

ffaANN MLP V0.1

May 20, 2022

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[1]: import math
import numpy as np
import pandas as pd
# import seaborn as sns
# import matplotlib.pyplot as plt

# from sklearn.preprocessing import LabelEncoder
# from sklearn.preprocessing import OneHotEncoder
from sklearn.preprocessing import LabelBinarizer
from sklearn import preprocessing
from scipy.special import expit

from numpy.random import default_rng

from sklearn.metrics import classification_report
from sklearn.metrics import confusion_matrix

import time

from ffaAnn_thread_V_I import *

class MultiLayerPerceptron():
    # ===== Activation Functions ===== #

    # accepts a vector or list and returns a list after performing
    ↪ corresponding function on all elements

    @staticmethod
    def sigmoid(vectorSig):
        """returns 1/(1+exp(-x)), where the output values lies between zero and
        ↪ one"""
        sig = expit(vectorSig)
        return sig
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    @staticmethod
    def binaryStep(x):
        """ It returns '0' if the input is less than zero otherwise it returns 1
        ↪ one """
        return np.heaviside(x, 1)

    @staticmethod
    def linear(x):
        """  $y = f(x)$  It returns the input as it is """
        return x

    @staticmethod
    def tanh(x):
        """ It returns the value  $(1 - \exp(-2x)) / (1 + \exp(-2x))$  and the value
        ↪ returned will be lies in between -1 to 1 """
        return np.tanh(x)

    @staticmethod
    def relu(x): # Rectified Linear Unit
        """ It returns zero if the input is less than zero otherwise it returns
        ↪ the given input """
        x1 = []
        for i in x:
            if i < 0:
                x1.append(0)
            else:
                x1.append(i)

        return x1

    @staticmethod
    def leakyRelu(x):
        """ It returns zero if the input is less than zero otherwise it returns
        ↪ the given input """
        x1 = []
        for i in x:
            if i < 0:
                x1.append((0.01 * i))
            else:
                x1.append(i)

        return x1

    @staticmethod
    def parametricRelu(self, a, x):

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        """ It returns zero if the input is less than zero otherwise it returns
        ↳ the given input """
        x1 = []
        for i in x:
            if i < 0:
                x1.append((a * i))
            else:
                x1.append(i)

        return x1

    @staticmethod
    def softmax(self, x):
        """ Compute softmax values for each sets of scores in x """
        return np.exp(x) / np.sum(np.exp(x), axis=0)

# ===== Activation Functions Part Ends ===== #

# ===== Distance Calculation ===== #

    @staticmethod
    def chebishev(self, cord1, cord2, exponent_h):
        dist = 0.0
        if ((type(cord1) == int and type(cord2) == int) or ((type(cord1) ==
        ↳ float and type(cord2) == float))):
            dist = math.pow((cord1 - cord2), exponent_h)
        else:
            for i, j in zip(cord1, cord2):
                dist += math.pow((i - j), exponent_h)
            dist = math.pow(dist, (1.0 / exponent_h))
        return dist

    @staticmethod
    def minimum_distance(self, cord1, cord2):
        # min(|x1-y1|, |x2-y2|, |x3-y3|, ...)
        dist = float('inf')
        if ((type(cord1) == int and type(cord2) == int) or ((type(cord1) ==
        ↳ float and type(cord2) == float))):
            dist = math.fabs(cord1 - cord2)
        else:
            for i, j in zip(cord1, cord2):
                temp_dist = math.fabs(i - j)
                if (temp_dist < dist):
                    dist = temp_dist
        return dist

    @staticmethod

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def maximum_distance(self, cord1, cord2):
    # max(|x1-y1|, |x2-y2|, |x3-y3|, ...)
    dist = float('-inf')
    if ((type(cord1) == int and type(cord2) == int) or ((type(cord1) ==
→float and type(cord2) == float))):
        dist = math.fabs(cord1 - cord2)
    else:
        for i, j in zip(cord1, cord2):
            temp_dist = math.fabs(i - j)
            if (temp_dist > dist):
                dist = temp_dist
    return dist

@staticmethod
def manhattan(self, cord1, cord2):
    # |x1-y1| + |x2-y2| + |x3-y3| + ...
    dist = 0.0
    if ((type(cord1) == int and type(cord2) == int) or ((type(cord1) ==
→float and type(cord2) == float))):
        dist = math.fabs(cord1 - cord2)
    else:
        for i, j in zip(cord1, cord2):
            dist += math.fabs(i - j)
    return dist

