

1 Separate Motor Memories are Formed When Controlling Different  
2 Implicitly Specified Locations on a Tool

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15 **Abstract**

16 Skillful manipulation requires forming and recalling memories of the dynamics of objects linking  
17 applied force to motion. It has been assumed that such memories are associated with entire  
18 objects. However, we often control different locations on an object, and these locations may be  
19 associated with different dynamics. We have previously demonstrated that multiple memories  
20 can be formed when participants are explicitly instructed to control different visual points  
21 marked on an object. A key question is whether this novel finding generalizes to more natural  
22 situations in which control points are implicitly defined by the task. To answer this question, we  
23 used objects with no explicit control points and tasks designed to encourage the use of distinct  
24 implicit control points. Participants moved a handle, attached to a robotic interface, to control the  
25 position of a rectangular object ('eraser') in the horizontal plane. Participants were required to  
26 move the eraser straight ahead to wipe away a column of dots ('dust'), located to either the left  
27 or right. We found that participants adapted to opposing dynamics when linked to the left and  
28 right dust locations, even though the movements required for these two contexts were the same.  
29 Control conditions showed this learning could not be accounted for by contextual cues or the fact  
30 that the task goal required moving in a straight line. These results suggest that people naturally  
31 control different locations on manipulated objects depending on the task context, and that doing  
32 so affords the formation of separate motor memories.

33 **New & Noteworthy**

34 Skilled manipulation requires forming motor memories of object dynamics, which have been  
35 assumed to be associated with entire objects. However, we recently demonstrated that people can  
36 form multiple memories when explicitly instructed to control different visual points on an object.  
37 Here we show that this novel finding generalizes to more natural situations in which control  
38 points are implicitly defined by the task.

## 39 **Introduction**

40 Numerous studies of motor learning have examined adaptation of reaching movements to novel  
41 loads, or force fields, applied to the hand via a handle attached to a robotic interface (Shadmehr  
42 et al. 2010; Wolpert et al. 2011). Many of these studies have used a ‘viscous curl field’ where the  
43 load depends on hand speed and acts perpendicular to hand direction. Although this unusual load  
44 initially perturbs the hand movement, over trials people adapt such that they can make roughly  
45 straight line movements to the target; learning that is thought to involve the formation of a motor  
46 memory, or internal model, of the load (Shadmehr and Mussa-Ivaldi 1994; Flanagan and Wing  
47 1997; Wolpert and Ghahramani 2000; Wolpert and Flanagan 2010). Previous studies have also  
48 shown that subsequent adaptation to an opposing load (e.g., a viscous curl field that acts in the  
49 opposite direction) largely overwrites the initial learning such that people must readapt when the  
50 original load is experienced again following the opposing load (Shadmehr and Mussa-Ivaldi  
51 1994; Caithness et al. 2004).

52 A number of studies have asked whether learning of opposing loads (or dynamics) can be  
53 facilitated by the provision of contextual information. Perhaps not surprisingly, it is well  
54 established that people can learn different loads if they are linked to different movements; for  
55 example, movement in different directions or in different regions of space (Thoroughman and  
56 Shadmehr 2000; Howard et al. 2013). However, when the parameters of the required movement  
57 are held constant, it has been shown that contextual cues, including arbitrary colour cues, are not  
58 effective in allowing people to form separate motor memories for opposing loads (Gandolfo et  
59 al. 1996; Howard et al. 2013). Interesting, when visuomotor rotations are gradually applied such  
60 that participants unwittingly generate similar hand movements when moving a cursor to two  
61 different targets, they can form separate motor memories of dynamics for these identical hand  
62 movements (Hirashima and Nozaki 2012). However, in this case, distinct visuomotor  
63 transformations are involved in planning movements to the two targets.

64 In studies of force-field adaptation, such as those described above, the viewed ‘object’ being  
65 moved is typically a small circular disk linked to the position of the handle, and the task involves  
66 controlling the center of the disk. However, most of the objects we grasp and move in real world  
67 tasks have more complex geometry and we can control different locations, or control points, on  
68 the object. Indeed, many objects, like a pencil or a hammer, can serve more than one function  
69 and these functions are often related to different control points. For example, we control opposite  
70 ends of a pencil for writing and erasing, and the middle when placing it behind our ear.  
71 Moreover, control can rapidly shift between different points on a single object within a single  
72 task. For example, we may control the lip of a glass as we bring it to our mouth and then the base  
73 of the glass when replacing it on a table. Importantly, there may be different dynamics  
74 experienced when controlling these different control points. Thus, when using a broom, we can

75 control the left or right edge when that edge moves along and contacts a wall, and the dynamics  
76 will depend on which edge contacts the wall.

77 A recent study showed that people can form distinct motor memories of opposing loads when  
78 controlling different points on an object, even when making identical movements for the two  
79 loads (Heald et al. 2018). In this previous experiment, participants grasped the handle of a  
80 robotic manipulandum (Fig. 1A) which was aligned to the center of a virtual rectangular object  
81 (see Fig. 1B, C). In the ‘single explicit control point’ condition (Fig. 1B), the participant was  
82 required to move a central control point (central yellow circle in the figure) to the central target.  
83 A second, irrelevant ‘target’ was visible on the left or right and its position was linked to the  
84 load—either a clockwise (CW) or counter clockwise (CCW) viscous curl field—experienced  
85 during the movement. Thus, the irrelevant target provided an arbitrary visual cue about the  
86 direction of the field. In the ‘different explicit control points’ condition (Fig. 1C), participants  
87 moved either the left or right control point (see left and right yellow circles in the figure) to the  
88 (now relevant) left or right target, respectively. The left and right targets were again linked to  
89 opposing viscous curl fields. Heald and colleagues (2018) found that participants could not form  
90 separate memories for the two fields in the single explicit control point condition. That is, no  
91 adaptation was observed for either field indicating complete interference. This result is consistent  
92 with previous work showing that arbitrary visual cues do not facilitate the formation of separate  
93 motor memories (Howard et al. 2013). In contrast, participants could form distinct motor  
94 memories in the different explicit control points condition, even though the movements were  
95 identical for the different loads.

