

# Collision Detection

Jane Li

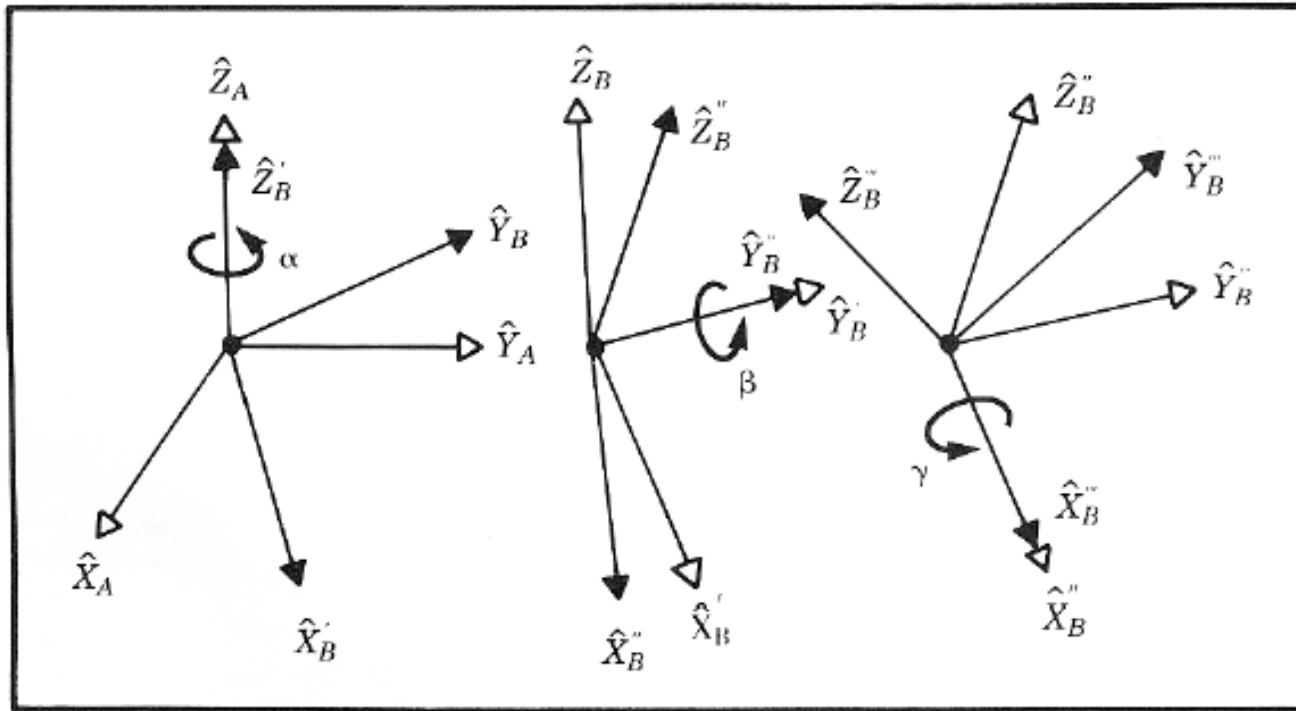
Assistant Professor

Mechanical Engineering & Robotics Engineering

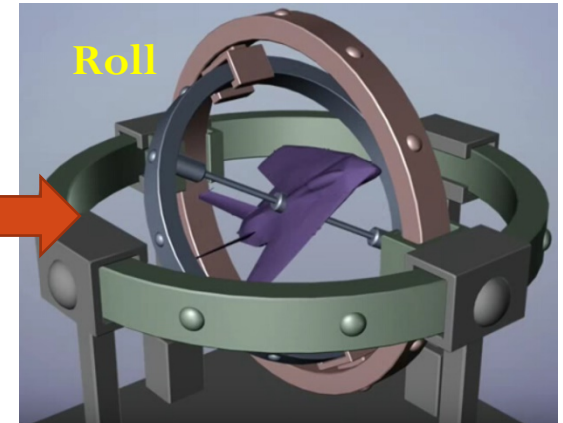
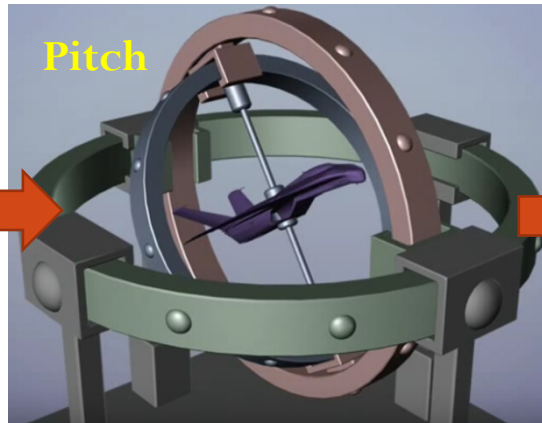
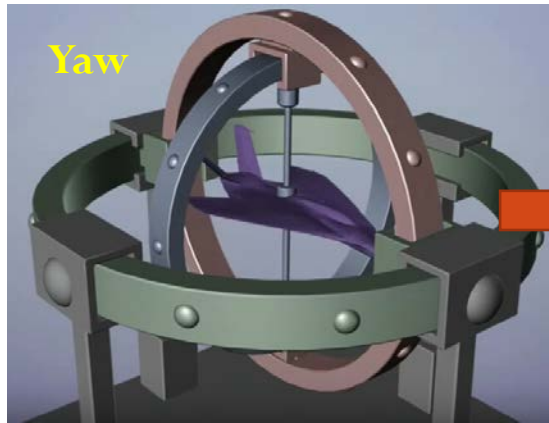
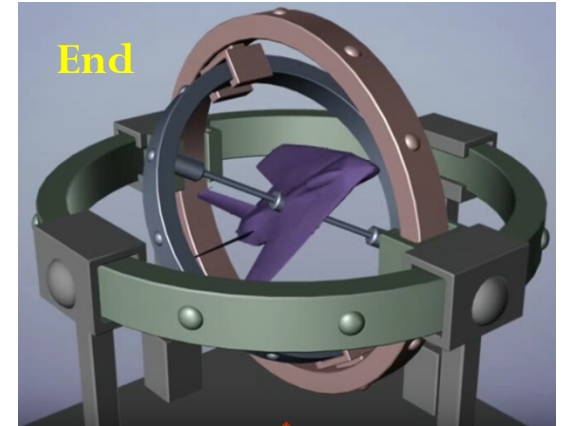
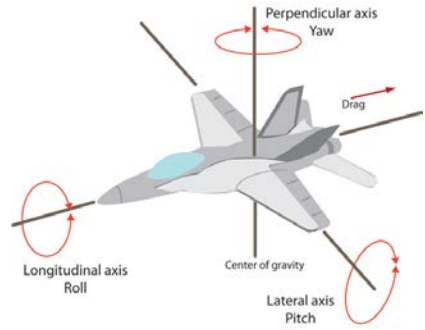
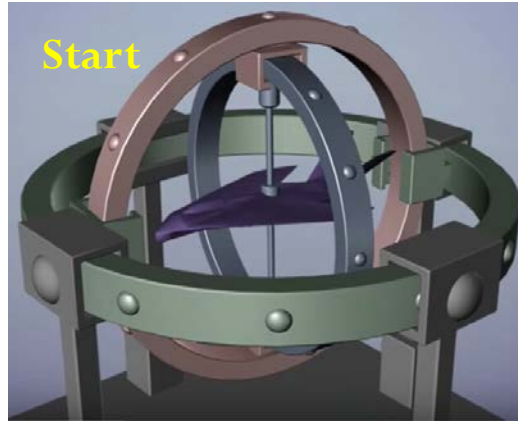
<http://users.wpi.edu/~zli11>

# Euler Angle

- Euler angle – Change the orientation of a rigid body to by
  - Applying sequential rotations about moving axes

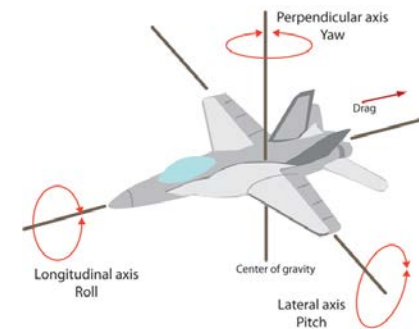
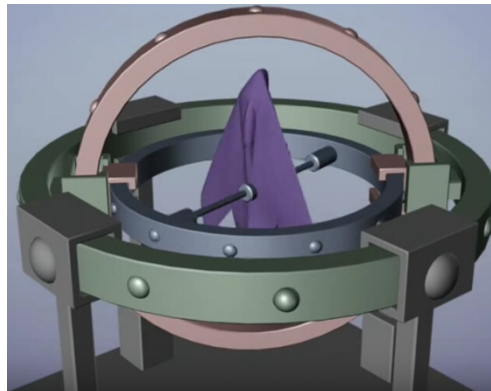


# No Gimbal Lock



# Euler Angle and Gimbal

- Applying Euler angle rotation **behaves** as if
  - Changing the orientation of an object using real gimbal set – a mechanism
  - As a mechanism, gimbal set can have **singularity**
- Gimbal lock
  - At this configuration, gimbal set can change the roll in many ways, but
    - Cannot change the yaw of the plane, without changing the pitch at the same time
    - → Lose the control of one DOF for **yaw**



# Gimbal Lock – Singularity Problem

- Singularities
  - Why does the ring for yaw and ring for roll do the same thing?
- Let's say this is our convention:

$$R = \begin{bmatrix} \cos \alpha & -\sin \alpha & 0 \\ \sin \alpha & \cos \alpha & 0 \\ 0 & 0 & 1 \end{bmatrix} \begin{bmatrix} 1 & 0 & 0 \\ 0 & \cos \beta & -\sin \beta \\ 0 & \sin \beta & \cos \beta \end{bmatrix} \begin{bmatrix} \cos \gamma & -\sin \gamma & 0 \\ \sin \gamma & \cos \gamma & 0 \\ 0 & 0 & 1 \end{bmatrix}$$

- Let's set  $\beta = 0$

$$R = \begin{bmatrix} \cos \alpha & -\sin \alpha & 0 \\ \sin \alpha & \cos \alpha & 0 \\ 0 & 0 & 1 \end{bmatrix} \begin{bmatrix} 1 & 0 & 0 \\ 0 & 1 & 0 \\ 0 & 0 & 1 \end{bmatrix} \begin{bmatrix} \cos \gamma & -\sin \gamma & 0 \\ \sin \gamma & \cos \gamma & 0 \\ 0 & 0 & 1 \end{bmatrix}$$

- Multiplying through, we get:

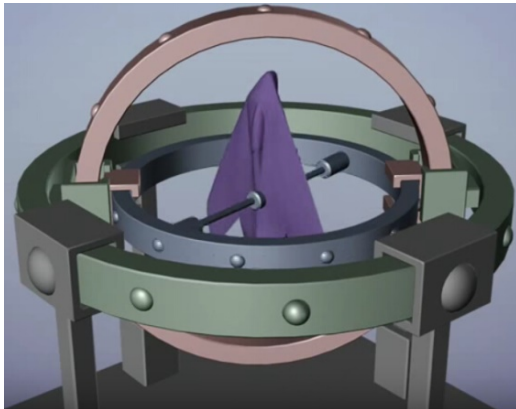
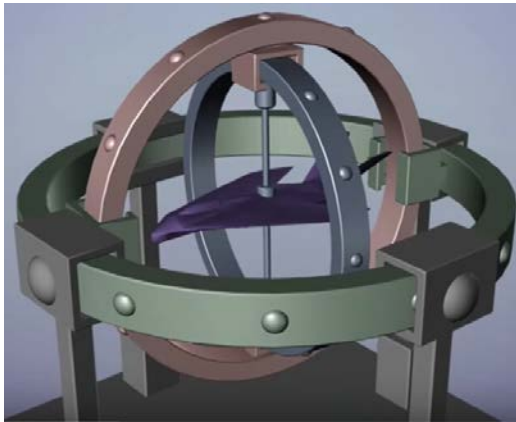
$$R = \begin{bmatrix} \cos \alpha \cos \gamma - \sin \alpha \sin \gamma & -\cos \alpha \sin \gamma - \sin \alpha \cos \gamma & 0 \\ \sin \alpha \cos \gamma + \cos \alpha \sin \gamma & -\sin \alpha \sin \gamma + \cos \alpha \cos \gamma & 0 \\ 0 & 0 & 1 \end{bmatrix}$$

- Simplify:

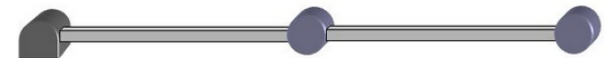
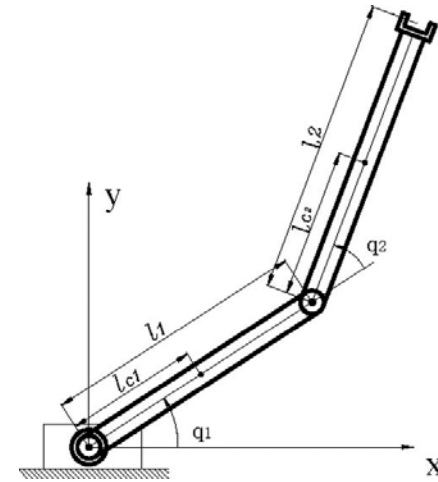
$$R = \begin{bmatrix} \cos(\alpha + \gamma) & -\sin(\alpha + \gamma) & 0 \\ \sin(\alpha + \gamma) & \cos(\alpha + \gamma) & 0 \\ 0 & 0 & 1 \end{bmatrix}$$

$\alpha$  and  $\gamma$  do the same thing!  
We have lost a degree  
of freedom!

