

## CASE STUDY OVERVIEW

### INTRODUCTION

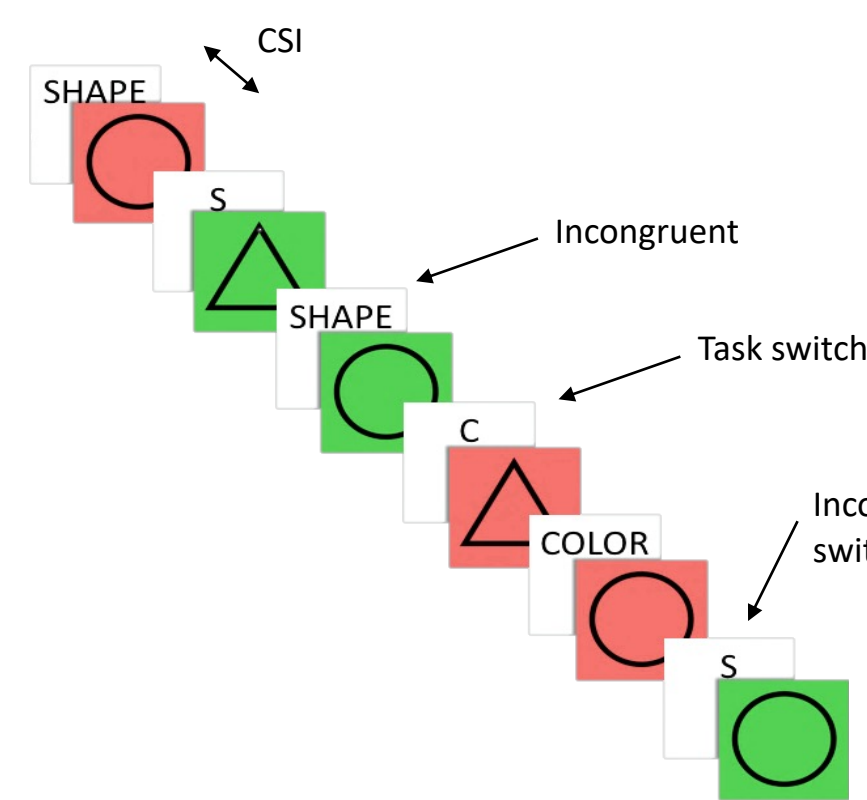
One of the regions hindered by schizophrenia is the **dorsolateral prefrontal cortex (DLPFC)** which has been associated to the ability of task switching (TS). Nevertheless, literature suggests that people affected by schizophrenia (SCHZ) **do not perform worse** than a neurotypical control population (CTRL). Apparently SCHZ are simply slower in TS but reach the same tasks' performances of CTRL. The literature assumes that this latter fact is possibly due to some unknown **compensation mechanism** in the SCHZ's brain.

### DESCRIPTION OF THE DATASET

175 participants (125 CTRL and 50 SCHZ).

For each participant:

- Health-related data → age and BMI
- Functional connectivity map, a table of >36000 values, each corresponding to a node of the brain mesh on which the fMRI data was projected
- Event recordings, a time step dataset composed of all the readings from the test, such as: reaction time, cue, answer.



Instructions  
Red or Circle = Right button  
Green or Triangle = Left button  
Fig. 1 Sample of task switching experiment

### TASK-SWITCHING

While under fMRI each participant was presented with a **series of geometric shapes** and asked to identify either the color or the shape of the image based on the task cue presented prior to the image. On 25% of trials the instructions **switched**, i.e., participants were instructed to switch from identifying shape to identifying color, or vice versa. Sometimes there was **congruency**, i.e., when the wrong rule incidentally produces the same target answer. The Event Recordings dataset was gathered during this experiment.

### OBJECTIVES

- According to the literature:
- SCHZ are slower than CTRL but have comparable performance in the task-switching test;
  - brain activity between SCHZ and CTRL differ in specific regions' activity.
- Our objective was to verify or reject these hypotheses.

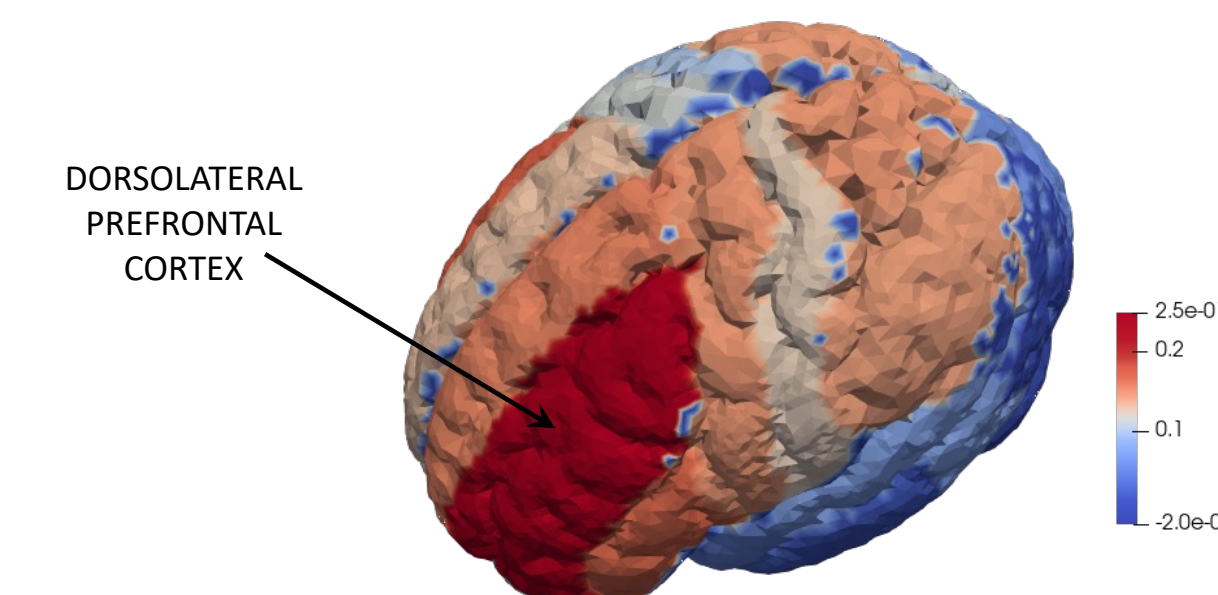


Fig. 2 Region of interest

## EXPLORATORY ANALYSIS

### REACTION TIME

Reaction time is the interval elapsing between a cue and the participant's response.

