

# LSTM with attention for Stock Prediction

**Revolutionizing the Stock Market, through A.i**

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01 | What are LSTMs?

02 | What does the LSTM architecture look like?

03 | Where are LSTMs used?

04 | LSTMs for Stock Prediction

**What** are  
LSTMs?

01

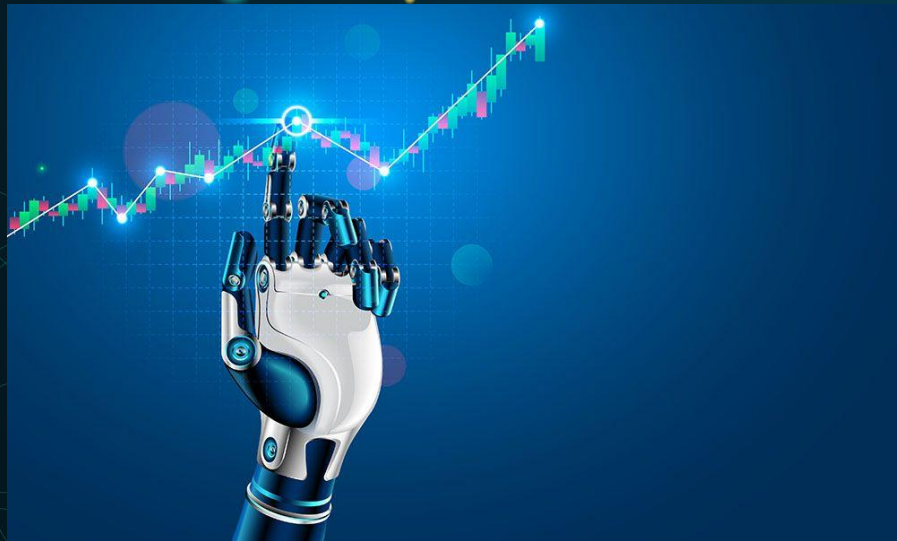
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# Long short-term memory



- **Form of Recurrent Neural Network**
- **Useful in time series prediction**
- **Takes into account contextual information as well as input to give output**

# LSTMs



**The ability for gradients to remain unchanged solves the vanishing gradient problem in traditional RNNs**



**Input gate,  
Output gate & Forget gate**

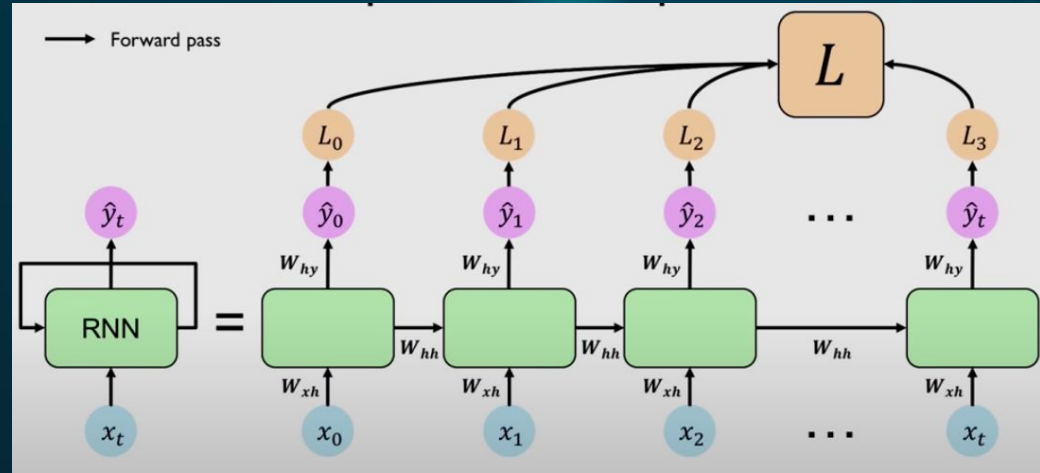
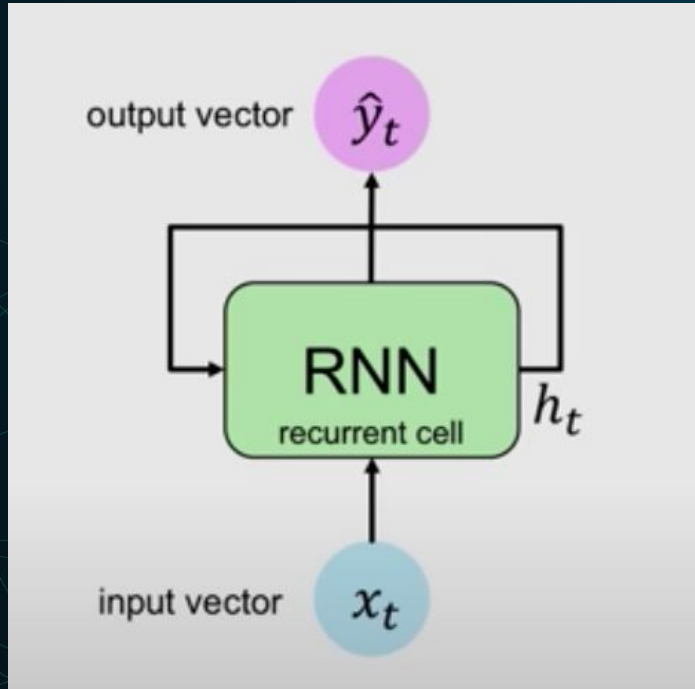


