












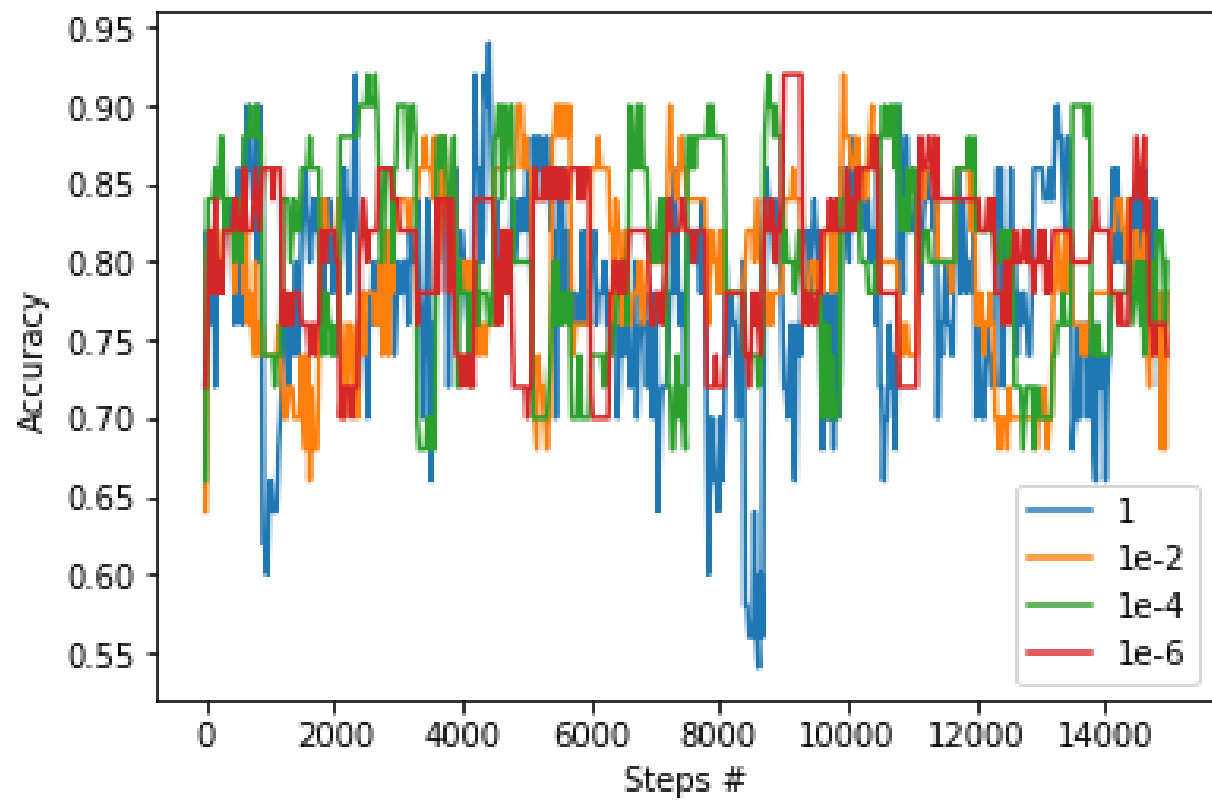


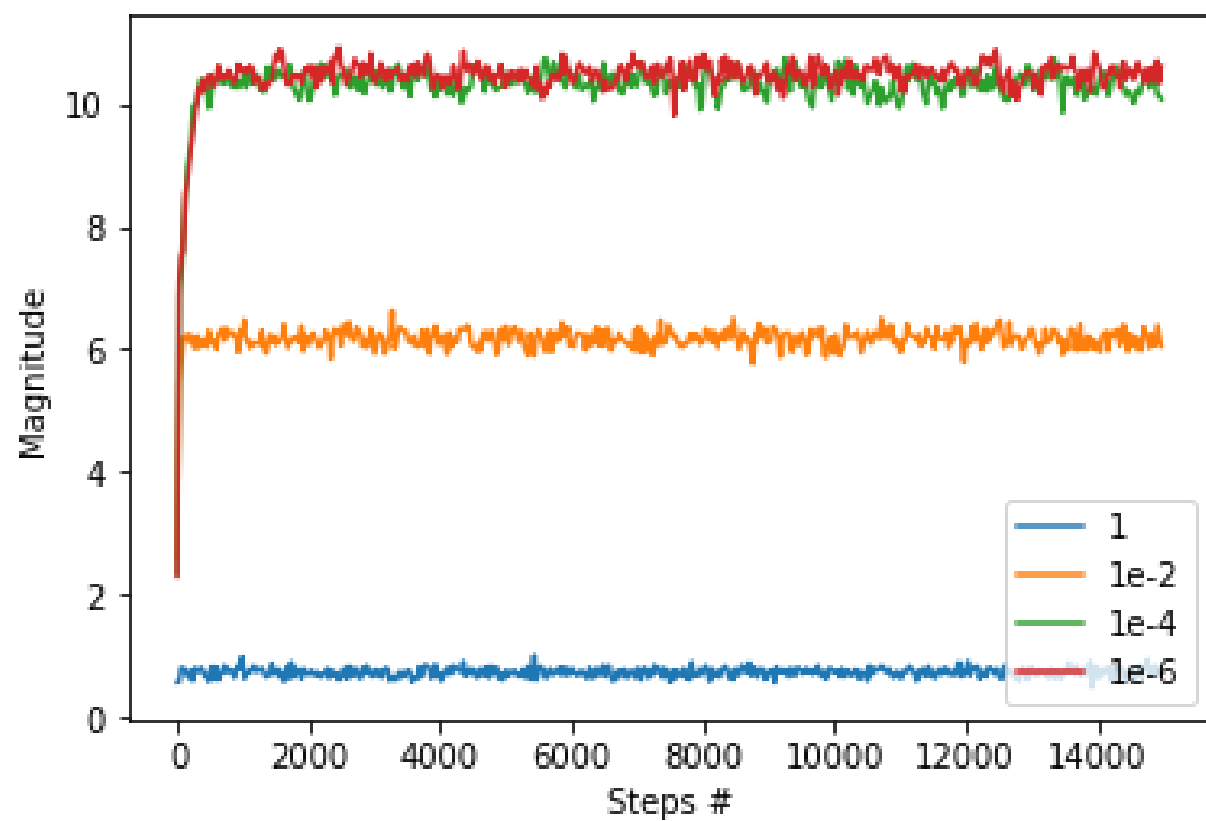
Overview	Data	Kernels	Discussion	Leaderboard	Rules	Team	My Submissions	Submit Predictions
add submission details								
<a href="#">output3.csv</a> 4 hours ago by <a href="#">Junhao Pan</a> add submission details				0.80528		<input type="checkbox"/>		
<a href="#">output3.csv</a> 4 hours ago by <a href="#">Junhao Pan</a> add submission details				0.80425		<input type="checkbox"/>		
<a href="#">output2.csv</a> 4 hours ago by <a href="#">Junhao Pan</a> add submission details				0.80671		<input type="checkbox"/>		
<a href="#">output3.csv</a> 4 hours ago by <a href="#">Junhao Pan</a> add submission details				0.80630		<input type="checkbox"/>		
<a href="#">output3.csv</a> 4 hours ago by <a href="#">Junhao Pan</a> add submission details				0.75900		<input type="checkbox"/>		
<a href="#">output3.csv</a> 4 hours ago by <a href="#">Junhao Pan</a>				0.78153		<input type="checkbox"/>		

Overview	Data	Kernels	Discussion	Leaderboard	Rules	Team	My Submissions	Submit Predictions
53	new	Pan Zhang			0.80692	9	9m	
54	new	Shuyue Lai			0.80692	22	1d	
55	new	YuxuanRen			0.80692	16	5h	
56	new	Mathias			0.80692	1	6h	
57	new	JoJo			0.80671	18	18h	
58	new	yanxu			0.80671	16	7h	
59	new	Junhao Pan			0.80671	20	3h	
Your Best Entry 								
Your submission scored 0.80589, which is not an improvement of your best score. Keep trying!								
60	new	Robert Jin			0.80671	35	1h	
61	new	robertjin			0.80671	1	1h	
62	new	Adam Dama			0.80651	3	2h	
63	new	Hassan			0.80630	3	3h	
64	new	Gauraang Naik			0.80630	9	1h	

