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Ventrolateral Prefrontal Cortex Contributes to Human Motor Learning

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1 Ventrolateral Prefrontal Cortex Contributes to Human Motor Learning

2 Abbreviated title: Prefrontal cortex in human motor learning

3

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28

29 **Abstract**

30 This study assesses the involvement in human motor learning, of the ventrolateral prefrontal cortex (BA
31 9/46v), a somatic region in the middle frontal gyrus. The potential involvement of this cortical area in
32 motor learning is suggested by studies in non-human primates which have found anatomical connections
33 between this area and sensorimotor regions in frontal and parietal cortex, and also with basal ganglia
34 output zones. It is likewise suggested by electrophysiological studies which have shown that activity in
35 this region is implicated in somatic sensory memory and is also influenced by reward. We directly tested
36 the hypothesis that area 9/46v is involved in reinforcement-based motor learning in humans. Participants
37 performed reaching movements to a hidden target and received positive feedback when successful. Prior
38 to the learning task, we applied continuous theta burst stimulation (cTBS) to disrupt activity in 9/46v in
39 the left or right hemisphere. A control group received sham cTBS. The data showed that cTBS to left
40 9/46v almost entirely eliminated motor learning, whereas learning was not different than sham stimulation
41 when cTBS was applied to the same zone in the right hemisphere. Additional analyses showed that the
42 basic reward-history-dependent pattern of movements was preserved but more variable following left
43 hemisphere stimulation, which suggests an overall deficit in somatic memory for target location or target
44 directed movement rather than reward processing per se. The results indicate that area 9/46v is part of the
45 human motor learning circuit.

46 **Significant Statement**

47 Prefrontal cortex may contribute to motor learning as it is known to be involved in planning, executive
48 control, and motivation or reward processing (Miller and Cohen, 2001). Here we focused on ventrolateral
49 prefrontal cortex (BA 9/46v), an area which has been shown to be linked neuroanatomically and electro-
50 physiologically to sensorimotor regions of the brain and to circuits involved in reinforcement. Using
51 continuous theta burst stimulation (cTBS) to this region prior to a reinforcement-based motor learning
52 task, we found a significant reduction in learning. This suggests that this zone in the lateral prefrontal
53 cortex contributes to motor learning which is mediated by reward.

54

55 Introduction

56 The brain structures involved in human motor learning have been studied extensively. Areas in frontal
57 and parietal cortex, cerebellum and basal ganglia have each been shown to contribute to learning and
58 retention, although their weighting differs between tasks. In contrast, prefrontal cortex has received little
59 attention to date in the context of motor learning (but see Anguera et al., 2010 and Codol et al., 2020)
60 even though regions within prefrontal cortex are known to be neuroanatomically connected to
61 sensorimotor related regions of other structures which are implicated in learning. The present study
62 focuses on ventrolateral prefrontal cortex (BA 9/46v), a somatic region in the middle frontal gyrus
63 directly above the ascending anterior ramus (of the lateral fissure that separates BA 44 and 45), and has
64 neuroanatomical connections to premotor, somatosensory and basal ganglia structures. By disrupting this
65 area using magnetic brain stimulation, we test for its participation in human motor learning.

66

67 The focus on 9/46v is motivated by both electrophysiological findings and neuroanatomical
68 connectivity. Studies in non-human primates have identified a homologous somatic region in the inferior
69 bank of the principal sulcus which is interconnected with areas PF and PFG in the inferior parietal lobe
70 (or supramarginal gyrus in humans) and second somatosensory cortex in the parietal operculum (Preuss
71 and Goldman-Rakic, 1989; Petrides and Pandya, 2002) (for a summary, see (Yeterian et al., 2012)). This
72 area also communicates with the hand area of ventral premotor cortex and likewise receives inputs from
73 globus pallidus and substantia nigra of the basal ganglia (Middleton and Strick, 2002). In
74 electrophysiological studies, this same region has been implicated in somatic sensory memory and
75 decision making (Romo et al., 1999).

76

77 We tested for the involvement of 9/46v using a reinforcement learning task. In reinforcement-
78 based motor learning, positive feedback provides behavioral reinforcement, inducing plasticity in motor,
79 somatic and reward-related networks (Bernardi et al., 2015; Sidarta et al., 2016). The involvement of the

80 middle frontal gyrus in reinforced sequence learning has been demonstrated using repetitive TMS (Dayan
81 et al., 2018). Area 9/46v involvement in both reinforcement learning (Fermin et al., 2016) and visuomotor
82 adaptation (Anguera et al., 2010) has been observed in studies using fMRI. Other parts of the prefrontal
83 cortex, in particular, ventromedial prefrontal cortex and orbitofrontal cortex have been implicated in
84 reward-based learning more generally. In the non-human primate literature, activity in dorsolateral
85 prefrontal cortex during a delay period was found to be related to the amount of reward received and the
86 type of responses to be performed (Hikosaka and Watanabe, 2000; Wallis and Miller, 2003). Moreover,
87 there is evidence that the lateral prefrontal cortex carries reciprocal projections with the midbrain
88 dopaminergic neurons (Williams and Goldman-Rakic, 1998; Frankle et al., 2006), as well as with the
89 orbitofrontal cortex (Barbas and Pandya, 1989).

