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Title

Observing Motor Learning Produces Somatosensory Change

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21 **ABSTRACT**

22 Observing the actions of others has been shown to affect motor learning, but does it
23 have effects on sensory systems as well? It has been recently shown that motor
24 learning that involves actual physical practice is also associated with plasticity in the
25 somatosensory system. Here we assessed the idea that observational learning
26 likewise changes somatosensory function. We evaluated changes in somatosensory
27 function after human subjects watched videos depicting motor learning. Subjects
28 first observed video recordings of reaching movements, either in a clock-wise or
29 counter-clockwise force-field. They were then trained in an actual force-field task
30 that involved a counter-clockwise load. Measures of somatosensory function were
31 obtained before and after visual observation and also following force-field learning.
32 Consistent with previous reports, video observation promoted motor learning. We
33 also found that somatosensory function was altered following observational
34 learning, both in direction and in magnitude, in a manner similar to that which
35 occurs when motor learning is achieved through actual physical practice.
36 Observation of the same sequence of movements in a randomized order did not
37 result in somatosensory perceptual change. Observational learning and real physical
38 practice appear to tap into the same capacity for sensory change in that subjects
39 that showed a greater change following observational learning showed a reliably
40 smaller change following physical motor learning. We conclude that effects of
41 observing motor learning extend beyond the boundaries of traditional motor
42 circuits, to include somatosensory representations.

43

44 **KEYWORDS**

45 Observational learning. Somatosensory plasticity. Motor learning. Force-field
46 learning.

47

48

49 **INTRODUCTION**

50 Observing others while they learn a motor task has been shown to engage the motor
51 system and to result in reliable changes to motor learning. Here, we assess the
52 possibility that the effects of observing motor learning are not solely confined to the
53 motor system, but spread as well to somatosensory representations. We show that
54 there are changes to sensed limb position following observational learning that are
55 similar to those which occur following actual motor learning.

56

57 There have been a number of demonstrations that motor learning can occur even in
58 the absence of overt physical practice, as is the case of when one observes motor
59 learning. A series of studies (Mattar and Gribble, 2005; Brown et al., 2009) have
60 shown that subjects who observed a video depicting another person learning to
61 reach in a novel mechanical environment performed better when later tested in the
62 same environment than subjects who observed similar movements that did not
63 involve learning. Similarly, the observation of another individual performing
64 repetitive thumb movements has been shown to alter both the movements and the
65 motor potentials evoked from the stimulation of motor cortex (Stefan et al., 2005).
66 Several studies have shown that similar brain networks are activated during the
67 observation and execution of movement, and in particular, ventral premotor cortex
68 and supplementary motor area, inferior parietal lobule and superior temporal
69 sulcus (see Kilner, 2011 for review).

70

71 Several studies have also shown that motor learning is accompanied by adaptation
72 in sensory systems. Learning tasks involving arm movements have been shown to
73 change attributes of sensory function such as sensed limb position (Cressman and
74 Henriques, 2009; Haith et al., 2008; Ostry et al., 2010) and perceptual acuity (Wong
75 et al., 2011). At the neural level, a network has been identified, that is associated
76 with the perceptual changes that occur in conjunction with motor learning. This
77 comprises second somatosensory cortex, ventral premotor cortex and
78 supplementary motor area (Vahdat et al., 2011).

79

80 Taken together, these observations raise the possibility that changes in sensory
81 perception could be triggered not only by actual motor learning, but also by
82 observing someone else engaged in a motor learning task. We tested this hypothesis
83 by assessing somatosensory perception before and after a task that involved
84 observation of motor learning. The test involved two groups of subjects that
85 watched a video depicting an actor learning to reach in a novel mechanical
86 environment. The direction of the perturbation applied to the actor's arm was
87 opposite for the two groups. We found that watching someone else learn not only
88 affected the characteristics of motor learning but also was associated with changes
89 in somatosensory perception. Moreover, depending on the direction of the force-
90 field during the observed learning, the two groups showed changes in sensory
91 perception in opposite directions. The perceptual changes observed here are in the
92 same direction as those previously described following actual motor learning. We

93 conclude that observational learning has effects that spread beyond motor circuits
94 of the brain and contributes to plasticity in sensory systems.

95

96 **METHODS**

97

98 **Subjects and experimental tasks**

99 28 subjects of either sex were randomly assigned to two experimental conditions (n
100 = 14 each; mean age \pm standard deviation: 20.2 ± 2.5). The conditions differed only
101 in terms of the direction of the force-field observed in the video recording (see
102 below). An additional group of 14 subjects (mean age \pm standard deviation: $21.4 \pm$
103 3.1) was recruited and assigned to a scrambled-video control condition (see below).
104 The subjects were all right handed and reported no history of sensorimotor
105 disorders. All procedures were approved by the McGill University Research Ethics
106 Board.

