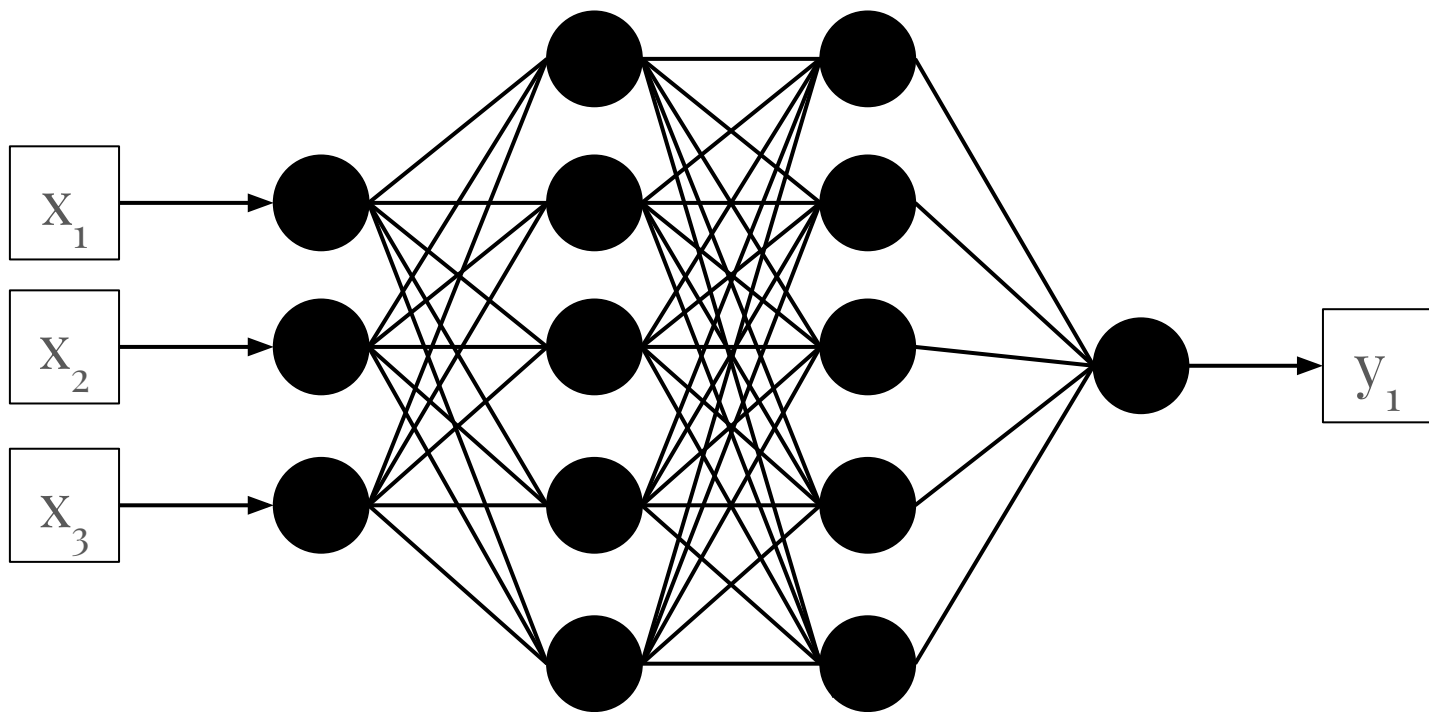


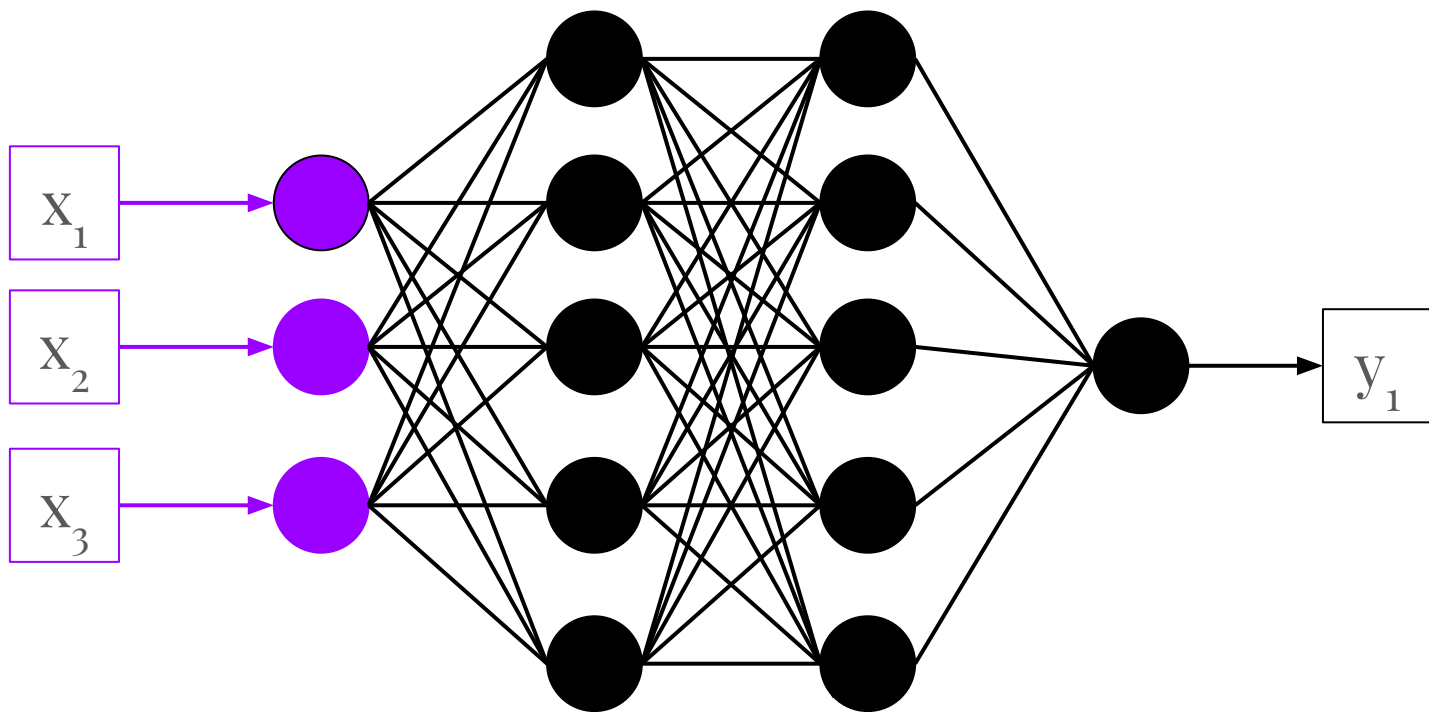
Transformers and Large Language Models (LLMs)

