

# Composition and decomposition of visuomotor maps during manual tracking

Pierre-Michel Bernier, James Mathew, Frédéric Danion

## ► To cite this version:

Pierre-Michel Bernier, James Mathew, Frédéric Danion. Composition and decomposition of visuomotor maps during manual tracking. Journal of Neurophysiology, 2021, 126 (5), pp.1685-1697. 10.1152/jn.00058.2021. hal-03375231

# HAL Id: hal-03375231 https://hal.science/hal-03375231v1

Submitted on 17 Nov 2022

**HAL** is a multi-disciplinary open access archive for the deposit and dissemination of scientific research documents, whether they are published or not. The documents may come from teaching and research institutions in France or abroad, or from public or private research centers. L'archive ouverte pluridisciplinaire **HAL**, est destinée au dépôt et à la diffusion de documents scientifiques de niveau recherche, publiés ou non, émanant des établissements d'enseignement et de recherche français ou étrangers, des laboratoires publics ou privés.

1	Composition and decomposition of visuomotor maps during					
2	manual tracking					
3	Pierre-Michel Bernier <sup>1</sup> , James Mathew <sup>2,3</sup> , Frederic R. Danion <sup>2,4</sup>					
4	<sup>1</sup> Département de Kinanthropologie, Université de Sherbrooke, Sherbrooke, Québec, Canada					
5	<sup>2</sup> Aix Marseille Univ, CNRS, INT, Institut Neurosci Timone, Marseille, France					
6 7 8	<sup>3</sup> current affiliation: Institute of Neuroscience, Institute of Communication & Information Technologies, Electronics & Applied Mathematics, Université Catholique de Louvain, Belgium					
9 10	<sup>4</sup> University of Poitiers, CNRS, Center for Research on Cognition and Learning (CERCA) UMR 7295, Poitiers, France					
11	Running Head: Modularity of visuomotor adaptation					
12 13	<i>Key-words:</i> hand tracking; sensorimotor adaptation; visuomotor rotation; modular learning; interference; kinematic perturbation; mass-spring mapping					
14	Corresponding author:					
15	Email: frederic.danion@univ-poitiers.fr					
16	Number of figures: 9					
17 18	Number of pages: 40					
19 20 21 22 23	Acknowledgement: Support for this research was provided by the CNRS (IEA N°00070). We also wish to thank Nabawiat Mondoha and Léa Dupony for technical assistance during data collection. Finally, we are thankful to all the reviewers for their scrupulous work and helpful feedback.					
24	Conflict of interest:					
25	The authors state they have no conflict of interest.					
26						
27	Contributions:					
28	PMB and FRD designed the study, collected and analysed the data. All authors drafted the					
29	manuscript.					

## 30 ABSTRACT

31 Adapting hand movements to changes in our body or the environment is essential for 32 skilled motor behavior, as is the ability to flexibly combine experience gathered in separate 33 contexts. However it has been shown that when adapting hand movements to two different 34 visuomotor perturbations in succession, interference effects can occur. Here we investigate 35 whether these interference effects compromise our ability to adapt to the superposition of the 36 two perturbations. Participants tracked with a joystick a visual target that followed a smooth 37 but unpredictable trajectory. Four separate groups of participants (total n = 83) completed one 38 block of 50 trials under each of three mappings: one in which the cursor was rotated by  $90^{\circ}$ 39 (ROTATION), one in which the cursor mimicked the behavior of a mass-spring system 40 (SPRING), and one in which the SPRING and ROTATION mappings were superimposed 41 (SPROT). The order of the blocks differed across groups. Although interference effects were 42 found when switching between SPRING and ROTATION, participants who performed these 43 blocks first performed better in SPROT than participants who had no prior experience with 44 SPRING and ROTATION (i.e., composition). Moreover, participants who started with 45 SPROT exhibited better performance under SPRING and ROTATION than participants who 46 had no prior experience with each of these mappings (i.e., decomposition). Additional 47 analyses confirmed that these effects resulted from components of learning that were specific 48 to the rotational and spring perturbations. These results show that interference effects do not 49 preclude the ability to compose/decompose various forms of visuomotor adaptation.

50

51

#### 52 NEW AND NOTEWORTHY

The ability to compose/decompose task representations is critical both for cognitive and behavioral flexibility. Here we show that this ability extends to two forms of visuomotor adaptation in which humans have to perform visually guided hand movements. Despite the presence of interference effects when switching between visuomotor maps, we show that participants are able to flexibly compose or decompose knowledge acquired in previous sessions. These results further demonstrate the flexibility of sensorimotor adaptation inhumans.

#### 60 INTRODUCTION

A critical issue that is still unresolved in the field of sensorimotor control pertains to the modularity of sensorimotor mappings, and especially whether multiple internal models can interact, be flexibly combined and whether they can be stored in common vs. separate working memory systems (Burgos et al. 2018; Davidson and Wolpert 2004; Flanagan et al. 1999; Haruno et al. 2001; Imamizu et al. 2007; Pearson et al. 2010; Wolpert and Kawato 1998).

67 One type of paradigm that has long been used to address the degree of modularity and 68 independence between sensorimotor representations is that of interference (Duncker et al. 69 2020; Krakauer et al. 1999, 2019; Lerner et al. 2020). Generally, when participants are 70 sequentially exposed to a perturbation (e.g., force-field or visuomotor rotation) and its mirror-71 reversal soon thereafter, adaptation to the second perturbation is hampered (anterograde 72 interference) or memory of the first one is impaired (retrograde interference) (Krakauer et al. 73 2005; Miall et al. 2004). There have been multiple explanations for this phenomenon, with 74 early work emphasizing that interference arises whenever error signals for each perturbation 75 are encoded via the same sensory modality (proprioception, vision) or within the same 76 reference frame (intrinsic, extrinsic) (Krakauer et al. 1999). Later work brought nuance and 77 suggested that the critical factor may not be the sensory modality (or reference frame) per se, 78 but the state variable of the perturbation. For instance, interference has been shown to occur 79 for different types of perturbations (force-field and visuomotor rotation) if they are both made 80 to depend on the same state variable, being position, velocity or acceleration (Tong et al. 81 2002). In more recent work, the notion of context (e.g., color of background or target) and 82 task goal (e.g., location in the workspace) have been brought forward, with evidence that two 83 perturbations interfere when they affect movements that are directed toward a common goal,

or more subtly when they share common motor preparatory activity (Howard et al. 2012;
Krakauer et al. 2019; Sheahan et al. 2016).

86 Another type of paradigm that has been used to address the modularity of 87 sensorimotor mappings is that of composition/decomposition, in which participants are 88 sequentially exposed to separate single sensorimotor mappings or one that consists of their 89 combination. An early study by Flanagan and colleagues (Flanagan et al. 1999) showed that 90 participants can flexibly compose and decompose adaptation to different types of 91 perturbations, namely a dynamic viscous force-field and a kinematic 60° visuomotor rotation, 92 even though they influence behaviour in opposite directions. For instance, after participants 93 had adapted to each single perturbation separately, they exhibited immediate benefits on the 94 combined perturbation as compared to naïve participants. A critical factor in their study, 95 which may have facilitated composition, was that the perturbations were "orthogonal" to each 96 other, influencing different state variables and being mediated by different sensory modalities, 97 thus minimizing potential interference between the two (an issue which was not explicitly 98 tested in their study).

99 Hence, it remains unclear whether composition and decomposition remain possible 100 when two perturbations share attributes and interfere with each other. To address this issue, 101 we used two kinematic perturbations that pertained to the same sensory modality (visual), for 102 which the state variables were partially shared, and for which all features pertaining to task 103 goal and context were the same. The first one is a visuomotor rotation, in which a cursor is 104 rotated by 90° with respect to hand motion. The second one consists of a cursor that mimics 105 the behaviour of a damped mass-spring system. Although this perturbation is less 106 conventional, several reports have shown its relevance for motor learning (Dingwell et al. 107 2002, 2004; Huang et al. 2007; Landelle et al. 2016; Nagengast et al. 2010). In contrast to the visuomotor rotation which relies on a single state variable (cursor position), the effect of the
mass-spring mapping depends upon position, velocity as well as acceleration.

110 We used a pursuit tracking task in which participants had to keep the cursor as close as 111 possible to a moving target that followed an unpredictable trajectory (Danion and Flanagan 112 2018; Mathew et al. 2018). Although this task differs from more traditional discrete reaching 113 tasks in the sense that it relies more heavily on feedback control rather than feedforward 114 control (Yang et al. 2020), pursuit tracking has nonetheless been shown to be under adaptive 115 control as demonstrated by the presence of potent aftereffects, a hallmark of adaptation 116 (following a 90° visuomotor rotation; Gouirand et al. 2019; Mathew et al. 2018; Yang et al. 117 2020). One of the main advantages of using this task is that it minimizes the possibility for 118 exploiting explicit mechanisms known to be at play during visuomotor adaptation, such as 119 cognitive strategizing and re-aiming (Fernandez-Ruiz et al. 2011; Haith et al. 2015; Leow et 120 al. 2017; McDougle and Taylor 2019), thereby unmasking the low-level implicit updating of 121 internal models.

Results revealed that even though adaptation to the two perturbations led to interference, participants could still successfully compose and decompose them, demonstrating that the brain is able to segregate the two mappings even when they rely on the same sensory modality, partially share state variables, and are learned under the same task goals and context.

127

#### 128 METHOD

129 Participants

Four groups of right-handed participants took part in this study (Group 1, N=20, Age: 22.8  $\pm$ 4.9 yrs., 12 female; Group 2, N=21, Age: 22.7  $\pm$  6.2 yrs., 12 female; Group 3, N=21, Age: 22.3  $\pm$  5.0 yrs., 14 female; Group 4, N=21, Age: 23.1  $\pm$  45.8 yrs., 13 female). Although no formal a priori power analysis was performed, based on our previous experience using the 134 tracking task (Gouirand et al. 2019; Mathew et al. 2018, 2019a) and pilot testing, we aimed 135 for a sample size of at least n = 20 per group. We were able to collect 21 participants per group but had to drop one participant of Group 1. Handedness of participants was verified 136 137 using the Oldfield Handedness Inventory with a mean laterality quotient of  $96.0 \pm 6.7\%$ . None 138 of the participants had neurological or visual disorders. They were naïve as to the 139 experimental conditions and hypotheses, and had no previous experience with oculo-manual 140 tracking tasks. The experimental paradigm (2016-02-03-007) was approved by the Ethics 141 Committee of Aix-Marseille University and complied with the Declaration of Helsinki. All 142 participants gave written consent prior to participation. Each experimental protocol lasted 143 about one hour, and participants were compensated 10€ for their participation.

