

```
In [2]: import numpy as np
import pandas as pd
import tensorflow as tf
from sklearn.preprocessing import OneHotEncoder
from sklearn.metrics import accuracy_score
import time
from sklearn.preprocessing import scale
```

```
In [4]: dd_train = pd.read_csv('Training Data.csv')
dd_test = pd.read_csv('Testing Data.csv')

dd_real = pd.read_csv('Real Data.csv')
```

```
In [51]: in_train = dd_train.values[:,1:129].astype(np.float64)
in_train = scale(in_train, axis = 1)
out_train = dd_train.label.astype('category')
out_train = pd.get_dummies( out_train ).values.astype(np.float64)
in_valid = dd_test.values[:,1:129].astype(np.float64)
in_valid = scale(in_valid, axis = 1)
out_valid = dd_test.label.astype('category')
out_valid = pd.get_dummies( out_valid ).values.astype(np.float64)

in_real = dd_real.values[:,1:129].astype(np.float64)
in_real = scale(in_real, axis = 1)
```

```
In [52]: all_labels = np.unique(dd_test.label.astype('category'))
dd_real.label.values
```

```
Out[52]: array(['Looter Scooter'], dtype=object)
```

```
In [53]: out_real = np.reshape((all_labels == "Smuggler's Copter") +0,
[1,264]).astype(np.float64)
in_real.shape
```

```
Out[53]: (1, 128)
```

```
In [54]: N_train = in_train.shape[0]
N_feat = in_train.shape[1]
N_cat = out_train.shape[1]
N_valid = in_valid.shape[0]
N_real = in_real.shape[0]
```

```
In [55]: N_train
```

```
Out[55]: 52800
```

```
In [56]: # hyper-parameters
EPOCHS   = 300           # number of training epochs
N_nodes  = 256           # nodes in hidden layer
ALPHA     = 0             # regularization parameter
BS        = 52800         # batch size
STD       = 0.1           # weight initialization standard deviation
```

```
In [86]: x_train = tf.placeholder( tf.float32, [BS, N_feat] )
        y_train = tf.placeholder( tf.float32, [BS, N_cat] )

        x_train_f = tf.constant( in_train , tf.float32, [N_train,N_feat])
        y_train_f = tf.constant( out_train , tf.float32, [N_train,N_cat])

        x_valid = tf.constant( in_valid , tf.float32, [N_valid , N_feat] )
        y_valid = tf.constant( out_valid, tf.float32, [N_valid, N_cat])

        x_real = tf.constant( in_real , tf.float32, [N_real , N_feat] )
        y_real = tf.constant( out_real, tf.float32, [N_real, N_cat])
```

```
In [71]: w1 = tf.Variable( tf.truncated_normal( [N_feat,N_nodes], stddev = STD,
        seed=0))
        b1 = tf.Variable( tf.truncated_normal( [1,N_nodes], stddev = STD, seed=0))

        y1_train = tf.nn.relu( tf.matmul(x_train,w1) + b1 )
        y1_train_f = tf.nn.relu( tf.matmul(x_train_f,w1) + b1 )
        y1_valid = tf.nn.relu( tf.matmul( x_valid, w1) + b1 )
        y1_real = tf.nn.relu( tf.matmul( x_real, w1) + b1 )

        w2 = tf.Variable( tf.truncated_normal( [N_nodes,N_cat], stddev = STD, seed=0))
        b2 = tf.Variable( tf.truncated_normal( [1,N_cat], stddev = STD, seed=0))

        logits_train = tf.matmul(y1_train,w2) + b2
        logits_train_f = tf.matmul(y1_train_f,w2) + b2
        logits_valid = tf.matmul(y1_valid,w2) + b2
        logits_real = tf.matmul(y1_real,w2) + b2
```

```
In [72]: CE = tf.reduce_mean( tf.nn.softmax_cross_entropy_with_logits(
        logits_train, y_train) )
        L2 = ALPHA*(tf.nn.l2_loss(w1) + tf.nn.l2_loss(b1) + \
        tf.nn.l2_loss(w2) + tf.nn.l2_loss(b2))
        CE_train_f = tf.reduce_mean( tf.nn.softmax_cross_entropy_with_logits(
        logits_train_f, y_train_f) )
        CE_valid = tf.reduce_mean( tf.nn.softmax_cross_entropy_with_logits(
        logits_valid, y_valid) )

        y_train_p = tf.nn.softmax( logits_train )
        y_train_fp = tf.nn.softmax( logits_train_f )
        y_valid_p = tf.nn.softmax( logits_valid )
        y_real_p = tf.nn.softmax( logits_real)

        optimizer = tf.train.AdamOptimizer().minimize(CE+L2)
        init = tf.initialize_all_variables()
```

```
In [73]: sess = tf.Session()
        sess.run(init)
```

```

In [74]: t0 = time.time()
         np.random.seed(0)

         print( 'Epochs =%3d, Training Set Size =%4d, Nodes = %5d, Alpha = %3.4f, Batch
           Size = %4d, STD = %5.3f' %
             (EPOCHS, N_train, N_nodes, ALPHA, BS, STD))
         print()
         print('%15s%24s%24s' % (' ','cross-entropy','error-rate'))
         print('%15s%12s%12s%12s%12s%12s%12s' %
           ('epoch','training','validation','training','validation','L2','time (mi
             n)'))
         for i in range(EPOCHS+1): # For every Epoch
             ran = np.random.permutation(N_train) # Order the data
             reran = np.reshape( ran, [ int(N_train/BS) ,BS] ) #Reshape ordering as a m
             atrix
             for j in range( int(N_train/BS) ): # For every batch
                 mini = reran[j,:].astype(int) # Find the batch indices
                 x_batch = in_train[mini,:] # Call the batch features
                 y_batch = out_train[mini] # Call the batch labels
                 # Do a step with a batch
                 sess.run([optimizer],feed_dict = {x_train:x_batch, y_train:y_batch})
             if (i % int(EPOCHS/10)) == 0:
                 ( ce_train, ce_valid, out_train_pf, out_valid_p, l2 ) = \
                 sess.run( [CE_train_f, CE_valid, y_train_fp, y_valid_p,L2])
                 err_train = 1-accuracy_score( out_train.argmax(axis=1),
                                         out_train_pf.argmax(axis=1))
                 err_valid  = 1-accuracy_score( out_valid.argmax(axis=1),
                                         out_valid_p.argmax(axis=1))

                 t = (time.time() - t0)/60
                 print('%7d %7d %12.5f %12.5f %12.6f %12.6f %12.3f %12.1f' %
                     (EPOCHS,i,ce_train,ce_valid,err_train,err_valid,l2,t))