96 Whereas Heald and colleagues (2018) provided participants with visible, discrete control points  
97 that they were explicitly instructed to control, in many real-world manipulation tasks, the control  
98 points are implicitly specified by the demands of the task. Thus, in the broom example cited  
99 above, the controlled location (e.g., the edge closest to the wall) is implicitly specified by the  
100 task environment. The aim of the current study was to assess whether the formation of distinct  
101 motor memories for opposing dynamics, recently established for explicit control points, also  
102 occurs for implicitly specified control points. Our basic approach was similar to that employed  
103 by Heald and colleagues. That is, participants controlled the movement of a rectangular object by  
104 moving a handle attached to a robotic device. In our main condition (Different Implicit Control  
105 Points condition), participants were required to ‘erase’ a column of dots (‘dust’) while avoiding  
106 an obstacle (Fig. 2A). The dust and obstacle were located on either the left or right and  
107 positioned such that, for both locations, participants were required to make an approximately  
108 straight line movement to remove the dust while avoiding the obstacle. CW and CCW viscous  
109 curl fields were linked to the left and right dust/obstacle locations such that the load tended to  
110 perturb the hand *away* from the obstacle. We hypothesized that participants would control the

111 side of the object where the dust and obstacle were located and this would allow them to form  
112 distinct motor memories of the opposing force fields.

113 Two single control point conditions were also run as control experiments. In the Single Control  
114 Point Target condition, participants were required to move a circle, located at the center of the  
115 object, to a circular target located straight ahead (Fig. 2B). As in the main condition, a column of  
116 dust and an obstacle were located on either the left or right and linked to CW and CCW fields,  
117 respectively. The aim of this control was to rule out the possibility that purely contextual  
118 information provided by the dust and obstacle (and the wiping away of the dust) can account for  
119 learning of opposing fields. In the Single Control Point Line condition, participants were  
120 required to move a narrow object to remove a central column of dust (Fig. 2C). As in the other  
121 conditions, a column of dust and an obstacle were located on either the left or right and linked to  
122 CW and CCW fields, respectively. The aim of this control was to rule out the possibility that  
123 learning occurs when the goal of the reaching movement is to remove a column of dust, as  
124 opposed to when the goal is simply to move the hand to a single target.

## 125 **Methods**

### 126 *Participants*

127 Thirty-two participants (19 women) between 18 and 23 years of age were recruited from the  
128 student population at Queen's University through the Queen's Paid Research Study page on  
129 Facebook and advertisements. Participants received \$15 an hour for their participation. All  
130 participants were right-handed and had normal or corrected-to-normal vision. After providing  
131 informed consent, participants were assigned to one of three groups. Group 1 (N = 12) completed  
132 the Different Implicit Control Points condition, Group 2 (N = 10) completed the Single Implicit  
133 Control Point Target condition, and Group 3 (N = 10) completed the Single Implicit Control  
134 Point Line condition. The study was approved by the Queen's General Research Ethics Board  
135 and complied with the Declaration of Helsinki.

### 136 *Materials*

137 All tasks were performed using the wBOT planar robotic manipulandum and virtual-reality  
138 system (Howard, Ingram, & Wolpert, 2009; see Fig. 1A). Torque motors allow forces to be  
139 generated on the handle. A monitor mounted above the wBOT projected virtual images into the  
140 plane of movement through an opaque horizontal mirror. Note that in our previous study (Heald  
141 et al. 2018), participants could see their actual hand through the mirror whereas in the current  
142 study they only saw a circle, or cursor, representing the position of their hand.

143 In all trials, the participant moved a rectangular object, centered on the wBOT handle, by  
144 translating the handle. The orientation of the object was fixed, such that rotating the handle had

145 no effect on the object's orientation. On each trial, the wBOT could generate no force (baseline  
146 trials), forces specified by a velocity-dependent (i.e., viscous) curl field (perturbation trials), or  
147 forces specified by a force channel (channel trials). For the curl field, the force generated on the  
148 hand was given by:

$$149 \begin{bmatrix} F_x \\ F_y \end{bmatrix} = b \begin{bmatrix} 0 & -1 \\ 1 & 0 \end{bmatrix} \begin{bmatrix} \dot{x} \\ \dot{y} \end{bmatrix}$$

150 where  $F_x$ ,  $F_y$ ,  $\dot{x}$  and  $\dot{y}$  are the x and y forces and velocities at the handle. The viscosity, or field  
151 gain,  $b$  was set to  $\pm 15$  Ns/m and the sign of  $b$  specified whether the curl field was clockwise  
152 (CW) or counterclockwise (CCW). Note that to compensate for a CW or CCW curl field, the  
153 participant must generate a leftward or rightward force, respectively, while moving the handle.  
154 On channel trials, the hand was constrained to move along a straight ahead line. This was  
155 achieved by simulating forces associated with a stiff, damped spring with the forces acting in the  
156 x direction. The stiffness was 5,000 N/m and the damping coefficient was 5 Ns/m. Channel trials  
157 enable the measurement of feedforward or predictive forces generated by the participant  
158 orthogonal to the reach direction (Scheidt et al. 2000; Milner and Franklin 2005; Smith et al.  
159 2006). These forces can be used to estimate the level of adaptation to the force field (see below).  
160 The wBOT was also used to simulate contact forces if the object controlled by the participant  
161 contacted the obstacle. The sides of the obstacle were modelled as a stiff, damped spring with a  
162 stiffness of 4,000 N/m and a damping coefficient of 1 Ns/m. Note that we did not apply forces to  
163 the object to simulate inertia.

