## CS 5633 -- Spring 2009

ALGORITHMS


## Range Trees

Carola Wenk
Slides courtesy of Charles Leiserson with small changes by Carola Wenk

## Orthogonal range searching

Input: $n$ points in $d$ dimensions

- E.g., representing a database of $n$ records each with $d$ numeric fields

Query: Axis-aligned box (in 2D, a rectangle)

- Report on the points inside the box:
- Are there any points?
- How many are there?
- List the points.



## Orthogonal range searching

Input: $n$ points in $d$ dimensions
Query: Axis-aligned box (in 2D, a rectangle)

- Report on the points inside the box

Goal: Preprocess points into a data structure to support fast queries

- Primary goal: Static data structure
- In 1D, we will also obtain a dynamic data structure supporting insert and delete



## 1D range searching

In 1 D , the query is an interval:

First solution:

- Sort the points and store them in an array
- Solve query by binary search on endpoints.
- Obtain a static structure that can list $k$ answers in a query in $\mathrm{O}(k+\log n)$ time.
Goal: Obtain a dynamic structure that can list $k$ answers in a query in $\mathrm{O}(k+\log n)$ time.


## $\therefore$ <br> 1D range searching

In 1D, the query is an interval:


New solution that extends to higher dimensions:

- Balanced binary search tree
- New organization principle: Store points in the leaves of the tree.
- Internal nodes store copies of the leaves to satisfy binary search property:
- Node $x$ stores in $k e y[x]$ the maximum key of any leaf in the left subtree of $x$. CS 5633 Analysis of Algorithms .

$k e y[x]$ is the maximum key of any leaf in the left subtree of $x$.
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## Pseudocode, part 1: <br> Find the split node

1D-RANGE-QUERY( $\left.T,\left[x_{1}, x_{2}\right]\right)$
$w \leftarrow \operatorname{root}[T]$
while $w$ is not a leaf and $\left(x_{2} \leq k e y[w]\right.$ or $\left.k e y[w]<x_{1}\right)$ do if $x_{2} \leq k e y[w]$
then $w \leftarrow l e f t[w]$
else $w \leftarrow \operatorname{right}[w]$
// $w$ is now the split node
[traverse left and right from $w$ and report relevant subtrees]

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Pseudocode, part 2: Traverse left and right from split node
1D-RANGE-QUERY( $\left.T,\left[x_{1}, x_{2}\right]\right)$
[find the split node]
// $w$ is now the split node
if $w$ is a leaf
then output the leaf $w$ if $x_{1} \leq k e y[w] \leq x_{2}$
else $v \leftarrow l e f t[w]$
// Left traversal
while $v$ is not a leaf
do if $x_{1} \leq k e y[v]$
then output the subtree rooted at $\operatorname{right}[v]$ Q
$v \leftarrow \operatorname{left}[v]$ else $v \leftarrow \operatorname{right}[v]$
output the leaf $v$ if $x_{1} \leq k e y[v] \leq x_{2}$
[symmetrically for right traversal]


## Analysis of 1D-Range-Query

Query time: Answer to range query represented by $\mathrm{O}(\log n)$ subtrees found in $\mathrm{O}(\log n)$ time.
Thus:

- Can test for points in interval in $\mathrm{O}(\log n)$ time.
- Can report all $k$ points in interval in $\mathrm{O}(\mathrm{k}+\log n)$ time.
- Can count points in interval in $\mathrm{O}(\log n)$ time

Space: $\mathrm{O}(n)$
Preprocessing time: $\mathrm{O}(n \log n)$



## 2D range trees

Store a primary 1D range tree for all the points based on $x$-coordinate.
Thus in $\mathrm{O}(\log n)$ time we can find $\mathrm{O}(\log n)$ subtrees representing the points with proper $x$-coordinate. How to restrict to points with proper $y$-coordinate?


## 2D range trees



Idea: In primary 1 D range tree of $x$-coordinate, every node stores a secondary 1D range tree based on $y$-coordinate for all points in the subtree of the node. Recursively search within each.


## 2D range tree example



## Analysis of 2D range trees

Query time: In $\mathrm{O}\left(\log ^{2} \mathrm{n}\right)=\mathrm{O}\left((\log n)^{2}\right)$ time, we can represent answer to range query by $\mathrm{O}\left(\log ^{2} n\right)$ subtrees. Total cost for reporting $k$ points: $\mathrm{O}\left(k+(\log n)^{2}\right)$.

Space: The secondary trees at each level of the primary tree together store a copy of the points. Also, each point is present in each secondary tree along the path from the leaf to the root. Either way, we obtain that the space is $\mathrm{O}(n \log n)$.
Preprocessing time: $\mathrm{O}(n \log n)$
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## $d$-dimensional range trees

Each node of the secondary $y$-structure stores a tertiary

$z$-structure representing the points in the subtree rooted at the node, etc.


Query time: $\mathrm{O}\left(k+\log ^{d} n\right)$ to report $k$ points. Space: $O\left(n \log ^{d-1} n\right)$
Preprocessing time: $\mathrm{O}\left(n \log ^{d-1} n\right)$

## Search in Subsets

Given: Two sorted arrays $A_{1}$ and $A$, with $A_{1} \subseteq A$
A query interval $[l, r]$
Task: Report all elements $e$ in $A_{1}$ and $A$ with $l \leq e \leq r$ Idea: Add pointers from $A$ to $A_{1}$ :
$\rightarrow$ For each $a \in A$ add a pointer to the
smallest element $b \in A_{1}$ with $b \geq a$
Query: Find $l \in A$, follow pointer to $A_{1}$. Both in $A$ and $A_{1}$ sequentially output all elements in $[l, r]$.

Query:
[15,40]


Runtime: $\mathrm{O}((\log n+k)+(1+k))=\mathrm{O}(\log n+k))$ 2/2609 CS 5633 Analysis of Algorithms 19

## Search in Subsets (cont.)

Given: Three sorted arrays $A_{1}, A_{2}$, and $A$, with $A_{1} \subseteq A$ and $A_{2} \subseteq A$
Query:


Runtime: $\mathrm{O}((\log n+k)+(1+k)+(1+k))=\mathrm{O}(\log n+k))$
Range trees:



## :nco $d$-dimensional range trees

Query time: $\mathrm{O}\left(k+\log ^{d-1} n\right)$ to report $k$ points, uses fractional cascading in the last dimension
Space: $O\left(n \log ^{d-1} n\right)$
Preprocessing time: $\mathrm{O}\left(n \log ^{d-1} n\right)$

Best data structure to date:
Query time: $\mathrm{O}\left(k+\log ^{d-1} n\right)$ to report $k$ points.
Space: $\mathrm{O}\left(n(\log n / \log \log n)^{d-1}\right)$
Preprocessing time: $\mathrm{O}\left(n \log ^{d-1} n\right)$

