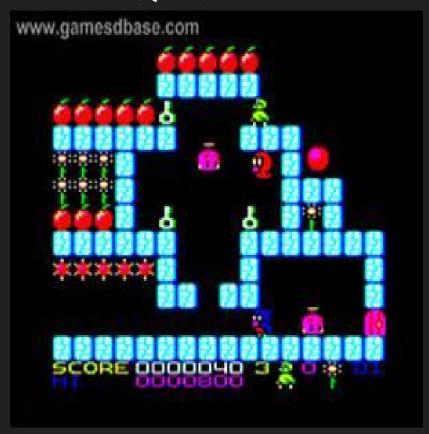
# Artificial Intelligence

Christopher Menart Nikit Malkan Chris Makepeace Branden Ten Brink

#### The First Game Al



# Qwak



### Pac-Man



#### 80's: Finite State Machines



#### Did Garry Kasparov Have Fun?











#### Strategy Al Spectrum

"Good"

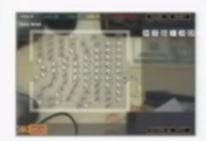
"Fun"

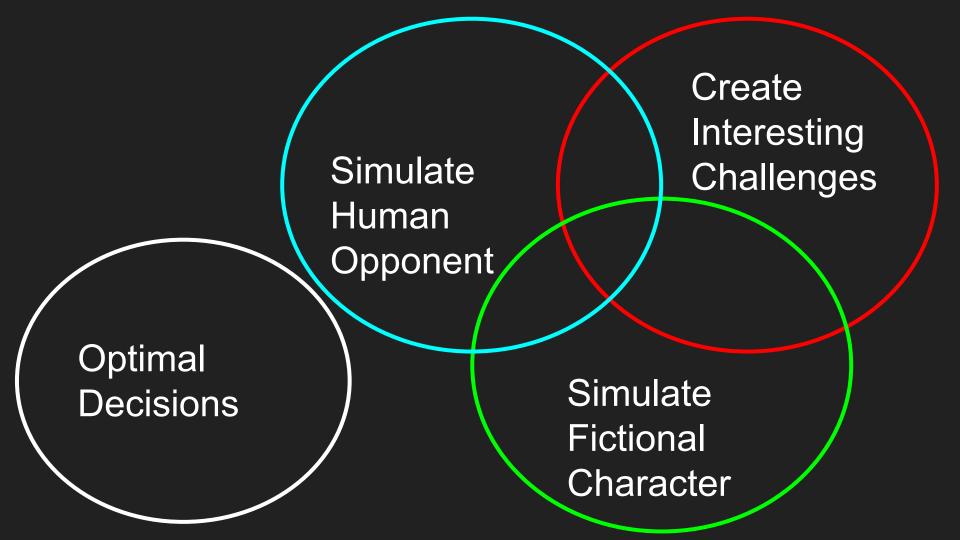












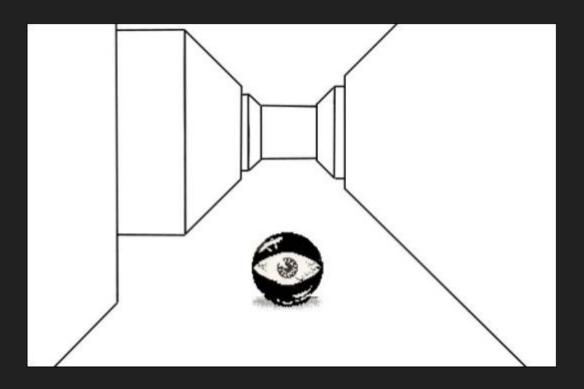
### Interesting Challenge



Simulating Fictional Characters

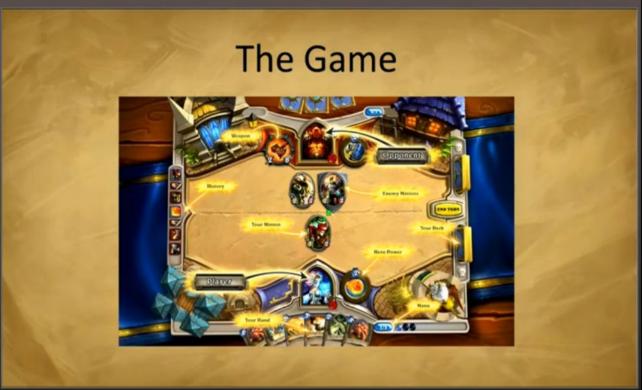


### Simulating Human Opponents



### Simulating Human Opponents







#### Optimal Decisions



# Al and Cheating

#### Enhancing Al



You have the option to enhance various aspects of the AL to make the game more difficult and interesting. This only affects the main computer-controlled countries.

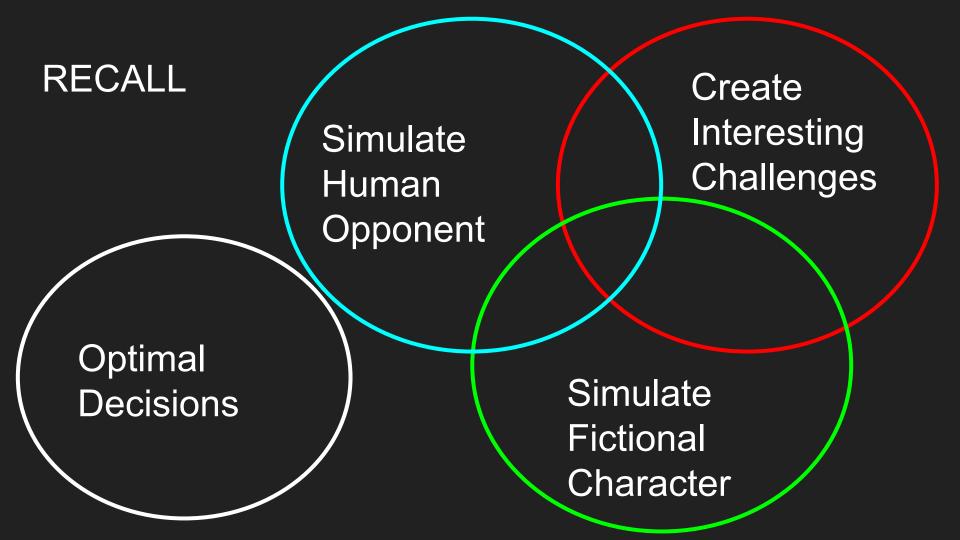
(For effects on your decision, check the information appearing when you move the mouse over the button.)

Let the AI to cheat as much as possible.

Difficult

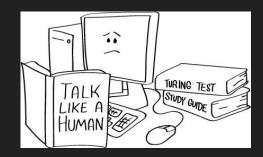
Complicate the game a bit

Normal, no changes





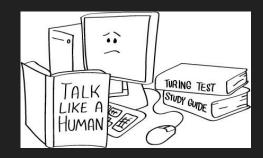
Imagine playing a game of Mario Kart. Each player will



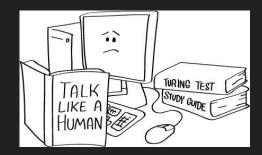
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    - Often inefficient!
    - (It's more fun this way!)



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  - Place arbitrary value on things.
    - Blue colour is best colour.
    - (This is a fact.)



- Imagine playing a game of Mario Kart. Each player will
  - Have unique playstyles.
    - Often inefficient!
    - (It's more fun this way!)
  - Place arbitrary value on things.
    - Blue colour is best colour.
    - (This is a fact.)
  - Be notoriously fickle.
    - Our *perception* of how we perceive something changes at the drop of hat...
    - (This character beat me.  $\Rightarrow$  This character is broken.  $\Rightarrow$  I'm going to play this character.)



- Scenario
  - A game of Age of Empires.
  - One player is dominating.

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  - And break them when convenient.
- Withhold information.
  - I don't have have enough resources/units to fight.
- Lie and cheat.
  - What my cavalry are raiding your villagers during the skirmish?
  - I didn't notice...

#### Solving Interesting Challenges

- Limited amount of information.
  - Can see current status.
  - Can think about past events.

