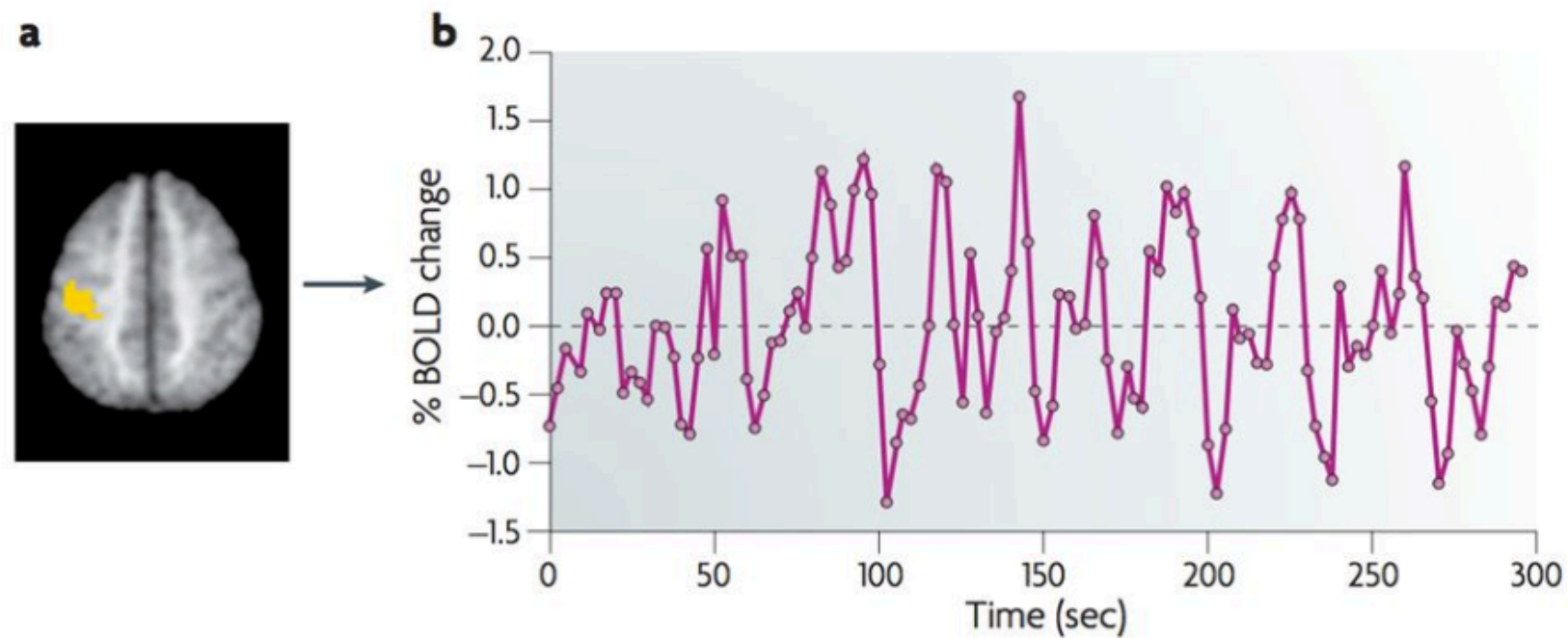


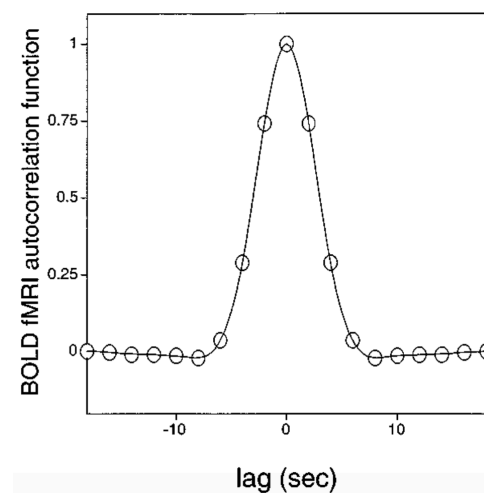
Natalia Bielczyk  
Pouya Ghaemmaghami  
Gregor Koehler  
Fabrizio Damicelli  
Sarah Morgan  
Jean-Loup Loyer  
Onerva Korhonen

