# Spatial Index Structures (R-tree Family) 

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## Problem

- Given a collection of geometric objects (points, lines, polygons, ...)
- organize them on disk, to answer spatial queries (range, nn, etc)



## R-trees

- [Guttman 84] Main idea: extend B+-tree to multi-dimensional spaces!
- (only deal with Minimum Bounding Rectangles MBRs)



## R-trees

- A multi-way external memory tree
- Index nodes and data (leaf) nodes
- All leaf nodes appear on the same level
- Every node contains between $m$ and $M$ entries
- The root node has at least 2 entries (children)


## Example

- eg., w/ fanout 4: group nearby rectangles to parent MBRs; each group -> disk page



## Example

- $F=4$



## Example

- $\mathrm{F}=4$



## R-trees - format of nodes

- \{(MBR; obj_ptr)\} for leaf nodes



## R-trees - format of nodes

- \{(MBR; node_ptr)\} for non-leaf nodes




## Insertion Processes



## Processes of Quadratic Spiltt

 (page 52 in Guttman's paper [1])
## Pick first entry for each group Run PickSeeds



## Processes of Quadratic Spiltt (page 52 in Guttman's paper)

## PickSeeds <br> PS1 [Calculate inefficiency of grouping entries together]

For each pair of E1 and E2, compose a rectangle R including E1 and E2
Calculate $\mathrm{d}=\operatorname{area}(\mathrm{R})$ - area(E1) $-\operatorname{area}(\mathrm{E} 2)$
PS2 [Choose the most wasteful pair ]
Choose the pair with the largest d


## Processes of Quadratic Spiltt

(page 52 in Guttman's paper)


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## Processes of Quadratic Spiltt (page 52 in Guttman's paper)

Pick first entry for each group (PickSeeds)


PickNext
PN1 [Determine cost of putting each entry in each group] For each entry E
calculate $\mathrm{d} 1=$ the increased MBR area required for G1 calculate d2 = the increased MBR area required for G2 PN2 [Find entry with greatest preference for one group] Choose the entry with the maximum difference between d1 and d2


## Processes of Quadratic Spiltt

(page 52 in Guttman's paper)


## Processes of Quadratic Spiltt

(page 52 in Guttman's paper)

Pick first entry for each group (PickSeeds)
Select entry to assign (PickNext)

| G1 | G 2 |
| :---: | :---: |
| l | m |
| k |  |
|  |  |



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Pick first entry for each group (PickSeeds)
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| G1 | G 2 |
| :---: | :---: |
| l | m |
| k | X |
|  | j |
|  |  |
|  |  |



## Excercise

- $(m, M)=(2,4)$

- Build a R-Tree for these spatial data
- Hint: You could use the Spatial index structures demo application step by step


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## Search Object in R-Tree



## Overlap query in R-Tree

(find objects that overlap with Z)


## Main Drawbacks of R-Tree

- R-tree is not unique, rectangles depend on how objects are inserted and deleted from the tree.
- In order to search some object you might have to go through several rectangles or the whole database
- Why?
- Solution?


## $\mathrm{R}^{+}$-Tree

- Overcome problems with R-Tree
- If node overlaps with several rectangles insert the node in all
- Decompose the space into disjoint cells



## R+-Tree Properties

- R+-tree and cell-trees used approach of discomposing space into cells
- R+-trees deals with collection of objects bounded by rectangles
- Cell tree deals with collection of objects bounded by convex polyhedron
- R+-trees is extension of k-d-B-tree
- Retrieval times are smaller
- When summing the objects, needs eliminate duplicates
- Again, it is data-dependent


## R-tree

- The original R-tree tries to minimize the area of each enclosing rectangle in the index nodes.
- Is there any other property that can be optimized?

$$
\text { R*-tree } \rightarrow \text { Yes! }
$$

## $R^{*}$-tree

- Optimization Criteria:
- (O1) Area covered by an index MBR
- (O2) Overlap between index MBRs
- (O3) Margin (perimeter) of an index rectangle
- (O4) Storage utilization
- Sometimes it is impossible to optimize all the above criteria at the same time!
- ChooseSubtree:
- If next node is a leaf node, choose the node using the following criteria:
- Least overlap enlargement
- Least area enlargement
- Smaller area
- Else
- Least area enlargement
- Smaller area


## R*-tree

- SplitNode
- Choose the axis to split
- Choose the two groups along the chosen axis
- ChooseSplitAxis
- Along each axis, sort rectangles and break them into two groups ( $\mathrm{M}-2 \mathrm{~m}+2$ possible ways where one group contains at least $m$ rectangles). Compute the sum $S$ of all margin-values (perimeters) of each pair of groups. Choose the one that minimizes $S$
- ChooseSplitIndex
- Along the chosen axis, choose the grouping that gives the minimum overlap-value


## R*-tree

- Forced Reinsert:
- defer splits, by forced-reinsert, i.e.: instead of splitting, temporarily delete some entries, shrink overflowing MBR, and re-insert those entries (hopefully they'll end up in an adjacent node so need for split)
- Which ones to re-insert?
- How many? A: 30\%



## References

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