

Cluster approach for EEG analysis: predicting upcoming sensorimotor event.

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Prediction investigation

The ability to predict an upcoming action is an **intrinsic property** of the motor system.



Brachial Plexus Injury (BPI) leads to **severe impairment of upper limb function**.

Is it possible that sensory and motor deficits associated with BPI affects prediction?

Would the sensorimotor cortex be able to distinguish between prediction contexts?

Does BPI affect prediction ability?



Action observation paradigm

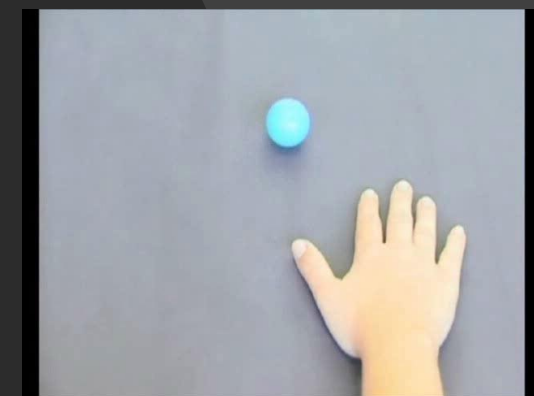


Experimental setup

Hand Mov



Ball Mov

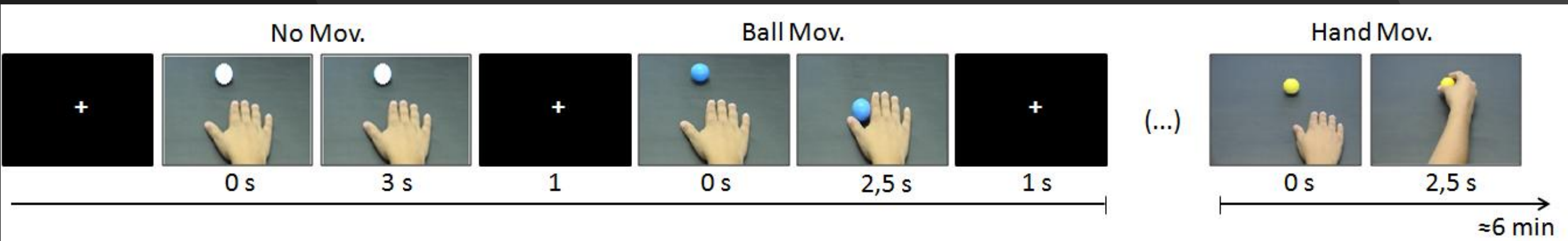
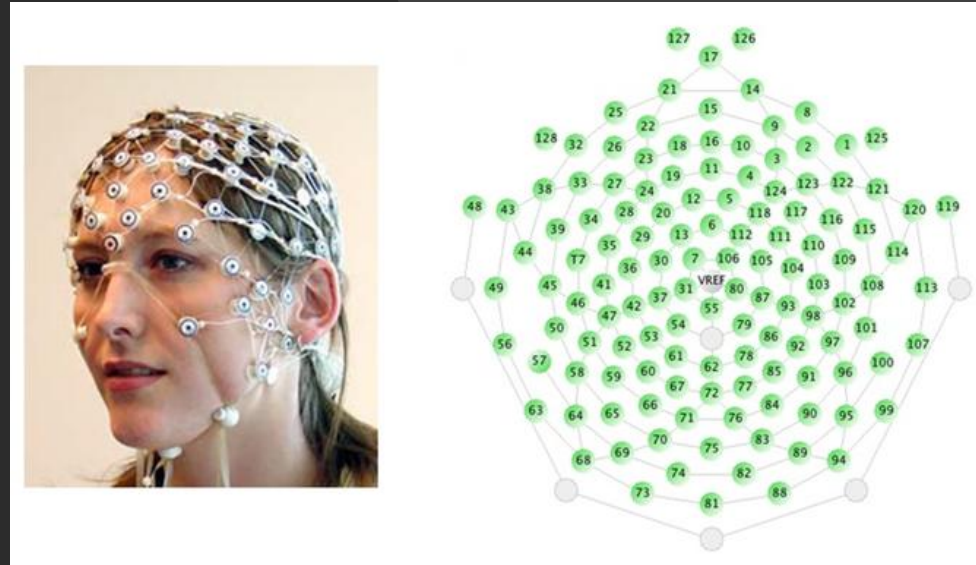


No Mov



Protocol

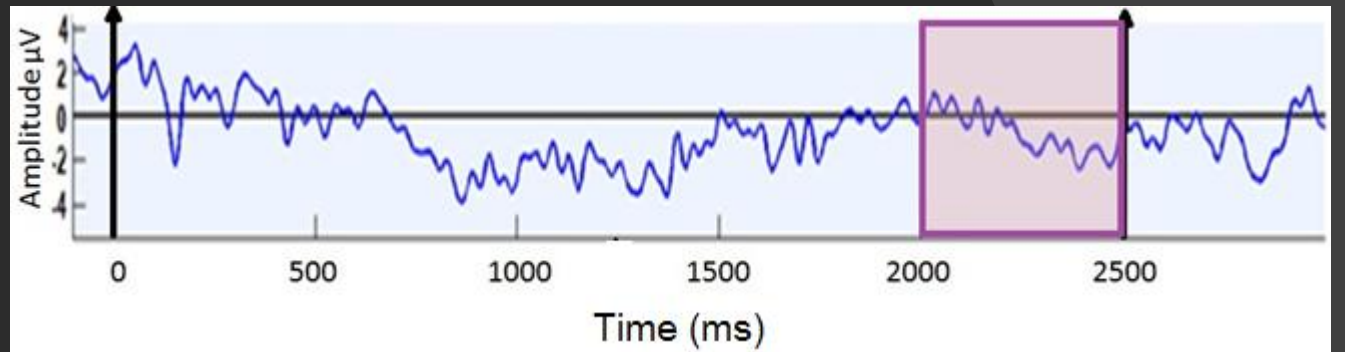
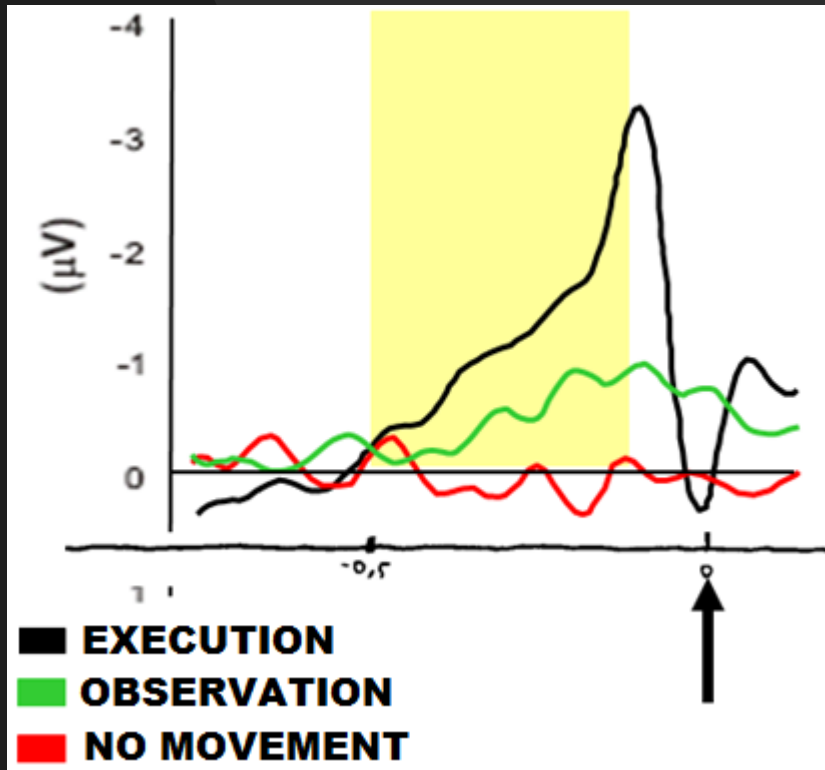
- Duration: ~ 2h
- 6 blocks (3 right hand and 3 left hand)
- 60 trials per block
- Conditions presented at random