144

#### 145 Apparatus

146 The experimental setup is similar to the one used in our previous studies (Gouirand et 147 al. 2019; Mathew et al. 2018, 2019b), thus we will only report key information. Our setup is 148 illustrated in Figure 1a. Participants were seated comfortably in a dark room facing a screen 149 (ACER Predator, 1920×1080, 27" inch, 240Hz) positioned in the frontal plane. Head 150 movements were restrained by a chin rest and a padded forehead rest. In order to block direct 151 vision of their hands, a horizontal shield was positioned under the participants' chin. 152 Participants were required to hold a joystick (Series 812, Megatron, France, with  $\pm 25^{\circ}$  of 153 inclination along X-Y axes) with their right hand positioned horizontally on a table in front of 154 them. Both right and left forearms were resting on the table. The output of the joystick was 155 fed into a data acquisition system (Keithley ADwin Real Time, Tektronix) and was sampled 156 at 1000 Hz.

157

158 Procedure

159 Throughout the experiment, participants had to perform a tracking task (Figure 1b) 160 that consisted of moving the joystick with the right hand so as to keep the cursor (red disk, 161 0.5cm in diameter) as close as possible to a moving target (blue disk, 0.5cm in diameter). The 162 motion of the target resulted from the combination of sinusoids: two along the X axis (one 163 fundamental and a second or third harmonic) and two along the Y axis (same procedure; see 164 Figure 1b for axes). We used the following equations to construct target motion:

165 
$$x_t = A_{1x} \cos\omega t + A_{2x} \cos(h_x \omega t - \varphi_x) \qquad (1)$$

166 
$$y_t = A_{1y} sin\omega t + A_{2y} sin(h_y \omega t - \varphi_y) \qquad (2)$$

167 This technique was used to generate pseudo-random 2D patterns while preserving 168 smooth changes in velocity and direction (Danion and Flanagan 2018; Mrotek and Soechting 169 2007; Soechting et al. 2010). A total of five different patterns with a mean tangential velocity 170 of 16cm/s were used throughout the experiment (see Table 1 and Figure 1c). The order of 171 patterns was randomized across trials and participants while ensuring that each pattern was 172 presented equally often within each experimental condition.

173 Four types of hand-cursor visual mappings were tested: NORMAL, ROTATION, 174 SPRING, and SPROT. Under the NORMAL mapping the gain of the joystick was such that a 175 25° change in the inclination of the joystick resulted in a 15cm change on the screen. This 176 gain prevented the cursor from moving outside the screen. For the NORMAL mapping the 177 angular relationship between the joystick orientation and its visual consequences on the 178 screen was one-to-one and thus intuitive: if the joystick was inclined to the left, the cursor on 179 the screen also moved to the left. Under the ROTATION mapping, the relationship between 180 the joystick orientation and the position of the cursor was altered by a 90° counter-clockwise 181 visuomotor rotation (Ogawa and Imamizu 2013). As a result, if the participant moved the 182 joystick forward, the cursor moved leftward on the screen. Under the SPRING mapping, the 183 cursor behaved as a mass attached to the hand by means of a spring. We used the following parameters for the simulation: mass = 1 Kg, stiffness = 40 N/m, damping = 1.66 N/m/s, resting length = 0 m. This parameter setting results in a 1Hz resonance frequency (F) as imposed by the following equation:

187 
$$F = \frac{1}{2\pi} \sqrt{\frac{k}{m}}$$
 (3) with *m* accounting for the mass, and *k* for the stiffness.

188 This parameter setting is consistent with previous studies investigating the 189 manipulation of non-rigid objects (Danion et al. 2012, 2017; Dingwell et al. 2002, 2004; 190 Landelle et al. 2016; Mathew et al. 2019a; Nagengast et al. 2009). Finally the fourth mapping, 191 SPROT, resulted from the combination of the ROTATION and SPRING mappings, meaning 192 that the cursor was both rotated and behaving like a mass-spring. Supplemental videos 193 depicting representative trials of participants in the NORMAL mapping as well as during the 194 first and last trials of each of the three perturbed mappings can be found here 195 https://zenodo.org/record/5138123#.YP75VI5KiUk.

196 After 4-5 trials of familiarization, each participant began with a baseline block of 10 197 trials under the NORMAL mapping (see Figure 2). Then they completed one block of 50 198 trials under each of the 3 experimental conditions: SPRING, ROTATION, and SPROT. 199 Group 1 and Group 2 were tested for the ability to compose sensorimotor adaptation, with 200 participants completing SPRING and ROTATION before they were tested on SPROT. 201 Conversely, Group 3 and Group 4 were tested first on SPROT then on SPRING and 202 ROTATION, so as to test the ability to decompose sensorimotor adaptation. After completing 203 these 4 blocks, all participants performed a washout block with 10 trials under the NORMAL 204 mapping. Overall a total of 170 experimental trials were collected per participant. Each trial 205 lasted 10 seconds. The total duration of the experiment averaged 60 min.

206

At the end of the experiment, there was an informal debriefing. Participants were asked the following open question: "Please describe the perturbation(s) you experienced". Our main 209 interest was to evaluate whether participants could report that one perturbation was the 210 combination of two others.

211

#### 212 Data analysis

Because participants were explicitly instructed to always minimize the cursor-target distance, our primary dependent variable to characterize performance across all types of perturbations was hand tracking error. To quantify hand tracking error (E) we measured the distance in cm (in two dimensions; x and y) between the cursor (C; moved by the hand) and the target (T) at each instant (t) using the following equation:

218 
$$E_t = \sqrt{(C_{xt} - T_{xt})^2 + (C_{yt} - T_{yt})^2} \qquad (4)$$

219

We averaged this error across time for each trial while excluding the first second of data from each trial.

222 In addition to hand tracking error, two additional metrics were used in an effort to 223 isolate components of learning that would be specific to either the SPRING or ROTATION 224 perturbations. The first metric was directional error, which consisted in rotating the cursor 225 data (around the center) with respect to the target data in each trial, and determining the angle 226 which minimized hand tracking error (a method inspired from Yang et al. 2020). Here, by 227 convention, a positive directional error indicates that cursor data had to be rotated clockwise 228 to match the target data. It was hypothesized that this metric would show strong modulations 229 during adaptation to the ROTATION and SPROT perturbations, but not during the SPRING 230 perturbation. The second metric was cursor velocity (i.e., mean tangential velocity in each 231 trial) because hand/joystick velocity is amplified at the cursor level by the dynamics of the 232 spring (Landelle et al. 2016; Mathew et al. 2019a). Following this line of reasoning, it was 233 hypothesized that under initial exposure to the SPRING and SPROT mappings cursor velocity would substantially exceed target velocity (16 cm/s), while this would not be the case under
ROTATION or Baseline. Similar to tracking error, directional error and cursor velocity were
assessed while excluding the first second of data from each trial.

237

#### 238 Statistical analysis

239 Baseline, as well as washout performance was compared across groups with a 4 Group 240 x 10 Trial two-way ANOVA with trial as a repeated-measures. Then, to test our main 241 hypotheses regarding composition/decomposition, we compared adaptation to each of the 242 three mappings (SPRING, ROTATION, SPROT) across groups. To do so, for each mapping, 243 adaptation performance was tested with a 4 Group x 2 Phase (Early, Late) two-way ANOVA 244 with phase as a repeated-measures. Early adaptation consisted of the mean error across the 245 first 10 trials (1-10), whereas Late adaptation consisted of the mean error across the last 10 246 trials (41-50). To provide insight regarding the relative complexity of the SPRING and 247 ROTATION perturbations, we compared performance of naïve participants performing their 248 first block under each of these mappings, that is Group 1 under SPRING vs. Group 2 under 249 ROTATION. This was done using a 2 Group x 2 Phase (Early, Late) two-way ANOVA with 250 phase as a repeated-measures. Finally, to address the possibility of anterograde interference 251 between ROTATION and SPRING, we compared the performance of participants in each 252 mapping depending on whether or not learning was immediately preceded by prior exposure 253 to the other mapping. Namely, we pooled the data of Groups 1 and 3 (in which ROTATION 254 was immediately preceded by SPRING) as well as those of Groups 2 and 4 (in which 255 SPRING was immediately preceded by ROTATION) and performed a 2 Order (First vs. 256 Second) x 2 Phase (Early vs. Late) two-way ANOVA with phase as a repeated measure. This 257 analysis was done separately for SPRING and ROTATION.

258 Whenever relevant, post-hoc tests were done with two-tailed unpaired t-tests and the 259 Benjamini-Hochberg procedure [i.e., false discovery rate (FDR); (Benjamini and Hochberg 260 1995)] was used to correct for multiple comparisons. For ANOVAs, effect sizes are reported 261 as partial eta squared ( $n_p^2$ ; Fritz et al. 2012; Lakens 2013), whereas for targeted comparisons 262 (i.e., t-tests), effect sizes are reported as Cohen's d. For all analyses, the threshold for 263 significance was set to  $\alpha = 0.05$ .

264

#### 265 **RESULTS**

#### 266 Baseline tracking

267 During the first block all participants performed the tracking task under the NORMAL 268 mapping. The two-way ANOVA (Group by Trial) revealed no systematic difference in tracking performance between the groups (F<sub>(3,79)</sub> = 0.512, p = 0.675,  $n_p^2 = 0.019$ ). Averaged 269 270 across groups, mean hand tracking error during baseline trials was 1.68cm. There was a main effect of Trial (F<sub>(9,711)</sub> = 5.307, p < 0.001,  $n_p^2 = 0.06$ ) revealing a decrease in tracking error, 271 272 however this improvement was similar across groups as revealed by a lack of Group x Trial interaction (F<sub>(27,711)</sub> = 0.611, p = 0.941,  $n_p^2 = 0.02$ ). Post-hoc analysis of the Trial effect 273 274 revealed that while there was a significant decrease in tracking error from trial 1 to 3 (p < p275 0.05), there was no significant difference between any of the trials from 3 to 10 (all p > 0.22). 276 This capacity to achieve asymptotic performance after only two trials suggests that 277 participants were adept at the task and that meta-learning (or mere practice with the tracking 278 task) is unlikely to account for the learning curves during exposure to perturbations.

