



# Collision Detection Algorithms

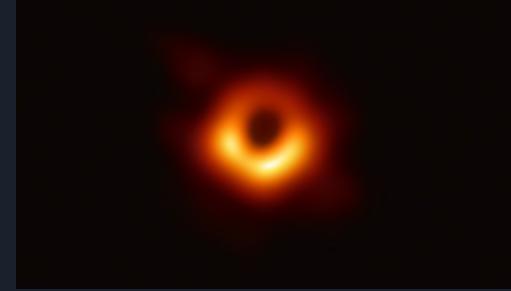
Brandan Roachell and Rob Bray  
April 27, 2023



# Test Questions

1. What is the major flaw of discrete collision detection?
2. What kind of  $k$ -DOP is a 3D AABB? (What is  $k$ ?)
3. What is one way to optimize a BVH?

# Brandan Roachell



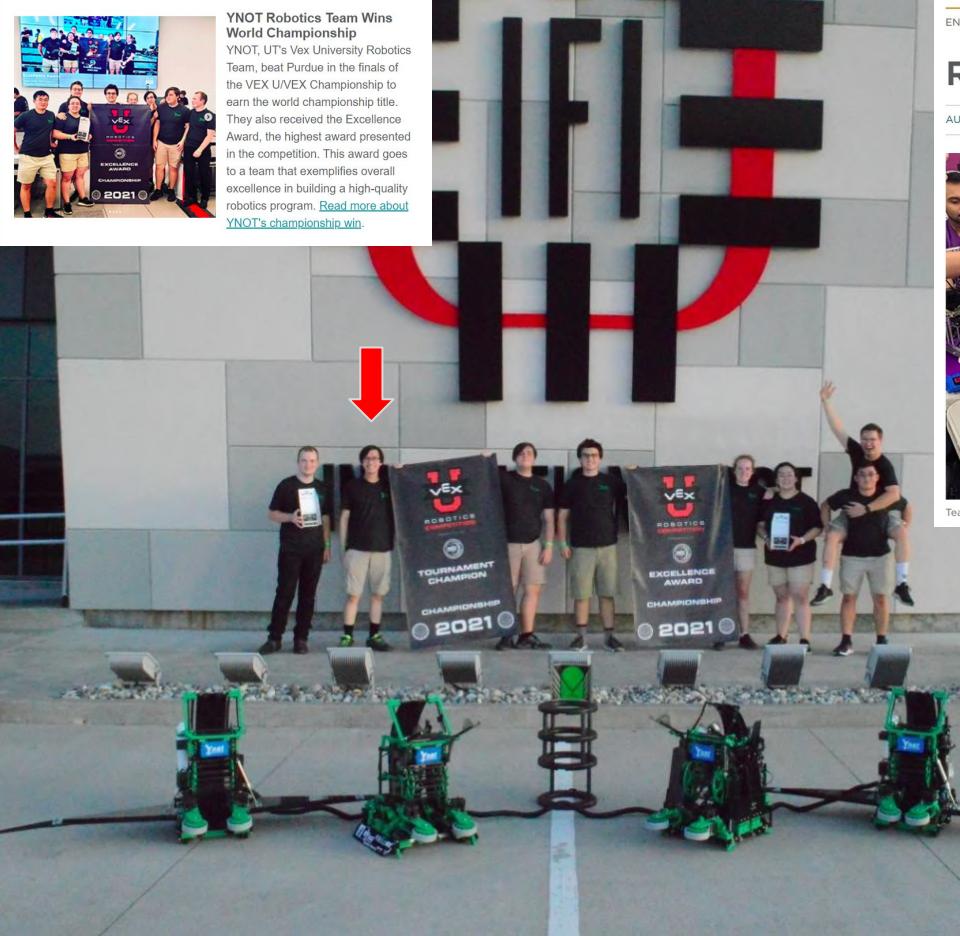
- First (and only, hopefully) year master's student in Computer Science (5-Year BS/MS)
- Graduated from UTK in Dec. 2022 w/ BS in CS and a math minor
- Used to do undergrad research under Dr. Taufer, now a GTA for her data mining class
- Planning to do software engineering somewhere, but not really sure
- Interests:
  - piano
  - robotics
  - hiking?



13 y/o me  
(May 2015)



Chimney  
Tops Trail  
(Dec. 2021)



ENGINEERING & TECHNOLOGY

## Robotics Team World Champions

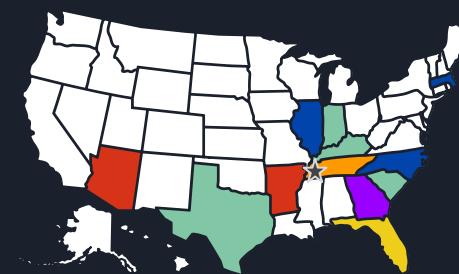
AUGUST 26, 2021

Team YNOT's tether bots set up during the 2021 VEXU Robotics World Championship.

Mont  
Sel  
Popu  
Eleve  
Name  
posted  
Colle  
Nan  
2023  
posted  
Robin  
Name  
Spirit  
posted



2022 Think Award



- I'm from Memphis, TN
- Places I've been (intended destination)
  - also a few cities in China back in 2010 (toured Beijing and visited family in Nanning) and a few cities in Germany (mainly Berlin) in summer 2019 before my first semester here
- Can't cook but love eating / trying all kinds of foods
  - some of my absolute favorites: nigiri/sashimi, Korean BBQ, ramen, bubble tea



Atlanta, GA  
(2022)



Fin-Two  
(Downtown!)