Dr. Julie Butler
DSC 340 Week 13 Slides

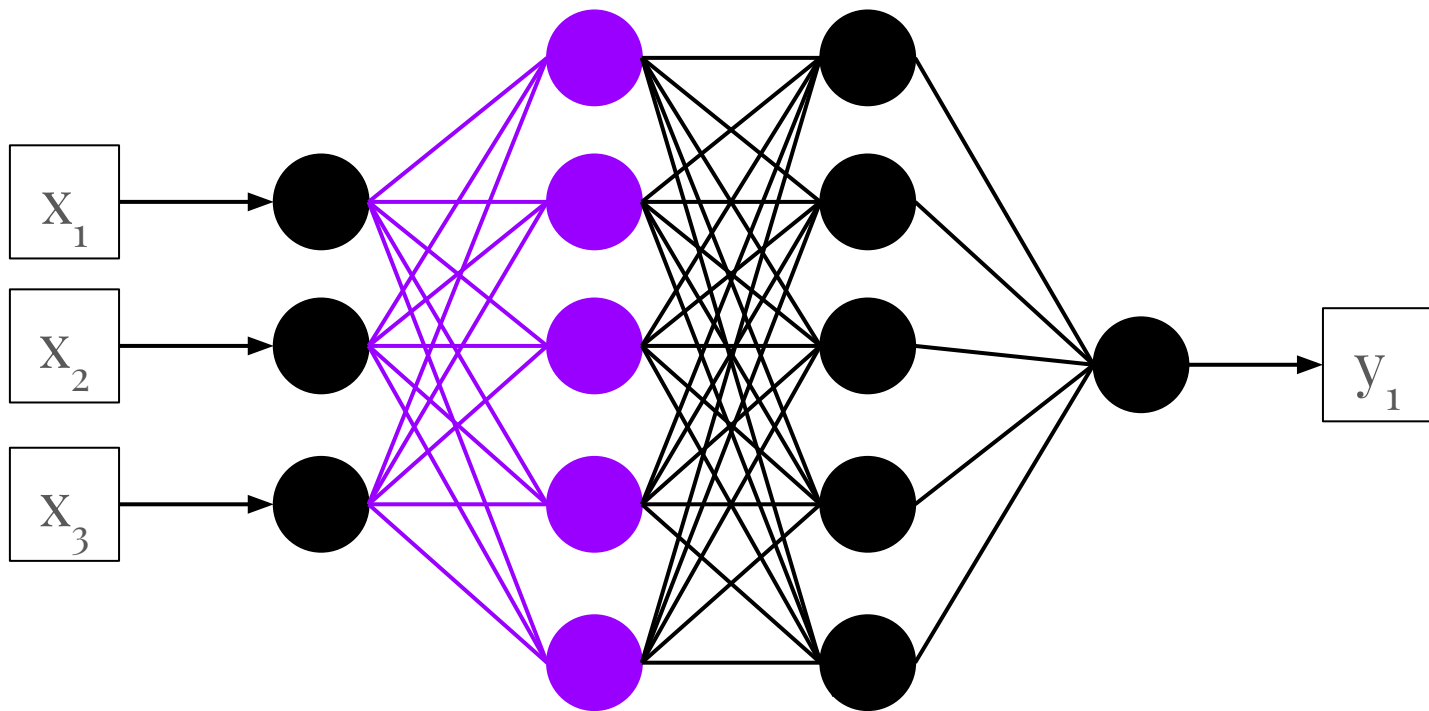
Neural Networks



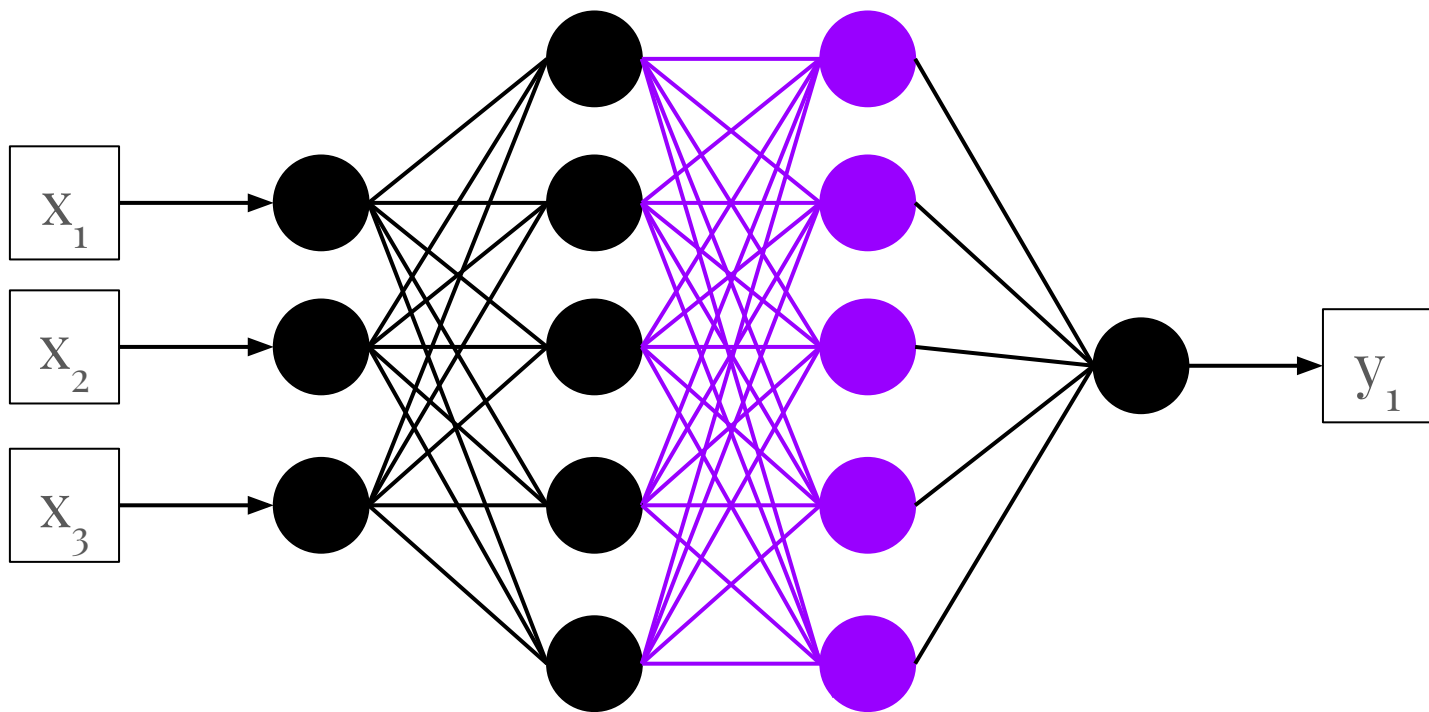
Feedforward Neural Network



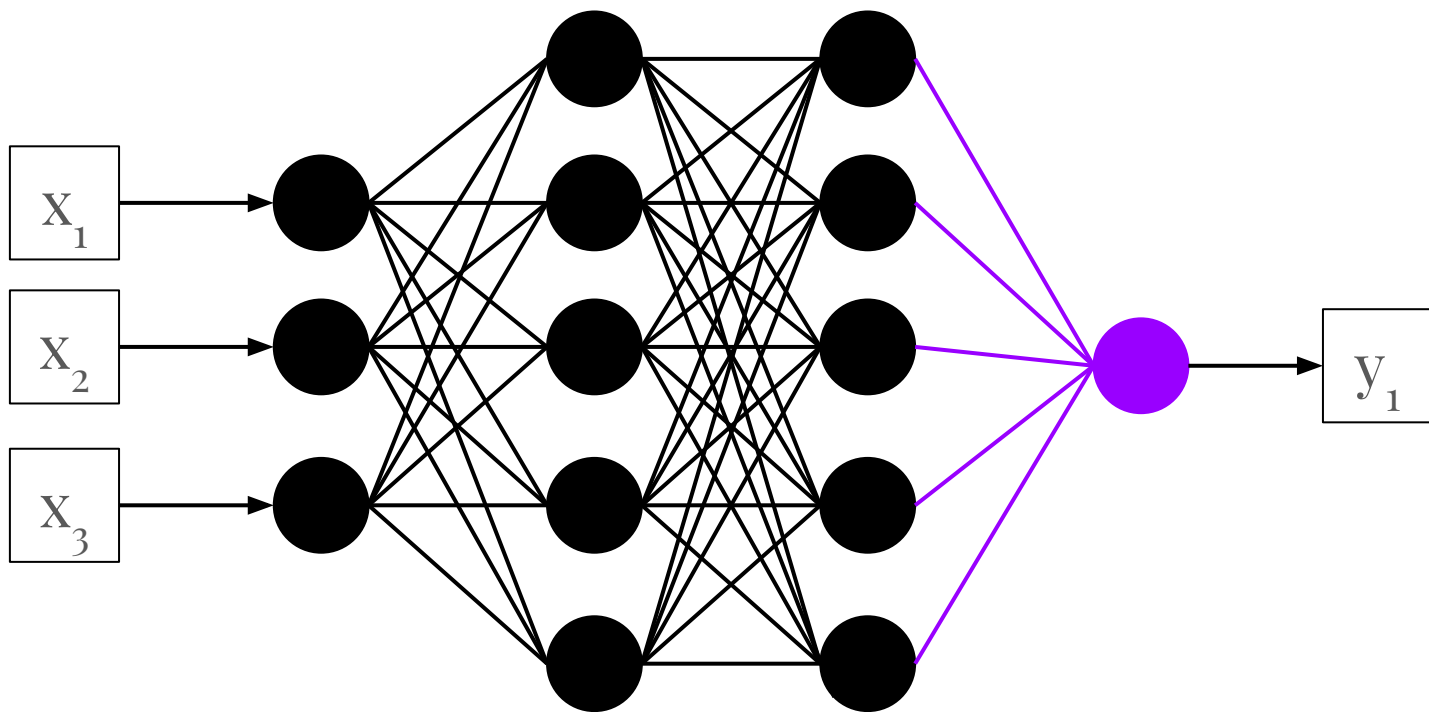
Feedforward Neural Network



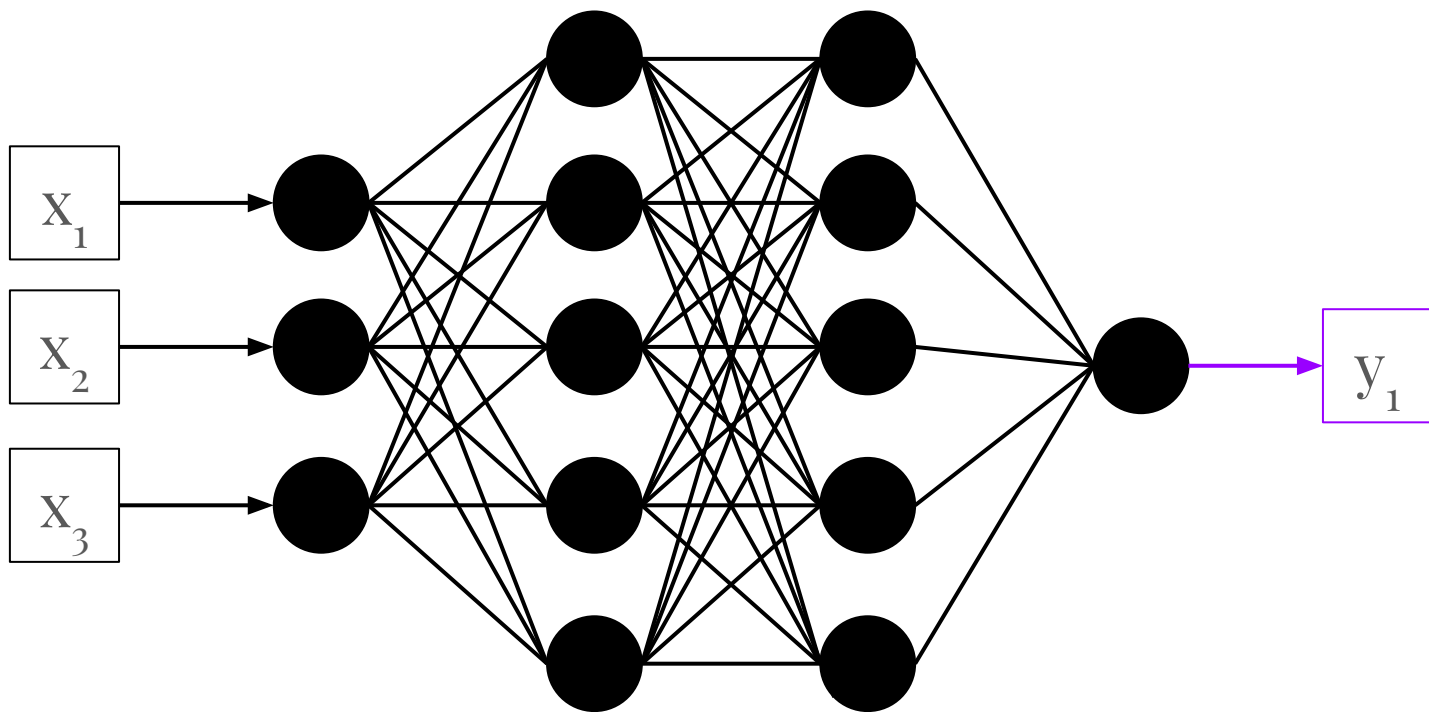
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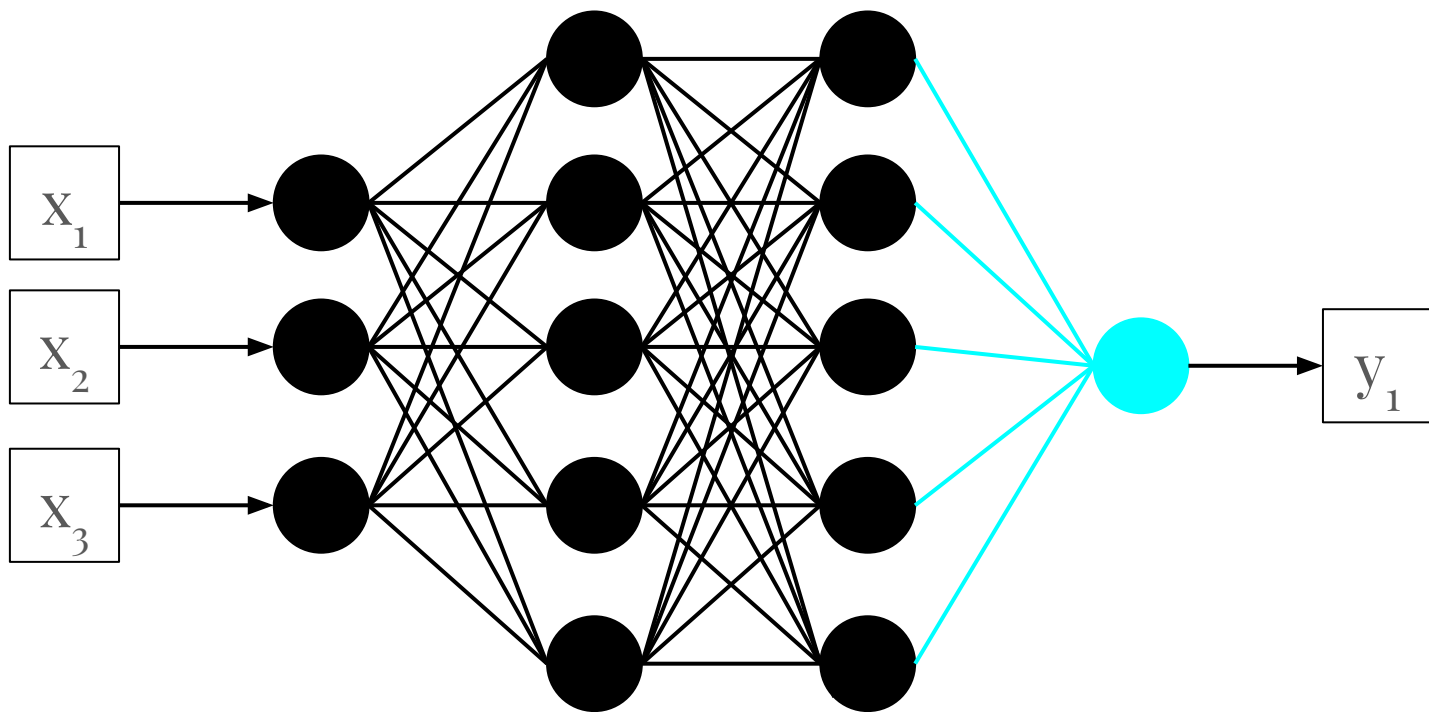
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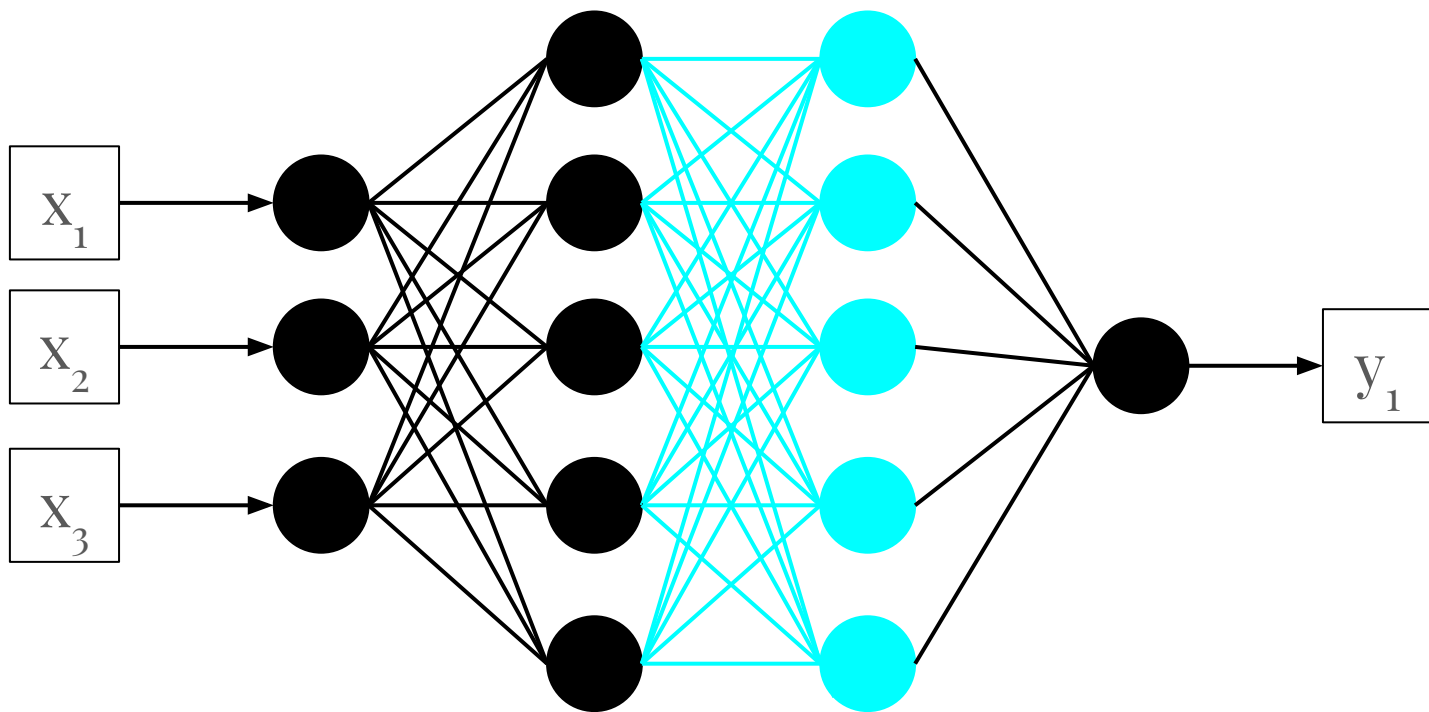
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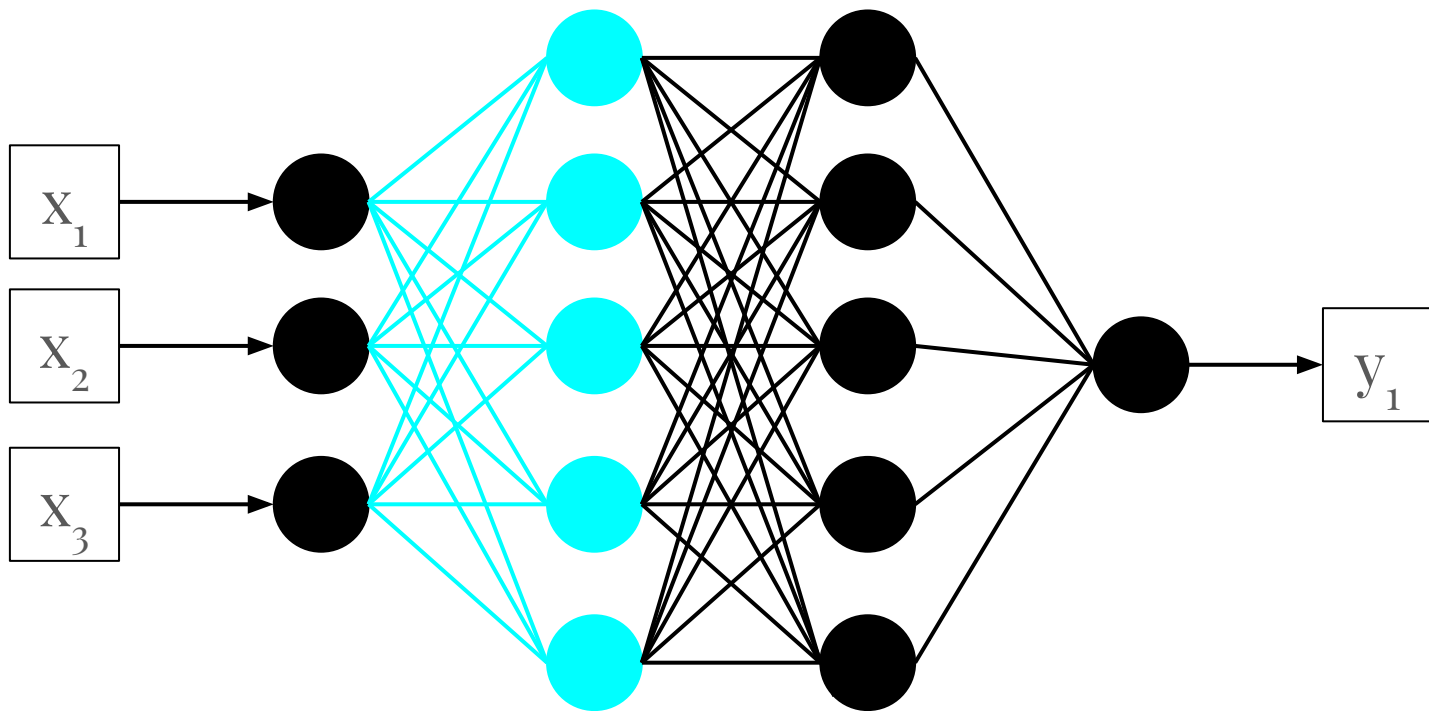
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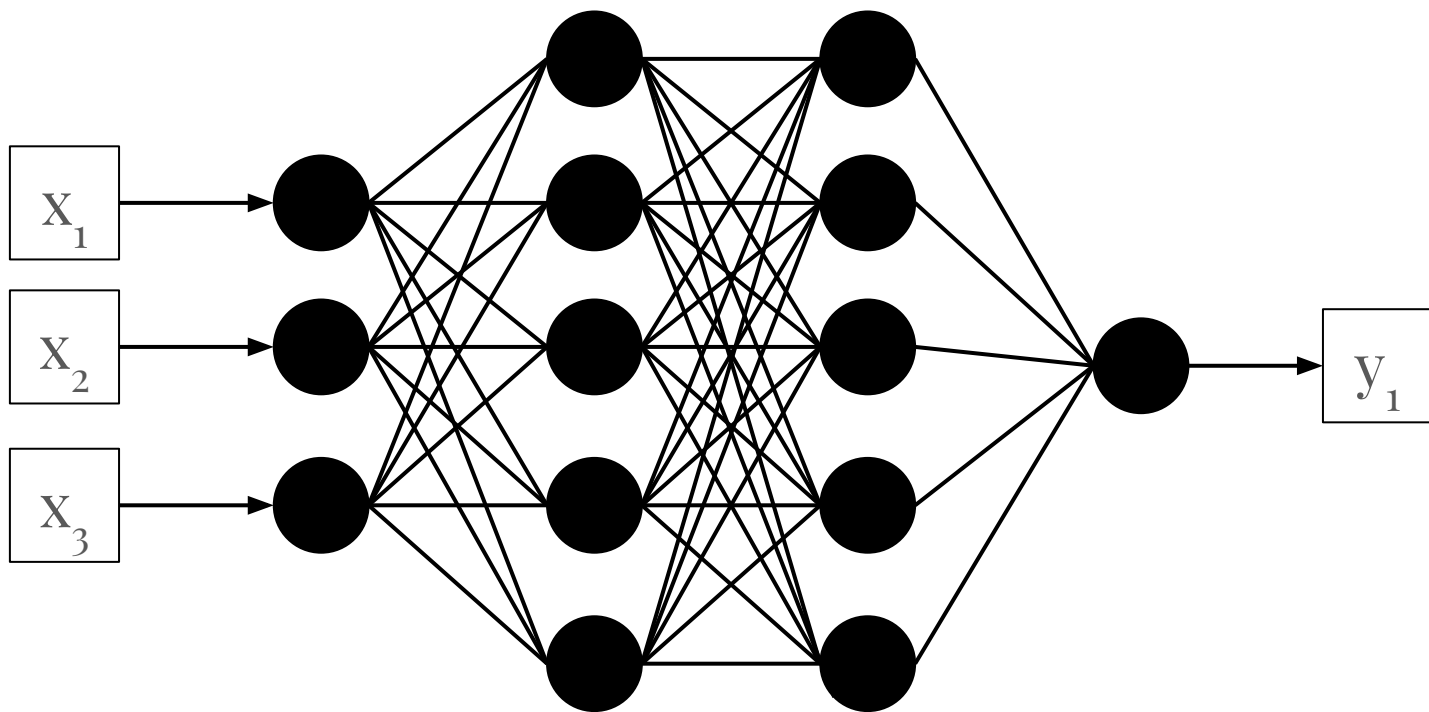
Feedforward Neural Network