```

Epochs =300, Training Set Size =52800, Nodes = 256, Alpha = 0.0000, Batch Size = 52800, STD = 0.100

time (min)	epoch	cross-entropy		error-rate		L2
		training	validation	training	validation	
300	0	5.85669	5.85707	0.997443	0.998030	0.
000	0.0					
300	30	1.45093	1.45758	0.081269	0.084508	0.
000	0.2					
300	60	0.09357	0.09711	0.003295	0.003750	0.
000	0.3					
300	90	0.03798	0.04135	0.001326	0.001932	0.
000	0.5					
300	120	0.02485	0.02827	0.000795	0.001515	0.
000	0.7					
300	150	0.01810	0.02155	0.000436	0.001174	0.
000	0.8					
300	180	0.01389	0.01733	0.000227	0.000985	0.
000	1.0					
300	210	0.01104	0.01445	0.000133	0.000871	0.
000	1.1					
300	240	0.00901	0.01238	0.000114	0.000795	0.
000	1.3					
300	270	0.00751	0.01083	0.000057	0.000720	0.
000	1.4					
300	300	0.00636	0.00963	0.000038	0.000682	0.
000	1.6					

In [75]: (out_real_p) = sess.run([y_real_p])

In [89]: all_labels[out_real_p[0].argmax()]

Out[89]: 'Demolish'

In [92]: out_real_p = out_real_p[0]
out_real_p.argmax()

Out[92]: 60

In [93]: all_labels[60]

Out[93]: 'Demolish'

In [94]: out_real_p[60]

Out[94]: 0.34933463

In []: