

```

1 # Important note: you do not have to modify this file for your homework.
2
3 import numpy as np
4 np.random.seed(123)
5
6
7 def train_and_predict_svm(train_matrix, train_labels, test_matrix, radius):
8     """Train an SVM model and predict the resulting labels on a test set.
9
10    Args:
11    train_matrix: A numpy array containing the word counts for the train set
12    train_labels: A numpy array containing the spam or not spam labels for the train set
13    test_matrix: A numpy array containing the word counts for the test set
14    radius: The RBF kernel radius to use for the SVM
15
16    Return:
17    The predicted labels for each message
18    """
19    model = svm_train(train_matrix, train_labels, radius)
20    return svm_predict(model, test_matrix, radius)
21
22
23 def svm_train(matrix, category, radius):
24     state = {}
25     M, N = matrix.shape
26     Y = 2 * category - 1
27     matrix = 1. * (matrix > 0)
28     squared = np.sum(matrix * matrix, axis=1)
29     gram = matrix.dot(matrix.T)
30     K = np.exp(-(squared.reshape((1, -1)) + squared.reshape((-1, 1)) - 2 * gram) / (2 * (radius ** 2)))
31
32     alpha = np.zeros(M)
33     alpha_avg = np.zeros(M)
34     L = 1. / (64 * M)
35     outer_loops = 10
36
37     alpha_avg = 0
38     ii = 0
39     while ii < outer_loops * M:
40         i = int(np.random.rand() * M)
41         margin = Y[i] * np.dot(K[i, :], alpha)
42         grad = M * L * K[:, i] * alpha[i]
43         if margin < 1:
44             grad -= Y[i] * K[:, i]
45             alpha -= grad / np.sqrt(ii + 1)
46             alpha_avg += alpha
47             ii += 1
48
49     alpha_avg /= (ii + 1) * M
50
51     state['alpha'] = alpha
52     state['alpha_avg'] = alpha_avg
53     state['Xtrain'] = matrix
54     state['Sqtrain'] = squared
55     return state
56
57
58 def svm_predict(state, matrix, radius):
59     M, N = matrix.shape
60
61     Xtrain = state['Xtrain']
62     Sqtrain = state['Sqtrain']
63     matrix = 1. * (matrix > 0)
64     squared = np.sum(matrix * matrix, axis=1)
65     gram = matrix.dot(Xtrain.T)
66     K = np.exp(-(squared.reshape((-1, 1)) + Sqtrain.reshape((1, -1)) - 2 * gram) / (2 * (radius ** 2)))
67     alpha_avg = state['alpha_avg']
68     preds = K.dot(alpha_avg)
69     output = (1 + np.sign(preds)) // 2
70
71     return output

```