90

91 Participants in the present study were assigned to one of three experimental conditions in which
92 continuous theta-burst transcranial magnetic stimulation (cTBS) was applied to either left or right 9/46v,
93 with the goal of disrupting activity in the target zone, or to a sham stimulation group. This was followed
94 by a motor learning task in which participants performed reaching movements to a hidden target. The
95 participants were given positive feedback when the movement was successful, that is, when it had landed
96 in the target zone. We found that disruption of area 9/46v prior to learning had a detrimental effect on
97 both learning rate and on the overall number of successful (and thus rewarded) movements. This is
98 consistent with its participation in reinforcement-based motor learning.

99 Materials and Methods

100 *Participants*

101 Fifty-four healthy right-handed young adults (19 men, 35 women) were recruited and randomly
102 assigned into either a left hemisphere (left 9/46v, N=18), right hemisphere (right 9/46v, N=18), or sham
103 stimulation condition (sham, N=18). Handedness was assessed using the Edinburgh handedness inventory

104 (Oldfield, 1971). All procedures were approved by the McGill University Faculty of Medicine
105 Institutional Review Board and participants provided written informed consent.

106

107 *Experimental Design*

108 Participants held a vertical handle attached to the end of a two degree-of-freedom robotic
109 manipulandum (Interactive Motion Technologies). They were seated with their right shoulder abducted to
110 about 70 degrees and the elbow supported by an air sled. A semi-silvered mirror, which served as a
111 display screen, was placed just below eye level and blocked the vision of the arm and the robot handle
112 (Figure 1A). A white start circle, 20 mm in diameter, was positioned on the display screen about 30 cm in
113 front of the participant, on the body midline. A 1 cm white arc was shown on the left of the screen during
114 familiarization trials (Figure 1B). During the familiarization phase, participants were instructed to move
115 to any point on the arc after the “Go” cue appeared and to make straight movements without corrections.
116 A cursor, which represented the instantaneous handle position in space, was removed once the arm moved
117 outside of the white start circle. The required movement duration was 500 – 700 msec but there was no
118 penalty if the movement did not end on time or outside the target arc. Once the movement ended, the
119 robot brought the arm back to the start position.

120

121 Following the familiarization training, the target arc was removed. The participant was instructed
122 to move towards the now hidden arc and was told there was a target located in the arc. Then, each
123 participant made 15 movements without receiving feedback of any kind. A target direction was then set
124 for each subject separately to correspond to the direction of the first movement after the 15th trial that fell
125 between 110 and 160 degrees (second quadrant at the left). Positive feedback (an animated explosion, a
126 pleasant tone, and a score) was provided for this movement. Participants were told that their task was to
127 repeat the same successful movement throughout the course of training. Positive feedback was dependent
128 solely on movement direction at peak velocity although participants were provided feedback on distance
129 for training purposes during familiarization trials. The width of the target zone was 5 degrees and positive

130 feedback was provided if the angular deviation was within ± 2.5 degrees of the center line. The width and
131 position of the reinforced direction were fixed. Altogether, the participants completed 4 blocks of 50
132 training trials with positive feedback when successful. This was followed by 25 further movement trials
133 with no feedback. For these trials, participants were told to aim in the direction in which they had been
134 rewarded previously. They were also told that no reward would be given even if they were accurate. The
135 sequence of different phases of the experiment is shown in Figure 1C.

136

137 *Stimulation Sites*

138 Prior to the study, each participant underwent an MRI scan at the Montreal Neurological Institute
139 Brain Imaging Centre. Structural images were acquired with a T1-weighted 3D MPRAGE sequence as
140 follows: TR = 2300 ms; TE = 2.98 ms; slices = 192; thickness = 1 mm (no gap); FA = 90°; and FOV =
141 256 mm \times 256 mm, iPAT mode = ON (acceleration factor 2 \times).

142

143 The stimulation location in area 9/46v was identified for each subject separately, in the following
144 manner. The identification starts with pars opercularis and pars triangularis in the inferior frontal gyrus,
145 which are separated by the ascending anterior ramus of the lateral fissure (Petrides and Pandya, 2002).
146 This ascending sulcus runs up from the lateral fissure and is almost perpendicular to the inferior frontal
147 sulcus. The stimulation site, as shown in Figure 1D, lies in the middle frontal gyrus, medial to ascending
148 anterior ramus of the lateral fissure and between two posterior middle frontal gyrus sulci, the posterior
149 middle frontal sulcus (anterior) and posterior middle frontal sulcus (intermediate) (Petrides, 2012). The
150 mean stimulation location is shown in each hemisphere in standard MNI coordinates: (-46, 26, 30 mm)
151 for the left 9/46v and (52, 26, 32 mm) for the right 9/46v. The stimulation site was marked and
152 maintained using Brainsight (Rogue Research, Montreal, Canada). The TMS coil position was tracked
153 using a three-dimensional optical system (Polaris System, Northern Digital, Bakersfield, CA, United
154 States).

155

156 *Stimulation Protocol*

157 The theta-burst magnetic stimulation magnitude was based on the resting motor threshold (RMT) in
158 primary motor cortex. The position at which left or right motor cortex was maximally excitable in
159 eliciting motor-evoked potentials (MEPs) in the contralateral FDI muscle was determined, using single-
160 pulse TMS (Magstim200 stimulator). The coil was placed tangentially on the scalp with the handle
161 pointing backward and laterally at a 45° angle away from the midline. The EMG response of the FDI
162 muscle was recorded using Ag-AgCl surface electrodes. The RMT was defined as the minimum intensity
163 required to elicit at least 5 MEPs (>50 mV peak-to-peak amplitude) in 10 consecutive single-pulse
164 stimulations.

