CSE250a_HW6.3

November 13, 2017

1 6.3d

```
In [2]: import numpy as np
In [37]: ''' Load files and constants '''
         spectX_fh = 'hw6_spectX.txt'
         spectY_fh = 'hw6_spectY.txt'
         spectX = np.loadtxt(spectX_fh)
         spectY = np.loadtxt(spectY_fh)
         ITERS = 256
         T = 267 \#examples
         n = 23 \# inputs
         PIO = 0.05 \# initial parameter
         ITERS_LIST = [0,1,2,4,8,16,32,64,128,256]
         Ti_arr = np.zeros(n)
         for i in range(n):
             Ti_arr[i] = np.sum(spectX[:,i])
In [47]: ''' Functions '''
         \# P(Y|X)
         \# give p\_arr, x\_t (arr), y\_t (value)
         def likelihood(p, x, y):
             prod = np.prod((1-p)**x)
             out = (1-y)*prod + y*(1-prod)
             return(out)
         # E-step of EM algorithm
         \# give x_t, y_t, p arrays for current iteration of t
         def e_step(x, y, p):
             numer = y*x*p
             denom = 1-np.prod((1-p)**x)
             return(numer/denom)
```

```
# main
def EM_algorithm(x_data, y_data):
   mistakes = [] # mistakes in each iteration
   L = [] # log-likelihood for each iteration
    p = np.full(n, PIO) #initialize p_arr with 0.05
    for i in range(ITERS+1):
        L_i = 0
        M_i = 0
        em_sum = 0
        for t in range(T):
            p_yx = likelihood(p, x_data[t], y_data[t])
            L_i += np.log(p_yx)
            em_sum += e_step(x_data[t], y_data[t], p)
            if (p_yx < 0.5):
                M_i += 1
        p = em_sum/Ti_arr
        mistakes.append(M_i)
        L.append(L_i/T)
        if i in ITERS_LIST:
            print('iteration: %d \t number of mistakes M %d \t log-likelihood L %d' % (
    return(mistakes, L)
```

2 Solution

```
In [48]: mistakes_list, log_likelihoods = EM_algorithm(spectX, spectY)
```

```
iteration: 0
                      number of mistakes M 175
                                                         log-likelihood L 0
                      number of mistakes M 56
                                                        log-likelihood L 0
iteration: 1
                      number of mistakes M 43
iteration: 2
                                                        log-likelihood L 0
                      number of mistakes M 42
iteration: 4
                                                        log-likelihood L 0
iteration: 8
                      number of mistakes M 44
                                                        log-likelihood L 0
iteration: 16
                       number of mistakes M 40
                                                         log-likelihood L 0
iteration: 32
                       number of mistakes M 37
                                                         log-likelihood L 0
iteration: 64
                       number of mistakes M 37
                                                         log-likelihood L 0
                        number of mistakes M 36
iteration: 128
                                                          log-likelihood L 0
                        number of mistakes M 36
iteration: 256
                                                          log-likelihood L 0
```