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Rapid changes in movement representations during human reaching could be preserved in memory for at least 850ms

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1 **Rapid changes in movement representations during human**
2 **reaching could be preserved in memory for at least 850ms**

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25 **ABSTRACT**

26 Humans adapt to mechanical perturbations such as force fields during reaching within
27 tens of trials. However, recent findings suggested that this adaptation may start within one
28 single trial, i.e., online corrective movements can become tuned to the unanticipated
29 perturbations within a trial. This was highlighted in previous works with a reaching experiment
30 in which participants had to stop at a via-point (VP) located between the start and the goal. A
31 force field was applied during the first and second parts of the movement and then occasionally
32 unexpectedly switched off at the VP during catch trials. The results showed an after-effect
33 during the second part of the movement when participants exited the VP. This behavioural
34 result was interpreted as a standard after-effect, but it remained unclear how it was related to
35 conventional trial-by-trial learning. The current study aimed to investigate how long do such
36 changes in movement representations last in memory. For this, we have studied the same
37 reaching task with VP in two situations: one with very short residing time in the VP and the
38 second with an imposed minimum 500ms dwell time in the VP. In both situations, during the
39 unexpected absence of the force field after VP, after-effects were observed. This suggests that
40 online corrections to the internal representation of reach dynamics can be preserved in memory
41 for around 850ms of resting time on average. Therefore, rapid changes occurring within
42 movements can thus be preserved in memory long enough to influence trial-by-trial motor
43 adaptation.

44 **SIGNIFICANCE STATEMENT**

45 Recent studies suggested that adaptive feedback control happens within a reach movement and
46 the feedback responses are tuned specifically to the single-trial perturbation. Here we show that
47 these feedback mediated changes in movement representations can last for around 850ms and
48 are available to reproduce the characteristics of the newly acquired correction process. Current
49 data replicate previous studies showing that feedback corrections are associated with changes

50 in online representations, and demonstrate that these changes are preserved in memory long
51 enough to be an important component of standard trial-by-trial adaptation.

52 **INTRODUCTION**

53 Humans adapt to force field perturbation during reaching movements within a few minutes of
54 practice (Brashers-Krug et al. 1996; Shadmehr and Brashers-Krug 1997; Shadmehr and Mussa-
55 Ivaldi 1994). But learning is hampered when attempting to adapt to opposing force fields
56 sequentially or intermittently (Caithness et al. 2004; Gandolfo et al. 1996; Karniel and Mussa-
57 Ivaldi 2002). The reasoning for the relative inability to learn opposing perturbations is that,
58 given no explicit contextual information about the forcefield, the motor memory attempts to
59 learn the mean of the force fields applied on the recent trials (Scheidt et al. 2001) using a single
60 internal model of the mean of the random environment (Takahashi et al. 2001), or the internal
61 models for different perturbations share common resources (Tong and Flanagan 2003). In these
62 scenarios, it was demonstrated that the presence of explicit contextual cues associated with each
63 perturbation or different representations could facilitate the adaptation to opposing
64 perturbations, by acquiring multiple internal models simultaneously and predictively switching
65 between them (Addou et al. 2011; Cothros et al. 2008; Hirashima and Nozaki 2012; Imamizu
66 et al. 2007; Osu et al. 2004; Wada et al. 2003).

67 However, more recent studies highlighted the possibility of concomitant learning of opposing
68 and unexpected force fields that could be explained as the expression of online, continuous
69 adaptive control (Crevecoeur et al. 2020a, 2020b). This supports the possibility that online
70 feedback corrections happening within a trial are not stereotyped but are associated with
71 specific changes in movement representation (Joiner et al. 2017). It remains to be elucidated
72 whether the underlying mechanism associated with feedback adaptation plays a role in the trial-
73 by-trial adaptation that characterizes learning across trials.

74 A central piece of evidence for rapid adaptation is based on the presence of after-effects
75 expressed after a stop-over at a via-point (VP) (Crevecoeur et al. 2020b). On catch trials, a force
76 field was applied during the first part of the movement and then unexpectedly switched off after
77 the via-point. When participants exited the VP, after-effects were observed, which were specific
78 to the perturbation experienced before VP within the same trial, and were consistent with the
79 after-effects observed in conventional trial-by-trial adaptation scenarios. The movement after
80 VP was interpreted as an after effect, showing that the feedback correction elicited prior to the
81 via-point could change movement representations online.

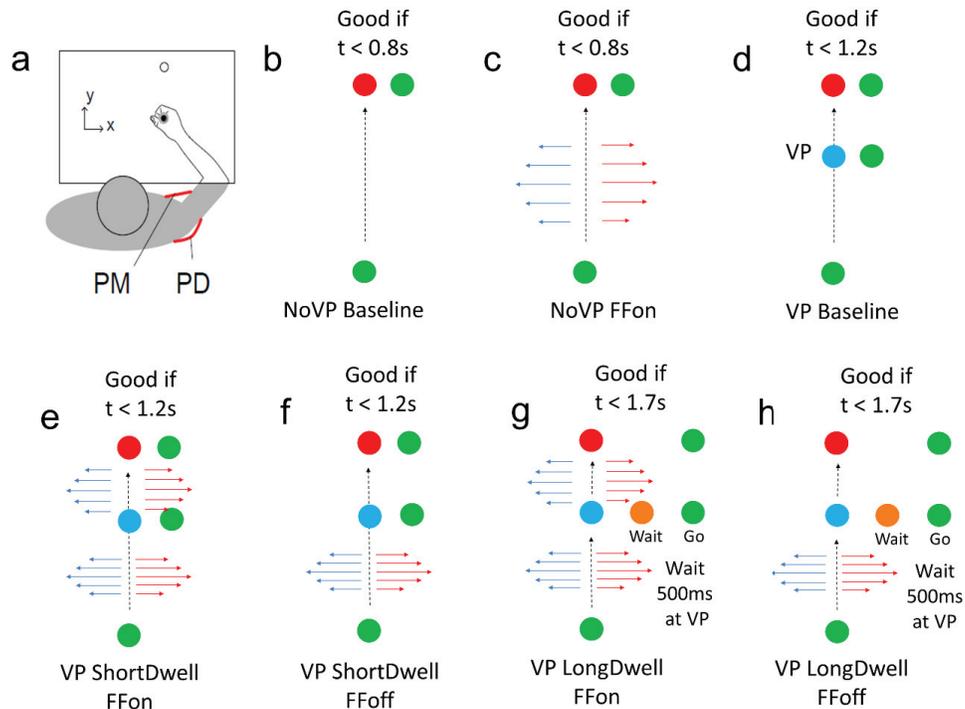
82 It remained unclear whether these changes in reach representation observed in trials with via-
83 point were short-lived, or whether they could participate in trial-by-trial adaptation. More
84 precisely, it is unknown whether the motor system forgets the effect of online feedback
85 corrections very fast, as it arises due to transient disturbances; or if these changes are retained
86 in memory for enough time to impact behaviour in the next trial. If the online feedback
87 corrections are retained, then it suggests that much of trial-by-trial adaptation and after-effects
88 may be acquired within perturbed movements. Alternatively, if feedback-related changes in
89 movement representation decay very fast, then trial-by-trial learning must be based on offline
90 adjustments. In the present work, we replicated previous findings and found that these online
91 feedback corrections elicited after-effects that could be retained in memory for at least 850ms.
92 Therefore feedback adaptation constitutes a candidate component of more conventional trial-
93 by-trial learning.