Normality: Shapiro test

→ p-value = 0.016 (CTRL), p-value = 0.09 (SCHZ)

T-test on the means of the Reaction Times: CTRL vs SCH

→ p-value = 0

Confidence interval for the difference of the means:

[0.173, 0.232, 0.292]

We can confirm that SCHZ are indeed slower than CTRL: this is consistent with the literature.

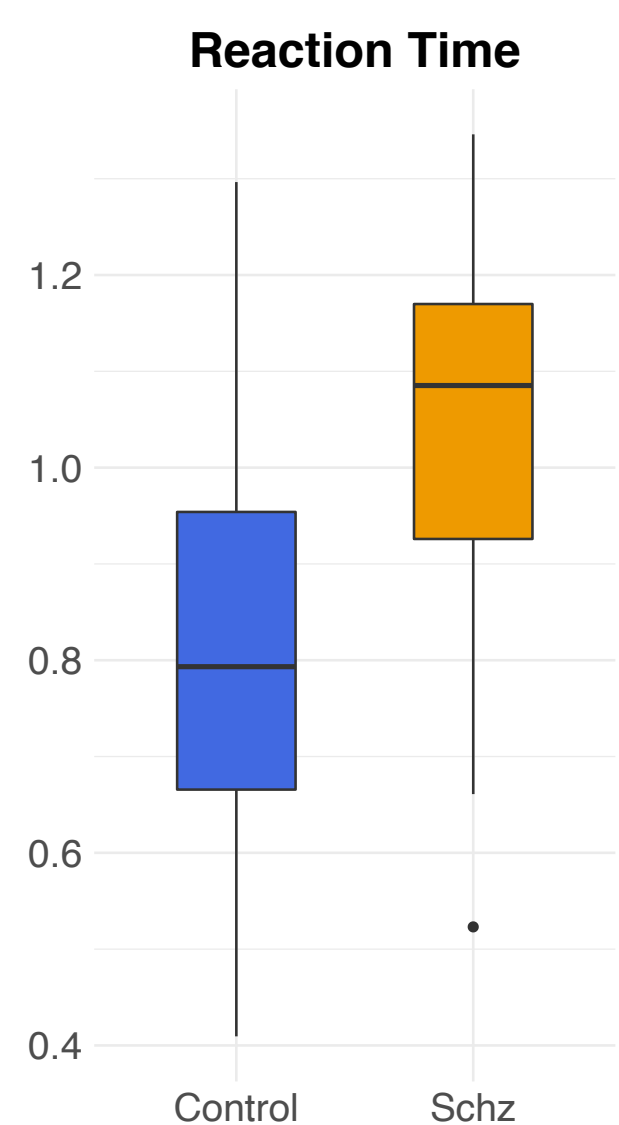


Fig. 3 Box Plot of the Reaction Times for SCHZ and CTRL

### PSYCHOLOGICAL TRAITS: BARRATT IMPULSIVENESS SCORES

Impulsivity is the predisposition toward rapid unplanned reactions.

T-test on the Scores of the Barratt Impulsivity Test (BIS):

SCHZ scores vs CTRL scores

→ p-value ≈ 1

Reaction Time ~ BIS

The BIS did not turn out to be a statistically significant regressor.

