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Mottola, Francesca; Blanchfield, Anthony; Hardy, James; Cooke, Andrew

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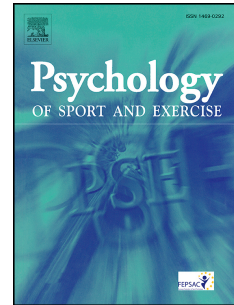
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EEG Neurofeedback Improves Cycling Time to Exhaustion

Francesca Mottola*, Anthony Blanchfield, James Hardy and Andrew Cooke

School of Sport, Health and Exercises Sciences, Bangor University LL57 2PZ, UK.

***Corresponding author:** School of Sport, Health and Exercises Sciences, Bangor University, George Building, Bangor, Gwynedd, Wales, LL57 2PZ, UK.

Email: Pep83b@bangor.ac.uk Permanent email: Francesca_mottola@outlook.com Telephone number: [+393791290295](tel:+393791290295)

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Conflict of Interest

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Author Note

The dataset can be made available upon reasonable request to the corresponding author.

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Abstract

Objective: The role of the brain in endurance performance is frequently debated; surprisingly, few investigations have attempted to improve endurance performance by directly targeting brain activity. One promising but untested approach to modifying brain activity is electroencephalogram (EEG) neurofeedback. Consequently, our experiment is the first to examine an EEG neurofeedback intervention for whole-body endurance performance.

Method: We adopted a two-part experiment. The first consisted of a randomized parallel controlled design. Forty participants were allocated to three experimental groups; increase relative left cortical activity (NFL), increase relative right (NFR), and passive control (CON). They performed a depleting cognitive task, followed by either six 2-min blocks of EEG neurofeedback training (NFL or NFR) or time-matched videos of the neurofeedback display (CON). Next, they performed a time-to-exhaustion (TTE) test on a cycle-ergometer. We then tested participants of NFL and NFR groups in an additional experimental visit and administered the opposite neurofeedback training within a fully repeated-measures protocol.

Results: EEG neurofeedback modified brain activity as expected. As hypothesized, the NFL group cycled for over 30% longer than the other groups in the parallel controlled design, NFL: 1382 ± 252 s, NFR: 878 ± 167 , CON: 963 ± 117 s. We replicated this result in the repeated-measures design where NFL: 1167 ± 831 s performed 11% longer than NFR: 1049 ± 638 s). There were no differences in pre-exercise fatigue, vigor or self-control; area under the curve group-differences for perceived effort were interpreted within a goal persistence framework. **Conclusion:** The brief EEG neurofeedback intervention elicited greater relative left frontal cortical activity and enhanced endurance exercise performance.

Keywords: Brain stimulation, endurance performance, approach motivation, frontal alpha asymmetry.

26

Introduction

27 The role of the brain in endurance exercise performance has been debated for a
28 number of years. During this time, however, surprisingly few investigations have attempted
29 to alter endurance performance by directly targeting brain activity (Angius et al., 2018). One
30 novel approach to directly modifying brain activity is electroencephalogram (EEG)
31 neurofeedback. Neurofeedback is a non-invasive technique based on operant conditioning
32 whereby individuals learn to self-regulate their electrocortical activity with the aid of positive
33 or negative reinforcement whenever electrocortical activity meets a pre-designated pattern
34 (Enriquez-Geppert et al., 2017). Accordingly, neurofeedback provides an exciting
35 opportunity to train individuals to produce brain activation patterns that might be conducive
36 for endurance performance, and thereby yield a new non-invasive intervention to enhance
37 endurance performance. This technique could also shed important new light on brain and
38 endurance performance mechanisms. This paper reports on the first investigation of these
39 pressing issues.

40 EEG-Neurofeedback

41 The EEG assesses cerebral activity via electrodes attached to the scalp to record
42 voltages emitted from the brain. This signal is dominated by oscillations that are usually
43 decomposed into five characteristic frequencies [delta (0.5–3.5 Hz), theta (4–7 Hz), alpha (8–
44 12 Hz), beta (13–30 Hz), and gamma (30-80 Hz)] reflecting specific brain states and
45 cognitive functions (Knyazev, 2007). Slow frequencies within the delta-band are prevalent
46 during deep sleep, theta-band has been associated with different cognitive functions like
47 encoding information, alpha-band reflects suppressed brain activity and it has been associated
48 with resting states, inhibition of cortical activity and directed attention, while faster
49 frequencies (e.g. beta-band) are associated with alertness and attention (see Engel & Fries,
50 2010; Knyazev, 2007). In a typical EEG-neurofeedback session, the EEG signal is recorded

51 from the scalp and computer software extracts the EEG feature that is the target of the
52 neurofeedback training (e.g., spectral power in the alpha frequency band). This EEG feature
53 is then compared to a criterion (e.g., a pre-defined target alpha power level) and displayed
54 back via visual and/or auditory stimuli (e.g., graphs on a computer screen; an auditory tone).
55 In this way, performers receive instantaneous, real-time feedback that indicates the current
56 activity of the selected brainwave compared to the desired level of activation, hence they can
57 begin to develop strategies to control their brainwaves to match the pre-defined target level
58 (Enriquez-Geppert et al., 2017).

59 Research has used EEG-neurofeedback training to enhance cognitive performance
60 (Gruzelier, 2014) and, more recently, neurofeedback has been utilized with self-paced target
61 sports (e.g. Ring et al., 2015) as studies have reported cortical signatures that appear to
62 characterize optimal performance during the final moments of motor preparation for such
63 tasks (Cooke et al., 2014). However, compared to fine-motor skills (e.g., golf putting), whole-
64 body exercise presents methodological hurdles such as muscular artefacts, electrode
65 movement and sweat (Perrey & Beson, 2018), which make it difficult to discern brainwaves
66 that characterize superior performance for data-driven neurofeedback interventions. To tackle
67 this issue, we have advocated a prescription approach that allows the development of theory-
68 driven neurofeedback protocols in the absence of prior data (Cooke et al., 2018). In the
69 present study, we developed and tested a prescription for neurofeedback to enhance
70 endurance performance, drawn from the approach-withdrawal model of frontal asymmetry
71 (Davidson, 1992) alongside the psychobiological model of endurance performance (Marcora,
72 2008).

73 **The Brain and Endurance Performance**

74 According to the psychobiological model of endurance performance, exercise
75 capacity is a goal-directed behavior that is limited by a conscious decision to withdraw from

76 exercise when the effort is perceived as no longer possible or justified (Marcora, 2008).
77 During endurance events, athletes face increasingly unpleasant physical sensations, such as
78 fatigue, pain and discomfort (McCormick et al., 2018). In this context, the motivation to
79 continue, despite the rising urge to quit, is pivotal (Schiphof-Godart et al., 2018). The
80 psychobiological model of endurance performance therefore predicts that any intervention
81 that reduces the perception of effort will improve endurance performance (Blanchfield et al.,
82 2014).

83 According to the approach-withdrawal model of frontal asymmetry (Davidson, 1992;
84 Harmon-Jones & Gable, 2018), lateralization of brain activity across the prefrontal cortical
85 hemispheres reflects opposite motivational directions that drive behaviors and emotions.
86 Left-sided frontal activity is associated with approach-related processes whereas right-sided
87 frontal activity is associated with avoidance-related processes (Harmon-Jones & Gable,
88 2018). EEG research has measured asymmetric frontal cortical activity by subtracting alpha
89 power at the left frontal leads from alpha power at the right leads (i.e., relative frontal alpha
90 asymmetry). Power within the alpha frequency band (8-13 Hz) is *inversely* related to cortical
91 activity. Hence, positive values are indicative of greater left over right frontal cortical
92 activity, while negative values indicate a greater right over left frontal cortical activity (Smith
93 et al., 2017). Using this asymmetric index, previous studies reported that relative left frontal
94 cortical activation is associated with positive affective responses to appetitive stimuli
95 (Harmon-Jones & Gable, 2009) and action motivation (Berkman & Lieberman, 2010). More
96 importantly, experimentally manipulated changes in relative left over right frontal cortical
97 activity led to increased persistence during an unsolvable cognitive task (Shiff et al., 1998)
98 and an action-orientated mindset (Harmon-Jones et al., 2008). These findings collectively
99 suggest that relative left frontal cortical activity initiates motivational and cognitive processes
100 that favor the maintenance of performance, especially when effort is at its highest.

101 Pertinently, Allen et al. (2001) demonstrated that EEG-neurofeedback can be used to modify
102 relative frontal alpha asymmetry. In their study, individuals were trained to increase either
103 relative right or relative left frontal cortical activity with five 6-minute sessions of
104 neurofeedback performed over five consecutive days. They found that the group trained to
105 increase relative left frontal cortical activity reported significantly more amusement, interest,
106 and happiness in response to a film and significantly more zygomatic activity ('smile' faces)
107 than the group trained to increase relative right frontal cortical activity. Similar effects have
108 been reported by more recent studies (e.g., Peeters et al., 2014; Quaedflieg et al., 2016) with
109 Peeters et al. reporting that just a single session of neurofeedback effectively modified
110 relative frontal alpha asymmetry. However, these studies primarily focused on the effect of
111 neurofeedback training for asymmetric frontal cortical activity on affective responses,
112 whereas behavioral outcomes received little attention. Behavioral outcomes are central,
113 however, in endurance events.

114 **Aim of the Present Experiment**

115 The present research is the first to test the use of neurofeedback as a brain-based
116 intervention to improve endurance exercise performance; specifically, the effect of increased
117 relative left frontal cortical activity on whole-body endurance performance. We implemented
118 a two-part experiment; the first involved a between-subject design, while in the second part
119 the same group of participants was tested in a fully repeated measures design (i.e., crossover
120 trial). Based on the aforementioned research, we reasoned that an alpha asymmetry
121 neurofeedback protocol designed to increase relative left frontal cortical activity would
122 enhance approach motivation and delay the urge to withdraw that is thought to terminate
123 endurance exercise. We also anticipated that the intervention could be especially useful when
124 participants are already in a state of cognitive depletion and fatigue prior to the start of
125 endurance exercise. This is because a state of cognitive depletion is thought to elevate

126 perceived effort and impair subsequent endurance exercise (e.g. Bray et al., 2008).
127 Accordingly, we manipulated individuals' asymmetric frontal activity after they engaged in
128 an effortful, depleting cognitive task used to exacerbate the feelings of fatigue (Inzlicht &
129 Berkman, 2015). We then assessed the effect of our frontal asymmetry neurofeedback
130 protocol on performance and perception of effort (i.e., RPE) during a cycling time-to-
131 exhaustion test. On the basis of the approach-withdrawal motivational model of asymmetric
132 frontal activity (Harmon-Jones & Gable, 2018) that we adopted to prescribe the
133 neurofeedback interventions, we hypothesized that increased relative left frontal cortical
134 activity would allow individuals to cycle for longer during a constant load time-to-exhaustion
135 task compared to both the opposite neurofeedback intervention (increased relative right
136 frontal cortical activity) and a passive control intervention. Based on the psychobiological
137 model of endurance performance (Marcora, 2008), we further expected that neurofeedback-
138 induced performance differences would be characterized by reduced perception of effort.