94 **MATERIAL AND METHODS**

95 *Experimental design*

96 18 right-handed healthy adults (age = 22.9 ± 1.9 , 10 female) were recruited for the study. All of
97 them provided written informed consent. The experimental paradigm was approved by the

- 98 Ethics Committee of the host institution and complied with the Declaration of Helsinki.
 99 Participants were compensated for their participation.



100

101 Figure1. a) Experimental setup. Electromyogram was recorded from Pectoralis Major (PM) and
 102 Posterior Deltoid (PD). b) Typical simple reaching trial without via-point (VP) and forcefield
 103 (FF) c) NoVP trial with forcefield, either clockwise (red arrows) or counterclockwise (blue
 104 arrows). d) VP trial without forcefield. Participants were requested to make a short pause at VP
 105 and proceed to the final target. e) VP ShortDwell trial with force field before and after VP. f)
 106 VP ShortDwell catch trial with forcefield unexpectedly turned off after VP. g) VP LongDwell
 107 trial with forcefield before and after VP. h) VP LongDwell catch trial with forcefield
 108 unexpectedly turned off after VP. The target would change color when the participants made
 109 movements within the instructed time window. For d-h, VP would change color when the
 110 participants made a pause at VP and the hand velocity dropped to $<3\text{cm/s}$. For g-h, VP would
 111 change color again when the participant stayed at VP for 500ms.

112 Participants grasped the handle of a robotic arm (KINARM, Kingston, ON, Canada), and were
 113 instructed to perform visually guided forward reaching movements towards a virtual target and
 114 their forehead resting on a stable resting pad, to minimize head movements.

115 There were mainly seven types of movement conditions:

116 1) *No via-point trials (NoVP Baseline/B)*: Participants had to wait at the starting
117 position (a filled circle with radius 0.6cm) for a random delay uniformly distributed between 2s
118 and 4s. The goal position was fixed at 15cm from the starting point and was initially presented
119 as an open red circle. A cue was delivered to initiate the movement by filling the circle in the
120 goal position and for a successful trial, the participants had to reach the goal position within
121 600ms to 800ms (including reaction time) and stabilize there for at least 1s. Visual feedback
122 was provided to inform them about the reaching time. If they moved too fast, the goal circle
123 changed back to an open circle. If the movement was too slow, it remained red. The goal target
124 became green when they hit it within the specified time window. When they managed to keep
125 the cursor in the goal target for the instructed stabilization period, the trial was successful and
126 a score displayed on the screen was incremented (1 point). The scores and feedback about
127 timing were provided to encourage consistent movement times but all trials were included in
128 the dataset. In all cases, the direct vision of the arm and hand was blocked but the cursor aligned
129 to the handle was always visible.

130 2) *NoVP with force fields (NoVPPF)*. In these types of trials, participants experienced
131 mechanical perturbation by orthogonal force fields during the forward movement, ie, lateral
132 force proportional to the forward hand velocity ($F_x = \pm L v_y$, $L = 13 \text{ Nsm}^{-1}$). Force fields were
133 either clockwise (CW) or counter-clockwise (CCW).

134 3) *Via-point (VP) Baseline trials with slowdown at VP*. In these trials, a via-point (filled
135 blue circle of radius 1cm) was located at 10cm on the straight line joining the start and goal
136 position. Participants were instructed to reach the goal position through the VP (Fig 1c). Bonus
137 points (3 points) were given when they paused at the VP and the hand velocity inside the VP
138 dropped below 3cm/s. Feedback about a successful slowdown at the VP was given during the
139 trial by changing the color of the VP filled circle from blue to green.

140 4 and 5) *Via-point trials with short dwell time at VP, force field ON before VP and*
141 *ON/OFF after VP (VPsFFon/ VPsFFoff)*. For catch trials, the hand velocity was monitored
142 online so as to turn off the force field if the hand cursor was at the VP and the hand velocity
143 dropped below 3cm/s while at the VP (as shown in Fig 1d).

144 6 and 7) *Same as 4&5, but with long dwell time at VP (VPIFFon/ VPIFFoff)*. In these
145 trials, participants were forced to stay at the VP for at least 500ms before they proceed to the
146 goal position.

147 Once they reached the VP, the filled blue circle became orange and after 500ms it turned
148 to green, which was a go cue to proceed to the final position (Fig 1e). The notation VPs/IFFon
149 and VPs/IFFoff corresponds to VP trials with forcefield on and off in either ShortDwell or
150 LongDwell situations. To summarize, we had a factorial design of trials: No via-point trials
151 with force field on or off (CW/CCW); via-point trials with force field on or off, catch trials
152 where the force field was turned off after the via-point, and similar via-point trials with the
153 instruction to remain in the via-point for at least 500ms (CW/CCW, ShortDwell/LongDwell,
154 forcefield ON/OFF after VP).

