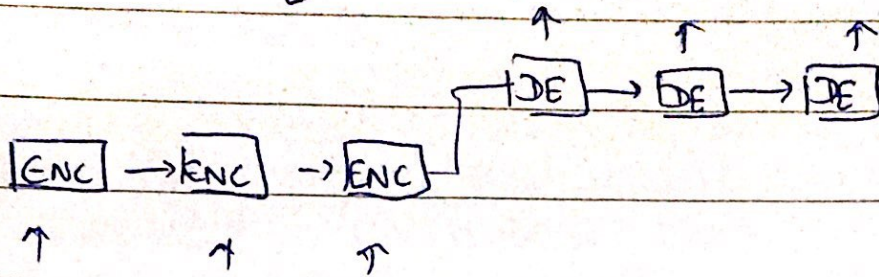


Seq 2 Seq:

Encoder/Decoder



- The  $\rightarrow$  arrow is context vector
- If attention is added then it's weighted sum of context vector

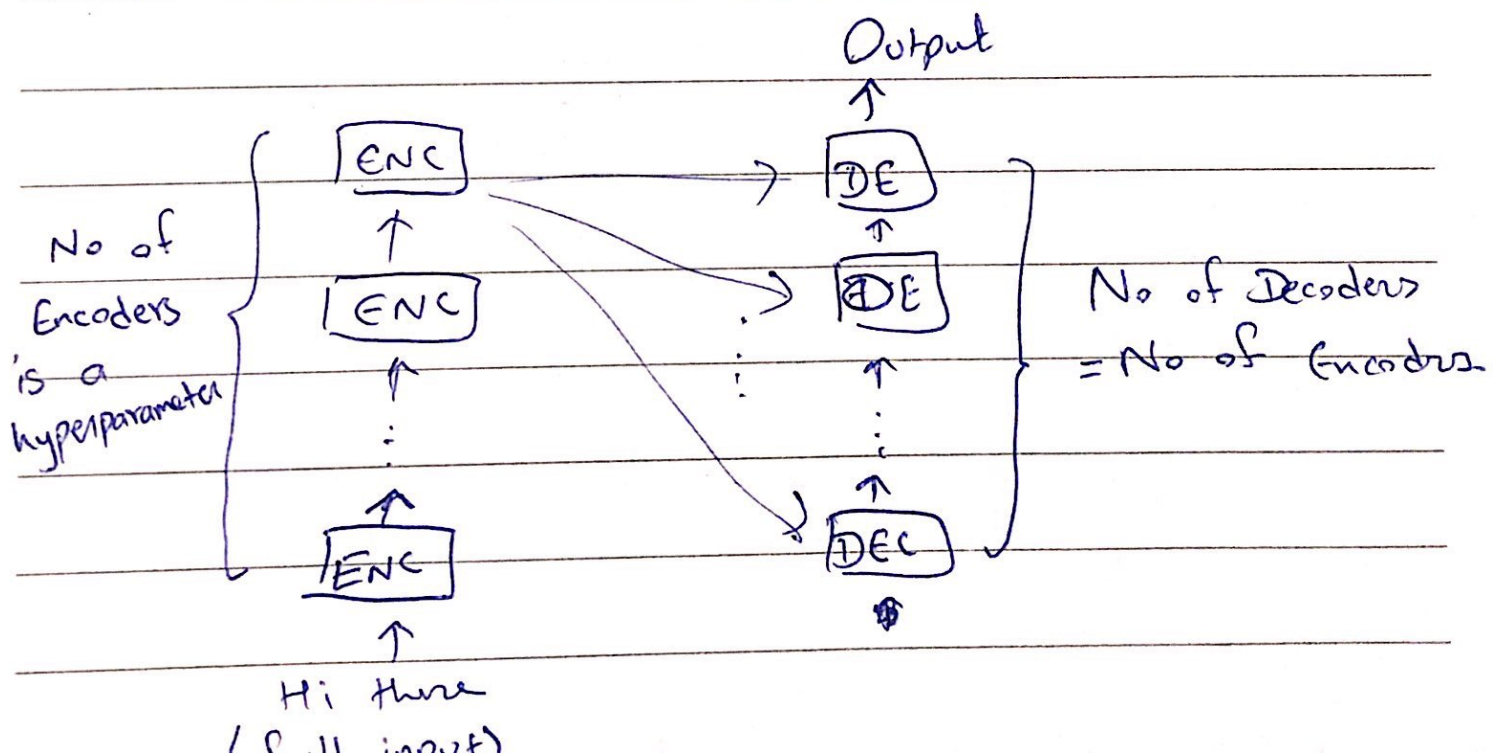
### Problems:

