



# Deep Learning and Word Embeddings Created from Online Course Reviews for Sentiment Analysis

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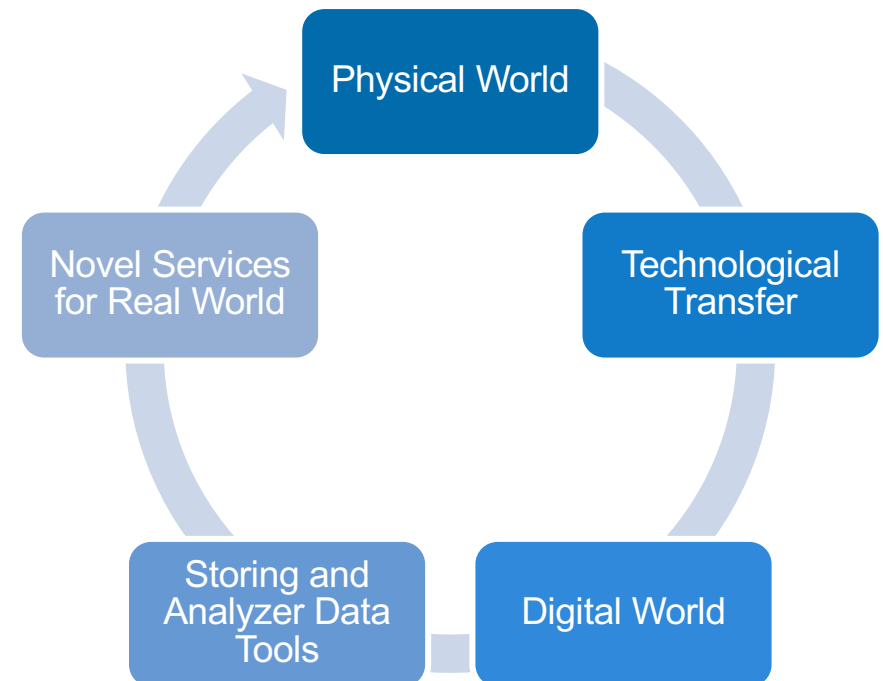
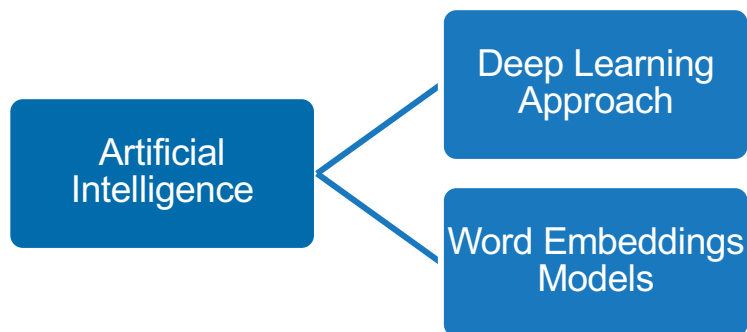




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## Motivation

- Today more and more people express their opinions in online platforms
- The use of Artificial Intelligent approaches has showed remarkable improvements in many domains
- Recent methods to capture and represent knowledge are Word Embeddings



