

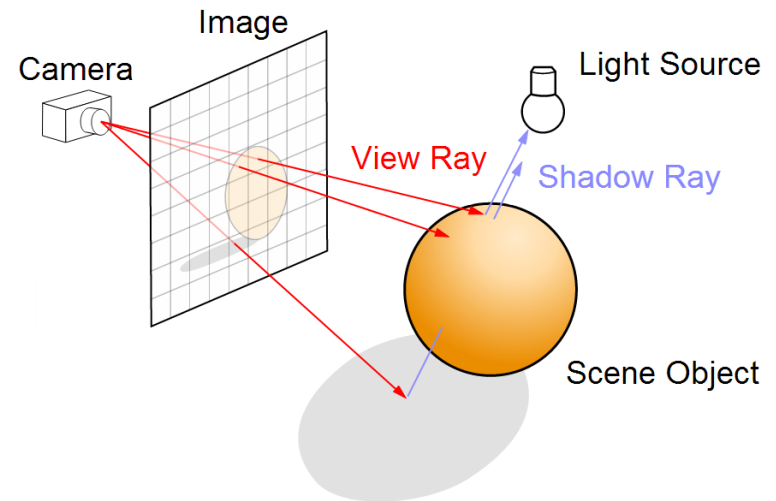
CMSC740

Advanced Computer Graphics

Fall 2025
Matthias Zwicker

Ray tracing pseudocode

```
rayTrace() {  
    construct scene representation  
  
    for each pixel  
        ray = computePrimaryViewRay( pixel )  
        hit = first intersection with scene  
        color = shade( hit ) // using shadow ray  
        set pixel color  
}
```



Cost of naïve approach

- For each ray, the cost is linear in the number of primitives (triangles) in the scene
- Complexity $\Theta(n)$ per ray, n primitives
- Total cost: objects*rays

Example

- 1024x1024 image, 1000 triangles
- 10^9 ray triangle intersections

Ray tracing acceleration techniques

Fast intersections

```
graph TD; A[Fast intersections] --> B[Faster ray-object intersection tests]; A --> C[Fewer ray-object intersection tests];
```

Faster ray-object intersection tests

- Efficient numerical intersection algorithms
- Code optimization (vector instructions, multi-threading, GPU

<http://en.wikipedia.org/wiki/OptiX>)

Fewer ray-object intersection tests

- „Acceleration structures“
- Bounding volume hierarchies
- Space subdivision

Generalized rays

- Beam tracing
http://en.wikipedia.org/wiki/Beam_tracing
- Cone tracing
http://en.wikipedia.org/wiki/Cone_tracing

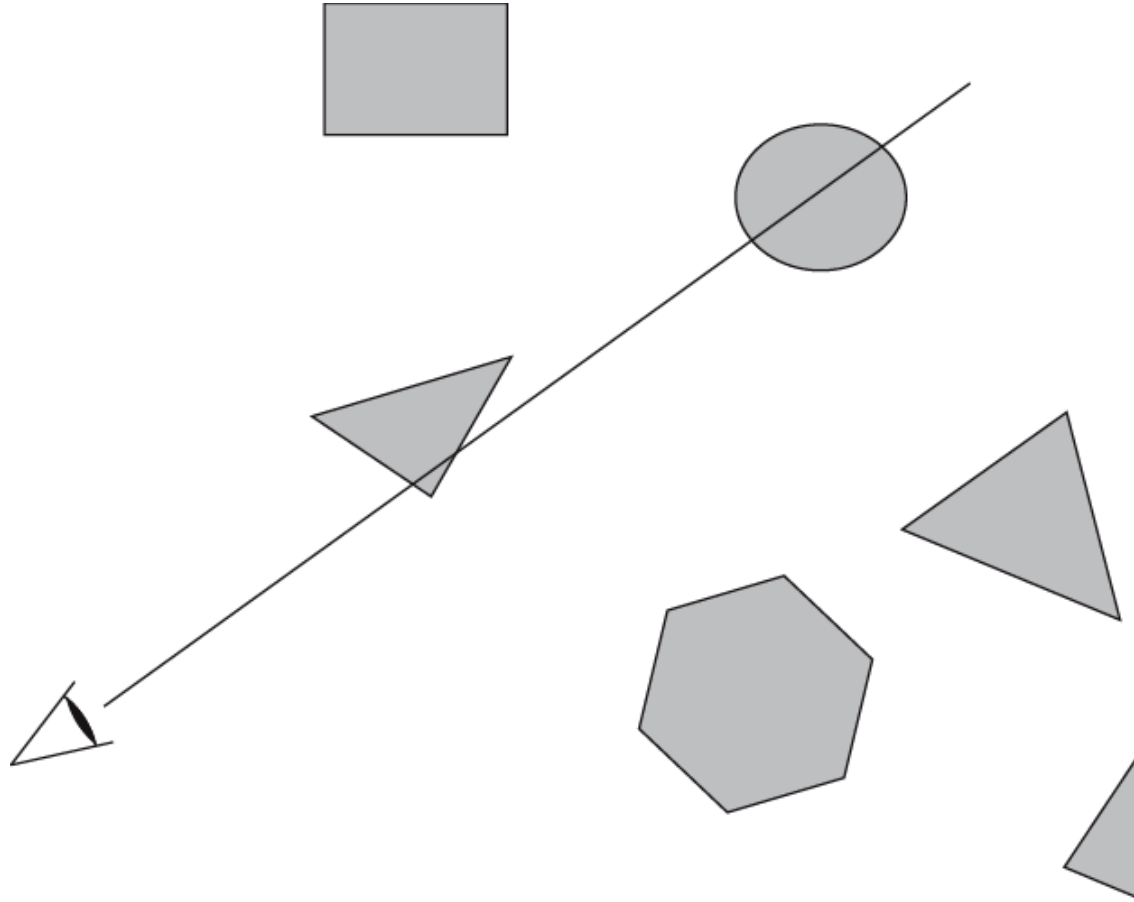
Acceleration structures

- Goal: “sub-linear” complexity
 - Number of intersection tests grows more slowly than proportional to number of primitives
 - Logarithmic complexity: $\Theta(\lg n)$
- Don't touch every single object (i.e., triangle)

Spatial data structures

- Enable efficient operations on data organized in a **metric space**
 - „Metric space“: can make distance measurements
 - Operations: intersection tests, search queries based on proximity, etc.
- Applications
 - Ray tracing (rendering), acceleration structure = spatial data structure
 - Collision detection (physics simulations)
 - Chemical simulations
 - Machine learning (nearest neighbor queries)
 - Data analysis
 - ...
- Detailed background in "Foundations of Multidimensional and Metric Data Structures"
<http://books.google.dk/books?id=KrQdmLjTSaQC>

Acceleration structures: ideas?



Acceleration structures

- Two types

1. Object subdivision

- Bounding volume hierarchies (BVHs)

2. Spatial subdivision

- Uniform, hierarchical grids
- Octrees
- Binary space partitioning (BSP) trees, kd-trees

Object subdivision

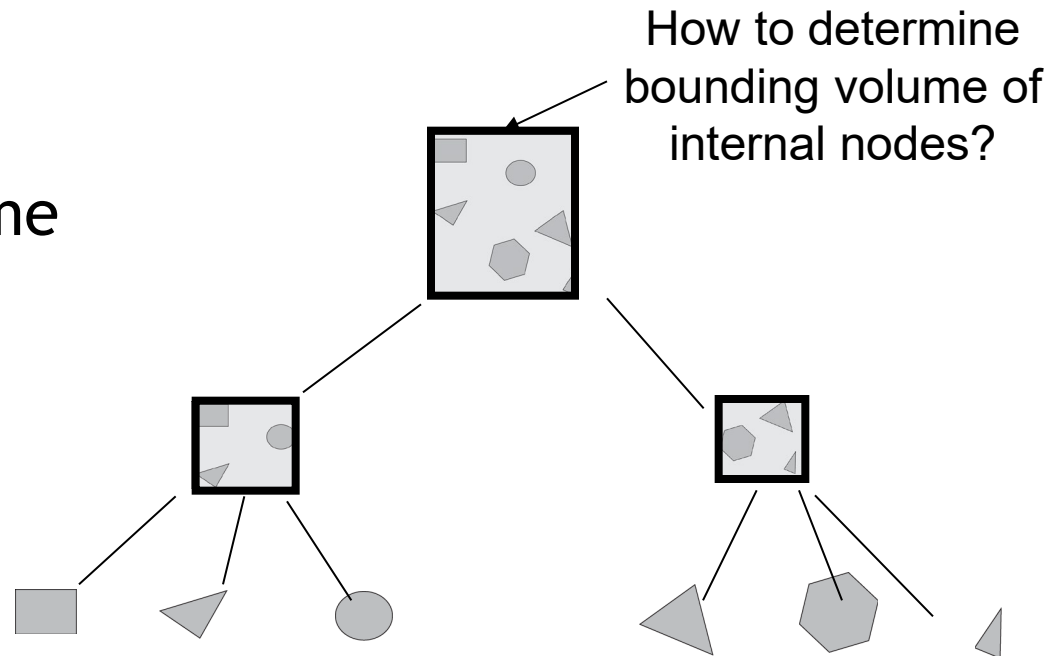
- Hierarchies of groups of objects
- Groups are represented by their **bounding volumes**
 - Bounding volume: simple geometry that encloses all objects in a group, allows fast ray intersection computation (for example: axis aligned boxes, spheres, etc.)
- **“Bounding volume hierarchies”**, BVH
http://en.wikipedia.org/wiki/Bounding_volume_hierarchy
- Logarithmic complexity $\Theta(\lg n)$ to find intersection
 - Depth of BVH hierarchy is logarithmic in terms of number of objects n

Bounding volume hierarchies

- Tree structure
- Leaf nodes contain objects (e.g. triangles)
- Each internal node is bounding volume

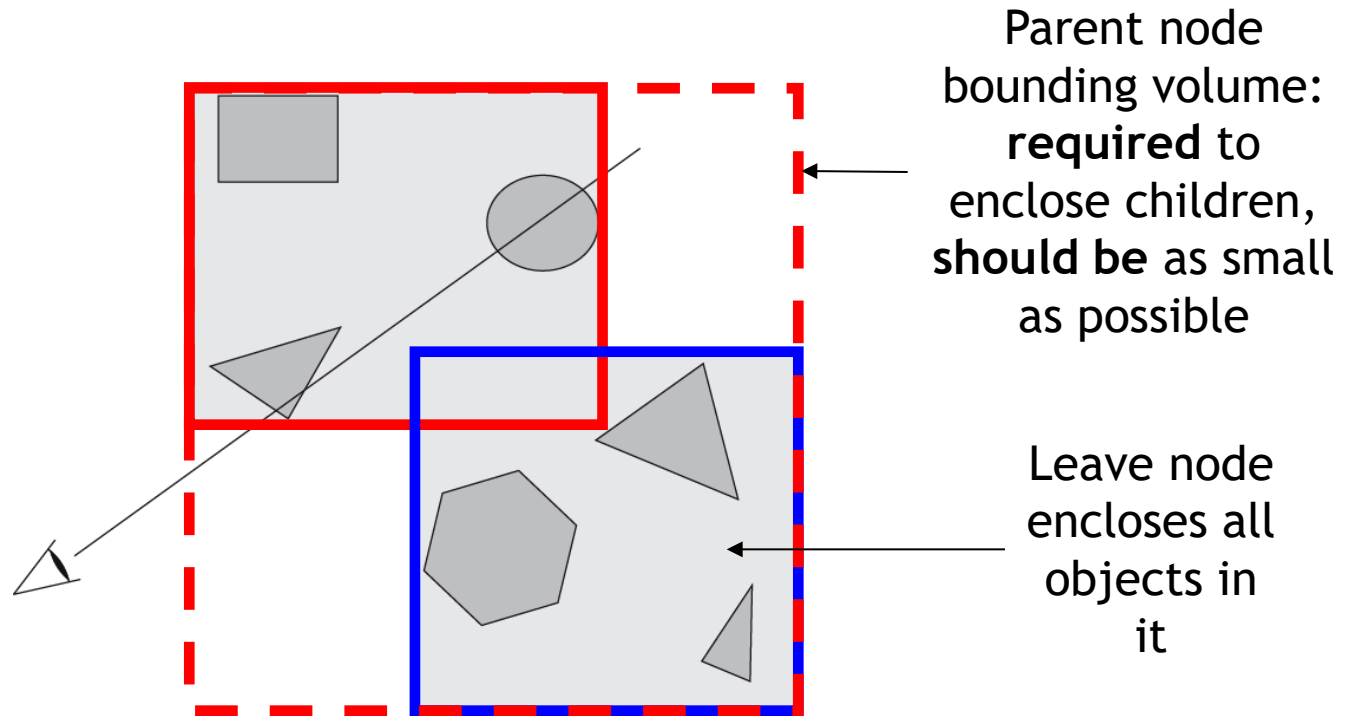


Bounding volume



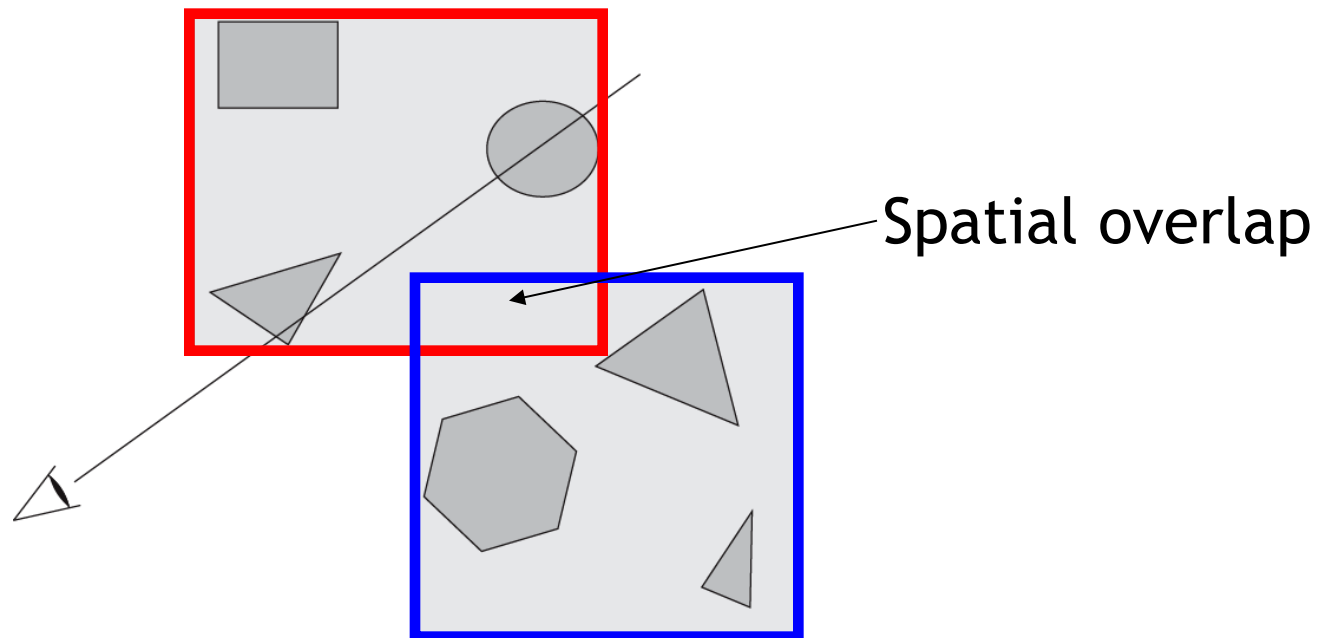
Bounding volume hierarchies

- Bounds of each bounding volume contain all objects in its subtree



Bounding volume hierarchies

- Subtrees can overlap spatially
 - Not all objects within the bounding volume of a node need to be in its own subtree
- Subtrees are not ordered in any way



