


# Applied Text Analytics & Natural Language Processing



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**Deep Learning**  
**Long Short-Term Memory (LSTM) + Attention**

Some of the slides are based on Ming Li (University of Waterloo – Deep Learning Part)  
with some modifications



# Learning Objectives

In this lesson, you will learn how to augment LSTM with an attention structure LSTM

- Why we need Attention Mechanism
- Encoder-Decoder architecture
- How it works





# Language Translation Example

*Let's say we are going to translate "How are you" from English into Polish:*

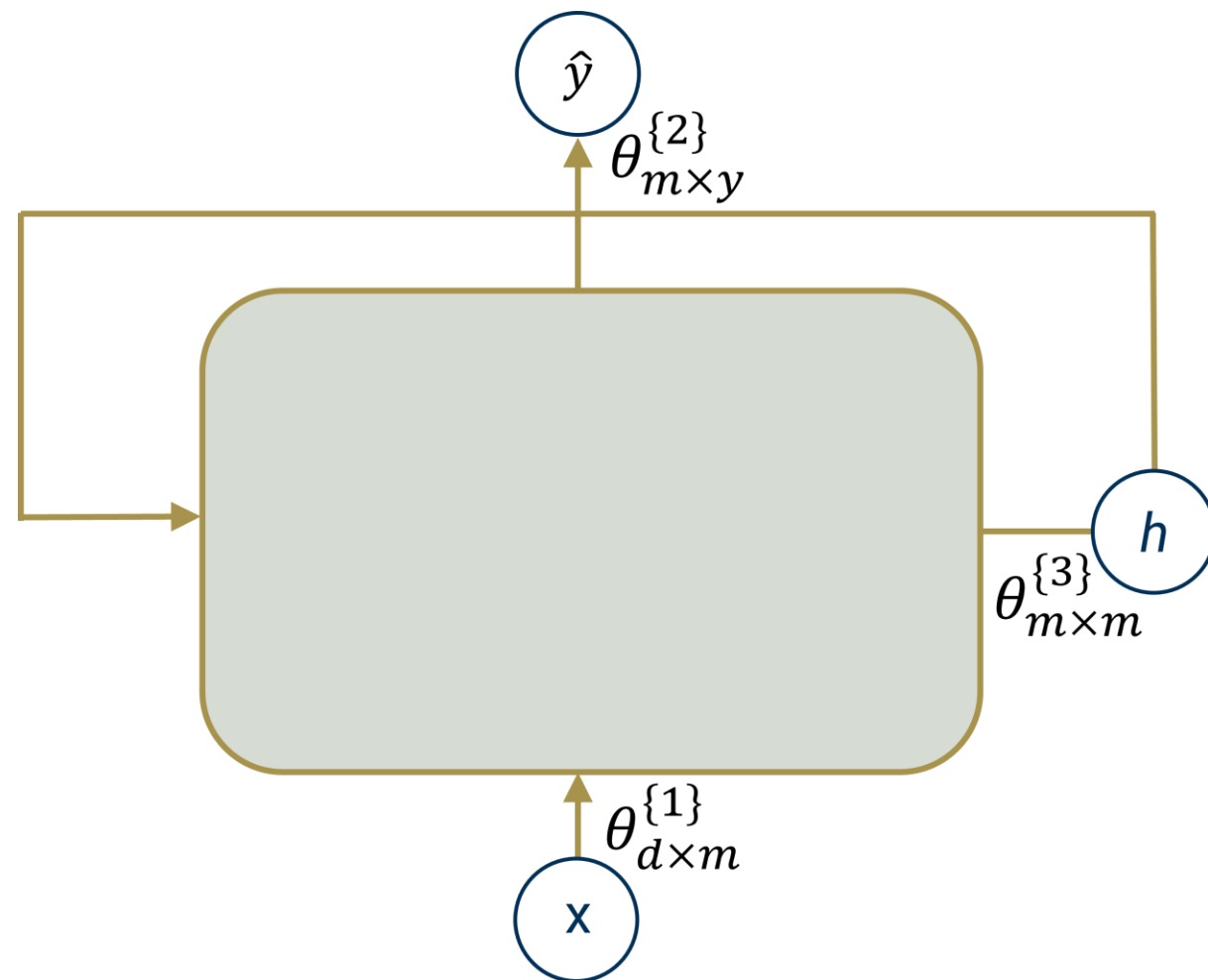
*English: How are you*

*Polish: jak się masz*

*We are going to use LSTM units to perform this task.*

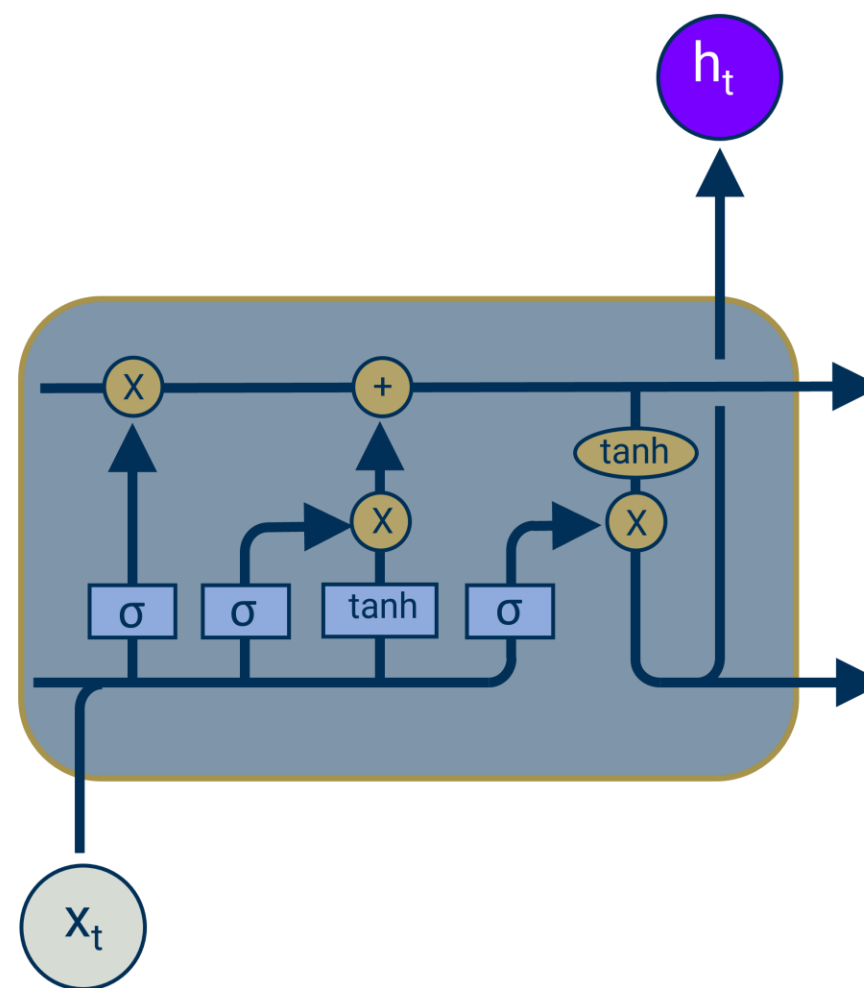
# RNN and LSTM Units

An RNN Unit



```
tf.keras.layers.SimpleRNN  
(rnn_units)
```

An LSTM Unit

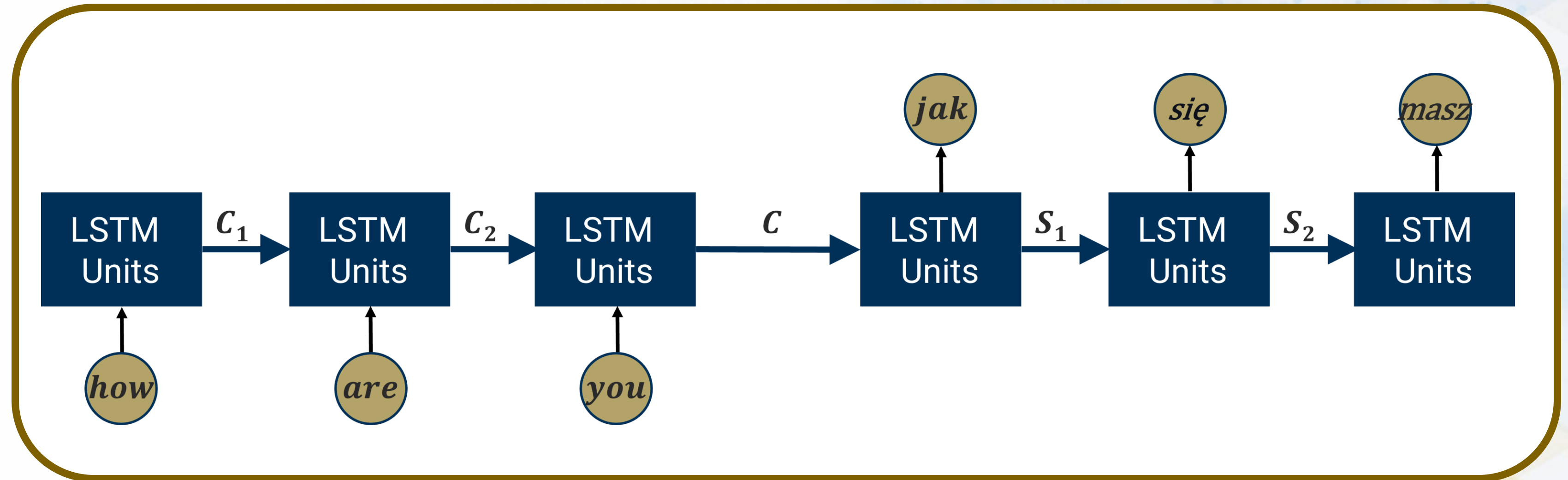


```
tf.keras.layers.LSTM  
(lstm_units)
```

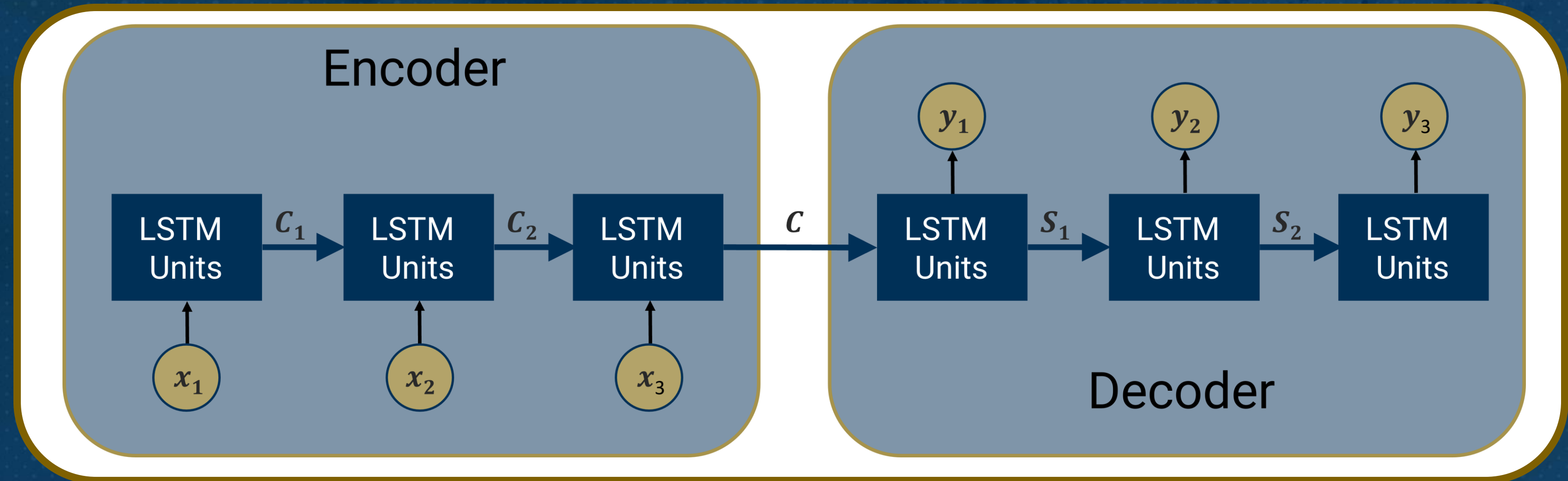
*LSTM essentially augments the RNN unit by creating gates that allow some information to be passed on through the network and some to be forgotten.*