#### 164 *Procedure*

165 At the start of all trials, the object and start box (center approximately 30 cm in front of the  
166 middle of the participant's chest) were displayed and the robot moved the rectangular object  
167 (attached to the handle of the robot which was held by the participant) to the start box (Fig. 2).  
168 Once the participant held the object within 0.3 cm of the center of the start box, and below a  
169 speed of 0.5 cm/s, for 100 ms, the remaining items in the scene were displayed (e.g., obstacle,  
170 dust, end line, target). After a 0.2 s delay, a brief tone was delivered which served as the go  
171 signal.

172 In the Different Implicit Control Points condition (Fig. 2A), participants were required to move  
173 the object (orange rectangle, width 160 mm, height 10 mm) from the start box (gray rectangle,  
174 width 164 mm, height 14 mm) to the end line (gray rectangle, width 240 mm, height 14 mm),  
175 while erasing a column of dust (50  $1 \times 1$  mm dots forming a column 10 mm wide and 80 mm  
176 high) and avoiding an obstacle (width 40 mm, height 100 mm). Participants were instructed to  
177 "remove the dust while avoiding the obstacle" but no priority was given to either of these task

178 demands. No instructions were given about gaze or head orientation. The required movement  
179 distance (i.e., the y distance between the centers of the start box and end line) was 120 mm. The  
180 dust could be located on the left or right with the center positioned 70 mm laterally from midline  
181 (i.e., the center of the object when at the start location) and thus 10 mm closer to midline than the  
182 edge of the object. The obstacle was positioned on the same side as the dust with the near edge  
183 located 90 mm laterally from the midline, and thus 10 mm farther from the midline than the edge  
184 of the object. The bottom edge of the obstacle was aligned, in the y direction, with the top edge  
185 of the object, when at the start position, and the bottom edge of the dust was 50 mm above the  
186 top edge of the object. Finally, a slightly darker orange circle (diameter 8 mm) was located at the  
187 center of the object and indicated the location of the handle.

188 The environment in the Single Control Point Target condition (Fig. 2B) was similar to the  
189 Different Implicit Control Points condition except that a start circle and an end target (green  
190 circles 10 mm in diameter) were also displayed and the center circle on the object was blue and  
191 thus more visually salient. The target was positioned straight ahead and located in the center of  
192 the end line. The participant was required to move the center circle on the object, which served  
193 as an explicit control point, from the start circle to the target. They were told to avoid hitting the  
194 obstacle but no instructions were given about the dust. If a participant asked about the dust, they  
195 were told to just focus on moving the center circle to the target.

196 The environment in the Single Control Point Line condition (Fig. 2C) was similar to the  
197 Different Implicit Control Points condition except that the object was narrow (20 mm) and an  
198 additional, centrally located column of dust was displayed. Participants were instructed to erase  
199 the central column of dust.

## 200 *Trial Structure*

201 The trial structure was the same in all three conditions. Trials were organized in blocks of 8  
202 trials, with half of the trials (randomly selected) featuring the obstacle on the left and half  
203 featuring the obstacle on the right. The experiment began with a pre-exposure phase with no  
204 force fields applied (i.e., baseline trials). This phase included 4 blocks of 8 trials making 32 trials  
205 in total. This phase was followed by the exposure phase in which opposing force fields were  
206 associated with the two contexts. Specifically, CW and CCW curl fields were associated with the  
207 left and right obstacle positions. This phase consisted of 52 blocks of 8 trials (4 per context)  
208 making 416 trials in total. Each block of 8 trials included one channel trial which was pseudo-  
209 randomly selected but could not be the first or last trial of the block to avoid consecutive channel  
210 trials. The context (i.e., obstacle location) of the channel trial alternated across blocks such that  
211 one channel trial for each context was included for every two blocks (16 trials). The exposure  
212 phase was followed by the post-exposure phase which consisted of 12 blocks of 8 trials (4 per  
213 context), making 96 trials in total, with the force fields turned off (i.e., baseline trials).

## 214 *Data Analysis*

215 The x and y positions of the hand (i.e., handle) and the x and y forces output to the robot handle  
216 were sampled at 1000 Hz and smoothed offline using a Butterworth fourth order, zero phase lag,  
217 low-pass filter with a cutoff frequency of 14 Hz. For analysis, we selected the primary movement  
218 generated by the participant as follows. We first found the time of the peak resultant velocity of  
219 the hand and then searched backward in time to find the time at which the hand last exceeded 10  
220 mm/s (start) and forward in time to find the time of the sample before the hand first dropped  
221 below 10 mm/s (end).

222 Two measures of performance were calculated based on the primary movement, as defined  
223 above. In non-channel trials, we first computed the maximum perpendicular error (MPE),  
224 defined as the largest lateral (x) deviation—positive or negative—of the hand from the straight  
225 ahead line. Note that the CW and CCW force fields, associated with the obstacle being on the  
226 left and right, tended to push the hand to the right and left resulting in positive and negative  
227 MPEs, respectively. So that we could combine all trials, we then computed the adjusted MPE by  
228 flipping the sign (i.e., negating) MPE for trials in which the obstacle was on the right. (Note that  
229 this tended to result in positive adjusted MPE values when participants did not compensate for  
230 either the CW or CCW force field.) In channel trials, we estimated the proportion of the ideal  
231 lateral force generated by the participant, where the ideal force is the force that the participant  
232 would have had to apply to move perfectly straight had the expected force field been applied.  
233 Specifically, we determined the slope when regressing, with no intercept, the actual lateral force  
234 time series generated by the participant during the movement against the corresponding ideal  
235 force. We will refer to this measure as ‘adaptation’. A value of 1 indicates full compensation for  
236 the force field, a value of 0 indicates no compensation, and negative values indicate the  
237 participant pushed in the wrong direction given the expected force field.