@staticmethod
def eucledian(self, cord1, cord2):
    dist = 0.0
    if ((type(cord1) == int and type(cord2) == int) or ((type(cord1) ==
→float and type(cord2) == float))):
        dist = math.pow((cord1 - cord2), 2)
    else:
        for i, j in zip(cord1, cord2):
            dist += math.pow((i - j), 2)
    return math.pow(dist, 0.5)

# ===== Distance Calculation Ends ===== #

def __init__(self, dimensions=(8, 5), all_weights=(0.1, 0.2),
→fileName="iris"):

    """
    Args:
        dimensions : dimension of the neural network
        all_weights : the optimal weights we get from the bio-algoANN models
    """

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self.allPop_Weights = []
self.allPopl_Chromosomes = []
self.allPop_ReceivedOut = []
self.allPop_ErrorVal = []

self.all_weights = all_weights

self.fitness = []

# ===== Input dataset and corresponding output
→ ===== #

self.fileName = fileName
self.fileName += ".csv"
data = pd.read_csv(self.fileName)

classes = []
output_values_expected = []
input_values = []

# ~~~~ encoding ~~~~#

# labelencoder = LabelEncoder()
# data[data.columns[-1]] = labelencoder.fit_transform(data[data.
→ columns[-1]])

# one hot encoding - for multi-column
# enc = OneHotEncoder(handle_unknown='ignore')
# combinedData = np.vstack((data[data.columns[-2]], data[data.
→ columns[-1]])).T
# print(combinedData)
# y = enc.fit_transform(combinedData).toarray()
# y = OneHotEncoder().fit_transform(combinedData).toarray()

#
y = LabelBinarizer().fit_transform(data[data.columns[-1]])
# print(y)

# ~~~~ encoding ends ~~~~#

for j in range(len(data)):
    output_values_expected.append(y[j])

# print(output_values_expected)

input_values = []
for j in range(len(data)):

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        b = []
        for i in range(1, len(data.columns) - 1):
            b.append(data[data.columns[i]][j])
        input_values.append(b)

    self.X = input_values[:]
    self.Y = output_values_expected[:]

    # input and output
    self.X = input_values[:]
    self.Y = output_values_expected[:]

    self.dimension = dimensions
    # print(self.dimension)

    # ===== Finding Initial Weights ===== #

    self.pop = [] # weights
    reshaped_all_weights = []
    start = 0
    for i in range(len(self.dimension) - 1):
        end = start + self.dimension[i + 1] * self.dimension[i]
        temp_arr = self.all_weights[start:end]
        w = np.reshape(temp_arr[:, (self.dimension[i + 1], self.
↪dimension[i]))
        reshaped_all_weights.append(w)
        start = end
    self.pop.append(reshaped_all_weights)

    self.init_pop = self.all_weights

    # ===== Initial Weights Part Ends ===== #

def Predict(self, chromo):
    # X, Y and pop are used
    self.fitness = []
    total_error = 0
    m_arr = []
    k1 = 0
    for i in range(len(self.dimension) - 1):
        p = self.dimension[i]
        q = self.dimension[i + 1]
        k2 = k1 + p * q
        m_temp = chromo[k1:k2]
        m_arr.append(np.reshape(m_temp, (p, q)))
        k1 = k2

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y_predicted = []
for x, y in zip(self.X, self.Y):

    yo = x

    for mCount in range(len(m_arr)):
        yo = np.dot(yo, m_arr[mCount])
        yo = self.sigmoid(yo)

    # converting to sklearn acceptable form
    max_yo = max(yo)
    for y_vals in range(len(yo)):
        if(yo[y_vals] == max_yo):
            yo[y_vals] = 1
        else:
            yo[y_vals] = 0
    y_predicted.append(yo)
return (y_predicted, self.Y)

def main(self):
    Y_PREDICT, Y_ACTUAL = self.Predict(self.init_pop)
    Y_PREDICT = np.array(Y_PREDICT)
    Y_ACTUAL = np.array(Y_ACTUAL)

    n_classes = 3

    label_binarizer = LabelBinarizer()
    label_binarizer.fit(range(n_classes))
    Y_PREDICT = label_binarizer.inverse_transform(np.array(Y_PREDICT))
    Y_ACTUAL = label_binarizer.inverse_transform(np.array(Y_ACTUAL))

