Genetic Algorithm

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This was my attempt at recreating Costa's work taking a genetic algorithm approach to the League of Legends team composition based on 3 strategies:

- 1. Hard Engage
- 2. Team Fight
- 3. Poke

Due to missining data and not being able to find the source of that data there were certain features that I was not able to code for. Some of those features were:

- A specific Champion's winrate
- A specific Champion's recommended lane position
- A specific Champion's counter
- Ensuring that each team does not have any repeating champions
- Excluding a specific set of champions from the pool selection

Bugs remaining:

For some reason, there is a bug in where if I try to find the fitness value for the Poke strategy, it always returns 0. I don't understand why but it is another thing I plan to edit in the future.

How to change the settings for the program:

Step 1) In the 'Generating the size of the population' section, change the value on for 'sol_per_pop' to the desired size of the population.

Step 2) In the 'Passing the teams to the genetic algorithm' section, change the number of generations and the mutation rate to the desired values.

Step 3) In the 'Saving the results in a .csv file for later use' section, change the name of the .csv file to whatever name you desire to record the fitness value results of the current iteration.

```
In [59]: import numpy as np
   from random import choice
   import pandas as pd
   import random
   import csv
   import matplotlib.pyplot as plt
```

Genetic Algorithm functions

Due to not being able to completely replicate the functions and classes from the Costa paper, I resulted to using another coder's genetic algorithm functions and modifying it as needed for my purposes.

```
In [46]: #pulled the code from:
    # https://github.com/ahmedfgad/GeneticAlgorithmPython/blob/m

#modified function
    #will get passed a 2d array containing row index for the cha
    def cal_pop_fitness(pop,champ_info,strategy):
        # Calculating the fitness value of each solution in the
        # The fitness function calulates the sum of products bet
```

```
fitness = []
    for row in range(len(pop)):
        temp = 0
        for col in range(len(pop[row])):
            if(strategy == "Hard Engage"):
                temp1 = champ_info.iloc[pop[row][col]]['Atta
                temp += temp1
            elif (strategy == "Team Fight"):
                temp1 = champ info.iloc[pop[row][col]]['Atta
                temp += temp1
            elif (strategy == "Poke"):
                temp1 = champ info.iloc[pop[row][col]]['Atta
                temp += temp1
            else:
                print("Invalid Strategy")
        fitness.append(temp)
    return fitness
#added line 39 to line 41
#no change needed here
#fitness = 1d array
def select mating pool(pop, fitness, num parents):
    #make a copy of fitness
    copied fit = []
    for num in range(len(fitness)):
        copied fit.append(fitness[num])
    # Selecting the best individuals in the current generati
    parents = np.empty((num_parents, pop.shape[1]))
    for parent_num in range(num_parents):
        max fitness idx = np.where(copied fit == np.max(copi
        \max \text{ fitness idx} = \max \text{ fitness idx}[0][0]
        parents[parent_num, :] = pop[max_fitness_idx, :]
        return parents
#original function
#no change needed here
def crossover(parents, offspring size):
    offspring = np.empty(offspring size)
    # The point at which crossover takes place between two p
    crossover_point = np.uint8(offspring_size[1]/2)
    #print("Crossover point: ",crossover point)
    for k in range(offspring size[0]):
        # Index of the first parent to mate.
        parent1 idx = k*parents.shape[0]
```

```
# Index of the second parent to mate.
        parent2 idx = (k+1)%parents.shape[0]
        # The new offspring will have its first half of its
        offspring[k, 0:crossover point] = parents[parent1 id
        # The new offspring will have its second half of its
        offspring[k, crossover point:] = parents[parent2 idx
    return offspring
def mutation(offspring crossover, population, mutation chance)
    random chance = int(np.random.uniform(0,11,1))
    # Mutation changes a single gene in each offspring rando
    # to emualate the chance of mutation happening
    if (random_chance <= mutation chance):</pre>
        for idx in range(offspring crossover.shape[0]):
            #getting the number of genes to mutate
            mutation counter = int(np.random.uniform(0,5,1))
            if mutation counter > 0:
                #to mutate the number of genes
                mutate = 0
                while mutate < mutation counter:</pre>
                    #does not account for muation in the sam
                    #the index of the gene to change
                    gene idx = int(np.random.uniform(0,5,1))
                    check = 0
                    random\ value = 0
                    while(check == 0):
                        #print("check = ", check)
                        random value = int(np.random.uniform
                        #print("random value = ",random valu
                        checker = np.argwhere(population ==
                        #print("checker = ", checker)
                         if checker.size == 0:
                             if random value < 152:</pre>
                                 check = 1
                    offspring crossover[idx, gene idx] = ran
                    mutate +=1
    return offspring crossover
```

```
#new function to handle the fitness value
def fitness_value(fitness_info,strategy):
    # Calculating the fitness value of each solution in the
    fitness_val = 0
    if (strategy == "Hard Engage"):
        fitness_val = (fitness_info/2125)*100
elif (strategy == "Team Fight"):
        fitness_val = (fitness_info/405)*100
elif (strategy == "Poke"):
        fitness_val == (fitness_info/3630)*100
else:
        print("Invaled strategy")
return fitness_val
```