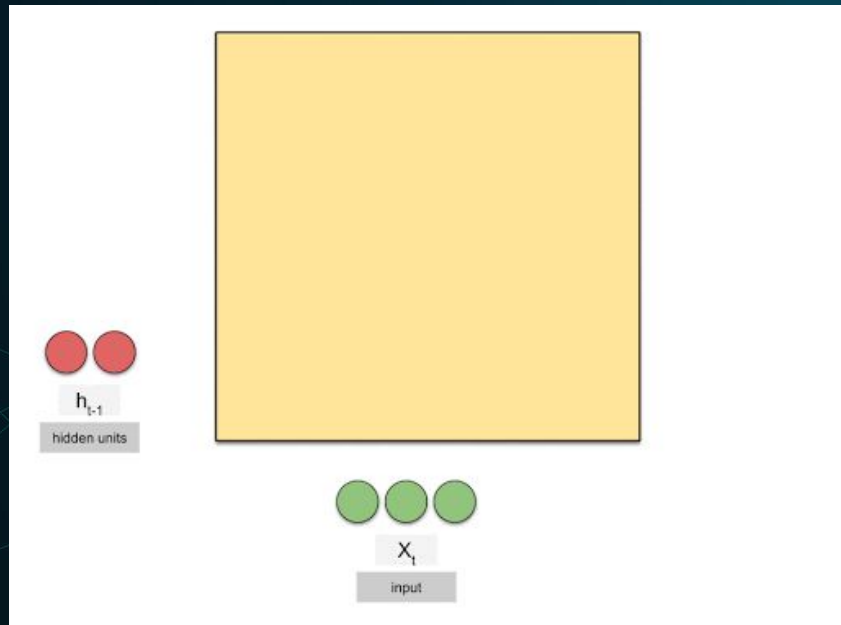
What does the  
**architecture**  
look like?