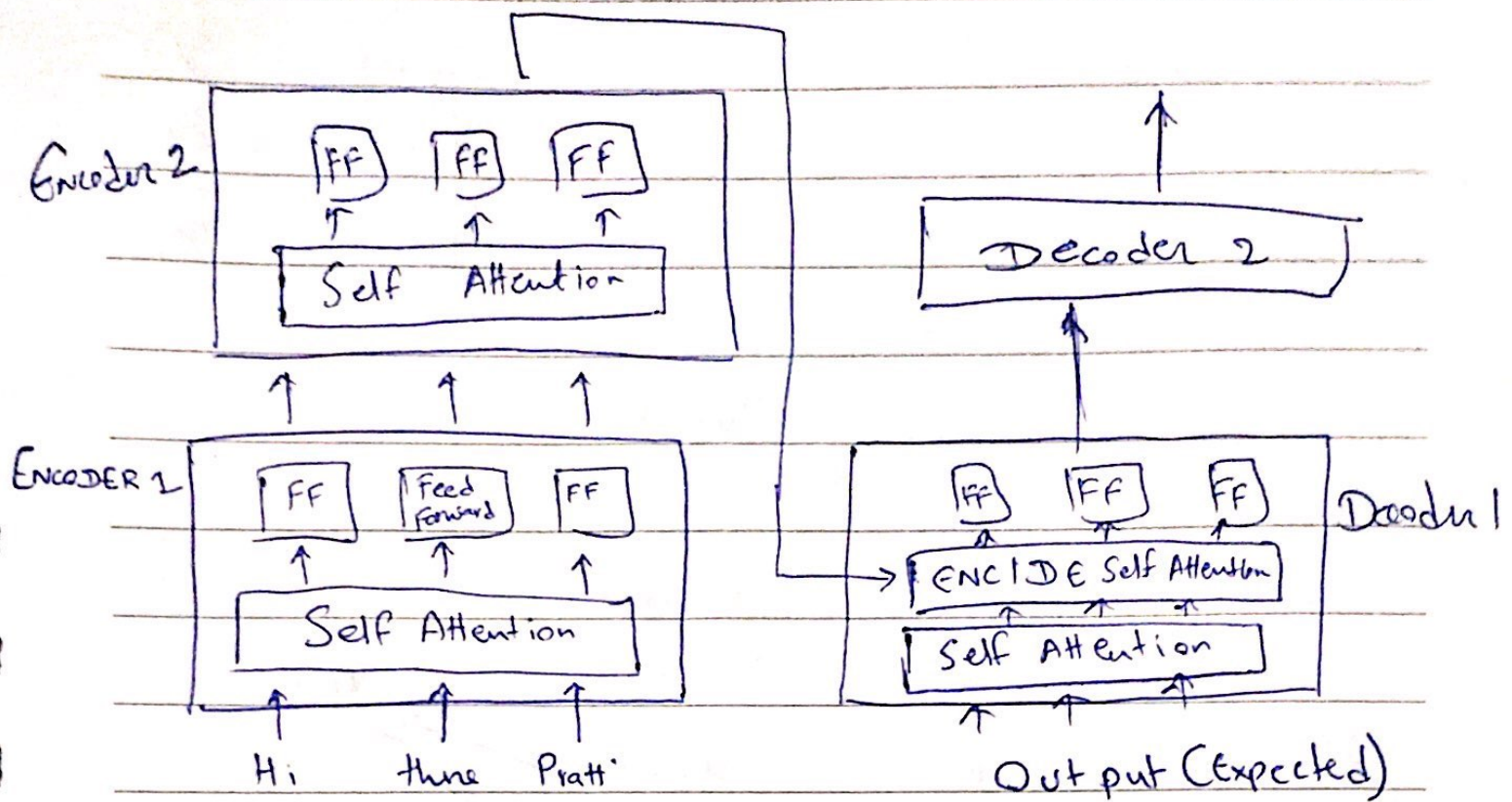
- 1) Can't do parallelization in this structure
- 2) long range dependencies not possible.

