

# Analyzing Political Bias through A User-Friendly Interface

Colin Lightfoot

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# Problem

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- 2 Some hide facts to present a specific argument.
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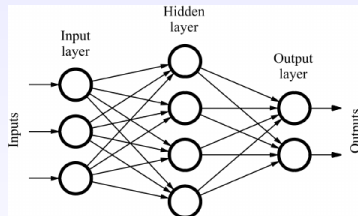
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- Iyyer et al. created political bias classifiers using Recursive Neural Network (RNN) models with Long Short Term Memory (LSTM) nodes with a high degree of accuracy.[1]
- Stanford researchers Arkajyoti Misra and Sanjib Basak showed that RNNs with LSTM nodes can also predict implicit political bias.[2]

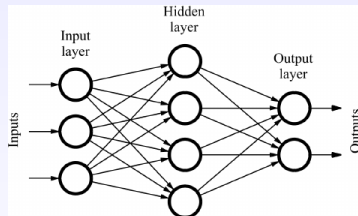
# Introduction to Neural Networks

- Algorithms modeled after the brain.
- Organized into layers with interconnected nodes.
- Weighted edges connect nodes.
- Layers are successively computed based off computations from the lower layers.
- Nodes transform input using an activation function and then outputs result.



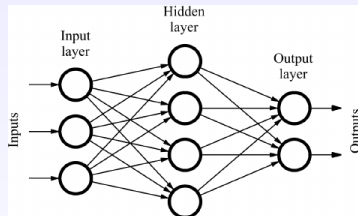
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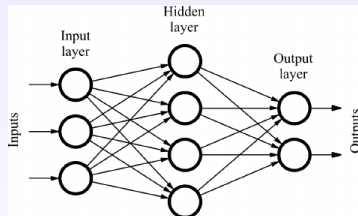
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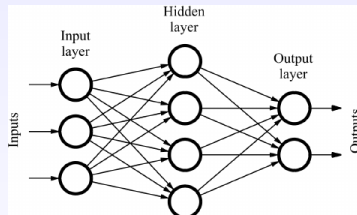
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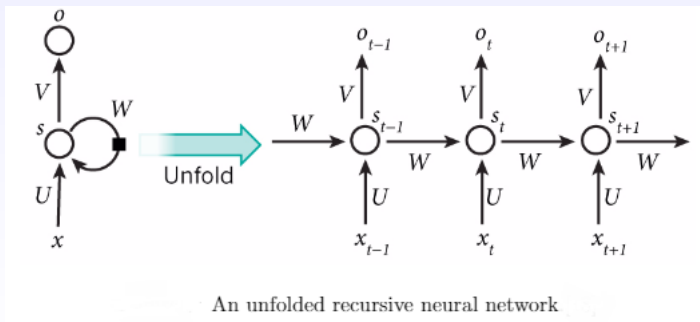
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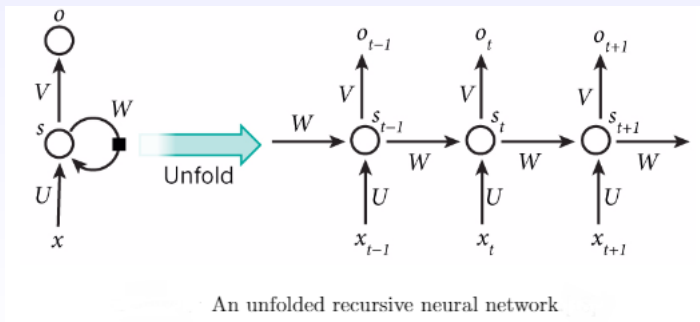
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- Designed to make use of sequential information.
- Perform same computations for every element in a sequence.
- The output is dependent on the model's previous recurrences.
- RNNs can have dependent output since nodes hold previous calculations.