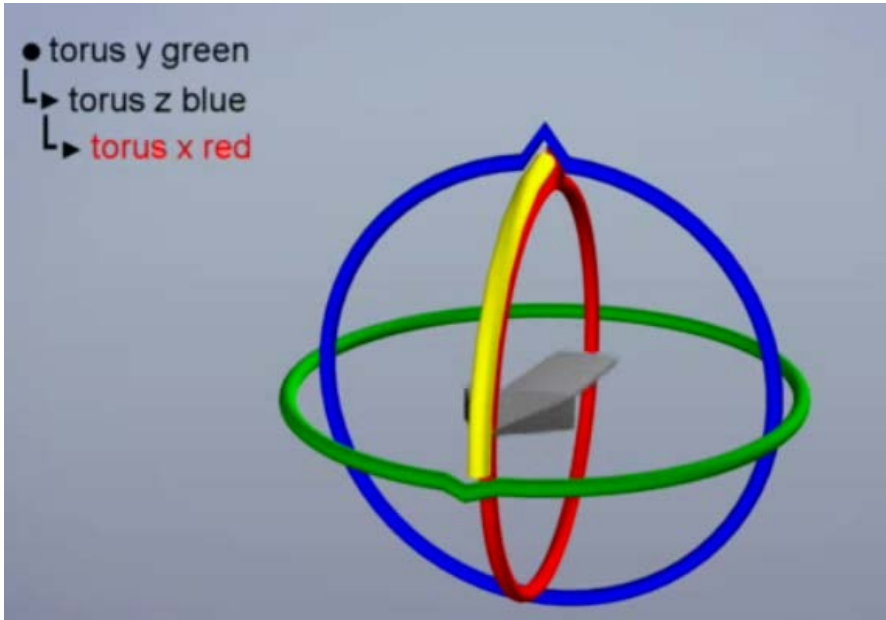
# Gimbal Lock is a Singularity Problem



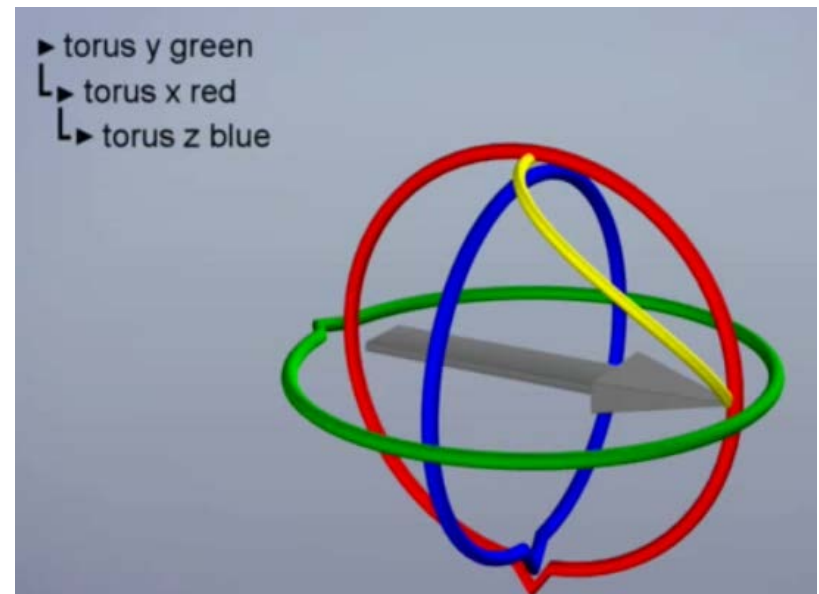
Lose the control of Yaw



## Get out of gimbal lock?



To **Pitch**, First need to get out of gimbal lock  
→ Rotate **ring for yaw** back and forth, while rotate the **ring for pitch**  
→ Unexpected curved Motion



# Why Rotation Matrix and Quaternion

- Why rotation matrix and quaternion do not have gimbal lock?
  - 3D Rotation  $\rightarrow$  quaternion, rotation matrix --- one to one
  - 3D Rotation  $\rightarrow$  Euler angles --- not one-to-one
    - Sometimes, the dimension of the Euler angle space drops to 2

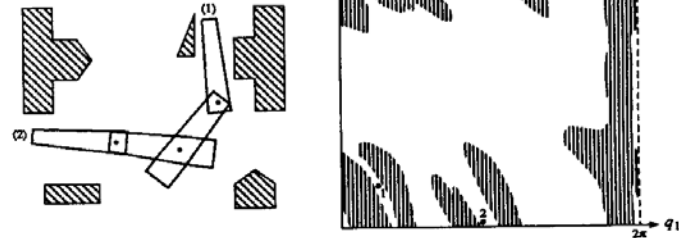
$${}^A_B R_{Z'Y'X'}(\alpha, \beta, \gamma) = R_Z(\alpha)R_Y(\beta)R_X(\gamma) = \begin{matrix} \text{1} \\ \left[ \begin{array}{ccc} c\alpha & -s\alpha & 0 \\ s\alpha & c\alpha & 0 \\ 0 & 0 & 1 \end{array} \right] \end{matrix} \begin{matrix} \text{2} \\ \left[ \begin{array}{ccc} c\beta & 0 & s\beta \\ 0 & 1 & 0 \\ -s\beta & 0 & c\beta \end{array} \right] \end{matrix} \begin{matrix} \text{3} \\ \left[ \begin{array}{ccc} 1 & 0 & 0 \\ 0 & c\gamma & -s\gamma \\ 0 & s\gamma & c\gamma \end{array} \right] \end{matrix}$$

$${}^A_B R_{Z'Y'X'}(\alpha, \beta, \gamma) = \begin{bmatrix} c\alpha c\beta & c\alpha s\beta s\gamma - s\alpha c\gamma & c\alpha s\beta c\gamma + s\alpha s\gamma \\ s\alpha c\beta & s\alpha s\beta s\gamma + c\alpha c\gamma & s\alpha s\beta c\gamma - c\alpha s\gamma \\ -s\beta & c\beta s\gamma & c\beta c\gamma \end{bmatrix}$$



# Motivation

- Find a path in C-space



- Compute  $C_{obs}$  – Hard
- Check if a configuration is collision – Easy
- Collision detection
  - For a single configuration
  - Along a path/trajectory

# Collision Detection

- Speed is **very** important
  - Need to check collision for **large number of** configurations
  - For most planners, runtime for real-world task depends **heavily** on the speed of collision checking
- Tradeoff
  - Speed
  - Accuracy
  - Memory usage
  - Increase speed → more memory, less accuracy

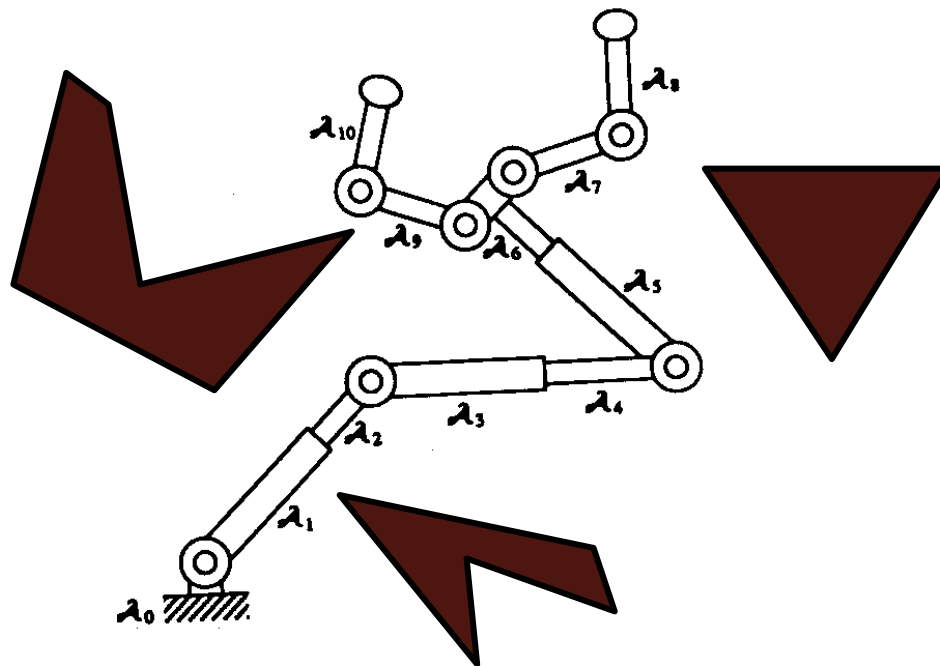
# Crowd Simulation



Figure from Kanyuk, Paul. "Brain Springs: Fast Physics for Large Crowds in WALLdr E." IEEE Computer Graphics and Applications 29.4 (2009).

# Self-Collision Checking for Articulated Robot

- Self-collision is typically not an issue for mobile robots
- Articulated robots must avoid self-collision
  - Parent-child link – set proper joint angle limits
  - With root or other branches – e.g. Humanoid robot?



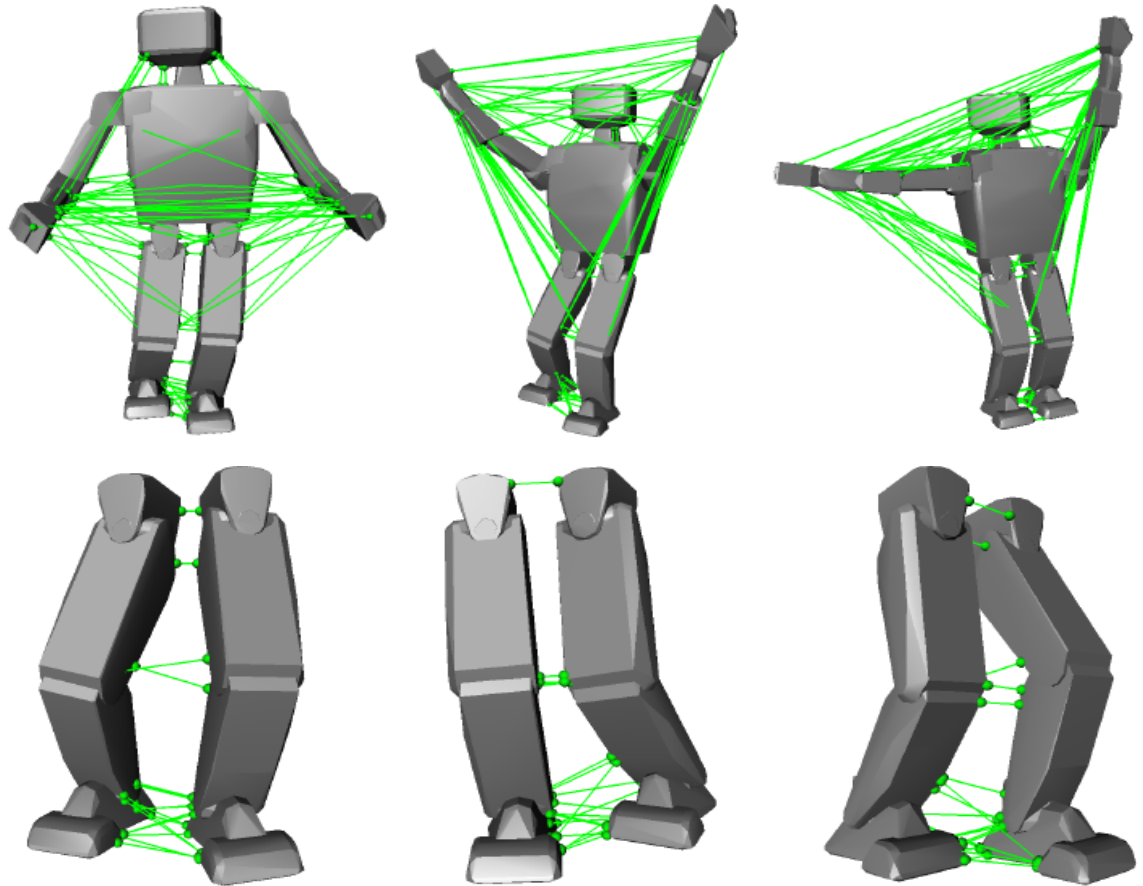
# Self-Collision Checking For Humanoid Robot

