

COL 351:

Analysis and Design of Algorithms

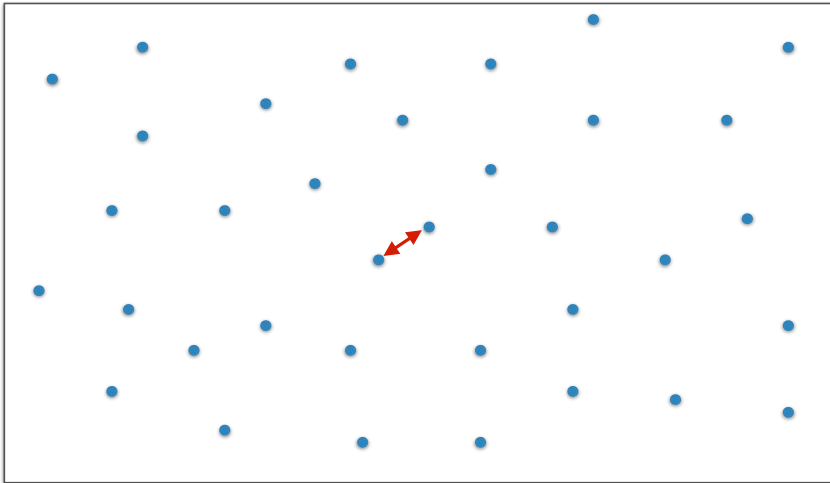
Lecture 25

Closest Pair of Points (or Minimum pairwise distance)

Given: A set P of n points in x-y plane.

Output: A pair of points in P at minimum distance, or $\min_{a \neq b \in P} \text{distance}(a, b)$.

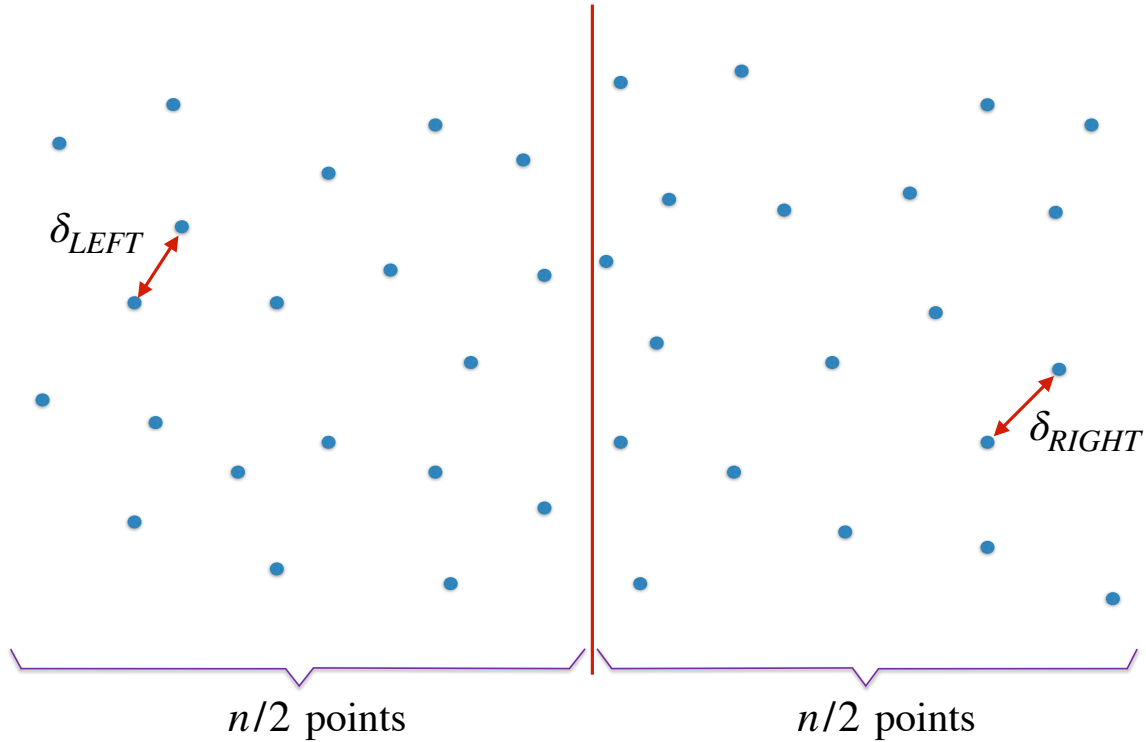
Example:



