

RNN / LSTM

"The analysis" generated from "these embeddings" spell out "the bias" implicit in "the data" on which THEY were trained

PROBLEM :

→ No context of what's going on in sentence.

⇒ Long Context Dependencies.

2017

"Attention is all you need"

Self Attention

Solution.

Process:

Sequence Input

Tokenize

Vectors (Embeddings)

NORMAL

- sentence

- word

- sub word *

- character

$\begin{bmatrix} 0.1 \\ 0.5 \\ \vdots \\ \dots \end{bmatrix}$ $\begin{bmatrix} \end{bmatrix}$ \dots $\begin{bmatrix} \end{bmatrix}$

Implementation:

$[TRUMP] \leftarrow \begin{bmatrix} \vdots \\ \vdots \\ \vdots \\ \vdots \end{bmatrix}$

small
NN. \Leftarrow

Q (query)

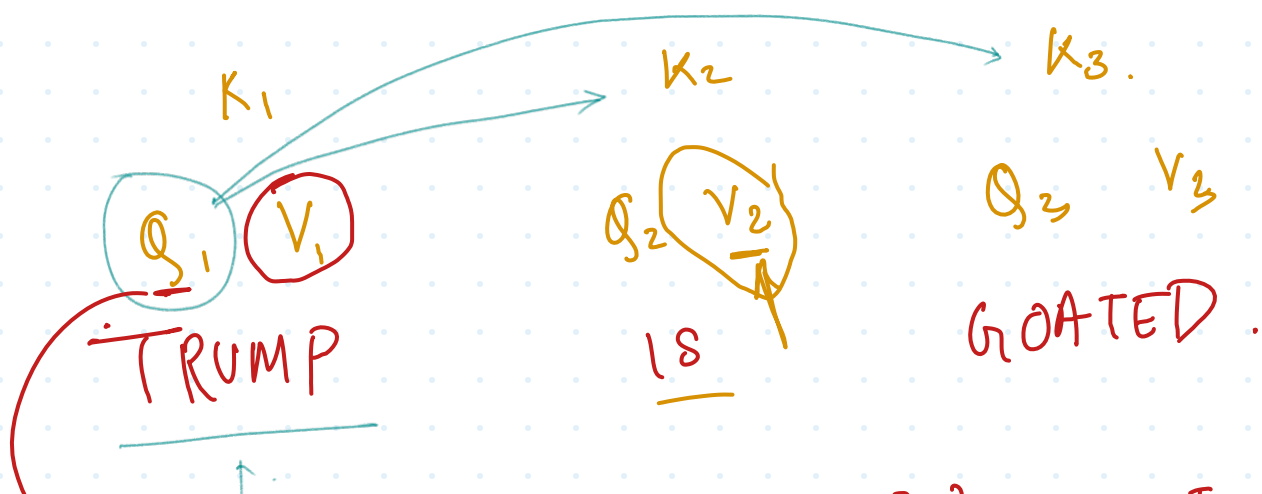
K (key)

V (value)

