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1 Title: Task errors drive memories that improve sensorimotor adaptation.

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- 11 Abstract
- 12 Traditional views of sensorimotor adaptation, or adaptation of movements to
- 13 perturbed sensory feedback, emphasize the role of automatic, implicit correction of
- 14 sensory prediction errors (differences between predicted and actual sensory
- 15 outcomes). However, latent memories formed from sensorimotor adaptation,
- 16 prominently evidenced in improved learning (i.e., savings), have recently been
- 17 attributed to strategic corrections of task errors (failures to achieve task goals). To
- 18 dissociate contributions of task errors and sensory prediction errors to latent
- 19 sensorimotor memories, we perturbed target locations to remove or enforce task
- 20 errors during learning and/or test. We show that prior learning to correct task errors
- 21 was sufficient for savings: a history of sensory prediction errors was neither sufficient
- 22 nor obligatory for savings. Limiting movement preparation time further revealed two
- distinct components of this learning: 1) time-consuming, flexible strategies, and 2)
- 24 rapidly expressible, inflexible stimulus-response associations. The results show that
- 25 adaptive responses to sensorimotor perturbations take many forms.

26 Introduction

A large body of knowledge created in the last 25 years about motor learning 27 has been drawn from the paradigm of sensorimotor adaptation. Here, a systematic 28 perturbation is applied to the visual representation of movement (Cunningham, 1989; 29 von Helmholtz et al., 1924), or to limb dynamics (Dietz et al., 1994; Shadmehr et al., 30 31 1994), such that the sensory consequences of motor commands are changed. This necessitates adaptive motor responses in order to restore effective movement under 32 33 the new conditions. Given changes in the environment and the body, such adaptive processes are essential to sustain successful movement in the natural world. There 34 are, however, long standing questions over the extent to which principles of 35 sensorimotor adaptation apply to other forms of motor learning; especially to the 36

acquisition of novel motor skills. This issue is important because novel skill
acquisition is of considerable practical relevance: during rehabilitation (Krakauer et
al., 2017), sport (e.g., learning to serve a tennis ball), and industry (e.g., learning to
control a back-hoe).

A key piece of evidence pertinent to the question of how sensorimotor 41 42 adaptation relates to other forms of motor learning is the extent to which exposure to sensorimotor perturbations generates long-lasting memories. Sensorimotor memory 43 is often operationalised as improved adaptation when re-encountering a similar 44 45 perturbation, and the phenomenon, commonly termed savings, is well documented (Brashers-Krug et al., 1996; Cassady et al., 2018; Day et al., 2018; Flook et al., 46 1977; Kojima et al., 2004; Mawase et al., 2014; Roemmich et al., 2015; Seidler et al., 47 2017). Importantly, the sensorimotor memories implied by savings are latent, 48 because the benefit of previous exposure persists even after behaviour is returned to 49 50 the naïve state by removing the perturbation for many trials (Zarahn et al., 2008), even a year after the initial encounter (Landi et al., 2011; Maeda et al., 2018). A 51 52 latent form of memory for sensorimotor perturbations is both obligatory for success given the non-stationarity of our environment, and reminiscent of new motor skill 53 54 memories, which can be flexibly expressed according to context.

Although a long history of work has sought to identify the mechanisms that 55 underlie savings (e.g., Hadjiosif et al., 2013; Herzfeld et al., 2014; Huang et al., 56 2011; Huberdeau et al., 2015a; Mawase et al., 2014; Orban de Xivry et al., 2015; 57 Smith et al., 2006), the topic remains controversial. One influential proposal was the 58 idea that savings occurs because specific actions are associated with task success 59 during initial adaptation to the perturbation, and that these actions are recalled upon 60 task failure when a related perturbation is subsequently encountered (Huang et al., 61 2011). An alternative idea is that exposure to a new sensorimotor environment 62 induces a form of "meta-learning", in which the structure of the perturbation is 63 encoded in memory to assist subsequent adaptation (Braun et al., 2009). More 64 recently, savings was attributed to changes in the sensitivity to errors (Gonzalez 65 Castro et al., 2014; Herzfeld et al., 2014). According to this idea, experiencing a 66 systematic sequence of errors generates a memory of errors, which increases 67 sensitivity to those errors and the gain of error correction when reencountering 68 similar errors (Gonzalez Castro et al., 2014; Herzfeld et al., 2014). 69

70 Despite the importance of the phenomenon of savings for the broad field of

motor learning, interest in the processes that underlie the effect has declined since 71 the emergence of compelling evidence that savings in standard visuomotor rotation 72 tasks is dominated by volitional, strategic selection of actions that restore task 73 success (Avraham et al., 2019; de Brouwer et al., 2017; Haith et al., 2015; Morehead 74 et al., 2015). For example, if leftward displacement of visual feedback causes a 75 76 person to miss the target to the left, they tend to deliberately aim to the right of the target to counteract the error (Uhlarik, 1973). Using cues to signal perturbation onset 77 78 prompted rapid re-selection of the adapted movement on the first trial, even before 79 participants re-experienced the previously encountered error (Morehead et al., 2015). Similarly, suppressing strategy use by limiting movement preparation time 80 prevented the expression of savings (Haith et al., 2015). If savings were solely a 81 manifestation of deliberate strategy use, then "cognitive" functions which determine 82 how successfully one might acquire and implement strategies would be central to 83 84 acquisition of latent sensorimotor memories: non-strategic "motor" processes would thus be of less importance. 85 86 But is the conscious awareness of a strategy, to apply a corrective movement

that already exists within the participant's motor repertoire, really all that is retained 87 88 when a person adapts movement to a perturbation? Or are there components of savings that are less amenable to conscious control? Savings is evident in 89 90 alternative sensorimotor adaptation contexts where the required corrective movement is less obvious, such as force field and split-belt treadmill paradigms 91 92 (Cassady et al., 2018; Day et al., 2018; Mawase et al., 2014; Roemmich & Bastian, 2015) or in saccadic adaptation (Kojima et al., 2004). This suggests the existence of 93 a component to long-term retention of latent sensorimotor memories that is less 94 accessible to conscious awareness. If there are indeed multiple components to long-95 term sensorimotor memories, then what are the necessary conditions for their 96 encoding and expression? A systematic approach to address this question requires 97 98 experiments to dissociate the contributions of the different types of errors that drive sensorimotor adaptation, both during the initial exposure to the perturbation and 99 100 when the putative latent learning is subsequently expressed. Sensorimotor perturbations, by definition, evoke sensory prediction errors (i.e., discrepancies 101 between predicted sensory outcomes of movements and actual sensory outcomes of 102 movements), but can also lead to task errors (i.e., a failure to successfully 103 104 accomplish a task, such as missing a target). These errors have dissociable neural

105 correlates (Diedrichsen et al., 2005; Palidis et al., 2018; Reuter et al., 2018; Torrecillos et al., 2014) and dissociable behavioural consequences (Izawa et al., 106 2011; Nikooyan et al., 2015; Therrien et al., 2016). Which of these errors are 107 required for the encoding and expression of long-term sensorimotor memories? 108 Here, we show that correcting for task errors during an initial exposure to 109 visuomotor rotation is necessary for latent retention of visuomotor memory, and that 110 it is not necessary to reexperience task errors in order to subsequently express this 111 learning. Further, we show that a history of correcting for task errors, provoked by 112 113 perturbing target location rather than sensory feedback of movement, can evoke faster adpatation to a subsequent sensorimotor perturbation, even when participants 114 have no prior experience of this sensorimotor perturbation. This learning appeared at 115 first glance to show hallmarks of a volitionally controlled strategy: it was flexible 116 enough to accommodate a different reach solution at training and at test. However, 117 118 flexibility disappeared when we limited movement preparation time: performance was worse than naïve as participants continued to re-engage the now-maladaptive 119 120 reach solution that they had learned previously to associate with restoration of success in the task. Thus, improved adaptation to sensorimotor perturbation requires 121 122 a history of compensating for task errors, and the latent sensorimotor memories that underlie improved adaptation to subsequent perturbations can take at least two 123 124 distinct forms, 1) volitionally controlled, flexible strategies and 2) inflexible stimulusresponse associations that are less amenable to volitional control. 125

126 Methods and Materials

127 Participants

There were a total of 132 participants (75 female, age range 17-34 years, mean age 20.6). All participants were naïve to visuomotor rotation and force-field adaptation tasks, and were naïve to the aims of the study. Participants received course credit or monetary reimbursement upon study completion. The study was approved by the Human Research Ethics Committee at The University of Queensland. All participants provided written informed consent. This study conforms with the Declaration of Helsinki.