Protocol

Readiness Potential – Prediction marker

(Kilner et al, 2004)



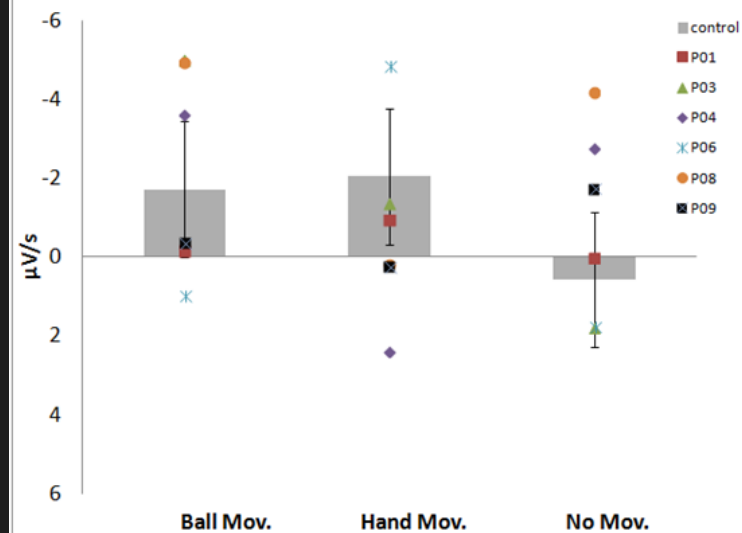
Time window - Negative slope
500 ms before movement beginning

P01

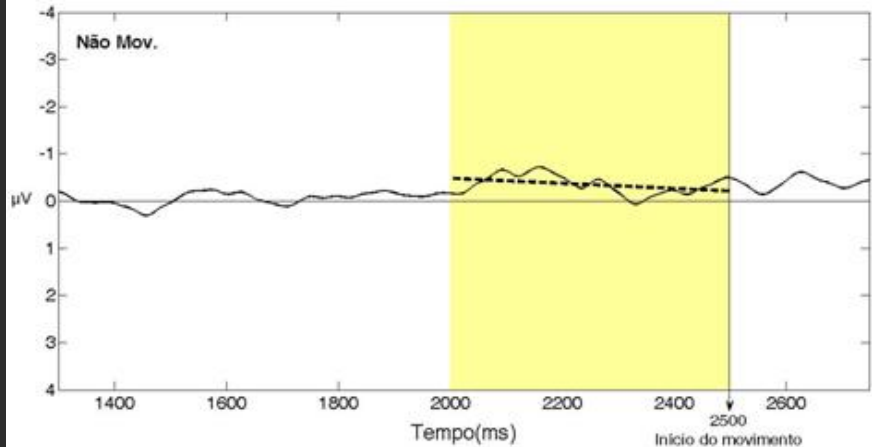
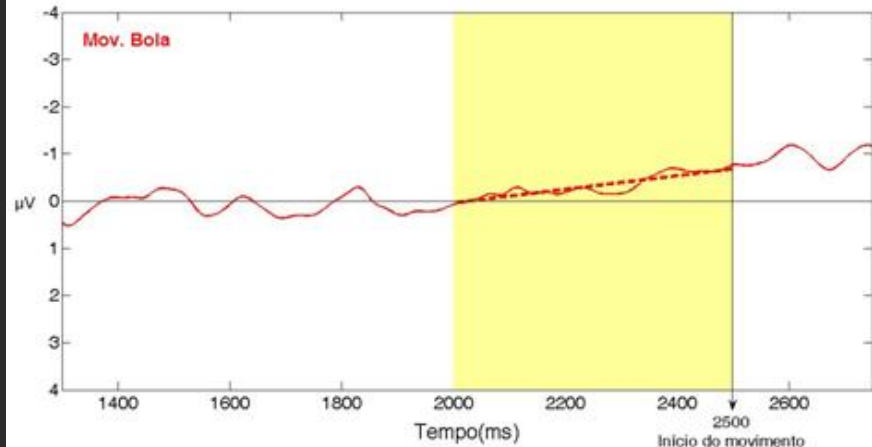
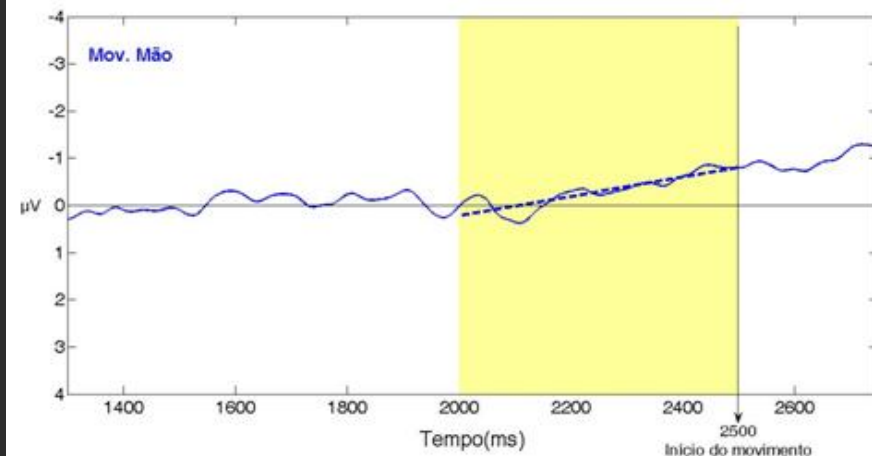
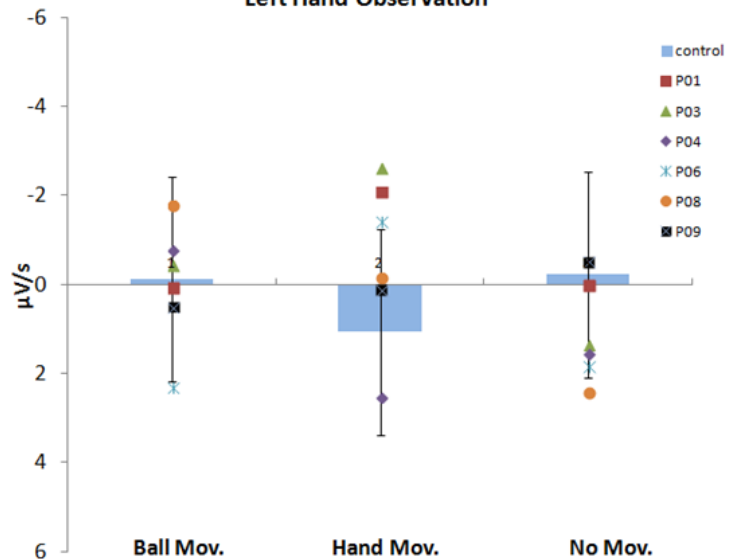