Load in the Champion Information

```
In [47]: #getting the champion dataset
   champion = pd.read_csv('Champion_Info_Mod.csv', sep=",")
   champion.head()
```

Out[47]:		Unnamed: 0	ID_Num	Name	Attack Damage	Attack Damage per Level	Attack Range	Attack Speed per Level	Health Points
	0	0	266	Aatrox	60.00	5.00	175	2.500	580.0
	1	1	103	Ahri	53.04	3.00	550	2.000	526.0
	2	2	84	Akali	62.40	3.30	125	3.200	575.0
	3	3	12	Alistar	62.00	3.75	125	2.125	600.0
	4	4	32	Amumu	53.38	3.80	125	2.180	615.0

```
In [48]: # Inputs of the equation.
# can change this as needed if a champion was already select

equation_inputs = [425,425,425,425]

# Number of the weights we are looking to optimize.
# going to be the sum of the needed stats of a given championum_weights = len(equation_inputs)
```

Generating the size of the population

```
In [54]: sol_per_pop = 30
# Defining the population size.

pop_size = (sol_per_pop,num_weights) # The population will h

#Creating the initial population.
new_population = np.zeros(shape=(sol_per_pop,num_weights), d
#print(new_population)
```

Generating the teams

```
In [55]: pop_size_real = sol_per_pop*num_weights
    trial = np.asarray(random.sample(range(0,152),pop_size_real)
    new_population=trial.reshape(sol_per_pop,num_weights)
    #print(new_population)
```

Passing the teams to the genetic algorithm

```
In [56]: records = [["Generation", "Hard Engage", "Team Fight", "Poke"]
    mutation_rate = 7
    num_generations = 1000

#number of parents mating minimum = 2
    num_parents_mating = sol_per_pop -1
    for generation in range(num_generations):
        gather = []
```

```
gather.append(generation+1)
for num in range(3):
    #print("Generation: ", generation+1)
    # Measuring the fitness of each chromosome in the po
    strat = 'No strat'
    if (num == 0):
        strat = "Hard Engage"
        #print(strat)
    elif (num == 1):
        strat = "Team Fight"
        #print(strat)
    elif (num == 2):
        strat = "Poke"
        #print(strat)
    fitness = cal pop fitness(new population, champion, st
    #print(strat, fitness)
    # Selecting the best parents in the population for m
    parents = select mating pool(new population, fitness
    #print("Parents: ")
    #print(parents)
    # Generating next generation using crossover.
    if pop_size[0] == num_parents_mating:
        offspring crossover = crossover(parents, offsprin
    else:
        offspring crossover = crossover(parents, offsprin
    #print("Offspring crossover:")
    #print(offspring crossover)
    # Adding some variations to the offsrping using muta
    offspring mutation = mutation(offspring crossover, ne
    #print("offspring mutation:")
    #print(offspring mutation)
    # Creating the new population based on the parents a
    new population[0:parents.shape[0], :] = parents
    new population[parents.shape[0]:, :] = offspring mut
    #print("new_population:")
    #print(new population)
    # The best result in the current iteration.
    fitness new = cal pop fitness(new population, champio
    fit value = fitness value(np.max(fitness new),strat)
    gather.append(fit value)
    #print(strat, fit value)
    #print("Best result after crossover and mutation (Ha
```

In [57]: #print(records)

```
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```

Saving the results in a .csv file for later use

```
In [58]: with open('P_30_MR_7_G_1000.csv', 'w', newline='') as file:
    writer = csv.writer(file, quoting=csv.QUOTE_NONNUMERIC,
    writer.writerows(records)
```

Displaying the results

Due to my unfamiliarity in collecting all the data in one go, I had to manually go through the code above, change the needed values to mimic the settings that were used to test the Genetic Algorithm from Costa's work and collect that data bit by bit.

Settings:

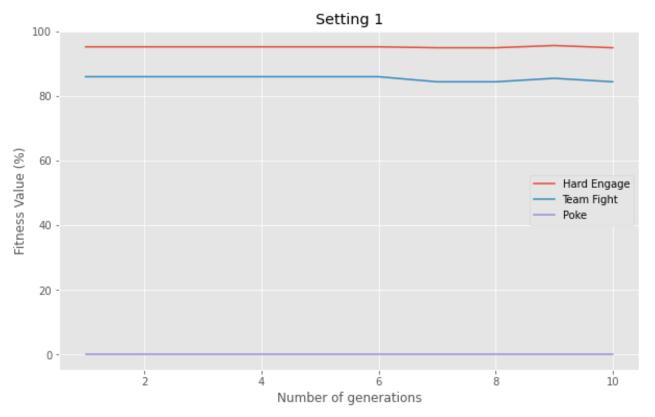
```
Setting 1: Population = 10, Mutation Rate = 0.3,
Generations = 10
Setting 2: Population = 20, Mutation Rate = 0.5,
Generations = 100
Setting 3: Population = 30, Mutation Rate = 0.7,
Generations = 1000
```

The corresponding results are in the labeled .csv files.

Below are the results.

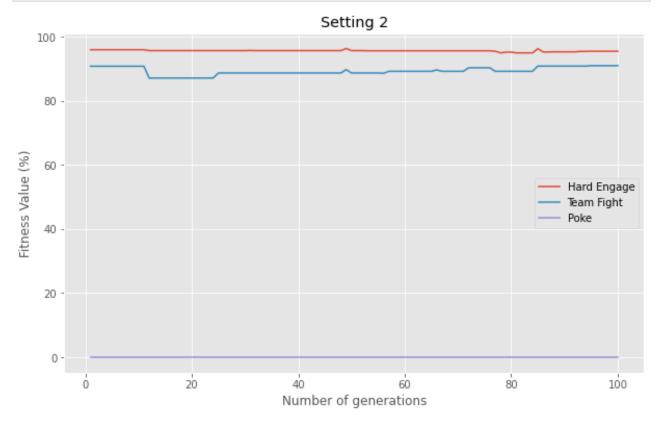
Setting 1 Results