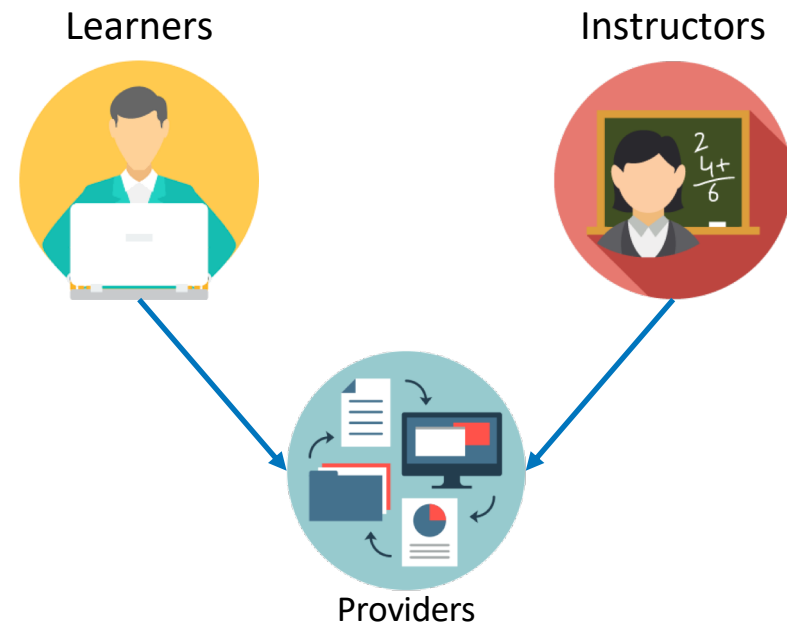


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## Reference Domain: E-Learning

- There is a technological transfer of teaching material, learning tools, lessons in e-learning platforms
- Students express their opinions about courses
- The analysis of students' opinions is useful to evaluate courses quality and to make courses recommendation



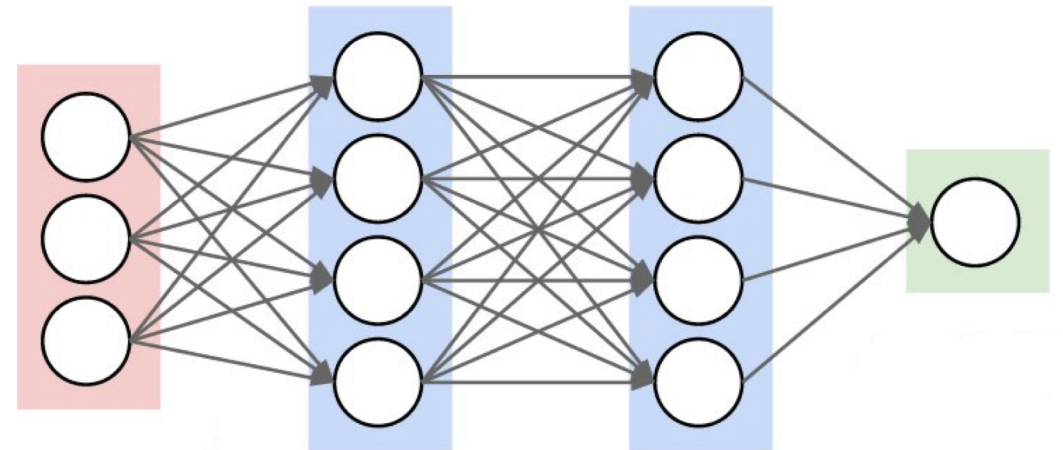


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# Deep Learning

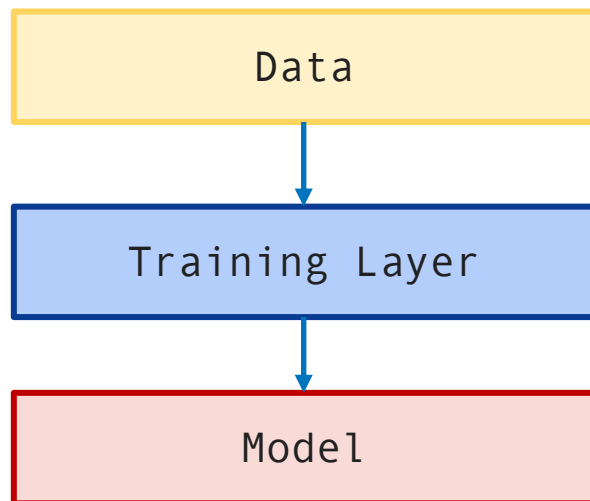
- The Deep Learning refers to Machine Learning methods inspired by biological nervous systems that are able to learn from data
- They have nodes that simulate neurons functions
- The output of a network depends on connections between network layers and functions that nodes implement