Houston, TX  
(2021)

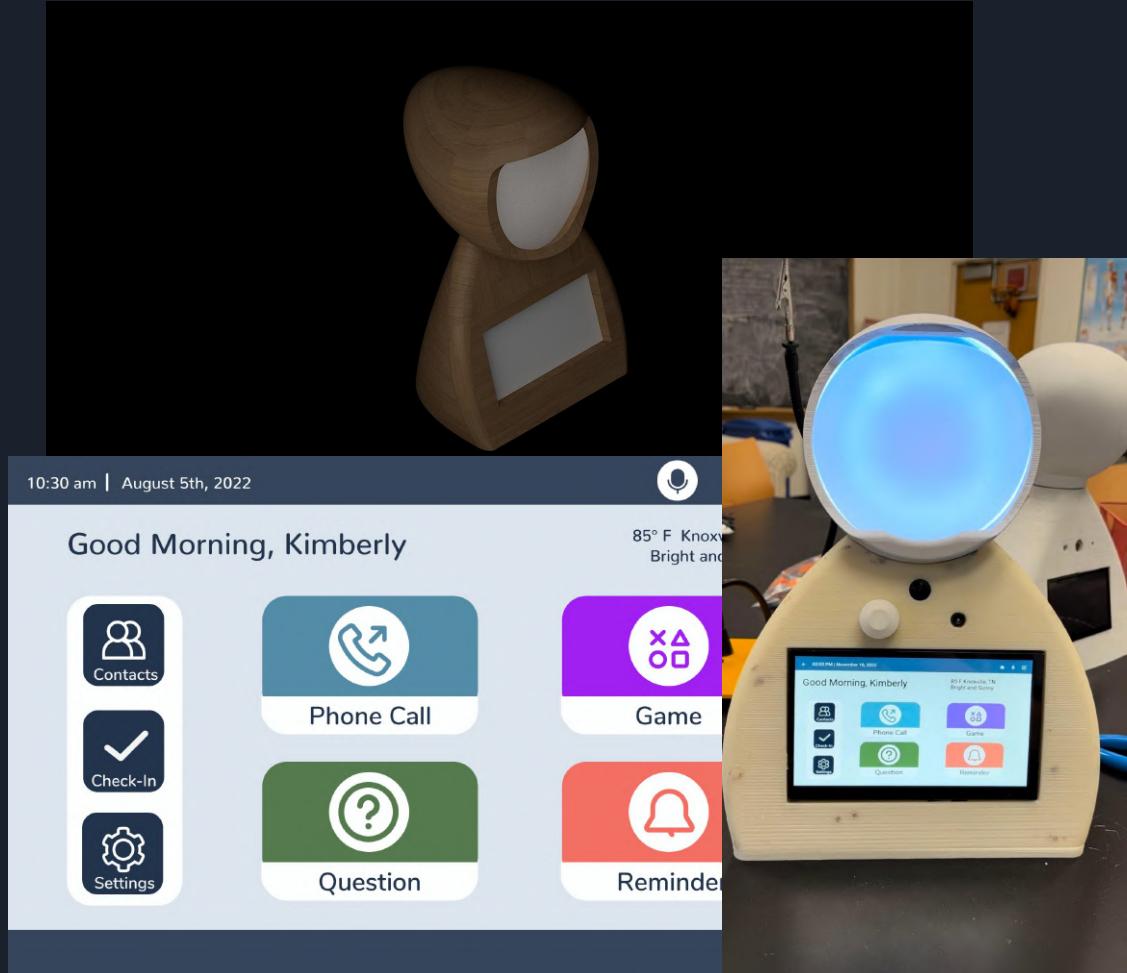


# Rob Bray

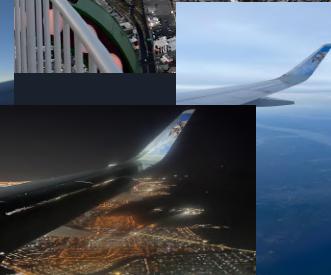
- Grew up in Savannah, GA. Lived in Hummelstown, Pennsylvania for 3 years. Moved to Tennessee for undergrad in CS at UTK
- First year masters in CS, advised by Dr. Gregor, GRA for Dr. Xiaopeng Zhao, GTA for Dr. Emrich



- Thesis work: FRED, the friendly robot to ease dementia. Affordable social robot based on Raspberry Pi for older adults with cognitive decline







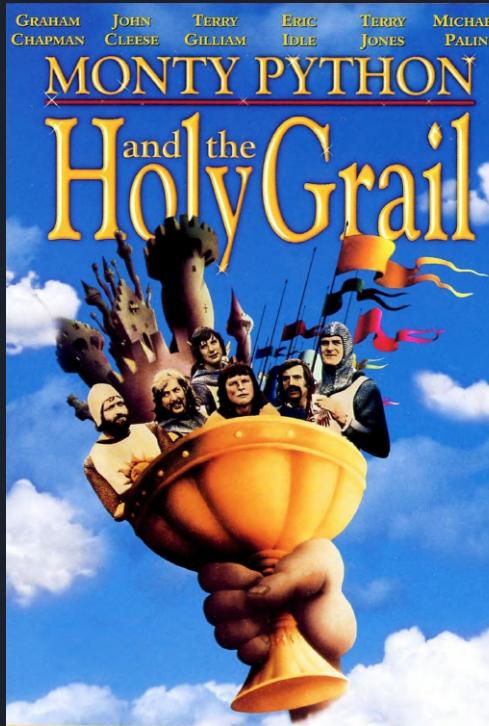


MK-N 982

- I love movies
  - Favorite movie ever: Monty Python and the Holy Grail
  - Favorite movie right now: Bullet Train



<https://www.google.com/url?sa=i&url=https%3A%2F%2Fbloody-disgusting.com%2Fmovie%2F3718201%2Fbullet-train-trailer-2-brad-pitt-fights-to-survive-in-deadpool-2-directors-violent-action-thriller%2F&sig=AOVw2T1mehgQlyUirndWzJusI=1825253089600&source=images&cd=vfe&ved=0CBAQIRxOwTcOCOIxq4CxQ/AAAA/AAAAAAABao>



[https://www.google.com/url?sa=i&url=https%3A%2F%2Fwww.imdb.com%2Ftitle%2Ftt0071853%2F&pisg=AOvVaw3g0p\\_egR49VZSP0ywH5wB&ust=1682522411132000&source=images&cd=vfe&ved=0CBAQjRxqFwoTCKJLkMqxf4CFQAAAAAdAAAAABAD](https://www.google.com/url?sa=i&url=https%3A%2F%2Fwww.imdb.com%2Ftitle%2Ftt0071853%2F&pisg=AOvVaw3g0p_egR49VZSP0ywH5wB&ust=1682522411132000&source=images&cd=vfe&ved=0CBAQjRxqFwoTCKJLkMqxf4CFQAAAAAdAAAAABAD)