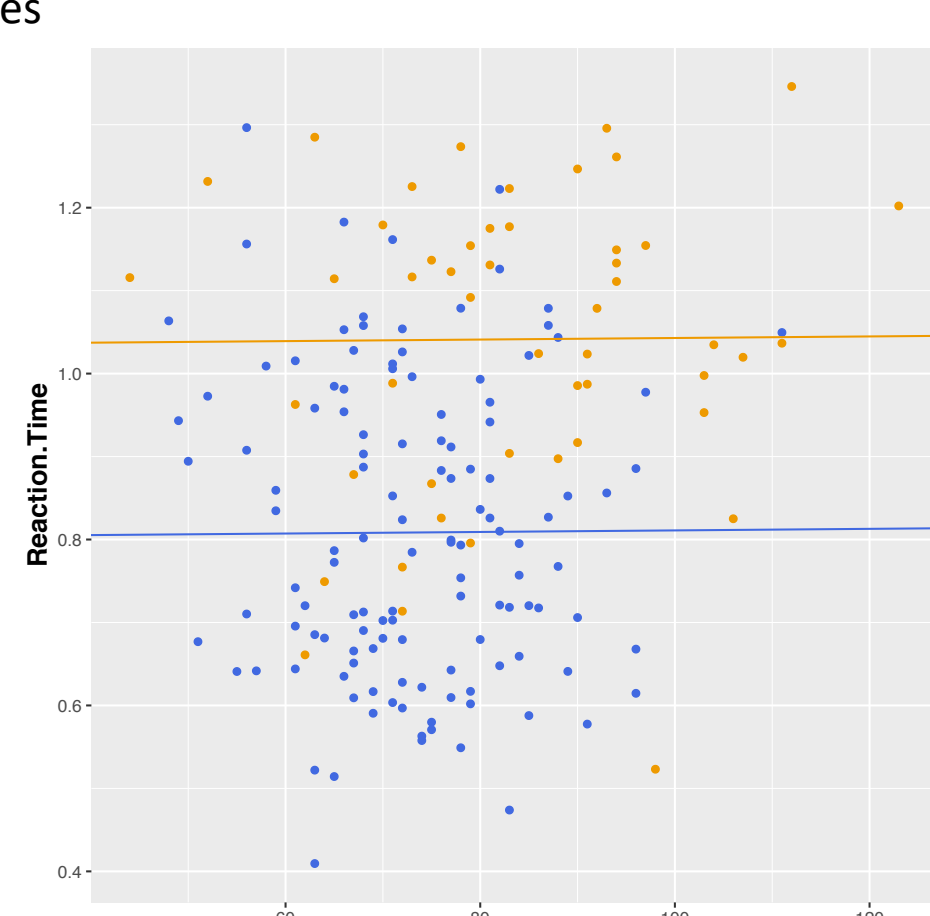


Fig. 5 Linear Regression Reaction time vs BIS

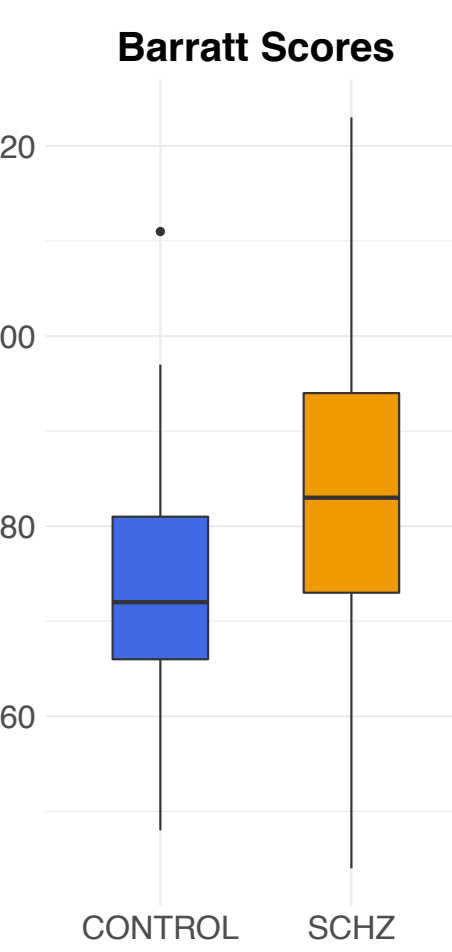


Fig. 4 Box Plot of the BIS for SCHZ and CTRL

### CONFOUNDING FACTORS

Reaction Time ~ Age + BMI + Diagnosis + Age : Diagnosis + BMI : Diagnosis

No interaction appeared significant

Both Age and BMI have an increasing effect on reaction times. However, we will not consider these factors in the ANOVA as we do not have enough observations - also these factors are not controllable.

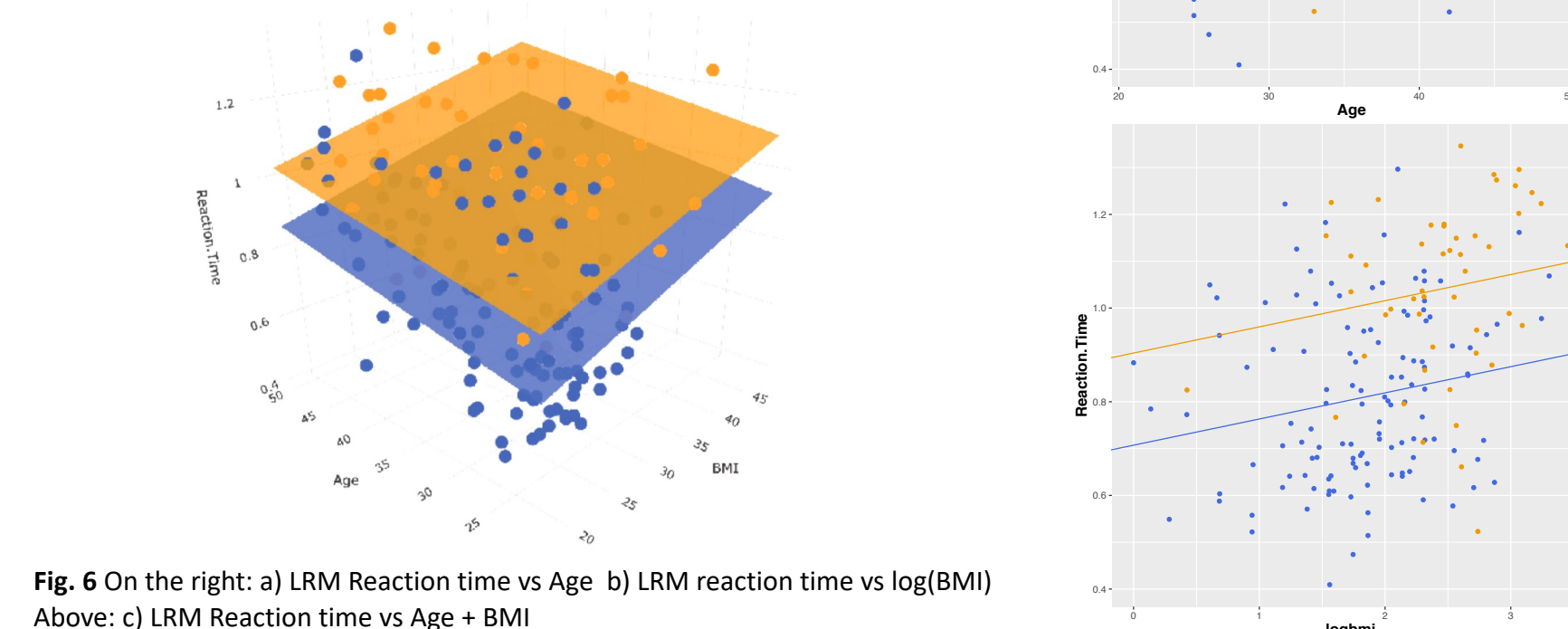


Fig. 6 On the right: a) LRM Reaction time vs Age b) LRM reaction time vs log(BMI) Above: c) LRM Reaction time vs Age + BMI

## RESULTS

### PERFORMANCE ANALYSIS

Performance is measured via:

- Switch cost:  $\mu_{\text{Switch}} - \mu_{\text{NoSwitch}}$  = mean time during Switch trials - mean time during NoSwitch trials
- Correct cost:  $\mu_{\text{Correct}} - \mu_{\text{NonCorrect}}$  = mean time during Correct trials - mean time during NonCorrect trials
- General accuracy rate:  $\# \text{correct\_trials} / \# \text{total\_trials}$
- Switch accuracy rate:  $1 - \# \text{errors\_on\_switch} / \# \text{total\_errors}$

Analysis:

- Switch Costs and Correct Costs;
- ANOVA;
- analysis of error/accuracy rates.

