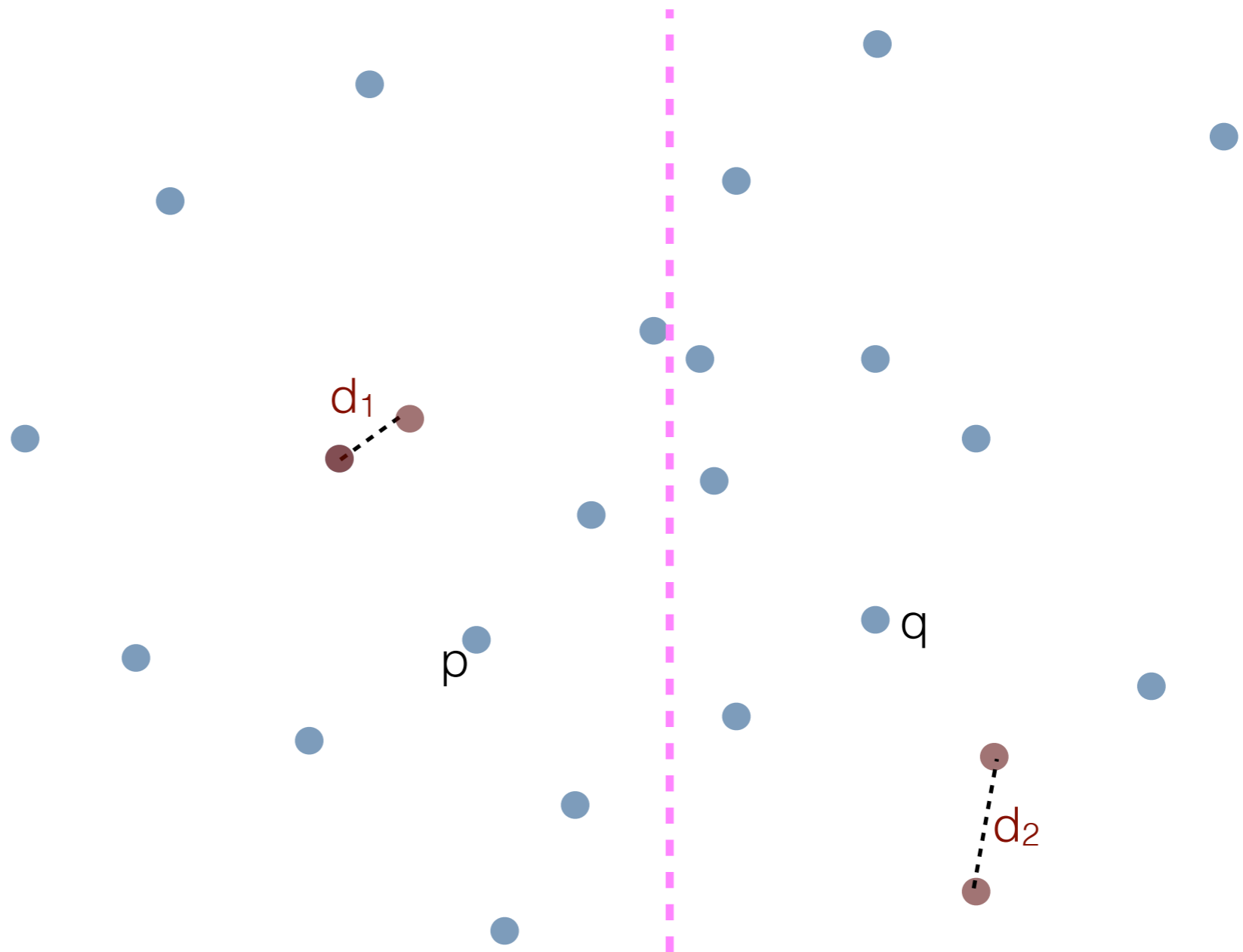
Do we need to examine all pairs  $(p,q)$ , with  $p$  in  $P_1$ ,  $q$  in  $P_2$ ?



Can  $(p,q)$  be the closest pair?

# Refining the merge

Do we need to examine all pairs  $(p,q)$ , with  $p$  in  $P_1$ ,  $q$  in  $P_2$ ?



