

# Implementing Recurrent Neural Networks with Keras

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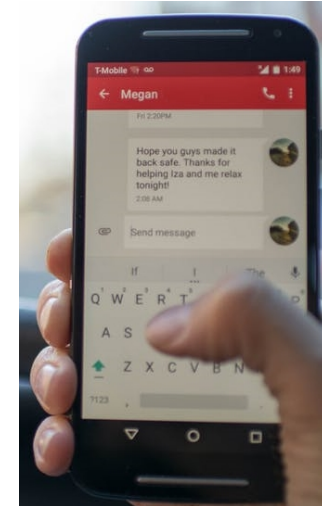
# Sequential Dependence



Stock Prices



Weather



Text Input



# Traditional NN Issues

**No tracking of data sequences**

**Do not remember previous values**

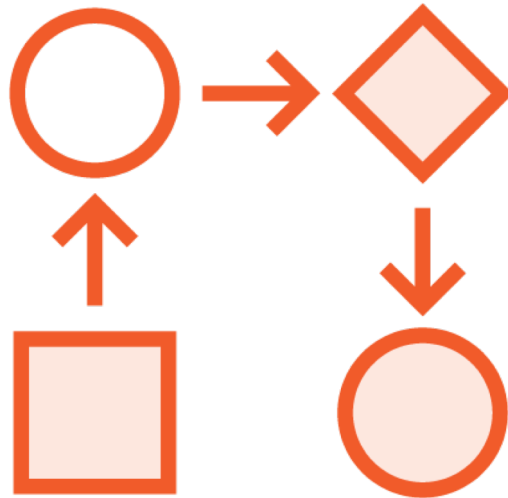
**RNNs address these issues**



# RNN Features



Sequential information



Same computations

Date	Price
1/15	145.25

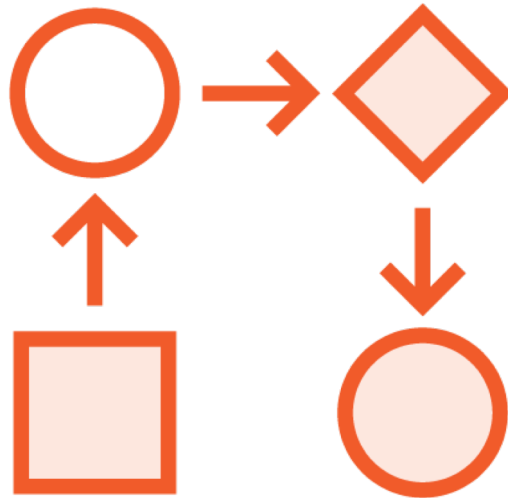
Current



# RNN Features



Sequential information

