

1 **Mechanisms of responsibility assignment during redundant reaching**
2 **movements**

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5 Alexandra Reichenbach^{1*}, Angela Costello¹, Peter Zatzka-Haas¹, and Jörn Diedrichsen¹

6 ¹Institute of Cognitive Neuroscience, University College London, London, United Kingdom

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8 Running head: Online control of redundant movements

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10 * Correspondence:

11 Alexandra Reichenbach

12 Institute of Cognitive Neuroscience, University College London

13 Alexandra House, 17 Queen Square

14 London WC1N 3AR, United Kingdom

15 Phone: (44) 20 76795570

16 Email: a.reichenbach@ucl.ac.uk

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Abstract

20 When the two hands act together to achieve a goal, the redundancy of the system makes it necessary to
21 distribute the responsibility for error corrections across the two hands. In an experiment in which
22 participants control a single cursor with the movements of both hands, we show that right-handed
23 individuals correct for movement errors more with their non-dominant left than with their right hand,
24 even though the dominant right hand corrects the same errors more quickly and efficiently when each
25 hand acts in isolation. By measuring the responses to rapid cursor and target displacements using force
26 channels, we demonstrate that this shift is due to a modulation of the feedback gains of each hand,
27 rather than to a shift in the onset of the corrective response. We also show that the shift towards left-
28 hand corrections is more pronounced for errors which lead to adaptation (cursor displacements) than
29 for perturbations which do not (target displacements). This finding provides some support for the idea
30 that motor system assigns the correction to the most likely source of the error to induce learning and to
31 optimize future performance. Finally, we find that the relative strength of the feedback corrections in
32 the redundant task correlates positively with those found for the non-redundant tasks. Thus, the
33 process of responsibility assignment modulates the processes that normally determine the gains of
34 feedback correction, rather than completely overwriting them.

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37 Keywords

38 Reaching movements, redundancy, online corrections, visual perturbations

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Introduction

41 Human movements often involve a number of effectors or joints. When reaching for an object, we
42 normally use a combination of trunk, shoulder, elbow, wrist, and finger movements to efficiently
43 achieve our goal (Bernstein 1967; Diedrichsen et al. 2010). Indeed, one may argue that reaching
44 movements that are limited to shoulder and elbow joints, are only found in the laboratory setting,
45 where additional degrees of freedom are constrained to allow for a simplified kinematics and dynamic
46 analysis (Bhushan and Shadmehr 1999). In natural, free movements, most goal positions can be
47 achieved using a range of different joint combinations (Cirstea and Levin 2000). Given this natural
48 redundancy, motor commands have to be distributed across effectors. Furthermore, errors that occur
49 during the movement in one joint can be compensated for by adjustments in a combination of other
50 joints (Kurtzer et al. 2008). Thus, the motor system also needs to distribute responsibility for correcting
51 movement errors across the involved effectors.

52 How does the motor system solve this problem? One possibility is that the motor system
53 distributes the correction in such a way that it optimizes the performance for the *current* movement.
54 This can be achieved by using a control policy (Todorov and Jordan 2002) that minimizes the influence of
55 signal-dependent noise and the overall effort (Harris and Wolpert 1998; O'Sullivan et al. 2009). This
56 leads to solutions in which the faster and more accurate effectors contribute more to the correction
57 than the slower and less accurate ones. Alternatively, the motor system may assign the error to the
58 joints according to their probability of having caused the error, thereby adapting the presumably
59 maladapted joints and improving *future* performance of the whole system. This solution would require a
60 dedicated mechanism that assigns the error across effectors.

61 White & Diedrichsen (2010) studied the process of responsibility assignment using a bi-manual
62 reaching task. In the redundant version, participants had to hit one target with a single cursor, which
63 was displayed at the spatial midpoint between both hands. In this condition, a deviation of the cursor
64 from its desired path could have been caused by either the left or the right hand, or any combination of
65 the two. Accordingly, any combination of left or right hand movements could also correct for the error.
66 In this redundant situation, the motor system has to assign the responsibility to correct for the error to
67 the involved effectors. In the non-redundant version of the task, each hand moved independently to a
68 separate target. Errors therefore had to be corrected with the hand that encountered the error. In the
69 latter condition, corrections with the dominant right hand were faster and more precise (Elliott et al.

70 1999; Mieschke et al. 2001; Todor and Cisneros 1985). However, in the redundant task, right-handed
71 participants corrected for visually induced errors (cursor rotations) more with their non-dominant, left
72 hand. This suggests that the motor system assigned a larger portion of the correction to the hand that
73 more likely caused the error (the noisier left hand). This would have the advantage that the adaptive
74 change predominantly occurs in the appropriate effector. In favor of this interpretation, the authors
75 found a clear correlation between the distribution of corrections and the distribution of adaptive
76 changes on the next trial. In the present study, we now address three important questions about the
77 mechanism that underlies the assignment of responsibility for error corrections during redundant
78 movements.

79 First, we ask whether the process of responsibility assignment acts by modulating the time that
80 each effector needs to respond to the error, or whether it changes the feedback control gains, i.e. the
81 strength of the correction. While both would lead to a shift in the distribution of the overall correction in
82 the end of the movement, they would imply different neural mechanisms. The gradual nature of the
83 visual perturbation (cursor rotation) used by White & Diedrichsen (2010) does not allow
84 disentanglement of the temporal onset of a correction from its gain. In the present experiment, we
85 therefore displaced the visual cursors laterally at a specific time point during the first half of the
86 movement (Franklin and Wolpert 2008; Sarlegna et al. 2003; Sarlegna et al. 2004). To further improve
87 the measurements of the early corrective movement, we used “force channel” trials (Smith et al. 2006),
88 in which the reaching hands were constrained on a straight path to their respective targets. The onset
89 time and strength of the corrective action could therefore be determined from the force participants
90 exerted against the wall of the channel (Franklin and Wolpert 2008).

91 The hypothesis that the error is assigned to the most likely cause of the error (the non-dominant
92 hand) raises a second question. This assignment strategy certainly only makes sense for errors that may
93 be caused by internal noise or mis-calibration of the visuomotor system, and therefore actually require
94 learning (Diedrichsen et al. 2005). By contrast, one would expect that any error that does not require an
95 adaptive change should simply be corrected in the most effective manner, i.e. predominantly with the
96 dominant hand. White & Diedrichsen (2010) compared visual rotations of the cursors, i.e. internally
97 attributed errors that lead to strong adaptation responses, to displacements of the visual target
98 (Goodale et al. 1986; Prablanc and Martin 1992), i.e. externally attributed errors that do not lead to
99 visuomotor adaptation. While they found no difference in responsibility assignment in these two cases,
100 the finding is tempered by the fact that the cursor rotations and target displacements differed in their

101 temporal dynamics (gradual vs. abrupt). Here, we reinvestigate this question using abrupt lateral
102 displacements of the visual cursor instead of cursor rotations. This allowed us to directly compare
103 corrective movements in response to these two types of errors, because both perturbations had
104 precisely defined temporal onsets, comparable time courses, and the same magnitude.

