

Introduction to AI

All for One

Choi Minjoo

Choi Minjoo (Judy Choi)

- Careers
 - 2018 Working Holiday in France
 - 2020 ~ M.S in Kangwon Univ
 - Intelligence Software Lab
 - NLP (Machine Translation)
 - 2021 ~ 2022 Bering Lab (NLP Researcher & Engineer)
- SNS
 - <https://www.facebook.com/minjoo.choi.562/>
 - <https://github.com/Judy-Choi>
 - <https://www.linkedin.com/in/judy-choi/>



Before we start the class..

Let's have a discussion!

What is your goal?

- What do you want to get in our class?
- Why are you interested in A.I?
- What do you want to do?
- Please feel free to share what you think 😊

Minjoo's Goal..

- In my case...
 - My dream is ‘Overcome the language barrier’ 
 - So I studied A.I
 - To develop a translator (ex: Google Translate)
- In our class...
 - Learn about A.I (* Deep dive into NLP)
 - Develop simple translator

Today's Contents

- Abstract of A.I
- Natural Language Processing (NLP)
- Deep dive into NLP Model : Transformer

Abstract of A.I

A.I?

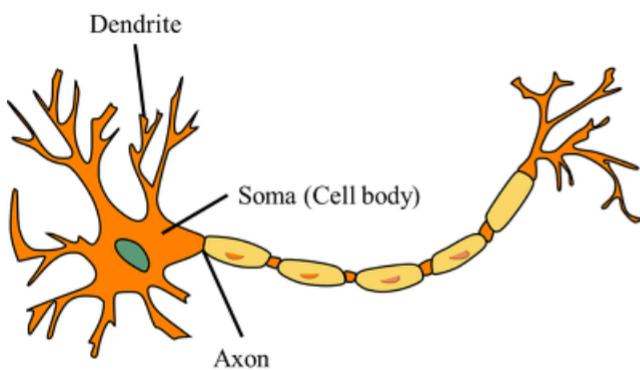
Artificial Intelligence

A.I (Artificial Intelligence)

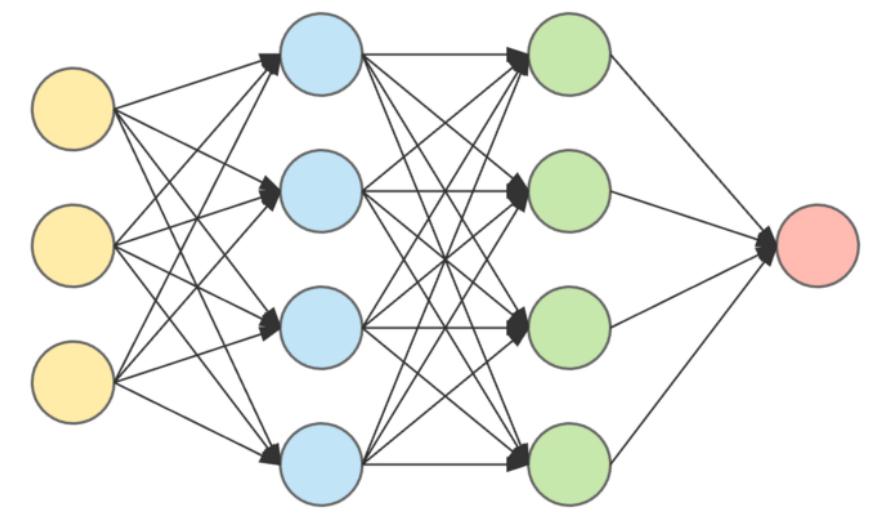
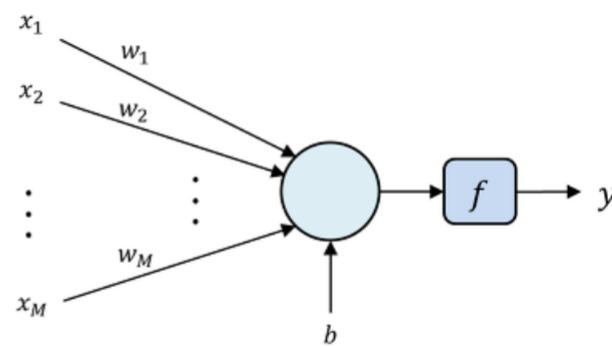
- Intelligence made by human
- Similar to human brain
- So, how does it work? 🤔

Neural Network

- Artificial neural network mimicking neural networks in the human brain.
- Brain : Neuron = A.I : Perceptron



[그림 1] 생물체의 neuron (좌)과 artificial neuron (우)



input layer

hidden layer 1

hidden layer 2

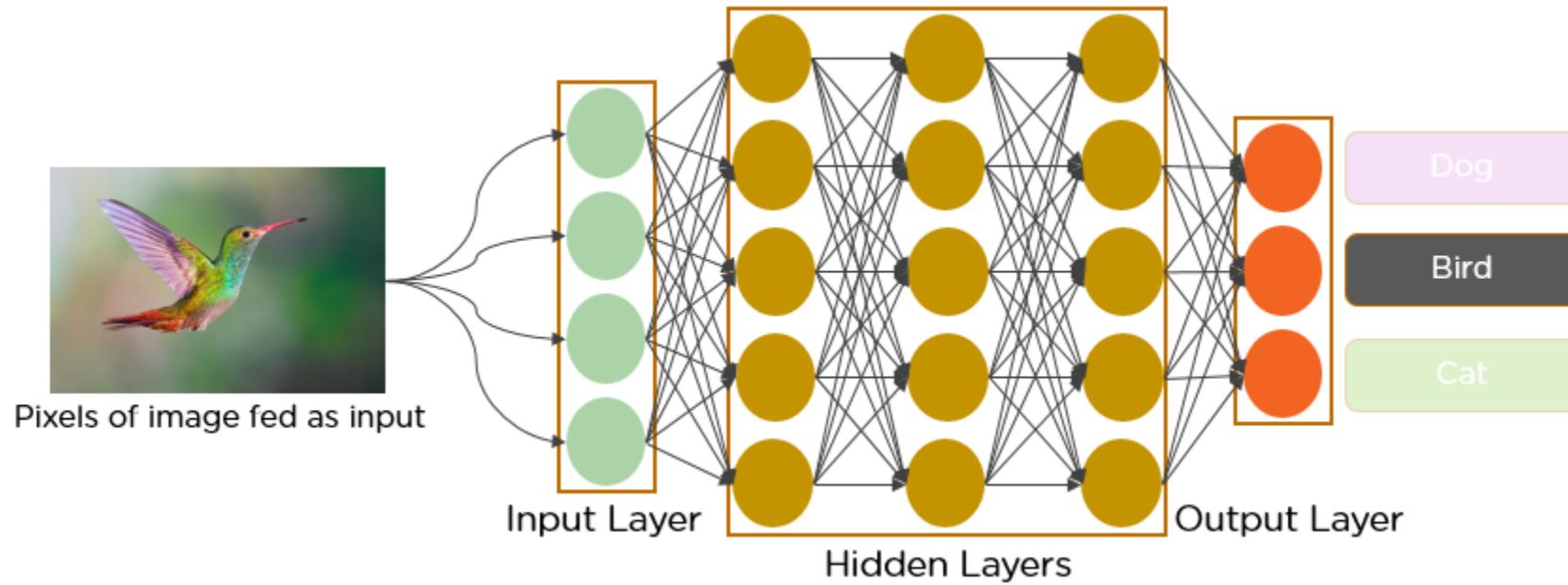
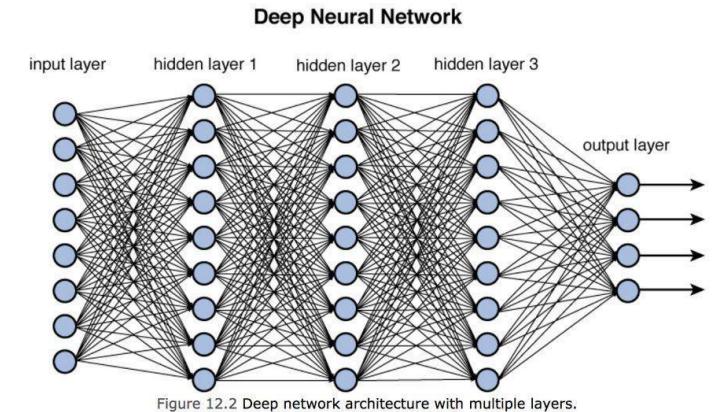
output layer

<https://smartstuartkim.wordpress.com/2019/01/27/history-of-neural-networks-1-perceptron/>

<https://gongster.medium.com/how-does-a-neural-network-work-intuitively-in-code-f51f7b2c1e3f>

Deep Neural Network (DNN)

- A network of multiple layers of perceptron layers



<https://towardsdatascience.com/training-deep-neural-networks-9fdb1964b964>

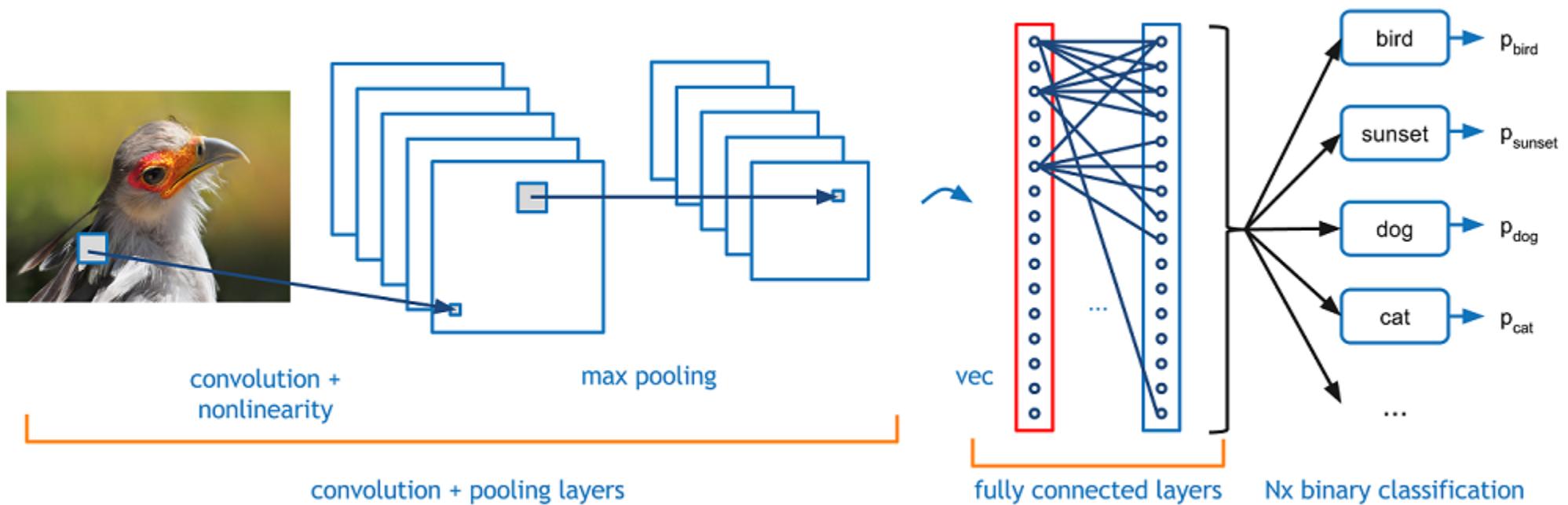
<https://www.analyticsvidhya.com/blog/2021/05/convolutional-neural-networks-cnn/>

(Tip) 3 big category of AI

- 🖤 CV (Computer Vision)
- 💋 NLP (Natural Language Processing)
- 📊 DS (Data Science)

