

# Attention - based - Models :

→ Why do we need them ?

→ Intuition & Architecture

→ Attention on Images

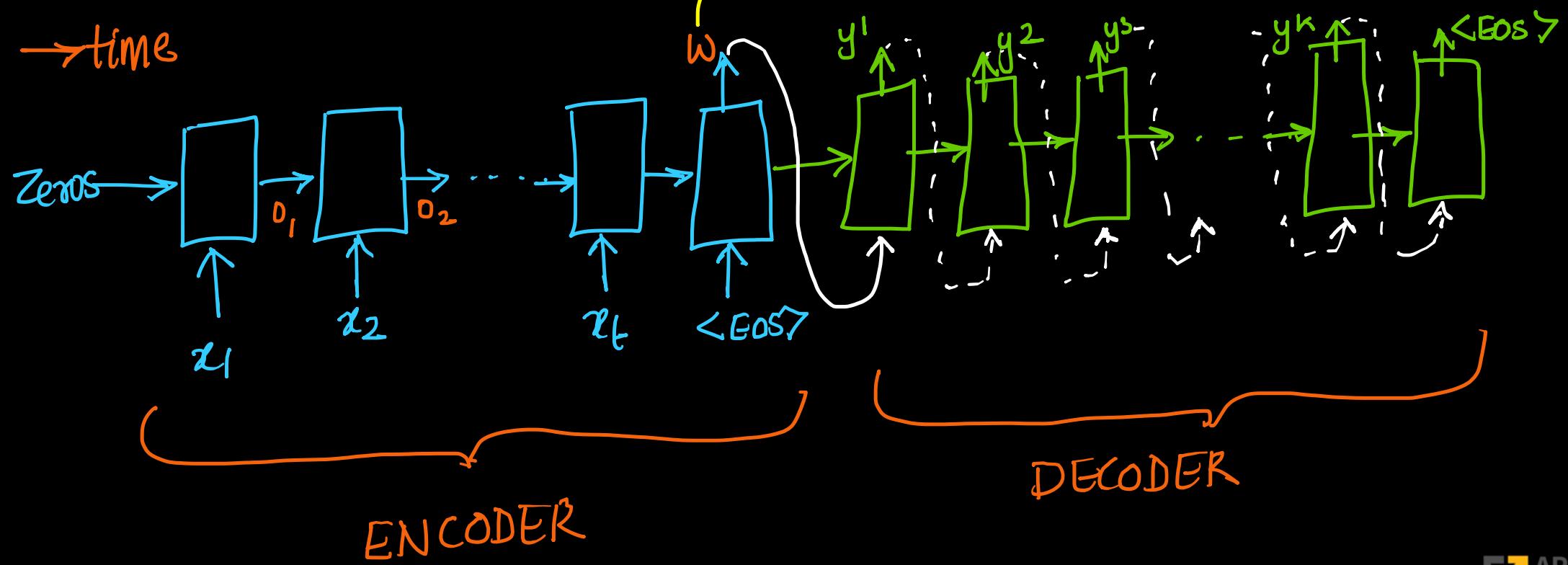
→ one-line code implementation -