135 Apparatus

Participants completed the task using a vBOT planar robotic manipulandum,
 which has a low-mass, two-link carbon fibre arm and measures position with optical

encoders sampled at 1,000 Hz (Howard et al., 2009). Participants were seated on a 138 height-adjustable chair at their ideal height for viewing the screen for the duration of 139 the experiment. Visual feedback was presented on a horizontal plane on a 27" LCD 140 computer monitor (ASUS, VG278H, set at 60Hz refresh rate) mounted above the 141 vBOT and projected to the participant via a mirror in a darkened room, preventing 142 direct vision of her/his hand. The mirror allowed the visual feedback of the targets, 143 the start circle, and hand cursor to be presented in the plane of movement, with a 144 black background. The start was aligned approximately 10cm to the right of the 145 146 participant's mid-sagittal plane at approximately mid-sternum level. An air-sled was used to support the weight of participants' right forearms, to reduce possible effects 147 of fatigue. 148

149 General Trial Structure

150 While grasping the robot arm, participants moved their hand-cursor (0.5cm 151 radius red circle) from the central start circle (0.5cm radius white circle) to the targets 152 (0.5cm radius yellow circles). Targets appeared in random order at one of eight locations (0°, 45°.... 315°) at a radius of 9 cm from a central start circle. At the start 153 of each trial, the central start circle was displayed. If participants failed to move their 154 hand-cursor to within 1cm of the start circle after 1 second, the robotic 155 manipulandum moved the participant's hand to the start circle (using a simulated 2 156 dimensional spring with the spring constant magnitude increasing linearly over time). 157 158 A trial was initiated when the cursor remained within the home location at a speed below 0.1cm/s for 200ms. Across all experiments, we used a classical timed-159 response paradigm (e.g., e.g., Schouten et al., 1967) to manipulate movement 160 preparation time during the planar reaching task (Favilla et al., 1996). A sequence of 161 162 three tones, spaced 500ms apart, was presented at a clearly audible volume via external speakers. Participants were instructed to time the onset of their movements 163 164 with the onset of the third tone, which was more highly-pitched than the two previous, and slice through the target with their cursor. Movement initiation time was 165 identified online as when hand speed exceeded 2cm/s. Targets appeared at 1000ms 166 minus a monitor display latency $(27.6 \pm 1.8 \text{ms})$, before the third tone. Thus, target 167 direction information became available 972ms before the desired initiation time. 168 When movements were initiated 50ms later than the third tone, the trial was aborted: 169 the screen went black and the text "Too Late" was displayed on the feedback screen. 170

When movements were initiated more than 100ms before the desired initiation time, 171 the trial was aborted: the screen went black and a "Too Soon" error message was 172 displayed. Thus, movements had to be initiated between 872 and 1022ms of target 173 presentation. We chose this movement preparation time for consistency with our 174 previous work using the timed-response paradigm with visuomotor rotations (Leow et 175 176 al., 2017). No visual feedback about movements was available when trials were aborted, and so such trials were repeated at the end of the cycle. We enforced long 177 movement preparation times across most conditions to prevent the possibility that 178 179 the task error manipulation resulted in self-selection of different movement preparation times. Under these conditions, participants had ample opportunity (i.e. 180 time for movement preparation) to use explicit strategies. 181

Across all conditions, cursor feedback was displayed after the hand had 182 moved 4cm from the start to target (located 9cm away from the start). At this point, 183 184 the direction of cursor velocity was measured to define target movements in some conditions as described below. During StandardTaskError conditions, the target 185 186 remained stationary throughout the trial, such that whether or not participants hit the target was contingent on the participant's reach direction. During NoTaskError 187 188 conditions, the target was shifted to align with the direction of cursor velocity, measured at 4cm into the movement. This is analogous to moving a basketball hoop 189 190 towards the ball mid-flight; the ball always goes through the hoop regardless of the person's actions. During EnforcedTaskError conditions, the target was shifted 191 192 randomly by 20°–30° (counterclockwise in half of the trials, clockwise in half of the 193 trials) relative to the cursor direction when the hand 194 had moved 4 cm from the start. This is analogous to moving a basketball hoop away

from the ball's trajectory; participants can never get the ball through the hoop regardless of where they shoot. In Experiments 3 and 4, we imposed systematic task errors without any perturbation of the hand-cursor relationship: the target was moved during the movement by 30° relative to the original target position, always in the same direction (clockwise for half of all participants, counterclockwise of half of all participants, counterbalanced): no rotation of the visual feedback of movement was imposed when this occurred.

To familiarize participants with the equipment and the timed-response paradigm, all participants were first allowed a familiarization block comprising a maximum of 6 cycles. One cycle consisted of 1 trial to each of the 8 targets, and

target order was random within each cycle. Participants were explicitly instructed to 205 make shooting movements so that the cursor passed through the targets, rather than 206 to stop on the targets. Cursor feedback terminated as soon as the desired movement 207 extent (the 9cm distance between the start and the target) was achieved. After 208 familiarisation, all participants (regardless of assigned condition) were given the 209 same task instruction, as follows. "Your task in this experiment is to hit the targets. 210 The computer might disturb the cursor and/or the target, this is a normal part of the 211 experiment, just try to hit the target as well as you can". Participants then completed 212 213 the following blocks. **Baseline** (6 cycles): no rotation of visual feedback. **Training** (60 cycles): For experiments 1 & 2, a 30° rotation of cursor feedback representing 214 the hand position was imposed. Half of all participants encountered a clockwise 30° 215 rotation and half encountered a 30° counterclockwise rotation. For experiments 3-4, 216 no cursor rotation was applied during this training phase, but a 30° rotation of target 217 position relative to the original target position was applied mid-movement. Half of all 218 participants encountered a clockwise 30° rotation and half encountered a 30° 219 220 counterclockwise rotation. No feedback (6 cycles): Upon leaving the start circle, no feedback about movements was available. Before this block, participants received 221 222 explicit instructions about the rotation removal, as follows: "Any disturbance that the computer has applied is now gone, and the feedback of your movement will now be 223 224 hidden as soon as it leaves the start circle, so please move straight to the target". **Washout:** Cursor position feedback was restored, but the 30° rotation of cursor was 225 removed. For Experiments 1 and 2, to prevent the experience of washout-related 226 task errors, task errors were removed across all conditions (i.e., the target position 227 228 shifted mid-movement to ensure that the cursor always hit the target). The length of the washout block was the same as the adaptation block (60 cycles). For 229 230 Experiments 3 and 4, participants had no prior experience of the cursor rotation, only task errors, and they could volitionally reach straight to the target by the end of the 231 232 no-feedback block, thus it was unnecessary to employ a long washout with the notask-error manipulation to avoid exposure to errors related to abrupt removal of the 233 234 perturbation: we thus provided 12 washout cycles without mid-movement target shifts. Test (60 cycles): the 30° rotation of cursor feedback was imposed (half of all 235 participants encountered a clockwise 30° rotation and half encountered a 30° 236 counterclockwise rotation). Between each block, there was a small delay to allow for 237 experimental instructions and loading of the computer code for different experimental 238

8

blocks.

240 Data analysis

Movement onset time was taken as the time at which hand speed first 241 exceeded 2 cm/s. Reach directions were quantified at 20 percent of the radial 242 distance between the start and the target. Reaches with absolute initial direction 243 errors greater than 60° with respect to the target (movements that were more than 244 60° to the left or the right of the target) were considered outliers, and were removed 245 from analyses. Experiment1: StandardTaskErrors: 0.62%, NoTaskErrors 0.11%, 246 EnforcedTaskErrors: 1.73%; Experiment2: TrainStandardTaskErrors: 0.29%, 247 TrainEnforcedTaskErrors: 0.62%; TrainNoTaskErrors: 0.17%; Experiment 3: Same: 248 0.30%, Different: 0.20%. Experiment 4:ShortDifferent: 3.82%; ShortSame: 4.31%, 249 ShortNaive:4.59%). Excluding these trials did not have any qualitative impact on the 250 251 results. Trials were averaged in cycles of eight (one trial for each target angle) for 252 conversion to percent adaptation (see below). For graphing purposes, reach directions for participants who experienced counterclockwise rotations (30°) were 253 sign-transformed and pooled with data for participants who experienced 254 counterclockwise (30°) rotations: values closer to 30° indicate more complete 255 adaptation. 256

For all blocks except the test block, we estimated adaptation performance as percent adaptation, which quantifies reach directions relative to the ideal reach direction (as shown in Hadjiosif & Smith, 2013).

260

 $naive\ percent\ adaptation = 100\% imes rac{reach\ direction-baseline\ bias}{ideal\ reach\ direction-baseline\ bias}$.

261

For the test block, we were interested in savings, which is improved learning 262 at test compared to naïve. Even with exposure to the same number of no-rotation 263 trials at washout as at training (480 trials), washout was often incomplete. 264 Incomplete washout can inadvertently magnify estimates of savings. Estimates of 265 savings thus needs to take into account the extent of washout. We estimated percent 266 adaptation for the test block as follows, where reach biases in the washout phase 267 were estimated as the mean of the final 3 cycles of the washout block, similar to 268 Haith et al. (2015). 269

270 $test percent adaptation = 100\% \times \frac{reach direction - washout bias}{ideal reach direction - washout bias}$

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To evaluate savings (improved adaptation compared to naïve), we selected 272 first 5 cycles (i.e., the first 40 trials) of the naïve and test block for comparisons using 273 Welch's t-tests (Delacre et al., 2017)(or Mann-Whitney U-tests if assumptions of 274 normality were violated), as savings tends to be most evident at initial exposure/re-275 276 exposure to the rotation in visuomotor rotation paradigms. We note however that this window may miss important effects outside the first 5 cycles, particularly since 277 adaptation is slower when task errors are removed or enforced (Kim et al., 2019; 278 279 Leow et al., 2018). To avoid missing effects outside the first 5 cycles of the block, we additionally estimated performance in the entire adaptation block by splitting each 280 60-cycle adaptation block into an early phase (estimated as mean percent 281 adaptation from the first 30 cycles) and a late phase (estimated as mean percent 282 adaptation from the last 30 cycles). To compare naïve to test adaptation 283 284 performance, we used Training (naïve, test) x Phase (early, late) ANOVAs on early and late phase percent adaptation, with greenhouse-geisser corrections applied 285 286 where appropriate. For Experiment 1, test block adaptation was compared to naïve block adaptation within the same group of participants. For Experiment 2, test block 287 288 adaptation with a certain task error manipulation was compared to naïve adaptation from a different group with equivalent task error manipulations. Specifically, the 289 290 TrainStandardTE group and the TrainEnforcedTE group experienced no task errors at test, and thus were compared to the naïve no task error block from the 291 292 TrainNoTaskErrors group. The TrainNoTaskErrors group experienced standard task 293 errors at test and thus were compared to the naïve standard task error block in the 294 TrainStandardTaskErrors group. Similarly, for Experiment 3, test block adaptation with standard task errors was compared with the naïve standard task error block in 295 296 the TrainStandardTaskError group from Experiment 2. For Experiment 4, test block adaptation with short preparation time and standard task errors were compared with 297 298 data from a separate control group who experienced the same short preparation time and standard task error conditions, but who were naïve to any training to reduce task 299 300 errors or sensory prediction errors.

A common alternative measure of savings is to assess for increases in rate constants, obtained by fitting the data to exponential functions. Rate constant analyses were not used here for the following reasons. For datasets where savings is evident as immediate adaptation in the first cycle upon perturbation exposure

305 (Huberdeau et al., 2015a; Landi et al., 2011), rate constants are typically small because the rapid initial adaptation is not captured by the fit. This can give the 306 erroneous impression that savings is absent, and this situation was apparent in 307 some of our data. When we tried to avoid this problem by fixing the fit parameter that 308 reflects the v value when x = 0 as the mean reach direction in the immediately 309 previous no-rotation cycle, the fits poorly characterized the data. These results agree 310 with previous work demonstrating that exponential functions poorly represent 311 individual learning curves, which often show abrupt step-like increases in 312 313 performance (Gallistel et al., 2004). Statistical analyses were performed with SPSS and JASP. Graphs were 314

- plotted with GraphPad Prism version 7.00 for Windows, GraphPad Software, La Jolla
- 316 California USA, <u>www.graphpad.com</u>.

317 Results

318 Experiment 1: Task errors are important for savings

In Experiment 1, we asked whether savings would be present if adaptation 319 was learnt in the absence of task errors, or with task errors that were enforced 320 regardless of the participants' actions. During training, all participants were exposed 321 to a 30° rotation of cursor feedback. In the StandardTaskError condition, since the 322 323 target was not moved within a trial, task errors were allowed to vary contingent upon participants' responses to the cursor perturbation (Figure 1B). Task errors were 324 325 enforced in the EnforcedTaskError condition by moving the target mid-movement so that the cursor always missed the target by 20-30° (Figure 1E). Task errors were 326 removed in the NoTaskError condition by moving the target to align with the cursor 327 trajectory mid-movement (Figure 1H). After initial exposure to the visuomotor 328 rotation, behaviour was returned to the unadapted state by removing the cursor 329 rotation in a washout phase. During this washout, we also employed the 330 331 NoTaskError manipulation across all groups to prevent experience of task errors upon abrupt removal of the cursor rotation. At the test block (i.e., the second 332 exposure to the visuomotor rotation) we applied the same task error manipulations 333 that each group experienced when they were initially exposed to the perturbation. 334 Reach directions across all cycles for groups are shown in Figure 1A. Both 335 removing task errors and enforcing task errors slowed adaptation compared to 336

337 experiencing standard task errors that were contingent upon the corrective

responses of the participant. One participant from the no task error group did not
move towards the presented target in the cycles 41 to 47, which resulted in the
variability that is apparent in the group average plot. The analysis outcomes were
similar with and without this dataset.