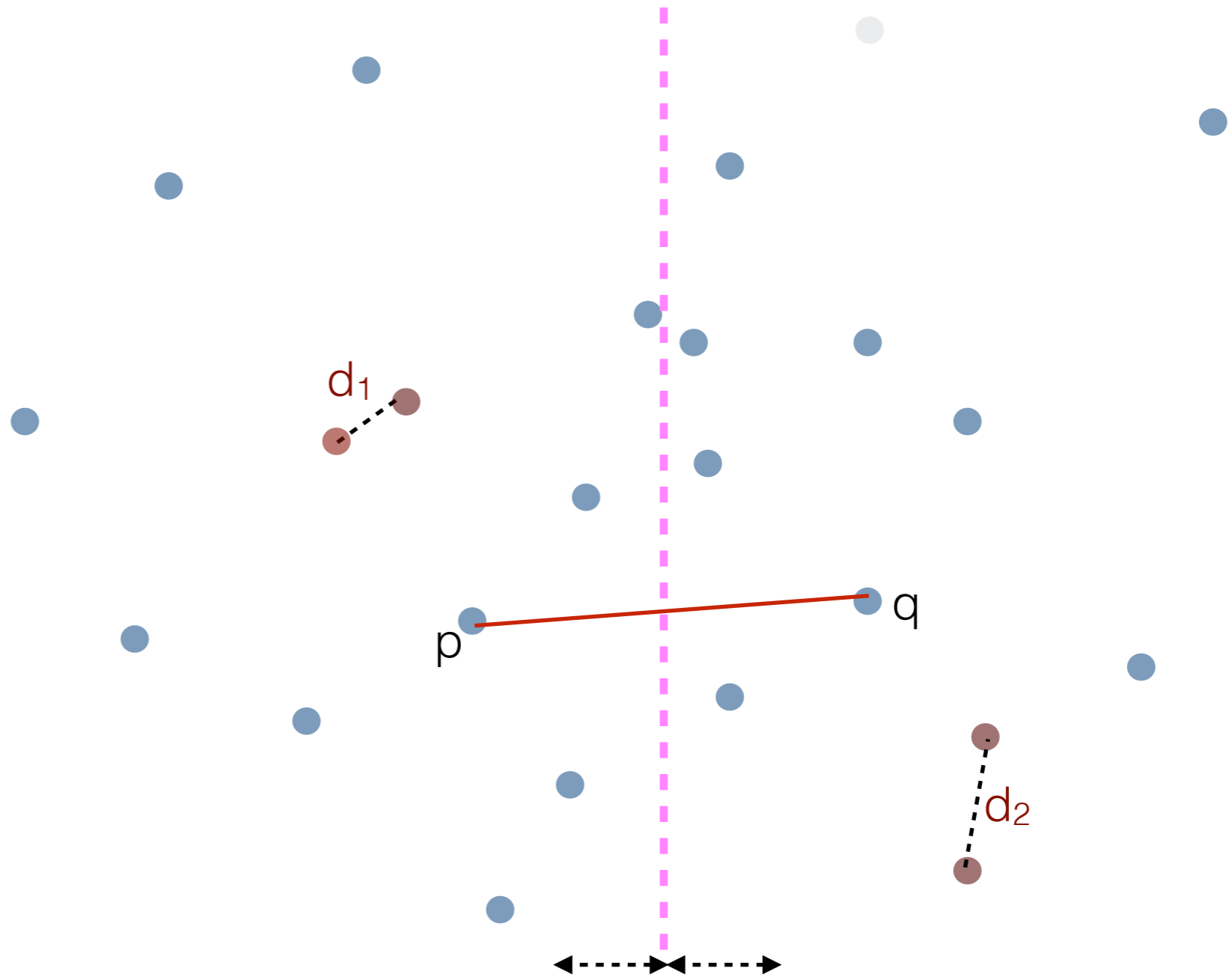
Can  $(p,q)$  be the closest pair?

Why not? Where do  $p,q$  need to lie in order to be the closest pair?