238 An ANOVA was performed to measure changes in adjusted MPE and adaptation during the  
239 perturbation phase of the experiment. Specifically, the first and final blocks of the exposure  
240 phase for each condition were compared. The significance level will be set to  $p < 0.05$ .

## 241 **Results**

### 242 *Representative Hand Paths*

243 The top, middle and bottom rows of Fig. 3 show hand paths from representative participants in  
244 Group 1 (Different Implicit Control Points condition), Group 2 (Single Control Point Target  
245 condition) and Group 3 (Single Control Point Line condition), respectively. Paths from selected  
246 blocks are shown including the last block of baseline trials in the pre-exposure phase (block 4),  
247 the first, sixth and last blocks of perturbation trials in the exposure phase (blocks 5, 10 and 57),  
248 and the first and last blocks of baseline trials in the post-exposure phase (blocks 57 and 68). The

249 red paths are from trials with the obstacle on the left and the blue trials are from trials with the  
250 obstacle on the right. The red rectangles show the leftward limit of possible hand motion, due to  
251 the obstacle, in trials with the obstacle on the left (red paths). The blue rectangles show the  
252 rightward limit of possible hand motion, due to the obstacle, in trials with the obstacle on the  
253 right (blue paths). Note that rectangles are not displayed for the Group 3 participant because  
254 these were  $\pm 80$  mm away from the hand. Note that the force field tended to push the hand away  
255 from the obstacle. Individual trials are numbered for the first perturbation block, in which trial 5  
256 was a channel trial.

257 Consider, first, the participant in Group 1. In the last block of the pre-exposure phase (block 4),  
258 this participant generated approximately straight hand paths. When the force field was  
259 unexpectedly turned on in the first block of the exposure phase (block 5), hand paths were  
260 greatly perturbed away from the obstacle. However, the participant gradually adapted to the  
261 opposing force fields such that hand paths became increasingly straight across blocks. Note that in  
262 later trials of the exposure phase, the object occasionally hit the obstacle. Thus, In block 56, the  
263 object hit the right obstacle in one of the trials (such that the blue hand path contacts the blue  
264 obstacle). In the first block of baseline trials after the force fields were turned off (block 57),  
265 clear aftereffects are observed where the hand is 'perturbed' in the opposite direction, indicating  
266 that the participant was compensating for the expected, but unexpectedly removed, force field. In  
267 all of the trials in this block the object contacted the obstacle. However, by the last block of the  
268 post-exposure phase (block 68), the participant had fully de-adapted and straight line hand paths,  
269 similar to those observed prior to the exposure phase (block 4), were observed. These results  
270 indicate that this participant was able to form motor memories of the opposing force fields when  
271 implicitly controlling different ends of the object in order to remove the dust.

272 Now consider the hand paths for the representative participants in Groups 2 and 3. In contrast to  
273 the representative participant in Group 1, both of these participants failed to adapt to the  
274 opposing force fields, such that their hand paths continued to be perturbed away from the  
275 obstacle throughout the exposure phase. Consistent with this failure to adapt, limited after-effects  
276 were observed when the force fields were turned off at the start of the post-exposure phase  
277 (block 57). These results indicate that these participants were not able to form memories of the  
278 opposing force fields when controlling a single control location in order to move to a target  
279 (Group 2) or erase a line of dust (Group 3).

### 280 *Adjusted Maximum Perpendicular Error in Non-Channel Trials*

281 The top row of Fig. 4 shows the adjusted MPE in non-channel trials as a function of trial for the  
282 same representative participants from each group shown in Fig. 3. The grey zones on the left and  
283 right of each plot mark the pre- and post-exposure phases, respectively. The red circles represent  
284 trials with the obstacle on the left, and the blue circles represent trials with the obstacle on the

285 right. The black dashed horizontal line represents the limit of possible hand motion, imposed by  
286 the obstacle, in adjusted x coordinates. (Note that this limit was -80 mm in the Single Control  
287 Point Line condition and thus is off the scale for Group 3.) The middle row of Fig. 4 shows, for  
288 each of these participants, corresponding data averaged across the 14 non-channel trials (7 per  
289 context) in each successive pair of trial blocks (or ‘blockpair’). These plots provide a smoothed  
290 view of how adjusted MPE changes across the different phases of the experiment. Finally, the  
291 bottom row shows group mean data corresponding to the middle row. Participants in Group 1  
292 reduced adjusted MPE across trials during the exposure phase and exhibited after effects during  
293 the post-exposure phase (negative adjusted MPE values). In contrast, for participants in Groups 2  
294 and 3, adjusted MPE remained elevated during the exposure phase and little or no after effects  
295 were observed. These results suggest that whereas participants in Group 1 were able to adapt to  
296 the opposing CW and CCW force fields, participants in Groups 2 and 3 were not.

297 An ANOVA with group (1-3) as a between-subjects factor and blockpair (first and last  
298 blockpairs of the exposure phase) as a within-subjects factor was carried out assess changes in  
299 adjusted MPE during the exposure phase. A significant interaction ( $F_{2,29} = 3.99$ ,  $p = 0.029$ )  
300 between blockpair and group was observed. To follow up on this interaction, separate paired t-  
301 tests comparing the first and last blockpair were carried out. For Group 1, adjusted MPE  
302 significantly decreased ( $t_{11} = 5.34$ ,  $p < 0.001$ ) from the first blockpair ( $M = 21.9$  mm,  $SE = 3.3$   
303 mm) to the last ( $M = 7.2$  mm,  $SE = 3.0$  mm). In contrast, for Groups 2 and 3, no significant  
304 difference (Group 2:  $t_9 = 0.58$ ,  $p = 0.58$ ; Group 3:  $t_9 = 1.36$ ,  $p = 0.21$ ) was observed between the  
305 first and last blockpairs.

### 306 *Adaptation Measured in Channel Trials*

307 Adaptation involves learning to generate forces that counteract the force field, thus allowing the  
308 participant to move the object straight ahead and succeed at the task. This adaptation can be  
309 directly assessed by measuring the forces participants exert on randomly selected channel trials.  
310 Channel trials allows us to distinguish between adaptation and the use of a co-contraction  
311 strategy whereby the participant compensates for the force field by stiffening the limb. As  
312 outlined above (see Methods), for channel trials we computed the slope of the relationship  
313 between the lateral force generated by the participant and the ideal lateral force that would fully  
314 compensate for the force field, had it been present (and as expected by the context). This slope  
315 provides a simple measure of the state of adaptation of the participant (Trewartha et al. 2014;  
316 Heald et al. 2018). We refer to this slope as the adaptation.

317 The top row of Fig. 5 shows adaptation, measured in channel trials, as a function of trial for the  
318 same representative participants from each group shown in Figs. 3 and 4. The red and blue  
319 circles represent trials with the obstacle on the left and right and associated with the CW and  
320 CCW force fields. (Note that channel trials were only included in the exposure phase.) Dashed

321 horizontal lines indicate adaptation values of 0 (no adaptation) and 1 (full adaptation). For the  
322 participant from Group 1, adaptation increases from close to 0 towards 1 across the exposure  
323 phase. For the participant from Group 2, a reciprocal relationship between adaptation for the CW  
324 and CCW force fields was observed. That is, this participant—like several other participants in  
325 Groups 2 and 3—could temporarily exhibit adaptation to one force field but only at the expense  
326 of adaptation to the other force field. For the representative participant from Group 3, little  
327 adaptation is observed for either force field. The middle row of Fig. 5 shows, for each of these  
328 participants, corresponding data averaged across the 2 channel trials (1 per context or force field)  
329 in each successive pair of trial blocks. These plots provide a smoothed view of how adaptation  
330 changes across the exposure phase and effectively remove reciprocal adaptation to the opposing  
331 fields. The bottom row shows group mean data corresponding to the middle row. Participants in  
332 Group 1 began adapting early in the exposure phase and reached close to full adaptation by the  
333 end of the exposure phase. In contrast, participants in Groups 2 and 3 failed to adapt to the  
334 opposing force fields.

335 A group (1-3) by blockpair (first and last blockpairs of the exposure phase) ANOVA was carried  
336 out to examine changes in adaptation during the exposure phase. A significant interaction ( $F_{2,29} =$   
337  $10.88$ ,  $p < 0.001$ ) between group and blockpair was observed. To follow up on this interaction,  
338 separate paired t-tests comparing the first and last blockpair were carried out. For Group 1,  
339 adaptation significantly increased ( $t_{11} = -5.65$ ,  $p < 0.001$ ) from the first blockpair ( $M = 0.34$ ,  $SE$   
340  $= 0.07$ ) to the last ( $M = 0.98$ ,  $SE = 0.07$ ). In contrast, for Groups 2 and 3, no significant  
341 difference (Group 2:  $t_9 = -0.48$ ,  $p = 0.64$ ; Group 3:  $t_9 = -1.58$ ,  $p = 0.15$ ) was observed between  
342 the first and last blockpairs. These results confirm that whereas participants in Group 1 adapted  
343 to the opposing force fields, participants in Groups 2 and 3 did not.

344 Note that although adaptation at the end of the exposure phase was, on average, close to 1 for  
345 participants in Group 1, the corresponding adjusted MPE measure did not return to its baseline  
346 (i.e., pre-exposure) level. This apparent discrepancy is due to the fact that the slope of the  
347 relationship between the actual force and the ideal force (i.e., ‘adaptation’) can be  $\sim 1$  without  
348 there being a perfect correspondence between these two forces. Thus, an adaptation value of 1  
349 does not imply perfect adaptation.

## 350 **Discussion**

351 The aim of the current paper was to test the hypotheses that (1) people implicitly control  
352 different locations on a tool depending on the task environment, and (2) that this flexible control  
353 affords the formation of separate motor memories of dynamics linked to these locations. In  
354 support of these hypotheses, we found that participants could adapt to opposing force fields  
355 linked to erasing a line of target dots with either the left or right end of a rectangular object. This

356 adaptation occurred even though the movement kinematics associated with these two contexts  
357 were similar. Control conditions showed this learning could not be accounted for by contextual  
358 cues associated with the location of the obstacle and dust, or the fact that the task goal (i.e.,  
359 erasing the dust) required moving in a straight line. These results suggest that participants  
360 implicitly exerted control over different locations on the object and that this allowed them to  
361 form separate motor memories for each control location. This finding extends our previous work  
362 showing that multiple memory formation is possible when controlling different explicitly defined  
363 and visually marked control points on an object (Heald et al. 2018).

