## Data Structures \& Algorithms for Geometry

$\bigcirc$ Agenda:

- Introduce course
- Linear algebra primer
- Introduce bounding volumes
- General BV characteristics
- Axis-aligned bounding boxes


## What should you already know?

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- Some knowledge of linear algebra / vector math.


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- For most assignments you will need to implement classes that conform to a very specific interface.
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- Most data structures for geometry are specialized versions of linked lists, binary trees, etc.
- Some knowledge of linear algebra / vector math.
- Can probably pick most of it up on the way, but be prepared to work a little harder.


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$七$ Creation and traversal of space partitions.
- Doom (the original) made BSP trees popular...now you get to implement one.


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- May seem trivial, but what if you want to operate on all the polygons that share a vertex?
$\operatorname{~Numerical~stability~and~geometrical~robustness.~}$
- Floating point math is inexact. This can cause problems. Big problems.


## How will you be graded?

- Bi-weekly quizzes worth 5 points each.
- A final exam worth 50 points.
- Bi-weekly programming assignments with 10 points each.
Ə A term project worth 50 points.


## How will programs be graded?

ə First and foremost, does the program produce the correct output?
$\ominus$ Are appropriate algorithms and data-structures used?

Is the code readable and clear?

## Linear algebra primer

- Three important data types:
- Scalar values
- Row / column vectors
- $1 \times 4$ and $4 \times 1$ are the sizes we'll most often encounter
- Square matrices
- $4 \times 4$ is the size we'll most often encounter


## Scalars

$\rightleftharpoons$ These are the numbers you know!

- Example: 3.14, 5.0, 99.9, $\sqrt{2}$, etc.


## Row vectors

$\theta$ These are special matrices that have multiple columns but only one row.

- Example: $\left.\begin{array}{lll}5.0 & 3.14 & 37\end{array}\right]$
- Add and subtract the way you would expect.
- Example: $\left[\begin{array}{lll}1 & 2 & 3\end{array}\right]+\left[\begin{array}{lll}9 & 10 & 11\end{array}\right]=\left[\begin{array}{lll}10 & 12 & 14\end{array}\right]$
- Both vectors must be the same size.
- Operate with scalars the way you would expect.
- Example: $3.2 \times\left[\begin{array}{lll}1 & 2 & 3\end{array}\right]=\left[\begin{array}{lll}3.2 & 6.4 & 9.6\end{array}\right]$
$\quad$ Notice that vector multiplication is missing...


## Column vectors

$\theta$ These are special matrices that have multiple rows but only one column.

- Example: $\left[\begin{array}{l}1 \\ 2 \\ 3\end{array}\right]$

Ə Work just like row vectors.

## Vector operations

$\vartheta$ There are only a few operations specific to vectors that are really important for us.

## Dot Product

$\rightleftharpoons$ Noted as a "dot" between two vectors (e.g., A•B)

- Also known as "inner product."
- Multiply matching elements, sum all the results.
- Example:

$$
\left[\begin{array}{ll}
2.3 & 1.2
\end{array}\right] \cdot\left[\begin{array}{ll}
1.7 & 6.5
\end{array}\right]=(2.3 * 1.7)+(1.2 * 6.5)=11.71
$$

## Why is the dot product so interesting?

- In 3-space, the dot of two unit vectors is the cosine of the angle between the two vectors.
- If the vectors are not already normalized (unit length), we can divide the dot product by the magnitudes.
- Example:

$$
\frac{a \cdot b}{|a||b|}=\cos \theta
$$

## Vector Magnitude

- Noted by vertical bars, like absolute value.

Take the square root of the dot product of the vector with itself...like absolute value.
ə Result is the magnitude (a.k.a. length) of the vector.

- Example:

$$
\begin{gathered}
\left.\left[\begin{array}{ll}
\frac{\sqrt{2}}{2} & \frac{\sqrt{2}}{2}
\end{array}\right]=\sqrt{\left[\frac{\sqrt{2}}{2}\right.} \frac{\sqrt{2}}{2}\right] \cdot\left[\begin{array}{ll}
\frac{\sqrt{2}}{2} & \frac{\sqrt{2}}{2}
\end{array}\right]= \\
\sqrt{\left(\frac{\sqrt{2}}{2}\right)^{2}+\left(\frac{\sqrt{2}}{2}\right)^{2}}=\sqrt{\frac{2}{4}+\frac{2}{4}}=1
\end{gathered}
$$

## Normalize

- Noted by dividing a vector by its magnitude.
- Example: $\frac{A}{|A|}$
$\ominus$ Results in a vector with the same direction, but a magnitude of 1.0.
$\quad$ Works the same as with scalars.


