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## Arousal levels explain inter-subject variability of neuromodulation effects

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**Institutions:** University of Trento

**Published on:** 10 May 2020 - bioRxiv (Cold Spring Harbor Laboratory)

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1                    **Arousal levels explain inter-subject variability of neuromodulation effects**

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19 **Abstract**

20 Over the past two decades, the postulated modulatory effects of transcranial direct current stimulation  
21 (tDCS) on the human brain have been extensively investigated, with attractive real-world  
22 applications. However, recent concerns on reliability of tDCS effects have been raised, principally  
23 due to reduced replicability and to the great interindividual variability in response to tDCS. These  
24 inconsistencies are likely due to the interplay between the level of induced cortical excitability and  
25 unaccounted individual state-dependent factors. On these grounds, we aimed to verify whether the  
26 behavioural effects induced by a common prefrontal tDCS montage were dependent on the  
27 participants' arousal levels. Pupillary dynamics were recorded during an auditory oddball task while  
28 applying either a sham or real tDCS. The tDCS effects on reaction times and pupil dilation were  
29 evaluated as a function of subjective and physiological arousal predictors. Both predictors  
30 significantly explained performance during real tDCS, namely reaction times improved only with  
31 moderate arousal levels; likewise, pupil dilation was affected according to the ongoing levels of  
32 arousal. These findings highlight the critical role of arousal in shaping the neuromodulatory outcome,  
33 and thus encourage a more careful interpretation of null or negative results.

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38 **Keywords**

39 tDCS; arousal; pupil; interindividual variability; neuromodulation; state dependency; transcranial  
40 electrical stimulation; tES.

## 41 1. Introduction

42

43 Founded on decades of experimentation, transcranial direct current stimulation (tDCS) is a research  
44 tool capable of interacting with the central nervous system, that has been rediscovered at the  
45 beginning of this century (1). Beside its value for basic research (2), tDCS has raised great interest  
46 for real-world applications, like rehabilitative interventions for neurological and psychiatric diseases  
47 (3) and cognitive enhancement (or detracting) in both young and older adults (4–7). However, the  
48 development of more effective and generalizable stimulation protocols has been hindered by the gap  
49 between our sparse knowledge of the physiological effects and the induced behavioral impact of tDCS  
50 (8). What raises most concern is the lack of replicability among tDCS studies and the interindividual  
51 variability in response to tDCS (9–15). In addition to non-optimal methodological practices, such as  
52 inadequate control conditions and lack of statistical rigor, a complex interplay among biological  
53 differences and the level of neuromodulatory effects might be crucial in explaining the reported  
54 inconsistencies across studies (16–18). In particular, state-based factors, including the specific or  
55 generalized levels of activation prior and during stimulation, the initial levels of performance,  
56 wakefulness, task priming or novelty, might all play a decisive role. It appears conceivable to interpret  
57 the final effects of tDCS as contingent on the level of network engagement (19,20). In line with this  
58 prediction, several cognitive studies have reported a clear effect of baseline levels of different mental  
59 capabilities on tDCS response (21–26). Most recently, individual differences in the behavioral effects  
60 of prefrontal tDCS have been associated with the levels of excitability of the targeted cortex, indexed  
61 by relative concentrations of GABA and glutamate (27).

62 Notably, tDCS affects large-scale brain systems extending well beyond the area under the stimulating  
63 electrode (28–31). This approach translates into a lack of focality that closely resembles the spread  
64 of the noradrenergic modulatory action exerted by the locus coeruleus (LC), which subtends arousal  
65 functions. Several authors have highlighted the key adaptive role of this specific midbrain system in  
66 shaping behavioral performance of primates (32–36). A large body of evidence suggests that the

67 exogenous direct currents and the endogenous noradrenergic modulatory action on target cells, share  
68 the same central mechanism of neuronal gain control (34,37–39). Therefore, an interrelation between  
69 the two stimulating activities seems reasonable to the extent that whenever the contrast between  
70 activated and inhibited units becomes sufficiently increased or decreased any further added  
71 neuromodulation can likely spoil the expected results. In this regard, a recent study has shown that  
72 offline anodal tDCS may hinder the LC endogenous action during response inhibition processes due  
73 to the induced alterations of pre-existent neural excitability levels (40). Given the above  
74 considerations, it appears evident that great part of the tDCS behavioral variability reasonably stems  
75 from the interdependency between the induced cortical excitability and the varying levels of arousal  
76 experienced by participants before and during the experimental sessions.

77 The aim of this study was to verify whether the behavioural and physiological responses induced by  
78 a common prefrontal tDCS montage were dependent on the participants' arousal levels. We selected  
79 the tDCS montage used to stimulate prefrontal cortex in attentional and vigilance tasks (40–43),  
80 which is also commonly used in a variety of other settings, such as language-related, executive  
81 functions, episodic and visual working memory tasks (44–47). The tDCS was applied during an  
82 auditory oddball task aimed to probe cognitive performance as a function of arousal levels (48–50).  
83 Our task, indeed, was purposefully designed to keep participants alerted over uncertain intervals (i.e.,  
84 variable inter stimulus interval) in a way that online tDCS effects would be necessarily subjected to  
85 more frequent fluctuations of arousal (51,52).

86 We tracked pupillary changes as a proxy for the LC modulatory action (50,53–55). Accordingly, we  
87 used reaction times (RT) and pupil dilation peaks (PD) as measures of LC phasic response to the  
88 relevant stimuli (target), and pre-stimulus pupil diameter (PrePD) as a physiological marker of the  
89 LC tonic discharge activity. Furthermore, because LC endogenous activity is closely related to the  
90 perceived anxiety (56–58) subjective arousal levels were evaluated by means of State-Trait Anxiety  
91 Inventory (STAI-Y) (59).