- Look for patterns.
  - Predict future outcomes.
  - Exploit what we can.

# **Bottom Line**

We want to win!

#### Conflict

- We want to win.
- Good AI wants to win.
- Fun Al enables the player to win.

- Very difficult to find a balance.
- Too easy ~ no challenge.
- Too difficult ~ impossible challenge

#### Cheating ~ What's the Point?

- Al is very limited in what it can do.
- Increase difficulty ⇒ Increase in available tactics.

- Al will need some help to keep up with player.
- Cheating allows us to accomplish our three goals.

# What is Cheating?

"...giving agents actions and access to information that would be unavailable to the player in the same situation."

- Wikipedia: Artificial Intelligence (Video Games)

# How to Cheat

#### Stat Modifiers

#### **Stat Modifiers**

- Modify stats
  - Higher difficulty = Better stats

#### **GAME SNAPSHOT** DIFFICULTY Settler O Chieftain Warlord O Noble Monarch Emperor Immortal O Deity **GAME SPEED** Marathon Epic O Quick

#### **Stat Modifiers**

- Modify stats
  - Higher difficulty = Better stats
- Increase passive gold/income/exp rate
  - Resource gathering rate too





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- Ignore population cap
  - Spawn free units
  - o 0 pop units



#### **Stat Modifiers**

- Modify stats
  - Higher difficulty = Better stats
- Increase passive gold/income/exp rate
  - Resource gathering rate too
- Ignore population cap
  - Spawn free units
  - o 0 pop units
- Faster build rates
  - Never 0 time for basic buildings



# Ask the Game Engine (All Seeing AI)

Ignore fog of war







# Ask the Game Engine (All Seeing Al)

- Ignore fog of war
- Look up duration of status effects









# Ask the Game Engine (All Seeing AI)

- Ignore fog of war
- Look up duration of status effects
- Know effects of all items on a stage









# Different Rules or Mechanics

- Infinite ammo/no reloading
  - When you loot, limited ammo.





### Different Rules or Mechanics

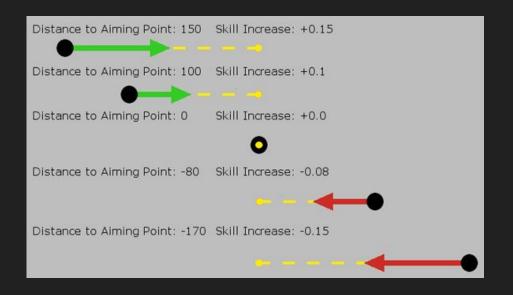
- Infinite ammo/no reloading
  - o When you loot, limited ammo.
- Special Al specific moves
  - Fighting games.

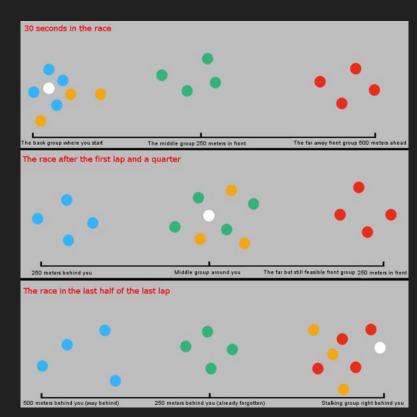




# Dynamic Game Difficulty Balance ~ Rubber Band Al

- Racing Games
- Sports Games

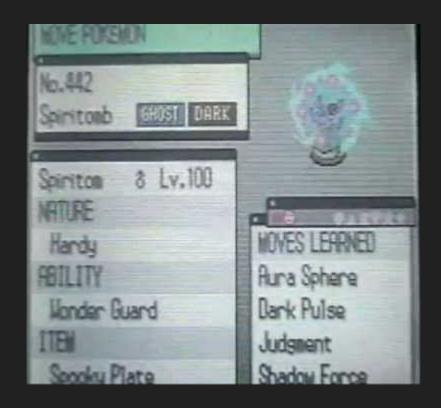




# Al Learning

- Learn from the player's choices.
- Keep trying until the Al wins.





