## Master Thesis - Semester III

Explorative study of explainable artificial intelligence techniques for sentiment analysis applied for English language

by Rohan Kumar Rathore

Advisor: Dr. Anton Kolonin

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- Introduction
- Recap
- Exploration of Ruleex ANN-DT technique
- Next steps
- References

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- Artificial intelligence : Artificial agents achieving goals smartly
- Machine learning : Algorithmic models responsible for smartness
- Explainable artificial intelligence : Techniques to explain the models

- Sentiment analysis model development
  - Data: IMDB movie reviews
  - Model: multisentiment, context based, neutral-mixed capable, unbiased
- Semester I
  - Local interpretable model-agnostic explanations (LIME): Explaining with surrogate models
- Semester II
  - Layer-wise relevance propagation (LRP): Explaining with propagated weights relevance scores of the network
- Semester III (This work)
  - Artificial neural network decision tree algorithm (Ruleex ANN-DT): Explaining by extraction of decision trees from artificial neural networks

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## Exploration of Ruleex ANN-DT for sentiment analysis - I



- Selection of Attribute: Similar to CART algorithm of reducing the  $V_w = \sum_{k=1}^{2} \frac{n_k}{n} \operatorname{Var}(O_k)$ entropy
- Stopping criteria: Standard deviation or the variance is zero
- Statistical pruning technique: chi squared

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## Exploration of Ruleex ANN-DT for sentiment analysis - II

 Decision Tree representation (showing sub-section here) of a simple Sentiment Analysis NN model (features: tf-idf, layers: {500, 100, 30, 2}, training acc: 85.5%, testing acc: 82.8 %)



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- Improve the model to meet all the functional goal [in-progress]
- Explore bayesian neural networks for sentiment analysis
- Paper readiness

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