$\begin{bmatrix} \end{bmatrix}$

$\begin{bmatrix} \end{bmatrix}$

$\begin{bmatrix} \end{bmatrix}$



similarity
sim $(Q_1, K_2) =$
 $(Q_1, K_3) =$

" $(Q_2, K_1) =$

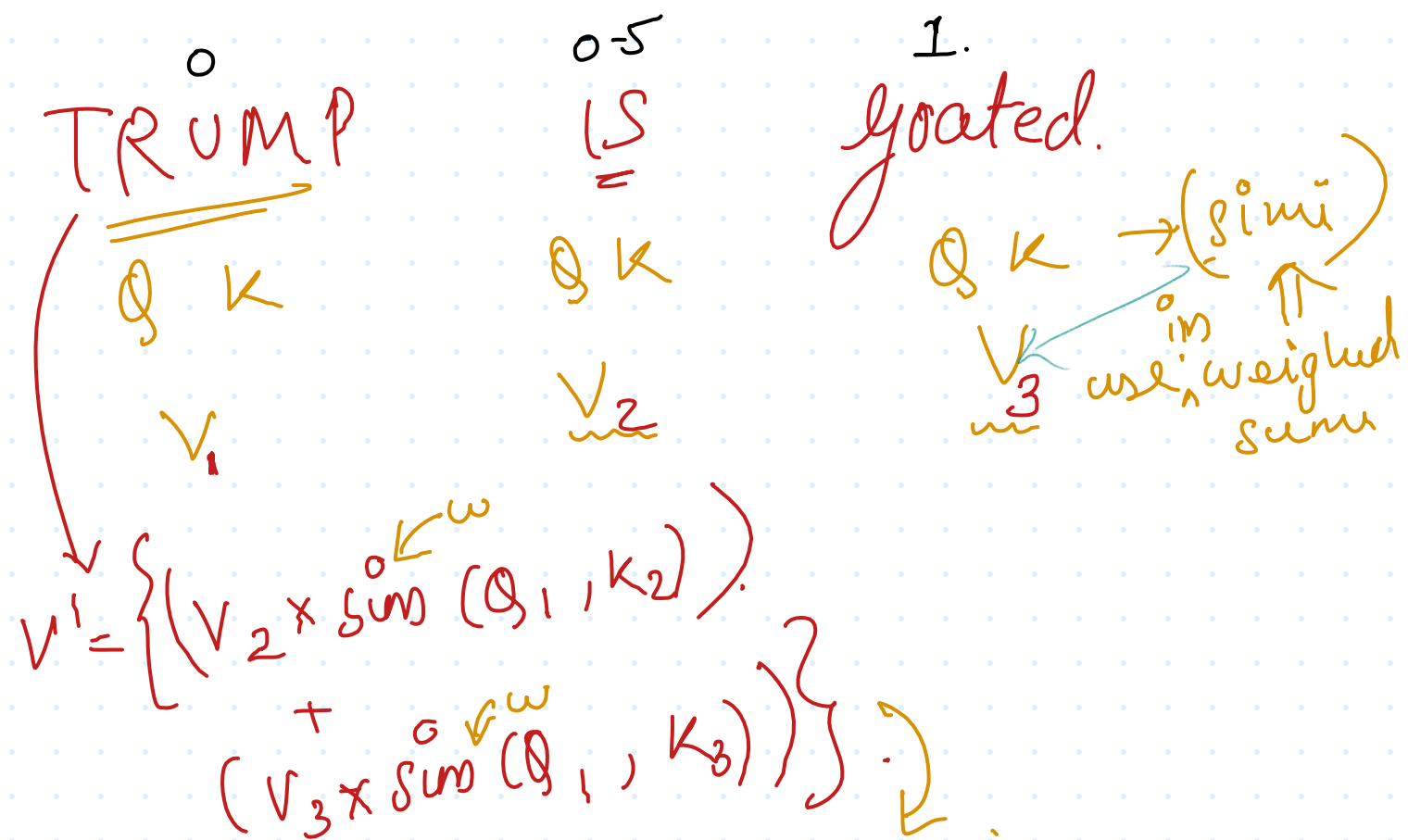
" $(Q_2, K_3) =$

" $(Q_3, K_1) =$

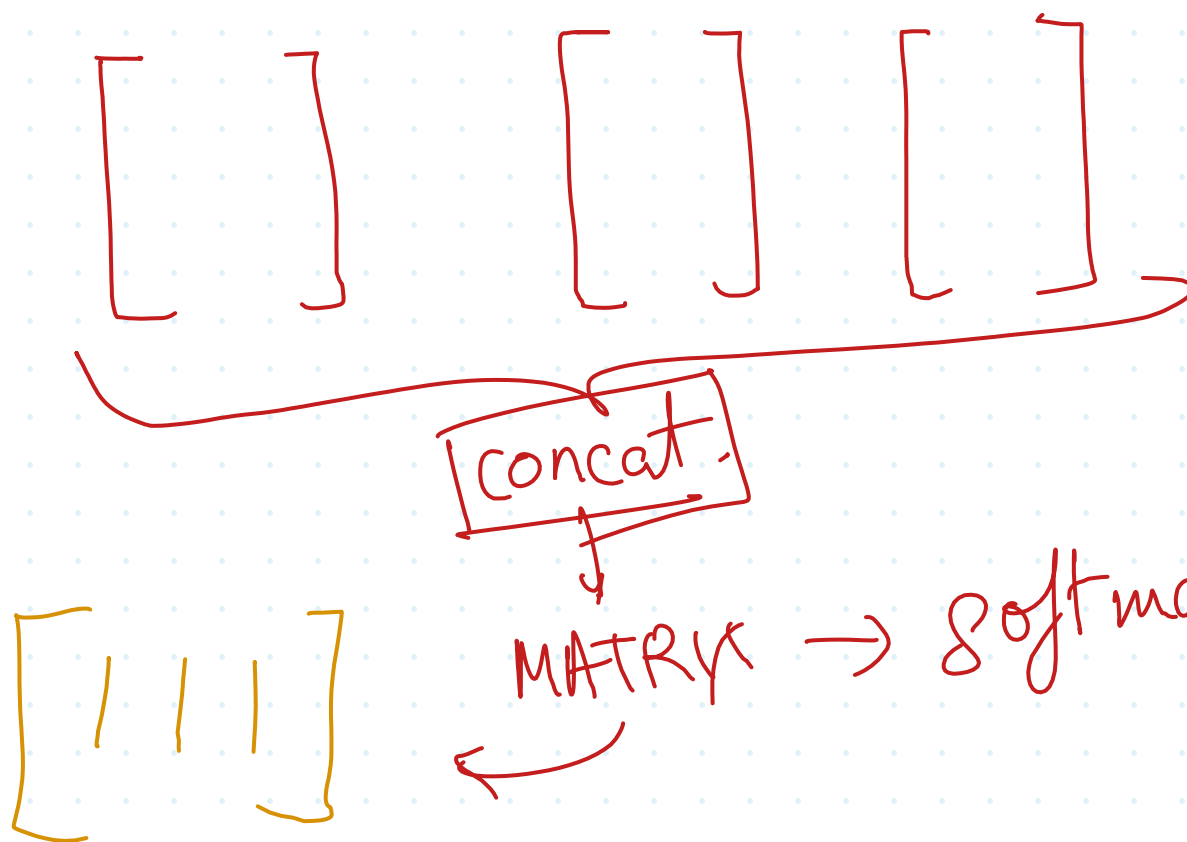
" $(Q_3, K_2) =$

} \Rightarrow DOT
PRODUCT

weight