<https://www.google.com/url?sa=i&url=https%3A%2F%2Fwww.sonypictures.com%2Fmovies%2Fbullettrain&sig=AOVwAvTepI1mehgFUyUmrdWz&ust=168252253089600&source=images&cdv=fe&ved=0CBQArRxqFwoTC OCI-0kx4fCFOA AAAAABAA>



# Outline

- Overview of Simulating Collisions
  - Intro to Physics Simulation
  - Types of Collision Detection
- Data Structures & Algorithms
- History
- Applications
- Implementations
- Live Demo
- Results
- Open Issues
- References and Closing



# Intro to Physics Simulation

- Goal: simulate a set of physical laws as accurately as possible
  - it should at least “feel right” and be stable enough
- Base level: kinematics, the motion of objects alone over time
  - gravity, friction
- Next level: collision detection
  - more complex shapes and models?
- Next level: collision resolution
  - elastic or inelastic?
  - what about angular velocity / momentum?
- More advanced simulations for fluid dynamics, soft-body dynamics, cloth, modeling light transport (ray tracing), etc.

```
def on_tick(self, dt):
    self._prev_pos = self._pos
    self._pos += self._vel * dt + 0.5 * self._acc * dt*dt
    self._vel += self._acc * dt

    # move bounding box
    self.rect.centerx = self._pos.x
    self.rect.centery = self._pos.y
```

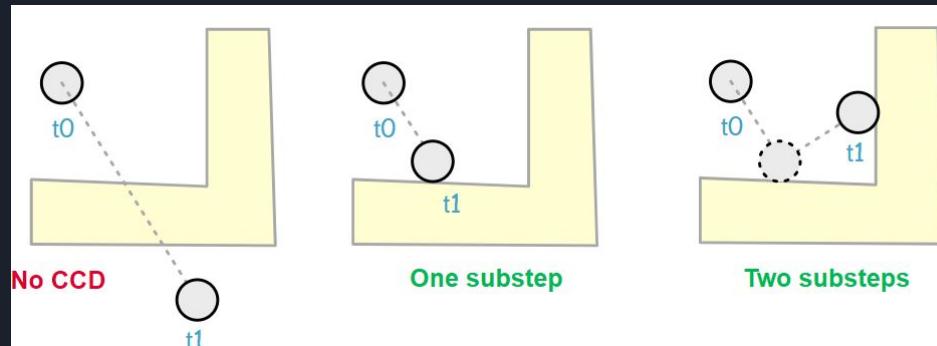
$$\Delta x = v_0 t + \frac{1}{2} a t^2$$
$$v = v_0 + a t$$

$$v'_2 = \frac{2m_1}{m_1 + m_2} v_1 - \frac{m_1 - m_2}{m_1 + m_2} v_2$$
$$v'_1 = \frac{m_1 - m_2}{m_1 + m_2} v_1 + \frac{2m_2}{m_1 + m_2} v_2$$

velocities after an  
elastic collision

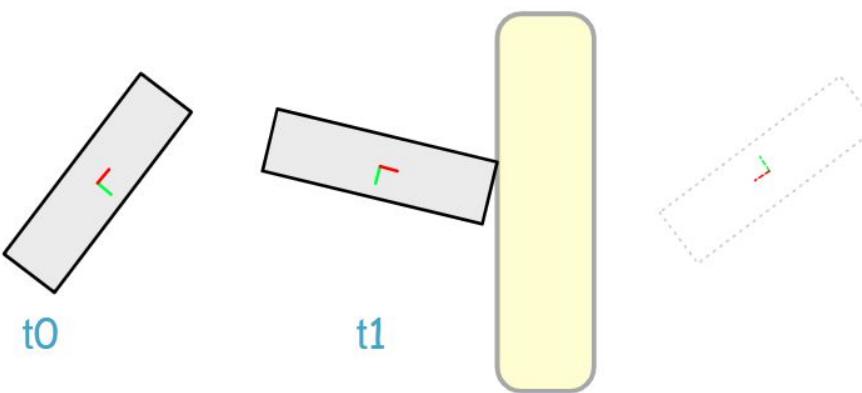
# Types of Collision Detection

- Discrete
  - uses the time step between current time and the last frame for kinematics (referred to as  $dt$ , “delta time,” or a “tick”)
  - suffers from the so-called “tunneling effect”
- Continuous
  - requires some form of interpolation between  $t_0$  and  $t_1 = t_0 + dt$ 
    - supersampling
    - bisection
    - ray casting
  - more substeps (costly)
    - significant impact on performance

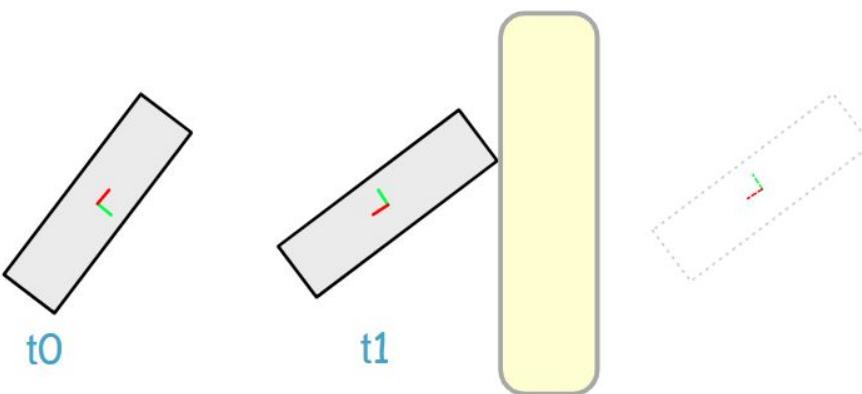




[2]

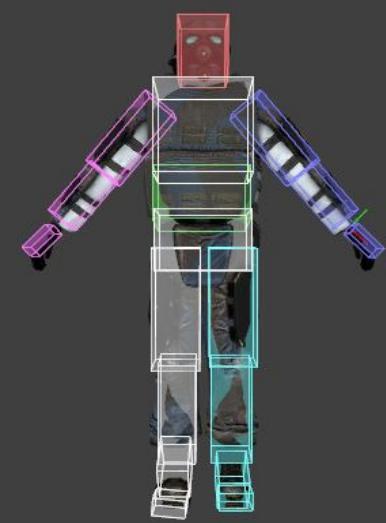


orientation usually not considered in CCD!