# Back to our Language Translation Model



# Encoder and Decoder

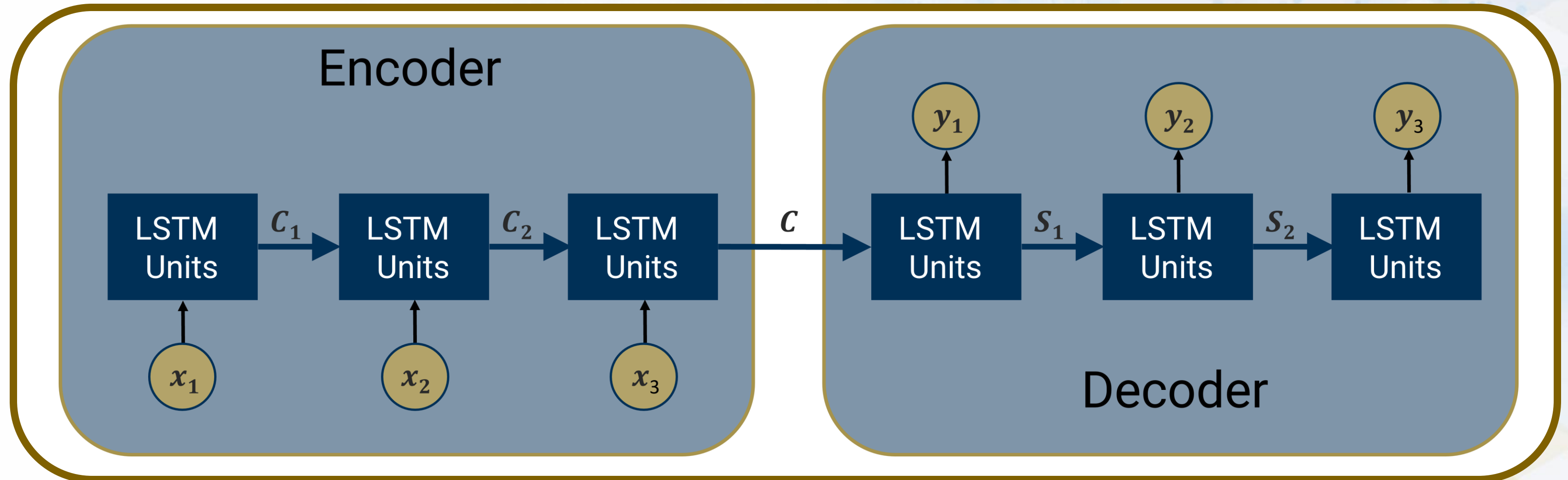


$c_i$ : It is the encoder state

