

# PSY9511: Seminar 8

Sequence modelling (with an emphasis on language)

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Esten H. Leonardsen

13.05.24



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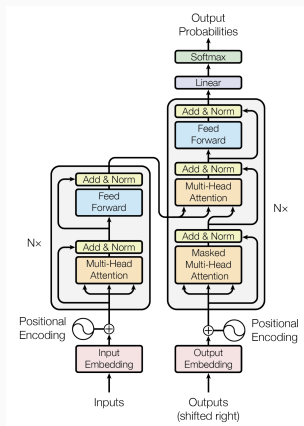
# Transformers

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# Transformers



Vaswani, A., Shazeer, N., Parmar, N., Uszkoreit, J., Jones, L., Gomez, A. N., ... & Polosukhin, I. (2017). Attention is all you need. Advances in neural information processing systems, 30

The movie was great, the actors were\_\_\_\_\_

# Transformers: Attention

The movie was great, the actors were \_\_\_\_\_



# Transformers: Attention

The movie was great, the actors were \_\_\_\_\_



# Transformers: Attention

The movie was great, the actors were \_\_\_\_\_



# Transformers: Attention

The movie was great, the actors were \_\_\_\_\_





# Transformers: Attention

The movie was great, the actors were \_\_\_\_\_



# Transformers: Attention

The movie was great, , the actors were \_\_\_\_\_



# Transformers: Attention

The movie was great, the actors were \_\_\_\_\_



# Transformers: Attention

The movie was great, the actors were \_\_\_\_\_



The movie was great, we saw it at the new  
Cinema in the city center, right down by the  
restaurant where we went for my birthday that  
one year, the one where the clown was  
inside the cake, the actors were \_\_\_\_\_

The movie was great, we saw it at the new  
Cinema in the city center, right down by the  
restaurant where we went for my birthday that  
one year, the one where the clown was  
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The movie was great, the actors were\_\_\_\_\_



# Transformers: Attention

The movie was great, the actors were\_\_\_\_\_

[8     7     9     6 0 8     4     10] → ?



# Transformers: Attention

The movie was great, the actors were\_\_\_\_\_

[8    7    9    6 0 8    4    10] → ?

[0    0    0    1 0 0    0    0 ]



# Transformers: Attention

The movie was great, the actors were \_\_\_\_\_

[8      7      9      6 0 8      4      10]  $\rightarrow$  ?

$\times$   
[0      0      0      1 0 0      0      0]

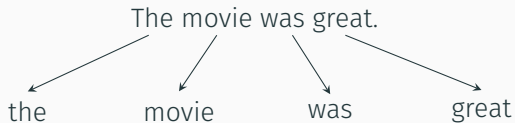
$=$   
[0      0      0      6 0 0      0      0]



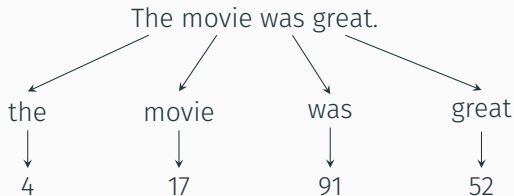
# Transformers: Positional encoding

The movie was great.

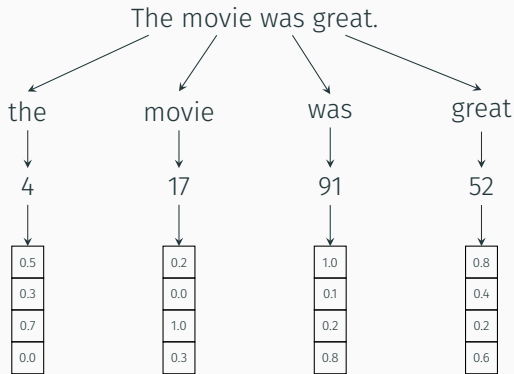
# Transformers: Positional encoding



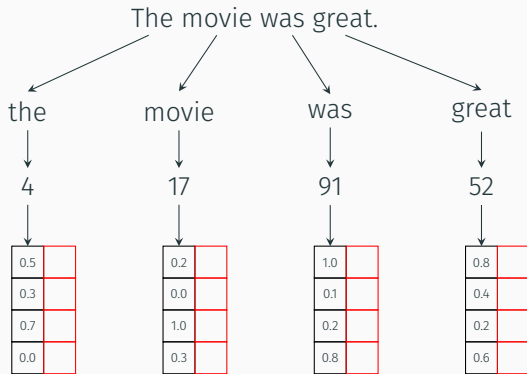
# Transformers: Positional encoding



# Transformers: Positional encoding

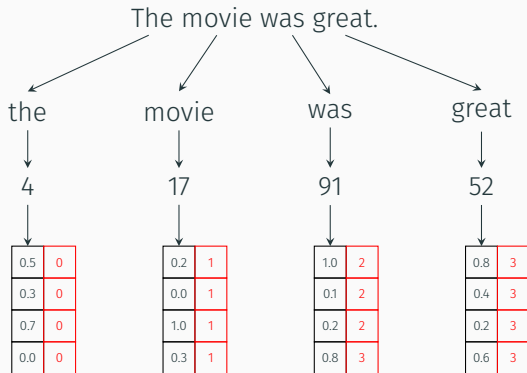


# Transformers: Positional encoding

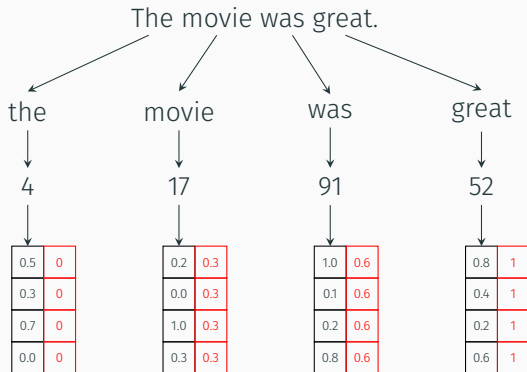




# Transformers: Positional encoding



# Transformers: Positional encoding



# Transformers: Embedding



[https://huggingface.co/docs/transformers/model\\_doc/llama2](https://huggingface.co/docs/transformers/model_doc/llama2)

# Transformers: Demo

<http://localhost:8888/notebooks/notebooks/GPT%20Embedding%20demo.ipynb>



Transformers: Revolutionized language modelling by combining feed forward neural networks with multihead attention and positional encodings (and infinite data and compute)

- Main advantage: Outperforms everything else for almost all language modelling tasks
- Main disadvantage: Can either be used locally, which is fidgety and requires a good computer, or via an API, which is costly and gives others access to your data