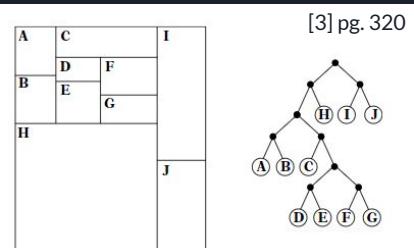


# Data Structures

- Bounding box/volume vs. hitbox
  - axis-aligned bounding box (AABB)
  - oriented bounding box (OBB)
  - $k$  discrete oriented polytope ( $k$ -DOP)
- Bounding volume hierarchy (BVH)
  - AABB tree or R-tree (“rectangle” tree)
- $k$ -d trees
  - generalization of quadtrees / octrees
  - $k$  represents the number of dimensions subdivided by arbitrarily positioned splits, performed in one dimension at a time (does not have to match the dimensionality of the space)

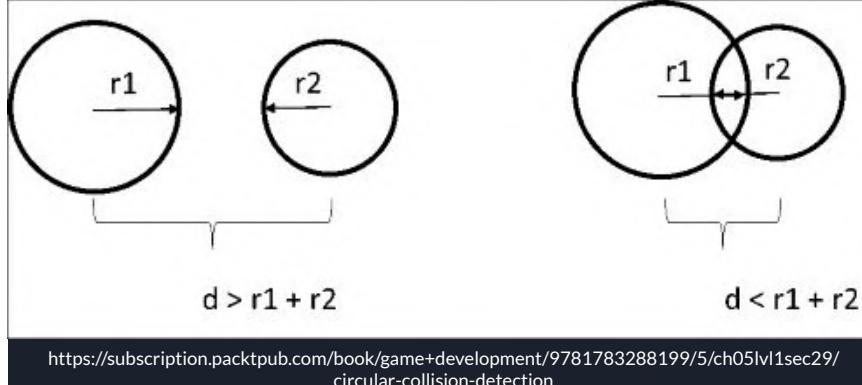


[https://developer.valvesoftware.com/wiki/Bounding\\_box](https://developer.valvesoftware.com/wiki/Bounding_box)  
<https://developer.valvesoftware.com/wiki/Hitbox>



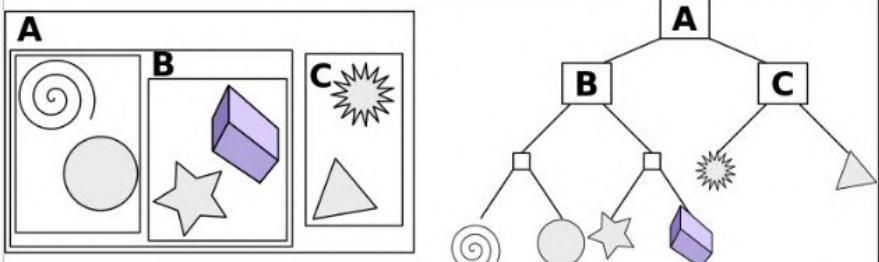
a 2D  $k$ -d tree

BETTER BOUND, BETTER CULLING →  
 ← FASTER TEST, LESS MEMORY

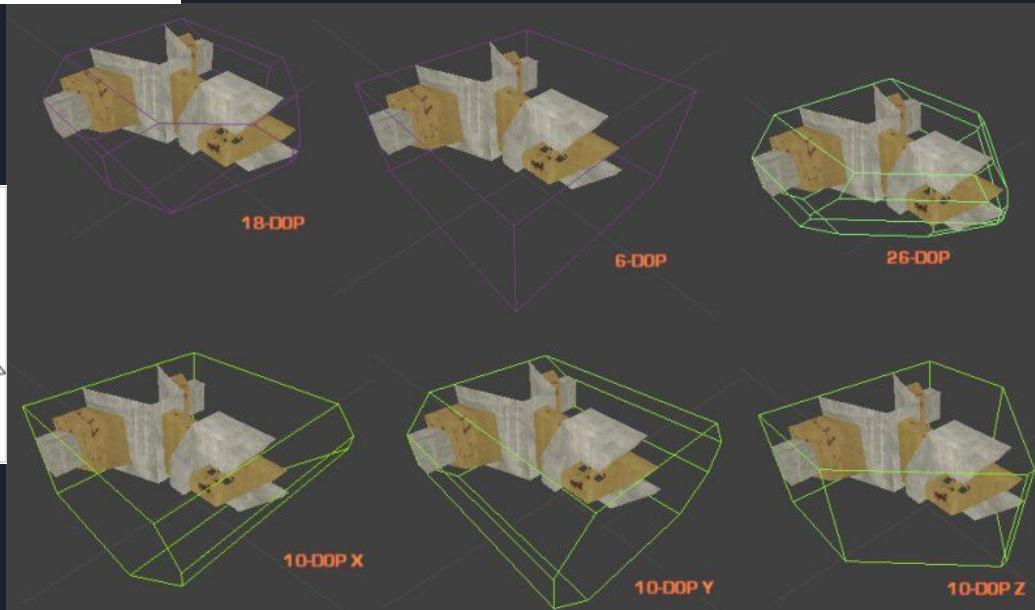


<https://subscription.packtpub.com/book/game+development/9781783288199/5/ch05lvl1sec29/circular-collision-detection>

[https://www.researchgate.net/figure/Bounding-volumes-sphere-axis-aligned-bounding-box-AABB-oriented-bounding-box\\_fig9\\_272093426](https://www.researchgate.net/figure/Bounding-volumes-sphere-axis-aligned-bounding-box-AABB-oriented-bounding-box_fig9_272093426)