105 Finally, we asked how responsibility assignment in redundant tasks interacts with the
106 mechanism that determines the feedback gains in non-redundant tasks. One possibility is that the
107 principles that determine the responsibility assignment in the redundant case are separate from the
108 principles that determine the feedback gains for both hands in the non-redundant tasks. This hypothesis
109 predicts that the bimanual correction asymmetry in the redundant task is either not correlated with the
110 correction asymmetry in the non-redundant task, or negatively correlated. The latter case would arise if
111 high variability in the left hand would lead to lower feedback gains in the non-redundant task (Todorov
112 2005), but also to higher gains in the redundant task, as the left hand becomes the more likely cause of
113 the error. Alternatively, the process of responsibility assignment may add to the existing underlying
114 feedback gains for the left and right hand. It would therefore reflect a compromise between optimizing
115 the performance on the current trial, and assigning the correction to the most likely cause of the error.
116 This hypothesis predicts that the correction asymmetries in the redundant and non-redundant tasks
117 correlate positively across participants.

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Material and Methods

120 *Participants*

121 Thirty-one neurologically healthy right-handed volunteers (experimental group 1: 19 participants, 20-36
122 years, 7 female; experimental group 2: 12 participants, 20-28 years, 6 female) were recruited from an
123 internal experiment database. All participants provided written informed consent prior to testing and
124 were paid as compensation for their time expense. They were naïve to the purpose of the experiment
125 and debriefed after the experimental sessions. The research ethics committee of University College
126 London (United Kingdom) approved all experimental and consenting procedures.

127 *Apparatus & Stimuli*

128 Participants were seated comfortably in front of a virtual environment setup, leaning slightly forward
129 with their forehead supported by a forehead rest. They made 15cm reaching movements away from
130 their body while holding onto a robotic manipulandum (update rate 1kHz, recording of position and
131 force data at 200Hz) with each hand. Movements were performed involving shoulder, elbow, and wrist
132 movements in the horizontal plane at chest height. A mirror that was mounted horizontally above the
133 manipulanda prevented direct vision of the hands, but allowed participants to view a visual scene on an
134 LCD monitor (update rate 60Hz). The visual display was arranged such that stimuli appeared to be
135 exactly in the depth-plane on which the hands moved. The movements were instructed using starting
136 boxes (unfilled white squares, 0.5cm size, 6cm to the left and right from body midline) and target
137 box(es) (unfilled white squares, 1cm size). Fixation had to be maintained on a white fixation cross
138 (0.5cm), which was located in between the target boxes. The hand positions were represented by
139 unfilled white circles (cursors, 0.3cm diameter) located vertically above the real positions of the hands.
140 All visual stimuli were displayed with a time delay of 68 ± 5 ms.

141 *Visual perturbations*

142 We applied two types of visual perturbation during uni-manual and bi-manual reaching movements. The
143 perturbations occurred once the average position of the two hands had moved 15% of the forward
144 distance to the target(s). One perturbation type consisted of a 2.5cm displacement of the visual cursor
145 in lateral direction (defined as the x-direction) either to the left or to the right (cursor displacement, CD).
146 The other perturbation type consisted of a 2.5cm displacement of the visual target in the lateral
147 direction either to the left or to the right (target displacement, TD). The necessary correction magnitude

148 for both perturbation types was equal since task success was defined in visual space. Only the direction
149 of correction was opposite, i.e. a target displacement to the right caused a corrective response to the
150 right while a cursor displacement to the right caused a corrective response to the left, and vice versa.
151 Both perturbations could easily be detected and participants were informed about their occurrence
152 before the experiment started.

153 ***Reaching conditions***

154 We used two non-redundant conditions (“uni-manual” and “two-cursor”) and one redundant condition
155 (“one-cursor”). The reaching conditions were blocked, and participants were informed before each block
156 which kind of reaching movements they were supposed to perform.

157 Uni-manual (UM): Non-redundant uni-manual reaching movements were executed with either the left
158 or right hand to a single target, while the other hand was static at its starting position. The target was
159 located 15cm directly ahead of the starting position of the respective hand. Either the target or the
160 cursor could be displaced to the left or to the right. Only participants from experimental group 1 were
161 tested on this condition, because we did not expect further insights from testing more participants on
162 this condition.

163 Two-cursor (TC): Participants executed bi-manual reaching movements, where each hand was
164 associated with its own cursor, yielding non-redundant movements. The cursors were located above
165 each hand, and each cursor had to reach its own target, which was located 15cm directly ahead of the
166 respective starting positions. Both the left and right cursor or target could be displaced in independent
167 directions (but at the same time), yielding 3 perturbation conditions: (a) a *single perturbation* was
168 applied either to the left or right hand; (b) *symmetric perturbations* occurred, such that both hands had
169 to respond with inward- or outward corrections (only experimental group 1); (c) *asymmetric*
170 *perturbations*, such that both hands had to respond with leftward or rightward corrections. Only one
171 type of perturbation (cursor or target) occurred within one trial. Because we did not find any significant
172 differences between perturbation conditions, we averaged the results of all two-cursor conditions,
173 analyzing the behavior of each hand relative to its own perturbation only.

174 One-cursor (OC): Redundant bi-manual reaching with a single cursor presented on the screen, which
175 was located at the midpoint between the physical positions of both hands. Therefore, each hand
176 contributed to half of the cursor motion. The goal of the movement was a single target located at body

177 midline, 15cm ahead of the starting positions. As in the other conditions, either the target or cursor was
178 displaced laterally.

179 ***Trial procedure***

180 Participants started a trial by moving the cursors into the starting boxes while keeping their eyes on the
181 fixation cross. After 800ms, the target box(es) appeared 15cm straight above the starting boxes, to
182 which participants were instructed to make fast and accurate reaching movements. In the one-cursor
183 condition, the two cursors disappeared upon target appearance and a single cursor was displayed at the
184 spatial midpoint between the two hands. The trial ended when the hand velocity remained below 3.5
185 cm/s for 40ms. A trial was considered valid when reaching time was shorter than 800ms and maximum
186 velocity ranged between 50 and 80 cm/s. Valid trials with endpoint accuracy of at least 7mm
187 contributed a single point each for the overall score and were rewarded with a visual target “explosion”
188 and a pleasant tone. A running score was continuously displayed above the targets. Feedback about
189 invalid trials, successful reaches, and increase in score was given via a color scheme at the end of each
190 trial. Participants were encouraged to use this visual feedback to adjust their movements on the
191 following trials if necessary.

