

# Hidden State Dynamics in visual cortex and motor cortex

Pod name: Mesfouf Pod mentor: Pietro Verzelli

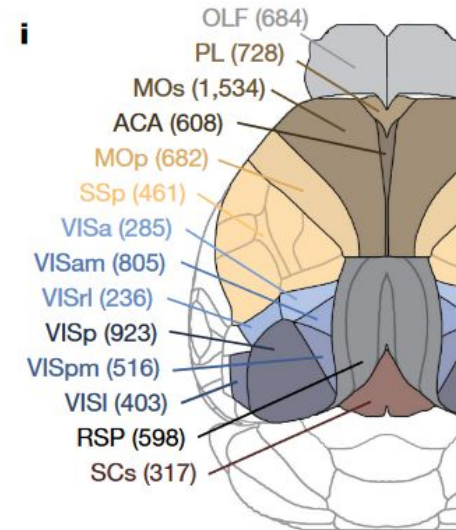
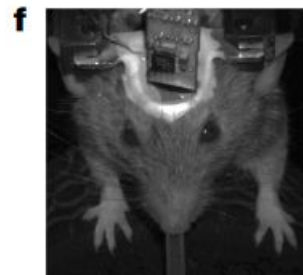
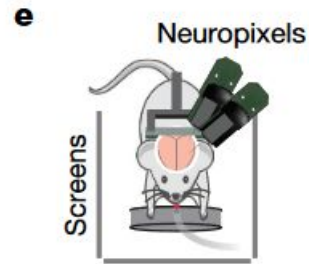
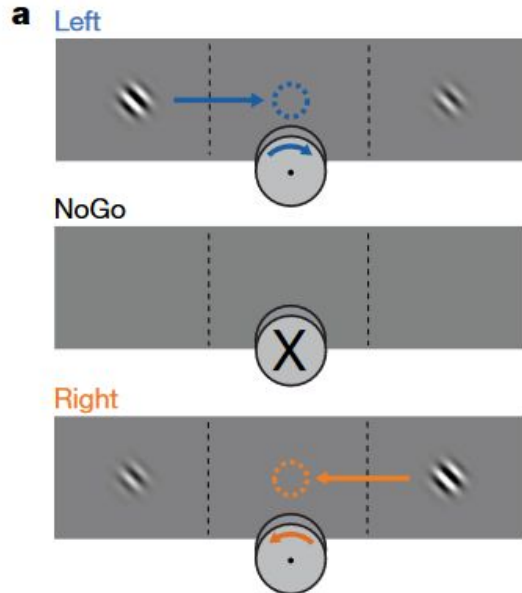
Project TA: Sinem Serap Project mentor: Benjamin Gagli

Group: Chao(s)fan

Jing, Peng, Ula, Yuyang, Farnaz, Yidan

# Introduction

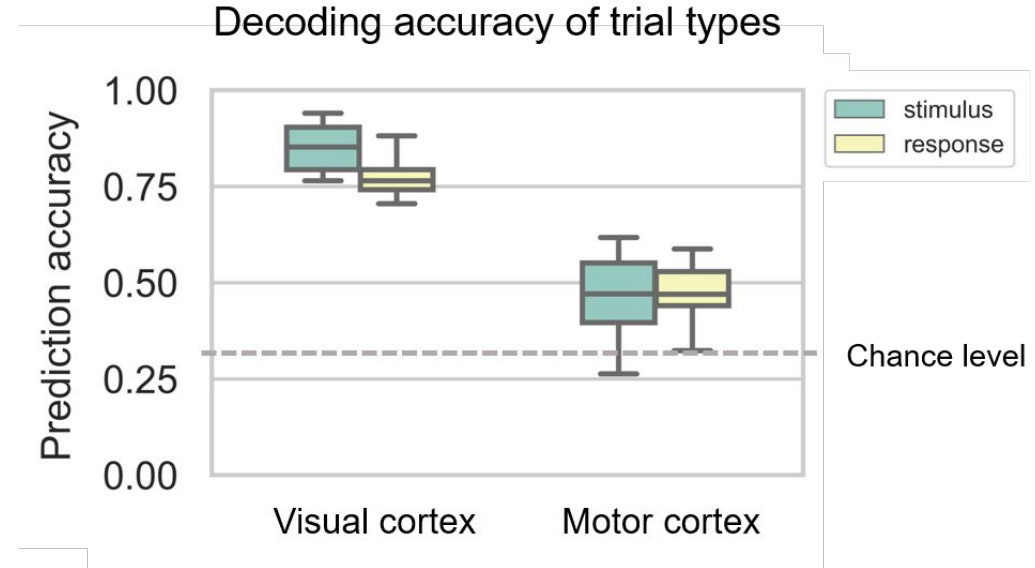
- In **Steinmetz dataset**, mice perform a decision making task, involving processing different visual stimuli, selecting actions and getting the feedback.
- **Scientific question:** How does information transform from the visual cortex to the motor cortex?



