

# Lecture 26

CSE 331

Nov 3, 2021

# Please have a face mask on

## Masking requirement



*UR requires all students, employees and visitors – regardless of their vaccination status – to wear face coverings while inside campus buildings.*

<https://www.buffalo.edu/coronavirus/health-and-safety/health-safety-guidelines.html>

# Coding P2 due Friday

Fri, Nov 5	Kickass Property Lemma    $x^3$	[KT, Sec 5.4] (Project (Problem 2 <b>Coding</b> ) in)
Mon, Nov 8	Weighted Interval Scheduling   $x^3$	[KT, Sec 6.1] (Project (Problem 2 <b>Reflection</b> ) in)
Wed, Nov 10	Recursive algorithm for weighted interval scheduling problem   $x^2$	[KT, Sec 6.1] (HW 6 out)
Fri, Nov 12	Subset sum problem    $x^3$	[KT, Sec 6.1, 6.2, 6.4]
Mon, Nov 15	Dynamic program for subset sum    $x^3$	[KT, Sec 6.4]
Wed, Nov 17	Shortest path problem    $x^2$	[KT, Sec 6.8] (HW 7 out, HW 6 in)
Fri, Nov 19	Bellman-Ford algorithm    $x^2$	[KT, Sec 6.8]
Mon, Nov 22	The P vs. NP problem  $x^2$	[KT, Sec 8.1]
Wed, Nov 24	<b>No class</b>	Fall Recess
Fri, Nov 26	<b>No class</b>	Fall Recess
Mon, Nov 29	More on reductions  $x^2$	[KT, Sec 8.1]
Wed, Dec 1	The SAT problem  $x^2$	[KT, Sec 8.2] (HW 8 out, HW 7 in)
Fri, Dec 3	NP-Completeness  $x^2$	[KT, Sec. 8.3, 8.4] (Project (Problem 3 <b>Coding</b> ) in)
Mon, Dec 6	k-coloring problem  $x^2$	[KT, Sec 8.7] (Quiz 2) (Project (Problem 3 <b>Reflection</b> ) in)

# Group formation instructions

## Autolab group submission for CSE 331 Project

The lowdown on submitting your [project](#) (especially the [coding](#) and [reflection](#)) problems as a group on Autolab.

Follow instructions **EXACTLY** as they are stated

**The instructions below are for Coding Problem 1**

You will have to repeat the instructions below for EACH coding AND reflection problem on project on Autolab (with the appropriate changes to the actual problem).

## Form your group on Autolab

**Groups on Autolab will NOT be automatically created**

You will have to form a group on Autolab by yourself (as a group). Read on for instructions on how to go about this.

[Click to add notes](#)