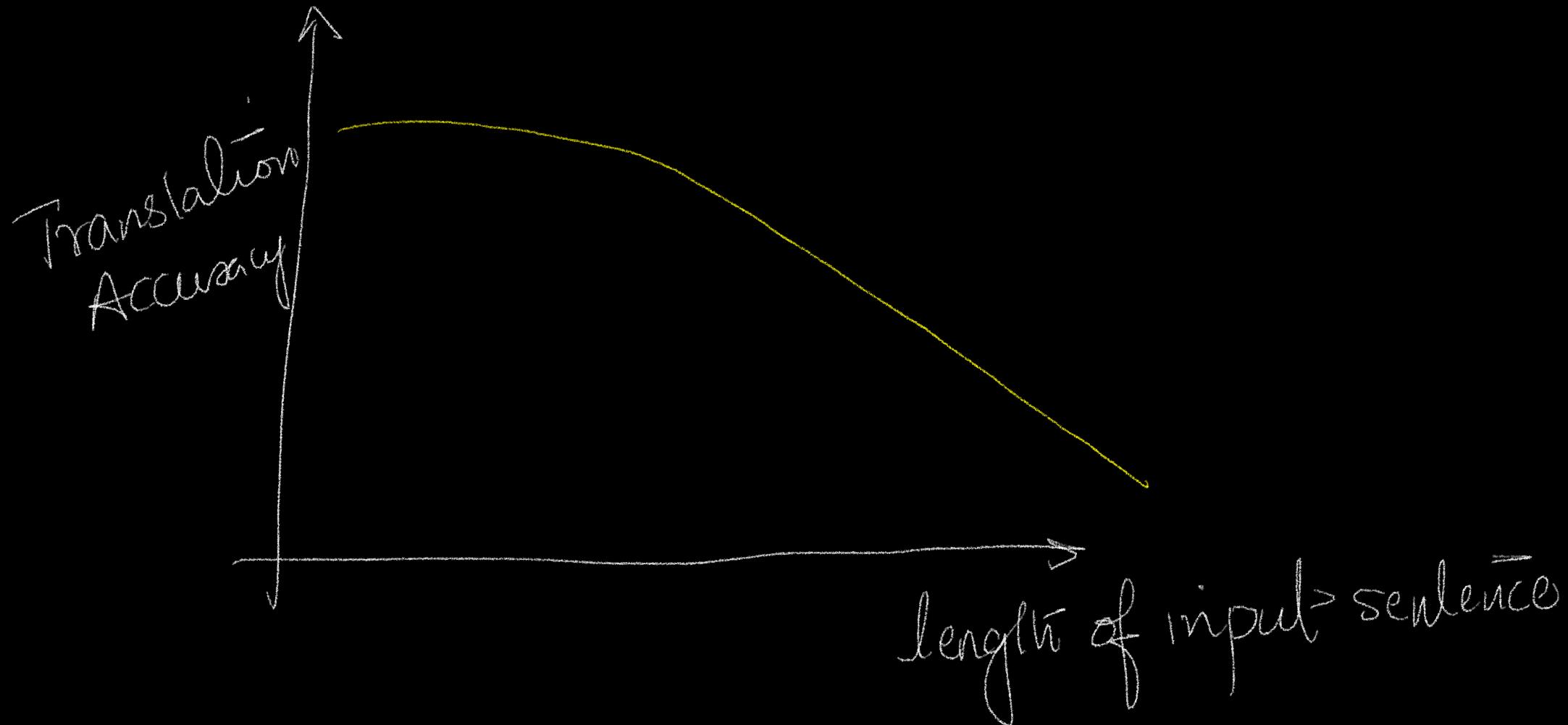
Problems with simple Seq2Seq model: (previous video)

→ lengthy sentences

→ time

Not human-like  
cannot capture the essence of  $\alpha$ .