Steinmetz, N.A., Zatka-Haas, P., Carandini, M. *et al.* (2019).

# Decoding trials information from neurons firing rates

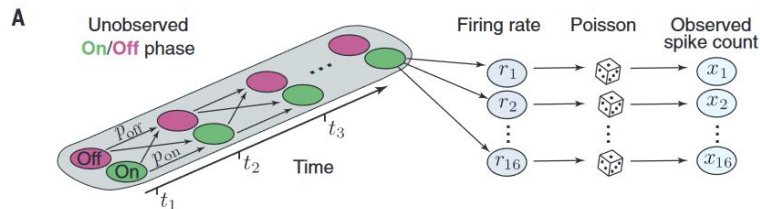
- The firing rate of neurons in visual cortex and motor cortex both contain trial information of stimulus and response. (Shuler & Bear, 2006)
- The firing rate of neurons in visual cortex better predicted stimulus type than response type.
- The firing rate of neurons in motor cortex had almost the same decoding accuracy in predicting stimulus types and response types.



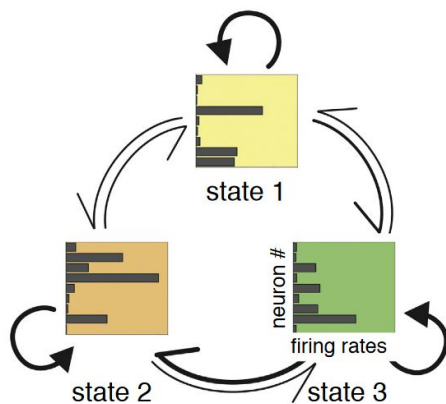
(Supportive vector classifier with 10-fold cross validation)

# Selecting the best number of states for Hidden Markov Model

## Poisson HMM

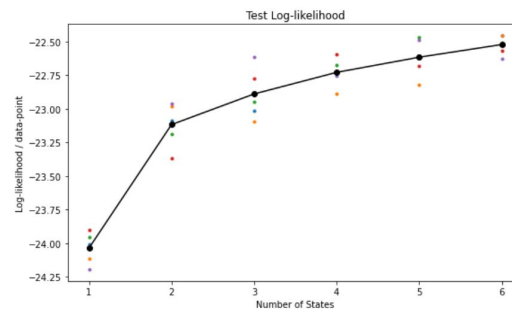


(Engel et al., 2016)

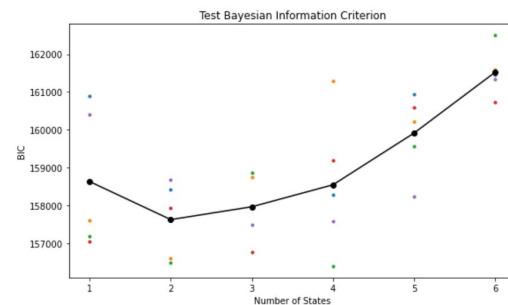
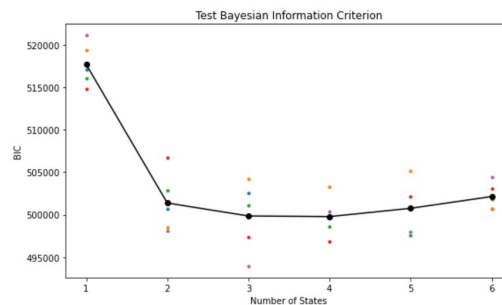
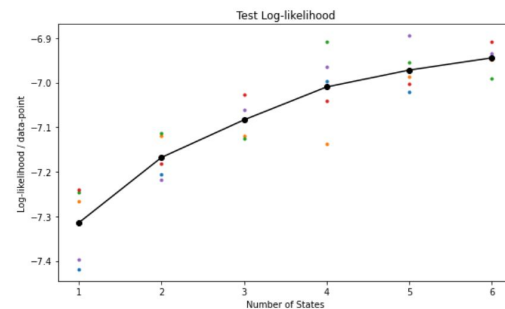


(Mazzucato et al., 2019)