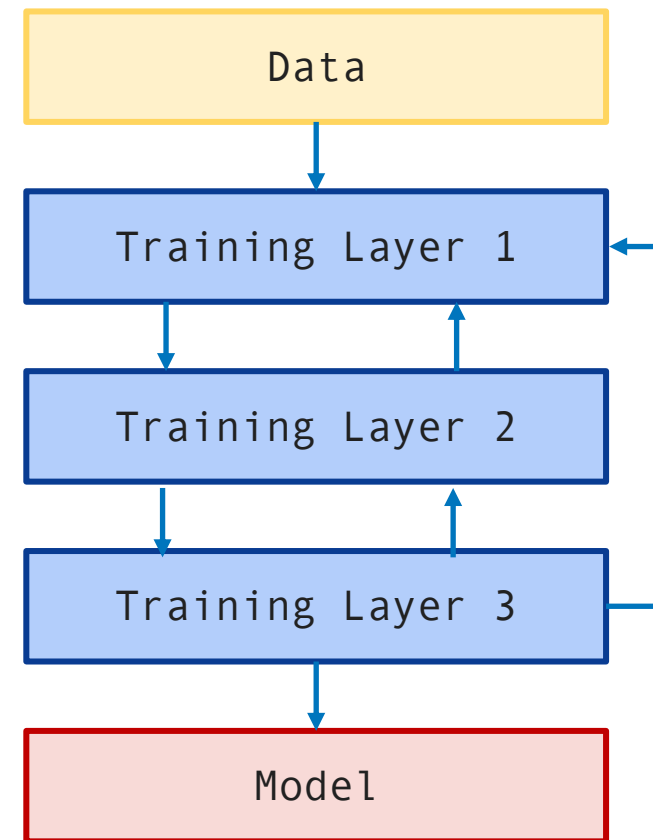
# Deep Learning VS Common Machine Learning

Common approaches



- In a Deep Learning approach each layer can see what others did in order to improve results
- Common approaches: Random Forests, Simple Neural Networks, Support Vector Machines