155 Participants performed two different kind of blocks: *ShortDwell and LongDwell*. Each
156 consisted of 240 trials composed of 100 NoVP baseline trials, 40 NoVPFF trials, 20 VP baseline
157 trials, 40 VPs/IFFon and 40 VPs/IFFoff trials. All trials and force field directions were
158 interleaved randomly within each block, such that the occurrence and direction of the
159 perturbations were unpredictable. Half of the participants did ShortDwell block set before
160 LongDwell block set.

161 ***Data analysis and statistics***

162 The 2-dimensional coordinate of the cursor aligned to the robotic handle, and the forces
163 at the interface between the participants' hand and the handle were sampled at 1kHz. Signals

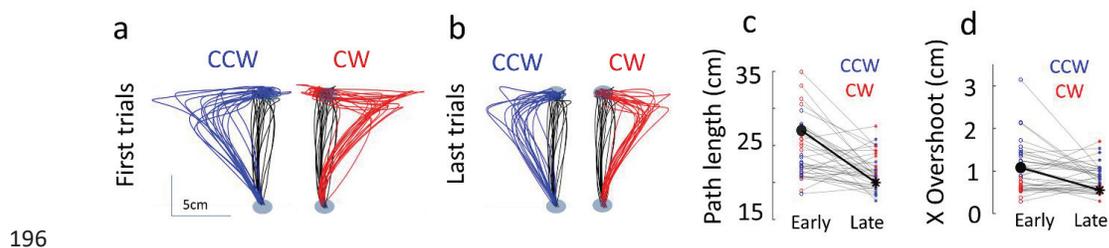
164 were digitally low-pass filtered with a fourth-order, dual-pass Butterworth filter with a cut-off
165 frequency of 50Hz. Velocity signals were obtained from numerical differentiation of position
166 signals (4th order, finite difference algorithm). Electromyogram (EMG) was recorded from the
167 shoulder flexor - Pectoralis Major (PM) and shoulder extensor - Posterior Deltoid (PD), the
168 main muscles recruited when performing lateral corrections against the perturbations used in
169 this experiment (Bagnoli Desktop System, Delsys, Boston, MA, US). EMG electrodes were
170 positioned over the muscle belly after light abrasion of the skin. A dermatode self-adhering
171 electrode was positioned on the right foot ankle for ground. EMG signals were collected at
172 1000Hz sampling frequency and digitally band-pass filtered (4th order dual-pass: [10, 400] Hz).

173 Three events were used as timing references. First, reach onset was defined as the
174 moment when the cursor exited the home target. Second, the moment the cursor reached VP.
175 Third, the moment the cursor exited VP and proceeded towards the final target location. Hand
176 paths were averaged first; within and then across the subjects. For each subject, lateral (v_x) and
177 forward (v_y) component of the peak velocity was computed before and after VP for each trial
178 and averaged per condition. EMG traces were averaged offline, first within and then across
179 subjects and were aligned to the VP exit to compute the characteristics of muscle response after
180 VP, in both ShortDwell and LongDwell, *VPs/IFFoff* and *VPs/IFFon*. For statistical comparison
181 across conditions, EMG was averaged in 100ms bins before VP exit. Paired t-tests and repeated
182 measures ANOVAs were used to find a significant difference with a p-value of less than 0.05.
183 We measured the onset of changes in EMG after the VP exit. EMG traces averaged across trials
184 for each subject were collapsed into a 30ms wide (centered) sliding window, and sliding
185 comparisons through time were performed with paired t-tests. We searched in the time series
186 of p-values the moment the difference across populations of EMG data crossed a threshold (p
187 < 0.05), which was immediately followed by a strongly significant difference ($p < 0.001$).

188 RESULTS

189 ***Behavioral traces for simple movements***

190 Simple reaching trials with and without perturbation and adaptation across trials were
 191 discussed in detail in some previous works (Crevecoeur et al. 2020b, 2020a). As in these
 192 previous reports, for no via-point trials, the current dataset also observed a significant reduction
 193 in end-point target overshoot (t-test: $t_{35} = 3.77$; $p < 0.001$) and hand path length (t-test: $t_{35} =$
 194 4.33 ; $p < 0.001$) between the first and last trials (Fig 2), suggesting that feedback correction for
 195 the unanticipated force field trials improved.



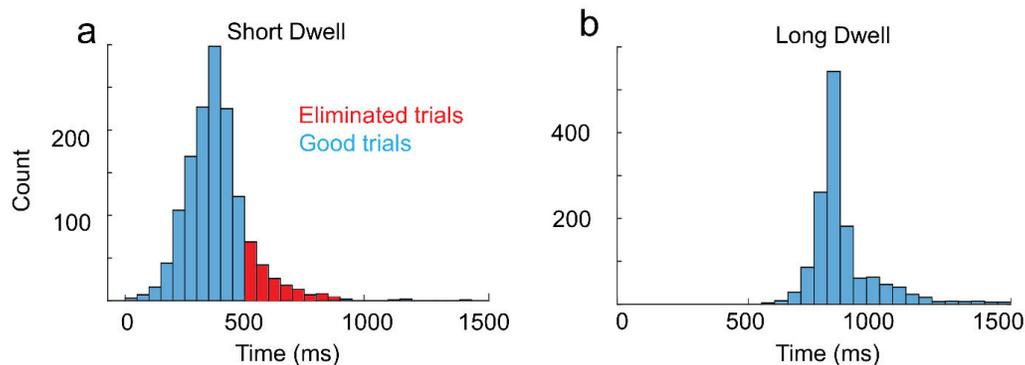
197 Fig 2: a) First trials of no via-point movements with CCW(blue) and CW(red) forcefields
 198 (NoVPPF) plotted with baseline (NoVP) trials (black) for all 18 subjects. b) Last trials of the
 199 same, note how the target overshoot is reduced in comparison with first trials. c) Distance
 200 travelled (path length) by hand during first and last trials d) End-point target overshoot in the
 201 X direction in early and late trials. The thick black dot and star in c and d indicate the mean.
 202 There is a significant reduction in target overshoot and path length between early and late trials,
 203 which show hints of adaptation.