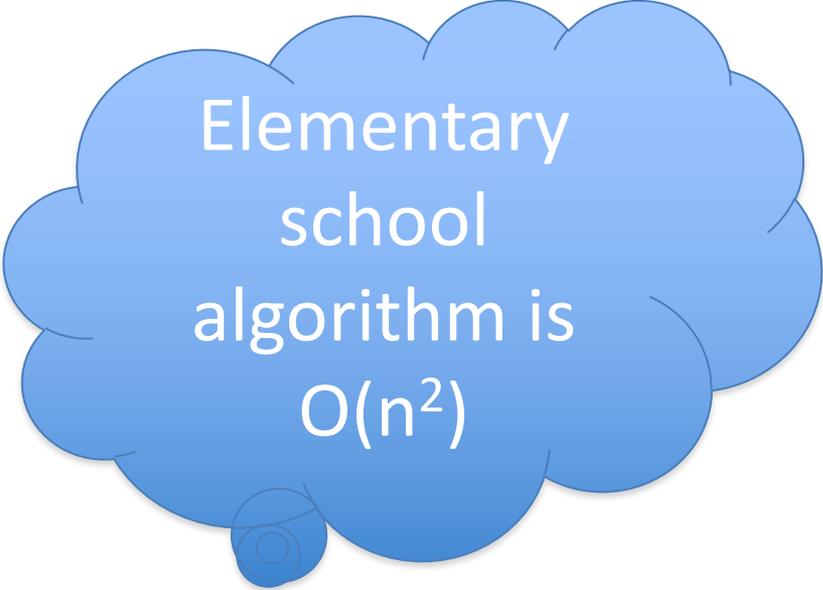


# Multiplying two numbers

Given two numbers  $a$  and  $b$  in binary

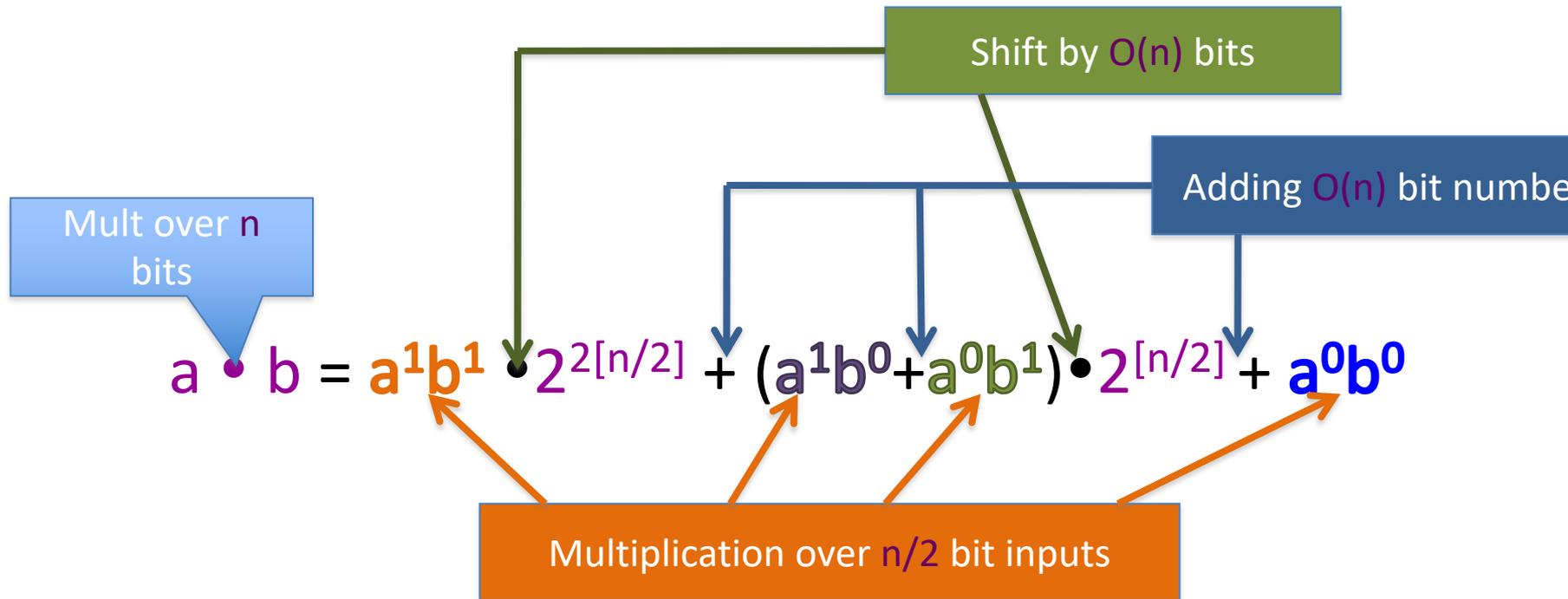
$$a = (a_{n-1}, \dots, a_0) \text{ and } b = (b_{n-1}, \dots, b_0)$$