192 In half of the trials, a “force channel” restricted the movements for a sensitive read-out of the feedback
193 responses (Franklin and Wolpert 2008; Smith et al. 2006). Force data obtained with this method is more
194 sensitive to the detection of responses to perturbations than position data from free reaching trials. The
195 sensitivity is in the same range as velocity data with having the advantage that the force is measured
196 directly and does not have to be derived, thus no additional noise is introduced. The force channel was
197 implemented with a spring-like force of 7000 N/m applied in lateral direction, which guided the hands
198 on a straight path to the targets. In these trials, the cursor or target displacements were reversed 250ms
199 after the initial displacement in order to enable task success. In the other half of the trials, the target
200 and cursor displacement remained, such that the participants needed to correct for the perturbations.

201 ***Session procedure***

202 An experimental session started with training blocks of all experimental conditions, but without force
203 channel trials in order to keep the decrease in force responses as low as possible throughout the
204 experiment (Franklin and Wolpert 2008). Training continued until at least 75% of trials produced by the
205 participant were valid. The participants of experimental group 1 were tested for all reaching conditions
206 in a blocked design with block order counterbalanced across participants. The one-cursor and both uni-

207 manual conditions were each tested in two blocks of fully randomized 48 trials each. Each block
208 contained 4 repetitions of the full permutation of all factors perturbation type (CD/TD/no perturbation)
209 x displacement (left/right) x force channel (yes/no). All two-cursor conditions were intermixed in six
210 two-cursor blocks, comprising 1/9 unperturbed trials, 2/9 two-cursor symmetric and asymmetric trials
211 each, and 4/9 single perturbation trials permuted with displacement (left/right) and force channel
212 (yes/no). Each of these blocks contained 48 fully randomized trials, leading to overall 8 repetitions per
213 condition. Participants were informed before each block whether the next block was uni-manual, one-
214 cursor, or two-cursor. Participants of experimental group 2 were only tested for the one-cursor, two-
215 cursor asymmetric, and two-cursor single conditions. Each of the 4 test blocks contained 80 trials, also
216 resulting in 8 repetitions per condition with an equivalent ratio of trial types as experiment 1. Within
217 each block, 24 one-cursor and 56 two-cursor trials were blocked with the order between these two
218 conditions counterbalanced across participants. Within the one-cursor and two-cursor sub blocks, the
219 order across trials was fully randomized.

220 ***Data analysis***

221 Invalid trials (6%) were excluded from further analysis, as they did not meet the movement time (<
222 800ms) or speed (50-80 cm/s) criteria. For each condition and participant, we could average over 6 to 8
223 repetitions. Movement start and end time-points were defined as the velocity exceeding or falling below
224 2.5 cm/s for at least 40ms. All position and force traces were aligned temporally to the onset of the
225 visual perturbations, or the point in time when the perturbation would have occurred for unperturbed
226 trials. For all analyses, we took the display time delay (68 ± 5 ms) into account.

227 To assess the size of the corrective responses, we measured the lateral forces exerted into channels
228 (perpendicular to the reaching direction, Fig. 1). A measure of correction strength for each hand was
229 obtained by taking the difference between the force correcting for leftward displacements and the force
230 correcting for rightward displacements. This subtraction automatically removed any constant forces in
231 the channel that were caused by the biomechanical properties of the arm and robot. To obtain a time-
232 averaged single measure for each hand and correction type, we averaged the force difference in the
233 time interval from 180 to 330 ms after perturbation onset (*CorrectionStrength*). Additionally, we
234 calculated the size of the final correction on trials without force channels. For this measure, we also
235 used only the component in the direction of the perturbation: the correction in lateral direction at the
236 end of the movement. Here, we averaged over leftward and rightward corrections of the same hand, in
237 each case coding the expected response as a positive value. Thus, a correction with an extent of 25mm

238 constitutes a full correction for the perturbation. The onset time of the corrective movement was
239 assessed using only the force channel trials, as this data provides the most time sensitive information
240 about corrections. For each subject and condition, we applied t-tests between the force traces of all
241 leftward and rightward corrections until at least 4 consecutive tests revealed differences on a
242 significance level of $p < .05$. The time stamp of the first of those 4 consecutive tests was taken as onset
243 time.

244 As the interest of this study focused on the differences between redundant and non-redundant
245 movements, the main comparisons are between the one-cursor and two-cursor conditions. Whenever
246 the goal of the analysis was to confirm hypotheses based on the results of previous studies, we
247 computed one-sided t-tests according to these hypotheses. For demonstrating novel effects or
248 interactions, we computed two-sided t-tests or repeated measures ANOVAs. Corrections for multiple
249 comparisons were performed using Bonferroni corrections where necessary. *P* values smaller than .05
250 are reported as significant. All values reported are mean values across participants with their respective
251 standard deviations unless stated otherwise.

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Results

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Errors in the redundant task are mostly assigned to the left hand.

All participants showed fast movement corrections that specifically counteracted the displacement of cursor or target: When a cursor was displaced to the right, the hand(s) responsible for the cursor's movement pressed leftwards into the channel. By contrast, when a target was displaced to the right, the hand(s) controlling the cursor to that target pressed rightward into the channel. Figure 1 illustrates the difference in force between leftwards and rightward displacements, in such a way that positive values indicate a corrective response in the expected direction. In all conditions, the feedback correction began around 200ms after the visual perturbation.

<insert figure 1 about here>

The amplitude of the corrective response, however, varied substantially between hands and conditions. For the non-redundant reaching conditions (two-cursor and uni-manual), the forces were usually higher for the right hand. To quantify this observation, we averaged the force difference between displacements to the left and right over the time interval from 180 to 330 ms after the visual perturbation (*CorrectionStrength*). We then used the difference in strength between the hands (right hand *CorrectionStrength* subtracted from left hand *CorrectionStrength*) as our measure of hand asymmetry (Fig 2).

<insert figure 2 about here>

In non-redundant conditions, the right hand exerted larger forces than the left hand. These differences were significant for both cursor displacement conditions (TC: $t_{30} = 2.65, p < .01$; UM: $t_{18} = 2.55, p = .01$). For target displacements, the measured left-right hand differences were smaller and did not differ significantly from symmetry (TC: $t_{30} = 1.27, p = .10$; UM: $t_{18} = 1.04, p = .16$). Overall, however, these results demonstrate that the feedback gains in non-redundant reaching are higher for the right than for the left hand.