204

205 ***Via-point dwell time***

206 Turning to via-point trials, we measured the actual dwell time for short and long dwell
 207 conditions to verify whether participants complied with task instructions (Fig 3). For analysis,
 208 we defined dwell time as the time interval between the VPentry and VPexit for the hand motion.
 209 In ShortDwell trials, the mean dwell duration at VP was 345 ± 22 ms (for all participants, min =
 210 22ms; max = 499ms). Around 15% of the total ShortDwell trials (variation per subject: 0-
 211 37.5%) consisted of dwell duration not in the range 0-500ms were eliminated from further
 212 analysis (Fig3a, the red fraction of the histogram). In LongDwell, mean dwell duration was

213 856±37ms (min = 550ms, max = 1491ms). In this condition, 3% of the total LongDwell trials
 214 from all the subjects (variation per subject: 1.25-6.25%) were eliminated, so that LongDwell
 215 trials consisted of dwell time within the range 500-1500ms (Fig3b).



216

217 Fig 3. Distribution of actual dwell times for all subjects and all trials in a) ShortDwell and b)
 218 LongDwell blocks. Each bin corresponds to 50ms. For ShortDwell, the trials with dwell times
 219 longer than 500ms and for LongDwell, the trials with dwell times shorter than 500ms or longer
 220 than 1500ms were removed from the analyses.

221

222 *Behavioral traces for movement through via-point*

223 To trace out the nature of online changes in movement representation happening within
 224 the trial, we compared the movement after VP in situations with force field on or off after the
 225 via-point (VPs/IFFon and VPs/IFFoff).

226 *Forcefield off (catch trials):*

227 VPs/IFFoff trials were interleaved as catch trials to capture the dynamics of online
 228 correction within the trial. When the force field was off after VP, an after-effect was observed
 229 in the subsequent chunk of movement, such that the hand path deviated on the other side
 230 compared to that of the previously experienced perturbation before VP (Fig 4d,e). The lateral
 231 component of the 2nd peak velocity showed inverse modulation in comparison to the hand path
 232 deviation experienced prior to the VP (Fig 4f). There was a significant difference from baseline

233 trials for CCW and CW in ShortDwell (CCW: $t_{17} = -8.85$; $p < 0.001$ and CW: $t_{17} = 3.03$; $p <$
234 0.01) and LongDwell (CCW: $t_{17} = -8.89$; $p < 0.001$ and CW: $t_{17} = 5.80$; $p < 0.001$). But there
235 was no significant difference between ShortDwell and LongDwell trials for CCW ($t_{17} = -0.25$;
236 $p = 0.80$) and CW ($t_{17} = -1.43$; $p = 0.17$). This showed that the dynamics of the online correction
237 adopted before VP were continued after VP and it was comparable for ShortDwell and
238 LongDwell conditions. That means this correction strategy was preserved and exploited even
239 after a pause of around 850ms at the VP.

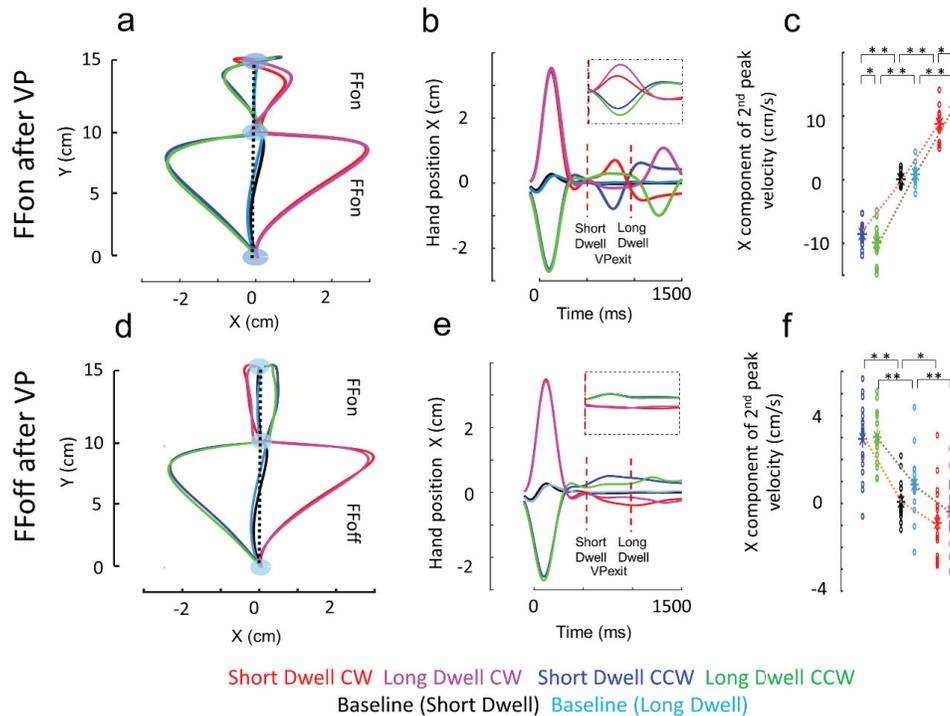
240 One possibility was that participants performed faster movements after the VP in the
241 LongDwell condition, resulting in larger forces produced by the force field but it was not the
242 case: we also checked the Y component of the 2nd peak velocity in VPs/IFFoff trials and found
243 no significant difference from baseline trials for CCW and CW in ShortDwell (CCW: $t_{17} = -$
244 1.72 ; $p = 0.10$ and CW: $t_{17} = -1.74$; $p = 0.1$), but there was a significant difference in LongDwell
245 (CCW: $t_{17} = 4.02$; $p < 0.001$ and CW: $t_{17} = 5.89$; $p < 0.001$). Also, there was no significant
246 difference in the Y component between ShortDwell and LongDwell trials for CCW ($t_{17} = 1.13$;
247 $p = 0.27$), but there was for CW ($t_{17} = 2.87$; $p = 0.01$).