279

#### 280 Adaptation to the SPRING mapping

Figure 3a compares the time course of tracking error for each of the 4 groups under the SPRING mapping. The two-way ANOVA revealed a main effect of phase ( $F_{(1,79)} = 402.772$ ,

p < 0.001,  $n_p^2 = 0.836$ ), with a decrease in tracking error as a function of exposure. There was 283 also a main effect of Group ( $F_{(3,79)} = 3.001$ , p = 0.035,  $n_p^2 = 0.102$ ), as well as a significant 284 interaction ( $F_{(3,79)} = 10.996$ , p < 0.001,  $n_p^2 = 0.295$ ). Specifically, post-hoc tests revealed that 285 286 during Early adaptation, hand tracking error in Group 3 was significantly smaller than in 287 Groups 1 ( $t_{(39)} = 2.401$ , p = 0.021, Cohen's d = 0.77), 2 ( $t_{(40)} = 5.317$ , p < 0.001, Cohen's d = 0.77), 2 ( $t_{(40)} = 5.317$ , p < 0.001, Cohen's d = 0.77), 2 ( $t_{(40)} = 5.317$ , p < 0.001, Cohen's d = 0.77), 2 ( $t_{(40)} = 5.317$ , p < 0.001, Cohen's d = 0.77), 2 ( $t_{(40)} = 5.317$ , p < 0.001, Cohen's d = 0.77), 2 ( $t_{(40)} = 5.317$ , p < 0.001, Cohen's d = 0.77), 2 ( $t_{(40)} = 5.317$ , p < 0.001, Cohen's d = 0.77), 2 ( $t_{(40)} = 5.317$ , p < 0.001, Cohen's d = 0.77), 2 ( $t_{(40)} = 0.021$ , Cohen's d = 0.021, Cohen's d = 0.288 1.65) and 4 ( $t_{(40)} = 3.347$ , p = 0.002, Cohen's d = 1.05; see Figure 3b). Based on these 289 observations we conclude that Group 3 who experienced the SPRING immediately after the 290 SPROT mapping is the only group that demonstrated an advantage when adapting to 291 SPRING. As for Late adaptation, post-hoc tests revealed no difference across groups (all 292 p > 0.5; see Figure 3c). This suggests that, irrespective of the previous exposure to other 293 mappings, all groups were able to adapt to the SPRING to a similar extent.

294

#### 295 Adaptation to the ROTATION mapping

296 Figure 4a compares the time course of tracking error for each of the 4 groups under the ROTATION mapping. The two-way ANOVA revealed a main effect of phase ( $F_{(1,79)}$  = 297 507.556, p < 0.001,  $n_p^2 = 0.865$ ), with a decrease in tracking error as a function of exposure. 298 There was no main effect of Group ( $F_{(3,79)} = 2.501$ , p = 0.065,  $n_p^2 = 0.087$ ), but a significant 299 interaction (F<sub>(3,79)</sub> = 21.991, p < 0.001,  $n_p^2 = 0.455$ ). Specifically, post-hoc tests revealed that 300 301 during Early adaptation, hand tracking error in Group 4 was smaller than in Groups 1 302  $(t_{(39)} = 4.672, p < 0.001, \text{ Cohen's } d = 1.26), 2 (t_{(40)} = 3.650, p = 0.001, \text{ Cohen's } d = 0.91)$  and 3 ( $t_{(40)} = 2.457$ , p = 0.017, Cohen's d = 0.75; see Figure 4b). Based on these observations we 303 304 conclude that Group 4 who experienced the ROTATION immediately after the SPROT 305 mapping, is the only group that demonstrated an advantage when adapting to ROTATION. As 306 for Late adaptation, post-hoc tests revealed no difference across groups (all p > 0.3; see Figure 4c). This suggests that, irrespective of the previous exposure to other mappings, allgroups were able to adapt to the ROTATION to a similar extent.

309

## 310 Adaptation to the COMBINED (SPROT) mapping

311 Figure 5a compares the time course of tracking error across groups under the SPROT 312 mapping, which results from the combination of SPRING and ROTATION. The two-way ANOVA revealed a main effect of phase (F<sub>(1,79)</sub> = 240.580, p < 0.001,  $n_p^2 = 0.753$ ), with a 313 314 decrease in tracking error as a function of exposure. There was a main effect of Group ( $F_{(3,79)}$ = 18.652, p < 0.001,  $n_p^2 = 0.415$ ), as well as a significant interaction (F<sub>(3,79)</sub> = 14.882, 315 p < 0.001,  $n_p^2 = 0.361$ ). Specifically, post-hoc tests revealed that during Early adaptation, hand 316 317 tracking error in Groups 3 and 4 was smaller than in Groups 1 and 2 (all p < 0.001, all 318 Cohen's d > 1.77; see Figure 5b). Based on these observations we conclude that Groups 1 and 319 2 who had prior experience with the SPRING and ROTATION mappings demonstrated a 320 clear advantage for the combined mapping. Moreover, it seems that the order in which the 321 groups experienced the SPRING and ROTATION mappings was not critical for this 322 composition effect. This benefit was long-lasting, as revealed by the fact that in Late 323 adaptation, Groups 1 and 2 still presented significantly smaller errors than Groups 3 and 4 (all 324 p < 0.05, all Cohen's d > 0.70; see Figure 5c).

325

## 326 Washout of adaptation

At the end of the experimental sessions, all groups performed a washout block in which the NORMAL mapping was restored unexpectedly. A two-way ANOVA (Group x Trial) revealed no systematic difference in tracking performance across groups during this block ( $F_{(3,79)} = 0.239$ , p = 0.869,  $n_p^2 = 0.009$ ). However, there was a main effect of Trial ( $F_{(9,711)} = 93.292$ , p < 0.001,  $n_p^2 = 0.541$ ) revealing a decrease in tracking error, as well as a

significant Group x Trial interaction ( $F_{(27,711)} = 2.744$ , p < 0.001,  $n_p^2 = 0.09$ ). Post-hoc 332 333 analysis revealed that this effect originated from the fact that during the first washout trial, 334 tracking was less impaired in Group 4 (who had experienced SPRING just before washout) as 335 compared to all three other groups (3.06 vs. 4.26cm; p < 0.001) which in the latter case were 336 not different from each other (all p > 0.57). Averaged across groups, mean tracking error 337 during the last washout trial was 1.99cm, a value significantly greater than during Baseline 338 (p < 0.001). Overall these analyses confirm that, no matter the order of the SPRING, 339 ROTATION, and SPROT mapping, all groups presented potent and long lasting aftereffects 340 during the washout block.

341

## 342 Comparison between SPRING and ROTATION in naïve participants

343 To assess the relative complexity in adapting to the SPRING and ROTATION 344 mappings, Figure 6a represents how naïve groups adapted to each perturbation, that is Group 345 1 under SPRING was compared to Group 2 under ROTATION. As can be seen, initial 346 tracking error was larger under the ROTATION mapping than SPRING. The two-way ANOVA revealed a main effect of phase (F<sub>(1,39)</sub> = 291.679, p < 0.001,  $n_p^2 = 0.882$ ), with a 347 348 decrease in tracking error as a function of exposure for both perturbations. There was a main effect of Group (F<sub>(1,39)</sub> = 6.400, p = 0.016,  $n_p^2 = 0.141$ ), as well as a significant interaction 349  $(F_{(1,39)} = 48.492, p < 0.001, n_p^2 = 0.554)$ . Specifically, in Early adaptation errors were 350 approximately 40% higher for ROTATION than for SPRING ( $t_{(39)} = 4.309$ , p < 0.001, 351 352 Cohen's d = 0.96; see Figure 6b), however in Late adaptation, tracking performance was 353 similar under both mappings (p = 0.922; see Figure 6c). This suggests that although the 354 ROTATION mapping was initially more challenging than the SPRING mapping, participants 355 exhibited similar tracking accuracy at the end of exposure.

356

#### 357 Anterograde interference between SPRING and ROTATION

To test for anterograde interference between ROTATION and SPRING, we compared adaptation to each mapping depending on whether or not learning was immediately preceded by prior exposure to the other mapping. Specifically, data from Groups 1 and 3 (in which ROTATION was immediately preceded by SPRING) were pooled and compared to those of Groups 2 and 4 (in which SPRING was immediately preceded by ROTATION) using a 2 Order (First vs. Second) x 2 Phase (Early vs. Late) two-way ANOVA with phase as a repeated measure.

For SPRING (Figure 7a), the ANOVA revealed a main effect of Order ( $F_{(1,81)} = 8.121$ , p < 0.006,  $n_p^2 = 0.091$ ), a main effect of Phase ( $F_{(1,81)} = 316.561$ , p < 0.001,  $n_p^2 = 0.796$ ), and an interaction ( $F_{(1,81)} = 7.513$ , p < 0.008,  $n_p^2 = 0.085$ ). Specifically, in Early adaptation (Figure 7b), errors were lower when SPRING was done before ROTATION (Groups 1 and 3) as compared to when SPRING was done after ROTATION (Groups 2 and 4) ( $t_{(81)} = 3.732$ , p < 0.001, Cohen's d = 0.82). However, the influence of Order was temporary, as there was no difference in Late adaptation ( $t_{(81)} = 1.480$ , p = 0.143, Cohen's d = 0.33; see Figure 7c).

