

# **The Analysis Group workshop 2025**

# Program

10:30. Introduction. Diego Vidaurre

11:00. The Hidden Markov model. Laura Masaracchia

12:00. Lunch

12.30. Out-of-sample prediction of non-imaging traits.

Christine Ahrends

13.30. Statistical inference on brain dynamics. Nick Larsen

14.30. Coffee break.

15.00. Normative modelling of functional connectivity.

Janus Rønn Lind Kobbensmed

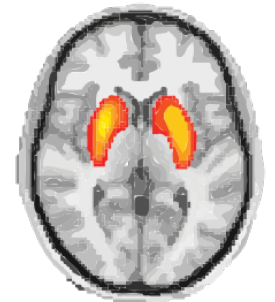
# Brain networks and their dynamics

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## Level of description:

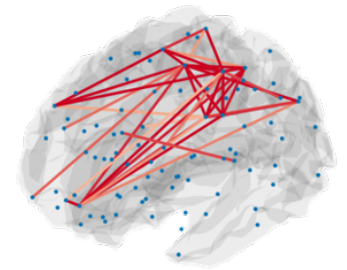
**Independent Component Analysis**

First order moments  
(e.g., amplitude)



**Hidden Markov Model**

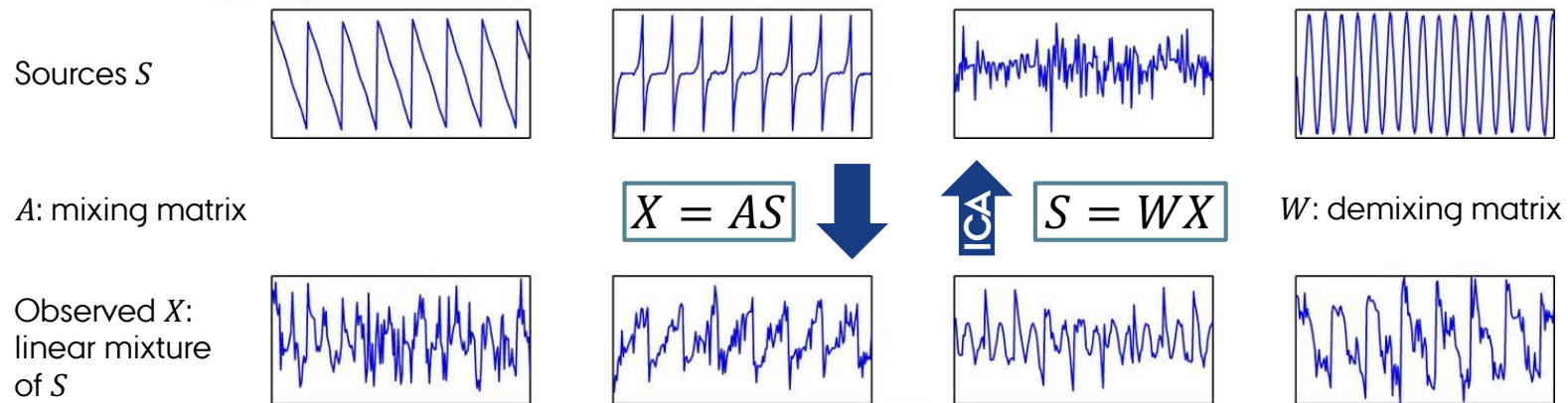
Second/higher order  
moments (e.g.,  
functional connectivity)