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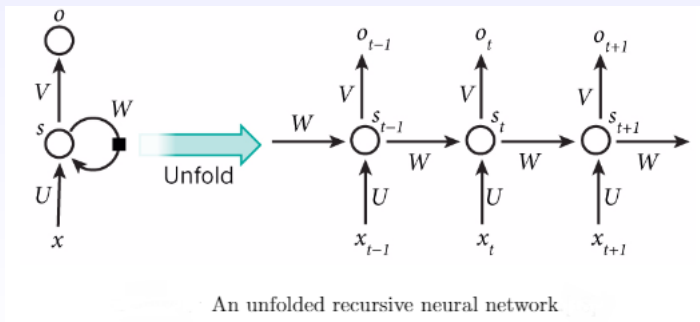
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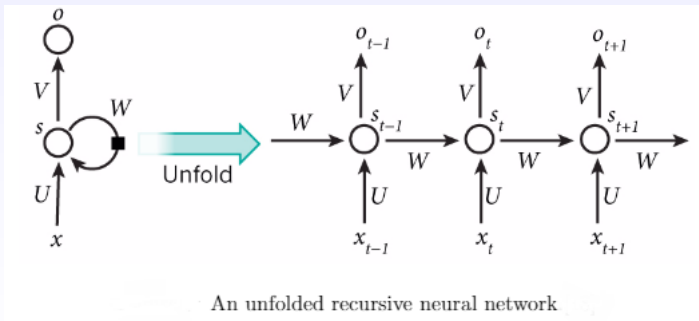
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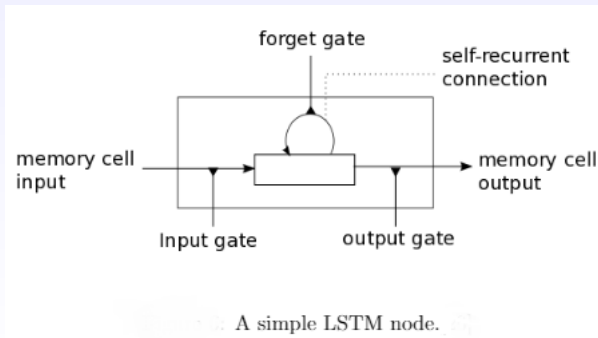
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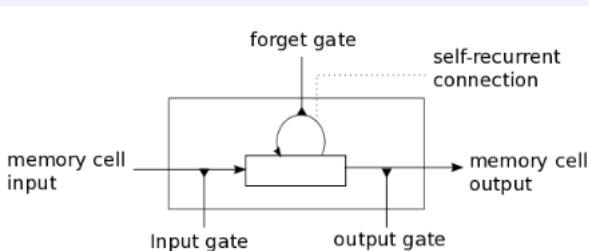
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- Prevents exploding and vanishing gradient dilemmas during edges' weight training.
- Has a chance to "forget" its current state.
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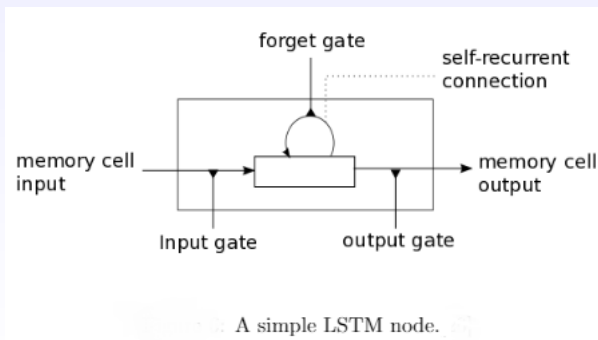
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A simple LSTM node.

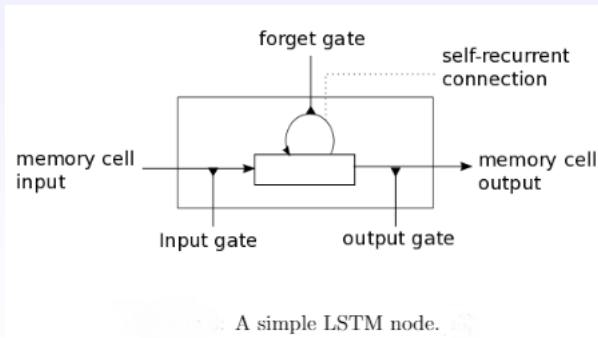
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# Implementation

- User searches a news topic.
- Web scraper searches queried article results.
- Articles are run through RNN.
- Cycle repeats until RNN finds both a liberal and a conservative article.

## Fair & Balanced News

What news do you want to search for?

Search

Most Popular Liberal View

Most Popular Conservative View

The user interface for my project.

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Possible Noise:

- Various-sized datasets
- Complexity of language
- Small sentence sizes

- Continue tuning RNN
- Collect larger datasets
- Scrape more news outlets
- Run against other algorithms
- Better user interface



# Conclusion

Thank you professors Deverick and Lewis, as well as my friends and family for helping me complete this project! I was able to apply knowledge learned throughout my time here to create a useful and easy-to-use webpage that helps people understand the political atmosphere surrounding a news event.



Mohit Iyyer, Peter Enns, Jordan Boyd-Graber, Philip Resnik.  
*Political Ideology Detection Using Recursive Neural Networks*  
<http://www.aclweb.org/anthology/P/P14/P14-1105.pdf>



Arkajyoti Misra and Sanjib Basak. *Political Bias Analysis*  
<https://cs224d.stanford.edu/reports/MisraBasak.pdf>