## Trends in the resting brain

# Is resting state BOLD fMRI activity random?

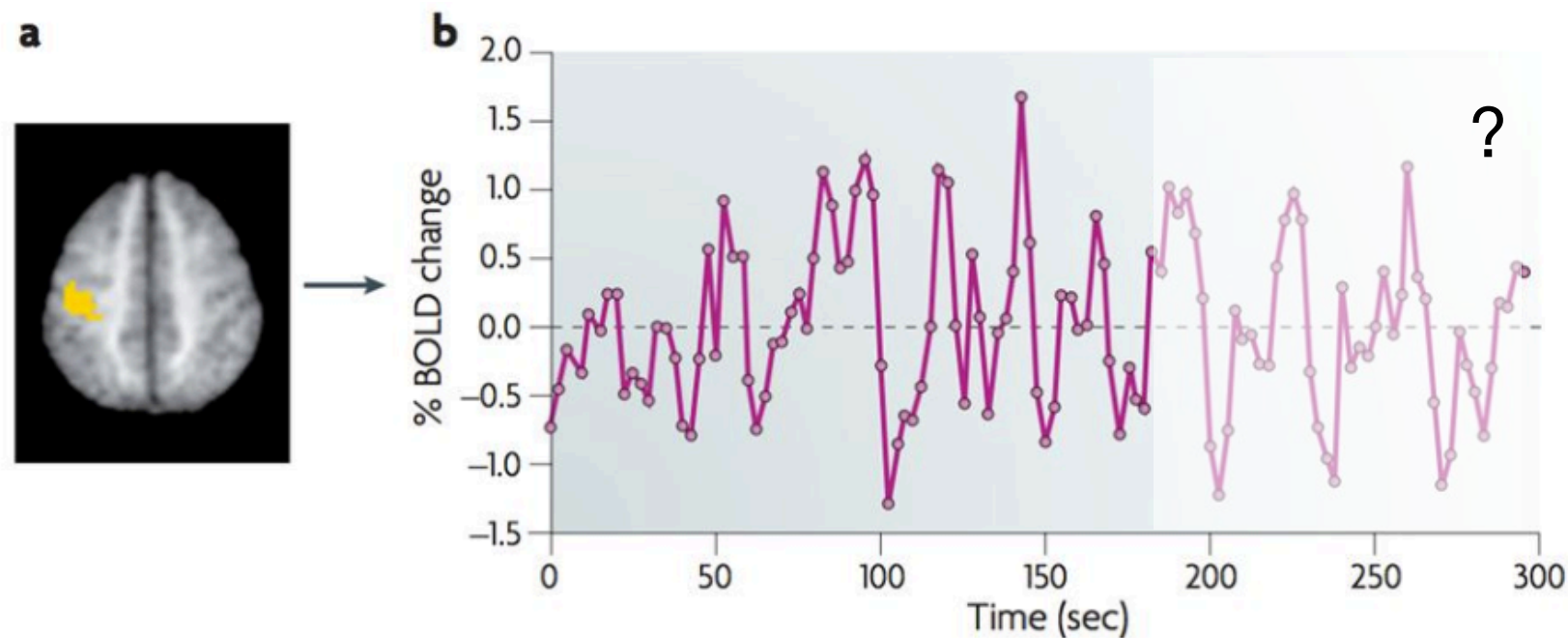


- we know that BOLD is autocorrelated because of the slow hemodynamics

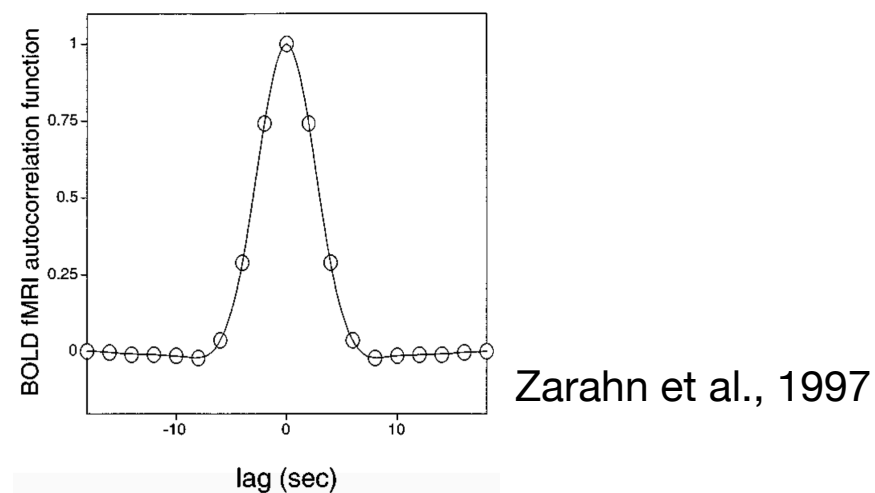


Zarahn et al., 1997