Vidaurre et al. (2022).  
Imaging Neuroscience

# Independent component analysis

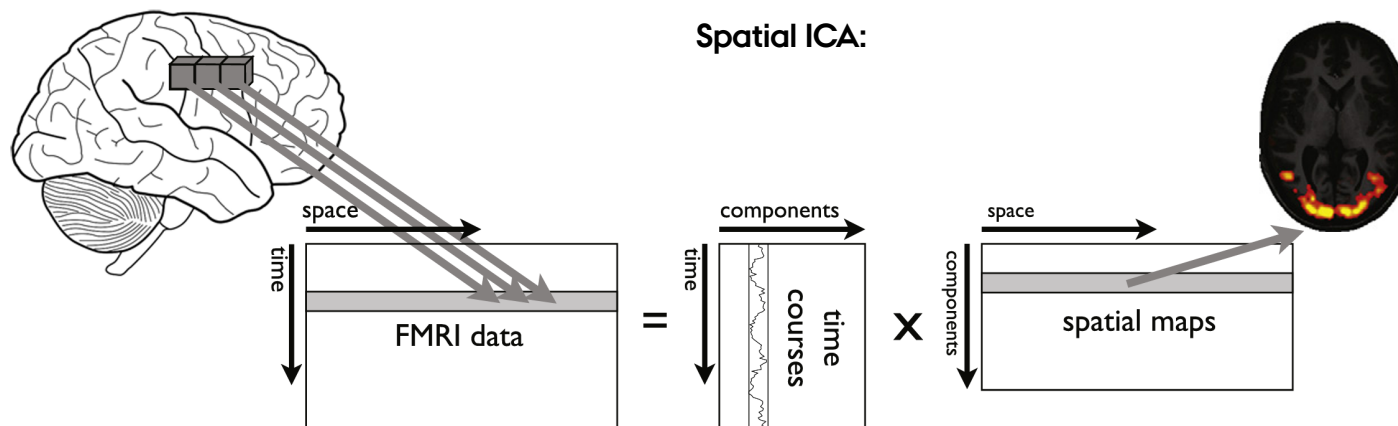
- Problem of blind source separation (Hérault and Jutten, 1984-1991)
- Express a set of random variables as linear combinations of statistically independent component variables
- Leans on non-Gaussianity



