## AtDelfi: Automatically Designing

Michael C. Green, Ahmed Khalifa, Gabriella A. B. Barros, Tiago Machado, Andy Nealen, and Julian Togelius

Legible, Full Instructions

### Motivation

#### **Motivation**

What is a tutorial?

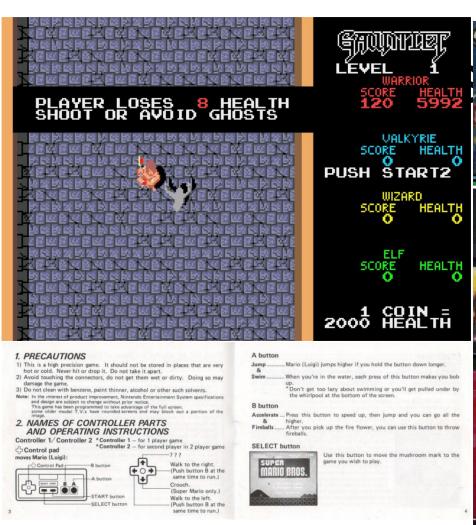
Mechanics and Graphs

**GVGAI** Quick Overview

Generating a Tutorial in GVGAI (AtDelfi)

AtDelfi - GVGAI Results

**Future Work** 





## Goals

To explore a new role for artificial intelligence: **Teacher** 

How can Al automatically generate tutorials for games?

## Sub-Questions

What kinds of tutorials can be automatically generated?

What **kinds of games** can tutorials be automatically generated for?

How effective are they? Are some more effective than others?

## What is a tutorial?

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"Tutorial: a paper, book, film, or computer program that provides practical information about a specific subject"

-Merriam Webster

### "Practical Information?"

HP/Resource

Dying

Movement/Controls

Enemies/Friends

Points/Score

Winning and Losing

Other Mechanics

Strategy

### "Practical Information?"

HP/Resource

Dying

Movement/Controls

Enemies/Friends

Points/Score

Winning and Losing

Other Mechanics

• <del>Ctrategy</del>

- 1. Teaching using Instruction
- 2. Teaching using Demonstration
- 3. Teaching using a Carefully-Designed Experience



Teaching using Instruction (Civilization 6)

Teaching using Examples (Megaman X)

Teaching using a Carefully Designed Experience (Super Mario Bros)



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## Mechanics and Graphs

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What is a tutorial?

**Mechanics and Graphs** 

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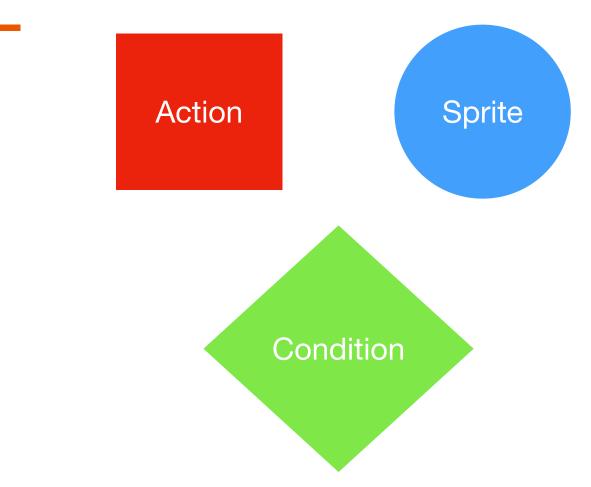
AtDelfi - GVGAI Results

**Future Work** 

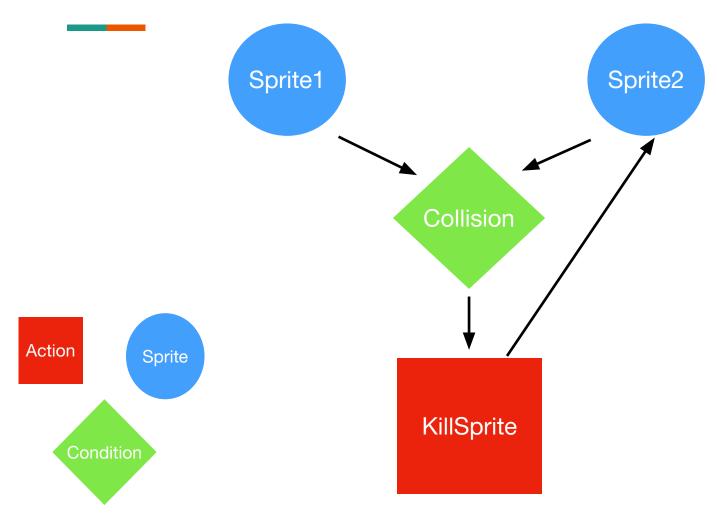
## "Game Mechanic: an action that a player can take that changes the game state"