02

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# Recurrent Neural Networks (RNNs)





## Update Hidden State

$$h_t = \tanh(W_{hh}^T h_{t-1} + W_{xh}^T x_t)$$

## Input Vector

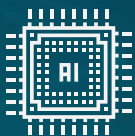
$$x_t$$

## Output Vector

$$\hat{y}_t = W_{hy}^T h_t$$



# Long Short Term Memory (LSTM) Networks



FORGET



STORE

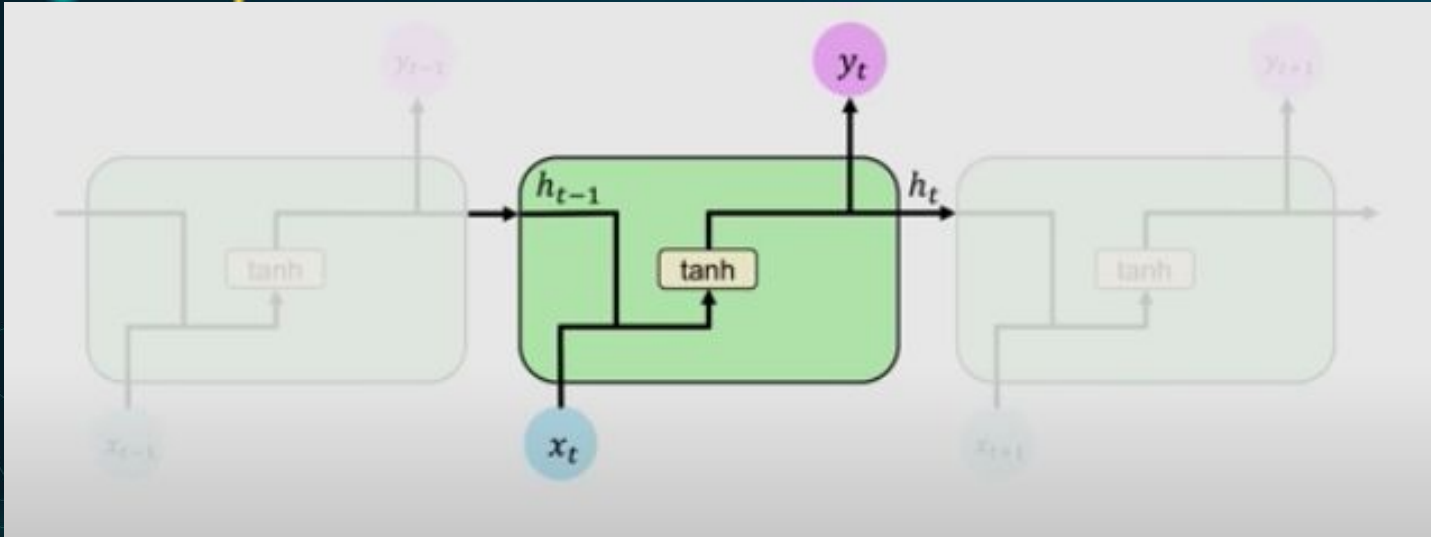


UPDATE