BVH construction

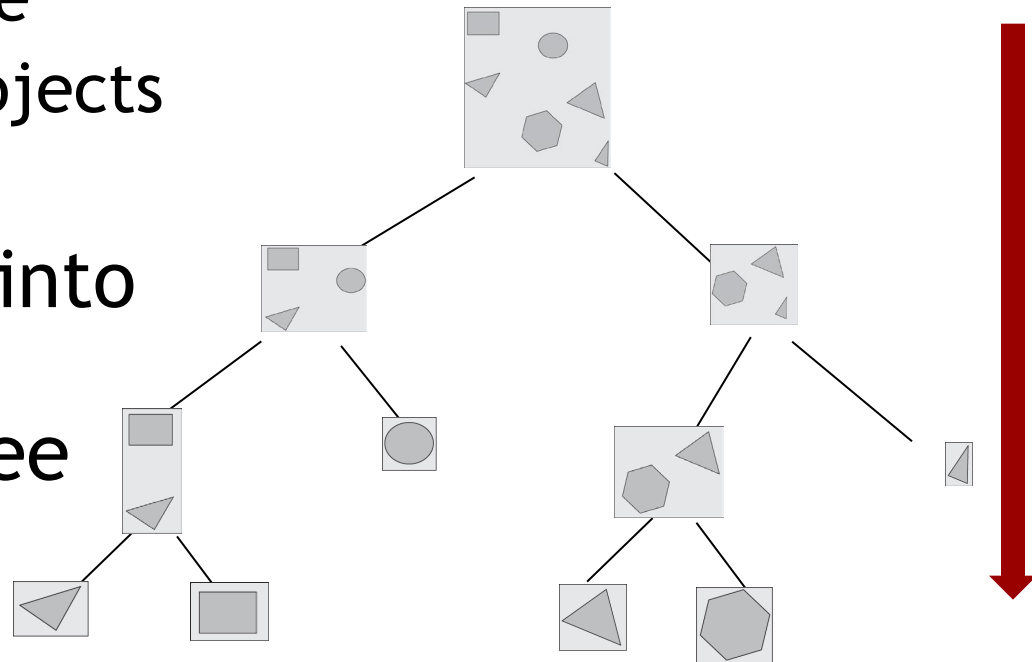
- Partitioning objects along coordinate axes in a **top-down** fashion, starting at root
 - Other strategies (e.g., bottom-up) possible

http://en.wikipedia.org/wiki/Bounding_volume_hierarchy

- Partitioning strategies, alternatives

- In geometric middle
- Into equal nr. of objects
- Equal surface area

- Partitioning nodes into two children results in binary tree



BVH intersection

- If bounding volume of node is not intersected by a ray, none of the objects in its subtree are
 - Subtree can be pruned (ignored) during intersection testing
- If node is intersected, all children have to be tested for intersections recursively

BVH intersection

- Types of bounding volumes

http://en.wikipedia.org/wiki/Bounding_volume

- (Axis aligned) bounding boxes (AABB)
 - Bounding spheres
 - Bounding anything
- BVH with axis aligned bounding boxes (AABB) are popular because of efficient intersection testing

BVHs are always binary trees

- A. True
- B. False

Leaf nodes in a BVH always contain a single object (triangle)

A. True

B. False

Today: acceleration structures

- Introduction
- Two types
 1. Object subdivision
 - Bounding volume hierarchies (BVHs)
 2. Spatial subdivision
 - Uniform, hierarchical grids
 - Octrees
 - Binary space partitioning (BSP) trees, kd-trees

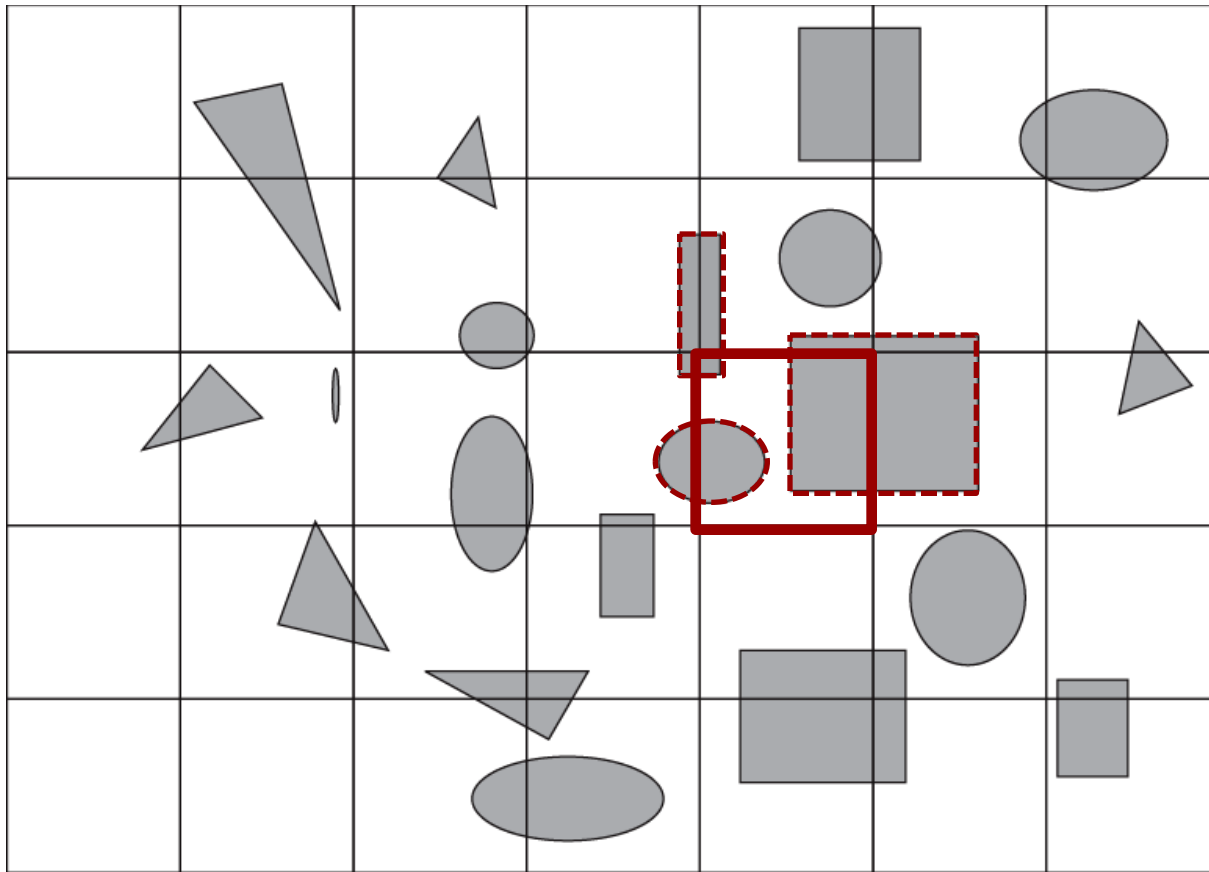
Spatial subdivision

Main idea

- Partition space into **non-overlapping** cells
- Each cell stores reference to all objects that overlap it