## Cross Product

- Noted as an X between two vectors (e.g., $a \times b$ )
$\rightleftharpoons$ Derivation of the cross product is not important. The math is:

$$
a \times b=\left[\begin{array}{lll}
a_{y} b_{z}-a_{z} b_{y} & a_{z} b_{x}-a_{x} b_{z} & a_{x} b_{y}-a_{y} b_{x}
\end{array}\right]
$$

$\bigcirc$ Only valid in 3-dimensions.

## Why is the cross product so interesting?

© Two really useful properties.

- The result of the cross product between two vectors is a new vector that is perpendicular (also called normal) to both vectors.
- If the source vectors are normalized:

$$
|a \times b|=\sin \theta
$$

## Matrices

- Like vectors, but have multiple rows and columns.
- Example: $\left[\begin{array}{llll}1.0 & 0.0 & 0.0 & 0.0 \\ 0.0 & 1.0 & 0.0 & 0.0 \\ 0.0 & 0.0 & 1.0 & 0.0 \\ 0.0 & 0.0 & 0.0 & 1.0\end{array}\right]$

ค Add and subtract like you would expect.

- Like vectors, both matrices must be the same size...in both dimensions.


## Matrix / vector multiplication

ə Special rules apply that make it different from scalar multiplication.

- Not commutative! e.g., $M \times N \neq N \times M$
- Is associative. e.g., ( $N M$ ) $P=N(M P)$
- Column count of first matrix must match row count of second matrix.
- If M is a 4-by-3 matrix and N is a 3-by-1 matrix, we can do $M \times N$, but not $N \times M$.
- If the source matrices are n-by-m and m-by-p, the resulting matrix will be $n$-by-p.


## Matrix / vector multiplication (cont.)

$\quad$ To calculate an element of the matrix, C, resulting from AB:

$$
C_{i j}=\sum_{r=1}^{n} a_{i r} b_{r j}
$$

- What does this look like?


## Matrix / vector multiplication (cont.)

〇To calculate an element of the matrix, C , resulting from AB:

$$
C_{i j}=\sum_{r=1}^{n} a_{i r} b_{r j}
$$

$\ominus$ What does this look like?

- The dot product of a row of A with a column of B.
- This is why the column count of A must match the row count of B...otherwise the dot product wouldn't work.


## Transpose

〇 Noted by a "T" in the exponent position (e.g., M ${ }^{T}$ ).
-The rows become the columns, and the columns become the rows.

- Example:

$$
\left[\begin{array}{ll}
2 & 3 \\
4 & 5 \\
6 & 7
\end{array}\right]^{T}=\left[\begin{array}{lll}
2 & 4 & 6 \\
3 & 5 & 7
\end{array}\right]
$$

## References

## http://en.wikipedia.org/wiki/Matrix_multiplication http://en.wikipedia.org/wiki/Dot_product http://en.wikipedia.org/wiki/Cross_product

## Break

## Bounding Volumes

- From Wikipedia:
"...a bounding volume for a set of objects is a closed volume that completely contains the union of the objects in the set."
- Why is this useful?


## Bounding Volumes

$\ominus$ From Wikipedia:
"...a bounding volume for a set of objects is a closed volume that completely contains the union of the objects in the set."
$\partial$ Why is this useful?

- We can represent complex geometry (a character model with 50,000 polygons) with a simplified approximation (a box with 6 polygons) that can be tested more quickly.
- Since the representation is inexact, so is the test result.


## Desirable BV Characteristics

O Inexpensive intersection tests

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- The whole point of using a BV instead of the source geometry is to speed up rejection / acceptance tests between geometric objects.


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- If the BV is a poor representation of the source geometry, tests between BVs will result in many false positives or false negatives.


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- If the BV is too expensive to compute, it may cancel out any speed-up that it provides.


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## Desirable BV Characteristics

Ə Inexpensive intersection tests

- Tight fitting to source geometry
- Inexpensive to compute
- Easy to transform
- Most interesting objects move. If the object moves, its BV needs to move with it. If it is too difficult / expensive to move, it may cancel out the speed-up.


## Desirable BV Characteristics

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## Desirable BV Characteristics

- Inexpensive intersection tests
- Tight fitting to source geometry
- Inexpensive to compute
- Easy to transform
- Inexpensive to store
- If the BV requires too much space to store or too much time to access, it can negatively impact performance.