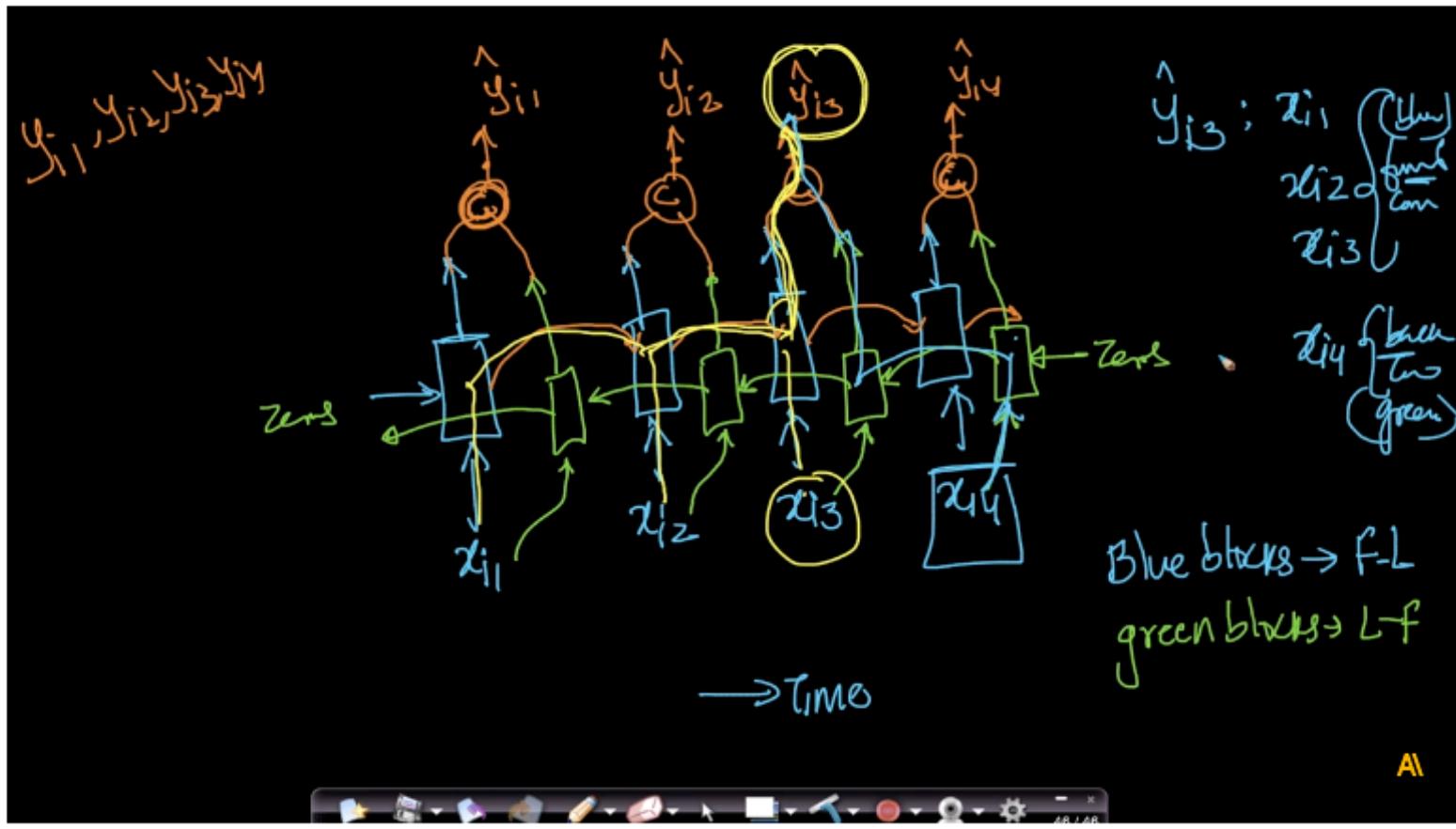


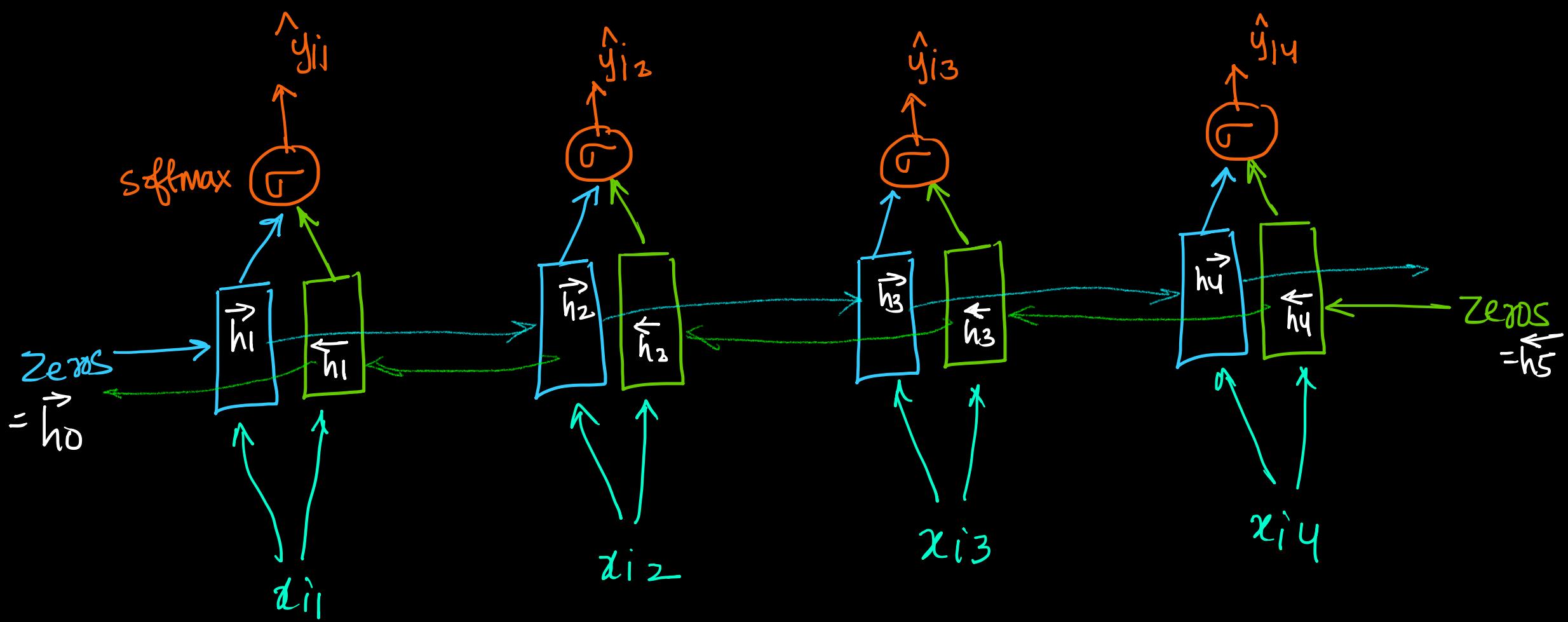


# Bidirectional RNN.

Instructor: Applied AI Course Duration: 12 mins

Full Screen





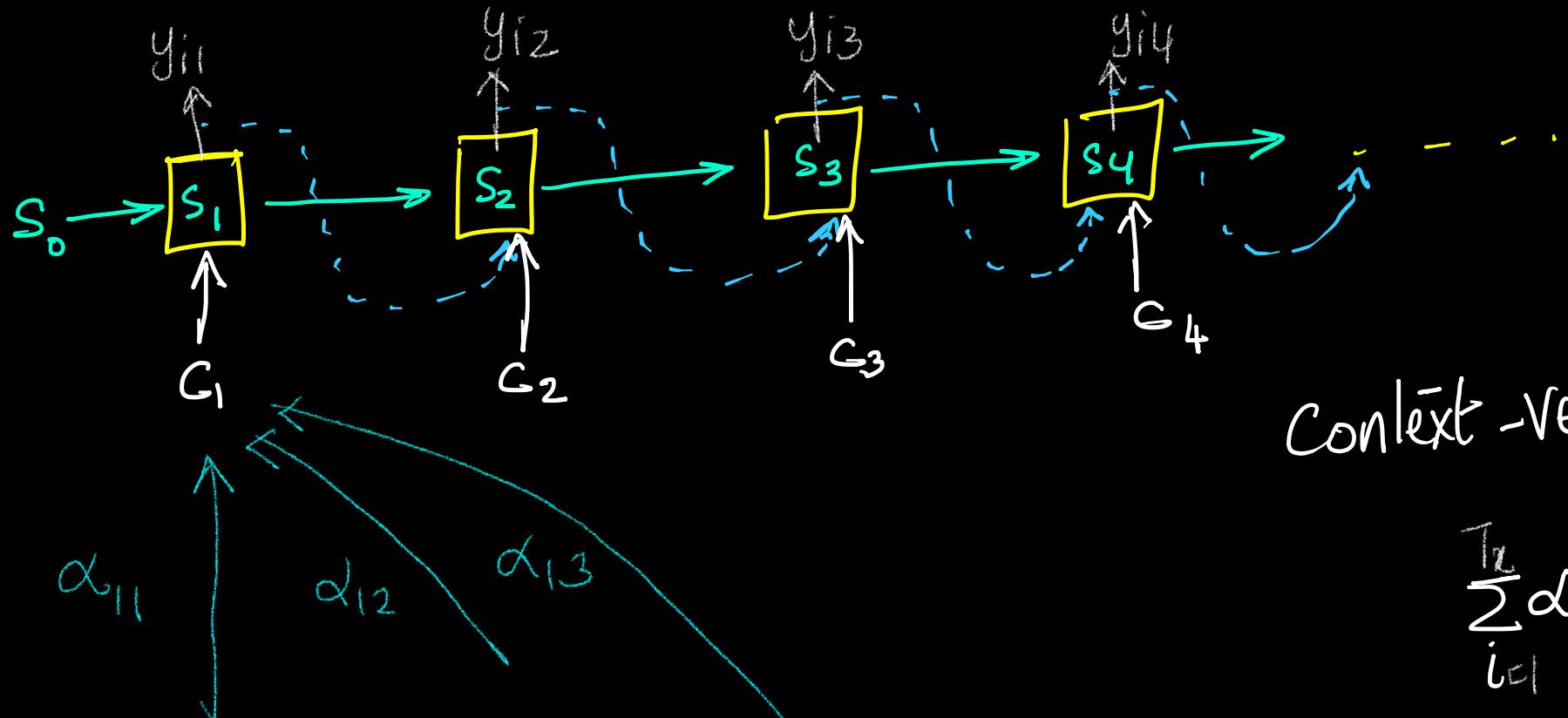
$x_i$ :  $i^{\text{th}}$  input-sentence  
 $y_i$ :  $i^{\text{th}}$  output-sentence