"Defining Game Mechanics," Miguel Sicart

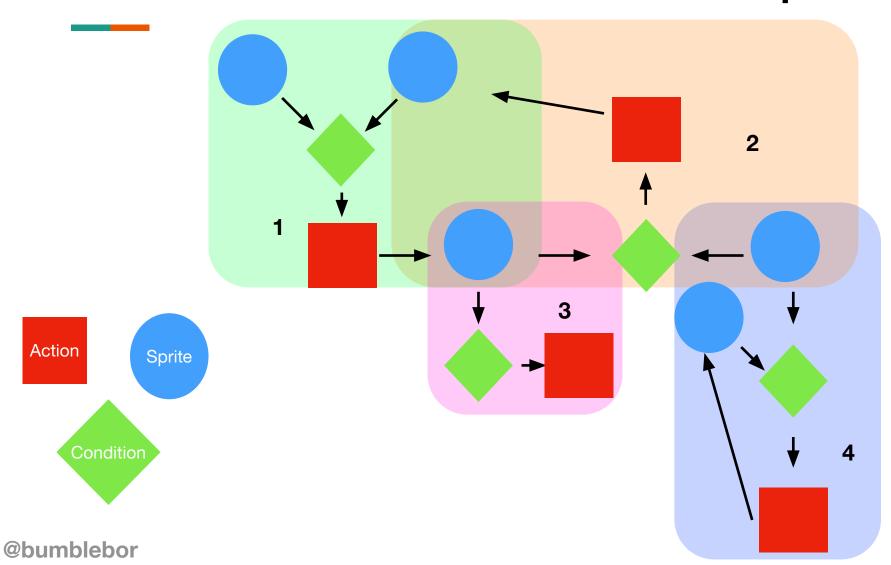
## A Directed Mechanic Graph



## A Directed Mechanic Graph



## A Directed Mechanic Graph



## GVGAI (Quick Overview)

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**GVGAI** Quick Overview

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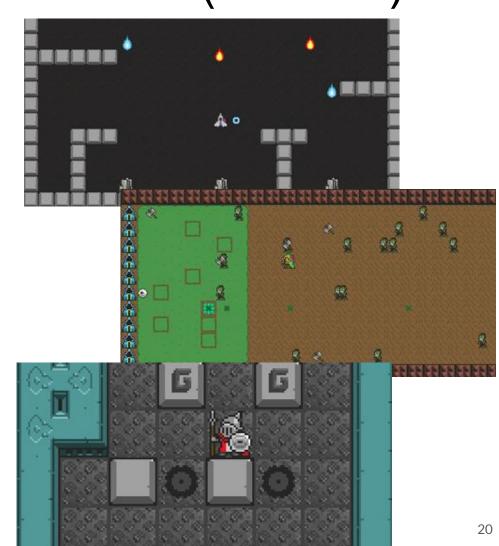
AtDelfi - GVGAI Results

**Future Work** 

## General Video Game Artificial Intelligence Framework (GVG-AI)

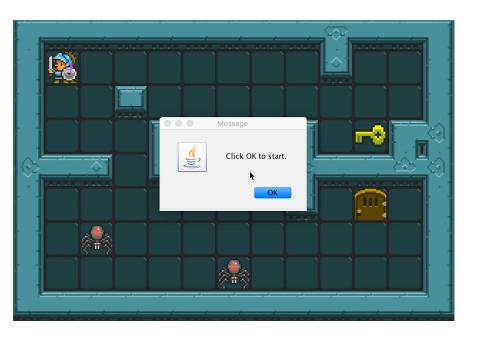
A collection of video games for AI benchmarking

All represented in Video Game Description Language (VGDL)



## Video Game Description Language (VGDL)

#### Level



#### **Spriteset:**

"Spider", "Key", "Wall", "Avatar"

#### **Interaction Rules:**

If "Spider" collide "Avatar" then Kill "Avatar"

#### **Termination**

#### **Conditions:**

If "Avatar" dies, Game Lost

# Generating a Tutorial in GVGAI (AtDelfi)

**Motivation** 

What is a tutorial?