TRIVIAL : $O(n^2)$

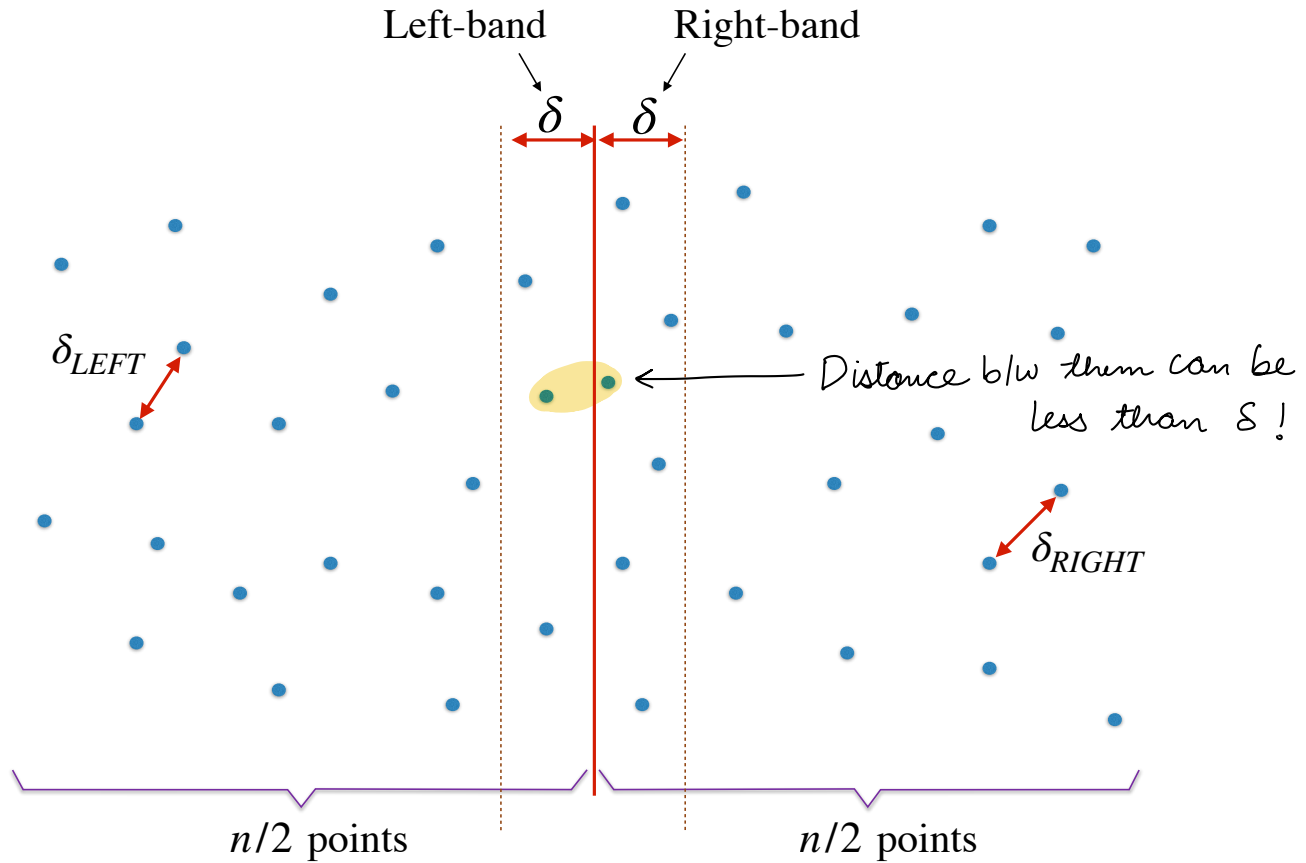
Divide and Conquer (Divide step)