Training Accuracy



Magnitude of Weight



The model is not overly sensitive to the choice of the lambda when it is around  $1e-2$  or less. In theory, smaller lambda would take longer time to stabilize themselves to establish a consistent accuracy. However, since we run 50 epochs on the dataset, it is enough for small lambda at even  $1e-7$  to stabilize.

My best accuracy is generated with a lambda of  $1e-5$ . I have experienced with other numbers as well, but accuracy fluctuates only slightly.

In fact, there are other parameters which have more effects on the outcome. For example, the way to calculate the learning rate is quite a major impact on the result. I have changed the constants in the formula to control the update of the weight, but apparently the one documented by professor gave a consistent and good result. It uses the season's count as a variable to gradually decrease the step length.



```
In [1]: import numpy as np
import numpy.linalg as la
import matplotlib.pyplot as plt
import argparse
from sklearn import preprocessing

train_file = open('train.data')
test_file = open('test.data')

epochs = 50
seasons = 300
steps = 145

d_train = []
d_label = []
train_file.seek(0)
for line in train_file:
    line = line.rstrip('\n')
    lc = line.split(',')
    line_l = [lc[0], lc[2], lc[4], lc[10], lc[11], lc[12]]
    d_train.append(line_l)
    if (lc[14] == '<=50K'):
        d_label.append(-1)
    else:
        d_label.append(1)
d_train = preprocessing.scale(d_train)
d_train = np.c_[np.ones(len(d_train)), d_train, d_label]

d_test = []
test_file.seek(0)
for line in test_file:
    line = line.rstrip('\n')
    lc = line.split(',')
    line_l = [lc[0], lc[2], lc[4], lc[10], lc[11], lc[12]]
    d_test.append(line_l)
d_test = preprocessing.scale(d_test)
d_test = np.c_[np.ones(len(d_test)), d_test]

d_train = np.array(d_train, dtype = float)
d_test = np.array(d_test, dtype = float)

print(d_train.shape)
print(d_test.shape)

(43958, 8)
(4884, 7)
```

```
In [2]: lam = [1, 0.01, 0.0001, 0.000001]

accuracy_plot = []
magnitude_plot = []
weights = []

for l in lam:
    print('Start training... lam = %.5f' % l)
    weight = np.random.uniform(size = (len(d_train[0]) - 1))
    step_accu_history = []
    mag_history = []

    for i in range(epochs):
        if (i%10 == 0):
            print('Training epoch:', i, '~', i + 10, '...')
            np.random.shuffle(d_train)
            e_train = d_train[50:, 0:7]
            e_train_label = d_train[50:, 7:8].flatten()
            e_val = d_train[0:50, 0:7]
            e_val_label = d_train[0:50, 7:8].flatten()

            for j in range(seasons):
                for k in range(steps):
                    step_len = 1/(0.01*i + 50)
                    row_idx = j*steps + k
                    row = e_train[row_idx]
                    label = e_train_label[row_idx]
                    pred = row.dot(weight)
                    if (label*pred >= 1):
                        weight = (1 - step_len*1)*weight
                    else:
                        weight = weight - step_len*(1*weight - label*row)
                #
                bias = bias + step_len*label
                if (j%30 == 0):
                    preds_side = e_val.dot(weight)
                    err_count = 0
                    for n in range(len(e_val_label)):
                        if (preds_side[n]*e_val_label[n] < 0):
                            err_count += 1
                    step_accu_history.append(1 - err_count/len(e_val_label))
                    mag_history.append(la.norm(weight, 2))

            accuracy_plot.append(step_accu_history)
            magnitude_plot.append(mag_history)
            weights.append(weight)
```