With standard task errors, percent adaptation at test tended to improve 342 compared to naive immediately after rotation onset (Figure 1C), similar to Huberdeau 343 et al. (2015a). This improvement was primarily evident in the first 8 trials of exposure 344 to the cursor rotation (i.e., the first cycle), as adaptation in the first cycle improved at 345 346 test compared to naive (naïve: 8.5+/-6.6%, test: 32.0+/-8.6%, cohen's d=0.74). Improvements compared to naïve were marginal when estimated over the first 5 347 cycles (naïve: 37.5+/- 3.9%; test: 53.4+/-8.6%, p= 0.0554, cohen's d= 0.618). Block x 348 Phase (early adaptation, late adaptation) ANOVA comparing the naïve and the test 349 block showed a non-significant main effect of block and no significant interactions 350 with block. 351

- 352 With enforced task errors (Figure 1H), percent adaptation in the first 5 cycles
- did not differ reliably at test (15.9+/-2.7%) compared to naïve (18.5+/-3.0%),

t(11)=0.663, p=.521, cohen's d=0.192. Block x Phase (early adaptation, late

adaptation) ANOVA comparing the naïve and the test block showed a non-significant main effect of block, F(1,11)=2.855, p=0.119, partial η -squared=0.2, and no reliable interactions with block.

With no task errors (Figure 1I), percent adaptation in the first 5 cycles did not differ reliably from naïve (17.7+/-3.1%) to test (13.1+/-2.8%), t(11)=1.08, p=.303, cohen's d =0.3. Block x Phase ANOVA on the entire adaptation block showed worse adaptation at test (mean of the entire test block: 46.3+/-5.1%) compared to naïve (mean of the entire naïve block, 53.0+/-3.6%, figure 1I), significant main effect of block, F(1,11)=5.95, p=0.033, partial η-squared=0.35.

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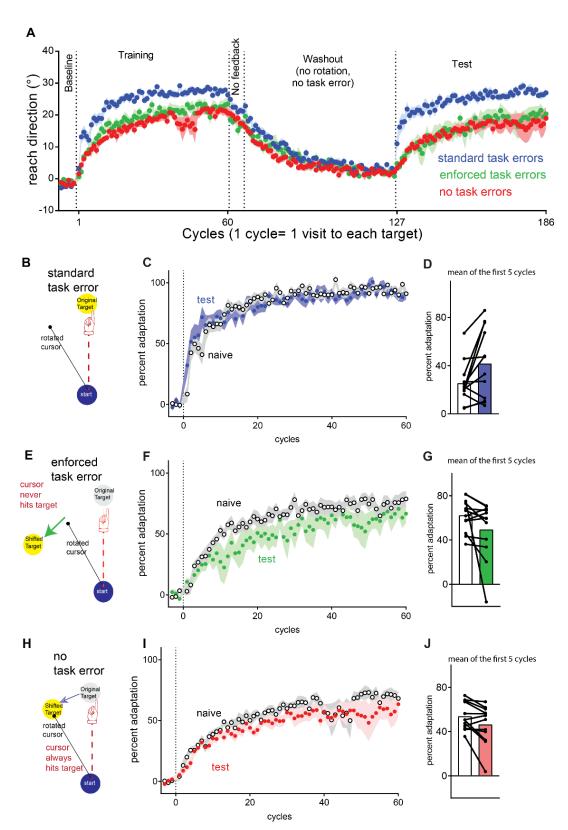




Figure 1. Experiment 1: Despite re-exposure to the same rotation, savings was absent with no 366 task errors or enforced task errors. At both training and test (i.e., during exposure to a 30° cursor 367 rotation, participants were exposed to either standard task errors (B), enforced task errors (E), or no 368 369 task errors (H). Cycle averaged reach directions across all blocks (A). Cycle averaged percent 370 adaptation compared to naïve white circles) (C, F, I), and mean percent adaptation averaged across 371 cycles (D, F G). Improved adaptation (greater percent adaptation) compared to naïve was evident 372 with standard task errors (C & D), but not with enforced task errors (F&G), and not with no task errors 373 (I & J). For D, F, G, error bars=95% CI. All other error bars are SEM.

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Thus, despite exposure to the same cursor perturbation, and therefore previous experience of the similar sensory prediction errors, savings was not evident in the groups that did not experience correctable task errors as a result of the cursor perturbation.

378 Experiment 2: Task errors are required at encoding but not at retrieval.

The absence of savings when perturbation-induced task errors were removed 379 suggests some role of perturbation-induced task errors in savings. A few 380 381 interpretations are possible. First, task errors might act as a retrieval cue to trigger the memory that is responsible for savings (Huberdeau et al., 2015a). Second, task 382 383 errors might be necessary to encode a memory that is responsible for savings. Third, task errors might be necessary both at encoding and at retrieval for savings: savings 384 385 can only occur when previously experienced task errors are revisited. We dissociated these possibilities in Experiment 2. Task errors were manipulated either 386 387 at training or at test to identify whether savings requires prior experience of task errors during first exposure to a perturbation (when a memory is first "encoded") or 388 389 when the perturbation is re-encountered (when a memory is "retrieved"). A TrainStandardTaskError group (n=12, 6CW, 6CCW) was deprived of task errors at 390 test (target was shifted mid-movement so that the cursor always hit the target), but 391 392 were provided standard task errors at training (i.e. no target shifts): absence of savings here would suggest that task errors are necessary as a retrieval cue for 393 savings. A TrainNoTaskError group (n=12, 6CW, 6CCW) was deprived of task errors 394 at training, but experienced standard task errors at test (target did not move mid-395 movement): absence of savings here would suggest that the task errors are not 396 397 required as a retrieval cue, but are a necessary component to encoding a memory that results in savings. Does savings result from the experience of task errors alone, 398 399 or does savings require learning to correct for task errors? To test this, a TrainEnforcedTaskError group (n=12,6CW, 6CCW) were provided with enforced task 400 errors at training (target always moves away from the cursor mid-trial, such that they 401 402 could never succeed in reducing task errors), and were tested for savings in the absence of task errors. After training, all groups encountered 6 no-feedback cycles 403 404 and 60 no-rotation washout cycles with no task error, and then re-encountered the 405 same cursor rotation as they experienced at training. To evaluate savings, test 406 performance was compared to the naive adaptation of another group who

407 experienced the same task error conditions. Specifically, the no task error test phase
408 from the TrainStandardTaskError and the TrainEnforcedTaskError groups was
409 compared to the no task error training phase of the TrainNoTaskError group. The
410 standard task error test phase from the TrainNoTaskError group was compared to
411 the standard task error training phase of the TrainStandardTaskError group.