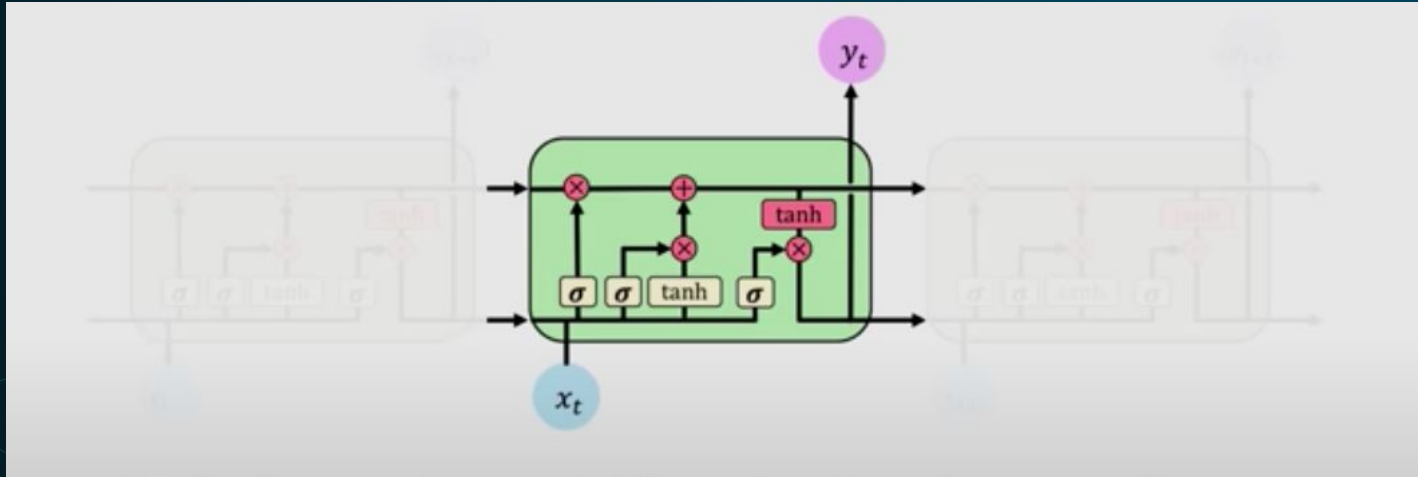
OUTPUT

# RNN Model



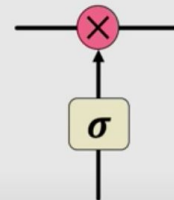
Simple RNN can be modeled

# LSTM Model

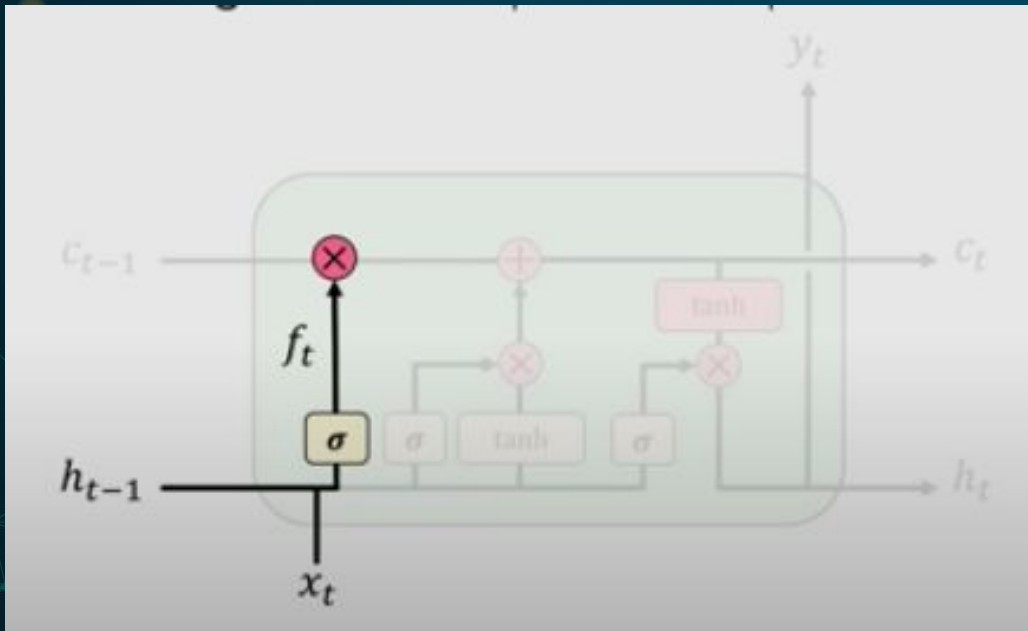


What an LSTM can be modeled as

Information is **added** or **removed** through structures called **gates**

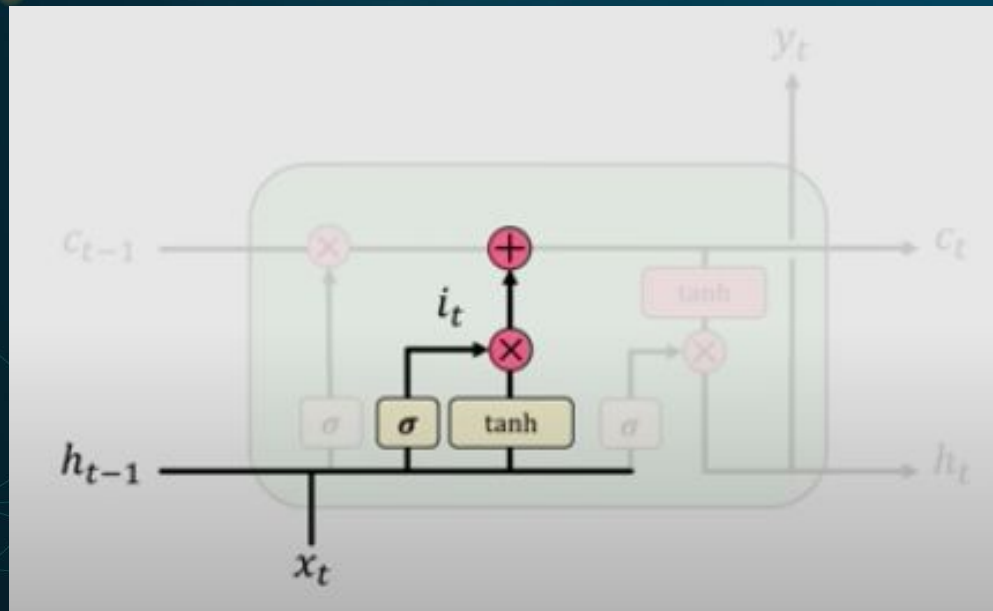


# LSTMs



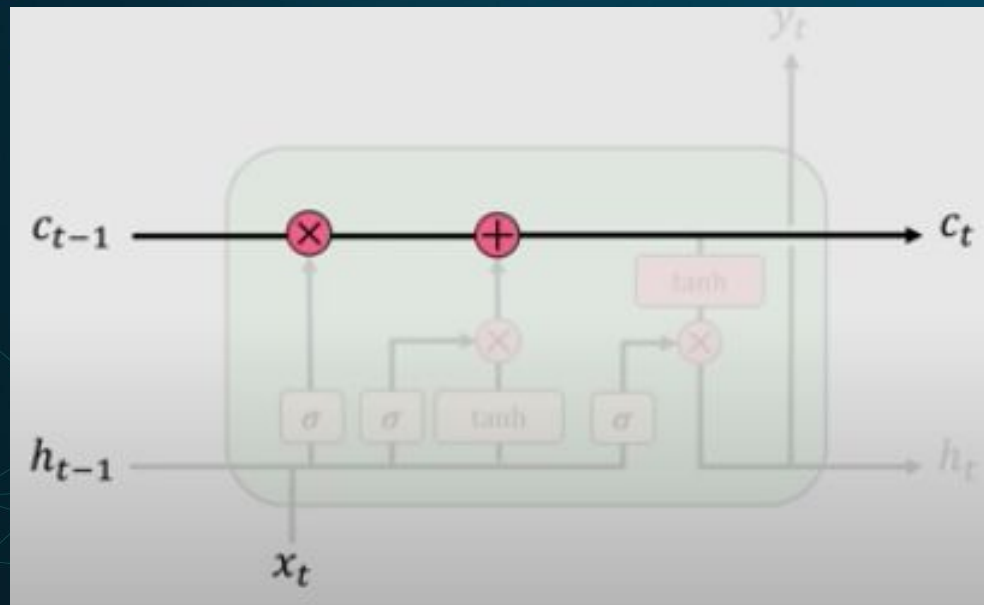