$$P = \left( \sum_{i=1}^{N-1} i \right) - (N - 1) = \sum_{i=1}^{N-2} i$$

$$P = \frac{N^2 - 3N + 2}{2}$$

For  $N = 31$ ,

$$P = 435.$$



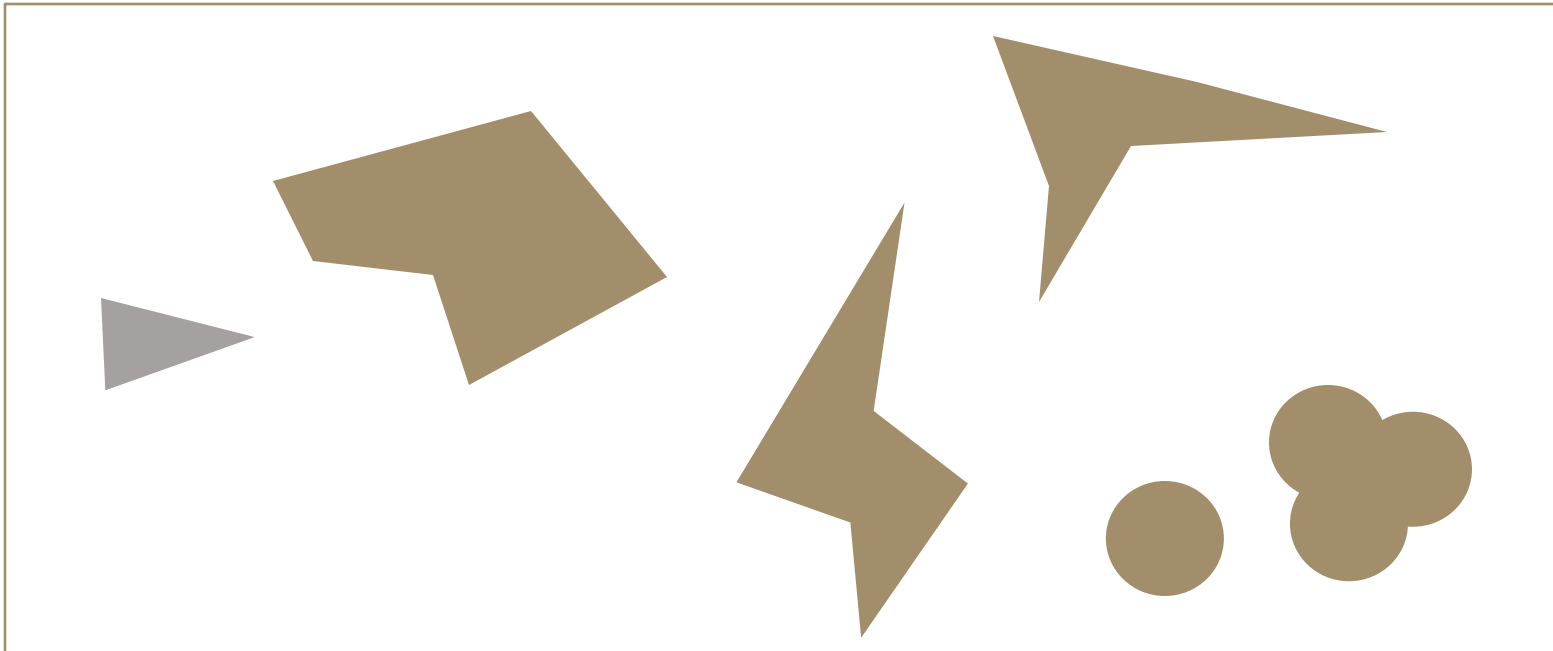
(J. Kuffner et al. Self-Collision and Prevention for Humanoid Robots. Proc. IEEE Int. Conf. on Robotics and Automation, 2002)

# Outline

- Representing Geometry
- Methods
  - Bounding volumes
  - Bounding volume Hierarchy
- Dynamic collision detection
- Collision detection for Moving Objects
  - Feature tracking, swept-volume intersection, etc.

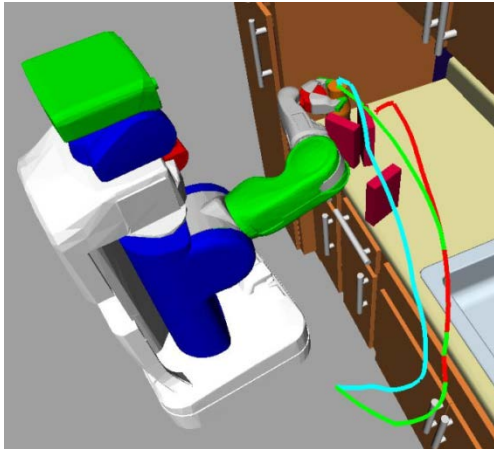
## 2D Representation

- 2D robots and obstacles are usually represented as
  - Polygons
  - Composites of discs



## 3D Representation

- Many representations - most popular for motion planning are
  - Triangle meshes
  - Composites of primitives (box, cylinder, sphere)
  - Voxel grids



Triangle meshes



Composite of primitives

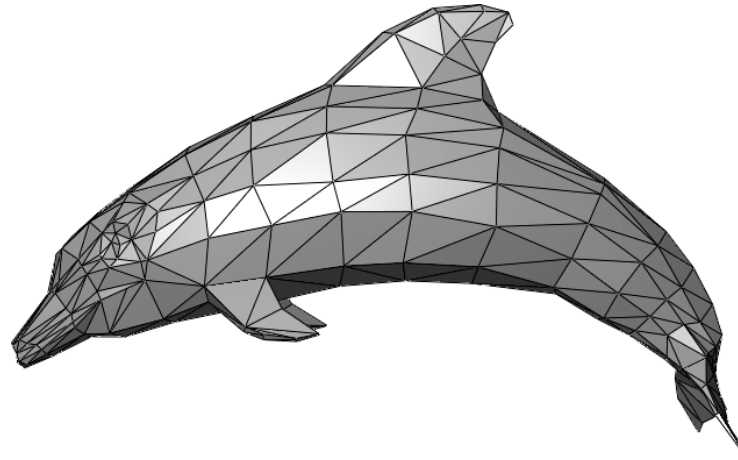


Voxel grid



# 3D Representation: Triangle Meshes

- Triangle mesh
  - A set of triangles in 3D that share common vertices and/or edges
- Most real-world shapes can be represented as triangle meshes

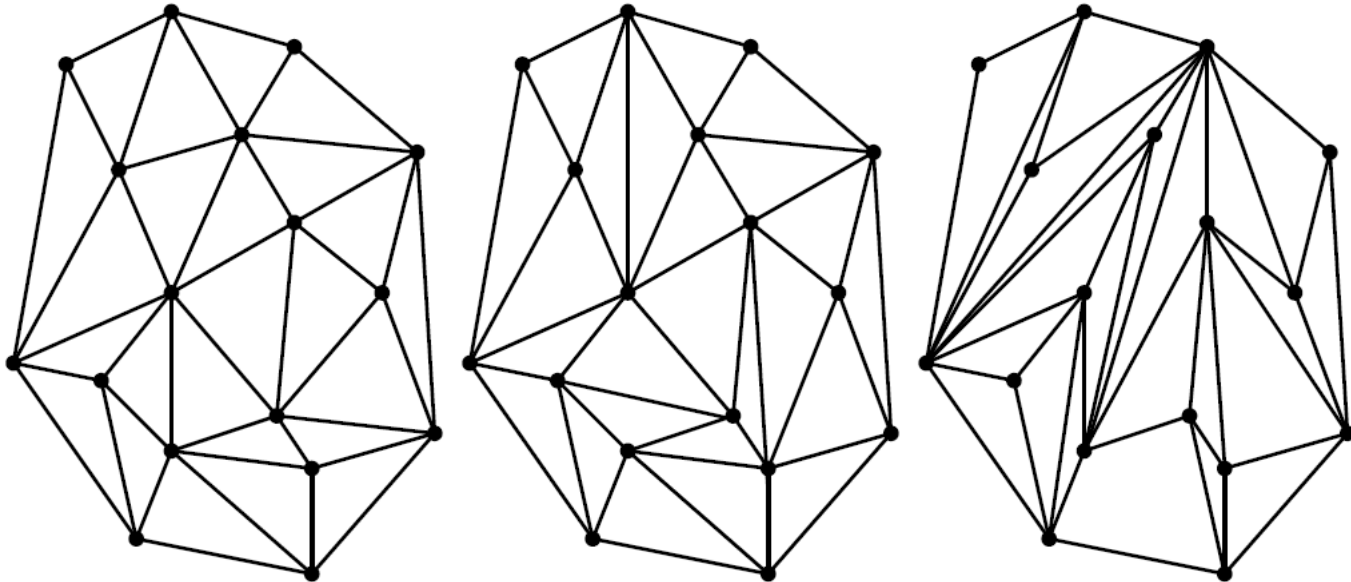
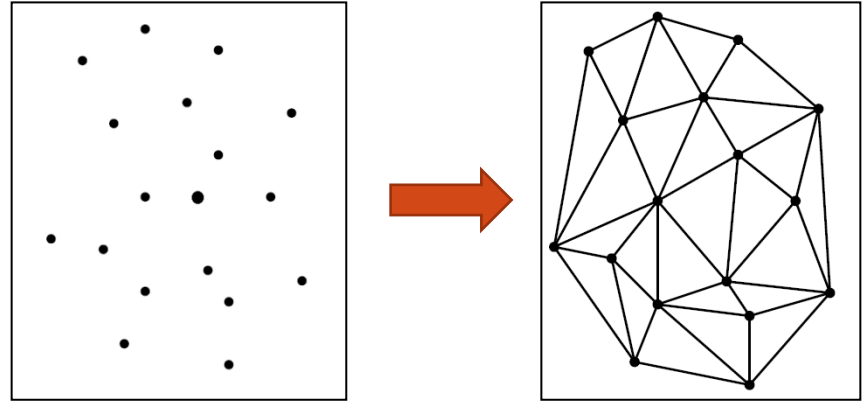


- Delaunay Triangulation
  - A good way to generate such meshes (there are several algorithms)

# Delaunay Triangulation

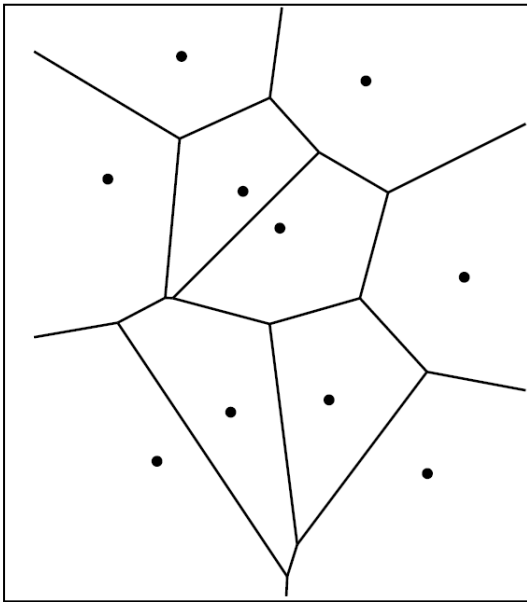
- Method

- Sample on the terrain
- Connect Sample points
- Which triangulation?

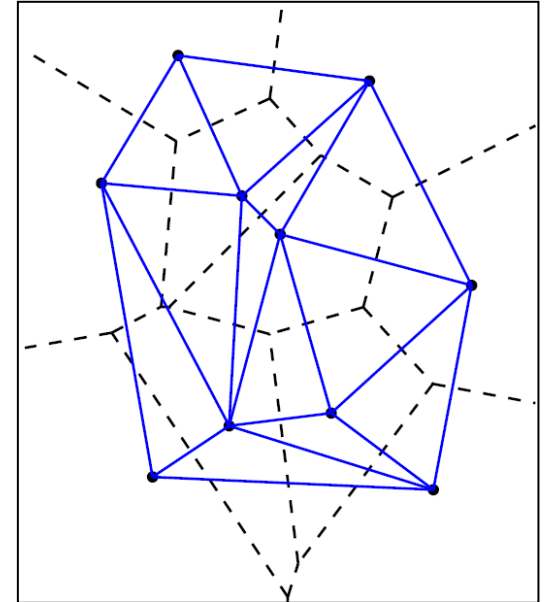
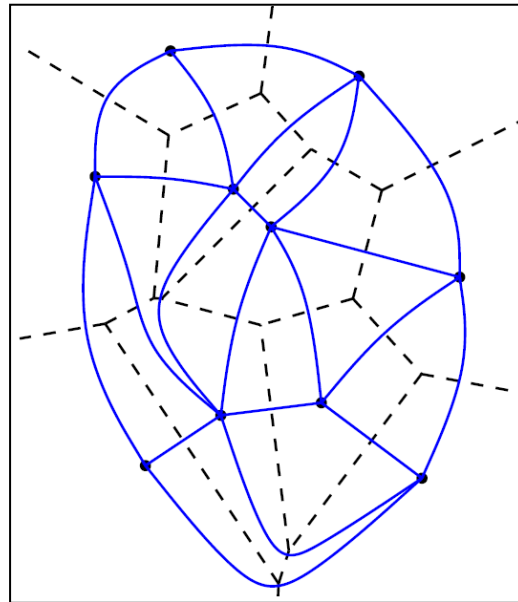