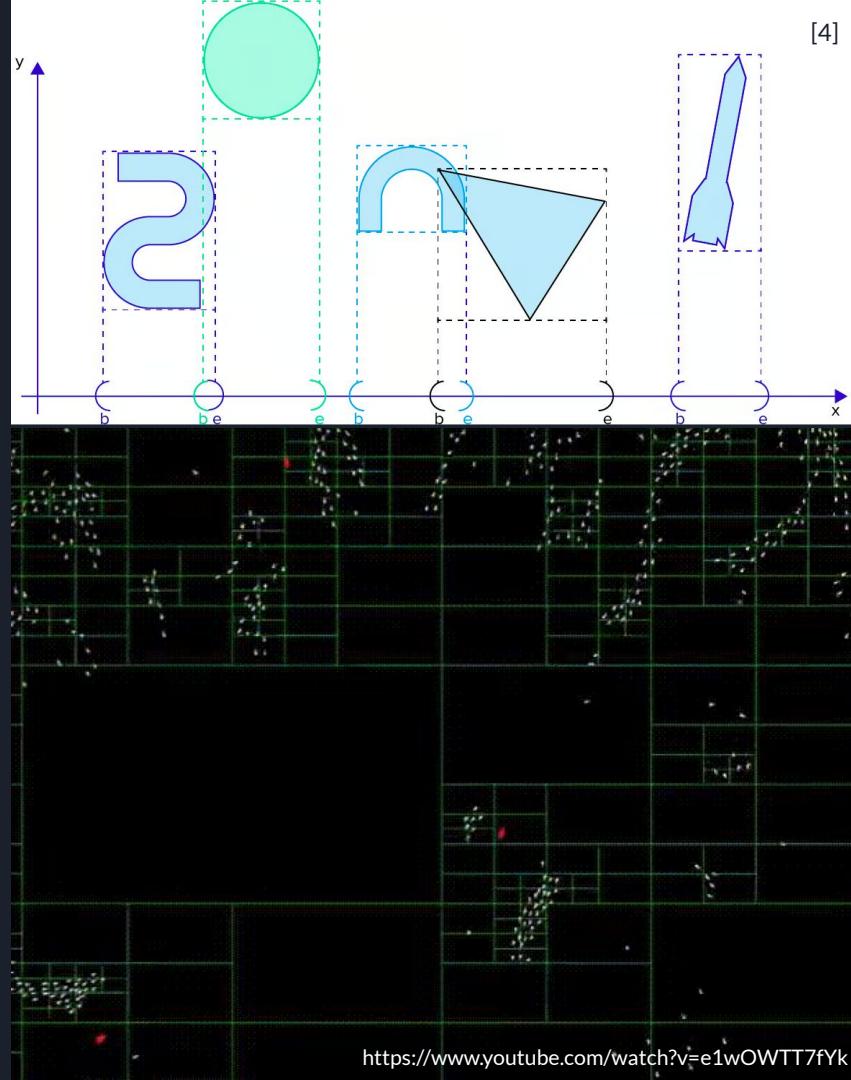
[https://en.wikipedia.org/wiki/Bounding\\_volume\\_hierarchy](https://en.wikipedia.org/wiki/Bounding_volume_hierarchy)



<https://docs.unrealengine.com/4.27/en-US/InteractiveExperiences/Physics/Collision/HowTo/AddDOP/>

# Algorithms

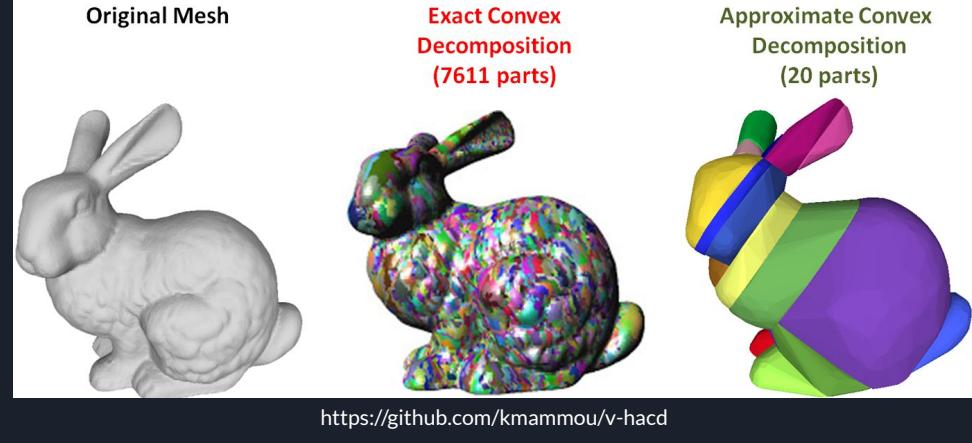
- Pairwise checking
  - naive: try all combinations
  - broad phase algorithms to reduce the number of pairs
    - sweep and prune / sort and sweep
    - hierarchical methods
      - spatial partitioning
        - uniform grid
        - k-d trees
      - object partitioning
        - BVH



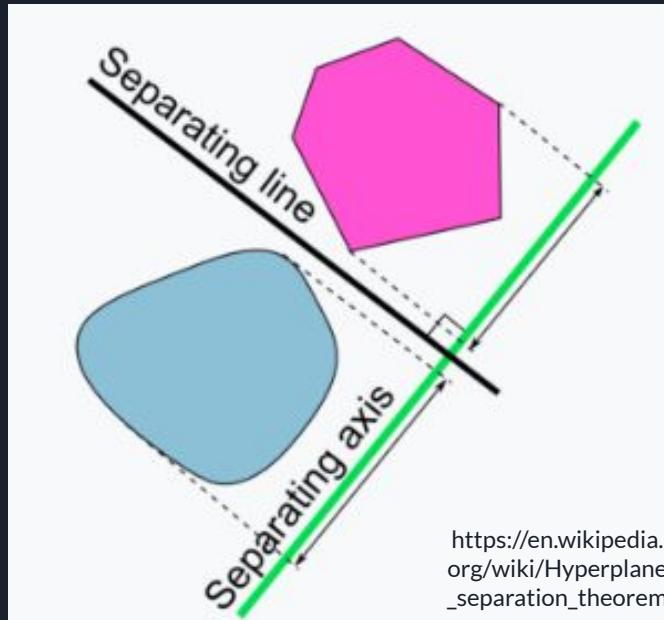


# Algorithms

- Pairwise checking
  - narrow phase
    - convex decomposition
      - Hierarchical Approximate Convex Decomposition (HACD)
    - check for overlap
      - Separating Axis Theorem (SAT)
      - Gilbert–Johnson–Keerthi distance algorithm (GJK)