165

166 cTBS (Goldsworthy et al., 2011) was used to disrupt neural activity in left or right 9/46v prior to learning.
167 cTBS was applied in two trains (10 minutes apart) of repetitive biphasic magnetic pulses (Magstim Super
168 Rapid Stimulator) at 70% intensity of the resting motor threshold for the FDI muscle (based on left and
169 right M1 separately, recorded using a Magstim 200 monophasic stimulator). Each train of cTBS
170 comprised 600 pulses applied in bursts of three pulses at 50 Hz, with bursts repeated at a frequency of 5
171 Hz, corresponding to a total train length of 40s. cTBS stimulation was delivered with the coil handle
172 pointed downward.

173

174 To test for possible indirect effects of cTBS on motor cortex, we applied single-pulse TMS to the motor
175 hotspot, at an intensity sufficient to evoke 20 MEPs of approximately 500-1000 μ V (peak-to-peak
176 amplitude) both prior to stimulation and at the same intensity, 10 min post cTBS.

177 *Statistical Analysis*

178 Directional error was quantified as the angular deviation (AD) from the true target direction (center of the
179 target zone) at the maximum velocity. The absolute angular deviation, $|AD|$, was used as a measure of
180 movement accuracy. The number of trials with positive feedback and absolute angular deviation were
181 used to quantify learning. The rate of learning was computed through a linear fit to the absolute angular
182 deviation as a function of learning trials. The slope of the fitted line was used as a measure of the learning
183 rate. One-way ANOVA was performed on learning rates across experimental conditions. One-way
184 ANOVA was also performed on mean change in absolute angular deviation from the first block to the last
185 block of training.

186

187 We also computed a linear fit to the mean percentage of rewarded movements across participants
188 over the course of training. One-way ANOVA was performed on changes in the percent of rewarded
189 movements between the first and last block of training. A two-way ANOVA was performed to assess the
190 effect of reward history on movement variability from n^{th} to $n+1^{\text{th}}$ trial in different experimental
191 conditions. Post-hoc tests were corrected for multiple comparisons.

192

193 To evaluate possible effects of cTBS on motor cortex, MEPs recorded post-cTBS were expressed
194 as a percentage of pre-cTBS MEPs, using mean MEP amplitude on a per subject basis. One-way ANOVA
195 was used to test for the difference between experimental conditions.

196 **Results**

197 Participants held the handle of a robotic manipulandum (Figure 1A) and made reaching movements
198 towards a hidden target (Figure 1B, shaded gray area) in four blocks of 50 trials each. Participants were
199 rewarded for successful movement in the target direction. To assess the contribution of the ventrolateral

200 prefrontal cortex to motor learning, cTBS stimulation was applied before learning in different groups of
201 subjects in each hemisphere separately. Figure 2A shows data from a representative subject in each
202 experimental condition. Movement paths shown in blue are for successful (rewarded) movements and
203 those in red are for unsuccessful movements. Note that the overall direction differs in the three conditions
204 because of individual differences in target location. The figure shows that movement paths were similar in
205 the three experimental conditions at the beginning of training (block 1). At the end of training (block 4),
206 participants in the sham condition moved more consistently to the target than participants who received
207 stimulation to either left or right 9/46v (Figure 2A).

208

209 Reduction in the angular deviation from the target direction, $|AD|$, over the course of motor task provides
210 a measure of improvement in accuracy as a result of learning (Figure 2B). The rate of reduction in $|AD|$
211 was estimated for each subject separately. ANOVA applied to the slope estimates indicated the rate of
212 angular deviation reduction differed significantly among stimulation conditions ($F_{(2,51)}=4.19$, $p=0.02$,
213 Figure 2B). The rate of learning was slower in participants who received stimulation over left 9/46v
214 (slope=-0.002, 95% CI=-0.01, 0.006) than those who received sham (slope=-0.022, 95% CI=-0.033, -
215 0.011) stimulation ($p=0.016$). There was no significant difference in the learning rate between the sham
216 and right 9/46v (slope=-0.009, 95% CI=-0.019, 0.001) conditions ($p=0.16$). Another indicator of learning
217 is the change in the $|AD|$ from the beginning of the learning session to the $|AD|$ at the end (Figure 2C).
218 The mean change in $|AD|$ from the first to last learning block showed significant differences between
219 conditions ($F_{(2,51)}=4.93$, $p=0.01$). Post-hoc tests indicated that participants in the sham stimulation
220 condition showed a greater reduction in $|AD|$ than participants in the left 9/46v condition ($p=0.014$).

221

222 Participants also performed no-feedback trials after the initial learning session in which feedback on
223 movement success was withheld. We found no significant difference in $|AD|$ between conditions
224 ($F_{(2,51)}=0.57$, $p=0.56$) nor was there a significant difference in the slope between the groups in no-
225 feedback trials ($F_{(2,51)}=1.82$, $p=0.17$). The slope in these trials for the sham condition was not reliably

226 different than zero ($p=0.56$). The slopes in the left 9/46v ($p=0.003$) and right 9/46v ($p=0.05$) conditions
227 were both found to be reliably greater than zero indicating a progressive reduction in accuracy for the
228 learned target direction.