Feedforward Neural Network

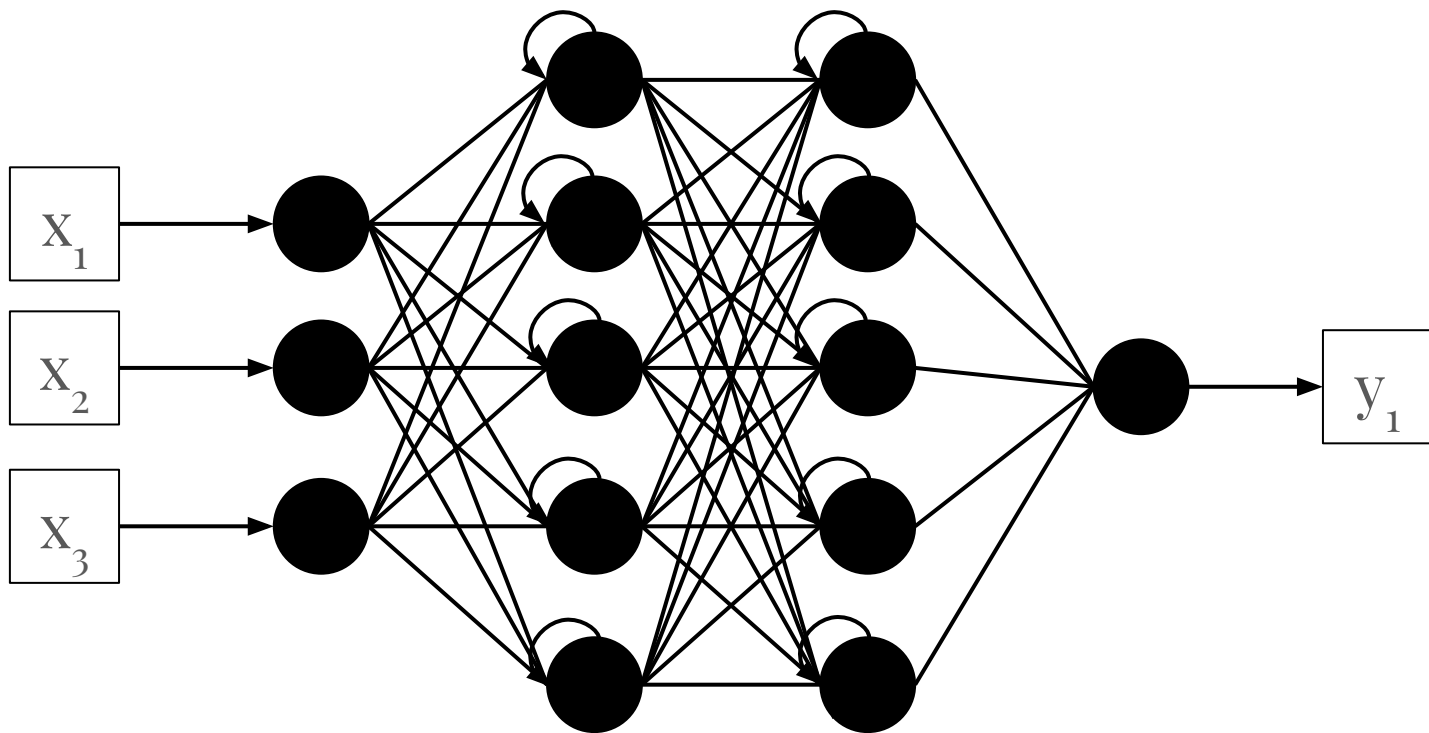


Feedforward Neural Network

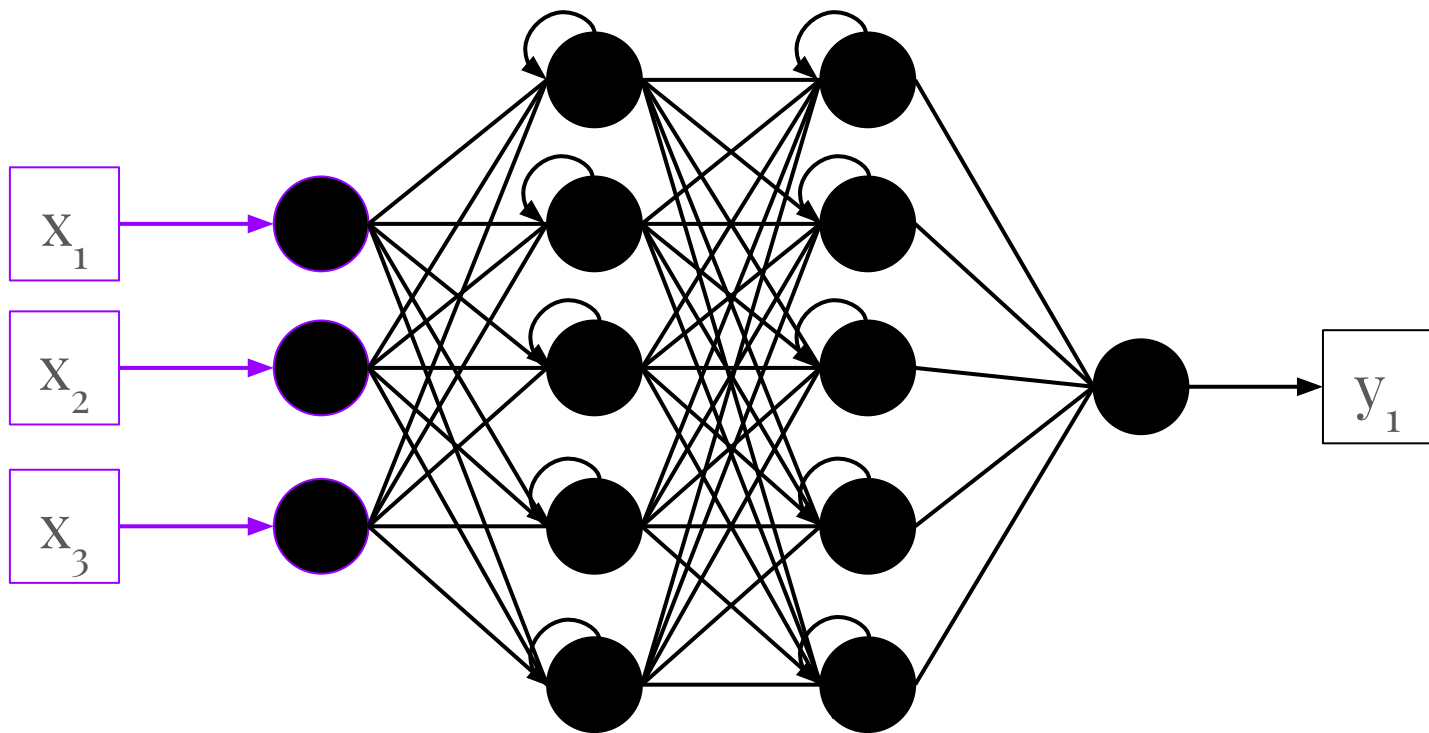


Feedforward Neural Network

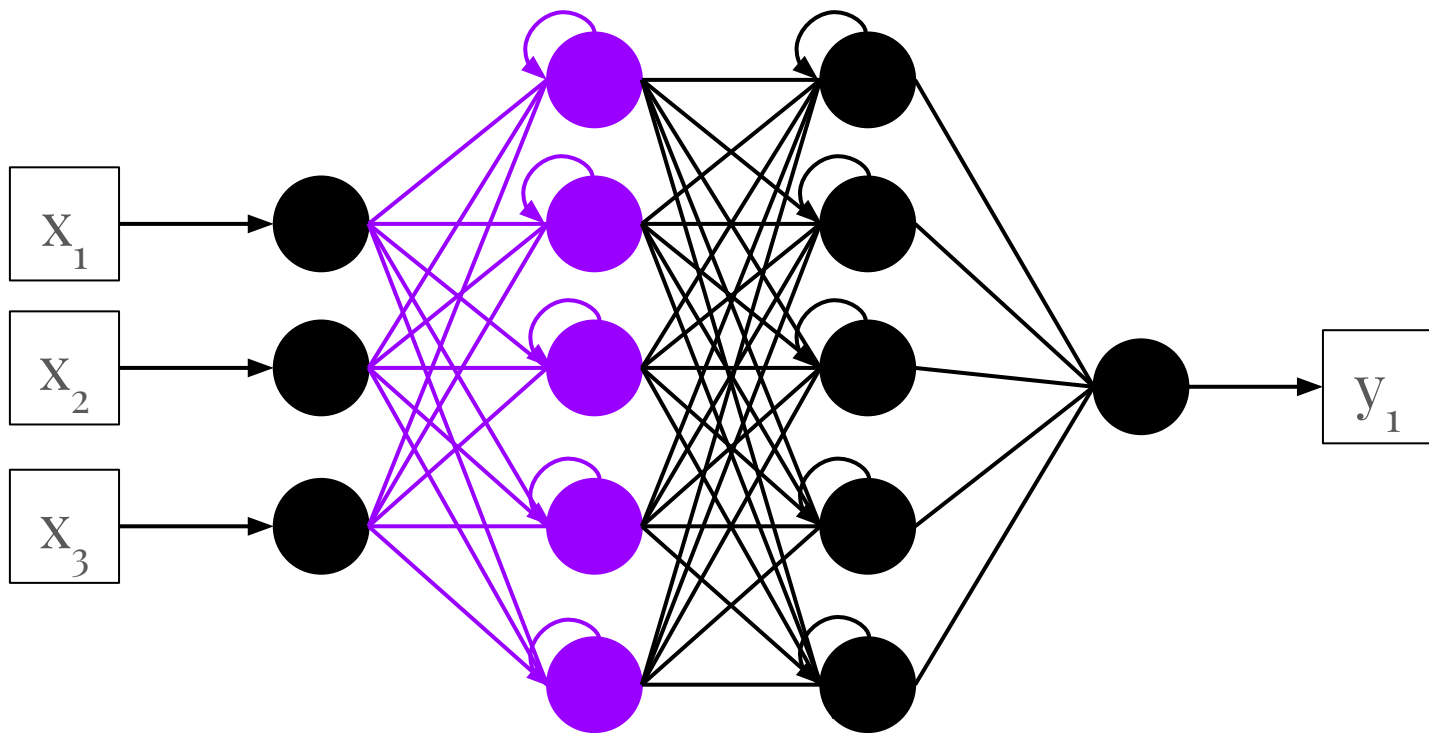
Recurrent Neural Networks



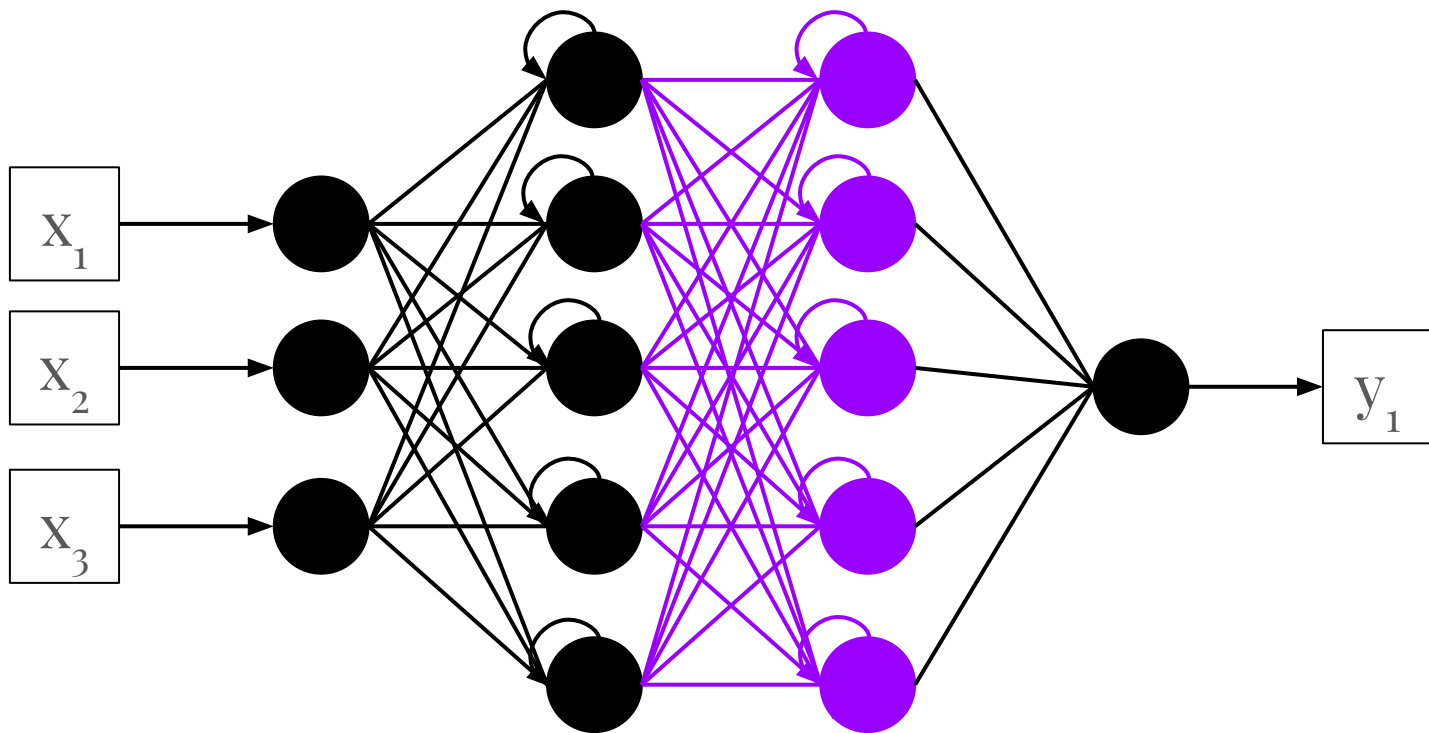
Simple Recurrent Neural Network



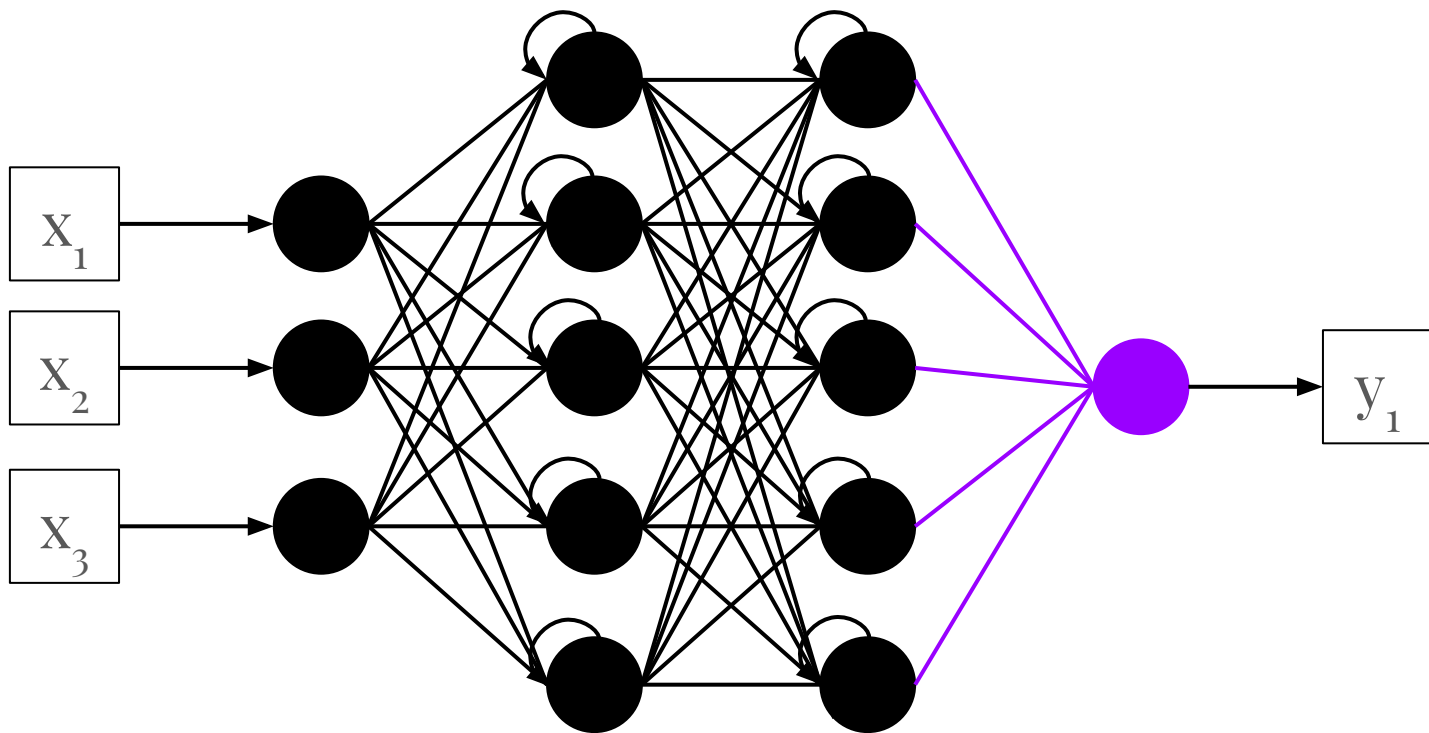
Simple Recurrent Neural Network