**Mechanics and Graphs** 

**GVGAI Quick Overview** 

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**Future Work** 

## 1. Read in VGDL (Video Game Description Language)

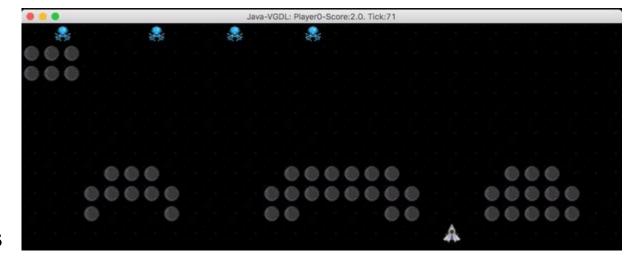
#### Movement

- controls/limits
   Interactions between
   objects/sprites
  - collisions
  - relationships

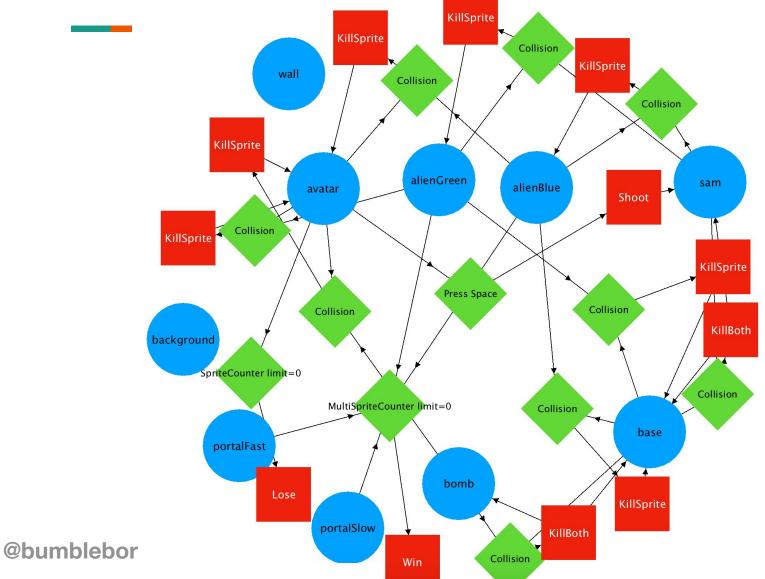
Termination conditions

how to win/lose

Score/points/misc



## 2. Build Mechanic Graph

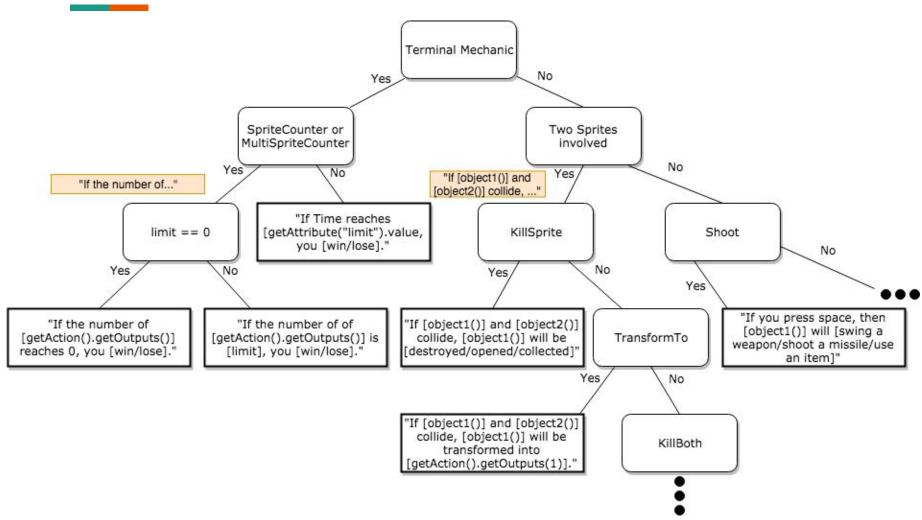


### 3. Find Critical Paths

"The series of mechanics that lead from player input to a terminal state"

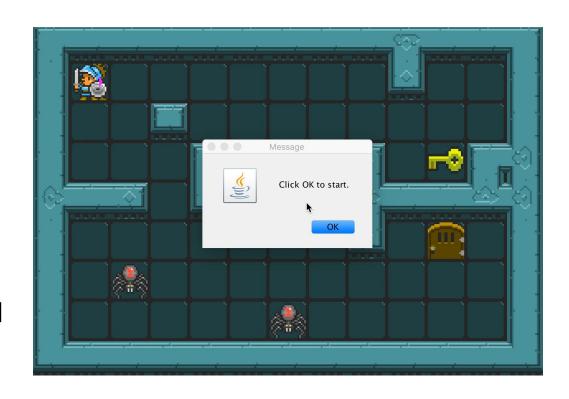
- use to determine how to win and lose the game
- simple breadth first search from avatar to terminal conditions