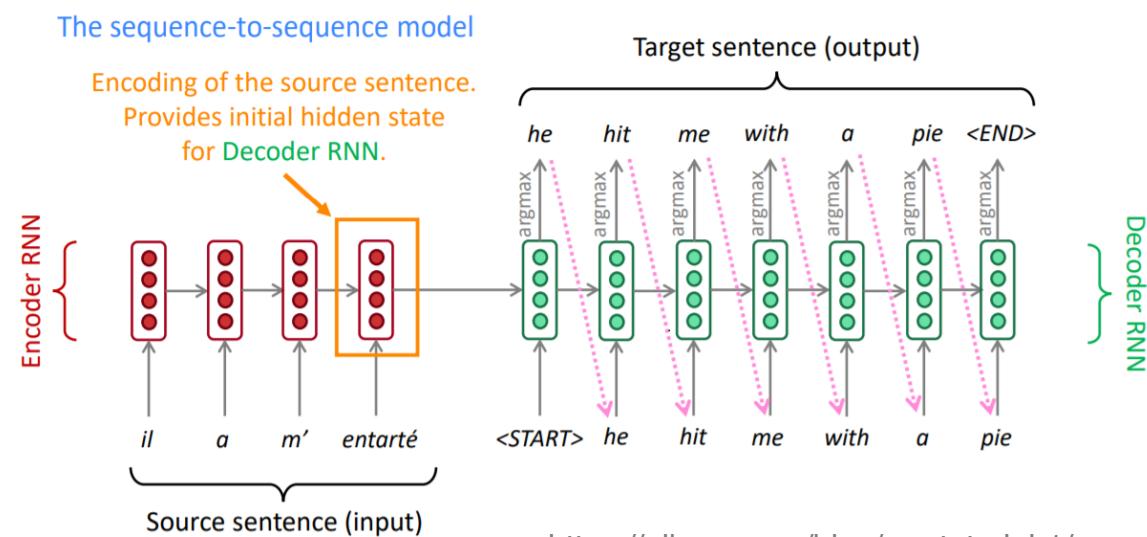
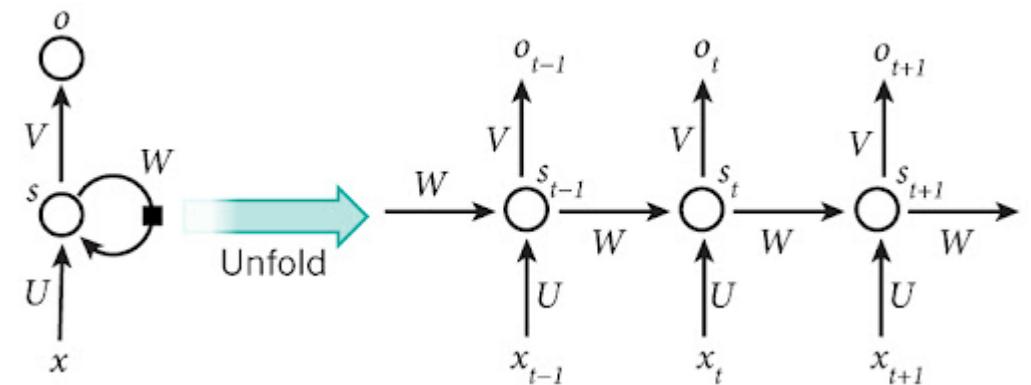
CV (Computer Vision)

- CNN (Convolution Neural Network)



NLP (Natural Language Processing)

- RNN (Recursive Neural Network)
- Seq2Seq (Sequence to Sequence)



<https://aikorea.org/blog/rnn-tutorial-1/>

<https://medium.com/analytics-vidhya/neural-machine-translation-using-bahdanau-attention-mechanism-d496c9be30c3>

Only A.I model is all we need?



We need more...

Process

1. Set your **goal**
2. Prepare **Dataset** for your goal
3. **Train** model using dataset
4. **Evaluate** the model performance

Example in my case

1. I want Korean-English Translator!
2. Get Korean-English dataset
3. Train NLP model for ‘Machine Translation’ using dataset
4. Evaluate my model performance

Natural Language Processing (NLP)

NLP?

- ‘Interactions between computers and human language’
- A subfield of linguistics, computer science, and artificial intelligence
- Programming computers to process and analyze large amounts of natural language data.
- The goal is a computer capable of "understanding" the contents of documents, including the contextual nuances of the language within them.

Field of application

- Chatbot
 - ChatGPT, Alexa, Siri, Bixby.
- Text Summarization
 - Google search
- Document Classification
 - Spam mail filtering
- Machine Translation
 - Google Translate



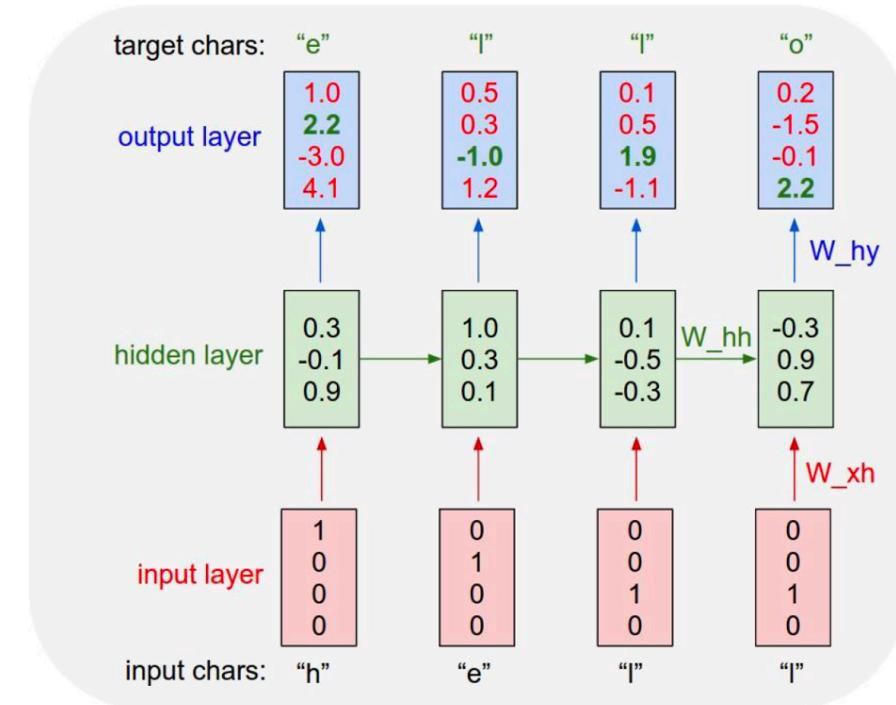
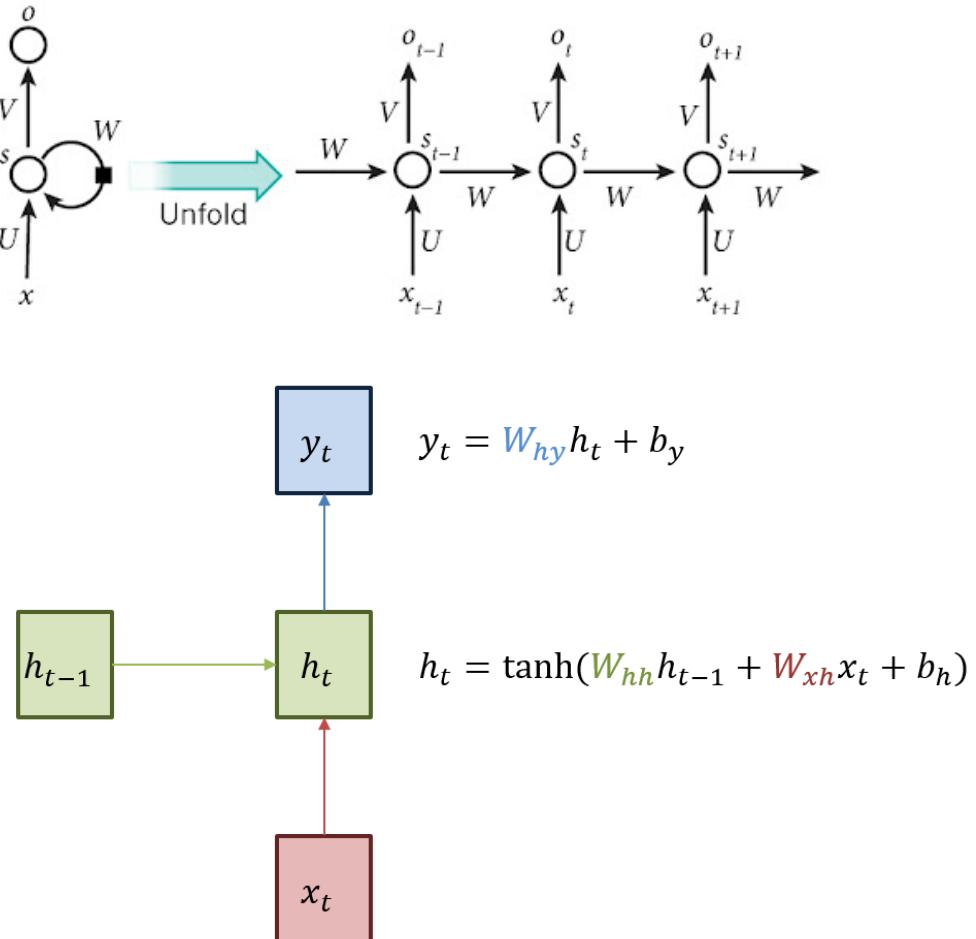
Uzbekistan

Country in Central Asia

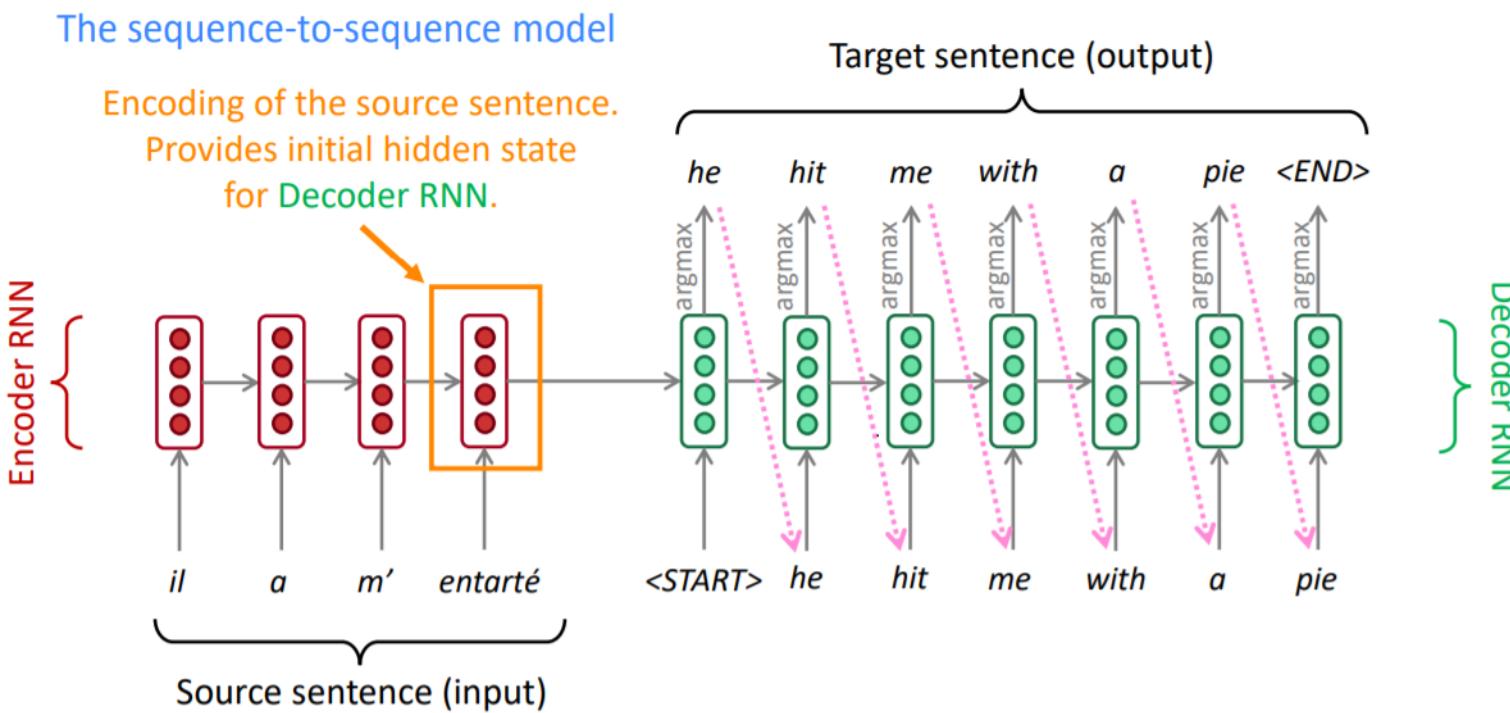
Uzbekistan is a Central Asian nation and former Soviet republic. It's known for its mosques, mausoleums and other sites linked to the Silk Road, the ancient trade route between China and the Mediterranean. Samarkand, a major city on the route, contains a landmark of Islamic architecture: the Registan, a plaza bordered by 3 ornate, mosaic-covered religious schools dating to the 15th and 17th centuries. — Google



RNN (Recursive Neural Network)