# Is resting state BOLD fMRI activity random?



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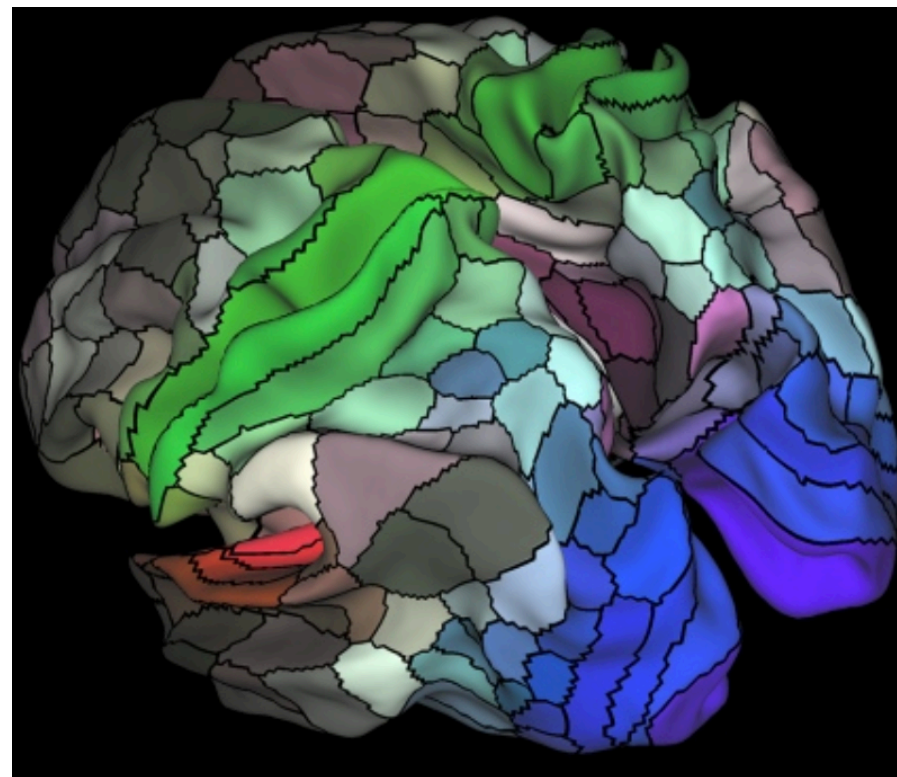
- can we *predict* the future BOLD fMRI values on the basis of historical values?  
can we *beat* the prediction accuracy coming from autocorrelation?