364 Previous studies of motor learning have shown that people can simultaneously adapt to different  
365 (typically opposing) dynamics when these are applied to reach movements with different  
366 kinematics (Thoroughman and Shadmehr 2000; Howard et al. 2013). Moreover, under certain  
367 conditions people can, at least partially, adapt to opposing dynamics applied to reaching  
368 movements with the same kinematics. Thus, adaptation is seen when one force field is applied  
369 during unimanual reaching and the opposing force field is applied (to the same hand) during  
370 bimanual reaching (Nozaki et al. 2006; see also Yokoi et al. 2011). Adaptation is also observed  
371 when the common reach movement to which the opposing force fields are applied is preceded by  
372 (or followed by) different “lead in” (or “follow through”) movements linked to the force fields  
373 (Howard et al. 2012, 2015; Sheahan et al. 2016). Finally, it has been shown that, following  
374 gradual adaptation to opposing visuomotor rotations that make participants unwittingly believe  
375 they are reaching to different targets even though the same hand movement is generated,  
376 participants can adapt to opposing dynamics linked to the two visually distinct, but physically  
377 identical, reaching movements (Hirashima and Nozaki 2012). In all of these cases, the  
378 movements to which the opposing dynamics are applied differ in the either the sensorimotor  
379 transformation or the overall movements required to perform the task. However, when different  
380 dynamics are applied to the same—physical and visually perceived—isolated movement,  
381 previous work has found that people are generally unable to adapt despite a variety of contextual  
382 cues (Gandolfo et al. 1996; Howard et al. 2013; Heald et al. 2018). In all of the previous work,  
383 participants controlled a small circular object (or “cursor”) linked to the position of the hand (or  
384 handle grasped by the hand). However, in real-world manipulation tasks, we often manipulate  
385 objects with more complex geometry and may control different locations on the object  
386 depending on the task at hand. The current study, together with our recent study (Heald et al.  
387 2018), demonstrate that when controlling—either implicitly or explicitly—different parts of the  
388 object, people can learn different dynamics for movements with the same kinematics.

389 The idea that control, and motor memories, can be flexibly assigned to different locations on an  
390 object can be related to the ‘sensorimotor control point’ framework for understanding the control  
391 of object manipulation tasks (Flanagan et al. 2006; Johansson and Flanagan 2009). This  
392 framework views manipulation tasks as a series of action phases demarcated by contact events

393 (or potential contact events) that give rise to distinct, and often discrete, multisensory signals.  
394 Consider the simple task, examined by Johansson and colleagues (2001), in which participants  
395 grasped a bar from the near end, lifted it and moved it around an obstacle to contact a button with  
396 the far end, and then replaced it. In this example, contact between the fingers and bar marks the  
397 end of the reach phase, the breaking of contact between the object and surface marks the end of  
398 the load phase, the clearance of the far end of the bar around the obstacle (a potential contact  
399 event) marks the end of the first movement phase, and so on. These contact events (or potential  
400 contact events) give rise to distinct tactile signals, as well as visual, proprioceptive and even  
401 auditory signals, that indicate whether the goal of the action phase has been achieved. Thus, they  
402 serve as key sensorimotor control points in the task: by comparing predicted and actual sensory  
403 signals linked to these points, the brain can monitor task progress and launch appropriate  
404 corrective actions if necessary (Johansson and Flanagan 2009). Critically, these corrective  
405 actions depend on the phase of the task (Johansson and Westling 1987, 1988) and thus  
406 manipulation tasks involve switching between different sensorimotor control policies that govern  
407 motor responses to sensed errors (Flanagan et al. 2006). Note that sensorimotor control points are  
408 both spatial and temporal in nature; they occur at specific times during the unfolding task and are  
409 also associated with contact locations (e.g., between the tip of the object and the target button or  
410 between the bottom of the object and the landing surface). Thus, sensorimotor control points can  
411 be linked to locations on manipulated objects. Finally, across sequential phases of the task, the  
412 dynamics experienced by the actor can vary due to changing interactions between the objects in  
413 the environment, and this may necessitate changes in the underlying control (Chib et al. 2009).  
414 Given these aspects of the sensorimotor control of manipulation tasks, the ability to flexibly  
415 assign distinct memories of dynamics to different locations on an object is highly advantageous.

416 When reaching to a single target with the hand, a cursor controlled by the hand, or an object held  
417 in the hand, people fixate the target and almost never fixate the hand, cursor, or the object in the  
418 hand (Johansson et al., 2001; Flanagan and Johansson, 2003). When the target of action is a line,  
419 as in our erasing task (which is effectively a tracing task), gaze is directed along the line, ahead  
420 of the hand (Reina and Schwartz, 2003; Gowen and Miall 2006; Ketcham et al. 2006). This  
421 raises the question whether the learning we observed in our main experiment is due to different  
422 eye movements being generated for the opposing force fields. Importantly, in our previous study  
423 we showed that, when controlling different explicit locations on the object, participants could  
424 still adapt to opposing force fields when required to fixate a central point throughout each trial  
425 (Heald et al. 2018). Of course, even when fixating a central location it is obvious that  
426 participants attend to different locations when controlling different parts of the object. However,  
427 this ‘attention’ is not some abstract cognitive resource that is distinct from motor control. Rather,  
428 as outlined in the sensorimotor control point framework (Johansson and Flanagan 2009), it is  
429 part and parcel of controlling movement—e.g., providing retinal and extra-retinal information  
430 about target locations, monitoring task performance, and detecting and responding to errors—

431 and can reasonably be referred to as “sensorimotor attention” centered on control points. Indeed,  
432 for us sensorimotor attention and control points are not really separable since sensorimotor  
433 attention is fundamentally linked to the point being controlled, and control points imply not only  
434 a location but the processes involved in control.

435 We recognize that our interpretation of our results is based on inference. Ultimately, we cannot  
436 ‘know’ that participants are controlling a particular location. However, given the correspondence  
437 between the current results and those from our previous study (Heald et al. 2018), we feel it is  
438 reasonable to suggest that participants controlled separate locations on the object in our main  
439 (Different Implicit Control Points) condition and a single location in our two control conditions.

440 The final level of adaptation we observed in the main experimental task was close to 1,  
441 suggesting that participants, on average, strongly compensated for the force-field. This  
442 adaptation is greater than the level we observed in our previous paper (Heald et al. 2018), which  
443 was approximately 0.8 (i.e., 80 percent compensation), as well as previous studies of force-field  
444 learning which have reported adaptation values ranging from 0.6 to 0.8 (Smith et al. 2006;  
445 Trewartha et al. 2014). This more complete compensation is presumably due to the task  
446 requirements; specifically the fact that participants needed to generate approximately straight  
447 line hand paths in order to remove all of the dust while avoiding the obstacle. In contrast,  
448 previous studies have used standard target reaching tasks in which the goal is to move the hand  
449 to a small circular target. Whereas participants tend to generate roughly straight hand paths,  
450 following adaptation, when reaching to such targets in the presence of a force field, perfectly  
451 straight hand paths are not required by the task. Importantly, as we demonstrated in the Single  
452 Control Point Line condition, the requirement of moving in a straight line, per se, does not  
453 necessarily result in adaptation. That is, participants in this condition failed to form separate  
454 memories for the opposing force fields.

455 A number of studies have provided evidence for the idea, dating back over a century (Head and  
456 Holmes 1911), that tool-use can dynamically change somatosensory and visual representations.  
457 Thus, psychophysical studies have shown that tool use can change the perceptual representation  
458 of peripersonal space (Berti and Frassinetti 2000; Farnè et al. 2005; Witt et al. 2005) and the  
459 body schema (Cardinali et al. 2009) and neurophysiological studies have found that tool use can  
460 lead to neural activity changes in premotor, primary somatosensory, and parietal regions (Iriki et  
461 al. 1996; Inoue et al. 2001; Obayashi et al. 2001; Maravita and Iriki 2004; Schaefer et al. 2004;  
462 Hihara et al. 2006). It is plausible that controlling different locations on a tool may result in  
463 distinct activity changes in sensorimotor regions, which in turn may provide a neural basis for  
464 representing different dynamics (Nozaki and Scott 2009; Yokoi et al. 2011).

465 In summary, we have provided evidence that people naturally control different locations on  
466 manipulated objects depending on the functional task they are performing, and that distinct  
467 motor memories of dynamics can be linked to these controlled locations. This ability is important  
468 because, in natural manipulatory tasks, different dynamics can be associated with controlling  
469 different parts of the object during the unfolding task. Our results, which both confirm and  
470 extend our recent study on explicit control points (Heald et al. 2018), suggest that our ability to  
471 allocate multiple motor memories to a single object, even when making the same movement, is  
472 quite general and can be exploited in a number of contexts.

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## 552 **Figure Captions**

553 Figure 1. A) Robotic interface and virtual reality system used to simulate objects and force  
554 fields. B) Single explicit control experiment from Heald et al. (2018). Participants were required  
555 to move a central control point, on the object, to the central target. The location of the lateral  
556 ‘target’ was linked to the direction of the force field. C) Different explicit control points  
557 experiment from Heald et al. (2018). Participants were required to move either the left or right  
558 control point, on the object, to the left or right target, respectively. The location of the target was  
559 linked to the direction of the force field.

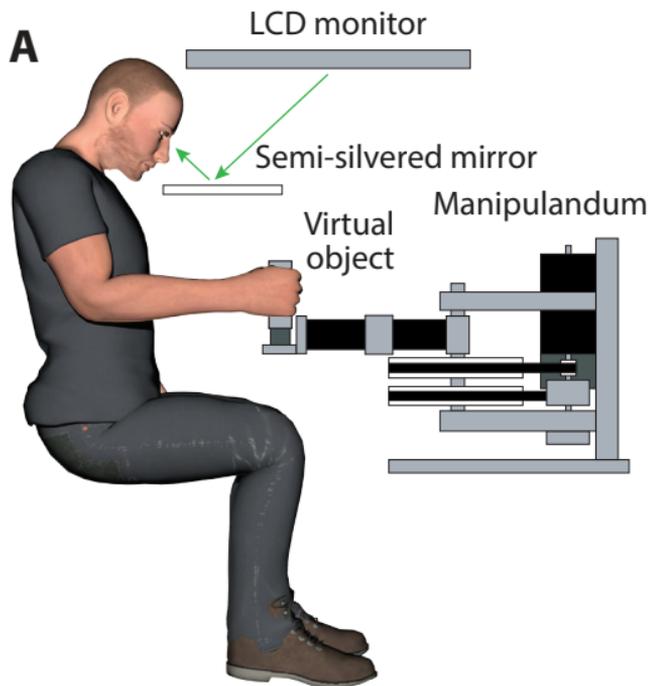
560 Figure 2. Three experimental groups. A) Group 1: Different Implicit Control Points condition.  
561 Participants were required to move the object (‘eraser’) straight ahead to remove (‘erase’) a  
562 column of dots (‘dust’) located on either the left or right while avoiding an obstacle. In all  
563 groups, clockwise (CW) and counter clockwise (CCW) viscous curl fields were linked to the  
564 location of the obstacle. B) Group 2: Single Control Point Target condition. Participants were  
565 required to move a circle (explicit control point), located at the center of the object, from a  
566 circular start position to a circular target located straight ahead. C) Group 3: Single Control Point  
567 Line condition. Participants were required to move a narrow object to remove a central column  
568 of dots.

569 Figure 3. Hand paths from representative participants in Groups 1, 2 and 3 are shown in the top,  
570 middle, and bottom rows, respectively. Paths from different blocks of trials including the last  
571 baseline block of the pre-exposure phase (4), the first (5), sixth (10), and last (56) perturbation  
572 blocks from the exposure phase, and the first (57) and last (68) baseline blocks from the post-  
573 exposure phase. Individual trials are numbered for block 5; note that trial 5 is a channel trial. The  
574 red rectangles show the leftward limit of possible hand motion, due to the obstacle, in trials with  
575 the obstacle on the left (red paths). The blue rectangles show the rightward limit of possible hand  
576 motion, due to the obstacle, in trials with the obstacle on the right (blue paths). Rectangles are  
577 not displayed for the Group 3 participant because they were  $\pm 80$  mm away from the hand. Note  
578 that in perturbation trials, the force-field tended to push the hand away from the obstacle.  
579 Whereas the participant in Group 1 gradually adapted to the force fields, the participants in  
580 Groups 2 and 3 did not.