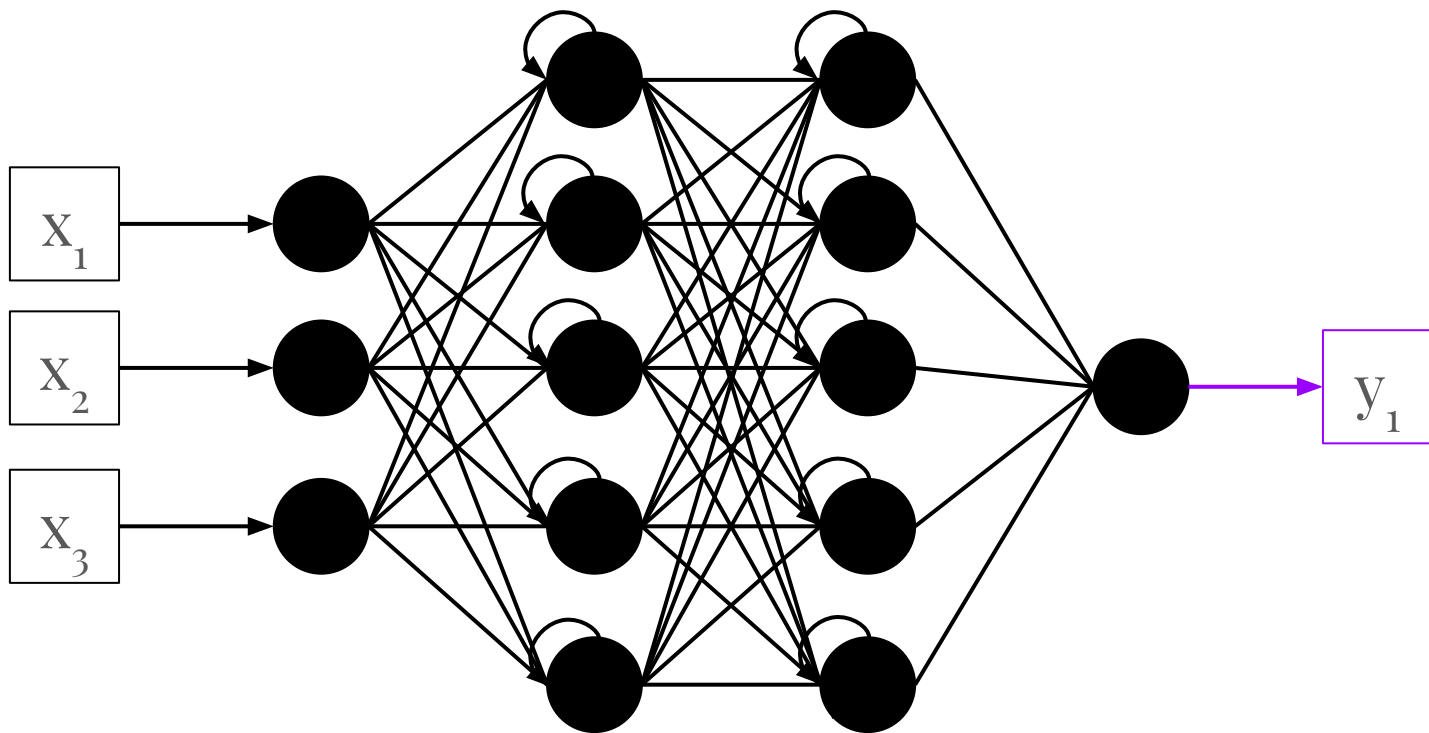
Simple Recurrent Neural Network



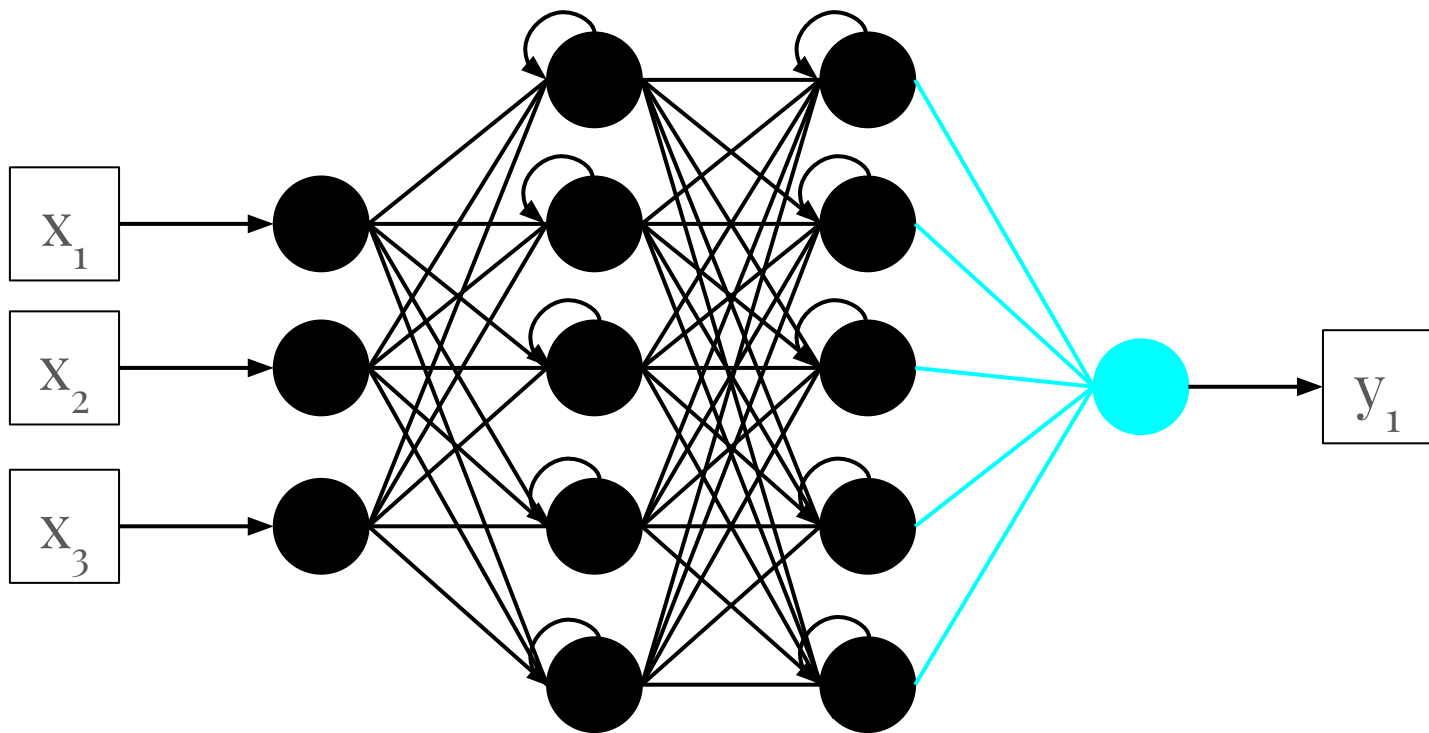
Simple Recurrent Neural Network



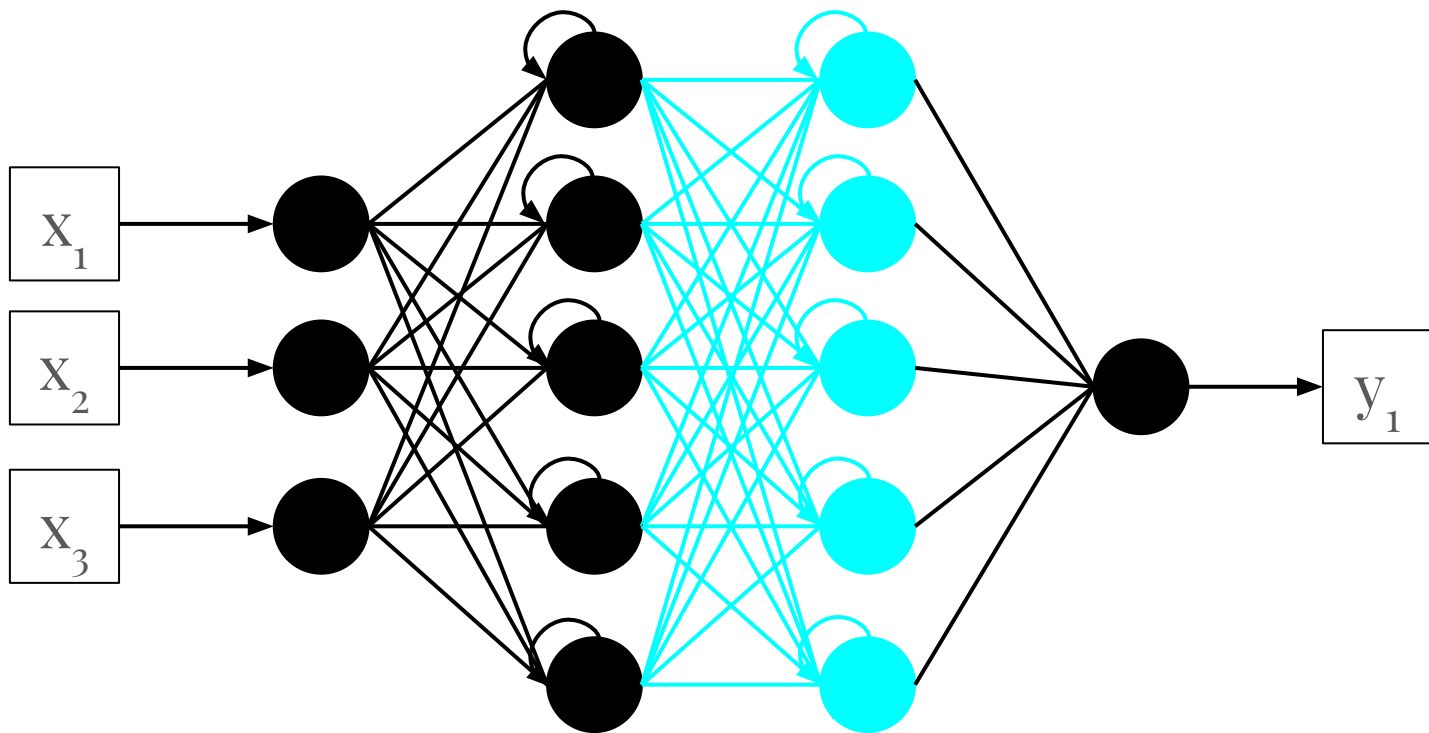
Simple Recurrent Neural Network



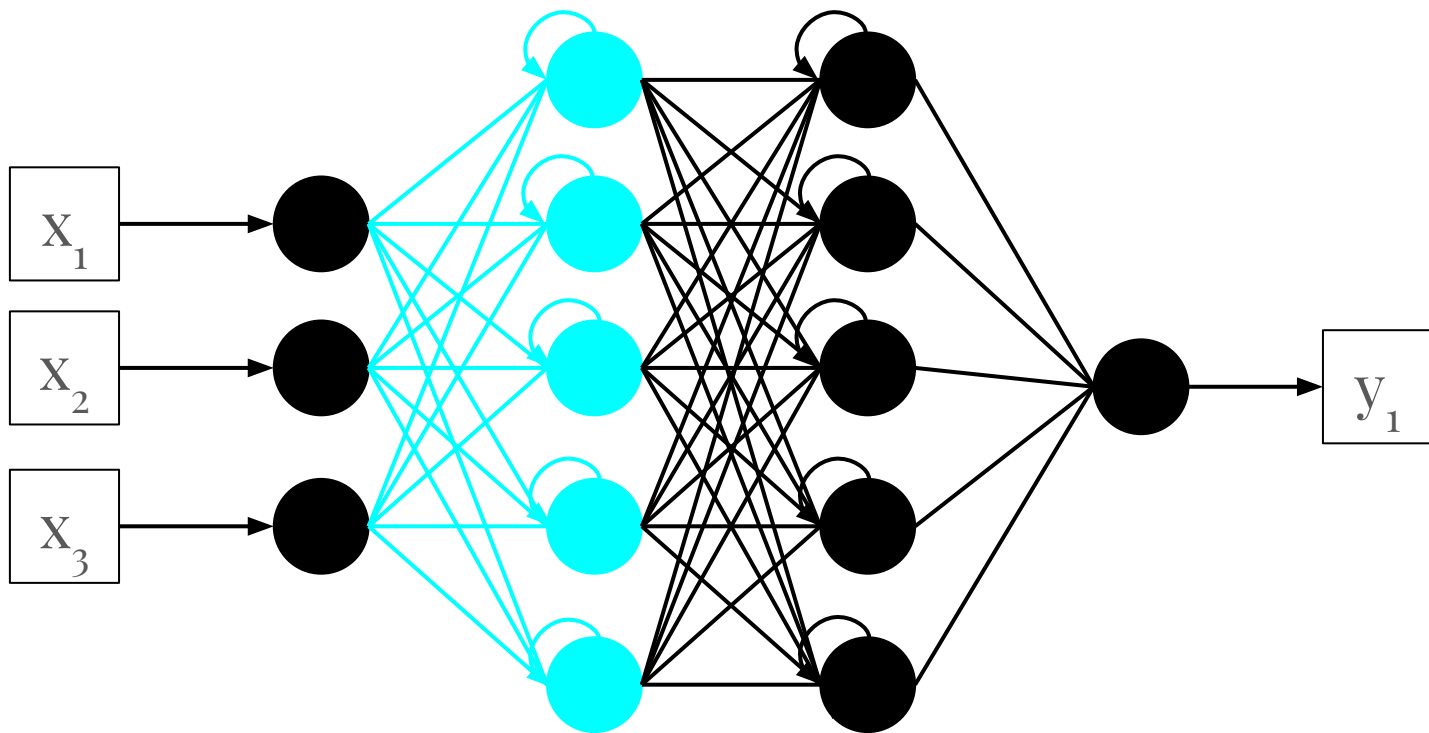
Simple Recurrent Neural Network



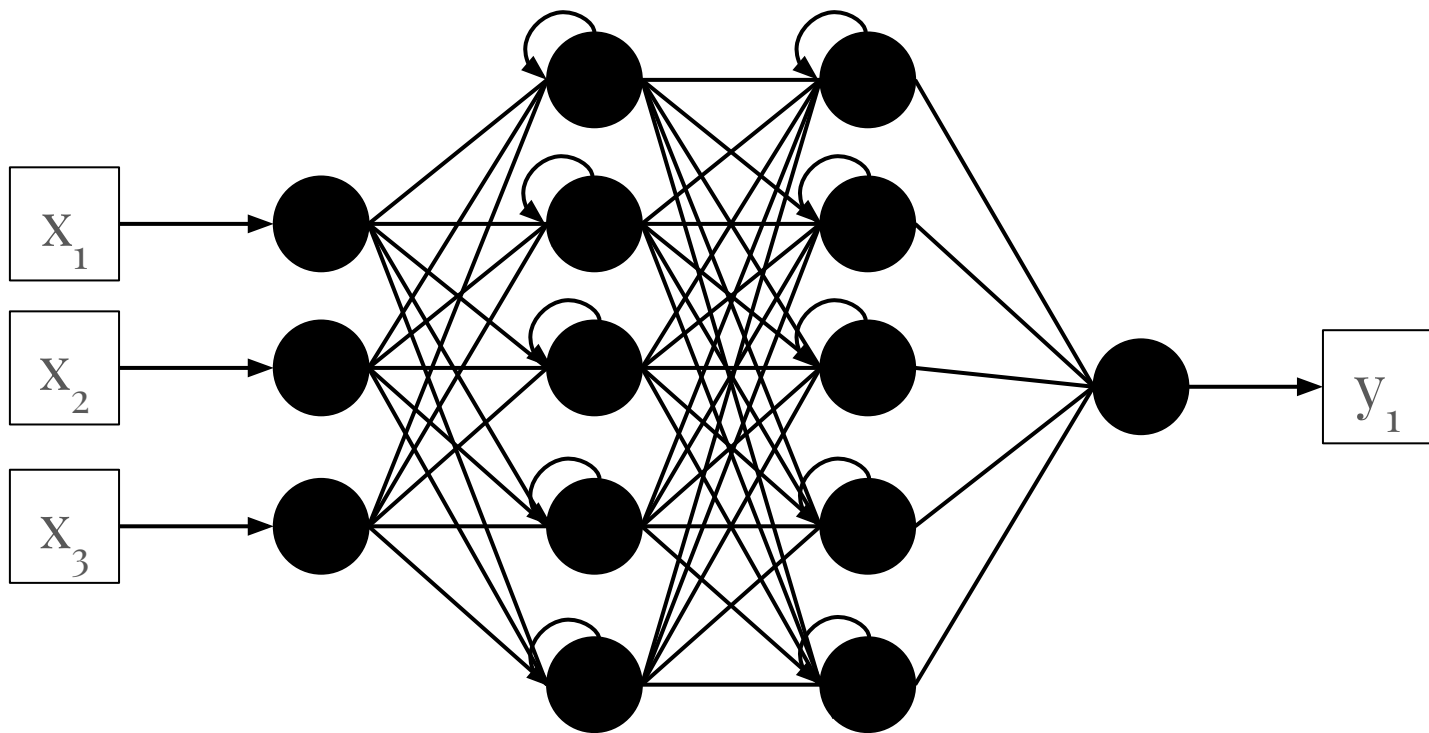
Simple Recurrent Neural Network



Simple Recurrent Neural Network