92

## 93 2. Methods

94 Mindful that the mere sensory stimulation could mimic the expected arousal effects, prior to  
95 conducting the study, we ran a control experiment to validate our blind-controlled tDCS protocol  
96 with respect to the potential alteration of arousal due to subjective sensations. To this end, ten healthy  
97 participants were recruited. Pupillary dynamics were recorded at rest using the exact same setting as  
98 in our main experiment (see section 2.3 and 2.4). Statistical analyses revealed no difference in eye-  
99 blink rate and subjective discomfort between sham and real stimulation, ruling out the possibility of  
100 tDCS confounding effects on arousal (see supplementary material).

101

### 102 2.1 *Participants*

103 Fifteen right-handed healthy participants took part in the main experiment. Data of one subject were  
104 rejected prior to analyses due to the excessive noise in her/his pupil signal (i.e., interpolation rate >  
105 30% of the whole epoch; see 2.3). The remaining 14 participants (8 females) had a mean age of 22.4  
106 ( $SD = 3.9$ ) and a mean score to the STAI-Y trait of 44.9 ( $SD = 4.1$ ). Participants had no history of  
107 neurological or psychiatric illness and had normal or corrected-to-normal visual acuity. Ethical  
108 approval was obtained by the Ethics Committee of the IRCCS Centro San Giovanni di Dio  
109 Fatebenefratelli, Brescia, Italy. All participants were given written informed consent.

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### 111 2.2 *Study design and task procedure*

112 A single-blind within-subject design was implemented for this experiment. The testing sessions were  
113 organized in two days separated by at least 48h in order to exclude any tDCS carryover effects. In  
114 each session we collected behavioral and pupil data for the whole task duration (~18 min).  
115 Participants completed the task twice: at *baseline* (T1) without any electrodes mounted on their scalp,  
116 and subsequently either during *sham* or *real* stimulation (T2) (Figure 1b).

117 Participants were randomly assigned and counterbalanced across two session-orders of tDCS  
118 protocol, so as to rule out any extra confounding variable. Importantly, they were kept blind to the

119 ongoing experimental condition (i.e., sham or real). However, any proportion of variability possibly  
120 due to either orders of stimulation was accounted for by including the order group as an independent  
121 fixed factor (see section 2.5). As for the time of the day, the same participant was tested at around the  
122 same hour to control for any arousal variation due to the daily metabolic cycle and circadian rhythms  
123 (60).

124 Participants seated in a soundproof dark room at the distance of about 55 cm from a 17-in LCD  
125 monitor and with the only source of light provided by a grey fixation cross. The auditory oddball task  
126 was presented using E-Prime presentation software (61) by means of two constant-loudness speakers  
127 (Figure 1a).

128 In every task condition there was a fixed total number of trials (420) of which 20% included targets  
129 (84) and 80% standards stimuli (336). The stimuli order was then pseudorandomized in a way that  
130 target tones (880Hz) occurred after at least three standard tones (800 Hz). The interstimulus interval  
131 was set to a range of 2.1-2.9 s and both stimuli lasted for 70 ms including 5 ms of fade in-out edit. In  
132 so doing, we ensured enough time (~8 s) for any pupil dilation to return to baseline before overlapping  
133 to the next target trial (50,53). Along with a short training session, participants were instructed to  
134 readily press a button with their right index finger whenever detecting a target tone, and to keep their  
135 gaze on the fixation cross throughout the task. Speed of response and gaze fixation were emphasized  
136 before each task execution.

137 At the end of each experimental session participants were given a questionnaire to rate the perceived  
138 sensations or discomforts that influenced their performance (62,63).

139 Finally, a careful screening on the amount of sleep, caffeine intake, nicotine and alcohol consumption  
140 was carried out next to the above questionnaire. None of these factors was found to be associated  
141 with either stimulation sessions.