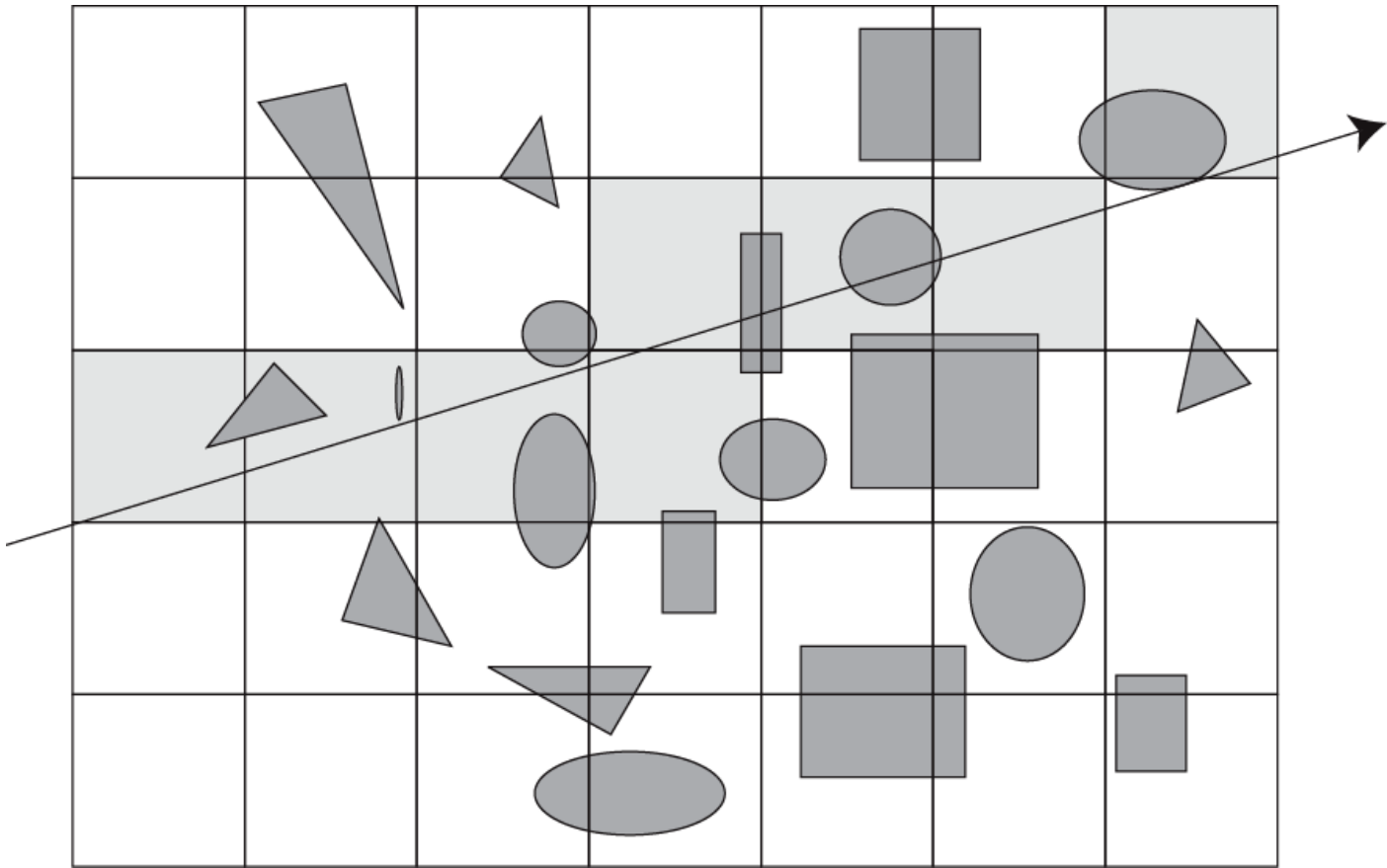
Uniform grid

- Each cell stores ref. to all objects in it



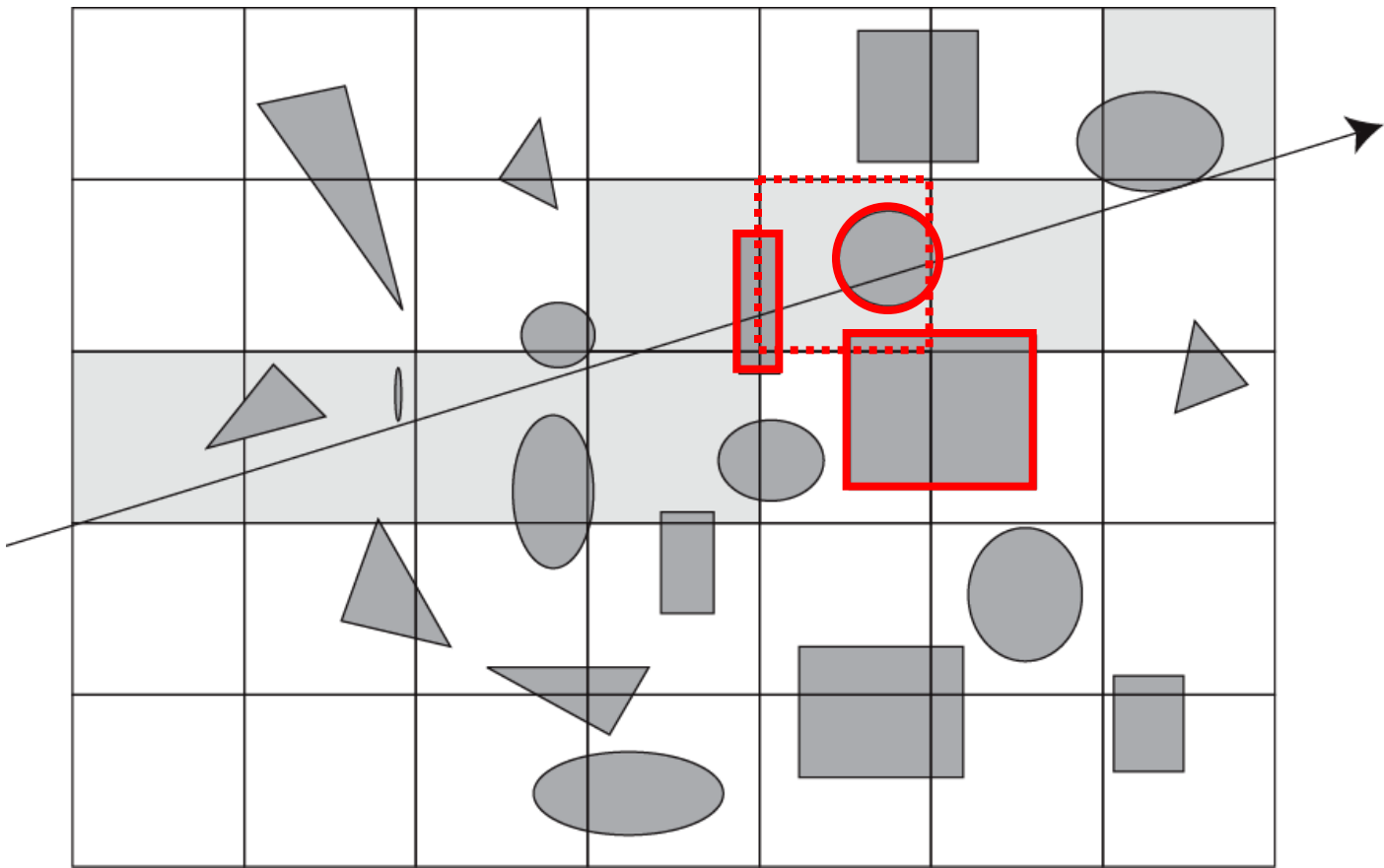
Uniform grid

- Traverse grid along ray

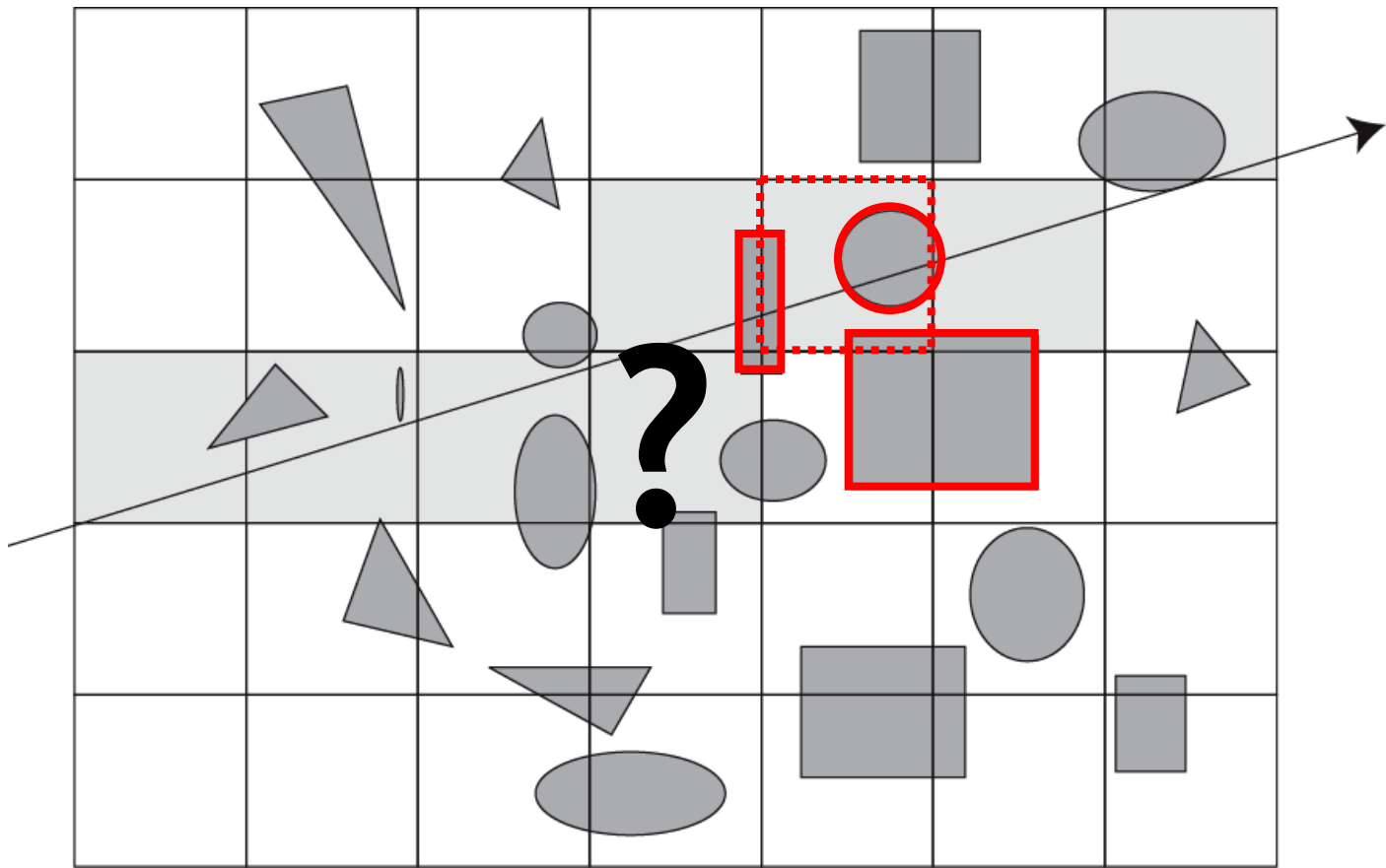


Uniform grid

- For each cell, intersect all objects in cell

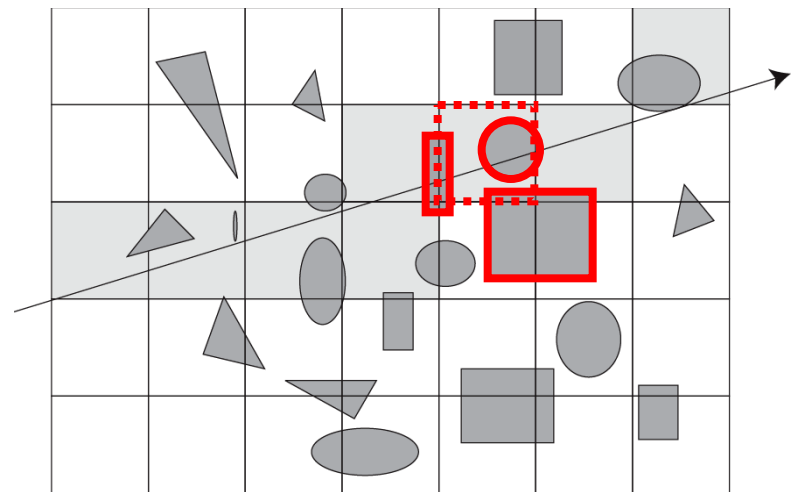


Uniform grid: disadvantages?

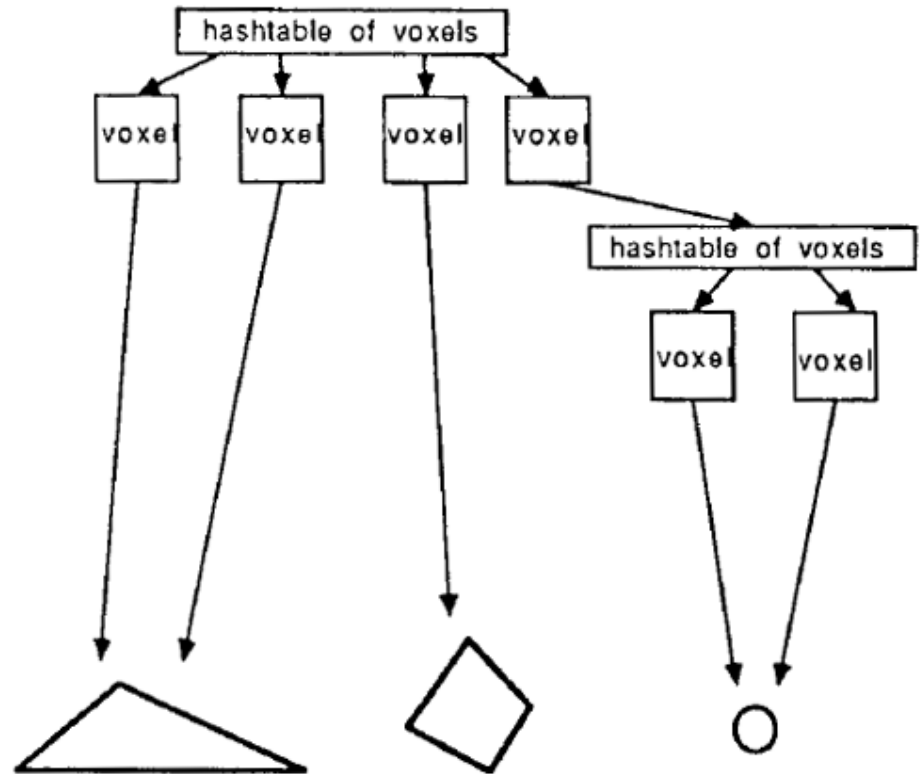
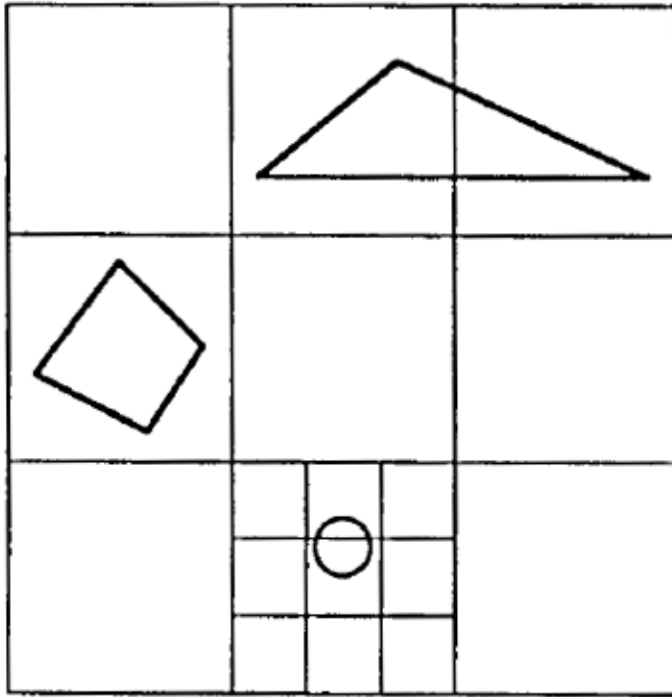


Uniform grid

- Advantages
 - Can traverse ray along grid (front to back)
 - Can stop as soon as a hit is found
- Disadvantages
 - “Teapot in a stadium” problem: no good uniform grid size
 - Potentially intersect same object multiple times



Hierarchical grid

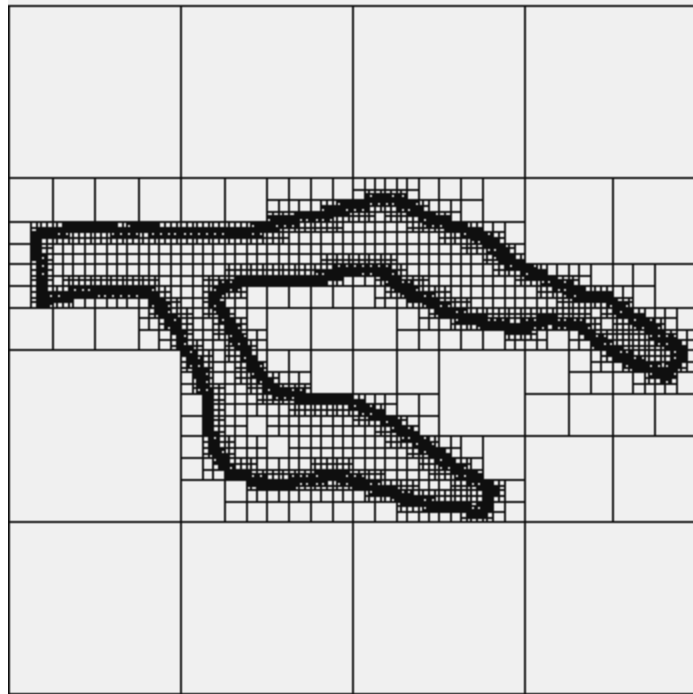


“Adaptive voxel subdivision for ray tracing”, 1989

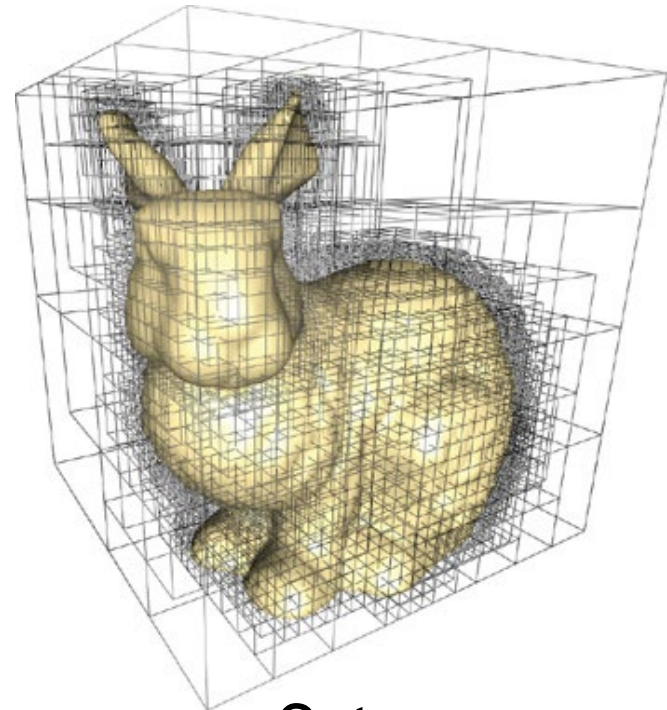
Octree

<http://en.wikipedia.org/wiki/Octree>

- Special case of hierarchical grid
- Analogous to quadtree in 2D
- Recursively split each cubic cell (at its center) into 8 equally sized cubic cells



Quadtree



Octree

Octrees are binary trees

- A. True
- B. False

Octrees implement the best possible space partitioning because space is divided into equally sized child nodes

A. True

B. False

Binary space partitioning (BSP) trees

http://en.wikipedia.org/wiki/Binary_space_partitioning

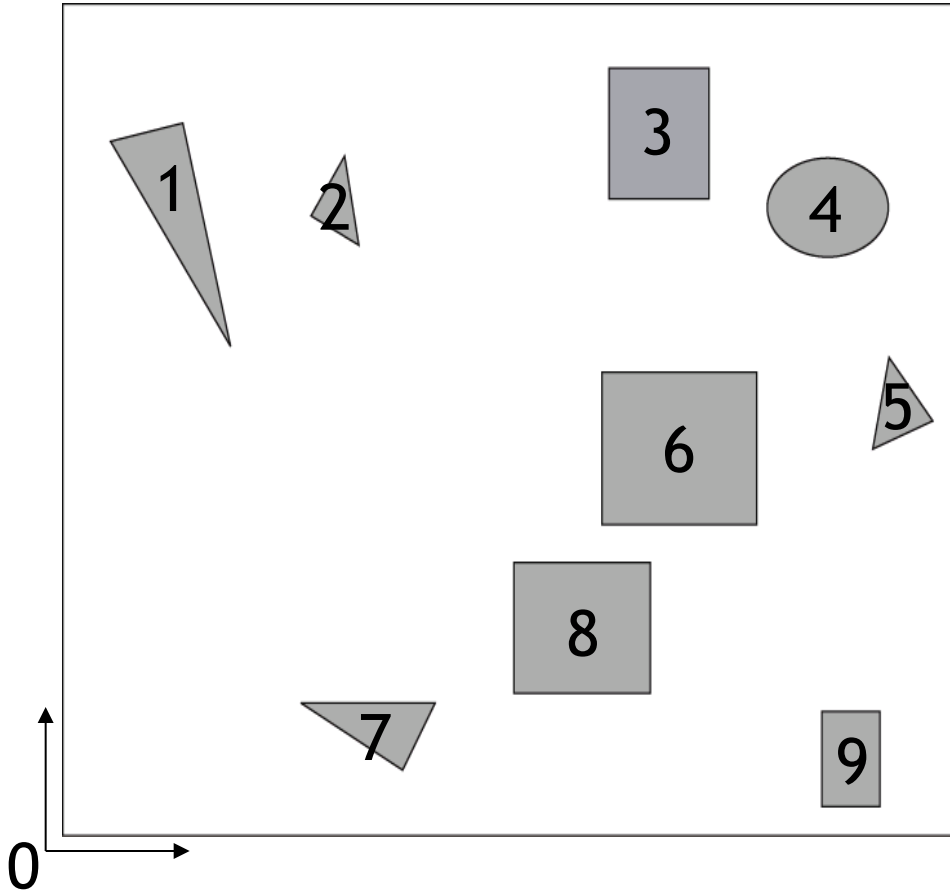
- Main idea
 - Recursively divide space into **two parts** using dividing planes (with **arbitrary position, orientation**)
- Special case: **k-d-trees**
 - Dividing planes are **axis aligned**