Deep Learning approach

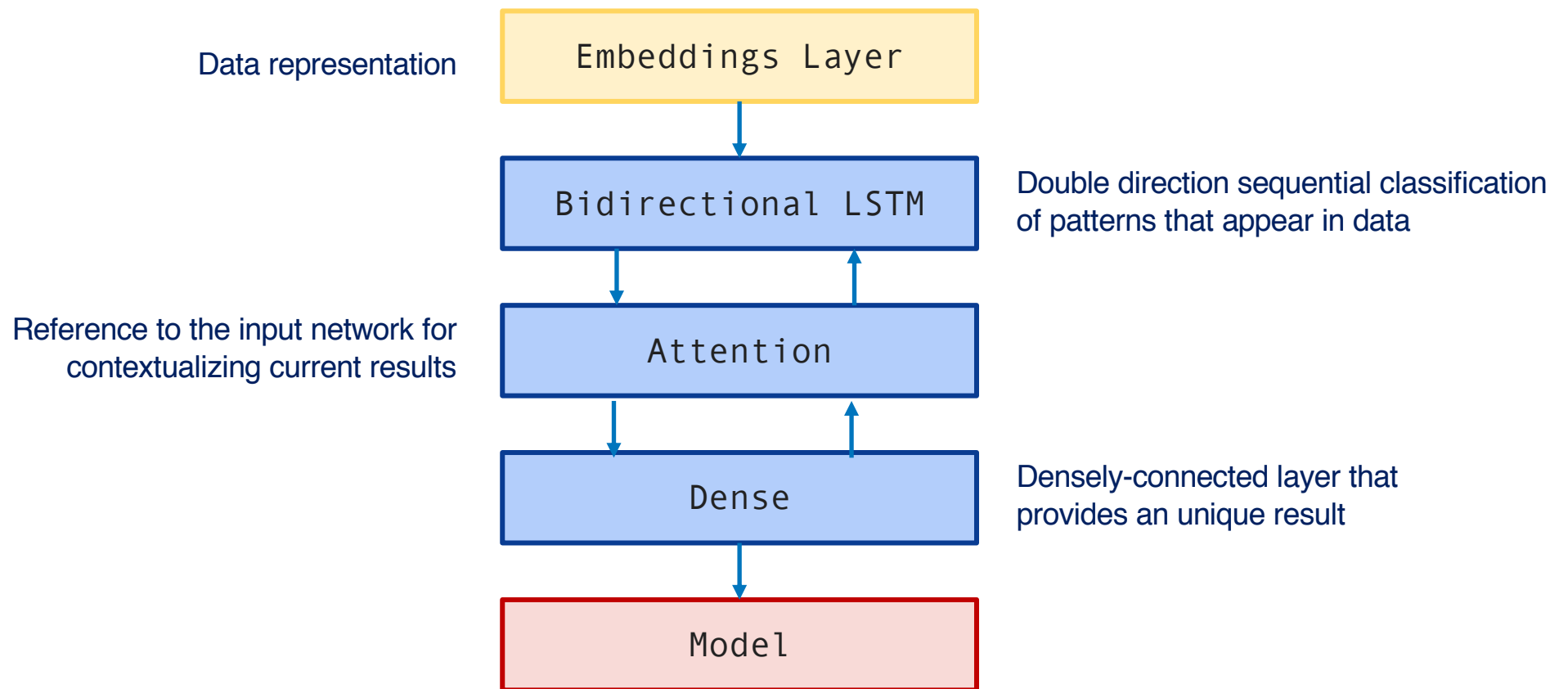




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## Our Deep Learning Model



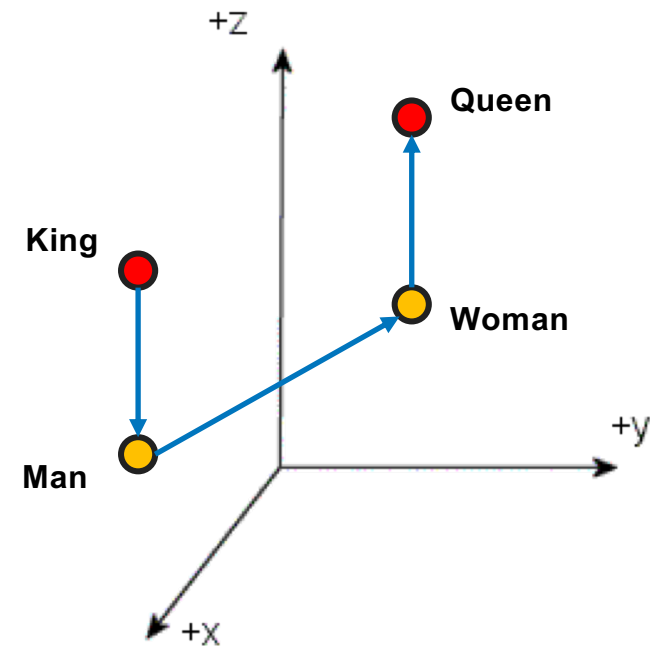


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## Word Embeddings

- Words Embeddings are numerical vectors that represents words
- They capture the syntactic and semantic of words functions



$$\text{King} - \text{Man} + \text{Woman} = \text{Queen}$$



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# Word Embeddings Generators