Compute  $c = a \times b$



Elementary  
school  
algorithm is  
 $O(n^2)$

# The current algorithm scheme



$$T(n) \leq 4T(n/2) + cn \dots$$

$$T(1) \leq c$$

$T(n)$  is  $O(n^2)$

# The key identity

$$a^1b^0 + a^0b^1 = (a^1 + a^0)(b^1 + b^0) - a^1b^1 - a^0b^0$$

# The final algorithm

Input:  $a = (a_{n-1}, \dots, a_0)$  and  $b = (b_{n-1}, \dots, b_0)$

**Mult** ( $a, b$ )

If  $n = 1$  return  $a_0b_0$

$a^1 = a_{n-1}, \dots, a_{\lceil n/2 \rceil}$  and  $a^0 = a_{\lceil n/2 \rceil - 1}, \dots, a_0$

Compute  $b^1$  and  $b^0$  from  $b$

$x = a^1 + a^0$  and  $y = b^1 + b^0$

Let  $p = \text{Mult}(x, y)$ ,  $D = \text{Mult}(a^1, b^1)$ ,  $E = \text{Mult}(a^0, b^0)$

$F = p - D - E$

return  $D \cdot 2^{2\lceil n/2 \rceil} + F \cdot 2^{\lceil n/2 \rceil} + E$

$$T(1) \leq c$$

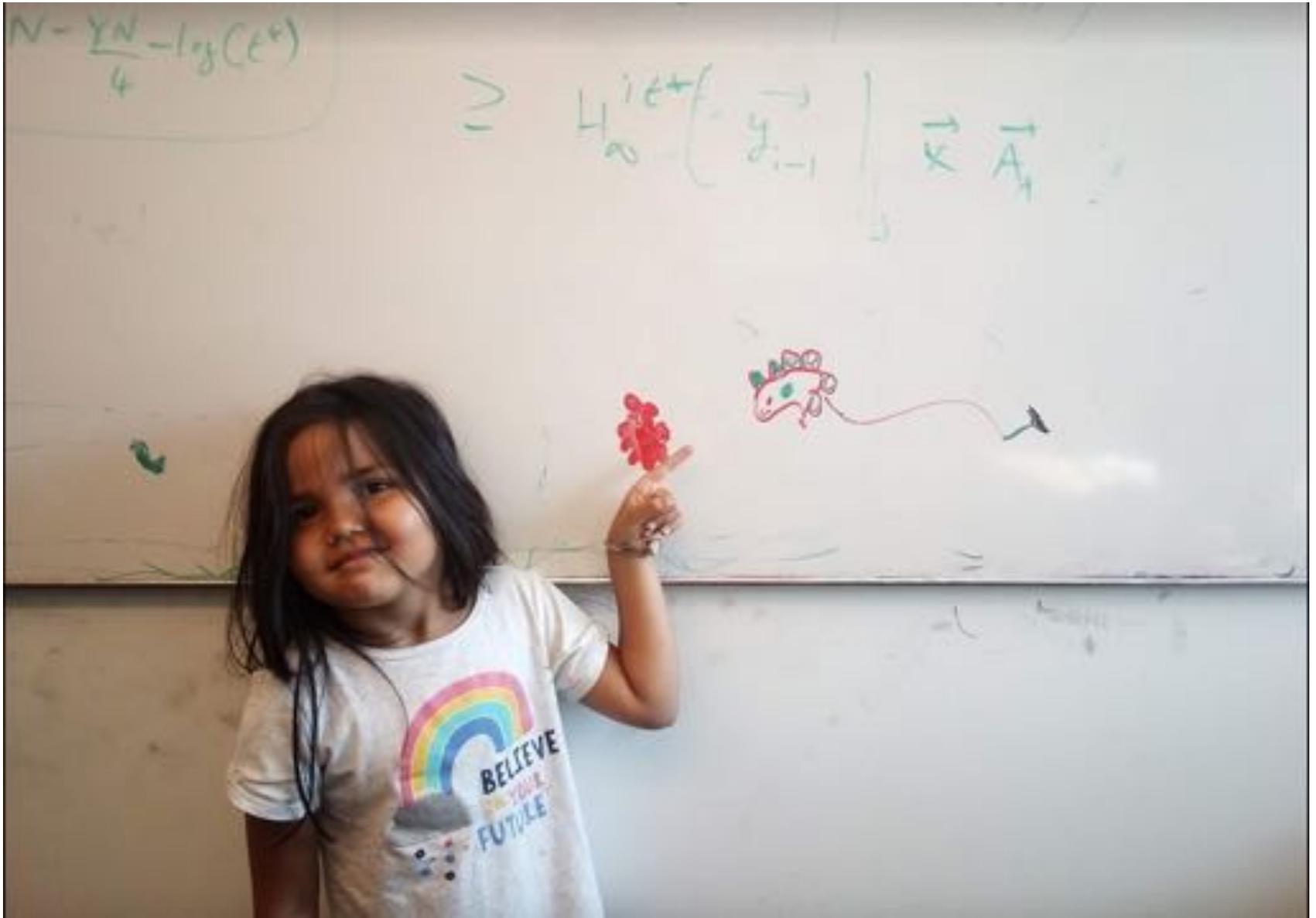
$$T(n) \leq 3T(n/2) + cn$$

$O(n^{\log_2 3}) = O(n^{1.59})$   
run time

All **green** operations  
are  $O(n)$  time

$$a \cdot b = a^1 b^1 \cdot 2^{2\lceil n/2 \rceil} + ((a^1 + a^0)(b^1 + b^0) - a^1 b^1 - a^0 b^0) \cdot 2^{\lceil n/2 \rceil} + a^0 b^0$$

# Questions/Comments?

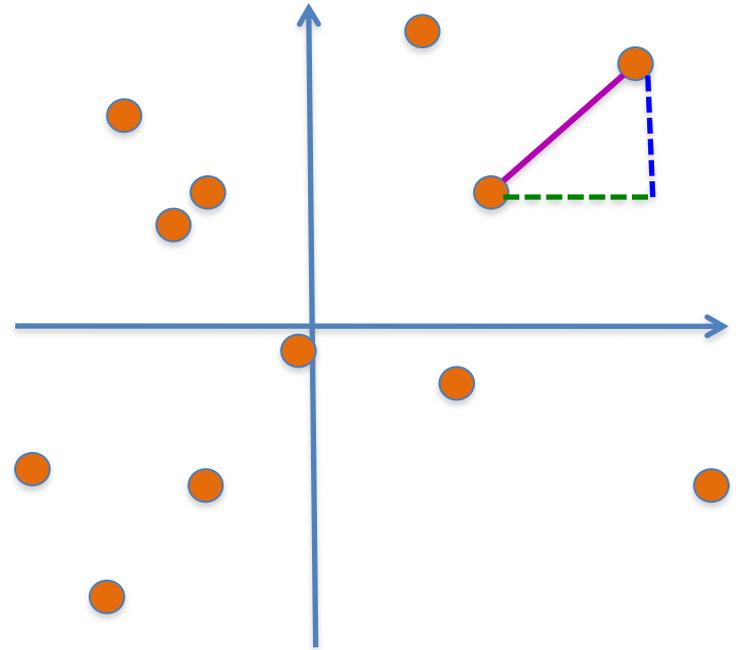


# Closest pairs of points

Input:  $n$  2-D points  $P = \{p_1, \dots, p_n\}$ ;  $p_i = (x_i, y_i)$

$$d(p_i, p_j) = ((x_i - x_j)^2 + (y_i - y_j)^2)^{1/2}$$

Output: Points  $p$  and  $q$  that are closest



# Group Talk time

$O(n^2)$  time algorithm?

1-D problem in time  $O(n \log n)$  ?

