

# Tutorial 3

## Backpropagation

### BT3017

Due date: 12<sup>th</sup> February 2024 (Monday) 2359 hrs

Semester 2, AY23/24, School of Computing, National University of Singapore

**IMPORTANT:**

*For this tutorial, you are supposed to submit your project file to CANVAS.*

*Instruction for submission:*

- *Create a folder using the following naming convention:*  
*StudentNumber\_yourName\_Tut3*
- *Put your .ipynb file in this folder.*
- *Zip your folder. Name your zip file using the following convention:*

*StudentNumber\_yourName\_Tut3.zip*

*For example, if your student number is A1234567B, and your name is Chow Yuen Fatt, for this tutorial, your file name should be A1234567B\_ChowYuenFatt\_Tut3.zip*

- *Submit the zip file in the “Tutorial-3 Submit Here” folder in CANVAS.*

Note: The code and the dataset for this tutorial were downloaded from the following website (renamed to main.py and wheat-seeds.csv):

<https://machinelearningmastery.com/implement-backpropagation-algorithm-scratch-python/>

Study the code and the dataset wheat-seeds.csv, then answer the following questions.

#### Question 1

Read the wheat-seeds.csv file into a dataframe called `df_weed`.

Display the first 5 rows of data records using the pandas function `head()`.  
Note that the file does not contain any column names.

#### Question 2

Add the following column names to the 8 columns of the dataframe `df_weed`:

`'feat1', 'feat2', 'feat3', 'feat4', 'feat5', 'feat6', 'feat7', 'class'`

Display the first 5 rows of data records using the pandas function `head()`.

#### Question 3

Use Pandas to find out the minimum and maximum values of each column.

#### Question 4

There was a scaling done on the data before the machine learning process.

- Write down the formulae used for the scaling.
- State what would be the max and min values after the scaling.

#### Question 5

Study the code main.py that was downloaded from the website.

Comment out the statement.

`normalize_dataset(dataset, minmax)`

Run the code to train the neural network using the dataset wheat-seeds.csv.

Print the scores and mean accuracy as given in the code.

#### Question 6

Repeat Question 3 but include the statement

*normalize\_dataset(dataset, minmax)*

Compare the scores and mean accuracy obtained with the results obtained in Question 3.

#### Question 7

Referring to the function *cross\_validation\_split* :

- c. What does the function do?
- d. Why is it important to do that? (a 1-sentence answer will do).

#### Question 8

What does the function *accuracy\_metric* do?

#### Question 9

Which function in the code performs the non-linear perceptron activation?

Give a scientific name to this function.

#### Question 10

In the function “transfer\_derivative”, explain why the return value is  
output \* (1-output)

#### Question 11

In the function “*backward\_propagate\_error*”, the “error” represents (fill in the denominator):

$$error = \frac{\partial E}{\partial}$$

### Question 12

In the function “*backward\_propagate\_error*”, “*neuron[‘delta’]*” represents (fill in the denominator):

$$error = \frac{\partial E}{\partial}$$

### Question 13

Modify the code to run for 600 epochs instead of 500 epochs in the system (i.e. change the value of `n_epoch`).

Print the total training error (a scalar) for epochs at 100, 200, 300, 400, 500, 600.

### Question 14

Modify the code so that the neural network has two hidden layers. The added hidden layer will be in-between the existing hidden layer and the output layer. Also, the added hidden layer has 4 neurons.