Classical Readiness Potential

Readiness Potential
Right Hand Observation



Readiness Potential
Left Hand Observation

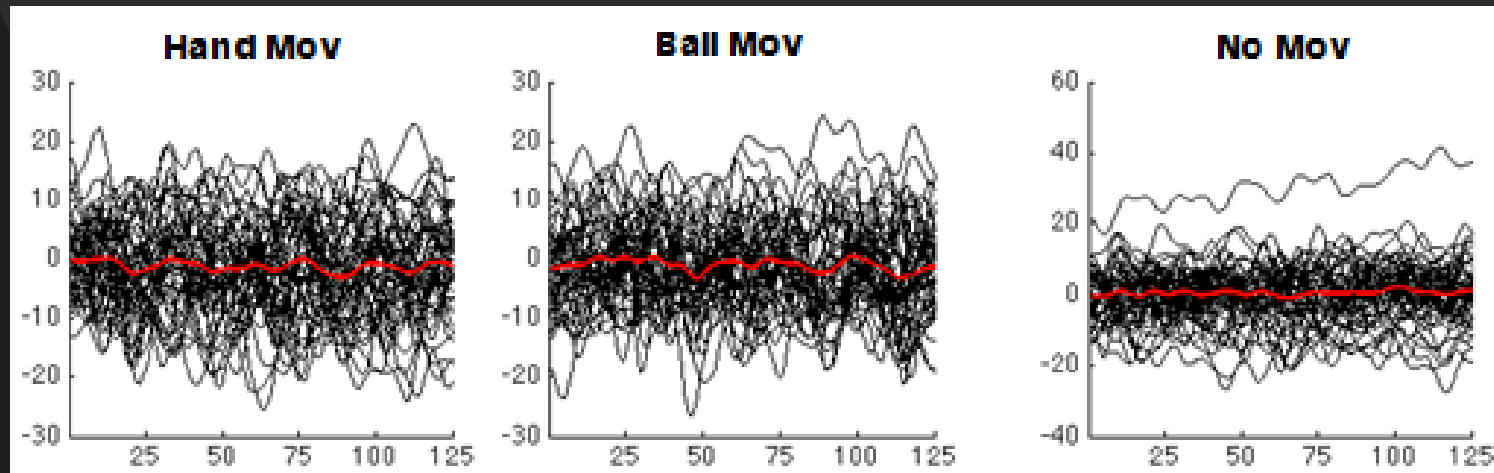
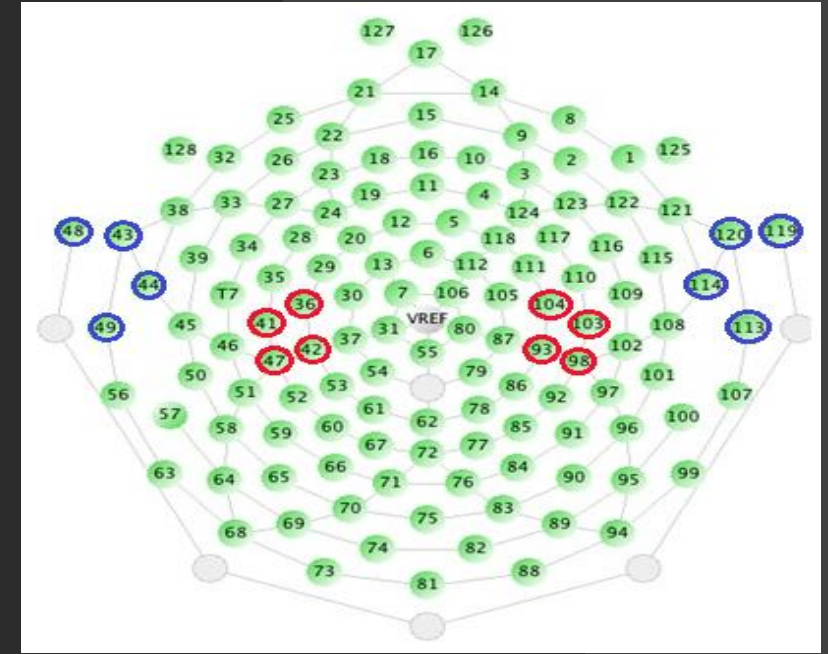


