

OASIS ML Group TRAINING 03

◆ Logistic Regression simple practice – Multi-Classification

In this practice, you are asked to use the **whole** “Iris Data Set” and separate data into three varieties. Follow hints below to finish it.

□ Practice :

■ Analysis datasets :

Iris datasets contains three varieties of Iris : 「Setosa」, 「Versicolour」 and 「Virginica」. Each variety has 50 data, which means there're total 150 data in the datasets. Each data contains 4 features : 「Sepal length」, 「Sepal width」, 「Petal length」 and 「Petal width」. You are asked to use **all of them** in this practice.

■ Concept :

Build multiple classifier which can output 0~1, and choose the class corresponded with classifier which has highest value as prediction.

■ One-hot encoding :

- Discuss what's one-hot encoding and why we need it?
- What's difference between one-hot encoding and label encoding?

Both **Scikit-learn** and **Pandas** can help us finish doing one-hot encoding, in this practice, **you shall use Scikit-learn in this practice**.

■ Softmax function :

Use Softmax func. Instead of Sigmoid func.

- What's Softmax function?.
- Discuss why using Softmax function?

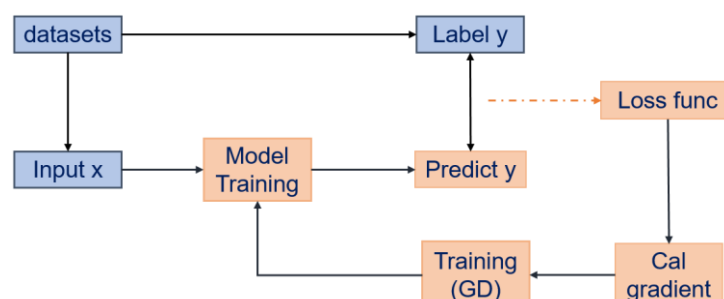
$$\sigma(\vec{z})_i = \frac{e^{z_i}}{\sum_{j=1}^K e^{z_j}}$$

■ Loss function :

- Using Cross entropy function as loss function.

$$H = \frac{-1}{M} \sum_{m=0}^{M-1} (\text{label_y}_m \log(\text{pred_y}_m))$$

■ Training flow structure :



■ Recommend initial parameter :

Epoch : 10000, learning rate : 0.01

- **Hint 01** : Import library you needed, but do not call API.
- **Hint 02** : Get the datasets from sklearn.

```
from sklearn.datasets import load_iris
iris = load_iris()
```

- **Hint 03** : In this time, you need to **choose 3 varieties and 4 features**.
Original data shape : (150, 4), Label data shape : (150,)
- **Hint 04** : Convert label by using one-hot encoding.

Reference : [sklearn.preprocessing.OneHotEncoder](https://scikit-learn.org/stable/modules/generated/sklearn.preprocessing.OneHotEncoder.html)

```
1 # do ONE-HOT ENCODING
2 from sklearn.preprocessing import OneHotEncoder
3
4 ...
5     Code here
6 ...
7 print('Shape of original data : {}'.format(y_org.shape))
8 print('shape after One Hot-encoding : {}'.format(y_all_one.shape))
```

Shape of original data : (150,)
shape after One Hot-encoding : (150, 3)

- **Hint 05** : Separate datasets into training dataset and testing datasets by using `train_test_split` from sklearn. In this time, split data into 50% training data and 50% testing data
- **Hint 06** : Define function you need, for example : softmax, cross entropy.....

```
def softmax(x):
    ### Code here ###
    return f_x

def predict_(x, w):
    return ### ?????? ###

def cross_entropy(yt, yp):
    return ### ?????? ###
```

- **Hint 07** : Calculating the accuracy score by using `accuracy_score` from sklearn.

```
from sklearn.metrics import accuracy_score
```
- **Hint 08** : After training, show the result.
First epoch result: Loss:1.091583, Accur : 0.266667
Final epoch result: Loss:0.137235, Accur : 0.960000
- **Hint 09** : Plot the figure of “iteration vs. loss” and “iteration vs. accuracy”.

■ **Bonus Problem :**

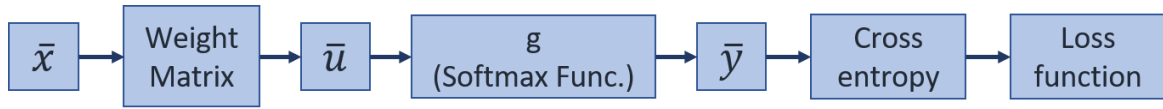


Figure shows the relationship of weight matrix, softmax and loss function.

➤ Please dervie :

When $err = pred_y - label_y$,

$$\frac{\partial L}{\partial W_{ij}} = x_j \cdot err_i$$

or

$$\frac{\partial L}{\partial W_{ij}} = \frac{1}{M} \sum_{m=0}^{M-1} x_{j(m)} \cdot err_{i(m)}$$