# Rules of Cheating

"Cheat wherever you can. A.I.s are handicapped. They need to cheat from time to time if they're going to close the gap."

Jonny Ebbert, Relic, Lead Designer on Dawn of War 2

# Cheat Fairly

- Humans are notoriously bad at detecting cheating.
  - If I did it it's because I'm skilled.
  - If the Al did it it's because it's cheating.
  - Even streaks of luck is "cheating".

# Golden Rule of Cheating

# "Never get caught cheating. Nothing ruins the illusion of a good A.I. like seeing how they're cheating." - Jonny Ebbert

# Pathfinding

# Good and Bad Pathfinding In Video Games

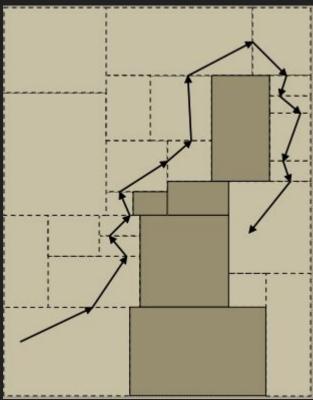
#### Good

- Fluid Human Like Movement
- (Re)pathing cheap
- Works well with other Al agents

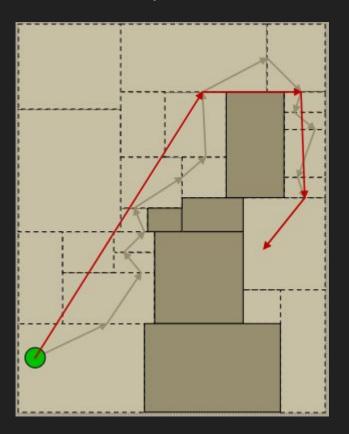
#### Bad

- Pathing expensive
- Repathing often
- Robotic movement and all knowing AI

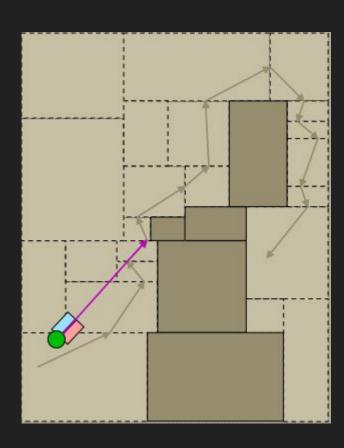
# A\* Through Navigation Mesh

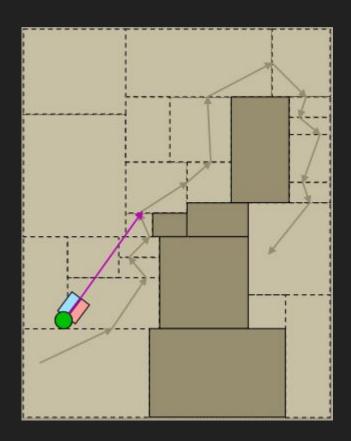


#### Path Optimization

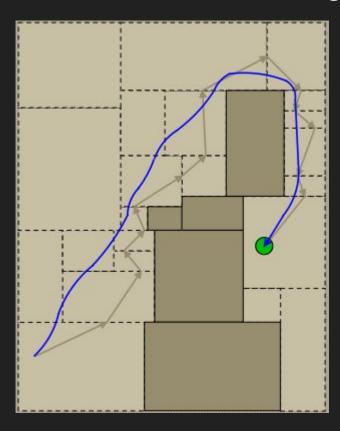


# Reactive Path Following





# Reactive Path Following



# Pathfinding Algorithms

A\*

#### Simple recalculations:

- D\*
- DynamicSWSF
- Incremental A\*
- D\*-Lite

#### Any-angle movement:

- Field D\*
- Theta\*
- Incremental Phi\*

#### Fast/Sub-optimal

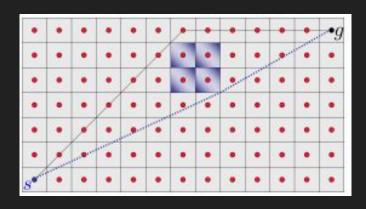
- Anytime D\*
- HPA\*
- HAA\*

#### Field D\*

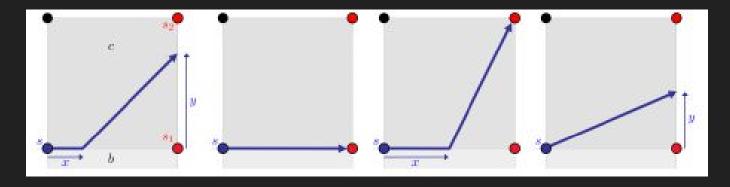
Uses path calculations similar to D\*-Lite

