## ESE 545 Project 2

Andrew Hunter, John Waldt

Question 1.1. The csv of training data was read in as a pandas data frame and the S labels were changed to $-1$ and $1$ .	Sentiment
Question 1.2. The cleaning process only included steps 1-6 and the given stop word list. All tweet strings were cleaned using regular expressions and pandas replace method for da Then each cleaned tweet string was split into a list of words by spaces.	
<b>Question 1.3.</b> Unigram and Bigram features were created using CountVectorizer from the package. For unigram case, our training set was $n = 1600000$ and $p = 383587$ . For bigram $n = 1600000$ and $p = 3395410$ . We scaled all features by their standard deviations.	
Question 1.4. See Figure 1.	
Question 1.5. See Figure 1.	

Question 1.6. The test set was loaded in and cleaned the same way the training set was. It was then turned into a bag of words using the vocabulary from the training set.

**Unigram:** Due to the relatively small sample size of the test set (n = 498), some randomness can be seen in the test error. In the end we achieved around a 20% error on both the test and training set with Pegasos and AdaGrad. For both Pegasos and AdaGrad, the inputs were  $\lambda = .009$ , Batch Size = 4500. Figure 1 shows a plot of unigram error rate by number of iteration and Table lists the final accuracy and error rates.

**Bigram:** Using the bigram, we were able to achieve a training error of under 10% for both Pegasos and AdaGrad. However, the accuracy on the test set was only slightly better than random guessing. This is most likely due to over-fitting the training sample, and a very sparse feature matrix for the test set. For both Pegasos and AdaGrad, the inputs were  $\lambda = .001$  and Batch Size = 4500. Figure 2 shows a plot of bigram error rate by number of iteration and Table lists the final accuracy and error rates.

Unigram Results				
	AdaGrad	Pegasos		
Train Error	18.03%	20.86%		
Test Accuracy	85.34%	83.13%		

Table 1: Unigram Final Results

Bigram Results				
	AdaGrad	Pegasos		
Train Error	5.07%	8.4%		
Test Accuracy	56.8%	56.2%		

Table 2: Bigram Final Results

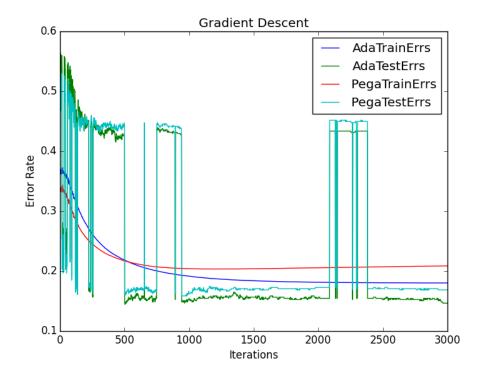


Figure 1: Unigram Plot

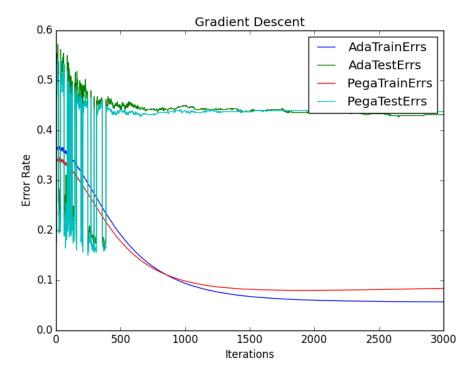


Figure 2: Bigram Plot