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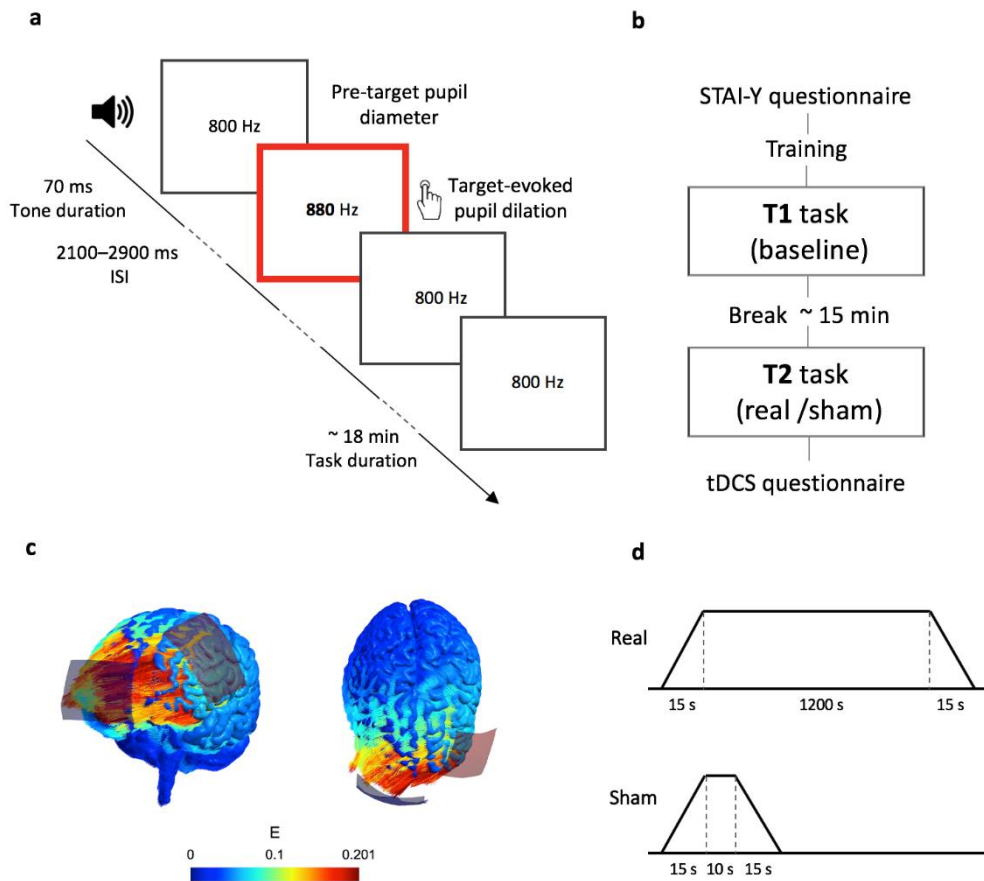
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**Fig. 1. Study design and task paradigm.** **a**, Example of a trial sequence. **b**, Overview of the experimental timeline, showing two testing sessions each one with two task conditions: baseline and stimulation. **c**, Simulation results for the applied tDCS montage and parameters using SimNIBS toolbox (Saturnino et al., 2019). The colors denote the electric fields simulated in a default head model. **d**, Schematic representation of the stimulation protocol

### 2.3 Pupil signal recording and pre-processing

Participants seated on a chair with adjustable height allowing for the use of a fixed chinrest, and thus keeping variability in the eye-to-camera distance and visual angle as low as possible. For the pupil diameter recording, an EyeLink 1000 Plus system (SR Research, Osgood, ON, Canada) was set up at 500 Hz sampling rate with left-monocular and pupil-CR tracking mode. A 9-point calibration procedure was performed before each recording session. After the final session, participants were



171 asked to wear hand-crafted goggles whose left side incorporated an artificial eye with a 4 mm pupil,  
172 carefully positioned over the subject's left eye. This allowed for a precise conversion of pupil  
173 arbitrary units from the eye-tracker system output to millimeters. Pupil signal was processed offline.  
174 Eye blink correction was implemented with a custom script in MATLAB (MathWorks, Inc, Natick,  
175 MA, USA). A shape-preserving piecewise cubic interpolation method was chosen to interpolate  
176 values ranging from 70 ms before blink onset to 300 after blink offset. Epoch segmentation (-1 s to  
177 +2.5 s, relative to target onset), baseline correction (subtractive method, from -800 ms to +200 ms)  
178 and visual inspection of pupil traces was carried out in the Brain Vision EEG analyzer software (Brain  
179 Products GmbH, Munich, Germany). We extracted two variables of interest from pupil signal: (i)  
180 pupil dilation (PD), as the peak value of the maximum dilation after targets presentation and (ii) Pre-  
181 stimulus pupil diameter (PrePD) as the mean of 1 s data prior to tone presentation. All epochs with a  
182 peak pupil diameter exceeding  $\pm 2$  mm were rejected (50).

183

#### 184 *2.4 tDCS protocol*

185 A battery-driven current stimulator (Brain- STIM, EMS, Bologna, Italy) was used to deliver 1 mA  
186 ( $0.028 \text{ mA/cm}^2$ ) direct current stimulation via two rubber electrodes ( $35 \text{ cm}^2$ ) which were inserted  
187 inside two saline-soaked sponges. These were fixated with an elastic mesh stretching over the entire  
188 head. In order to ensure a stable impedance level as well as keeping skin sensations at the minimum,  
189 conductive electro-gel was also applied.

190 Similarly to previous studies (43), the electrodes montage consisted in placing the anode over the  
191 area F3 of the EEG 10-20 system and the return (cathode) electrode over the right supra-orbital area  
192 as reported in Figure 1c. The duration of the stimulation consisted of about 17 min (1040 s) with 15  
193 s of currents fade-in and fade-out. Configuration of the sham condition included 15 s of fade-in, 10 s  
194 of actual current delivery and 15 s of fade-out given at the beginning of the experiment only (see  
195 Figure 1d).

196

197 *2.5 Statistical analyses*

198 As expected, the nature of our oddball task caused ceiling effects in the correct responses for all  
199 conditions (accuracy rate > 98%). All the trials that included either a false alarm or a missed response  
200 were left out from subsequent analyses on RT, as well as trials corresponding to RT faster than 150  
201 ms or exceeding 1.96 standard deviations from the mean (number rejected trials:  $M = 3.14$ ,  $SD =$   
202  $1.39$ ). All valid RT were then log-transformed to the base  $e$  in order to ensure a normal distribution  
203 of the data. We considered only trials having no missing values at the two main outcomes RT and  
204 PD, resulting in 52 trials overall. Importantly, these data points were not collapsed across conditions;  
205 hence *Trial* was included in the analyses as an independent fixed factor, and thus affording a greater  
206 reliability and robustness of the findings.