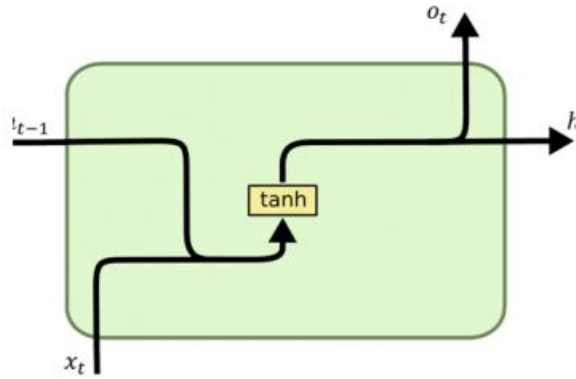


Simple Recurrent Neural Network

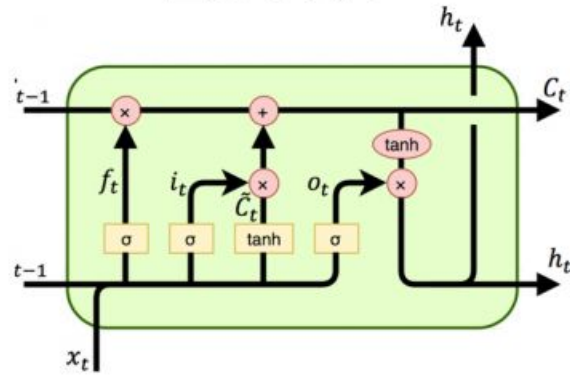


Simple Recurrent Neural Network

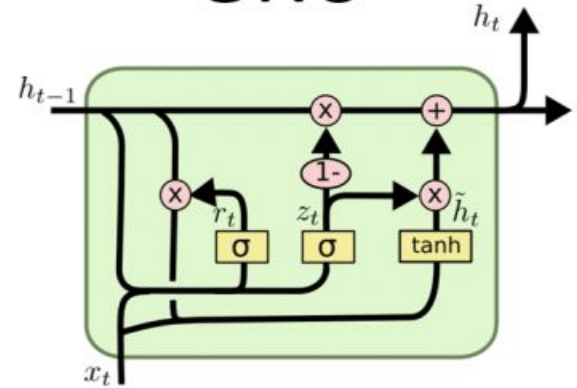
RNN



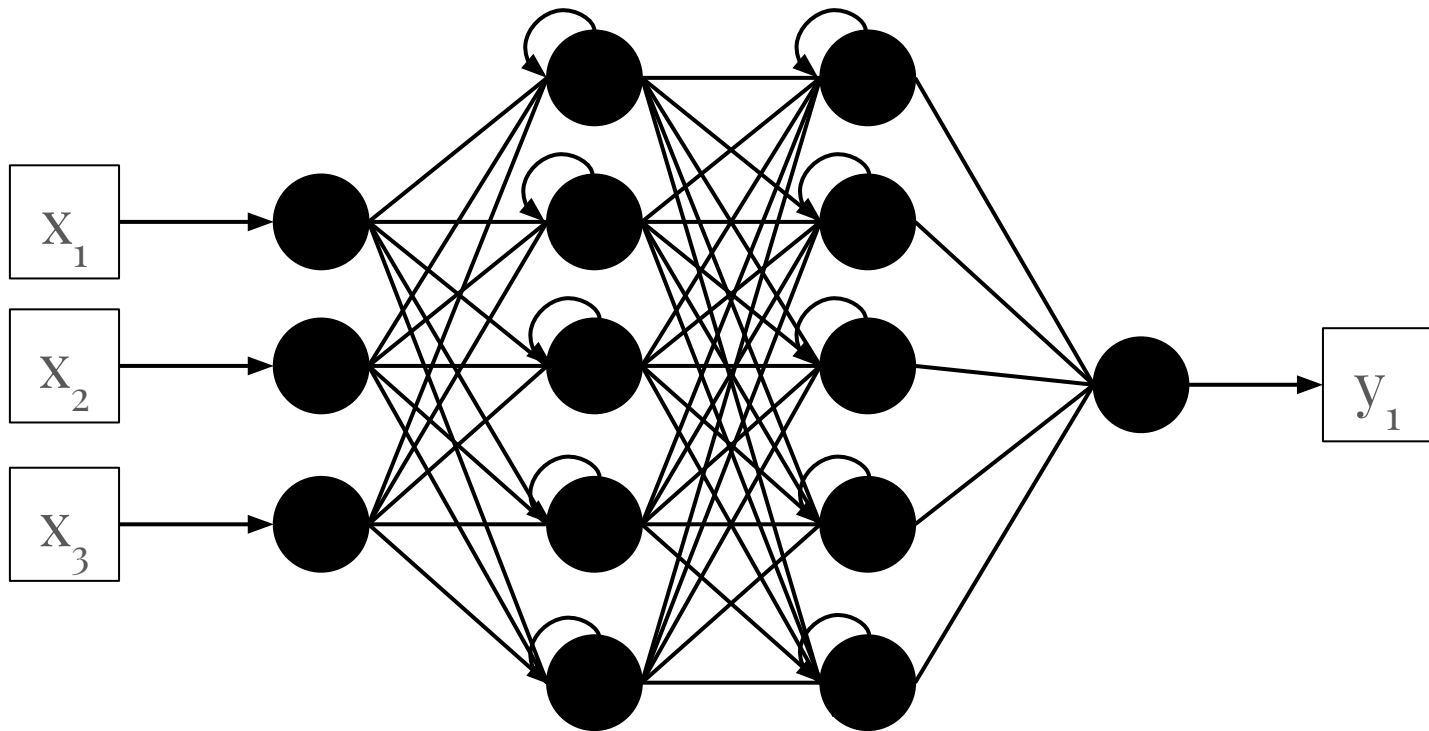
LSTM



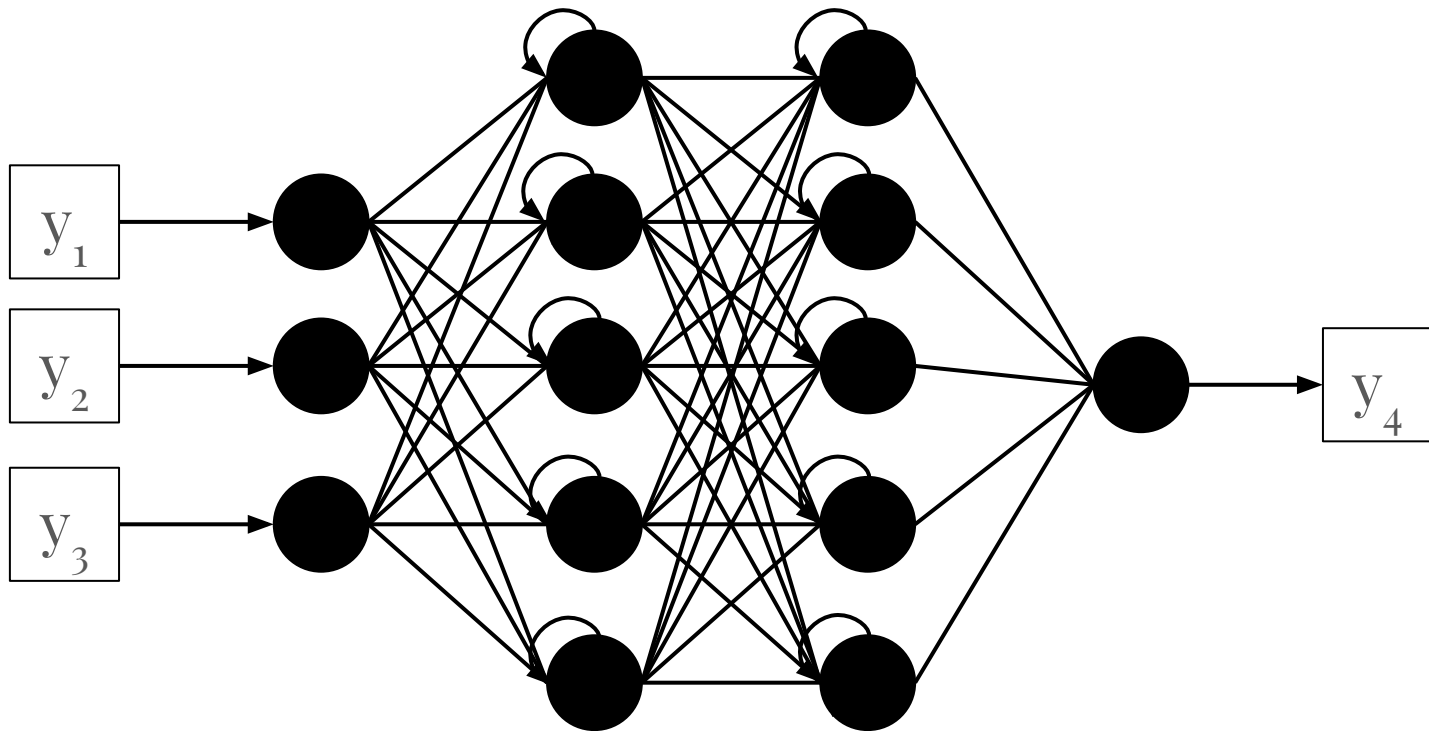
GRU



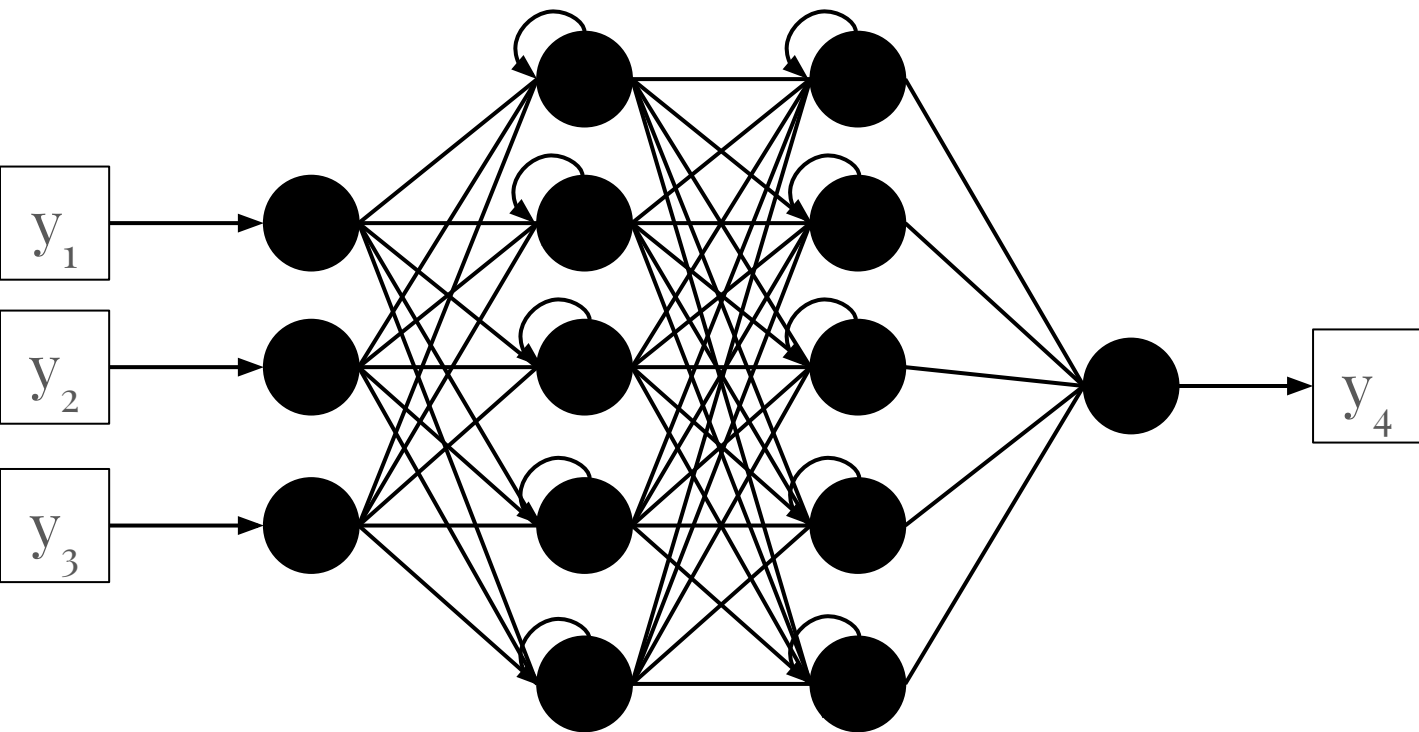
More Complicated Recurrent Neural Network Versions



Normal (Point-Wise Input)