$$\mathcal{D} = \{x_i, y_i\}_{i=1}^n$$

$$h_t = \langle \vec{h}_t, \overleftarrow{h}_t \rangle$$

NEURAL MACHINE TRANSLATION BY JOINTLY LEARNING TO ALIGN AND TRANSLATE <https://arxiv.org/pdf/1409.0473.pdf>

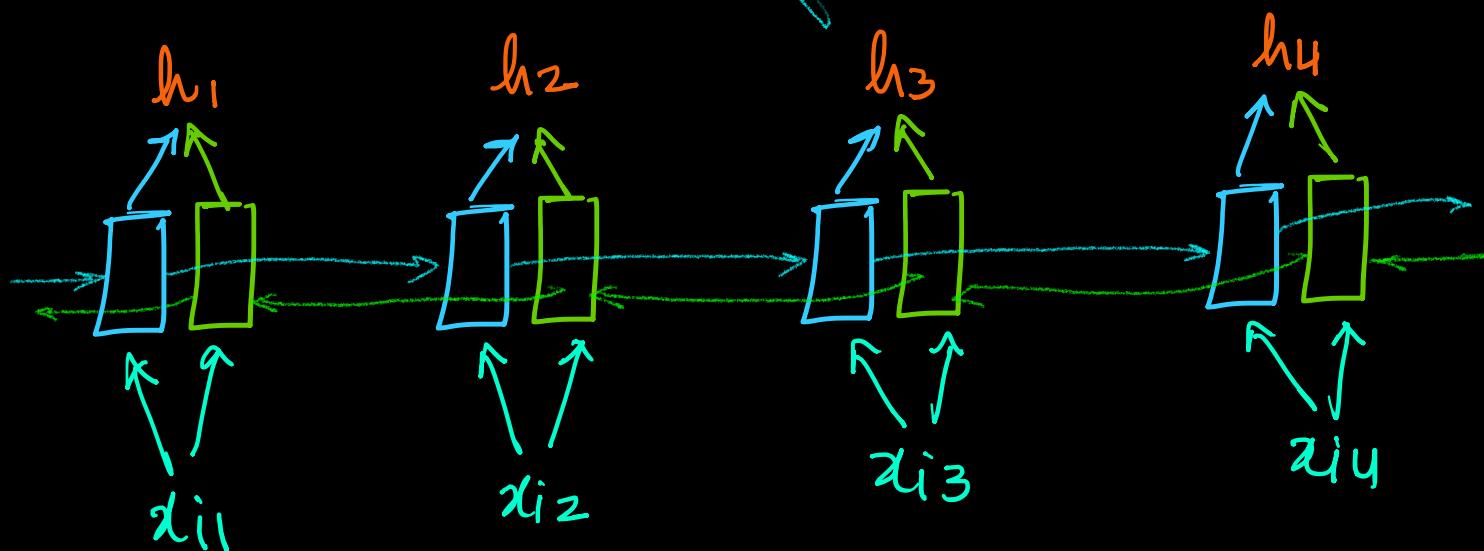
Dzmitry Bahdanau, KyungHyun Cho, Yoshua Bengio, ICLR 2015



decoder

$$\text{Context-Vec} = C_i = \sum_{i=1}^{T_x} h_i d_{ii}$$

$$\sum_{i=1}^{T_x} d_{ii} = 1 \quad \& \quad d_{ii} \geq 0$$



encoder

How to compute  $\alpha_{ij}$ 's ?