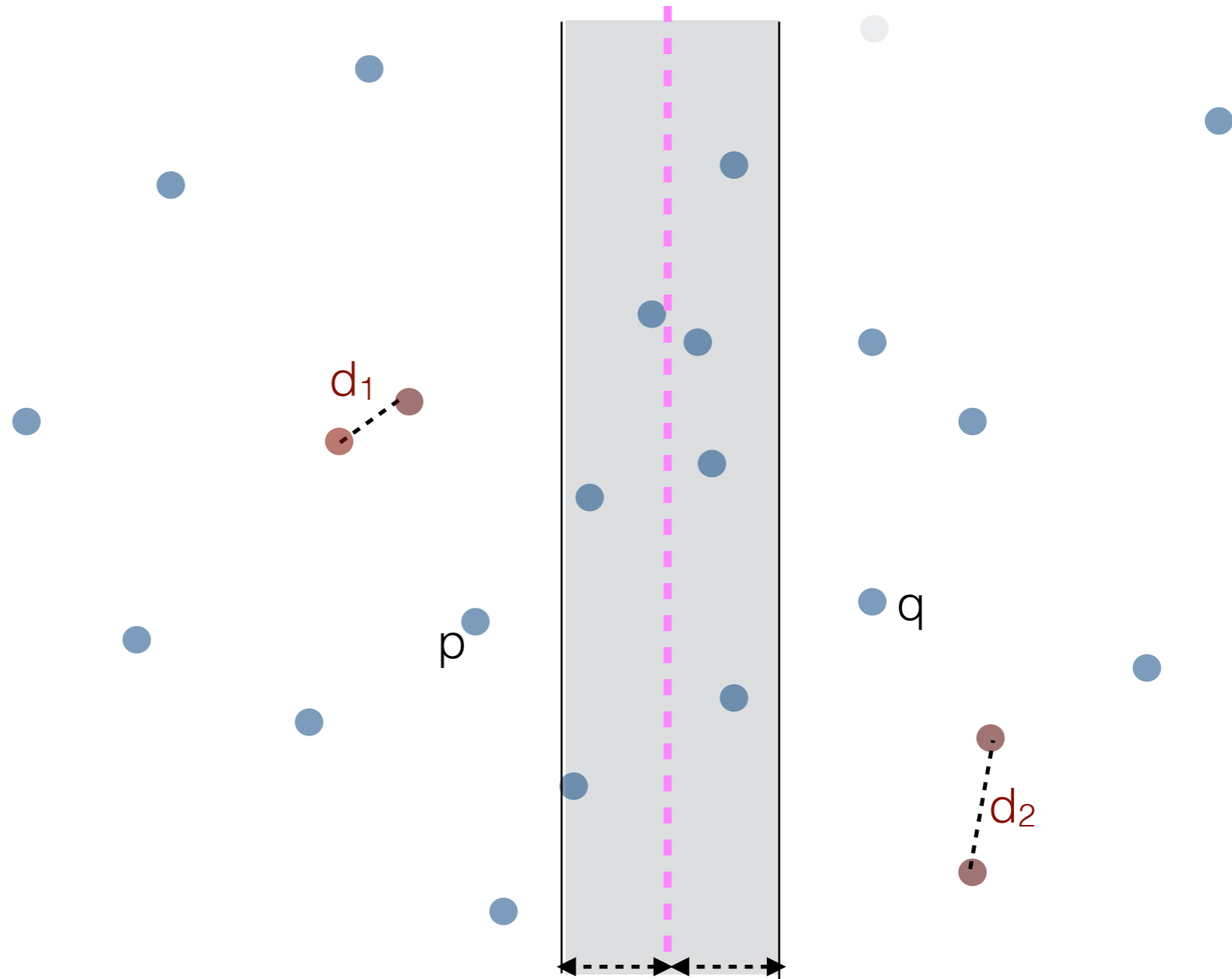


Notation:  $d = \min \{d_1, d_2\}$

In order for  $\text{dist}(p,q)$  to be smaller than  $d$ , it must be that both the horizontal and the vertical distance between  $p$  and  $q$  must be smaller than  $d$ .



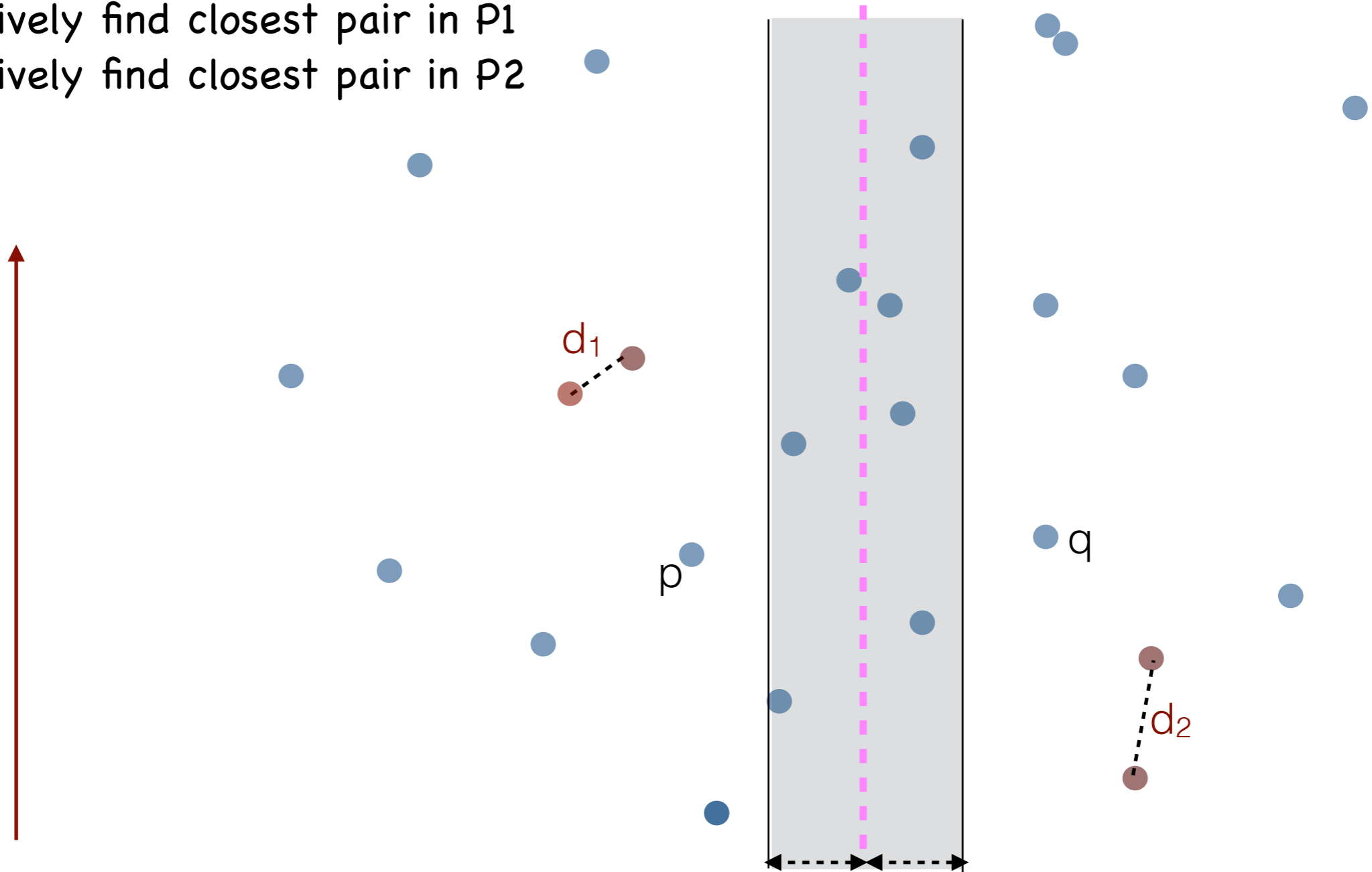
Claim: In order to be candidates for closest pair, points  $p$ ,  $q$  must lie in the  $d$ -by- $d$  strip centered at the median.



Proof:

# Refining the merge

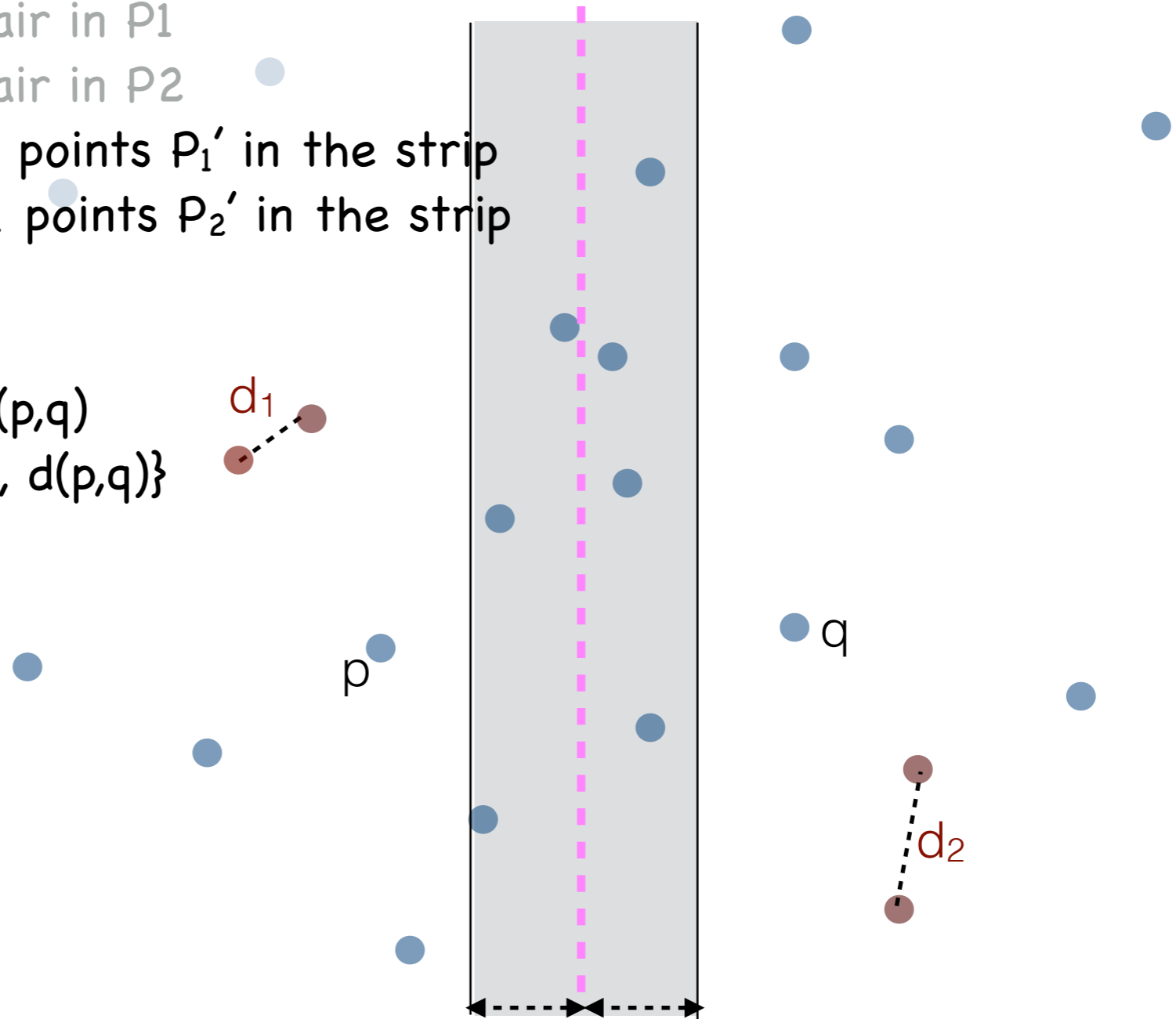
- find vertical line that splits  $P$  in half
- let  $P_1, P_2$  = set of points to the left/right of line
- recursively find closest pair in  $P_1$
- recursively find closest pair in  $P_2$
- .....