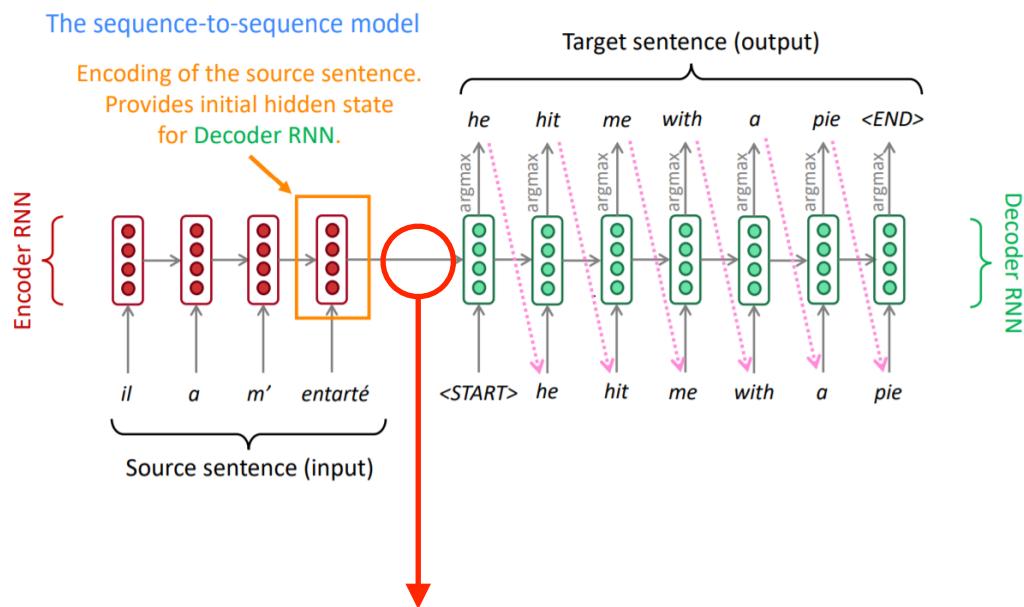


Seq2Seq

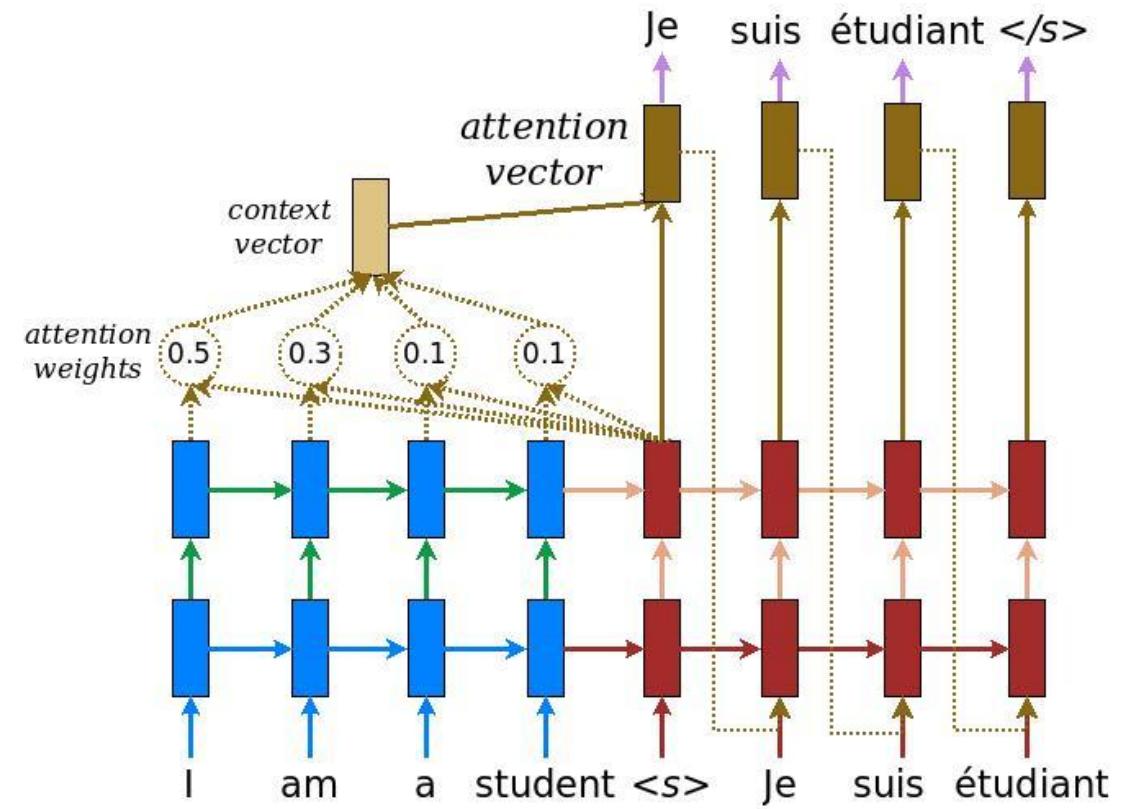


Seq2Seq + ‘Attention’

- Decoder learn to focus over a specific range of the input sequence

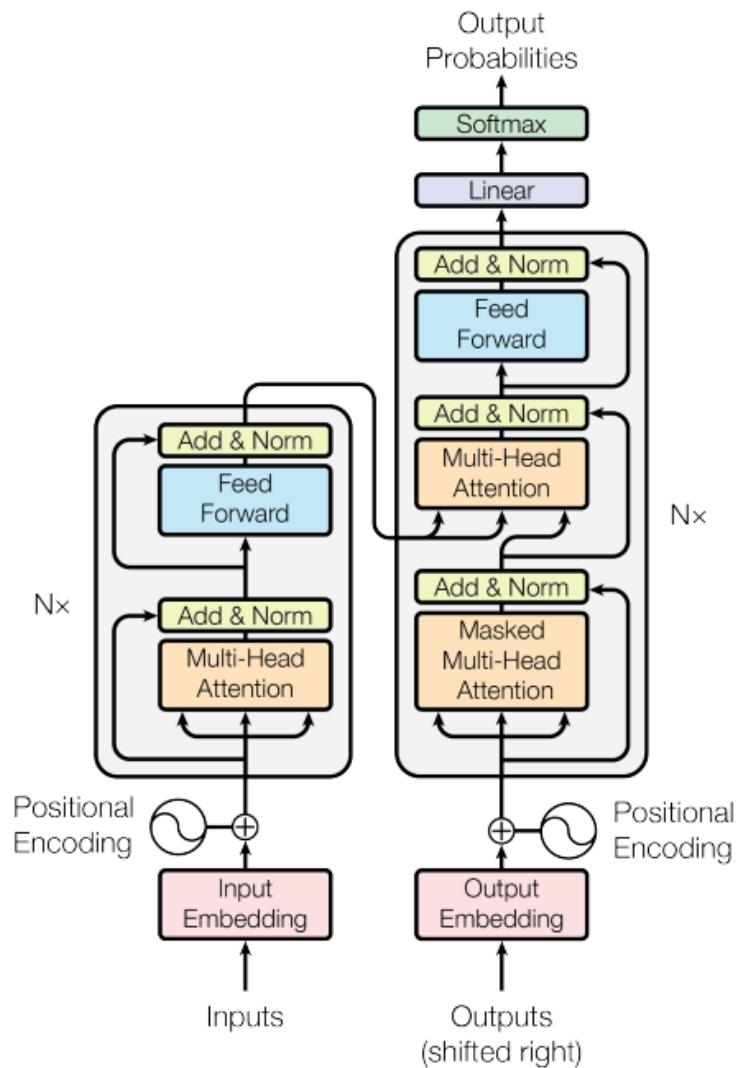


Bottleneck Problem!



Transformer

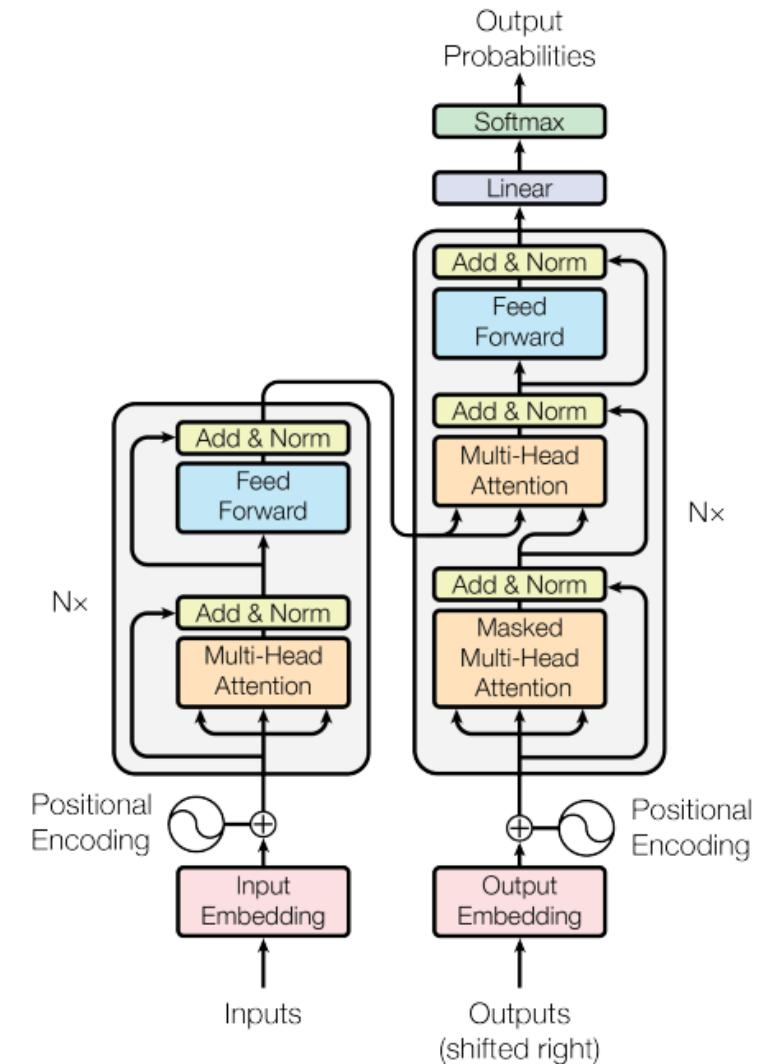
- ‘Attention is All you Need’



Deep dive into NLP Model: Transformer

Why we deep dive into Transformer?

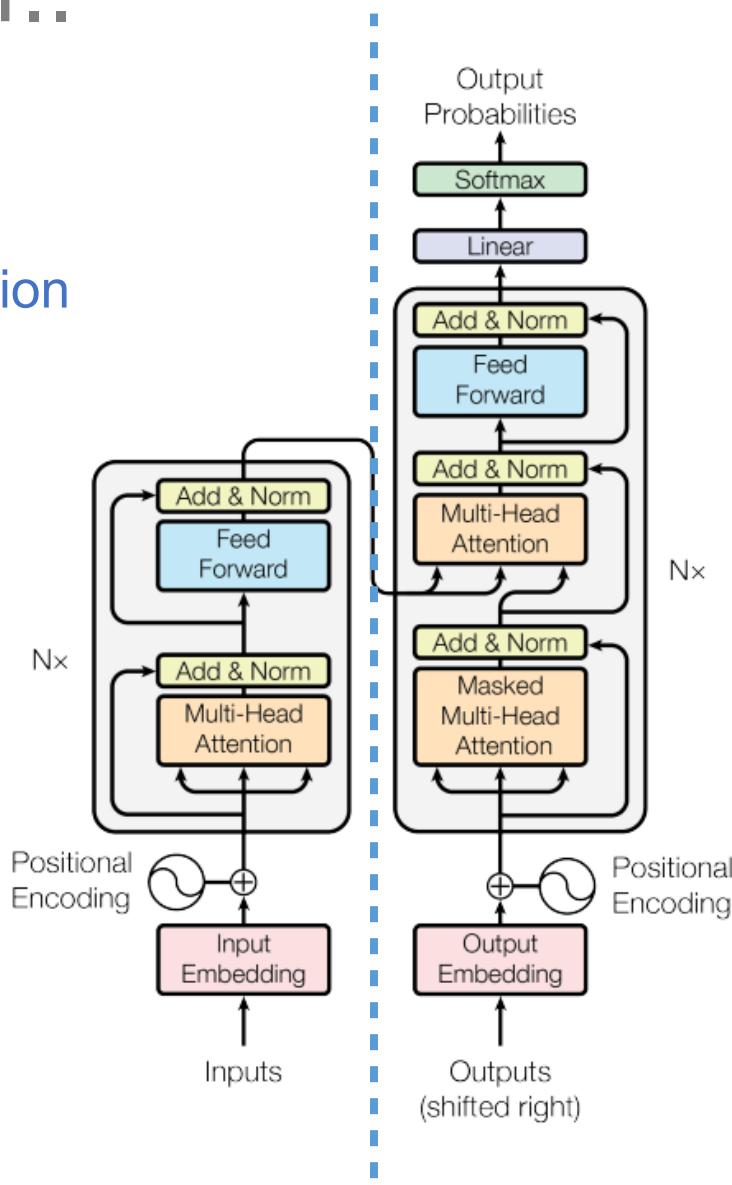
- Revolution in the NLP world!
- Root of BERT, GPT (ChatGPT)...



After Transformer..