In contrast, for the redundant one-cursor task, the left hand pushed stronger in the force channel than the right hand (Fig 1). The between-hand difference was significant for cursor ($t_{30} = 2.84, p < .01$), as well as for target ($t_{30} = 2.30, p < .05$) displacements. Importantly, a direct comparison of the asymmetry scores confirmed that participants indeed switched from stronger right-hand feedback gains for the

281 non-redundant condition to stronger left-hand feedback gains for the redundant condition (cursor
282 displacement: $t_{30} = 4.75$, $p < .001$; target displacement: $t_{30} = 3.50$, $p < 0.01$). This difference in the
283 distribution of feedback corrections was not associated with a systematic change in the kinematic
284 parameters during unperturbed movements (Table 1). Thus, we replicated the previously reported
285 change in the assignment of corrections (White and Diedrichsen 2010).

286 In summary, our results show that responsibility assignment in redundant movements is not solved by
287 each hand independently responding as strong as it would alone. Rather they indicate that feedback
288 corrections are assigned to the effectors in a different manner in the redundant situation.

289 *<insert table 1 about here>*

290 ***Responsibility assignment modulates feedback gain, not temporal onset***

291 To further characterize the mechanism of responsibility assignment, we asked whether the shift in
292 correction asymmetry was caused by a difference in the temporal delay of correction between the
293 hands, or only by a difference in the magnitude of corrective force applied with each hand. All results
294 reported so far were manifest in the initial force with which the hands corrected for the sudden
295 movement error, i.e. the correction gain of each hand. In contrast, the onset time of the corrections did
296 not change systematically with condition (cf. Fig. 1). The mean onset time ranged from 162 to 194 ms,
297 and a repeated-measures ANOVA with the factors reaching condition (OC/TC/UM) x perturbation
298 (cursor/target) x hand (left/right) revealed neither a significant main effect, nor any interaction. Even
299 though the right hand responded slightly faster to cursor displacements in the two-cursor condition (t_{30}
300 = 1.71; $p < .05$), this advantage neither reversed for the redundant condition, nor was there a difference
301 in correction onset in any other condition. Thus, the process of responsibility assignment results in a
302 modulation of the response gain of each hand, not in a difference in the reaction time with which each
303 hand responded to the perturbation.

304 ***Shift in correction asymmetry to the left hand when introducing redundancy is more*** 305 ***pronounced for cursor than for target perturbations***

306 The reasoning behind our hypothesis that right-handed participants correct more with the left hand in
307 the redundant task is that this less-skilled hand has a higher probability of having caused the error. This
308 would be functional, as the hand that corrects more also adapts more (White & Diedrichsen, 2010).
309 Thus, the shift to the left-hand would ensure that the most likely source of the error experiences

310 stronger adaptation. A prediction following from this hypothesis is that the shift towards the left hand
 311 should be stronger for perturbations requiring adaptation of future movements (an error in the internal
 312 representation of the motor system, thus most likely a systematic error) compared to perturbations not
 313 leading to visuomotor adaptation (a change in the environment, thus most likely a random error).

314 To test this prediction, we first had to establish that there is indeed more adaptation for cursor
 315 displacements than for target displacements. While it is well established that the *gradual* visual rotation
 316 of the cursor leads to adaptation of the next movement (Diedrichsen et al. 2005), this has not been
 317 shown for *sudden* cursor displacements as employed here. We therefore assessed the trial-by-trial
 318 adaptation rates for both cursor and target displacements. For this analysis, we only used trials in which
 319 a free-reaching trial with a perturbation was followed by another free-reaching trial. The initial
 320 deviations from a straight path to the target in the follow-up trials (measured 200ms in the movement)
 321 relative to the prior perturbations yielded the adaptation rates. A repeated-measures ANOVA confirmed
 322 that cursor displacements caused higher adaptation rates than target displacements ($F_{1,16} = 9.84, p < .01$;
 323 cursor: 0.13 ± 0.23 ; target: 0.03 ± 0.23).

324 Based on these results, our hypothesis would now predict that the asymmetry shifts more towards the
 325 non-dominant left hand for on-line corrections to cursor displacements (internal error) than to target
 326 displacements (external error). Indeed, the pattern of results (Fig 2) confirms this prediction: The on-line
 327 correction asymmetry was biased more toward the left hand for cursor than for target displacements
 328 ($t_{30} = 2.49, p < .05$). Furthermore, the *shift* in correction asymmetry resulting from introducing
 329 redundancy, i.e. the difference between the correction asymmetries in the redundant one-cursor and
 330 non-redundant two-cursor condition, was significantly larger for cursor than for target displacements
 331 ($t_{30} = 3.18, p < .01$).

332 The asymmetry pattern found in the early corrections was sustained until the end of the movements, as
 333 visible in the free reaching trials without the force channel. In these trials, the spatial amplitude of the
 334 correction at the end of the movement was larger for the right than for the left hand in all non-
 335 redundant conditions. For corrections to cursor displacements the difference was significant (TC: $t_{30} =$
 336 $2.50, p < .01$, LH: 13.6 ± 6.0 mm, RH: 15.8 ± 5.7 mm; UM: $t_{18} = 2.10, p < .05$, LH: 19.0 ± 5.6 mm, RH:
 337 21.5 ± 5.0 mm). However, for corrections to target displacements the difference was weaker (TC: $t_{30} =$
 338 $1.00, p > .1$, LH: 18.3 ± 6.8 mm, RH: 19.1 ± 6.1 mm; UM: $t_{18} = 0.72, p > .2$, LH: 20.9 ± 7.8 mm, RH:
 339 21.7 ± 6.2 mm). Moreover, we found a similar effect for the endpoint accuracy for unperturbed

340 movements (Table 1). The accuracy was significantly better for the right than for the left hand, both for
341 bi-manual two-cursor ($t_{30} = 8.17, p < .001$), and for uni-manual movements ($t_{18} = 5.69, p < .001$).

342 For the redundant movements, the correction effect reversed: The magnitude of end correction for
343 cursor displacements was significantly smaller for the right than for the left hand ($t_{30} = 3.11, p < .01$, LH:
344 20.5 ± 10.0 mm, RH: 14.4 ± 7.1 mm). Again, the difference failed to reach significance for the target
345 displacements ($t_{30} = 0.72, p > .2$, LH: 13.8 ± 10.2 mm, RH: 12.7 ± 8.1 mm). For cursor displacements, the
346 difference in the final amplitude between the left and right hand changed significantly from the non-
347 redundant to the redundant condition ($t_{30} = 2.81, p = .01$). This shift was not significant for target
348 displacements ($t_{30} = 1.12, p > .2$). Finally, the *shift* in correction asymmetry resulting from introducing
349 redundancy was significantly larger for cursor than for target displacements ($t_{30} = 4.53, p < .001$).
350 Therefore, the pattern of correction amplitudes at movement end closely resembled the pattern found
351 in the early corrective movements in the force channels.