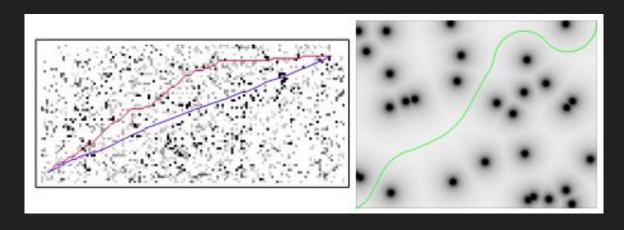
Previous algorithm paths restricted to headings of  $\pi/4$  or 45°

Uses Interpolation-based Path Planner and Replanner



# Field D\*





# Behavior Trees

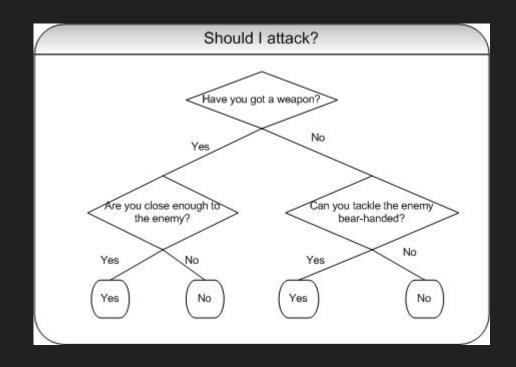
# A Bit of History: Decision Trees

#### Pros

- Clean structure
- Easy implementation
- Decent level of behavior

#### Cons

- One-way, single behavior
- Complexity is hard to implement



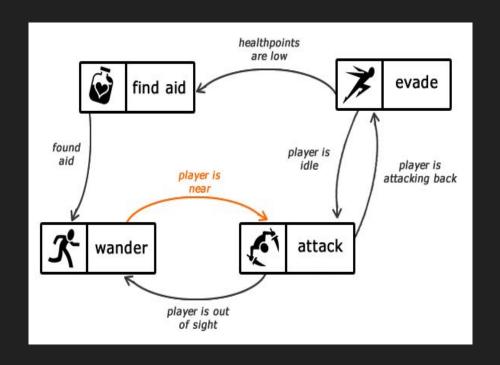
# A bit of history: State Machines

#### **Pros**

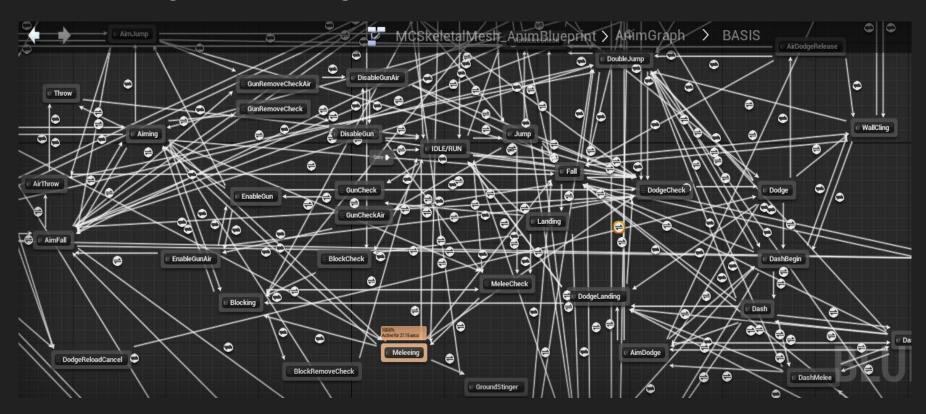
- Easy to implement
- Fast performance
- Can support complex behavior

#### Cons

- Transitions can be hard to manage
- Gets messy, very quickly!



