

## Assignment 2 – Symbolic Regression

Hongbo Zhu     UNI: hz2629

Evolutionary Computation & Design Automation  
(MECS E4510)

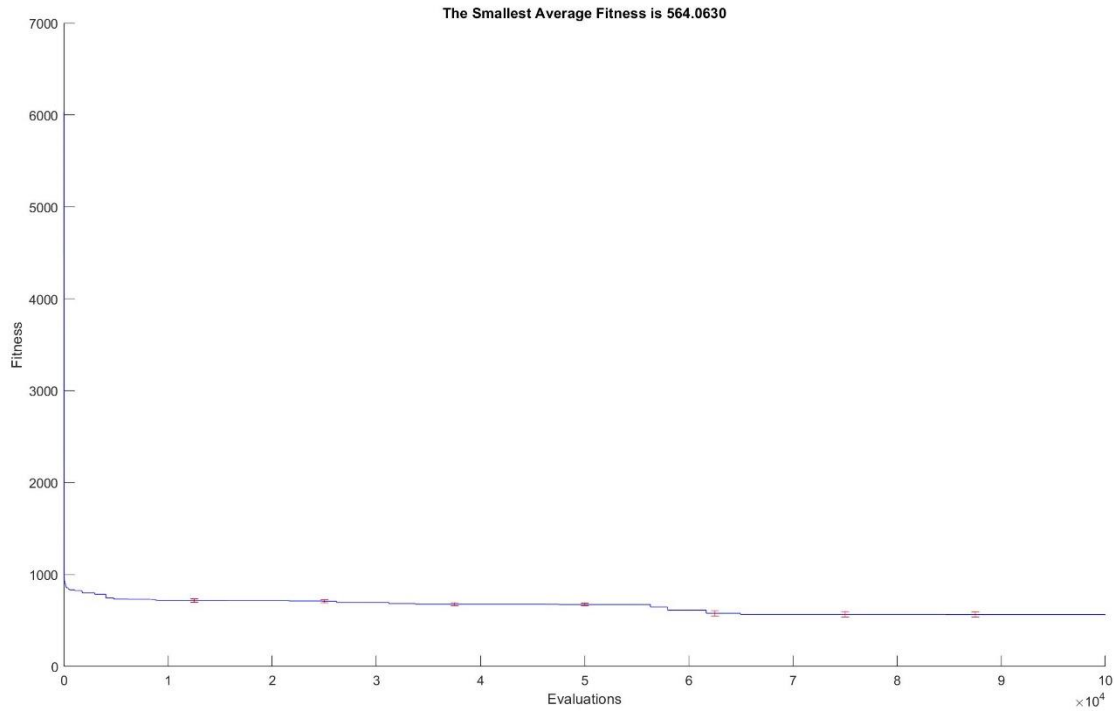
Instructor: Prof. Hod Lipson

Date Submitted: 10/12/2019

Grace Hours Used: 0 h

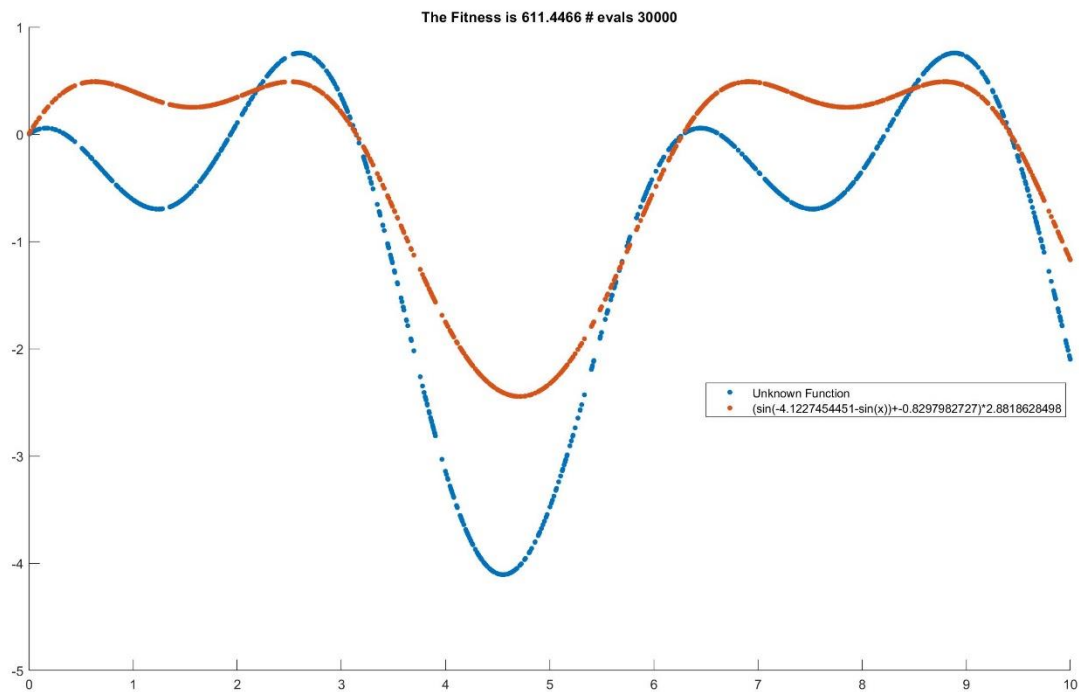
Grace Hours Remaining: 96 h

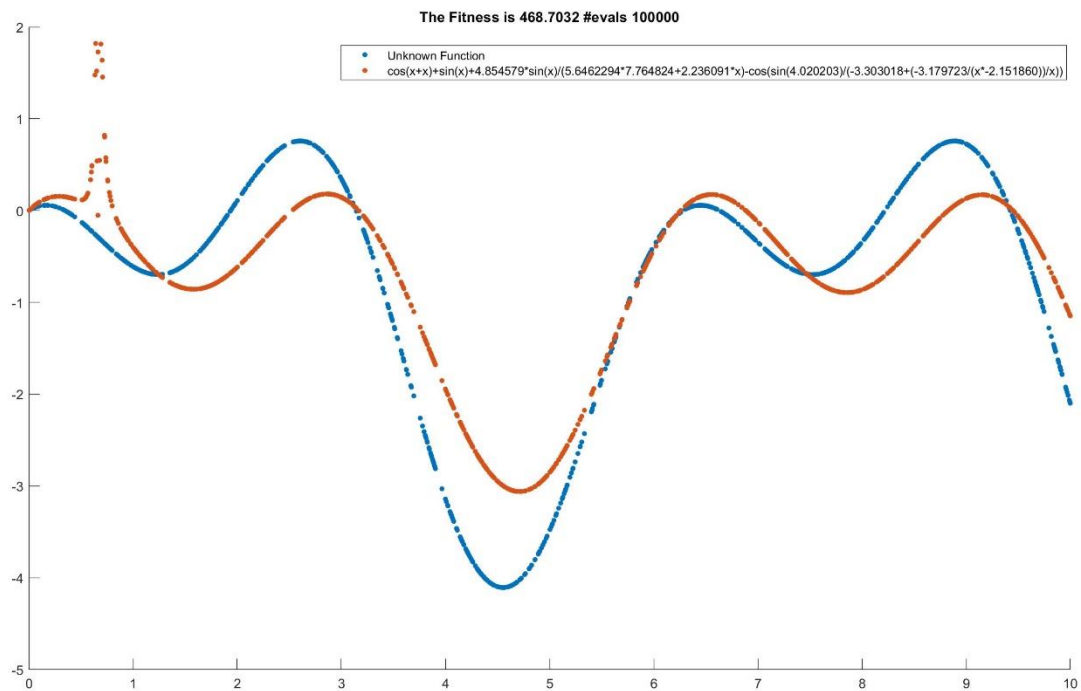
# 1. Learning Curve



After 100000 generations, the average fitness is 564.0630. Fitness is the sum of the difference value between each y coordinate value in data.txt and the outcome corresponding to each x coordinate of the function founded by random search method. The error bars in figure are calculated from 5 different fitness curves.

# 2. Function Figure





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#include <iostream>
#include <fstream>
#include <vector>
#include <chrono>
#include <random>
#include <ctime>
#include <iomanip>
#include <string>
#include <cmath>
#include <cstdio>

using namespace std;

#define POINT_NUM 1000
#define GENERATION 100000

void Read();
void Generate();
string To_string(string gene[],int x);
double Operate();

static string operator_dic[8] = { "+", "-", "*", "/", "sin", "cos", "x", "a" };
static string calculator[4] = { "+", "-", "*", "/" };
static string tri[2] = { "sin", "cos" };
static string cons[2] = { "x", "a" };

double xlist[POINT_NUM] = { 0 };
double ylist[POINT_NUM] = { 0 };
double BestYlist[POINT_NUM] = { 0 };
double fitnesslist[GENERATION] = { 0 };
double constant[100] = { 0 };

static string tree[256];

int main()
{
    double fitness = 10000.0;
    double bestfitness = fitness;
    srand(int(time(0)));