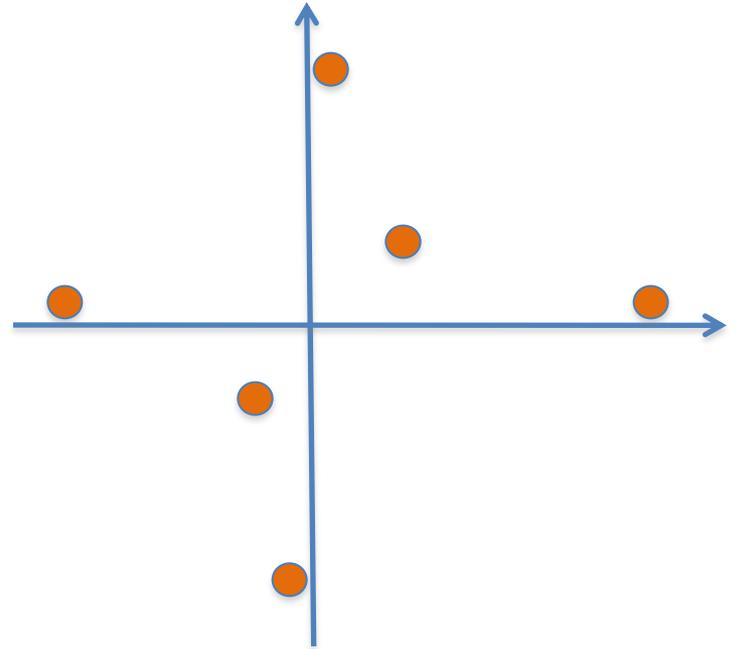


# Sorting to rescue in 2-D?

Pick pairs of points closest in **x** co-ordinate

Pick pairs of points closest in **y** co-ordinate

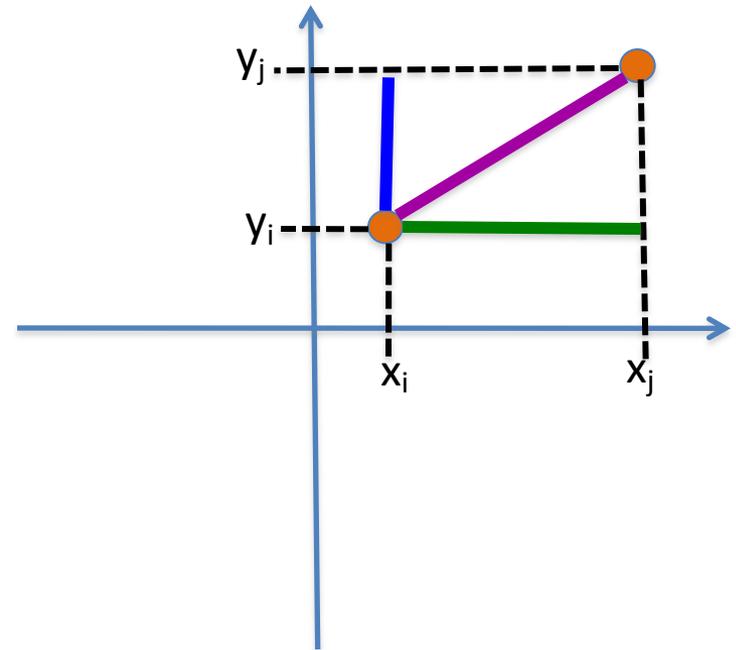
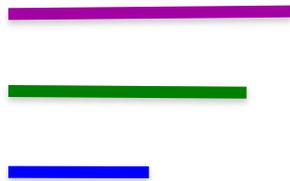
Choose the better of the two



