```
#!/usr/bin/env python3
     # -*- coding: utf-8 -*-
 3
 4
     Example 3.6 Multiclass Stochastic Gradient Descent (SDG) for the MINST data set
 5
 6
     Developed for Machine Learning for Mechanical Engineers at the University of
 7
     South Carolina
8
9
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10
11
12
     import IPython as IP
13
     IP.get ipython().magic('reset -sf')
14
15
     import numpy as np
16
     import scipy as sp
17
     import pandas as pd
18
     from scipy import fftpack, signal # have to add
19
     import matplotlib as mpl
20
     import matplotlib.pyplot as plt
21
     import sklearn as sk
22
     import time as time
23
     from sklearn import linear model
24
     from sklearn import pipeline
25
     from sklearn import datasets
26
     from sklearn import multiclass
27
28
    cc = plt.rcParams['axes.prop cycle'].by key()['color']
29
    plt.close('all')
30
31
32
    #%% Load your data
33
34
     # Fetch the MNIST dataset from openml
35
    mnist = sk.datasets.fetch openml('mnist 784',as frame=False)
36
     X = np.asarray(mnist['data'])  # load the data
     Y = np.asarray(mnist['target'],dtype=int) # load the target
37
38
39
     # Split the data set up into a training and testing data set
40
     X \text{ train} = X[0:60000,:]
41
    X \text{ test} = X[60000:,:]
42
     Y \text{ train} = Y[0:60000]
43
     Y \text{ test} = Y[60000:]
44
45
46
     #%% Train a Multiclass Stochastic Gradient Descent classifiers
47
48
     # SK learn has a Multiclass and multilabel module as sk.multiclass. You can use
49
     # this module to do one-vs-the-rest or one-vs-one classification.
50
51
     # here we test a one-vs-rest classifier that uses Stochastic Gradient Descent
52
     tt 1 = time.time()
53
     ovr clf = sk.multiclass.OneVsRestClassifier(sk.linear model.SGDClassifier())
54
     ovr clf.fit(X train, Y train)
55
     print('One-vs-Rest took '+str(time.time()-tt 1 )+' seconds to train and execute')
56
57
     # here we test a one-vs-one classifier that uses Stochastic Gradient Descent
58
    tt 1 = time.time()
59
     ovo clf = sk.multiclass.OneVsOneClassifier(sk.linear model.SGDClassifier())
60
     ovo clf.fit(X train, Y train)
     print('One-vs-one took '+str(time.time()-tt 1 )+' seconds to train and execute')
61
62
63
     # Moreover, Scikit-Learn detects when you try to use a binary classification algorithm
64
     # a multiclass classification task, and it automatically runs OvA (except for SVM
     classifiers for which it uses OvO).
     tt 1 = time.time()
6.5
```

```
multi_sgd_clf = sk.linear_model.SGDClassifier()
multi_sgd_clf.fit(X_train, Y_train) # y_train, not y_train_5
print('SK learns automated selection (OvA) took '+str(time.time()-tt_1 )+' seconds to train and execute')
```