139 **Experiment 1A: Between-Subject Design**

140 **Materials and Methods**

141 **Participants**

142 Forty volunteers ($n = 26$ males and $n = 14$ females) between 18 and 45 years old were
143 recruited from university and local sports clubs. The sample was informed by power analysis
144 based on previous research illustrating the effect of neurofeedback on alpha asymmetry.
145 Research by Quaedflieg et al. (2016) and Mennella et al. (2014) reported that EEG-
146 neurofeedback protocols such as the one used in this experiment elicited a significant and
147 medium effect size ($\eta^2_p = 0.08$ and $\eta^2_p = 0.14$, respectively). Using the average of these effect
148 sizes, GPower indicated that a sample of 27 participants would be sufficient to detect a
149 comparable effect via the between-subject factorial ANOVA design that we planned to

150 employ [$f = 0.33$), $\alpha = 0.05$, and $\beta = 0.80$)]. Accordingly, by recruiting a sample of 40, we
151 were more than sufficiently powered to detect the expected effect.

152 In order to participate in this research, participants had to be free from self-reported
153 illness, injury and dyslexia, and not taking medication except the contraceptive pill.
154 Participants were asked to sleep at least seven hours, avoid heavy exercise and alcohol during
155 the 24 hours preceding each experimental visit, to avoid nicotine and caffeine for three hours
156 before each experimental visit, and to consume a light meal two hours before attending each
157 visit. Compliance with these instructions was confirmed at the start of each visit. All
158 participants provided written informed consent and the study was approved by the Research
159 Ethics Committee according to the Declaration of Helsinki.

160 **Design**

161 We adopted a randomized between-groups design to investigate the effect of EEG-
162 neurofeedback on exhaustive endurance exercise performance. Participants were randomly
163 allocated to either an increase relative left frontal cortical activity neurofeedback group (NFL
164 group), or one of two control groups: an increase relative right frontal cortical activity
165 neurofeedback group (NFR group), or a no-neurofeedback passive control group (CON
166 group) Randomization was performed in blocks of six and the scheme was generated by
167 using the Web site Randomization.com. After receiving the neurofeedback intervention, or
168 the passive control intervention, all participants completed a time-to-exhaustion exercise test
169 on a cycle ergometer.

170 **Experimental Procedures**

171 Participants made two laboratory visits, separated by a minimum of 48 hours, and a
172 maximum of 14 days. Laboratory conditions were standardized at a temperature of $20 \pm 1^\circ\text{C}$,
173 atmospheric pressure of 1015 ± 9 mbar, and humidity of $53 \pm 7\%$.

174 **Visit 1.** The first session was identical for all three groups and involved a maximal
175 incremental ramp test on a cycle-ergometer (Excalibur Sport, Lode, Groningen, Netherlands)
176 to assess individuals' maximal oxygen consumption ($\dot{V}O_2\text{max}$) and peak power output
177 (PPO). Before the test, anthropometric measurements (body mass and height) were recorded.
178 The ramp test started with 2-min rest after which the power automatically increased from 50
179 W by 25 W every minute until voluntary exhaustion. Verbal encouragement was provided
180 close to the end of the test to ensure that participants reached their maximal effort. During the
181 maximal incremental test, oxygen consumption was measured breath by breath via a
182 computerized metabolic gas analyzer (Metalyzer 3B, Cortex Biophysik, Leipzig, Germany)
183 connected to a mouth mask (7600 series, Hans Rudolph, Kansas City, MO, USA). The device
184 was calibrated before each test using a known concentration of gases and a 3L calibration
185 syringe (Series 5530, Hans Rudolph). Maximal oxygen consumption was defined as the
186 highest value of oxygen uptake averaged over 15 s. Heart rate (HR) was recorded
187 continuously throughout the test with a wireless chest strap (S610, Polar Electro, Kempele,
188 Finland) and rating of perceived effort (RPE) was measured at the end of every incremental
189 stage using the Category Ratio scale (CR-10) developed by Borg (1998) . The standard
190 instructions of the scale were provided to participants prior to starting the test and low and
191 high anchor points were established using the procedures advocated by Noble and Robertson
192 (1996). This first visit allowed participants to familiarize with the laboratory setting and
193 testing procedures that were used for the experimental trial.

194 All exercise tests were performed on the same braked cycle-ergometer (Excalibur
195 Sport, Lode, Groningen, Netherlands) set in hyperbolic mode, which allows the power to
196 change independently of pedal frequency. For all exercise tests, exhaustion was defined as
197 the point at which the individual voluntarily stopped the test, or the cadence had fallen below
198 60 revolutions per minute (rpm) for more than five consecutive seconds. During the tests,

199 participants were asked to remain in the saddle and were allowed to freely choose their
200 cadence so long as it remained between 60 and 100 rpm.

201 **Visit 2.** Upon arrival, all participants were briefed about the visit and then prepared
202 for the EEG recording (see details below). The procedure took 20 min after which the Brunel
203 Mood State Scale (BRUMS) and the State of Self-Control Capacity Scale (SSCCS) were
204 administered (see section on psychological measures). All participants then completed a brief
205 writing task designed to elicit a state of mild cognitive depletion and fatigue (see section on
206 written task) followed by a second assessment of mood (BRUMS) and self-control (SSCCS).
207 They then received an EEG-neurofeedback intervention (NFL or NFR) or a time-matched
208 viewing of EEG signals without actively controlling them (CON) followed by a final
209 assessment of self-reported mood and self-control. Next, participants moved onto the cycle-
210 ergometer to perform a time-to-exhaustion cycling test, which required them to pedal for as
211 long as possible at an intensity of 65% of their peak power output (see section on cycling
212 time-to-exhaustion test, TTE).

213 **Manipulations and Measures**

214 **Written Task (WT).** Before the neurofeedback/control interventions, all participants
215 were instructed to produce a handwritten copy of a typed piece of text consisting of 336
216 words (one page) describing physics processes. Importantly, they were asked to omit the
217 letters *A* and *N* from every word when producing their handwritten copy. This meant that the
218 performer had to override their automatic writing habits so as to comply with the instructions
219 of the written task. This task was adapted from similar versions previously used successfully
220 to induce a state of mild cognitive depletion (Myers et al., 2018). The same text was used for
221 all individuals and the time taken to complete the writing task was recorded. In each visit 30
222 min elapsed between the completion of the written task and the start of the TTE tests.

223 **EEG Recording.** EEG signal was recorded from F3 and F4 sites on the scalp using
224 Ag/AgCl electrodes (Blue Sensor SP, Ambu) connected to a DC amplifier (PET-4,
225 Brainquiry, neuroCare Group) that digitalized the signal at 1000 Hz. The active electrodes
226 were positioned with a stretchable lycra cap in accordance with the 10-20 system (Jasper,
227 1958) and were referenced to linked mastoids, with a ground electrode positioned at FPz. The
228 recording sites were abraded using a blunt needle and a conductive gel was applied, while an
229 abrasive cream (Nuprep, Weaver and Company) and alcohol wipes were used to clean the
230 mastoids and the forehead, before electrodes were attached. Electrode impedance at each site
231 was kept below 10 k Ω . Before completing the written task, five 5 s baseline recordings were
232 taken while participants sat still and maintained their gaze toward a black fixation cross
233 printed on a white background. The power within the alpha frequency band (8-13 Hz) was
234 averaged over the five baseline recordings and across the two sites, F3 and F4, and the value
235 was used to individualize the thresholds for the neurofeedback interventions.

236 **EEG-Neurofeedback Interventions (NFL and NFR Groups).** The neurofeedback
237 interventions consisted of six blocks of two minutes with one minute of rest in between each
238 block. During each block, a computer running Bioexplorer software (Cyberevolution,
239 Brainquiry, neuroCare Group) extracted the signal from each lead and simultaneously
240 calculated the alpha frequency power using a fast Fourier transform algorithm with Hanning
241 windowing function. The signal was 8-13 Hz band-pass filtered using the 6th order
242 Butterworth IIR filter and averaged continuously every 5 ms. The resulting values were then
243 displayed to participants on-screen via bar charts displaying alpha power at the F3 and F4
244 sites and an auditory tone that changed in pitch with changes in the ratio of F3 and F4 alpha
245 power.

246 **NFL Group.** Importantly, for members of the NFL group, the tone was set to silence
247 and the color of the bar changed from red to blue when participants decreased their F3 alpha

248 power by 1.5% and increased their F4 alpha power by 1.5% from their baseline level (blocks
249 1-3), or when they decreased F3 by 3% and increased F4 by 3% (blocks 4-6). Participants
250 were told that decreasing the height of the F3 bar and increasing the height of the F4 bar
251 would silence the tone and that their goal was to silence and keep it silent for as long as
252 possible.

253 **NFR Group.** The procedure for the NFR group was identical except that their goal
254 was to increase the height of the F3 bar and decrease the height of the F4 bar. The tone
255 silenced when they increased their F3 alpha power and decreased their F4 alpha power from
256 baseline by 1.5% (sessions 1-3) and 3% (sessions 4-6). To help ensure the signal was being
257 regulated by cognitive processes and was not contaminated by artifacts, the tone was
258 prevented from silencing in both the NFL and the NFR interventions during any periods
259 where there was $>10\mu\text{V}$ of 50 Hz activity in the EEG signal.

260 **Passive Control Group.** Participants in the passive control group underwent the same
261 procedures as the other groups (i.e., EEG set up, baseline assessment, and written task);
262 however, instead of receiving the neurofeedback training, they watched six 2-min video clips
263 displaying a replay of the neurofeedback session from random participants in the
264 experimental groups (3 from the NFL and 3 from NFR group, ordered randomly and then
265 presented to all participants in a standardized sequence). This ensured that members of the
266 passive control group were exposed to the same auditory and visual stimuli as members of
267 both experimental groups. The passive control group were not given any instructions about
268 controlling the bars on the screen, they were instead told that they were to watch a video of a
269 neurofeedback recording while sitting still and remaining silent.

270 **Cycling Time-to-Exhaustion (TTE) Test.** After the neurofeedback intervention,
271 participants performed a TTE on the cycle ergometer. The test started with a 3-min warm-up
272 with the intensity set at 30% of individuals' PPO. After the warm-up, the intensity was

273 increased automatically to a power output corresponding to 65% PPO and participants were
274 instructed to cycle for as long as they could. Before starting the test, participants were
275 reminded to cycle until exhaustion, to remain sitting in the saddle for the duration of the TTE
276 test and to maintain the cadence between 60 and 110 rpm. No verbal encouragement, or
277 feedback about elapsed cycling time, were provided at any point during any cycling TTE.

278 HR was recorded continuously throughout the TTE using the Polar HR monitor (Polar
279 RS800CX, Polar Electro, Kempele, Finland). HR value in the final 15 s of each minute was
280 recorded and used for analysis. RPE was evaluated using the CR-10 scale (Noble &
281 Robertson, 1996) presented to participants at the final 15 s of every minute of the TTE test.
282 Participants were instructed to rate how hard, heavy and strenuous the cycling TTE test felt at
283 that moment (Marcora, 2010). Three minutes after the end of the TTE test, a 0.5 µl sample
284 of whole fresh blood was taken from the left earlobe and blood lactate concentration was
285 measured with a portable lactate meter (Lactate Pro 2 LT-1730, Arkray, Shiga, Japan).

286 **Psychological Questionnaires.** Upon their arrival (baseline), after the written task
287 and after the interventions, participants completed the following questionnaires:

288 ***Brunel Mood Scale (BRUMS).*** Mood state was recorded using the BRUMS (Terry et
289 al., 2003). The scale includes 24 items divided into 6 subscales (depression, fatigue, vigor,
290 tension, confusion, anger). Participants were instructed to indicate the extent to which they
291 were experiencing the feeling described by the item at that moment in time ('how do you feel
292 right now') using a 5-point scale (0 = *not at all* to 4 = *extremely*). A total score for each
293 subscale was computed by summing the ratings of its respective items. For the purpose of this
294 experiment, we were interested in ratings of fatigue and vigor, and focused our analyses on
295 these subscales.

