

2018-05-25

CE810 GD2

CE810 - Game Design 2  
Lab - Searchable Design Spaces

Joseph Walton-Rivers & Piers Williams  
Monday, 14 May 2018  
University of Essex

# CE810 - Game Design 2

## Lab - Searchable Design Spaces

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# Intro

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# Design Spaces

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└ Intro

└ Design Spaces

- In this morning's session we talked about **Game Parameters**

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- Why is this dependance possibly an issue?

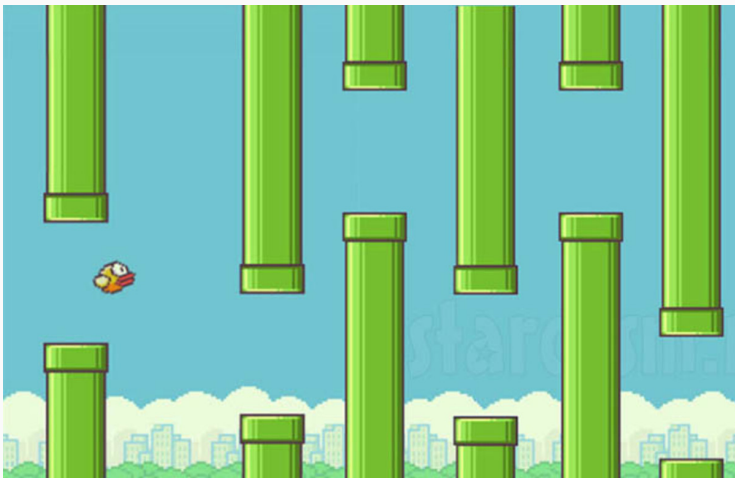
# Flappy Bird

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# Exercise: Game Parameters

## Question

What game parameters are there for *Flappy Bird*?



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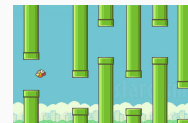
└ Flappy Bird

└ Exercise: Game Parameters

Exercise: Game Parameters

Question

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# Answer: Game Parameters

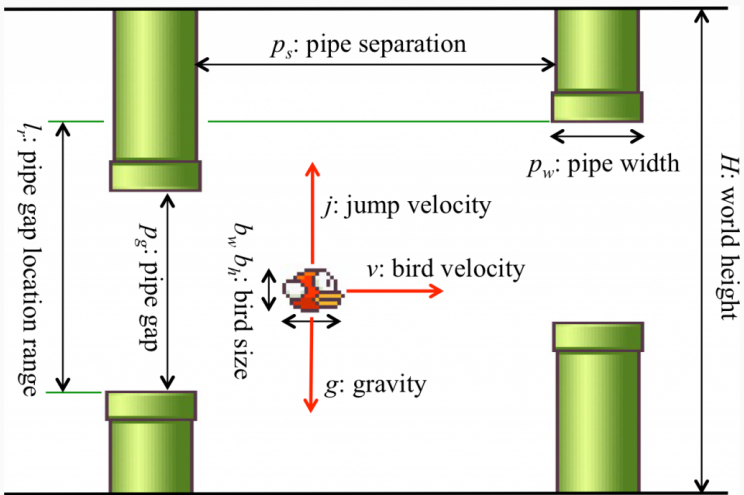
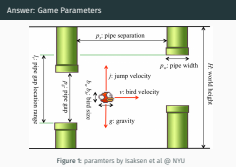


Figure 1: paramters by Isaksen et al @ NYU

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└ Flappy Bird

└ Answer: Game Parameters





# Flappy Birds

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└ Flappy Bird

└ Flappy Birds

**Activity**

Go to the *Flappy Bird demo* and change the sliders.  
How does changing the parameters affect the gameplay?  
<http://game.engineering.nyu.edu/projects/exploring-game-space/> [1]

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# How does this relate to us?

Isaksen et al basically did the following:

1. Select parameters
2. Repeat  $N$  times
  - 2.1 Generate games
  - 2.2 Evaluate games
  - 2.3 Record results
3. Analyse results
4. Output result

This is how we're going to think about tuning our own game parameters.

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└ Flappy Bird

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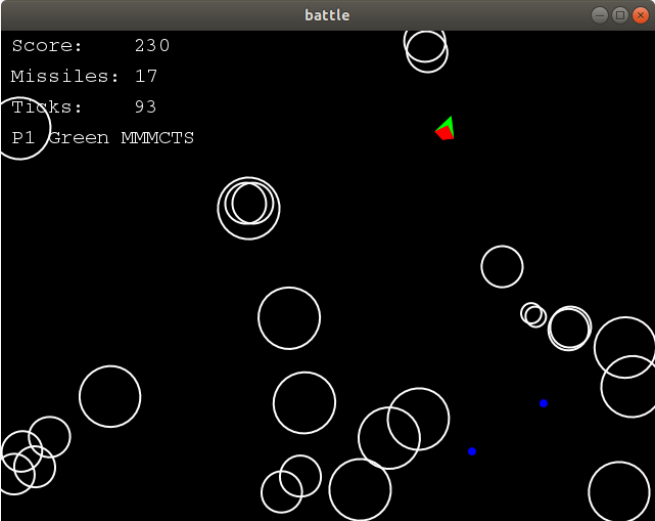
**Solution** Make AIs that play them

# Asteroids

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# Asteroids

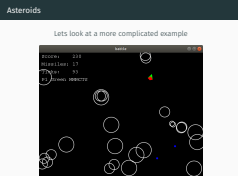
Lets look at a more complicated example



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└ Asteroids



## Question

What parameters could we change for *Asteroids*?

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└ Parameters

## Question

What parameters could we change for *Asteroids*?

- Game Length
- Number of bullets
- Speed of bullets
- Number of asteroids
- Number of asteroid children
- Ship speed
- Ship turn rate
- Bullet cost
- Can bullets hit the ship

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└ Asteroids

└ Parameters

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- Score difference
- Time to win (game ticks)
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## Exercise

Create a version of *Asteroids* that **disadvantages** the rotate and shoot player over the other agents.

# Asteroids Codebase

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- Relatively simple
- Easy to change parameters
- Can customise it further if you particularly want something else
- Genetic algorithm included to assist you
  - Only thing it needs ... a better Fitness Function

# Overview

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└ Asteroids Codebase

└ Overview

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- Easy to change parameters
- Can customise it further if you particularly want something else
- Genetic algorithm included to assist you
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```
SimpleBattle battle = new SimpleBattle(true, params);  
BattleController p1 = new SingleMCTSPlayer(new Random());  
battle.playGame(  
    p1,  
    new MultiRecorder(scoreRecorder, bulletRecorder)  
);
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```

Most examples shortened for fitting in the slides

# Parameters?

```
int[] params = new int[N_PARAMS];  
Arrays.fill(params, -1);  
params[N_MISSILES] = 200;
```

The set of parameters currently supported is in that handy list from slide 9

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└ Asteroids Codebase

└ Parameters?

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- Searching design spaces can require a lot of computational power.

We will cover how they work later



# Searching the space

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└ Asteroids Codebase

└ Searching the space

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- `"com.fossgalaxy.games.asteroids.battle.jenetics.Jenetics"`

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```
Arrays.fill(USING, false);  
USING[N_MISSILES] = true;  
USING[BULLET_TIME_TO_LIVE] = true;  
USING[SHIP_MAX_SPEED] = true;  
USING[SHIP_STEER_RATE] = true;  
USING[BULLET_KILL_SHIP] = true;
```

```
Jenetics: Limits  
  
int[][] limits = {  
    {10, 500}, // N_MISSILES  
    {20, 100}, // BULLETT_TIME_TO_LIVE  
    {1, 10},  
    {5, 50},  
    {0, 1}  
};
```

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int[][] limits = {  
    {10, 500}, // N_MISSILES  
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};
```

# Jenetics: Chromosomes

```
// Convert limits to the chromosomes
List<Chromosome<IntegerGene>> genes = Arrays
    .stream(limits)
    .map(x -> IntegerChromosome.of(x[0], x[1], 1))
    .collect(Collectors.toList());
```

```
// Chromosomes to genotype
Factory<Genotype<IntegerGene>> genotype =
    ↪ Genotype.of(genes);
```

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// Chromosomes to genotype
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```



```
int[] params = getParamsFromGenotype(genotype);
AIExperiment experiment = new AIExperiment(5,
    ↪ controllerFunctions, params);
Map<String, List<Integer>> scores = experiment.run();
Map<String, Integer> avg = new HashMap<>();
for(Map.Entry<String, List<Integer>> entry : scores.entrySet()){
    avg.put(
        entry.getKey(),
        entry.getValue().stream().mapToInt(Integer::new).sum() / 5);
}
return avg.get("PiersMCTS") - avg.get("RotateAndShoot");
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```

```
ExecutorService exec = Executors.newFixedThreadPool(3);  
final Engine<IntegerGene, Double> engine = Engine  
    .builder(Jenetics::fitness, genotype)  
    .populationSize(50)  
    .executor(exec)  
    .optimize(Optimize.MAXIMUM)  
    .build();
```



```
final Genotype<IntegerGene> result = engine.stream()
    .limit(limit.byExecutionTime(Duration.ofMinutes(120)))
    .limit(300)
    .peek( x-> {
        System.out.println("Generation: " + x.getGeneration());
        System.out.println("Best Fitness: " + x.getBestFitness());
    }
    )
    .collect(EvolutionResult.toBestGenotype());

System.out.println(result);
```

# Jenetics: Running it

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```
System.out.println(result);
```

-  A. Isaksen, D. Gopstein, and A. Nealen.  
**Exploring game space using survival analysis.**  
In *FDG*, 2015.
-  D. Perez, S. Lucas, and J. Liu.  
**Lecture slides for ce810.**  
2015-2017.