372 For ROTATION (Figure 7d), the ANOVA revealed a main effect of Order  $(F_{(1,81)} =$ 4.557, p < 0.036,  $n_p^2 = 0.053$ ), a main effect of phase (F<sub>(1,81)</sub> = 213.820, p < 0.001,  $n_p^2 = 0.053$ ) 373 0.725), but no interaction (F<sub>(1,81)</sub> = 0.152, p < 0.698,  $n_p^2 = 0.002$ ). Specifically, errors were 374 375 lower when ROTATION was done before SPRING (Groups 2 and 4) as compared to when 376 ROTATION was done after SPRING (Groups 1 and 3), an effect that was present both in 377 Early and Late adaptation (Figure 7e and 7f). Altogether, although SPRING perturbed 378 ROTATION for a longer period than ROTATION perturbed SPRING, these data provide 379 clear evidence of anterograde interference between SPRING and ROTATION, in the sense 380 that prior exposure to one of these two mappings impaired learning of the other mapping.

381

#### 382 Additional analyses

384 In order to provide further insight regarding composition and decomposition of a 385 component that is specific to the rotational perturbation, directional errors were assessed. 386 Figure 8 compares the time course of directional errors for the four groups under the three 387 mappings. As a first qualitative assessment, it can be seen that directional error is near-zero 388 and similar across groups during Baseline. As expected, directional errors emerge under 389 ROTATION and SPROT, that is when a rotational perturbation is applied, but tend to 390 decrease as a function of adaptation. Interestingly, directional errors change polarity during 391 SPRING in Groups 2, 3 and 4 (which have had previous exposure to the rotation), suggesting 392 the presence of carry-over effects. The absence of directional errors in Group 1 upon "naïve" 393 exposure to SPRING is noteworthy, as it demonstrates that this variable is solely influenced 394 by the rotation perturbation, but not the spring. Composition is exemplified by the fact that 395 directional errors are lower under SPROT for Groups 1 and 2 (prior experience with rotation) 396 as compared to Groups 3 and 4 (no prior experience with rotation). Decomposition is 397 exemplified by the fact that directional errors tend to be lower under ROTATION for Groups 398 3 and 4 (prior experience with the rotational perturbation under SPROT) as compared Groups 399 1 and 2 (no prior experience with the rotational perturbation). Hence, these data argue for 400 composition and decomposition effects that arise from a component of learning that is specific 401 to the rotational perturbation.

402 Statistical analyses largely confirmed these qualitative assessments. Specifically, for 403 Baseline, a two-way ANOVA (Group by Trial) revealed no main effect of Group ( $F_{(3,79)} =$ 404 0.990, p = 0.402,  $n_p^2 = 0.036$ ), no main effect of Trial ( $F_{(9,711)} = 1.132$ , p = 0.337,  $n_p^2 = 0.01$ ) 405 and no interaction ( $F_{(27,711)} = 0.808$ , p = 0.744,  $n_p^2 = 0.03$ ).

406 For SPRING, a 4 Group x 2 Phase (Early, Late) two-way ANOVA with phase as a 407 repeated-measures revealed a main effect of Phase ( $F_{(1,79)} = 198.840$ , p < 0.001,  $n_p^2 = 0.716$ ), a

main effect of Group ( $F_{(3,79)} = 20.504$ , p < 0.001,  $n_p^2 = 0.438$ ), and an interaction ( $F_{(3,79)} =$ 408 19.922, p < 0.001,  $n_p^2 = 0.431$ ). Specifically, post-hoc tests revealed that during Early 409 adaptation, all groups differed (p < 0.01) except Groups 2 and 4 (p = 0.926). During Late 410 411 adaptation, directional errors were smallest in Group 1, being significantly different from both 412 Groups 2 and 4 (p < 0.01). Directional errors were also significantly smaller in Group 3 than 413 Group 4 (p < 0.05). As mentioned earlier, a notable finding here is the null directional errors 414 for Group 1, which underwent SPRING without having been previously exposed to the 415 Rotation in any way. This confirms that that this particular metric is specific to the rotation 416 perturbation.

For ROTATION, the ANOVA revealed a main effect of Phase ( $F_{(1,79)} = 32.232$ , p < 0.001,  $n_p^2 = 0.290$ ), no effect of Group ( $F_{(3,79)} = 1.327$ , p = 0.272,  $n_p^2 = 0.048$ ), but an interaction ( $F_{(3,79)} = 3.509$ , p < 0.05,  $n_p^2 = 0.118$ ). Specifically, post-hoc tests revealed that during Early adaptation, Group 4, which was exposed to ROTATION immediately after SPROT, presented significantly lower directional errors than Group 1 (p = 0.027), suggesting decomposition. There were no significant differences during Late adaptation.

423 Concerning SPROT, the ANOVA revealed a main effect of Phase ( $F_{(1,79)} = 66.902$ , 424 p < 0.001,  $n_p^2 = 0.459$ ) and a main effect of Group ( $F_{(3,79)} = 4.704$ , p < 0.01,  $n_p^2 = 0.152$ ), but 425 no interaction ( $F_{(3,79)} = 2.573$ , p = 0.06,  $n_p^2 = 0.089$ ). Specifically, post-hoc tests revealed that 426 directional errors in Groups 1 and 2 (which had been previously exposed to the rotation 427 perturbation), were significantly lower that in Groups 3 and 4 (all p < 0.05). This is a potent 428 demonstration of composition.

Finally, during washout directional error changed polarity with respect to ROTATION and SPROT, an observation consistent with the presence of aftereffects. The two-way ANOVA (Group by Trial) revealed a main effect of Group ( $F_{(3,79)} = 5.372$ , p < 0.01,  $n_p^2 =$ 0.169), a main effect of Trial ( $F_{(9,711)} = 48.453$ , p < 0.001,  $n_p^2 = 0.38$ ) and an interaction 433 (F<sub>(27,711)</sub> = 2.352, p < 0.001,  $n_p^2 = 0.08$ ). Specifically, Group 4 presented significantly less 434 directional error than all other groups during the first 6 trials (all p < 0.05), which is consistent 435 with the fact that this group was tested immediately after SPRING (rather than SPROT or 436 ROTATION).

437

#### 438 Cursor velocity

439 In order to provide further insight regarding composition and decomposition of a 440 component that is specific to the spring perturbation, cursor velocity was assessed. Figure 9 441 compares the time course of cursor velocity for the four groups under the three mappings. As 442 a first qualitative assessment, it can be seen that cursor velocity is similar during Baseline 443 across groups, and that its value is similar to mean target velocity (16 cm/s). As expected, 444 cursor velocity increased substantially under initial exposure to the SPRING and SPROT 445 mappings, consistent with the amplificative effect of the spring dynamics. It should be noted, 446 however, that this variable was not exclusively modulated by the spring perturbation, as an 447 increase (albeit smaller) was observed in Group 2 during "naïve" exposure to ROTATION. 448 Nevertheless, composition is reflected by the fact that cursor velocity was lower during the 449 first ~5 trials of SPROT for Groups 1 and 2 (prior experience with SPRING) as compared to 450 Groups 3 and 4 (no prior experience with SPRING). Decomposition is exemplified by the fact 451 that cursor velocity is lower under SPRING for Groups 3 and 4 (prior experience with the 452 spring perturbation under SPROT) as compared to Groups 1 and 2 (no prior experience with 453 the spring perturbation). Hence, these data argue for composition and decomposition effects 454 that arise from a component of learning that is predominantly influenced by the spring 455 perturbation.

456 Statistical analyses largely confirmed these qualitative assessments. Specifically, for 457 Baseline, a two-way ANOVA (Group by Trial) revealed no main effect of Group ( $F_{(3,79)} =$ 

458 0.798, p = 0.499,  $n_p^2 = 0.029$ ), no interaction (F<sub>(27,711)</sub> = 1.051, p = 0.395,  $n_p^2 = 0.038$ ), but a 459 main effect of Trial (F<sub>(9,711)</sub> = 2.881, p = 0.002,  $n_p^2 = 0.035$ ), revealing that all groups slightly 460 reduced their cursor velocity over the first 4 trials.

461 For SPRING, a 4 Group x 2 Phase (Early, Late) two-way ANOVA with phase as a repeated-measures revealed a main effect of Phase ( $F_{(1,79)} = 120.303$ , p < 0.001,  $n_p^2 = 0.604$ ), a 462 main effect of Group ( $F_{(3,79)} = 11.722$ , p < 0.001,  $n_p^2 = 0.308$ ), and an interaction ( $F_{(3,79)} = 0.308$ ) 463 10.890, p < 0.001,  $n_p^2 = 0.293$ ). Specifically, post-hoc tests revealed that during Early 464 465 adaptation, cursor velocity in Groups 3 and 4 was significantly lower than for Groups 1 and 2 466 (all p < 0.01). During Late adaptation, cursor velocity in Group 3 was significantly lower than 467 for Groups 1 and 2 (both p < 0.05), while it was also significantly lower for Group 4 than for 468 Group 2 (p < 0.05). These data reflect decomposition since Groups 3 and 4, which were 469 exposed to the spring perturbation during SPROT and thus learned to reduce cursor velocity, 470 carried this effect over to the SPRING condition.

471 For ROTATION, the ANOVA revealed a main effect of Phase ( $F_{(1,79)} = 4.760$ ,  $p < 0.05, n_p^2 = 0.057$ ), a main effect of Group (F<sub>(3,79)</sub> = 11.963,  $p < 0.001, n_p^2 = 0.312$ ), and an 472 interaction (F<sub>(3,79)</sub> = 14.291, p < 0.001,  $n_p^2 = 0.352$ ). Specifically, post-hoc tests revealed that 473 474 during Early adaptation, Group 1 significantly differed from Groups 2 and 3 (both p < 0.01), 475 while Group 2 significantly differed from all other Groups (all p < 0.01). During Late 476 adaptation, Groups 1 and 2 differed from Group 3 (both p < 0.05). Here again, the fact that 477 cursor velocity for Groups 1, 3 and 4 was lower than for "naïve" Group 2 during early 478 ROTATION (sometimes below baseline levels), suggests the presence of carry-over effects 479 resulting from prior exposure to the spring perturbation.