296 ***State Self-Control Capacity Scale (SSCCS).*** The SSCCS developed by Ciarocco et
297 al. (2004) was used to assess participants' momentary state of self-control. The scale included

298 26 items (e.g., “I feel sharp and focused”) rated on a 7-point Likert-type scale from 1 (*not*
299 *true*) to 7 (*very true*). Higher values were representative of a greater state of self-control (no
300 depletion) while lower values indicated a greater state of depletion.

301 **Data Reduction**

302 **EEG.** Matlab (R2017b) was used to extract EEG data recorded during the
303 neurofeedback and control interventions for statistical analyses. The signal from F3 and F4
304 was down-sampled offline at 256 Hz, and a 1 Hz high pass filter (cut off frequency 0.8 Hz
305 and transition bandwidth 0.4 Hz), and 30 Hz low pass filter (cut off frequency 35 Hz and
306 transition bandwidth 10 Hz), were applied. Continuous EEG data were manually corrected
307 for eye blinks artefacts. Each 2 min block was divided into 2 s epochs (75% overlap) and
308 epochs containing artefacts greater than $\pm 75 \mu\text{V}$ were rejected. The power spectrum was
309 derived from each retained epoch by a fast Fourier transformation using a 100% Hanning
310 windowing function. For each NF block, power within the alpha frequency (8-13 Hz) was
311 averaged across epochs and the resulting values used to compute the index of alpha
312 asymmetry defined as the log-transformed alpha power at F4 minus the log-transformed
313 alpha power at F3 ($\text{Ln} [\text{alphaF3}] - \text{Ln} [\text{alpha F4}]$) (Smith et al., 2017).

314 **HR and RPE.** To give insight into the temporal changes of RPE and HR throughout
315 the cycling TTE test, we split each participant’s TTE test into five time-points; the first time-
316 point corresponded to the end of the first minute of the test, the last four time points
317 corresponded to the 25%, 50%, 75% and 100% of the individual’s total cycling time. For
318 each individual TTE test, the values of HR and RPE attained at the minutes corresponding to
319 the 5 time-points were used for the analysis. To provide further insight into the time-
320 responses of these two variables, we computed the area under the curve (AUC) for RPE and
321 HR using the integrated trapezoid formula (Pruessner et al., 2003). For each individual TTE
322 test, the trapezoid areas were calculated from the values of HR and RPE attained at the

323 minutes corresponding to the 25%, 50%, 75%, 100% of the total time to exhaustion test and
324 the time distance between these points,

325 e.g. $AUC_{RPE} = (RPE_i + RPE_{i+1}) \cdot t_i/2$ where i = height at the start of the quartile, $i+1$ =

326 height at the end of the quartile, and t_i = duration (length) of the quartile (Pruessner et al.,
327 2003).

328 **Statistical Analysis**

329 **Main Analyses.** We performed a 3 (Group) \times 6 (Block) mixed-model ANOVA to
330 assess the effectiveness of the neurofeedback intervention in manipulating frontal asymmetry.
331 We ran planned orthogonal contrasts to compare the TTE achieved by participants in the NFL
332 group with the TTE achieved by participants in the NFR (a form of active control) and CON
333 (passive control) groups. Finally, 3 (Group) \times 5 (Time) ANOVAs were used to examine the
334 effects of neurofeedback on HR and RPE during the cycling TTE test. Planned orthogonal
335 contrasts were used to compare the AUCs for RPE and HR.

336 **Control Analyses.** We also performed a number of control analyses. First, to check
337 that our random assignment was successful in balancing the groups at baseline, we subjected
338 fitness levels, anthropometric characteristics, baseline alpha-asymmetry, fatigue, vigor and
339 self-control to one-way between-group ANOVAs. Second, to ensure that our written task and
340 our neurofeedback interventions had a similar effect on the self-control, fatigue and vigor of
341 participants, we tested these self-report measures with 3 (Group) \times 3 (Time; baseline, post-
342 written task, post neurofeedback) ANOVAs. Finally, to check that all participants reached a
343 similar level of exhaustion at the end of each TTE test, mean cadence, RPE at exhaustion, HR
344 at exhaustion, and blood lactate at exhaustion were analyzed with one-way between group
345 ANOVAs. In all cases the assumptions of homoscedasticity and sphericity were tested with
346 Levene and Mauchly tests and results were reported with the appropriate corrections
347 (Welch's F and Greenhouse–Geisser correction) applied when the assumptions had not been

348 met. The nonparametric Kruskal-Wallis test was used on data that did not meet the
349 assumption of normality as assessed with the Shapiro-Wilk test. Significant interactions were
350 investigated with planned contrasts. For all analyses, statistical significance was set at p
351 ≤ 0.05 and the effect sizes were reported as partial eta squared (η_p^2) and Hedges's g_s (Lakens,
352 2013).

353 Results

354 Alpha asymmetry

355 The 3 (Group) \times 6 (Block) ANOVA on the alpha asymmetry indices revealed a
356 significant interaction, $F(6,116)=2.29$, $p=.038$, $\eta_p^2=.11$. Post-hoc planned contrasts revealed a
357 significant difference in alpha asymmetry between the NFL and NFR groups in blocks 4,
358 $t(37)=2.10$, $p=.043$, $g_s=.65$ and 5, $t(37)=2.64$, $p=.012$, $g_s=.82$. Accordingly, alpha asymmetry
359 scores in the two active groups diverged as the intervention progressed, with the NFL group
360 manifesting more left-sided frontal cortical activity, and the NFR group more right-sided
361 frontal cortical activity in the last three blocks of the neurofeedback intervention. This
362 indicates that our neurofeedback intervention was successful in establishing two distinct
363 frontal asymmetry groups immediately prior to the TTE. This effect is illustrated in Figure 1.

364 ** Insert Figure 1 about here **

366 Cycling time to exhaustion test

367 Results of the TTE tests are summarized in Figure 2. We hypothesized that the NFL
368 group would outperform the NFR and passive control groups. Orthogonal planned contrasts
369 confirmed that the NFL group performed significantly better than the other two groups, $t(37)$
370 $=2.03$, $p=.050$, $g_s=.64$, while the performance of the NFR and the passive control groups did
371 not differ from each other, $t(37)=0.33$, $p=.744$, $g_s=.10$.

372 ** Insert Figure 2 about here **

373

374 **RPE and HR**

375 The 3 (Group) \times 5 (Time) ANOVAs performed on the RPE and HR values revealed a
376 main effect of time on RPE, $F(3,101)=400.25$, $p<.001$, $\eta_p^2=.91$, and HR, $F(2, 63)=270.55$,
377 $p<.001$, $\eta_p^2=.88$. As expected, both variables increased significantly at every time point.
378 There was also a significant effect of group for RPE, $F(2, 37)=3.54$, $p=.039$, $\eta_p^2=.16$. Post
379 hoc tests indicated that RPE in the NFL group (6.8) did not differ significantly from that in
380 the other groups, $p=.719$; however, RPE in the CON group (7.6) was significantly higher
381 than RPE in the NFR group (6.4), $p=.012$. The HR data yielded no significant differences
382 between groups ($F(2,36)=0.91$, $p=.412$, $\eta_p^2=.05$). No significant Group \times Time interactions
383 emerged. Effects are summarized in Figure 3A and 3B.

384 Overall, the AUC for RPE and HR were greater in the NFL compared to the other two
385 groups, but contrast tests did not reach the statistical level for significance, RPE: $t(37)=1.84$,
386 $p=.074$ and HR: $t(36)=1.74$, $p=.090$. This reflects the greater amount of total work performed
387 by participants in NFL and implies a slower rate of increase in RPE and HR in the NFL group
388 (see Figure 3C and 3D).

389 ** Insert Figure 3 about here **

390

391 **Control Analyses**

392 Our control analyses are reported in full in the digital supplementary material (see
393 Experiment 1A, Results, Supplementary Material). In brief, there were no baseline
394 differences between the groups on any measures, indicating that our randomization was
395 effective (see Table 1). The 3 (Group) \times 3 (Time) ANOVAs performed on the self-report
396 measures of fatigue, vigor and state of self-control revealed no main effects for group and no
397 Group \times Time interactions. There were main effects for time, indicating that self-control and

398 vigor decreased, and fatigue increased after the writing task and tended to increase again after
399 the intervention. This confirmed that all our participants were in a similar state of fatigue and
400 mild cognitive depletion prior to commencing the cycling TTE test. Finally, there were no
401 group differences in the mean cadence or in any of the physiological assessments made at
402 exhaustion, confirming that all groups reached a similar level of physiological fatigue at the
403 end of the cycling TTE test (see Experiment 1A, Table S2, Supplementary Material).

404 **Conclusion and Introduction to Experiment 1B**

405 The results from Experiment 1A showed that EEG-neurofeedback can be used to non-
406 invasively modify frontal hemispheric asymmetry. More importantly, they suggested that
407 greater relative left frontal cortical activity enhanced cycling-based endurance exercise
408 performance. However, between-person variability in many psychophysiological signals can
409 be high such that some researchers have argued that within-person designs are preferred (e.g.,
410 Jennings et al., 2007). As such, to examine the replicability and robustness of our finding, we
411 followed up Experiment 1A with a fully repeated measures design in Experiment 1B.

412 **Experiment 1B: Within-Subject Design**

413 **Materials and Methods**

414 **Design, Participants, and Procedures**

415 A cross-over, single-blind, counterbalanced design was used for the second
416 experiment whereby the same individuals who had received the EEG-neurofeedback
417 interventions in Experiment 1A (groups NFL and NFR) were tested for a third experimental
418 session. The twenty-six NFL and NFR participants ($n = 17$ males and $n = 9$ females) from
419 Experiment 1 performed the additional, third experimental visit. This was identical to the
420 second experimental session described in Experiment 1A (see visit 2 above for details),
421 except that participants received the opposite neurofeedback intervention in this additional
422 session. Accordingly, in Experiment 1B, all 26 participants received both the NFL and NFR

423 interventions on separate occasions, allowing for within-subject comparisons. The order of
424 the two visits was counterbalanced across participants, who were scheduled at the same time
425 of day to control for possible circadian rhythm effects on physical performance and alpha
426 asymmetry. Participants were allowed a minimum of 3 days and a maximum of 3 weeks from
427 the previous experimental session to perform the additional visit. This design is illustrated in
428 Figure S1 alongside the Consolidated Standards of Reporting Trials (CONSORT) checklist
429 for crossover trials (Supplementary Material). Participants were asked to keep their training
430 routine consistent throughout their involvement in the study. All apparatus, measures and
431 other procedures were identical to those reported in Experiment 1A.

432 **Data Reduction**

433 **HR and RPE.** The HR and RPE values attained in each TTE test at the minutes
434 corresponding to the 25%, 50%, 75% and 100% of the total endurance time were used for the
435 within-subject comparison ('relative iso-time' in Nicolò et al., 2019). For the first time point,
436 we used the values recorded at the end of the first minute of each test. In addition, AUCs
437 were derived from RPE and HR data recorded during the TTE with the same formula
438 described in Experiment 1A (see data reduction above).