    # find error

    print("\n Actual / Expected", Y_ACTUAL)
    print("\n Predictions", Y_PREDICT)
    print("\n\nConfusion Matrix")
    print(confusion_matrix(Y_ACTUAL, Y_PREDICT))

    print("\n\nClassification Report")
    target_names = ['class 0', 'class 1', 'class 2']
    print(classification_report(Y_ACTUAL, Y_PREDICT,
    ↪target_names=target_names))

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[2]: start_time = time.time()
i = InputData(fileName="iris")
input_val, output_val = i.main()

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end_time = time.time()
print("Time for inputting data : ", end_time - start_time)

print("===== Calling FFA to get best weights =====")

start_time = time.time()
a = ffaAnn(initialPopSize=100, m=10, dimensions = [100,10],
    ↪input_values=input_val, output_values_expected=output_val, iterations = 100)

fit, b, weights, dim = a.main()

end_time = time.time()
print("Time taken : ", end_time - start_time)

print("\n Fitness : ", fit, "\n Best Weights : ", weights, "\n Dimensions : ",
    ↪dim)

import matplotlib.pyplot as plt
x=b[:]
z=[i for i in range(0,100)]
plt.plot(z,x)

plt.title("Firefly Algorithm")
plt.ylabel("Fitness")
plt.xlabel("Iterations")
end_time = time.time()
print("Time Taken : ", end_time - start_time)

```