## Visual cortex

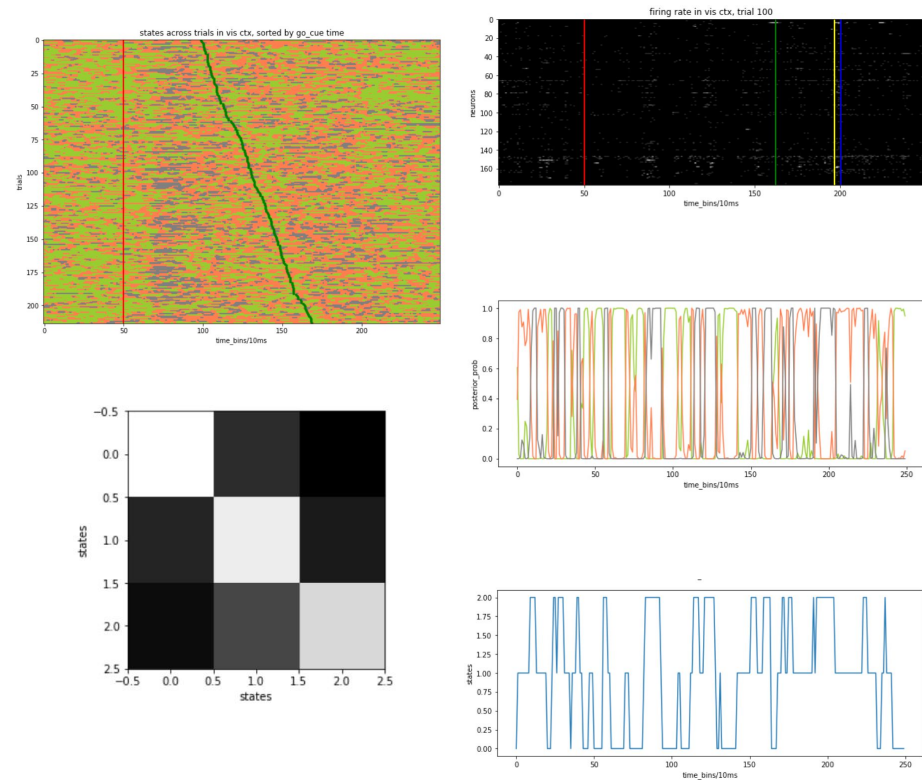


## Motor cortex

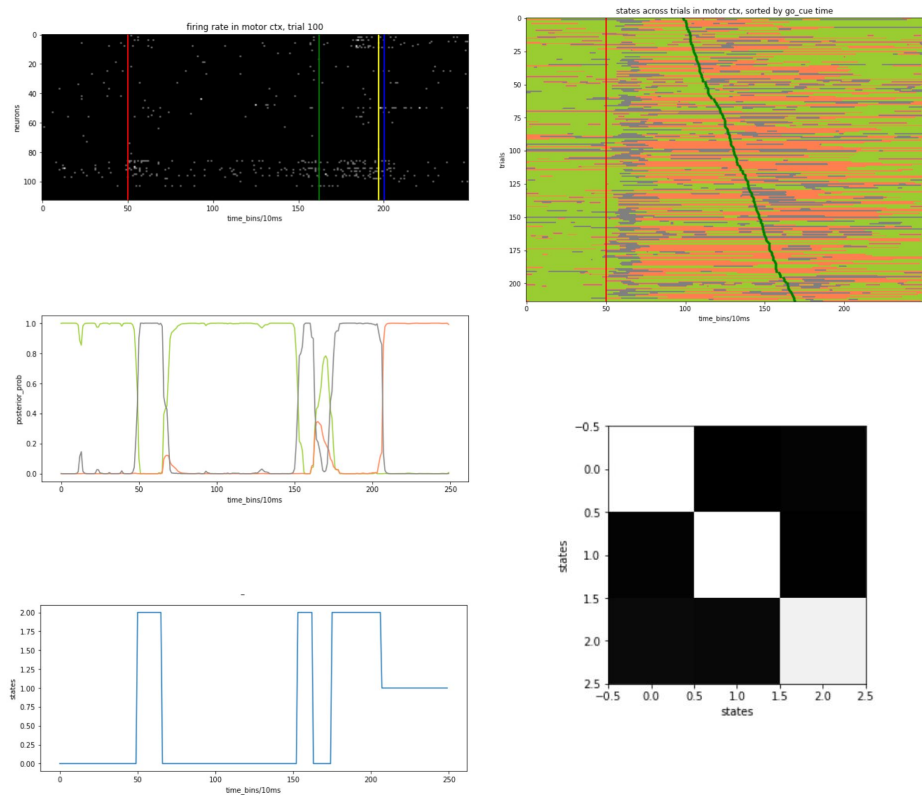


# Hidden states in visual cortex and motor cortex using Hidden Markov Model

## Visual cortex



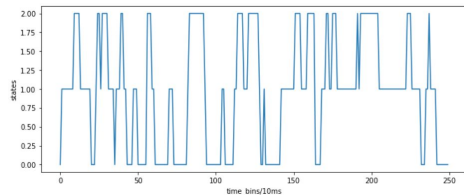
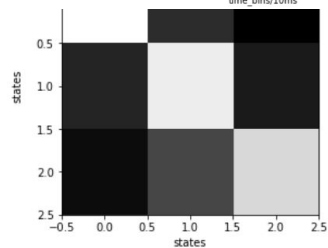