480 Concerning SPROT, the ANOVA revealed a main effect of Phase ( $F_{(1,79)} = 102.703$ , 481 p < 0.001,  $n_p^2 = 0.565$ ) no effect of Group ( $F_{(3,79)} = 0.080$ , p = 0.971,  $n_p^2 = 0.003$ ), and a 482 significant interaction ( $F_{(3,79)} = 5.649$ , p < 0.001,  $n_p^2 = 0.177$ ). Although cursor velocity was lower for Groups 1 and 2 as compared to Groups 3 and 4 during the first ~5 trials of SPROT, suggesting composition, this effect did not reach statistical significance when considering our operational definition of Early adaptation (trials 1-10) (all p > 0.2). As for Late adaptation, there was a tendency for cursor velocity to differ between Groups 1 and 2 vs. Group 3, but it did not reach significant levels (both p > 0.07).

Finally, during washout cursor velocity was below baseline levels, which is indicative of aftereffects. The ANOVA revealed no main effect of Group ( $F_{(3,79)} = 2.353$ , p = 0.078,  $n_p^2 =$ 0.082), but a significant main effect of Trial ( $F_{(9,711)} = 17.952$ , p < 0.001,  $n_p^2 = 0.185$ ) and an interaction ( $F_{(27,711)} = 2.365$ , p < 0.001,  $n_p^2 = 0.082$ ). Specifically, Group 3 presented significantly less aftereffects than all other groups during the first 4 trials (all p < 0.05), which is consistent with the fact that this group was tested immediately after ROTATION (rather than SPRING or SPROT).

495

#### 496 **DISCUSSION**

497 The main objective of this study was to investigate interference effects as well as 498 modularity of sensorimotor adaptation in manual tracking under two separate visual 499 perturbations (SPRING and ROTATION) and their combination (SPROT). First, evidence for 500 anterograde interference was found whenever participants switched from SPRING to 501 ROTATION, and vice versa. Second, evidence for modularity was found both in terms of 502 composition and decomposition. Indeed, irrespective of the order of presentation, prior 503 exposure to each single mapping clearly benefited to learning the combined mapping. 504 Conversely, prior exposure to the combined mapping facilitated learning of the single 505 mapping that immediately followed. More fine-grained analyses revealed that the composition 506 and decomposition effects were attributable to components of learning that were specifically 507 acquired through exposure to either the rotational perturbation (i.e., directional error) or the

spring perturbation (i.e., cursor velocity), excluding the possibility that these effects be solely due to task-irrelevant improvements in motor acuity or meta-learning (Braun et al. 2009; Turnham et al. 2012). Together, these results demonstrate that even though two perturbations interfere with each other, they can still be composed and decomposed advantageously.

512

### 513 Interference between SPRING and ROTATION

514 Our results provide evidence for anterograde interference, in that exposure to either 515 one of the single mappings (SPRING or ROTATION) impaired subsequent learning of the 516 other single mapping (see Figure 7). While it is likely that interference arose from a 517 combination of the previously identified factors (i.e., same sensory modality of the errors, 518 partially shared state variables, common task goal and context), it suggests that shared neural 519 populations (or at least neural populations whose dynamics occupy a shared subspace; 520 Duncker et al. 2020) were involved in adapting to the SPRING and ROTATION mappings. 521 Nonetheless, as will be discussed in the next sections, interference did not preclude 522 participants' capacity to compose or decompose these novel sensorimotor representations. In 523 that sense our results extend the findings of Flanagan et al. (1999) who found evidence for 524 modularity in the context of force field and visuomotor adaptation (two "orthogonal" 525 perturbations), in absence of direct evidence of interference between the two. Thanks to our 526 additional analyses of directional error and cursor velocity (Figures 8 and 9), it could be 527 confirmed that the interference effects found at the task level (i.e., hand tracking error, see 528 Figure 7) specifically resulted from carry-over effects inherent to each perturbation. Indeed, 529 following exposure to the ROTATION and SPROT mappings, participants exhibited a 530 negative directional bias in cursor motion, which likely accounted for the impairment in 531 tracking performance under SPRING (and Washout). Similarly, following the SPRING and 532 SPROT mappings, participants tended to unnecessarily slow down their cursor motion, an effect again likely to have altered tracking performance under ROTATION (and Washout).
Altogether, although anterograde interference is expected when sequentially adapting to
opposite visuomotor rotations (Krakauer et al. 2005; Miall et al. 2004; Wigmore et al. 2002),
we show here that carry-over effects along different dimensions of hand behavior (direction
vs. velocity) can also lead to interference at the task level.

538 No matter their origin, interference effects in our task were not symmetrical, as prior 539 exposure to the SPRING mapping seems to have had a more detrimental effect on learning of 540 the ROTATION mapping than the contrary. Indeed, the interference effect from SPRING to 541 ROTATION was present both in early and late adaptation, whereas the interference effect 542 from ROTATION to SPRING was only present in early adaptation. This asymmetry may 543 result from differences in the complexity of the two perturbations, as suggested by distinct 544 time course of tracking error in naïve participants. Indeed, as shown in Figure 6, the SPRING 545 mapping appeared less challenging than ROTATION, with lower initial tracking errors and 546 fewer trials needed to reach asymptotic levels of performance. Given that asymptotic 547 performance has been shown to initiate consolidation processes and promote anterograde 548 interference (Leow et al. 2013; Shibata et al. 2017), the more extensive period at asymptote 549 for SPRING may have led to its stabilization, and ultimately to greater impairment to 550 ROTATION than the contrary. A second possibility may stem from differences in the state 551 variables being influenced by each mapping, with ROTATION and SPRING relying on a 552 common state variable (i.e., position), but SPRING depending upon additional variables (i.e., 553 velocity and acceleration). It may be that SPRING had a greater impact on ROTATION 554 because it interfered with its unique state variable, conversely ROTATION interfered less on 555 SPRING because many more state variables were involved.

556

#### 557 Composition and decomposition of visuomotor adaptation

558 Irrespective of the order of exposure to the SPRING and ROTATION mappings, 559 participants of Groups 1 and 2 exhibited a strong and reliable advantage for learning the 560 combined mapping as compared to naïve participants of Groups 3 and 4 (see Figure 5). Not 561 only was this advantage observed during early exposure, but it persisted throughout the entire 562 adaptation session. Evidence for composition supports the idea that even though the two 563 perturbations may have involved partially overlapping neural substrates (thus causing 564 interference), they were somehow combined advantageously when facing the SPROT 565 mapping.

566 In addition, following adaptation to the combined mapping, participants of Groups 3 567 and 4 exhibited an advantage when subsequently tested in either one of the single mappings 568 (see Figures 3 and 4). This decomposition effect indicates that the SPROT mapping was not 569 learned as a third entity independent from each single mapping. In contrast, it suggests that 570 during SPROT the sensorimotor system was seemingly able to pick out error signals 571 associated with each of the single mappings even though they were superimposed, perhaps 572 due to the fact that they influenced partly different state variables. Nonetheless, it should be 573 noted that this effect occurred completely outside of participants' capacity to identify the 574 perturbations, as none of them was able to report that two mappings were superimposed, let 575 alone what their underlying nature was. Although these verbal reports do not formally rule out 576 the use of explicit strategies, they still suggest that cognitive processes, such as re-aiming, 577 played a negligible role in the gradual improvement in performance observed here. Rather, 578 they point to the possibility that adaptation was due to the implicit update of an internal 579 model. This is further supported by the potent and long-lasting aftereffects for each 580 perturbation during washout, which are generally ascribed to implicit adaptation. Importantly, 581 these aftereffects were not only observed for tracking error, but also for directional error and 582 cursor velocity, which respectively pertained to the ROTATION and SPRING mappings. The

583 rotational aftereffects are notable since large perturbations such as the one used here (90° 584 visuomotor rotation) have been suggested to be mediated to a large extent by strategic/explicit 585 processes, at least in reaching tasks (Bond and Taylor 2015). Note that even in the case of 586 reaching movements, the use of stringent (i.e., low) reaction time constraints prevents the 587 expression of the strategic/explicit component (Leow et al. 2017). This latter observation 588 echoes with our pursuit tracking task in which participants had to constantly keep track of the 589 target and update their cursor position, rendering the use of cognitive strategizing and re-590 aiming unlikely given that they are time-consuming processes (Fernandez-Ruiz et al. 2011; 591 Haith et al. 2015; Leow et al. 2017; McDougle and Taylor 2019). In direct support of our 592 interpretation, recent work has shown that during manual tracking, rotational perturbations of 593 90° lead to potent directional aftereffects (unlike for a mirror-reversal perturbation), leading 594 the authors to suggest that it was subtented by genuine adaptive mechanisms rather than de 595 novo learning (Yang et al. 2020).

596 To some extent, the SPROT mapping can be conceived as a 90° visuomotor rotation 597 with added noise, given the non-linear hand-cursor spatial relationship incurred by the 598 SPRING perturbation. In that light, the decomposition effect observed for ROTATION 599 indicates that despite this increase in noise, participants could reliably extract error signals 600 specifically pertaining to the visuomotor rotation. This observation is reminiscent of a study 601 showing that participants could adapt their reaching movements to a visuomotor rotation even 602 when combined with a 200 ms visual delay (Honda et al. 2012). Moreover, as in our case, that 603 study revealed that adaptation to the combined perturbation was facilitated by prior exposure 604 to the visual delay (hence a form of composition). However, that study did not investigate 605 decomposition of the combined perturbation into each of the two perturbations.

606 An interesting finding is that the decomposition effect was clear for the single 607 mapping that immediately followed exposure to SPROT but did not extend to the subsequent

608 single mapping. Two non-exclusive reasons may account for this. First, this may have 609 resulted from two simulateous effects, namely the enhanced tracking performance in the 610 individual mappings due to prior practice with the combined perturbation (i.e., 611 decomposition), along with anterograde interference. Indeed, given the observed anterograde 612 interference between SPRING and ROTATION, it is likely that extraction of one of the single 613 mappings following SPROT counteracted the subsequent extraction of the other single 614 mapping. Second, as time elapsed, the memory of the combined mapping may have gradually 615 decayed, favoring the extraction of the first single mapping as compared to the second one. 616 Future experiments will be needed to clarify the respective contribution of these two 617 mechanisms.