<http://en.wikipedia.org/wiki/Kd-tree>

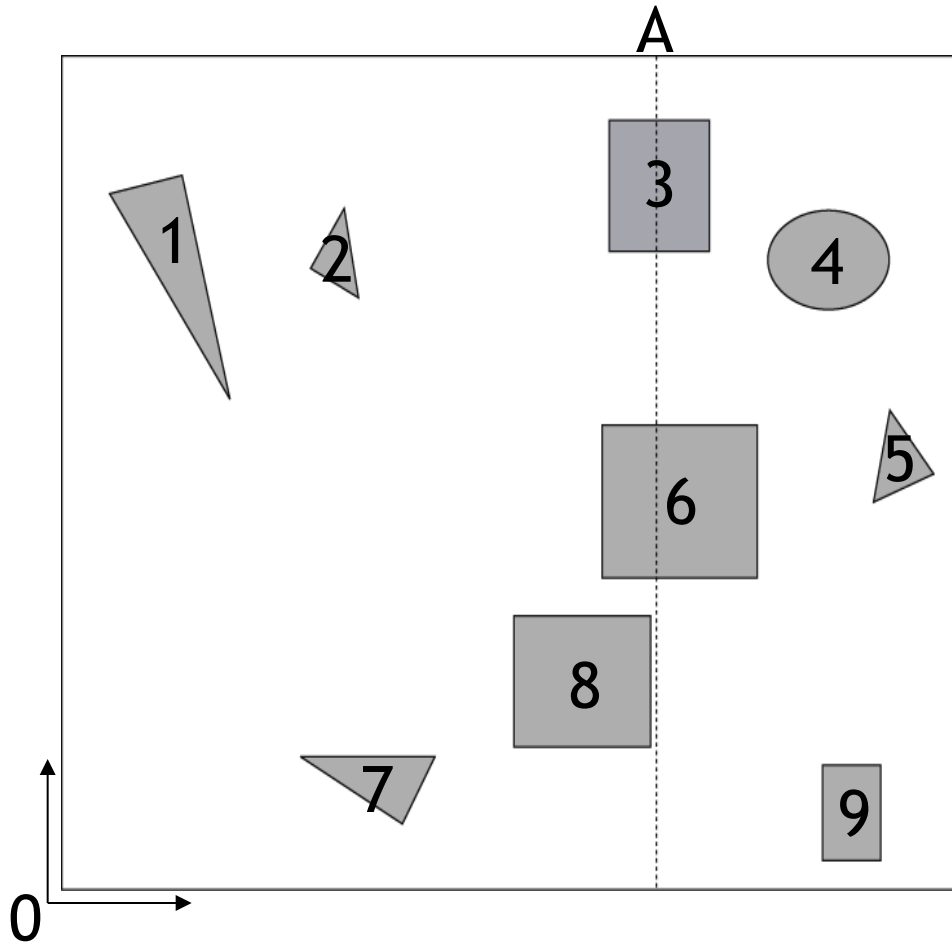
k-d tree example

- Stopping criterion: subdivide until fewer than 3 objects in node
- Convention for children in binary tree
 - Left child “below” split plane (smaller coordinates along split axis)
 - Right child “above” split plane (larger coordinates along split axis)
- Typically, cycle through splitting axis from one hierarchy level to next

k-d tree example

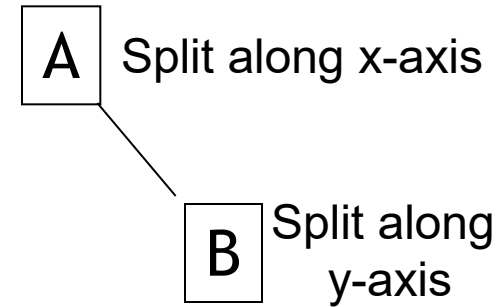
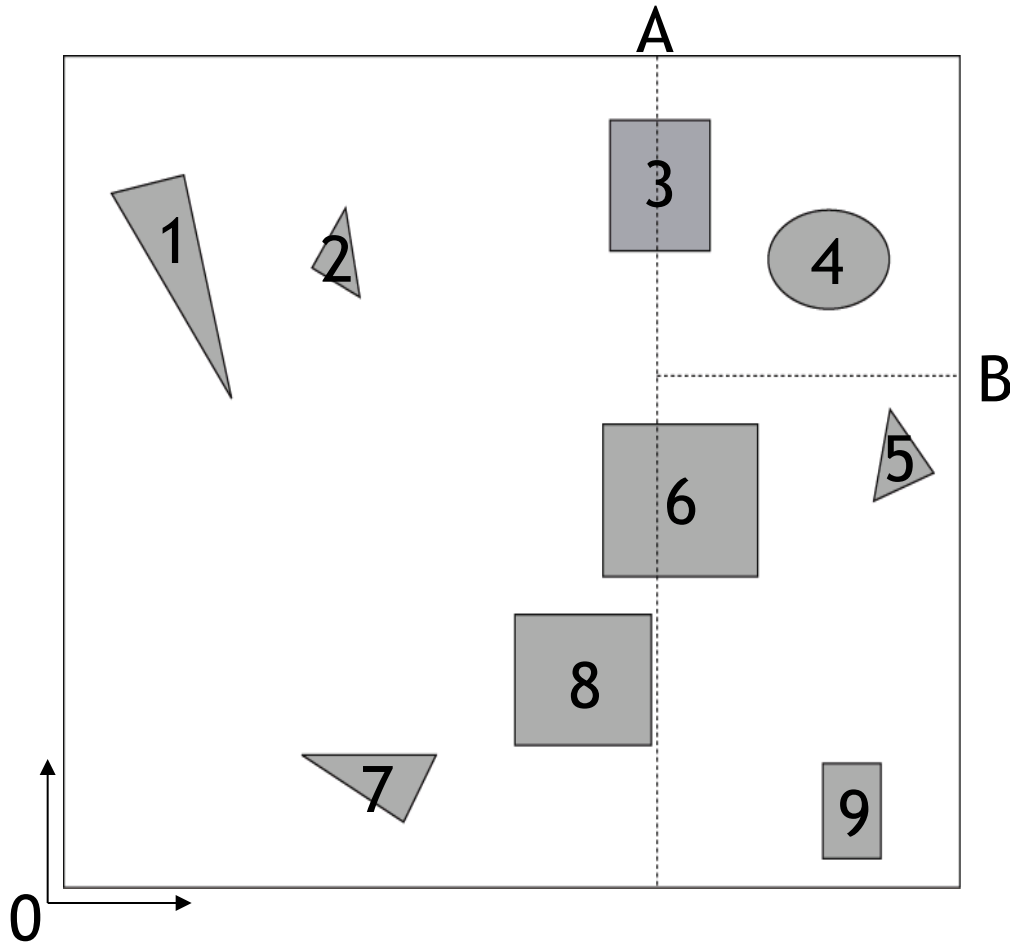


k-d tree example

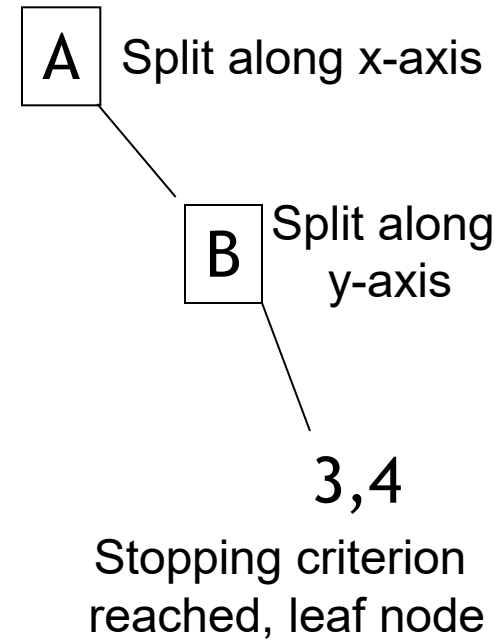
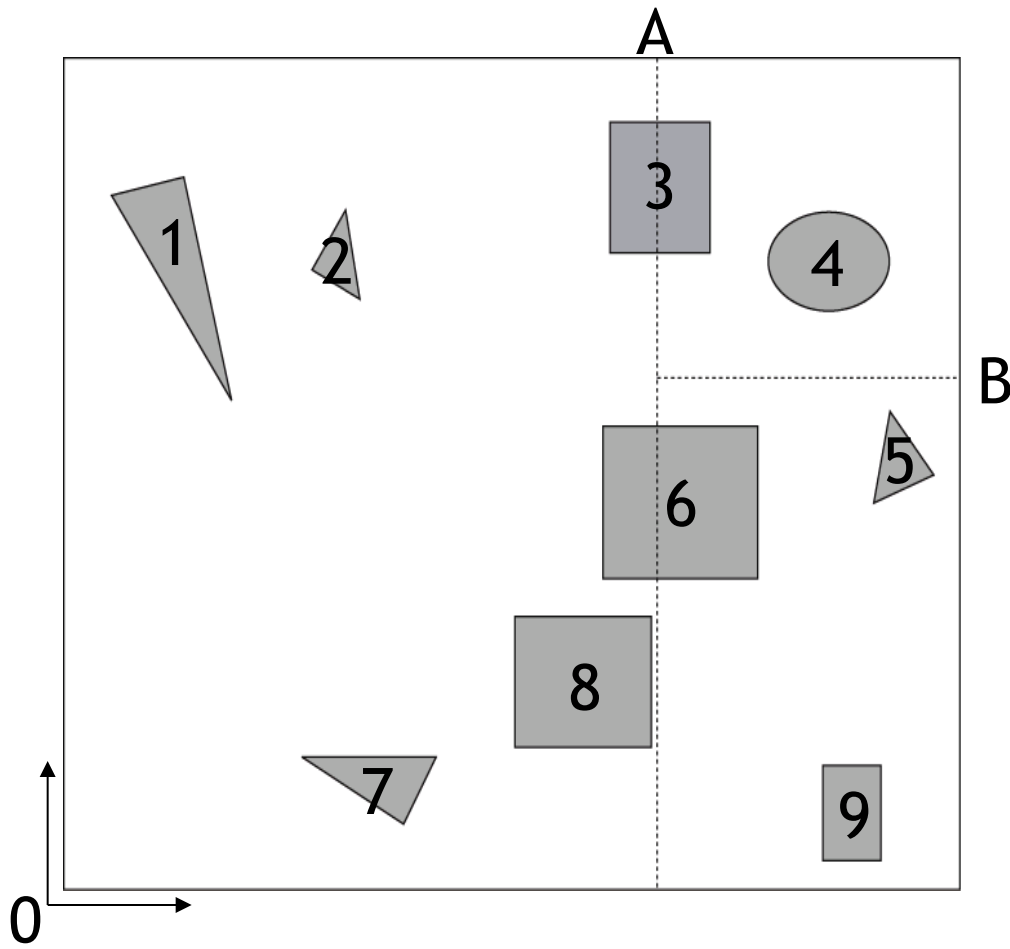


A Split along x-axis

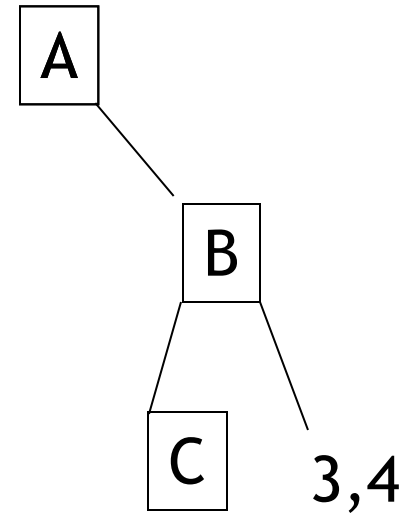
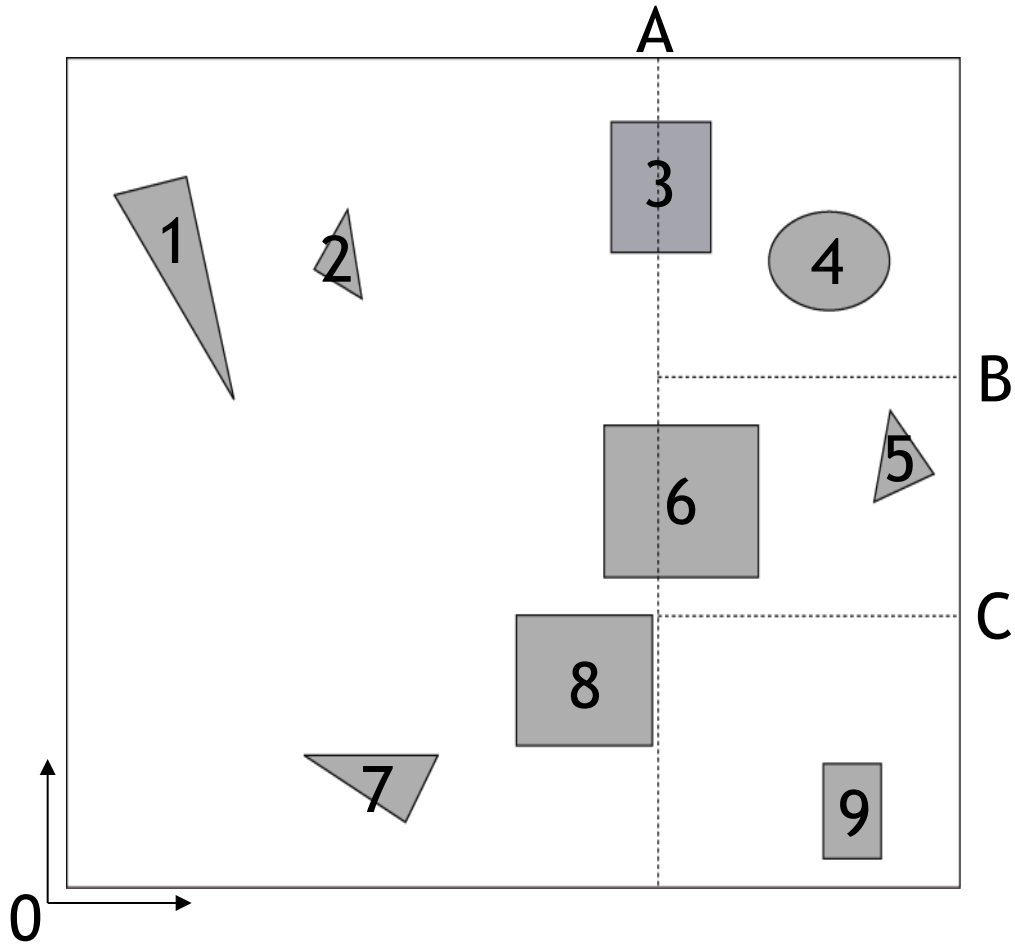
k-d tree example



