Review Popularity Classification based on Syntactic, Semantic, and Non-Textual Heuristics

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Abstract

This project aims to classify the popularity of Goodreads book reviews using Logistic Regression, XGBoost, and Neural Networks. The model leverages syntactic, semantic, and non-textual heuristics derived from the review text and metadata to predict whether a review is popular (above the 75th percentile of total votes). The approach combines handcrafted linguistic features with TF-IDF text representations in a unified multi-model learning pipeline.

System Overview & Architecture

- 1. Data Handling: Reviews are loaded from the GoodReads UCSD Dataset and sampled (sample_size). Popularity is defined as reviews with n_votes above the 75th percentile.
- 2. Feature Engineering: Three groups of features are extracted:
 - Syntactic: character count, word/sentence length, punctuation ratios, uppercase ratio.
 - **Semantic:** VADER sentiment (pos/neg/compound), TextBlob polarity/subjectivity, lexical diversity.
 - **Non-Textual:** rating, extreme rating indicator, number of comments, reading progress (has_read, has_started).

These are combined with a 100-dimensional TF-IDF vector (unigrams + bigrams).

- 3. Data Preparation: All features are standardized using StandardScaler. The dataset is split 80:20 for training and testing using stratified sampling.
- 4. Model Training:
 - Logistic Regression: with class balancing.
 - XGBoost: tree-based boosting with imbalance correction.
 - **Neural Network:** dense layers with ReLU, dropout, batch normalization, and adaptive learning rate scheduling.
- **5. Evaluation:** Models are compared on accuracy, precision, recall, F1, and ROC-AUC. A bar chart and confusion matrix are generated. Features are cached for fast re-runs.

Output: Performance metrics (console), png images, and cached feature files.

Note: Replace placeholders (image.jpeg-image4.jpeg) with your own figures. Images are automatically scaled to fit on a single A4 page.

```
GOODREADS REVIEW POPULARITY CLASSIFIER
Loading 100,000 reviews...
 100,000 loaded...
[OK] Loaded 100,000 reviews
Popularity: Top 25% (threshold: 1.0 votes)
is_popular
    72086
    27914
Name: count, dtype: int64
FEATURE ENGINEERING
Cleaning text...
Extracting features from 99,658 reviews...
 0/99,658
Adding TF-IDF...
[OK] 120 features extracted
PREPARING DATA
Train: (79726, 120), Test: (19932, 120)
TRAINING MODELS
1. Logistic Regression...
2. XGBoost...
3. Neural Network...
```

Figure 1: Feature Engineering and Data cleaning.

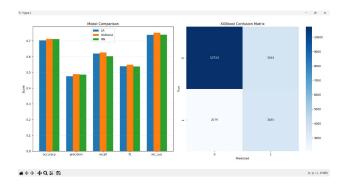


Figure 2: Confusion Matrix, BarPlots etc.



Figure 3: Epoch-Wise Training Outputs

Figure 4: Performance Metrics