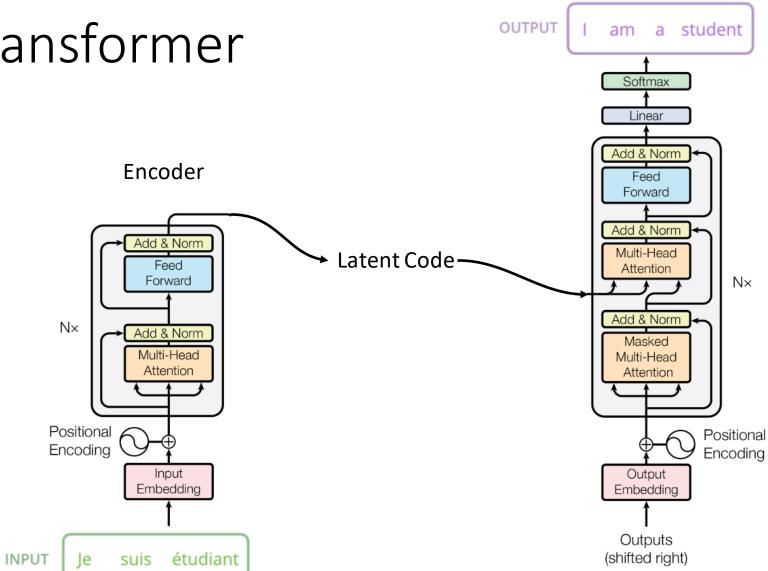
Neural Computation

The Decoder - Part 2

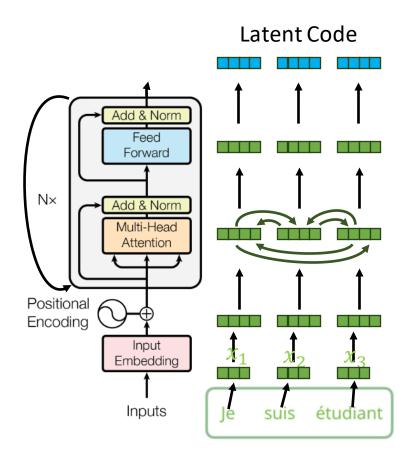
Putting Everything Together

The Transformer

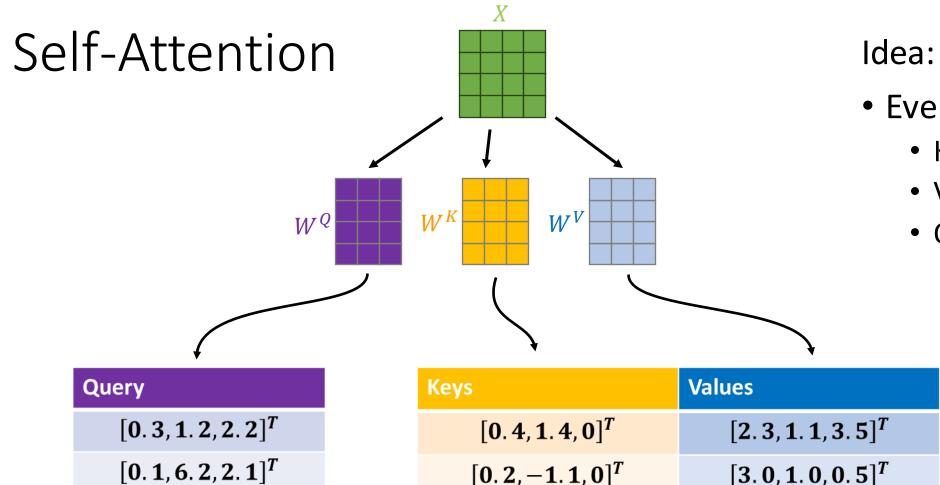


Decoder

The Encoder



Decoder The Transformer Output Probabilities Softmax Linear Add & Norm Encoder Feed Forward Add & Norm Add & Norm Multi-Head Latent Code -Feed Attention Forward N× Add & Norm $N \times$ Add & Norm Masked Multi-Head Multi-Head Attention Attention Positional Positional Encoding Encoding Input Output Embedding Embedding Outputs étudiant (shifted right) INPUT suis **Executed repeatedly** Executed once

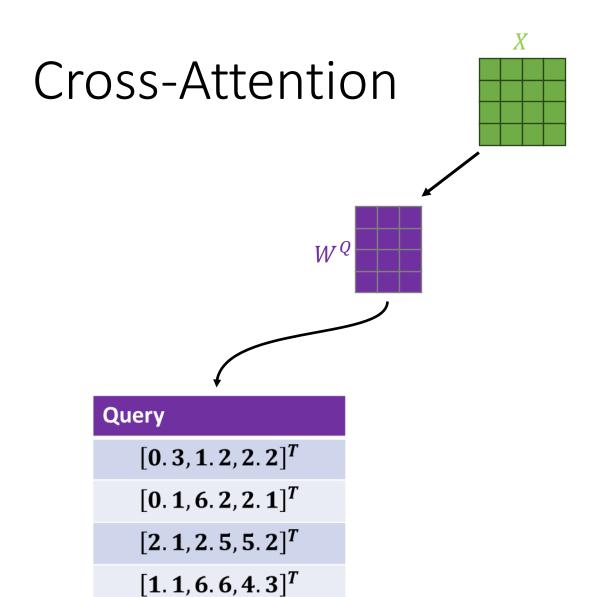


 $[2.1, 2.5, 5.2]^T$

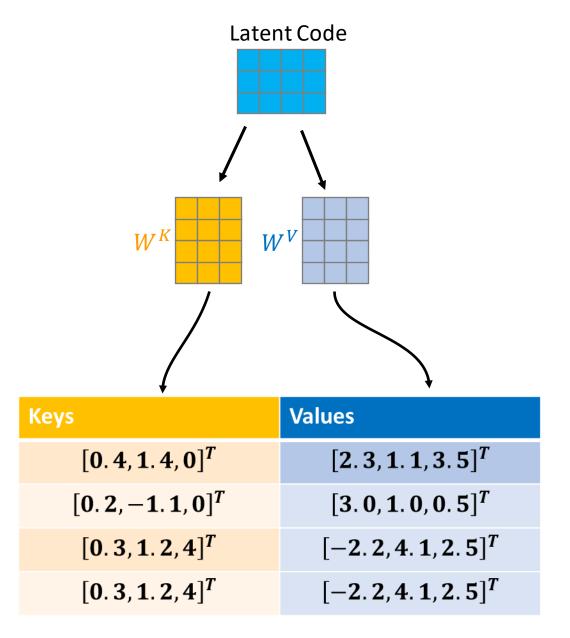
 $[1.1, 6.6, 4.3]^T$

- Every token makes:
 - Key
 - Value
 - Query

Keys	Values
$[0.4, 1.4, 0]^T$	$[2.3, 1.1, 3.5]^{7}$
$[0.2, -1.1, 0]^T$	$[3.0, 1.0, 0.5]^{7}$
$[0.3, 1.2, 4]^T$	[-2, 2, 4, 1, 2, 5]
$[0.3, 1.2, 4]^T$	[-2.2, 4.1, 2.5]



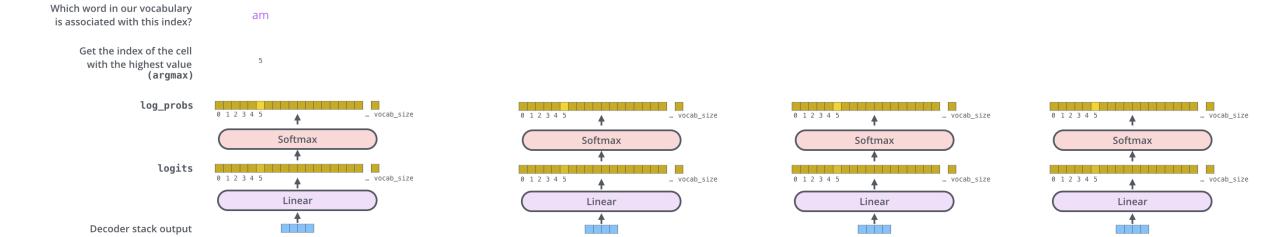
From Decoder



From Encoder

Decoder The Transformer Output Probabilities Softmax Linear Add & Norm Encoder Feed Forward Add & Norm Add & Norm Multi-Head Latent Code -Feed Attention Forward N× Add & Norm $N \times$ Add & Norm Masked Multi-Head Multi-Head Attention Attention Positional Positional Encoding Encoding Input Output Embedding Embedding Outputs étudiant (shifted right) INPUT suis **Executed repeatedly** Executed once

Which word in our vocabulary am is associated with this index? Get the index of the cell 5 with the highest value (argmax) log_probs 0 1 2 3 4 5 ... vocab_size Softmax logits 0 1 2 3 4 5 ... vocab_size Linear Decoder stack output



Decoder The Transformer Output Probabilities Softmax Linear Add & Norm Encoder Feed Forward Add & Norm Add & Norm Multi-Head Latent Code -Feed Attention Forward N× Add & Norm $N \times$ Add & Norm Masked Multi-Head Multi-Head Attention Attention Positional Positional Encoding Encoding Input Output Embedding Embedding Outputs étudiant (shifted right) INPUT suis **Executed repeatedly** Executed once