Encoder

- Extracts contextual information
- Base of **BERT**



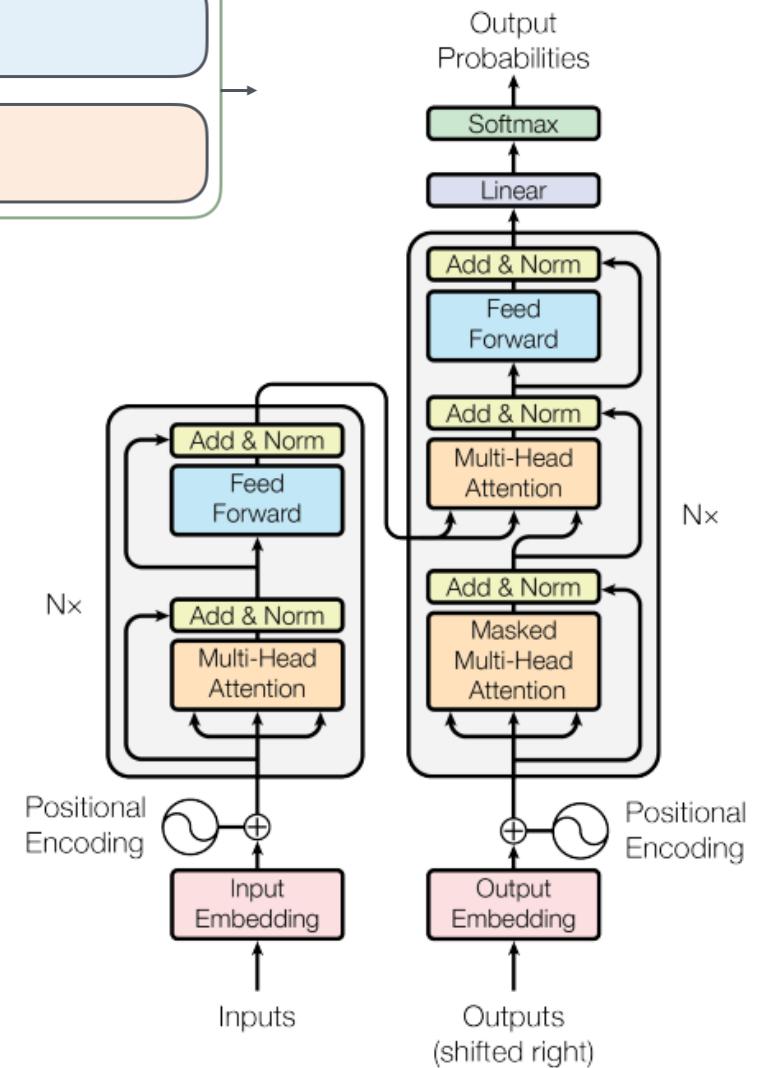
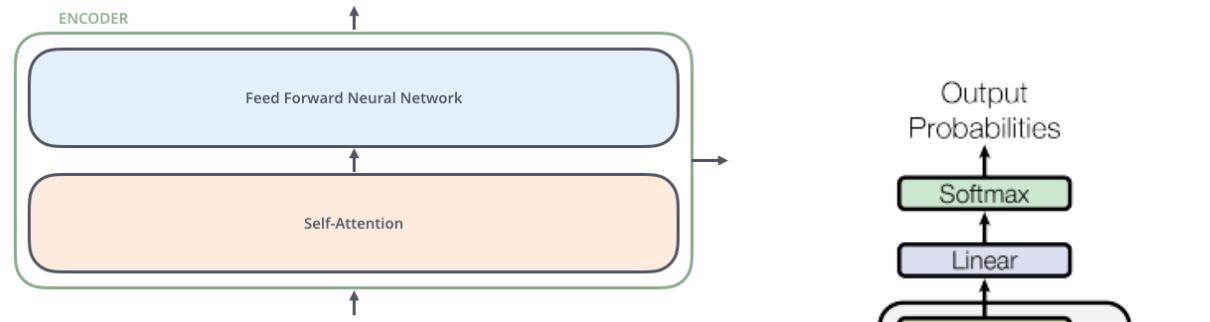
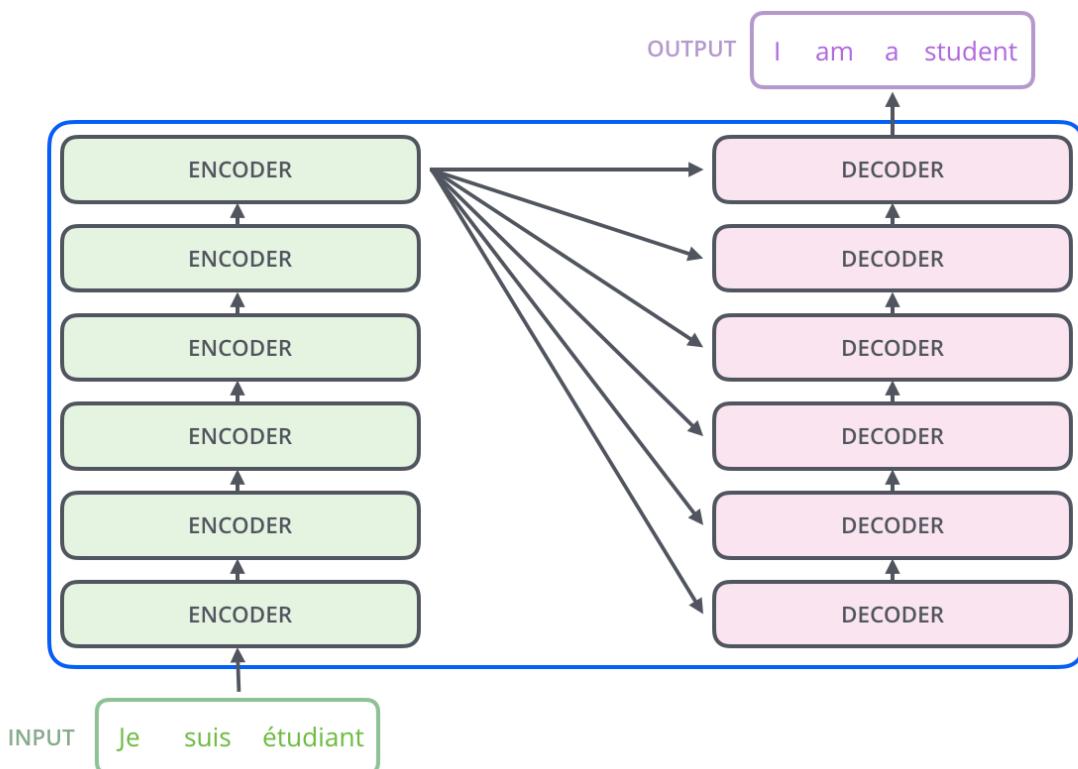
Decoder

- **Generates** the desired output
- Base of **GPT**

Let's dive!

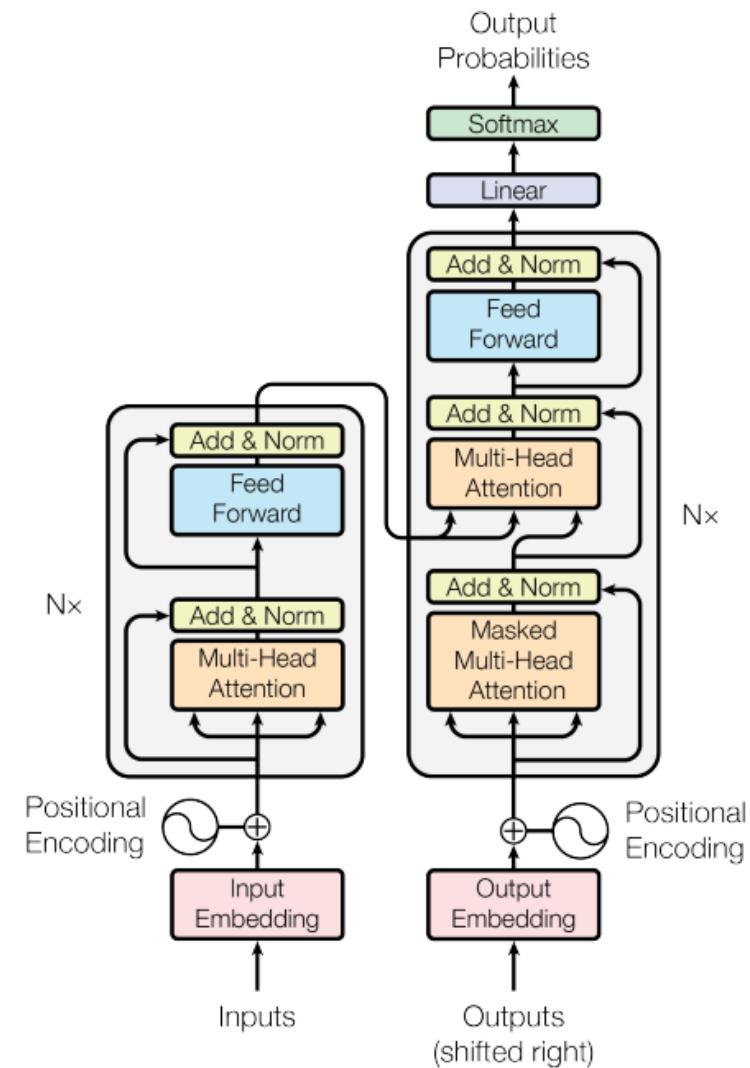
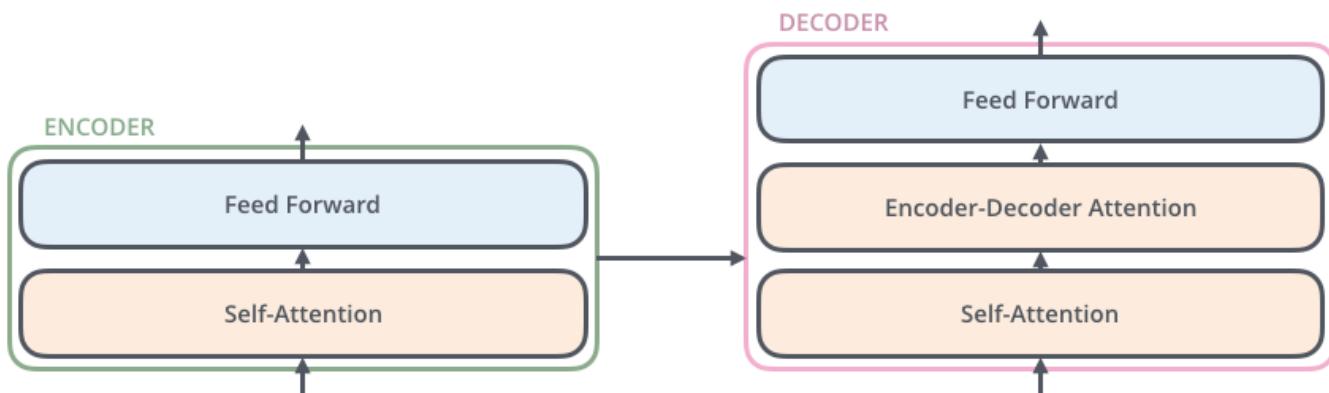
Transformer

- Encoder – Decoder (6-6)