107

108 Subjects were tested individually in a single session lasting 2 hours. The session
109 comprised perceptual tests, reaching movements, and video observation (Fig. 1). In
110 all tasks, subjects held the handle of a two degree-of-freedom planar robotic arm
111 with their right hand (InMotion2, Interactive Motion Technologies). Subjects were
112 seated and, in conditions involving movement, the arm movements occurred in a
113 horizontal plane at shoulder height. Vision of the arm was blocked.

114

115 At first, subjects were familiarized with the perceptual test and the reaching task.
116 Afterwards, the experiment began with a baseline estimate of sensed limb position.
117 Subjects then performed 100 straight-out reaching movements during which the
118 robot applied no force to the hand (null condition). Immediately following null-field
119 training, a second baseline estimate of sensed limb position was obtained. Subjects
120 were subsequently asked to watch a video recording of another individual
121 performing reaching movements in a velocity-dependent force-field (see below).
122 Following the video observation, another estimate of sensed limb position was
123 taken. Finally, subjects made 150 movements straight-out from the body, in a
124 velocity-dependent force-field, followed by a final estimate of sensed limb position.
125 Subjects were naïve with regard to the purpose of the study, and they received no
126 information about the force applied by the robot, in any stage of the experiment.

127

128 **Perceptual judgments**

129 Subject's perception of the boundary between left and right was estimated using an
130 adaptive procedure, as described previously (Ostry et al., 2010; Vahdat et al., 2011).
131 The perceptual tests were conducted with the eyes closed. The robot was
132 programmed to move the subjects' hand outward from a start position following a
133 fork-shaped trajectory (Fig. 2a). Subjects were instructed not to resist the action of
134 the robot. At the end of each movement, the subjects' hand was either to the left or
135 the right of the midline, by an amount that was computed on a trial-by-trial basis.
136 When the robot reached its final position, subjects were asked to indicate whether
137 the hand had been moved to the left or to the right. The sagittal plane movement

138 amplitude in the perceptual tests was 15 cm for all trials. The lateral displacement
139 on the first movement of each run was randomly selected from a uniform
140 distribution with values ranging from 20 to 30 mm (in both directions). All
141 participants were able to correctly discriminate the direction of the first arm
142 deflection. On the next trial, the deflection was reduced by 10 mm, and this was
143 repeated on successive trials until the subject reported a change in the direction of
144 lateral displacement. At this point, we reduced the step size by half, and the next
145 displacement was in the opposite direction. The algorithm terminated whenever the
146 step size for the upcoming movement fell below 1 mm. Thus, on each trial, the
147 magnitude of the lateral deviation of the hand was modified in an adaptive manner
148 (Taylor and Creelman, 1967), until an estimate of the perceived boundary between
149 left and right was obtained. Each block of perceptual tests involved 6 runs.
150 Occasionally 4 runs were collected if the perceptual estimates converged slowly.
151 This procedure yielded a corresponding number of estimates of the right-left
152 boundary. On successive runs, the initial displacement direction alternated between
153 left and right.

154

155 To exclude the possibility of perceptual changes related to active motor outflow
156 (force production) during the perceptual testing phase, we measured the average
157 lateral force applied by the subjects to the robot handle during the final trial of each
158 PEST run. This is the trial in which the PEST algorithm converges, providing an
159 estimate of the perceptual boundary. To calculate this force, we took the difference
160 between the sensed force in the 500 msec before and the final 500 msec of the

161 plateau phase of servo displacement. The average displacement for the arm in this
162 time window was measured as 4.4 mm, and the average lateral force, across all
163 subjects and all conditions, was 1.14 Newton (about 110 grams). A force of this
164 magnitude would be expected simply due to the passive stiffness of the arm. This is
165 consistent with the idea that active force production was not a significant factor in
166 the obtained perceptual estimates.

167

168 **Reaching movements**

169 In the dynamics-learning task, subjects made reaching movements to a single visual
170 target. The start point was situated in the center of the workspace, ~ 25 cm from the
171 subject's chest along the body midline. The target was located 15 cm directly in
172 front of the start position in the sagittal plane. The start and target positions were
173 represented by white circles, 20 mm in diameter. A yellow circle, 12mm in diameter,
174 provided the subject with visual feedback on the hand's current position. Note that
175 visual feedback was present during reaching movements and was not provided
176 during the perceptual testing phase. Subjects were also asked to move as straight as
177 possible. Visual feedback of movement duration was provided at the end of each
178 reaching movement by a target color change. The feedback was used to help
179 subjects achieve the desired movement duration, but no trials were removed from
180 analysis if subjects failed to comply with the speed requirement. At the end of each
181 trial, the robot returned the subject's hand to the start position. In the force-field-
182 learning phase, the robot applied a counterclockwise load to the hand that primarily

183 acted to deflect the limb to the left. The force was applied to the hand according to
184 the following equation:

185

$$186 \begin{bmatrix} f_x \\ f_y \end{bmatrix} = D \begin{bmatrix} 0 & 18 \\ -18 & 0 \end{bmatrix} \begin{bmatrix} v_x \\ v_y \end{bmatrix}$$

187

188 where x and y are the lateral and sagittal directions, f_x and f_y are the commanded
189 force to the robot in Newtons, v_x and v_y are hand velocities in Cartesian coordinates
190 in meters per second, and D defines the direction of the force-field; For the
191 counterclockwise (CCW) force-field, D is -1.

192

193 **Video recordings**

194 Video recordings provided subjects with a screen-centered, top-down view of
195 another individual's right arm and the workspace within which movements to the
196 target were made. The recording depicted an individual moving to the target as the
197 robot applied perturbing force to the arm. In the CCW video recording, the forces
198 were the same as those later experienced by the observer (Congruent group); in the
199 CW video recording, the forces applied in the observational phase were opposite to
200 those later experienced by the observer (Incongruent group). These recordings
201 showed the progression from highly perturbed to straight movements typically
202 associated with motor learning. Superimposed on the video image were images of
203 the visual target and a cursor representing the position of the hand (Fig 1). Each

204 recording was approximately 3 min in duration and demonstrated a series of 28
205 movements from the beginning of the force-field training sequence.

206

207 A third video was developed for the control experiment. This video comprised the
208 28 original movements from the CCW video that we utilized for the Congruent
209 group, but in this case the movements were presented in random order. The order
210 was further edited in order to minimize information potentially relevant to learning.
211 Thus, high-error movements were not presented in the first three trials, repetitive
212 sequences of low-error movements were not presented at the end and
213 homogeneous blocks of high or low-error trials were avoided.

214

215 All video presentations were repeated 5 times. The subject's task was to observe
216 attentively. No mention was made of the forces applied. To ensure that subjects paid
217 attention to the video recordings, we asked them to monitor the depicted
218 movements and report to the experimenter when movements made by the subject
219 in the video were too fast or slow, as indicated by the targets changing color. We
220 found that subjects were highly accurate (mean score > 90% correct), which
221 provides support for the idea that adequate attention was given to the observational
222 phase of the experiment. During observation, subjects were instructed to keep hold
223 of the robot handle, which was positioned to correspond to the starting position of
224 the actor on the screen.

225

226 **Data analysis**

227 The data from all perceptual runs in each phase of the experiment were used to
228 estimate the perceived boundary between left and right. The entire set of measured
229 lateral deviations and associated binary responses were fitted on a per-subject basis
230 with a logistic function that gave the probability of responding “the hand was
231 deflected to the right” as a function of the lateral position of the hand. We used a
232 least-squares error criterion (glmfit in Matlab) to obtain the fit. The 50% point of
233 the fitted function was taken as the perceptual boundary and used for purposes of
234 statistical analysis.

235

236 We assessed motor learning by calculating the perpendicular deviation of the hand
237 from a straight line connecting the start point and the target, at the movement peak
238 velocity (PDmaxv). We assessed the change in PDmaxv over trials by fitting a single
239 exponential function to the data averaged across subjects. The equation takes the
240 form $P = c - ae^{-bn}$, where P is the PDmaxv on trial n . This function is well
241 approximated in the discrete domain by $P(n) = c - a(1 - b)^n$, where b is the rate of
242 learning and c is the asymptotic performance level. Separate fits were conducted for
243 subjects that experienced force-fields congruent with their visual observation and
244 those for which the force-field training was incongruent.

245

246 To further investigate potential effects of the video recording on motor
247 performance, we also computed the perpendicular deviation of the hand from the
248 same straight line in an early stage of the movement, 100 ms following movement
249 onset (PD100). This particular variable was chosen for this test because it

250 minimizes the likelihood of feedback based corrections in limb trajectory measures.
251 For both PDmaxv and PD100, we quantified motor learning as the difference in
252 movement curvature between the final 5 and the first 5 movements in the force-
253 field condition. In addition to mean movement curvature, we evaluated the
254 between-subjects variability of motor performance in the first part (10 movements)
255 of the force-field learning task.

256

257 Changes in somatosensory perception were evaluated statistically using ANOVA. To
258 compare motor learning in subjects that viewed CW versus CCW force-field learning
259 videos we employed independent-samples t tests. Differences in the variability of
260 motor performance were assessed by using Bartlett's test. The two groups showed
261 similar baseline estimates of sensed limb position, and no differences were found in
262 the two baselines, in either of the two groups ($p > 0.1$). The second baseline was
263 therefore taken as the reference point for subsequent analyses.

264

265 **RESULTS**

266 Participants were tested for somatosensory perception at the beginning of the
267 experimental session as well as at several points in the experimental sequence:
268 following reaching movements in the absence of any mechanical load (null
269 condition), following video observation and following force-field learning (Fig. 1).

270

271 Fig. 2b shows estimates of sensed limb position obtained for the two video
272 observation conditions. It is seen that there are shifts in sensed limb position that

273 vary with the pattern of force-field learning observed in the video. In both cases,
274 there is a shift in the perceptual boundary in a direction opposite to the observed
275 force. Thus, subjects that watched a video of adaptation to a rightward force-field
276 showed a leftward shift in the perceptual boundary and vice versa. This same
277 pattern of perceptual change is observed under actual force-field learning
278 conditions. When subjects were subsequently required to train under actual force-
279 field conditions, further perceptual change was observed. For subjects in which the
280 force-field was congruent with the observed learning, we saw a further shift in the
281 perceptual boundary, in the same direction as that obtained during observational
282 learning. In contrast, when the learned force-field was incongruent with the
283 observed learning, the subsequent perceptual shift was in the direction one would
284 expect on the basis of the mechanical load (and resulted in the elimination of the
285 previous perceptual change). These effects are summarized in Fig. 2C which shows
286 changes in the perceptual boundary relative to the pre-videoclip baseline.

287

288 To test the hypotheses of the study, we designed statistical analyses that could
289 assess the specific effect of each manipulation separately. ANOVA was therefore
290 employed to assess perceptual change following video observation (Perceptual test
291 2 - 1) and following actual force-field learning (Perceptual test 3 - 2). ANOVA
292 revealed that the pattern of perceptual changes differed for subjects in the
293 congruent and incongruent experimental conditions ($F(1,27) = 5.75, p < 0.03$).
294 Following video observation, sensed limb position was different for participants
295 who watched the CW videoclip and those who watched the CCW videoclip (post-hoc

296 comparison: $p < 0.01$). Watching opposite forces led to opposite changes in sensed
297 limb position. The absolute change in sensed limb position due to video observation
298 was reliably different than zero ($t(27) = 2.82, p < 0.01$).

299

300 The force-field learning followed video observation and resulted in changes in
301 sensed limb position that were in the same direction and of similar magnitude in the
302 two groups ($p > 0.4$). When comparing this change in perception with the previous
303 change, following videoclip observation, differences emerged for the two groups.
304 The group that watched a CW force in the videoclip and then experienced a force-
305 field in the opposite, CCW direction (shown in red in Fig. 2C), showed a significant
306 difference in perceptual change scores (post-hoc comparison: $p < 0.02$). In
307 particular, whereas the CW videoclip resulted in a leftward shift in the perceptual
308 boundary, subsequent training in a CCW field served to create a perceptual change
309 in the opposite direction. In contrast, for the group who first watched and then
310 experienced a CCW force-field (shown in blue Fig. 2C), both manipulations resulted
311 in rightward shifts in the perceptual boundary. The increased shift in the rightward
312 direction was not reliably different in magnitude than that which occurred due to
313 visual observation alone ($p > 0.4$).

314

315 We assessed whether the change in sensed limb position following actual force-field
316 learning was related to that experienced following video observation. For the group
317 that observed and experienced forces that acted in the same direction (CCW), a
318 highly significant inverse relationship was observed (Fig. 3). Subjects that

319 experienced larger changes in sensed limb position following video observation had
320 smaller subsequent changes following force-field learning ($r(13) = -0.66, p < 0.01$).
321 Subjects that watched learning in one direction and then trained in an opposite
322 force-field showed no reliable correlation in changes in sensed limb position due to
323 the video and the actual force-field ($r(13) = 0.29, p > 0.3$).

324

325 We compared changes in sensory perception following observational learning with
326 those reported previously in the context of actual force-field learning. For this
327 analysis we used the data from a previous study (Vahdat et al., 2011) in which we
328 used a similar experimental protocol (with $n=13$) and the same perceptual testing
329 procedure as employed here. The analysis focused on changes in sensed limb
330 position in the perceptual tests that were conducted following the primary
331 experimental manipulation, that is, immediately following actual versus
332 observational learning. A comparison of the two datasets revealed no differences in
333 the magnitudes of perceptual change between the observational and physical
334 learning conditions ($t(25) = 0.65, p > 0.5$). However, sensory change following actual
335 motor learning showed significantly less between-subjects variability, as compared
336 to motor learning by observing ($t(12) = 10.51, p < 0.002$).

337

338 All subjects were tested for motor learning using a CCW force-field. Subjects who
339 had previously watched a movie showing a CCW force (congruent condition)
340 showed better performance in the motor learning task than subjects that watched a
341 CW force-field (incongruent directions) (Fig. 1). Asymptotic performance (mean \pm

342 99% CI) based on exponential fits to the PDmaxv was reliably better for subjects in
343 the congruent (-2.3 ± 0.34 mm) than in the incongruent group (-4.3 ± 0.4 mm). The
344 overall goodness of fit was similar in the two groups ($r^2 = 0.69$ and 0.61 , for
345 congruent and incongruent conditions respectively).

346

347 We also evaluated the lateral deviation of the limb at a point 100 ms into the
348 movement (PD100). Fig. 4 shows that the amount of learning (that is, the decrease
349 following learning in the magnitude of lateral deviation 100 ms into the reaching
350 movement) was greater for subjects who experienced the same force in the
351 observational and actual learning tasks ($t(26) = 2.16, p < 0.05$). Measures of lateral
352 limb deviation at maximum velocity showed similar patterns, although the
353 difference was not statistically reliable. We observed differences in variability of
354 movement between the two conditions as well. The group exposed to a congruent
355 force in the observational and actual learning task showed less variability in
356 movements in the initial motor learning trials (PDmaxv: $t(13) = 12.64, p < .001$;
357 PD100: $t(13) = 6.49, p < 0.02$).

358

359 The results show that video observation produces reliable changes in both sensed
360 limb position and in motor performance. However, it is unclear whether the effects
361 depend specifically on the observation of learning or whether they are attributable
362 to the statistical distribution of the events in the visual display. In particular, the
363 videoclips show trajectories that are curved in a single direction, to the left for the
364 CCW videoclip and to the right for the CW clip. Thus, it is possible that the

365 asymmetric distribution of the visual input, rather than the observation of learning,
366 biases subjects toward one side of the workspace, thus producing changes in sensed
367 limb position.

368

369 As a control, we tested a further group of subjects that were exposed to the same
370 CCW videoclip employed before, except that in this case the order of the movements
371 in the video was randomized. In this way, the overall visual information presented
372 to subjects in the two experiments was the same. However, the video sequence did
373 not show learning but rather a random mixture of high and low-error trials. If the
374 distributional properties of the visual input are sufficient to induce the effects
375 described above, we would expect subjects to show a pattern of change in sensed
376 limb position similar to that observed for subjects in the congruent condition. A
377 comparable level of motor learning should also be observed.

378

379 Fig. 5a shows estimates of sensed limb position for the scrambled CCW video
380 observation condition, along with the data from the original video clips. The change
381 in sensed limb position due to scrambled CCW video observation was not reliably
382 different than zero ($t(13) = -1.35, p > 0.19$), with half of the sample showing changes
383 in one direction and half in the other. Indeed, the overall pattern was opposite to
384 that of the CCW-video group, and not significantly different from the pattern of the
385 CW-video group ($t = -0.51, p > 0.6$).

386

387 We conducted further tests for changes to sensed limb position following video
388 observation using bootstrap procedures (bootstrp and bootci in Matlab). We
389 estimated the 95% confidence interval for the mean change in sensed limb position
390 (bias) following observation of the videoclip in the CCW, CW and the scrambled
391 CCW video control condition, using 100000 iterations each. For each of the two
392 experimental groups, the estimated change in sensed limb position was reliably
393 different than zero (C.I.: [0.0002, 0.0046] for the CCW-video group, [-0.0053, -
394 0.0003] for the CW-video group). This was not the case for the scrambled CCW
395 video control condition (C.I.: [-0.0042, 0.0005]).

396

397 Fig. 5b shows motor learning data for the scrambled CCW-video group, along with
398 learning data for the two original groups of subjects. Subjects in the scrambled CCW-
399 video group exhibited asymptotic levels of motor learning that were intermediate to
400 the two other groups. Asymptotic performance based on exponential fits to the
401 PDmaxv (-3.5 ± 0.3 mm, mean \pm 99% CI; $r^2 = 0.73$) was reliably better compared
402 than that of the group that observed an incongruent, CW video, but reliably worse
403 than subjects that observed the original CCW video ($p < 0.01$ in each case).
404 Comparisons of motor learning based on the raw data resulted in the same overall
405 pattern, but without statistical significance.

406

407 **DISCUSSION**

408 The present investigation tested the idea that observational motor learning
409 produces changes to somatosensory function, in addition to its effects on motor

410 learning. We found that sensed limb position changed following the observation of
411 an actor learning to reach in a force-field. The direction of the perceptual shift
412 depended on the direction of the observed force. These changes were in the same
413 direction as those previously described following actual motor learning (Ostry et al.,
414 2010; Vahdat et al., 2011). Moreover, consistent with Mattar and Gribble (2005),
415 subjects that viewed videos that were congruent with subsequent force-field
416 learning showed greater amounts of learning and had movements that were less
417 variable.

418

419 These effects could not be attributed to the observation of movement error alone. A
420 control experiment showed that observing learning was important. Observing a
421 sequence of movements that randomly varied from high to low-error trials did not
422 produce reliable changes in sensed limb position. Random-video observation also
423 had a reduced impact on motor learning.

424

425 A similarity in the processes underlying perceptual change following observational
426 learning and actual motor learning is indicated by two related observations. First,
427 the average change in perception following observational learning is in the same
428 direction and of the same magnitude as the one for actual motor learning. Second,
429 observational learning and real physical practice appear to tap into the same
430 capacity for sensory change in that subjects that showed a greater change following
431 learning by observing showed a reliably smaller change following physical motor
432 learning, and vice versa. At the same time, the sensory outcome of the two

433 procedures is not identical. Compared to the sensory shifts described in previous
434 investigations following physical learning, the changes reported here are
435 characterized by greater between-subjects variability. This is in line with previous
436 investigations showing, for the motor domain, similar performance between the
437 physical and imagined execution of actions, but with higher variability in the case of
438 imagery (Papaxanthis et al., 2002).

439

440 The present results show that motor learning affects both motor and sensory
441 systems, regardless of whether the learning is achieved by standard physical
442 practice or by observational learning. In the case of actual motor learning, changes
443 to both sensory and motor function presumably ensure that the systems remain in
444 register. Together with previous observations (Mattar and Gribble, 2005), the
445 present study provides support for a similar effect of observed motor learning on
446 the broader sensorimotor network that is responsible for motor adaptation.

447

448 A number of studies have now shown that the somatosensory areas of the brain
449 have mirror-like properties, resembling those that have been previously described
450 in premotor (Rizzolatti and Craighero, 2004) and affective (Wicker et al., 2003)
451 networks of the brain, such that they are active both when an action is observed as
452 well as when the same action is executed (Di Pellegrino et al., 1992). The
453 observation of the action of others has been shown to evoke activation in areas BA1
454 and BA2 and also second somatosensory cortex (Avikainen et al., 2002; Cross et al.,
455 2006; Gazzola and Keysers, 2009; Keysers et al., 2010). BA2 activation has been

456 reported for the observation of hands interacting with objects (Hasson et al., 2004;
457 Pierno et al., 2009). The influence of visual information on haptic processing in BA2
458 presumably depends on reciprocal connections between both BA2 and second
459 somatosensory cortex and regions of the intraparietal sulcus (e.g., the ventral
460 intraparietal area) and the inferior parietal lobule (Pons and Kaas, 1986; Lewis and
461 Van Essen, 2000; Rozzi *et al.*, 2006). In the monkey these parietal areas have been
462 shown to combine visual, auditory and somatosensory information (Lewis and van
463 Essen, 2000; Maunsell and van Essen, 1983), which is relayed to somatosensory
464 cortex and to circuits in premotor cortex (Keysers and Perret, 2004). This pattern of
465 connections could provide the neural substrates by which the somatosensory
466 experience of adapting to a force field could be engaged by passive visual
467 observation. Moreover, these areas are similar to those implicated in the perceptual
468 changes that occur in conjunction with actual motor learning (Vahdat et al., 2011).
469 This latter network comprises second somatosensory cortex, ventral premotor
470 cortex and supplementary motor cortex. It is noteworthy that the primary brain
471 areas reported in action-observation studies, ventral premotor cortex,
472 supplementary motor area, inferior parietal lobule and the superior temporal sulcus
473 (Kilner, 2011) partially overlap those reported in the context of the perceptual
474 aspects of motor learning.

475

476 A previous study has shown that motor learning is similarly influenced by watching
477 a natural progression of learning, a scrambled sequence of high and low-error trials
478 or even a sequence of high-error trials alone (Brown et al., 2010). These results are

479 not consistent with the findings of the present control study which shows that
480 observing a scrambled sequence of movements has no reliable effects on perceptual
481 function and reduced effects on motor learning. The difference in findings may lie in
482 the fact that the previous study utilized videos showing eight different directions of
483 movement, thus providing subjects with more examples of high-error movement,
484 compared to our study in which only one direction of movement was employed. It is
485 possible that in this previous study the amount of error information provided the
486 basis for effective learning even in the scrambled condition. In the present study, the
487 relatively sparse error information uncovered the importance of a coherent learning
488 sequence for the success of observational learning. It should also be noted that this
489 previous study (Brown et al., 2010) did not measure sensed limb position. This
490 leaves open the possibility that their scrambled videos produced only a partial
491 learning, one that involved the motor component but did not extend to the
492 somatosensory system. In the present control study there were no significant
493 changes to estimates of sensed limb position following the observation of a
494 scrambled CCW video. Half of the subjects tested in the control condition showed
495 perceptual shifts in one direction and half in the other. However, the overall trend in
496 the perceptual judgments was in a direction opposite to that obtained with the
497 standard CCW video that shows learning, and closer to that of the CW video. Indeed
498 it is interesting to consider the possibility that when participants are visually
499 exposed to movements that do not involve learning, but are systematically biased
500 toward one side of the workspace different mechanisms of cross-modal perceptual
501 learning are engaged. An effect similar to that in the present control condition has

502 been observed in speech listening studies where a habituation-like phenomenon has
503 been reported. When subjects are repeatedly exposed to a given vowel sound at one
504 end of an auditory continuum, their ability to discriminate it from the vowels at the
505 other end is altered. There is a shift in the perceptual boundary such that subjects
506 are more likely to classify subsequent sounds as belonging to the other category
507 (Cooper, 1974). Similarly, in our study participants who have been repeatedly
508 exposed to movements deviated toward the left modify their subsequent perceptual
509 classification reporting a greater number of deviations in the other direction (by
510 shifting their perceptual boundary toward the left). If a similar mechanism underlies
511 the results of the present control condition and that observed in speech listening
512 studies, then one would expect that presentation of a scrambled CW video would
513 yield a symmetrical effect, with somatosensory judgments biased toward the right.
514 While the present investigation was aimed at testing the effects of observing
515 learning on somatosensory function, it would be of additional interest to assess
516 possible habituation phenomena in experiments involving somatosensory
517 classification and learning.

518

519 The results reported here have potential application in the field of rehabilitation,
520 given the increasing interest in action observation training for the rehabilitation of
521 stroke patients (Celnik et al., 2008). Properly designed action-observation trainings
522 could potentially be used to improve the recovery of sensory function in stroke
523 patients. Additionally, the evaluation of sensory function could become a valuable

524 complementary tool for assessing the outcome of action-observation training aimed
525 at restoring motor function.

526

527 **Disclosures**

528 The authors declare no competing financial interests.

529

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532

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538

539 **Authors' contribution**

540 BNF, MD, EB, DJO designed research, BNF performed research, BNF, MD analyzed

541 data, BNF, MD, EB, DJO wrote the paper.

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544

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639 **Figure 1.** Sequence of procedures and experimental data showing changes in
640 movement curvature (PD_{maxv}) during training averaged across subjects (\pm SEM).
641 Subjects that observed and practiced movements in a CCW field are in blue
642 (congruent group, N = 14). Subjects that observed a CW field and then trained with a
643 counter-clockwise load are in red (incongruent group, N = 14). The cyan and
644 magenta lines show exponential fits to the data for the congruent and incongruent
645 groups, respectively.

646

647 **Figure 2.** Assessment of somatosensory function.

648 **A,** Representative hand paths during perceptual tests. The color code gives the trial
649 number in the testing sequence.

650 **B,** Fitted psychometric functions for two representative subjects showing perceptual
651 classification before (gray) and after (red or blue) observational force-field learning.
652 As in previous studies of force-field learning with physical practice, following motor
653 learning by observing the perceptual boundary shifts in a direction opposite to the
654 observed-applied force.

655 **C,** Mean change (\pm SEM) in the perceptual boundary (bias) following observational
656 motor learning and following actual motor learning, for observation of a CCW (blue,
657 N = 14) or CW (red, N = 14) force-field. For visualization purposes, the two groups
658 have been aligned at baseline.

659

660 **Figure 3.** For subjects that both observed and practiced a force-field in a CCW
661 direction (N = 14), the amount of shift in the perceptual boundary following

662 observational learning is inversely correlated with the change following actual
663 motor learning.

664

665 **Figure 4.** Assessment of motor learning.

666 **A,** Subjects that observed and practiced a force-field in the same direction
667 (congruent group, N = 14) show greater motor learning than the group that
668 observed and practiced force-fields in opposite directions (incongruent group, N =
669 14). PD100 gives measures of lateral deviation 100 ms into the movement. PDmaxv
670 is lateral deviation at maximum velocity. For both measures, motor learning is
671 expressed as the mean difference in deviation scores between the last 5 and first 5
672 trials (\pm SE).

673 **B,** The congruent group shows less variable movements at the beginning of the
674 force-field task, compared to the incongruent group. Variability is expressed as
675 standard deviation across subjects in mm.

676

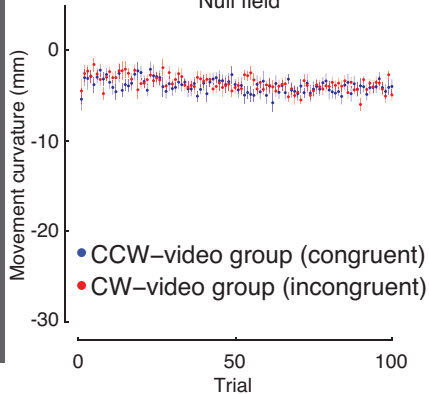
677 **Figure 5.** Watching a video in which the order of the movements was randomized
678 resulted in no change in somatosensory perception and a reduced benefit to motor
679 learning.

680 **A,** Mean perceptual change (\pm SEM) following observation of a standard-order CCW
681 video (blue, N = 14), a scrambled-order CCW video (green, N = 14) or a standard-
682 order CW video (red, N = 14).