439 **Statistical Analysis**

440 **Main Analyses.** In accord with our fully within-subject design, we performed 2
441 (Condition) \times 6 (Block) repeated measures ANOVA to assess the effectiveness of our
442 neurofeedback intervention in manipulating frontal asymmetry. We performed a paired-
443 samples (i.e., repeated measures) *t*-test to compare the TTE achieved by participants during
444 the NFL and NFR conditions. Finally, we performed 2 (Condition) \times 5 (Time) ANOVAs to
445 examine the effects of neurofeedback on RPE and HR throughout each cycling TTE test and
446 paired sample *t*-test to test the effect of neurofeedback on AUC for RPE and HR.

447 **Control Analyses.** Paired samples t -tests were used to compare baseline vigor and
448 fatigue, self-control, and alpha-asymmetry across the two experimental visits. Paired samples
449 t -tests also compared mean cadence, and HR, RPE and blood lactate level at exhaustion. We
450 employed separate 2 (Condition) \times 3 (Time; baseline, post written task, post neurofeedback)
451 repeated measures ANOVAs to examine the effect of the writing task and the neurofeedback
452 interventions on reported self-control, fatigue, and vigor. Finally, to examine the potential for
453 sequence effects within the crossover design (Wellek & Blettner, 2012), we performed a 2
454 (Order; AB and BA) \times 2 (Condition) mixed-model ANOVA on TTE where condition (NFL,
455 NFR) was a within-subject factor and order was entered as a between-subject factor (order A
456 = participants who completed NFL on visit 1 and NFR on visit 2; order B = participants who
457 completed NFR on visit 1 and NFL on visit 2). This was followed by separate paired-samples
458 t -tests for each order. Significant interaction effects were investigated with orthogonal
459 contrasts. For all analyses, statistical significance was set at $p \leq 0.05$ and effect sizes were
460 estimated with Cohen's d_{av} calculated with the average standard deviation and corrected as
461 Hedges's g_{av} (see Formula 10, Lakens, 2013).

462 **Results**

463 **Alpha asymmetry**

464 A 2 (Condition) \times 6 (Block) ANOVA performed on the alpha asymmetry indices
465 revealed a significant main effect of condition, $F(1,25)=4.81$, $p=.038$, $\eta_p^2=.16$. Alpha
466 asymmetry was significantly greater (and positive; $0.14 \pm 0.28 \mu\text{V}\cdot\text{Hz}^{-1}$) indicating dominant
467 left-sided frontal cortical activity in the NFL condition, compared to the NFR condition (-
468 $0.02 \pm 0.16 \mu\text{V}\cdot\text{Hz}^{-1}$), where the smaller (and negative) score indicates dominant right-sided
469 frontal activity. This finding confirms that our neurofeedback intervention was effective in
470 establishing two distinct asymmetry conditions, and the effect emerged across all blocks (Fig.
471 4). There was no Block main effect or Block \times Condition interaction.

472 ** Insert Figure 4 about here **

473

474 **Time to Exhaustion**

475 The TTE test was longer in the NFL condition (1167 ± 831 s) compared to the NFR
476 condition (1049 ± 638 s). This difference, 118 s, 95% CI [14, 221] was significant,
477 $t(25)=2.34, p=.028, g_{av}=.16$, supporting our finding in Experiment 1A.

478 **RPE and HR**

479 The 2 (Condition) \times 5 (Time) ANOVAs performed on the RPE and HR values
480 revealed a significant main effect of time (RPE: $F(2,60)=312.26, p <.001, \eta_p^2=.93$; HR:
481 $F(2,35)=178.21, p<.001, \eta_p^2=.89$). Both RPE and HR increased significantly at every time
482 point (p -values of the repeated contrasts between time points were $<.001$). There were no
483 significant effects of condition, or Condition \times Time interactions for either RPE, or HR.
484 These results are summarized in Figure 5A and 5B.

485 Areas under the curves were greater in the NFL condition compared to the NFR
486 condition for both HR, $t(22)=2.51, p=.020, g_{av}=.17$, and RPE, $t(24)=2.52, p=.019, g_{av}=.12$
487 (Figure 5C and 5D). Given the aforementioned empirical findings (i.e., lack of quartile
488 differences and significant TTE effect) and the visual representation in Figures 5C and 5D, it
489 would appear that when participants were under the NFL condition, they persisted on the
490 cycling task for longer demonstrating a suppressed rate of increase in RPE and HR.

491 ** Insert Figure 5 about here**

492

493 **Control Analyses**

494 Our control analyses are reported in full in the digital supplementary material
495 (Experiment 1B, Results, Supplementary Material); they confirmed our expectations. In brief,
496 there were no baseline differences across the conditions, indicating that participants reported

497 to the laboratory in a similar state for both of their experimental visits. The 2 (Condition) \times 3
498 (Time) ANOVA performed on the self-report measures of fatigue, vigor and state of self-
499 control capacity revealed no main effects for Condition and no Condition \times Time interaction.
500 There were main effects for Time, indicating that self-control and vigor decreased, and
501 fatigue tended to increase after the writing task and the neurofeedback intervention. This
502 confirmed that our participants were in a similar state of mild cognitive depletion prior to the
503 cycling TTE in both conditions. There were no differences in the mean cadence of the TTE
504 tests or in any of the physiological assessments made at exhaustion, confirming that
505 participants displayed a similar level of physiological fatigue in both conditions (see
506 Experiment 1B, Table S3, Supplementary Material). Finally, the 2 (Order) \times 2 (Condition)
507 mixed-model ANOVA performed on TTE confirmed the previously reported main effect for
508 condition, where TTE was significantly greater in NFL than in NFR. There was no effect of
509 Order and no Order \times Condition interaction. Paired samples *t*-tests confirmed that the effect
510 of condition was similar irrespective of the order in which participants completed the
511 neurofeedback interventions. This provides some assurance that the beneficial effects of the
512 NFL intervention on TTE were not bias by sequence or carryover effects (Wellek & Blettner,
513 2012).

514 **General Discussion**

515 **Main Findings**

516 This is the first investigation to assess the effect of neurofeedback on whole-body
517 endurance exercise performance. The results from both datasets provide consistent evidence
518 that increasing relative left frontal cortical activity (NFL) via EEG-neurofeedback has a
519 beneficial effect on endurance exercise performance. In Experiment 1A, participants who
520 received this NFL intervention were able to cycle for approximately six minutes (about 30%)
521 longer than participants who received either an increase in relative right frontal cortical

522 activity (NFR) via neurofeedback, or the passive control group (CON) who received no
523 neurofeedback intervention. This finding was replicated in Experiment 1B using a within-
524 subject design when the same individuals performed the TTE test after receiving both NFL
525 and NFR on separate occasions. In this instance, participants cycled for approximately two
526 minutes (11%) longer in the NFL condition compared to the NFR condition.

527 Importantly, in Experiment 1A, TTE performance was not significantly different
528 between the NFR and CON groups. Therefore, we can exclude the possibility that the NFL
529 performance improved simply because individuals underwent a neurofeedback intervention
530 per se (e.g., placebo effect), or due to mechanisms underlying the neurofeedback training
531 (e.g., operant conditioning). Also, the physical stimuli during the interventions were the same
532 across conditions, adding further evidence to indicate that the significant effect of NFL on
533 performance was due to changes in frontal asymmetry (i.e., were genuine) rather than any
534 other features associated with the experimental protocol (e.g., auditory and visual stimuli).

535 A more invasive brain stimulation method, transcranial direct current stimulation
536 (tDCS) has been reported to elicit either a 23% improvement (Angius et al., 2018), or no
537 improvement (Angius et al., 2015) of endurance performance when assessed using a within-
538 subject design. However, ethical concerns that have been raised about tCDS may limit its
539 mass uptake in applied settings (e.g., Davis, 2013). Our findings are the first to confirm that a
540 non-invasive approach to modifying brain activity via EEG-neurofeedback could offer a
541 practical and realistic performance enhancing alternative for individuals or situations where
542 tCDS is not acceptable, or viable.

543 **Mechanisms**

544 In the current study, as expected, HR and perceived effort during the TTE test
545 increased over time and reached on average 96% and the 100% of their maximal values,
546 respectively. Contrary to our hypothesis, NFL did not significantly reduce perception of

547 effort during any TTE. Specifically, ANOVAs failed to reveal the expected Group x Time
548 (Experiment 1A) or Condition x Time (Experiment 1B) interactions for RPE. While previous
549 studies show that psychological interventions can improve endurance exercise performance
550 by reducing perception of effort during the task (Blanchfield et al., 2014), the results of our
551 study suggest that EEG-neurofeedback may act in a different way. Rather than reducing
552 perception of effort, NFL may instead have supported participants to exercise for longer
553 while experiencing a high level of effort. Hence, NFL allowed participants to perform a
554 greater amount of physical work when fulfilling their goal to exercise for as long as possible.
555 To provide some support for this interpretation, we found differences in AUC of RPE and HR
556 which were marginally greater for NFL compared to NFR and CON in Experiment 1A and
557 significantly greater after NFL compared to NFR in Experiment 1B. Since the absolute levels
558 of RPE and HR at the end of each quartile of exercise were the same between groups and
559 conditions (i.e., no ANOVA interactions), the greater AUC for NFL can be attributed to
560 differences in the length (i.e., time; longer in NFL) rather than the height (i.e., RPE and HR)
561 factors in the AUC formula. Figures 3 and 5 illustrate this effect and reveal a slower rate of
562 increase in RPE and HR for NFL, reflecting the longer time taken to reach the same terminal
563 levels as achieved after NFR or CON, implying greater sustained effort in NFL than in NFR
564 or CON. Although we reported discrepant findings between our AUC and the traditional
565 ANOVA approach to analyzing time-series data in endurance studies, these were highly
566 informative. We encourage researchers to further explore the merits of the AUC approach in
567 future endurance-oriented experiments.

568 At a cortical level, our results imply that NFL prompted a neurophysiological shift
569 towards approach motivation and increased behavioral persistence. This perspective is
570 supported by the fact that our NFL neurofeedback intervention led to significantly greater
571 left-sided frontal cortical activity. Pertinently, relative left frontal cortical activity is involved

572 in approach motivation, which is considered to represent the tendency to move toward
573 something (Harmon-Jones & Gable, 2018). Approach-related processes engage the same
574 neural activation underlying local attentional scope. Specifically, relative left frontal-central
575 asymmetry induced by approach-related stimuli predicted narrowed attentional scope
576 (Harmon-Jones & Gable, 2009) which could assist goal-directed action by narrowing the
577 attention toward task-relevant information (Gable & Harmon-Jones, 2010) and increasing
578 cognitive stability and persistence (Liu & Wang, 2014). For example, in the context of the
579 current endurance exercise, left-sided frontal activity may help individuals maintain focus
580 and engagement with their progressively more painful and fatiguing task, thereby delaying
581 the urge to withdraw and stop. Consistent with this interpretation, Schiff et al. (1998) used a
582 lateral muscular hand contraction to modify asymmetric frontal cortical activity and found
583 higher persistence on an unsolvable puzzle after the right lateral muscular contractions (said
584 to increase left cortical activity) compared to the contralateral contraction and passive
585 control. Taken together these findings suggest that greater relative left frontal cortical
586 activity, following NFL, facilitated cognitive control by delaying attentional disengagement.
587 This, in turn, would allow individuals to allocate attention towards coping with the increasing
588 time-on-task demand of exercise helping them to tolerate high effort for longer. Further
589 support for this may be gleaned from the fact that activation of the left dorsolateral prefrontal
590 cortex (DLPFC) has been found when individuals implemented cognitive control to form and
591 maintain task-goal representation of the Stroop test (MacDonald et al., 2000). Similarly,
592 Bekerman and Lieberman (2010) used fMRI while participants performed a virtual task to
593 examine the relationship between asymmetric brain activation, stimulus valence, and
594 motivational direction. They found that relative left frontal activation of the DLPFC was
595 associated with action (eat), independently from the stimulus valence (pleasant food or
596 disgusting food). Because relative left frontal activity increased in response to approach-

597 related actions coupled with both positive stimuli and negative stimuli, the authors argued
598 that left-sided activity in the DLPFC should be involved in self-regulatory processes relevant
599 for successful goal pursuit.

600 In addition to being interpretable via models of approach and avoidance motivation,
601 our effects are also broadly in accordance the valence model (Heller, 1993) and the capability
602 model (Coan et al., 2006) of frontal hemispheric asymmetry. The valence model argues that
603 increased left-sided frontal asymmetry elicits more positively valenced emotions, and
604 previous research has demonstrated that greater positive emotions can facilitate endurance
605 performance (e.g., Hutchinson et al., 2018). However, the valence hypothesis has been
606 challenged by research demonstrating that while left-frontal activation is associated with
607 some positive emotions, it is also associated with the negative emotion of anger (Harmon-
608 Jones, 2003; Harmon-Jones & Allen, 1998; Hortensius et al., 2012). Accordingly, frontal
609 asymmetry may not be associated with valence per se, rather it reflects the motivational
610 system engaged by that stimulus or situation (Davidson & Irwin, 1999). This is why we
611 preferred the approach and avoidance motivational account of frontal asymmetry to the
612 valence model.

613 The capability model proposes frontal hemispheric asymmetry as a predictor of
614 individual capability for displaying certain affective styles (Coan et al., 2006). More
615 specifically, it predicts that individuals displaying greater left over right frontal activation
616 will also have more positive affective responses to external situations or stimuli, whereas
617 individuals reporting greater right over left frontal activation, within the same context, will
618 experience more negative affective responses (see Coan et al., 2001). As positive affect can
619 enhance endurance (Hutchinson et al., 2018), our results could be interpreted as supportive of
620 the capability model. Future research could incorporate features to tease apart the capability
621 model and the approach and avoidance model to shed more light on which of these

622 explanations provides the mechanism that underlies the effects of hemispheric asymmetry
623 neurofeedback on performance.

624 **Limitations and Future Directions**

625 Despite the encouraging findings provided, some limitations should be considered
626 when interpreting the results. Firstly, from a theoretical perspective, cortical activity was
627 measured during the neurofeedback procedure, but not afterwards, nor during the physical
628 task. Therefore, despite confirming the validity of a single session of EEG-neurofeedback
629 (Peeters et al., 2014), we can only assume that the neural changes induced during the single
630 session of neurofeedback persisted throughout the exercise. Further research is warranted to
631 assess the longevity of neurofeedback training effects and provide additional support for the
632 relationship between frontal asymmetric cortical activity and performance.

633 Secondly, our theory-driven approach was focused on perception of effort. However,
634 it may be possible that other psychological variables mediated the effect of the frontal
635 asymmetric cortical activity during the exhaustive cycling task. In this regard, Allen et al.
636 (2001) demonstrated that neurofeedback to modify asymmetric frontal cortical activity
637 altered self-reported emotional responses elicited by external stimuli. It is well-known that
638 feelings can change throughout the exercise (Hardy & Rejeski, 1989) and influence
639 performance (e.g. Hutchinson et al., 2018); therefore, future studies should assess affective
640 responses during endurance exercise following this neurofeedback intervention. Similarly,
641 additional markers of approach motivation could be assessed to further investigate the
642 psychological mechanisms underlying the relationship between asymmetric frontal cortical
643 activity and behavior (see Harmon-Jones & Gable, 2018).

644 It should be noted that due to the intended design of our experiment, our effects
645 emerged when participants entered exercise in a state of mild cognitive depletion and fatigue,
646 as indicated by the reduction in self-reported self-control that remained lower than baseline

647 after the manipulation. Thus, our performance results suggest that the left-sided frontal
648 cortical asymmetry may be particularly relevant when effort is aggravated by prior fatigue.
649 However, it would be useful for future research to replicate our experiments without prior
650 fatigue and/or with varying levels of prior fatigue to test the generalizability of our findings.
651 One could argue that any benefits of neurofeedback on physical endurance could be stronger
652 without any prior cognitive fatigue since this could help participants achieve more intense left
653 frontal activation during the neurofeedback intervention, beyond the levels achieved here.
654 These predictions await future testing.

655 The sample of the present study comprises recreational athletes, as such, it is not clear
656 if the effect found will generalize to elite athletes. On the one hand, elite athletes are already
657 closer to their endurance limits than recreational performers, possibly creating a ceiling with
658 less scope for neurofeedback (or any) intervention benefits to manifest. On the other, the
659 reduced between- and within-person variability displayed by elite compared to recreational
660 performers may render greater scope for statistically meaningful “marginal gains” to emerge
661 in elite performers. This can be tested by future research.

662 **Practical Applications**

663 From an applied perspective, our data support the use of EEG-neurofeedback in the
664 context of endurance performance and indicate that the application of EEG-neurofeedback
665 for as little as 12 minutes could offer a safe and ethically viable approach to performance
666 enhancement for athletes who engage in endurance exercise events lasting for around 20
667 minutes. In addition, Ring et al. (2015) reported that athletes undergoing repeated sessions of
668 neurofeedback training could learn to regulate their own cortical activity even when they are
669 not receiving the physical feedback. This offers a valuable advantage in an applied setting
670 where athletes might eventually be able to reproduce the performance-boosting brain activity
671 without any equipment, following a short period of neurofeedback training.

672

Conclusion

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Appendix

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Supplementary Material

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Complete results of control analyses are presented in the Supplementary Material.

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Table 1.

Descriptive Statistic and One-Way ANOVA of the Demographic Characteristics and Baseline Variables.

Measure	NFL	NFR	CON	<i>p</i>
	<i>M (SD)</i>	<i>M (SD)</i>	<i>M (SD)</i>	
n	13	13	14	
Age (yr)	27 (6)	27 (7)	27 (8)	.977
Weight (kg)	74.0 (11.2)	73.9 (18.4)	70.5 (9.4)	.741
Height (m)	1.76 (0.06)	1.73 (0.09)	1.75 (0.10)	.793
BMI (kg·m ⁻¹)	24 (4)	24 (5)	23 (2)	.623
$\dot{V}O_2$ max (ml·kg·min ⁻¹)	46.8 (12.4)	43.0 (11.6)	45.7 (9.4)	.672
PPO (W)	278 (82)	254 (70)	285 (76)	.556
Max HR (bpm)	176 (6)	174 (10) ^a	175 (10)	.674
Fatigue (BRUMS)	2.5 (2.3)	3.3 (3.1)	3.7 (3.2)	.528
Vigor (BRUMS)	8.7 (1.9)	7.8 (4.1)	8.21 (2.8)	.752
SSCCS	142 (13)	139 (20)	135 (21)	.620
Alpha Asymmetry (a.u.)	0.02 (0.09)	0.00 (0.10)	- 0.01 (0.05)	.542

Note. NFL = neurofeedback to increase relative left cortical activity group; NFR = neurofeedback to increase relative right cortical activity group; CON = passive control group; BMI = Body Mass Index; $\dot{V}O_2$ max = Maximal oxygen consumption; PPO = Peak Power Output; SSCCS = State of Self-Control Capacity Scale.

^a n = 12 because of recording problems during the test.

There were not significant differences between group.

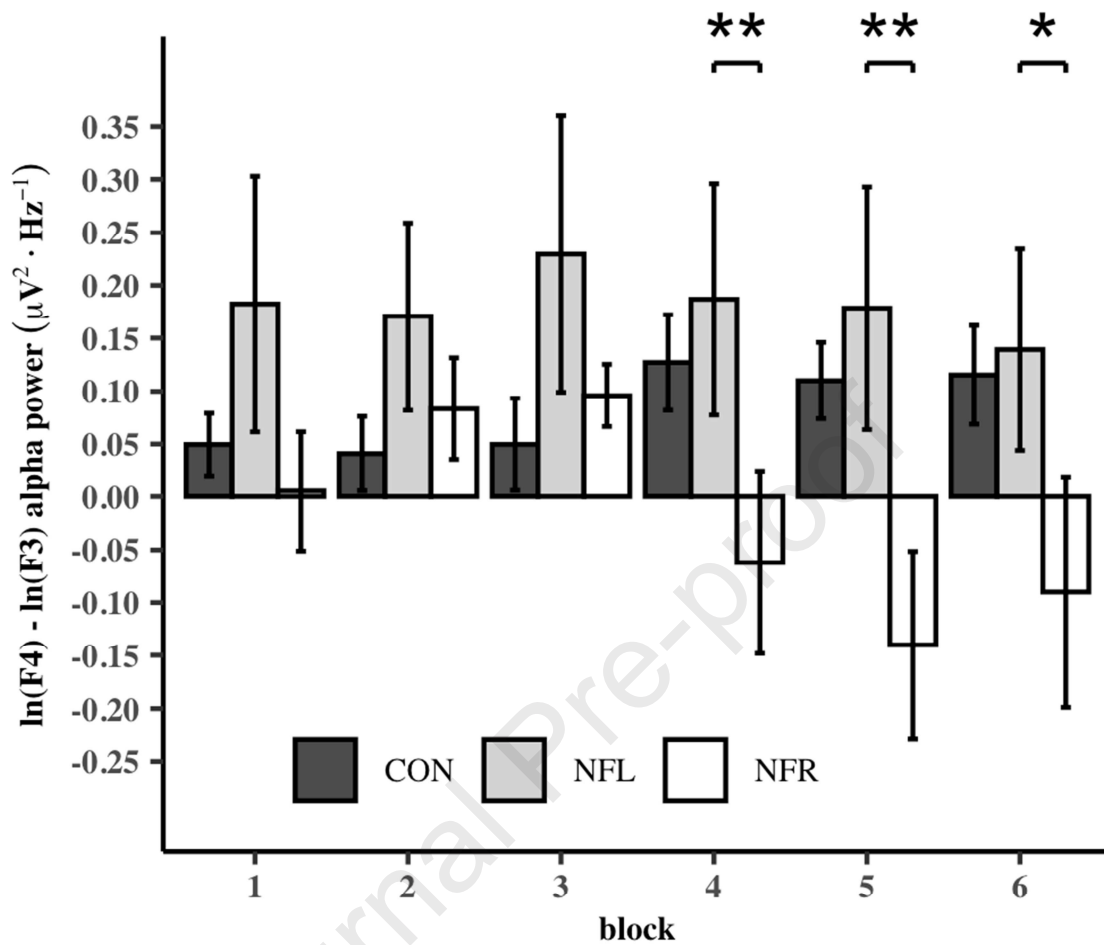


Figure 1

Frontal Alpha Asymmetry, Experiment 1A.

Note. Average value of 2-min six intervention blocks for each group, increase relative left, NFL, increase relative right, NFR, frontal cortical activity and passive control CON group, means and SE.

*Differences between groups NFL and NFR (**p <.05 and * p <.10).

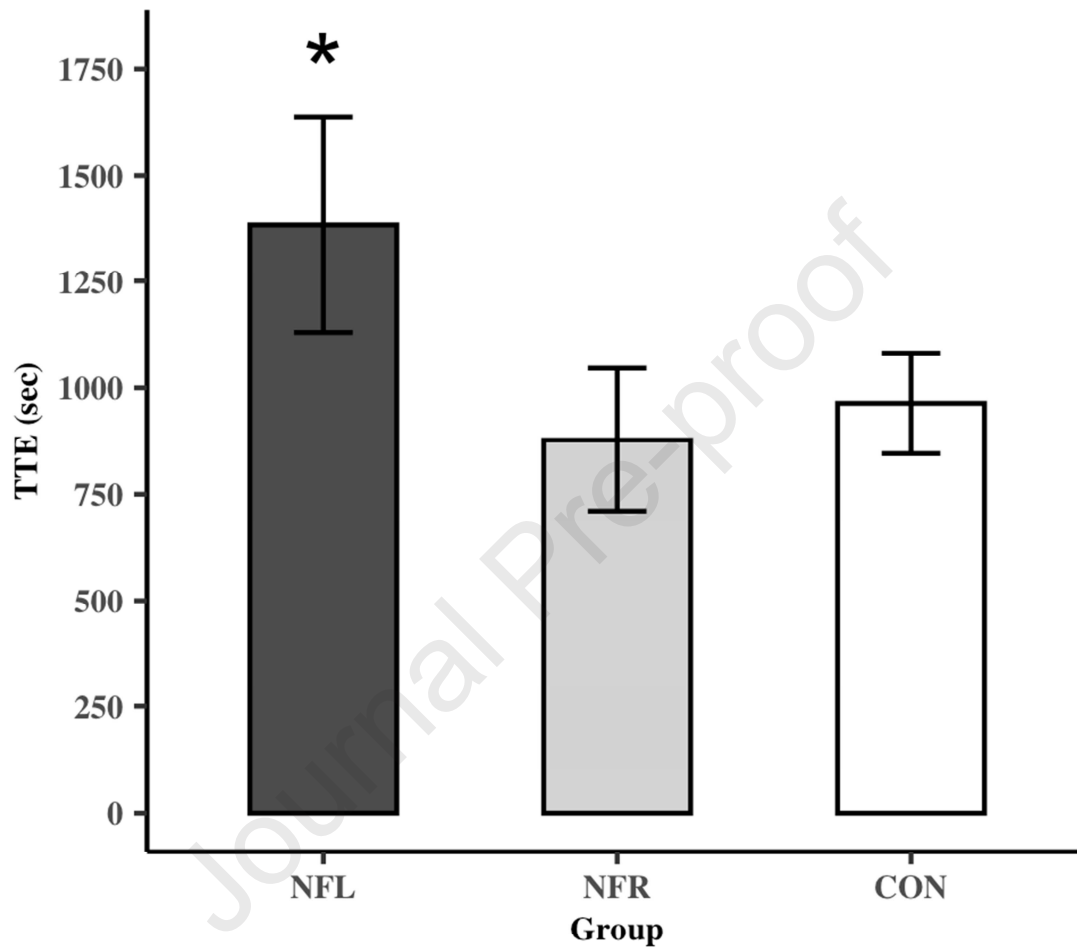


Figure 2

Effect of EEG-Neurofeedback on Time-to-Exhaustion, Experiment 1A.

Note. Mean \pm SE for each group, increase relative left, NFL, increase relative right, NFR, frontal cortical activity and passive control CON group.

* Significant difference between NFL and controls group, NFR and CON ($p = .05$).

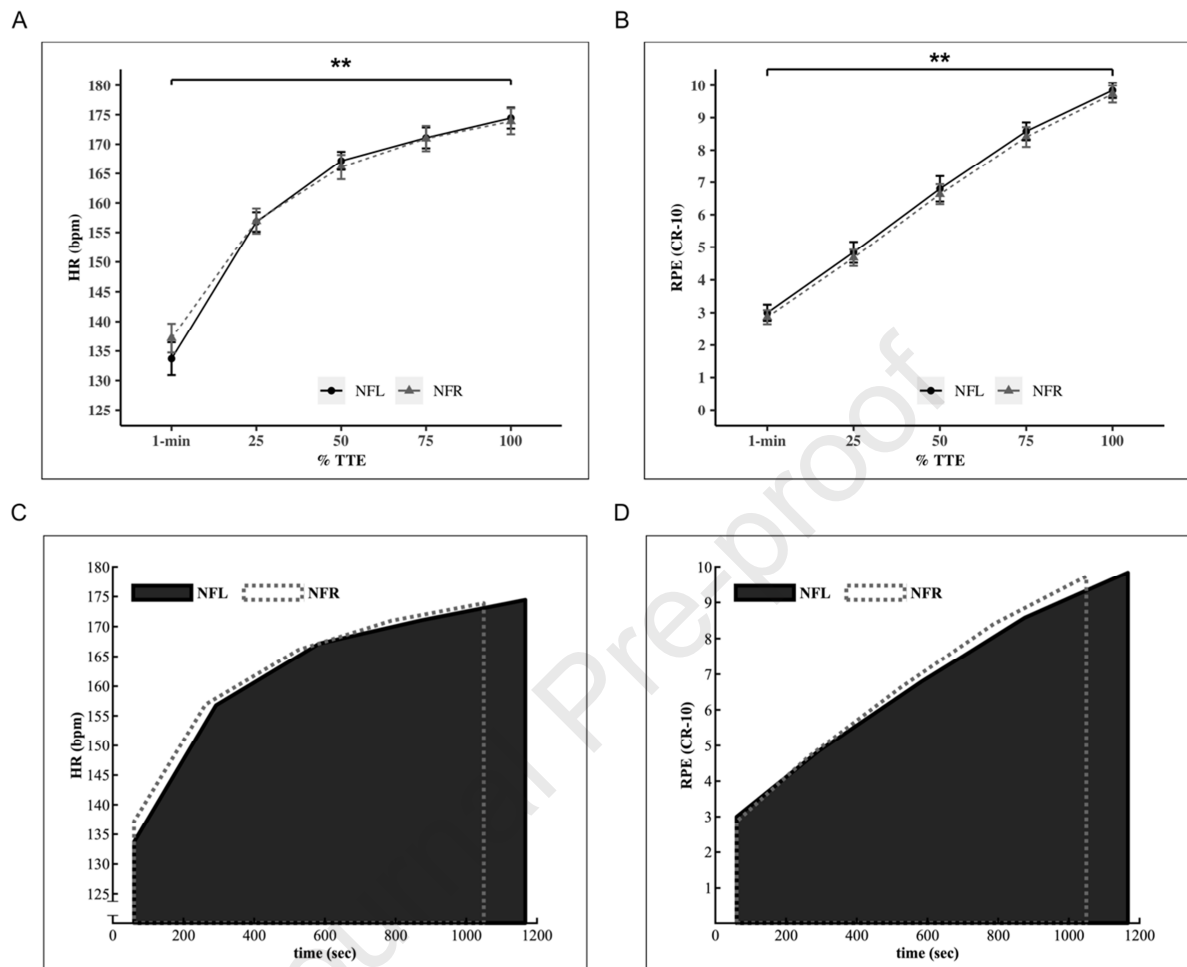


Figure 3

Heart Rate (A) and Rating of Perceived Effort (B) during TTE and Area Under the Curve of HR (C) and RPE (D), Experiment 1A.

Note. Means and SE, at first minute and 25%, 50%, 75% and 100% of TTE test for each group. **Significant main effect of time ($p < .001$);

Significant difference between groups NFR and CON ($p = .012$).

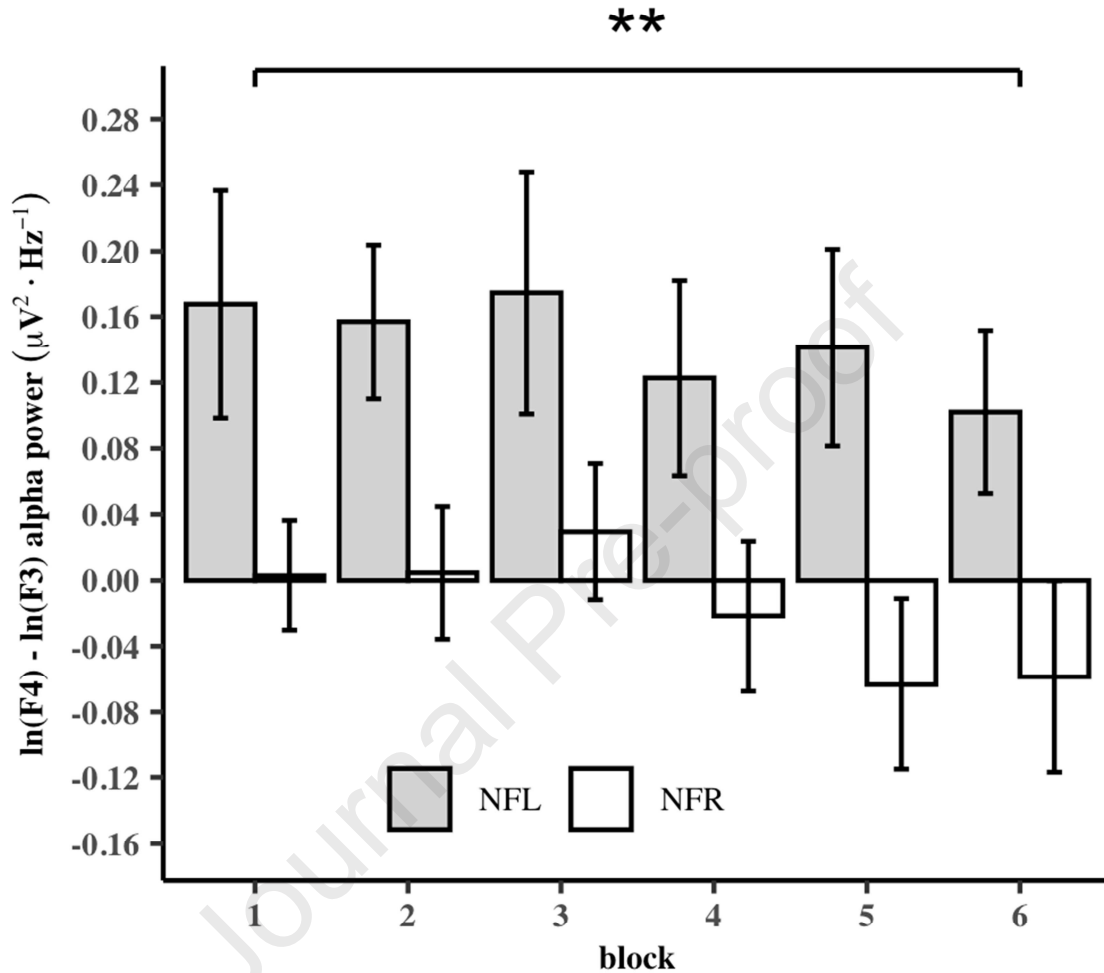


Figure 4

Frontal Alpha Asymmetry, Experiment 1B.

Note. Average value of 2-min six neurofeedback blocks for each condition, increase relative left, NFL, increase relative right, NFR, frontal cortical activity, means and SE.

*Significant main effect of condition ($p=.038$).