newValue += value * similarity(query, key)



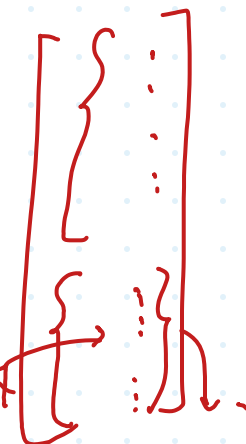
PROBLEM:

→ Order of the sentence.

Positional Encoding



Sin waves.

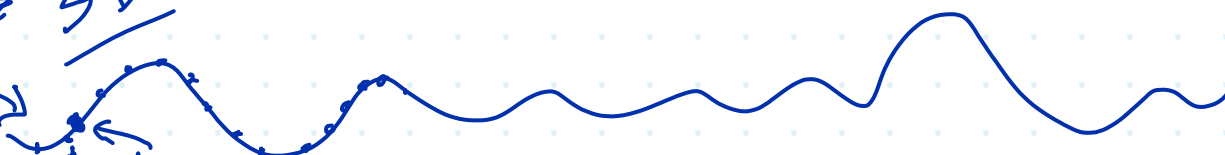


Ripples
in water

2D \Rightarrow 3D \Rightarrow ND.

word

- Multiple waves
- Diff freq.
- Merged together.



SUMMARIZE

→ Self Attention:

→ Q K V

→ Positional Enc.