# Delaunay Triangulation

- Goal – Avoid sliver triangle
  - Find the dual graph of Voronoi graph



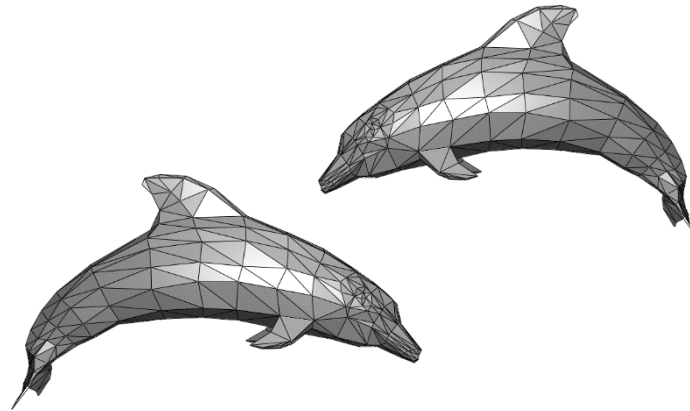
Voronoi Graph



Delaunay Graph

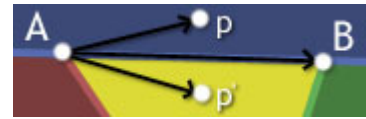
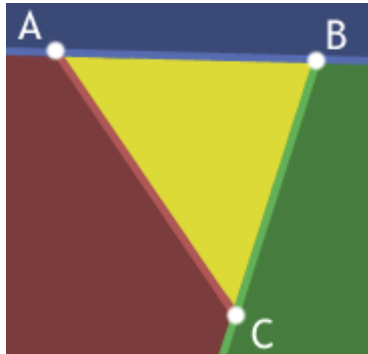
# Collision Checking: Intersecting Triangle Meshes

- The brute-force way
  - Check for intersection between every pair of triangles

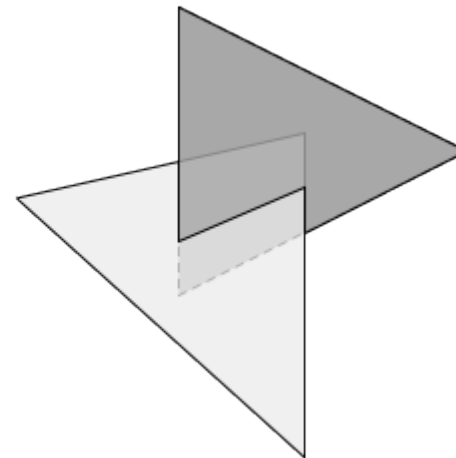
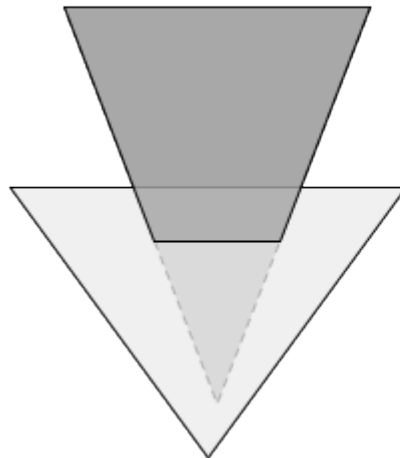


# Collision Checking for Triangles

- Check if a point in a triangle

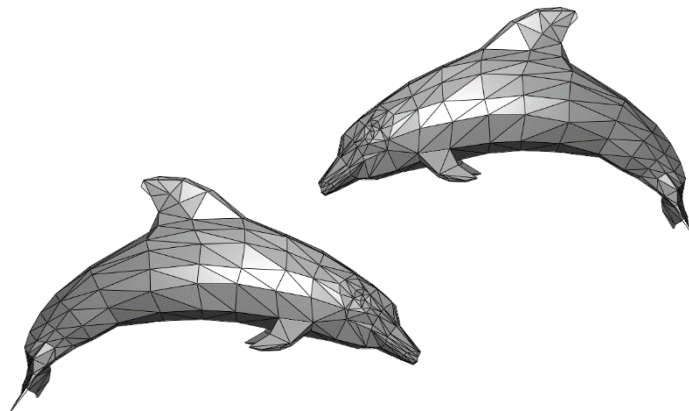


- Check if two triangles intersect



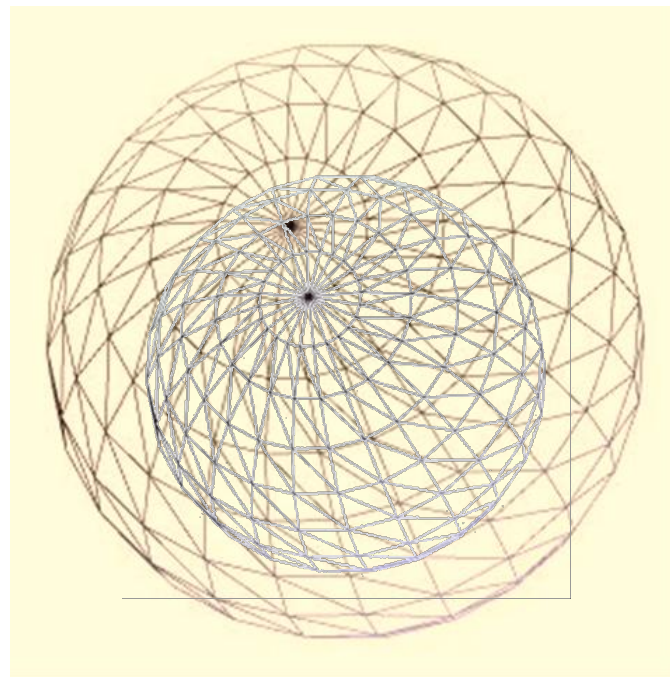
# Collision Checking: Intersecting Triangle Meshes

- Triangle-Triangle intersection checks have a lot of corner cases; checking many intersections is slow
  - See “O'Rourke, Joseph. *Computational geometry in C*. Cambridge university press, 1994.” for algorithms.
- Can we do better than all-pairs checking? – talk about it later ...



## 3D Representation: Triangle Meshes

- Triangle Meshes are **hollow**!
- Be careful if you use them to represent solid bodies



One mesh inside another; no intersection

## 3D Representation: Triangle Meshes

- Complexity of collision checking increases with the number of triangles
  - Try to keep the number of triangles low



- Algorithms to simplify meshes exist but performance depends on shape



# 3D Representation: Composites of Primitives

- Advantages:
  - Can usually define these by hand
  - Collision checking is much faster/easier
  - Much better for simulation
- Disadvantages
  - Hard to represent complex shapes
  - Usually conservative (i.e. overestimate true geometry)



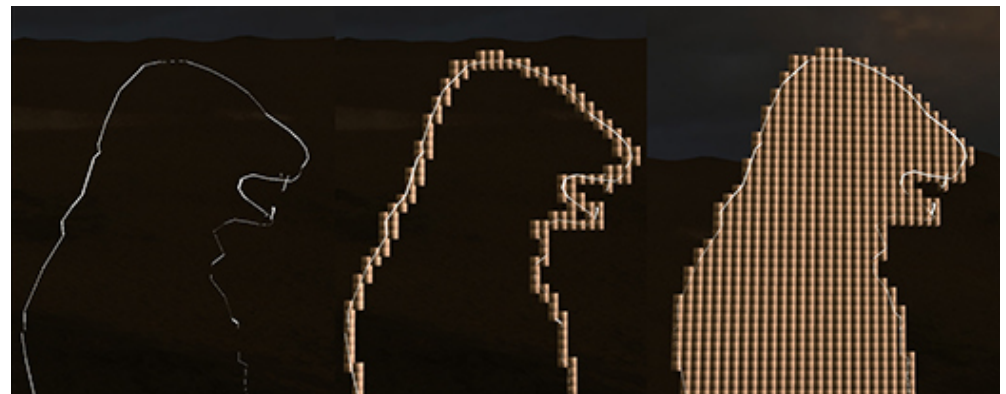
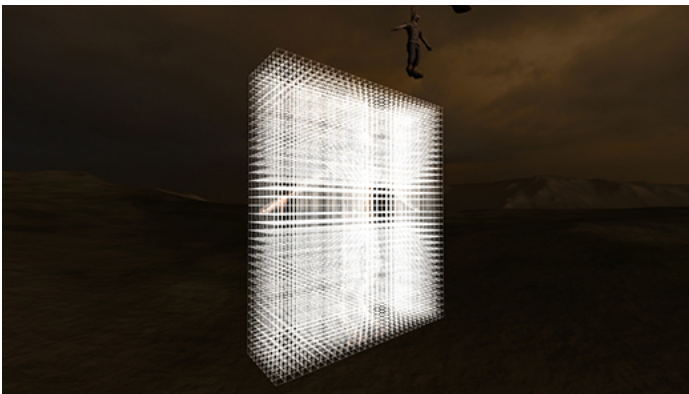
## 3D Representations: Voxel Grids

- Voxel —
  - Short for "volume pixel"
  - A single cube in a 3D lattice
- Not hollow like triangle meshes
  - Good for 'deep' physical simulations such as heat diffusion, fracture, and soft physics



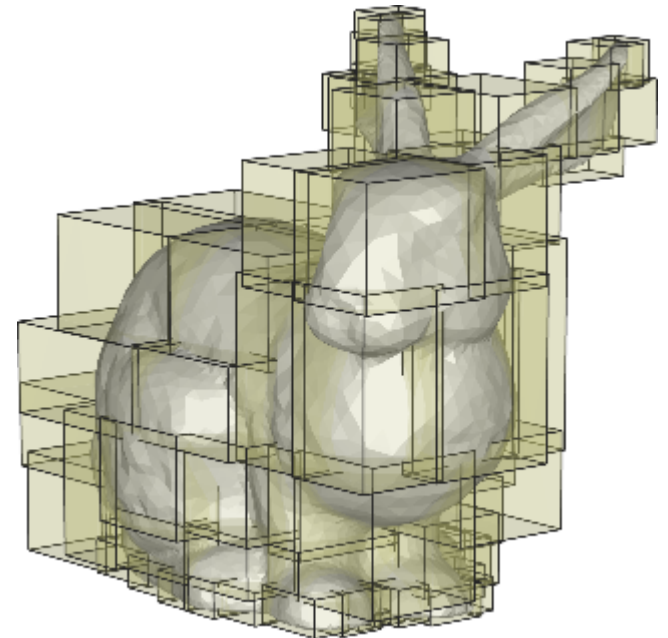
## 3D Representations: Voxel Grids

- How to make a voxel model from triangle mesh?
  - Grid the space
    - Grid resolution – without losing important details
    - Grid dimension – just enough to cover the model – efficiency
  - Solidify a shell representing the surface
  - Fill it in using a scanline fill algorithm



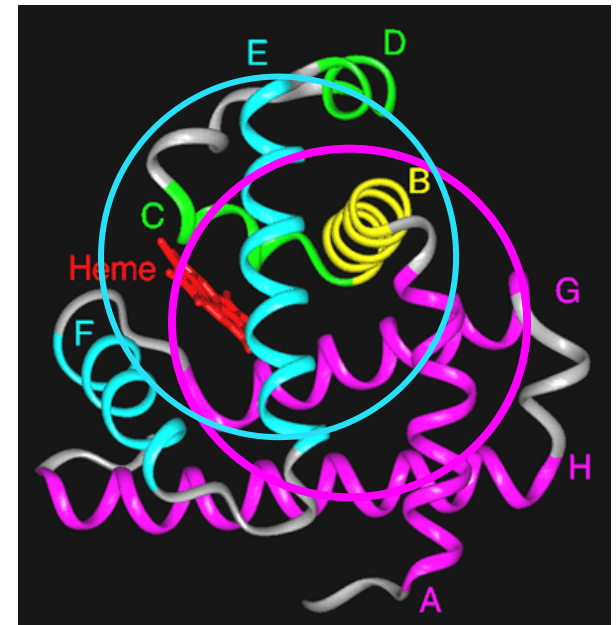
# Bounding Volume

- Bounding Volume
  - A closed volume that completely contains the object (set).
  - If we don't care about getting the *true* collision,
    - Bounding volumes represents the geometry (conservatively)
- Various Bounding Volumes
  - Sphere
  - Axis-Aligned Bounding Boxes (AABBs)
  - Oriented Bound Boxes (OBBs)



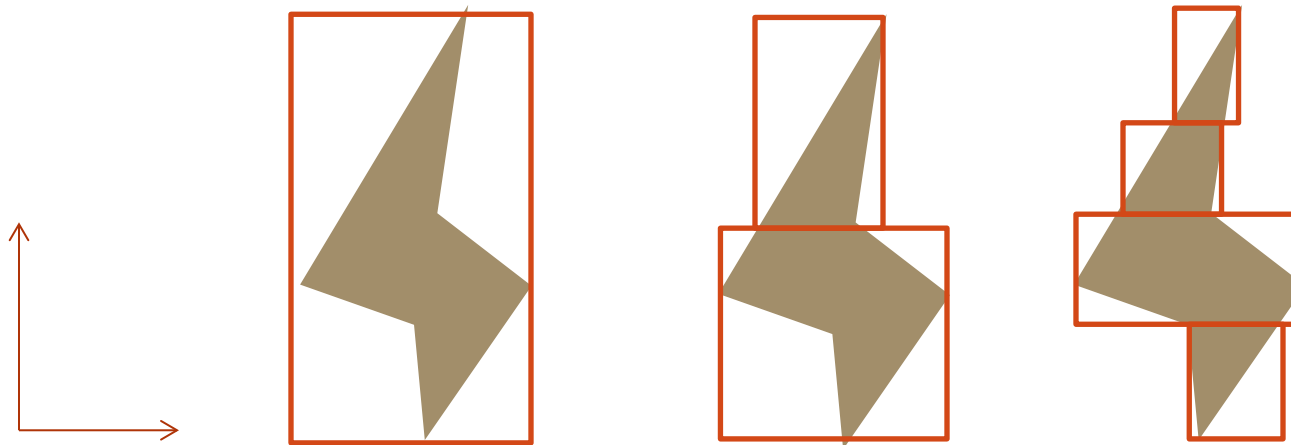
# Spheres

- Invariant to rotation and translations,
  - Do not require being updated
- Efficient
  - constructions and interference tests
- Tight?