#### 4. Generate Written Instructions



## 5. Capture Agent Playthroughs

- adrienctx
- NovelTS
- NovTea
- Number27
- YOLOBOT
- OneStepLookAhead
- DoNothing



#### 6. Display Instructions with Agent Examples

## AtDelfi - GVGAI Results

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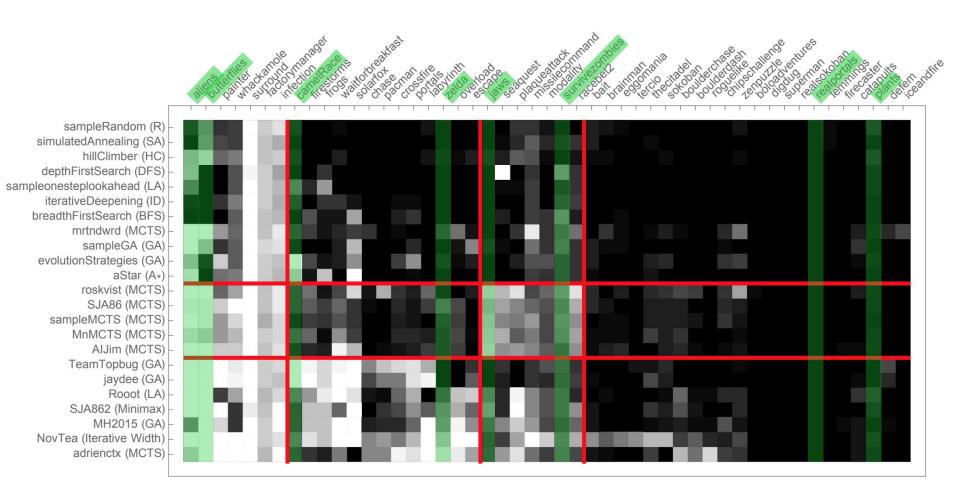
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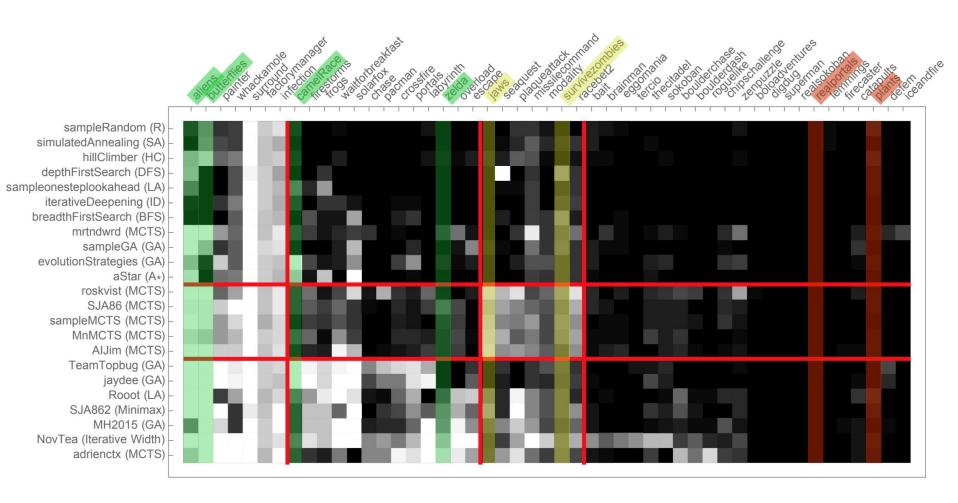
Future Work

### Selected Games in GVGAI





## Evaluation for Readability





## Improvements to AtDelfi

- Explore other Critical Path algorithms
- Objective User Study Evaluation
- More games, different kinds!
- Bugfixes