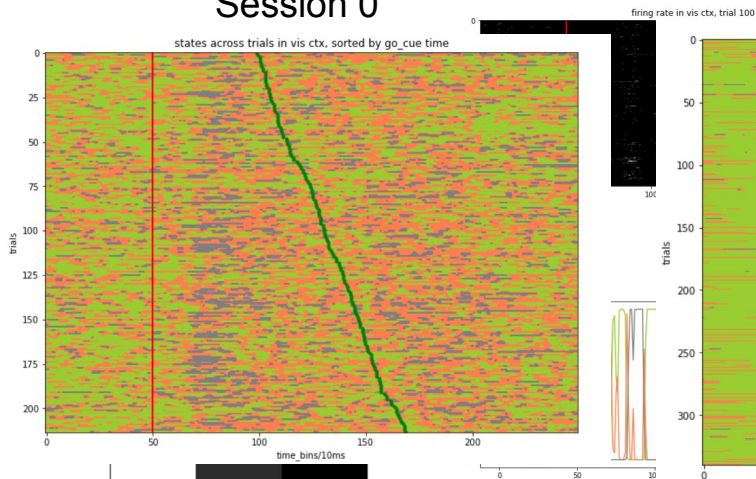
## Motor cortex



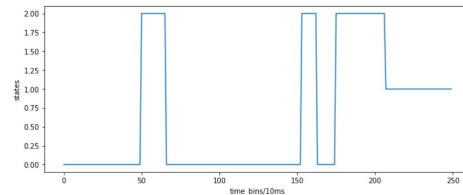
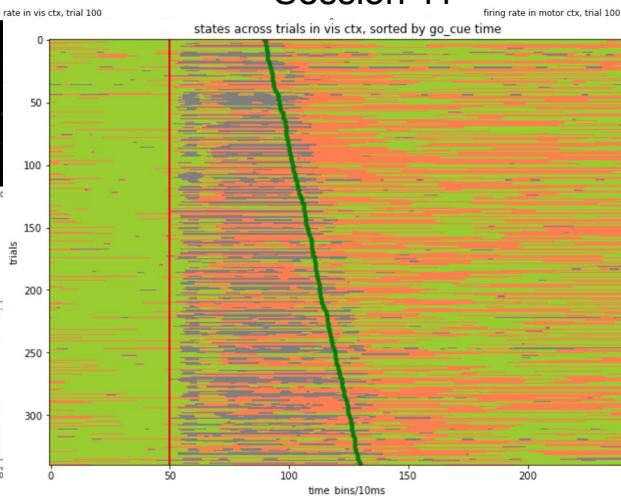
# Hidden states in visual cortex and motor cortex using Hidden Markov Model

## Visual cortex

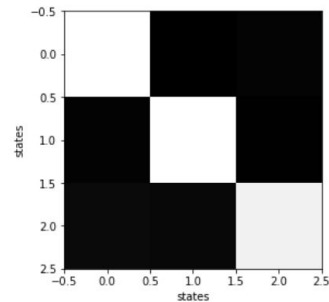
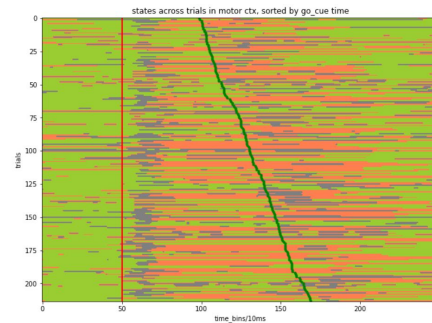
### Session 0



