

COL 758: Advanced Algorithms

Lecture 14

Randomized Incremental Construction

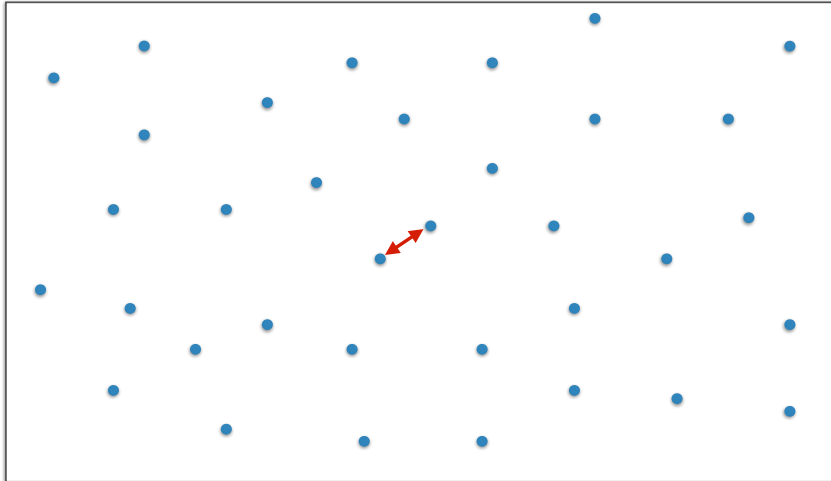
Minimum pairwise distance

Closest Pair of Points (or Minimum pairwise distance)

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

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

Example:



Deterministic algorithm
(COL 351):

- $O(n \log n)$: Divide and Conquer algorithm

Randomized algorithm:

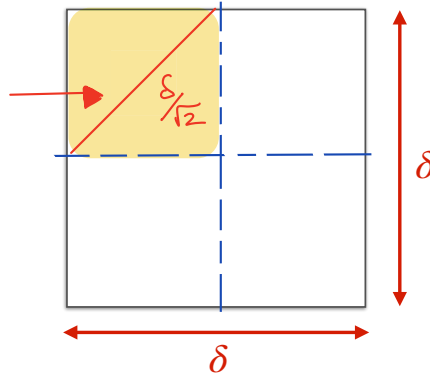
- $O(n)$: Randomized Incremental Construction

Subproblem

Given: A set S of points in x - y plane satisfying $\min_{\substack{(a,b) \in S \times S \\ a \neq b}} \text{distance}(a,b) \geq \delta$

Question: What is the maximum number of points that can fit in a square of size $\delta \times \delta$? *Ans: (≤ 4)*

*At most one point
can lie in this
square*



Randomized Algorithm: Main Idea

Notations:

- S : Input set of n points
- $(p_1, \dots, p_n)$: Random permutation of points in S
- S_i : Set of first i points, i.e. $(p_1, \dots, p_i)$
- δ_i : Minimum distance between points in set S_i

Question: What is probability that $\delta_i \neq \delta_{i-1}$?

Answer: $\leq 2/i$

Solution: Let a, b be a pair of points at least distance in set S_i .

$S_i \not\subset S_{i-1}$, that is, $\text{min-dist}(S_i) \not\subset \text{min-dist}(S_{i-1})$
only if point $p_i = a$ or $p_i = b$.

Now, $\text{Prob}(p_i = a \text{ or } p_i = b) = \frac{2}{|S_i|} = \frac{2}{i}$, so answer is $\leq 2/i$

Randomized Algorithm

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

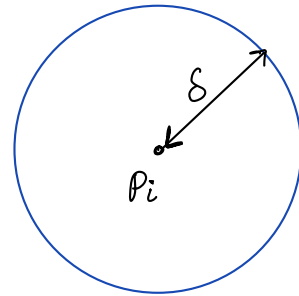
Output: A pair of points in S at minimum distance, or $\min_{a \neq b \in S} \text{distance}(a, b)$.

Algorithm

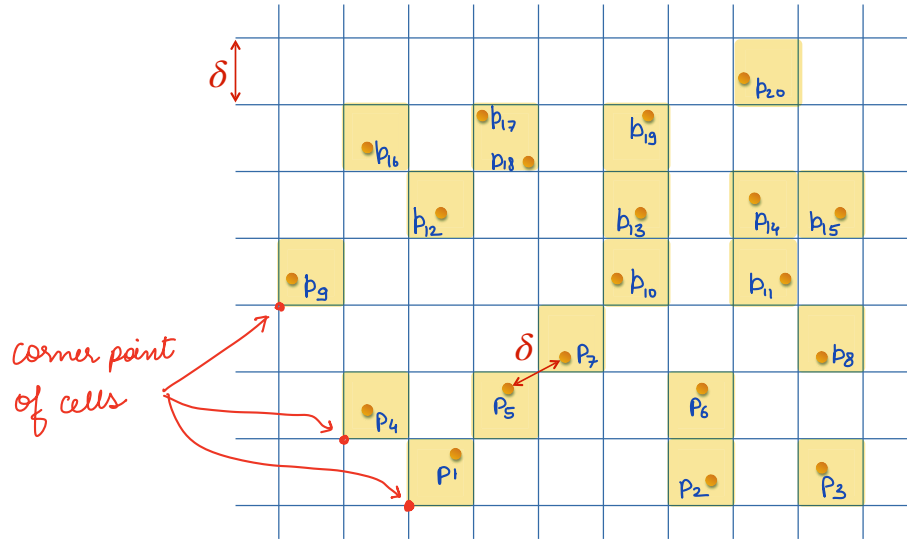
1. Let $P = (p_1, \dots, p_n)$ be a random permutation of the n points.
2. Initialize $\delta = \text{distance}(p_1, p_2)$.
3. **For** ($i = 3$ to n):
 Add point p_i , and update the minimum-distance δ .

