

08

'22

June

Week 24 Day (159-206)

Wednesday

JUNE 2022

MON	TUE	WED	THU	FRI	SAT	SUN	MON	TUE	WED	THU	FRI	SAT	SUN
1	2	3	4	5	6	7	8	9	10	11	12		
13	14	15	16	17	18	19	20	21	22	23	24	25	26
27	28	29	30										

09.00

## SUPPORT VECTOR MACHINE (SVM)

- FOR CLASSIFICATION, WE HAVE SEEN LOGISTIC REGRESSION
- 10.00      LDA, QDA and DECISION TREES.
- SUPPORT VECTOR MACHINE (SVM) IS ANOTHER ALGORITHM
- 11.00      FOR CLASSIFICATION
- MAIN ADVANTAGE - THEY CAN ACCOMODATE NON-LINEAR
- 12.00      BOUNDARIES.

13.00

### - MAXIMUM MARGIN CLASSIFIER -

14.00

- MAXIMAL MARGINAL CLASSIFIER IS BASIC ALGORITHM FROM WHICH SVM EXTENDS.
- IT RELIES ON SEPARATING CLASSES USING HYPERPLANE

15.00

### HYPERPLANE —

16.00

- IN A p-DIMENSIONAL SPACE, A HYPERPLANE IS A FLAT AFFINE SUBSPACE OF DIMENSION p-1

17.00

- IN A 2D SPACE, THE HYPERPLANE WILL BE A LINE
- IN A 3D SPACE, THE HYPERPLANE WILL BE FLAT PLANE

18.00

### HYPERPLANE —

$$\beta_0 + \beta_1 x_1 + \beta_2 x_2 + \dots + \beta_p x_p = 0$$



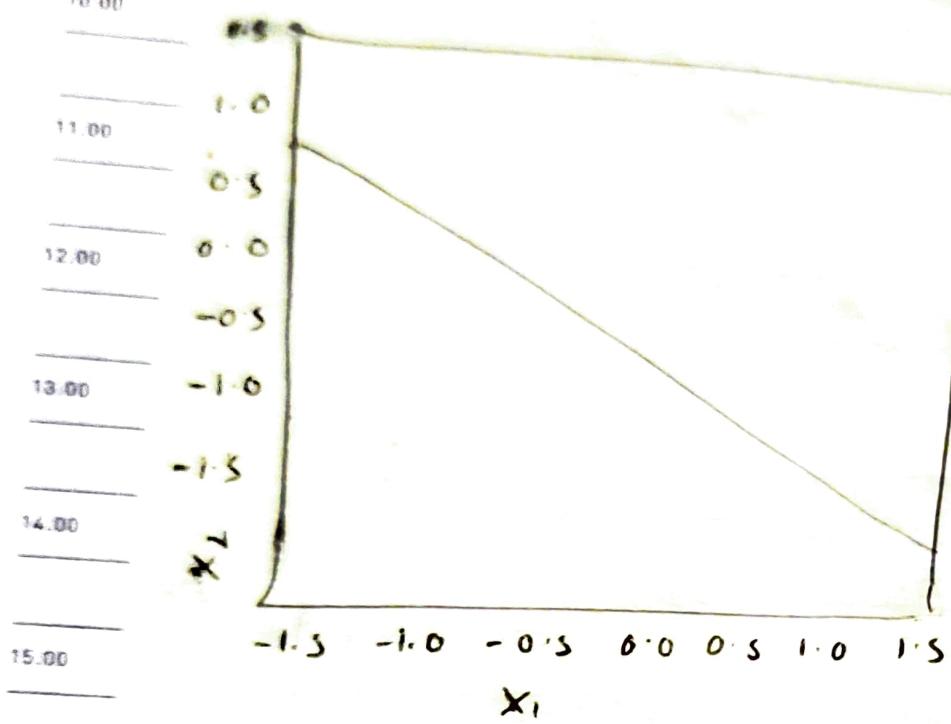
7	8	9	10	MON	TUE	WED	THU	FRI	SAT	SUN
11	12	13	14	15	16	17	18	19	20	21
25	26	27	28	29	30	31				

June  
Thursday

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09:00 — HYPERPLANE IN 2D —



16:00 MAXIMAL MARGIN CLASSIFIER

- IF DATA CAN BE SEPARATED PERFECTLY, THERE IS AN INFINITE NUMBER OF HYPERPLANES
- USE MARGINAL HYPERPLANE OR OPTIMAL SEPARATING HYPERPLANE.