Time to divide
= Time to find Median
= $O(n)$



$$\delta = \min(\delta_{LEFT}, \delta_{RIGHT})$$

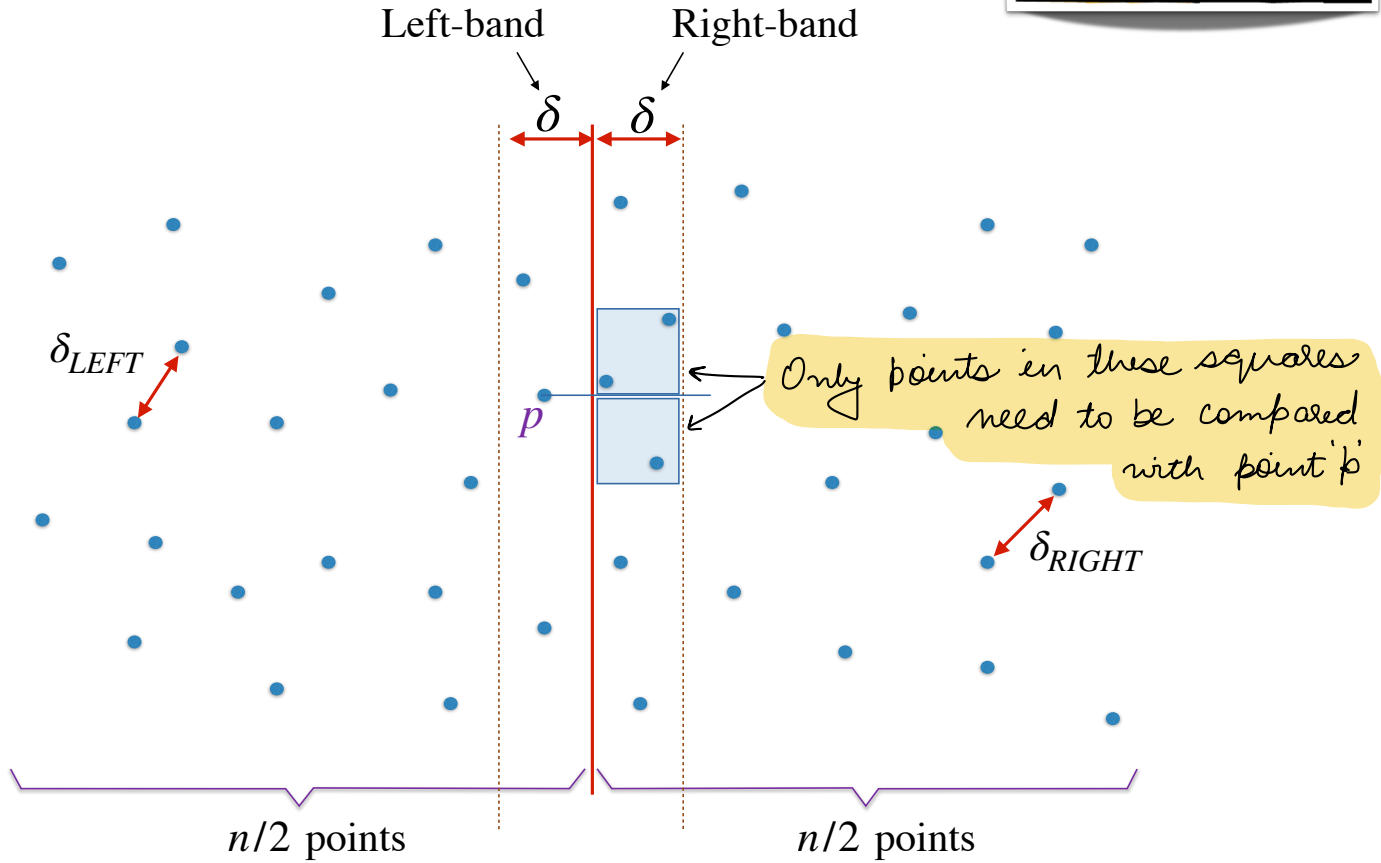
Divide and Conquer



$$\delta = \min(\delta_{LEFT}, \delta_{RIGHT})$$

Divide and Conquer

Both squares contain
at most 4 points

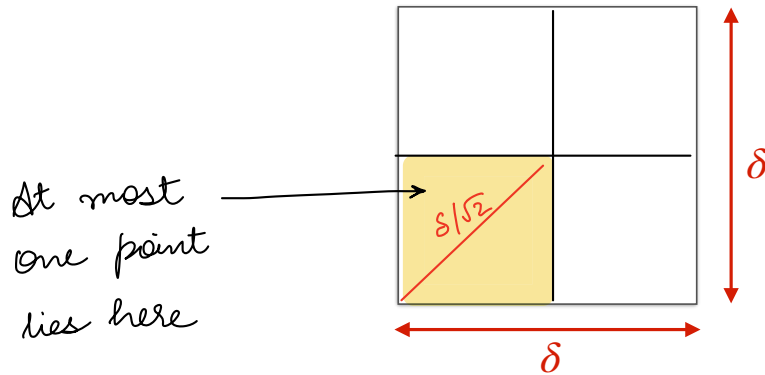


$$\delta = \min(\delta_{LEFT}, \delta_{RIGHT})$$

Subproblem

Given: A square satisfying all points in it are separated by distance at least δ .

Ques: How many points can lie in interior of square?



Ans: 4

Divide and Conquer

COMBINED
BAND

All squares contain
in total 16 points!