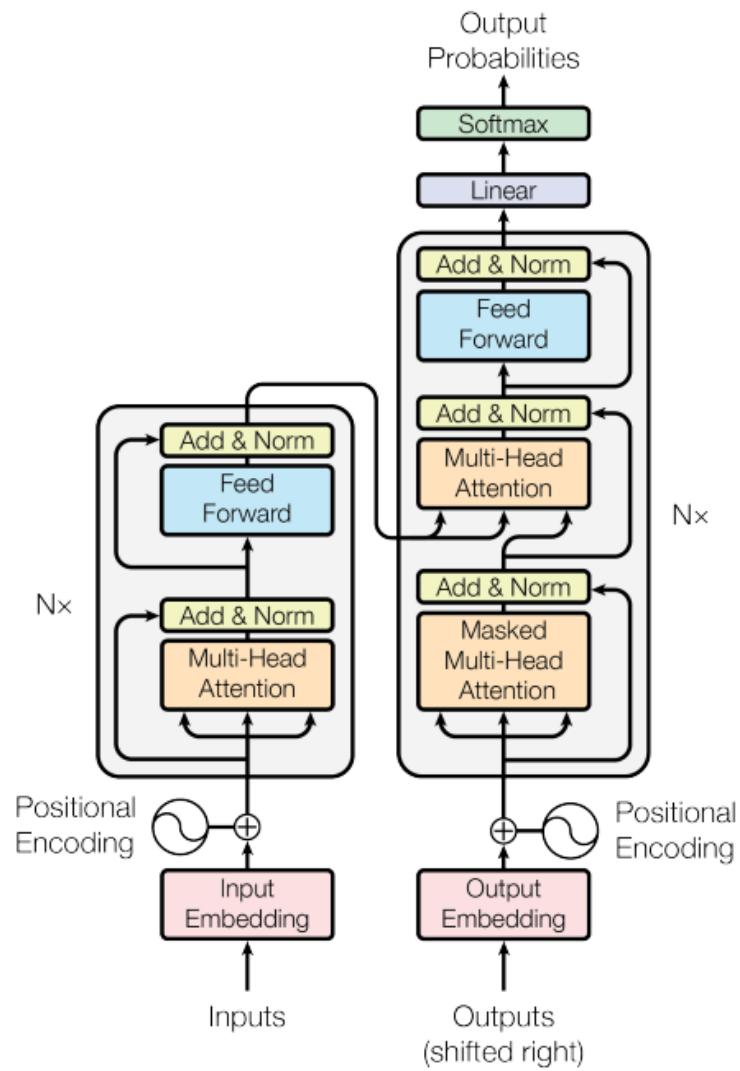
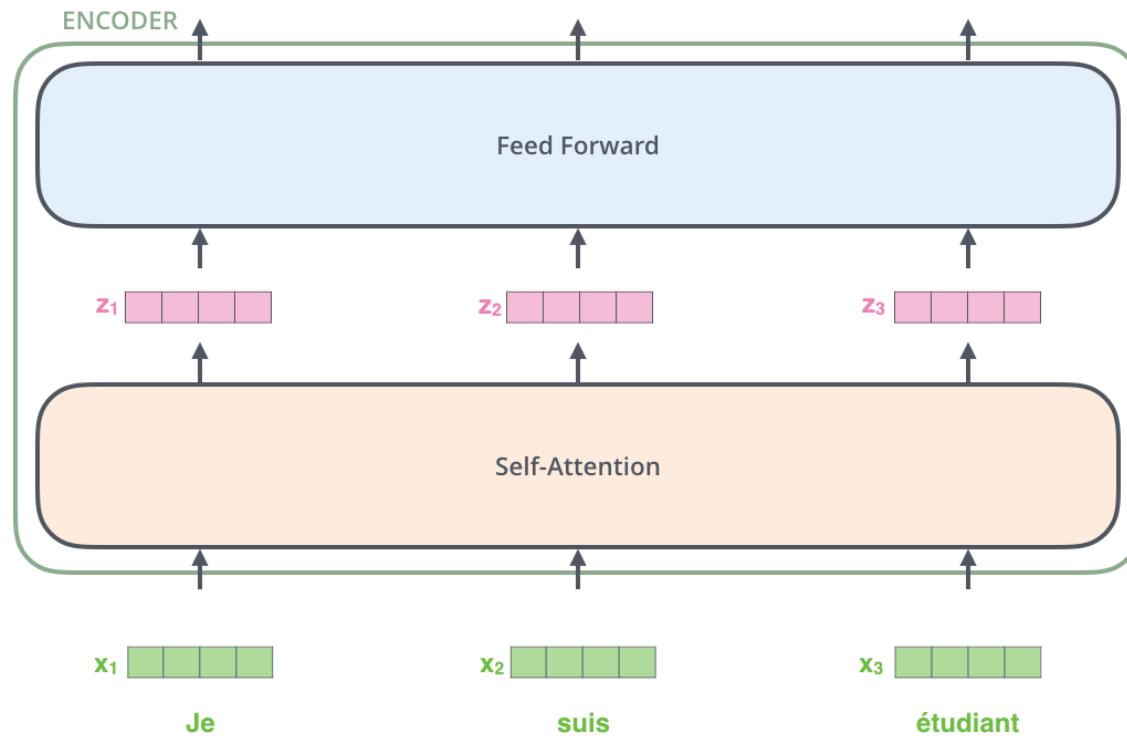
Transformer

- FFNN & Self-Attn in Encoder



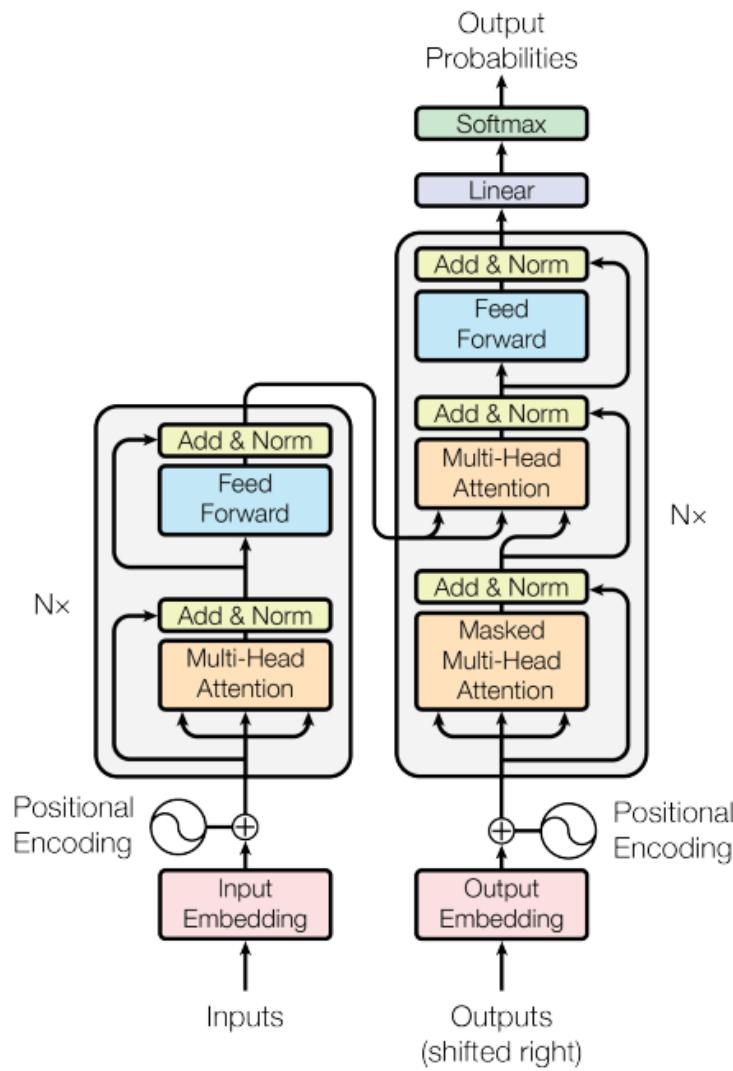
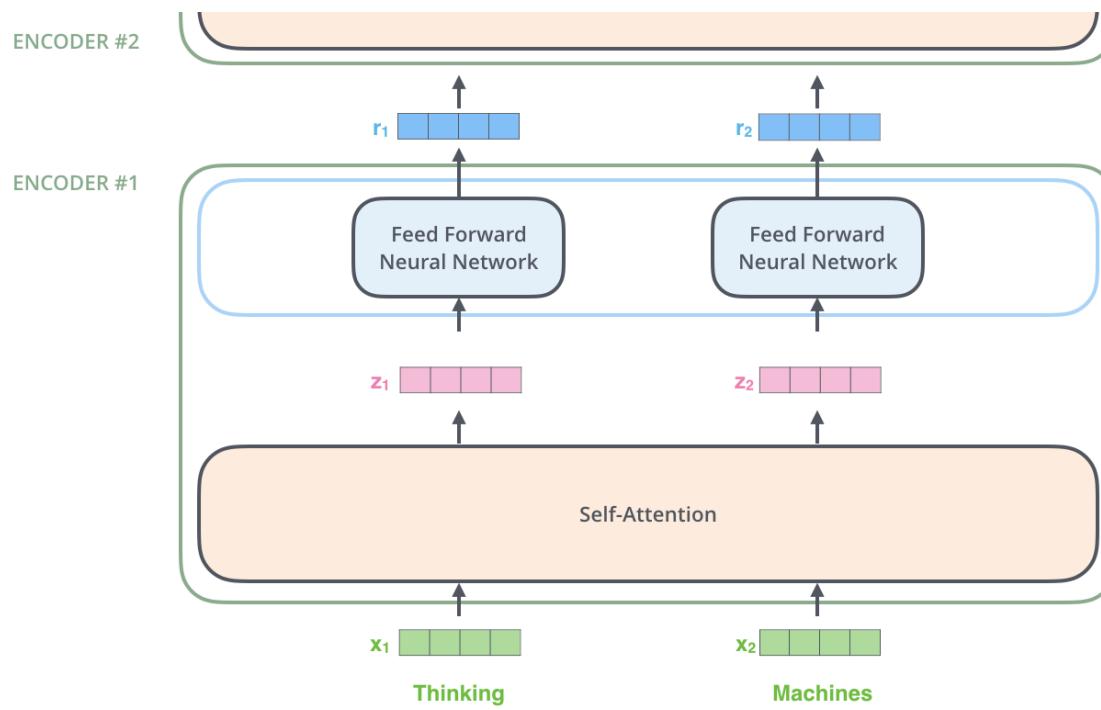
Transformer

- Input embedding



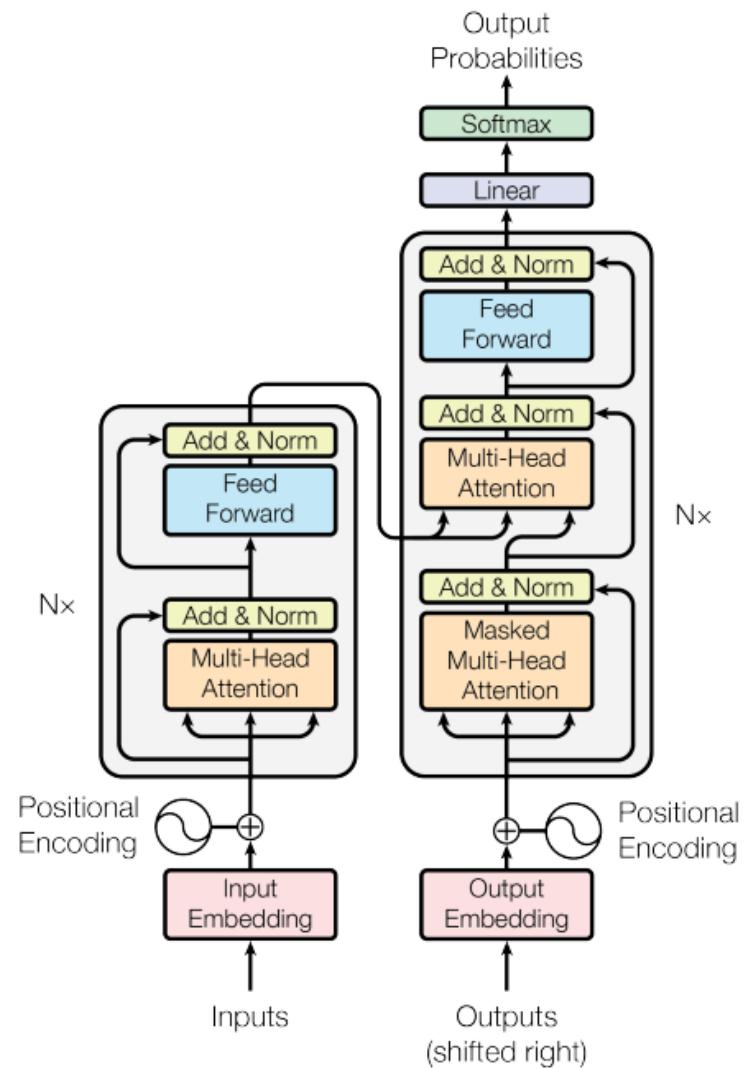
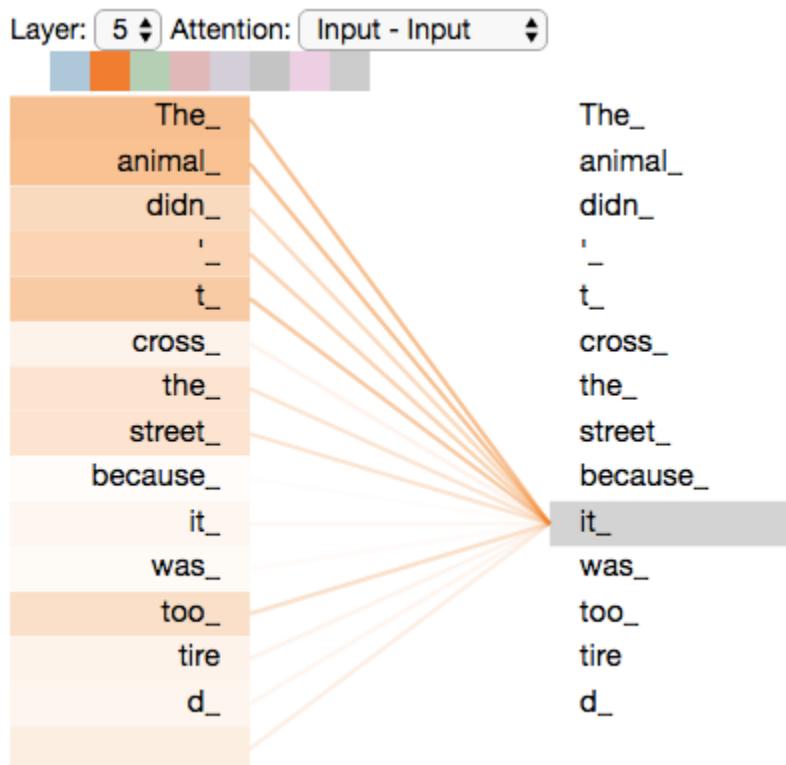
Transformer