### Soln

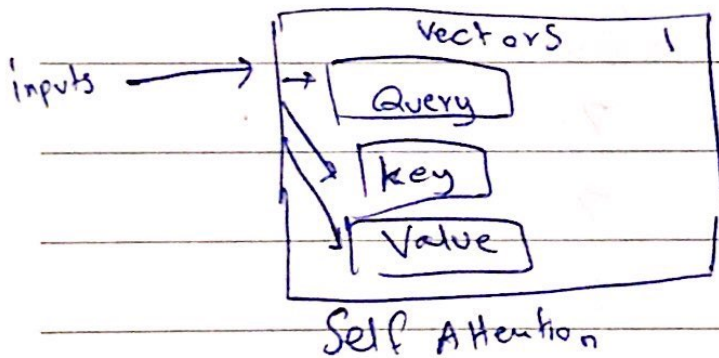
- 1) Transformers!

### Transformers:





• What is Self Attention?



Calc. relation to other words.

Word	q vector	k vector	v vector	score
Hi	$q_1$	$k_1$	$v_1$	$q_1 k_1$
there		$k_2$	$v_2$	$q_1 k_2$
Pratt		$k_3$	$v_3$	$q_1 k_3$



Word	q vector	k vector	v vector	score	score/2	Softmax
"	"	"	"	"	$q_1 k_1 / 2$	$x_{11}$
					$q_1 k_2 / 2$	$x_{12}$
					$q_1 k_3 / 2$	$x_{13}$

Mult. by  
value vectors

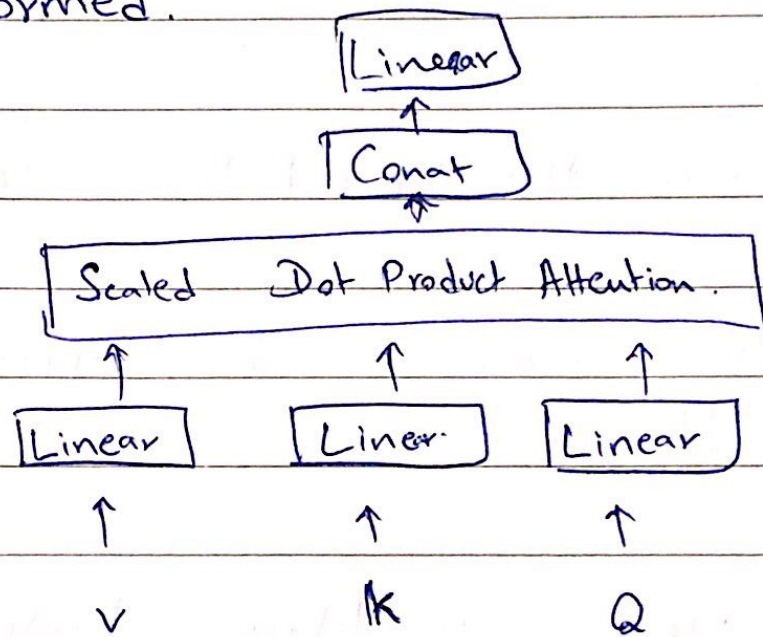
Score/2	Softmax	Softmax * v	Sum
"	$x_{11}$	$x_{11} * v_1$	$\rightarrow Z_1$
	$x_{12}$	$x_{12} * v_2$	
	$x_{13}$	$x_{13} * v_3$	

Word	Sum
Hi	$\rightarrow Z_1$
there	$\rightarrow Z_2$
Pratt	$\rightarrow Z_3$

Similarly we get Sum vector for all  
words  $Z_1, Z_2, Z_3$

In this way it can be calculated parallelly.

The outputs are concatenated & linearly transformed.



[MULTI HEAD ATTENTION]

Challenges:

- 1) Fixed Seq. length
- 2) Thus sentence needs to be cut in the middle leading to loss of context from the other half.

Solution:

- 1) Transformer XL

## Transformer XL

The Hidden state calc. from previous State is used as additional context for current segment.

Problem:

1) Increases the computation speed manifold.

→ A new Opponent has appeared!  
BERT!!!

BERT uses multilayer ~~bid~~ bidirectional Transformer encoder. Its self attention is in both directions