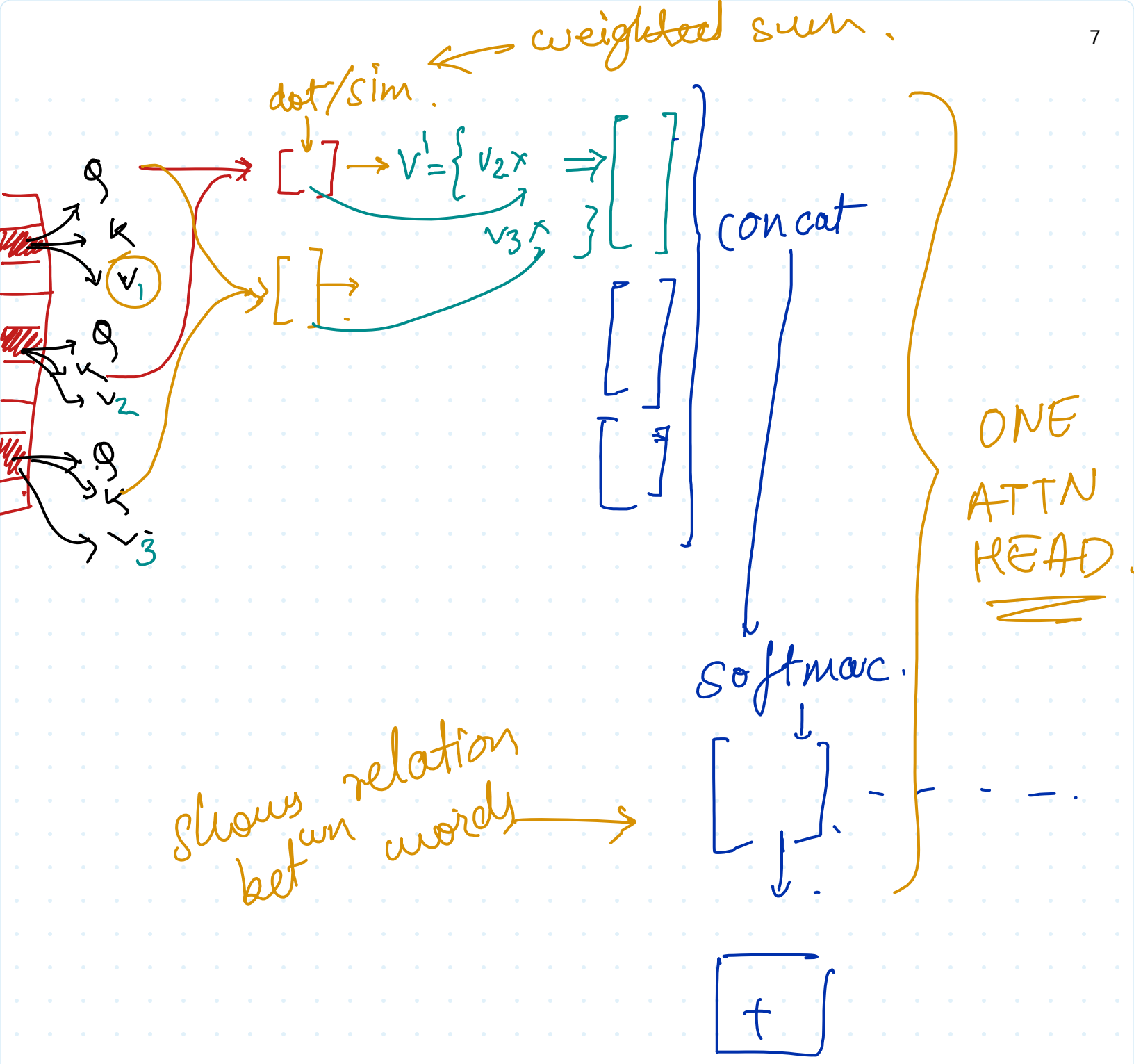
PROBLEM :

→ MULTIPLE PERSPECTIVES.