- Encoding



Transformer

- Self-Attention



Transformer

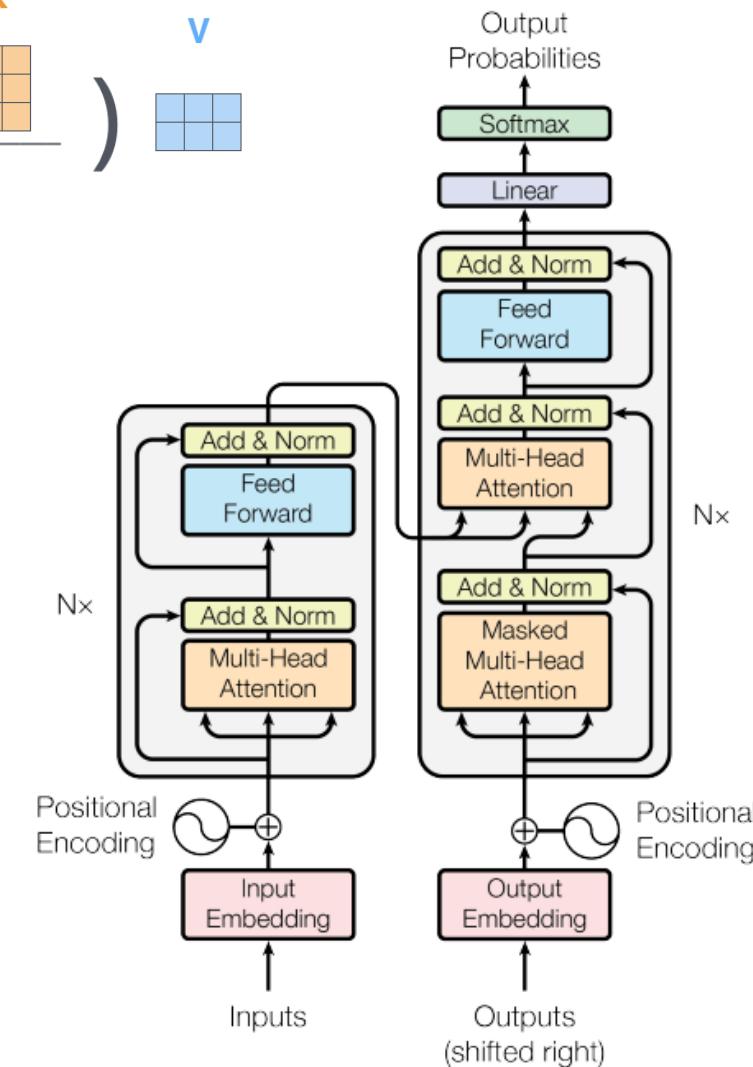
- Self-Attention

Input	Thinking		Machines	
Embedding	x_1		x_2	
Queries	q_1		q_2	
Keys	k_1		k_2	
Values	v_1		v_2	
Score	$q_1 \cdot k_1 = 112$		$q_1 \cdot k_2 = 96$	
Divide by 8 ($\sqrt{d_k}$)	14		12	
Softmax	0.88		0.12	
Softmax X Value	v_1		v_2	
Sum	z_1		z_2	

$$\text{softmax} \left(\frac{Q \times K^T}{\sqrt{d_k}} \right) V = Z$$

Matrix Calculation of Self-Attention

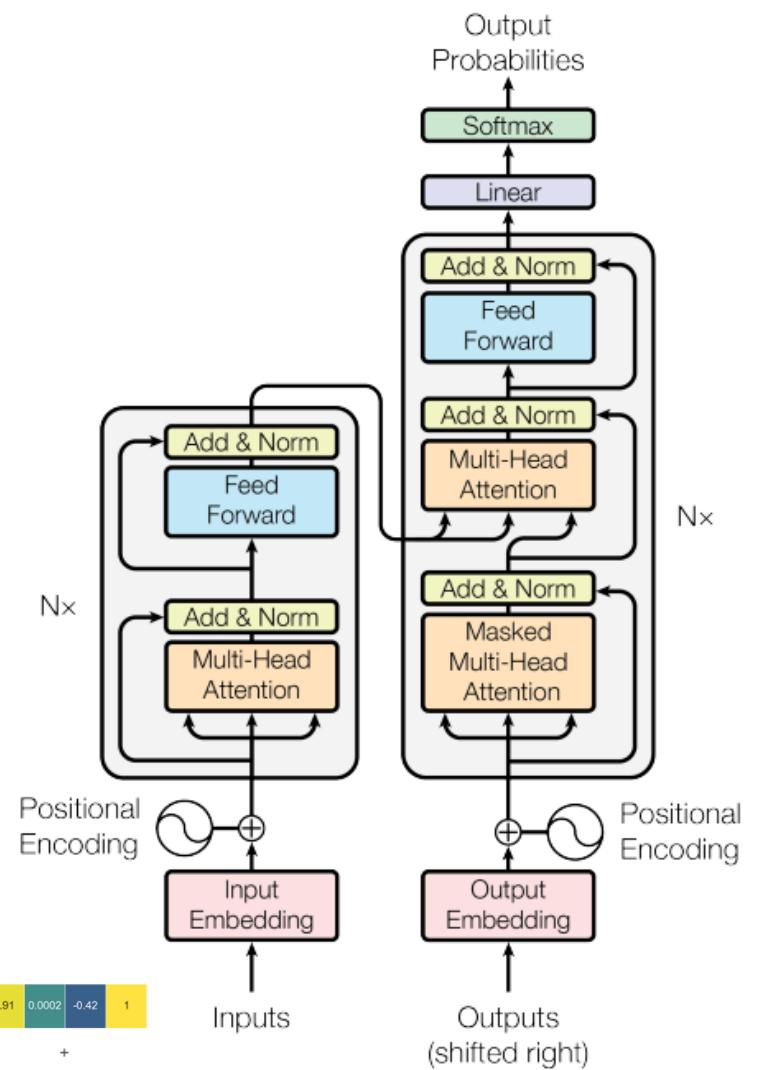
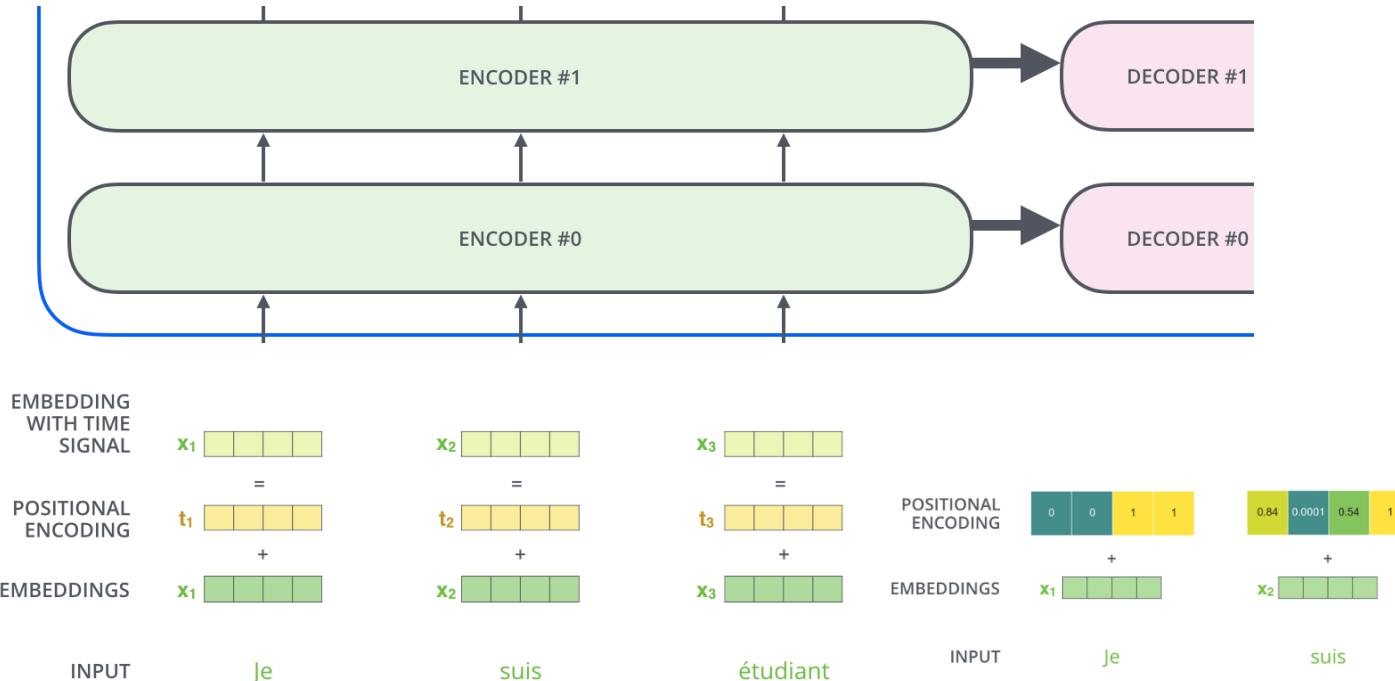
$$\begin{aligned} X &\times W^Q = Q \\ X &\times W^K = K \\ X &\times W^V = V \end{aligned}$$



<https://jalammar.github.io/illustrated-transformer/>

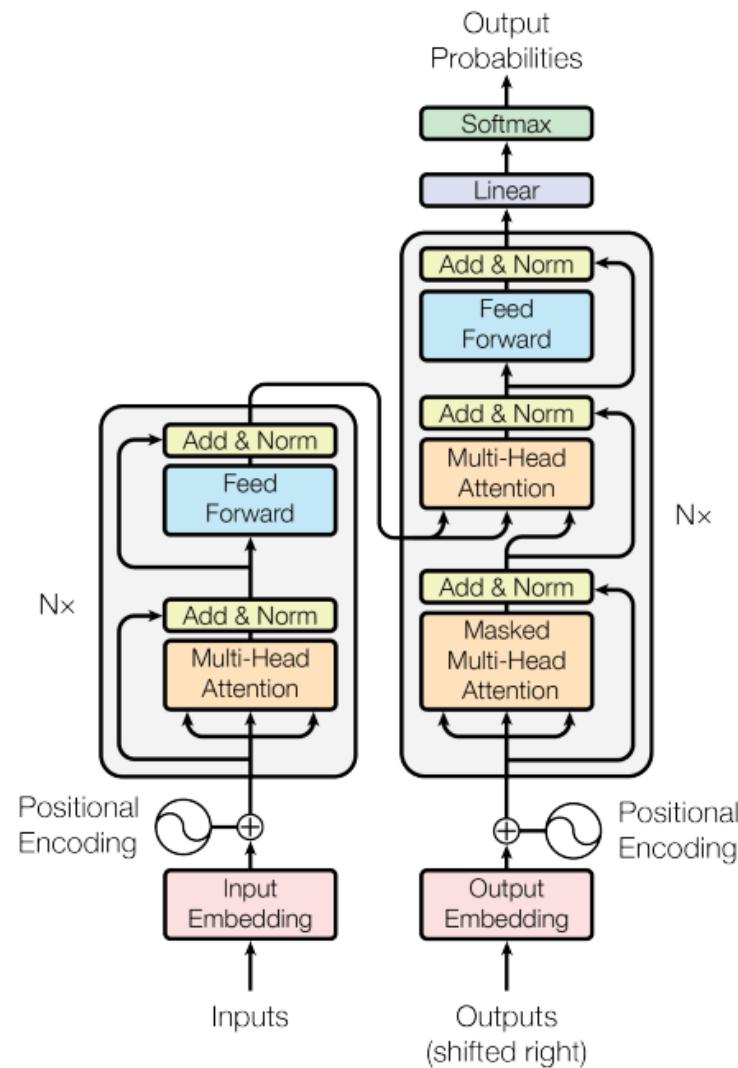
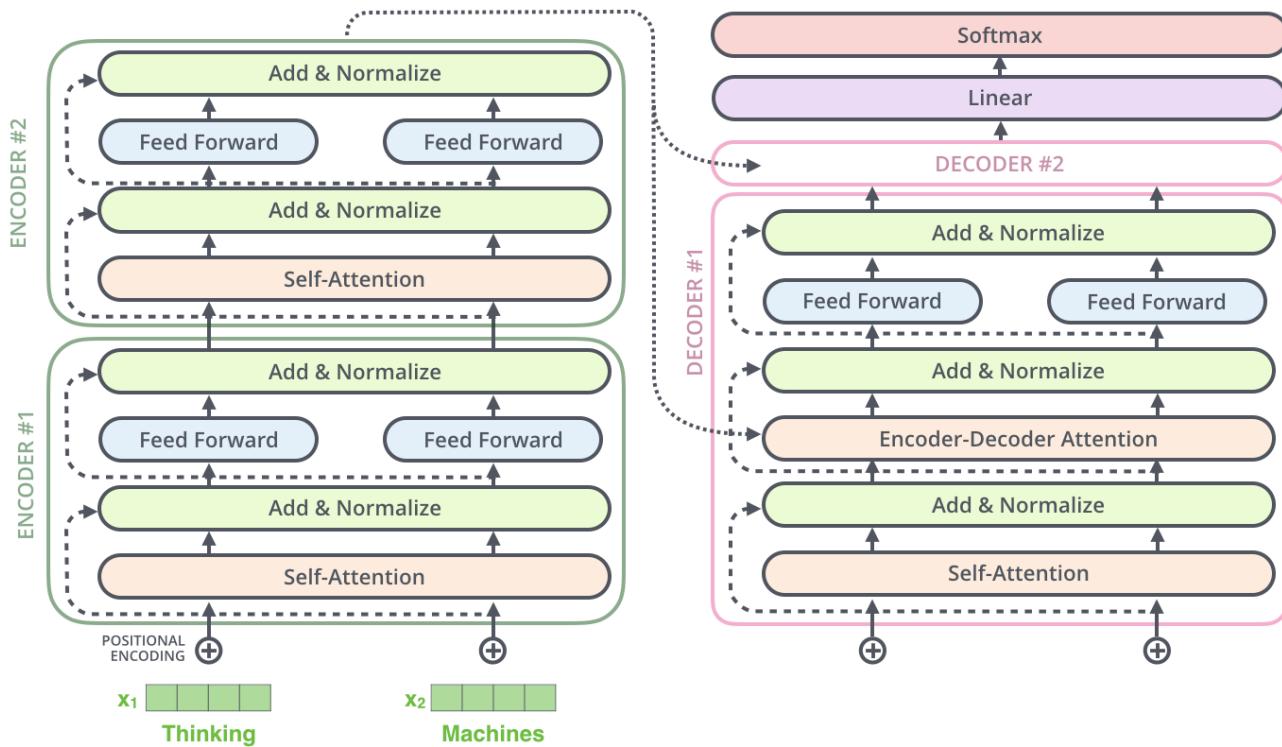
Transformer