248 In addition, we have done a separate analysis by further splitting the LongDwell trials
249 according to the individual median dwell time (range: 732-867ms; mean = 821ms), so that
250 Early-LongDwell was within the range 500-821ms (mean = 773ms) and Late-LongDwell was
251 within the range 821-1500ms (mean = 934ms). In this case also, when force field was off after
252 VP, there was no significant difference between ShortDwell and Early-LongDwell (CCW: t_{17}
253 $= -0.89$; $p = 0.38$ and CW: $t_{17} = -1.63$; $p = 0.12$), as well as ShortDwell and Late-LongDwell
254 (CCW: $t_{17} = 0.67$; $p = 0.51$ and CW: $t_{17} = -0.46$; $p = 0.65$). Thus, the consistent after-effects
255 were observed regardless of the average duration between the two consecutive chunks of
256 movement in the range 0-1500ms (see Fig 3).

257 *Forcefield on:*

258 When the forcefield was on after VP, participants made lateral deviation (which was
259 evident in Fig 4a,b) as expected and the modulation of lateral (x) component of the 2nd peak
260 velocity shows a similar trend as that of the perturbation they have experienced before VP (Fig
261 4c). Simple t-tests on the x component of 2nd peak velocity showed a significant difference from
262 baseline trials for CCW and CW in both ShortDwell (CCW: $t_{17} = 23.34$; $p < 0.001$ and CW: t_{17}
263 = -17.42 ; $p < 0.001$) and LongDwell (CCW: $t_{17} = 20.22$; $p < 0.001$ and CW: $t_{17} = -16.65$; $p <$
264 0.001) situations. This was somehow expected as the duration of pause at VP may not directly
265 influence the peak velocity modulation trend for subsequent perturbation, in comparison with
266 baseline trials. Also, there was a significant difference in the x component between ShortDwell
267 and LongDwell trials for CCW ($t_{17} = 2.41$; $p = 0.03$) and CW ($t_{17} = -4.86$; $p < 0.001$).

268 We checked the Y component of the 2nd peak velocity in VPs/IFFon trials, and there
269 was no significant difference from baseline trials for CCW and CW in ShortDwell (CCW: t_{17}
270 = 1.59 ; $p = 0.13$ and CW: $t_{17} = -0.99$; $p = 0.34$), but significant difference in LongDwell (CCW:
271 $t_{17} = 5.56$; $p < 0.001$ and CW: $t_{17} = 5.20$; $p < 0.001$). In addition, there was no significant difference
272 in the Y component between ShortDwell and LongDwell trials for CCW ($t_{17} = 1.62$; $p = 0.12$)
273 and CW ($t_{17} = 1.68$; $p = 0.11$). Thus participants control was more sensitive to the force field
274 after the via-point in the long-dwell condition. The analysis of EMG below supports this
275 explanation.



276

277 Fig 4. a, b & c correspond to the condition where force field was on before and after VP for
 278 both CW and CCW perturbations, while d, e & f correspond to the condition where force field
 279 was on before VP, but turned off after VP. VP baseline trials were included for comparison. a,
 280 d) Mean hand position in space. The dotted vertical line represents zero deviation. b, e) Mean
 281 X hand position across time from the onset of reach. The dotted lines in brown represent the
 282 mean VP exit time points. The plots in the dotted inset box (yaxis = [-2 2], xaxis = [0 600])
 283 represent the mean X hand position immediately after VP exit for the next 600ms. c, f) Lateral
 284 component of the maximum hand velocity after the VP. ** represents $p < 0.001$ and * is $p < 0.01$.

285

286 *EMG activity*

287 Previous studies showed that unexpected perturbation elicits an increase in co-activation
 288 (Crevecoeur et al. 2019; Franklin et al. 2008; Milner and Franklin 2005) to counter following
 289 disturbances. It remains debated whether co-contraction increases the intrinsic stiffness of
 290 muscles, making the joints mechanically rigid (Burdet et al. 2001; Gribble et al. 2003) or
 291 whether the advantage of co-contraction is to increase feedback gains and make neural control
 292 more robust (Crevecoeur et al. 2019; Crevecoeur and Scott 2014; Pruszynski et al. 2009).

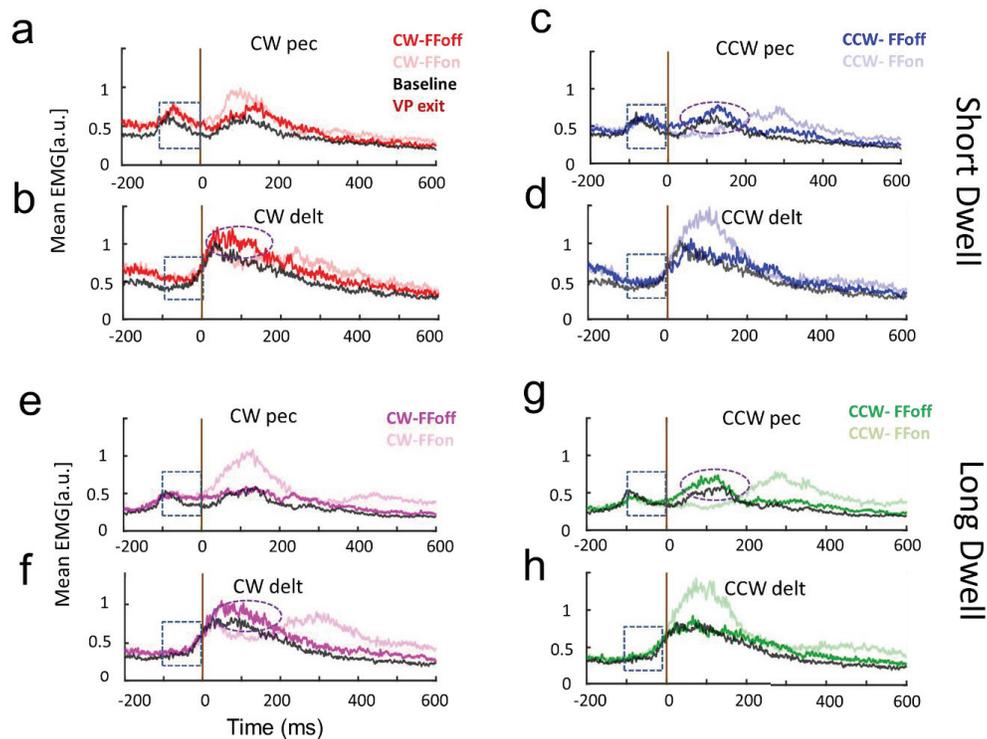
293 Importantly we found in the current dataset that an increase in co-activation was also elicited
294 within movements including a stopover at the via-point, and the comparison of trials with force
295 field on after the via-point allowed us quantifying the effect of co-contraction on behaviour.
296 We investigated EMG levels of an antagonist pair of shoulder muscles as well as correlates of
297 after-effects across the two conditions. We plotted EMG traces after VP in VPs/IFFon and
298 VPs/IFFoff situations for both pectoralis major and posterior deltoid (Fig 5).