3 steps

- 1) K-means cluster analysis
- 2) Fisher exact-test
- 3) Multi-subject analysis

Data preparation

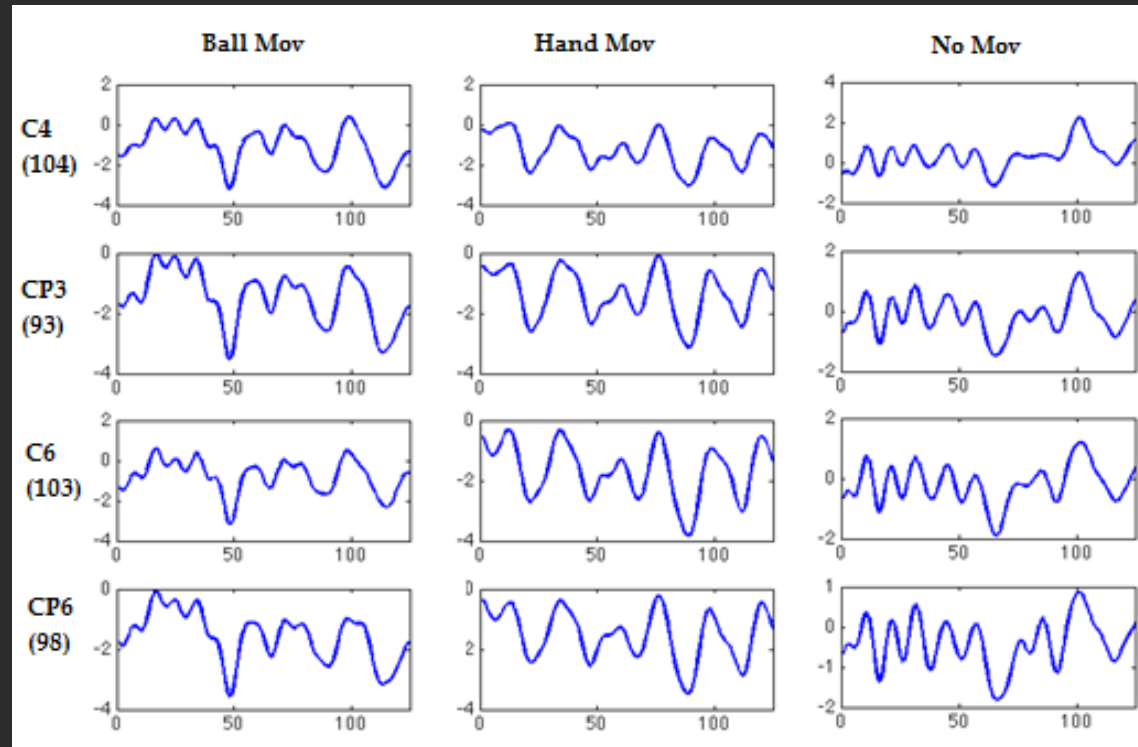
For each subject we consider two sets of electrodes: 8 electrodes in the sensorimotor cortex (in red), and 8 control electrodes over temporal cortex (in blue).



For each subject and each electrode (ex. CP3) we compute the average signal across epochs for each experimental condition

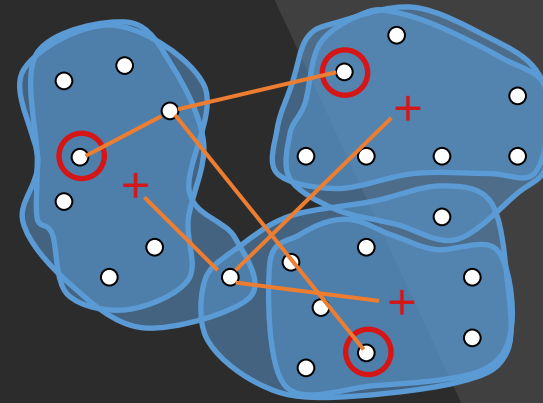
Data preparation

Second, we consider the 12 averaged signals, obtained from the three experimental conditions for all 4 electrodes of the sensorimotor cortex



For each subject, the 12 averaged signals for the electrodes in the sensorimotor cortex and the control electrodes were submitted to an hierarchical analysis, the first step was a k-means cluster analysis.

1) K-means cluster analyses



1ª Iteração

For each subject and set of electrodes, the goal was to group the 12 curves (3 conditions x 4 electrodes) into 3 possible clusters: A, B or C.

If the signal in the sensorimotor cortex is different between conditions, **the signals from the same condition should belong to the same cluster**, with a high separation between the clusters.

Our hypothesis is that we are able to observe this separation between conditions in the sensorimotor cortex but not in the set of temporal electrodes

K-means cluster analyses

Illustration of how the k-means cluster assigns a label to each one of the 12 averaged signals

Signal	1	2	3	4	5	6	7	8	9	10	11	12
Cluster	A	A	A	A	B	B	B	B	C	C	C	C

After the k-means step, we have a contingency table for each subject and for both sets of electrodes.