# A property of Euclidean distance



$$d(p_i, p_j) = ((x_i - x_j)^2 + (y_i - y_j)^2)^{1/2}$$



The **distance** is larger than the **x** or **y**-coord difference



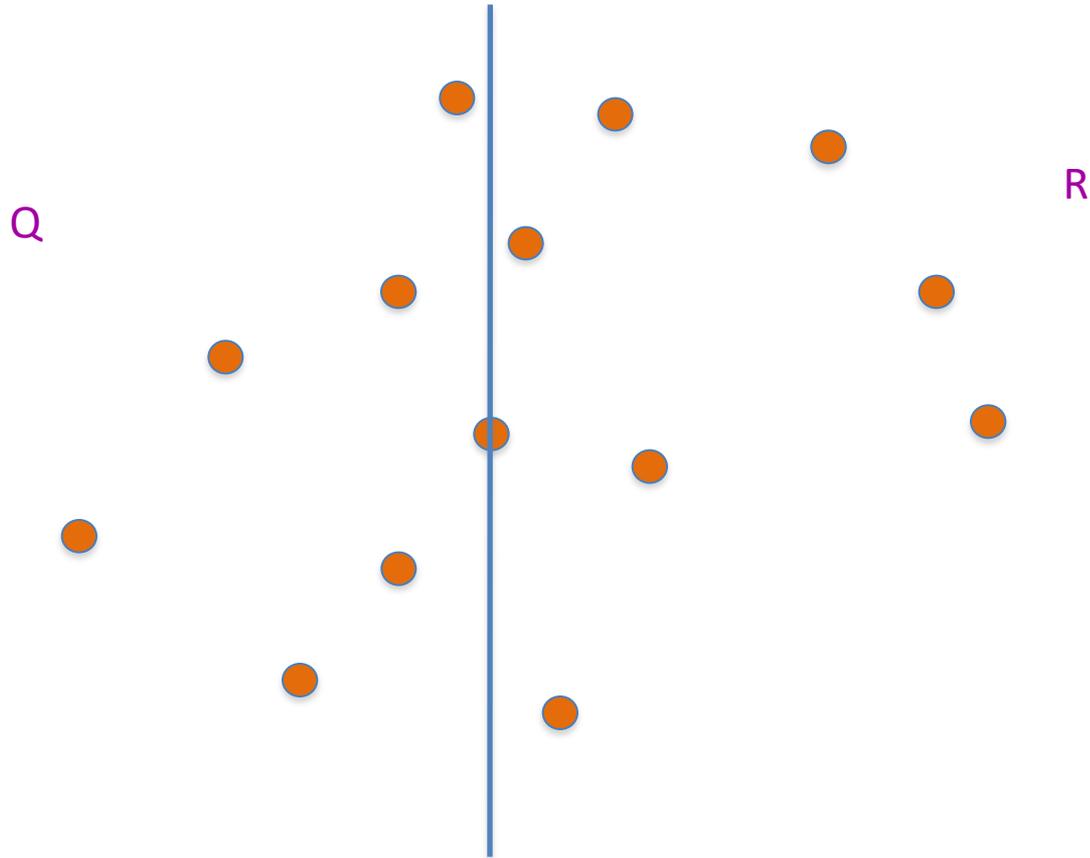
# Problem definition on the board...



