```python
import numpy as np
import numpy.random as rd
from progress.bar import FillingSquaresBar

N = 2
Out = 1
M1 = 20
N_EPOCHS = 1000
LR = 0.005


def inertia(t):
    e = 1 - np.exp(- t * 1e-10)
    return e


def load_data(URL_train, URL_test):
    return np.loadtxt(open(URL_train, "rb"), delimiter="," , skiprows=1), np.loadtxt(open(URL_test, "rb"), delimiter= ",",

                              skiprows=1)


def standardize_data(train, validate):
    inputs = train[:, :-1]
    means = np.mean(inputs, axis=0)
    stds = np.std(inputs, axis=0)
    train[:, :-1] = (train[:, :-1] - means) / stds
    validate[:, :-1] = (validate[:, :-1] - means) / stds


def init_network():
    w = rd.normal(loc=0., scale=1 / N, size=(M1, N))
    W = rd.normal(loc=0., scale=1 / M1, size=(Out, M1))
    theta = np.zeros((M1, 1))
    THETA = np.zeros((Out, 1))
    return w, W, theta, THETA


d_tanh = np.vectorize(lambda x: 1. - (np.tanh(x)) ** 2)

def feed_forward(x, w1, w_out, tht1, tht_out):

    h_b = np.matmul(w1, x) - tht1
    h_v = np.tanh(h_b)

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45      o_b = np.matmul(w_out, h_v) - tht_out
46      o_v = np.tanh(o_b)
47      return h_b, h_v, o_b, o_v
48
49
50  def energy(data, w1, w_out, tht1, tht_out):
51      n_data = data.shape[0]
52      out = np.zeros((n_data, 1))
53      for p in range(n_data):
54          p_mu = data[p]
55          x_mu = p_mu[:2].reshape((N, 1))
56          _, _, _, out[p] = feed_forward(x_mu, w1, w_out,
    tht1, tht_out)
57      t = data[:, 2].reshape((n_data,1))
58      diff = (t - out)
59      return 0.5 * np.sum(diff ** 2)
60
61
62  def c_error(data_val, w1, w_out, tht1, tht_out):
63      sum = 0
64      p_val = data_val.shape[0]
65      for p in range(p_val):
66          p_mu = data_val[p]
67          x_mu = p_mu[:2].reshape((N, 1))
68          t_mu = p_mu[2]
69          _, _, _, v_out = feed_forward(x_mu, w1, w_out,
    tht1, tht_out)
70          v_out = np.sign(v_out)
71          sum += np.abs( v_out - t_mu )
72      return (1 / (2 * p_val)) * sum
73
74
75  def train_network(learn, validate):
76      n_learn = learn.shape[0]
77      w, W, theta, THETA = init_network()
78      print("\nC_ERROR = {0}\n\n".format(c_error(validate, w
    , W, theta, THETA)))
79      e = energy(validate, w, W, theta, THETA)
80
81      Dw, DW = 0, 0
82      t = 0
83      for i_epoch in range(N_EPOCHS):
84          bar = FillingSquaresBar("Epoch " + str(i_epoch) +
    ": ", max=15*n_learn)
85          err_s = 0
86
87          for p in range(15*n_learn):
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 88              # Choose random pattern
 89              p_mu = learn[rd.randint(0, n_learn)]
 90              x_mu = p_mu[:2].reshape((N, 1))
 91              t_mu = p_mu[2]
 92
 93              # FEED FORWARD
 94              h_b, h_v, o_b, o_v = feed_forward(x_mu, w, W
    , theta, THETA)
 95
 96              # BACKPROPAGATION
 97
 98              ERR = (t_mu - o_v) * d_tanh(o_b)
 99              DW = LR * ERR * h_v.T + inertia(t) * DW
100
101              err = np.matmul(W.T, ERR) * d_tanh(h_b)
102              Dw = LR * np.matmul(err, x_mu.T) + inertia(t
    ) * Dw
103
104              # ADJUST WEIGHTS AND THRESHOLDS
105
106              W += DW
107              err_s += DW
108              THETA -= LR * ERR
109
110              w += Dw
111              theta -= LR * err
112
113              t += 1
114              bar.next()
115          bar.finish()
116          ce = c_error(validate, w, W, theta, THETA)
117          e_p = e
118          # e = energy(validate, w + Dw, W + DW, theta - (
    LR * err), THETA - (LR * ERR))
119          e = energy(validate, w, W, theta, THETA)
120          delta_e = e - e_p
121          print("\nC_ERROR = {0} , deltaH = {1}, H = {2}\n\
    n".format(ce, delta_e, e))
122          if ce < 0.118:
123              break
124      return w, W, theta, THETA
125
126
127 data_train, data_val = load_data("training_set.csv", "
    validation_set.csv")
128 standardize_data(data_train, data_val)
129 w, W, theta, THETA = train_network(data_train[:-3500],
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129 data_val)
130
131 np.savetxt("w1.csv", w, delimiter=",")
132 np.savetxt("w2.csv", W, delimiter=",")
133 np.savetxt("t1.csv", theta, delimiter=",")
134 np.savetxt("t2.csv", THETA, delimiter=",")
135
```