```
results s1 = pd.read csv('P 10 MR 3 G 10.csv', sep=",")
In [60]:
          #results s1.head()
          x axis = results s1["Generation"]
          hard engage = results s1["Hard Engage"]
          #print(hard engage)
          team fight = results s1["Team Fight"]
          poke = results s1["Poke"]
          plt.style.use('ggplot')
          fig = plt.figure(figsize=(10, 6))
          plt.title('Setting 1')
          plt.plot(x axis, hard engage, label='Hard Engage')
          plt.plot(x axis, team fight, label='Team Fight')
          plt.plot(x axis, poke, label='Poke')
          plt.legend()
          plt.xlabel('Number of generations')
          plt.ylabel('Fitness Value (%)')
          plt.show()
```



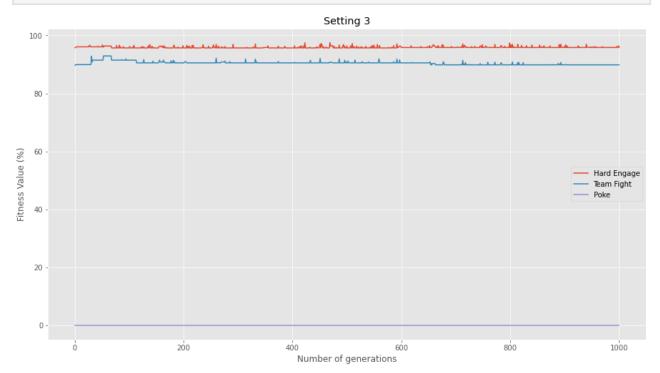
Setting 2 Results

```
results_s2 = pd.read_csv('P_20_MR_5_G_100.csv', sep=",")
In [61]:
          #results s1.head()
          x axis2 = results s2["Generation"]
          hard engage2 = results s2["Hard Engage"]
          #print(hard engage)
          team fight2 = results s2["Team Fight"]
          poke2 = results s2["Poke"]
          plt.style.use('ggplot')
          fig = plt.figure(figsize=(10, 6))
          plt.title('Setting 2')
          plt.plot(x axis2, hard engage2, label='Hard Engage')
          plt.plot(x axis2, team fight2, label='Team Fight')
          plt.plot(x axis2, poke2, label='Poke')
          plt.legend()
          plt.xlabel('Number of generations')
          plt.ylabel('Fitness Value (%)')
          plt.show()
```



Setting 3 Results

```
In [62]:
          results s3 = pd.read csv('P 30 MR 7 G 1000.csv', sep=",")
          #results s1.head()
          x axis3 = results s3["Generation"]
          hard engage3 = results s3["Hard Engage"]
          #print(hard engage)
          team fight3 = results s3["Team Fight"]
          poke3 = results s3["Poke"]
          plt.style.use('ggplot')
          fig = plt.figure(figsize=(15, 8))
          plt.title('Setting 3')
          plt.plot(x axis3, hard engage3, label='Hard Engage')
          plt.plot(x axis3, team fight3, label='Team Fight')
          plt.plot(x axis3, poke3, label='Poke')
          plt.legend()
          plt.xlabel('Number of generations')
          plt.ylabel('Fitness Value (%)')
          plt.show()
```



Future Work

This current form of the genetic algorithm that I had envisioned is far from perfect and still has it's bugs. This is still just another thing to improve on.

A small list of things I pla to improve on in the future I plan to improve a list of things:

- use websites to gather the most up to date win rate of specific champions
- use websites to gather the most up to date champion counters
- coding to ensure that each team does not have any repeat champions
- making it useful for any player from novice to professional

In []: