

# Assignment 4

Machine Learning COMS 4771

Spring 2014, Itsik Pe'er

Assigned: Feb 19<sup>th</sup>

Due: Class time, Feb 26<sup>th</sup>

Submission: Your submission folder on Courseworks. Submit folders for  
Assignment04.Problem01, and Assignment04.Problem02

1)

- a) Implement logistic-regression gradient descent, writing your own function

`ThetaStar =`  
`GradDescentLogistic(x,y,eta,epsilon,StartingTheta,StopTime)`  
First 5 parameters should be clear from class. `StopTime` is time in seconds after which you decide the program is not converging.  
[20 points]

- b) Interactively work with Matlab Write to test `GradDescentLogistic`. Save the commands you run into a script `TestGDL.m` that should:

- i) Set `StopTime` to 60
- ii) Choose  $N=100$   $x$  values in  $D=8$  dimensions randomly & uniformly within the range  $(-5,5)^D$
- iii) Use `SimLogistic` with  $\sigma=0$  to generate  $N$  training classification values  $y$ , and evaluate your classifier using  $M=20$  test datapoints generated with the same parameters.
- iv) Perform multiple runs on the same input, with the same and different `eta, epsilon, StartingTheta` with `eta, epsilon` that you set as you wish and `StartingTheta` chosen randomly in  $(-10,10)^D$ .

Perform as many runs as you see fit, till you decide on parameters `eta, epsilon` you think are good (call them  $\eta_0, \epsilon_0$ ). Measure the time it took `GradDescentLogistic` to converge for each run. The last run is with  $\eta_0, \epsilon_0$ .

Report:

`TestGDL.m` the script that does all this

`Inputs.txt`  $D+1$  columns,  $N+M$  rows detailing  $x, y$  (last column is  $y$ , last  $M$  rows are test)

`RealThetas.txt` One column vector of  $D+1$  entries (the first one for the free coefficient)

`Runs.txt`  $2D+7$  columns with a row for each runs. First two columns report:  
`eta, epsilon`; next  $D+1$ : `StartingTheta`; next  $D+1$ : optimized  $\theta$  values;  
next 2 columns: final value of the loss on training and test data; last column:  
runtime in seconds

[45 points]

- c) Rerun with  $\eta \leftarrow 2^k \eta_0$  for consecutive (positive and negative) integers  $k$  to demonstrate the problems with too large/small `eta`. Report `EtaRuns.txt`, formatted exactly as `Runs.txt` above, and `TestEta.m` the script that produces it.

[15 points]

- 2) Consider the neural network in the attached NN.A4.2.pdf, with two inputs, denoted by subscripts 1 and 2; two 1<sup>st</sup>-level logistic neurons, denoted by subscripts 3 and 4; two 2<sup>nd</sup>-level logistic neurons, denoted by subscripts 5 and 6; and a single 3<sup>rd</sup>-level logistic neuron, denoted by the subscript 7. The intercept for all neurons is modeled as respective coefficients for  $x_0=1$ . Write down explicit update equations for a gradient descent process with logistic loss.

[20 points]

Good luck!