299 To evaluate whether there was any difference in muscle activity at VP exit across
300 ShortDwell and LongDwell, we computed the difference of mean EMG activity in a window
301 0-100ms before VP exit, between the two dwell conditions and performed 2way repeated
302 measures ANOVA over factors: muscle (MUS: PEC vs DELT) and forcefield (FF: on vs off)
303 and found there was no effect of MUS ($F_{(1,143)} = 2.77$; $p = 0.11$), FF ($F_{(1,143)} = 1.12$; $p = 0.30$)
304 and their interaction ($F_{(1,143)} = 3.50$; $p = 0.08$). There was no significant difference between
305 forcefield on/off situations in agonist and antagonist muscles. In other words, in both FFon and
306 FFoff conditions (Short VS LongDwell) we measured similar correlates of agonist-antagonist
307 activity just prior to the exiting the via-point, that accounted for the after-effects when the force
308 field was unexpectedly turned off.

309 We also calculated the mean EMG activity 100ms before the VP exit (dotted square
310 boxes in Fig 5) and the difference between baseline and ShortDwell (CW/CCW/FFon/FFoff
311 pooled together, PEC: $t_{71} = -8.24$; $p < 0.001$ and DELT: $t_{71} = -6.19$; $p < 0.001$) as well as baseline
312 and LongDwell (PEC: $t_{71} = -2.6$; $p = 0.01$ and DELT: $t_{71} = -5.9$; $p < 0.001$). The higher muscle
313 activity in both muscles compared to baseline trials could raise the possibility of co-contraction
314 just before the VP exit.

315 Then we calculated the pairwise difference between ShortDwell and LongDwell trials
316 for each subject for VPs/IFFon and VPs/IFFoff situations for each muscle. For FF on condition,
317 the overall muscle activity in a window 0-100ms before VP exit was less in amplitude for

318 LongDwell compared to ShortDwell (Forcefield on, CW/CCW pooled together; PEC: $t_{35} = -$
319 5.35 ; $p < 0.001$ and DELT: $t_{35} = -4.78$; $p < 0.001$). That means, there was a tendency to co-
320 contract at the via-point which decreased over the course of residing time in the VP.
321 Importantly, for FF off condition also, the overall muscle activity 0-100ms before VP exit was
322 less in amplitude for LongDwell compared to ShortDwell (Forcefield off, CW/CCW pooled
323 together; PEC: $t_{35} = -5.35$; $p < 0.001$ and DELT: $t_{35} = -5.25$; $p < 0.001$), which allows us to
324 confirm that it had no influence on the after effect. In principle, co-contraction would result in
325 a trajectory that is less sensitive to perturbation or errors, thus these results were expected. The
326 foregoing analysis provides a confirmation: we observed different levels of co-contraction
327 while similar after-effect, suggesting that the level of co-activation was not statistically related
328 to the after-effect. Interestingly we observed that the trajectories after the VP were more
329 impacted in the LongDwell condition when the force field remained on, which likely resulted
330 from a combination of changes in representation (highlighted by the after-effects) and from a
331 change in control gains associated with co-contraction.



332

333 Fig 5. EMG correlates after VP in ShortDwell (a,b,c,d) and LongDwell (e,f,g,h) trials. Each
 334 trace represents mean across subjects. a,b,e,f for CW perturbation, c,d,g,h for CCW
 335 perturbation. All EMG traces were aligned at the time of the VP exit (Dark Brown line), the
 336 "0ms" in the horizontal axis indicates the timing of the VP exit. Force field on (VPs/IFFon -
 337 light shade) and off conditions (VPs/IFFoff- dark shade) were compared with VP baseline trials.
 338 The dotted oval shape represented higher activation in antagonist muscle. 100ms time window
 339 before VP exit was highlighted in dotted square boxes.

340

341 We further sought to characterize EMG correlates of force field anticipation after the
 342 via-point by performing comparisons based on a sliding window. EMG agonist (CW pec, CCW
 343 delt) followed a similar profile with and without force field until after VP, and this activity was
 344 higher than baseline. The antagonist (CCW pec, CW delt) muscle modulation also reflected
 345 correction for the unexpected deviation induced by switching off the force field (dotted oval in
 346 Fig 5). A similar observation was made in LongDwell trials. We have conducted paired t-tests
 347 for the mean of 30ms sliding window for the FFon and FFoff conditions and found the time
 348 points at which the on/off traces started to show a significant difference from VP exit, for

349 ShortDwell:- agonist pair = -22 ± 15 ms, antagonist pair = -14 ± 15 ms and for LongDwell:-
350 agonist pair: = -26 ± 15 ms, antagonist pair: = -37 ± 15 ms. (The average hand tangential velocity
351 at the exact moment of VPexit was 0.23 ± 0.03 cm/s for ShortDwell and 0.24 ± 0.02 cm/s for
352 LongDwell)

353 To summarize the analyses of EMG results, we highlighted a spontaneous tendency to
354 co-contract at the via-point, which decayed over the course of the dwell time interval. This
355 tendency had an impact on the perturbation-related motion when the force field remained on
356 likely due to intrinsic changes in limb impedance and to an increase in robustness. In contrast,
357 there was no systematic directional bias in muscle state that could account for the rapid after-
358 effect in either condition (short and long dwell times), and these after-effects were statistically
359 similar despite the difference in co-contraction. In addition, we reported correlates of agonist
360 activity when exiting the via-point, and antagonist response when the force field was turned off.
361 These detailed EMG analyses allowed us to emphasize the impact of co-contraction, and to
362 dissociate it from the near-instantaneous after-effects that, we found, could be preserved in the
363 motor system for at least 850ms.

364 **DISCUSSION**

365 We investigated the temporal nature of rapid changes in movement representation due to
366 unexpected force field perturbations. For this, we have studied the reaching task through a via-
367 point on the pathway in two situations: one with very short residing time at the via-point
368 (ShortDwell) and the second with an imposed minimum 500ms dwell time at the via-point
369 (LongDwell). First, in support of previous works (Crevecoeur et al. 2020b, 2020a), we observed
370 feedback adaptation across no via-point trials evidenced by a reduction in target overshoot and
371 path length, when opposing force fields were applied randomly. That means online feedback
372 corrections were tuned to specific perturbation within each individual trial although the force
373 fields could not be anticipated. Additionally, the current dataset replicated the previous findings

374 (Crevecoeur et al. 2020a) that EMG imprints of changes in feedback corrections occurred
375 within 250ms of reach onset, with this cohort of participants (data not shown). Second, in via-
376 point trials, we observed the presence of an after-effect to the movement correction after the
377 via-point that was opposed to the perturbation experienced before, when participants exited the
378 via-point in less than 500ms (ShortDwell). Similar to standard after-effects evoked by a single
379 force field trial, the presence of after-effects after the via-point was understood as the expression
380 of changes in movement representation occurring online. Third, comparable after-effects in
381 terms of hand path deviation and peak lateral velocity were observed in behavior and EMG
382 recordings with an average 850ms dwell time at VP (LongDwell), and even beyond as observed
383 when the trials were split according to their actual dwell time. In all, our results showed that
384 somatosensory feedback about movement error could have long-lasting effects and be
385 preserved during intervals comparable to different conditions of movement planning as in the
386 context of trial-by-trial adaptation.

387 Our main motivation was to relate rapid after-effects evoked within a sequence of
388 movements with residing times of the order of less than 500ms to those expressed in a time
389 scale closer to a second. In standard reaching experiments, consecutive trials are typically
390 separated by a few seconds. A direct comparison between after-effects after the VP and those
391 following standard force field trials could not be conclusive because the limb configuration is
392 not the same, however since these rapid feedback-related adjustments were preserved up to a
393 time interval closer to one second, we suggest that they play a central role in well-known
394 standard trial-by-trial learning. In other words, trial-by-trial adaptation and after-effects would
395 result at least partially from within-movement neural processing associated with feedback
396 control.

397 *Adaptation of online feedback correction across trials*

398 In force field adaptation experiments, one common assumption is that the prediction by forward
399 models cannot change within a movement due to sensory delays, hence this mechanisms would
400 only be available after the trial and therefore the reaching movements that employ only a
401 feedforward controller could not account for the within-trial adjustments (Wada et al. 2003;
402 Yousif and Diedrichsen 2012). In such cases, since the motion-dependent adaptive responses
403 cannot be based on real-time sensory feedback, the feedforward adaptive responses must be
404 programmed in advance based on predictions (Sing et al. 2013) and the delayed feedback
405 responses were used to learn a predictive feedforward response (Thoroughman and Shadmehr
406 1999). Alternatively, real-time online corrections could be achieved through a feedback
407 controller that must contain a forward model capable of accurate real-time prediction of the
408 state of the limb, and combine the state predictions (Wagner and Smith 2008). In the case of
409 random inconsistent perturbations scenarios, it was shown that the gain of sensory feedback
410 responses appears to increase (Liu and Todorov 2007), and feedforward adaptive responses to
411 decrease (Gonzalez Castro et al. 2014). Such cases highlighted “the adaptation of online
412 feedback correction” (Joiner et al. 2017; Yousif and Diedrichsen 2012), more specifically
413 “feedback adaptation” i.e., trial-by-trial fine-tuning of feedback responses to the specific
414 perturbation happening within each trial (Crevecoeur et al. 2020b). In our case, across trials,
415 there is an accumulation of learning, but this is not due to the predictive factor, instead, we
416 argue that this is due to the feedback mediated online corrective process (feedback adaptation)
417 since it is expressed very quickly in the ShortDwell condition.

418 In line with these concepts, it was demonstrated that the prediction of the current state
419 of the limb could happen within long-latency feedback pathways (latency ~60-
420 100ms)(Crevecoeur and Kurtzer 2018; Crevecoeur and Scott 2013; Scott 2016), which is faster
421 than trial time. Long-latency feedback correction is also sensitive to force field adaptation and
422 can facilitate trial-by-trial learning (Ahmadi-Pajouh et al. 2012; Cluff and Scott 2013; Maeda

423 et al. 2020). Thus this pathway may support sensory-prediction and adaptation functionally,
424 and its latency relative to reach time leaves time for potential changes within a movement.
425 Without restricting to long-latency feedback, changes in feedback response were measured
426 within ~250ms of reach onset (Crevecoeur et al. 2020a). In all, we believe that the assumption
427 that movement representations are fixed within a reaching movement requires revision.

428 *Traces of online feedback correction as after-effects in VP trials*

429 In case of any perturbation during reaching movement, within a short period of movement
430 initiation, sensory feedback starts to influence motor command updating throughout the
431 movement (Brashers-Krug et al. 1996; Kawato 1999; Lackner and Dizio 1994; Shadmehr et al.
432 2010; Wolpert et al. 2011). Our developments suggest that a change in movement
433 representation occurs in parallel during movement. Then the question is how long does this
434 movement representation persist in the memory? Conventional trial-by-trial studies reported
435 the variation in hand dynamics and movement trajectory from one trial to another. In these
436 situations, there was an inter-trial interval of one or two seconds to return the hand to the starting
437 position either passively or actively (Caithness et al. 2004; Donchin et al. 2003; Gandolfo et al.
438 1996; Izawa et al. 2008; Kording et al. 2007; Smith et al. 2006; Tong and Flanagan 2003). The
439 idea of providing via-points in between the start and final position facilitated tracking the online
440 feedback mediated corrective processes and associated adaptation within chunks of movement.