229 During the motor learning task, participants were instructed to maximize the number of rewarded trials.
230 Figure 3A shows the percentage of rewarded trials over the course of learning. Participants in the sham
231 stimulation group showed a steady increase in the number of successful movements (slope=0.119, 95%
232 CI=0.091-0.146) compared to participants in the left 9/46v stimulation condition (slope=0.011, 95% CI=-
233 0.014-0.038). Participants in the right 9/46v condition showed values intermediate between those in the
234 other two conditions (slope=0.073 95% CI=0.047-0.098). Statistical tests were conducted to assess
235 changes in the percent of rewarded movements between the first and the last block of training. The
236 change scores (increase from start to end of training in the percent of rewarded trials) differed
237 significantly across conditions ($F_{(2,51)}=6.18$, $p=0.003$). Post-hoc tests indicated a reliable difference in
238 reward change scores between the left 9/46v and sham stimulation conditions ($p=0.002$). Specifically,
239 participants in the sham stimulation condition received more rewards as learning progressed, whereas
240 participants who received stimulation to left 9/46v showed no improvement at all. There was no
241 difference in reward change scores for participants in the right 9/46v and sham stimulation conditions
242 ($p=0.10$). One sample t-tests indicated that the reward change from the first to last block for participants
243 in the left 9/46v condition was not reliably different than zero ($t_{(17)} = -0.13$, $p=0.89$).

244 One possible reason for not showing improvement over the course of training in the left 9/46v condition
245 was that stimulation impaired the capacity to benefit from reward. To assess this possibility, we computed
246 the absolute change in movement direction between the current trial (nth trial) and the subsequent trial
247 ($n+1^{\text{th}}$ trial) as a function of the history of rewarded movements. The analysis, shown in Figure 3B, was
248 conducted over the three most recent movements (n , $n-1$ and $n-2$ trial), under conditions where at least
249 one of these movements was rewarded. It can be seen that there is a graded pattern of absolute change in
250 movement direction, which is least following three rewarded movements and greatest when only a single

251 movement is rewarded. Thus, a normal although more variable reward-history-dependent pattern is
252 obtained following cTBS to left 9/46v. A two-way ANOVA with reward history and the stimulation
253 condition as the independent factors and Δm , the absolute change in movement direction, as dependent
254 variable revealed a significant effect of reward history ($F_{(6,306)}=53.85$, $p<0.001$) indicating that change in
255 movement direction is dependent on the number of rewarded trials in the recent past. The overall
256 magnitude of the change in direction, Δm , marginally differed across stimulation conditions ($F_{(2,51)}=2.86$,
257 $p=0.06$). Bonferroni-holm corrected post-hoc tests indicated that participants in the left 9/46v stimulation
258 condition showed greater change in direction than participants in the sham ($p=0.007$) and right 9/46v
259 conditions ($p=0.02$, Figure 3B). There was no indication that the reward-history dependent pattern
260 differed between conditions, that is, there was no significant interaction between stimulation conditions
261 and reward history ($F_{(12,306)}=0.43$, $p=0.94$). In summary, participants in the left 9/46v group showed the
262 same basic reward-history dependent pattern as the other conditions but with greater change in direction
263 overall. This suggests that the learning deficit in the left 9/46v condition is not due to an inability to
264 benefit from reward per se.

265 We have also assessed the possibility that 9/46v stimulation affected the movements themselves. We
266 compared three basic movement parameters, peak velocity, movement amplitude and movement duration
267 across stimulation conditions (Figure 4C). There were no significant differences between conditions (left
268 and right 9/46v and sham condition) in peak velocity ($F_{(2,51)}=1.28$, $p=0.28$), movement amplitude
269 ($F_{(2,51)}=0.10$, $p=0.90$) and movement duration ($F_{(2,51)}=2.12$, $p=0.13$). We also tested the possibility that
270 9/46v stimulation indirectly affected primary motor cortex and that deficits in learning occurred as a
271 consequence. We assessed motor evoked potentials (MEPs) before and after stimulation (representative
272 sample, Figure 4A) and found that there were no significant differences in peak-to-peak MEP amplitude
273 across experimental conditions ($F_{(2,51)}=0.56$, $p=0.57$, Figure 4B). Overall, this suggests that cTBS to 9/46v
274 did not alter basic movement patterns nor did it indirectly act on primary motor cortex.

275 Discussion

276 The present study used transcranial magnetic stimulation to disrupt activity in ventrolateral prefrontal
277 cortex (9/46v) in order to test its involvement in human motor learning. Participants held the handle of a
278 robot arm and made movements to a hidden target. Positive reinforcement was provided when the
279 movement ended in the target zone. cTBS stimulation was delivered prior to learning either to left or right
280 9/46v; control participants received sham TBS. It was found that cTBS to left 9/46v all but eliminated
281 improvements in movement as measured by changes in angular direction relative to the target. cTBS also
282 led to a significant reduction in the number of reinforced trials in comparison to sham stimulation. The
283 disruption of 9/46v did not adversely affect the ability to utilize reward as indicated by a normal, although
284 more variable, dependence of movement direction on reward-history. As there is no visual feedback
285 whatsoever in this task, this latter observation suggests that while a sensitivity to reward is preserved
286 following disruption of 9/46v, there is an across-the-board deficit in somatic memory for target location
287 or target directed movement, a result consistent with previous demonstrations of 9/46v involvement in
288 somatic memory (Romo et al., 1999). Overall, the present results indicate that area 9/46 is part of a
289 network that participates in human motor learning.