→ TODO SO : WE CALCULATE THE PERPENDICULAR DISTANCE BETWEEN EACH TRAINING OBSERVATION AND THE HYPERPLANE : MARGIN

- THE OPTIMAL SEPARATING HYPERPLANE IS THE ONE WITH LARGEST MARGIN

10

'22

June

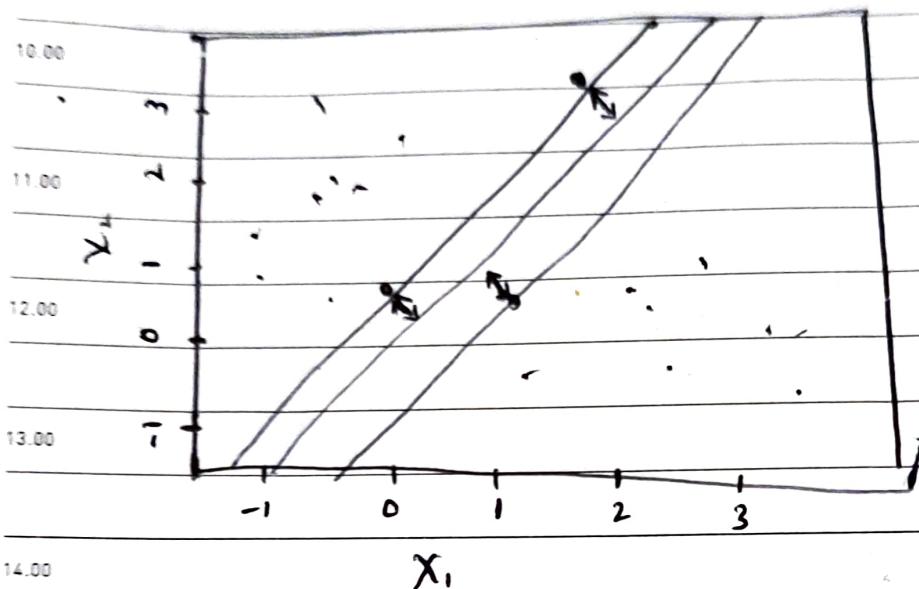
Week 24 Day 1261-2040

Friday

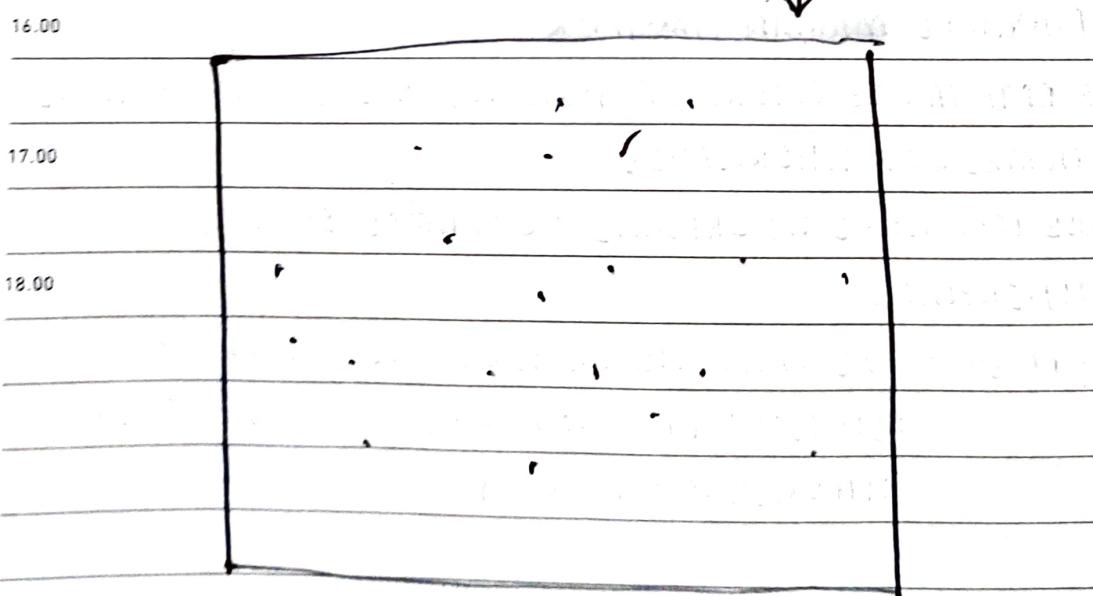
JUNE 2022

MON	TUE	WED	THU	FRI	SAT	SUN	MON	TUE	WED	THU	FRI	SAT	SUN
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## 09.00 - MAXIMAL MARGIN CLASSIFIER -



15.00 BUT WHAT IF THERE IS NO CLEAR SEPARATION  