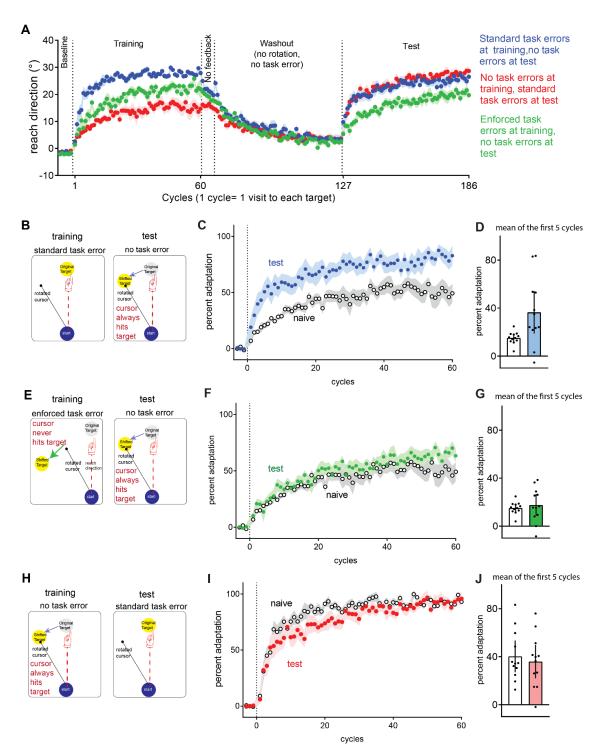
Figure 2C shows that in the TrainStandardTaskError group, standard task 412 errors at training resulted in better-than-naïve adaptation at test, even in the absence 413 of task errors at test, as evidenced in better adaptation at the first 5 cycles at test 414 (36.5+/-8.0%) compared to naive (15.2+/-1.5%), t(11.7) = 2.61, p= 0.016, cohen's 415 d=1.065. Similarly, Group (TrainStandardTaskError, Naïve) x Phase (Early 416 Adaptation, Late Adaptation) ANOVA showed a significant main effect of Group: 417 F(1,22)=10.211, p= .004, partial eta-squared =.317. Thus, a history of task errors 418 419 improved re-adaptation to a cursor rotation even when the perturbation did not cause 420 any task errors upon second exposure.

In the TrainEnforcedTaskError group (Figure 2F), adaptation in the first 5 421 422 cycles did not differ reliably at test (17.6+/-4.1%) compared to naïve (15.2+/-1.4%), t(13.7) = 0.561, p = 0.584, cohen's d = 0.229. Group (TrainEnforcedTaskError, 423 Naïve) x Phase ANOVA showed no reliable main effect of Group, F(1,22) = 1.20, 424 425 p=.285, partial eta-squared=.052, and a non-significant Phase x Group interaction, F(1,22) = 0.69, p = 0.413, partial n-squared = 0.03. Enforcing task errors at training 426 thus did not appear to improve adaptation compared to naïve when tested without 427 task errors. Thus, merely experiencing task errors, without learning to correct for 428 those task errors, was not sufficient to evoke subsequent savings. 429

430 In the TrainNoTaskError group (Figure 2I), adaptation in the first 5 cycles did not differ reliably at test (35.9+/-6.3%) compared to naïve (40.3+/-6%), t(21.9) =431 432 0.499, p = 0.623, cohen's d = 0.204. This lack of improvement compared to naïve was shown throughout the entire adaptation block (Figure 2I), as Group 433 434 (TrainNoTaskError, Naïve) x Phase (Early, Late Adaptation) ANOVA showed a nonreliable main effect of group, F(1,22) = 1.38, p = 0.25, partial η -squared = 0.05, and 435 436 a non-reliable Phase x Group interaction, F(1,22) = 3.47, p = 0.08, partial n-squared = 0.13. Thus, depriving participants of task errors when they were first exposed to 437 438 the cursor rotation at training resulted in no savings despite the subsequent 439 presence of standard task errors at test.

- 440 Thus, a history of adapting movements to correct task errors appears
- 441 necessary to encode learning that improves adaptation to a previously experienced
- 442 visuomotor rotation. The presence of task errors appears unnecessary to retrieve
- this learning.

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445 Figure 2. Experiment 2 showed that savings requires a history of adaptation to task errors. 446 During initial exposure to the cursor rotation (training), participants experienced task errors (either 447 standard task errors (B) or enforced task errors (E), or experienced no task errors (H). At re-exposure 448 to the cursor rotation (test), participants who experienced task errors at training were now deprived of 449 task errors (B & E) whereas participants who were deprived of task errors at training were now 450 provided task errors. (A) Cycle averaged reach directions across all blocks. Note that task errors were 451 removed at washout in all groups to ensure that abrupt removal of the perturbation would not 452 inadvertently evoke task errors. Clear symbols and white bars indicate naïve adaptation. (B). Even 453 without task errors at test, a history of standard task errors at training improved subsequent 454 adaptation, (greater percent adaptation in C & D). In contrast, adaptation was not improved in the 455 group who experienced a history of enforced task errors that could not be corrected for (F&G). 456 Adaptation was also unimproved without a history of task errors at training, despite the presence of 457 task errors at test. (I & J). For D, F, G, error bars=95% CI. All other error bars are SEM.

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459 **Experiment 3: Previous learning to correct for task errors can evoke savings.**

Recent work suggests that savings in visuomotor rotation primarily reflects the 460 deliberate application of a strategy, where participants explicitly re-aim to the one 461 side of a target to counteract the rotation of cursor feedback (Haith et al., 2015; 462 463 Morehead et al., 2015). This view considers the role of implicit adaptation to sensory prediction errors as secondary to the role of strategy in savings, and would interpret 464 the presence/absence of savings with task errors in Experiments 1 and 2 to be 465 because task errors provoke the formation of explicit strategies. An alternative view 466 is that task errors alter the sensitivity to sensory prediction errors (Kim et al., 2019; 467 Leow et al., 2018), and increased sensitivity to these errors produce savings 468 (Herzfeld et al., 2014). We cannot dissociate between the two alternative 469 explanations based on data from Experiments 1 and 2 alone because task errors 470 471 here were not wholly independent of sensory prediction errors; the task error 472 manipulations were always made in the presence of a perturbation of the hand-473 cursor relationship (which therefore induced sensory prediction errors). Thus, we next examined how learning to correct for task errors alone, in the absence of 474 sensory prediction errors (i.e., in the absence of any perturbation of the hand-cursor 475 relationship), affected subsequent adaptation to a visuomotor rotation. 476

477 In Experiment 3, we did not perturb the cursor at training, but enforced systematic task errors that could be counteracted by a re-aiming strategy: the target 478 always moved away by 30° from the original target location mid-movement: 479 participants could correct these task errors by re-aiming 30° away from the original 480 target (see Figure 3a). For one group of participants, the reach solution needed to hit 481 482 a given target after it jumped mid-movement was the same reach solution needed to counteract the cursor rotation in the test block (Same, n=12, 6 CW, 6 CCW). For 483 example, if the target jump at training was 30° counterclockwise, then the cursor 484 rotation at test was 30° clockwise (thus requiring a counterclockwise compensatory 485 hand movement). To test whether this learning is flexible enough to accommodate a 486 487 different reach solution, we had another group of naïve participants (**Different**, n=12, 6 CCW, 6CW), where the reach direction required to hit targets at training was 488 489 opposite to that at test. Pilot testing revealed substantial individual differences in how 490 guickly participants developed a strategy to re-aim at training. Thus, if the 491 experimenter observed that participants had yet to show successful re-aiming by trial

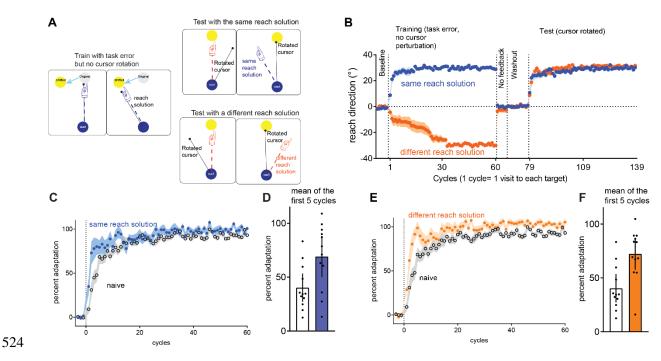
492 180 of the 480-trial training block, the experimenter explicitly instructed participants that a strategy may be needed to hit the target. This explicit instruction was required 493 494 in 2 of the 12 participants in the Same group, and 6 of the 12 participants in the Different group. Here, the instruction was given without exposure to the cursor 495 496 perturbation but after exposure to the *task* error. At the test block, no instructions about re-aiming were provided. To quantify savings, we compared percent 497 adaptation at test to naïve controls who experienced similar task error manipulations 498 (i.e., the naïve adaptation block from the group who experienced standard task 499 500 errors at training in Experiment 2).