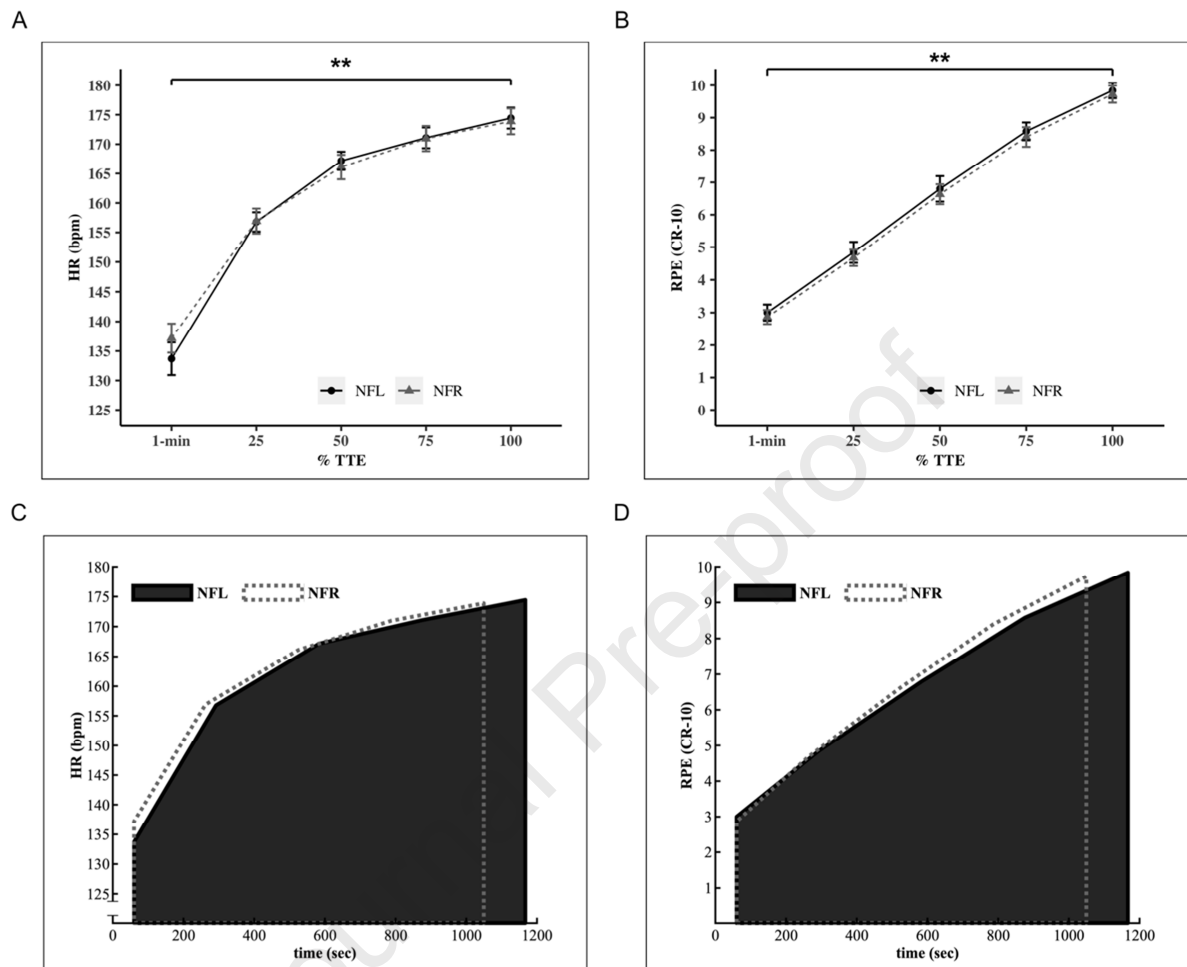
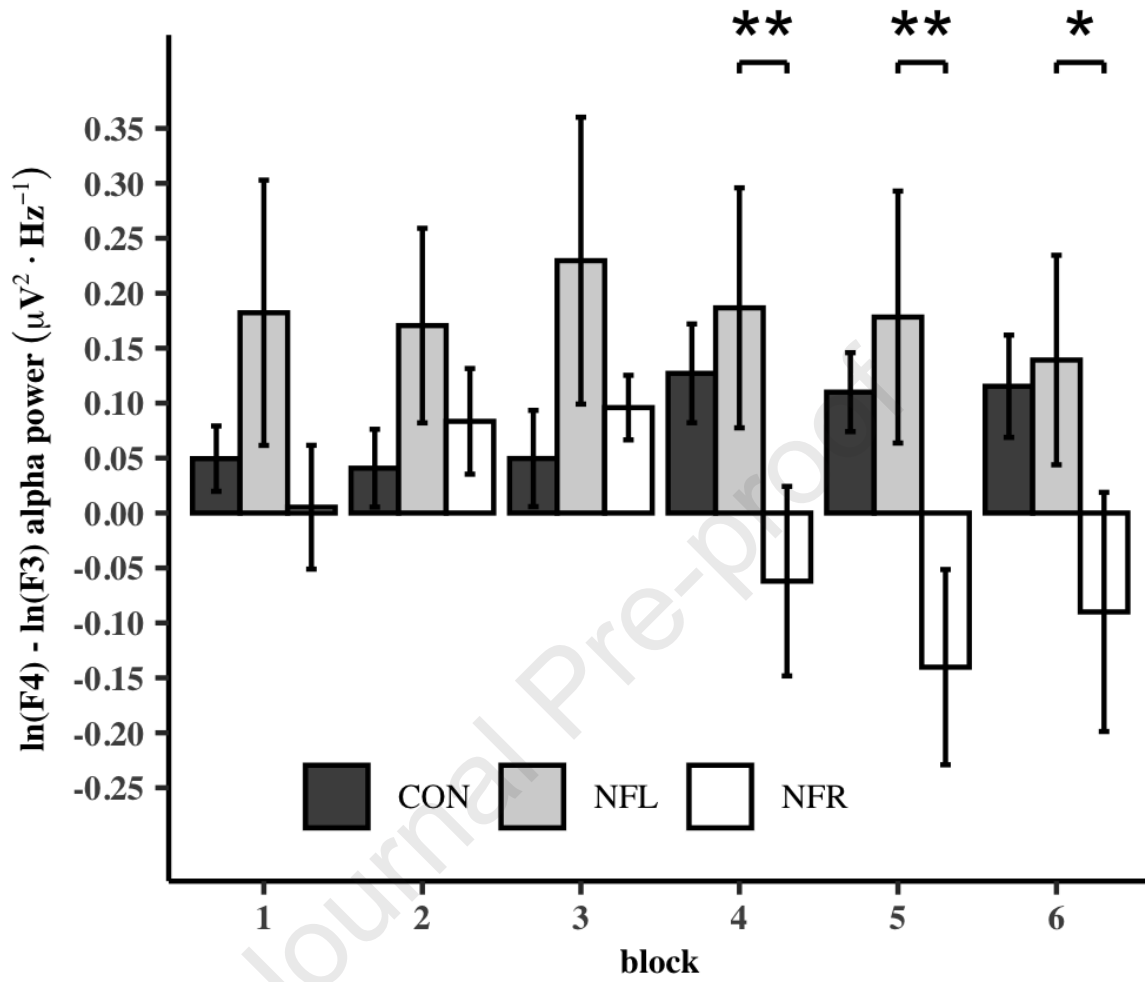


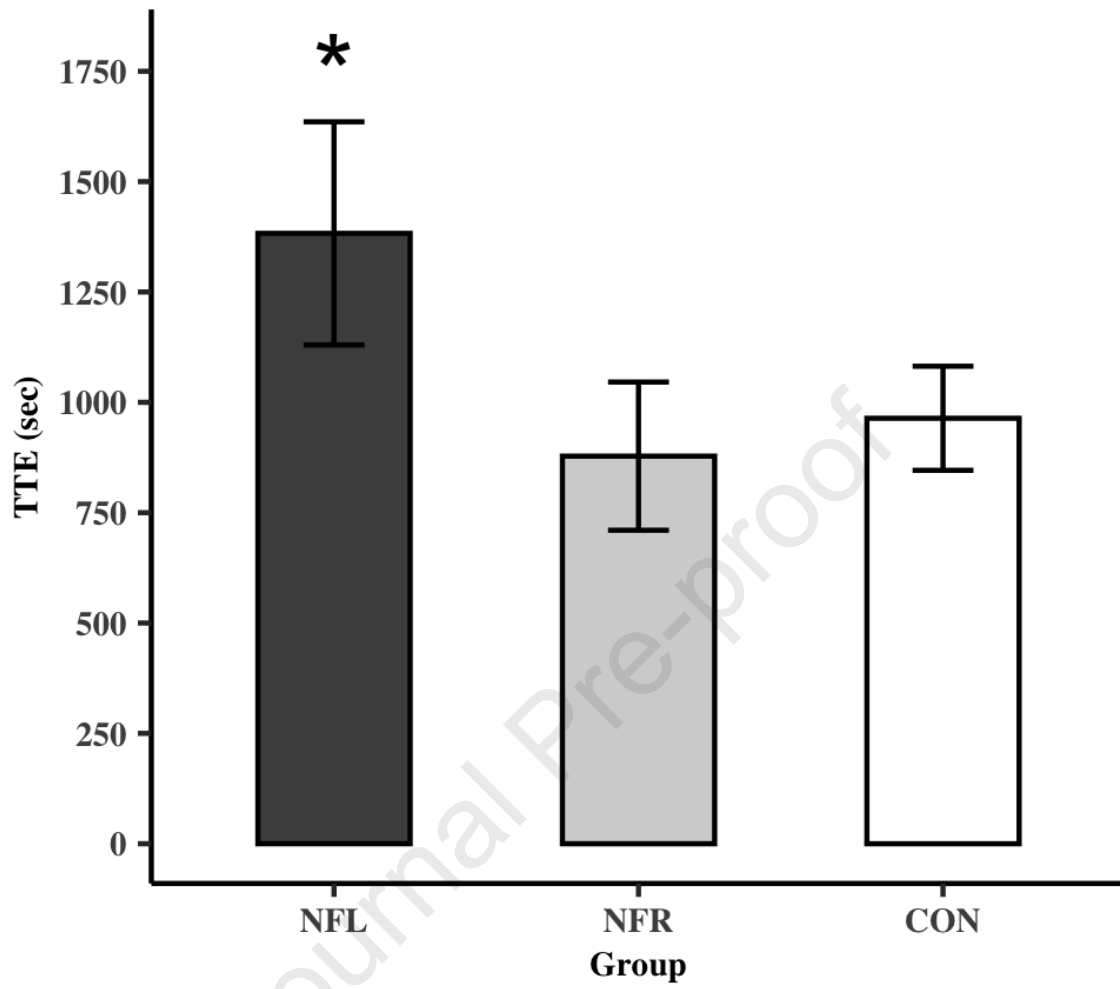
Figure 5

Heart Rate (A) and Rating of Perceived Effort (B) during TTE and Area Under the Curve of HR (C) and RPE (D) during TTE, Experiment 1B.

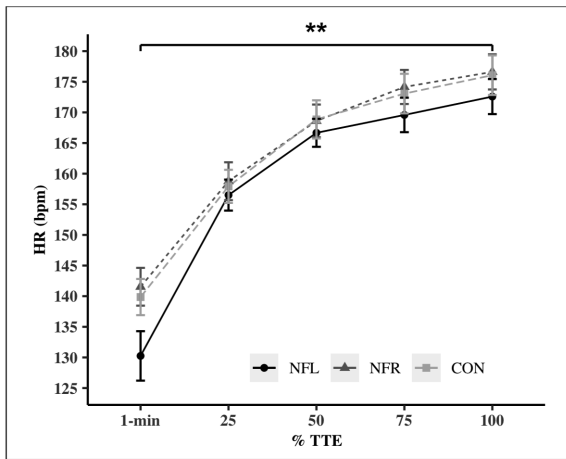
Note. Means and SE, at first minute and 25%, 50%, 75% and 100% of the TTE test for each condition.