	Cluster A	Cluster B	Cluster C
Hand Mov	4	0	0
Ball Mov	0	4	0

Intuitively, we can say that if the signals in 2 different conditions belong to the same cluster, we have an indication that the brain is not recognizing the conditions as distinct from each other.

2) Fisher exact-test

H0: The cluster label is independent of the experimental condition

H1: The cluster label is not independent of the experimental condition

Is there a strong dependence between condition and cluster label?

3) Multi-subject analysis

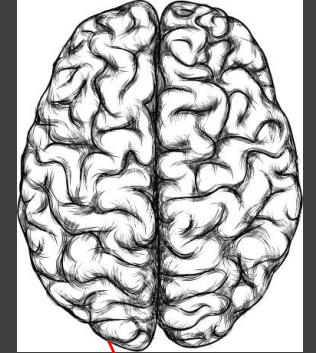
- ✓ The Fisher's exact test is performed for each subject independently. Therefore, 12 tests are performed.
- ✓ The Benjamini–Hochberg procedure was performed for correcting the p-value and controlling the false positive rate in multiple comparisons.

Results

Control Group (N=9)

Right Hand Observation

Condition comparison	Sensorimotor cortex electrodes		Temporal cortex electrodes (control)	
	Right Hemisphere	Left Hemisphere	Right Hemisphere	Left Hemisphere
Ball Mov x No Mov	9	7	0	0
Hand Mov x No Mov	8	8	0	0
Hand Mov x Ball Mov	7	8	0	0

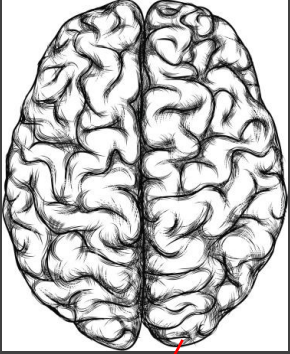


The table indicates the number of subjects that rejected H_0

Results

Control Group (N=9)

Left Hand Observation



Condition comparison	Sensorimotor cortex electrodes		Temporal cortex electrodes (control)	
	Right Hemisphere	Left Hemisphere	Right Hemisphere	Left Hemisphere
Ball Mov x No Mov	9	9	0	0
Hand Mov x No Mov	8	8	0	0
Hand Mov x Ball Mov	9	6	0	0

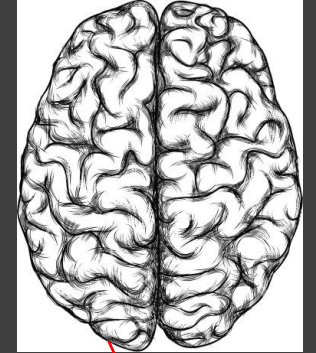


The table indicates the number of subjects that rejected H_0

Results

Brachial plexus Injury(N=6) –

Right Hand Observation



Condition comparison	Sensorimotor cortex electrodes		Temporal cortex electrodes (control)	
	Right Hemisphere	Left Hemisphere	Right Hemisphere	Left Hemisphere
Ball Mov x No Mov	4	0	0	0
Hand Mov x No Mov	0	4	0	0
Hand Mov x Ball Mov	0	5	0	0

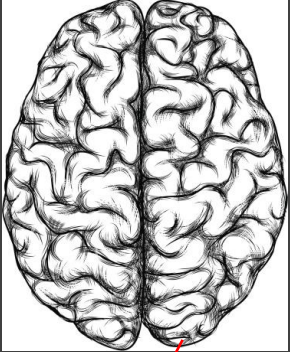


The table indicates the number of subjects that rejected H_0

Results

Brachial plexus Injury(N=6)

Left Hand Observation



Condition comparison	Sensorimotor cortex electrodes		Temporal cortex electrodes (control)	
	Right Hemisphere	Left Hemisphere	Right Hemisphere	Left Hemisphere
Ball Mov x No Mov	4	5	0	0
Hand Mov x No Mov	0	0	0	0
Hand Mov x Ball Mov	0	0	0	0

The table indicates the number of subjects that rejected H_0