### Session 11

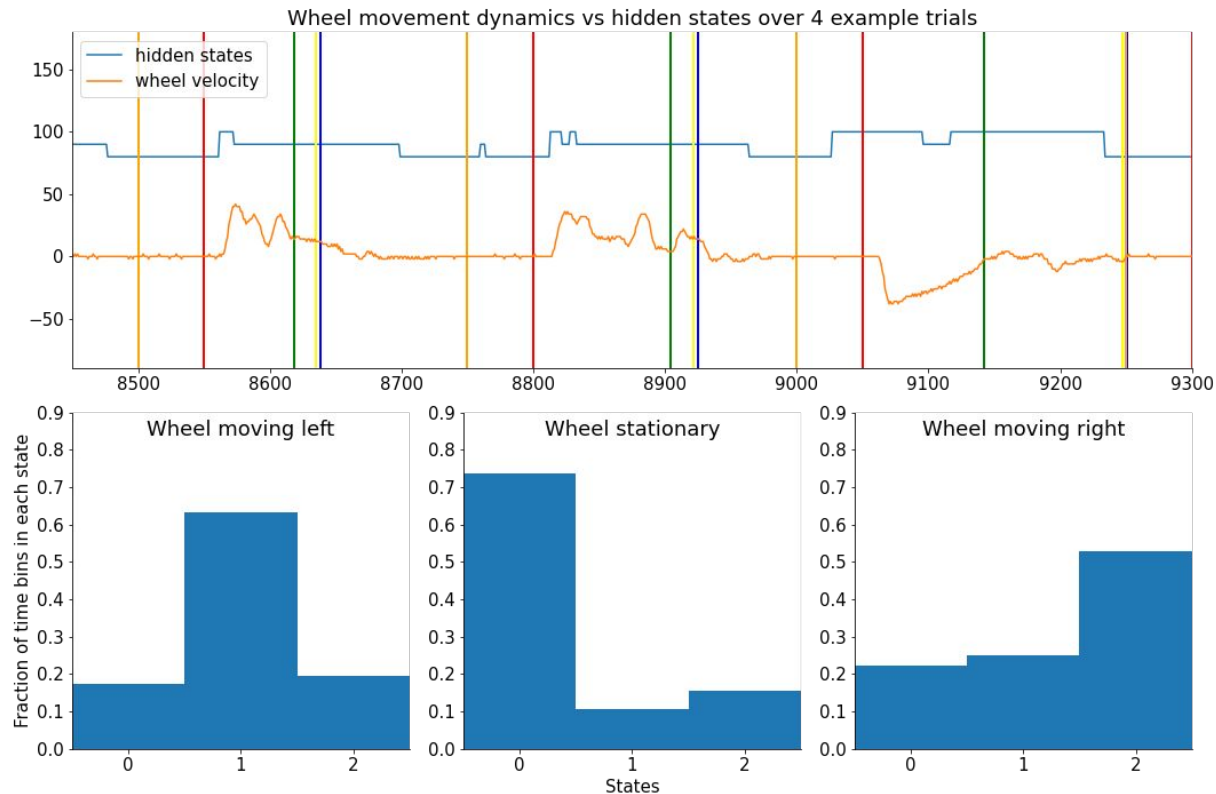


## Motor cortex



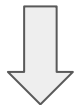
# States in motor cortex reflect the direction of wheel motion

- Wheel motion direction is predicted quite well by the HMM fit
- The accuracy of prediction is the lowest for moving in **the ipsilateral direction**



# Statistical features of different hidden states

Different direction of movement



Different brain activity

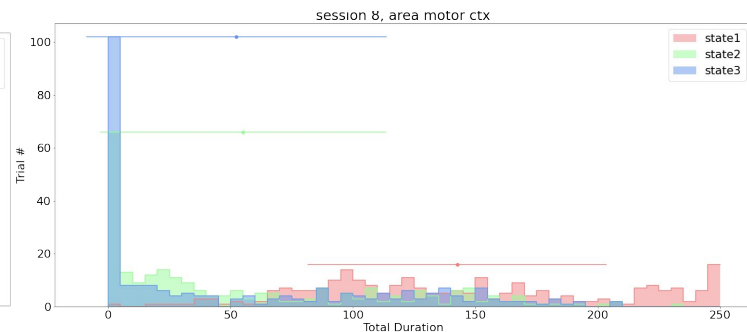
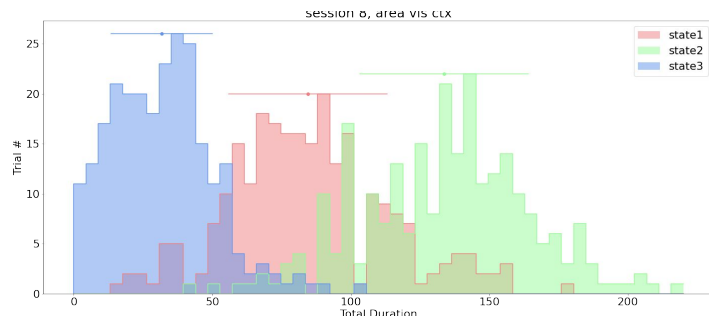


High standard deviation

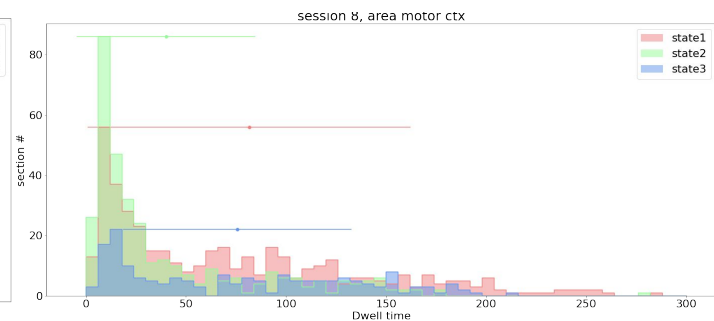
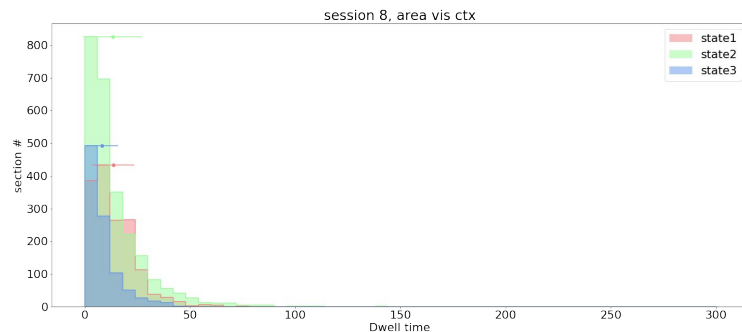
Visual cortex

