Assignment 1

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The file structure is Modular. The general Utility functions, such as the ones for getting Linear or Non - Linearly separable datasets can be found here Lib/Utils/Dataset.py and Lib/Utils/utility.py Feature maps have been defined in Lib/Utils/feature_map.py

Requirements:

import numpy as np
from tqdm import tqdm # for progress bar

Section 1 Overall file to be run is Perceptron.ipynb

The Main idea behind the perceptron is present in Lib/Utils/Models/Perceptron.py The rest can be seen in the plot, The spearability is implemented as the split distance of the normal distribution that generates the data, It is quite visible that the number of iterations decreases as the separability gets high.

Section 2 Overall file to be run is HingeClassifier.ipynb The loss implemented is the hinge Loss. The hinge loss has an optimization problem that will converge. The hinge loss can be seen as a 'soft' version of the perceptron loss. Using Logistic loss however theoretically will yield no convergence(for linearly separable data) (if w^* is an optimal solution then so is $2w^*$ but the loss is lesser for the latter.) Now, in order to see the gradients, one can see the Lib/Utils/Models/SVM_non_reg.py file, that contains the main information about the hinge loss update. Here is a short version

$$w' = w - \alpha \frac{\partial L}{\partial w}$$

$$L = \sum_{i=1}^{n} \max(0, 1 - y_i(w^T \phi(X_i)))$$

$$L = \sum_{i|u,w^T \phi(X_i) \le 1}^{n} 1 - y_i(w^T \phi(X_i))$$

Basically the the classifier is only built by points that are within the margin of $y_i W^t \phi(X_i) = 1$. From this we get

$$w' = w + \alpha \sum_{i|y_i w^T \phi(X_i) < 1}^n y_i \phi(X_i)$$

This algorithm is tremendously similar to the perceptron, only that the learning rate is smoothening the growth of the weights.

Section 3

Overall file to be run is NeuralNet.ipynb The overall picture that is needed can be seen directly from the Lib/Utils/Models/Neural_net.py file. The layers are defined in Lib/Gates/Layers.py losses are defined in Lib/Losses/Loss.py and the Solver has been implemented in Lib/Solvers/GD.py. The batch sampler has been defined in Lib/Utils/batch_sampler.py