**Significant main effect of time ($p < .001$).

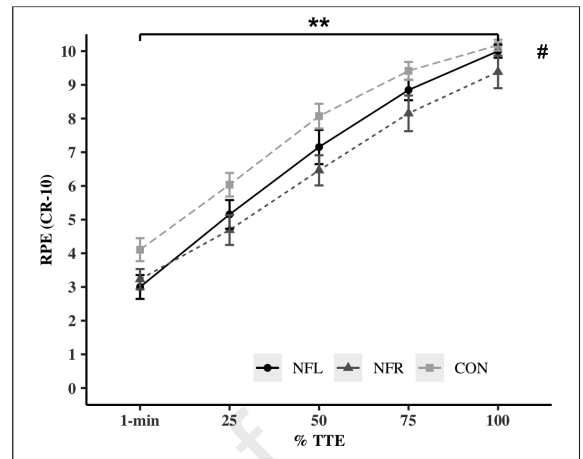




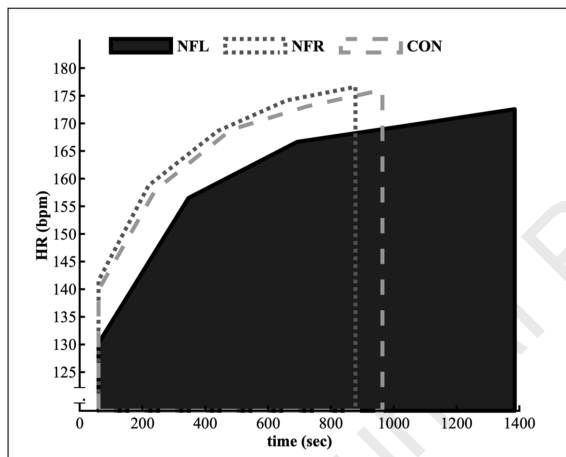
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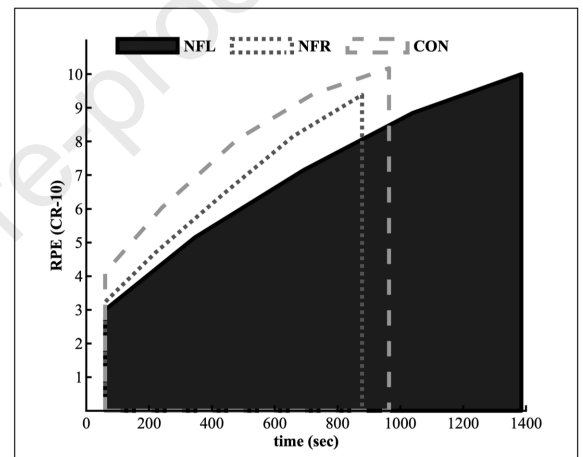
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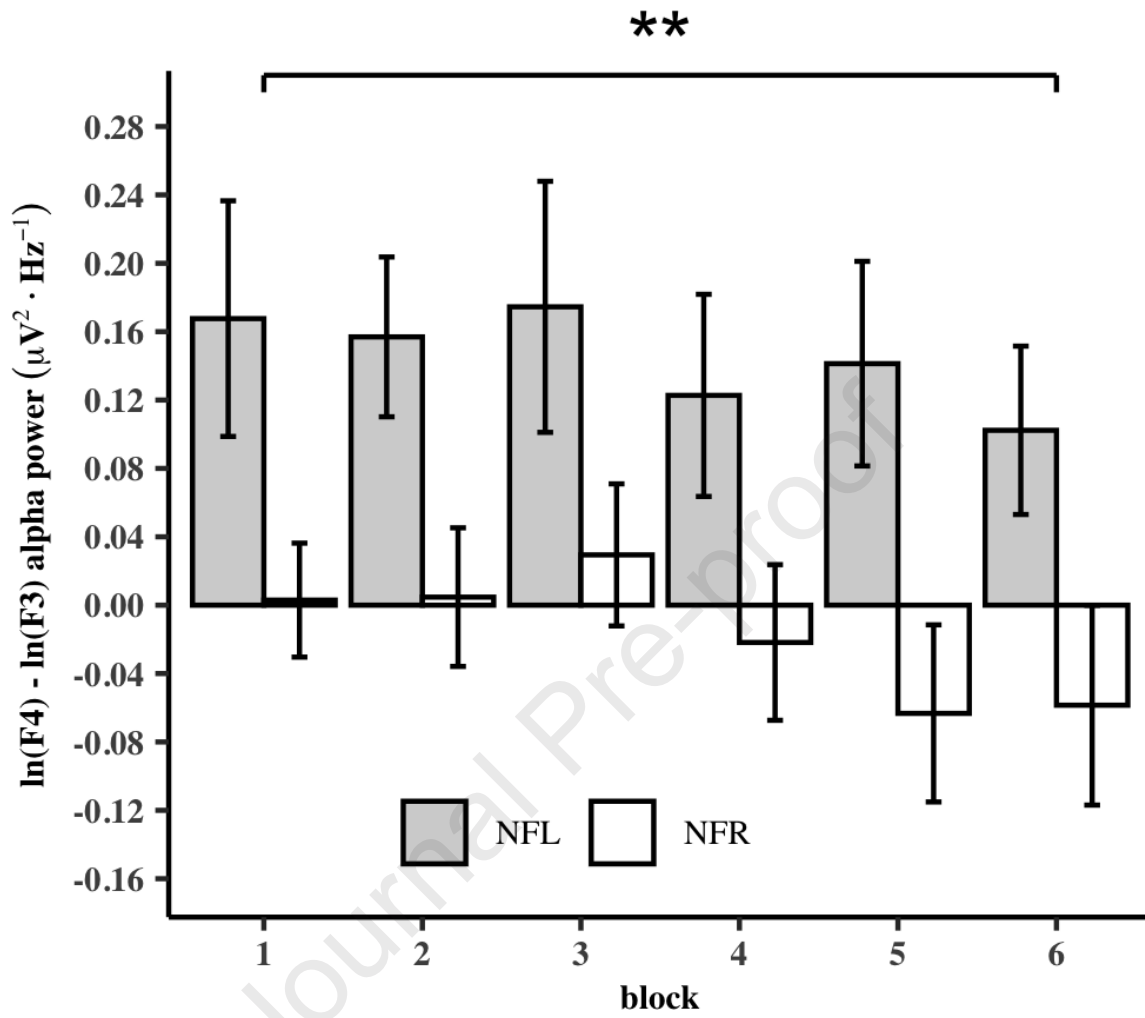


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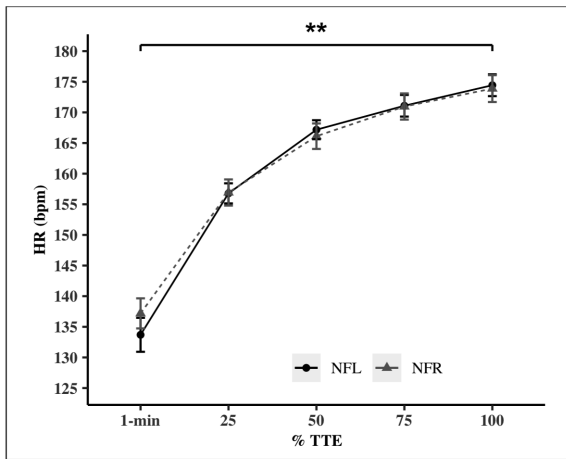


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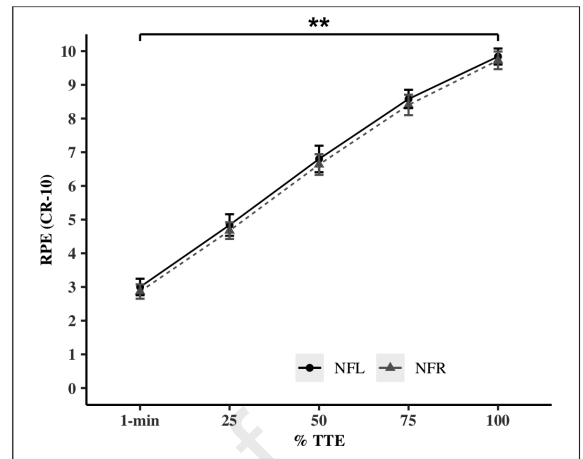




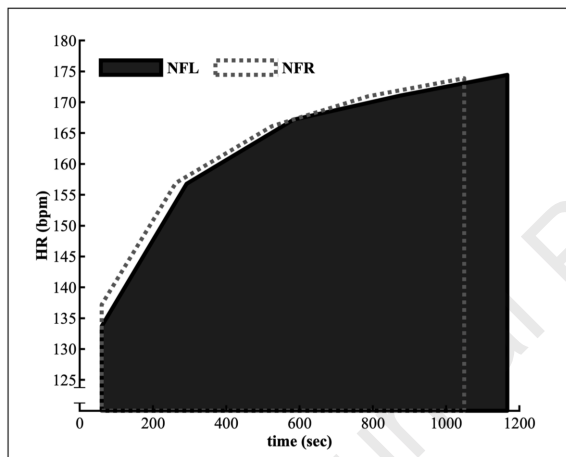
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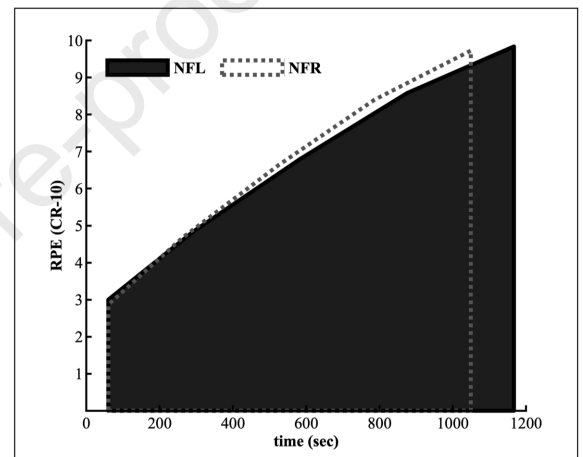
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C



D



EEG Neurofeedback Improves Cycling Time to Exhaustion

Highlights

- We investigated EEG neurofeedback in the context of endurance performance.
- A single session of EEG-neurofeedback modified frontal asymmetric activation.
- EEG-neurofeedback to increase left cortical activity improved cycling performance.

EEG Neurofeedback Improves Cycling Time to Exhaustion

Conflict of Interest

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EEG Neurofeedback Improves Cycling Time to Exhaustion

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Author Note

The dataset can be made available upon reasonable request to the corresponding author

Authorship contribution

Francesca Mottola: Conceptualization, Methodology, Software, Investigation, Formal Analysis, Data Curation, Writing- original draft, Writing - review and editing, Visualization.

Andrew Cooke: Conceptualization, Methodology, Software, Writing - original draft, Writing – review and editing. **James Hardy:** Conceptualization, Methodology, Writing - review and

editing. **Anthony Blanchfield:** Conceptualization, Methodology, Writing - review and editing.

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