Motor cortex

State duration time



Dwell time

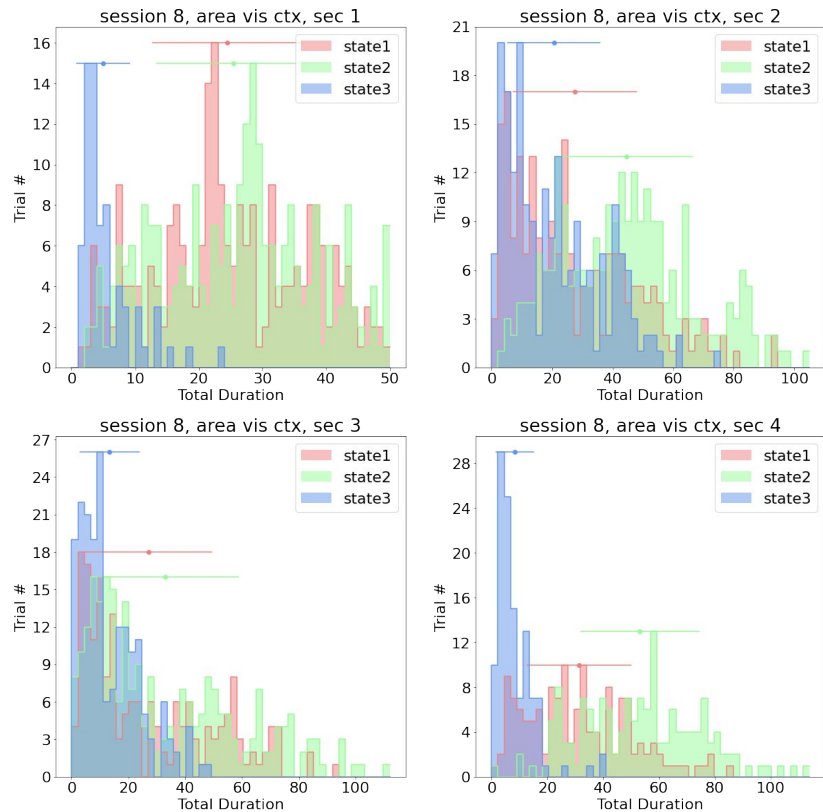


Non-Poisson

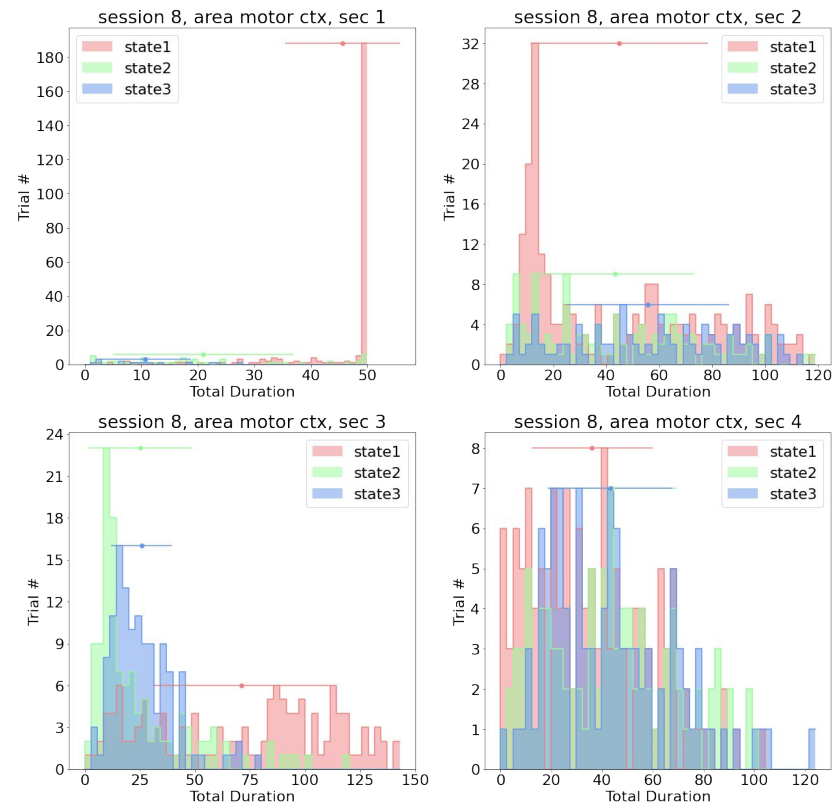


# Duration of states within different sections

## Visual cortex



## Motor cortex



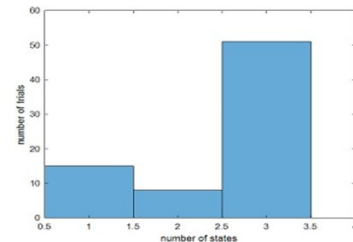
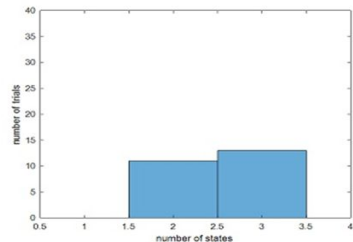
# Comparing different stimulus/movement types in visual and motor cortex

## Comparing different trial types and probable states in visual and motor cortex

Number of trials vs probable states in visual cortex

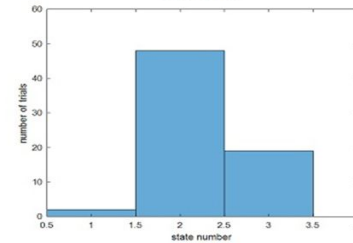
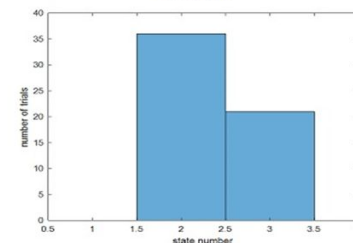
Number of trials vs probable states in motor cortex

No stimulus



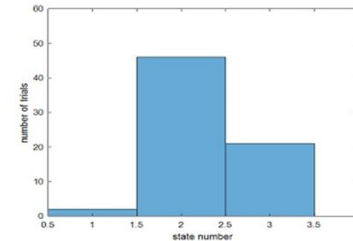
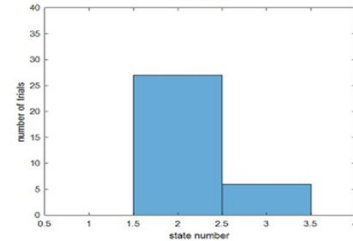
No movement