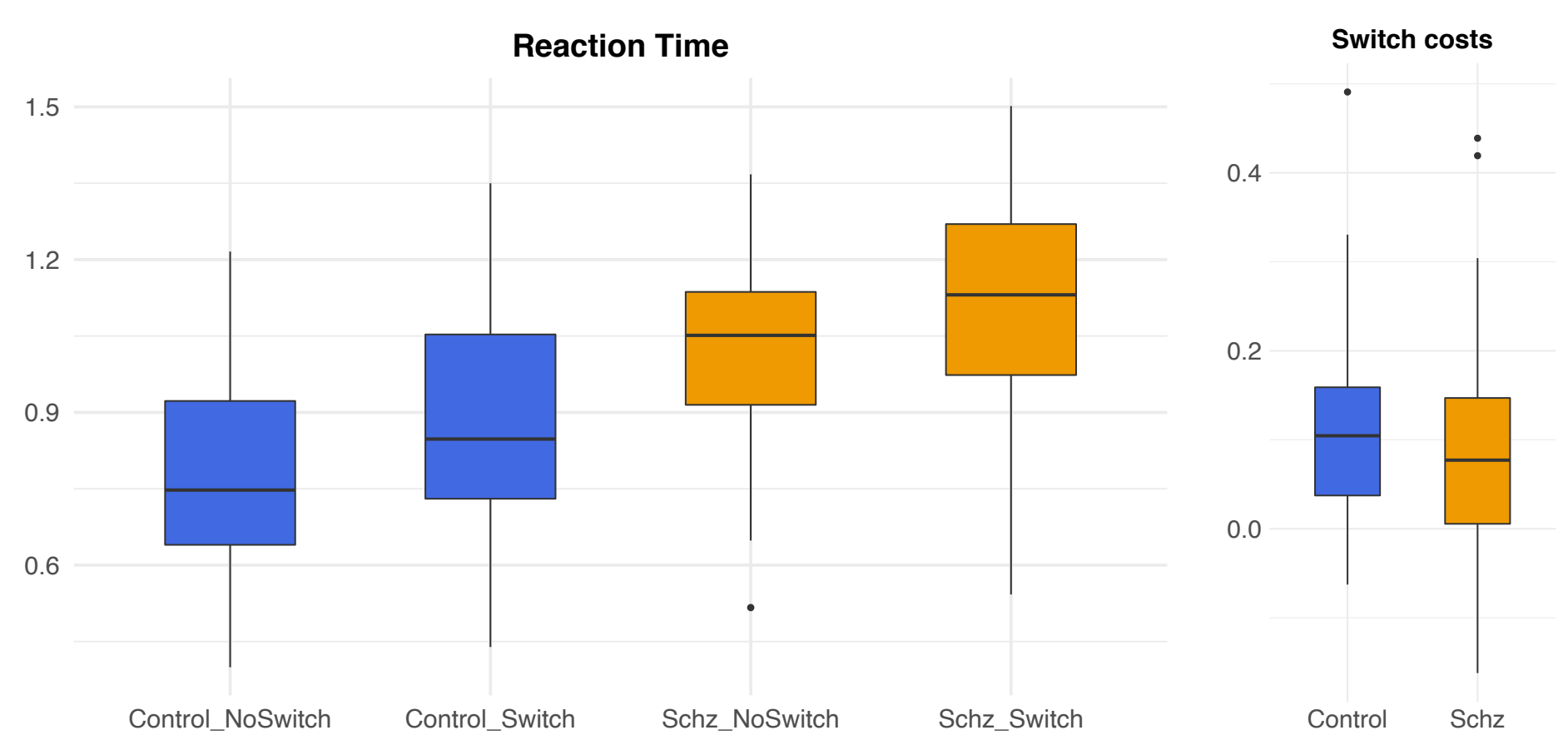


Fig. 7 a) Box Plot of Reaction Time in Switch and Non-Switch events b) Box Plot of Switch Cost

T-test on the mean of the Switch Cost (p-value = 0.4643)