207 In order to study the effect of tDCS on the behavioral and physiological responses, we performed two  
208 linear mixed models (LMM) on RT and on PD as dependent variables. Individual (subject-specific)  
209 variation was accounted for by considering *Subjects* as random effect. Fixed effects, repeated within  
210 subjects, were specified for *Condition* (2 levels, *real* and *sham*), *Time* (2 levels,  $T1$  and  $T2$ ) and *Trial*  
211 (52 levels); whereas *Order* (2 subgroups, *sham-real* and *real-sham*) was considered as a between-  
212 subject fixed effect. In addition, the interaction *Condition* x *Time* was assessed. Post hoc comparisons  
213 were adjusted with Sidak correction for multiple comparisons.

214 The above LMM were subsequently adjusted for subjective arousal (measured by STAI-Y State  
215 score) and for physiological arousal (evaluated by PrePD) in order to assess their effects on tDCS-  
216 induced modulation. Akaike information criteria (AIC) was used to select the best fitted models (the  
217 lower AIC the better model) and the corresponding predictors.

218 Finally, to control for any interdependence between the subjective and physiological measures of  
219 arousal, we calculated Pearson's (r) two tailed correlations between PrePD and STAI-Y State score.  
220 Correlations coefficients were all non-significant ( $p$ 's > 0.05). All statistical analyses were conducted  
221 on SPSS Statistics (IBM Corp, Armonk, NY, USA).

222

223 3. Results

224 Despite the random assignment, the participants included in the two *Order* subgroups exhibited  
225 different levels of physiological tonic arousal (PrePD) already at the baseline of the first experimental  
226 session, that is before applying the tDCS electrodes (two tailed independent t-tests [ $t = -3.64$ ,  $df =$   
227  $11.82$ ,  $p = .003$ ]). No difference was found between the subgroups in the STAI-Y scores [ $t = -.41$ ,  $df =$   
228  $11.57$ ,  $p = .68$ ].

229 As for the reported sensations, a Wilcoxon matched pair test revealed no significant difference  
230 between sham and real stimulation [ $Z = 1.34$ ,  $p = 0.18$ ]. It was also ensured that their written responses  
231 were consistent with their oral report. Therefore, it was safe to assume that participants were  
232 completely unaware of the type of stimulation protocol.

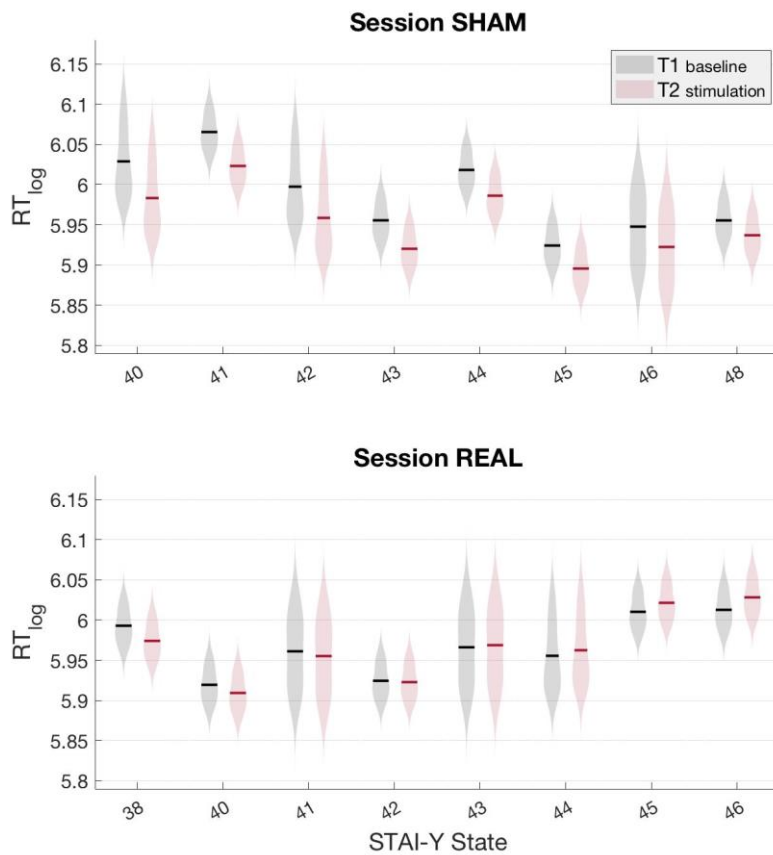
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234 3.1 Reaction times – RT

235 The unadjusted linear mixed model on RT [AIC = -2574] revealed no significant effects of the *Order*  
236 [ $F_{(1,11)} = .59$ ,  $p = .477$ ] and a trend toward significance for *Condition* [ $F_{(1,2419)} = 3.76$ ,  $p = .053$ ] and  
237 *Trial* [ $F_{(51,98)} = 1.47$ ,  $p = .05$ ], with slower RT occurring at the end of each tasks. A significant effect  
238 of *Time* [ $F_{(1,2399)} = 12.15$ ,  $p < .001$ ] showed that performance significantly improved from *T1* [ $M =$   
239  $5.98$ ;  $SE = .05$ ] to *T2* sessions [ $M = 5.96$ ;  $SE = .05$ ], indicating an overall practice effect. Importantly,  
240 we found a significant *Condition* x *Time* interaction effect [ $F_{(1,2403)} = 12.08$ ,  $p = .001$ ], indicating a  
241 different trend for real and sham conditions. The post-hoc comparison for *Time* revealed a significant  
242 performance improvement during *sham* ( $p < .001$ ), but not during *real* stimulation ( $p = .99$ ). This  
243 finding suggests that real tDCS hindered the practice effect that was present in the sham condition.

