# Sentiment Analysis

#### What is Sentiment?

- Sentiment = feelings
  - Attitudes
  - Emotions
  - Opinions
- Generally, a binary opposition in opinions is assumed
- For/against, like/dislike, good/bad, etc.

### What is Sentiment Analysis?

- Using NLP, statistics or machine learning methods to extract, identify, or otherwise characterize the sentiment content of a text unit.
- Sometimes referred to as opinion mining, although the emphasis in this case is on extraction.

## Challenges in Sentiment Analysis

- People express opinions in complex ways
- In opinion texts, lexical content alone can be misleading
- Intra-textual and sub-sentential reversals, negation, topic change common
- Rhetorical devices/modes such as sarcasm, irony, implication, etc.

## Techniques used for sentiment analysis

- Random Forest
- LSTM

#### Dataset

- Rotten Tomatoes movie review dataset
  - Has five labels :
    - Negative
    - Somewhat negative
    - Neutral
    - Somewhat positive
    - Positive
  - Training Data: 156060 sentences
  - Test Data: 66292

#### Dataset

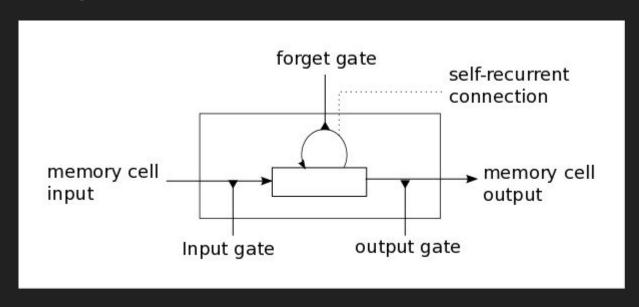
- Large Movie Review Dataset
  - Has two labels :
    - Positive
    - Negative
  - Training Data: 25000
  - Test Data: 25000

#### Random Forest

- Prediction is done from a combination of trees built on random subset of data and random feature set at each split in the tree.
- Features : n-gram and wordnet based features

#### LSTM

- Implemented Recurrent Neural Network (RNN) using the Long Short Term
   Memory (LSTM) architecture using Theano
- Vanishing Gradient Problem



#### LSTM Architecture

- Our model is composed of a single LSTM layer followed by an average pooling and a logistic regression layer
- From an input sequence x<sub>0</sub>, x<sub>1</sub>, x<sub>2</sub>, ..., x<sub>n</sub>, the memory cells in the LSTM layer will produce a representation sequence h<sub>0</sub>, h<sub>1</sub>, h<sub>2</sub>, ..., h<sub>n</sub>.
- This representation sequence is then averaged over all timesteps resulting in representation h.
- Finally, this representation is fed to a logistic regression layer whose target is the class label associated with the input sequence

#### Results

- Accuracy of LSTM
  - Rotten Tomatoes : -
  - IMDB: -82%
- Accuracy of Random Forest
  - Rotten Tomatoes : 65 %
  - IMDB: 70 %

#### **Statistics**

Train 0.0 Valid 0.142857142857 Test 0.208
The code run for 100 epochs, with 24.897038 sec/epochs
Training took 2489.7s

Activation	Validation Error
Sigmoid	0.14
ReLU	0.12
Leaky ReLU (alpha=0.3)	0.12*