```

Time for inputting data : 0.01881694793701172
===== Calling FFA to get best weights =====
-----GENERATION 0-----
-----GENERATION 1-----
-----GENERATION 2-----
-----GENERATION 3-----
-----GENERATION 4-----
-----GENERATION 5-----
-----GENERATION 6-----
hi
hi
hi
hi
hi
hi
hi
hihi

```


hi

-----GENERATION 7-----
-----GENERATION 8-----
-----GENERATION 9-----
-----GENERATION 10-----
-----GENERATION 11-----
-----GENERATION 12-----
-----GENERATION 13-----
-----GENERATION 14-----
-----GENERATION 15-----
-----GENERATION 16-----
-----GENERATION 17-----
-----GENERATION 18-----
-----GENERATION 19-----
-----GENERATION 20-----
-----GENERATION 21-----
-----GENERATION 22-----
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-----GENERATION 92-----
-----GENERATION 93-----
-----GENERATION 94-----
-----GENERATION 95-----
-----GENERATION 96-----
-----GENERATION 97-----
-----GENERATION 98-----
-----GENERATION 99-----

Fitness : 119.30006253385986

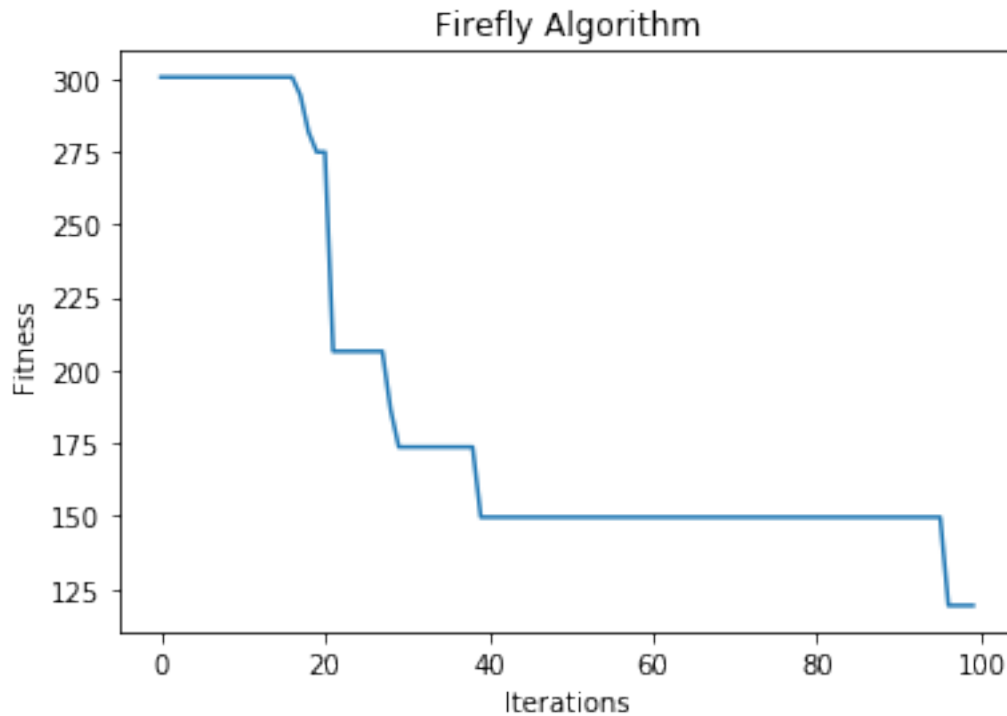
Time taken : 173.24341106414795

Fitness : -119.30006253385986

Best Weights : [0, 0, 0, 4, 0, -9, 10, 16, -17, -9, 0, 0, 18, 16, 0, 4, -2, 0, 19, 20, 4, -15, 10, 0, -1, 4, 0, 0, 0, 2, -1, -18, 0, 0, -2, 6, 7, -29, 0, 17, 4, 2, 14, 5, 0, 4, -22, -4, 5, 0, -32, 2, -5, 7, 0, -25, 14, 4, 3, 20, 0, 4, -2, 13, 13, 2, 16, -12, -5, 2, 0, -2, 0, -7, -2, 6, -14, 4, 7, 0, 0, -9, -6, 0, 0, 4, -10, -18, -12, 1, 0, -8, 0, 2, 7, -29, 0, 27, 4, -11, -6, 4, 2, 0, -2, 0, 2, 0, -6, 0, -14, 0, 0, 6, 2, 0, 0, 14, -9, 6, -11, 0, 5, 5, -4, -10, 11, 2, -7, 0, -5, -2, 1, 11, 10, 0, -18, 14, 5, 9, -15, 2, 0, -2, 7, 22, 0, 21, 2, -5, 32, 4, 0, 6, 2, 8, 6, -9, 0, -11, 4, 0, -4, 0, 10, 4, 2, 9, -20, 0, -14, -9, 6, 0, 2, -6, 7, -4, 5, 1, -2, -22, -14, 0, 4, 2, -7, -4, -2, 0, -12, 9, 4, 7, -10, -24, 14, -5, 0, 4, 5, -5, -2, 12, -10, -2, 4, -9, -16, -9, -14, 0, -5, -2, 4, 17, -12, -4, 7, 8, 0, -24, 10, 12, -11, 7, -20, -13, 0, 0, 0, 13, 9, 0, -4, 0, 3, 0, 8, 0, -2, 4, 13, 9, -5, -28, 0, 11, -4, -9, 5, 0, 10, 2, -4, -8, 2, 0, 2, -5, 2, -16, 0, -18, 5, -43, -2, 1, -3, 0, -7, -16, 15, -24, 18, -3, -2, 0, 20, -5, 2, 0, -5, 11, 0, -2, 10, -12, 0, -11, 10, -17, -4, 2, 7, -11, 6, 0, -17, 0, 5, 3, 19, 2, -3, 7, -8, -6, 0, -11, 2, 0, 0, 0, 5, -12, -6, 5, 0, 0, 11, 12, 0, 22, -2, -13, 0, 0, 2, 0, 4, -2, 20, 0, 1, 0, 12, -15, 0, 4, -8, 0, 18, 10, 2, 0, -5, -19, -11, 6, 9, 0, 2, 