290

291 No feedback trials at the end of training are consistent with this conclusion. For both left and right 9/46v
292 there is a progressive increase during no-feedback trials in angular deviation relative to the target which is
293 suggestive of a progressive loss of information during retention testing. In contrast, the slope is not
294 different than zero following sham stimulation indicating that retention is unimpaired when 9/46v is
295 intact. It should be noted that while for left 9/46v stimulation retention performance appears to be initially
296 better than that observed during learning, the values at the start of the retention test are wholly with the
297 range of those obtained over the course of training.

298

299 Although it is in prefrontal cortex, several studies have shown that, in non-human primates, area 9/46v
300 has both inputs and outputs to somatic regions of the brain, including connections to second
301 somatosensory cortex, cortical areas PF and PFG (supramarginal gyrus) in the inferior parietal lobe
302 (Preuss and Goldman-Rakic, 1989; Petrides and Pandya, 2002; Gerbella et al., 2013) and also to ventral
303 premotor cortex (Dum and Strick, 2005). In humans, an analogous pattern of connectivity between this
304 same set of areas has been reported using resting-state fMRI and diffusion tractography (Barbeau et al.,
305 2020) and between the ventral portion of the middle frontal gyrus and ventral premotor cortex (Catani et
306 al., 2012). Outputs from the basal ganglia to area 9/46v have also been reported (Middleton and Strick,
307 2002). As such, this area is well placed to funnel both somatic (error-based) and reinforcement-based
308 information to frontal motor areas in support of learning. The involvement of area 9/46v in somatic
309 memory and decision making has been documented in studies in which non-human primates are required
310 to hold in memory vibrotactile information (delivered to the fingertips) and to make judgements regarding
311 relative frequency. Neurons in this region have been found to show both memory dependent and decision-
312 making related activity (Romo et al., 1999).

313

314 Studies of spatial working memory in humans also report activity in this same region of prefrontal cortex
315 (D'Esposito et al., 1998; Owen et al., 2005). In strictly behavioral studies, there is evidence of a
316 relationship between somatosensory memory and reinforcement learning (Sidarta et al., 2018) and also
317 between visuospatial memory and sequence learning (Bo and Seidler, 2009; Bo et al., 2009). In the
318 Sidarta et al (Sidarta et al., 2018) study using a task similar to the one in the present study, it was found
319 that individuals with better sensory memory for their own movements also showed greater learning.

320

321 Reinforcement learning has been characterized as involving both repetition of successful movements
322 (exploitation) or the selection of new movements following unsuccessful trials (exploration). The present
323 results suggest that disruption of 9/46v leaves both processes intact as indicated by the finding that a
324 normal, but more variable, dependence of movement on reward history is preserved. The deficits in
325 learning appear instead to be memory dependent. This finding shows that it is possible experimentally to
326 partially dissociate the contribution of brain structures involved in reward and sensory memory in motor
327 learning. Area 9/46v involvement in human motor learning has been reported in studies involving both
328 reinforcement and error-based learning where learning-related activity is observed in both task-based and
329 resting-state scans (Anguera et al., 2010; Sidarta et al., 2016).

330

331 It was found that disruption of activity in right 9/46v resulted in a reduction in both the rate of learning
332 and the number of reinforced trials. Although these effects were not statistically different from measures
333 of the same variables when stimulation was delivered to left 9/46v, nor when sham stimulation was
334 delivered, the results for right hemisphere stimulation are intermediate between the two. Activity in right
335 9/46v has been observed previously in humans in both reinforcement learning and error-based learning
336 tasks (Anguera et al., 2010; Sidarta et al., 2016). It has also been observed previously in sensory memory
337 tasks in non-human primates (Romo et al., 1999). The extent to which there is hemispheric specialization
338 in the contribution of area 9/46v to learning is uncertain. In humans, there is substantial interhemispheric
339 connectivity in prefrontal cortex (Zarei et al., 2006). Moreover, interhemispheric propagation of TMS
340 stimulation in prefrontal cortex has been reported (Voineskos et al., 2010), which makes possible the idea
341 that the partial disruption of learning which occurs when right 9/46v is stimulated occurs as a result of
342 indirect effects on the left hemisphere.

343

344 The involvement of a somatic network in human motor learning is supported by the finding that areas
345 which show somatic memory and decision-making activity in non-human primates—second
346 somatosensory cortex, ventral premotor cortex, supplementary motor area and ventrolateral prefrontal
347 cortex (Romo et al., 2012) are likewise areas that show learning-related changes in functional
348 connectivity following motor learning in humans (Vahdat et al., 2011). This somatic network which also
349 includes inferior parietal cortex (supramarginal and angular gyrus) (Barbeau et al., 2020) fits within a
350 broader interconnected sensorimotor network which includes primary motor and somatosensory cortex,
351 medial wall motor areas, the superior parietal lobule, basal ganglia and cerebellum (see Rizzolatti and
352 Luppino, 2001; Bostan and Strick, 2018, for reviews). While each of these areas might contribute to the
353 learning observed in the present study, the elimination of learning following cTBS to 9/46v suggests a
354 causal contribution of this specific area in the context of reinforcement motor learning in humans.