# Materials and methods

## Datasets

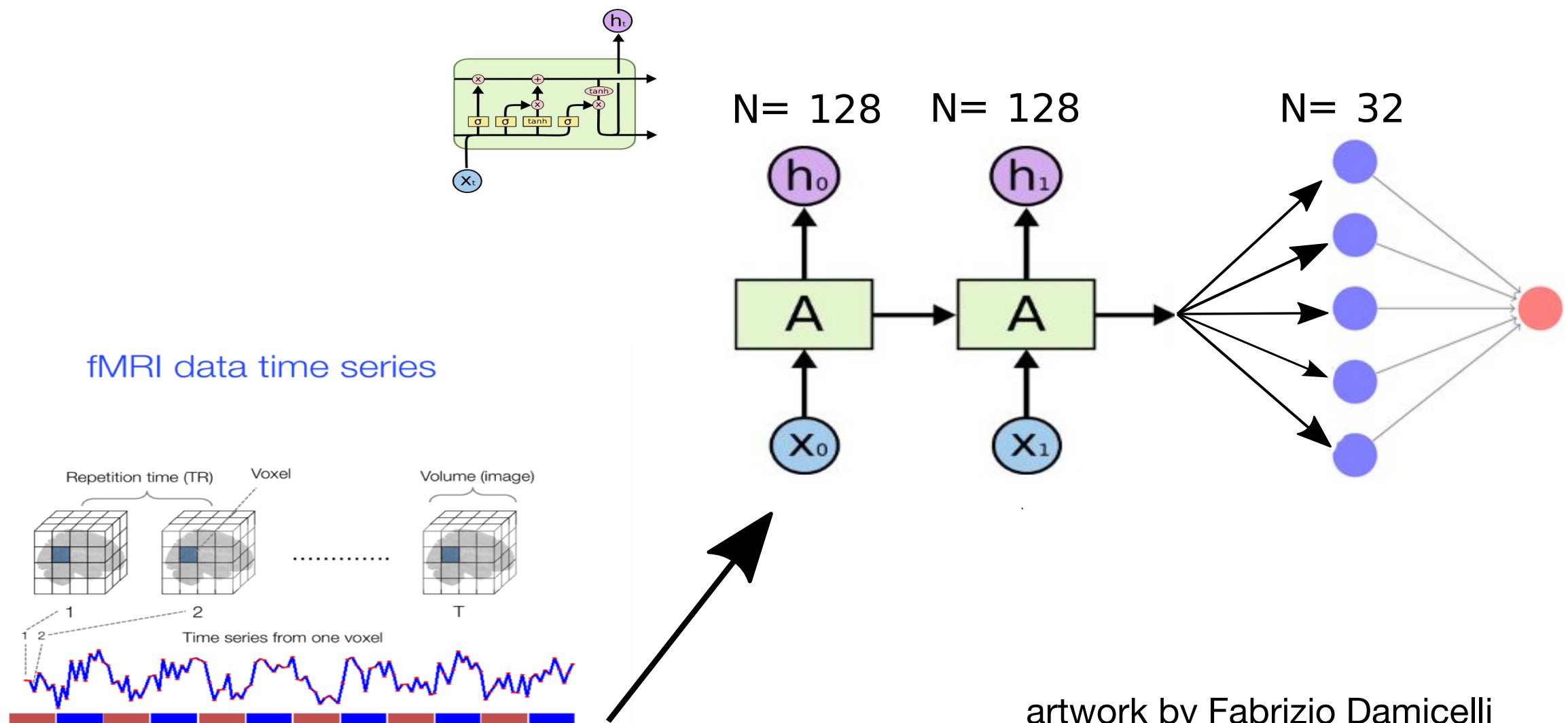
**functional Magnetic Resonance Imaging** datasets come from the Human Connectome Project (van Essen, 2013)

- > preprocessed using FSL with ICA-AROMA correction for movement artifacts
- > parcellated using new cortical parcellation by Glasser et al. (2016) using a trade-off between machine learning and neuroanatomy (180 ROIs)