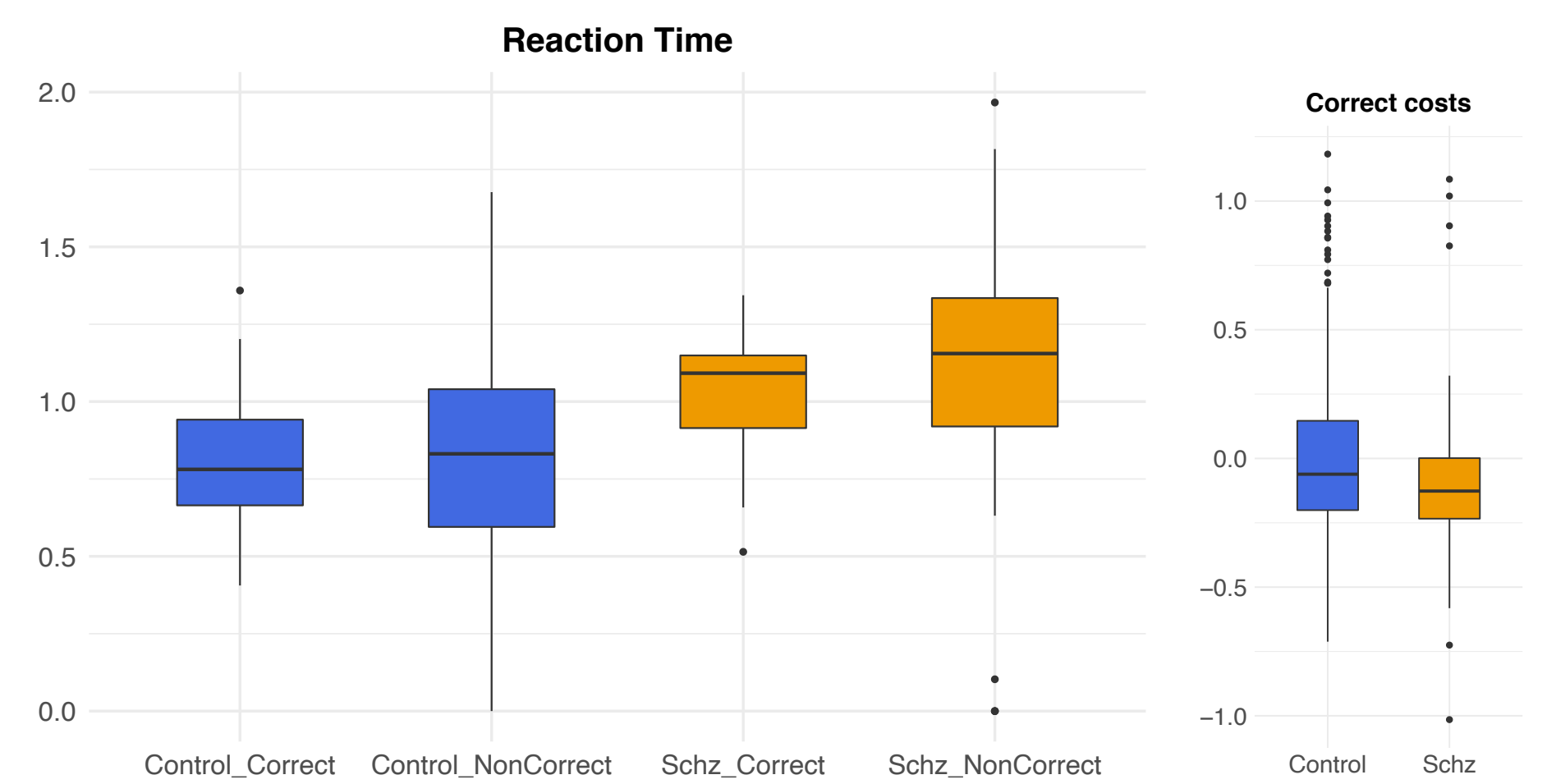


Fig. 8 a) Box Plot of Reaction Times when participants answered correctly and not b) Box Plot of Correct Cost

T-test on the mean of the Correct cost (p-value = 0.5299)

### ANOVA

Reaction Time ~ diagnosis + congruent + switch + diagnosis \* congruent + diagnosis \* switch + congruent \* switch

It showed:

- high significance of diagnosis and switch;
- no statistically significant interaction.

Stepwise reduction:

Reaction Time ~ diagnosis + switch

We can state that the difference between Switch Costs for SCHZ and CTRL are not statistically significant, i.e., switching seems not to hinder SCHZ's reaction time more than CTRL.

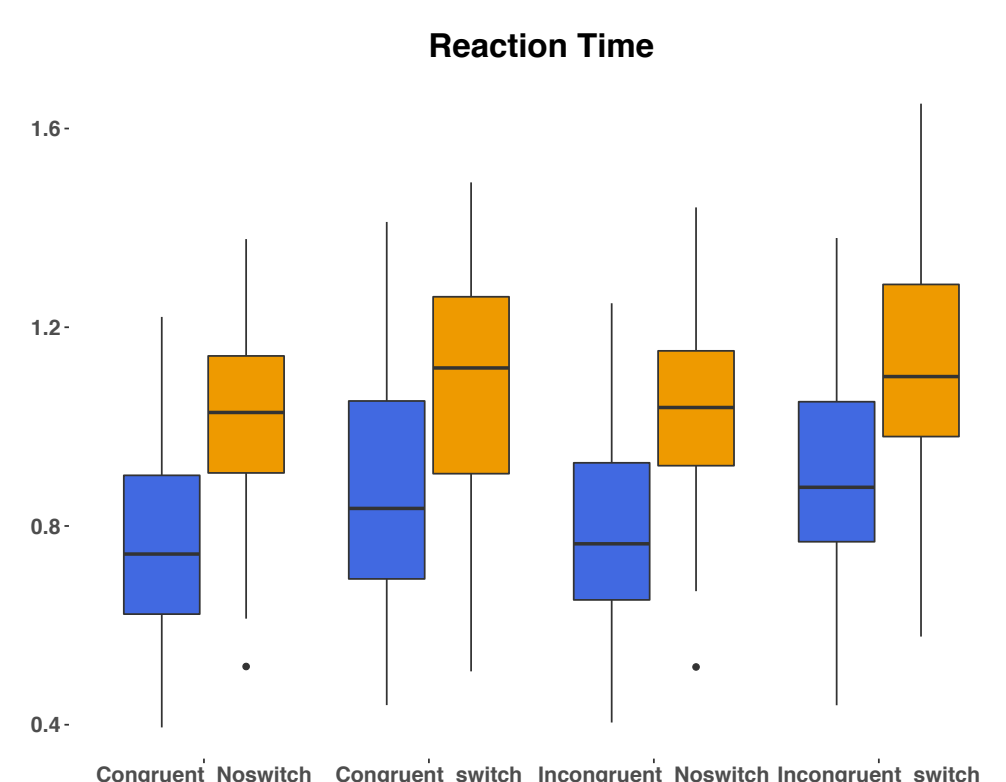


Fig. 9 Box Plot of ANOVA trials conditions

### LINEAR MIXED MODEL

The previous ANOVA does not consider that times are not independent.

→ Subjects' grouping as a Random Intercept in a LMM

Reaction Time ~ diagnosis + switch + (1|Subject)

→ PVRE = 0.8483049

This value is extremely high, suggesting that most of the real variability must be assigned to the intrinsic differences between participants rather than the difference between two groups.