**word2vec**

*fast***Text**

**GloVe**





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## The COCO Dataset



43K Courses



16K Instructors



2,5M Learners



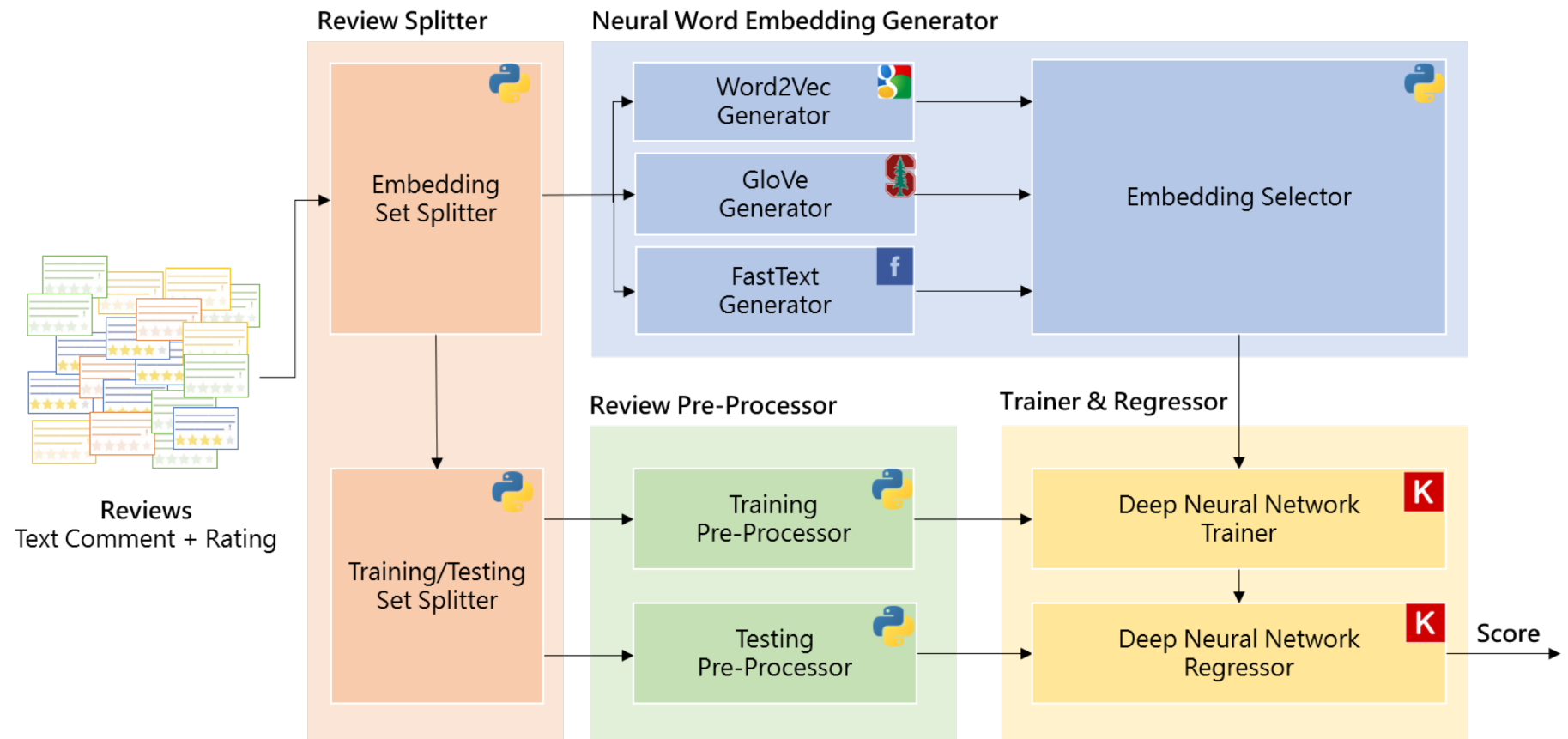
4,5M Ratings



1,2M Reviews

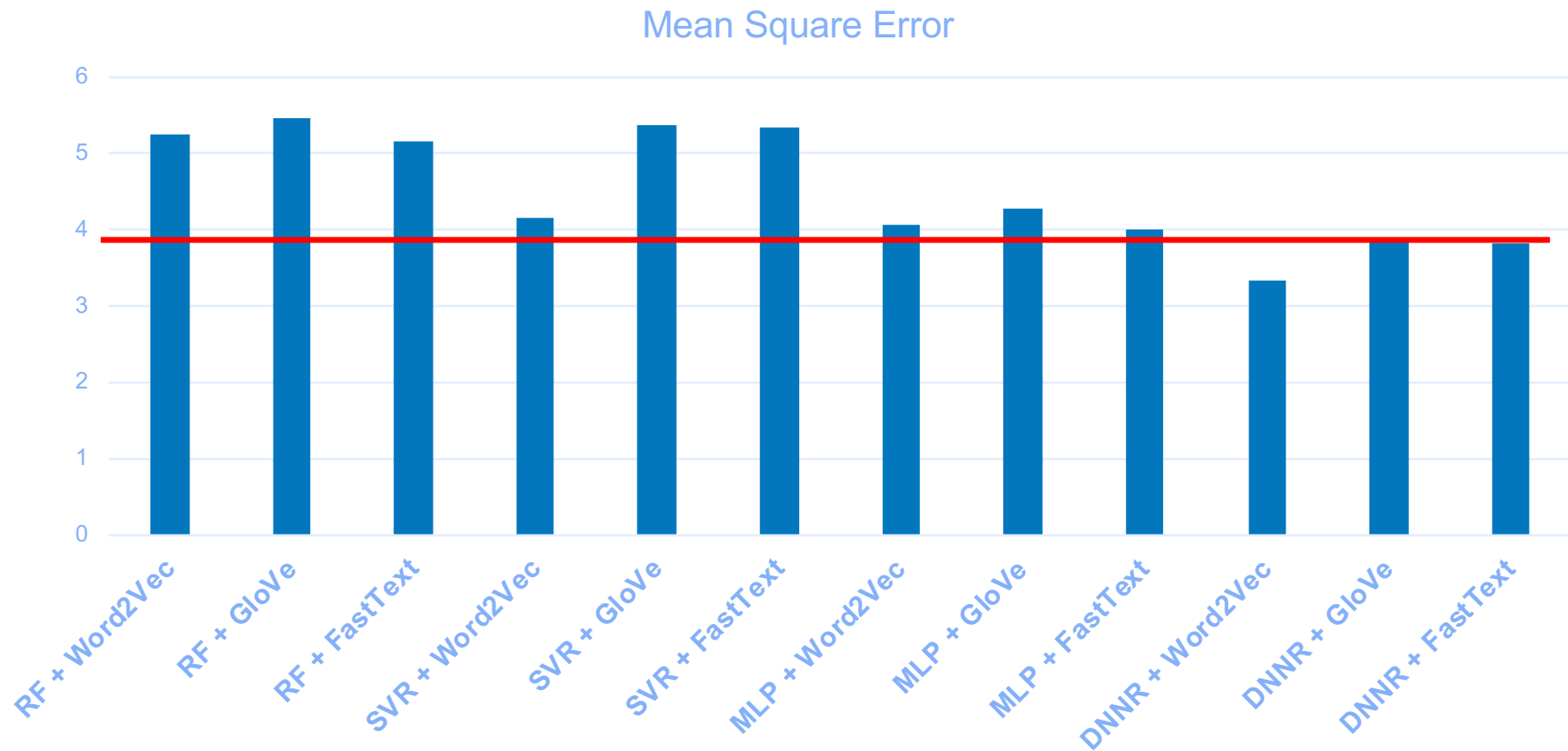


## Our Approach





## Deep Learning Improvements