## AtDelfi: Automatically Designing Legible, Full Instructions

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## Rule Merging

```
hungry (pacman) + fruit (food) > collect fruit
```

hungry (pacman) + pellet (food) > collect pellet

hungry (pacman) + power (food) > collect power

powered (pacman) + fruit (food) > collect fruit

powered (pacman) + pellet (food) > collect pellet

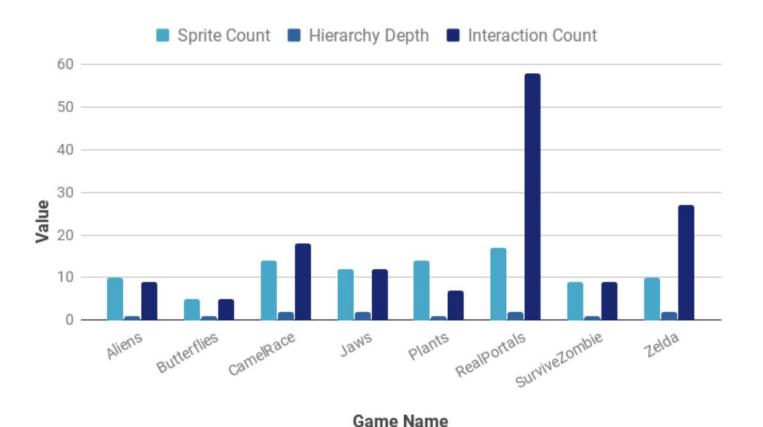
powered (pacman) + power (food) > collect power

```
name = powered
fullname = powered
     (pacman)
    type = Sprite
     subtype =
     OrientedAvatar
    parents = {pacman}
     ...
```

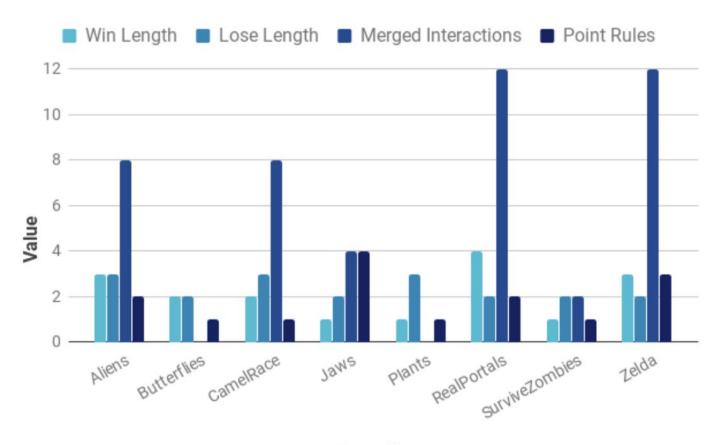
pacman + food > collect food

```
name = hungry
fullname = hungry
    (pacman)
    type = Sprite
    subtype =
    OrientedAvatar
    parents =
    {pacman}
    ...
```