355

356 In summary, it was found that cTBS stimulation to area 9/46v in prefrontal cortex disrupts motor learning
357 without affecting the movements themselves. The deficit appears to be primarily related to impaired
358 somatic memory for target location or target directed movement; disruption of 9/46v leaves
359 reinforcement-based learning largely intact. 9/46v is distinguished from other regions of prefrontal cortex
360 by its significant pattern of somatosensory connectivity. Area 9/46v thus appears to be part of the human
361 motor learning circuit.

362

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472

473 Figure Legends

474 **Figure 1. Participants learned to make movements to a hidden target, and positive feedback was**
475 **provided for successful movements.** (A) Participants made movements holding a robotic
476 manipulandum. (B) Schematic of the task. Participants made outward movements. If the movement
477 direction fell within the hidden target zone, positive feedback was provided to indicate success. No
478 feedback was given in the case of an unsuccessful movement. (C) Experimental sequence. Motor-evoked
479 potentials (MEPs) were elicited from the motor hot-spot in the left or right hemisphere before stimulation
480 (cTBS to right or left 9/46v or sham stimulation). MEPs were again recorded 10 minutes after stimulation
481 followed by the motor learning trials. In the no-feedback session at the end, participants were not
482 provided with feedback on the success of the movement. (D) Location of the stimulation site in
483 representative participants from the left 9/46v and right 9/46v condition, shown in the sagittal (right
484 panel) and coronal (middle panel) planes. The average location of the stimulation site (red circle) across
485 participants in the MNI brain.

486 **Figure 2. Suppression of left 9/46v using cTBS disrupts motor learning.** (A) Hand paths of a
487 representative participant from each group at the start (block 1) and end of training (block 4). Hand paths
488 shown in red are for unsuccessful movements, and those in blue are for successful movements. (B) Mean
489 absolute deviation from the center of the target zone over the course of training. The linear fit is shown
490 across learning trials and no-feedback trials separately. The shaded region represents \pm SEM. The rate of
491 learning was less in participants who received stimulation over left 9/46v than those who received sham
492 stimulation. (C) Mean absolute deviation in the first and last block of the training. Participants in the
493 sham stimulation condition showed a greater reduction in $|AD|$ than participants in the left 9/46v
494 condition.

495 **Figure 3. Suppression of left 9/46v using cTBS leaves reinforcement learning intact.** (A) Mean
496 percentage of rewarded trials over the course of training. A linear fit is shown across learning trials. The
497 shaded region represents \pm SEM. (B) Mean percent of rewarded movements in the first and last block of
498 the training. Participants in the sham stimulation condition received more rewards as learning progressed,
499 whereas participants who received stimulation to left 9/46v showed no improvement at all. (C) Mean
500 absolute change in movement direction between the current trial (n^{th} trial) and the subsequent trial ($n+1^{\text{th}}$
501 trial) as a function of the history of rewarded movements. Reward history included three most recent
502 movements (n , $n-1$ and $n-2$ trial), where at least one of these movements was rewarded. The left 9/46v
503 group showed the same basic reward-history dependent pattern as the other conditions but with greater
504 change in direction overall. This suggests that the learning deficit after left 9/46v suppression is not due to
505 inability to process reward but likely because of a deficit in memory for target direction.

506
507 **Figure 4. cTBS over left or right 9/46v did not alter the excitability of motor cortex or basic**
508 **movement parameters.** (A) Mean time series of MEPs recorded from the FDI muscle pre- (blue) and
509 post-cTBS (red) from a representative participant in each experimental condition. The TMS pulse occurs
510 at time = 0 ms. The shaded regions are \pm SEM across 20 MEPs. (B) Mean change in amplitude of MEPs
511 measured 10 minutes post-cTBS (computed as a percentage of pre-cTBS MEPs). Error bars give the
512 standard error across participants. (C) Mean movement duration, peak velocity and movement amplitude
513 across experimental conditions. cTBS to either left or right 9/46v did not modify the movement
514 parameters.