$c$ : Final encoder state which is sent to a decoder

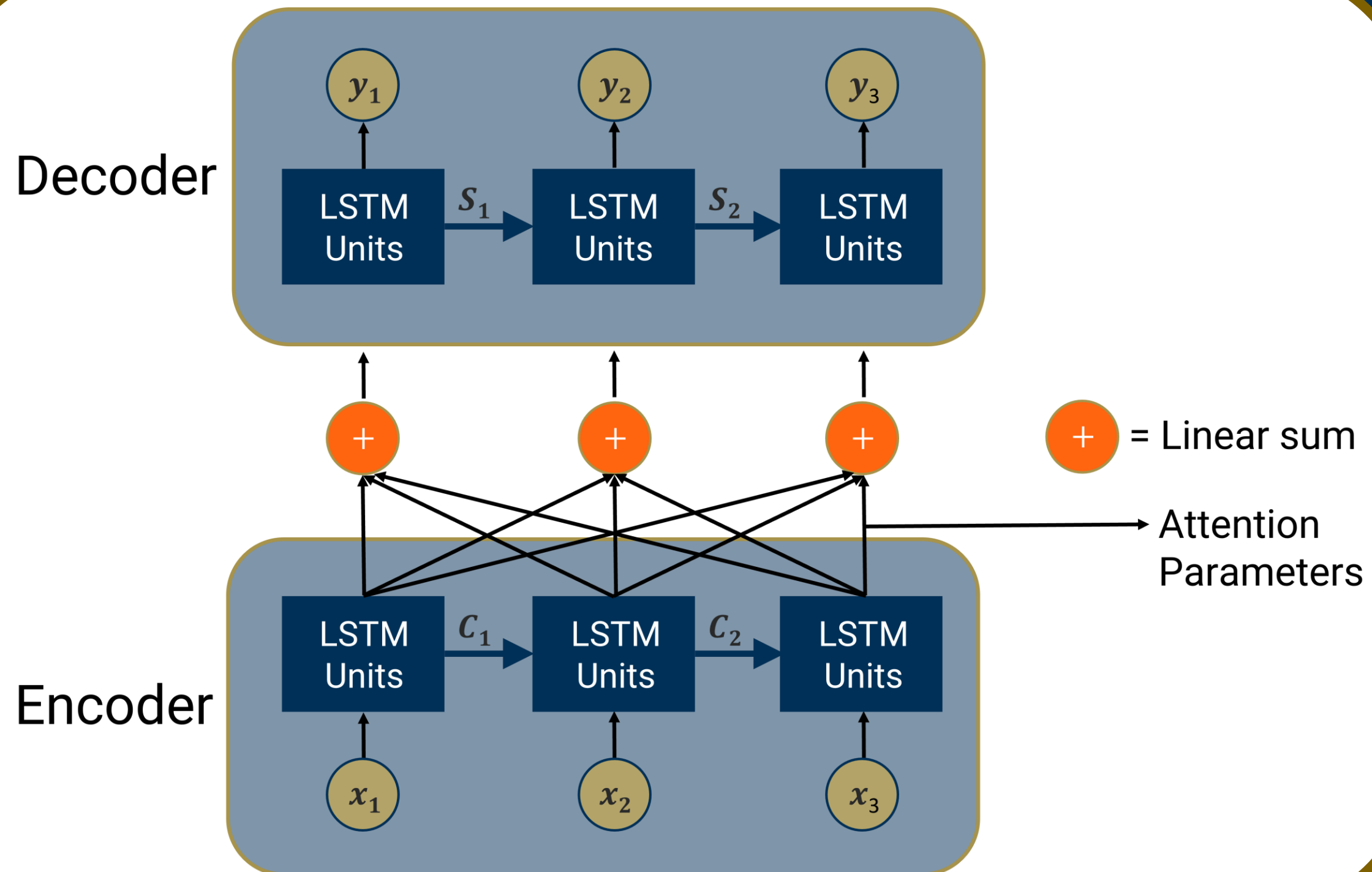
$s_i$ : It is the decoder state

# Why it is the Main Issue Here?