32, 20, 17, -9, -19, 3, 0, 10, 0, -2, -8, 0, 2, 4, 6, 10, 12, -7, 2, -7, 0, 6, 20, 7, -11, -18, 0, 5, -2, -6, -7, -28, 0, 4, -5, 11, -2, -11, 0, 0, 4, -2, 8, 5, -14, 0, 29, 7, -4, 0, -12, 0, -14, -11, -4, 2, 12, -8, 0, 10, 0, -8, 2, 2, -12, -9, 4, -9, -10, -5, 2, 0, 0, 5, -18, 11, 7, 5, 0, 28, 11, -19, -5, 18, 0, -6, 0, -5, -3, 0, 5, 8, 16, -2, 4, -14, 2, 4, 7, 6, -28, 0, 0, -2, -22, -6, 0, 2, 0, 0, -15, 6, -11, -2, 31, -8, 0, 17, 2, 0, -20, -14, -29, 5, 0, 7, 5, 7, 12, 9, 0, -6, -4, 5, 2, 2, -4, 5, 5, 20, 2, 15, -8, 0, 0, -8, 0, 0, 4, -13, 2, 0, 7, 12, 6, 8, -13, 8, 0, 0, 11, 0, 0, 3, 10, 16, -6, -25, 8, 9, 4, -11, -2, -9, -6, 19, 2, 0, -20, 5, -17, 0, 3, 11, 10, -16, -3, -9, -11, 0, 0, -4, 18, 2, 9, 4, 0, 0, 9, 2, -4, -11, 5, 13, 18, 12, -7, -2, -29, -8, 2, 18, 0, -4, -20, 7, 0, 0, -5, 9, 0, 4, 0, 2, -4, 0, 19, -23, 5, -6, 2, -11, 29, -20, 12, 0, -17, -11, 22, -5, 10, 9, -8, 7, 15, -11, 0, -2, 0, 11, -2, 0, 2, 0, 18, 7, 4, 10, 6, 0, 0, -3, 2, -9, -10, 0, -13, 0, 0, 2, 16, 19, -2, 18, -4, -11, 2, 4, 14, 2, -8, 9, 2, -10, 6, -6, 0, 0, -22, -11, -18, 0, 22, -2, 0, 7, 2, 4, 11, 19, 1, 24, -4, 5, -2, -10, 0, 10, -18, 8, -5, 12, 5, 11, 5, -19, 10, -7, 0, -4, 4, -8, -33, -9, 0, 2, 14, 0, 0, -17, 8, -2, 5, -13, 0, 4, -8, 0, 8, -2, -5, 10, -5, 4, 0, 5, -13, -13, 3, 0, -10, 16, -15, -4, 7, -18, 0, 2, -2, 0, 1, -4, -10, 0, 7, 0, -17, -11, 3, -14, 7, -3, 6, -15, -4, 0, -5, 7, 0, 14, 0, 11, 0, 4, -17, 8, 0, 0, 6, 0, 20, 0, -6, -23, -6, 15, 21, 0, -15, 0, -2, -9, -23, 9, -3, 8, 8, 0, 0, 2, 0, -3, 0, 8, 0, 2, 5, 0, 12, -5, -4, 0, -15, 0, 0, -31, -8, 4, -6, -13, 0, 2, -6, -27, 0, -2, 0, -12, 15, 0, 6, 0, -22, -9, 15, 5, 0, 4, 35, -2, 0, 0, 3, -2, -18, 5, 7, 0, 17, 0, -5, -2, 0, 4, -7, -16, -14, 9, 8, 0, 0, -15, 4, 15, -8, 0, 0, 2, -19, -13, 0, 6, 0, 17, -4, 16, 0, 2, 2, -5, 0, 0, -2, -18, -13, 0, -2, 6, -2, -4, 6, 2, -11, 24, 0, -5, 4, -1, -19, -18, 19, -3, 7, -5, 13, 21, 0, 0, -5, 7, 6, 12, 20, 0, 16, 1, -9, 0, 19, -3, -2, 1, 4, 0, 21, 0, 7, 9, 0, -16, 0, -5, -15, 0, 0, -6, -34, 0, 5, -7, 4, 15, 7, 0, -18, -10, 11, -10, 12, -18, 17, 34, 0, -2, -2, -18, 0, -12, -2, 13, 32, 38, -5, 0, 0, 6, 8, 10, -4, -20, 2, 17, 0, 2, 21, 2, 5, -14, 0, 0, 6, -20, 0, -17, 10, 5, 0, 2, 2, -7, 0, 10, -3, -2, -2, -18, 10, 0, 0, -9, -2, 5, 8, -4, 2, 5, 0, 9, 5, -6, 23, -22, 22, 0, 0, 5, -4,