244 Next, LMM adjusted for STAI-Y and PrePD were separately performed (see Supplementary Table  
245 1). We found an overall significant contribution of STAI-Y [ $F_{(1,2312)} = 9.44$ ,  $p = .002$ ] and more  
246 importantly a significant 3-way interaction [*Condition* x *Time* x STAI-Y:  $F = 19.1$ ,  $df = 3/1857$ ,  $p <$   
247  $.001$ ], indicating that the subjective level of arousal affected the interaction *Condition* x *Time* on RT.  
248 Specifically, STAI-Y state scores were predictive of the performance variations across tDCS

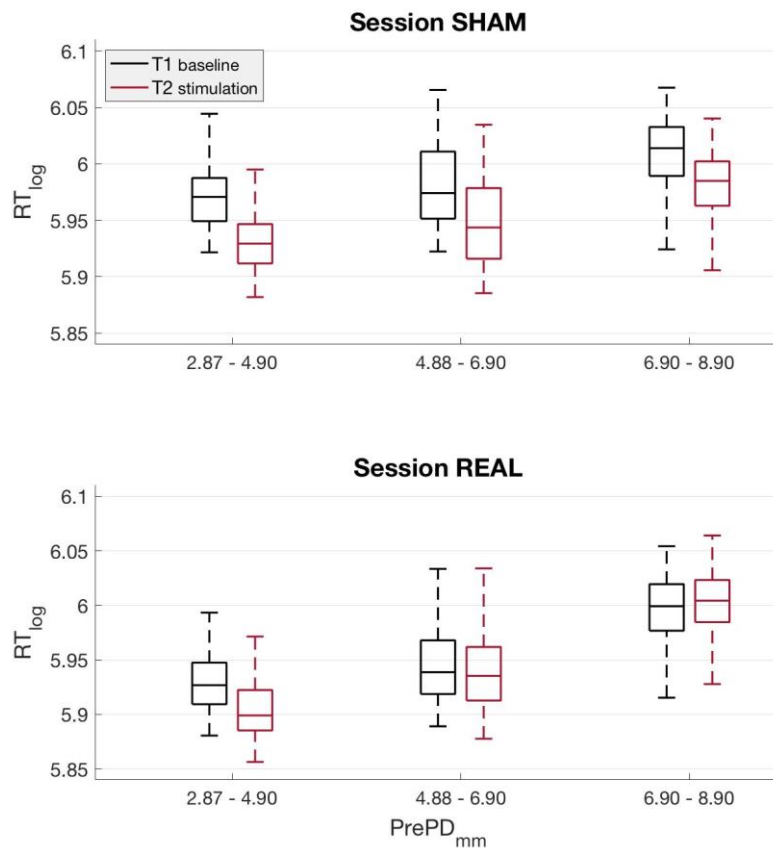
249 conditions. During sham session a performance improvement was observed for all the continuum of  
250 arousal, although it diminished as the level of STAY-Y increased. In the real tDCS condition, RT  
251 proved to be faster only when the levels of arousal were low, whereas such pattern was abolished or  
252 even reversed with higher levels of arousal (i.e., higher STAI-Y scores, see Figure 2).



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269 **Fig. 2. Reaction times by subjective arousal.** Average log-based RT of model fitted values are plotted as a function of  
270 STAI-Y scores, with results from session sham (top panel) and real (bottom panel). Each mean value is marked over the  
271 corresponding distribution of the data. Colors grey and red represent the baseline (T1) and stimulation (T2) task,  
272 respectively.

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275 After adjusting for PrePD, *Condition* and *Time* remained significant [ $F_{(1,2131)} = 6.88, p = .009$ ;  $F_{(1,1967)}$   
276  $= 9.44, p = .032$  respectively], although the physiological predictor did not reach statistical  
277 significance [PrePD:  $F_{(1,1834)} = 3.52, p = .061$ ]. Also in this case, the 3-way interaction [*Condition* x  
278 *Time* x PrePD:  $F_{(3,1307)} = 5.57, p = .001$ ] revealed that the interaction between *Condition* and *Time*

279 was affected by participants' physiological level of arousal. Consistently with the aforementioned  
280 effects of subjective levels of arousal, RT improvement across time was consistent in the sham  
281 condition, but larger during trials with a reduced PrePD. During real tDCS, a trend toward lower or  
282 no improvement was observed as physiological arousal increased (see Figure 3).



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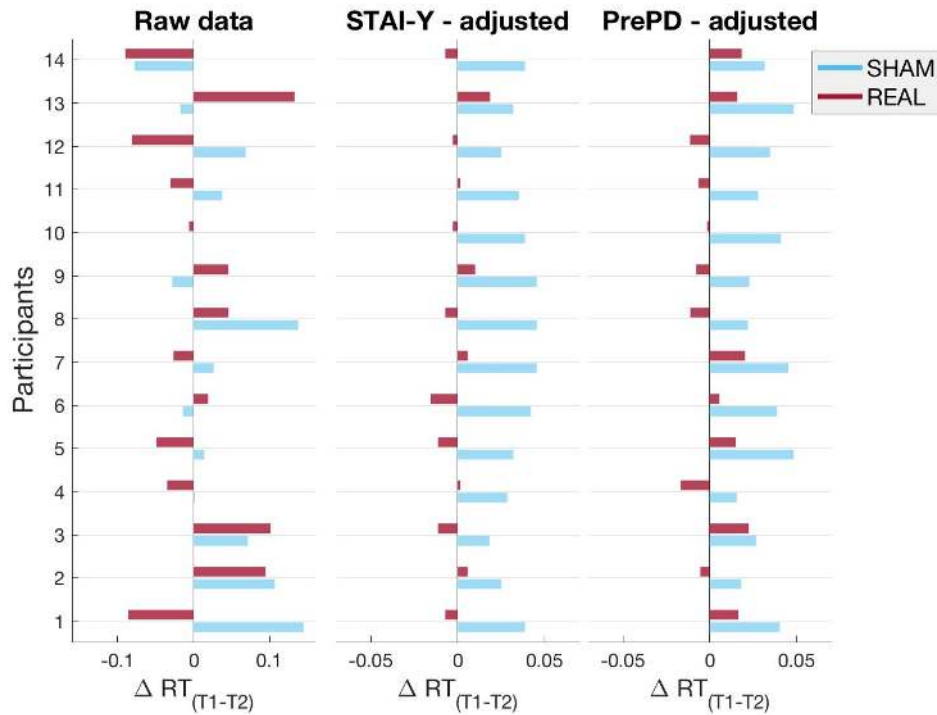
297 **Fig. 3. Reaction times by physiological arousal.** On each box, the interquartile range, the whiskers and the median of  
298 predicted log-based RT are represented for three linearly interspaced bins of pre-target pupil diameter, with results from  
299 session sham (top panel) and real (bottom panel). Colors grey and red represent the baseline (T1) and stimulation (T2)  
300 task, respectively.

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303 Based on the present results, a far more consistent trend emerged from the adjusted models as  
304 compared to the same raw data (see Figure 4). This finding corroborates the importance of not  
305 disregarding discrepancies rooted in interindividual differences, such as in physiological and  
306 subjective arousal, but rather include them as predictors along with individual random effects.

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318 **Fig. 4. Subject variability of reaction time change.** Average log-based RT differences between the baseline (T1) and  
319 stimulation (T2) tasks are plotted on the vertical axis for each participant, separately for session sham (blue bars) and real  
320 (red bars). A different bar plot is used to represent mean differences from raw (left panel) and fitted data from the adjusted  
321 models using STAI-Y (middle panel) and PrePD (right panel) predictors. Negative and positive values on the horizontal  
322 axis indicate slower and faster performance, respectively.

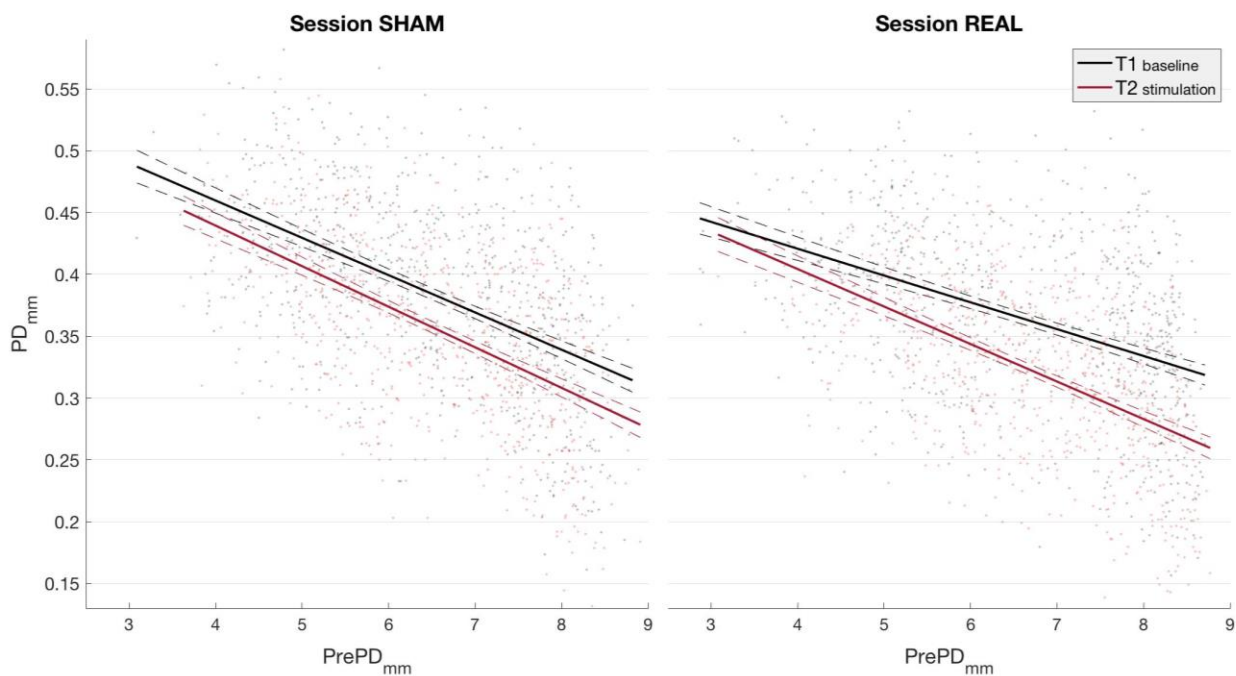
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### 325 3.2 Pupil dilation – PD

326 In the unadjusted LMM on PD, [AIC = 964.66], all fixed effects were significant [*Condition*:  $F_{(1,1340)}$   
327 = 10.46,  $p = .001$ ; *Time*:  $F_{(1,1445)} = 15.83$ ,  $p < .001$ ; *Trial*:  $F_{(51,88)} = 5.94$ ,  $p < .001$ ] except for the factor  
328 *Order* [ $F_{(1,11)} = 1.96$ ,  $p = .18$ ] and the interaction between *Condition* and *Time* [ $F_{(1,1362)} = .75$ ,  $p =$   
329  $.38$ ]. Importantly, pupil dilation decreased from *T1* [ $M = .375$ ;  $SE = .023$ ] to *T2* sessions [ $M = .34$ ;  $SE$   
330 =  $.023$ ], indicating a general habituation of the phasic pupillary responses. However, no specific effect  
331 of tDCS on PD was revealed.