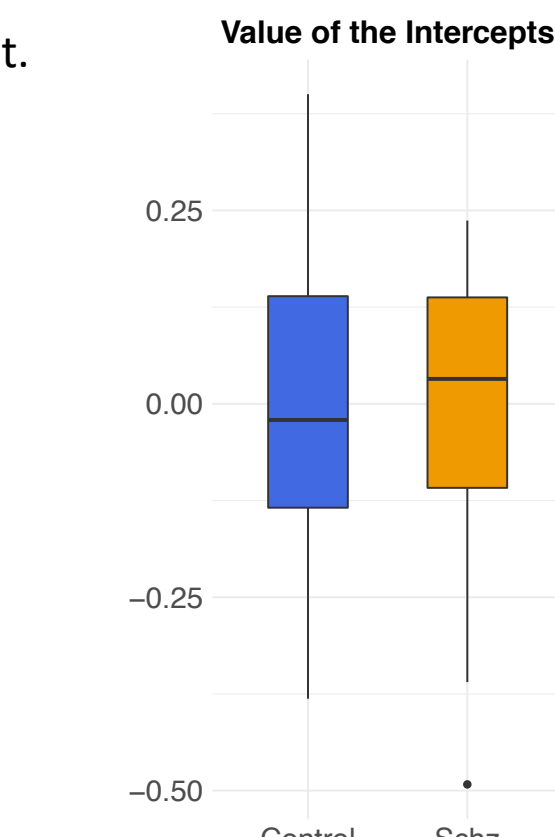
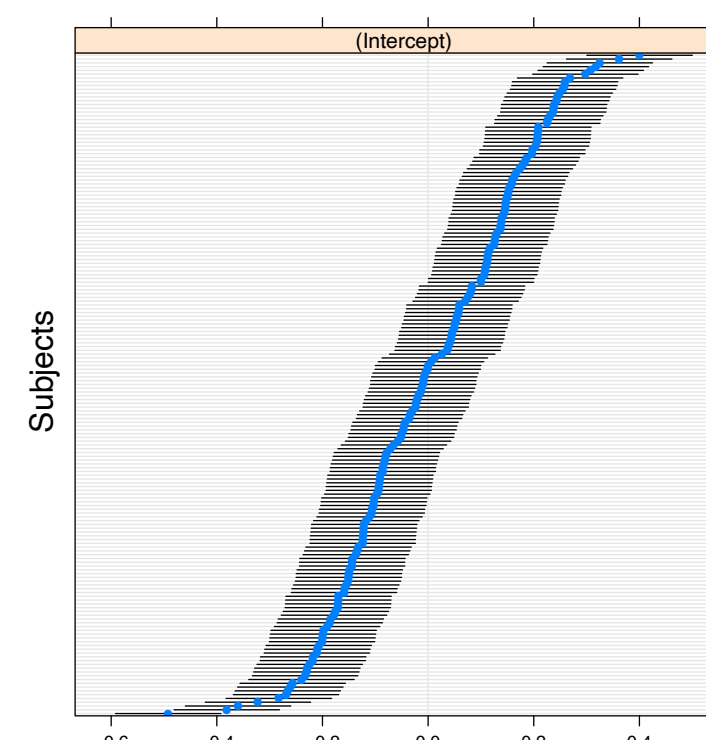


Fig. 10 From the top: a) Box Plot of the Random intercept values for SCHZ and CTRL b) Dotplot of the Random intercept values for SCHZ and CTRL

### CONSIDERATIONS ABOUT ACCURACY

- CTRL have higher accuracy
- SCHZ accuracy rate is lower than the CTRL one
- SCHZ accuracy on switch is higher than the CTRL one

The previous results falsify what has been proposed in the literature.

It appears that **no compensating mechanism** is necessary as the accuracy rate of SCHZ is lower than CTRL but seems independent of task switching.