Fill in the details of the new algorithm's merge phase and analyze it.

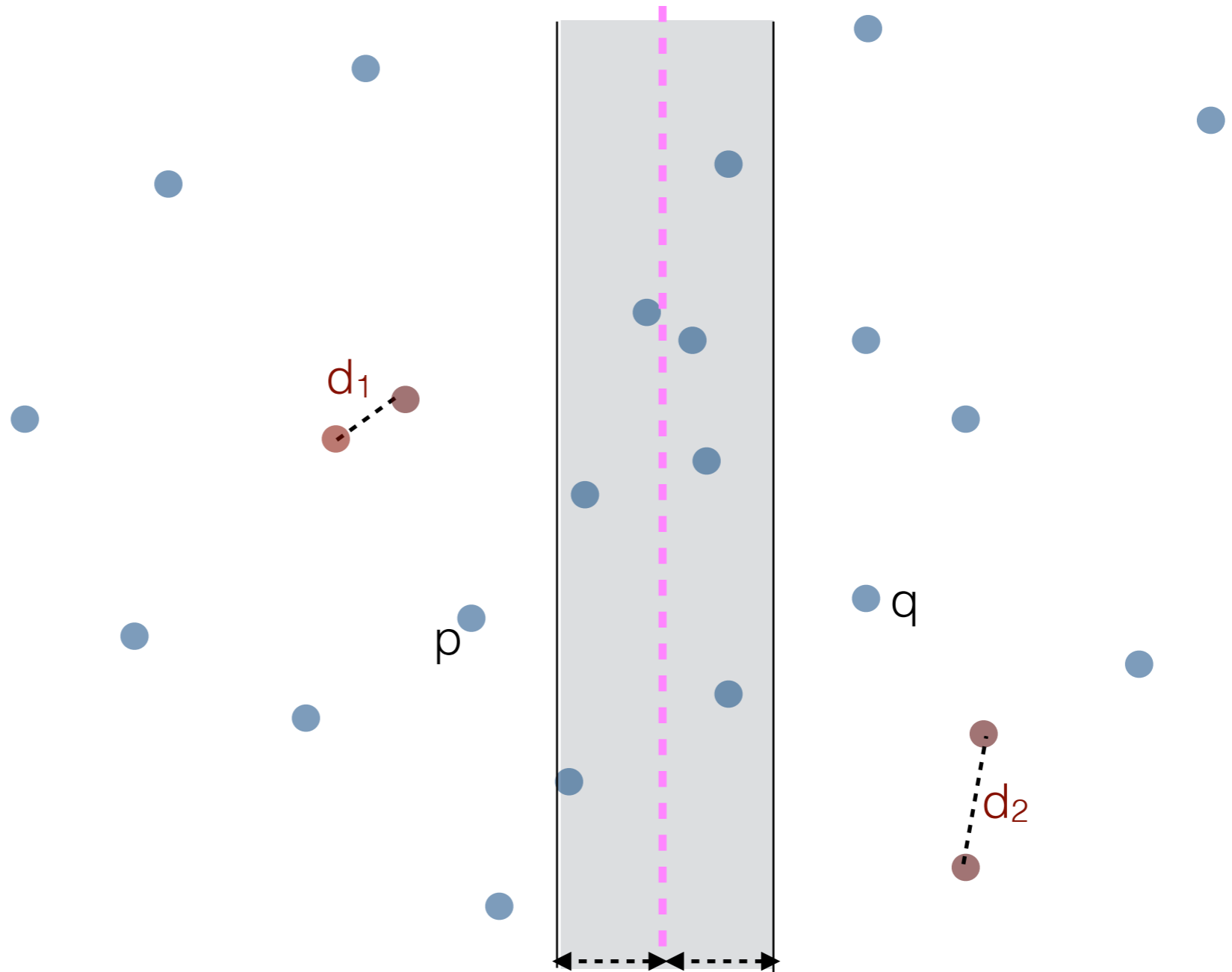
# Refining the merge

- find vertical line that splits  $P$  in half
- let  $P_1, P_2$  = set of points to the left/right of line
- recursively find closest pair in  $P_1$
- recursively find closest pair in  $P_2$
- traverse  $P_1$  and select all points  $P_1'$  in the strip
- traverse  $P_2$  and select all points  $P_2'$  in the strip
- for each  $p$  in  $P_1'$ 
  - for each point  $q$  in  $P_2'$ 
    - compute distance  $d(p,q)$
    - $\text{mindist} = \min\{d_1, d_2, d(p,q)\}$