# Machine learning algorithms

## [1] Long short-term memory (LSTM) recurrent neural network



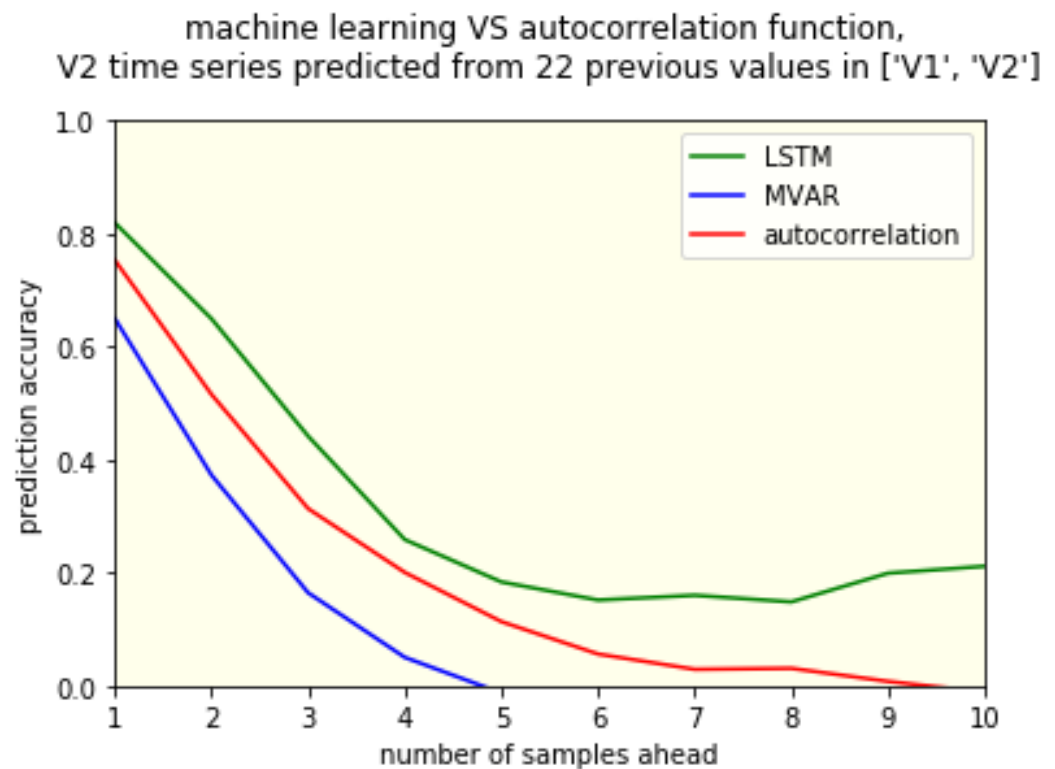
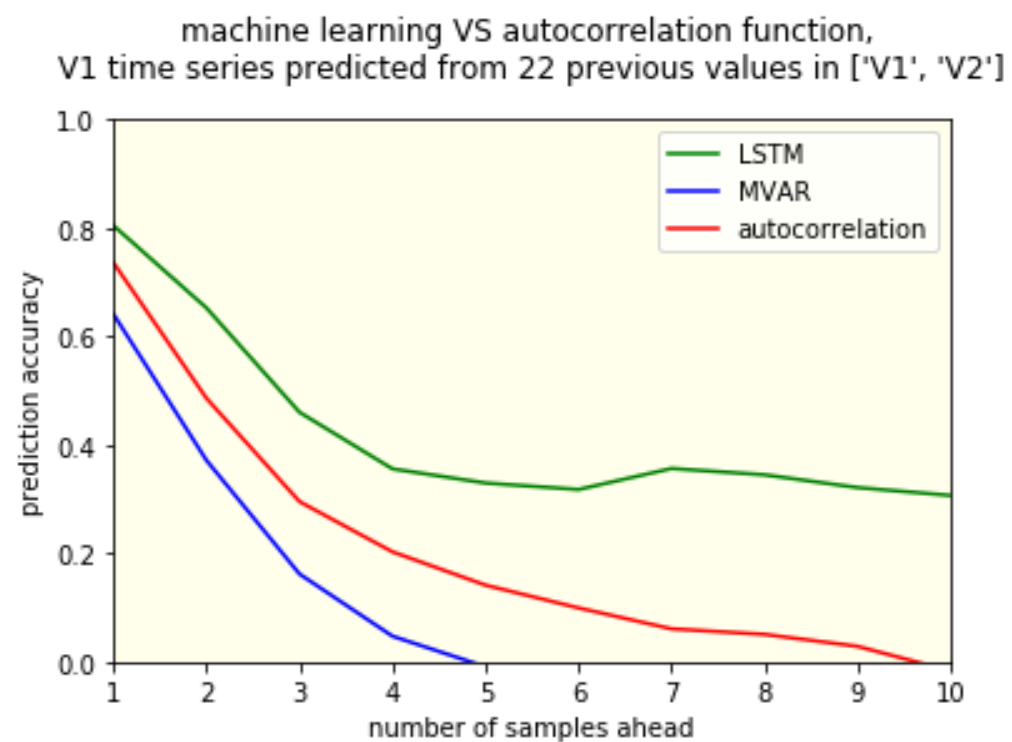
# Machine learning algorithms