FORGET Gate - Forget

# LSTMs



INPUT Gate - STORE

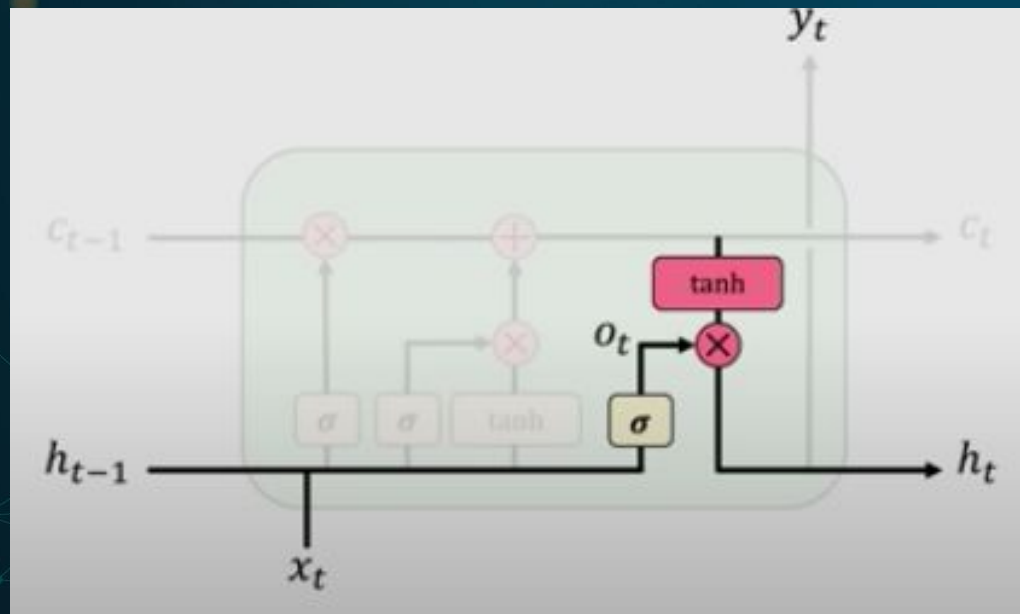
# LSTM<sub>s</sub>



FORGET + INPUT - UPDATE

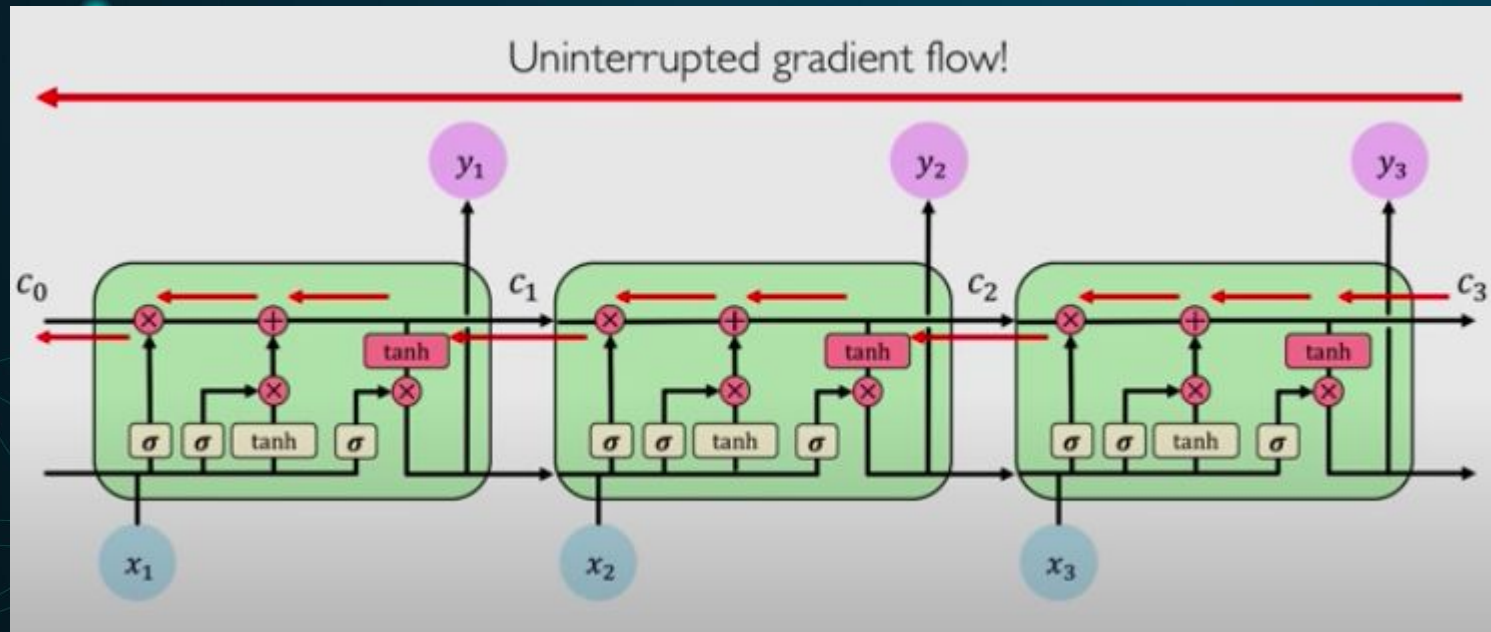


# LSTMs



OUTPUT Gate - OUTPUT

# LSTMs

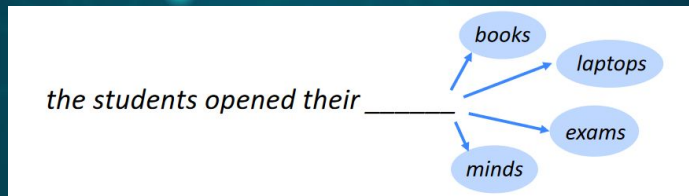


**Where** are  
LSTMs used?

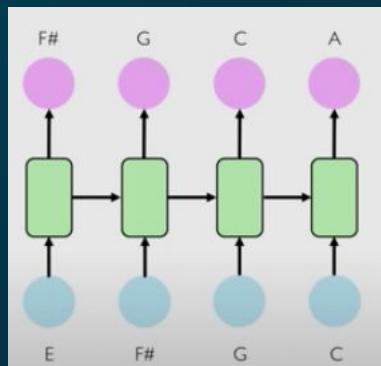
03

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# Where are they used?