352 Taken together, our results argue that responsibility assignment shifts the main weight of correction
353 towards the left hand for redundant tasks, and that it does so especially for perturbations that lead to
354 strong visuo-motor adaptation. In contrast, we found smaller shifts in asymmetry for target
355 displacements, for which adaptation rates were much lower.

356 ***Responsibility assignment for redundant movements modulates, rather than replaces, non-*** 357 ***redundant feedback gains***

358 Finally, we sought to determine how the mechanism of responsibility assignment for redundant
359 movements interacts with the mechanism that determines the gain of feedback responses for non-
360 redundant movements. We considered two possibilities: First, it could be that the feedback corrections
361 for non-redundant and redundant movements are determined following two completely different
362 principles. During non-redundant movements, each hand would show a feedback gain that reflects the
363 accuracy of this hand. For example, participants with a large difference in accuracy between hands
364 would exhibit larger feedback gains for the dominant right than the non-dominant left hand as
365 compared to more ambidextrous participants. For redundant movements, those participants would
366 assign responsibility preferentially to the noisier left hand. Following this idea, we would expect that a
367 person who exhibits stronger feedback responses with the right than with the left hand during non-
368 redundant tasks, should show a preference for the left hand during redundant tasks.

369 Alternatively, responsibility assignment may add to the existing gains of the left and right hand by
370 biasing the preference towards the non-dominant left hand, but not completely overwriting or reversing
371 the existing difference in feedback gains. In this case, we would expect that the correction asymmetries
372 for redundant and non-redundant movements correlate positively – i.e. a person exhibiting stronger
373 feedback responses with the right than with the left hand during non-redundant tasks, would exhibit a
374 weaker preference for the left hand during redundant tasks.

375 Consistent with the second idea, we found significant positive correlations for both perturbation
376 conditions (Fig. 3 middle panel; cursor displacement: $r = .42, p < .05$; target displacement: $r = .48; p <$
377 $.01$). This means that the existing correction asymmetry is shifted towards the non-dominant hand upon
378 introducing redundancy. Thus, there seems to be an individual hand preference for corrections, which is
379 biased towards the dominant hand in non-redundant movements, and shifted towards the non-
380 dominant hand when redundancy is introduced.

381 If there were stable inter-individual differences in how the feedback gains for the two hands are set,
382 then participants with a strong asymmetry for cursor displacement should also show a strong
383 asymmetry in the same direction for target displacements. Indeed, the correlations in hand asymmetry
384 between corrections to cursor and target displacements were strongly positive, both for redundant ($r =$
385 $.84, p < .001$) and non-redundant ($r = .86, p < .001$) reaching movements (Fig. 3 top and bottom panel). It
386 is noteworthy to emphasize that cursor and target displacements were randomly intermixed within each
387 block, while the reaching conditions were blocked, which might explain the more robust correlations
388 between error types. Overall, these findings show that there is a stable individual trait, which
389 determines the relative feedback gains for the left and right hand that applies to all conditions.
390 Responsibility assignment then acts on top of the existing preference, depending on specific task
391 constraints and requirements by shifting the correction asymmetry towards the non-dominant hand.

392 *<insert figure 3 about here>*

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Discussion

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The present study served to further illuminate the mechanisms underlying the assignment of responsibility for movement corrections across different effectors in a redundant reaching task. Our results confirm previous reports that the dominant hand shows stronger feedback corrections than the non-dominant hand (Elliott et al. 1999; Mieschke et al. 2001; Todor and Cisneros 1985), and that this asymmetry reverses for redundant movements (White and Diedrichsen 2010).

Furthermore, we demonstrate here that the asymmetry change was not driven by different onset times of the corrections between hands, but explained entirely by the feedback gains of the corrective responses. The previous study (White and Diedrichsen 2010) found changes in both strength and onset time; however, in this study the authors relied on kinematic measures relatively late in the movement. In contrast, our current study was specifically designed to detect the earliest possible responses to visual perturbations using rapid spatial displacements of cursor and target, and force channel trials to measure the reactive responses. This methodology allowed us to reliably disentangle amplitude and onset time of the corrective movements. We clearly showed that the responsibility assignment acted through a modulation of the gain of the response, leaving the onset times unchanged. In that aspect, the assignment process is similar to the up- or down-regulation of the visual reflexes with changes in model uncertainty (Franklin et al. 2012).

Based on the finding of White & Diedrichsen (2010) that the correction asymmetry in redundant movements is positively correlated with the subsequently adapted behavior, we hypothesized that the movement error and its correction is assigned preferentially to the more likely source of the error, the less reliable non-dominant hand, in order to adapt specifically this effector. In favor of the hypothesis, we found that the correction asymmetry is indeed more pronounced for internally attributable errors, for which an adaptation would be functional, than for externally attributable errors. Thus, the visuomotor system may strive to optimize not only current, but also future performance by preferentially adapting the presumably mis-calibrated joint. However, we also found a weaker, but still significant shift from stronger right-hand to stronger left-hand corrections for target displacement, for which the motor system shows a much lower adaptation rate (see our results and also Diedrichsen et al. (2005)). This low adaptation rate can be regarded as a sign that the motor system attributes these errors to an outside and unstable source (Berniker and Kording 2008). Given this, it is unclear why it still shifts

423 the main work of the correction to the left hand. These results therefore indicate that our main
424 hypothesis is not the complete story yet.

425 We therefore considered here two alternative explanations for the leftward shift of corrections
426 during target displacements. First, using the left hand more for movement corrections in the redundant
427 task may actually improve the performance on the current movement. This explanation is consistent
428 with the claim that the right hemisphere (and hence the left hand) is specialized for postural tasks and
429 endpoint corrections, whereas the left hemisphere (and therefore the right hand) is specialized for
430 dealing with the arm dynamics and online corrections during the movement (Sainburg and Kalakanis
431 2000; Schaefer et al. 2012). We think that this explanation is unlikely, however. First, in non-redundant
432 movements, the right hand was not only superior to the left hand in terms of the strength of the early
433 corrective response, but also in the final endpoint errors, which were consistently lower for the right
434 than for the left hand, both for perturbed and unperturbed trials. Additionally, the right-to-left shift in
435 the feedback gains from non-redundant to redundant movements was found already in the earliest
436 response, not only in the end of the movements when the left-hand advantage would arise.