Hyvärinen (2013), Philos. Trans. Royal Soc. A

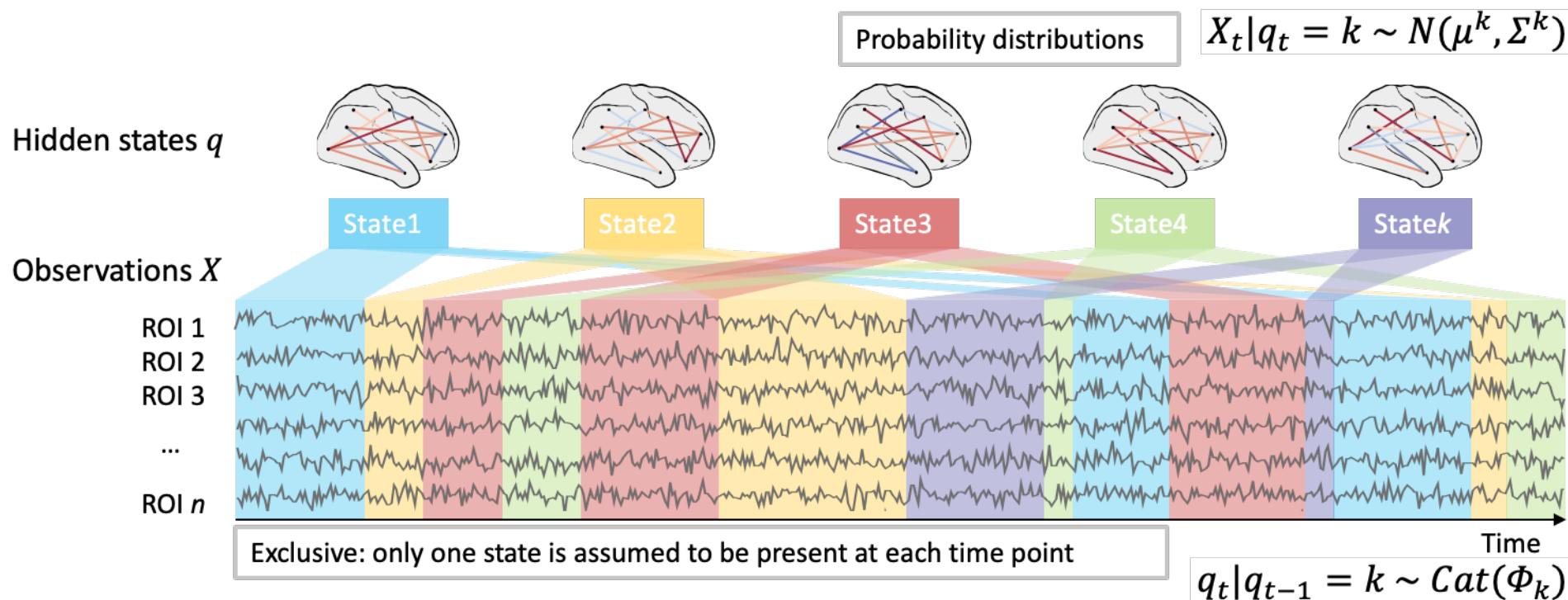
# Independent component analysis

- Problem of blind source separation (Hérault and Jutten, 1984-1991)
- Express a set of random variables as linear combinations of statistically independent component variables
- Leans on non-Gaussianity