# When it goes wrong



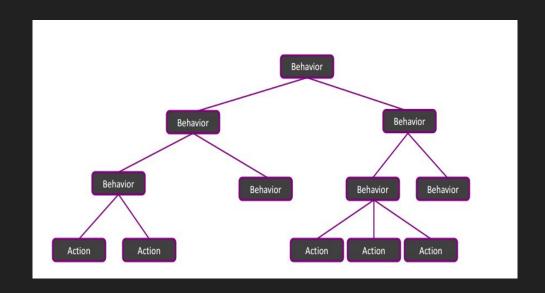
# Enter, Behavior Trees

#### **Pros**

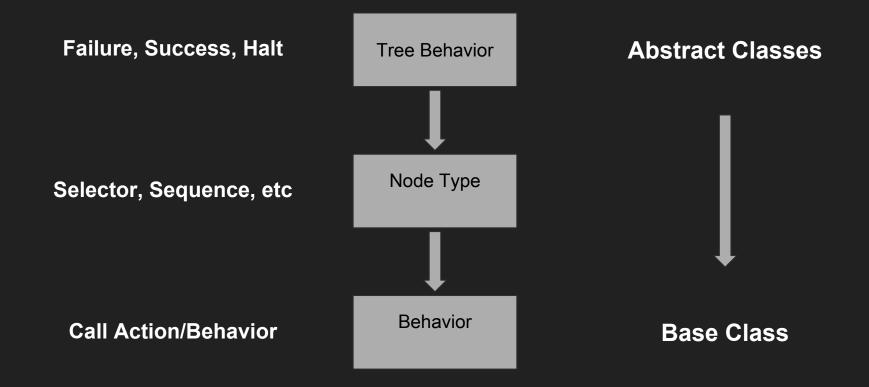
- Complex Behavior
- Clean Structure
- Non-linear traversal
- Industry Standard

#### Cons

- Complex implementation
- Custom Tree structure



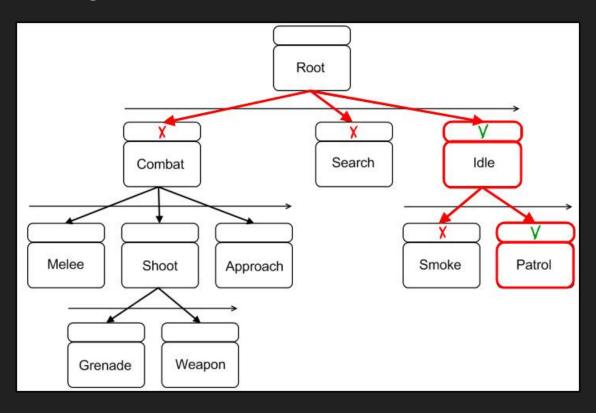
#### **Abstraction & Structure**



# What Types of Nodes Exist?

Selector Sequence Inverter Leaf Many More! Repeater

# Bring It All Together

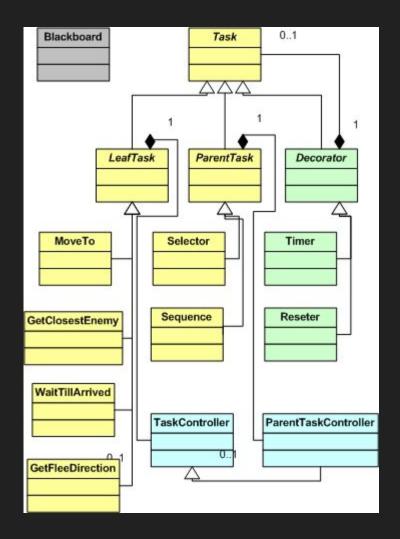


#### Control Room

Blackboard : Storage

- Type 1: Store References
  - Store reference to current node
  - Move to high priority behavior
  - Return to past node

- Type 2: Generate Sub-Trees
  - Create temporary Sub-Tree
  - Restart Behavior Tree



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