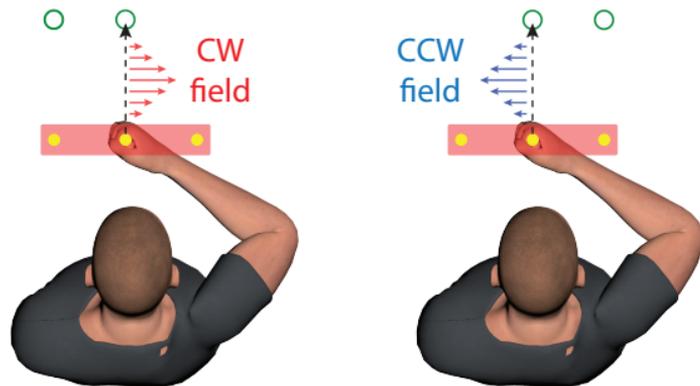
581 Figure 4. Top row: adjusted maximum perpendicular error (MPE), in non-channel trials, as a  
582 function of trial for three representative participants from Groups 1-3. The grey areas on the left  
583 and right mark the pre- and post-exposure phases, respectively. Red and blue points are from  
584 trials with the obstacle located on the left and right. The black dashed horizontal line represents  
585 the limit of possible hand motion, imposed by the obstacle, in adjusted x coordinates. (Note that  
586 this limit was -80 mm in the Single Control Point Line condition and thus is off the scale for  
587 Group 3.) Middle row: corresponding data averaged across the 14 non-channels trials (7 per

588 context) in perturbation trials, or 16 non-channel trials (8 per context) in baseline trials, in every  
589 2 blocks (16 trials). Bottom row: Group mean data corresponding to the middle row. Height of  
590 shaded regions represents  $\pm 1$  standard error.

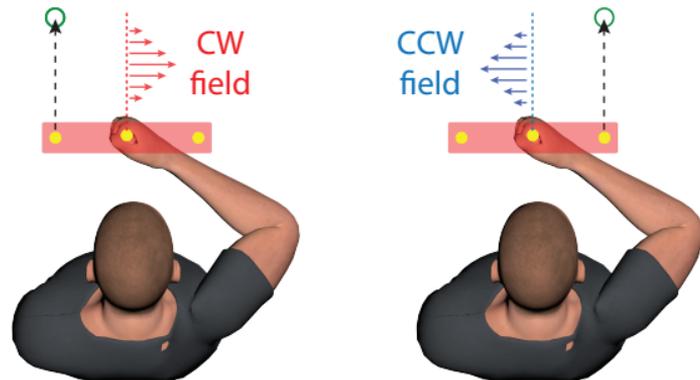
591 Figure 5. Top row: adaptation, in channel trials, as a function of trial for three representative  
592 participants from Groups 1-3. Red and blue points are from trials with the obstacle located on the  
593 left and right. Middle row: corresponding data averaged across the 2 non-channels trials (1 per  
594 context) in every 2 blocks (16 trials). Bottom row: Group mean data corresponding to the middle  
595 row. Height of the shaded regions represents  $\pm 1$  standard error.



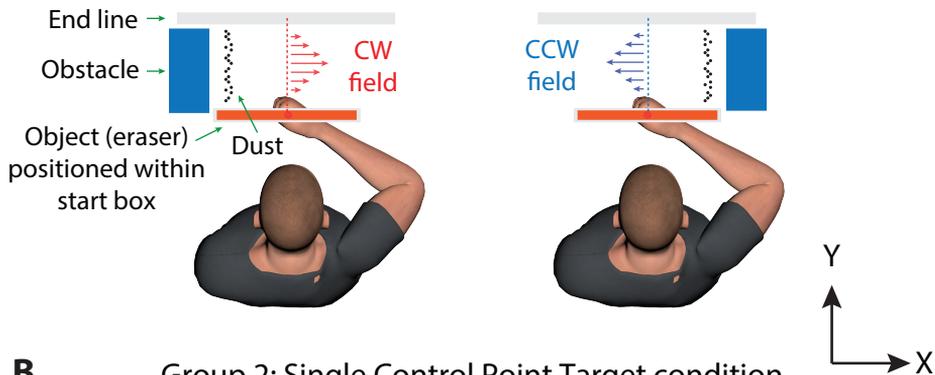
**B** Single explicit control point



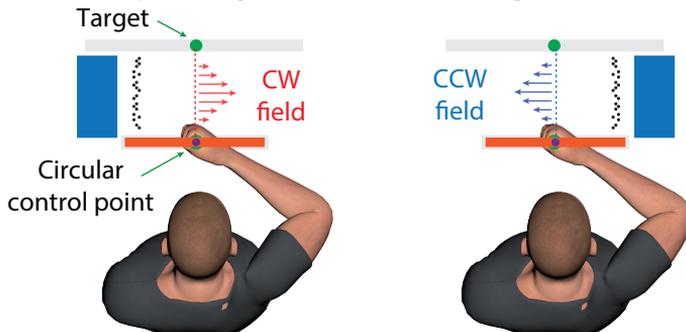
**C** Different explicit control points



### A Group 1: Different Implicit Control Points condition



### B Group 2: Single Control Point Target condition



### C Group 3: Single Control Point Line condition