Right stimulus



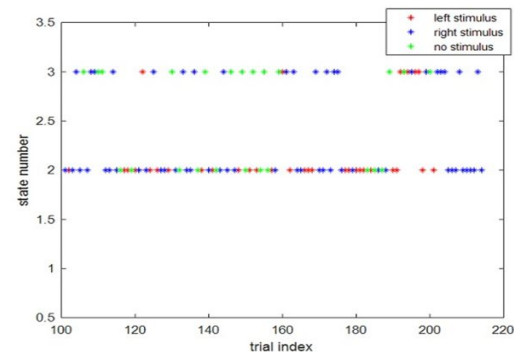
Moving to right

Left stimulus

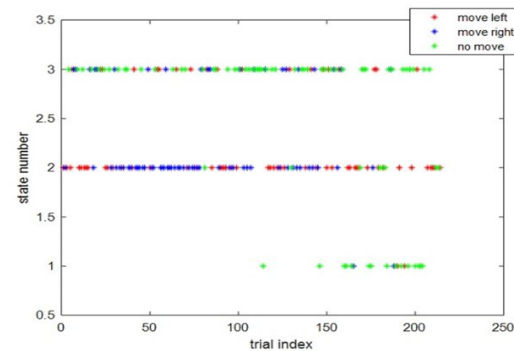


Moving to left

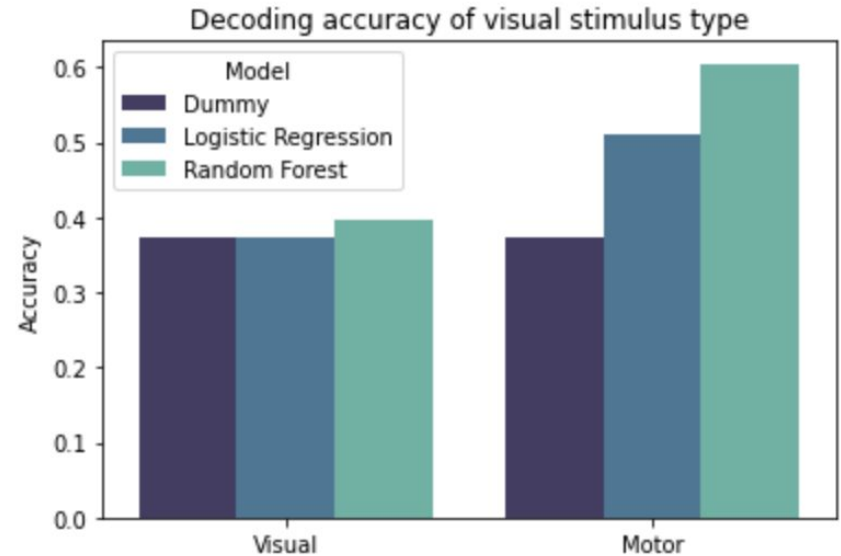
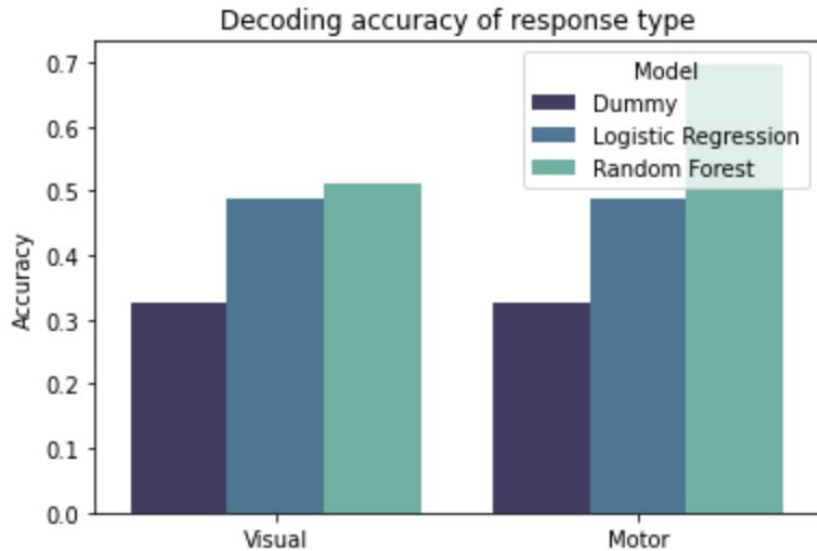
## Comparing probable states vs trials in visual cortex while having a stimulus on left/right or no stimulus



## Comparing probable states vs trials in motor cortex while moving to left/right or not moving



# Decoding trial information from HMM posterior in visual cortex & motor cortex



# Discussion

- Hidden states under visual cortex correlate to the visual stimuli type, and have more frequent transitions
- Hidden states under motor cortex correlate to movement direction, and the transitions are more stable
- Information encoded is different in different areas during this visual discrimination task.
  - visual cortex encodes more visual stimuli related information
  - motor cortex encodes more movement related information
- Results will change across different sessions
  - eg. hidden states under visual cortex have more stable transition pattern.
- Unfinished: **how** does information transform from the visual cortex to the motor cortex, we just figure out the difference of neural dynamics in visual cortex and the motor cortex.

Thank you!