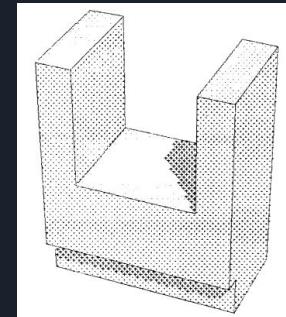
<https://github.com/kmammou/v-hacd>



[https://en.wikipedia.org/wiki/Hyperplane\\_separation\\_theorem](https://en.wikipedia.org/wiki/Hyperplane_separation_theorem)

# History

- Arthur Appel (1968): first computer-generated image shaded by ray tracing
- Jeffrey Goldsmith & John Salmon (1987):
  - automatic generation of bounding volume hierarchies
  - surface area heuristic (SAH) as a predictor for tree generation
- J. David MacDonald & Kellogg Booth (1990): applying SAH to binary trees for space subdivision



Appel 1968 [9]



Goldsmith & Salmon  
1987 [10]

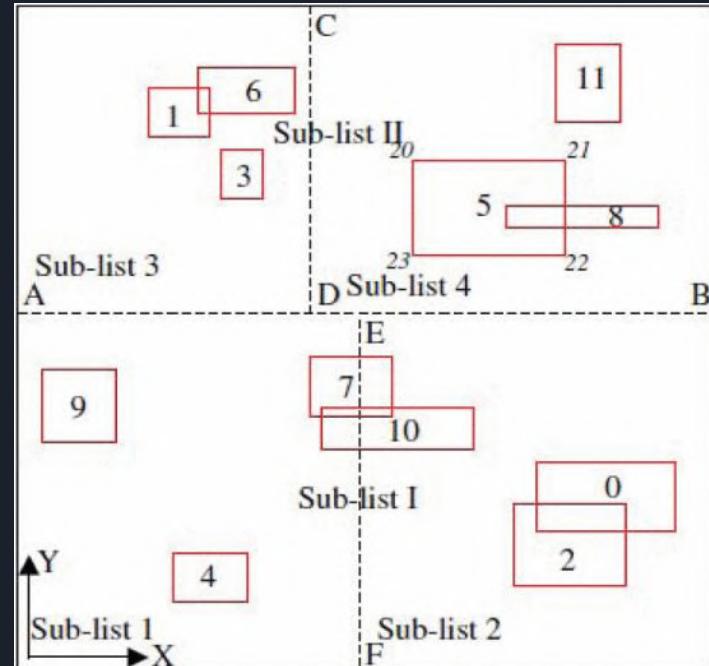


MacDonald & Booth  
1990 [11]

# History



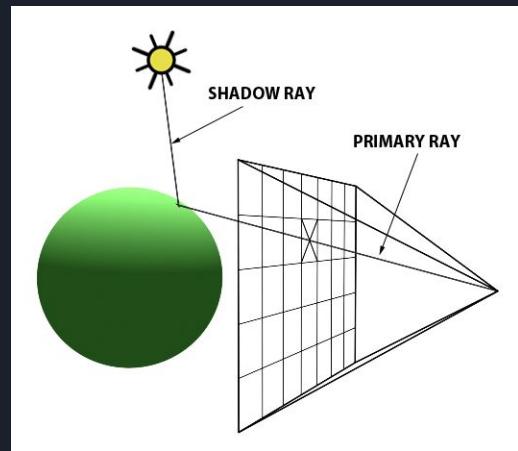
- Optimizations
  - Gino van den Bergen (1998): faster overlap testing with probabilistic SAT [12]
    - only 15% of separating axes are in the direction of two edges, so test a smaller subset for 6% failure rate
    - this performance is competitive with OBBs, where AABBs have been previously discounted
  - Yi-Si Xing, Xiaoping Liu, Shao-Ping Xu (2020): claimed  $O(n)$  algorithm similar to sweep and prune with their novel axial cut



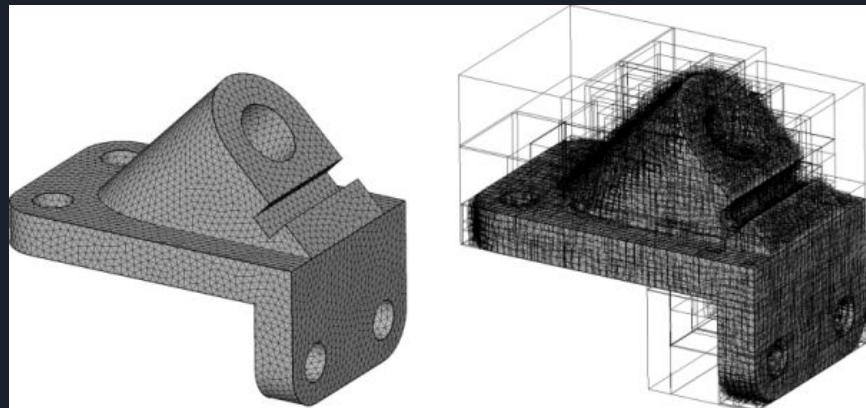
axial cut & locality overlap testing  
(Xing et al. 2020) [13]

# Applications

- Optimizing simulations
  - acceleration of ray tracing
  - game engines
  - aerospace: 4D AABB tree for space debris collision
  - swarm robotics
- Computational geometry / computer graphics
  - specifically CAD



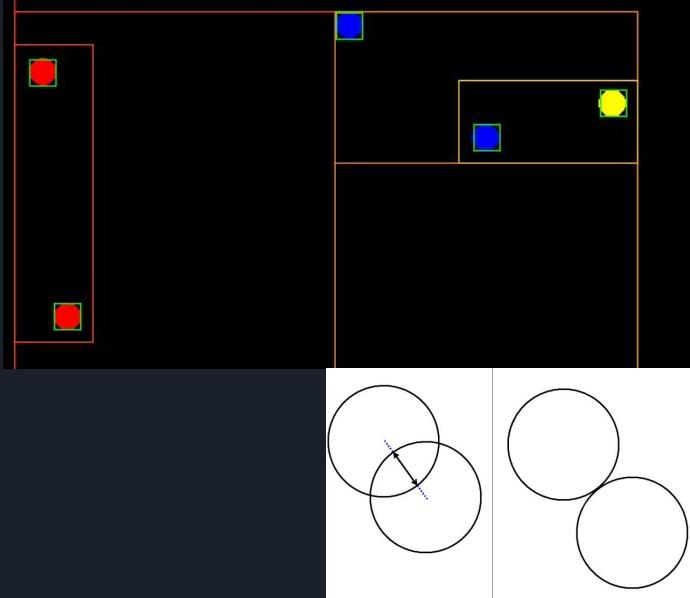
<https://www.scratchapixel.com/lessons/3d-basic-rendering/introduction-to-ray-tracing/implementing-the-ray-tracing-algorithm.html>