# Refining the merge

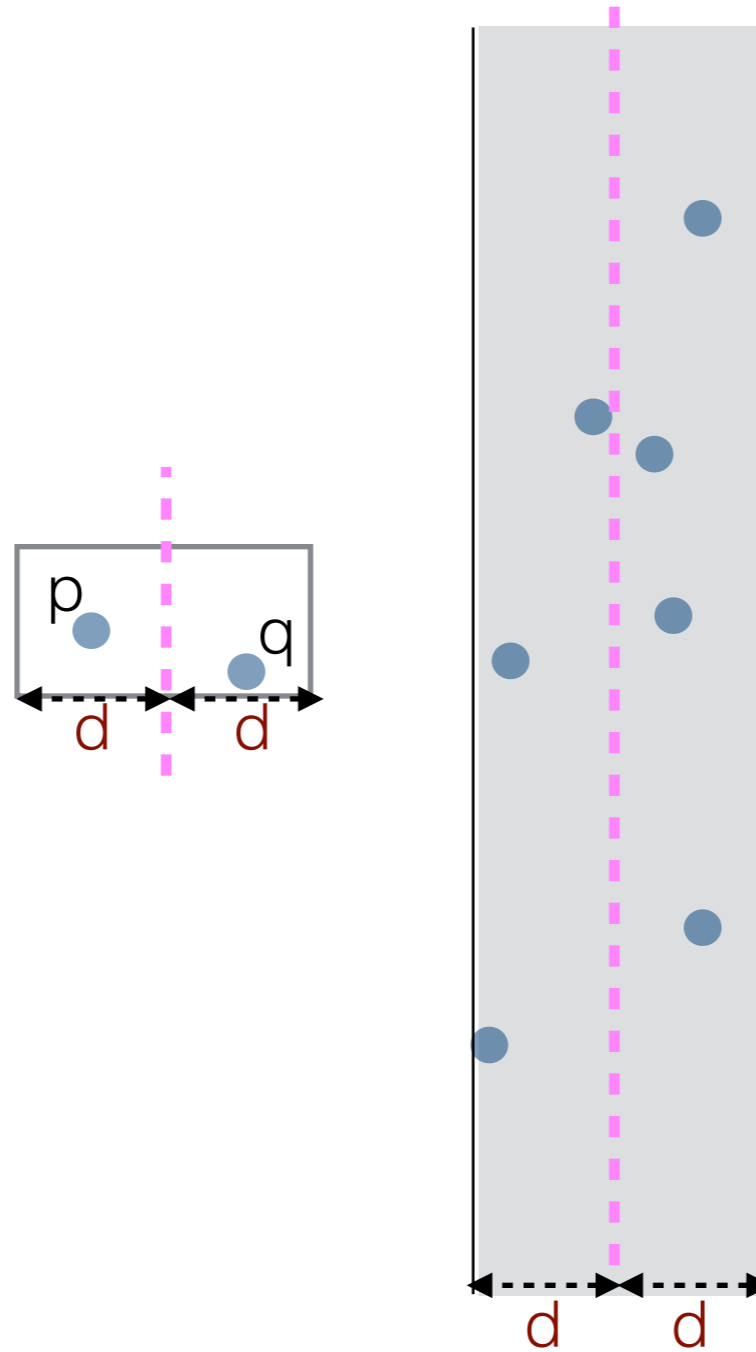
- Show an example where the strip may contain  $\Omega(n)$  points.



- What does this imply for the running time?

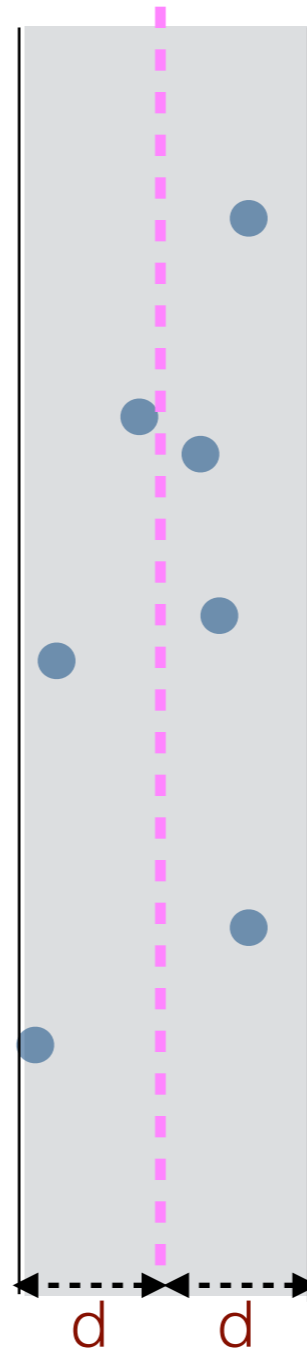
# Refining the merge

- Ok, so this is not yet enough
- But ... we also know that the vertical distance between  $p$  and  $q$  cannot be greater than  $d$ .



# Refining the merge

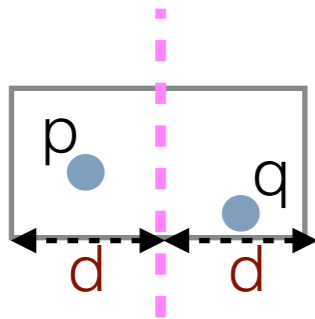
- Consider a point  $p$  in the stripe. How many points below it, at most, could be candidates for the closest pair  $(p,q)$ ?