Language  
Modeling



Music  
Generation



Stock Price  
Predictions

WILL BE DISCUSSED AHEAD!!

# LSTMs for **Stock Prediction**

# 04

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# LSTMs for Stock price prediction

**Stock prices are perfect examples of time series data**

**Use time series analysis to gain useful patterns & stats from the data**

**Time series forecasting to predict the future prices of stocks**

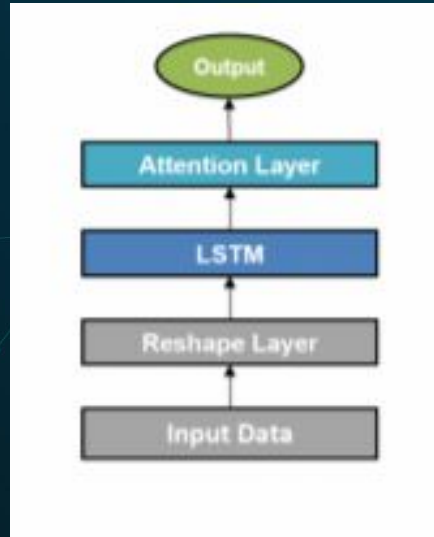


# LSTMs with Attention

$$e_t = \tanh(W_a [x_1, x_2, \dots, x_T] + b) \quad \alpha_t = \frac{\exp(e_t)}{\sum_{k=1}^T \exp(e_k)}$$

Trainable Weight Matrix

Resulting weighting



# Demonstration

**GO TO COLAB!!**

(Click)

# THANK YOU!



## References:

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