437 Alternatively, it is possible that the stronger left-hand corrections in the redundant task serve to
438 optimize future, rather than current performance – even during target displacements. While visuomotor
439 adaptation rates were close to zero for this condition, adaptation is not the only learning mechanism
440 that improves future performance (Huang et al. 2011). The non-dominant hand would profit more from
441 training corrective movements: The performance of the non-dominant hand is worse than the
442 performance of the dominant hand, as evident both in correction strength and end accuracy. Thus, skill-
443 learning mechanisms could improve online corrections especially for the non-dominant hand. Whether
444 this or possible alternative explanations can account for the responsibility assignment for error
445 corrections remains a question for future research.

446 Our final result allows some insight into how the process of responsibility assignment interacts
447 with the processes that determine the strength of feedback corrections during non-redundant tasks.
448 First, we found that the right-left preference appears to be a stable intra-personal trait across all tasks
449 and error types. Naturally, the intrinsic properties of each effector remain relatively constant across all
450 conditions. We then found that the balance between the left and right hand corrections for the
451 redundant task was positively correlated with the differences in correction strength in the non-
452 redundant bi-manual task. Therefore, the shift towards the non-dominant hands was achieved by
453 adding to existing differences in feedback gains, rather than by setting them using a completely different

454 principle. Thus, the visuomotor system optimizes the movements in a redundant system by modulating
455 the existing feedback mechanisms that normally determine the gain of the response.

456 In summary, our results confirm previous findings that right-handers correct more with their
457 non-dominant left hand in a redundant task, while they otherwise show stronger corrections with the
458 right hand. We further demonstrate that this change is caused by a shift in feedback gains, rather than
459 by a change of the onset times of the corrective responses, and that it acts additively on existing left-
460 right preferences. While the ultimate reason for the right-to-left hand shift for redundant movements
461 remains to be further investigated, our results demonstrate that the preference for left-hand
462 corrections in redundant movements is a replicable and stable phenomenon.

463 **Acknowledgements**

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Figure captions

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529 *Figure 1* Feedback corrections for the left and the right hand in response to (A) cursor
530 displacements and (B) target displacements in all reaching conditions. The traces depict the difference in
531 force exerted laterally in the channel between left- and rightward displacements of each hand, aligned
532 to the moment of visual perturbation (0ms). Note that the middle panels depict the data pooled over all
533 two-cursor conditions. The dashed lines mark the time period, over which the forces were averaged to
534 obtain the measure *CorrectionStrength* (180-330 ms). Shaded areas denote standard errors across
535 participants.

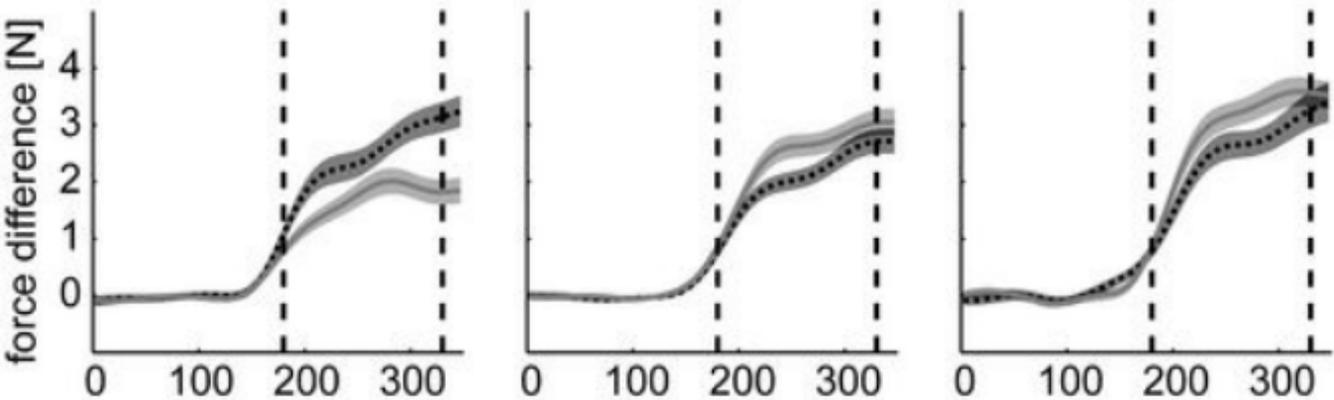
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537 *Figure 2* Asymmetry in feedback correction: Differences between hands (left – right hand) for
538 corrective force responses (*CorrectionStrength*) to cursor displacements (A) and target displacements (B)
539 for each reaching condition. Correction asymmetry > 0N represent left hand (LH) dominance, < 0N
540 represent right hand (RH) dominance. Above the boxes: paired t-tests left vs. right hand (one-sided
541 according to the hypotheses). Between the boxes: interaction between hands and reaching condition. *
542 $p < .05$; ** $p < .01$.