## [2] Multivariate Autoregressive Models

$$X_t = c + \sum_{i=1}^p \varphi_i \vec{X}_{t-i} + \varepsilon_t$$

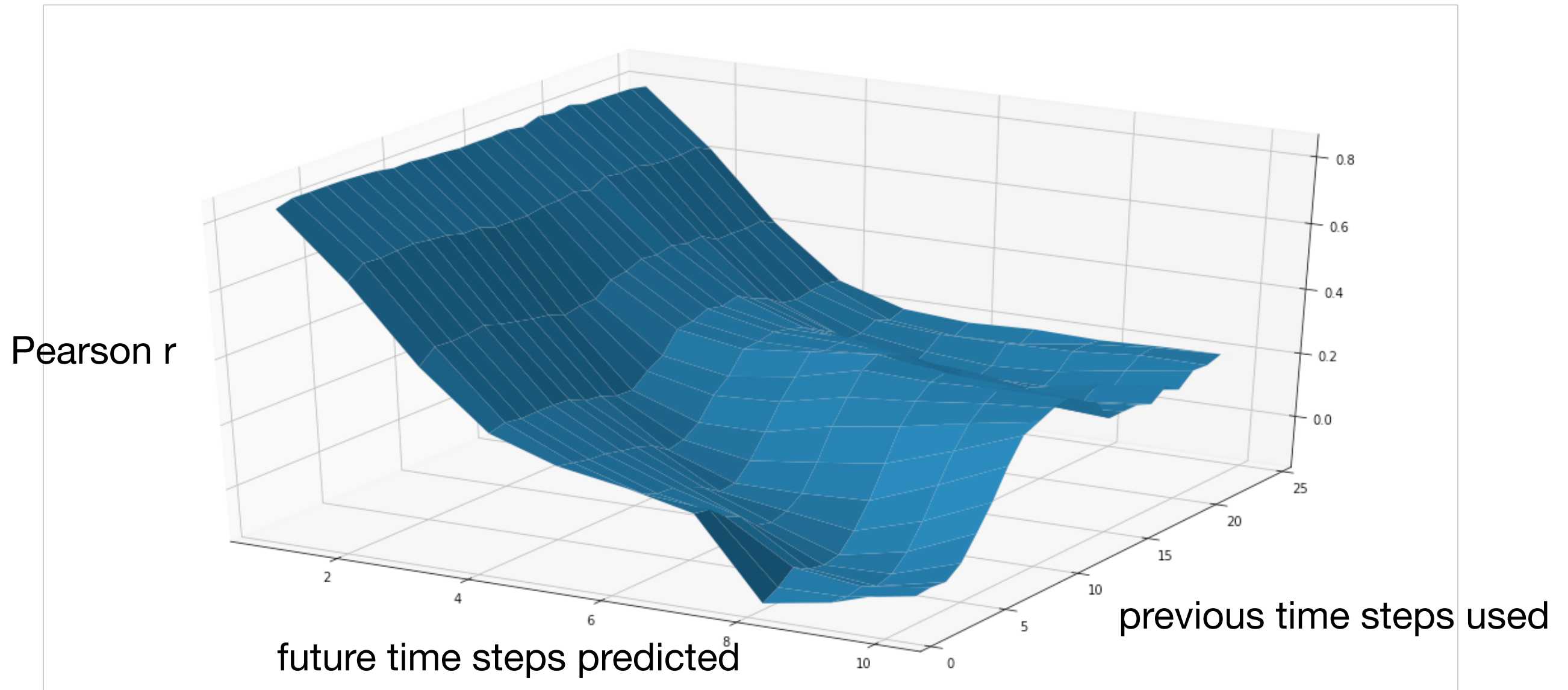
# Results

comparison between autocorrelation, LSTMs and MVARs (single subject level):