- Positional Encoding



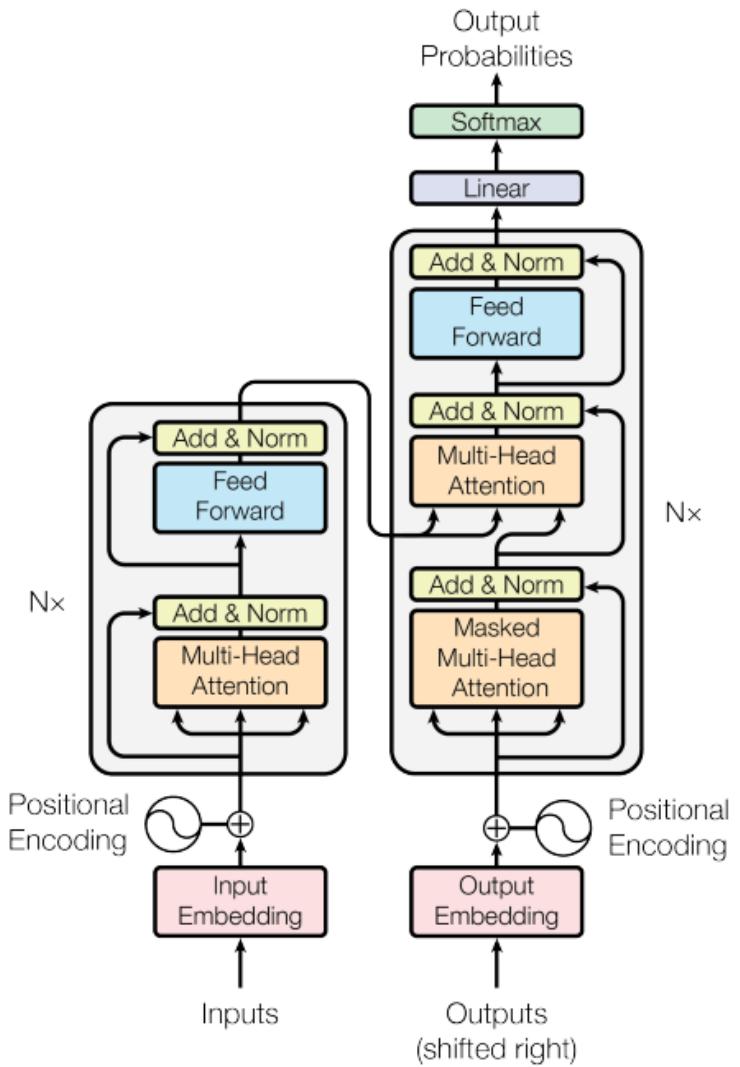
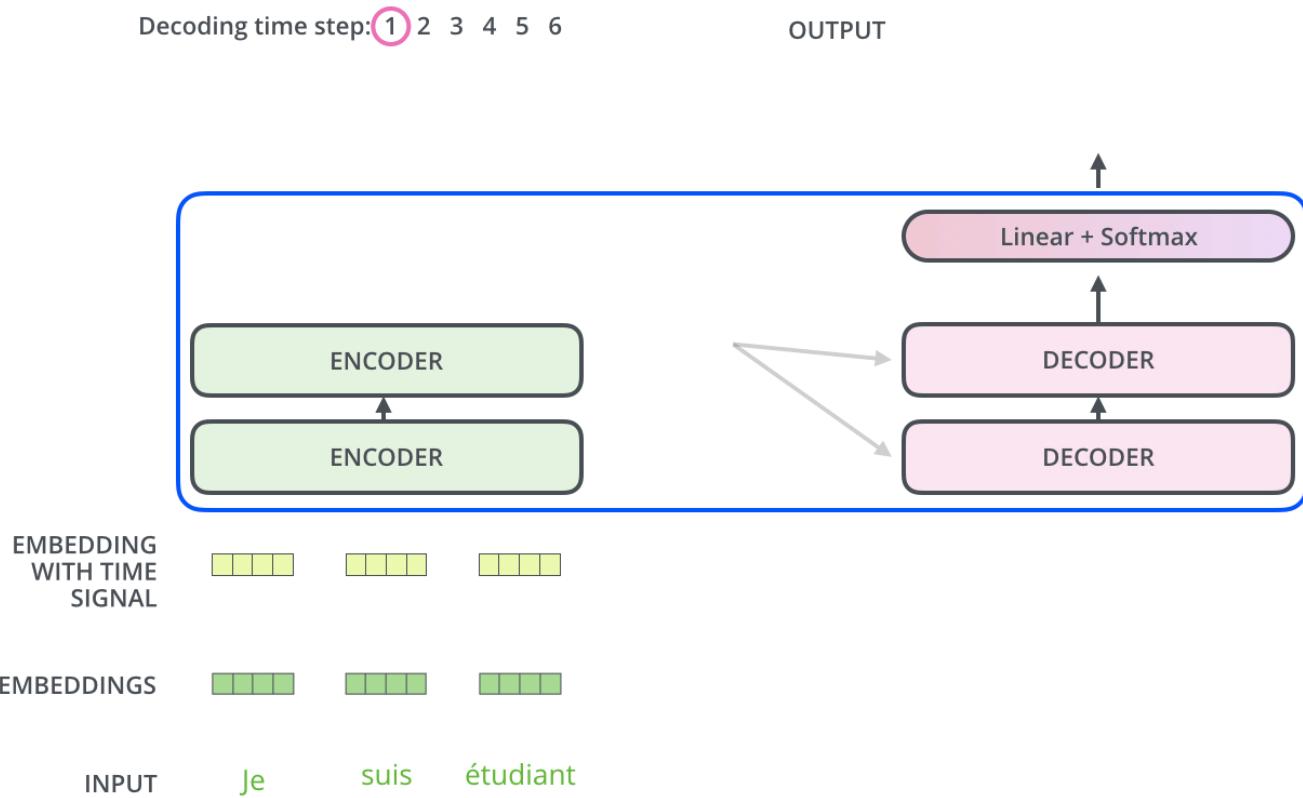
Transformer

- Detail process in encoder & decoder



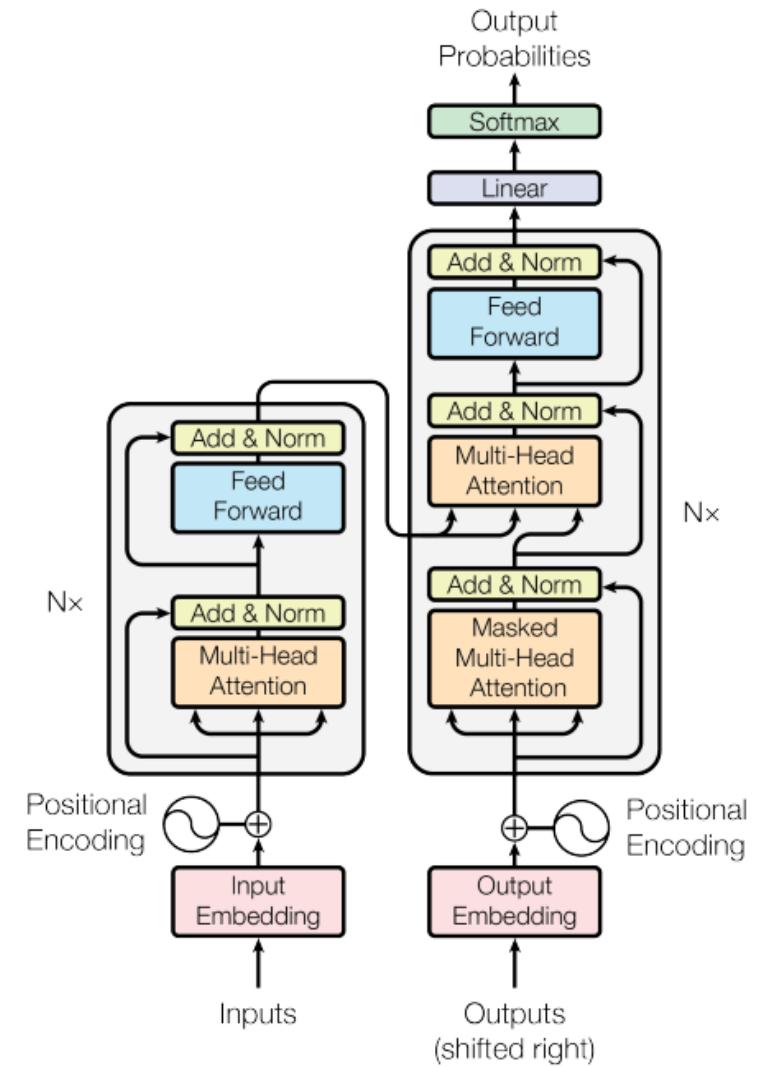
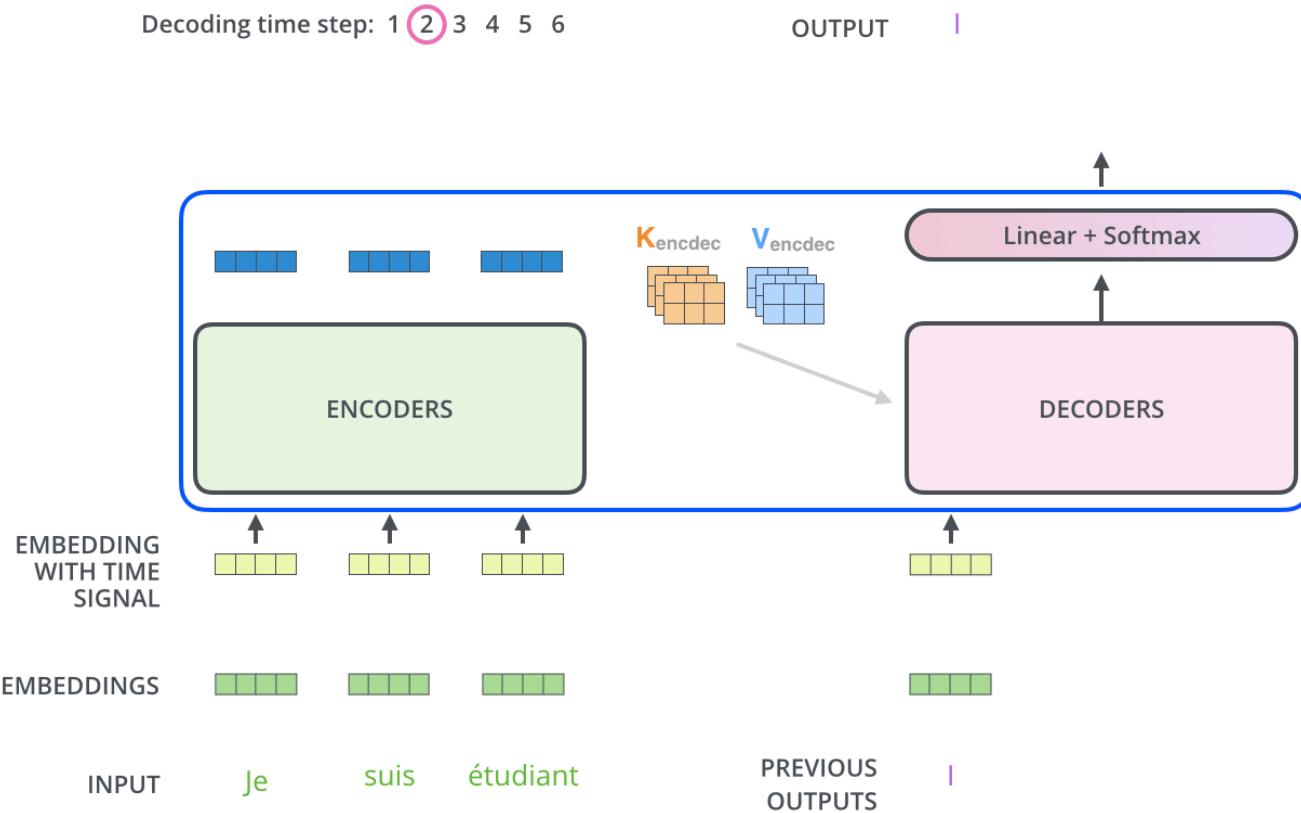
Transformer

- Decoder



Transformer

- Decoder



Summary of Transformer

- Encoder - Decoder Model
 - Encoder extracts contextual information
 - Decoder generates the desired output
- Self-Attention
 - using Query, Key, Value

After Transformer...