#### Metrics

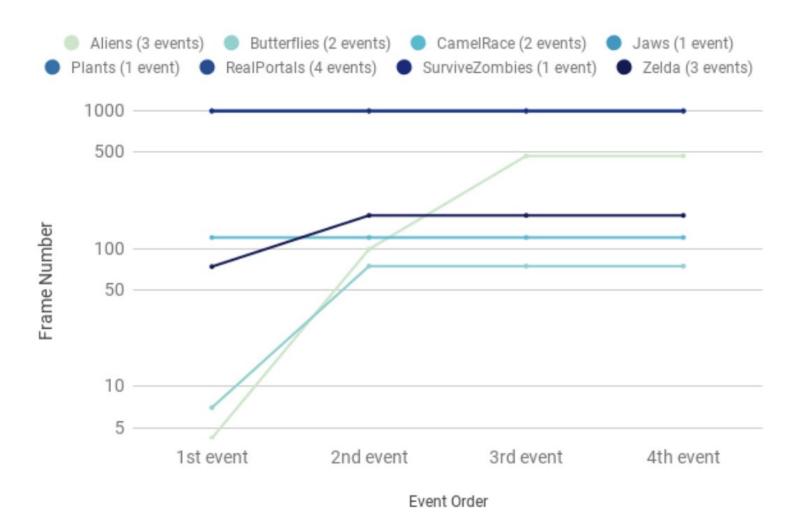


#### Metrics

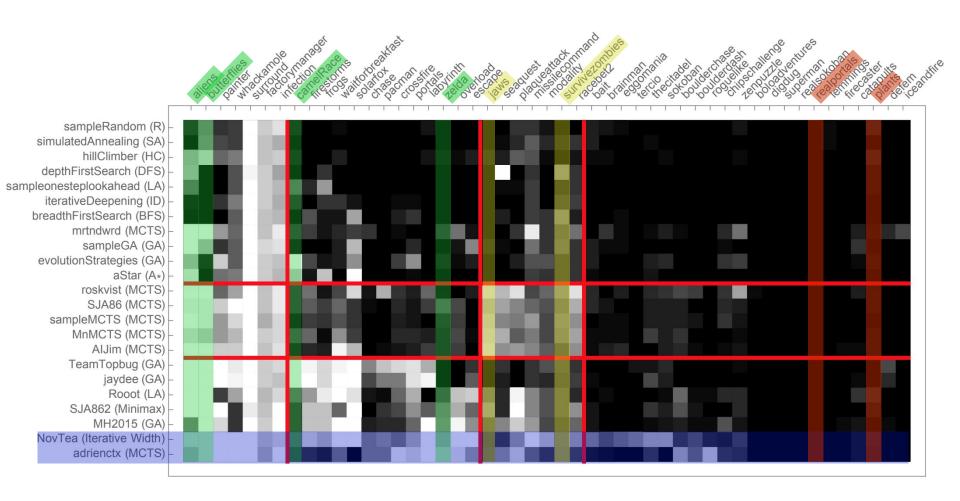


**Game Name** 

#### Metrics



# Correlations Between Agent Performance and Tutorial Readability



#### Use A\* to Learn Mechanics



## Evolve "Well-Designed"

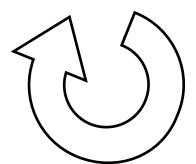




Various Disabilities using Mechanic Graph

ario

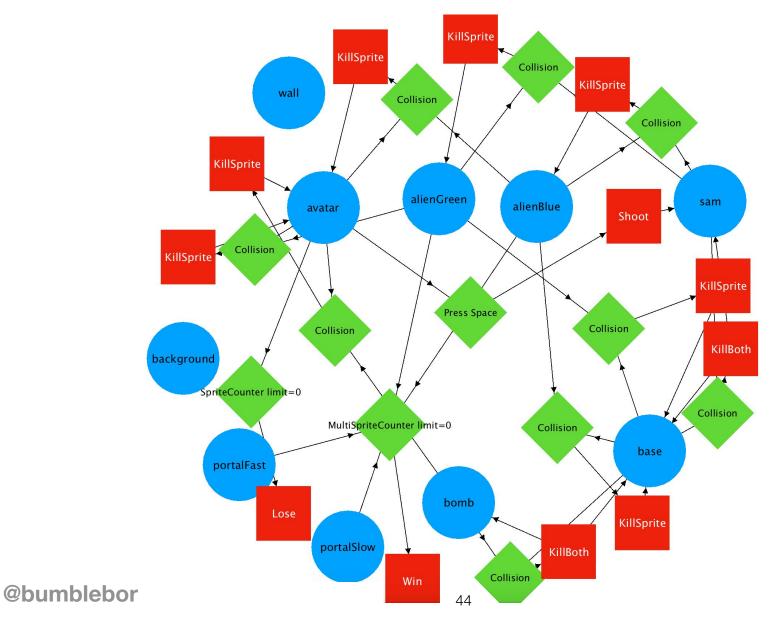
Mario Level