332 The adjustment for STAI-Y got worse the model fitting [AIC = 986.38], making the interaction  
333 *Condition x Time x STAI-Y* not significant [ $F_{(1,1066)} = 1.08, p = .35$ ] (see Supplementary Table 2).  
334 On the contrary, adjusting for PrePD strongly improved the model fitting [AIC = -365.48], with  
335 significant PrePD [ $F_{(1,1794)} = 2231.23, p < .001$ ] and interaction *Condition x Time x PrePD* effects  
336 [ $F_{(3,1172)} = 6.5, p < .001$ ]. In detail, during the sham condition a decrease in pupil dilation consistently  
337 occurred throughout the range of PrePD values, whereas during real tDCS the pupil dilation  
338 progressively shifted toward a maximal suppression during trials with larger PrePD (Figure 5).



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340 **Fig. 5. Pupil dilations explained by physiological arousal.** Model fitted PD values are plotted against pre-target pupil  
341 diameter, with results from session sham (**left panel**) and real (**right panel**). Grey and red best-fitting lines describe the  
342 trend of pupil dilation data points over pre-target pupil diameter respectively for the baseline (T1) and stimulation (T2)  
343 task. Dashed lines represent prediction functional bounds, i.e. the uncertainty of predicting the fitted lines.

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345

#### 346 4. Discussion

347 In the present study, we addressed the question of whether variable effects of single session tDCS  
348 could be dependent on the degree of arousal experienced before and during the experiment.

349 Subjective and physiological levels of arousal significantly accounted for the variation of reaction  
350 times across two experimental sessions. Real tDCS appeared to hinder the practice effect observed  
351 during the sham condition, with a trend becoming especially evident at higher levels of arousal. As  
352 for pupil dilation, its values were significantly tied to the corresponding physiological fluctuations of  
353 arousal. In particular, a more reduced pupillary response emerged during real tDCS as arousal levels  
354 increased.

355 These results shed light on one relevant factor, which seems to account for the paucity of consistency  
356 across tDCS effects in some experiments. What effectively emerges is that arousal is predictive of  
357 the modulations induced by tDCS on task performance. A number of studies, which reported a  
358 considerable inter- and intra-individual variability in response to tDCS protocols, investigated the  
359 impact of demographic characteristics (e.g., age, gender), cortical architecture variations or  
360 physiological measures specific to the targeted areas (e.g., levels of excitability of the primary motor  
361 cortex), yet without considering general measures of activation comparable to arousal (9,64–68).

362 Here, we collected ratings on the subjective level of anxiety (i.e., STAI-Y State) before each  
363 experimental session, thus serving as a fixed measure of arousal. Pre-target pupil diameter was instead  
364 used as a dynamic proxy of arousal, allowing us to track its ongoing fluctuations (50,52,69). We  
365 confirmed that pupil dilation values were negatively related with pre-target pupil diameter across all  
366 conditions, as frequently reported in the literature (50,70–72).

367 When our measures of arousal were accounted for by statistical analyses, a clear picture emerged,  
368 indicating that the effects induced by tDCS on the behavioral responses were dependent on both  
369 subjective and physiological levels of arousal levels. In the sham session, participants speeded up  
370 their responses when they completed the task for the second time. This practice effect emerged  
371 somewhat independently of both the subjective and physiological levels of arousal, although a slightly  
372 more pronounced improvement appeared with lower levels in either measures. During the application  
373 of real tDCS, however, performance ceased to improve with the exception of trials characterized by  
374 smaller pre-target pupil diameter and participants with a lower score at the STAI-Y questionnaire. A



375 negative or null behavioral outcome of anodal tDCS is not uncommon in the literature and learning  
376 impairments have been reported in a host of different tDCS studies involving specific learning  
377 outcomes, such as unimproved working memory for recognition or implicit categorization, blocked  
378 consolidation of visual perception and inhibited motor learning (68,73–78).

379 We chose response speed as behavioural measure, given that its intrinsic low sensitivity heavily relies  
380 on prior levels of fatigue and general activation (79–82). The interpretation of our behavioural results  
381 is arguably consistent with an inverted U-shape curve between task performance and arousal.  
382 According to this relationship, performance decline would occur when arousal levels are either too  
383 high or too low (33,83). None of the participants reported sleep deprivation or otherwise drowsiness-  
384 related conditions. Therefore, we can assume that the lower values of our predictors effectively  
385 corresponded to moderate and not low levels of arousal. With this in mind, the finding that facilitatory  
386 effects are principally associated with a moderate level of cortical excitation seems to support the  
387 proposed cellular mechanism for a cortical excitation-inhibition balance (16,84). On these grounds,  
388 tDCS exogenous modulation would negatively impact on the normal cortical functioning whenever  
389 the levels of endogenous neural activity increase to the extent of a dysfunctional neuronal gain, with  
390 spontaneous task disengagement causing slower responses. A direct consequence of this mechanism  
391 would be the inhibition of task learning effects, unless the endogenous system is sufficiently inactive,  
392 as in low arousal trials. The latter scenario provides an additional argument for when single session  
393 tDCS is found to improve task performance in the face of variable but otherwise moderate and well-  
394 balanced arousal levels. The understanding that an unbalanced combination of endogenous and  
395 exogenous excitability-increase events can, in fact, lead to negative effects is also coherent with  
396 frameworks on brain activity-dependent plasticity and on signal-to-noise ratio mechanisms (20,78).