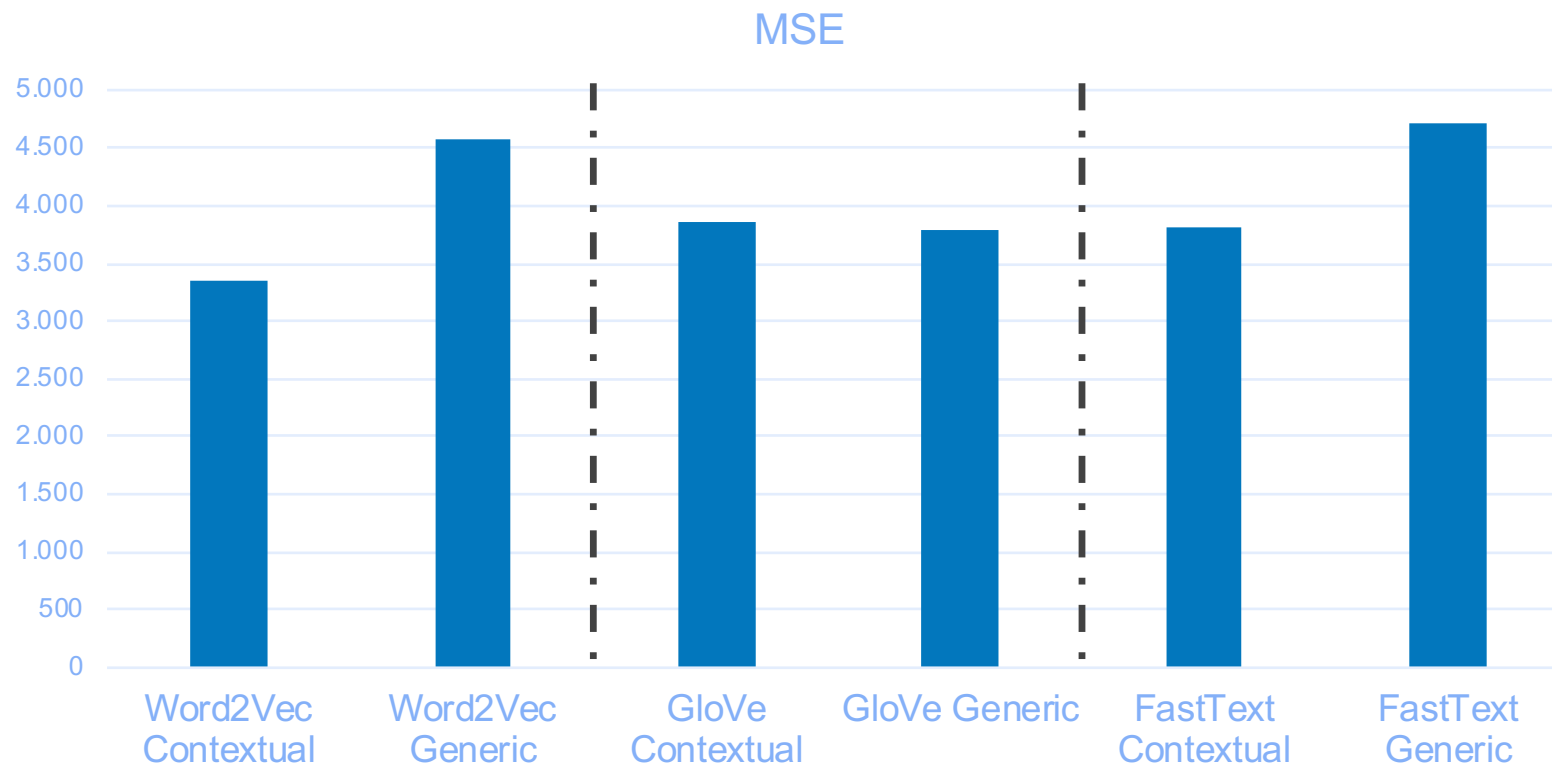




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## Word Embeddings Comparison





Thank you for your attention