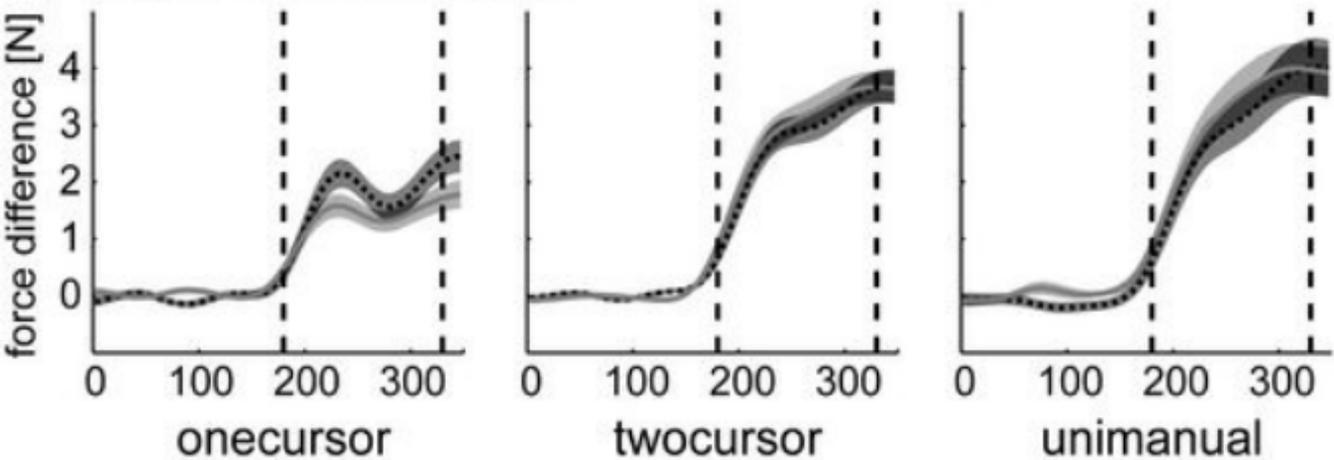
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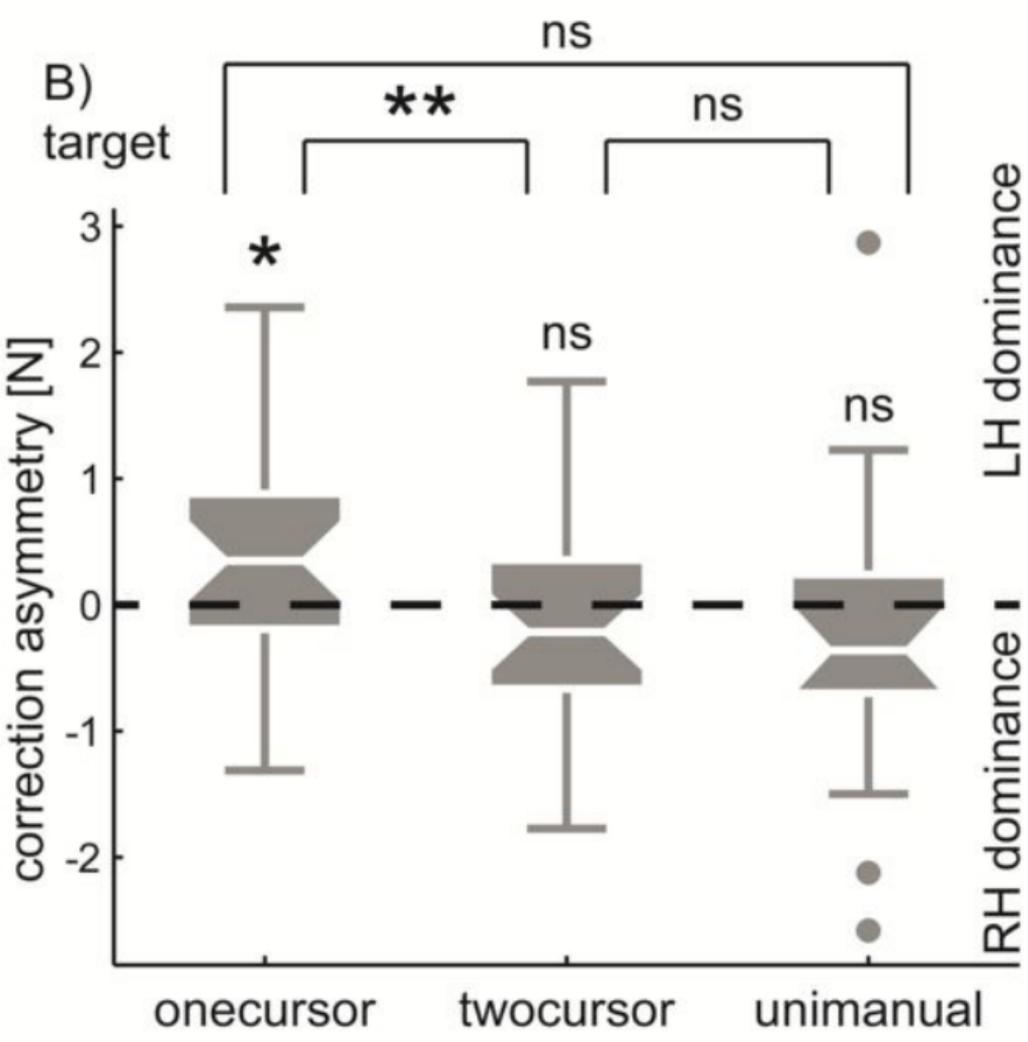
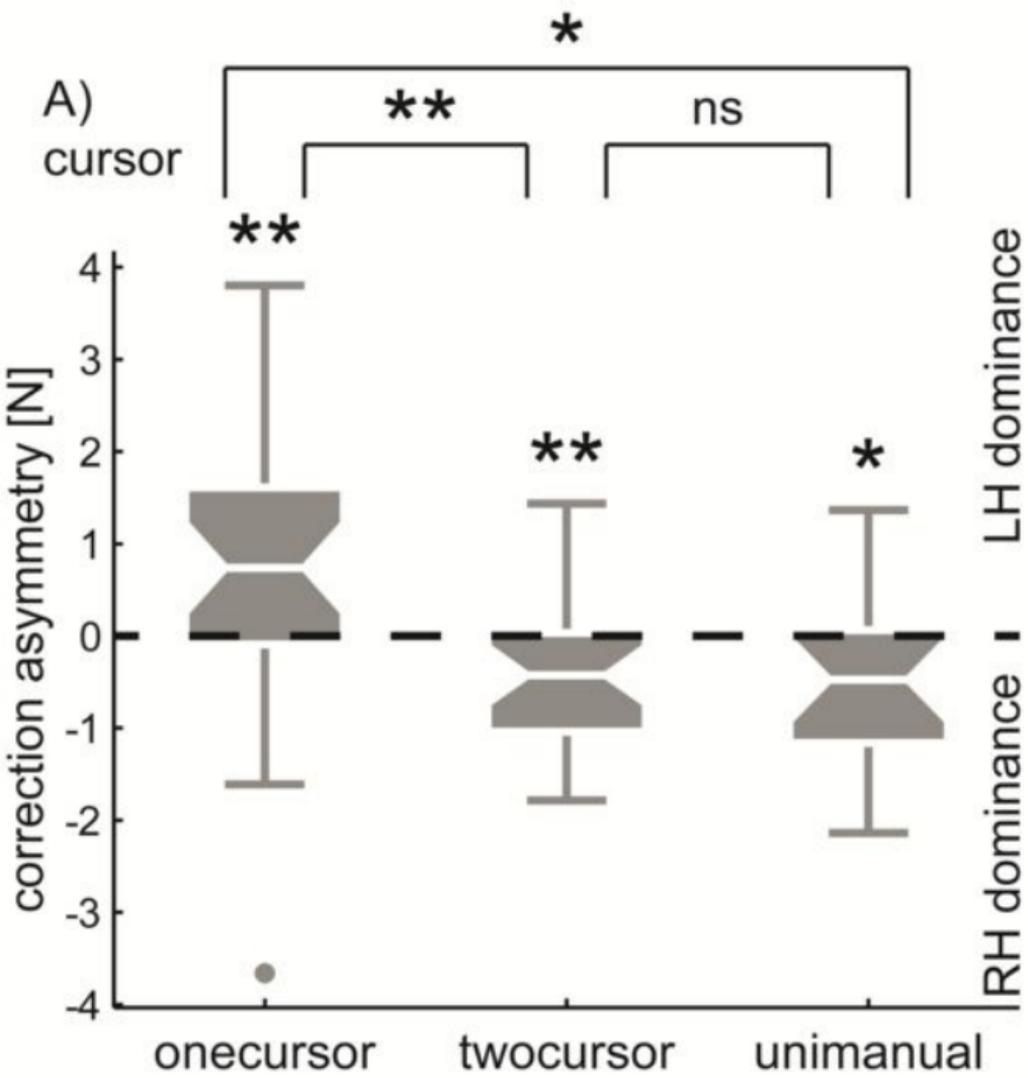
544 *Figure 3* Across-subject correlations of correction asymmetry between all bi-manual conditions.
545 The distributions of the correction asymmetries for the four conditions (error type x redundancy) are
546 illustrated in the corners with the same conventions as in Fig. 2, while their corresponding correlations
547 are depicted between these distributions.

