## Lecture 10: <br> Accelerating Ray-Scene Intersection

Computer Graphics and Imaging UC Berkeley CS184/284A

## Ray Tracing - Performance Challenges



San Miguel Scene, 10.7M triangles

## Ray Tracing - Performance Challenges

Simple ray-scene intersection

- Exhaustively test ray-intersection with every object

Problem:

- Exhaustive algorithm = \#pixels $\times$ \#objects
- Very slow!


## Ray Tracing - Acceleration

- Brute-force algorithm = \#pixels $\times$ \#objects
- Acceleration structures $\approx$ \#pixels $\times \log$ (\#objects)


## Bounding Volumes

## Bounding Volumes

Quick way to avoid intersections: bound complex object with a simple volume

- Object is fully contained in the volume
- If it doesn't hit the volume, it doesn't hit the object
- So test bvol first, then test object if it hits



## Optimize Ray-Plane Intersection For Axis-Aligned Planes?

General


$$
t=\frac{\left(\mathbf{p}^{\prime}-\mathbf{o}\right) \cdot \mathbf{N}}{\mathbf{d} \cdot \mathbf{N}}
$$

3 subtractions, 6 multiplies, 1 division

Perpendicular to x -axis


$$
t=\frac{\mathbf{p}_{x}^{\prime}-\mathbf{o}_{x}}{\mathbf{d}_{x}}
$$

1 subtraction, 1 division

## Ray-Intersection With Box

Could intersect with 6 faces individually
Better way: box is the intersection of 3 slabs


## Ray Intersection with Axis-Aligned Box

2D example; 3D is the same! Compute intersections with slabs and take intersection of $\mathrm{t}_{\text {min }} / \mathrm{t}_{\text {max }}$ intervals


Intersections with $x$ planes


Intersections with $y$ planes


Final intersection result How do we know when the ray misses the box?

## Uniform Spatial Partitions (Grids)

## Preprocess - Build Acceleration Grid



1. Find bounding box

## Preprocess - Build Acceleration Grid



1. Find bounding box
2. Create grid

## Preprocess - Build Acceleration Grid



1. Find bounding box
2. Create grid
3. Store each object in overlapping cells

## Ray-Scene Intersection



Step through grid in ray traversal order (3D line - 3D DDA)
For each grid cell
Test intersection with all objects stored at that cell

## Grid Resolution?



One cell

- No speedup


## Grid Resolution?



Too many cells

- Inefficiency due to extraneous grid traversal


## Grid Resolution?



Heuristic:

- \#cells = C * \#objs
- $C \approx 27$ in 3D


## Careful! Objects Overlapping Multiple Cells



What goes wrong here?

- First intersection found (red) is not the nearest!

Solution?

- Check intersection point is inside cell
Optimize
- Cache intersection to avoid re-testing (mailboxing)


## Uniform Grids - When They Work Well



Grids work well on large collections of objects that are distributed evenly in size and space

## Uniform Grids - When They Fail


"Teapot in a stadium" problem

# Non-Uniform Spatial Partitions: Spatial Hierarchies 

## Spatial Hierarchies



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## Spatial Hierarchies



## Spatial Hierarchies



Ren Ng

## Spatial Hierarchies



## Spatial Partitioning Variants



Oct-Tree


KD-Tree


BSP-Tree

Note: you could have these in both 2D and 3D. In lecture we will illustrate principles in 2D, but for assignment you will implement 3D versions.

## KD-Trees

Internal nodes store

- split axis: $x-, y$-, or $z$-axis
- split position: coordinate of split plane along axis
- children: reference to child nodes

Leaf nodes store

- list of objects
- mailbox information


## KD-Tree Pre-Processing



- Find bounding box
- Recursively split cells, axis-aligned planes
- Until termination criteria met (e.g. max \#splits or min \#objs)
- Store obj references with each leaf node


## KD-Tree Pre-Processing



Only leaf nodes store references to geometry

## KD-Tree Pre-Processing

Choosing the split plane

- Simple: midpoint, median split
- Ideal: split to minimize expected cost of ray intersection

Termination criteria?

- Simple: common to prescribe maximum tree depth (empirical $8+1.3 \log \mathbf{N}, \mathbf{N}=\# o b j s$ ) [PBRT]
- Ideal: stop when splitting does not reduce expected cost of ray intersection


## Top-Down Recursive In-Order Traversal



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## Top-Down Recursive In-Order Traversal



Internal node: split

## Top-Down Recursive In-Order Traversal



Leaf node: intersect all objects

## Top-Down Recursive In-Order Traversal



Internal node: split

## Top-Down Recursive In-Order Traversal



Leaf node: intersect all objects

## Top-Down Recursive In-Order Traversal



Internal node: split

## Top-Down Recursive In-Order Traversal



Leaf node: intersect all objects

## Top-Down Recursive In-Order Traversal



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Intersection found

## KD-Trees Traversal - Recursive Step

W.L.O.G. consider x -axis split with ray moving right


## Object Partitions \&

## Bounding Volume Hierarchy (BVH)

## Spatial vs Object Partitions

Spatial partition (e.g.KD-tree)

- Partition space into nonoverlapping regions
- Objects can be contained in multiple regions


Object partition (e.g. BVH)

- Partition set of objects into disjoint subsets
- Bounding boxes for each set may overlap in space