683 **B**, Asymptotic performance (\pm 99% CI) in force-field learning trials for the same
684 three groups, derived from exponential fits to the motor learning data (lateral
685 deviation at maximum velocity, PDmaxv).

Perceptual test 0

Null field



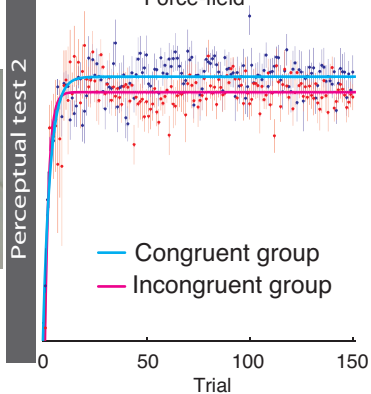
Perceptual test 1

Videoclip

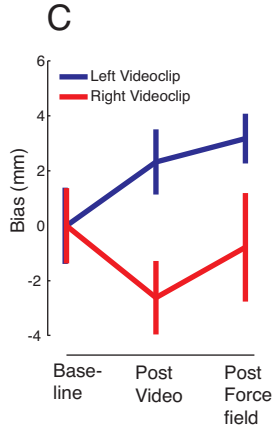
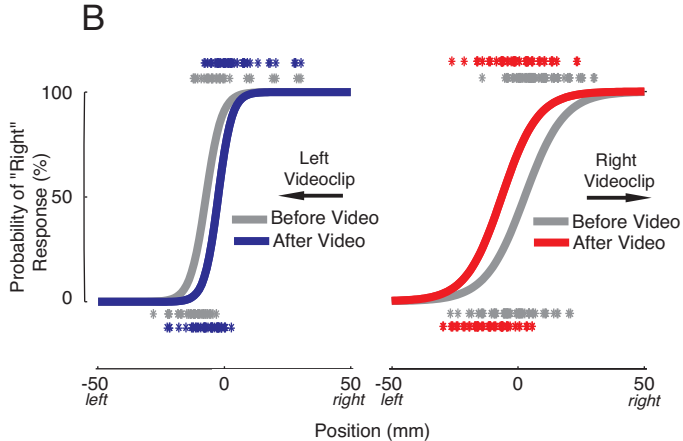
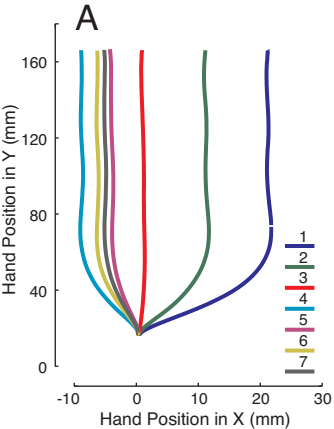


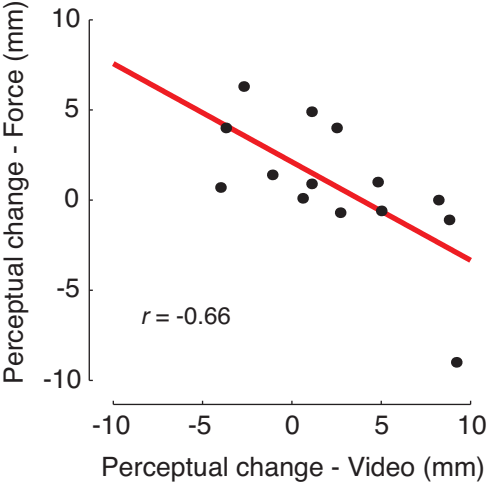
Perceptual test 2

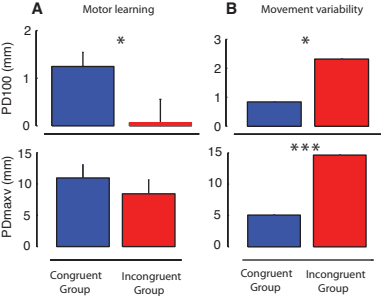
Force-field

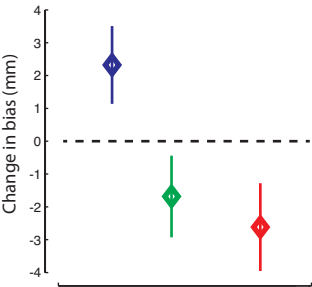


Perceptual test 3





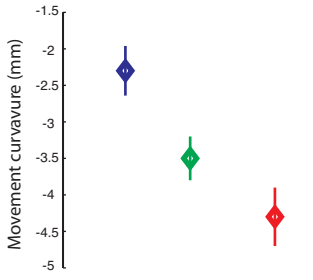


A

Ordered Left Video

Scrambled Left Video

Right Video

B

Ordered Left Video

Scrambled Left Video

Right Video