$$c_i = \sum_{j=1}^n \alpha_{ij} h_j \quad (\text{eqn 5 in the research paper})$$

$$\alpha_{ij} = \frac{\exp(e_{ij})}{\sum_{k=1}^n \exp(e_{ik})}$$

$\geq 0$

$\sum_j \alpha_{ij} = 1$

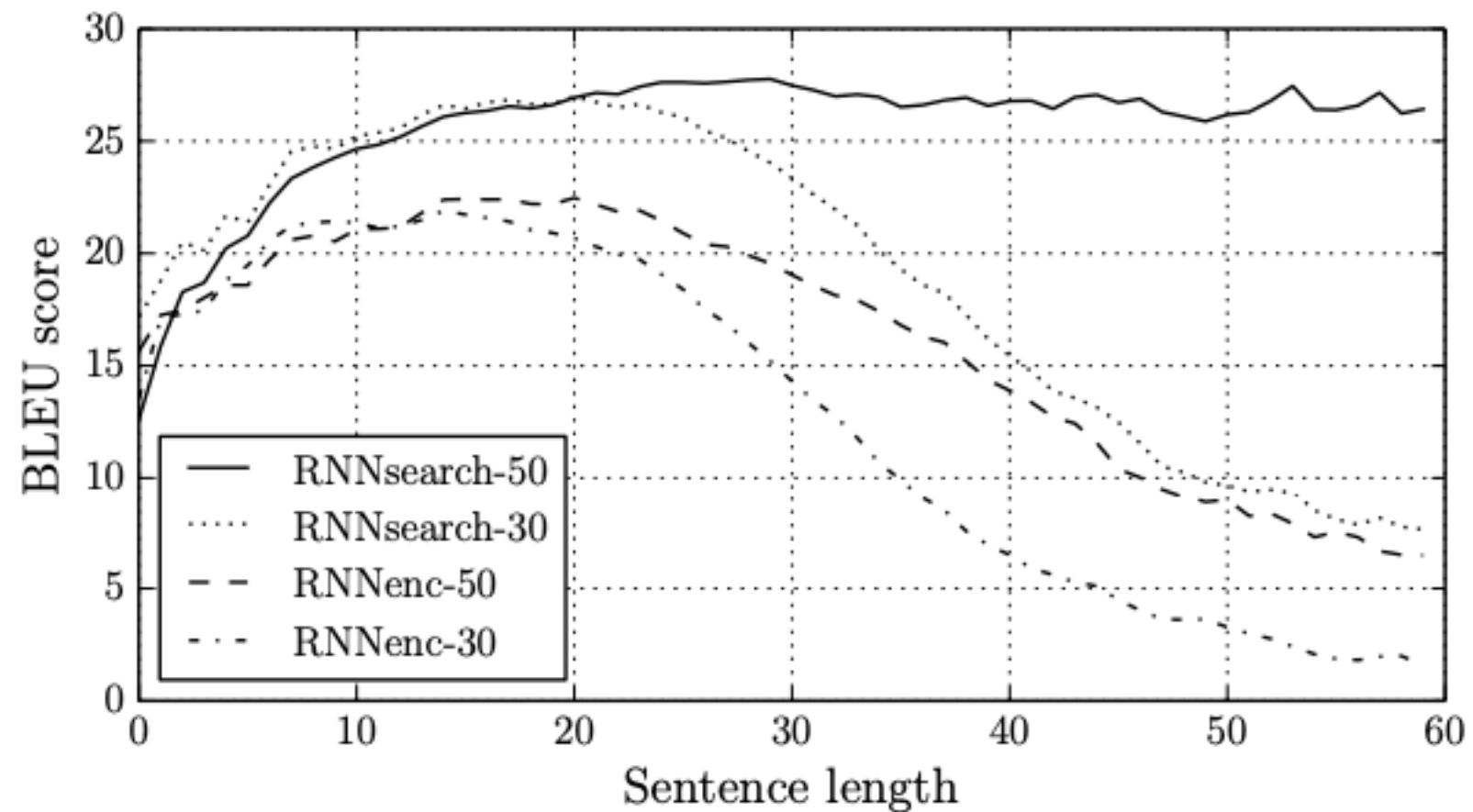
attention-model

$$e_{ij} = a(s_{i-1}, h_j)$$

↓