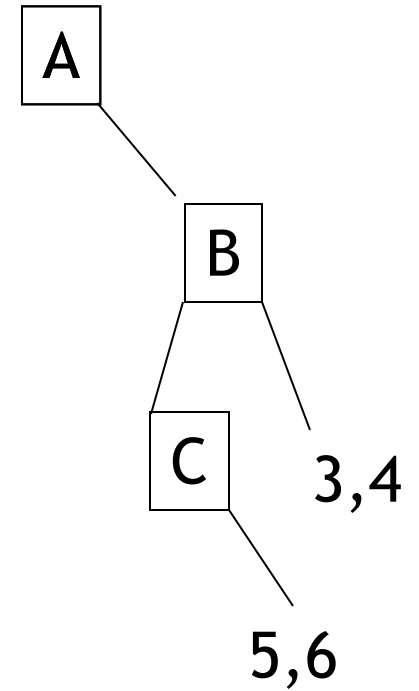
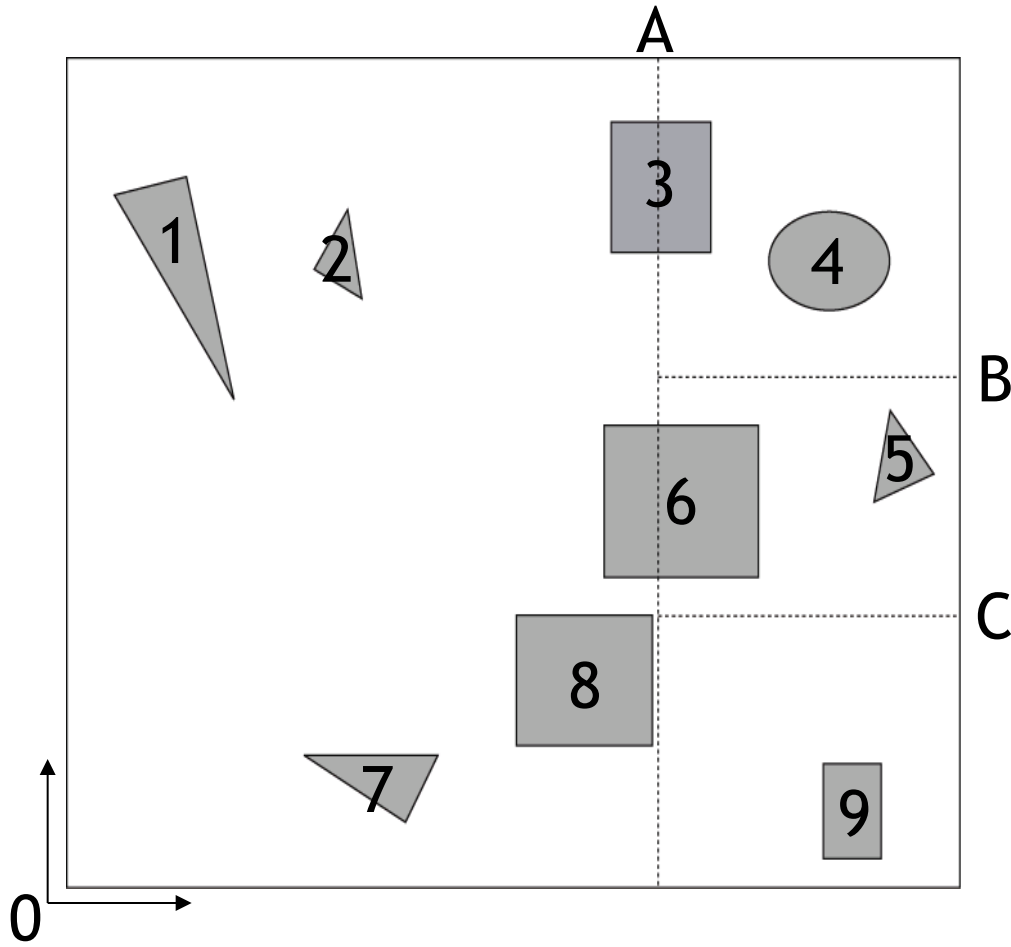
k-d tree example



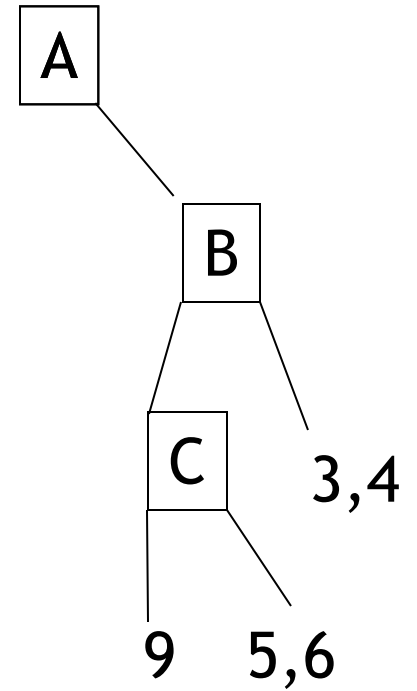
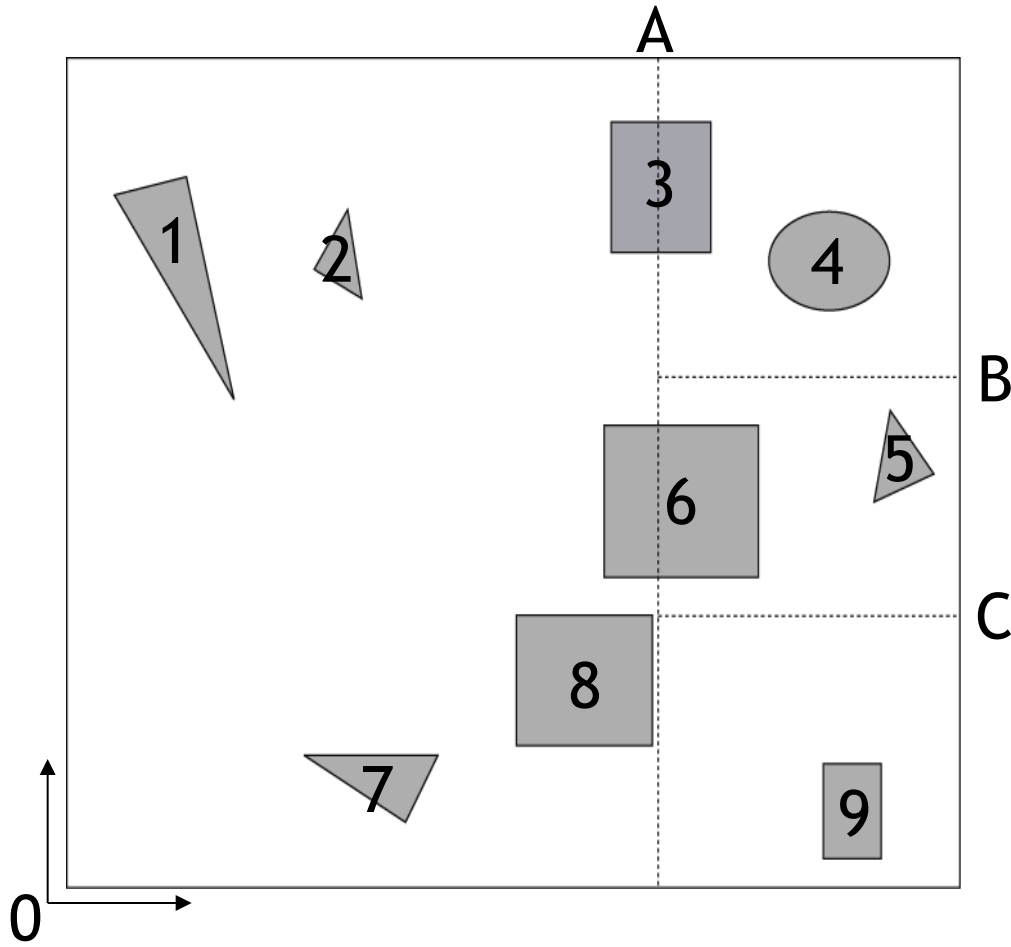
k-d tree example



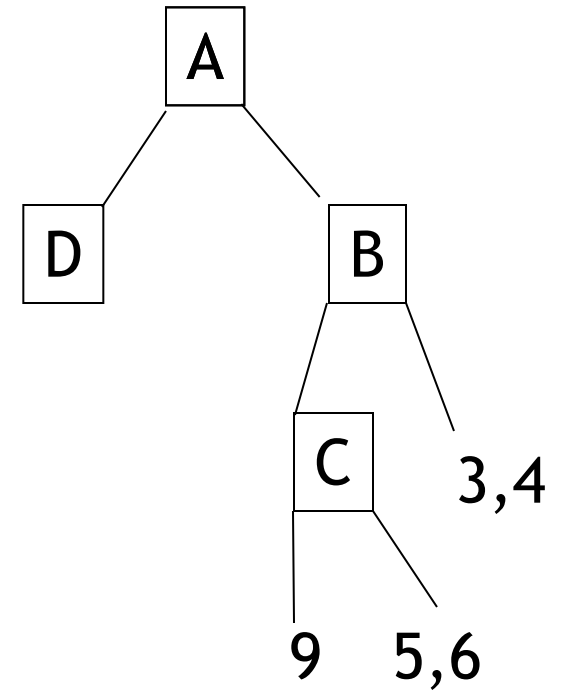
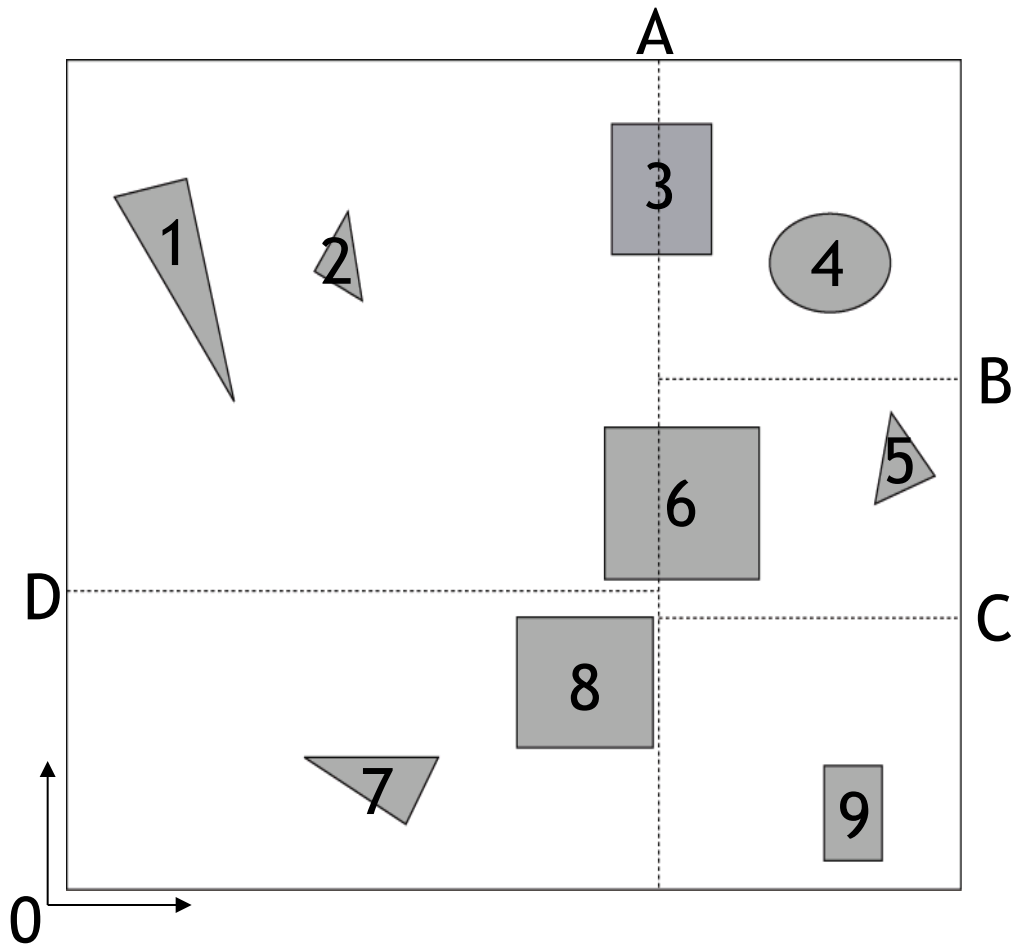
k-d tree example



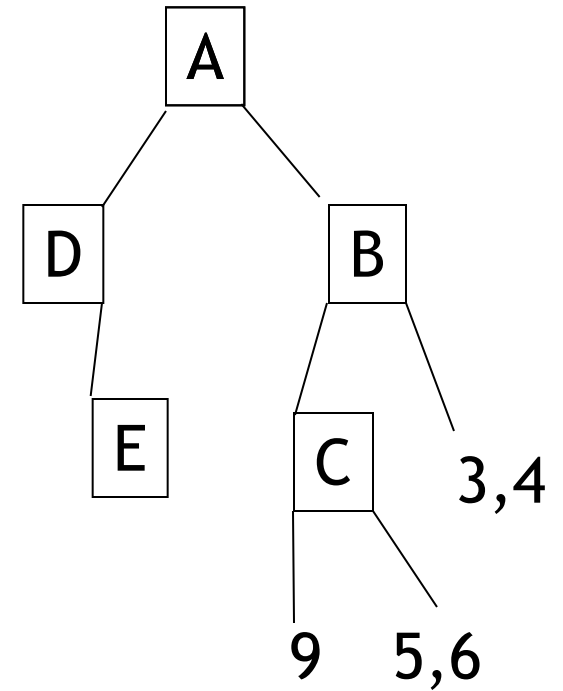
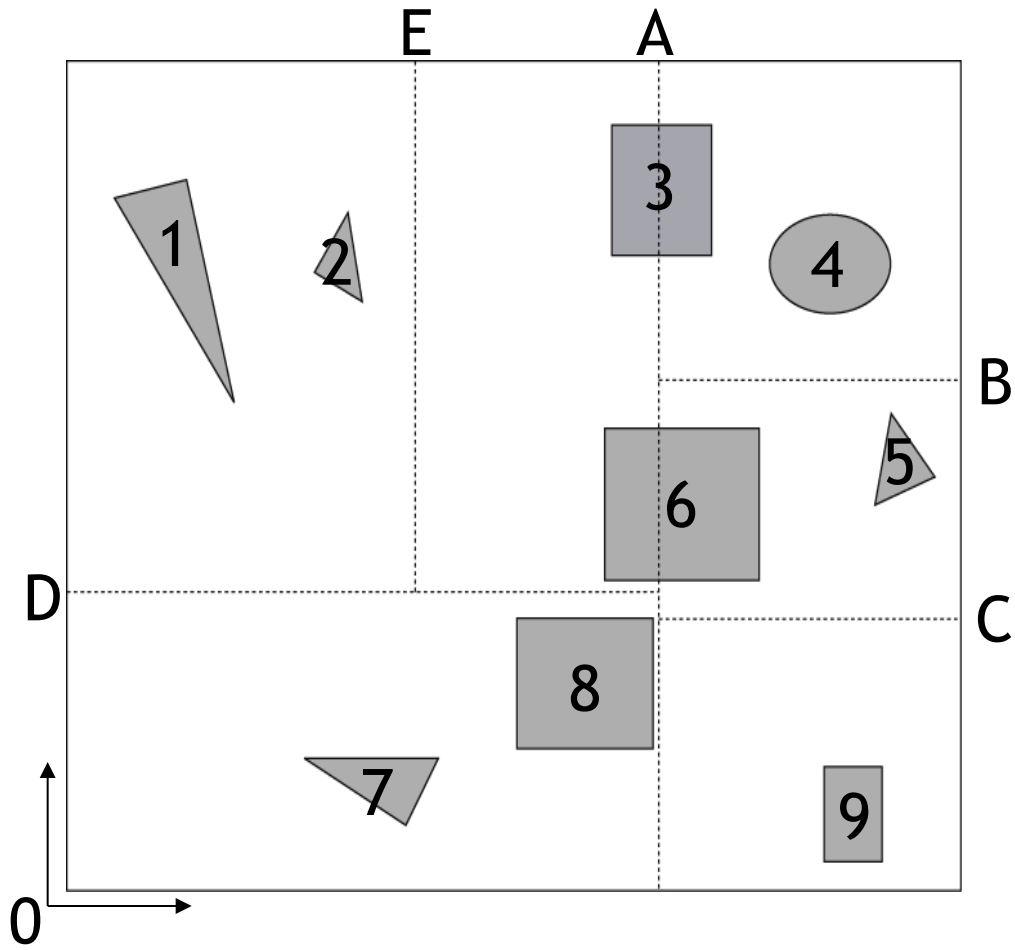
k-d tree example



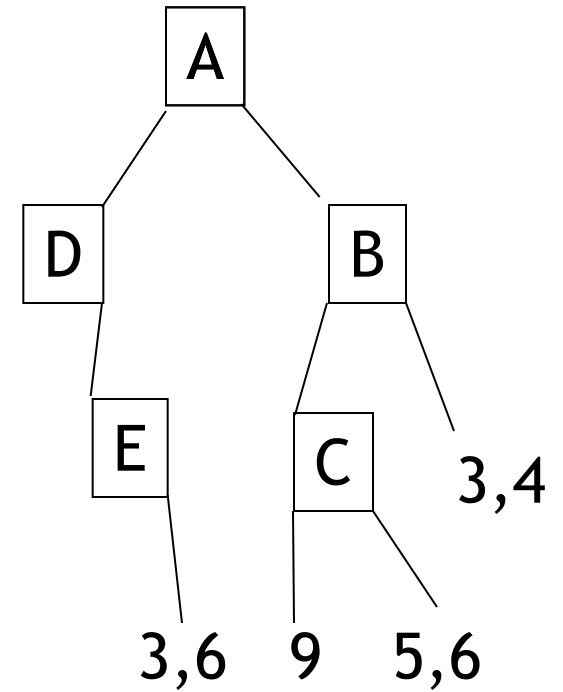
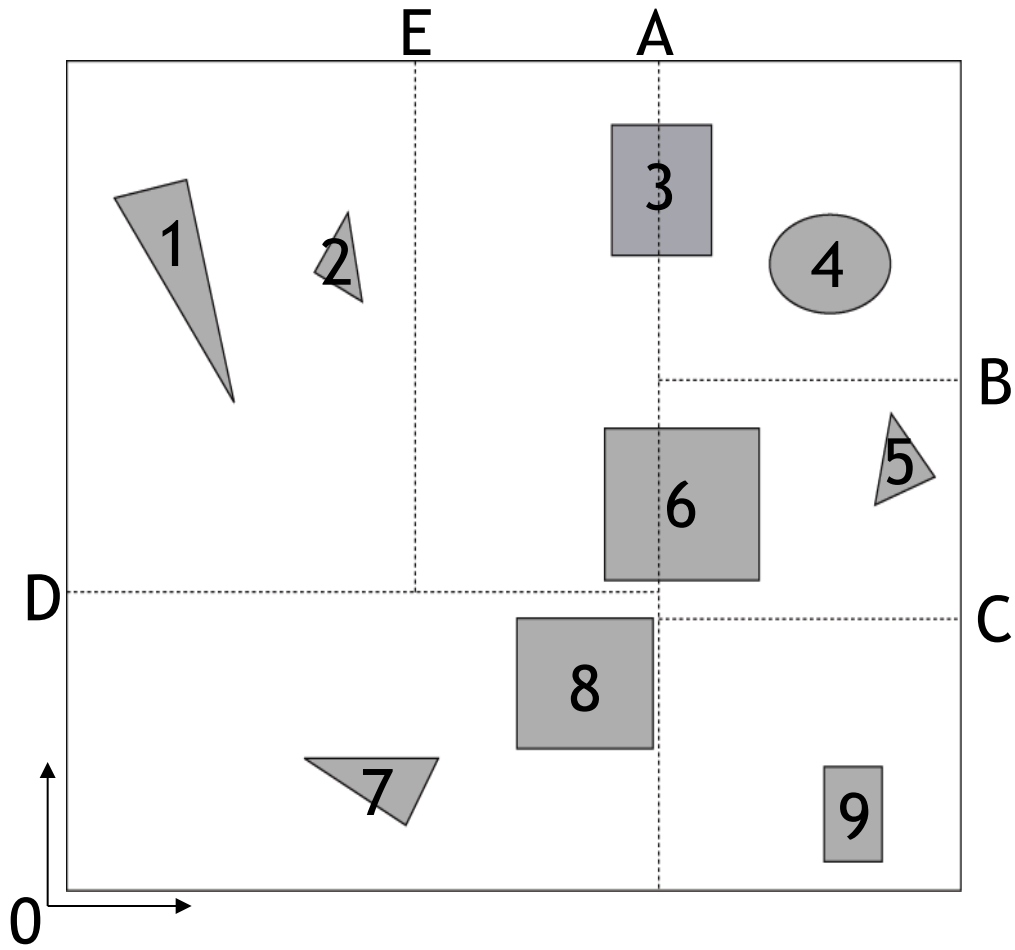
k-d tree example



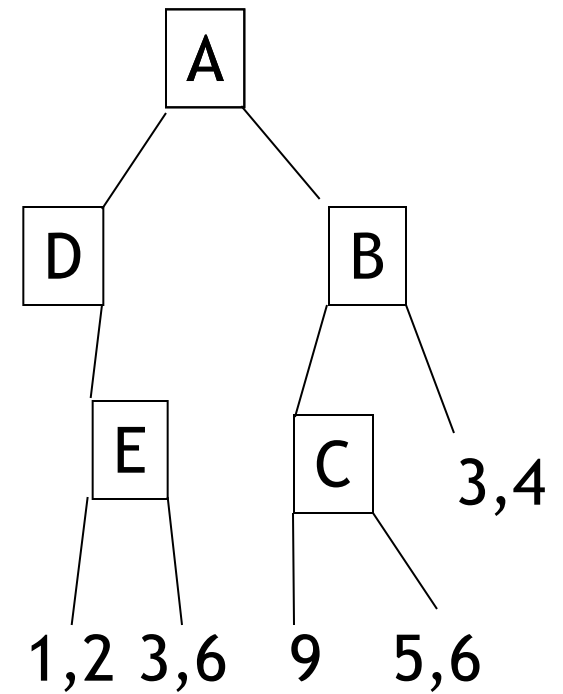
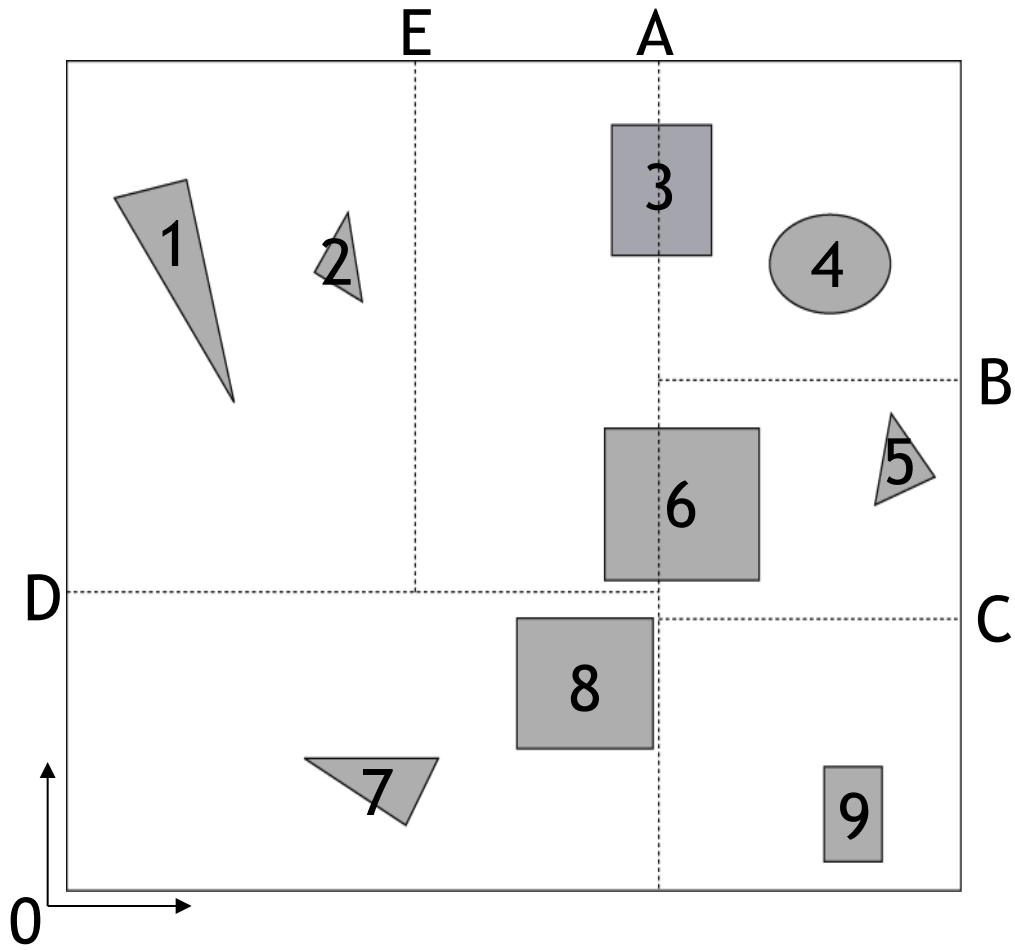
k-d tree example



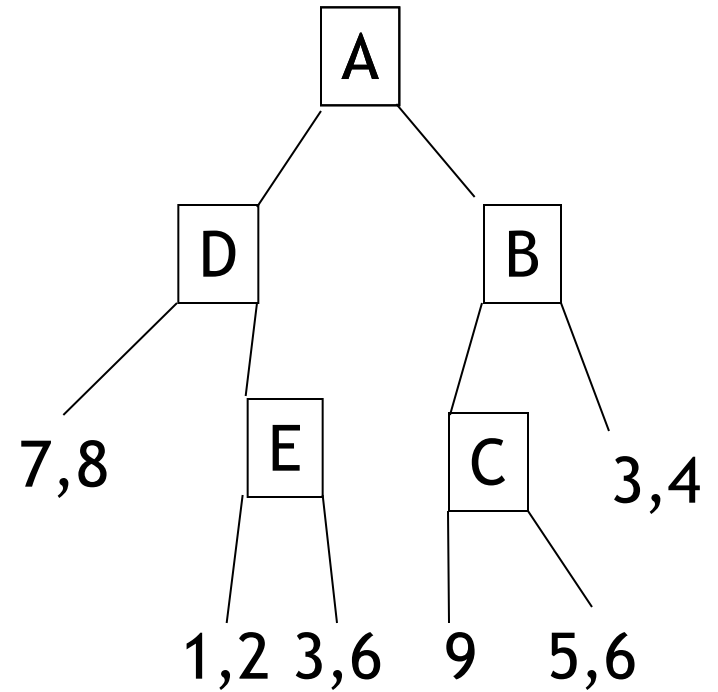
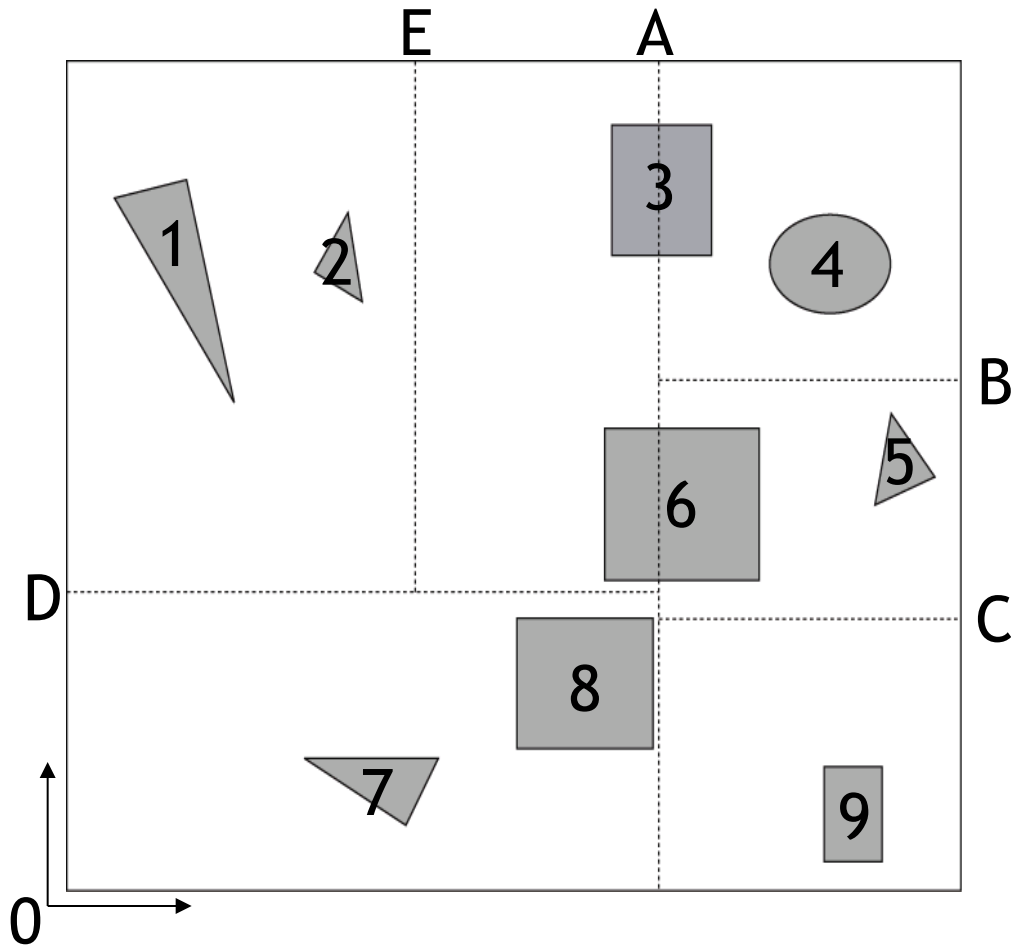
k-d tree example



k-d tree example



k-d tree example



k-d tree construction

- Goal: construct tree that minimizes rendering cost
 - Minimize expected number of intersection tests
- Parameters to optimize?
- Details see PBRT book, Section 4.4

<http://pbrt.org/index.html>

Traversing a kd-tree is faster than traversing an octree, because each node has fewer children (2 vs. 8)

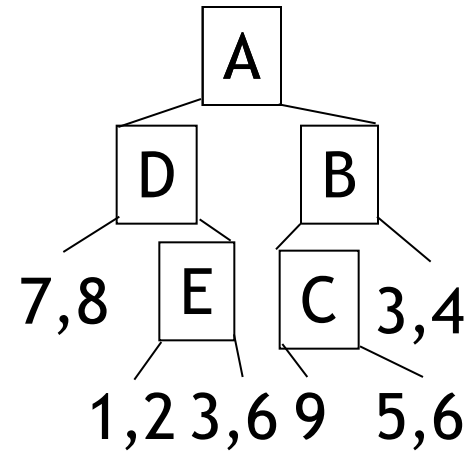
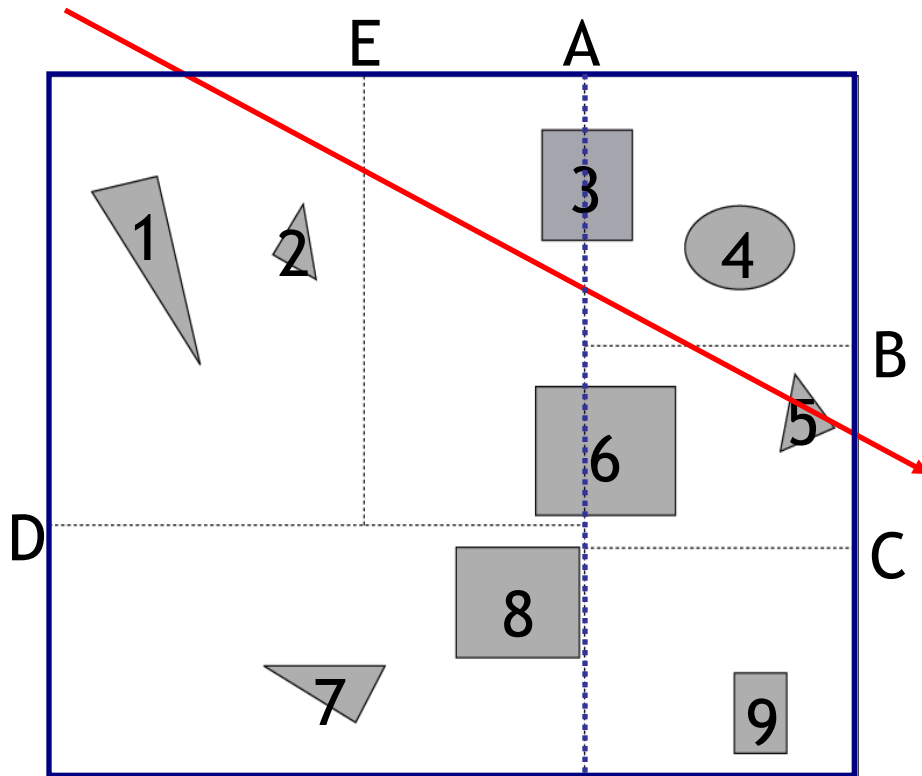
A. True

B. False

Tree traversal & intersection testing

- “Front-to-back” traversal
 - Traverse child nodes in order (front to back) along rays
- Stop traversing as soon as first surface intersection is found
 - Advantage over BVHs, where this is not possible
- Maintain own stack of subtrees to traverse
 - More efficient than recursive function calls

Tree traversal

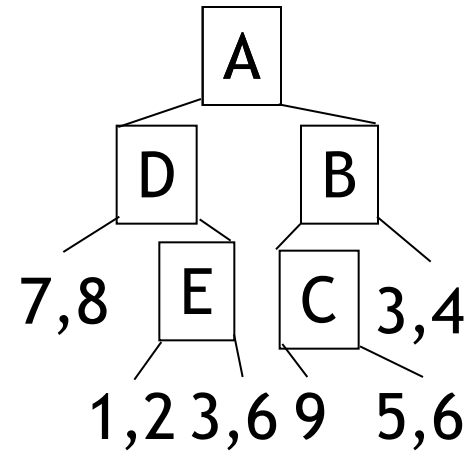
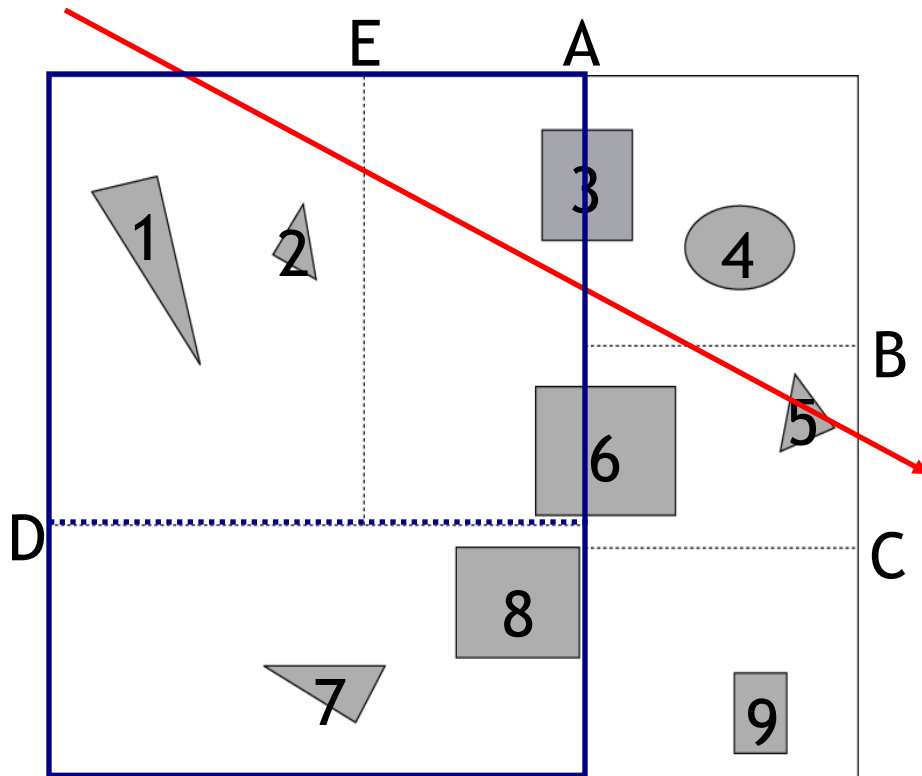


Process



Stack

Tree traversal



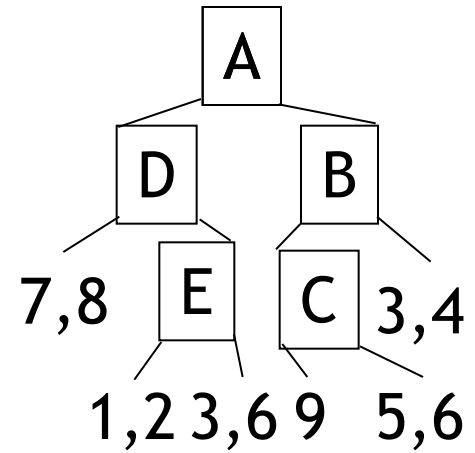
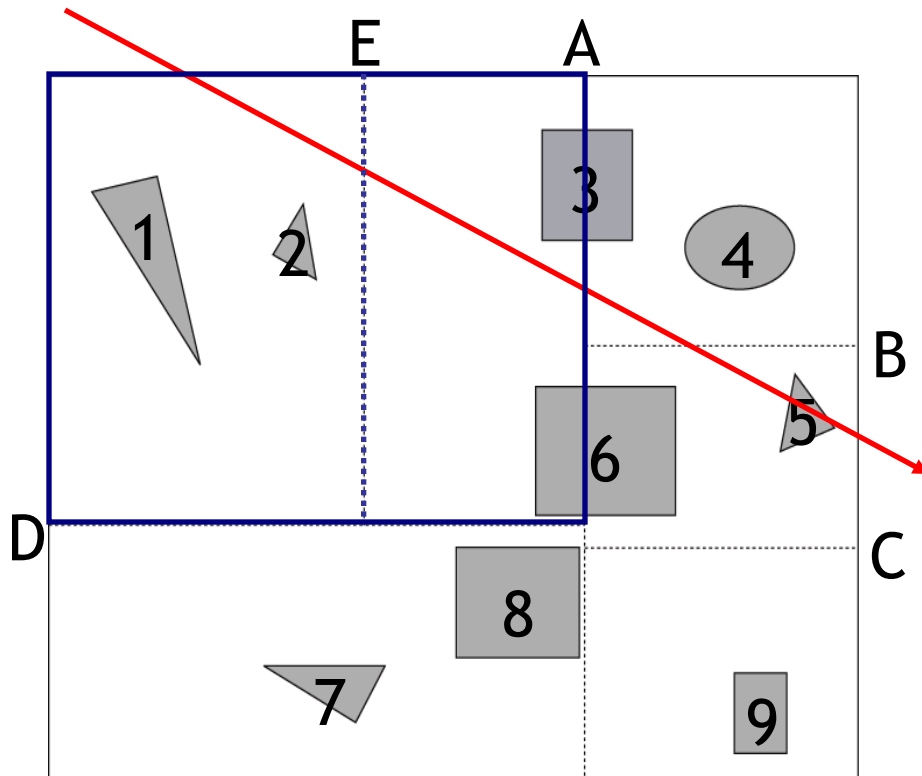
Process

D

Stack

B

Tree traversal



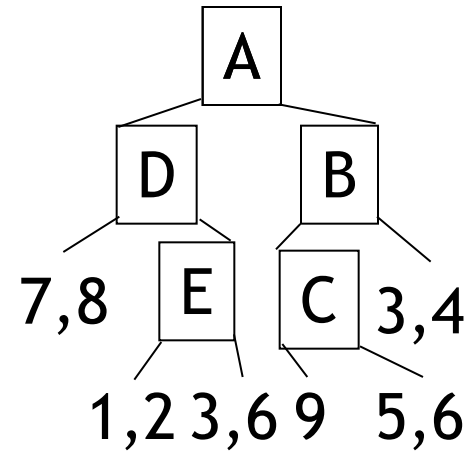
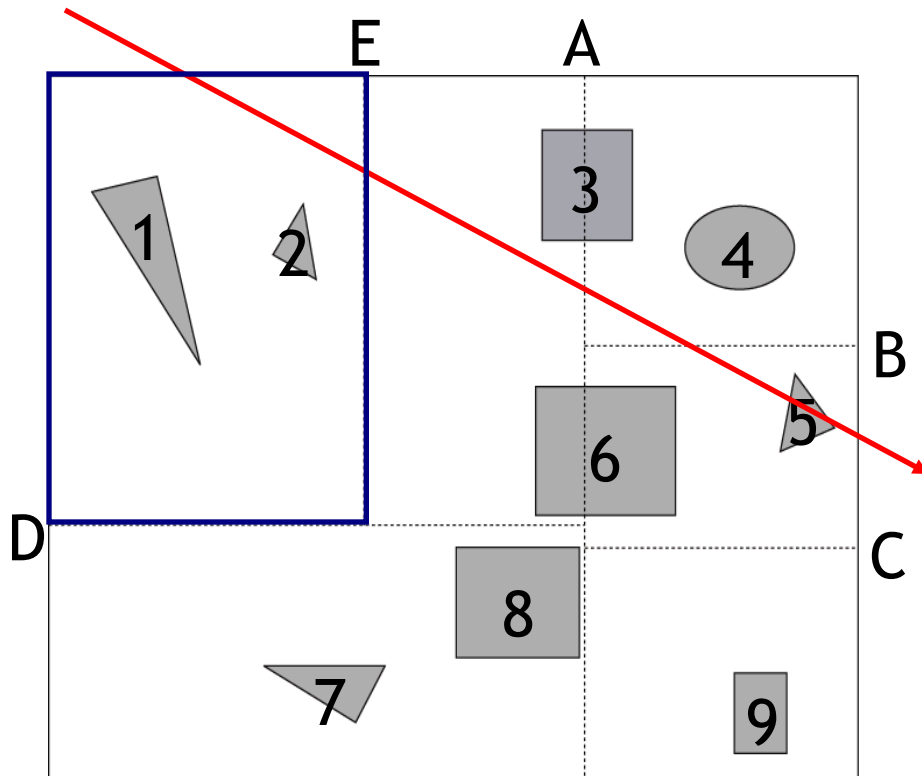
Process

E

Stack

B

Tree traversal



Process

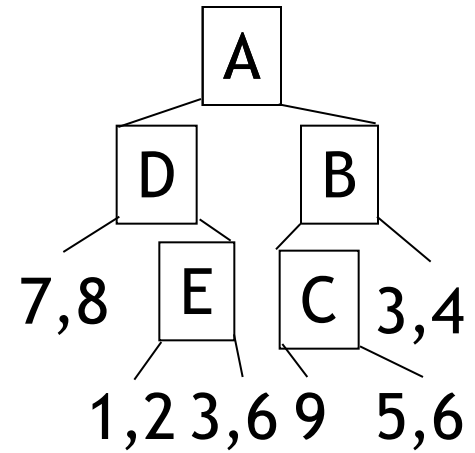
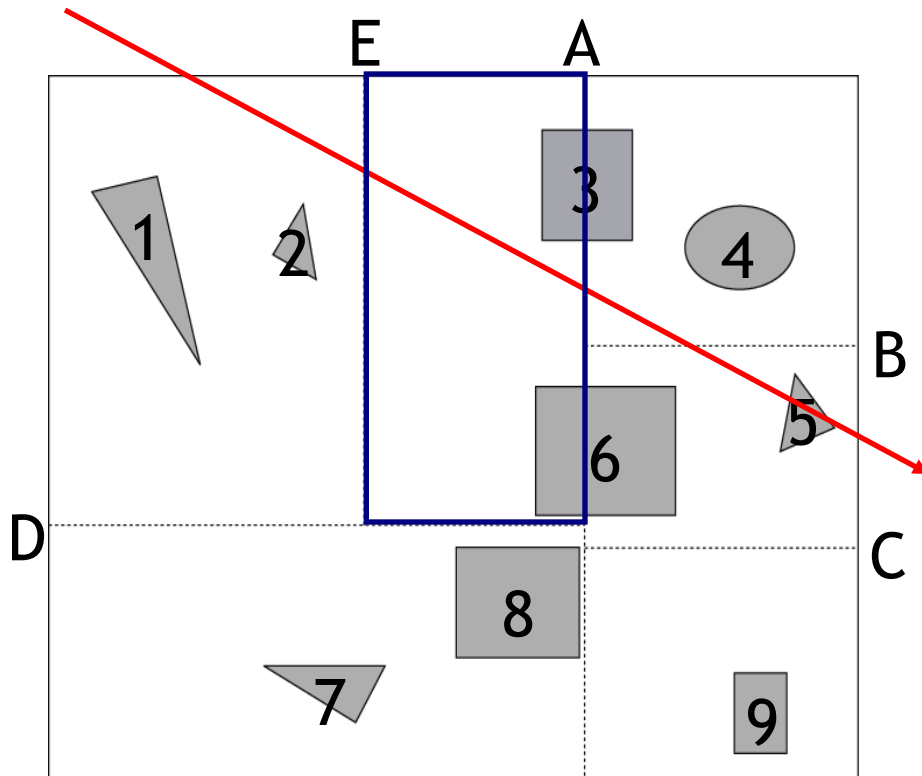
1,2