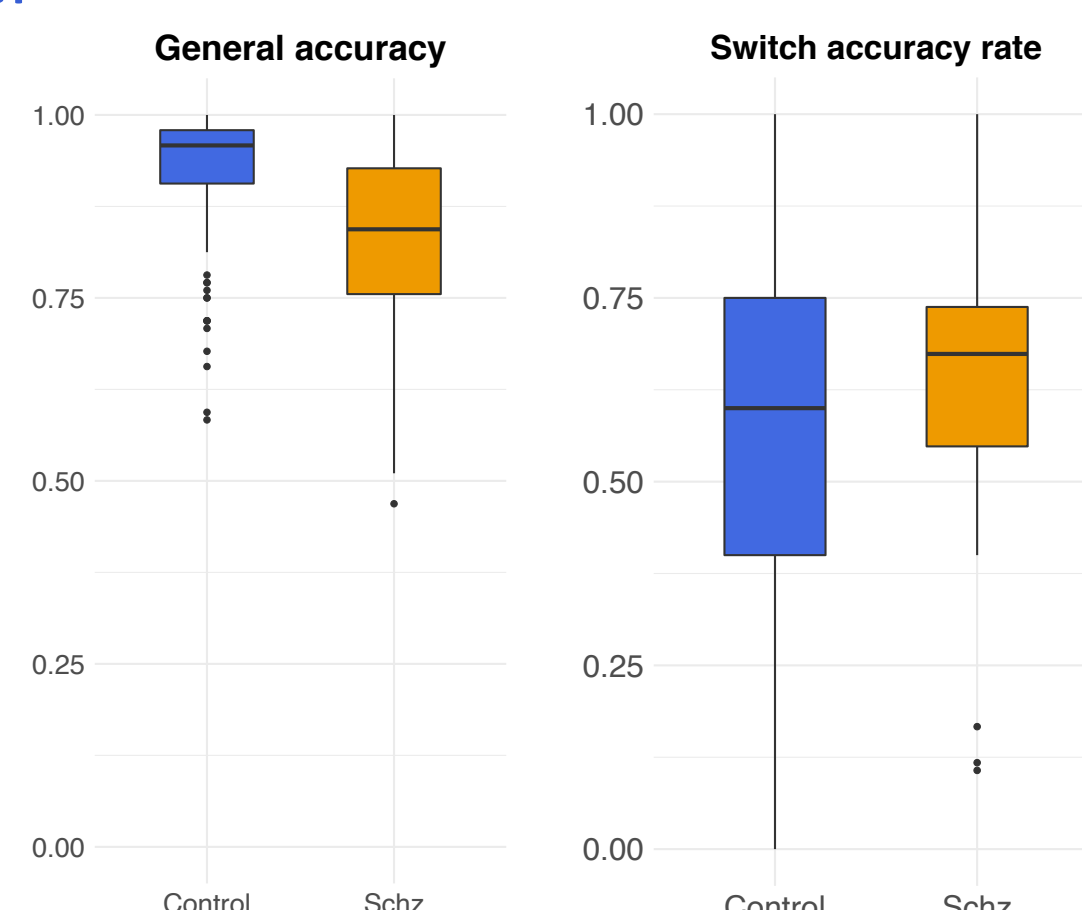


Fig. 11 From the left: a) Box plot of General accuracy rates for CTRL and SCHZ b) Box plot of Switch accuracy rates for CTRL and SCHZ

### PRINCIPAL COMPONENT ANALYSIS

p>n: Aggregated the nodes into the 83 Hammers canonical regions

1st PC - Weighted average of overall brain activation levels.

Emphasis on regions specifically involved in learning, action, and prediction.

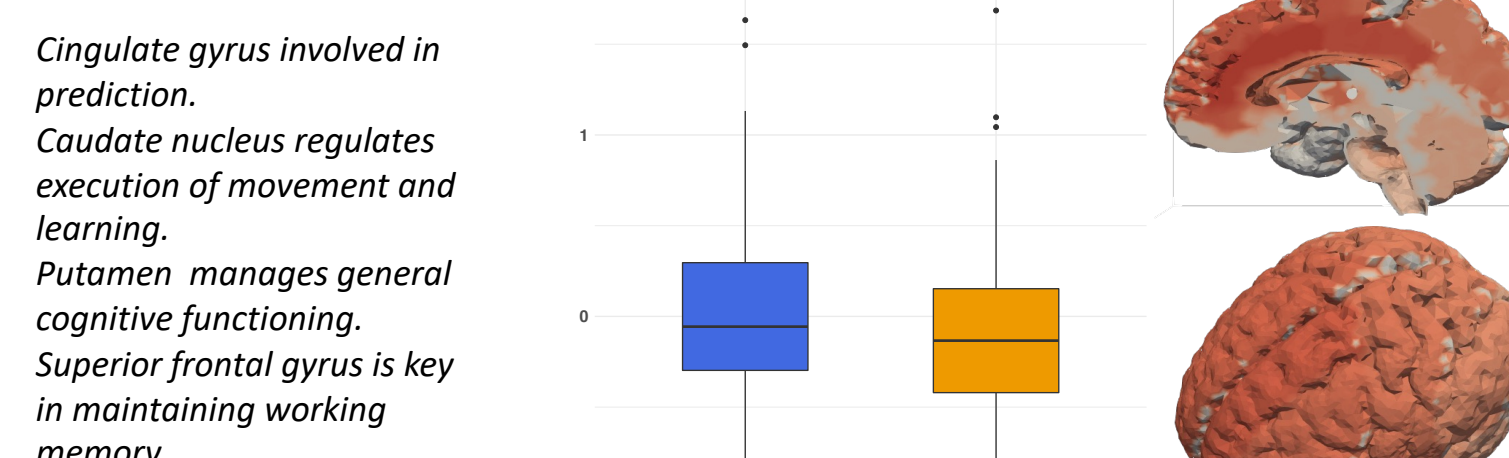


Fig. 12 a) Box plot of the scores on the first PC b) Projection of the first PC on the brain mesh

2nd PC - Prediction mechanism.

The brain makes a prediction about external reality from biological signals (sensory and emotional), rewarding itself if the prediction is accurate. Opposite signs on the loadings highlight the delay between hand-eye coordination and the prediction.