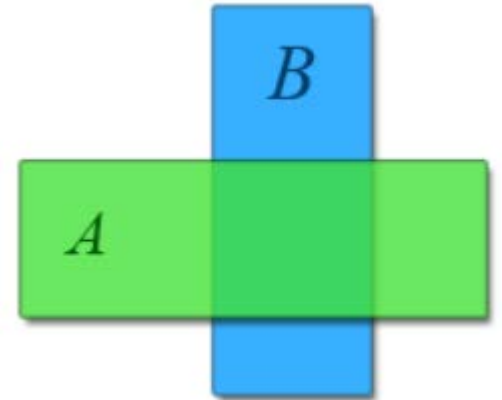
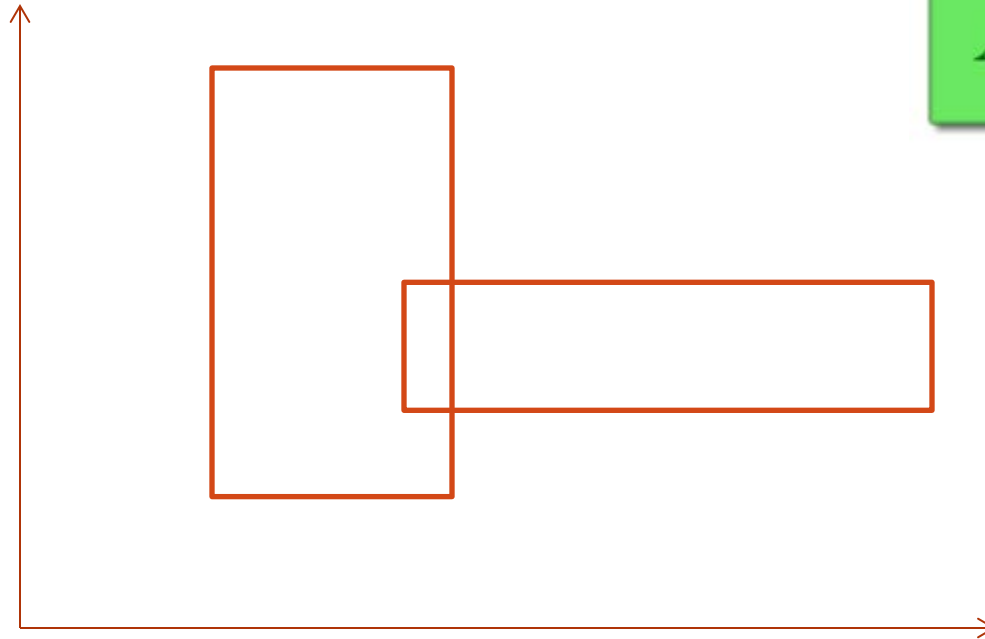
# AABBs

- Axis-Aligned Bounding Boxes (AABBs)
  - Bound object with one or more boxes oriented along the same axis



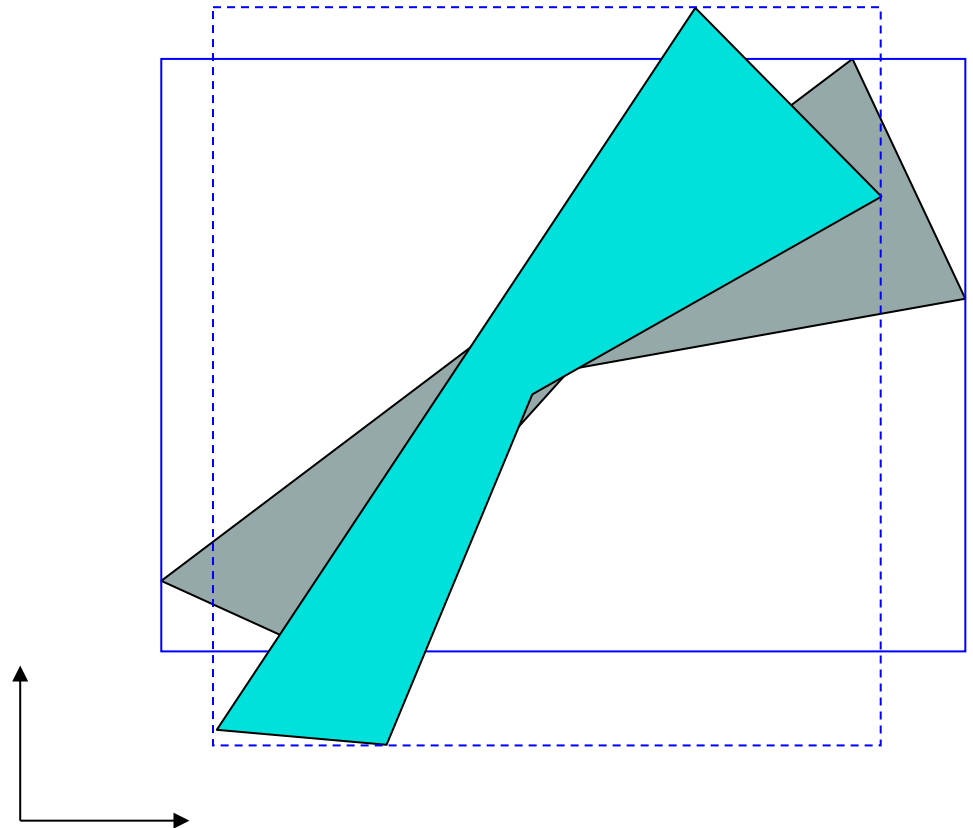
# AABBs

- How can you check for intersection of AABBs?



# AABBs

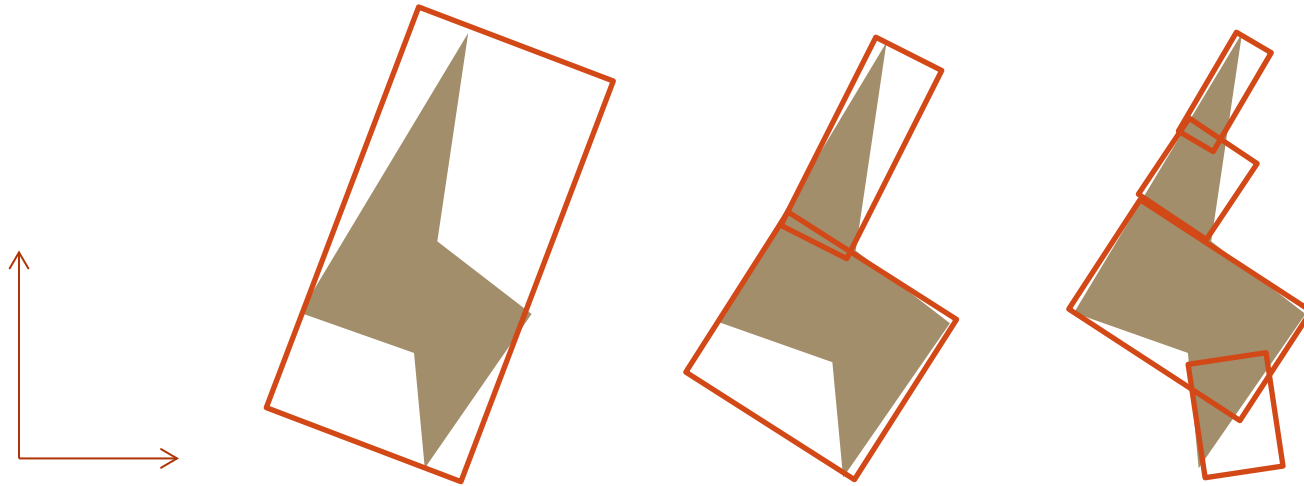
- Not invariant
- Efficient
- Not tight





# OBBs

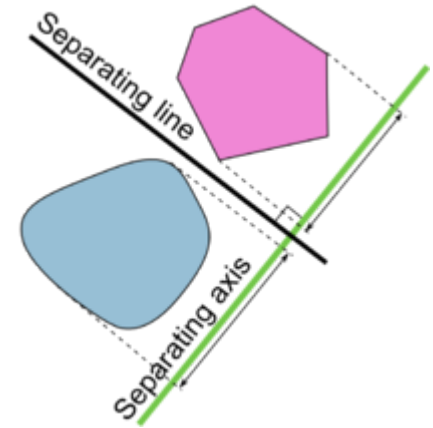
- Oriented Bound Boxes (OBBs) are the same as AABBs except
  - The orientation of the box is not fixed



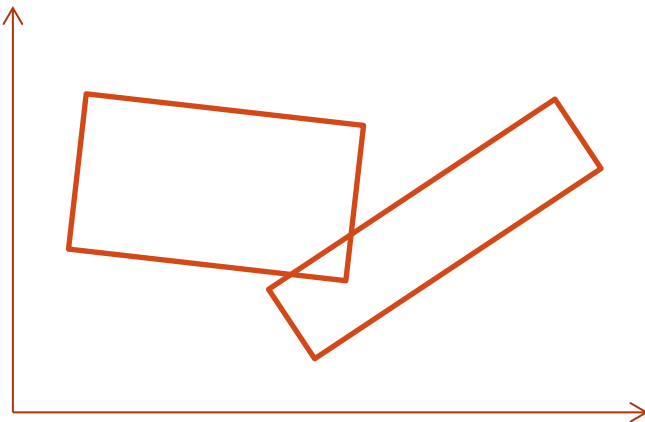
- OBBs can give you a tighter fit with fewer boxes

# OBBs

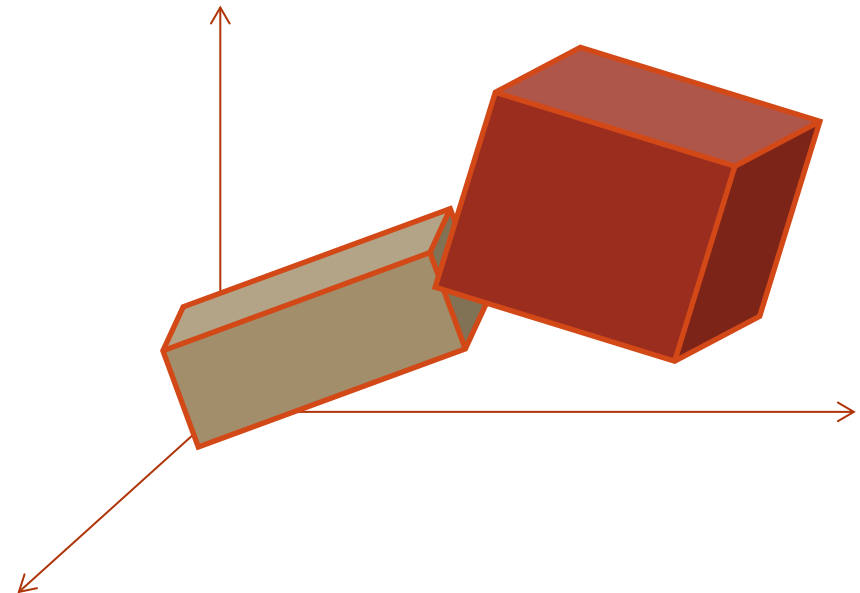
- How do you check for intersection of OBBs?
  - Hyperplane separation theorem



In 2D?



In 3D?