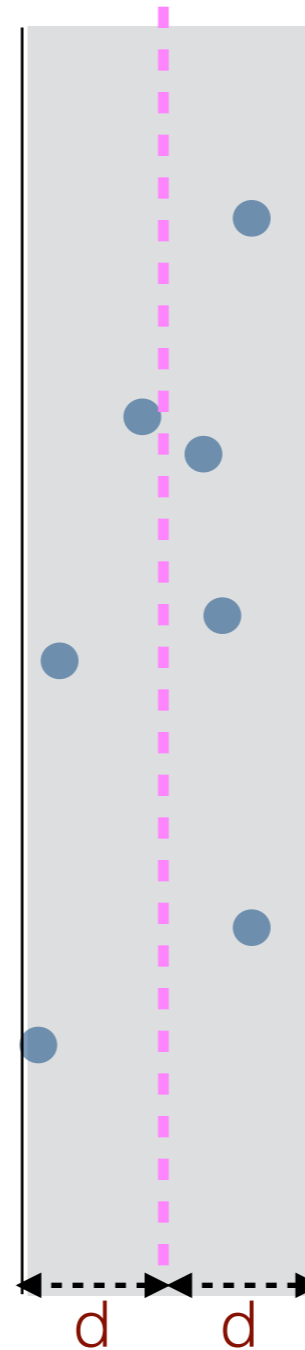
# Refining the merge

- Consider a point  $p$  in the stripe. How many points below it, at most, could be candidates for the closest pair  $(p,q)$ ?

$p, q$  must lie in  $2d$ -by- $d$  rectangle



any pair of points in the left side must be at least  $d$  away



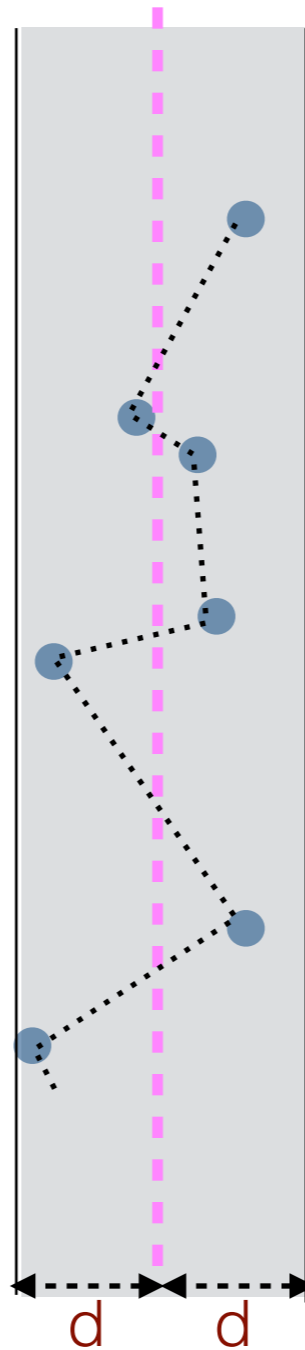
any pair of points in the right side must be at least  $d$  away



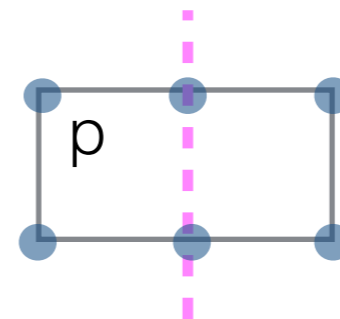
# Refining the merge

Claim:

A point  $p$  needs to check at most 5 points following  $p$  in  $y$ -order.



Note: Assume no duplicate points.



# Refining the merge

- Put all these together and write down the algorithm.
- Analyze the running time.

# Refining the merge

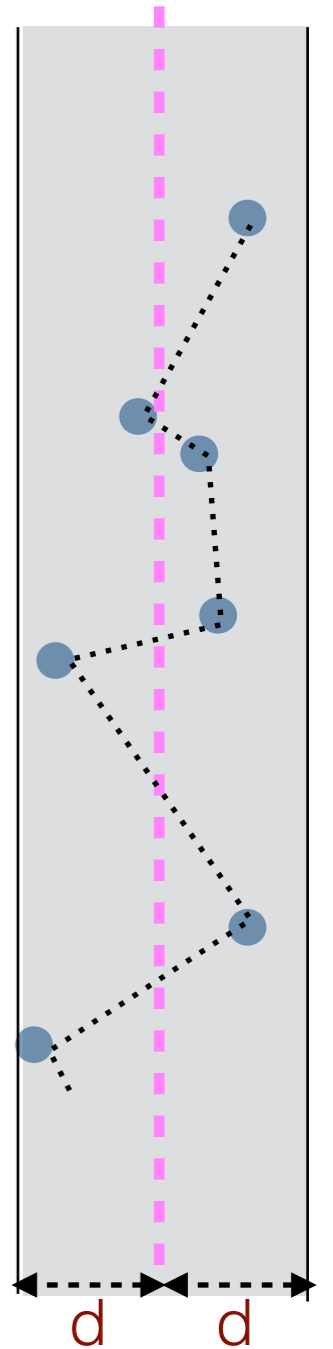
## closestPair(P)