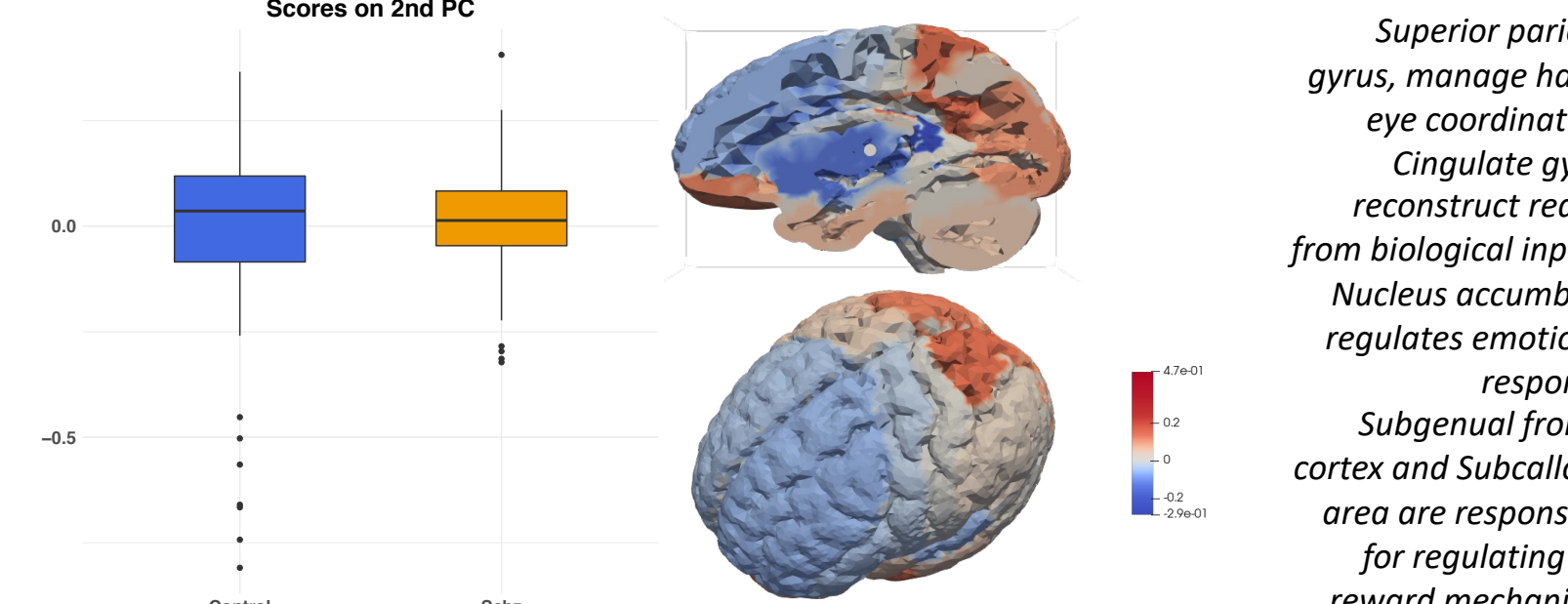


Fig. 13 a) Box plot of the scores on the second PC b) Projection of the second PC on the brain mesh

3rd PC - Regulation of dopamine release.

Lower scores in SCHZ show an unbalanced or ineffective production of dopamine (coherent with literature).

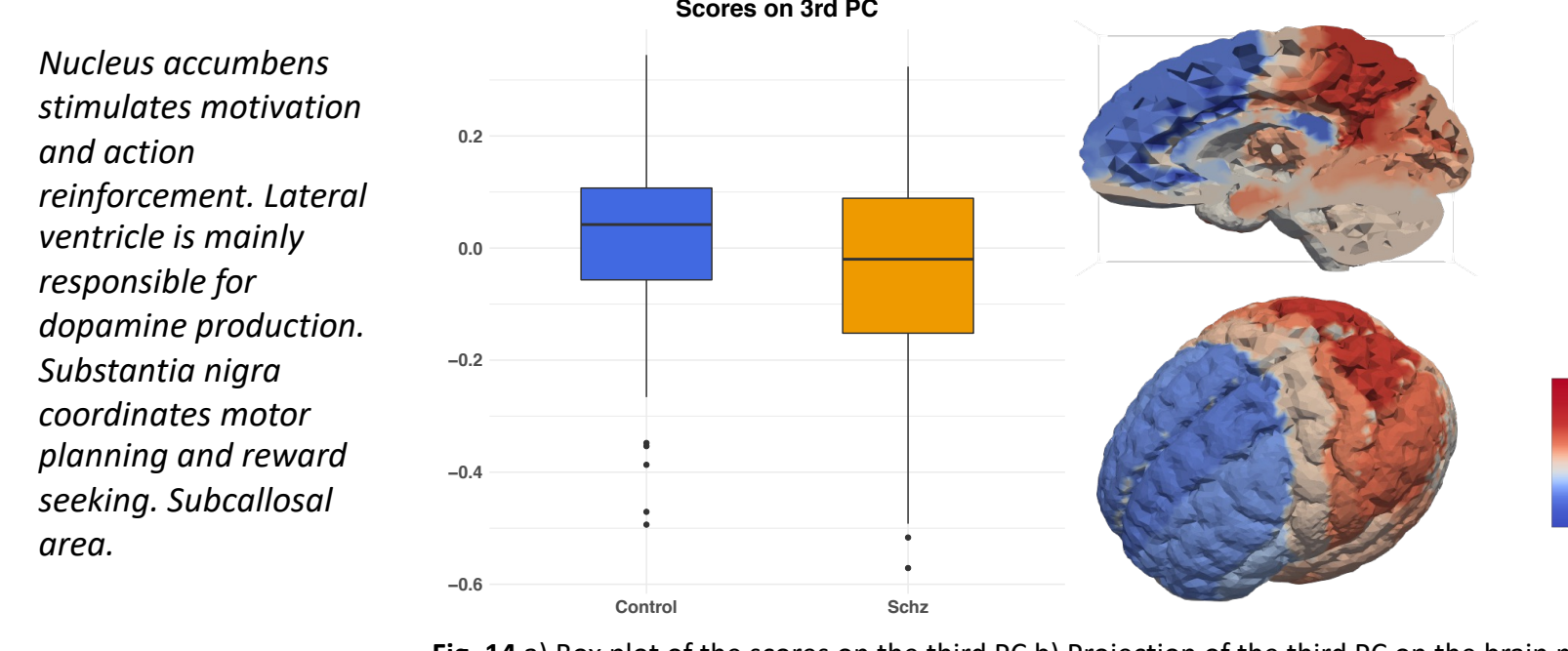


Fig. 14 a) Box plot of the scores on the third PC b) Projection of the third PC on the brain mesh

### Classification attempt

Through a MANOVA we ascertained that projecting all participants on the first three PCs would not be sufficient to build a classifier. Additionally, we observed that neurotypical people tend to be less homogeneous in brain activity, unlike what we saw in the analyses of performances.

## CONCLUSIONS

- SCHZ exhibit a higher reaction time and a lower accuracy rate than CTRL, but both results seem to be independent of task switching. We falsify the hypotheses under concern: SCHZ **do not employ a compensatory mechanism** in task-switching, rather displaying an **insensitivity to task switching**. Their overall worse results are modulated by a **comparable speed-accuracy trade-off** with respect to CTRL. There is a general difficulty of SCHZ to maintain and implement a **task-set** (perceptual, cognitive and response biases to optimize task performance).
  - Participants affected by schizophrenia retain less information and cognitive configuration across tasks (each trial being independent of the previous one).
- Our PCA **shows no difference in brain activation** between SCHZ and CTRL.
  - Differing cognitive functioning between the two groups (general slowing) is to be looked for in the complex **interaction between brain networks** rather than in the anomalous activation of just one or few selected regions.
- Our LMM analysis indicates a **high variability across participants**.
  - Differing performances cannot be attributed to diagnosis alone.

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