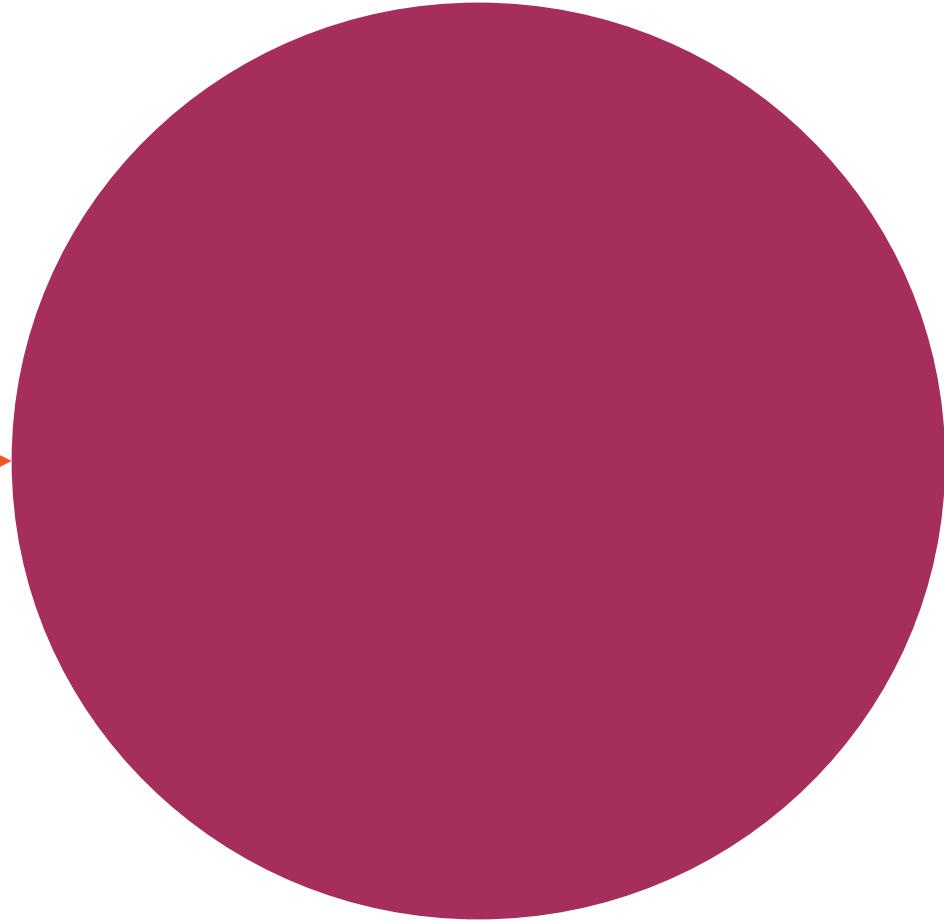


Same computations

Date	Price
1/15	145.25
Date	Price
1/12	138.50
1/13	152.00
1/14	147.50

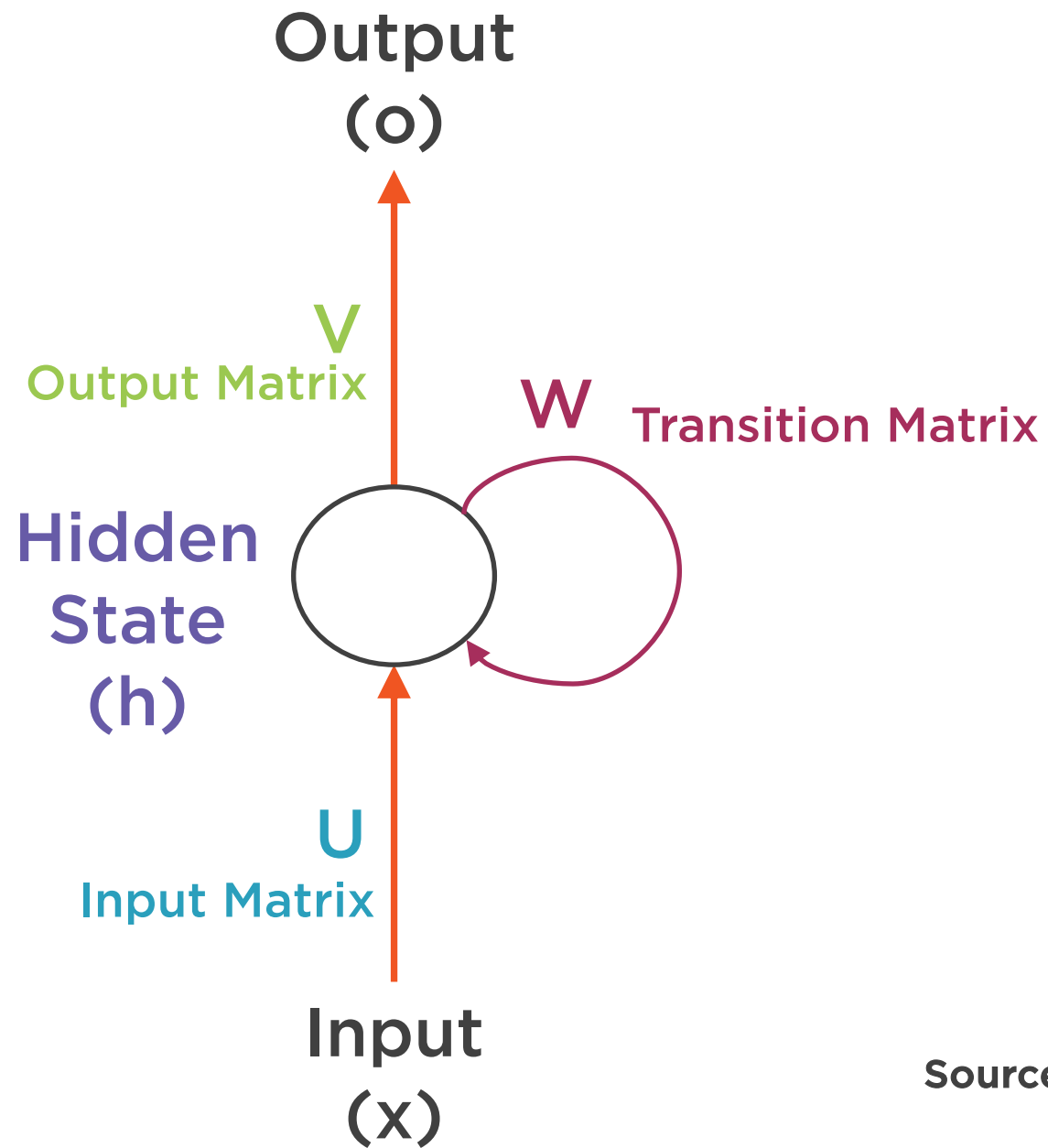
Uses current and previous data

Input  
(x)



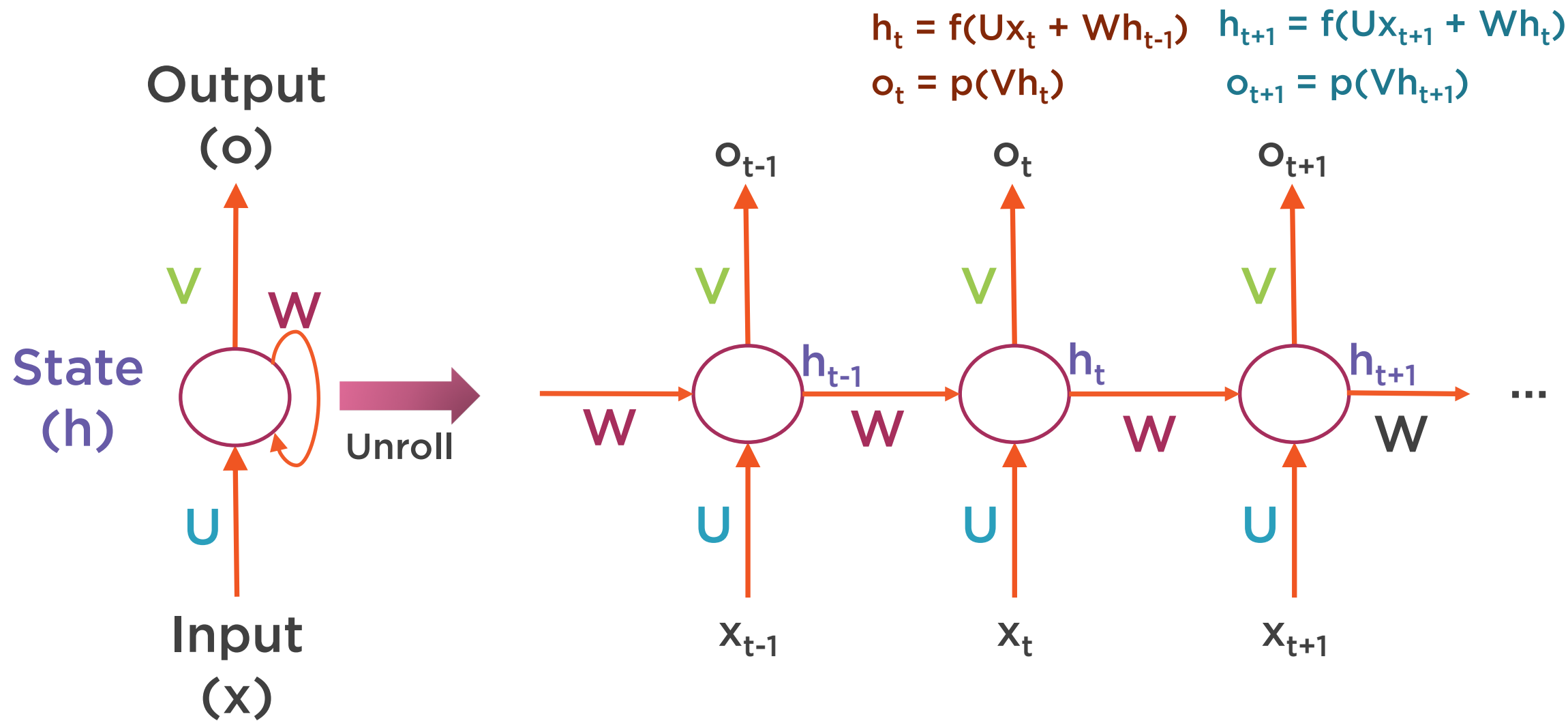
Output  
(o)