Beckmann (2012), NeuroImage

# Hidden Markov Modelling

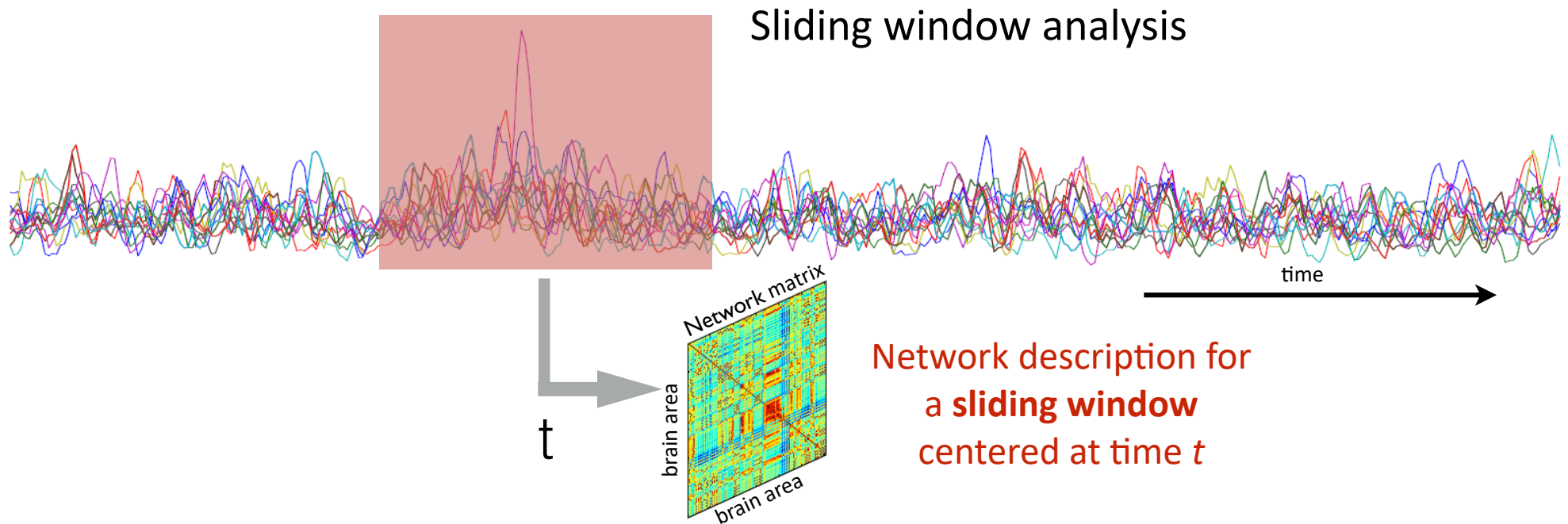


Vidaurre et al. (2017). PNAS

Vidaurre et al. (2018). Nature Communications

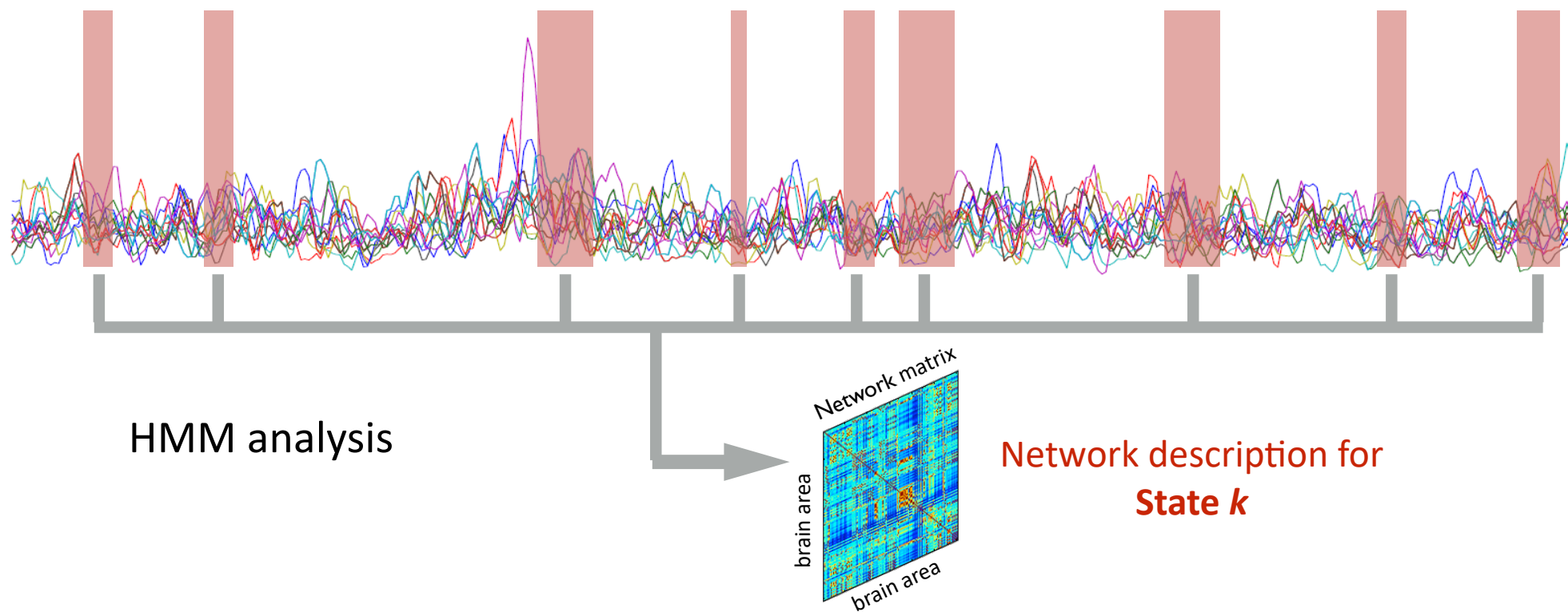
Ahrends & Vidaurre (2023). ArXiv

# HMM vs. sliding window analyses



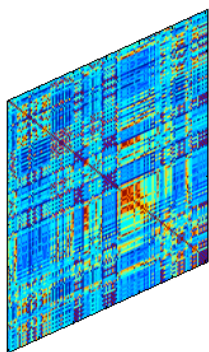
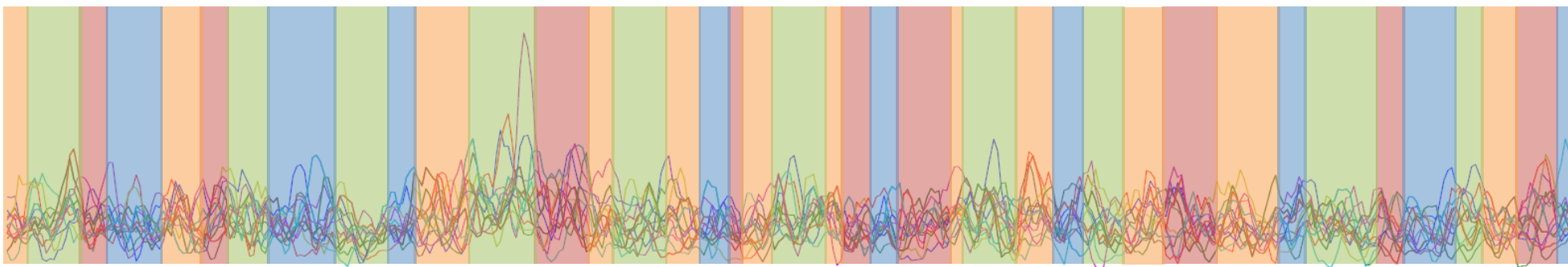


# From windows to state visits

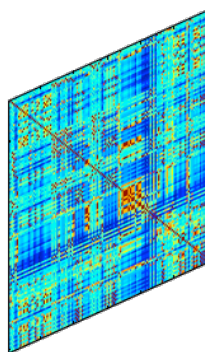