Quiz time : BERT



BERT



- Quiz
 - Minjoo _____ kimchi
 - ① run
 - ② read
 - ③ eat



BERT

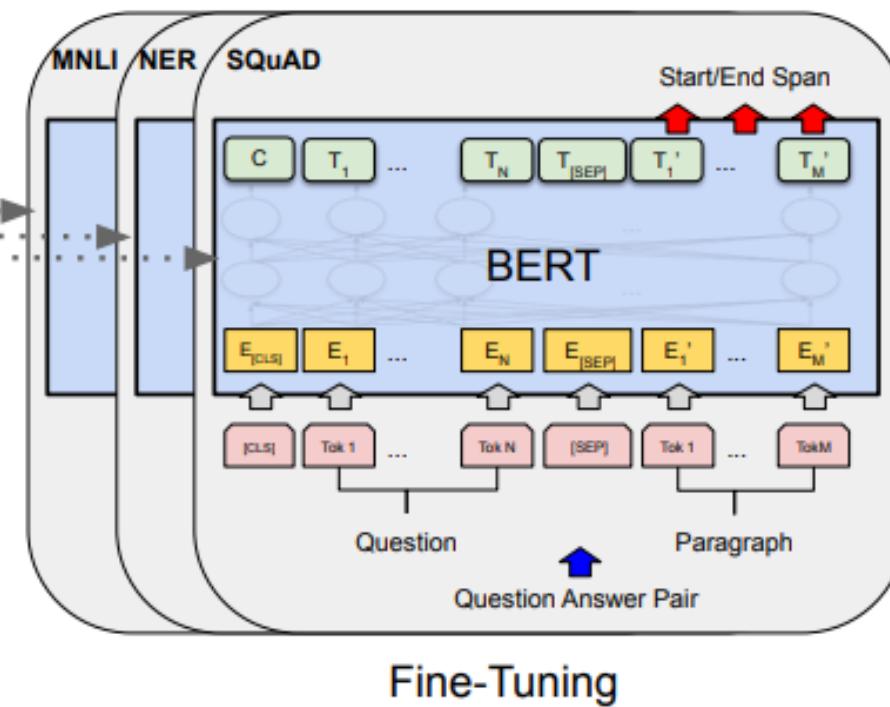
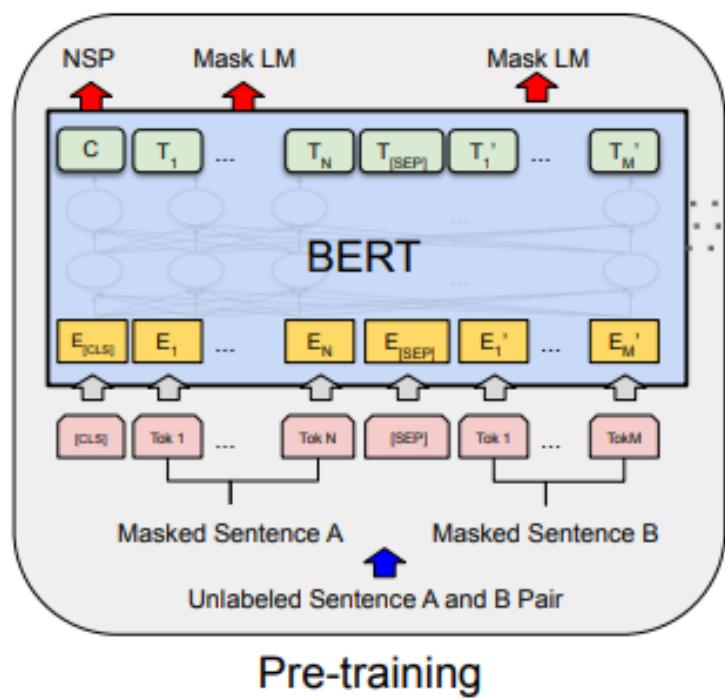


- Quiz
 - Minjoo _____ kimchi
 - ① run
 - ② read
 - ③ **eat**



BERT

- Bidirectional Encoder Representations from Transformers



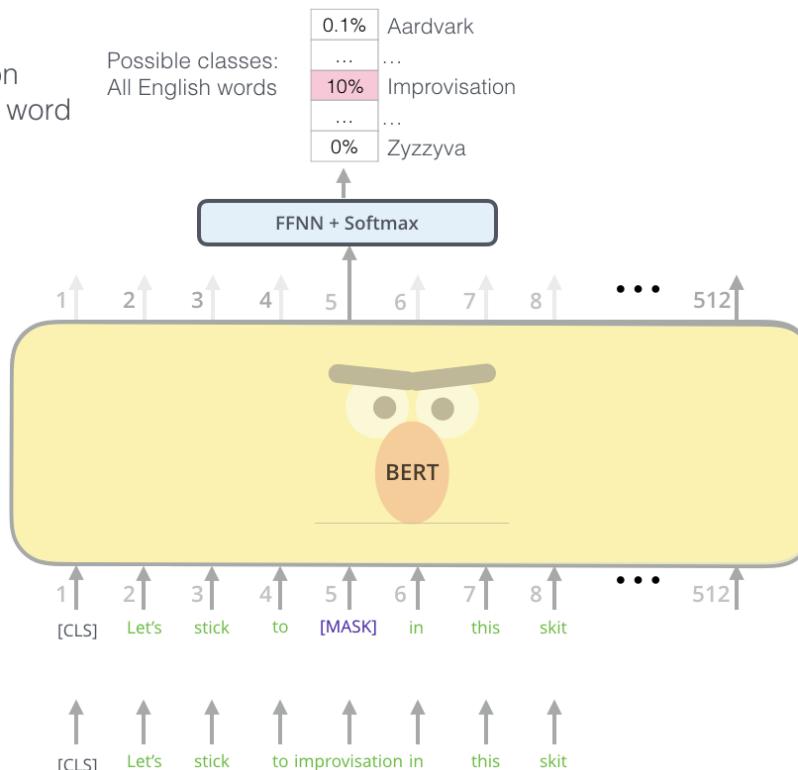
BERT

- Masked Language Model

Use the output of the masked word's position to predict the masked word

Randomly mask 15% of tokens

Input



BERT

- Pre-trained model

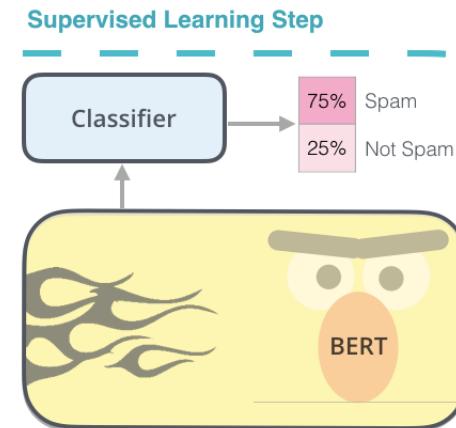
1 - **Semi-supervised** training on large amounts of text (books, wikipedia..etc).

The model is trained on a certain task that enables it to grasp patterns in language. By the end of the training process, BERT has language-processing abilities capable of empowering many models we later need to build and train in a supervised way.



Predict the masked word
(language modeling)

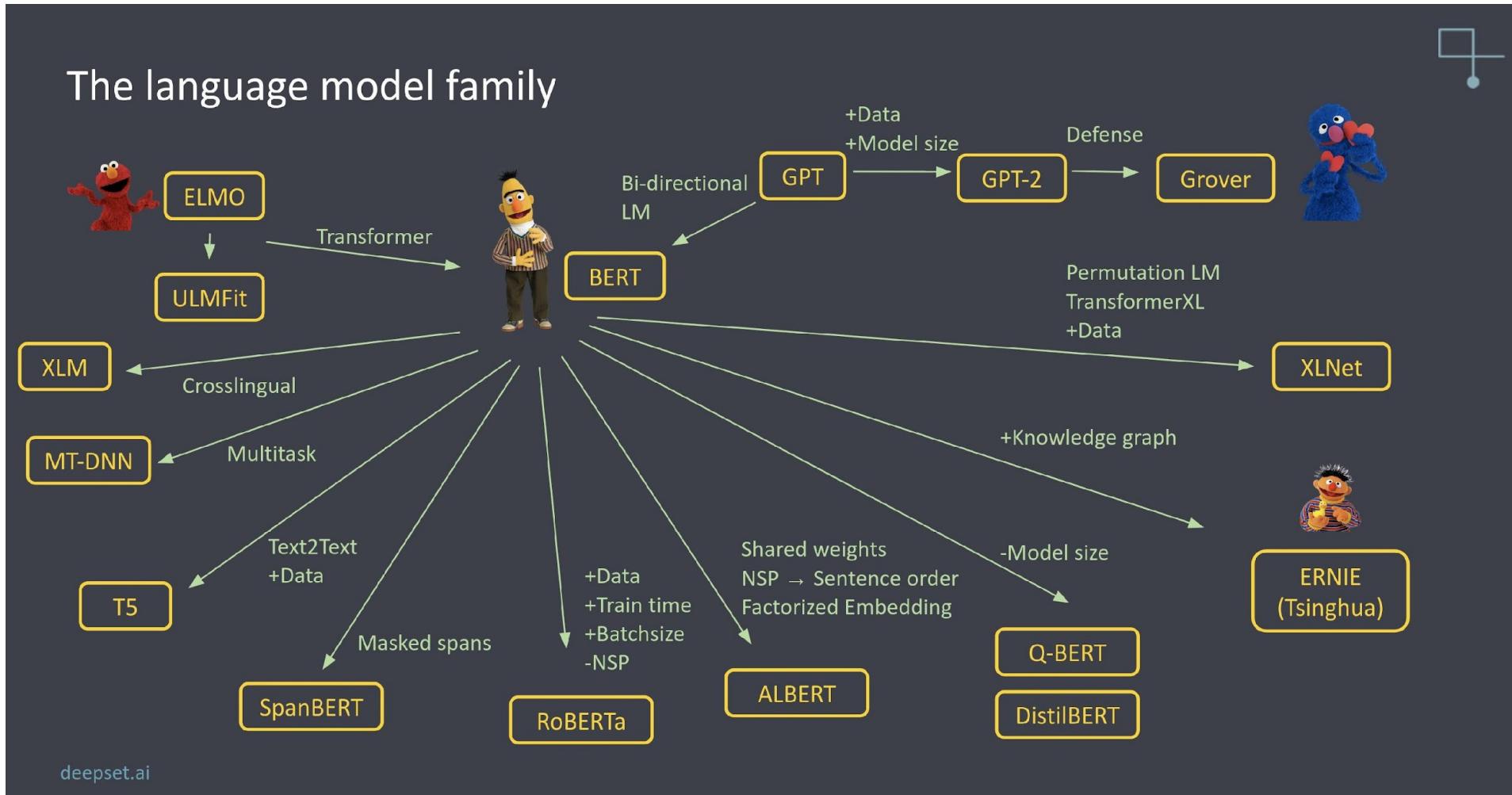
2 - **Supervised** training on a specific task with a labeled dataset.



Dataset:

Email message	Class
Buy these pills	Spam
Win cash prizes	Spam
Dear Mr. Atreides, please find attached...	Not Spam

Family of BERT



Summary

Today's summary

- A.I.
 - Neural Network
 - Deep Neural Network
 - CV, NLP, DS
 - Process to train A.I
- NLP
 - RNN → Seq2Seq → Transformer
 - Transformer (deep)
 - BERT

Let's take some rest



and think about something...

You can have some questions, maybe...

- We learned A.I
 - So show us an practice of using AI
- We learned how NLP model (Transformer) works
 - So what can we do using this model?
- As a developer, how can we develop AI service?

So next class :

- How to make Machine Translation?
 - Concept of Machine Translation
 - Practice using Transformer & OpenNMT Framework
- How to develop Translator service?
 - Back-end development using python (FastAPI)
 - Model serving

Q&A

- Teams Q&A
- Google Sheet

[https://docs.google.com/spreadsheets/d/
1VeDMsarHZV2mPx5muKAtI4P6JRIW6dxEeEbIMrZ1MMA/
edit#gid=0](https://docs.google.com/spreadsheets/d/1VeDMsarHZV2mPx5muKAtI4P6JRIW6dxEeEbIMrZ1MMA/edit#gid=0)

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