

```

1 import math
2
3 import matplotlib.pyplot as plt
4 import numpy as np
5
6 import util
7
8
9 def initial_state()::
10     """Return the initial state for the perceptron.
11
12     This function computes and then returns the initial state of the perceptron.
13     Feel free to use any data type (dicts, lists, tuples, or custom classes) to
14     contain the state of the perceptron.
15
16     """
17
18     # *** START CODE HERE ***
19     return []
20     # *** END CODE HERE ***
21
22
23 def predict(state, kernel, x_i):
24     """Peform a prediction on a given instance x_i given the current state
25     and the kernel.
26
27     Args:
28         state: The state returned from initial_state()
29         kernel: A binary function that takes two vectors as input and returns
30                the result of a kernel
31         x_i: A vector containing the features for a single instance
32
33     Returns:
34         Returns the prediction (i.e 0 or 1)
35     """
36     # *** START CODE HERE ***
37     return sign(sum(weight * kernel(x, x_i) for weight, x in state))
38     # *** END CODE HERE ***
39
40
41 def update_state(state, kernel, learning_rate, x_i, y_i):
42     """Updates the state of the perceptron.
43
44     Args:
45         state: The state returned from initial_state()
46         kernel: A binary function that takes two vectors as input and returns the result of a kernel
47         learning_rate: The learning rate for the update
48         x_i: A vector containing the features for a single instance
49         y_i: A 0 or 1 indicating the label for a single instance
50     """
51     # *** START CODE HERE ***
52     next_prediction = predict(state, kernel, x_i)
53     next_weight = learning_rate * (y_i - next_prediction)
54     state.append((next_weight, x_i))
55     # *** END CODE HERE ***
56
57
58 def sign(a):
59     """Gets the sign of a scalar input."""
60     if a >= 0:
61         return 1
62     else:
63         return 0
64
65
66 def dot_kernel(a, b):
67     """An implementation of a dot product kernel.
68
69     Args:
70         a: A vector
71         b: A vector
72     """

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73     return np.dot(a, b)
74
75
76 def rbf_kernel(a, b, sigma=1):
77     """An implementation of the radial basis function kernel.
78
79     Args:
80         a: A vector
81         b: A vector
82         sigma: The radius of the kernel
83     """
84     distance = (a - b).dot(a - b)
85     scaled_distance = -distance / (2 * (sigma) ** 2)
86     return math.exp(scaled_distance)
87
88 def non_psd_kernel(a, b):
89     """An implementation of a non-psd kernel.
90
91     Args:
92         a: A vector
93         b: A vector
94     """
95     if(np.allclose(a,b,rtol=1e-5)):
96         return -1
97     return 0
98
99 def train_perceptron(kernel_name, kernel, learning_rate):
100     """Train a perceptron with the given kernel.
101
102     This function trains a perceptron with a given kernel and then
103     uses that perceptron to make predictions.
104     The output predictions are saved to src/perceptron/perceptron_{kernel_name}_predictions.txt.
105     The output plots are saved to src/perceptron/perceptron_{kernel_name}_output.pdf.
106
107     Args:
108         kernel_name: The name of the kernel.
109         kernel: The kernel function.
110         learning_rate: The learning rate for training.
111     """
112     train_x, train_y = util.load_csv('train.csv')
113
114     state = initial_state()
115
116     for x_i, y_i in zip(train_x, train_y):
117         update_state(state, kernel, learning_rate, x_i, y_i)
118
119     test_x, test_y = util.load_csv('test.csv')
120
121     plt.figure(figsize=(12, 8))
122     util.plot_contour(lambda a: predict(state, kernel, a))
123     util.plot_points(test_x, test_y)
124     plt.savefig('perceptron_{}_output.png'.format(kernel_name))
125
126     predict_y = [predict(state, kernel, test_x[i, :]) for i in range(test_y.shape[0])]
127
128     np.savetxt('perceptron_{}_predictions'.format(kernel_name), predict_y)
129
130
131 def main():
132     train_perceptron('dot', dot_kernel, 0.5)
133     train_perceptron('rbf', rbf_kernel, 0.5)
134     train_perceptron('non_psd', non_psd_kernel, 0.5)
135     plt.show()
136
137
138
139 if __name__ == "__main__":
140     main()

```