# From windows to state visits

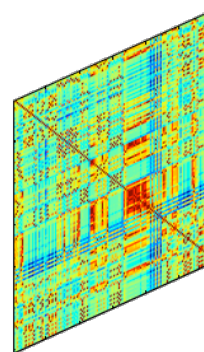
Pooling data over disjoint time periods:



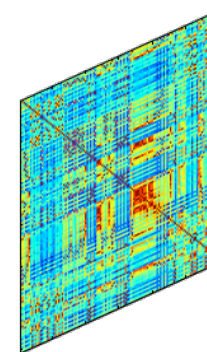
State 1



State 2



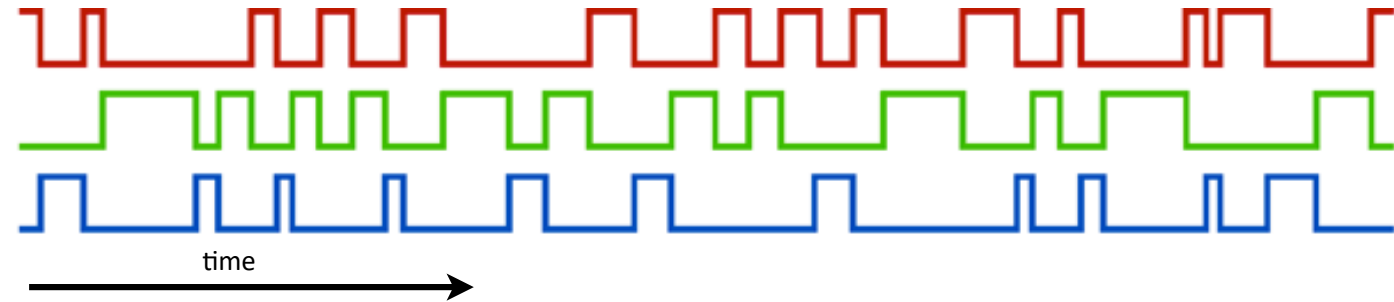
State 3



State 4

# The elements of the HMM

State time courses:  
**When**

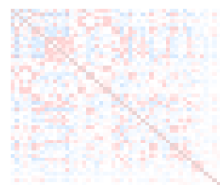
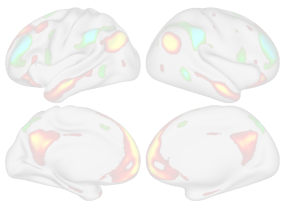