501 Figure 3B shows reach directions in all cycles. After instructing participants 502 that the task error manipulation had been removed, reach directions reverted rapidly 503 back to baseline in the no-feedback block. This illustrates that the re-aiming 504 response can be switched off immediately upon instruction.

505 Despite being naïve to the cursor rotation, improved adaptation was evident when the reach solution at test was the same as training (Figure 3C), as better 506 507 adaptation at test was evident in the first 5 cycles at test (69.1+/-8.7%) compared to naïve (40.3+/-6%), t(19.5) = 2.722, p = 0.013, cohen's d = 1.111. This effect was 508 509 primarily limited to the first 5 cycles, as analyses on the entire adaptation block via 510 Group x Phase (Early, Late Adaptation) ANOVA showed a unreliable main effect of Group, F(1,22) = 2.82, p = 0.107, partial η -squared = 0.11, and an unreliable Phase 511 x Group interaction, F(1,22) = 1.1, p = 0.304, partial n-squared = 0.04. Similarly, 512 improved adaptation was evident when the reach solution at test was opposite to 513 that at training (Figure 3E), as evident in better adaptation in the first 5 cycles at test 514 (72.2+/-6.7%) compared to naïve (40.3+/-6%), t(21.7) = 3.558, p=0.002, cohen's 515 d=1.453. Group x Phase (Early, Late Adaptation) ANOVA showed a main effect of 516 Group, F(1,22) = 8.11, p = 0.00934, partial n-squared = 0.26. The Phase x Group 517 interaction was not reliable, F(1,22) = 1.75, p = 0.199, partial n-squared = 0.07. 518

519 Hence, previous learning to counteract task errors was sufficient to improve 520 subsequent adaptation to a visuomotor rotation, even when participants were naïve 521 to perturbation-induced sensory prediction errors. This learning was flexible: it 522 elicited savings even when the reach solution required to hit a given target at training 523 was different from the reach solution required to hit that target at test.

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525 Figure 3. Experiment 3 shows that previous learning to correct for task errors in the absence of sensory prediction errors can evoke savings in visuomotor rotation. To test whether previous 526 527 learning to counteract task errors could improve naive adaptation (i.e., when participants were naïve 528 to perturbations of sensory feedback), we did not impose a cursor rotation at training, but rather 529 moved the target away from its original position by 30° at mid-movement. To hit the target, 530 participants had to to re-aim by 30°. Participants rapidly reverted to baseline performance after 531 receiving instructions that all disturbances had been removed. At test, participants encountered a 30° 532 cursor rotation for the first time. One group (Same) had the cursor rotation in the opposite direction as 533 the target movement direction during training, such that the participants could use the same reach 534 solution at training and test. The other group (Different) had the cursor rotation in the same direction 535 as the target movement direction during training, such that participants had directionally opposite 536 reach solutions at training and test. (B). Cycle-averaged reach directions throughout the experiment, 537 where each symbol represents 1 cycle (1 visit to each target), and reaches closer to 30° during test represent reaches that more adapted. Cycle-averaged percent adaptation during test (filled circles) 538 539 compared to naïve (clear circles) for the same reach solution (C) and the different reach solution (E). 540 Mean percent adaptation averaged over the first 5 cycles with the same solution (D) and with a different solution (F) Savings was evident in more adapted reaches compared to naïve (clear 541 542 symbols) for both the Same group (C & D) and the Different group (E & F). For D & F, error bars=95% 543 CI. All other error bars are SEM.

544 **Experiment 4: Expressing a memory of task errors at short latencies.**

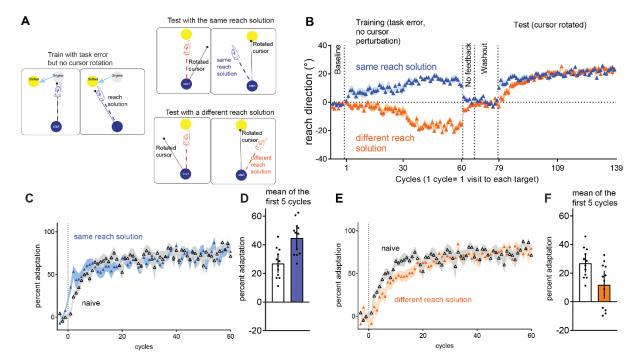
545 We next explored the mechanisms by which learning to compensate for task

- ⁵⁴⁶ errors can improve subsequent visuomotor rotation adaptation. Task error correction
- 547 likely relies on strategic processes that demand cognitive resources, because error
- 548 compensation is reduced by manipulations that limit cognitive resources, such as
- 549 time-constraints or a dual task (Anguera et al., 2012; Fernandez-Ruiz et al., 2011;
- 550 Galea et al., 2010; Haith et al., 2015; Leow et al., 2017; Malone et al.; Taylor et al.,
- 551 2007, 2008). In visuomotor rotation paradigms, these observations are consistent
- with the notion that mental rotation of a movement plan at a specified angle away
- 553 from a target is computationally expensive, and requires time (Bhat et al., 1998;

Georgopoulos et al., 1987; Pellizzer et al., 1993). Could savings occur even when 554 these time-consuming cognitive processes were suppressed by limiting preparation 555 time? To explore this, we replicated the design of Experiment 3, except that 556 participants were required to move within a short preparation time of 250ms after the 557 time of target presentation throughout all trials. We used the timed-response 558 paradigm we described previously in the methods for all the previous experiments, 559 but instead of presenting the target at 1000ms before the imperative to move, we 560 now present the target 250ms before the imperative to move (Leow et al., 2017). 561 562 There were two conditions: **ShortSame** (n=12, 6 CW, 6 CCW), where the reach solution is the same at training and at test, and ShortDifferent, (n=12, 6 CW, 6 563 CCW), where the reach solution is opposite at training and at test. Cycle-averaged 564 reach directions are shown in Figure 4. At training, despite the preparation time 565 constraints, participants did learn to compensate for task errors (Figure 4B), as 566 percent adaptation was larger at the late phase of the training block than the early 567 phase, as shown by a significant main effect of Phase, F(1, 23) = 57.1, p=1.1e-7, 568 partial eta-squared=0.7. However, the extent of compensation (estimated as the last 569 10 cycles) was less complete with short preparation time in Experiment 4 570 571 (ShortSame: 51.5+/-3.5%, ShortDifferent: 54.4+/-4.9%) than with long preparation time in Experiment 3 (Same 98.9+/-1.8%, Different: 97.4+/-2.5%), as 572 573 ReachSolutionDirection (Same, Different) x Preparation Time (Short, Long) showed a significant main effect of preparation time F(1, 44) = 179.3, p = 4.0e-17, partial eta-574 575 squared = 0.8.

We compared adaptation performance in the test block to a naïve control 576 577 group tested under similar preparation time and task error conditions (ShortNaive, n=12, 6 CW, 6 CCW). In the ShortSame group who trained with the same reach 578 579 solution at test and training, adaptation at test was better than naïve (Figure 4C), as mean of the first 5 cycles of the test block, 44.7+/-3.4% was better than naïve, 580 26.9+/-2.9%, t(21.6)= 3.964, p=6.581e -4, cohen's d=1.618). Improved adaptation 581 compared to naive was primarily concentrated in the first 5 cycles, as examining the 582 entire adaptation block with a Group x Phase (Early, Late adaptation) ANOVA 583 yielded an non-significant effect of Group F(1,22) = 0.01, p = 0.898, partial n-squared 584 = 0, and a non-significant Phase x Group interaction, F(1,22) = 0.17, p = 0.679, 585 partial η -squared = 0. 586

When the reach solution at test differed from that at training in the 587 ShortDifferent group, test performance was worse than naïve (Figure 4E). Percent 588 adaptation in the first 5 cycles at test (11.8+/-4.4%) was worse than naïve (26.9+/-589 2.9%), t(19.2)= 2.839, p= 0.010, cohen's d = 1.159. This was despite the fact that 590 participants had already disengaged the previously learnt reach solution in the 591 preceding no-rotation blocks with instruction (Figure 4B). Group x Phase (Early, Late 592 593 adaptation) on the entire adaptation block showed a Phase x Group interaction. F(1,22) = 9.59, p = 0.00524, partial η -squared = 0.3, as worse adaptation tended to 594 595 occur in the early phase (i.e., the first 30 cycles) but not in the late phase (the final 30 cycles) (see Figure 4E). 596



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599 Figure 4. Experiment 4 replicates the design of Experiment 3, except that participants completed all 600 trials under short preparation time of 250ms (A). Cycle-averaged reach directions, where each circle represents 1 cycle, or 1 visit to each target (B). Cycle-averaged percent adaptation during test (filled 601 602 triangles) compared to naïve (clear triangles) for the same reach solution (C) and the different reach 603 solution (E). Mean percent adaptation averaged over the first 5 cycles with the same solution (D) and 604 with a different solution (F). Savings was evident in more adapted reaches compared to naïve (clear 605 symbols) for the ShortSame group (C & D). For the ShortDifferent group, adaptation was worse than 606 naive (E & F). For D & F, error bars=95% CI. All other error bars are SEM. 607

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609 **Discussion**

In this work, we demonstrate a fundamental role for task errors in savings for 610 visuomotor rotation adaptation; a phenomenon that is a hallmark of latent 611 sensorimotor memory. We show that savings was absent without prior experience of 612 task errors (Experiments 1 & 2), and that prior correction of task errors, even without 613 prior exposure to sensory prediction errors, is sufficient to elicit savings (Experiments 614 3 & 4). Thus, systematic task errors that prompt adaptive motor responses can affect 615 subsequent adaptation to never-before encountered sensorimotor perturbations. The 616 results reinforce the notion that adaptive responses to sensorimotor perturbations 617 take multiple forms, and suggest that task errors play a primary role in driving 618 619 improved performance upon exposure to novel sensorimotor conditions. In particular, we suggest that latent sensorimotor memories, which improve subsequent 620 621 adaptation, rely on (at least) two distinct components, both of which are driven by the 622 failure to attain movement goals. The first is a strategic component that is flexible enough to facilitate corrective responses in the opposite direction, but that requires 623 substantial preparation time. The second component is a set of inflexible stimulus-624 response associations between targets and reach directions, that can be expressed 625 under time-pressure. 626

A history of adaptation to task errors are necessary for savings

An influential model of sensorimotor adaptation suggests that a history of 628 errors increases sensitivity to those errors, resulting in improved learning when 629 familiar errors are re-encountered (Herzfeld et al., 2014). Sensorimotor perturbations 630 typically evoke both sensory prediction errors and task errors, but it was previously 631 632 unclear how these errors contribute to latent sensorimotor memories that improve learning (Leow et al., 2016; Orban de Xivry & Lefevre, 2015). Here we show that, at 633 634 least in visuomotor rotation paradigms, a history of adaptation to task errors is crucial to encode latent memories that improve subsequent adaptation. Task errors that 635 could not be corrected (i.e., enforced task errors that occurred regardless of the 636 participants' behaviour) did not improve learning. Furthermore, Experiment 2 showed 637 638 that task errors need not be present upon re-exposure to the perturbation, contradicting the proposal that task errors act as a retrieval cue to trigger savings 639 640 (Huberdeau et al., 2015a).

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641 Savings do not require a history of sensory prediction errors

The results of Experiments 1 and 2 are consistent with the idea that savings 642 643 results from a memory that requires task errors for its encoding. What is the nature of this learning? One possibility is that task errors drive deliberate corrective 644 responses during adaptation (McDougle et al., 2016), and that faster subsequent 645 recognition and/ or selection of actions that correct task errors accounts for savings 646 (Haith et al., 2015; Huberdeau et al., 2015a; Huberdeau et al., 2015b; Morehead et 647 al., 2015). If this is true, then deliberate correction of task errors alone, even when 648 naïve to sensory prediction errors, should be sufficient for savings. To the best of our 649 knowledge, this guestion was not previously addressed (Haith et al., 2015; 650 Huberdeau et al., 2017; Morehead et al., 2015; Orban de Xivry & Lefevre, 2015). We 651 therefore tested this in Experiment 3, where a systematic task error was imposed at 652 653 training (targets always jumped mid-movement by 30°) without any perturbation of 654 hand position feedback. Training to correct for these task errors improved subsequent adaptation to the 30° rotation of hand position feedback compared to 655 naïve participants, even though we did not provide any instruction to apply previous 656 learning. Thus, learning to counteract task errors in the absence of a sensorimotor 657 perturbation was enough to improve adaptation to a never-before encountered 658 sensorimotor perturbation. 659

660 How might correction of task errors lead to savings?

Exactly what is encoded when task errors are corrected? In Experiment 3, we 661 found that adaptive responses to task errors can be switched off upon instruction 662 that the perturbation has been removed, but that this learning was still retained in 663 664 latent form to affect subsequent adaptation when a similar context was encountered. This suggests that this form of sensorimotor learning is fundamentally distinct from 665 the adaptive responses to sensory prediction errors, which are expressed in an 666 obligatory manner for many trials after the perturbation is removed. The persistent 667 and obligatory response to sensory prediction error is often conceived as remapping 668 between a desired movement direction (i.e., a motor plan) and the motor commands 669 670 that are generated to achieve execute the movement. We speculate that the contextually flexible adaptive response to task errors arises from an earlier 671 672 component of the sensory to motor transformation: a mapping between the behavioural goal and the motor plan selected to achieve it. This would be consistent 673

with a non-obligatory expression of the learning, because we can choose to achievebehavioural goals in many different ways.

Given that we can instruct participants to deliberately use re-aiming strategies 676 to reduce errors (Benson et al., 2011; Mazzoni et al., 2006; Savoie et al., 2018; 677 Schween et al., 2014; Taylor et al., 2011), it is possible that a history of deliberately 678 correcting for task errors (induced by target jumps) led to savings (under visuomotor 679 rotation conditions) by prompting acquisition of a re-aiming strategy. Indeed, one 680 view is that savings results solely from deliberate strategy use (Morehead et al., 681 2015). This view is supported by findings of no savings when cognitive resources are 682 suppressed by shortening movement preparation time during visuomotor adaptation 683 684 (Haith et al., 2015). Time pressure presumably suppresses time-consuming mental rotation processes required to re-aim at a planned angle away from the presented 685 target (Bhat & Sanes, 1998; Georgopoulos & Massey, 1987; Pellizzer & 686 687 Georgopoulos, 1993). In contrast, recent findings show savings despite time pressure when participants were allowed repeated episodes of adaptation to 688 opposing visuomotor rotation perturbations (Huberdeau et al., 2017). How might one 689 690 reconcile these findings? We think that the savings shown in that study might result from residual capacity to re-aim away from a target despite short latencies, as the 691 692 rotations were only applied to one of two possible targets. It is clear that when there 693 is a small target set size (i.e., a small predictable range of required movements, for 694 example when there were only two targets in McDougle et al. (2019), or when the targets were distributed in a narrow, predictable range in Leow et al. (2017)), time-695 pressure does not prevent people from aiming at a specified angle away from a 696 target. McDougle and Taylor (2019) showed that small set sizes promotes caching of 697 stimulus-response associations between targets and corresponding required 698 699 movements. When the required response was less predictable (i.e., with 8 or 12 700 targets randomly presented in a wide spatial array), time pressure resulted in 701 intermediate reaches that only partially compensated for the rotation-increasing time-pressure corresponded with less complete compensation (Leow et al., 2017; 702 703 McDougle & Taylor, 2019), consistent with analog movement re-planning via mental 704 rotation.

705 What are the contributions of stimulus-response associations and mental 706 rotation to savings? We explored this in Experiment 4 by replicating Experiment 3,

707 but limiting preparation time. Given the 8-target array, the required response was less predictable than in Huberdeau et al. (2017). At training, time pressure resulted 708 709 in incomplete compensation, as consistent with the results of Leow et al. (2017); McDougle and Taylor (2019), implying a restriction in mental rotation. Despite this, 710 adaptation was better-than-naive when the reach solution at test was the same as at 711 712 training, and worse than naïve when the reach solutions were opposite at training 713 and test. We interpret the findings as follows. Task errors in visuomotor rotation tasks typically provoke both mental rotation and stimulus-response associations. 714 715 Time-pressure suppresses mental rotation capacity, but might not prevent the formation of stimulus-response associations between target errors and reach 716 717 solutions. We think such associations were formed in our Experiment 4, and that, after washout, these latent stimulus-response associations were re-expressed when 718 confronted with a similar sensorimotor context (in this case, experiencing errors to 719 720 the side of targets). This learned association elicits savings when reach solutions for each target are the same at training and test, and interference when the reach 721 722 solutions differ. This interference is particularly interesting, because it occurred despite participants being obviously able to volitionally disengage recently learned 723 724 reach solutions in the preceding no-rotation trials with similar time demands. Maladaptive retrieval of an inappropriate reach solution might thus be triggered by 725 task errors (which were absent in the preceding no-feedback, no-rotation trials), and 726 this pre-potent response to the trigger was poorly inhibited under time pressure. An 727 alternative interpretation is that practice of mentally rotating a target in one direction 728 729 at training makes it more difficult to mentally rotate the target in the opposite 730 direction under time-pressure at test, because prior mental rotation can interfere with subsequent mental rotation in an opposite direction (Sack et al., 2007). An important 731 732 clue to identify which potential explanation is more likely comes from findings of deficient savings (Bedard et al., 2011; Leow et al., 2013; Leow et al., 2012; Marinelli 733 et al., 2009) and anterograde interference in Parkinson's disease (Leow et al., 2013). 734 Here, the better performance of Parkinson's disease patients when adapting to a 735 736 rotation opposite to that previously experienced (Leow et al., 2013) seems unlikely to result from superior mental rotation. Parsimony therefore suggests that the more 737 738 likely culprit is deficient acquisition of stimulus-response associations at initial learning (Foerde et al., 2011; Shohamy et al., 2006; Vo et al., 2014). Our current 739

data therefore suggest that inflexible stimulus-response associations can contributeto latent sensorimotor memories.

Athough we demonstrate a role for learning to correct task errors in improving 742 adaptation, we do not yet fully understand how task errors affect learning in typical 743 sensorimotor adaptation where task errors and sensory prediction errors co-occur. 744 Several possibilities exist. One possibility is that task errors might modulate the 745 sensitivity to sensory prediction errors, and this increased sensitivity might elicit a 746 gain in adaptation rate (Kim et al., 2019). There is some evidence to support this 747 hypothesis, as task errors can modulate the alteration of sensorimotor maps as a 748 result of exposure to sensory prediction errors (Kim et al., 2019; Leow et al., 2018; 749 Reichenthal et al., 2016; Schaefer et al., 2012; Welch, 1969). An alternative 750 possibility is that adaptation to task errors and adaptation to sensory prediction 751 752 occurs independently. More work is required to dissociate these possibilities.

753 We also do not yet understand the role of correcting task errors in adaptation to different sensorimotor perturbations which are less likely to provoke easily 754 755 verbalizable strategies (e.g. force-field adaptation, split-belt treadmill adaptation) and in paradigms that are less likely to be influenced by time-consuming deliberate 756 strategies, such as saccadic adaptation (Kojima et al., 2004). It is clear that volitional 757 758 strategies can influence adaptation in all of these paradigms (e.g., de'Sperati, 1999; Hwang et al., 2006), but it is currently unclear to what extent strategies contribute to 759 improved re-adaptation in these paradigms. In split-belt treadmill adaptation for 760 example, people can strategically improve adaptation by visual feedback of their 761 perturbation-induced gait asymmetry, and yet fail to express this improvement upon 762 763 removal of visual feedback; thus failing to augment savings by explicit strategy use (Leech et al., 2018). If and how stimulus-response associations might play a role in 764 these paradigms is even less clear. Another open question is if and how stimulus-765 response associations are contextually dependent, as savings is clearly modulated 766 by context (Song et al., 2015; Yin et al., 2014). Furthermore, although we 767 768 demonstrate a role of stimulus-response associations in savings despite timepressure, we do not discount the possibility that extended training might improve 769 770 mental rotation skill to allow savings under time-pressure regardless of set size. 771 perturbation direction, or perturbation magnitude during adaptation to a visuomotor 772 rotation (Provost et al., 2013; Wright et al., 2008).

How does the brain form latent sensorimotor memories in response to task 773 errors? We speculate that task errors prompt the formation of a new motor plan, 774 which specifies the required parameters of the action required to achieve the desired 775 outcome under new conditions. Achieving a desired outcome (e.g., a cancellation of 776 task error) forms an association between the stimulus (e.g., a task error for a given 777 target) and the response (the modified movement plan needed to restore task 778 779 success). This association is readily retriggered by task errors. Learning to alter movement plans, even without actually executing the motor plan, might play a crucial 780 781 role in sensorimotor adaptation (Sheahan et al., 2018; Vyas et al., 2018). For example, monkeys who learn to move a cursor with a brain-machine interface (i.e., 782 without moving their hands) show accelerated adaptation when first using their hand 783 to move a cursor (Vyas et al., 2018). Similarly, although people fail to concurrently 784 adapt to opposing perturbations, concurrent adaptation is possible when different 785 786 motor plans are tagged to opposing perturbations (Sheahan et al., 2018).

787 Summary

Our results show that failures to attain movement goals, or task errors, are a 788 fundamental driver of latent sensorimotor memories that improve adaptation to 789 sensorimotor perturbations. Flexible, strategic processes and inflexible cached 790 791 stimulus-response associations that arise in response to task errors both contribute 792 to savings in visuomotor adaptation. The data demonstrate the richness of 793 behavioural responses to sensorimotor perturbations, and suggest that some principles regarding the adaptative responses to sensorimotor perturbations may be 794 795 more broadly applicable to alternative motor learning contexts than previously recognised. 796

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