BETWEEN THE CLASSES (POINTS)



THAT'S WHEN WE REQUIRE SVM

JULY 2022

MON	TUE	WED	THU	FRI	SAT	SUN	MON	TUE	WED	THU	FRI	SAT	SUN
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Saturday

Week 24 Day (162-203)

## 09.00 SUPPORT VECTOR MACHINE (SVM)

- SVM IS EXTENSION OF MAXIMAL MARGIN CLASSIFIER.

10.00 - IT USES KERNELS TO ENLARGE THE FEATURE SPACE AND ACCOMMODATES FOR NON-LINEAR BOUNDARIES BETWEEN CLASSES.

## 12.00 KERNEL

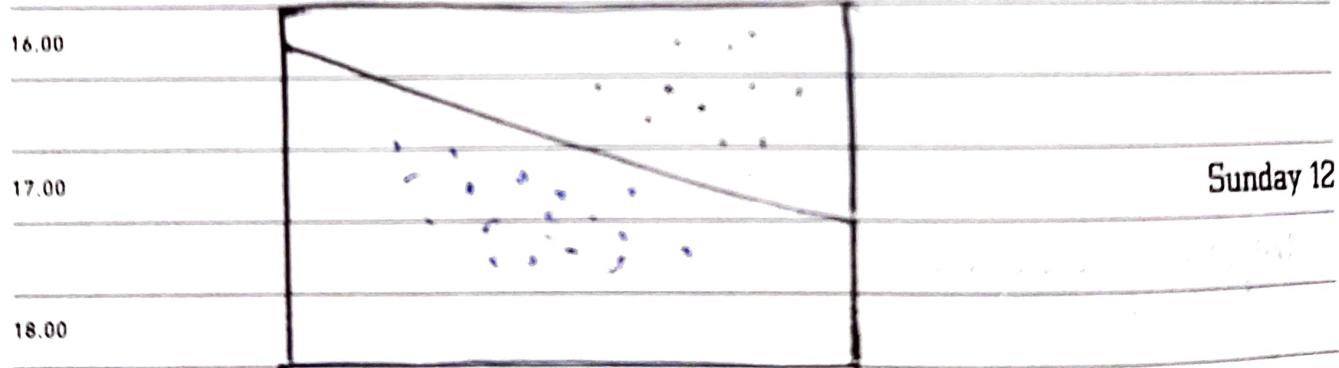
- A KERNEL IS FUNCTION THAT QUALIFIES THE SIMILARITY OF TWO OBSERVATIONS.