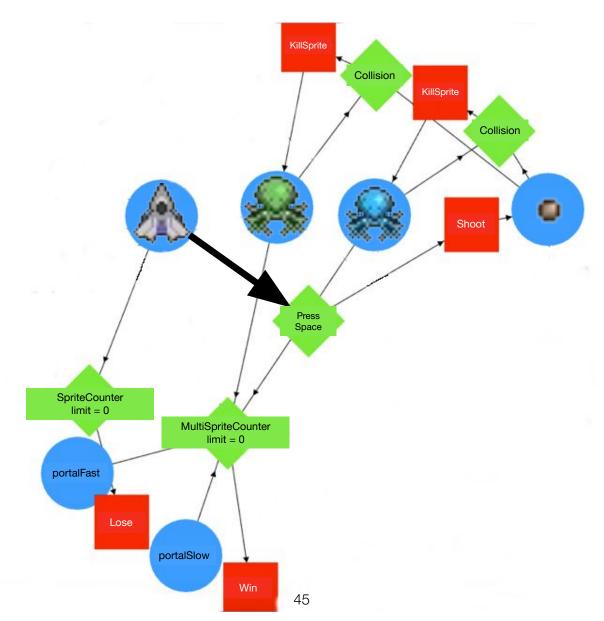


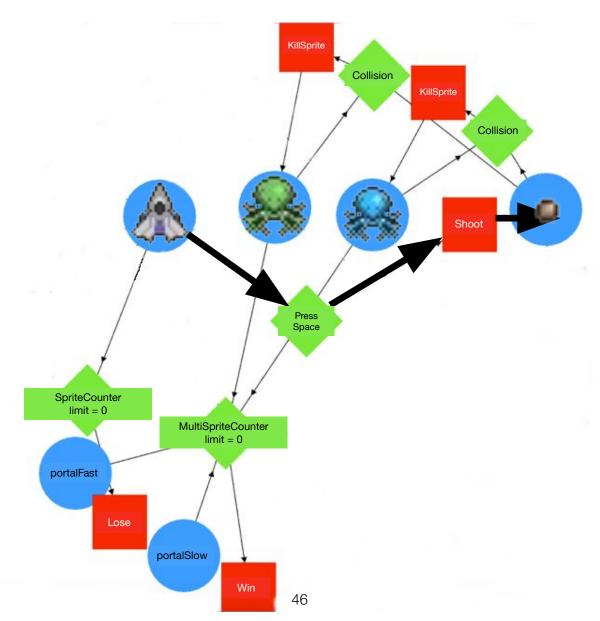
Fitness = Entropy of distance between agent deaths

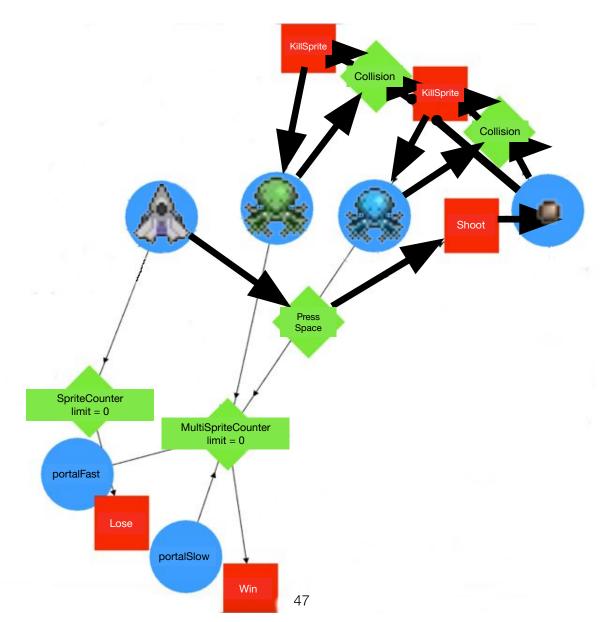
#### Learn Mechanics w/o a

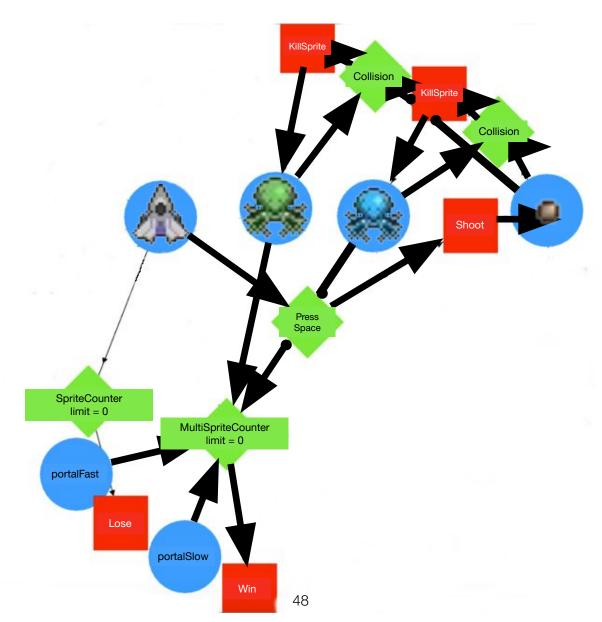
- Summerville Tolowatehin Myone
- Summerville's "Latent Causal Affordances"
- Guzdial's Game Engine Learning
- Visual information + game state (or domain knowledge)
- Only visual information (no state at all)

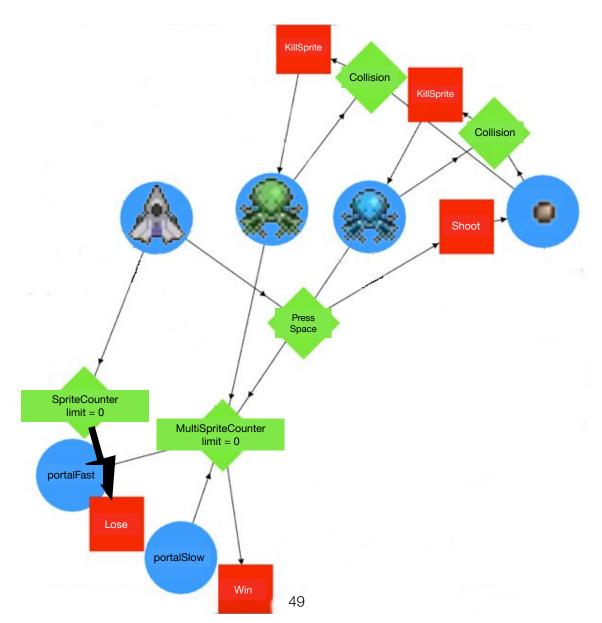


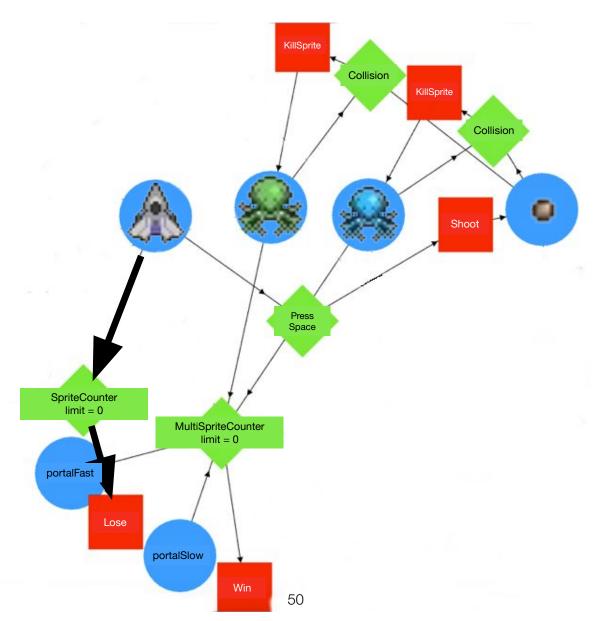




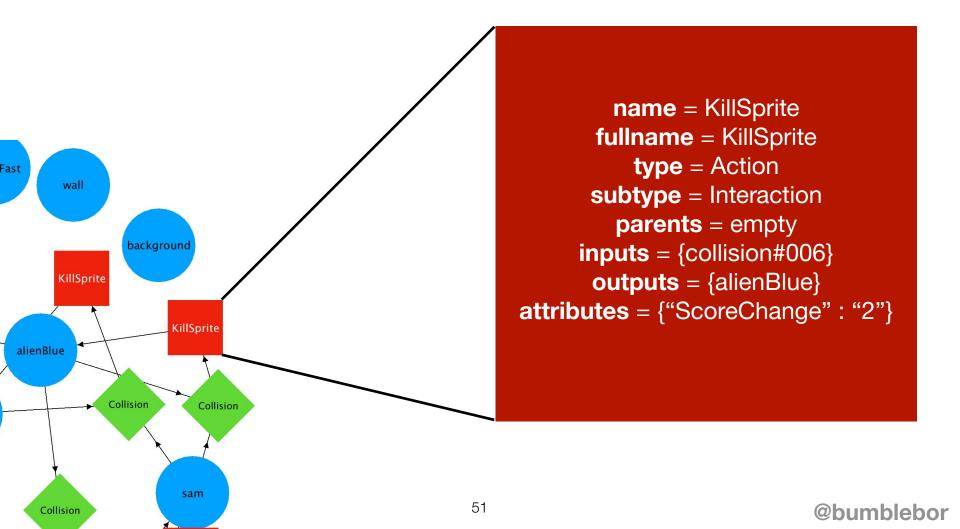








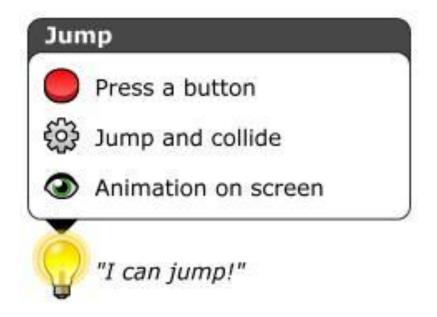
## 2. Build Mechanic Graph



## Expensive!



#### Skill Atoms - Dan Cook



## 2. Build Mechanic Graph

