Logistic regression (with three categories)

```
1. Import and visualize data set
  In [1]: import pandas as pd
  In [2]: df = pd.read_excel('wine_3.xlsx')
  In [3]: df.head()
  Out[31:
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  In [4]: x=df.drop('Class',axis=1)
  In [5]: v=df['Class']
  In [6]: import numpy as np
  In [7]: np.unique(v)
 Out[7]: array(['Tpye3', 'Type1', 'Type2'], dtype=object)
  In [8]: df.describe()
  Out[8]:
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                         2. Adjust data scaling
  In [9]: from sklearn.preprocessing import StandardScaler
In [10]: scaler = StandardScaler()
In [11]: x = scaler.fit transform(x)
In [12]: pd.DataFrame(x).describe()
Out[12]:
                                           -8.619821e-16 -8.357859e-17
                                                                                                         -8.657245e-16
                                                                                                                                       -1.160121e-16
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3. Split data set to training data and testing data

In [13]: from sklearn.model_selection import train_test_split
In [14]: xtrain, xtest, ytrain, ytest = train_test_split(x,y, test_size=0.3)

4. Build the linear regressing model

In [15]: from sklearn.linear_model import LogisticRegression	In [15]:	from	sklearn.linear	_model	${\tt import}$	LogisticRegression	
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In [16]: logmodel = LogisticRegression()

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In [17]: logmodel.fit(xtrain, ytrain)
Out[17]: LogisticRegression()
         5. Compare between original data and the result of prediction from the model
In [18]: ypred = logmodel.predict(xtest)
         6. Evaluate the model with confusion metrix
In [19]: from sklearn.metrics import classification_report, confusion_matrix
In [20]: print(confusion_matrix(ytest, ypred))
         [[13 0 0]
[ 0 20 0]
[ 0 0 21]]
In [21]: print(classification_report(ytest,ypred))
                                    recall f1-score
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Type2
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                                        1.00
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accuracy

macro avg weighted avg

In []:

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1.00

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