515

516

Figure 1

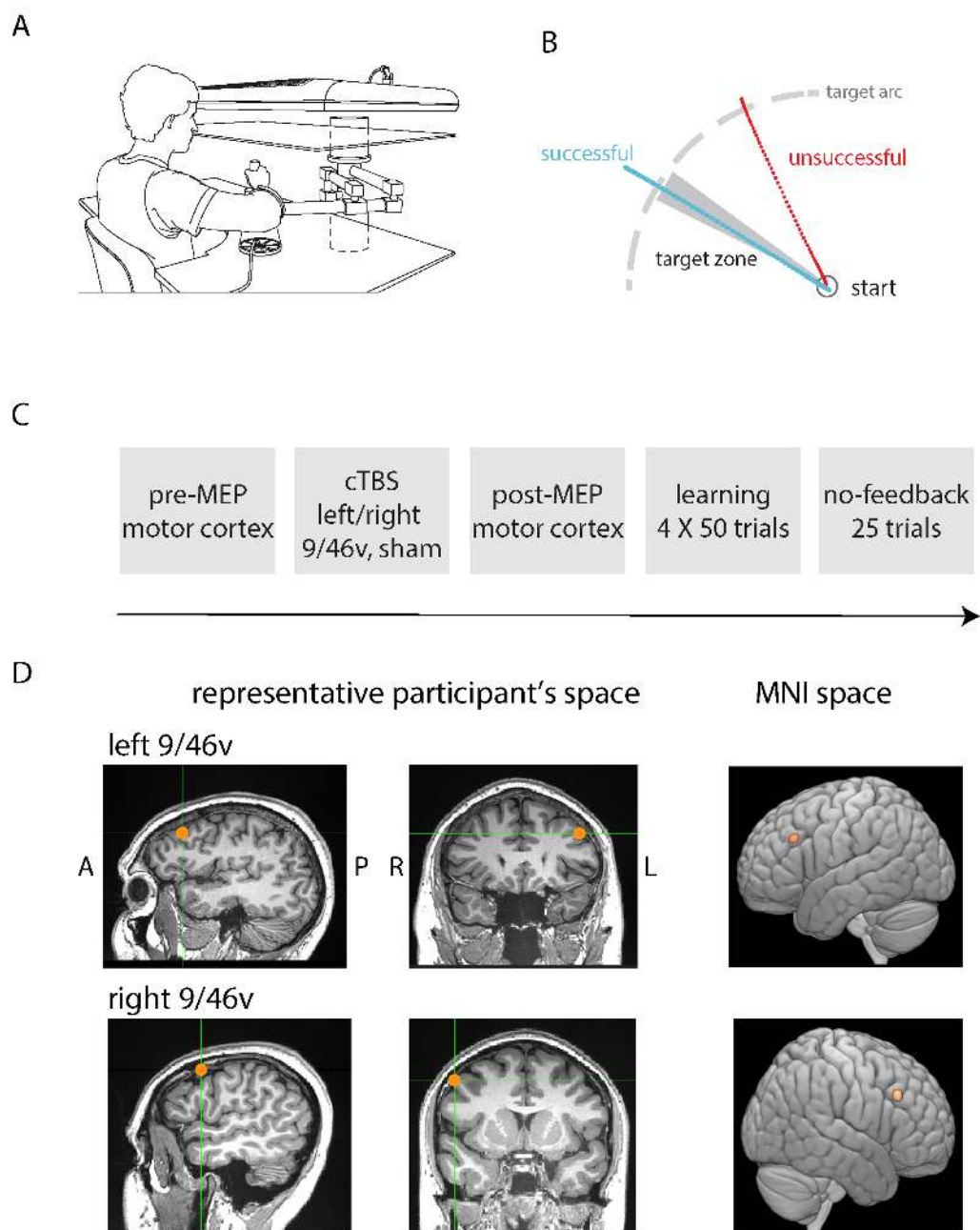


Figure 2