State probability distribution  
(one for each state):

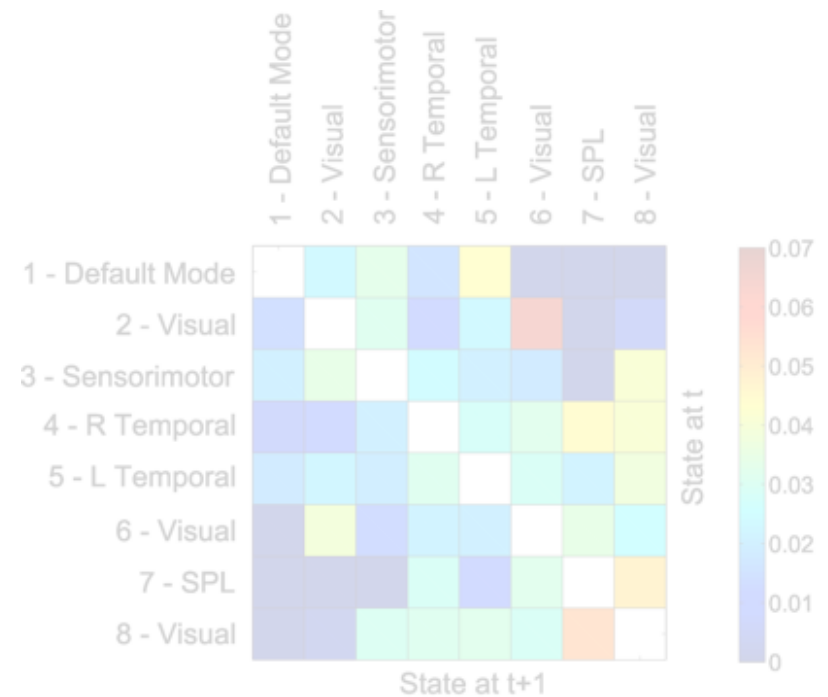
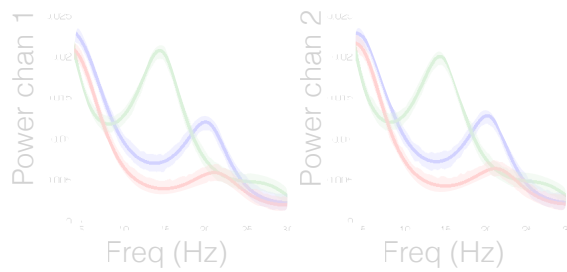
**What**