441 In our case, first, during ShortDwell condition, we have observed clear after-effects
442 during the follow-through movement after VP (Fig 4 d,e,f). Why did the hand path deviate after
443 VP? After-effects are known to reveal the change in motor command and the nature of the
444 adaptive process by highlighting the discrepancy between expected and actual dynamics
445 (Bhushan and Shadmehr 1999; Shadmehr and Mussa-Ivaldi 1994). During the first phase of the
446 movement, the hand experienced perturbation and it has been shown that the hand force to
447 counteract this disturbance became tuned to the hand velocity, which was consistent with online

448 adaptation (Crevecoeur et al. 2020b). This corrective process and thus evolved movement
449 representation continued after VP as the CNS expected a continuation of perturbation. In the
450 absence of this, the discrepancy in the expected and actual hand dynamics resulted in an after-
451 effect.

452 *Long-lasting effects of somatosensory feedback about movement error: a basis of trial-by-*
453 *trial adaptation?*

454 Rapid feedback adaptation may still differ from the mechanism engaged in memory
455 retrieval associated with different planning conditions. Indeed, follow-through movements with
456 a short movement pause at VP reported that sensorimotor states that differ in their recent
457 temporal history (~600ms) could engage distinct representations, but importantly they decayed
458 over time (Howard et al. 2012). That means, the more you rest at VP (or stay at inter-trial
459 interval period), the associated plan started to fade and the memory of the force field could not
460 be recalled; Wainscott and colleagues reported a reduction in the interference of random
461 perturbation learning, when a perturbed movement followed the distinct previous movement,
462 within a time interval of 500ms (Wainscott et al. 2005). Also, even contextual pre-movement
463 (Sarwary et al. 2015), planning (Howard et al. 2015; Sheahan et al. 2016) or motor imagery
464 (Sheahan et al. 2018) of the second phase of follow-through movement could facilitate
465 simultaneous learning of opposing perturbations, provided with a short dwell time at a via-
466 point.

467 Our results contrast with differences in planning associated with a via-point, since in
468 our case we still observed significant after-effects during the second phase of the movement
469 (Fig 4 d,e,f), after residing time that exceeded the time associated with a decay in the motor
470 memory of 600ms. In light of these previous observations, the fact that the after-effects evoked
471 within a sequence with a via-point are stable across residing time intervals, is not a trivial result.
472 Indeed, one could have expected that the lifetime of the rapid adjustment paralleled its time

473 scale, as proposed in previous models that consider multiple time scales of adaptation (Kording
474 et al. 2007). In this scenario, it was reasonable to expect that a feedback related change in
475 movement representation within ~400ms (from starting point to VP), would disappear within
476 the next time window of similar length. It was clearly not the case. Thus it seems that feedback-
477 related changes in representation and differences evoked by distinct planning conditions do not
478 have the same dynamics and their respective roles in trial-by-trial adaptation remain to be
479 elucidated.

480 In our case, the feedback correction before the VP could play the same role as the lead-
481 in movement but surprisingly we did not observe that it decayed so quickly, and our data
482 suggested that it could even carry over across trials. The presence of feedback correction even
483 after a short pause of around 0-1500ms time duration at VP suggested that somatosensory
484 feedback about movement error could have long-lasting effects in comparison with different
485 conditions of planning, and these effects might constitute the basis of standard trial-by-trial
486 learning.

487 Our results support the view that standard aftereffects may directly follow from
488 feedback adjustments instead of requiring a subsequent re-planning. In ShortDwell scenario,
489 we found that the aftereffects are the result of online feedback control, rather than feedforward
490 control in the classical sense as this task did not involve a re-planning separated in time from
491 the first segment, instead, the aftereffect must have been related to immediate feedback
492 adjustments prior to the via-point. Similar aftereffects are observed in LongDwell condition,
493 which means that feedback-related change in movement representation is preserved and utilized
494 during the second chunk of movement. We exploited LongDwell condition as a bridge between
495 ShortDwell and ordinary trial-by-trial adaptation, so as to highlight the role of within movement
496 neural processing associated with feedback control.

497 The results in the current study are in a way congruent with others who tested different
498 inter-trial intervals, such that the feedback error memory trace (which sustains up to 4s)
499 continuously promotes adaptation until the next movement (Huang and Shadmehr 2007). Here
500 we attempted to dissociate feedback-related aftereffect that is preserved, from possible build-
501 up or consolidation, which requires longer inter-trial interval (Bock et al. 2005; Francis 2005;
502 Huang and Shadmehr 2007). Reduced inter-trial interval evokes error sensitive (feedback)
503 component to play a prominent role in adaptation than predictive–error-insensitive component.

504 *Feedforward and feedback processes interaction*

505 We clearly concentrate on feedback adaptation and highlight its potential contribution
506 but we do not reject the possibility that changes in movement representation occur offline,
507 similar to feedforward adaptation. In fact, previous studies have suggested that the feedback
508 response and feedforward adaptation could work independently at least to some extent (Kasuga
509 et al. 2015; Yousif and Diedrichsen 2012). However, our study raises the question of how much
510 feedback and feedforward adaptation truly differ, or under which circumstances does one
511 process prevail or influence the other. When we consider the no via-point trials with force fields,
512 intermixed with baseline and via-point trials, the influence of the anticipation component was
513 absent. In order to reveal the characteristics of online feedback corrections and feedback
514 adaptation, we exploited via-point trials. Since the movements observed as after-effects account
515 for both feedforward force patterns and feedback control gains (Bhushan and Shadmehr 1999),
516 the after-effects observed in our task during the second phase of movement carry the imprint of
517 changes in feedback responses, that might eventually update the feedforward process. In such
518 case, it could be that gradual changes in feedforward representation result from repeated
519 feedback corrections, which contrasts with previous models according to which changes in
520 feedback control follow feedforward adaptation (Ahmadi-Pajouh et al. 2012; Maeda et al. 2018;
521 Wagner and Smith 2008). Ultimately we do not discard feedforward control and we recognize

522 that there can be a sequential (feedback – feedforward – feedback) update at a time scale faster
523 than a trial but we believe it is more accurate to describe our findings in terms of an internal
524 representation, which changes very rapidly and within a trial.

525 CONCLUSION

526 In conclusion, our data further support that the fast time scales of motor adaptation are
527 sufficiently fast to influence an on-going movement, and the associated changes in movement
528 representation are preserved during intervals of time comparable to different conditions of
529 planning. Hence the imprints of online feedback adaptation could be a major component of
530 trial-by-trial adaptation in the motor system.

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