Source: Nature





Source: Nature





# Simple RNN

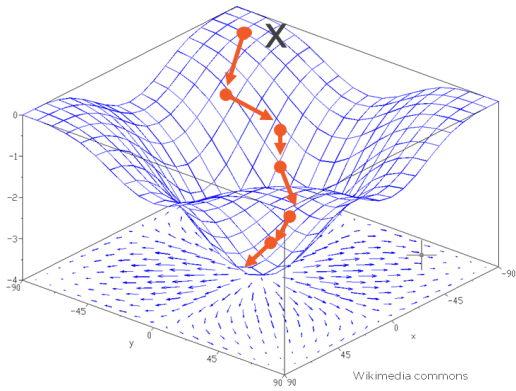
**Keras simpleRNN  
layer**

**Implements  
forwarding of  
information**

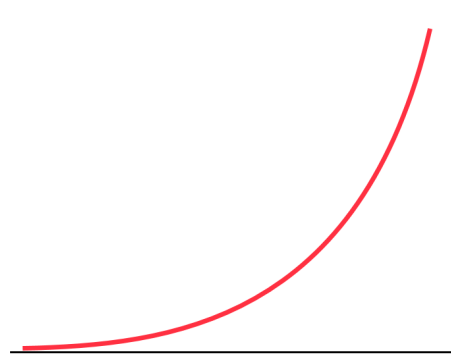
**Sometimes hard  
to train**



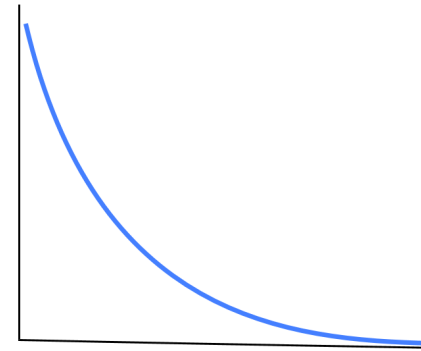
# RNN Training Issues



**Back  
Propagation  
issues**



**Exploding  
Gradient**



**Vanishing  
Gradient**

LSTM  
GRU

**Fix training  
issues**

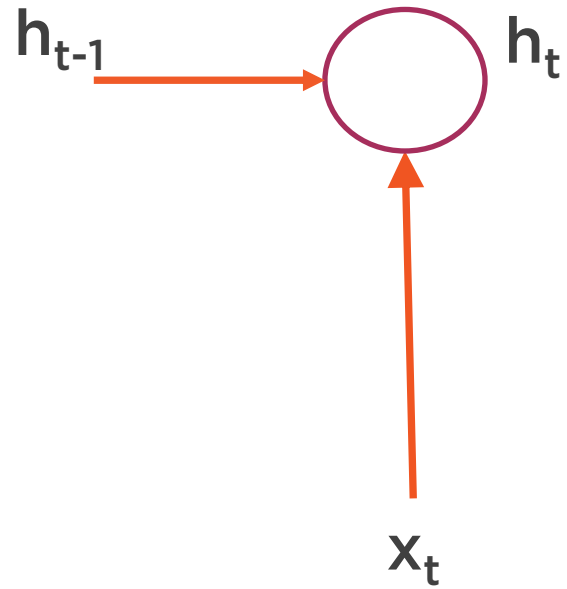


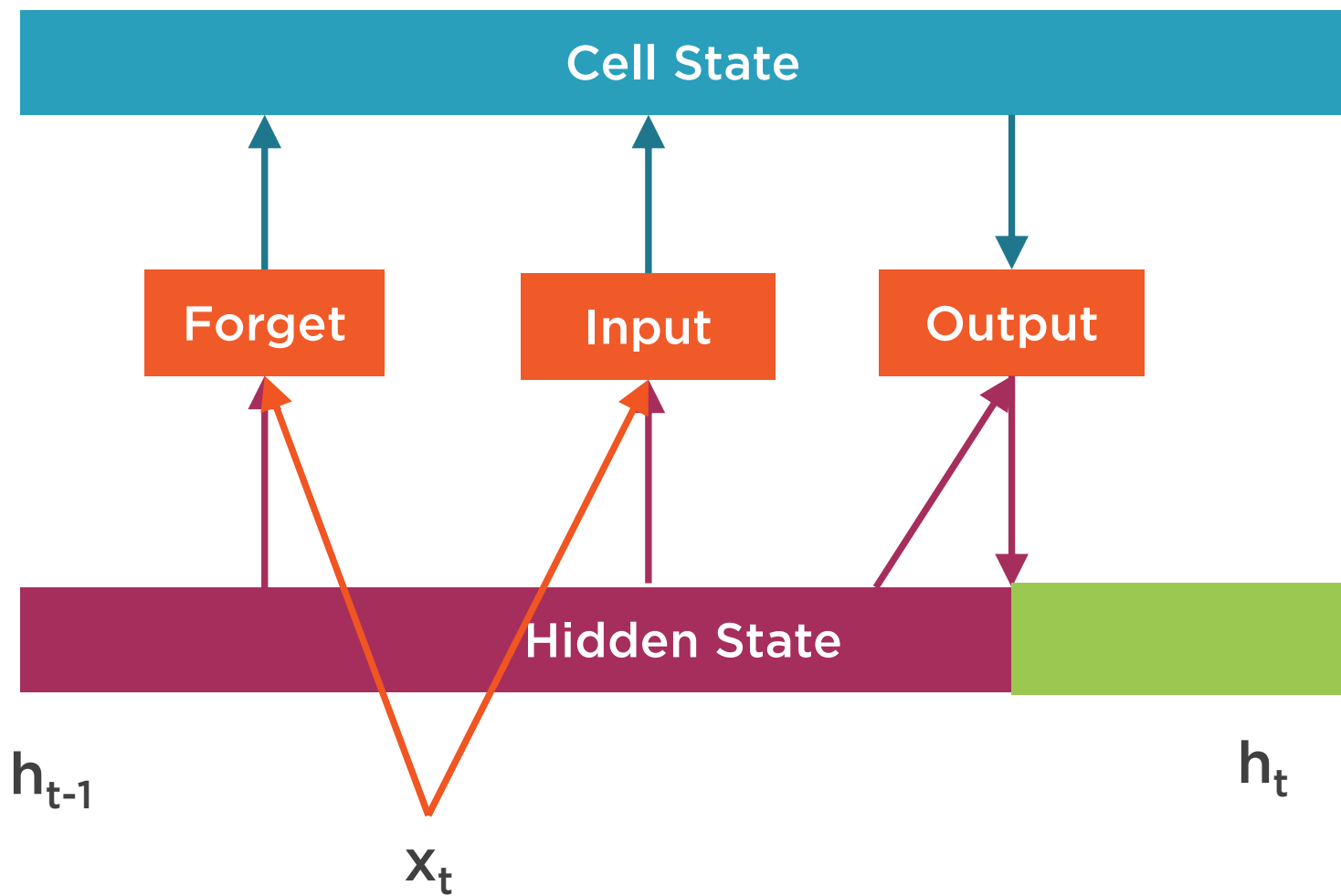
LSTMs and  
GRUs

**Cell State memory**  
**Accessed via Gates**



## Cell State





For more information see:  
<http://colah.github.io/posts/2015-08-Understanding-LSTMs>



# Gated Recurrent Unit (GRU)

**Simplifies LSTM**

**Forget + Input = Update**

**Merges Cell State and Hidden State**



# Keras Recurrent Neural Network Layers

RNN Type	Keras Layer
Standard RNN	SimpleRNN
Long Short Term Memory(LSTM)	LSTM
Gated Recurrent Unit (GRU)	GRU
CNN + LSTM	ConvLSTM2D
CUDA DNN Support	CuDNNGRU
	CuDNNLSTM



# Textual Data



Text is everywhere



Determining meaning is hard





# Restaurant Review

“I really love this place. The food was passible and the service was glacial. But the lights are pretty and tables cloths impressive.”

**Customer 72**



# Demo



## Sentiment Classifier

### IMDB review data



# Summary



Sequential data depends on previous data

RNNs handle sequential dependencies

Classic RNNs have issues

LSTM/GRU handles issues

Performed Sentiment Analysis with LSTM