//divide

- find vertical line that splits  $P$  in half
- let  $P_1, P_2$  = set of points to the left/right of line
- call  $\text{closestPair}(P_1)$ ; let  $d_1$  be the returned closest distance
- call  $\text{closestPair}(P_2)$ ; let  $d_2$  be the returned closest distance

//merge

- let  $d = \min\{d_1, d_2\}$
- Strip= empty
- for all  $p$  in  $P_1$ : if  $x_p > x_{\text{vertical}} - d$ : add  $p$  to Strip
- for all  $p$  in  $P_2$ : if  $x_p < x_{\text{vertical}} + d$ : add  $p$  to Strip
- sort Strip by  $y$ -coord
- initialize  $\text{mindist} = d$
- for each  $p$  in Strip in sorted order
  - compute its distance to the 5 points that come after it in sorted order
  - if any of these is smaller than  $\text{mindist}$ , update  $\text{mindist}$
- return  $\text{mindist}$



# Refining the merge

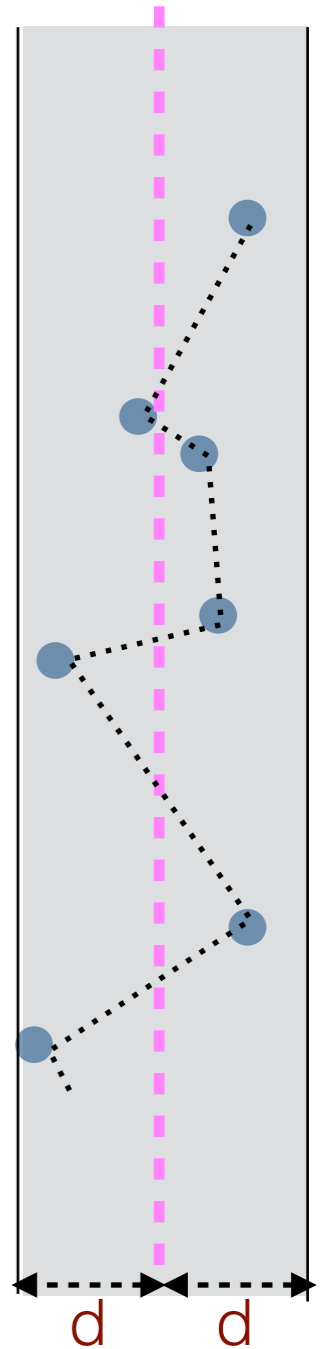
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- **sort Strip by y-coord**
- initialize  $\text{mindist} = d$
- for each  $p$  in Strip in sorted order
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Analysis: ?

# Refining the merge

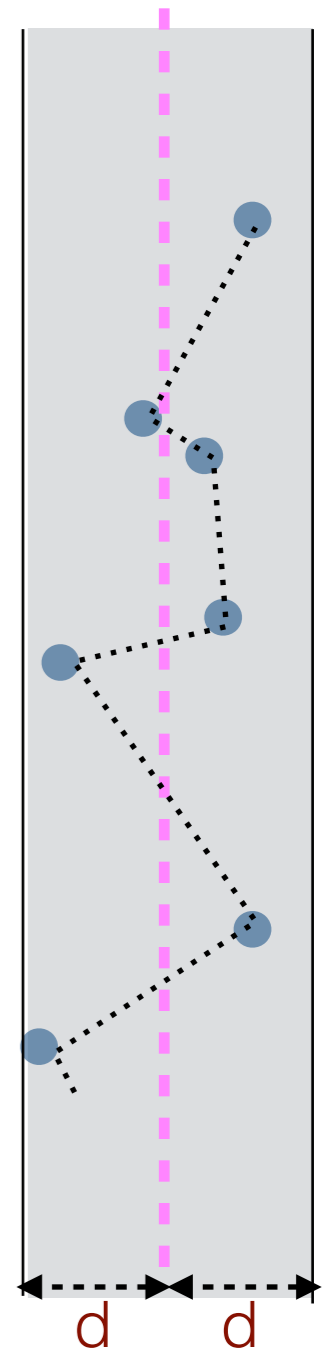
## closestPair(P)

### //divide

- find vertical line that splits P in half
- let  $P_1, P_2$  = set of points to the left/right of line
- call `closestPair(P1)`; let  $d_1$  be the returned closest distance
- call `closestPair(P2)`; let  $d_2$  be the returned closest distance

### //merge

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- **sort Strip by y-coord**
- initialize  $\text{mindist} = d$
- for each  $p$  in Strip in sorted order
  - compute its distance to the 5 points that come after it in sorted order
  - if any of these is smaller than  $\text{mindist}$ , update  $\text{mindist}$
- return  $\text{mindist}$



Analysis:  $T(n) = 2T(n/2) + O(n \lg n) \Rightarrow O(n \lg^2 n)$

# Divide-and-conquer for closest pair

- Avoiding the sort

# Divide-and-conquer for closest pair

- Describe in full detail how to avoid sorting at every level, and give the detailed pseudocode. Include an explanation for how to find the vertical line that splits  $P$  in half.