Mean activation

Functional connectivity



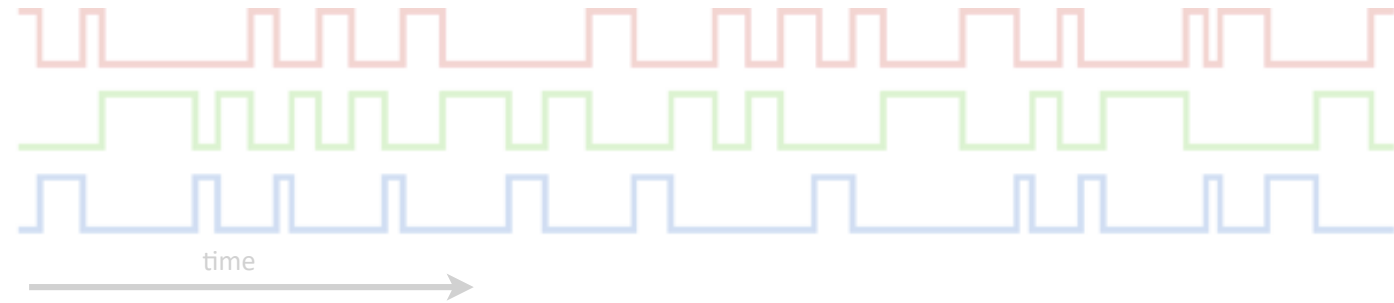
Spectral properties



Transition probability  
matrix

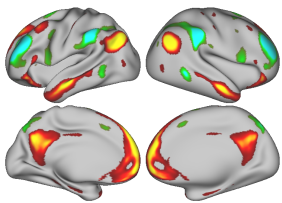
# The elements of the HMM

State time courses:  
**When**

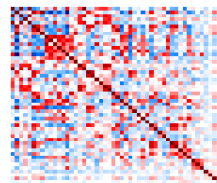


State probability distribution  
(one for each state):  
**What**

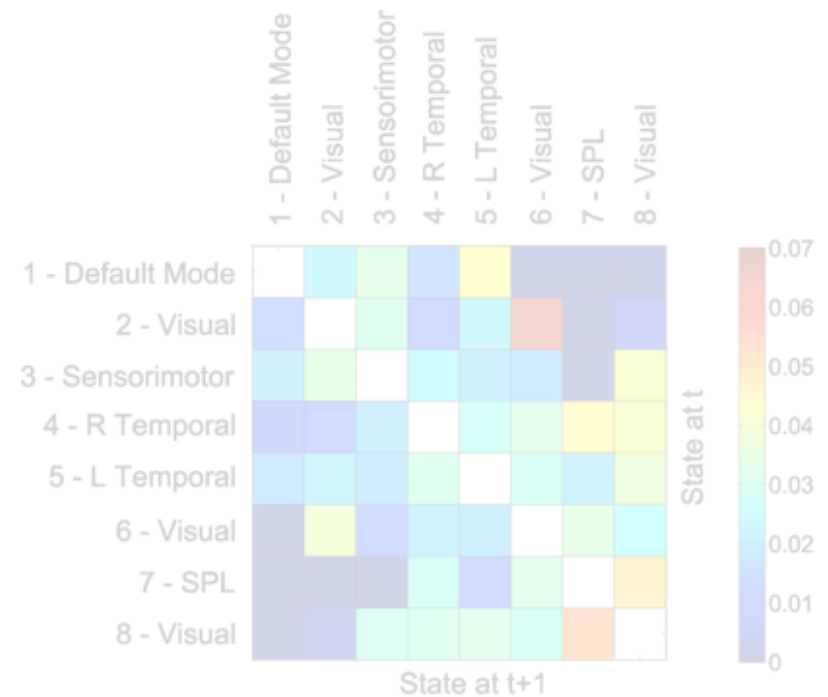
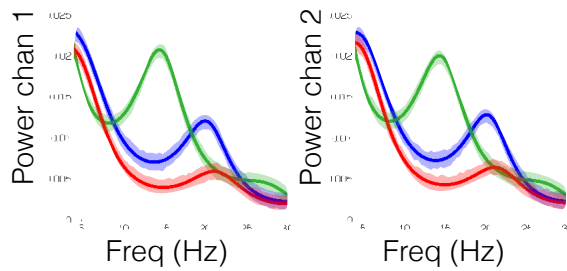
Mean activation