Question: How to quickly detect if there is a change in δ on insertion of point " p_i " ?

Observation: If $\delta = \text{min-dist}(S_{i-1})$, i.e. δ is minimum distance encountered till now, then on addition of p_i the min-distance decreases iff $S_{i-1} \cap \text{Ball}(p_i, \text{radius} = \delta)$ is not $\emptyset$.



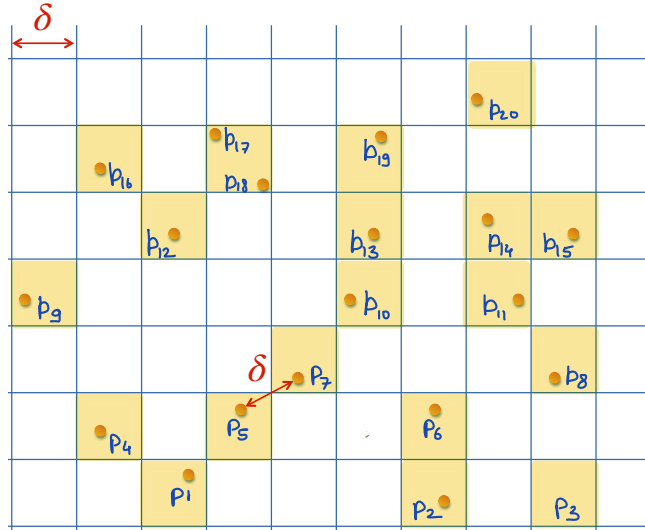
Detecting if there is a change in δ on insertion of new point :



Note : We can store
in Balanced BST structure
corner points of all the
cells containing one
or more points.

Make a grid of size δ containing “all points considered till now”

Grid Data Structure (using Balanced BST)



- **Build-Grid(S_i, δ):**

Build grid for S_i with parameter δ .

- **Find-Cell(p):** (search coordinate $\frac{x}{\delta}, \frac{y}{\delta}$)
Find the cell in which p belongs.

- **Report-Points-in-Cell(c):** (at most 4 pointers)
Report all points in cell c .

- **Insert-Point(p):**
Insert point p .

$O(\log n)$

$O(|S_i| \log n)$

Grid Data Structure

	Height Balanced Binary search tree	Dynamic Hashing
Find-Cell(p)	$O(\log n)$	$O(1)$
Report-Points-in-Cell(c)	$O(\log n)$	$O(1)$
Insert-Point(p)	$O(\log n)$	$O(1)$ expected
Build-Grid(S_i, δ)	$O(S_i \cdot \log n)$	$O(S_i)$ expected

Randomized Algorithm

Algorithm

1. Let $P = (p_1, \dots, p_n)$ be a random permutation of the n points.
2. Initialize $\delta = \text{distance}(p_1, p_2)$.
3. Build-Grid($\{p_1, p_2\}, \delta$)
4. For ($i = 3$ to n):

/* Add point p_i and update the minimum-distance δ . */

(i) Let $c = \text{Find-Cell}(p_i)$. *- If $p_i = (x_i, y_i)$ then search $(\frac{x_i}{\delta}, \frac{y_i}{\delta})$*

(ii) Compare distance of p_i from all point in c , and its neighbouring cells.

(we use function Report-Points-in-Cell).

(iii) If (δ is not updated) then Insert-Point(p_i).

Else Build-Grid($\{p_1, \dots, p_i\}, \delta$).

*At most 9 non-empty cells,
so at most 36 points*

Randomized Algorithm (using dynamic hashing data-structure)

Algorithm

1. Let $P = (p_1, \dots, p_n)$ be a random permutation of the n points.
2. Initialize $\delta = \text{distance}(p_1, p_2)$.
3. Build-Grid($\{p_1, p_2\}, \delta$)
4. For ($i = 3$ to n):
 - /* Add point p_i and update the minimum-distance δ .*/
 - (i) Let $c = \text{Find-Cell}(p_i)$. — $O(1)$
 - (ii) Compare distance of p_i from all point in c , and its neighbouring cells. — $O(1)$
(we use function Report-Points-in-Cell).
 - (iii) If (δ is not updated) then Insert-Point(p_i). — $O(1)$
Else Build-Grid($\{p_1, \dots, p_i\}, \delta$). — $O(i)$

Expected Time Complexity of i^{th} iteration

$$\text{Expected time complexity of Round } i = O(1) + O(i) * \text{Prob}(S_i < S_{i-1})$$

$$\leq O(1) + O(i) * \frac{2}{i} = O(1)$$

Thus, expected time complexity of algorithm is $O(n)$.