- THE KERNEL CAN BE OF ANY DEGREE

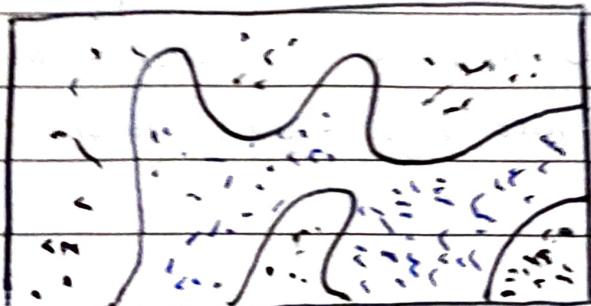
14.00 - A DEGREE GREATER THAN 1 ADDS MORE FLEXIBILITY TO THE BOUNDARY

15.00

## SVM



Sunday 12



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June

Monday

Week 25 Day (184-20)

JUNE 2022

SUN	MON	TUE	WED	THU	FRI	SAT	SUN	MON	TUE	WED	THU	FRI	SAT	SUN
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27	28	29	30											

09.00

HANDS ON EXPERIENCE IN PYTHON (SVM)

10.00

## SUPPORT VECTOR MACHINE (SVM) # CODE DANIEL

11.00

import numpy as np

import pandas as pd

import matplotlib.pyplot as plt

%matplotlib inline

import matplotlib.cm as cm

from scipy.io import loadmat

12.00

13.00

14.00

importing libraries

15.00

scipy.io loadmat - a function in the scipy library for reading MATLAB files (with extension .mat) and converting them into Python data structures.



JULY 2022

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18 19 20 21 22 23 24  
25 26 27 28 29 30 31

JUNE

'22

Tuesday

14

Week 26 Day 146/200

09:00 def plot\_data (X, y, xlabel, ylabel,  
pos\_label, neg\_label, x\_min, x\_max,  
y\_min, y\_max, axes = None):  
10:00 plt.rcParams ['figure.figsize'] = (20, 14)  
11:00 pos = y [:, 0] == 1  
12:00 neg = y [:, 0] == 0  
12:00 if axes == None:  
13:00 axes = plt. gca ()  
14:00 axes.scatter (X [pos] [:, 0], X [pos] [:, 1],  
marker = 'o', c = '#003f5c', s = 50,  
15:00 linewidth = 2, label = pos\_label )

16:00 axes.scatter (X [neg] [:, 0], X [neg] [:, 1],  
marker = 'o', c = '#ffaa60', s = 50,  
17:00 linewidth = 2, label = neg\_label )  
18:00 axes.set\_xlim ([x\_min, x\_max])  
18:00 axes.set\_ylim ([y\_min, y\_max])  
18:00 axes.set\_xlabel (xlabel, fontsize = 12)  
18:00 axes.set\_ylabel (ylabel, fontsize = 12)  
18:00 axes.legend (bbox\_to\_anchor = (1, 1),  
fancybox = True)



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June

Week 25 Day (166 199)

Wednesday

SUN	MON	TUE	WED	THU	FRI	SAT	SUN	MON
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27	28	29	30					

09.00

`X` - a two dimensional numpy array of shape  $(m, 2)$  containing the coordinates of the data points to be plotted.

10.00

`y` - a one dimensional numpy array of shape  $(m)$  containing the labels of data point (either 0 or 1)

11.00

`xlabel` - string specifying the label for the x-axis of the plot.

12.00

`ylabel` - string specifying the label for y-axis of plot

13.00

`pos_label` - string specifying the label for the positive class ( $y=1$ )

`neg_label` - string specifying the label for the negative class ( $y=0$ )

14.00

`xmin` - float specifying the minimum value of x-axis

`xmax` - float specifying the maximum value of x-axis

15.00

`ymin` & `ymax` - same as `X`

`axes` - optional parameter specifying matplotlib axes about object which create the plot.

16.00

The function first sets the size of plot using `plt.rcParams['figure.figsize']`. It then split the data into array into two array based on their labels (pos and neg).

17.00

It creates scatter plot for each class using `plt.scatter` with different colors and markers. The `c` parameter specifies the color of marker, `s` specifies the size and `linewidth` specifies width of marker edge. The function then sets the `xlim` and `ylim` of axis using `axes.set_xlim`, `axes.set_ylim`, `axes.set_xlabel` & `axes.set_ylabel`.