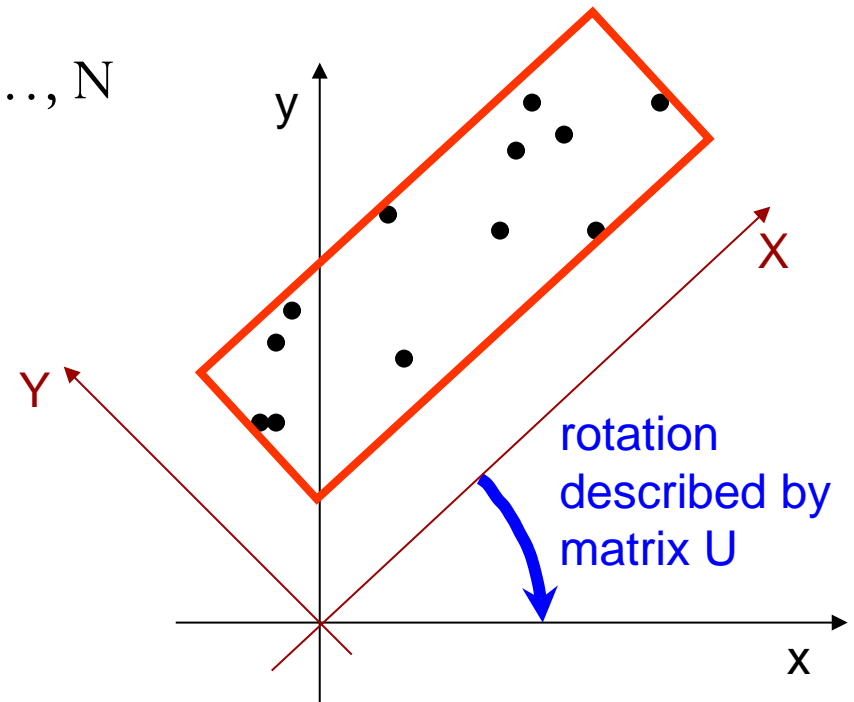
## Compute OBBs

- N points  $\mathbf{a}_i = (x_i, y_i, z_i)^T, i = 1, \dots, N$

- SVD of  $A = (\mathbf{a}_1 \mathbf{a}_2 \dots \mathbf{a}_N)$

→  $A = UDV^T$  where

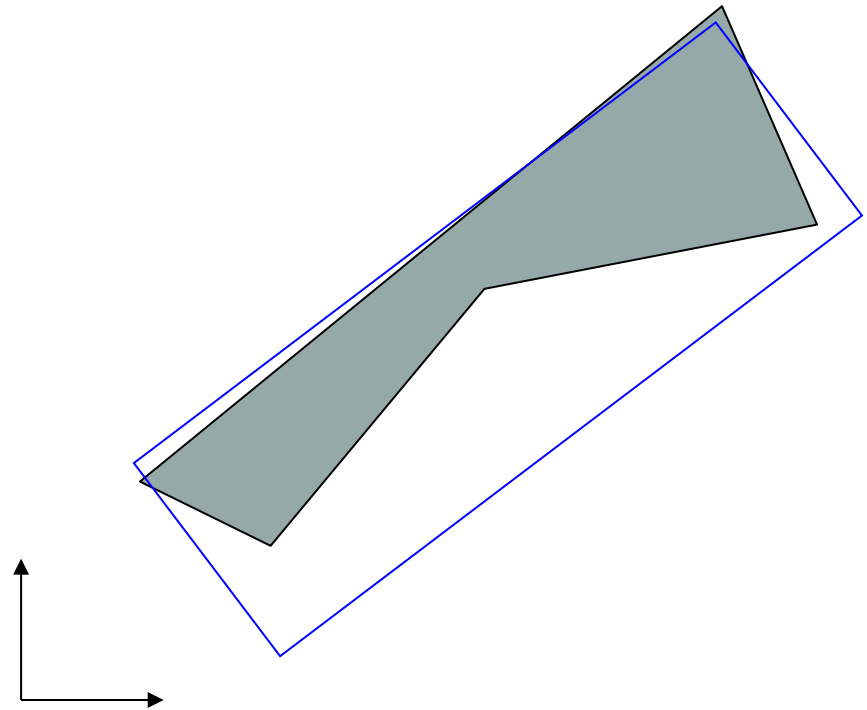
- $D = \text{diag}(s_1, s_2, s_3)$  such that  $s_1 \geq s_2 \geq s_3 \geq 0$
  - $U$  is a 3x3 rotation matrix that defines the principal axes of variance of the  $\mathbf{a}_i$ 's
- OBB's directions



- The **OBB** is defined by max and min coordinates of the  $\mathbf{a}_i$ 's along these directions
- Possible improvements: use vertices of convex hull of the  $\mathbf{a}_i$ 's or dense uniform sampling of convex hull

# OBBs

- Invariant
- Less efficient to test
- Tight



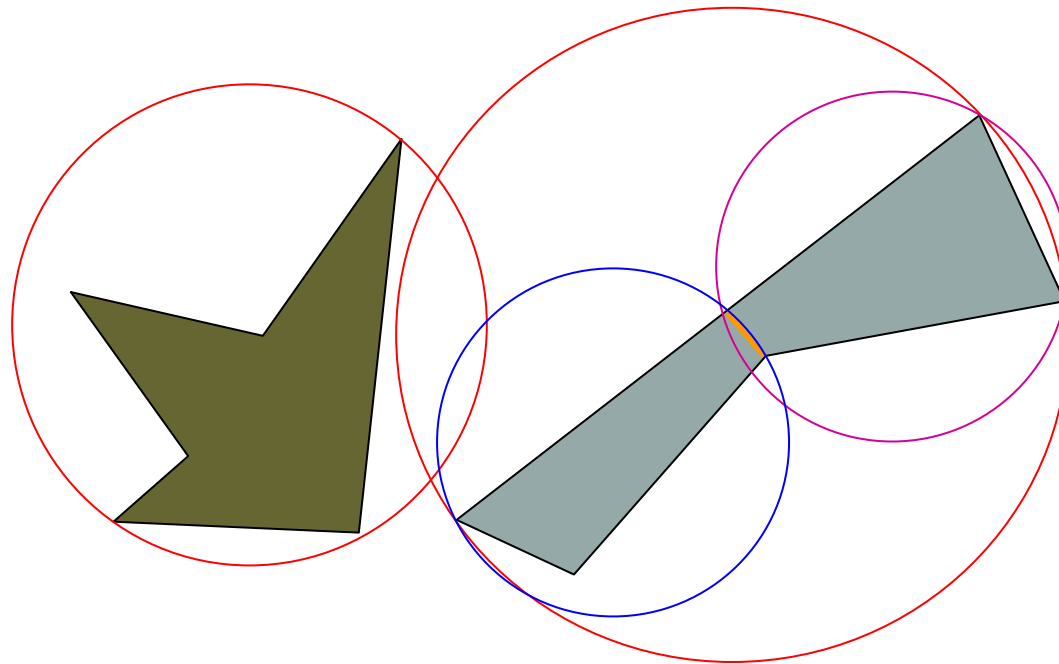
## Comparison of BVs

	Sphere	AABB	OBB
Tightness	-	--	+
Testing	+	+	0
Invariance	yes	no	yes

**No type of BV is optimal for all situations**

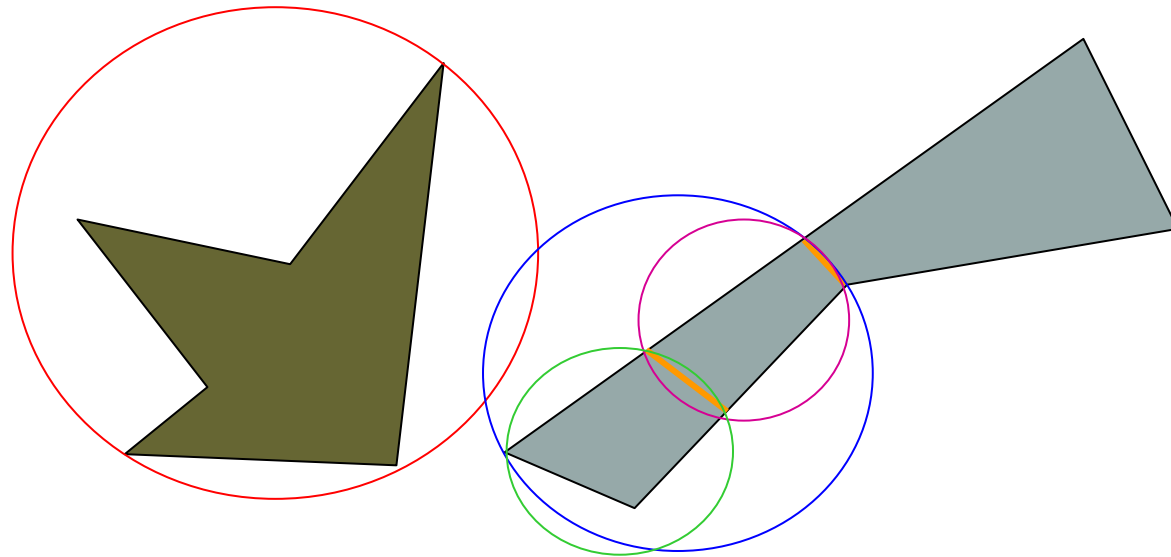
# Bounding Volume Hierarchy (BVH)

- Bounding Volume Hierarchy method
  - Enclose objects into bounding volumes (spheres or boxes)
  - Check the bounding volumes first
  - Decompose an object into two



# Bounding Volume Hierarchy (BVH)

- Bounding Volume Hierarchy method
  - Enclose objects into bounding volumes (spheres or boxes)
  - Check the bounding volumes first
  - Decompose an object into two
  - **Proceed hierarchically**

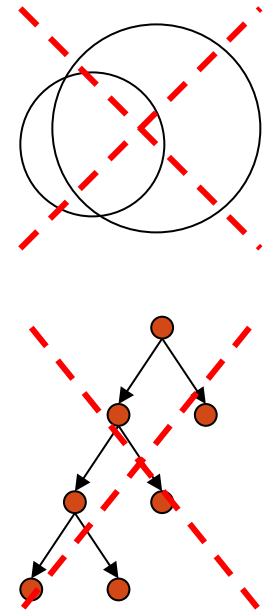
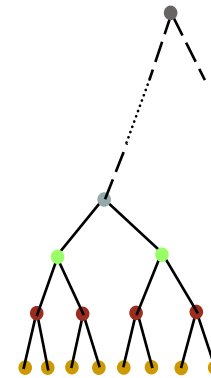


# Bounding Volume Hierarchy (BVH)

- Construction
  - Not all levels of hierarchy need to have the same type of bounding volume
    - Highest level could be a sphere
    - Lowest level could be a triangle mesh



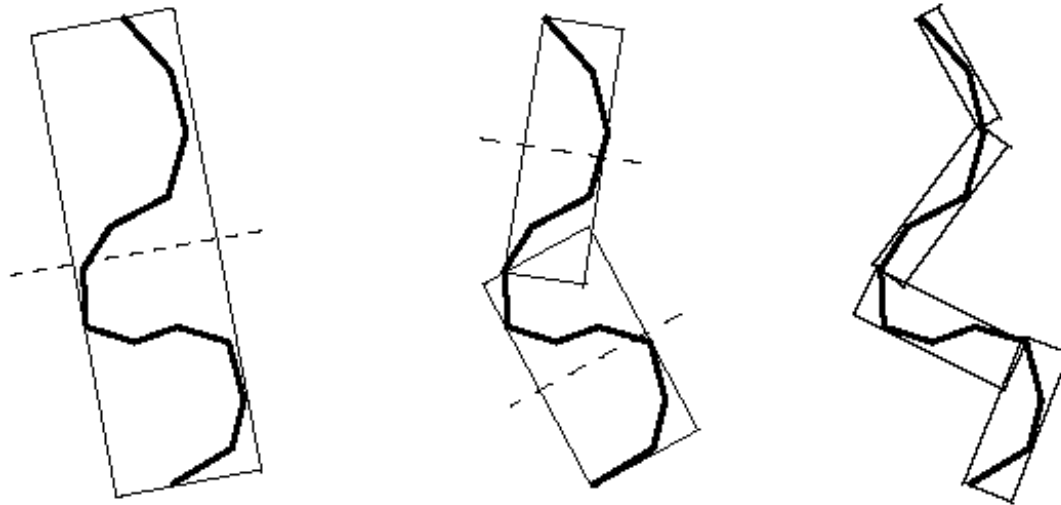
- Ideal BVH
  - Separation
  - Balanced tree



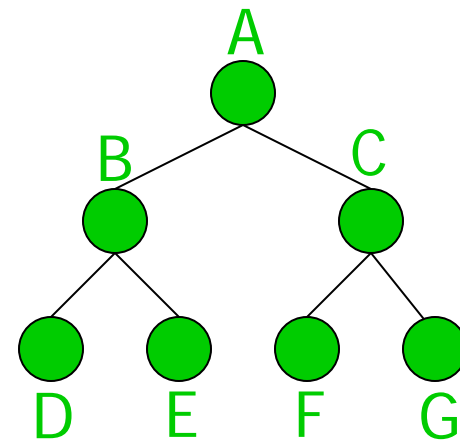
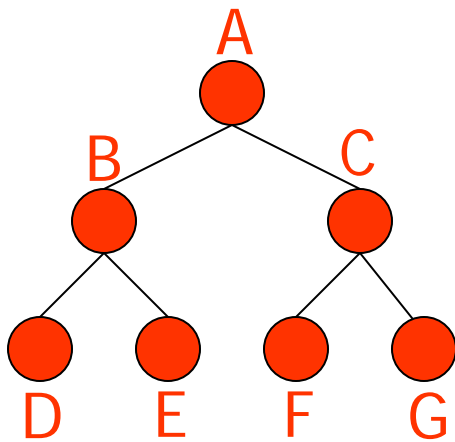


# Construction of a BVH

- Strategy
  - Top-down construction
  - At each step, create the two children of a BV
- Example
  - For OBB, split longest side at midpoint



