Sentiment Analysis on IMDB movie review using SVM

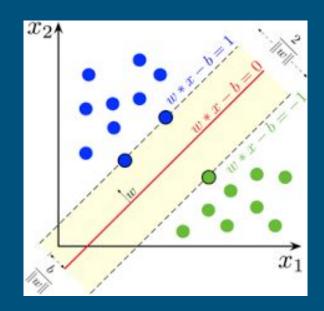
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Introduction

What is Sentiment Analysis?

- IMDB's movie review dataset
 - o 50,000 movie reviews.
 - 25,000 Positive reviews
 - 25,000 Negative reviews.

Support Vector Classifier



Pre-processing of dataset

- Tokenization
- Removal of stopwords
- Stemming
- Transformation:
 - Bag of Words
 - Term Frequency Inverse Document Frequency (TF IDF)
 - TF = Frequency of word in sentence / Total no. of words in sentence
 - IDF = log(Total no. of sentences / No. of sentences contains that word)
 - o **n-gram**

Support Vector Classifier (SVC)

• SVMs classify an input vector $x \in R_d$ using:

$$y_i = argmax (w^T x)$$

Optimization problem:

Min
$$0.5 * ||w||^2$$

Subject to $(x_i \cdot w + b) \cdot y_i \ge 1$ for all i

Crammer - Singer formulation for optimization problem

minimize
$$(0.5 * \Sigma ||w_m||^2) + C (\Sigma [1 + max (w_m^T.x_i - w_{yi}^T.x_i)])$$

Algorithm for solving Crammer-Singer equation

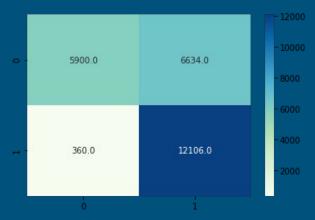
- 1. INPUT: X as train data, Y as train labels
- 2. X = hstack([X, ones((len(X), 1))])
- 3. N, d = X.shape
- 4. k = no. of classes
- 5. Initialize W matrix of size (k, d), penalty constant C = 1.0 , i=0
- 6. while i < iterations do
 - a. grad = gradient(W, X, Y, C)
 - b. $W = W \alpha * grad$ (Gradient Descent Approach)
 - c. i = i + 1
- 7. end

Results

| Models | Precision | Recall | F1-Score | Accuracy |
|----------------|-----------|--------|----------|----------|
| 1-Gram Sklearn | 0.772 | 0.778 | 0.775 | 0.773 |
| 2-Gram Sklearn | 0.788 | 0.779 | 0.784 | 0.786 |
| 3-Gram Sklearn | 0.792 | 0.773 | 0.783 | 0.785 |
| 1-Gram Scratch | 0.681 | 0.948 | 0.792 | 0.753 |
| 2-Gram Scratch | 0.646 | 0.971 | 0.776 | 0.720 |
| 3-Gram Scratch | 0.683 | 0.945 | 0.795 | 0.756 |



Recall comparison



Confusion Matrix for 2-gram TF-IDF Model build from scratch

References

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- [2] Casi Setianingsih Rimba Nuzulul Chory Muhammad Nasrun. "Sentiment analysis on user satisfaction level of monile data services using support vector machine (SVM) algorithm". In: IEEE International Conference on Internet of Things and Intelligence System (2018).
- [3] Andia Enggar Mayasari and Anggit Dwi Hartanto. "User Satisfaction Levels Sentiment Analysis Toward Goods Delivery Service On Twitter Using Support Vector Machine Algorithm (SVM)". In: International Conference on Information Technology, Information system and Electrical Engineering (2019).
- [4] Yoram Singer Koby Crammer. "On the Algorithmic Implementation of Multiclass Kernelbased Vector Machines". In: Journal of Machine Learning Research (2001).

Thank you