## Axis-aligned bounding box

$\rightleftharpoons$ One common BV is the axis-aligned bounding box (AABB).
Э Just an n-dimensional box whose sides are parallel to the axis and encloses all points.

## AABB Example



## AABB representation

$\theta$ Three common ways to represent an AABB

- All are equivalent, and each can easily be converted to the other.
- Depending on the data used to create the AABB, one representation may be easier to create than another.


## Minimum / maximum point

class aabb_m $\_$m \{
// Point such that for every // point P in the object: // (min.x <= P.x <= max.x) \&\& // (min.y <= P.y <= max.y) \&\& // (min.z <= P.z <= max.z) point min; point max;
\};

## Min point / diameter

class aabb_m_d \{
// Point such that for every // point P in the object:
// (min. $x$ <= P.x) \&\&
// (min.y <= P.y) \&\&
// (min.z <= P.z)
point min;
// Size AABB in each dimension. point diameter;
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## Center / radius

class aabb_c_r \{ // Center of the AABB. point center;
// Distance from 'center' to each // side of the AABB. point radius;
\};

## AABB-AABB Intersection

$\ominus$ AABB-AABB intersection is just an interval overlap test extended to $n$-dimensions.

- If there is no overlap in any dimension, the AABBs cannot intersect.
- Examples:
- Do $A=\{c=\{1,1\}, r=\{1,2\}\}$ and $B=\{c=\{3$, $4\}, r=\{1,1\}\}$ intersect?


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- Examples:
- Do $A=\{c=\{1,1\}, r=\{1,2\}\}$ and $B=\{c=\{3$, $4\}, r=\{1,1\}\}$ intersect?
- Do $A=\{c=\{1,1\}, r=\{2,2\}\}$ and $B=\{c=\{3$, $4\}, r=\{2,2\}\}$ intersect?


## AABB-AABB Intersection (cont.)

```
bool aabb_c_r::intersect(aabb_c_r &box)
{
    const point dist = center - box.center;
    const point rad = radius + box.radius;
    if (abs(dist[0]) > (rad[0])) return false;
    if (abs(dist[1]) > (rad[1])) return false;
    if (abs(dist[2]) > (rad[2])) return false;
    return true;
}
```


## AABB Creation

$\rightarrow$ Creating an initial AABB from source data is a trivial $O(\mathrm{n})$ problem.

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- Scan all of the points tracking the minimum and maximum value in each dimension. Convert the resulting values to the desired representation.
$\uparrow$ As the object moves, how can we update the AABB?
- Rotations are the problem.


## AABB from Bounding Sphere

$\rightleftharpoons$ For a given rotation:
1.Create a sphere centered at the point of rotation that encompasses the object.
2. Create an AABB from that sphere.
$\quad$ Merits and drawbacks of this technique?

## AABB from Bounding Sphere

$\rightleftharpoons$ For a given rotation:
1.Create a sphere centered at the point of rotation that encompasses the object.
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$\quad$ Merits and drawbacks of this technique?

- Fast to compute.
- Only works well if the object has a single pivot point.
- Creates a very loose AABB.
- Why not just use the bounding sphere?!?


## AABB from Source Data

〇 Recalculate the AABB from the transformed source data.

- Don't actually transform the points. Instead transform the axis use for the comparisons.
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## AABB from Source Data

- Recalculate the AABB from the transformed source data.
- Don't actually transform the points. Instead transform the axis use for the comparisons.
- Merits and drawbacks of this technique?
- Creates a tight fitting AABB.
- O(n) per transformation can be too expensive.
- Can be optimized using other search structures and / or a convex hull.
- More about convex hulls next week.


## AABB by Hill-climbing

Э Track the six points at the extrema of the AABB
$\supset$ To update, examine the neighboring points to search for the new extrema.
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Э Track the six points at the extrema of the AABB
$\supset$ To update, examine the neighboring points to search for the new extrema.
$\supset$ Merits and drawbacks of this technique?

- Creates a tight fitting AABB.
- Fast, but...
- Requires precalculation of a convex hull
- Requires a data structure that stores connectivity among points


## AABB from Rotated AABB

$\rightleftharpoons$ Transform the original AABB and compute its AABB.

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## AABB from Rotated AABB

$\rightleftharpoons$ Transform the original AABB and compute its AABB.

- Merits and drawbacks of this technique?
- Fast.
- Not a very tight fitting AABB.
- Very commonly used.


## Refererences

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

## Next week...

- More bounding volumes...
- Bounding spheres
- Oriented bounding boxes
- k-DOPs
- Convex hulls
- Something we can do with our BVs!
- First programming assignment will be assigned.


## Legal Statement

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