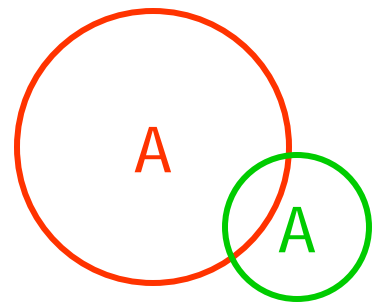
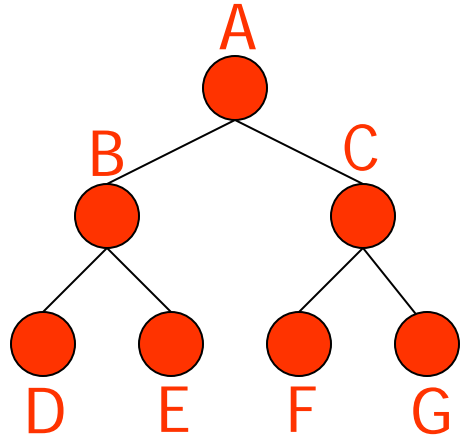
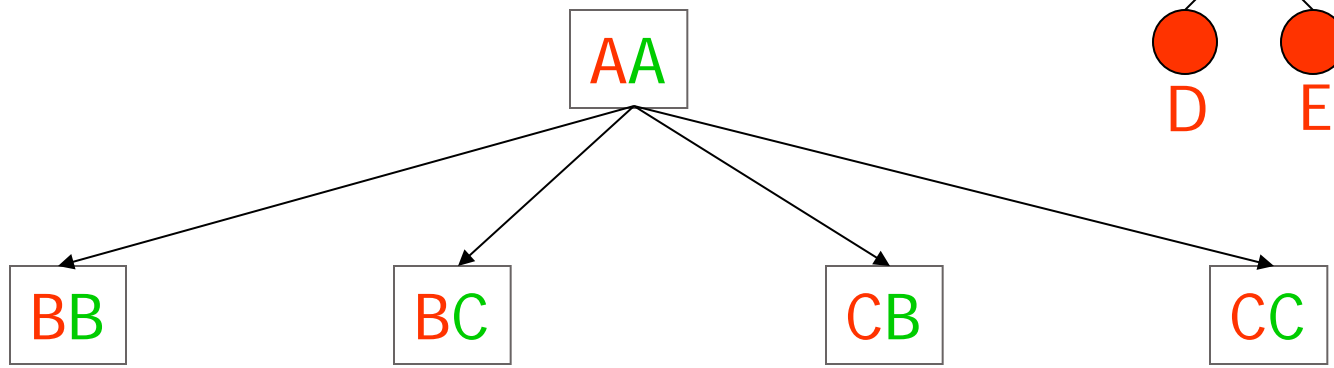
# Collision Detection using BVH



Two objects described by their  
**precomputed** BVHs

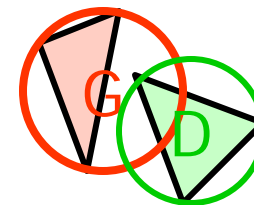
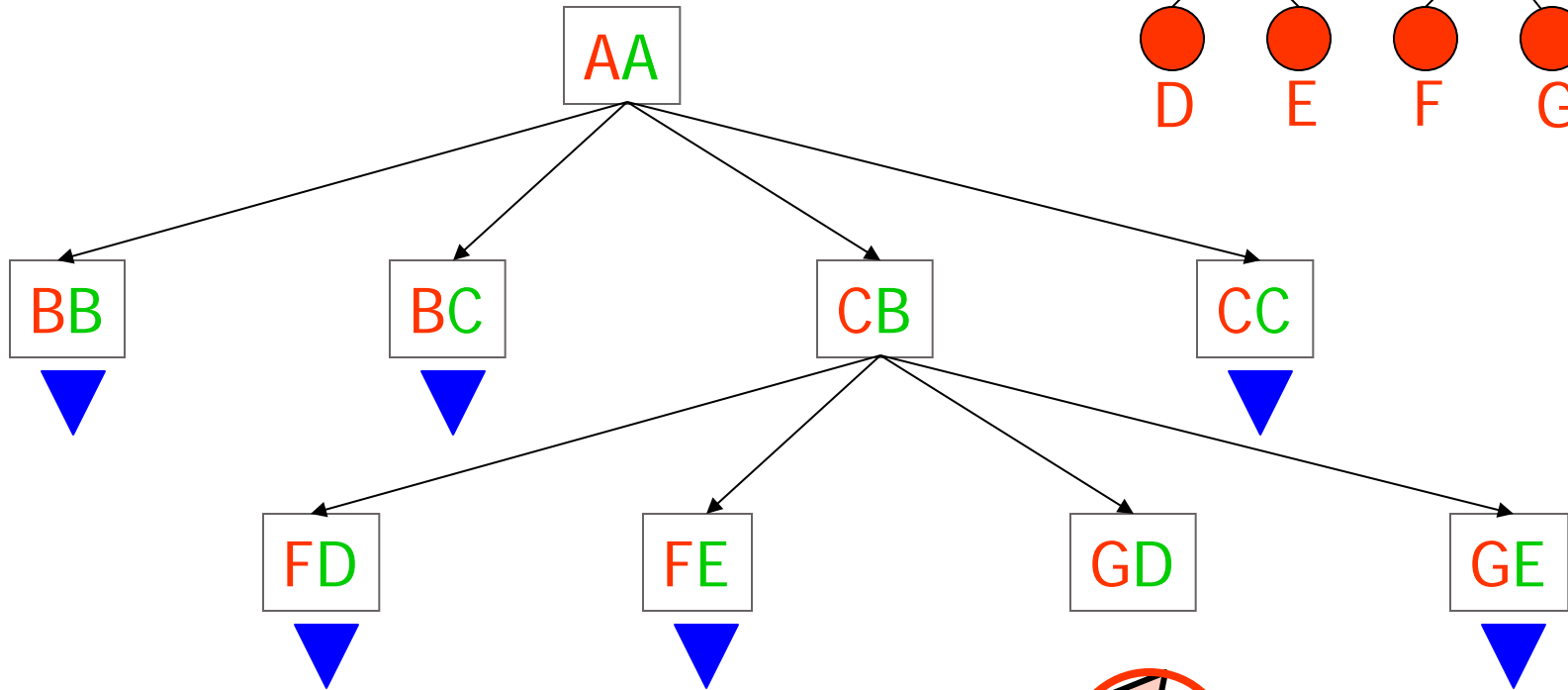
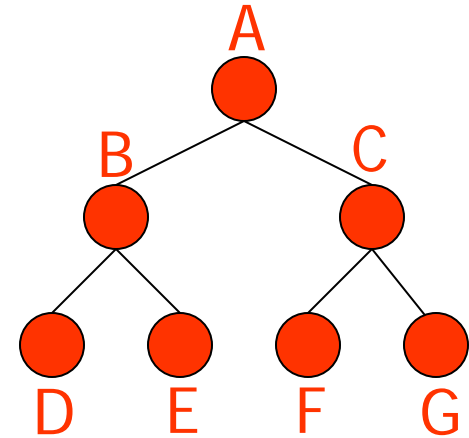
# Collision Detection using BVH

Search tree



# Collision Detection with BVH

Search tree

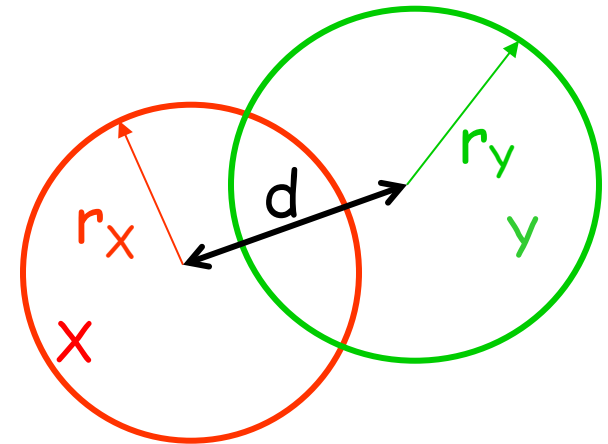


If two leaves of the BVH's overlap  
 (here, **G** and **D**) check their content  
 for collision

## Search Strategy

- If there is collision
  - It is desirable to detect it as quickly as possible
- **Greedy best-first search strategy** with
  - Expand the node XY with largest relative overlap (most likely to contain a collision)
  - Many ways to compute distance  $d$