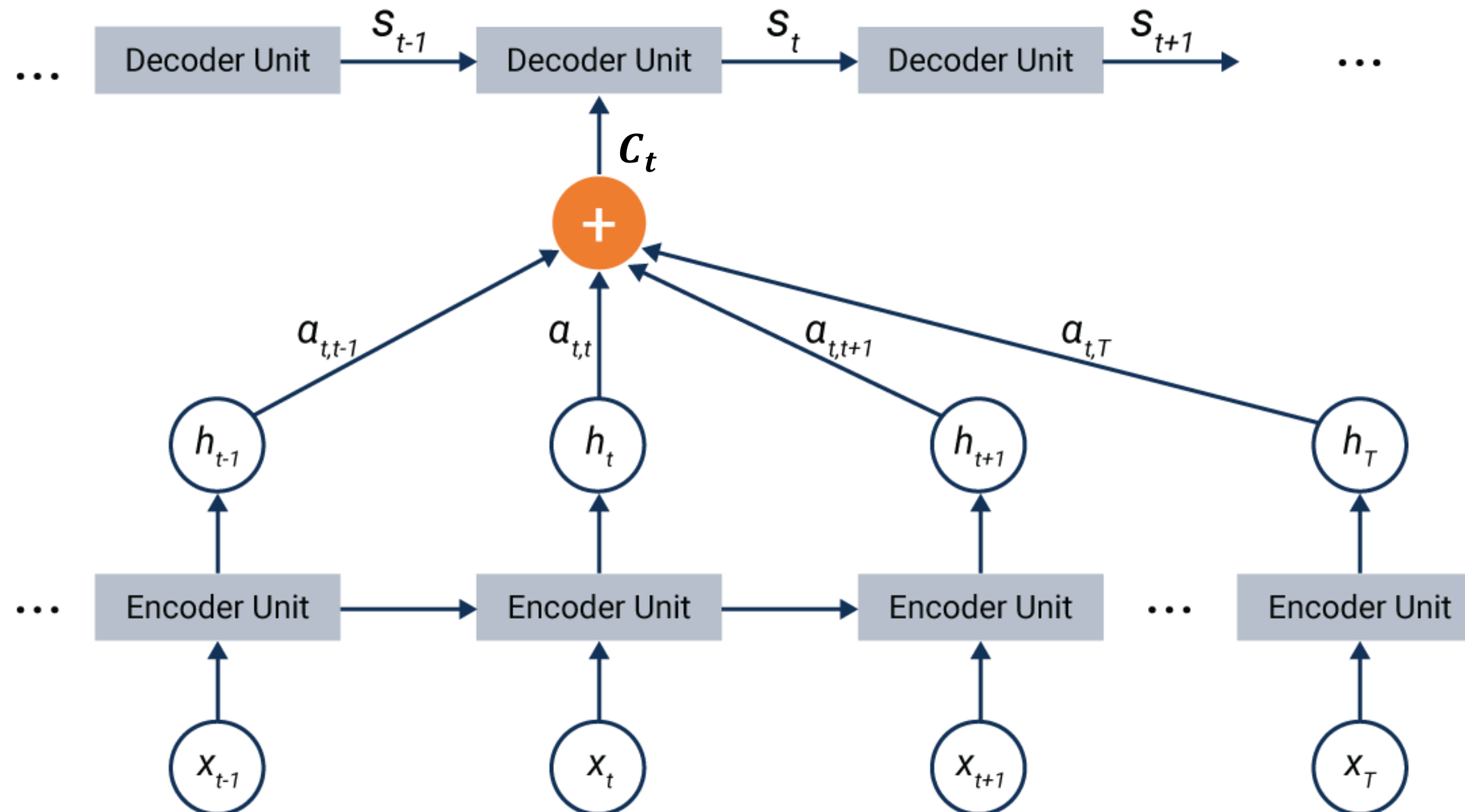


# Attention Mechanism

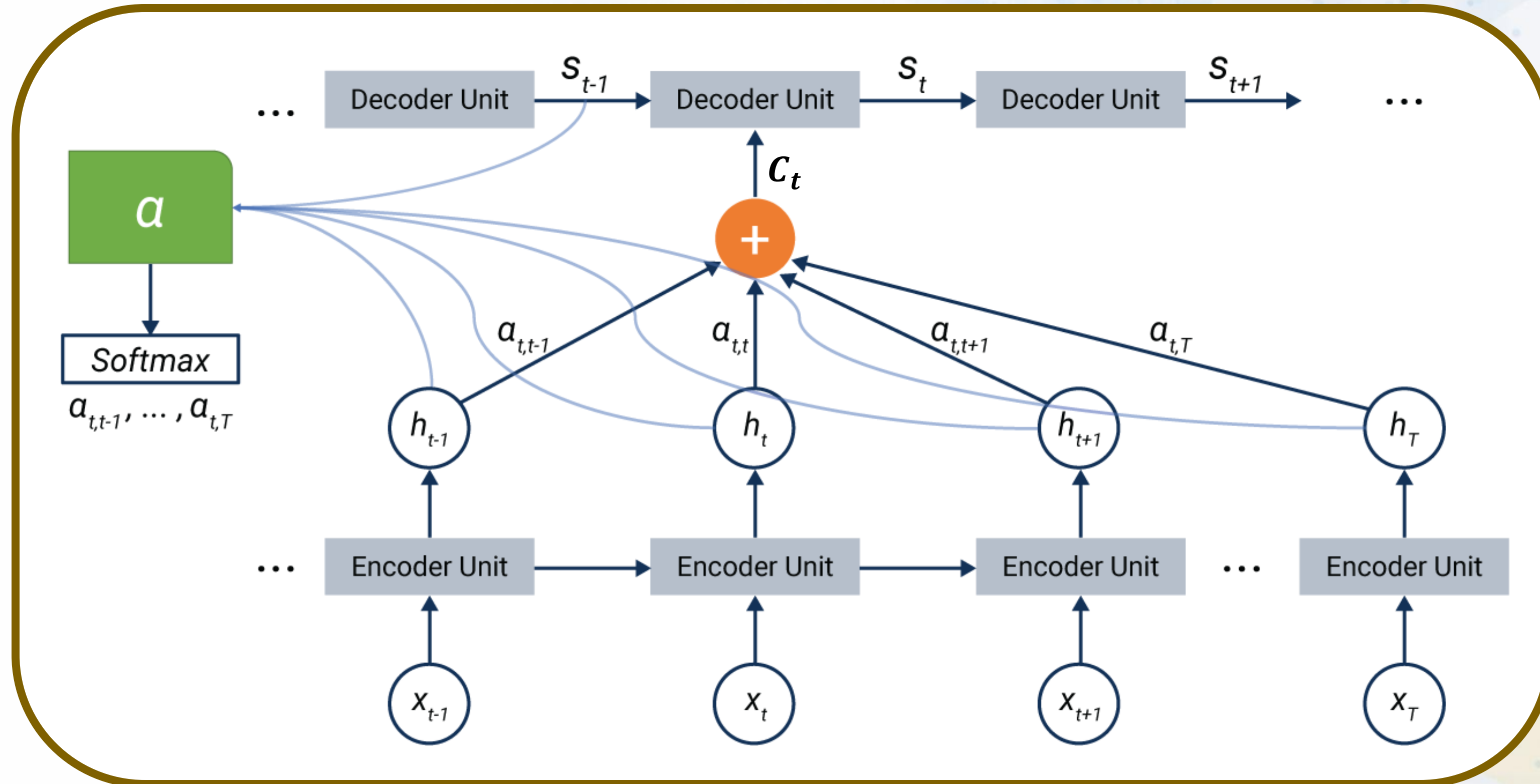




# We Need to Know the Weights Associated with Each Attention



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# Summary

- We learned about the Attention Mechanism
- Encoder and Decoder