`set_ylabel` - add legend, `bbox` - specifies location, `fancybox` - add rounded box

JULY 2022

MON	TUE	WED	THU	FRI	SAT	SUN	MON	TUE	WED	THU	FRI	SAT	SUN
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June

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Thursday

16

Week 25 Day 167 198

09:00

## SVM with Small Regularization —

10:00

```
data = loadmat('datapath-1')
X = data['X']
y = data['y']
plot_data = (X, y, 'X', 'y',
              'positive', 'negative', 0, 4.2, 0, 5)
```

11:00

plot-data function creates scatter plot of data points in X with their corresponding labels in y.

14:00

```
from sklearn import svm
# use C=1 regularization parameter
clf = svm.SVC(kernel='linear', C=1.0,
               decision_function_shape='ovr')
clf.fit(X, y, ravel())
# plot the data as well as boundary
plot_data(X, y, 'X', 'y', 'positive', 'negative',
          0, 4.2, 0, 5)
# plot hyperplane
X_1, X_2 = np.meshgrid(np.arange(-1, 5, 0.01),
                      (0.0, 5.0, 0.01), np.arange(0.0, 5.0, 0.01))
z = clf.predict(np.c_[X_1.ravel(), X_2.ravel()])
z = z.reshape(X_1.shape)
plt.contour(X_1, X_2, z, [0.5], colors='b')
```

datapath-1 is file path of the MATLAB file. code loads using scipy.io.loadmat and stores them in numpy array X

17

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Friday

— 25 Day (188-207)

JUNE 2022

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## 09:00 # SVM with Large Regularization

```

10:00 # Use C=100 regularization parameter
clf = svm.SVC(kernel='linear', C=100,
               decision_function_shape='ovr')

11:00 # Plot Data as well as boundary
plot_data(X, y, 'X', 'y', 'positive', 'negative',
          0, 4, 2, 0, 5)

12:00 # Plot hyperplane
X_1, X_2 = np.meshgrid(np.arange(0.0, 5.0,
                                 0.01), np.arange(0.0, 5.0, 0.01))

13:00 z = clf.predict(np.c_[X_1.ravel(), X_2.ravel()])

14:00 z = z.reshape(X_1.shape)

15:00 plt.contour(X_1, X_2, z, [0.5], colors='b')

```

16:00

LINEAR SVM using scikit learn library `svm.SVC` class with the 'linear' kernel and  $C=1.0$  regularization parameter.

After training classifier, you are plotting data using `plot-data` function with  $X$  and  $y$  as inputs along with other parameters to specify the plot details.

To plot the decision boundary or hyperplane, create meshgrid  $X_1$  and  $X_2$  coordinate using `np.meshgrid`. The predicting class labels for each point in the meshgrid using trained classifier `clf.predict(np.c_[X_1.ravel(), X_2.ravel()])`.

predicted Labels are reshaped to the same shape as meshgrid and then plot using `plt.contour` with contour level set to 0.5 (i.e decision boundary).

Color is b (blue).

JULY 2022

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June

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Saturday

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Week 25 Day 1 (69-196)

09.00

## SVM With Non Linear Boundary

10.00

```

data2 = loadmat('datapath-2')
X_2 = data2['X']
y_2 = data2['Y']
plot_data(X_2, y_2, 'X',
           'Y', 'positive', 'negative', 0,
           1.0, 0.38, 1)

```

11.00

12.00

13.00

14.00

15.00

16.00

It seems like you are loading data from a .mat using Scipy library loadmat function and storing the data in X\_2 and y\_2 variables.