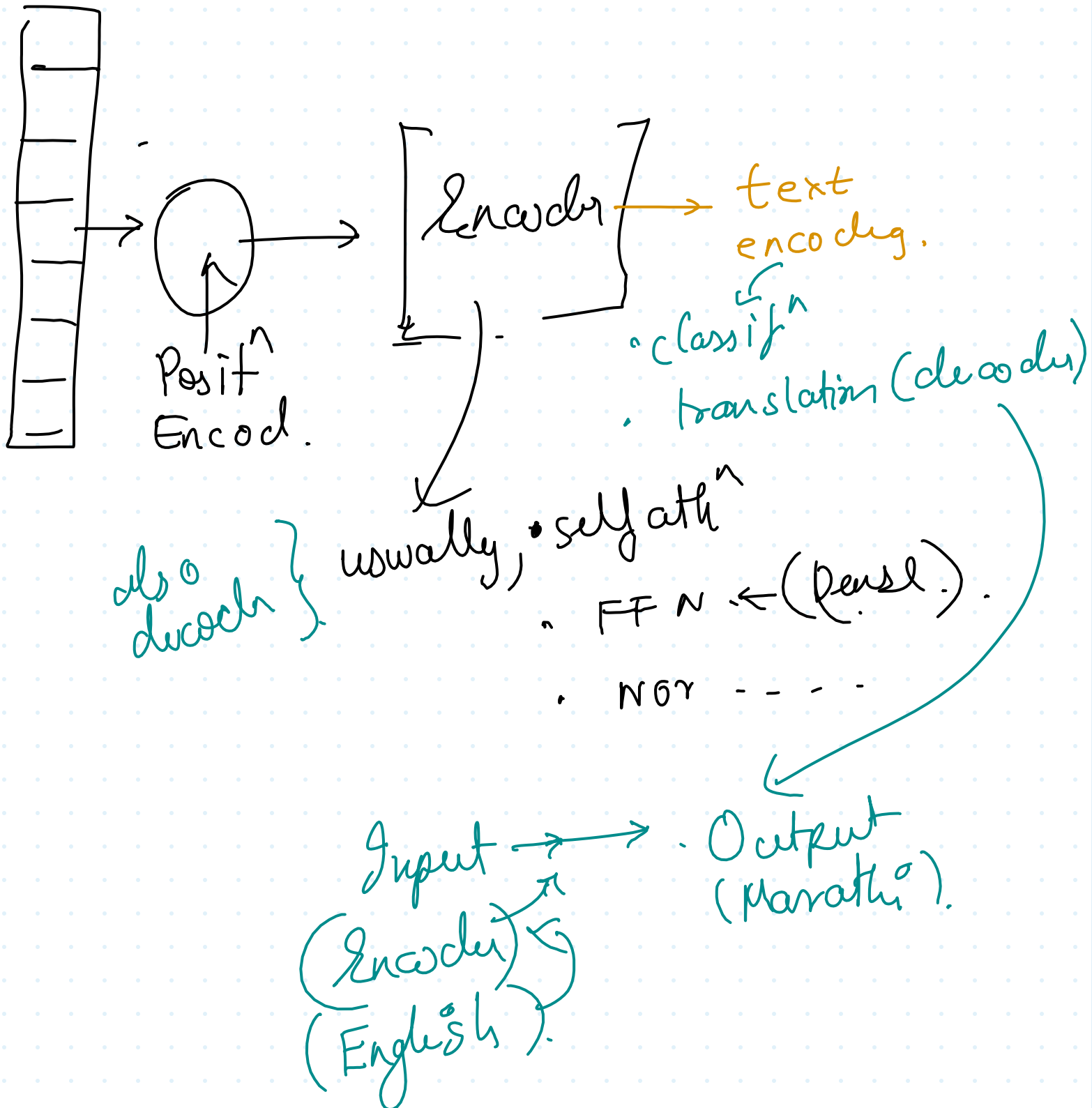
↓
MULTI HEAD ATTENTION

Solⁿ →

$A + A + \dots + A$
↑ ↑ ↑
└────────────────────────┘



ENCODER
 DECODER ← TRANSFORMER



Self
Attention

{ Cross-
Attention }

"Server, can I have the check?"

"Looks like I just crashed the server"