

```
In [51]: 1 import pandas as pd
2 import numpy as np
3 from math import sqrt
4 import time
5
6 import numba
7 from numba import int32, float64
8 from numba.experimental import jitclass
9
10 from sklearn.model_selection import train_test_split
11 from sklearn.datasets import load_digits
12 from sklearn.metrics import accuracy_score
13
14 import matplotlib.pyplot as plt
15 ##https://stackoverflow.com/questions/21154643/python-line-profiler-installation
16 %load_ext line_profiler
```

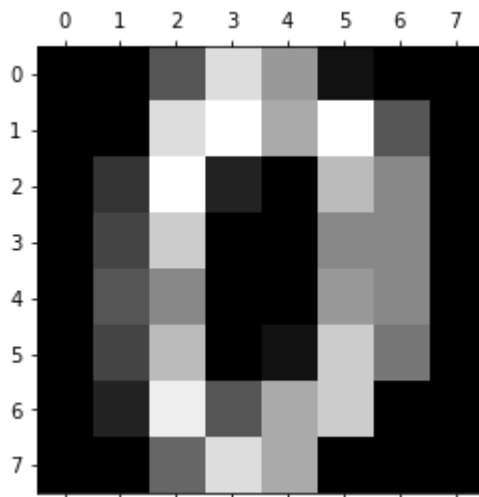
The line_profiler extension is already loaded. To reload it, use:
 %reload_ext line_profiler

```
In [52]: 1 digits = load_digits()
2 print(digits.data.shape)
```

(1797, 64)

```
In [53]: 1 #image representatio of the data
2 plt.gray()
3 plt.matshow(digits.images[0])
4 plt.show()
```

<Figure size 432x288 with 0 Axes>



```
In [54]: 1 X = digits.data
2 y = digits.target
3
4 X_train, X_test, y_train, y_test = train_test_split(X, y, test_size=0.25, ra
```

```

In [55]: 1 @numba.jit(nopython=True)
2 def euc_dist(x1, x2):
3     # return np.sqrt(np.sum((x1-x2)**2
4     dist = np.linalg.norm(x1-x2)
5     return dist
6
7 @numba.jit(nopython=True)
8 def predict(X_train, y_train, test, K):
9     dist = np.zeros((X_train.shape[0], 1))
10
11     for i in np.arange(X_train.shape[0]):
12         dist[i] = euc_dist(X_train[i], test)
13     # dist = np.array([euc_dist(test, x_t) for x_t in X_train])
14
15     X_train = np.column_stack((X_train, y_train))
16
17     X_train = np.column_stack((X_train, dist))
18
19     X_train = X_train[X_train[:,3].argsort()]
20     neighbor_classes = X_train[:, 2][:K]
21     classes = {}
22     for item in neighbor_classes:
23         if item in classes:
24             classes[item] = classes.get(item) + 1
25         else:
26             classes[item] = 1
27     counter_sorted = sorted(classes)
28     return counter_sorted[0]
29
30 def predict_numba(X_train, X_test, y_train, K):
31     predictions = np.zeros(X_test.shape[0])
32     for i in np.arange(X_test.shape[0]):
33         predictions[i] = predict(X_train, y_train, X_test[i], K)
34     return predictions

```

```

In [56]: 1 k = 3
2 X_train, X_test, y_train = X_train.astype('float64'), X_test.astype('float64')
3 start = time.time()
4 pred = predict_numba(X_train, X_test, y_train, k)
5 acc = accuracy_score(y_test, pred)
6 end = time.time()
7 print(f"Time Taken: {end-start} sec")
8 print("K = "+str(k)+"; Accuracy: "+str(acc))

```

Time Taken: 16.1155002117157 sec
K = 3; Accuracy: 0.11333333333333333

```

In [57]: 1 %timeit -n 5 predict_numba(X_train, X_test, y_train, k)

```

922 ms ± 88.8 ms per loop (mean ± std. dev. of 7 runs, 5 loops each)

```

In [58]: 1 %lprun -f predict_numba predict_numba(X_train, X_test, y_train, k)

```

Logistic Regression

In [65]:

```

1  alpha = 1e-2
2  max_iter = 1000
3
4  @numba.jit(nopython=True)
5  def _sigmoid(x):
6      """Sigmoid function"""
7
8      return 1.0 / (1.0 + np.exp(-x))
9
10 @numba.jit(nopython=True)
11 def predict(x_bar, params):
12     """predict the probability of a class"""
13
14     return _sigmoid(np.dot(params, x_bar))
15
16 @numba.jit(nopython=True)
17 def _compute_cost(input_var, output_var, params):
18     """Compute the log likelihood cost"""
19
20     cost = 0
21     for x, y in zip(input_var, output_var):
22         x_bar = np.array(np.insert(x, 0, 1))
23         y_hat = self.predict(x_bar, params)
24
25         y_binary = 1.0 if y == class_of_interest else 0.0
26         cost += y_binary * np.log(y_hat) + (1.0 - y_binary) * np.log(1 - y_h
27
28     return cost
29
30 def train(input_var, label, initial_params, print_iter = 5000):
31     """Train the model using batch gradient ascent"""
32
33     iteration = 1
34     while iteration < max_iter:
35         if iteration % print_iter == 0:
36             print(f'iteration: {iteration}')
37             print(f'cost: {_compute_cost(input_var, label, initial_params)}')
38             print('-----')
39
40         for i, xy in enumerate(zip(input_var, label)):
41             x_bar = np.array(np.insert(xy[0], 0, 1))
42             y_hat = predict(x_bar, initial_params)
43
44             y_binary = 1.0 if xy[1] == class_of_interest else 0.0
45             gradient = (y_binary - y_hat) * x_bar
46             initial_params += alpha * gradient
47
48         iteration += 1
49
50     return initial_params
51
52 def test(input_test, label_test, trained_params):
53     """Test the accuracy of the model using test data"""
54     total_classifications = 0
55     correct_classifications = 0
56

```

```

57     for x,y in zip(input_test, label_test):
58         total_classifications += 1
59         x_bar = np.array(np.insert(x, 0, 1))
60         y_hat = predict(x_bar, trained_params)
61
62         y_binary = 1.0 if y == class_of_interest else 0.0
63
64         if y_hat >= 0.5 and y_binary == 1:
65             # correct classification of class_of_interest
66             correct_classifications += 1
67
68         if y_hat < 0.5 and y_binary != 1:
69             # correct classification of an other class
70             correct_classifications += 1
71
72     accuracy = correct_classifications / total_classifications
73
74     return accuracy
75

```

```
In [67]: 1 digits_train, digits_test, digits_label_train, digits_label_test = train_test
```

```
In [61]: 1 start = time.time()
2 initial_params = np.zeros(len(digits.data[0]) + 1)
3 for clas in range(10):
4     class_of_interest = clas
5     if clas == 0:
6         trained_params = initial_params
7     trained_params = train(digits_train / 16.0, digits_label_train, trained_
8 digits_accuracy = test(digits_test / 16.0, digits_label_test, trained_params)
9 end = time.time()
10
11 print(f'Accuracy of prediciting in test set: {digits_accuracy}')
12 print(f'Total time taken: {end- start}sec')

```

Accuracy of prediciting in test set: 0.9888888888888889

Total time taken: 865.3413364887238sec

```
In [70]: 1 %timeit -n 1 train(digits_train / 16.0, digits_label_train, initial_params,
```

1min 27s ± 3.66 s per loop (mean ± std. dev. of 7 runs, 1 loop each)

```
In [71]: 1 %lprun -f train train(digits_train / 16.0, digits_label_train, initial_param
```

```
In [ ]: 1
```