## Bounding Volume Hierarchy (BVH)



Root $\rightarrow \square$

## Bounding Volume Hierarchy (BVH)



## Bounding Volume Hierarchy (BVH)



## Bounding Volume Hierarchy (BVH)



## Bounding Volume Hierarchy (BVH)

Internal nodes store

- Bounding box
- Children: reference to child nodes

Leaf nodes store

- Bounding box
- List of objects

Nodes represent subset of primitives in scene

- All objects in subtree


## BVH Pre-Processing

- Find bounding box
- Recursively split set of objects in two subsets
- Stop when there are just a few objects in each set
- Store obj reference(s) in each leaf node


## BVH Pre-Processing

Choosing the set partition

- Choose a spatial dimension to partition over (e.g. $x, y, z$ )
- Simple \#1: Split objects around spatial midpoint
- Simple \#2: Split at location of median object
- Ideal: split to minimize expected cost of ray intersection

Termination criteria?

- Simple: stop when node contains few elements (e.g. 5)
- Ideal: stop when splitting does not reduce expected cost of ray intersection


## BVH Recursive Traversal

Intersect (Ray ray, BVH node)
if (ray misses node.bbox) return; if (node is a leaf node) test intersection with all objs; return closest intersection;
hit1 = Intersect (ray, node.child1);
hit2 = Intersect (ray, node.child2); return closer of hit1, hit2;


# Optimizing Hierarchical Partitions (How to Split?) 

## How to Split into Two Sets? (BVH)



## How to Split into Two Sets? (BVH)



## How to Split into Two Sets? (BVH)



Split at median element?
Child nodes have equal numbers of elements

## How to Split into Two Sets? (BVH)



A better split?
Smaller bounding boxes, avoid overlap and empty space

## Which Hierarchy Is Fastest?

Key insight: a good partition minimizes the average cost of tracing a ray

## Which Hierarchy Is Fastest?

What is the average cost of tracing a ray?

For leaf node:

```
Cost(node) \(=\) cost of intersecting all triangles
    = C_isect * TriCount(node)
    C_isect \(\quad=\) cost of intersecting a triangle
    TriCount(node) \(=\) number of triangles in node
```


## Which Hierarchy Is Fastest?

What is the average cost of tracing a ray?

For internal node:

$$
\begin{aligned}
\text { Cost(node) }= & \text { C_trav } \\
& +\operatorname{Prob}(\text { hit L) * } \operatorname{Cost}(\mathrm{L}) \\
& +\operatorname{Prob}(\text { hit } R) * \operatorname{Cost}(R)
\end{aligned} \quad \begin{aligned}
\text { C_trav }= & \text { cost of traversing a cell } \\
\text { Cost }(L)= & \text { cost of traversing left child } \\
\text { Cost }(R)= & \text { cost of traversing right child }
\end{aligned}
$$

# Optimizing Hierarchical Partitions Example: Surface Area Heuristic Algorithm 

## Ray Intersection Probability

The probability of a random ray hitting a convex shape $A$ enclosed by another convex shape $B$ is the ratio of their surface areas, $\mathrm{S}_{\mathrm{A}} / \mathrm{S}_{\mathrm{B}}$.


$$
P(\operatorname{hit} A \mid \operatorname{hit} B)=\frac{S_{A}}{S_{B}}
$$

## Estimating Cost with Surface Area Heuristic (SAH)

Probabilities of ray intersecting a node

- If assume uniform ray distribution, no occlusions, then probability is proportional to node's surface area

Cost of processing a node

- Common approximation is \#triangles in node's subtree

```
Cost(cell) = C_trav + SA(L)*TriCount(L) + SA(R)*TriCount(R)
SA(node) = surface area of bbox of node
C_trav = ratio of cost to traverse vs. cost to intersect tri
    C_trav = 1:8 in PBRT [Pharr & Humphreys]
    C_trav = 1:1.5 in a highly optimized version
```


## Partition Implementation

Constrain search to axis-aligned spatial partitions

- Choose an axis
- Choose a split plane on that axis
- Partition objects into two halves by centroid
- 2N-2 candidate split planes for node with N primitives. (Why?)



## Partition Implementation (Efficient)

Efficient modern approximation: split spatial extent of primitives into $B$ buckets ( $B$ is typically small: $B<32$ )


For each axis: $x, y, z$ :
initialize buckets
For each object $p$ in node:
b = compute_bucket(p.centroid)
b.bbox.union(p.bbox);
b.prim_count++;

For each of the B-1 possible partitioning planes evaluate SAH
Execute lowest cost partitioning found (or make node a leaf)

## Cost-Optimization Applies to Spatial Partitions Too

- Discussed optimization of BVH construction
- But principles are general and apply to spatial partitions as well
- E.g. to optimize KD-Tree construction
- Goal is to minimize average cost of intersecting ray with tree
- Can still apply Surface Area Heuristic
- Note that surface areas and number of nodes in children differ from BVH


## Things to Remember

Linear vs logarithmic ray-intersection techniques
Many techniques for accelerating ray-intersection

- Spatial partitions: Grids and KD-Trees
- Object partitions: Bounding Volume Hierarchies

Optimize hierarchy construction based on minimizing cost of intersecting ray against hierarchy

- Leads to Surface Area Heuristic for best partition


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