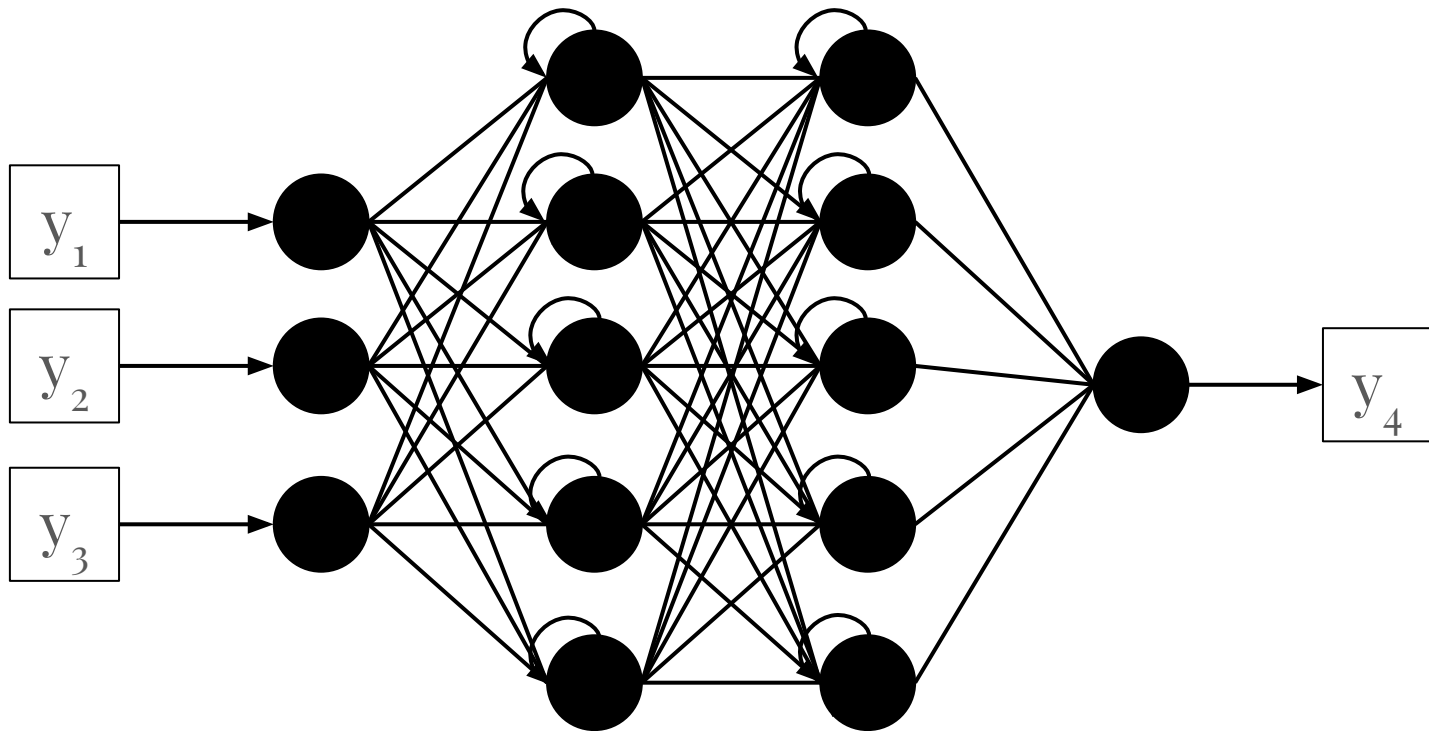
Time Series Formatting



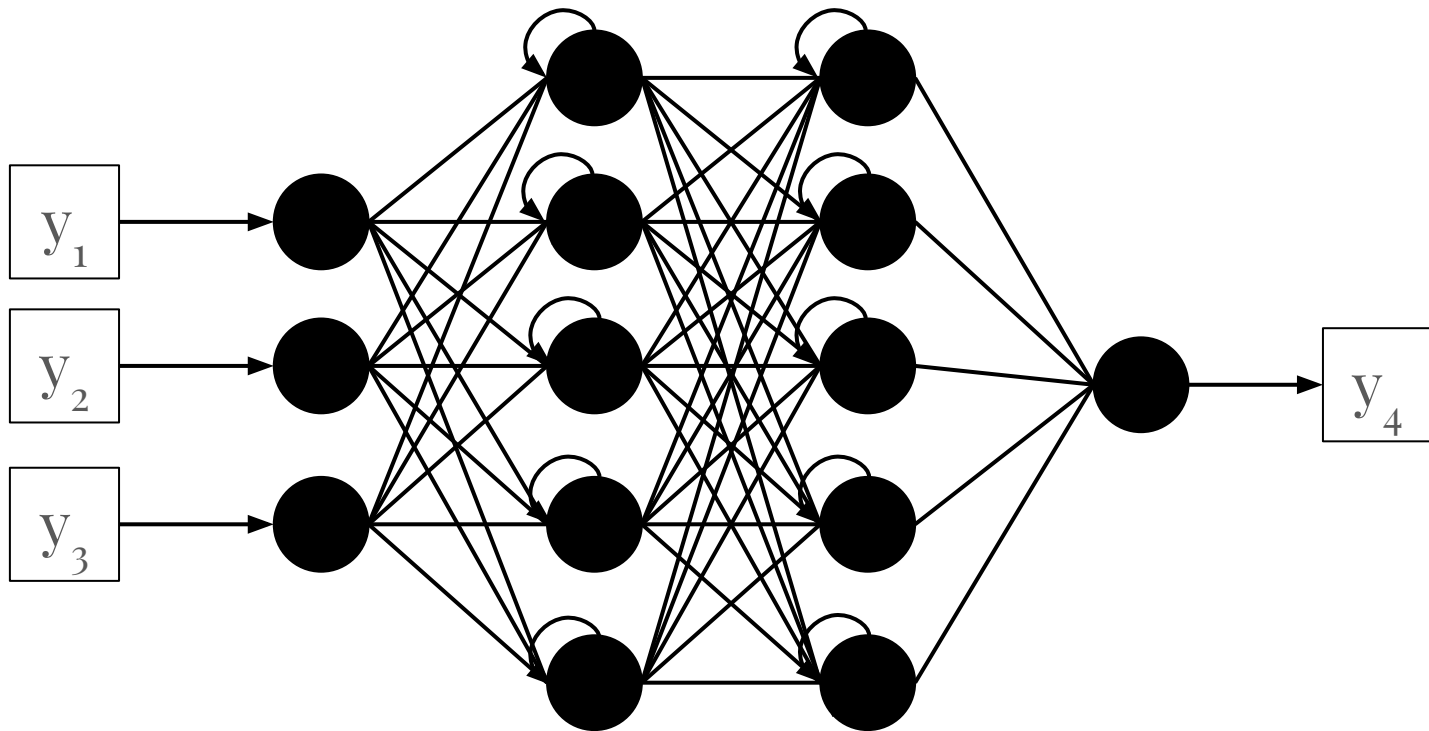
Text data
can be
considered
time series
(ordered)
data

Time Series Formatting

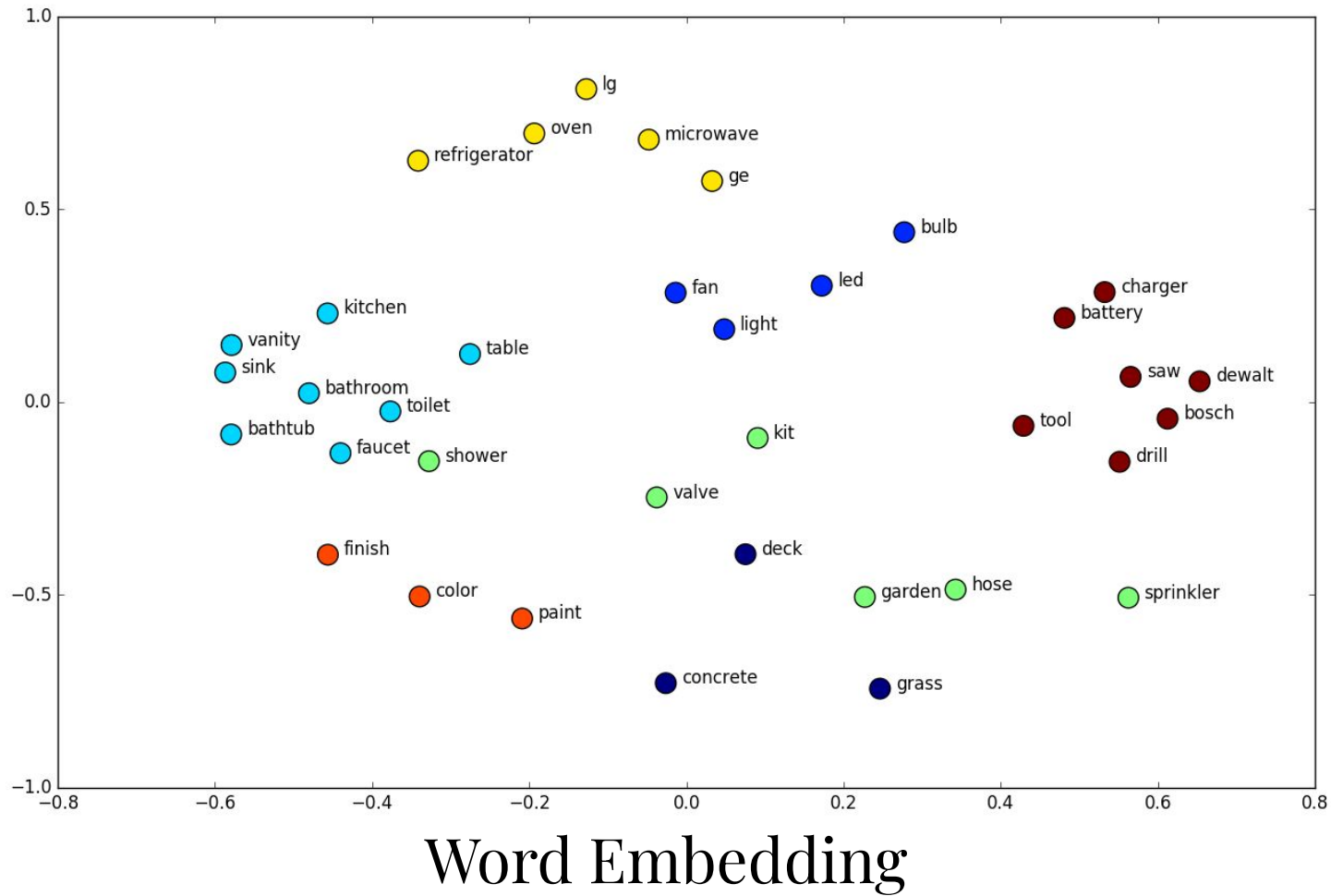
Working With Words



Numerical Data: $(1,2,3) \rightarrow 4$



Word Data: (Mr., Worldwide, to) \rightarrow Infinity



Predicting the Next Word In a Song

I don't want a lot for Christmas

There is just one thing I need

I don't care about the presents underneath the Christmas tree

I just want you for my own

More than you could ever know

Make my wish come true

All I want for Christmas is you

I don't want a lot for Christmas

There is just one thing I need

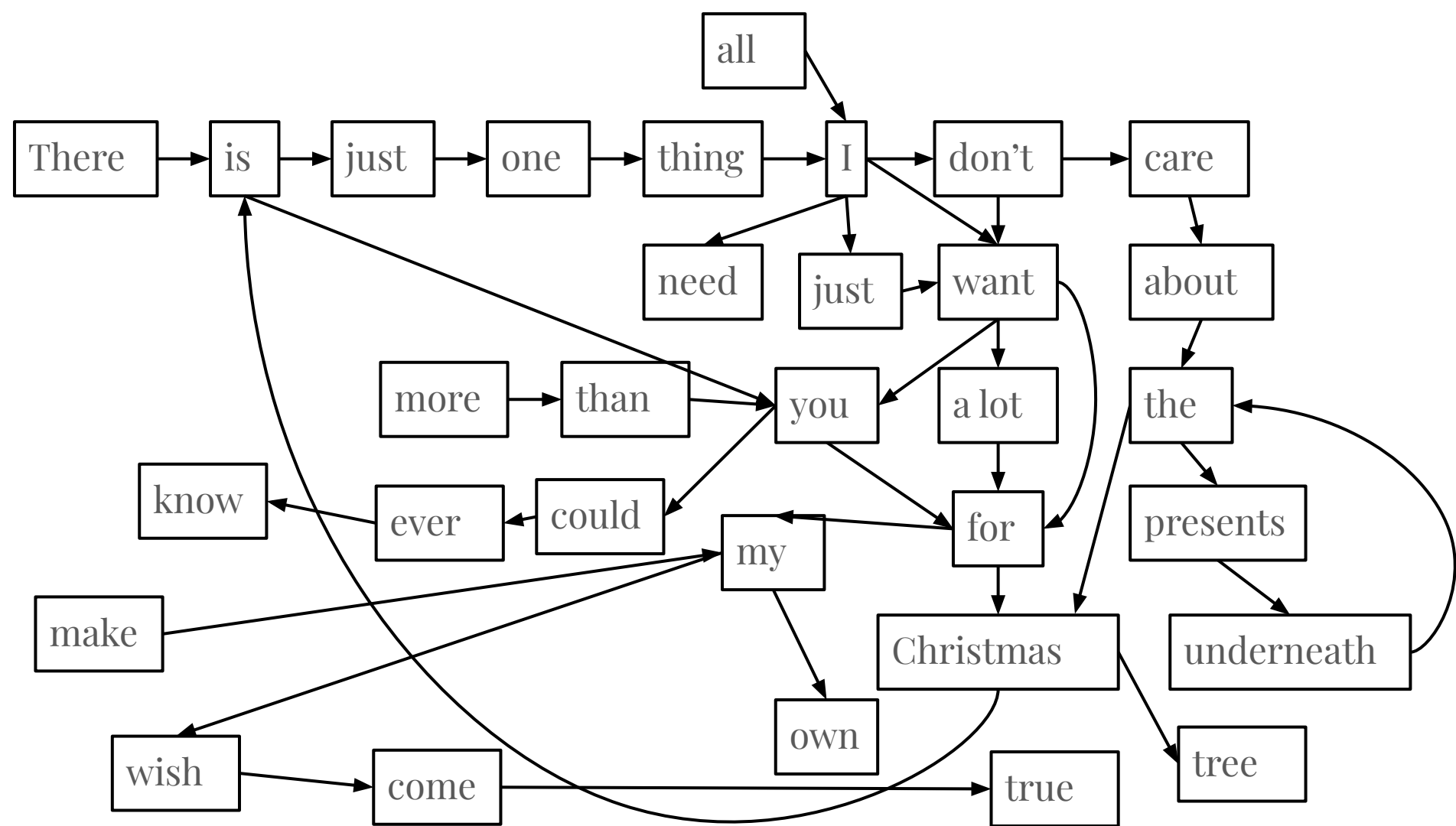
I don't care about the presents underneath the Christmas tree

