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# Investigating Long-Term Context of Language Models on Brain Activity during Narrative Listening in fMRI



Subba Reddy Oota<sup>1,2,3,4</sup> Frédéric Alexandre<sup>1,2,3,4</sup>, Xavier Hinaut<sup>1,2,3,4</sup>

<sup>1</sup>INRIA Bordeaux Sud-Ouest, France

 $^2$ LaBRI, UMR 5800 <sup>3</sup>IMN, UMR 5293 <sup>4</sup>Universite de Bordeaux, France



#### Introduction

- Sequence-based and pretrained language models have been found to be successful for text-driven prediction of brain activations.
- 2 However, these models still lack long-term memory plausibility (i.e. how they deal with long-term dependencies and contextual information)

# Can current language models deal with long-term dependencies?

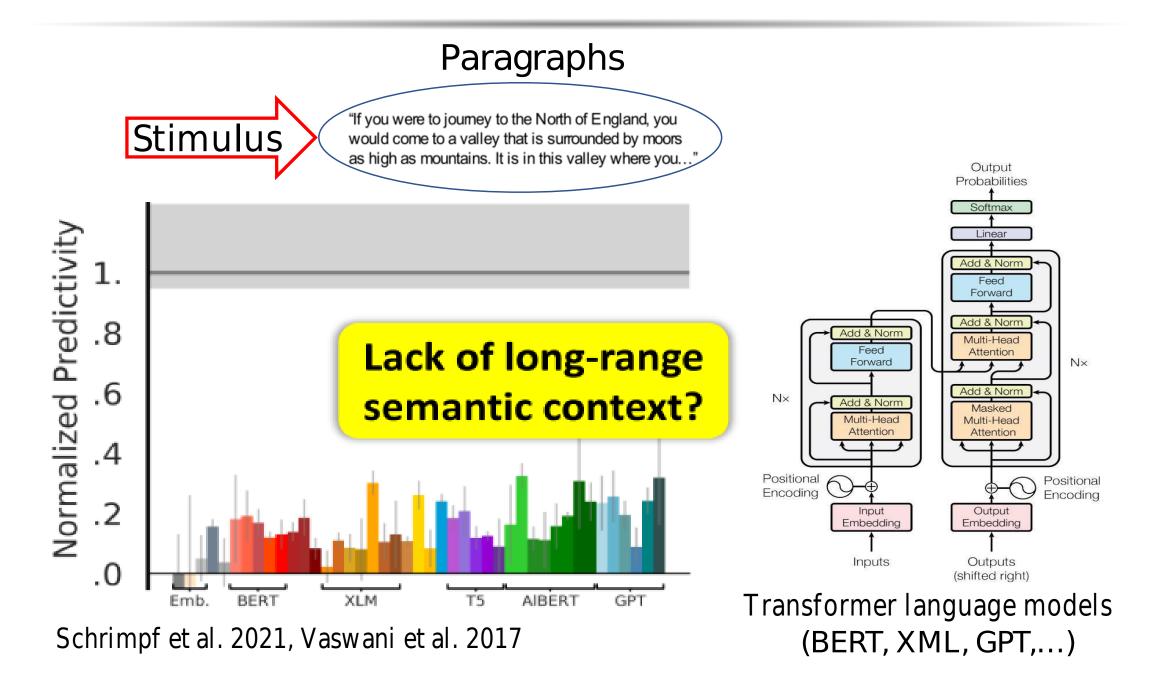
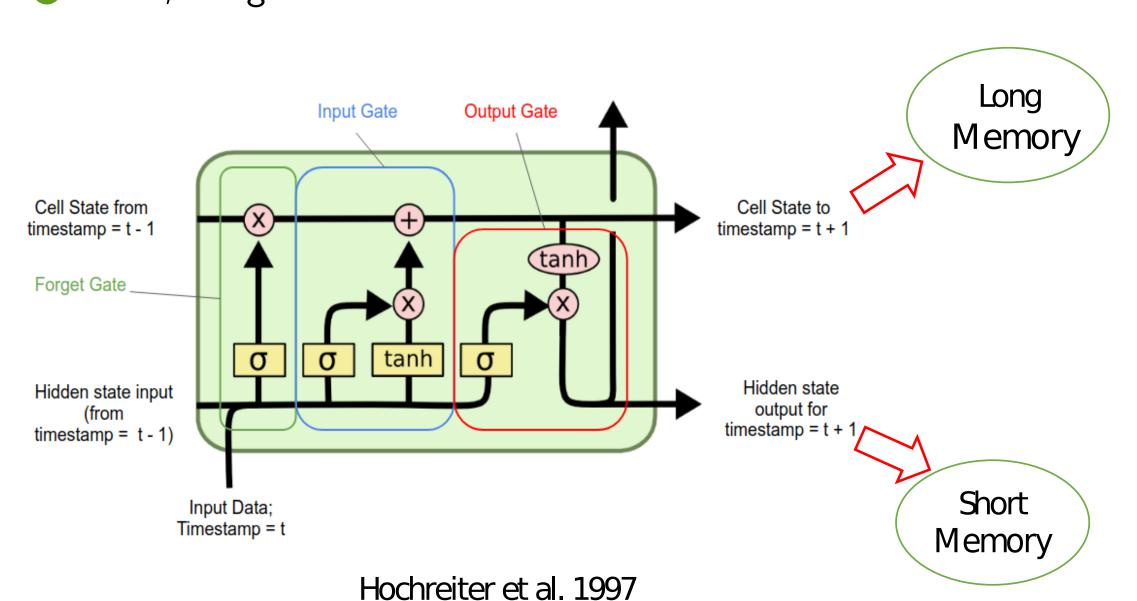


Figure 1:Sequence length is fixed to 512 words in Transformers.

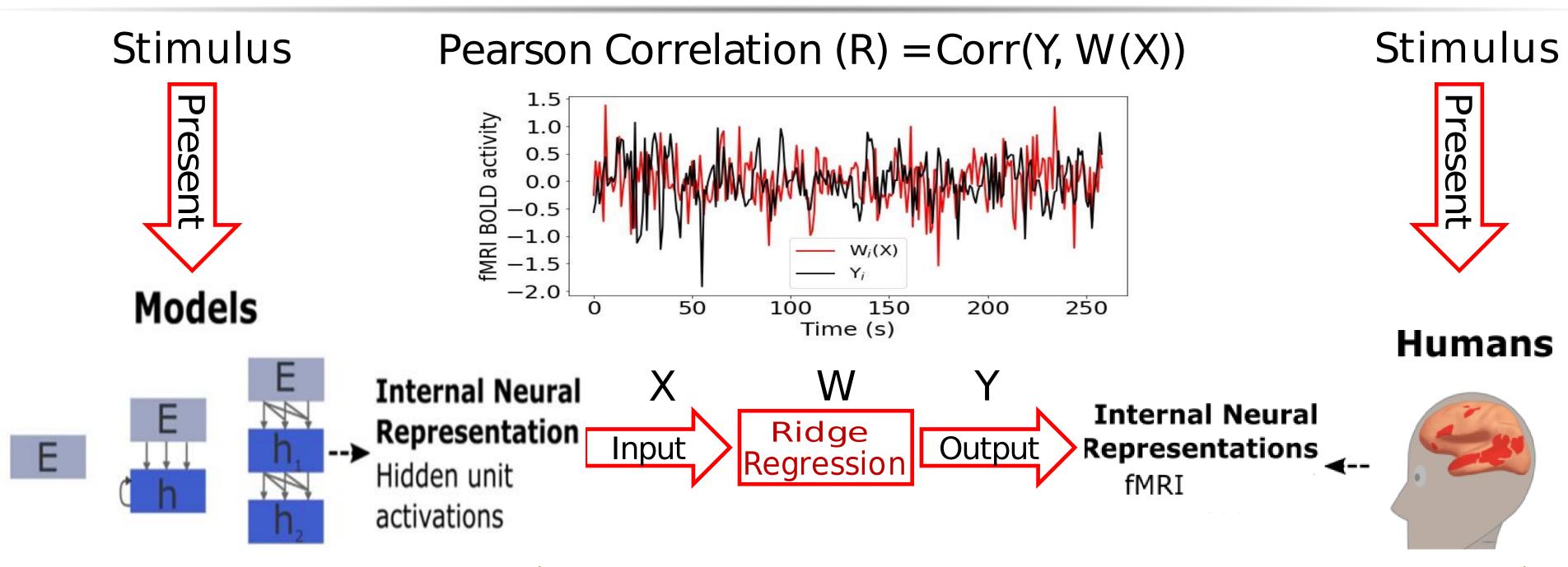
- Questions
- What kind of language models can represent long-term dependencies?
- © Could these language models also predict better brain activity while subjects are engaged in longer stories?
- Main Contributions
- We propose the problem of finding which type of language models are the most predictive of fMRI brain activity for listening tasks.
- Models Considered
- GloVe, Long Short-Term Memory Networks (LSTM)
- ELMo, Longformer



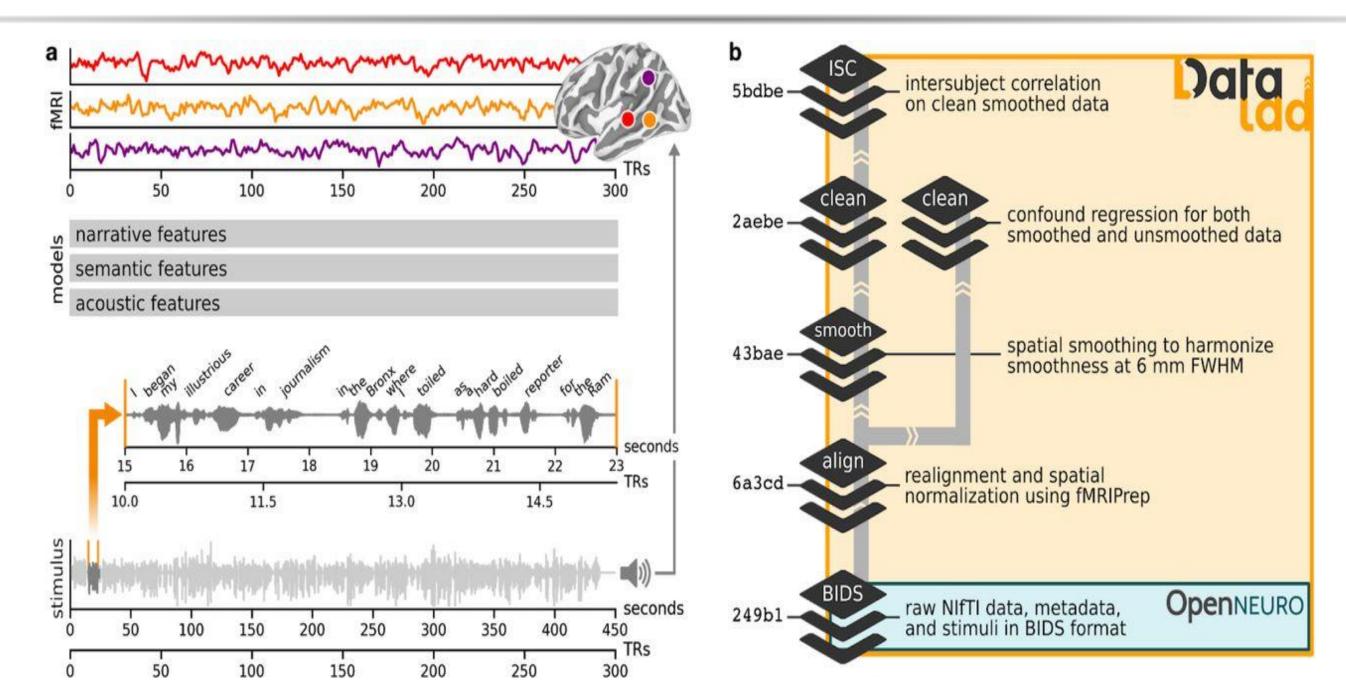
#### Evaluation Metrics

- 1 2V2 Accuracy
- Pearson Correlation (R)

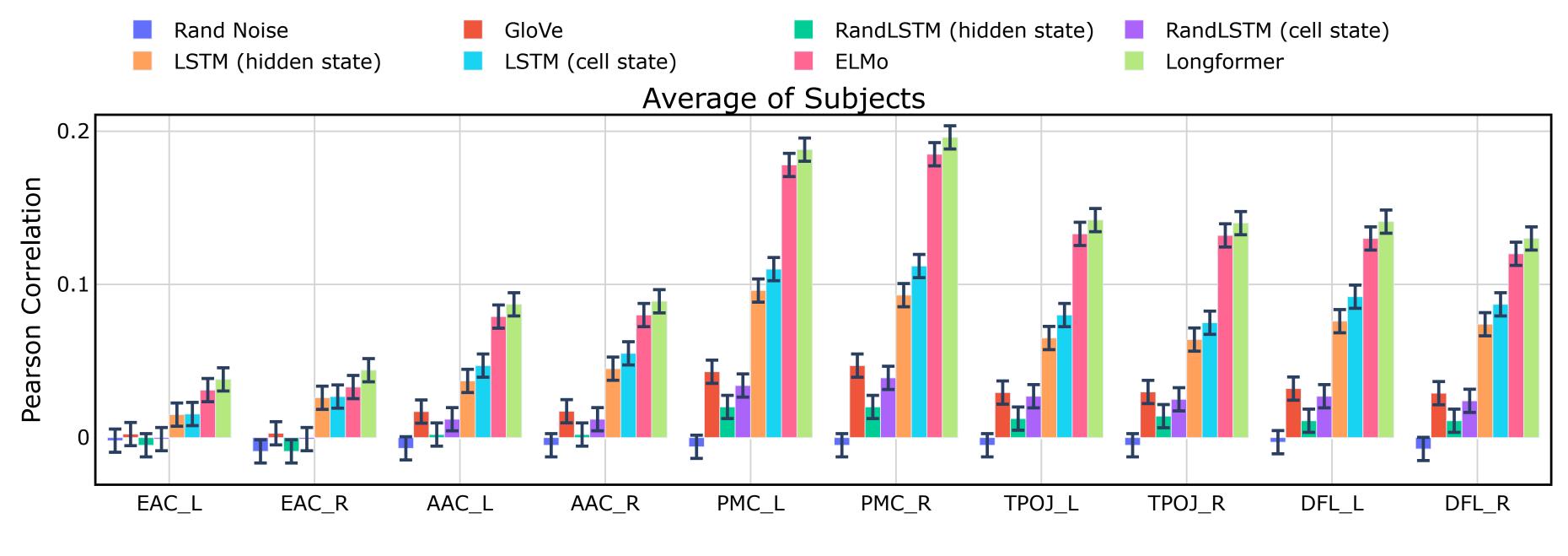
## Brain Encoding

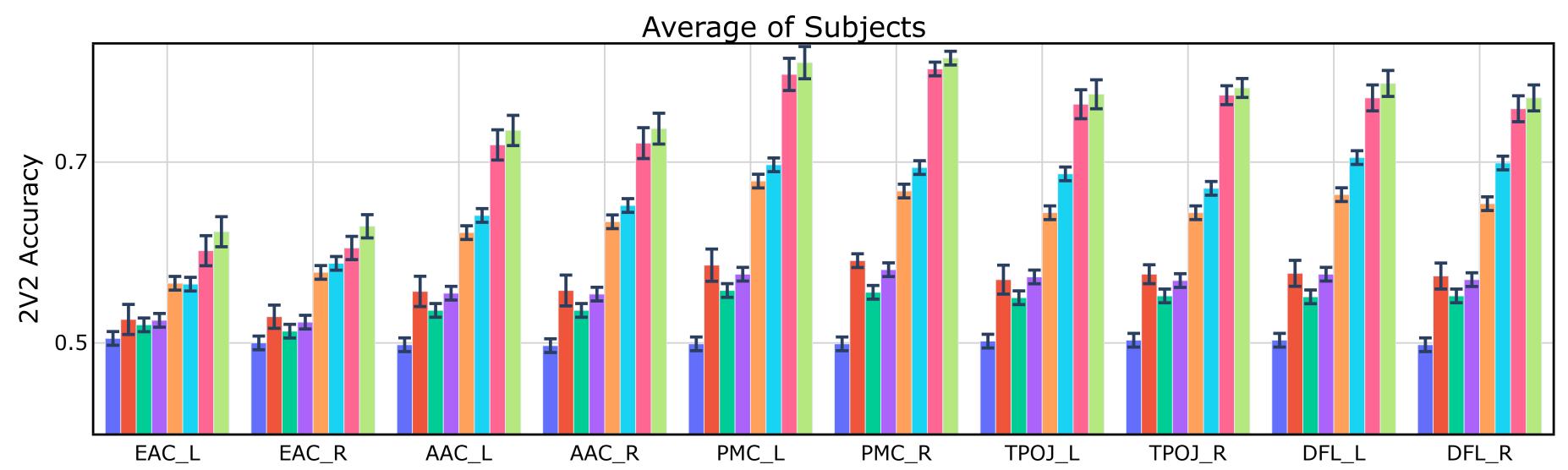


## Narrative Listening (Pieman dataset from Nastase et al. 2021)



# Encoding Performance of Language Models





## Brain Maps (Pearson Correlation)

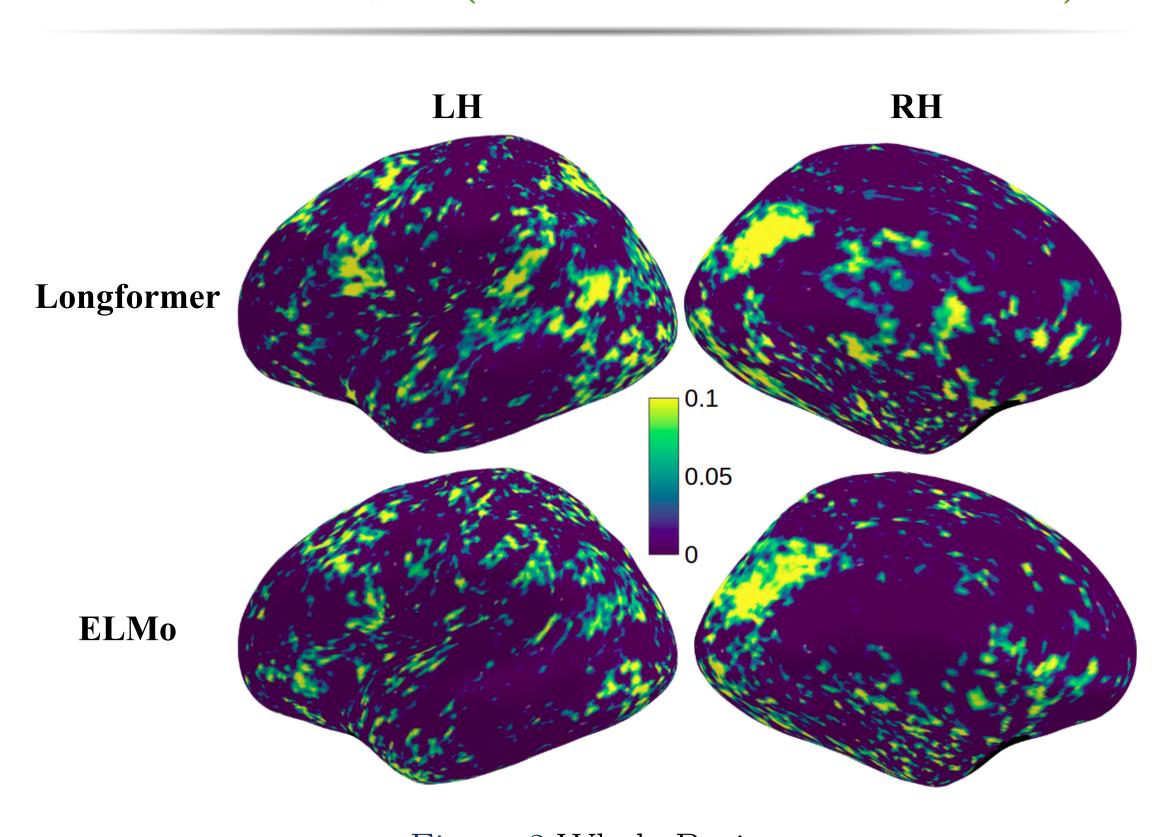


Figure 2:Whole Brain

- Cognitive Insights
- In LSTM, the cell state representations (long term memory vector) yield better encoding performance than hidden state representations.
- 2 We used different layers of ELMo and Longformer, where higher layers display better correlation for ELMo while intermediate layers show superior performance for Longformer.

#### Conclusion

- Language models with longer context (e.g. Longformer) better predict brain activity while subjects listening to stories.
- Future Directions: (i) Use more plausible language models than Transformers. (ii) Make hierarchical language models.

### References

- [1] Martin Schrimpf et al. 2021.
- The neural architecture of language: Integrative modeling converges on predictive processing.
- [2] Ashish Vaswani et al. 2017.
- Attention is all you need.
- [3] Samuel A Nastase et al. 2021. The "narratives" fmri dataset for evaluating models of naturalistic language comprehension.

# Acknowledgements

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