After loading, call plot-data function with X\_2 and y\_2 as input along with other parameters to specify the plot details such as axis labels and color scheme.

sigma = 0.1

gamma = 1/(2 \* sigma\*\*2)

Sunday 19

clfq = svm.SVC(Kernel='rbf', gamma=gamma,

C=1.0, decision\_function\_shape='ovr')

clfq.fit(X\_2, y\_2.ravel())

plot\_data(X\_2, y\_2, 'X', 'Y', 'positive',
 'negative', 0, 1.0, 0.38, 1)

X\_1, X\_2 = np.meshgrid(np.arange(0.0,
 1.0, 0.003), np.arange(0.38, 1.0, 0.003))

z = clfq.predict(np.c\_[X\_1.ravel(), X\_2.

ravel()])

z = z.reshape(X\_1.shape)

plt.contour(X\_1, X\_2, z, colors='b')

20

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June

Week 26 Day (171-196)

09.00

Monday

JUNE 2022

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8	9	10	11	12	13	14
15	16	17	18	19	20	21
22	23	24	25	26	27	28

## SUM With Cross Validation

10.00

`data_3 = loadmat('dataph-3')``X_3 = data_3['X']`

11.00

`y_3 = data_3['y']`

12.00

`Plot-data(X_3, y_3, 'X',  
'Y', 'positive', 'negative',  
[0.55, 0.35, -0.8, 0.6])`

13.00

`Sigma = [0.01, 0.03, 0.1, 0.3, 1, 3, 10, 30]`

14

`C = [0.01, 0.03, 0.1, 0.3, 1, 3, 10, 30]`

15

`errors = list()`

16

`Sigma-C = list()`

17

`for each in Sigma:`

18

`for each-C in C:`

19

`clf = svm.SVC(Kernel='rbf',`

20

`gamma = 1 / (2 * each ** 2), C=each-C,`

21

`decision-function-shape='ovr')`

22

`clf.fit(X_3, y_3.ravel())`

23

`errors.append(clf.score(data_3['Xval'],`

24

`data_3['Yval'].ravel()))`

25

`Sigma-C.append((each, each-C))``index = np.argmax(errors)``Sigma-Max, C-Max = Sigma-C``[index]``point(f"the optimal value is  
{Sigma-Max}")``point(f"the optimal value of C is:  
{C-Max}")`

JULY 2022

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09:00

Output -

The optimal value of sigma is : 0.1

10:00

The optimal value of c is : 1

11:00

Next Code -

12:00

$$\text{Sigma} = 0.1$$

13:00

$$\text{gamma} = 1 / (2 * \text{sigma} ** 2)$$

14:00

optimal-clf = svm.SVC (Kernel='rbf', gamma=gamma, C=1.0,  
decision-function-shape='ovr')

15:00

optimal-clf.fit(X-3, y-3.ravel())

16:00

plot-data (X-3, y-3, 'x', 'y', 'positive', 'negative', -0.55, 0.35,  
-0.8, 0.6)

17:00

X-1, X-2 = np.meshgrid(np.arange(-0.6, 0.4, 0.004), np.arange  
(-0.8, 0.6, 0.004))

z = optimal-clf.predict(np.c\_[X-1.ravel(), X-2.ravel()])

z = z.reshape(X-1.shape)

plt.contour(X-1, X-2, z, [0.5], colors='b')

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June

Week 26 Day (173-182)

Wednesday

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	27	28	29	30									26

09.00

## SPAM CLASSIFICATION

10.00

`spam-train = loadmat('datapath-train')``spam-test = loadmat('datapath-test')`

11.00

`C = 0.1``X-train = spam-train['X']`

12.00

`y-train = spam-train['y']`

13.00

`X-test = spam-test['Xtest']``y-test = spam-test['ytest']`

14.00

`clf-spam = svm.SVC(kernel='linear', C=C, decision_function_`

15.00

`shape='ovr')``clf-spam.fit(X-train, y-train.ravel())`

16.00

`train-acc = clf-spam.score(spam-train['X'], spam-train['y']).`

17.00

`ravel()``test-acc = clf-spam.score(X-test, y-test.ravel())`

18.00

`print(f"Training accuracy = {train-acc * 100}%")``print(f"Test accuracy = {test-acc * 100}%")`