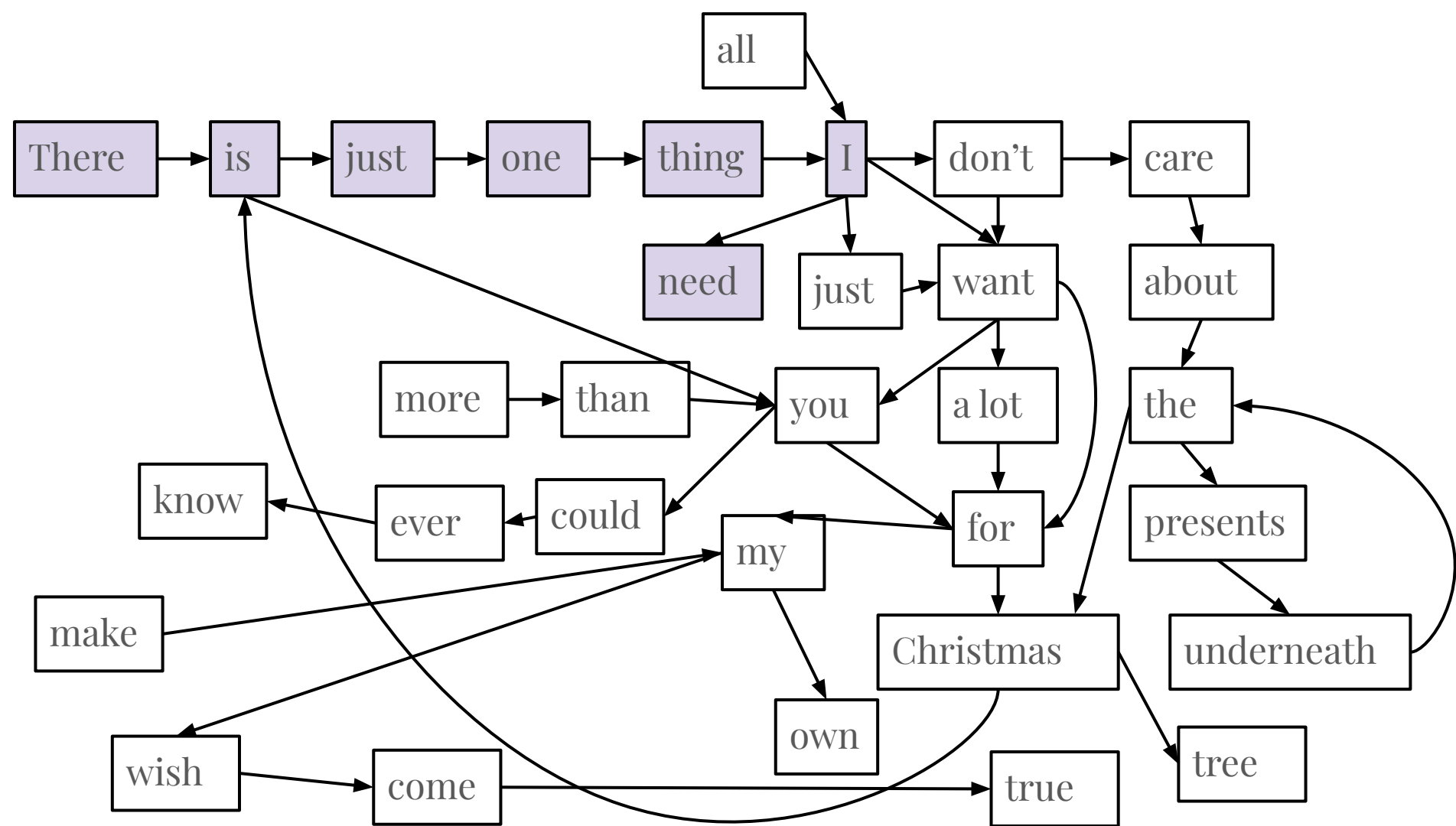
I just want you for my own

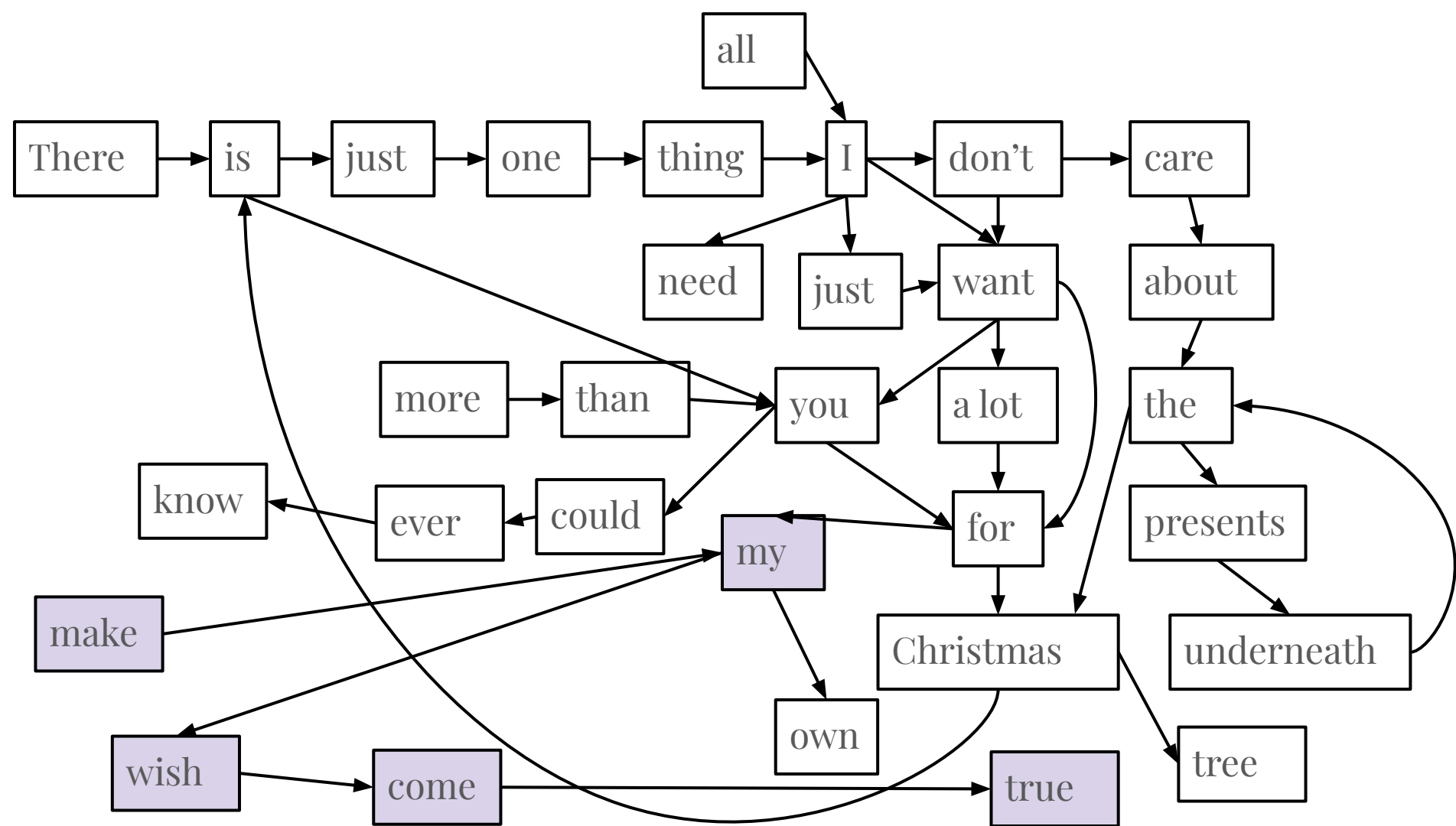
More than you could ever know

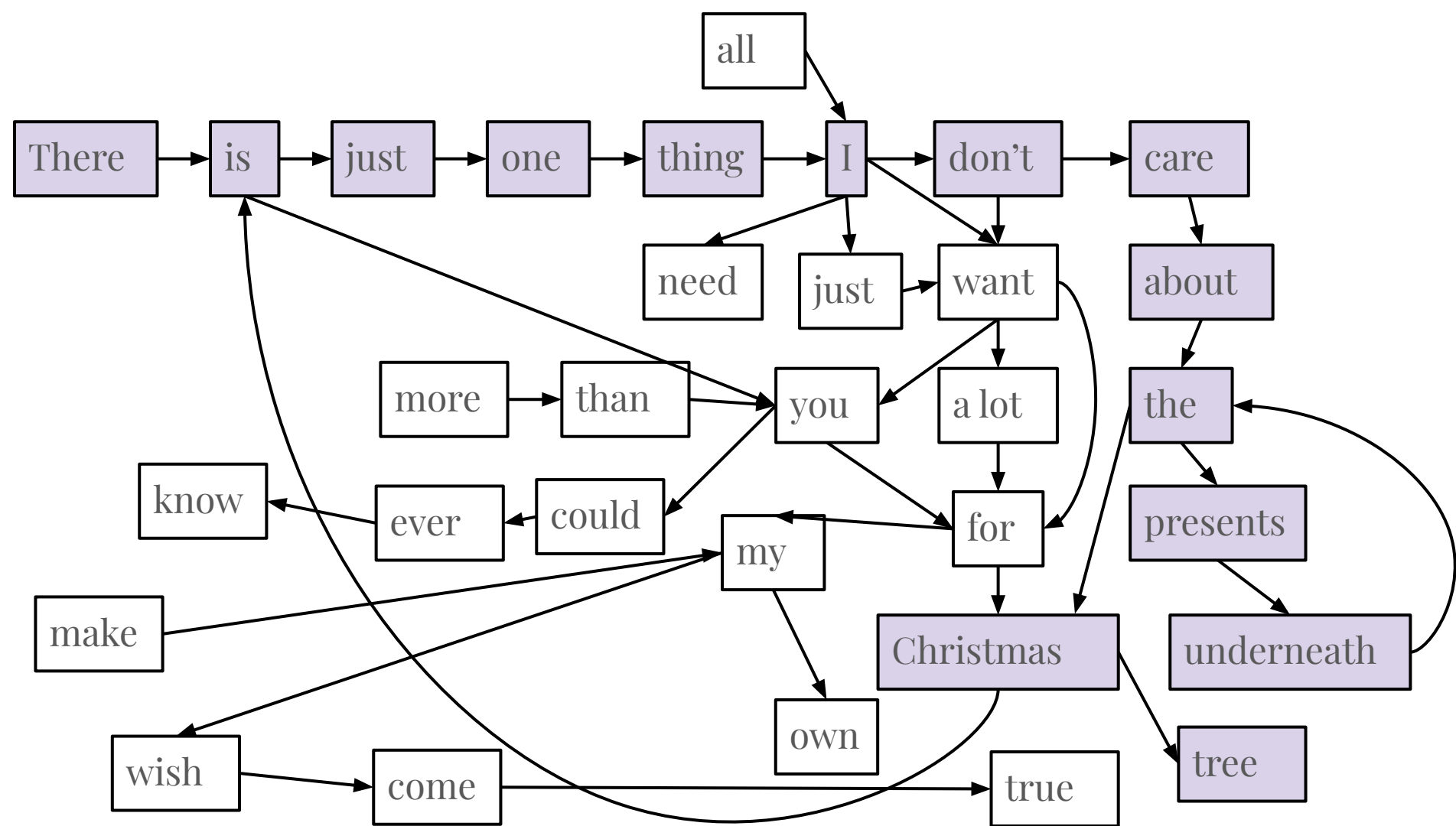
Make my wish come true

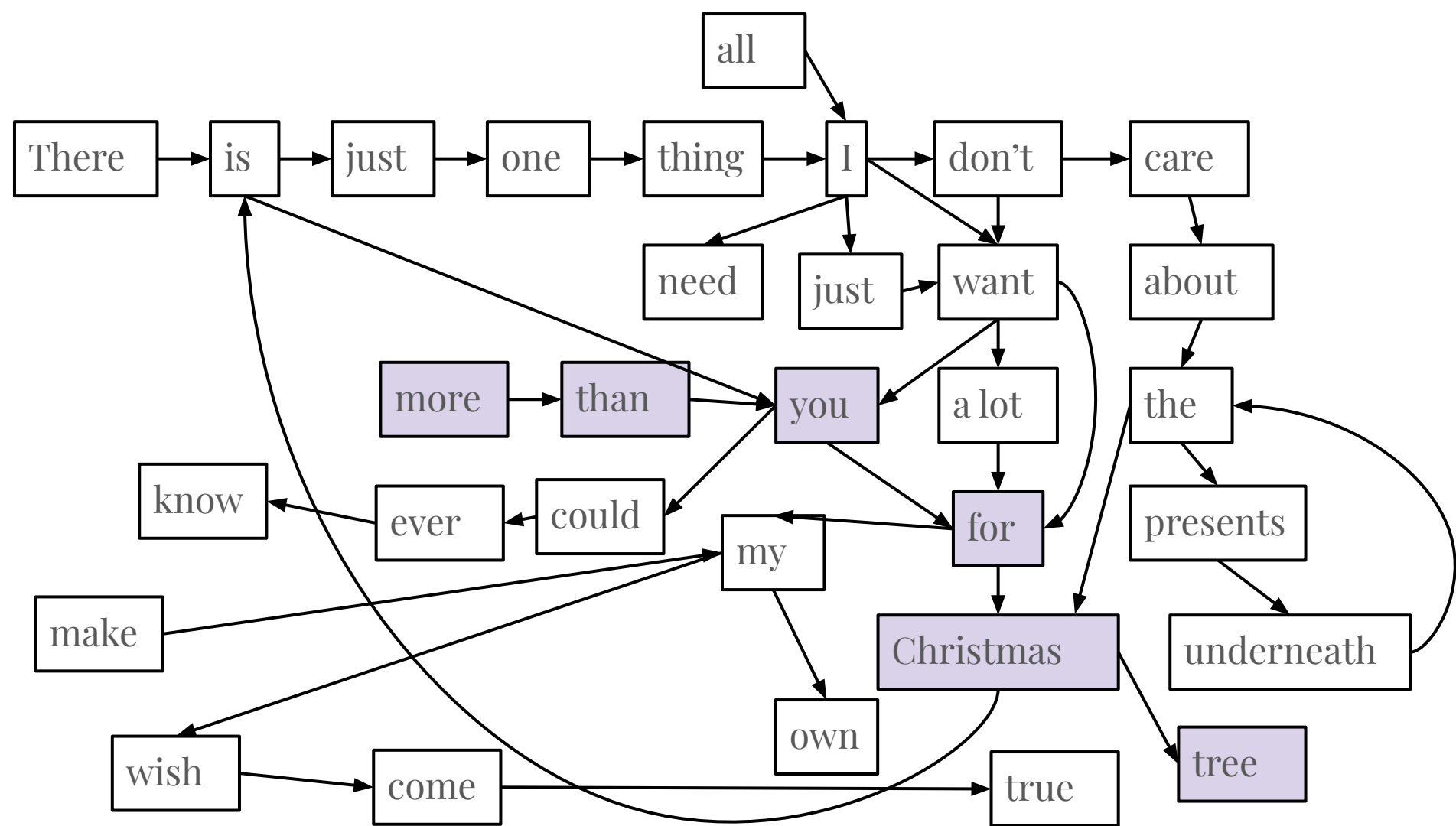
All I want for Christmas is you











I don't want a lot for Christmas

There is just one thing I need

I don't care about the presents underneath the Christmas tree

I just want you for my own

More than you could ever know

Make my wish come true

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More than you could ever know

Make my wish come true

All I want for Christmas is you

Attention Networks

Attention Networks

- To properly interpret and produce intelligible sentences, you need to consider variable sequence lengths
 - Not something a normal neural network is capable of doing
- Solution: Attention networks!