Left-band Right-band

δ δ

δ_{LEFT}

δ_{RIGHT}

p

$n/2$ points

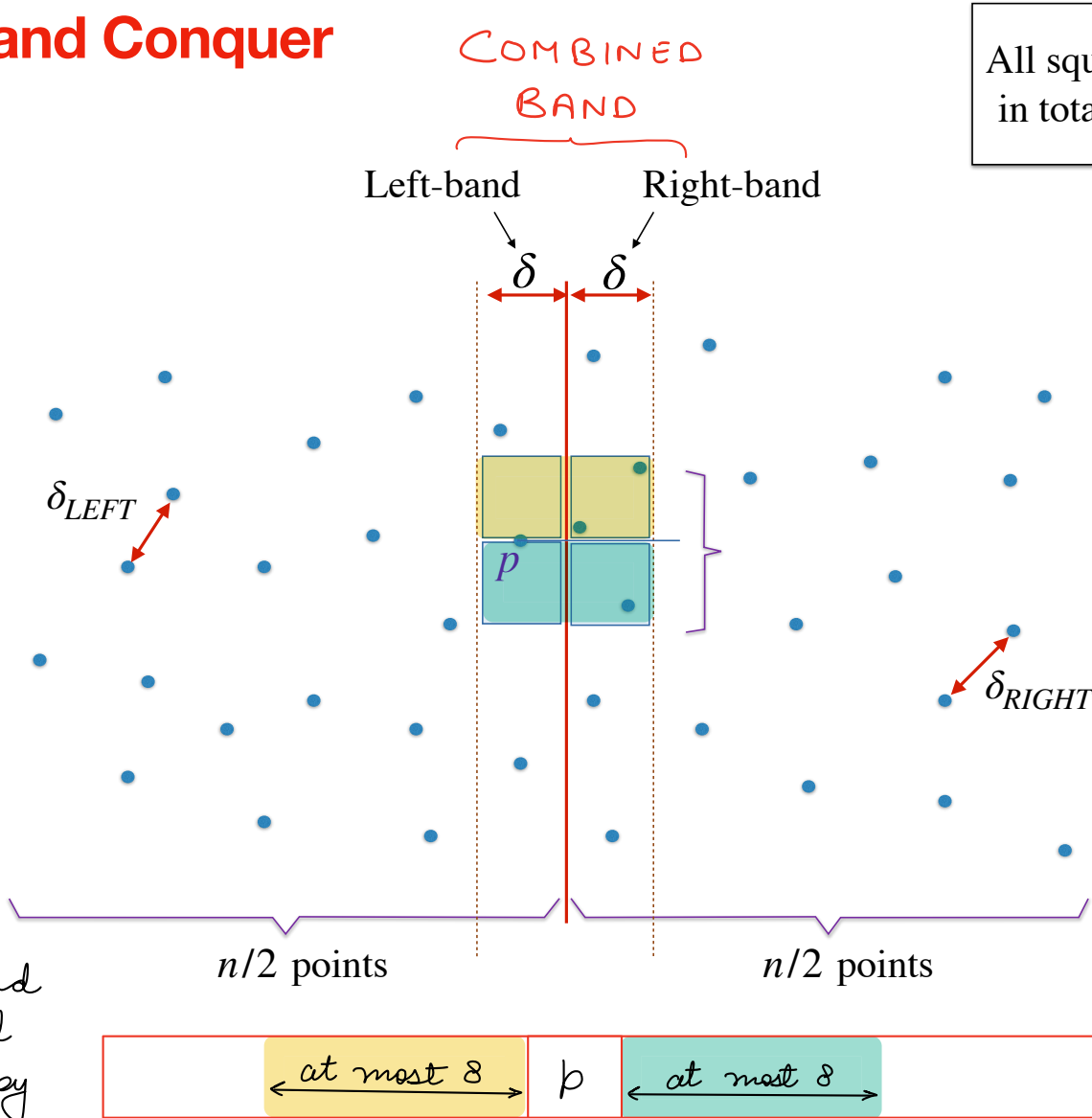
$n/2$ points

Combined
Band
sorted by
"y"

at most 8

p

at most 8



Algorithm

$$T(n) = \underbrace{O(n)}_{\text{Divide}} + \underbrace{2 T(n/2)}_{\text{Sub problems}} + \underbrace{O(n \log n)}_{\text{Combine}}$$

MinPairwiseDistance(P)

1. **If** ($|P| = 1$) return ∞
2. x_{MED} = Median of points in P according to x-coordinate
3. (P_{LEFT}, P_{RIGHT}) = Partition of P by x_{MED}
4. δ_{LEFT} = MinPairwiseDistance(P_{LEFT})
5. δ_{RIGHT} = MinPairwiseDistance(P_{RIGHT})
6. $\delta = \min(\delta_{LEFT}, \delta_{RIGHT})$
7. L-band = δ -length band of P_{LEFT}
8. R-band = δ -length band of P_{RIGHT}
9. C = Points in (L-band \cup R-band) sorted w.r.t. to y-coordinate .
10. **ForEach** ($p \in C$):
 - $C(p)$ = Points in C whose y-coordinate differ from that of p by at most δ .
 - δ_p = minimum distance b/w p and points in $C(p)$.
 - If** ($\delta_p < \delta$): $\delta = \delta_p$
11. Return δ

Can be improved to $O(n)$

$C(p)$ is subset of at most
← 8 predecessors and 8 successors
of p in ' C '

when points are
sorted by y coordinate

**Recurrence relation is $T(n) = 2T(n/2) + cn$,
but why?**

During preprocessing we can sort points by y-coordinate

This will give us an $O(n \log n)$ term overall.

Minimum pairwise distance

Result: Given a set P of n points in x-y plane, we can compute $\min_{a \neq b \in P} \text{distance}(a, b)$ in $O(n \log n)$ time.

Ques: Can you get $O(n \log_2(n))$ bound

without using Median finding algorithm?

Yes! During preprocessing we can sort according to

x coordinate as well.

