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## Closest Pair Problem

Input: Set of points $S$ in the plane
Output: The closest pair of points in $S$ $\qquad$
Naïve Solution: $O\left(n^{2}\right)$ time
Divide-\&-Conquer:

- $T(n)=2 T(n / 2)+M(n)$
- $M(n)=$ time to merge solutions to the two subproblems
- Only need to merge two strips on either side of vertical split
- Naïve Solutions: $M(n)=O\left(n^{2}\right)$
- Sort the points by $y$-coordinate: $M(n)=O(n l o g n)$
- Global sorting at the start: $M(n)=O(n)$

Lower Bound: $O(n \operatorname{logn})$ time
Randomized Algorithmion $\mathrm{O}_{\mathrm{on}}(n)$ time [Rabin]

## Post Office Problem

Preprocess: Given set $S$ of points in the plane representing post offices.
Input: Query point p.
Output: Report the closest post office to $p$.

## 1-d Post Office Problem

Preprocessing: Build balanced BST on S.

- O(nlogn)
- Alternatively, build a sorted array on S.

Query Algorithm: Given a value $p$, identify the smallest value larger than $p$ and the largest value smaller than $p$ and among the two pick the one that is closest to $p$.

- O(log $n$ )

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## 2-d $\mathrm{L}_{\infty}$ Post Office Problem

- $L_{p}=\left(\left(\left|a_{x}-b_{x}\right|\right)^{p}+\left(\left|a_{y}-b_{y}\right|\right)^{p}\right)^{1 / p}$
- $L_{2}=$ Euclidean distance
- $L_{\infty}=\max \left\{\left|a_{x}-b_{x}\right|,\left|a_{y}-b_{y}\right|\right\}$

Preprocessing: Build Range Tree on $S$.

- O(nlogn)

Query Algorithm: Given a value p, identify the closest point to the right of $p$ and the closest point to the left of $p$ and among the two pick the one that is closest to $p$.

- O(llog $n$ )

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## 2-D Range Tree

Build the $X$-Tree, a balanced binary search tree on set $S$ using the $x$-coordinates of the points. $\qquad$
For each node in the $X$-Tree, build a $Y$-Tree, a balanced binary search tree on the set of points in $\qquad$ the subtree of that node using the $y$-coordinates of the points.
Application: Output all points with $x$-coordinates in range $[A, B]$ and $y$-coordinates in range $[C, D]$.
Application: Post office problem

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| Good Network Design |
| :--- |
| - Small size |
| - Small weight |
| - Small degree |
| - Small diameter |
| - Highly connected, highly fault-tolerant |
| - Planar, low genus |
| Small load factor |
| SMALL DILATION |
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## Application of Geometric Spanners

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Network Design - Transportation, Communication $\qquad$
Distributed Algorithms - Synchronizers $\qquad$
Graphics - Model Simplification
Pattern Recognition - Approx. Neares $\dagger$ $\qquad$
Neighbors
Robotics - Approximate Shortest Path $\qquad$ Problems

Approximation Algorithm design [Rao and Smith]

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## Design of t-Spanners

## - Theta graphs

[Clarkson 87, Keil 88, Althofer et al. 93]

- Greedy algorithms
[Bern 89, Althofer et al. 93]
- Well-separated pair decomposition $\qquad$
[Callahan \& Kosaraju 95]
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## Well-Separated Pair Decomposition

Definition: [Callahan and Kosaraju, 95]
Given a set, $S$, of $n$ points in $R^{d}$, and $s>0$, a WSPD is sequence of pairs of subsets of $S$,

$$
\left\{A_{1}, B_{1}\right\}, \ldots,\left\{A_{m}, B_{m}\right\} \text {, s.t. }
$$

1. Every pair of vertices $\{p, q\}$ is in exactly one pair of the decomposition.
2. $A_{i}$ and $B_{i}$ are well-separated for each $i=1, \ldots, m$
3. $m=O(n)$
4. The decomposition can be computed in $O(n \log n)$ time.

| $t$-Spanner Construction Using WSPD |
| :--- |
| [Arya, Das, Mount, Salowe, Smid, 95] |
| 1. Compute a WSPD with $s=(4 t+4) /(t-1)$ |
| 2. For each well-separated pair $\left(A_{i}, B_{i}\right)$ |
| add an arbitrary edge between $A_{i}$ and $B_{i}$. |
| 3. Pruning Step: Remove unnecessary edges. |
| Analysis |
| Stretch factor $=t$ |
| Max degree $=O(1)$ |
| Total weight $=O(1)$ wt(MST) |
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## Theorem

Given a set $S$ of $n$ sites in $R^{d}$, and a real number $t>1$, there exists an efficient algorithm to construct a network $G$ such that:

- $+(G) \leq \dagger$,
${ }^{*} w t(G)=O(1) \cdot w t(M S T)$, and
"maximum degree of $G$ is $O(1)$
[Gudmundsson, Levcopoulos, Narasimhan 00]

| Comparison of Spanner Construction Methods |
| :--- |
| - Theta Graphs: O(nlogn) time, O(n) space |
| [Arya, Das, Mount, Salowe, Smid 95] |
| WSPD Spanners: O(nlogn) time, $O(n)$ space |
| [Callahan \& Kosaraju 95] |
| Greedy Algorithms: Low weight guarantees |
| O(nlogn) time, O(n) space, O(1) wt(MST) weight |
| [Das, Heffernan, Narasimhan, Salowe 93, 94, 95, |
| Gudmundsson, Levcopoulos, Narasimhan '00] |
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## Algorithm NewGREEDY(G=(V, E),t)

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Sort $E$ by non-decreasing weights
Initialize $G^{\prime}\left(V, E^{\prime}\right)$ to be empty
for each edge $e=(u, v) \in E$ do
if $\left(d_{G}(u, v)>t(1+\varepsilon)^{*} w t(e)\right)$ then
Add edge e to $E^{\prime}$
output $G^{\prime} \quad$
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Computing Stretch Factors $\qquad$
Input: A geometric graph $N$ on a set $S$ of $n$ sites Output: Compute the stretch factor of N . $\qquad$
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$\quad$ Approximate Stretch Factors

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## $\varepsilon$-APPROXIMATION ALGORITHM

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Step 1: Using separation constant $s=4(2+\varepsilon) / \varepsilon$ Compute a WSPD: $\left(A_{1}, B_{1}\right), \ldots,\left(A_{m}, B_{m}\right)$
Step 2: For every well-separated pair ( $A_{i}, B_{i}$ ) pick an arbitrary pair of vertices $\left(a_{i}, b_{i}\right)$ such that
$\qquad$ $a_{i} \in A_{i}, b_{i} \in B_{i}$.

## Step 3: Return

$\max _{i}\left\{d_{N}\left(a_{i}, b_{i}\right) /\left|a_{i} b_{i}\right|\right\}$
[Narasimhan \& Smid '00]
[Trivial Exact Algorithm using APSP]

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## Approximate Stretch Factors

PATH NETWORKS
$O$ (nlogn)
CYCLE NETWORKS
$O(n \operatorname{logn})$
TREE NETWORK
O(nlogn)

- PLANAR NETWORKS

O(nlogn)

- ARBITRARY NETWORKS
$O(m+n \log n)$ [(1+e)-approx]

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| GEOMETRIC ANALYSIS |
| :--- |
| Input: Set S of $n$ sites; Set E of edges joining sites: |
| Property P Satisfied by E |
| Output: wt(E) s ?? |$\quad$| Theta Graph Property [Clarkson, Keil] |
| :--- |
| Diamond Property [Das] |
| Gap Property [Das, Narasimhan] |
| Leapfrog Property [Das, Narasimhan] |
| Isolation Property [Das, Narasimhan] |

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Spanner Networks with other Properties
Fault-Tolerance [Narasimhan, Smid]
Small Degree
[Soares, Salowe, Das, Heffernan, Arya et al.]
Small Diameter [Arya et al.]
Bottleneck Spanners [Narasimhan, Smid]
Steiner Spanners - "Banyans" [Rao, Smith]
Tree Spanners \& Planar Spanners [Arikati et al.]
Probabilistic Embeddings [Bartal]
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| Experiments with Spanners <br> WSPD-based spanners followed by (approximate) greedy algorithm <br> [Narasimhan \& Zachariasen '00] |
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| Problem |
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| Preprocess a geometric spanner network so |
| that approximate shortest path lengths |
| between two query vertices can be reported |
| efficiently (using subquadratic space). |
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| Applications |
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| - Shortest path queries in polygonal domains |
| with obstacles. |
| - Approximate closest pair. |
| - |
| Computing approximate stretch factors of <br> geometric graphs. |
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