618 Finally, we observed an asymmetry in the relative strength of the composition and 619 decomposition effects, with decomposition being more fragile than composition. This effect 620 may stem from the fact that decomposing a mapping is presumably more complex (from a 621 computational perspective) than composing two mappings. Indeed although SPROT can 622 theoretically be decomposable into an infinite set of mappings, combining ROTATION and 623 SPRING can only lead to a single deterministic outcome. This issue (i.e., inverse problem) 624 has already been raised in the context of forward/inverse models in conjunction with modular 625 learning (Miall 2002; Wolpert and Kawato 1998).

626

## 627 Modularity in continuous and discrete actions

It has been suggested that "the differentiation between discrete and continuous movements is one of the pillars of motor behavior classification" (Huys et al. 2008). Although modularity of adaptation was initially uncovered through reaching (Flanagan et al. 1999), a discrete movement, here we show that manual tracking, a continuous movement, is also prone to composition and decomposition effects. The extent to which discrete and continuous

633 movements are distinct is a subject of heated debate (Cohen et al. 2019; Howard et al. 2011; 634 Huys et al. 2008; Ikegami et al. 2010; Schaal et al. 2004; Sternad and Schaal 1999; Yang et al. 635 2020; Yoo et al. 2021a). On the one hand, continuous and discrete movements are thought to 636 belong to different movement categories because they seem to rely on different control 637 processes (Huys et al. 2008; Sternad and Schaal 1999; Yang et al. 2020), as well as neural 638 structures (Hatsopoulos et al. 2004; Schaal et al. 2004). On the other hand, continuous 639 movements are sometimes considered as a mere concatenation of discrete actions (Miall et al. 640 1993; Zimnik and Churchland 2021), or similarly discrete movements are seen as truncated 641 continuous movements (Hogan and Sternad 2007). With regard to pointing and tracking 642 movements, we believe that a key difference lies in how planning and execution processes 643 operate. During fast pointing movements, planning is essentially performed before hand 644 movement starts, so that planning and execution operate sequentially. In contrast during 645 pursuit tracking, planning has to operate while the hand is already moving, so that planning 646 and execution must operate in concert. Although the current dataset certainly does not settle 647 the discrete/continuous debate, it suggests that, despite potential key differences between 648 pointing and tracking movements, both types of movement seem to follow the same general 649 principles with respect to the modularity of sensorimotor adaptation.

650

#### 651 Concluding comments

To summarize, the present study shows that interference effects can coexist with the ability to compose/decompose two visuomotor mappings that partially share the same state variables, and for which the task goals and context are the same. This indicates that the brain is not only able to flexibly combine multiple visuomotor mappings but is also able to partition sources of error when dealing with complex visuomotor mappings, allowing participants to cope efficiently with a fraction of this mapping. More generally this study reinforces the view

658	that modularity is ubiquitous in neuroscience (d'Avella et al. 2015), ranging from cognitive
659	(Barrett and Kurzban 2006; Coltheart 1999) to sensorimotor processes (d'Avella 2016;
660	Duncker et al. 2020; Flanagan et al. 1999; Lemke et al. 2019), which in the latter case seems
661	to encompass both discrete and continuous actions. Finally, we hope that, in addition to its
662	ecological relevance (Land 1992; Wardill et al. 2017; Yoo et al. 2021b), this study further
663	demonstrates the relevance of pursuit tracking to address key issues in sensorimotor control
664	and learning (Engel and Soechting 2000; Mathew et al. 2018; Miall et al. 2001; Yang et al.
665	2020; Yoo et al. 2021a).

## 667 **BIBLIOGRAPHY**

- 668 d'Avella A. Modularity for Motor Control and Motor Learning. In: *Progress in Motor*
- 669 *Control: Theories and Translations*, edited by Laczko J, Latash ML. Springer International
  670 Publishing, p. 3–19.
- d'Avella A, Giese M, Ivanenko YP, Schack T, Flash T. Editorial: Modularity in motor
- 672 control: from muscle synergies to cognitive action representation. *Front Comput Neurosci* 9,
  673 2015.
- 674 Barrett HC, Kurzban R. Modularity in cognition: framing the debate. *Psychol Rev* 113: 628,
  675 2006.
- 676 **Benjamini Y**, **Hochberg Y**. Controlling the False Discovery Rate: A Practical and Powerful 677 Approach to Multiple Testing. *J R Stat Soc Ser B Methodol* 57: 289–300, 1995.
- 678 **Bond KM**, **Taylor JA**. Flexible explicit but rigid implicit learning in a visuomotor 679 adaptation task. *J Neurophysiol* 113: 3836–3849, 2015.
- Braun DA, Aertsen A, Wolpert DM, Mehring C. Motor task variation induces structural
  learning. *Curr Biol CB* 19: 352–357, 2009.
- 682 Burgos PI, Mariman JJ, Makeig S, Rivera-Lillo G, Maldonado PE. Visuomotor
- coordination and cortical connectivity of modular motor learning. *Hum Brain Mapp* 39:
  3836–3853, 2018.
- 685 **Cohen EJ, Wei K, Minciacchi D**. Visuomotor perturbation in a continuous circle tracing 686 task: novel approach for quantifying motor adaptation. *Sci Rep* 9: 18679, 2019.
- 687 Coltheart M. Modularity and cognition. *Trends Cogn Sci* 3: 115–120, 1999.
- 688 **Danion F, Diamond JS, Flanagan JR**. The role of haptic feedback when manipulating 689 nonrigid objects. *J Neurophysiol* 107: 433–441, 2012.
- 690 Danion F, Mathew J, Flanagan JR. Eye Tracking of Occluded Self-Moved Targets: role of
- 691 Haptic Feedback and Hand-Target Dynamics [Online]. eNeuro,
- 692 2017http://www.eneuro.org/content/early/2017/06/26/ENEURO.0101-17.2017 [5 Jul. 2017].
- 693 Danion FR, Flanagan JR. Different gaze strategies during eye versus hand tracking of a
   694 moving target. *Sci Rep* 8: 10059, 2018.
- 695 Davidson PR, Wolpert DM. Internal models underlying grasp can be additively combined.
   696 Exp Brain Res Exp Hirnforsch Expérimentation Cérébrale 155: 334–340, 2004.
- 697 **Dingwell JB**, **Mah CD**, **Mussa-Ivaldi FA**. Manipulating objects with internal degrees of 698 freedom: evidence for model-based control. *J Neurophysiol* 88: 222–235, 2002.
- 699 **Dingwell JB**, **Mah CD**, **Mussa-Ivaldi FA**. Experimentally confirmed mathematical model 700 for human control of a non-rigid object. *J Neurophysiol* 91: 1158–1170, 2004.

- 701 **Duncker L, Driscoll L, Shenoy KV, Sahani M, Sussillo D**. Organizing recurrent network 702 dynamics by task-computation to enable continual learning. *Adv Neural Inf Process Syst* 33,
- 703 2020.
- Find Engel KC, Soechting JF. Manual tracking in two dimensions. *J Neurophysiol* 83: 3483–3496, 2000.
- Fernandez-Ruiz J, Wong W, Armstrong IT, Flanagan JR. Relation between reaction time
   and reach errors during visuomotor adaptation. *Behav Brain Res* 219: 8–14, 2011.
- 708 Flanagan JR, Nakano E, Imamizu H, Osu R, Yoshioka T, Kawato M. Composition and

decomposition of internal models in motor learning under altered kinematic and dynamic
 environments. *J Neurosci* 19: RC34, 1999.

- Fritz CO, Morris PE, Richler JJ. Effect size estimates: current use, calculations, and
   interpretation. J Exp Psychol Gen 141: 2, 2012.
- 713 Gouirand N, Mathew J, Brenner E, Danion F. Eye movements do not play an important
- role in the adaptation of hand tracking to a visuomotor rotation. *J Neurophysiol*, 2019.
- 715 doi:10.1152/jn.00814.2018.
- Haith AM, Huberdeau DM, Krakauer JW. The Influence of Movement Preparation Time
  on the Expression of Visuomotor Learning and Savings. *J Neurosci* 35: 5109–5117, 2015.
- Haruno M, Wolpert DM, Kawato M. Mosaic model for sensorimotor learning and control.
   *Neural Comput* 13: 2201–2220, 2001.
- Hatsopoulos N, Joshi J, O'Leary JG. Decoding Continuous and Discrete Motor Behaviors
  Using Motor and Premotor Cortical Ensembles. *J Neurophysiol* 92: 1165–1174, 2004.
- 722 Hogan N, Sternad D. On rhythmic and discrete movements: reflections, definitions and
- implications for motor control. *Exp Brain Res Exp Hirnforsch Expérimentation Cérébrale*181: 13–30, 2007.
- Honda T, Hirashima M, Nozaki D. Adaptation to visual feedback delay influences
   visuomotor learning. *PLoS One* 7: e37900, 2012.
- Howard IS, Ingram JN, Franklin DW, Wolpert DM. Gone in 0.6 Seconds: The Encoding
  of Motor Memories Depends on Recent Sensorimotor States. *J Neurosci* 32: 12756–12768,
  2012.
- Howard IS, Ingram JN, Wolpert DM. Separate representations of dynamics in rhythmic
   and discrete movements: evidence from motor learning. *J Neurophysiol* 105: 1722–1731,
- 732 2011.
- Huang FC, Gillespie RB, Kuo AD. Visual and haptic feedback contribute to tuning and
  online control during object manipulation. *J Mot Behav* 39: 179–193, 2007.
- Huys R, Studenka BE, Rheaume NL, Zelaznik HN, Jirsa VK. Distinct timing mechanisms
   produce discrete and continuous movements. *PLoS Comput Biol* 4: e1000061, 2008.

- 737 **Ikegami T, Hirashima M, Taga G, Nozaki D.** Asymmetric transfer of visuomotor learning 738 between discrete and rhythmic movements. *J Neurosci Off J Soc Neurosci* 30: 4515–4521,
- between discrete and rhythmic movements. J Neurosci Off J Soc Neurosci 30: 451
  2010.
- 740 Imamizu H, Higuchi S, Toda A, Kawato M. Reorganization of brain activity for multiple
- internal models after short but intensive training. *Cortex J Devoted Study Nerv Syst Behav* 43:
  338–349, 2007.
- 743 Krakauer JW, Ghez C, Ghilardi MF. Adaptation to visuomotor transformations:
- consolidation, interference, and forgetting. J Neurosci Off J Soc Neurosci 25: 473–478, 2005.
- Krakauer JW, Ghilardi MF, Ghez C. Independent learning of internal models for kinematic
   and dynamic control of reaching. *Nat Neurosci* 2: 1026–1031, 1999.
- Krakauer JW, Hadjiosif AM, Xu J, Wong AL, Haith AM. Motor Learning. *Compr Physiol* 9: 613–663, 2019.
- Lakens D. Calculating and reporting effect sizes to facilitate cumulative science: a practical
   primer for t-tests and ANOVAs. *Front Psychol* 4, 2013.
- Land MF. Visual tracking and pursuit: Humans and arthropods compared. *J Insect Physiol*38: 939–951, 1992.
- Landelle C, Montagnini A, Madelain L, Danion F. Eye tracking a self-moved target with
   complex hand-target dynamics. *J Neurophysiol* 116: 1859–1870, 2016.
- Lemke SM, Ramanathan DS, Guo L, Won SJ, Ganguly K. Emergent modular neural
   control drives coordinated motor actions. *Nat Neurosci* 22: 1122, 2019.
- Leow L-A, Gunn R, Marinovic W, Carroll TJ. Estimating the implicit component of
  visuomotor rotation learning by constraining movement preparation time. *J Neurophysiol* 118:
  666–676, 2017.
- Leow L-A, de Rugy A, Loftus AM, Hammond G. Different mechanisms contributing to
   savings and anterograde interference are impaired in Parkinson's disease. *Front Hum Neurosci* 7, 2013.
- Lerner G, Albert S, Caffaro PA, Villalta JI, Jacobacci F, Shadmehr R, Della-Maggiore
  V. The Origins of Anterograde Interference in Visuomotor Adaptation. *Cereb Cortex* 30:
  4000–4010, 2020.
- Mathew J, Bernier P-M, Danion FR. Asymmetrical Relationship between Prediction and
   Control during Visuomotor Adaptation. *eNeuro* 5, 2018.
- 768 **Mathew J, Flanagan JR, Danion FR**. Gaze behavior during visuomotor tracking with 769 complex hand-cursor dynamics. *J Vis* 19: 24–24, 2019a.
- Mathew J, Sarlegna FR, Bernier P-M, Danion FR. Handedness Matters for Motor Control
  But Not for Prediction. *eNeuro* 6, 2019b.
- McDougle SD, Taylor JA. Dissociable cognitive strategies for sensorimotor learning. *Nat Commun* 10: 40, 2019.

- 774 **Miall C.** Modular motor learning. *Trends Cogn Sci* 6: 1–3, 2002.
- 775 **Miall RC**, Jenkinson N, Kulkarni K. Adaptation to rotated visual feedback: a re-776 examination of motor interference. *Exp Brain Res* 154: 201–210, 2004.
- Miall RC, Reckess GZ, Imamizu H. The cerebellum coordinates eye and hand tracking
   movements. *Nat Neurosci* 4: 638–644, 2001.
- Miall RC, Weir DJ, Stein JF. Intermittency in human manual tracking tasks. *J Mot Behav*25: 53–63, 1993.
- 781 Mrotek LA, Soechting JF. Target interception: hand-eye coordination and strategies. J
   782 Neurosci 27: 7297–7309, 2007.
- Nagengast AJ, Braun DA, Wolpert DM. Optimal control predicts human performance on
   objects with internal degrees of freedom. *PLoS Comput Biol* 5: e1000419, 2009.
- Nagengast AJ, Braun DA, Wolpert DM. Risk-sensitive optimal feedback control accounts
   for sensorimotor behavior under uncertainty. *PLoS Comput Biol* 6: e1000857, 2010.
- 787 **Ogawa K, Imamizu H**. Human sensorimotor cortex represents conflicting visuomotor 788 mappings. *J Neurosci* 33: 6412–6422, 2013.
- Pearson TS, Krakauer JW, Mazzoni P. Learning not to generalize: modular adaptation of
   visuomotor gain. *J Neurophysiol* 103: 2938–2952, 2010.
- Schaal S, Sternad D, Osu R, Kawato M. Rhythmic arm movement is not discrete. *Nat Neurosci* 7: 1136–1143, 2004.
- Sheahan HR, Franklin DW, Wolpert DM. Motor Planning, Not Execution, Separates
  Motor Memories. *Neuron* 92: 773–779, 2016.
- 795 Shibata K, Sasaki Y, Bang JW, Walsh EG, Machizawa MG, Tamaki M, Chang L-H,
- 796 **Watanabe T**. Overlearning hyperstabilizes a skill by rapidly making neurochemical 797 processing inhibitory-dominant. *Nat Neurosci* 20: 470–475, 2017.
- Soechting JF, Rao HM, Juveli JZ. Incorporating prediction in models for two-dimensional
   smooth pursuit. *PloS One* 5: e12574, 2010.
- 800 **Sternad D**, **Schaal S**. Segmentation of endpoint trajectories does not imply segmented 801 control. *Exp Brain Res Exp Hirnforsch Expérimentation Cérébrale* 124: 118–136, 1999.
- 802 Tong C, Wolpert DM, Flanagan JR. Kinematics and dynamics are not represented
- independently in motor working memory: evidence from an interference study. J Neurosci Off
   J Soc Neurosci 22: 1108–1113, 2002.
- 805 Turnham EJA, Braun DA, Wolpert DM. Facilitation of learning induced by both random
   806 and gradual visuomotor task variation. *J Neurophysiol* 107: 1111–1122, 2012.
- 807 Wardill TJ, Fabian ST, Pettigrew AC, Stavenga DG, Nordström K, Gonzalez-Bellido
- 808 **PT**. A Novel Interception Strategy in a Miniature Robber Fly with Extreme Visual Acuity.
- 809 *Curr Biol CB* 27: 854–859, 2017.

- 810 Wigmore V, Tong C, Flanagan JR. Visuomotor rotations of varying size and direction
- 811 compete for a single internal model in motor working memory. J Exp Psychol Hum Percept
- 812 *Perform* 28: 447–457, 2002.
- 813 Wolpert DM, Kawato M. Multiple paired forward and inverse models for motor control.
- 814 Neural Netw 11: 1317–1329, 1998.
- 815 Yang C, Cowan N, Haith A. De novo learning versus adaptation of continuous control in a
- 816 manual tracking task [Online]. *bioRxiv*
- 817 2020.https://www.biorxiv.org/content/10.1101/2020.01.15.906545v1 [12 Jun. 2020].
- 818 Yoo SBM, Hayden BY, Pearson JM. Continuous decisions. *Philos Trans R Soc B Biol Sci*819 376: 20190664, 2021a.
- 820 **Yoo SBM**, **Tu JC**, **Hayden BY**. Multicentric tracking of multiple agents by anterior cingulate 821 cortex during pursuit and evasion. *Nat Commun* 12: 1985, 2021b.
- 822 Zimnik AJ, Churchland MM. Independent generation of sequence elements by motor
- 823 cortex. *Nat Neurosci* 24: 412–424, 2021.
- 824

## 825 FIGURE CAPTIONS

**Figure 1.** A. Overhead view of the experimental setup. B. Example trajectory of a moving target as well as a hand cursor on the screen. Note that the white trajectory was not presented to participants. C. The five target trajectories employed for pursuit tracking. The blue dot shows the position of the target at the trial start, and the arrow shows its direction (see methods for more details).

831

Figure 2. Experimental design. Each box represents one block, along with the number of
trials in each block.

834

**Figure 3.** Tracking error under the SPRING mapping. A. Time course of tracking error as a function of trial and experimental group. B. Comparison of tracking error during early exposure (mean of first 10 trials) across groups. C. Same as B for tracking error during late exposure (mean of last 10 trials). Black dots indicate individual participants, and error bars correspond to SEM. Asterisks indicate significant differences (p < 0.05). Note the lower initial tracking error in Group 3 who was exposed to the SPRING mapping immediately after the SPROT mapping.

842

**Figure 4.** Tracking error under the ROTATION mapping. A. Time course of tracking error as a function of trial and experimental group. B. Comparison of tracking error during early exposure (mean of first 10 trials) across groups. C. Same as B for tracking error during late exposure (mean of last 10 trials). Black dots indicate individual participants, and error bars correspond to SEM. Asterisks indicate significant differences (p < 0.05). Note the lower initial tracking error in Group 4 who was exposed to the ROTATION mapping immediately after the SPROT mapping.

850

**Figure 5.** Tracking error under the SPROT mapping. A. Time course of tracking error as a function of trial and experimental group. B. Comparison of tracking error during early exposure (mean of first 10 trials) across groups. C. Same as B for tracking error during late exposure (mean of last 10 trials). Black dots indicate individual participants, and errors bars correspond to SEM. Asterisks indicate significant differences (p < 0.05). Note the lower tracking error in Groups 1 and 2 who previously experienced the SPRING and ROTATION mappings separately.

858

859Figure 6. Tracking error under SPRING and ROTATION mappings in naïve participants. A.860Time course of tracking error as a function of trial and experimental group. B. Comparison of861tracking error during early exposure (mean of first 10 trials) across groups. C. Same as B for862tracking error during late exposure (mean of last 10 trials). Black dots indicate individual863participants, and errors bars correspond to SEM. Asterisks indicate significant differences864(p < 0.05). Note the larger initial tracking error in ROTATION (G2) than SPRING (G1).

865

866 Figure 7. Evidence for anterograde interference. A. Time course of tracking error under the 867 SPRING mapping depending on whether the ROTATION mapping was tested immediately 868 beforehand (G2G4) or not (G1G3). B. Comparison of tracking error during early exposure to 869 SPRING (mean of first 10 trials) across each group pair. C. Same as B for tracking error 870 during late exposure (mean of last 10 trials). D. Time course of tracking error under the 871 ROTATION mapping depending on whether the SPRING mapping was tested immediately 872 beforehand (G1G3) or not (G2G4). E. Comparison of tracking error during early exposure to 873 ROTATION (mean of first 10 trials) across each group pair. F. Same as E for tracking error 874 *during late exposure (mean of last 10 trials). Black dots indicate individual participants, and* 875 *errors bars correspond to SEM. Asterisks indicate significant differences (p < 0.05). Note in* 876 *both cases the detrimental effect of prior exposure on learning of the other mapping.* 

**Figure 8.** Time course of directional error as a function of mapping and experimental group. The table inset provides the order of mapping for each group. Errors bars correspond to SEM. Under SPROT note the smaller directional error in Groups 1 and 2 who previously experienced the ROTATION mapping. Note also under SPRING the negative polarity of directional error in Groups 2, 3 and 4 which previously experienced SPROT, ROTATION, or both.

884

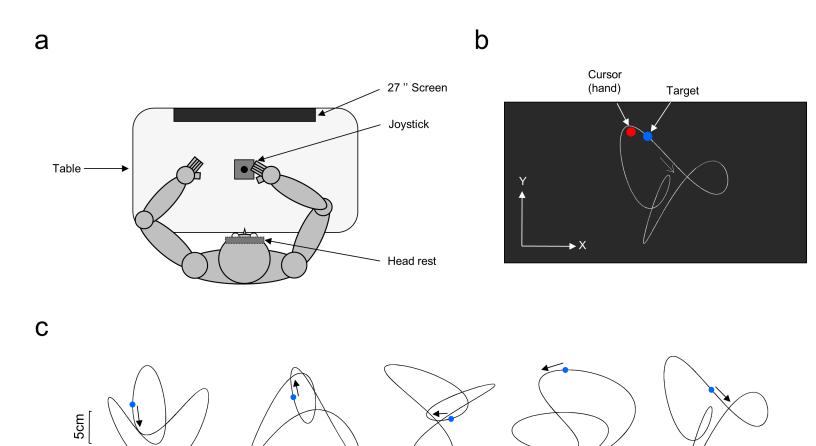
877

Figure 9. Time course of cursor velocity as a function of mapping and experimental group.
The table inset provides the order of mapping for each group. Error bars correspond to SEM.
Early under SPROT (first ~5 trials) note the smaller cursor velocity in Groups 1 and 2 who
previously experienced the SPRING mapping. Note also under SPRING the lower cursor
velocity in Groups 3 and 4 who previously experienced SPROT.

890 891

## 892 TABLE CAPTION

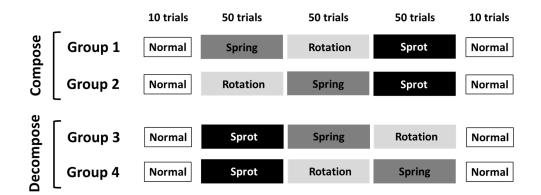
893 Table 1. Target trajectory parameters.

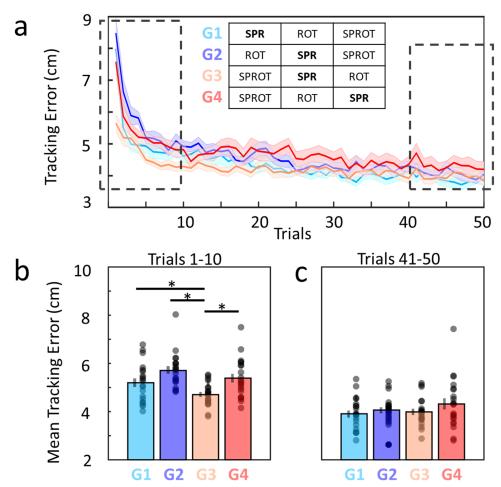


Y♠

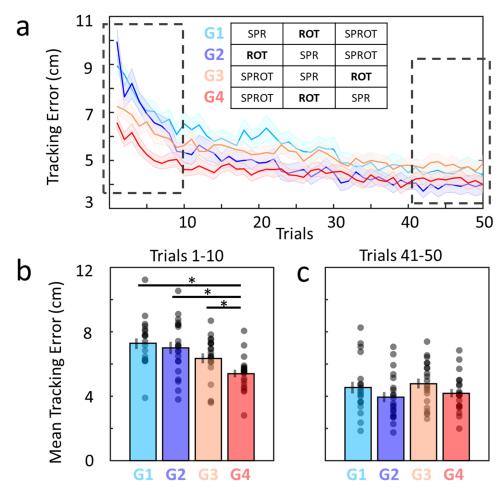
5cm

×

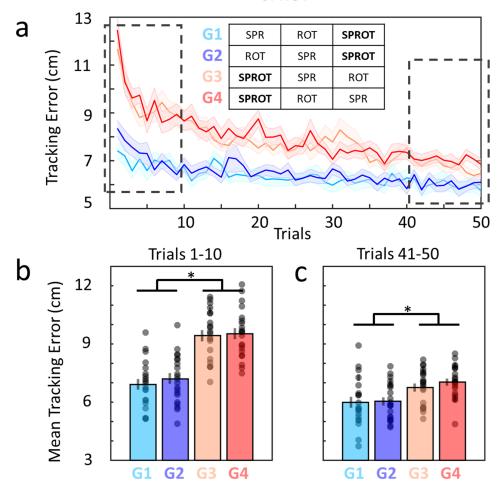




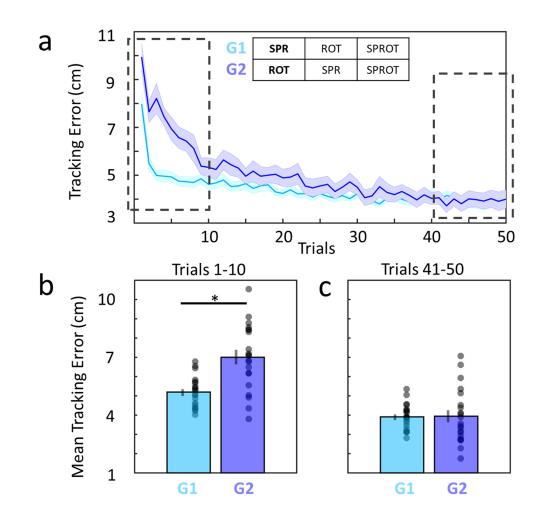
SPRING

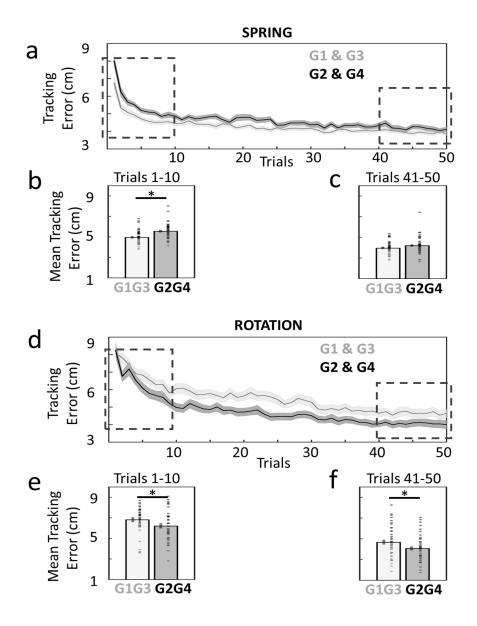


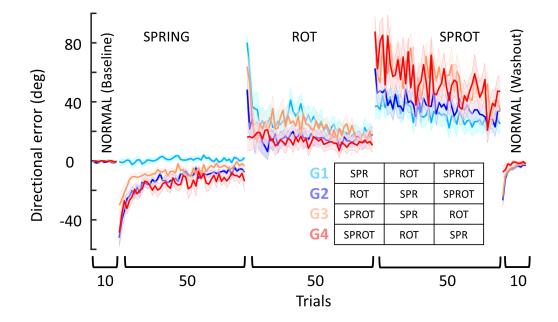
## ROTATION

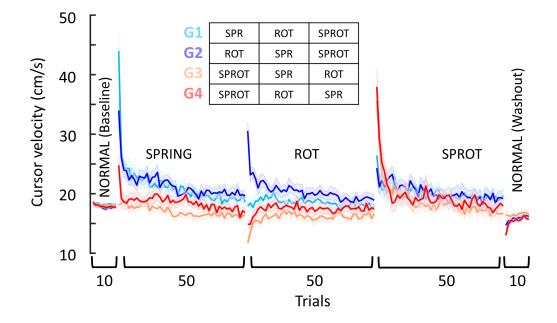


SPROT



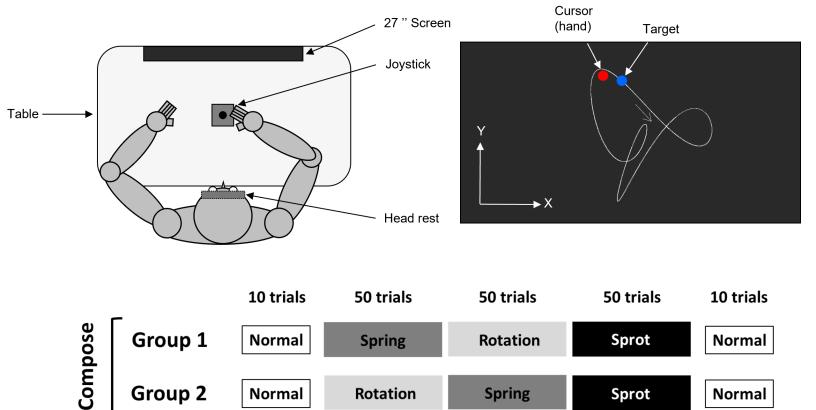






Trajectory	<i>A<sub>1x</sub></i> (cm)	<i>A</i> <sub>2x</sub> (cm)	h <sub>x</sub>	$\phi_{x}\left(^{\circ} ight)$	A <sub>1y</sub> (cm)	<i>A</i> <sub>2y</sub> (cm)	hy	$\phi_y$ (°)
1	5	5	2	45	5	5	3	-135
2	4	5	2	-60	3	5	3	-135
3	4	5.1	3	-60	4	5.2	2	-135
4	5	5	3	90	3.4	5	2	45
5	5.1	5.2	2	-90	4	5	3	22.5

Table 1. Target trajectory parameters.



- 1	_					
se						
od	Group 3	Normal	Sprot	Spring	Rotation	Normal
mo						
ect	Group 4	Normal	Sprot	Rotation	Spring	Normal
$\frown$						