A) cursor displacements left hand — right hand

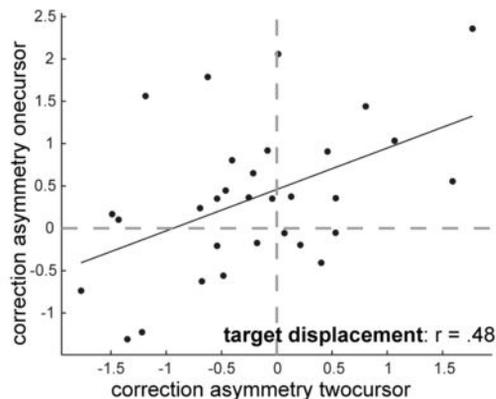
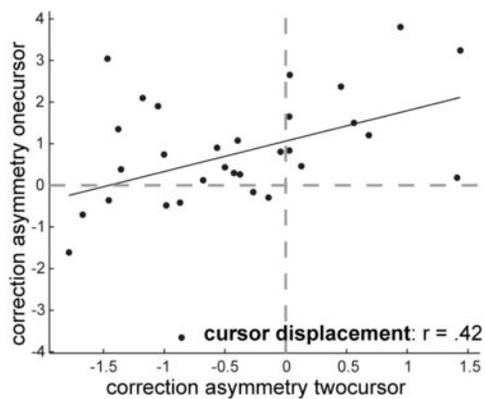
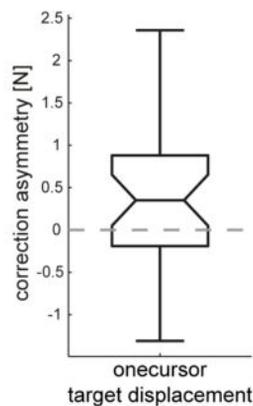
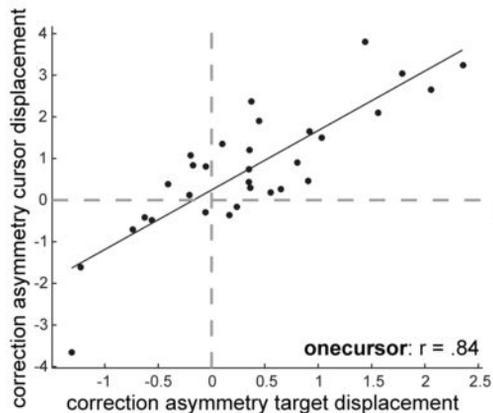
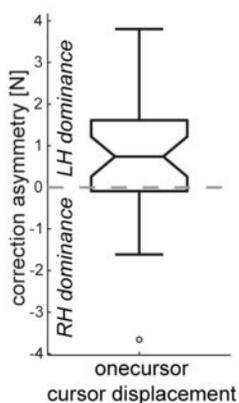


B) target displacements





redundant



non-redundant

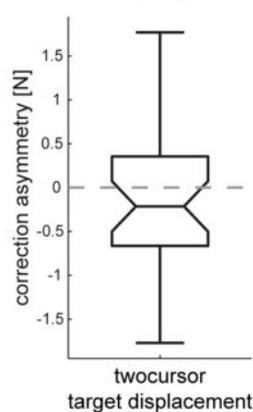
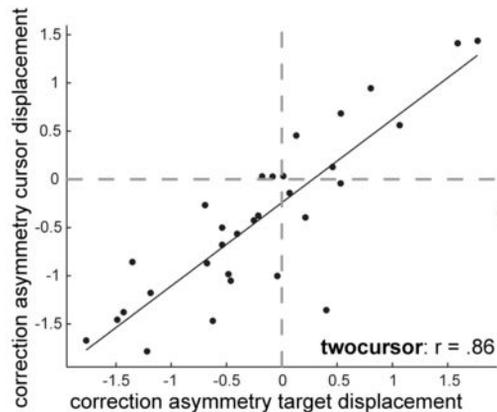
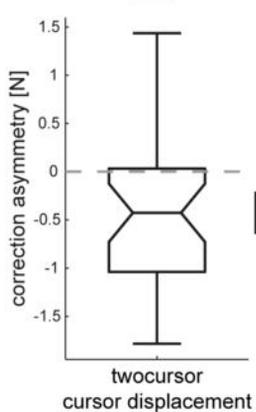


Table 1: Additional kinematic parameters for unperturbed movements (mean \pm standard deviation)

	<i>peak velocity [cm/s]</i>		<i>y-distance [mm]</i>		<i>end accuracy [mm]</i>	
	left hand	right hand	left hand	right hand	left hand	right hand
<i>two-cursor</i>	59.1 \pm 5.8	58.6 \pm 5.4	15.4 \pm 0.4	15.2 \pm 0.3	9.7 \pm 2.9	7.2 \pm 2.4
<i>uni-manual</i>	58.2 \pm 5.6	57.2 \pm 6.2	15.3 \pm 0.4	15.1 \pm 0.2	8.6 \pm 2.1	6.5 \pm 1.3
<i>one-cursor</i>	58.5 \pm 6.2	57.1 \pm 5.5	15.3 \pm 0.9	14.9 \pm 0.7	cursor overall: 12.3 \pm 4.5	

The peak velocity of unperturbed movements differed neither between hands nor between reaching conditions. The y-distance of unperturbed movements, defined as the difference between start and end location of each hand in direction of the reach, differed between reaching conditions ($F_{2,36} = 3.83$; $p < .05$), but was neither influenced by hand ($F_{1,18} = 3.98$; $p > .05$) nor did reaching condition interact with hand ($F_{2,36} = 0.75$; $p > .7$). The end accuracy, defined as the absolute distance between the end position(s) of the cursor(s) and the corresponding target(s), was significantly better for the right than for the left hand for all non-redundant conditions ($t > 5$; $p < .001$). This measure was calculated on unperturbed movements only in order to distinguish reaching accuracy from the size of feedback corrections.