feed forward NN (small)

Train using BPTT & let it converge



Drawback:

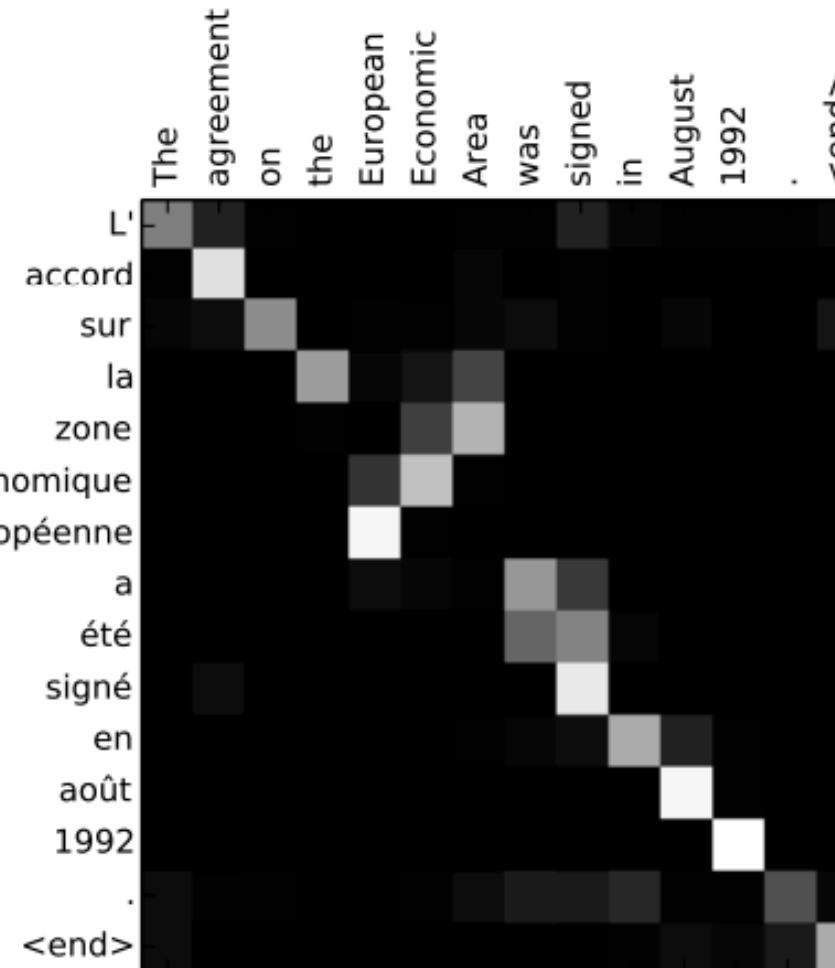
$$\text{Time-complex} = O(K_1 \cdot K_2) \xrightarrow{\substack{\uparrow \\ \text{length of input sentence}}} \text{length of output sentence}$$

[Not a major drawback]