Functional connectivity



Spectral properties



Transition probability  
matrix

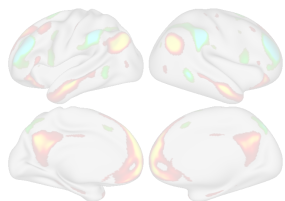
# The elements of the HMM

State time courses:  
**When**

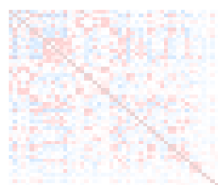


State probability distribution  
(one for each state):  
**What**

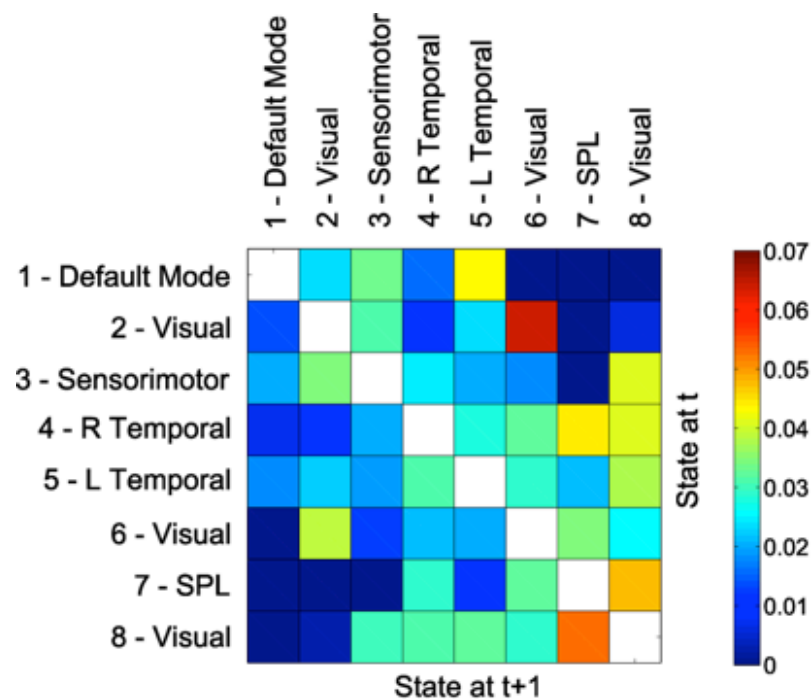
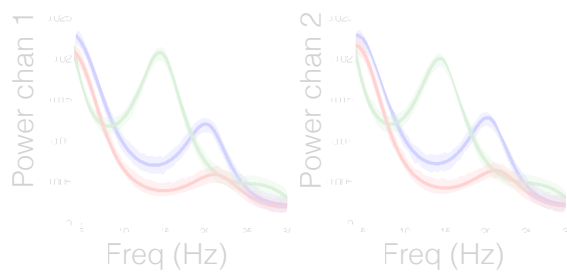
Mean activation



Functional connectivity



Spectral properties



Transition probability  
matrix

# Flexible state models



Sensor space M/EEG

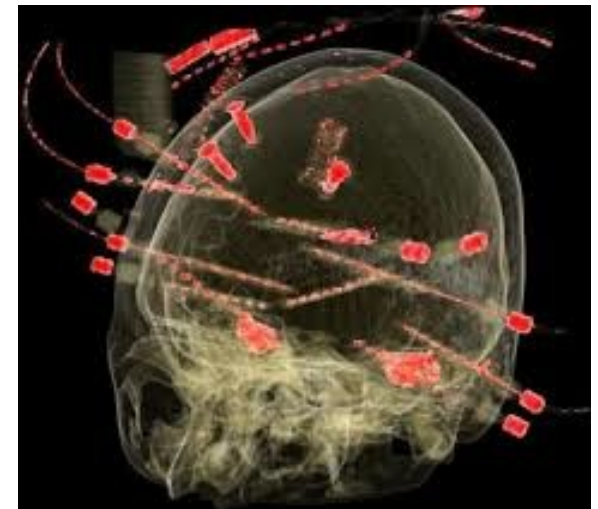


fMRI



Source space M/EEG

HMM



Intracranial  
recordings

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Janus Rønn Lind Kobbersmed

**HMM-based, using the GLHMM toolbox**

# Left-out (but you can ask)

- Advanced decoding analysis:

What to do when we want to interrogate when and where the brain encodes a stimulus or decision, in a task with variable/unknown latencies —such as recall or imagery? (*Pablo*)

- Generative models of task data, e.g. for hypothesis testing (*Diego*)
- How can we make estimations of dynamics more robust? (*Sonsoles*)
- How to combine multiple models to achieve more powerful out-of-sample predictions of behavioural traits? (*Ben Griffin*)
- How to predict subject traits from EEG spectrograms (*Cecilia Jarne*)

*Etc*