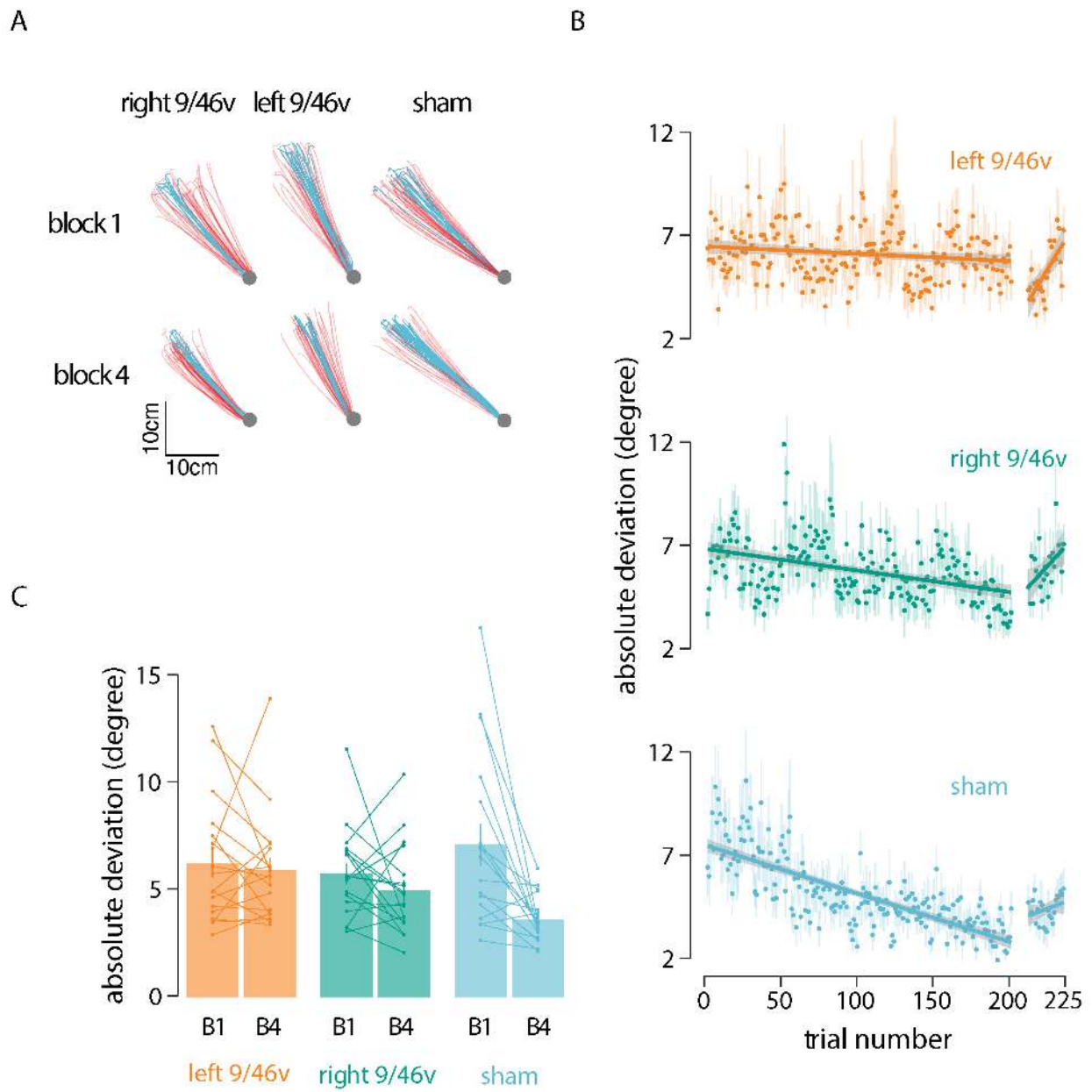


Figure 3

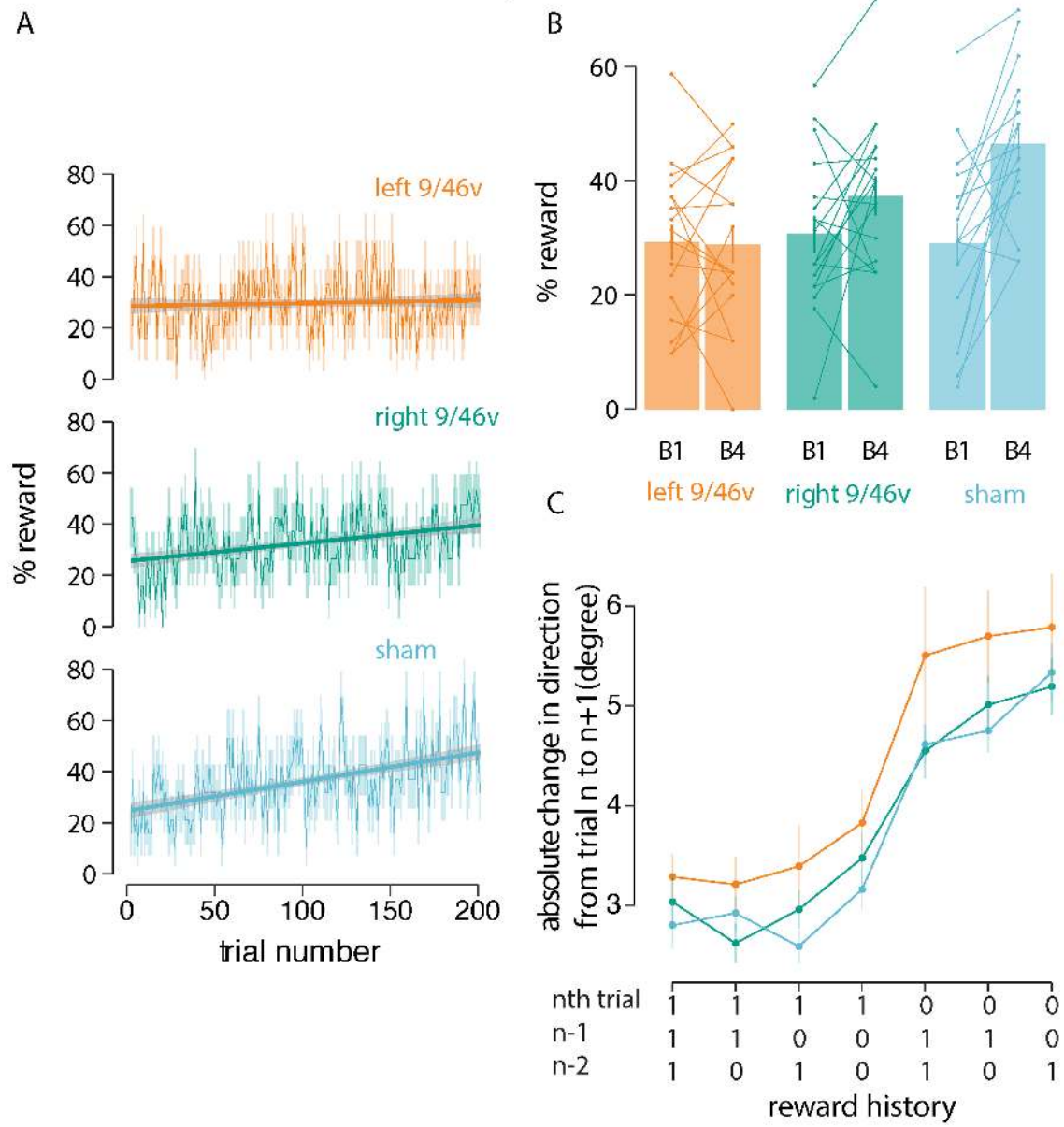


Figure 4