Visualize dij's

making sense  
of what's  
happening

{Debugging}

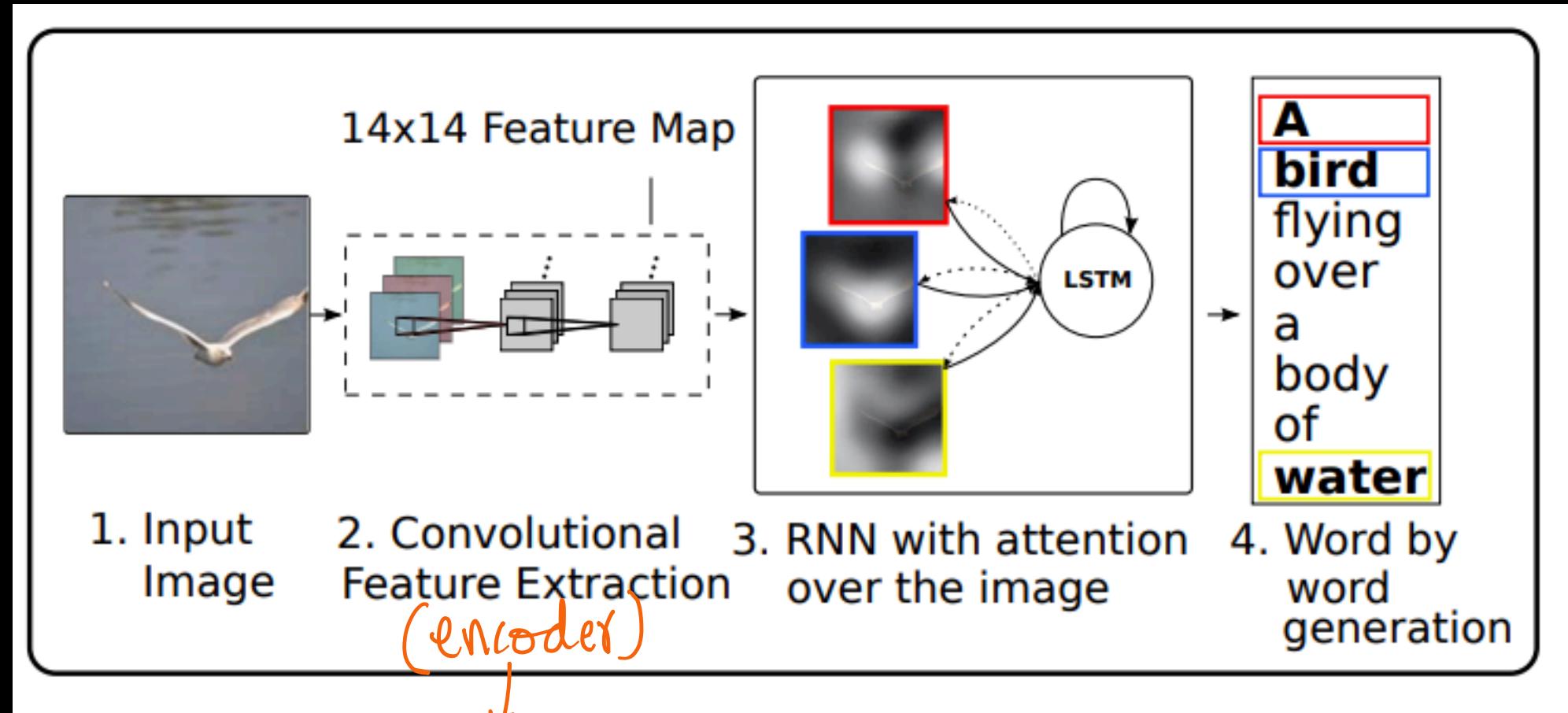


# Show, Attend and Tell: Neural Image Caption Generation with Visual Attention

Kelvin Xu, Jimmy Ba, Ryan Kiros, Kyunghyun Cho, Aaron Courville, Ruslan Salakhutdinov, Richard Zemel, Yoshua Bengio

[2015]

<https://arxiv.org/pdf/1502.03044.pdf>



" $L$ '  $d$ -dim vectors for each image-region

# Visualizing dij's:



A woman is throwing a frisbee in a park.



A dog is standing on a hardwood floor.



A stop sign is on a road with a mountain in the background.



A little girl sitting on a bed with a teddy bear.



A group of people sitting on a boat in the water.



A giraffe standing in a forest with trees in the background.

One-line implementation:

[https://www.tensorflow.org/api\\_docs/python/tf/keras/layers/Attention](https://www.tensorflow.org/api_docs/python/tf/keras/layers/Attention)

<https://towardsdatascience.com/light-on-math-ml-attention-with-keras-dc8dbc1fad39>