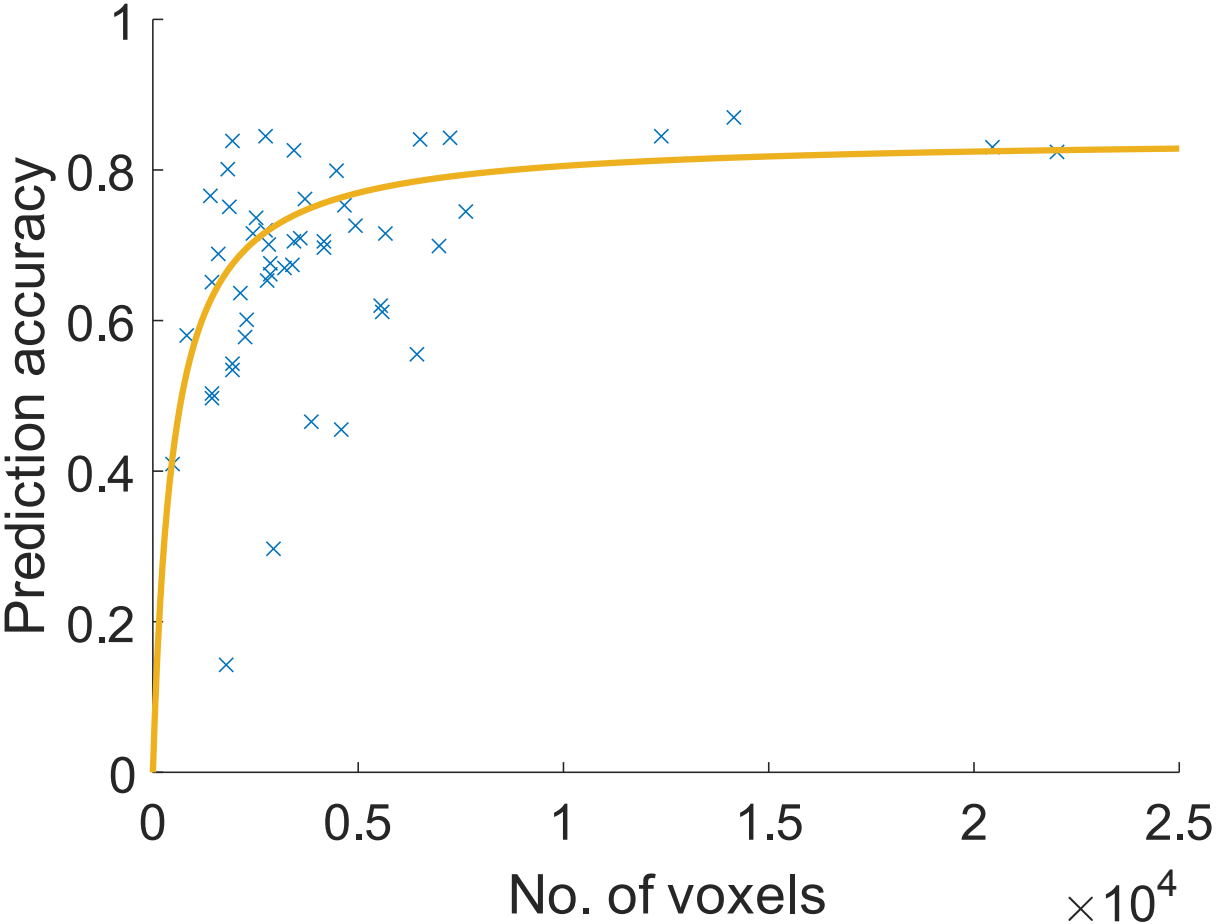
# Results

## Optimizing parameters for LSTMs

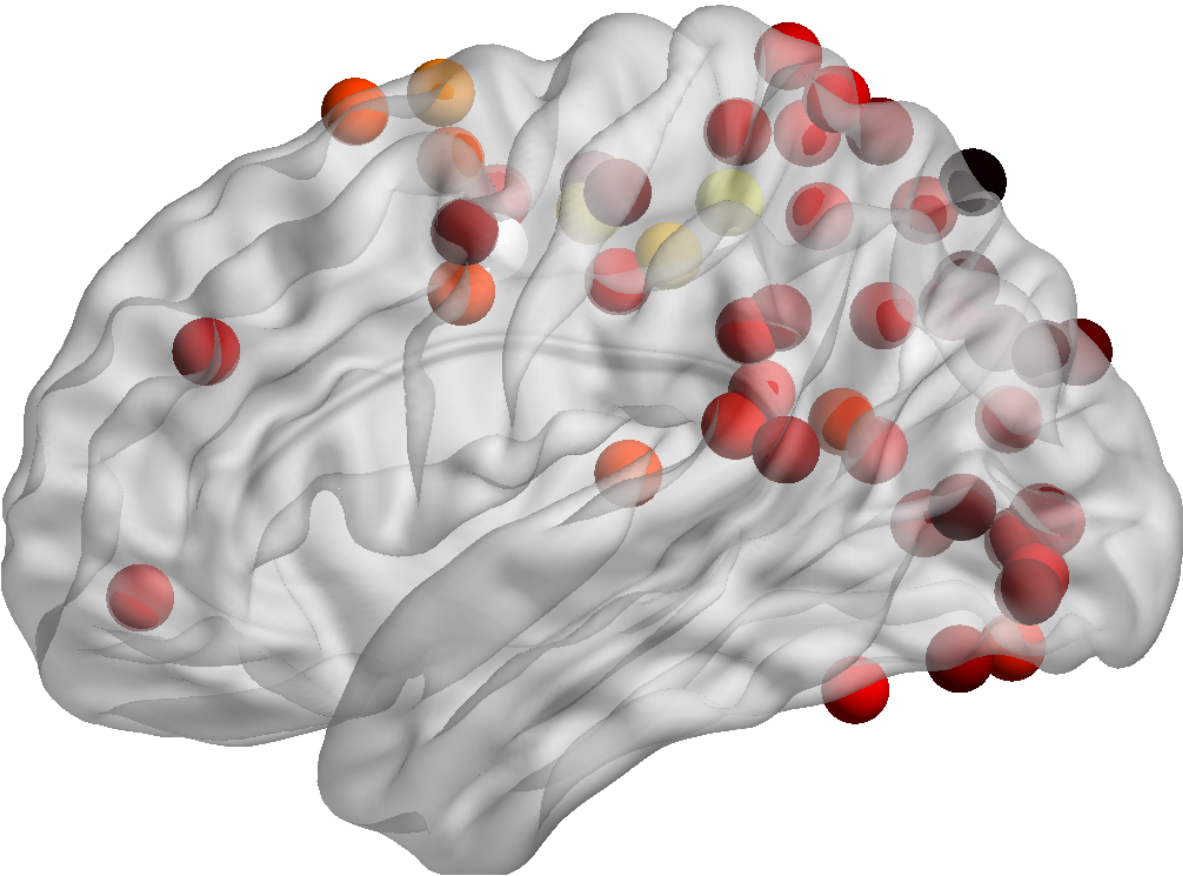




Size of ROI affects prediction accuracy  
(LSTMs, one sample ahead)



Size-corrected prediction accuracy



artwork by  
Sarah Morgan & Onerva Korhonen

## Future work

- [1] making the whole brain map of predictability
- [2] comparing the results from multivariate AR with the simple linear regression
- [3] exchange correlations with MSE as a measure of accuracy
- [4] second level analysis (looking at the cohort level)

## Future work

- [1] making the whole brain map of predictability
- [2] comparing the results from multivariate AR with the simple linear regression
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- [4] second level analysis (looking at the cohort level)

Thank you :)

**[https://github.com/cryptofan/BrainhackNetworks\\_indicators\\_restingstate](https://github.com/cryptofan/BrainhackNetworks_indicators_restingstate)**