    Read();
    for (int loop = 0; loop < GENERATION; loop++)
    {
        for (int i = 0; i < 100; i++)
        {
            constant[i] = 0.0;
        }
        for (int i = 0; i < 256; i++)
        {
            tree[i] = (string)"0";
        }
        Generate();

        for (int i = 0; i < sizeof(tree); i++)
        {
            if (i < (256/2 - 1) && tree[i] == (string)"/" && tree[2 * i + 1] == (string)"0")
            {
                loop--;
                continue;
            }
            if (i < (256 / 2 - 1) && tree[i] == "*" && (tree[2 * i] == "0" || tree[2 * i + 1] ==
"0"))
            {
                loop--;
                continue;
            }
        }

        fitness = Operate();
        int j = 0;
        for (int i = 255; i > 0; i--)
        {
            if (tree[i] == (string)"a")
            {
                char buffer[20];
                sprintf_s(buffer, "%.10f", constant[j]);
                string str = buffer;
            }
        }
    }
}

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        tree[i] = str;
        j++;
    }
}

string func = To_string(tree, 1);

if (bestfitness >= fitness)
{
    bestfitness = fitness;
    cout << "-----" << endl;
    cout << loop << endl;
    cout << func << endl;
    cout << fitness << endl;
}
fitnesslist[loop] = bestfitness;
}
ofstream outputfitness("fitness.txt"); //import fitness into a txt file

for (int i = 0; i < GENERATION; i++)
    outputfitness << setprecision(9) << fitnesslist[i] << endl;

outputfitness.close();
}

void Read()
{
    int i = 0;
    ifstream input("data.txt");

    double a, b;
    while (input >> a >> b) {
        xlist[i] = a;
        ylist[i] = b;
        i++;
    }
    input.close();
}

void Generate()
{
    bool flag = false;
    tree[1] = operator_dic[rand() % 6];
    for (int i = 1; i < 7; i++)
    {
        for (int j = (int)pow(2, i); j < (int)pow(2, i+1); j++)
        {
            for (int k = 0; k < sizeof(calculator); k++)
            {
                if (tree[int(j / 2.0)] == calculator[k])
                {
                    tree[j] = operator_dic[rand() % 8];
                    flag = true;
                    break;
                }
            }

            if (tree[int(j / 2)] == tri[0] || tree[int(j / 2)] == tri[1])
            {
                if (j % 2 == 0)
                    tree[j] = operator_dic[rand() % 8];
            }
        }
    }

    for (int i = (int)pow(2, 7); i < (int)pow(2, 8); i++)
    {
        if (tree[int(i / 2)] != (string)"0" && tree[int(i / 2)] != (string)"x" && tree[int(i / 2)] !=
(string)"a")
        {
            if (tree[int(i / 2)] == (string)"cos" || tree[int(i / 2)] == (string)"sin")
            {
                if (i % 2 == 0)
                {
                    tree[i] = operator_dic[6 + rand() % 2];
                }
            }
        }
    }
}

```

```

        else
        {
            tree[i] = operator_dic[6 + rand() % 2];
        }
    }
}

string To_string(string gene[], int x)
{
    string function = "\0";
    if ((2 * x >= 255) || (gene[2 * x] == (string)"0"))
        function += gene[x];
    else if (gene[x] == tri[0] || gene[x] == tri[1])
        function = function + gene[x] + (string)"(" + To_string(gene, 2 * x) + (string)");";
    else
        function = function + (string)"(" + To_string(gene, 2 * x) + gene[x] + To_string(gene, 2 * x + 1)
+ (string)");";
    return function;
}

double Operate()
{
    int j = 0;
    for (int i = 0; i < 256; i++)
    {
        if (tree[i] == (string)"a")
        {
            constant[j] = (double)rand() / (double)RAND_MAX * 20.0 - 10.0;
            j++;
        }
    }

    double error = 0.0;
    double fitness[256];
    for (int k = 0; k < POINT_NUM; k++)
    {
        int j = 0;
        for (int i = 0; i < 256; i++)
        {
            fitness[i] = 0.0;
        }

        for (int i = 255; i > 0; i--)
        {
            if (tree[i] == (string)"a")
            {
                fitness[i] = constant[j];
                j++;
            }

            else if (tree[i] == (string)"x")
                fitness[i] = xlist[k];

            else if (tree[i] == (string)"+")
                fitness[i] = fitness[2 * i] + fitness[2 * i + 1];

            else if (tree[i] == (string)"-")
                fitness[i] = fitness[2 * i] - fitness[2 * i + 1];

            else if (tree[i] == (string)"*")
                fitness[i] = fitness[2 * i] * fitness[2 * i + 1];

            else if (tree[i] == (string)"/")
                fitness[i] = fitness[2 * i] / fitness[2 * i + 1];

            else if (tree[i] == (string)"sin")
                fitness[i] = sin(fitness[2 * i]);

            else if (tree[i] == (string)"cos")
                fitness[i] = cos(fitness[2 * i]);
        }
        error += fabs(fitness[i] - ylist[k]);
    }
    return error;
}

```