# Rest of Today's agenda

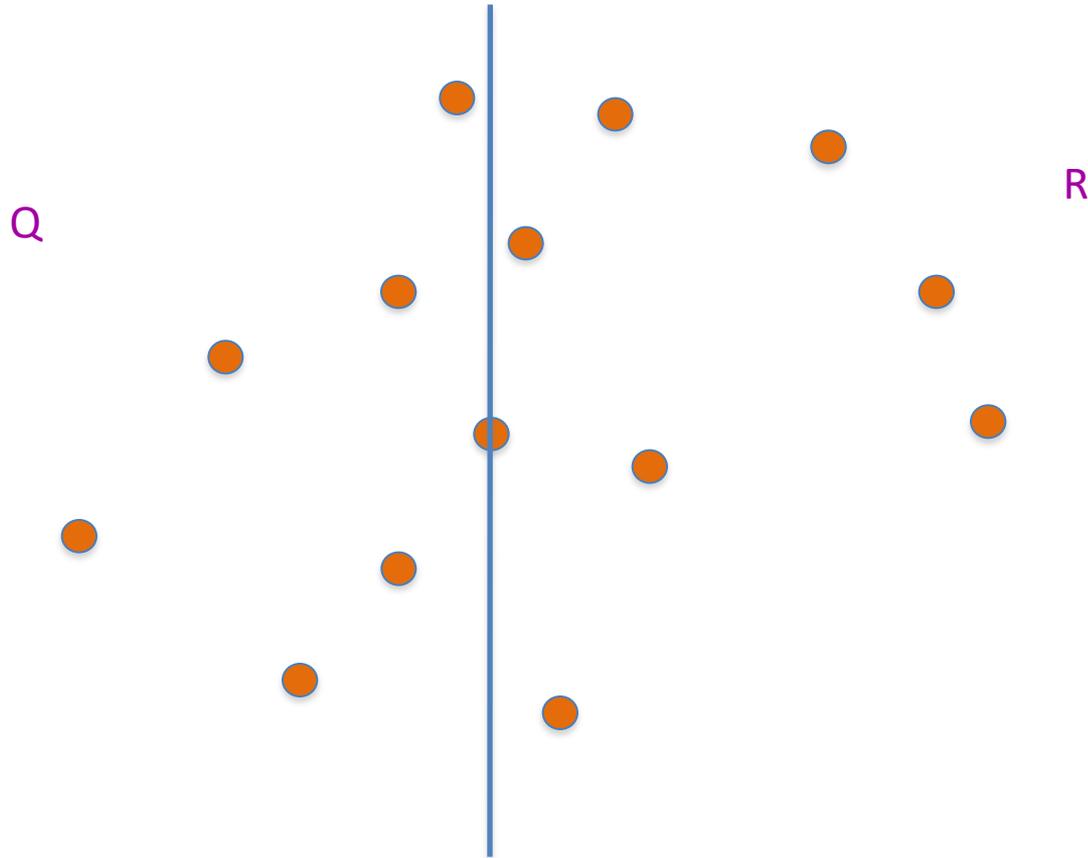
Divide and Conquer based algorithm

# Dividing up P



First  $n/2$  points according to the  $x$ -coord

# Recursively find closest pairs



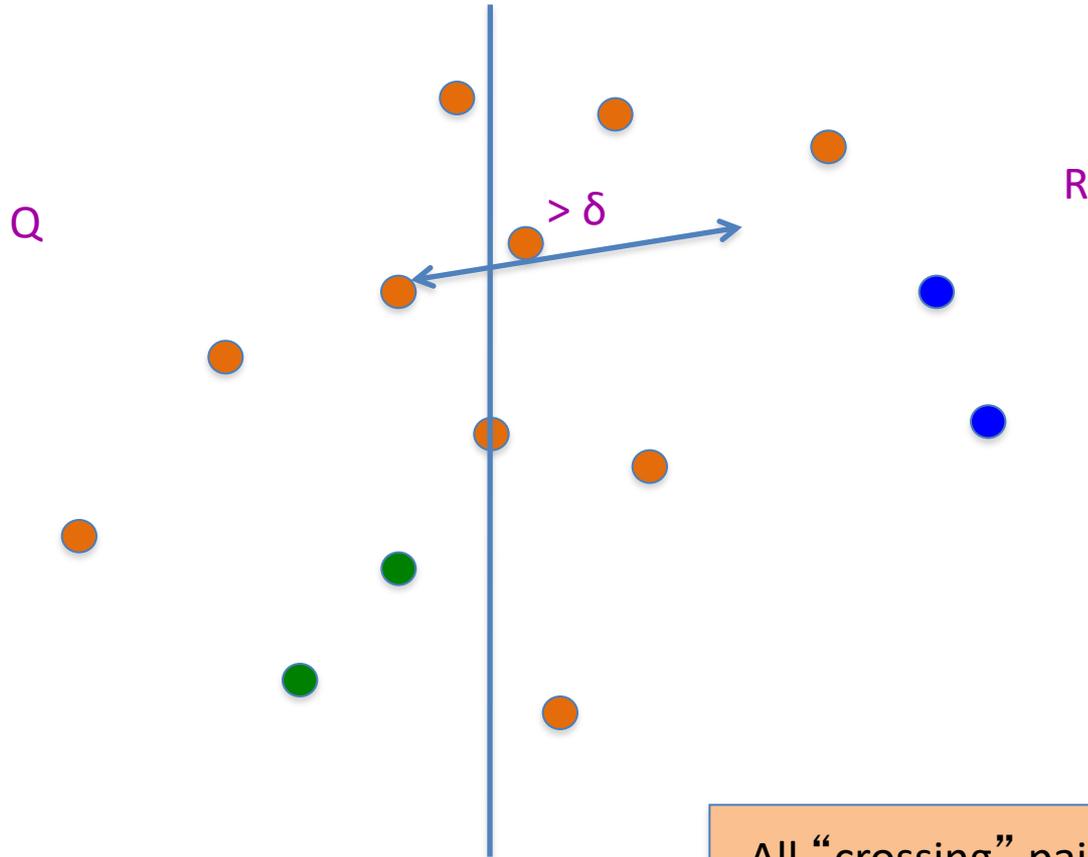
$$\delta = \min(\text{blue}, \text{green})$$

# An aside: maintain sorted lists

$P_x$  and  $P_y$  are  $P$  sorted by  $x$ -coord and  $y$ -coord

$Q_x, Q_y, R_x, R_y$  can be computed from  $P_x$  and  $P_y$  in  $O(n)$  time

# An easy case

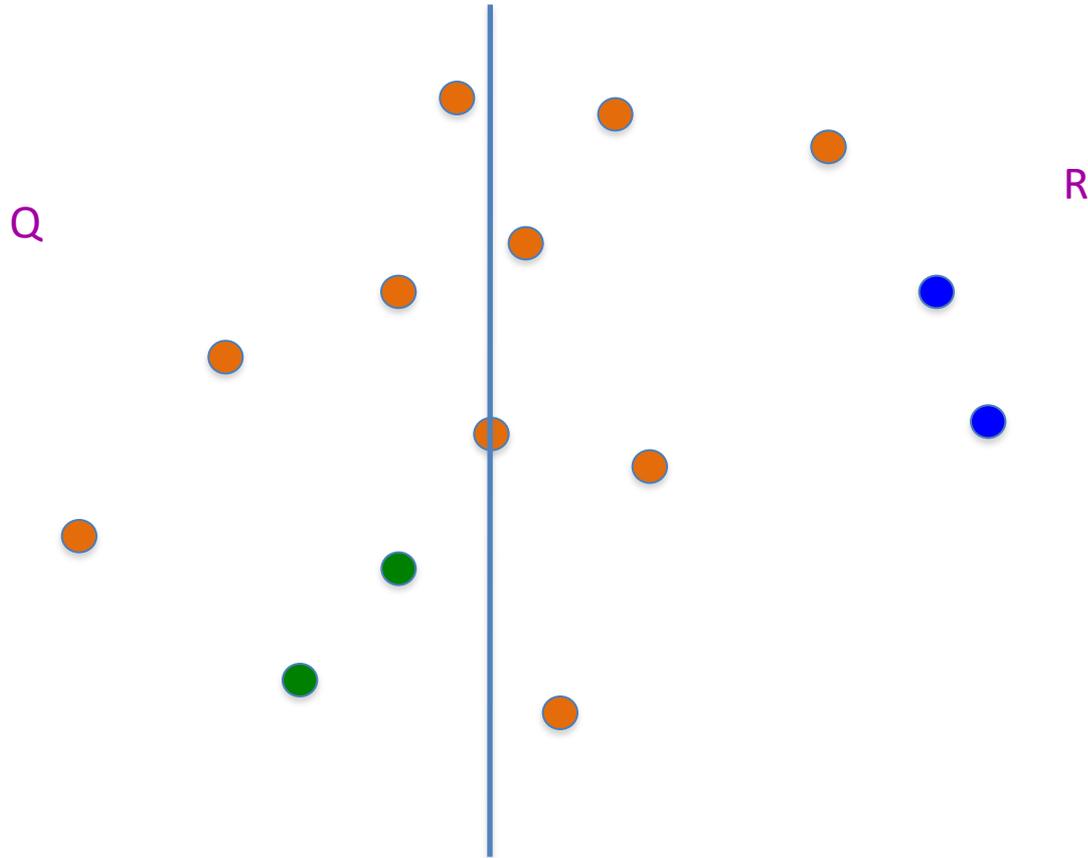


All “crossing” pairs have distance  $> \delta$

$\delta = \min(\text{blue}, \text{green})$



# Life is not so easy though



$$\delta = \min(\text{blue}, \text{green})$$