Attention Is All You Need

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Google Brain
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Noam Shazeer*
Google Brain
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Niki Parmar*
Google Research
nikip@google.com

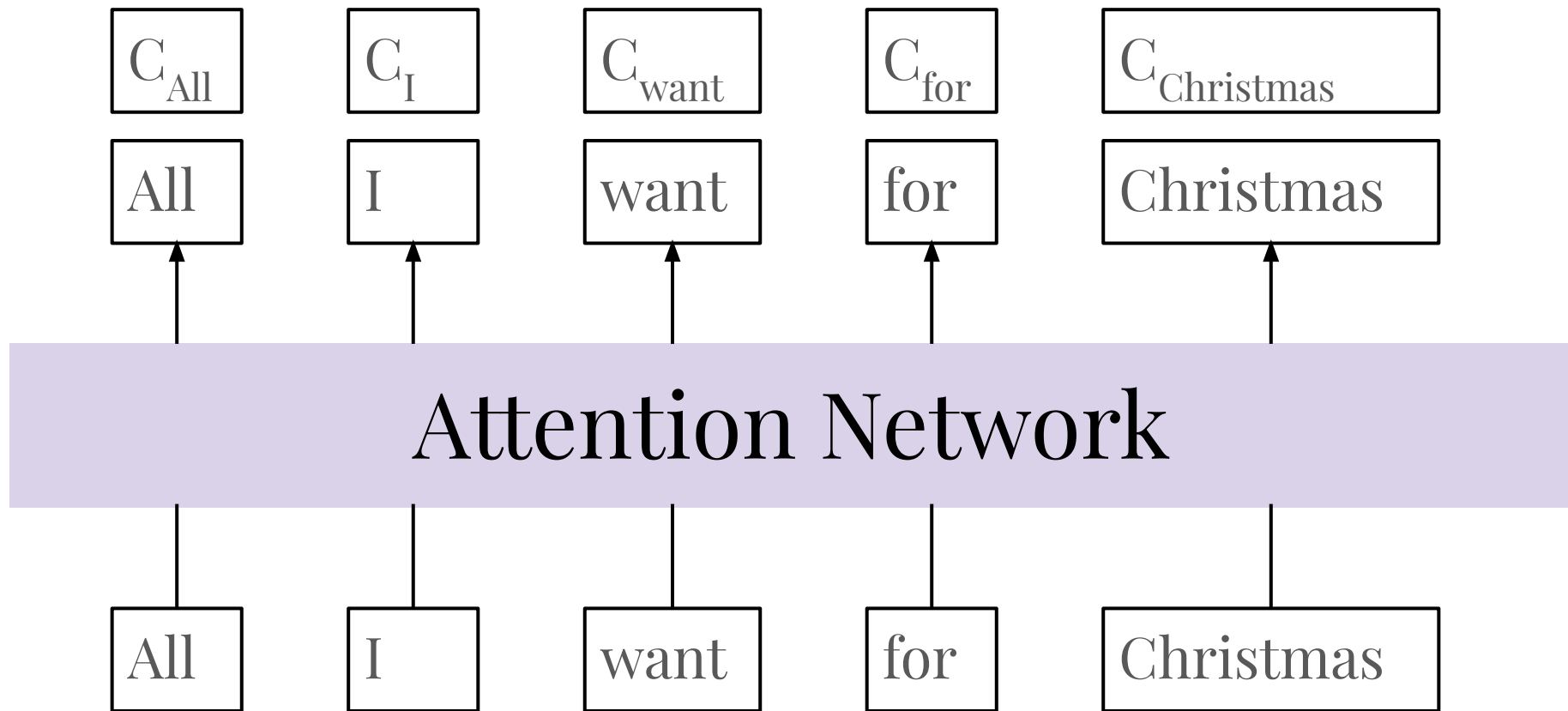
Jakob Uszkoreit*
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Llion Jones*
Google Research
llion@google.com

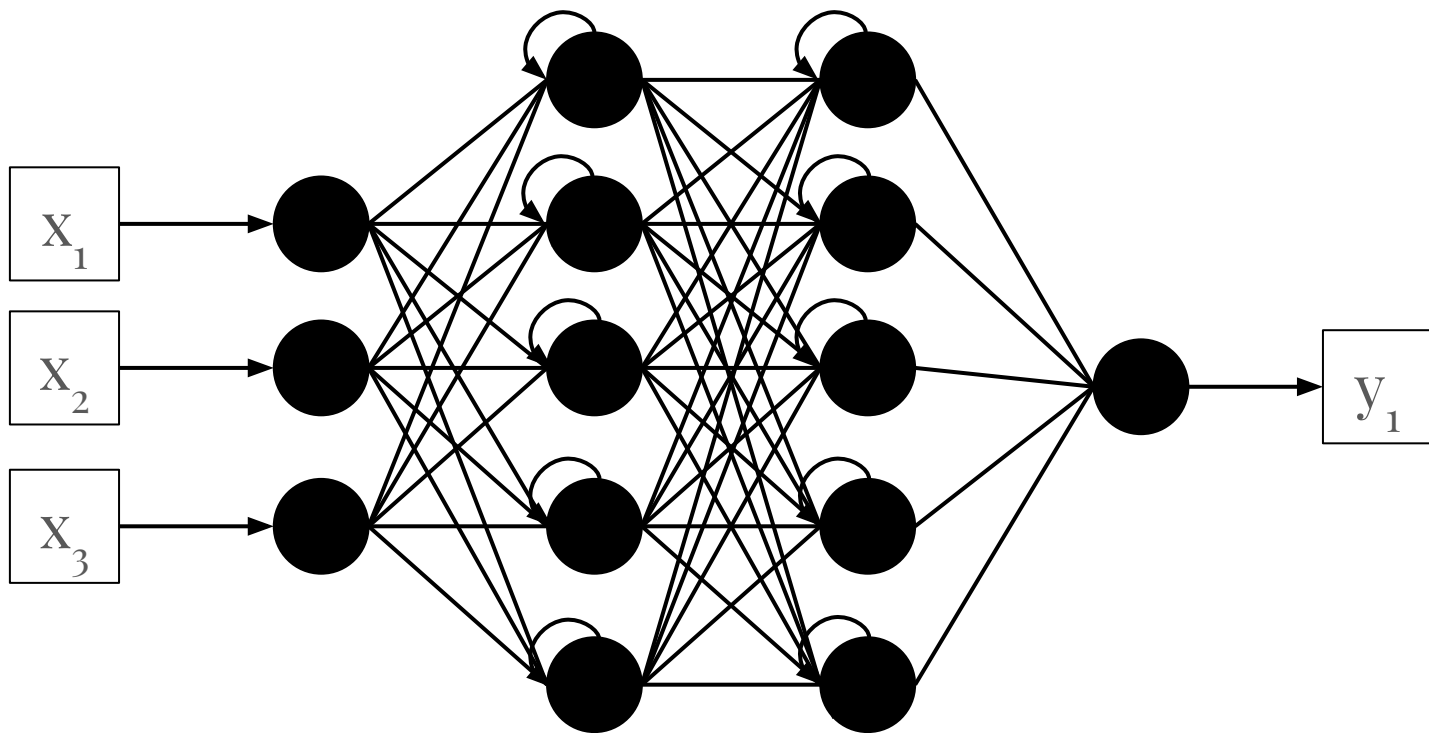
Aidan N. Gomez*[†]
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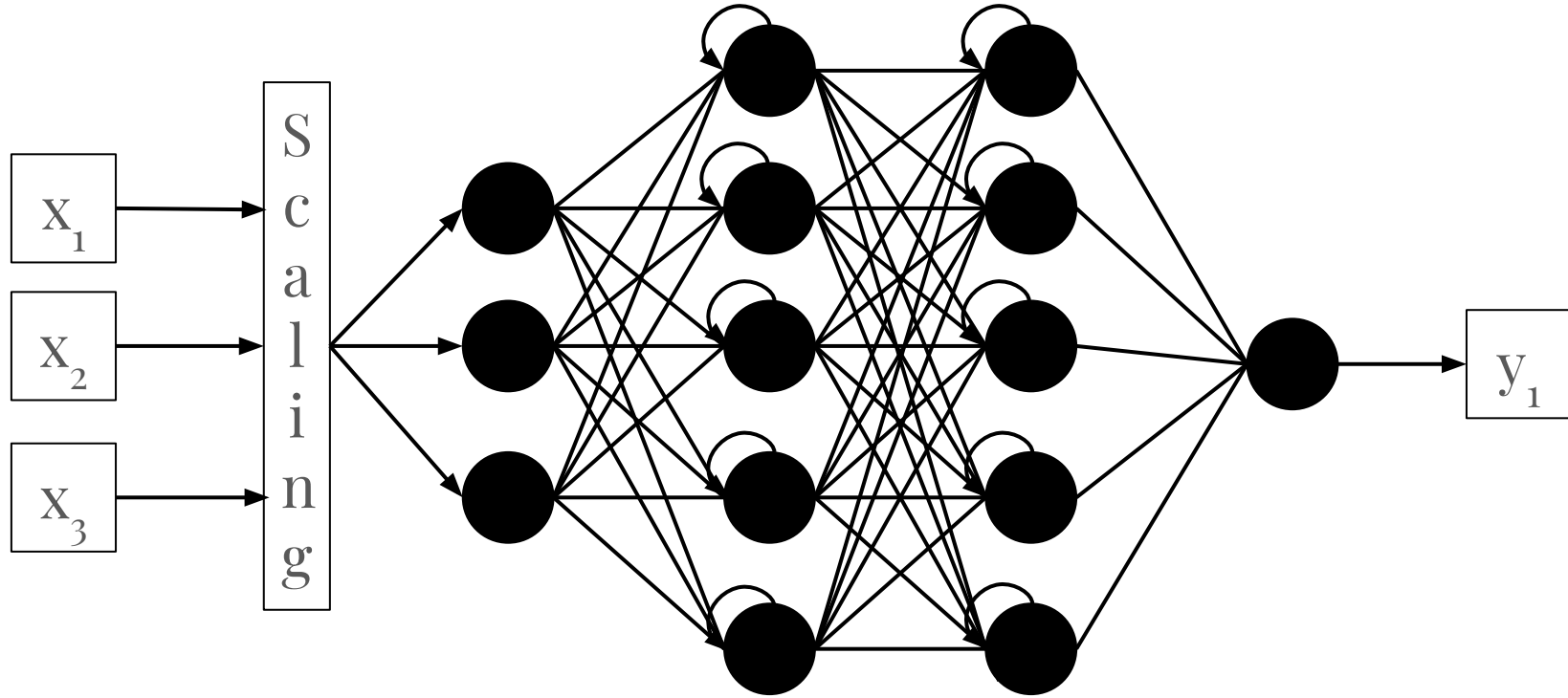
Illia Polosukhin*[‡]
illia.polosukhin@gmail.com



Transformer Networks



Simple Recurrent Neural Network



Preprocessing of data has been used throughout the course

Transformer Network: Attention network creates the connections, neural network finds the patterns



```
graph BT; Input(( )) --> AN[Attention Network]; AN --> NN[Neural Network]; NN --> TNN[Transformer Network];
```

Neural Network

Attention Network

Transformer Network



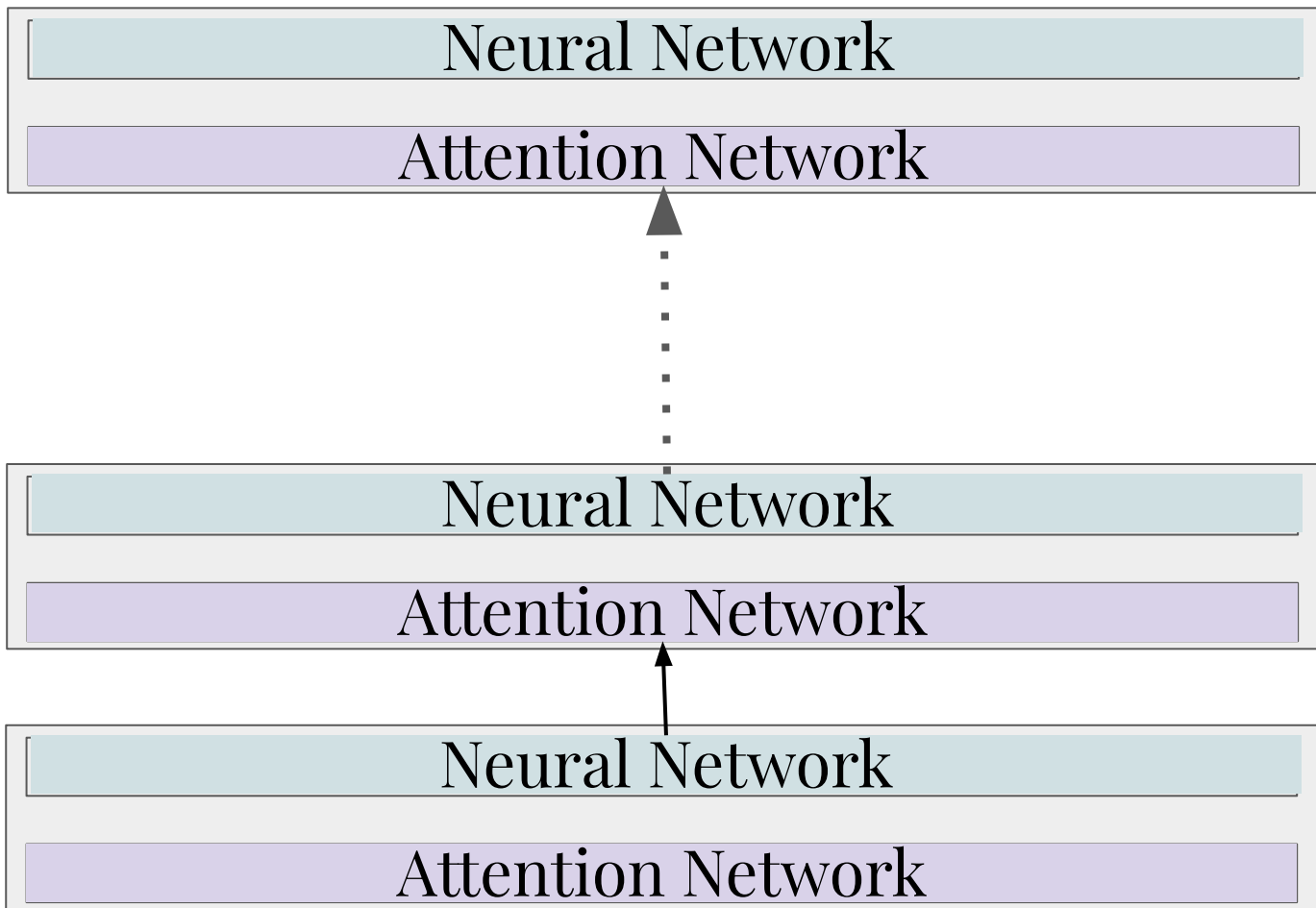
Neural Network



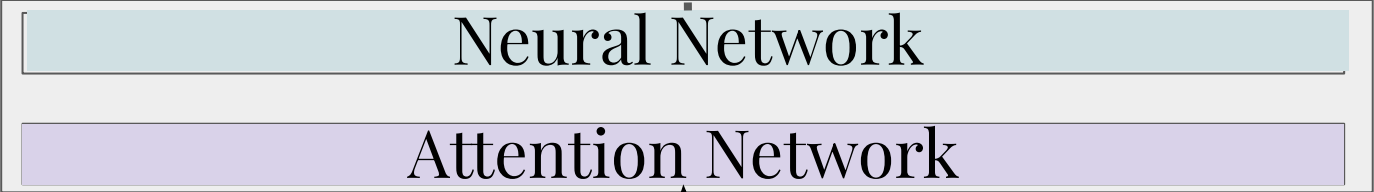
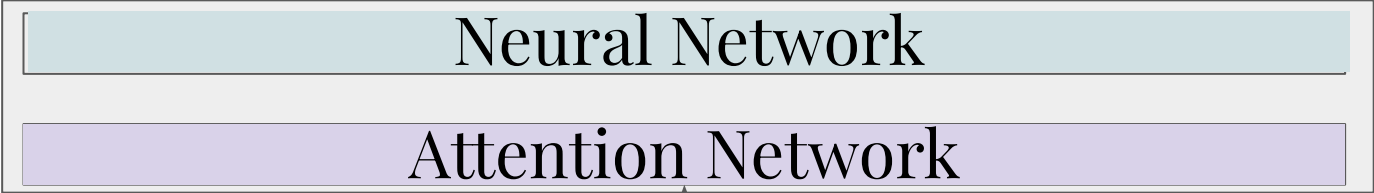
Attention Network



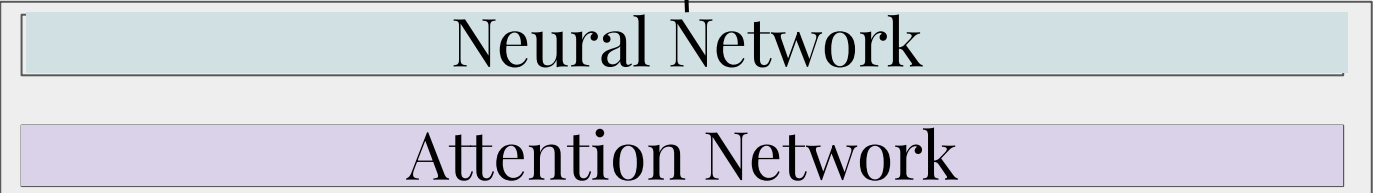
Chat Bots



Semantics



Syntax



ChatGTP-3

- 96 Transformers
 - Hundreds of billions of parameters
- Trained with the entire internet and all openly available books
 - Trillions of training points
- Trains in 355 years on a single GPU
 - Trains in a month with thousands of GPUs