Randomized Quick Sort

RandQuickSort(L)

x = Random element of list L ;

Initialise $L1$ and $L2$ to be empty lists;

For each ($y \in L \setminus x$):

 If ($y \leq x$) : $L1.append(y)$;

 If ($y > x$) : $L2.append(y)$;

Return $RandQuickSort(L1) \circ x \circ RandQuickSort(L2)$;

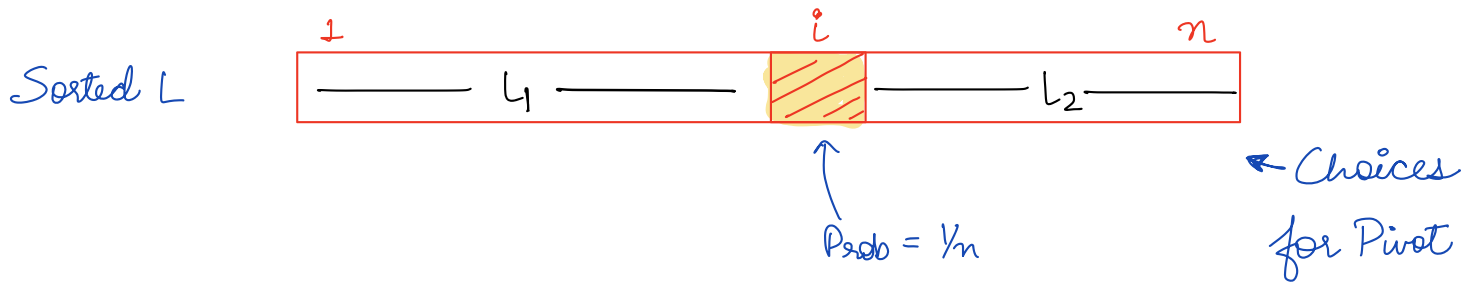
$T(n) :=$ Expected time to sort n elements



How to bound
 $T(n)$?

$$T(n) = \frac{1}{n} \sum_{i=1}^n \left(T(i-1) + T(n-i) \right) + cn$$

To show:
 $T(n) \leq dn \log_2 n$



If Pivot has rank i then

$$\text{size}(L_1) = i - 1$$

$$\text{size}(L_2) = n - i$$

$$T(n) = \frac{1}{n} \sum_{i=1}^n \left(T(i-1) + T(n-i) \right) + cn$$

To show:

$$T(n) \leq dn \log_2 n$$

How to ANALYZE ?

Hint :

$$T(i) \leq i \log(n/2) \quad \text{for} \quad i \leq n/2$$

$$T(i) \leq i \log(n) \quad \text{for} \quad n/2 < i \leq \frac{n}{2}$$

$$T(n) = \frac{1}{n} \sum_{i=1}^n \left(T(i-1) + T(n-i) \right) + cn$$

To show:
 $T(n) \leq dn \log_2 n$

$$= \frac{2}{n} \left(\sum_{i=1}^n T(i-1) \right) + cn$$

$$= \frac{2d}{n} \left(\sum_{i=1}^{n/2} T(i-1) + \sum_{i=\frac{n}{2}+1}^n T(i-1) \right) + cn$$

$$\leq \frac{2d}{n} \left(\sum_{i=1}^{n/2} (i-1) \underbrace{\log_2(n/2)}_{\log_2(n) - 1} + \sum_{i=\frac{n}{2}+1}^n (i-1) \log_2 n \right) + cn$$

$$= \frac{2d}{n} \left(\sum_{i=1}^n (i-1) \log_2 n - \sum_{i=1}^{n/2} (i-1) \right) + cn$$

$$= \frac{2d}{n} \frac{(n-1)(n)}{2} \log_2(n) - \frac{2d}{n} \frac{n}{2} \frac{(n-2)}{4} + cn$$

$$\underbrace{\hspace{10em}} \leq dn \log_2(n) \quad \text{for } d=4c.$$