-7, -16, -34, 6, -2, 0, 5, -2, -8, -7, 13, -2, 2, -2, 2, 0, -5, -5, -19, -7, -6, -6, -8, 11, -26, 15, 1, -8, 6, -9, 3, 0, 19, 0, 6, -15, -10, 4, -15, -2, -11, 3, -30, 6, 0, -6, 0, 12, 2, -7, -11, -8, 2, 0, 0, 12, 0, -2, 4, 9, 8, 0, 4, 2, 0, -7, 10, -5, -25, -2, 11, -4, 0, 0, -12, -6, -5, -5, -4, 0, 0, 10, 2, -9, -6, -9, 0, -14, 10, -9, 0, 23, -8, 17, -4, -5, -2, -13, 10, -2, -15, 4, -5, 2, 2, -11, 4, 4, -4, -2, 0, -8, -22, -9, 0, 0, -2, 0, 7, 0, -7, -11, -7, -6, 4, 5, 7, -12, 0, 0, 4, -7, 2, -9, -7, 0, 0, 2, 0, 0, -7, -11, 14, 0, -2, -2, 0, 0, -11, 0, -5, -9, 0, 2, 6, 0, 21, 0, 2, 18, -6, 4, -2, 10, -4, 0, 4, 2, -15, 7, -21, 22, 0, 5, 6, 0, 11, -4, 2, 5, -28, -4, 9, -2, 5, 2, 0, 12, 14, 5, 0, -4, 31, -4, 0, 11, -4, -5, 4, 4, 7, 8, 6, -14, 0, -12, -5, -4, 8, -4, 19, 0, -4, 9, 0, -4, -7, 2, 0, -10, 0, 0, 0, -12, -2, 20, 2, 1, 5, 0, -11, -3, 2, 0, 0, 0, -2, 22, 13, 5, -5, 0, -10, -3, 0, 8, 4, -28, 8, 19, -9, -9, -6, -6, 4, -2, -8, -20, -24, -5, 10, 0, 0, 15, -26, 2, 6, -11, -2, 29, 0, 0, 0, -11, 2, 0, -4, -10, 0, 0, 4, 9, 0, -7, 10, 2, 5, 4, 15, 3, -33, -11, 0, 9, 2, -15, 9, -1, 0, -6, -5, 2, -7, -11, 0, -9, 11, 17, -11, -2, -4, 5, 4, 0, 29, 2, -10, 4, -5, 15, 2, 5, 0, 5, 0, 2, 4, 5, -6, 0, 7, 2, -19, 0, -16, 2, 6, -2, 0, 0, 0, 0, 0, -3, 39, 0, -11, 14, -9, 0, 0, -10, -2, 0, 0, 0, 0, 1, -2, 2, 17, -9, 10, 7, -11, 7, -6, 7, 0, 0, -15, 2, 0, -8, 0, 0, -12, 0, 0, 16, 0, -8, 0, -1, 8, 0, 11, 11, 0, -6, 8, -2, -1, 2, 2, -9, 0, 2, -9, 12, -14, -10, 0, -9, 10, 2, 0, 4, 8, 5, -21, 2, 1, 0, -10, -13, 3, -2, 5, 0, 0, -2, 10, -18, 16, -1, -3, 23, 18, -11, -15, 4, 0, 8, 5, -5, -13, 0, 1, -8, -6, 0, 1, 0, -17, 10, 5, 10, 7, -9]

Dimensions : [4, 100, 10, 3]
Time Taken : 173.281170129776




```
[4]: start_time = time.time()
print("Testing")
m = MultiLayerPerceptron(fileName="iris_test", dimensions=dim,
    ↪all_weights=weights)
m.main()

end_time = time.time()
print("Time taken = ", end_time - start_time)
```

Testing

Actual / Expected [0 0 0 0 0 0 0 0 0 0 1 1 1 1 1 1 1 1 1 2 2 2 2 2 2 2 2 2 2]

Predictions [0 1 0 0 0 0 0 0 0 0 1 1 1 1 1 1 1 1 1 2 2 2 2 2 2 2 2 2 2]

Confusion Matrix

```
[[ 9  1  0]
 [ 0 10  0]
 [ 0  0 10]]
```

Classification Report

	precision	recall	f1-score	support
class 0	1.00	0.90	0.95	10
class 1	0.91	1.00	0.95	10
class 2	1.00	1.00	1.00	10
accuracy			0.97	30
macro avg	0.97	0.97	0.97	30
weighted avg	0.97	0.97	0.97	30

Time taken = 0.016193866729736328

[]: