# Identifying The Neural Architecture of Perceptual Decision Making with Normative, Shallow and Deep neural network approaches



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#### 1 Introduction

 Object recognition recruits a hierarchy of cortical regions [1] and evokes a rapid feedforward response [2]

## What neural mechanisms transform sensory input into perceptual experience?

- 2 Method & Analysis
- 17 participants made letter/digit judgements M
- We decoded **six orthogonal features** from

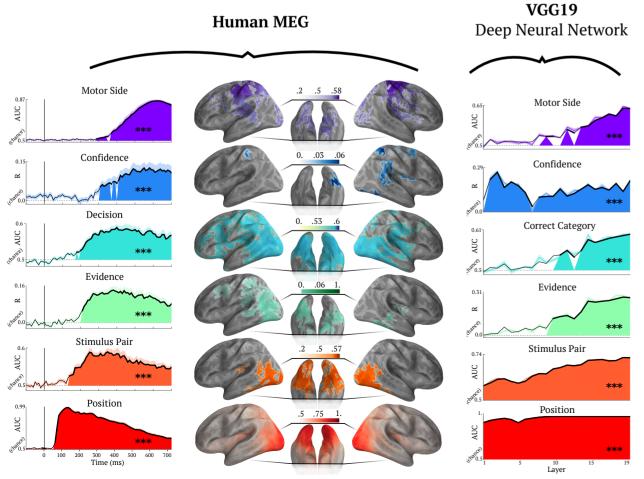
MEG was recorded with a 306 channel system

MEG activity over time and space

• The same features were decoded from each layer of a deep neural network (DDN)

### Temporal and spatial hierarchy:

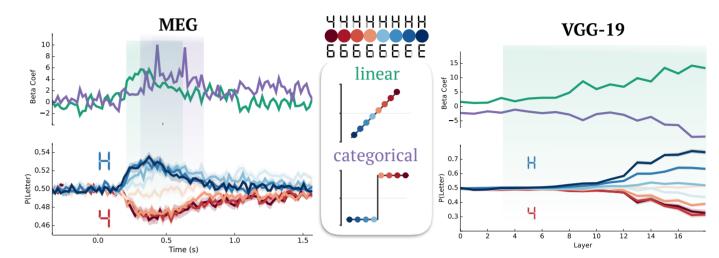
Comparing biological and artificial neural networks



#### 4

#### Tracking the neural computations performed at the decisional stage

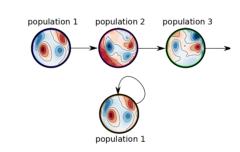
- Sensory evidence of the static stimulus is accumulated over time
- In the human brain, representation of decision variable transforms from linear -> categorical
- DNN remains linear

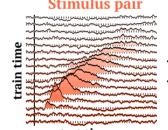


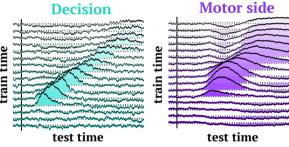
#### 5

#### Testing for feedforward and recurrent architectures in the human brain

 A sequence of operations underlies the processing of a particular stimulus property



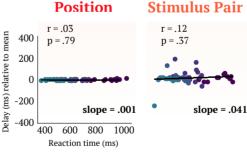


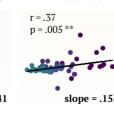


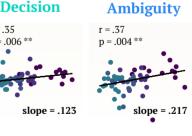
#### 6

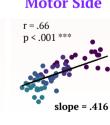
#### How are processing stages linked to one another to carry information

 Processing delay accumulates through the processing stages: The output of one process is the input to the next









#### 7 Conclusions

- The brain achieves object recognition by deriving increasingly abstract representations, using a spatio-temporal hierarchy
- Representations converge using feedforward and recurrent connections
- The brain is adaptive, and can delay processing stages at will

<sup>\*</sup> for a focused comparison between the human brain and deep neural networks, see Gwilliams & King (2017) NIPS workshop on Cognitively Informed AI [1] DiCarlo, J. J., D. Zoccolan and N. C. Rust (2012) [2] Gold, J. I. and M. N. Shadlen (2007)