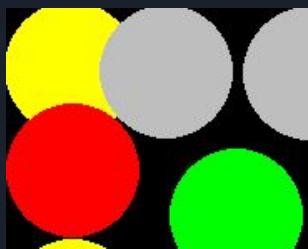
[https://doc.cgal.org/latest/AABB\\_tree/index.html](https://doc.cgal.org/latest/AABB_tree/index.html)

# Implementations

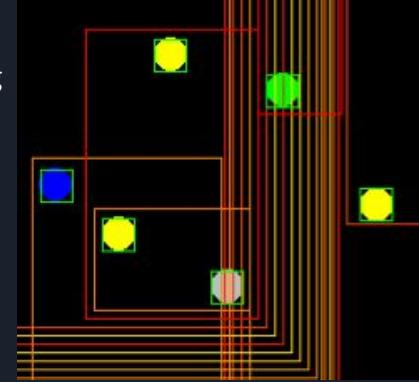
- Implemented a simple 2D discrete collision simulation
  - perfectly elastic circles
  - continuous wall collisions
  - “nudging” and density issues
- Implemented a 2D AABB (supports unions)
- Implemented a binary AABB tree
  - inserting a new leaf –  $O(\log n)$ 
    - recursively find the best sibling based on some cost function
    - create a new internal node, where the internal node’s children are the best sibling and the new node
    - trickle up the change by refitting the AABBs based on the new children
  - deleting a leaf –  $O(\log n)$ 
    - sibling replaces parent (internal node)
    - trickle up the change by refitting the AABBs



<https://flatredball.com/documentation/tutorials/math/circle-collision/>



issue with  
improper padding



# Implementations

- Various strategies for optimization
  - efficient insertion / good cost function
    - need a balance between quick insertion but “good enough” AABBs
    - either the insertion itself or the cost function can be recursive, employing some heuristic for efficiency
      - minimize surface area and overlap
  - try to keep as much of the tree when handling movement
    - rebuilding the tree each frame is costly
    - reinsertion is a good strategy because it is spread out
      - occurs when a node travels outside its parent’s bounding box
    - padding / “speculative expansion” based on velocity
  - balancing
    - tree rotations
    - but reinsertion can randomize the order naturally



# Implementations

- Broad phase checking each frame
  - brute force –  $O(n^2)$
  - combinations –  $O(n \text{ choose } 2) = O(n(n-1)/2) (= O(n^2))$
  - AABB pruning –  $O(n \log n)$ 
    - for each of the  $n$  objects, each one takes  $O(\log n)$  to determine leaf overlaps by eliminating up to half the objects per parent AABB check
    - we do not filter out duplicate checks



# Implementations

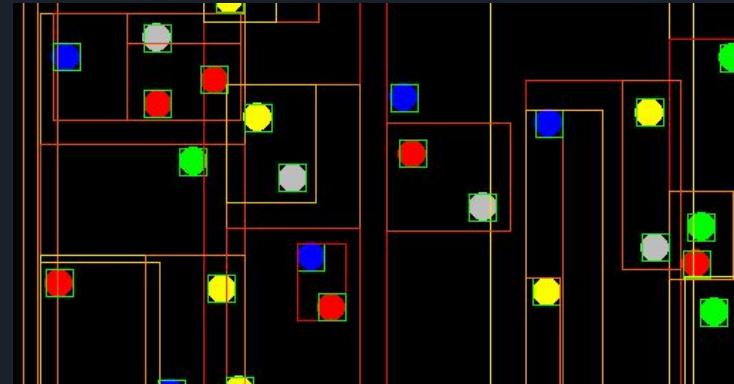
- Demo!
- Our code: <https://github.com/rjbray915/CS581-Final>

# Results

- Testing parameters:
  - seed: 581
  - number of circles: 100
  - min radius: 10
  - max radius: 10
  - spacing: 10
  - numbers are recorded during the second 30 seconds of the simulation

	Naive	AABB Tree
Avg FPS	153.8	232.8
Avg Checks	4950.0	1012.3

- FPS speedup: 51.4%
- Checks performed: 20.5%

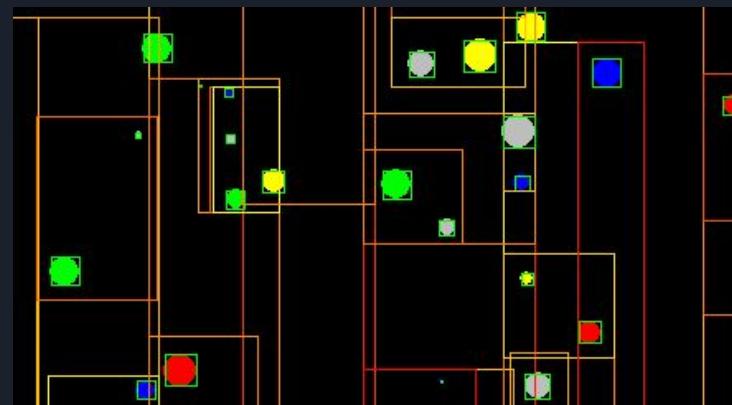


# Results

- Testing parameters:
  - seed: 581
  - number of circles: 100
  - min radius: 1
  - max radius: 10
  - spacing: 10
  - numbers are recorded during the second 30 seconds of the simulation