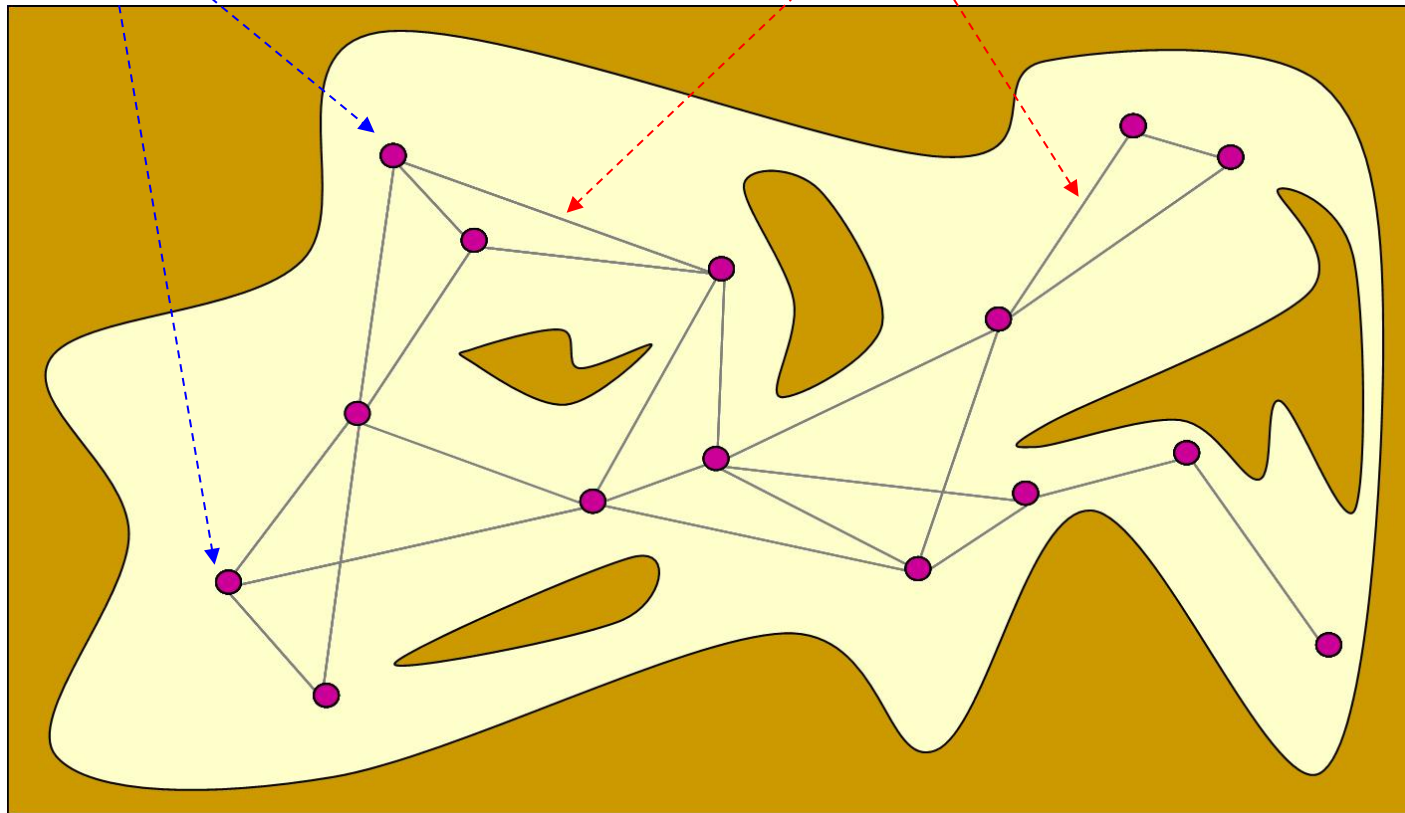
$$f(N) = d / (r_X + r_Y)$$



# Static vs. Dynamic VS Collision Detection

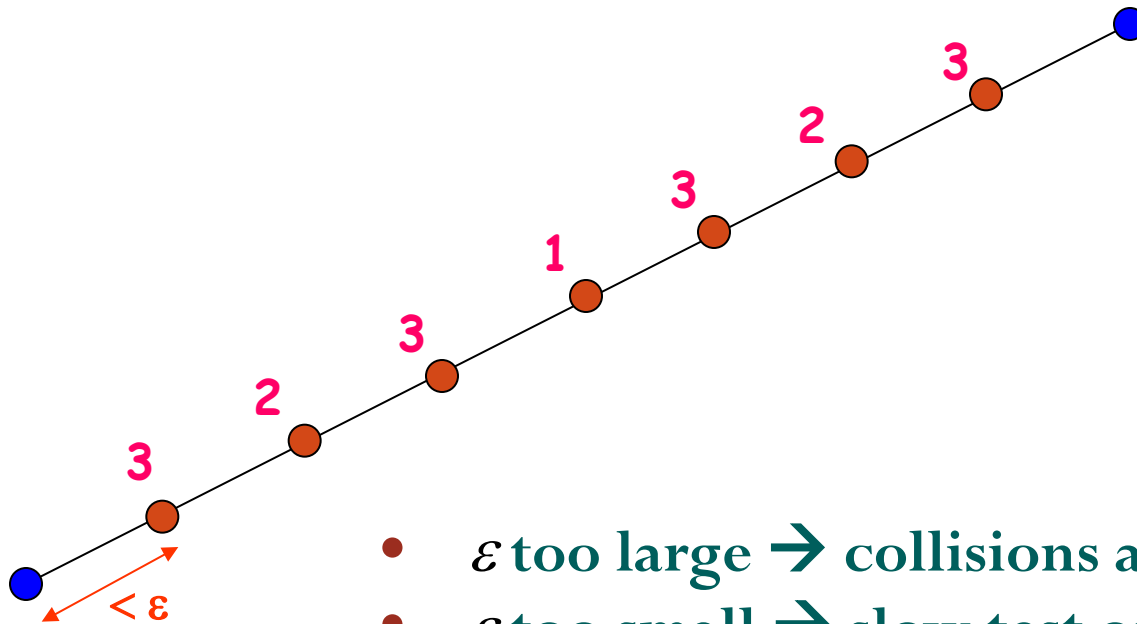
Static checks

Dynamic checks



# Usual Approach to Dynamic Checking

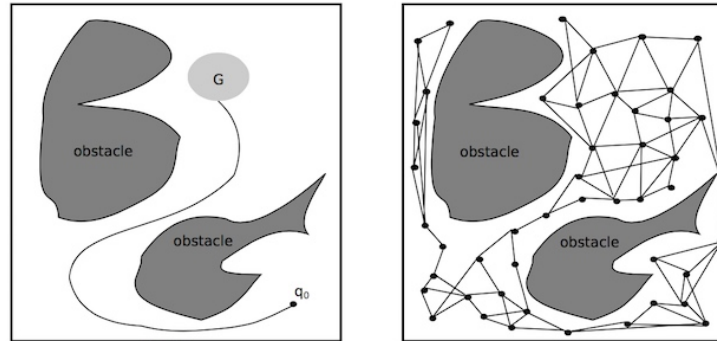
- 1) Discretize path at some fine resolution  $\epsilon$
- 2) Test statically each intermediate configuration



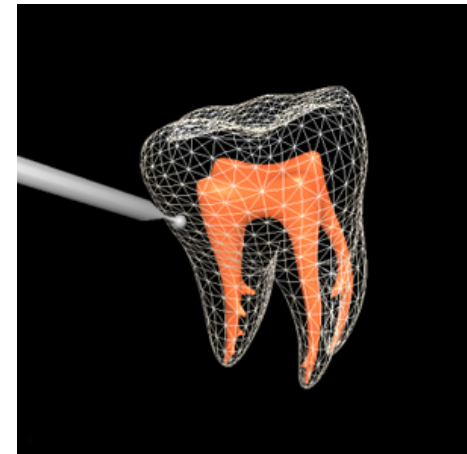
- $\epsilon$  too large  $\rightarrow$  collisions are missed
- $\epsilon$  too small  $\rightarrow$  slow test of local paths

# Testing Path Segment vs. Finding First Collision

- PRM planning
  - Detect collision as quickly as possible → Bisection strategy



- Physical simulation, haptic interaction
  - Find first collision → Sequential strategy





# Collision Checking for Moving Objects

- Feature Tracking
- Swept-volume intersection

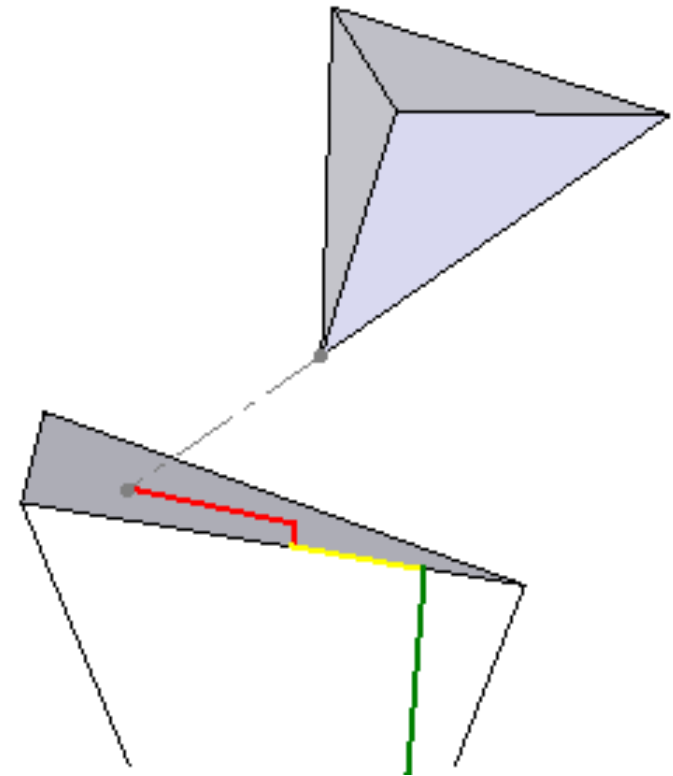
# Feature Tracking

- Compute the Euclidian distance of two polyhedra
- Problem setup
  - Each object is represented as a **convex polyhedron** (or a set of polyhedra)
  - Each polyhedron has a field for its faces, edges, vertices, positions and orientations ← **features**
  - The closest pair of features between two polyhedra
    - The pair of features which contains the **closest points**
  - Given two polyhedra, find and keep update their **closest features** (see [1])

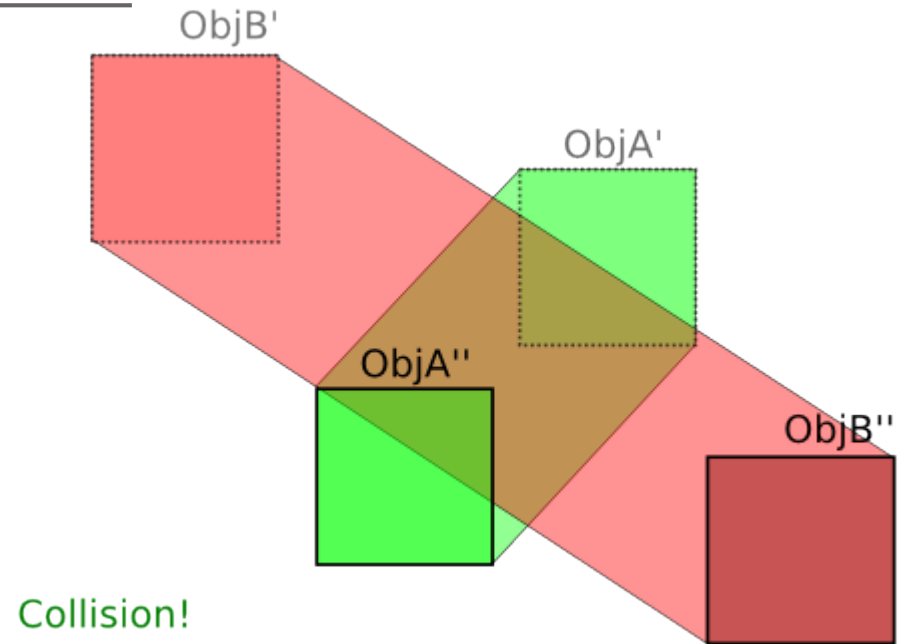
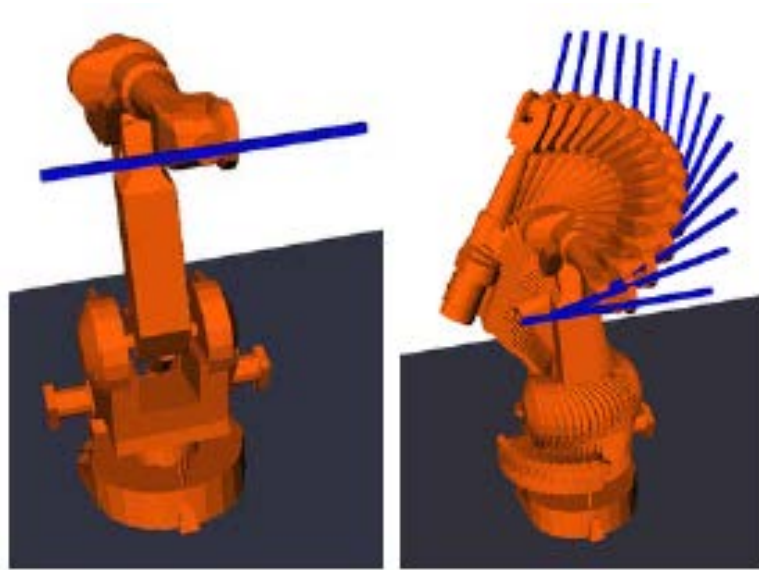
[1] M. Lin and J. Canny. A Fast Algorithm for Incremental Distance Calculation. Proc. IEEE Int. Conf. on Robotics and Automation, 1991

# Feature Tracking

- Strategy
  - The **closest pair of features** (vertex, edge, face) between two polyhedral objects are computed **at the start configurations** of the objects
  - During motion, at each small increment of the motion, they are updated
- Efficiency derives from two observations
  - The pair of closest features changes relatively **infrequently**
  - When it changes the new closest features will usually be on a **boundary** of the previous closest features

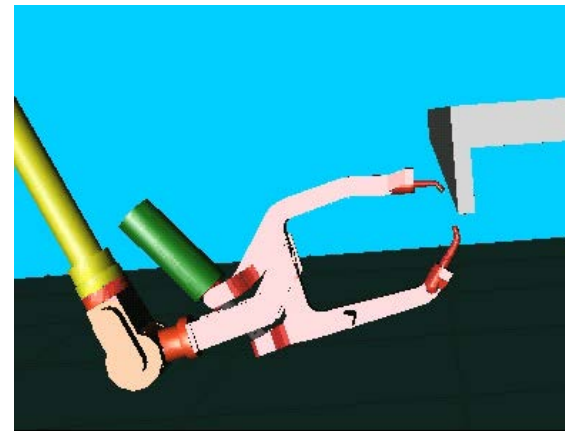
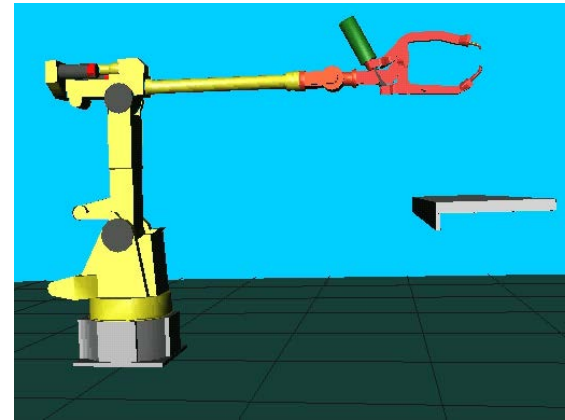
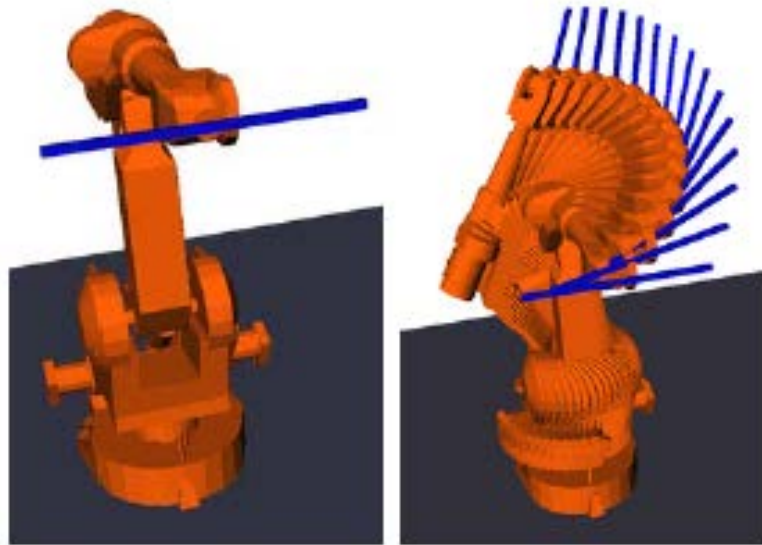


# Swept-volume Intersection



- $\epsilon$  too large  $\rightarrow$  collisions are missed
- $\epsilon$  too small  $\rightarrow$  slow test of local paths

# Swept-volume Intersection



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# Comparison

- Bounding-volume (BV) hierarchies
  - Discretization issue
- Feature-tracking methods
  - Geometric complexity issue with highly non-convex objects
- Swept-volume intersection
  - Swept-volumes are expensive to compute. Too much data.

# Readings

- Principles CH7
- Review of Probability Theory
  - <https://drive.google.com/file/d/0B7Swe0PHMbzbu1FqcnNORTFZOW>

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