Stack

B

3,6

Tree traversal



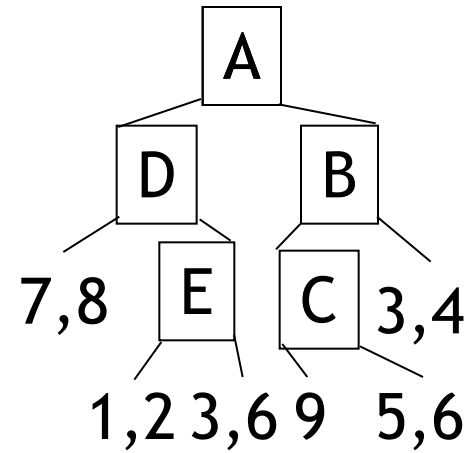
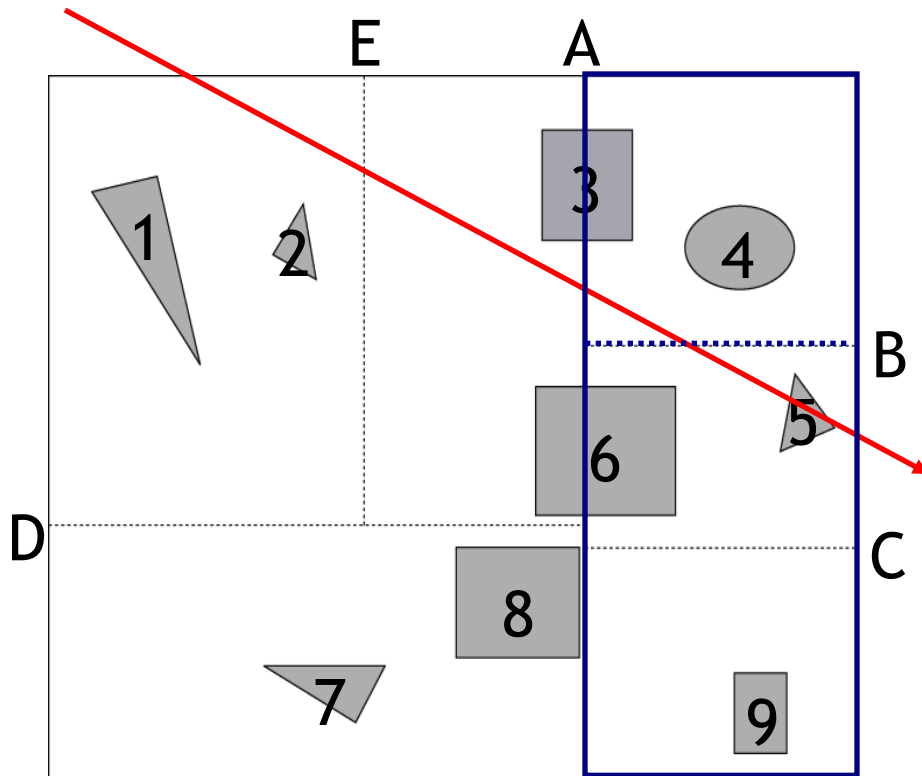
Process

3,6

Stack

B

Tree traversal

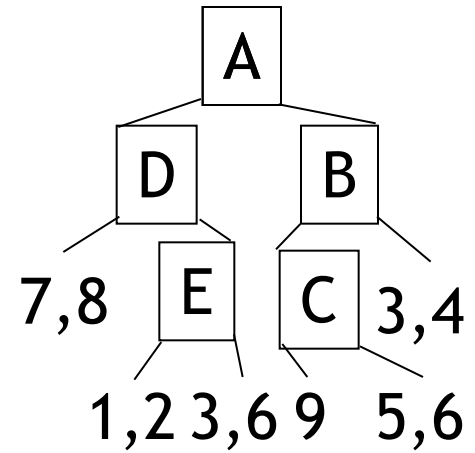
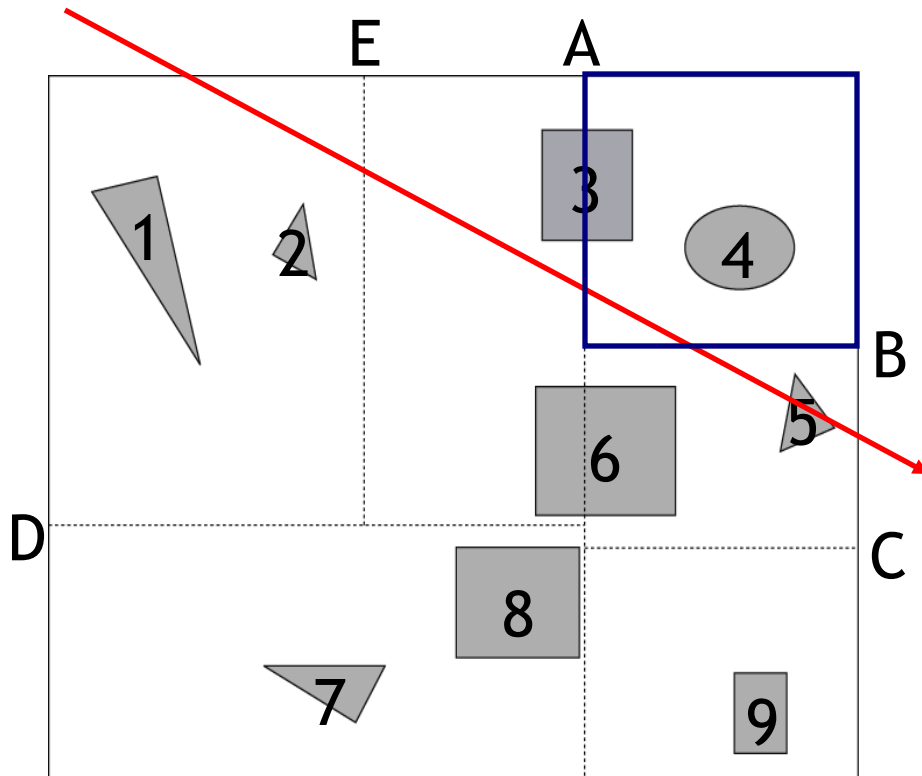


Process

B

Stack

Tree traversal



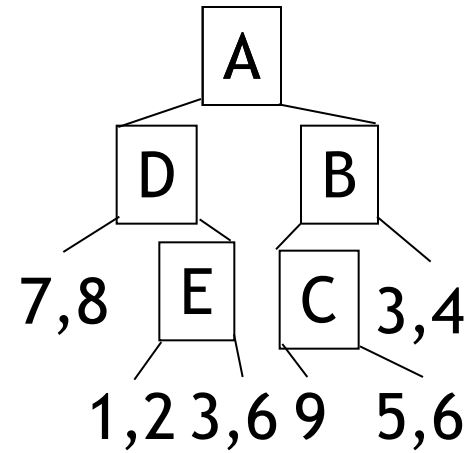
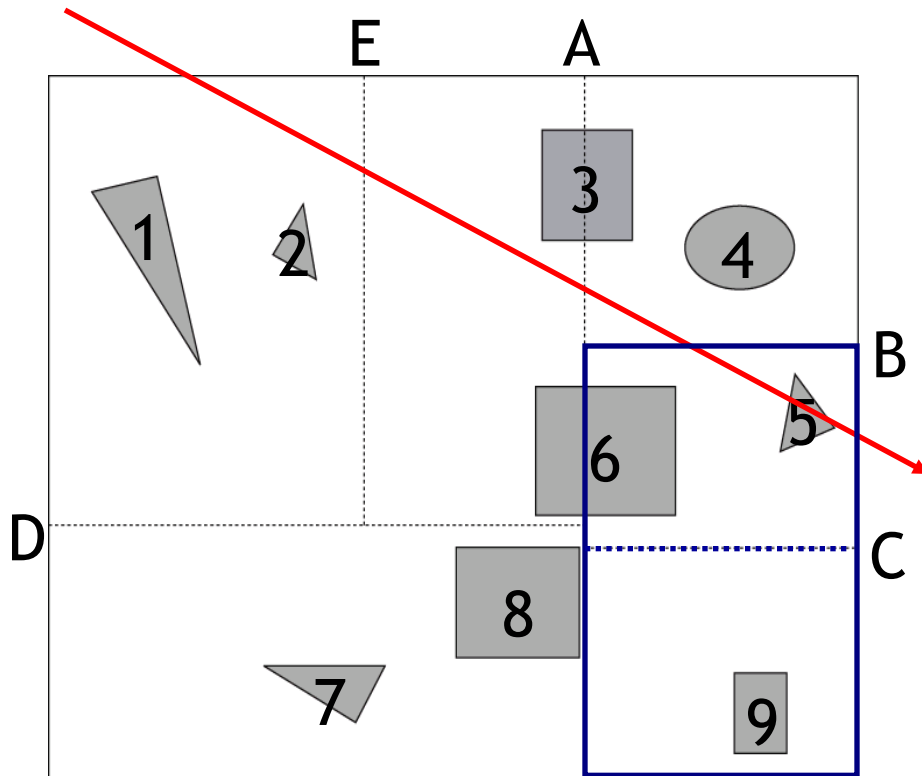
Process

3,4

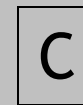
Stack

C

Tree traversal

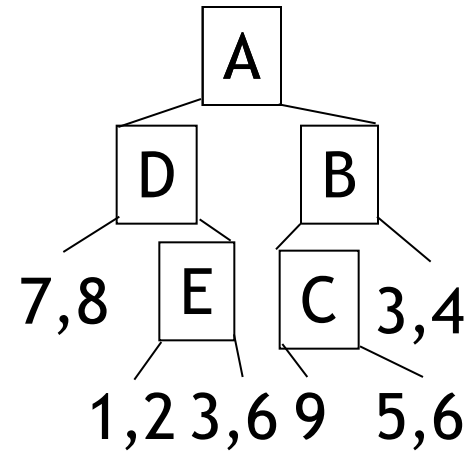
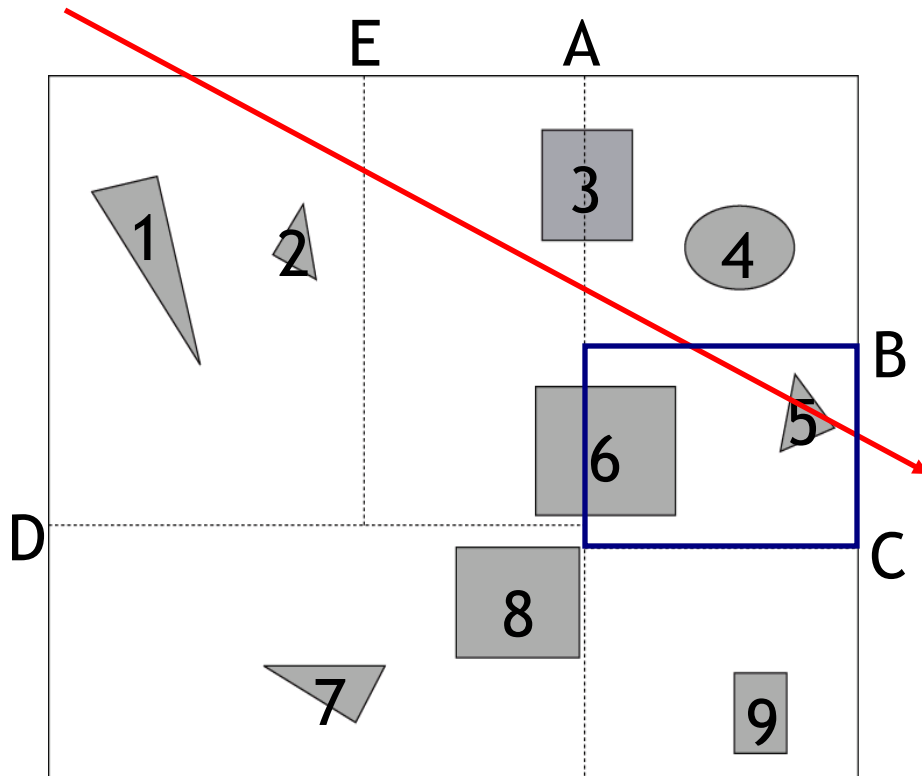


Process



Stack

Tree traversal

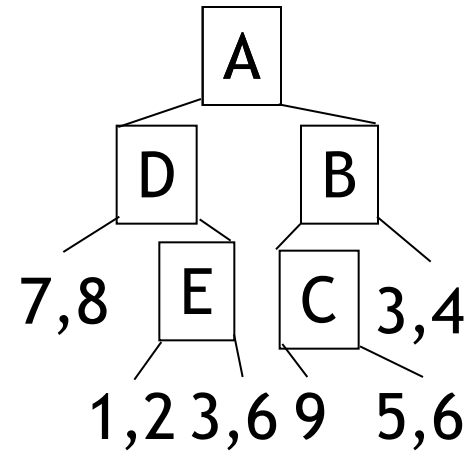
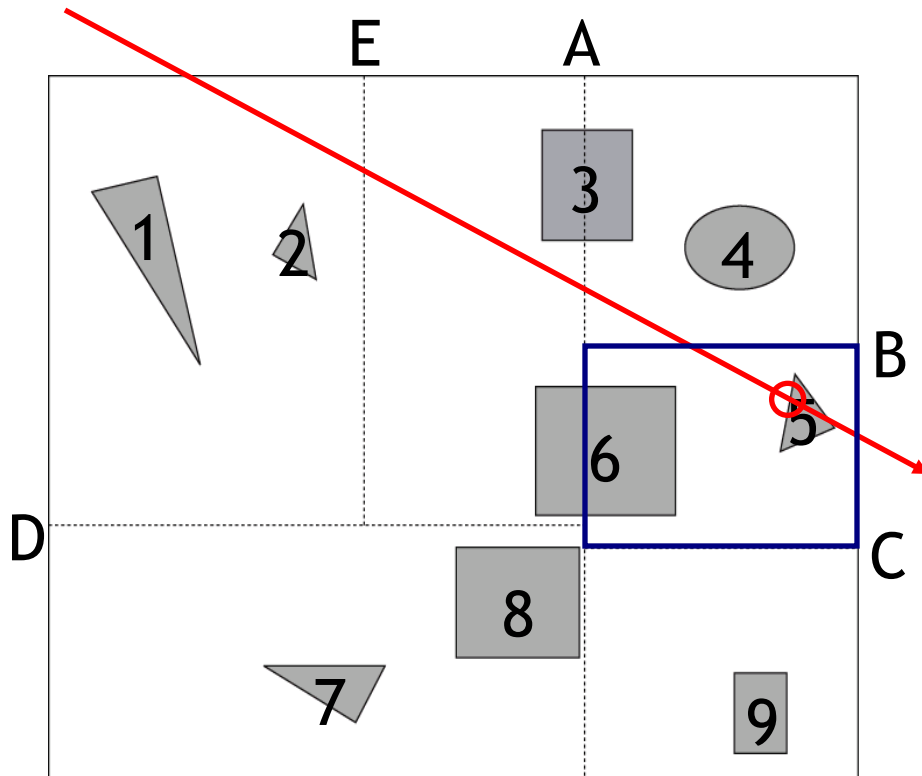


Process

5,6

Stack

Tree traversal



Process

5,6

Stack

Note

- Python renderer relies on Open3D for acceleration ray-triangle mesh intersections

http://www.open3d.org/docs/latest/tutorial/geometry/ray_casting.html

Next time

- Physical models for light and light transport