	Naive	AABB Tree
Avg FPS	150.1	279.2
Avg Checks	4950.0	960.1

- FPS speedup: 86.0%
- Checks performed: 19.4%

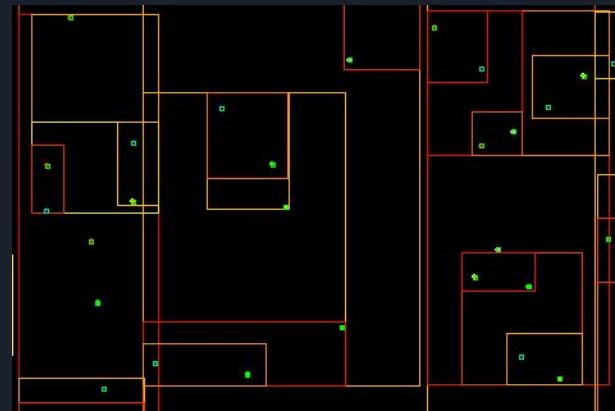


# Results

- Testing parameters:
  - seed: 581
  - number of circles: 100
  - min radius: 2
  - max radius: 2
  - spacing: 10
  - numbers are recorded during the second 30 seconds of the simulation

	Naive	AABB Tree
Avg FPS	152.6	298.3
Avg Checks	4950.0	852.9

- FPS speedup: 95.5%
- Checks performed: 17.2%

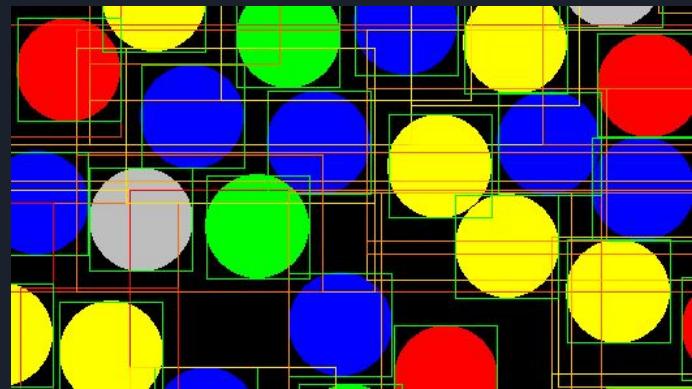


# Results

- Testing parameters:
  - seed: 581
  - number of circles: 100
  - min radius: 40
  - max radius: 40
  - spacing: 10
  - numbers are recorded during the second 30 seconds of the simulation

	Naive	AABB Tree
Avg FPS	146.4	191.1
Avg Checks	4950.0	1632.8

- FPS speedup: 30.5%
- Checks performed: 33.0%

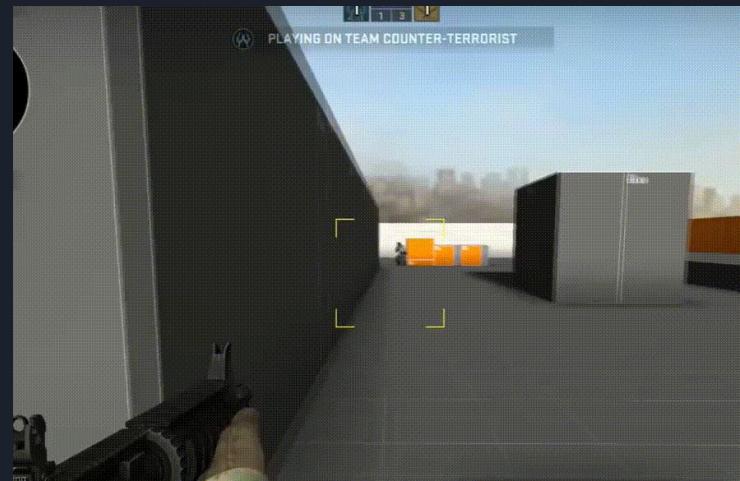


# Open Issues

- Online video games
  - hit registration, lag compensation
  - server tick rate
    - Counter-Strike 2 sub-tick updates
- Continuous collision detection
  - always room for improvement in efficiency, accuracy, and precision



<https://www.youtube.com/watch?v=6EwaW2iz4iA>





# References

1. <https://digitalrune.github.io/DigitalRune-Documentation/html/138fc8fe-c536-40e0-af6b-0fb7e8eb9623.htm>
2. [https://www.nphysics.org/continuous collision detection/](https://www.nphysics.org/continuous_collision_detection/)
3. <https://www.taylorfrancis.com/books/mono/10.1201/b14581/real-time-collision-detection-christopher-ericson>
4. [https://en.wikipedia.org/wiki/Bounding volume hierarchy](https://en.wikipedia.org/wiki/Bounding_volume_hierarchy)
5. <https://www.toptal.com/game/video-game-physics-part-ii-collision-detection-for-solid-objects>
6. <https://www.youtube.com/watch?v=9IULfQH7E90>
7. [https://box2d.org/files/ErinCatto DynamicBVH GDC2019.pdf](https://box2d.org/files/ErinCatto_DynamicBVH_GDC2019.pdf)
8. <https://github.com/kip-hart/AABBTree/>
9. <https://dl.acm.org/doi/10.1145/1468075.1468082>
10. <https://ieeexplore.ieee.org/document/4057175>
11. <https://link.springer.com/article/10.1007/BF01911006>
12. [https://www.cs.cmu.edu/~djames/pbmis/etc/jgt98deform AABB.pdf](https://www.cs.cmu.edu/~djames/pbmis/etc/jgt98deform_AABB.pdf)
13. [https://ieeexplore.ieee.org/abstract/document/5524093?casa\\_token=3\\_gGtO94mGwAAAAA:G8P3XI6RN6fxm5PbXQ3FlehIlvJiuai3rZb20on79exIzjwXea-M2Gde7fZPmGiPHD2oFECXNw](https://ieeexplore.ieee.org/abstract/document/5524093?casa_token=3_gGtO94mGwAAAAA:G8P3XI6RN6fxm5PbXQ3FlehIlvJiuai3rZb20on79exIzjwXea-M2Gde7fZPmGiPHD2oFECXNw)



# Discussion

- Questions?



# Test Questions Revisited

1. What is the major flaw of discrete collision detection?
2. What kind of  $k$ -DOP is a 3D AABB? (What is  $k$ ?)
3. What is one way to optimize a BVH?