397 Results on pupil dilation, which represents a physiological response to relevant stimuli, corroborate  
398 the above interpretation. Only when the ongoing levels of arousal were considered in the analyses, a  
399 specific effect of tDCS on pupil dilatation was revealed. An overall reduction of pupil dilation  
400 occurred when participants completed the task for the second time (T2), consistently with a

401 physiological habituation effect that paralleled the practice effect seen in the behavioral results  
402 (85,86). In particular, pupil dilation evenly decreased for the entire range of arousal in the sham  
403 session, but crucial variations emerged during the application of real tDCS: looking at the lower end  
404 of the arousal range, pupil dilation values were not as much reduced as in sham session. Conversely,  
405 a more pronounced reduction in pupil dilation was observed in trials associated with higher arousal.  
406 These, in fact, corresponded to the trials of unimproved response times following real tDCS.  
407 Therefore, habituation of a phasic response may not necessarily indicate the same outcome direction  
408 as the better performance after a practice effect (85,87). Pupil dilations primarily reflect the timely  
409 increase of neural gain control, which translates into a system's responsivity amplification, and as  
410 such can be ascribed in the aforementioned inverted-U curve (34,50,71,88). The implication is that  
411 the additive effect of an exogenous neuromodulation would, on the one hand, contrast the natural  
412 habituation effect on pupil dilation occurring below the intermediate range of tonic arousal and, on  
413 the other hand, accentuate task disengagement at higher levels of tonic arousal, hence a greater  
414 reduction in phasic response. An analogous explanation was put forward in a recent tDCS work  
415 showing a reduction of pupil dilation - but no behavioral effects - during a Go-NoGo task, whereby  
416 it was argued that an offline tDCS enhancement of neuronal membrane potential could hinder or  
417 replace the endogenous gain control mechanisms of locus coeruleus (40).

418 Furthermore, outside the tDCS literature, phasic pupillary responses were found to be reduced  
419 whenever participants' attention was not directed to the task, such as during episodes of mind  
420 wandering (72,89–91). Indeed, recent empirical and theoretical formulations of mind wandering have  
421 proposed that the locus coeruleus–norepinephrine system is tightly linked to different internally-  
422 driven cognitive states, i.e., on- and off-task states with various degrees of deliberate control (36,92).

423 In this respect, the possibility of a direct and focally targeted tDCS modulation of mind wandering  
424 has been recently debated with uncertain conclusions (93). Based on this knowledge, it is not unlikely  
425 that our tDCS effects would also be partly dependent on the arousal-mediated propensity of mind  
426 wandering activity during the task. Although not covered by the aims of this study, the above

427 possibility justifies the argument for a selective alteration of arousal via exogenous neuromodulation.  
428 For example, vigilance decrements and physiological sleep pressure were somewhat diminished after  
429 prolonged frontal anodal tDCS (41,94) with a magnitude of effects greater than caffeine (95,96).  
430 Whereas for the arousal modulation related to a specific event, stimulus-locked bursts of electric  
431 random noise stimulation were used to enhance performance and LC phasic responses, as indexed by  
432 skin conductance measurements (25). Despite this compelling evidence, it is still difficult to conclude  
433 that certain tDCS montages can directly modulate the deep brain arousal structures (97–99). Note  
434 though that other mechanisms could involve changes in the neocortical neurons, whose membrane  
435 potential shifts are known to be coupled with alteration in pupil diameter (34,100,101).

436

437 In summary, our data collectively offer an explanation for the negative or null effects of a common  
438 prefrontal tDCS application. We are aware that the interpretation of these particular results may not  
439 apply to all tDCS studies. Nevertheless, the large variability of arousal levels that we found across  
440 participants leads us to reflect more closely on what may mask the desired effects in the varied and  
441 still growing landscape of stimulation studies, which often fail to incorporate, but simply  
442 acknowledge, the crucial aspect of individual state-dependent variables (102–105).

443 The importance of brain state is not a novel idea in the literature on non-invasive brain stimulation.  
444 The ongoing or basal levels of activation, included in the concept of “state-dependency”, have been  
445 extensively reported to impact the effects of transcranial magnetic stimulation (TMS) (106).  
446 Nevertheless, considering the mechanisms of action of tDCS, which modulates excitability of neurons  
447 by hyperpolarizing or depolarizing their membrane potential (107,108), tDCS effects might be more  
448 sensitive to the arousal levels than TMS. In a similar vein, these considerations might be applicable  
449 to any kind of current stimulation modality.

450

451 Taken together, the discussed findings should encourage a more careful interpretation of null or  
452 negative effects of tDCS. This is far from saying that all replication failures are due to inherently

453 inefficacious tDCS protocols with exhausted future potential (15). Such observations should instead  
454 help ascribing the outcome of those protocols to the interrelation of the locus coeruleus–  
455 norepinephrine system and the spreading of induced currents in the brain (40,42). In this sense, future  
456 tDCS studies might consider useful to have both dynamic and fixed measures of arousal as an accurate  
457 way to monitor its impact on the final outcome. If successful, these achievements would be of great  
458 help also in assessing the degree of effectiveness with which tDCS protocols are being utilized to  
459 treat or ameliorate clinical conditions.

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#### 463 **Disclosure statement**

464 This work has not been published and has not been submitted for publication elsewhere while under  
465 consideration. The authors declare no potential conflict of interest.

466

#### 467 **Acknowledgements**

468 CF, CM and DB have been supported by the projects of the Italian Ministry of Health “Ricerca  
469 Corrente”.

470

471

472 **References**

473

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