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Positive and negative stroke signs revisited: dissociations between synergies, weakness, and impaired reaching dexterity

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1 **Abstract**

2 Most stroke victims experience motor deficits, usually referred to collectively as hemiparesis. While
3 hemiparesis is one of the most common and clinically recognizable motor abnormalities, it remains under-
4 characterized in terms of its behavioral subcomponents and their interactions. Hemiparesis is comprised of
5 both negative and positive motor signs. Negative signs consist of weakness and loss of motor control
6 (dexterity), whereas positive signs consist of spasticity, abnormal resting posture, and intrusive movement
7 synergies (abnormal muscle co-activations during voluntary movement). How positive and negative signs
8 interact, and whether a common mechanism generates them, remains poorly understood. Here we employed
9 a planar, arm-supported reaching task to assess post-stroke arm dexterity loss, which we compared to the
10 Fugl-Meyer stroke scale; a measure primarily reflecting abnormal synergies. We examined 53 patients with
11 hemiparesis after a first-time ischemic stroke. Reaching kinematics were markedly more impaired in
12 patients with subacute (<3 months) compared to chronic (>6 months) stroke even when matched for Fugl-
13 Meyer score. This suggests a dissociation between abnormal synergies (reflected in the Fugl-Meyer scale)
14 and loss of dexterity, which in turn suggests different underlying mechanisms. Moreover, dynamometry
15 suggested that Fugl-Meyer scores capture weakness as well as abnormal synergies, in line with these two
16 deficits sharing a neural substrate. These findings have two important implications: First, clinical studies

1

17 that test for efficacy of rehabilitation interventions should specify which component of hemiparesis they
18 are targeting and how they propose to measure it. Second, there may be an opportunity to design
19 rehabilitation interventions to address specific subcomponents of hemiparesis.

20 **Introduction**

21 Stroke is one of the leading causes of disability globally, with an estimated 13.7 million individuals
22 suffering a stroke each year (Johnson et al. 2019). A large fraction of strokes (up to 70-80%) results in some
23 degree of motor impairment (Nakayama et al. 1994; Rathore et al. 2002; Parker, Wade, and Hewer 1986),
24 which makes activities of daily living harder, compromising quality of life (Niemi M L et al. 1988; Viitanen
25 et al. 1988). Hemiparesis (or upper motor neuron syndrome) is clinically quite recognizable but remains
26 surprisingly under-characterized in terms of its behavioral components. It has been known since the late
27 19th century that hemiparesis is comprised of loss of ability (negative signs) and an intrusive movement
28 disorder (positive signs) (Hughlings Jackson 1884; Pearce 2004). Negative signs consist of weakness and
29 loss of dexterity or fractionated motor control, whereas positive signs consist of spasticity, abnormal resting
30 postures, and abnormal synergies whereby multiple muscles or joints become co-activated during voluntary
31 movement. How positive and negative signs relate to each other remains poorly understood. Bridging this
32 knowledge gap will be essential for the treatment of hemiparesis, as it will allow us to (a) different
33 components of hemiparesis, allowing clinicians to more reliably track motor recovery after stroke, (b) better
34 isolate and target individual components to make rehabilitation more effective, and (c) better assess the
35 efficacy of rehabilitation interventions.

36 Among positive signs of stroke, abnormal synergies have been the focus of particular attention and widely
37 recognized as a crucial characteristic of motor impairment after stroke. Thomas Twitchell's classic work
38 (Twitchell 1951) describes the time course of recovery of voluntary movement after stroke, from plegia to
39 flexor then extensor synergies to out-of-synergy movements. Given that recovery can get stuck at any point
40 along this sequence, Signe Brunnstrom (Brunnstrom 1966) suggested therapeutic procedures to increase
41 the chance of a patient progressing through it. A scale was subsequently developed to measure and track
42 recovery from synergies – the Fugl-Meyer scale (Fugl-Meyer et al. 1975).

43 The negative signs of stroke are weakness and loss of dexterity or motor control. Dexterity generally refers
44 to the ability to flexibly and independently control muscles and joints to generate the movement repertoire
45 required by a given task. Importantly, the term should not be considered synonymous with or reserved for
46 finger movements. Dexterity might require practice and, after stroke, it can recover independently of
47 weakness (Cortes et al. 2017; Xu et al. 2017). Notably, the intrusion of abnormal synergies might mask
48 dexterity. A previous study showed that when patients with chronic stroke made 3D reaching movements

49 within synergy, trajectories appeared comparable to those made by healthy controls (Zackowski et al. 2004).
50 In contrast, when these same patients attempted an out-of-synergy reach that required elbow extension, the
51 trajectory was degraded by an intrusive flexor synergy. This intrusion is thought to be invoked in part by
52 the patient needing to lift their arm against gravity, as several studies have shown that external support of
53 the weight of the arm can reduce the effect of abnormal synergies and increase the arm's available
54 workspace (Beer et al. 2007; 2004; Sukal, Ellis, and Dewald 2007). Thus, here we examined the relationship
55 between abnormal synergies and loss of arm dexterity after stroke. To obtain a measure of arm dexterity
56 loss, we quantified kinematics in a planar reaching task. The apparatus provided full support of the weight
57 of the arm, allowing us to assess arm dexterity while minimizing weakness and the intrusion of synergies;
58 moreover, the apparatus constrained the trunk, minimizing the use of compensatory strategies. To measure
59 the extent of abnormal synergies, we used the Fugl-Meyer scale for the upper extremity (FM-UE), which
60 was specifically designed to quantify abnormal synergies post-stroke (Fugl-Meyer et al. 1975; Brunnstrom
61 1966; Twitchell 1951). Because recovery of reaching dexterity and abnormal synergies may have different
62 time courses, we compared them at two different times post-stroke (Bernhardt et al. 2017): during the early
63 and late sub-acute stage (up to 3 months post-stroke) and the chronic stage (at least 6 months post-stroke).
64 We also assessed weakness in a subset of the patients using dynamometry.

65 **Materials and Methods**

66 **Participants and Ethics Statement**

67 Participants were recruited as part of a multiple-task study of the motor learning, control, and physiology
68 of stroke patients (PaLaS study, Physiology and Learning after Stroke). The study compared these
69 modalities between two stages in recovery: subacute (< 3 months post-stroke) and chronic (> 6 months
70 post-stroke). Table 1 shows details for each of the 53 stroke patients (27 subacute, 26 chronic) included in
71 this paper, whereas Table 2 shows summary demographics and assessment metrics for the two patient
72 groups and 17 healthy, age-range-matched controls (age comparisons between controls and either patient
73 group, or between patient groups: all $p>0.3$). Recruitment and data collection took place in Johns Hopkins
74 University and the Kennedy Krieger Institute in Baltimore, MD from December 2015 through February
75 2020; participant flow through the study is shown in Figure 1. Patients were recruited from the stroke and
76 rehabilitation units at Johns Hopkins, previous study participants, respondents to advertisement (flyers
77 posted within the hospital), and stroke support groups to which the study was advertised. Healthy controls
78 were recruited through advertisement and among previous study participants. All participants received
79 monetary compensation for their time (\$20/hour). Participants provided informed consent in accordance
80 with the Declaration of Helsinki, whereas procedures were approved by the Johns Hopkins Institutional
81 Review Board.

82 **Eligibility criteria**

83 Patients recruited had to be over 21 years old, had suffered an ischemic supratentorial stroke that was their
84 first stroke with motor deficits, exhibited some movement with the affected arm, and be able to provide
85 informed consent and understand the tasks involved. Exclusion criteria relevant to the tasks described in
86 this paper included hemorrhagic transformation or associated intracranial hemorrhage; severe congestive
87 heart failure; unstable angina; uncontrolled hypertension; dementia (assessed based on the Montreal
88 Cognitive Assessment, MoCA (Nasreddine et al. 2005)); severe aphasia or ideomotor apraxia, neglect or
89 hemianopia; and orthopedic or pain issues.

90 **Sessions**

91 Participants underwent two sessions: the main session (T1) and a one-month follow-up (T2). For the
92 subacute group, T1 took place 29.5 ± 19.8 days post-stroke (average \pm standard deviation) and T2 took place
93 39.5 ± 8.5 days later. For the chronic group, T1 took place 38.6 ± 29.6 months post-stroke and T2 took place
94 39.2 ± 7.8 days later.

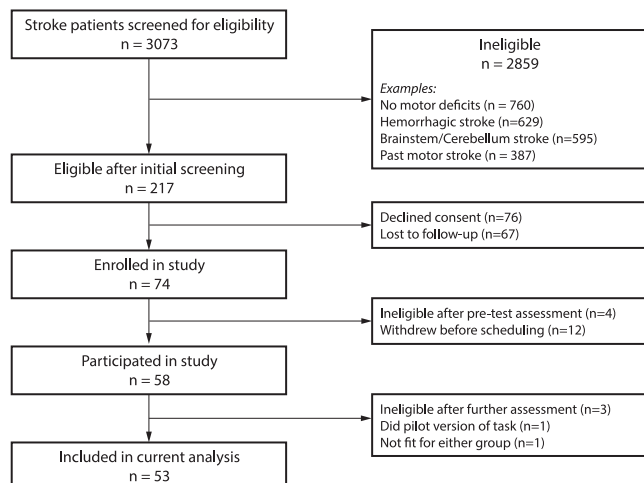


Figure 1: Participant flow through the study.
Note that the same patient might fulfill more than one ineligibility criteria.

95 Impairment assessment using the Fugl-Meyer scale for the upper extremity (FM-UE)

96 Assessments were separately scored by at least two different raters (J. Keller, AMH, MB). To obtain the
97 final value, scores were averaged between reviewers (hence some having decimal values). In cases of
98 substantial score differences (3 points or more), assessment videos were again reviewed by both raters
99 together. For the analysis comparing changes in arm dexterity and FM-UE from T1 to T2 (Figure 6), a
100 participant was excluded from the chronic group due to missing FM-UE score. We used the entirety of the
101 score (0-66) for our main analysis. At certain points, as mentioned in our results, we additionally performed
102 comparisons based on subcomponents of FM-UE scores focusing on (a) items referring to movement of the
103 proximal arm (items 3-17 and 31-33 – i.e. everything apart from parts I/VI (reflexes), VII (wrist), and VIII
104 (hand)), (b) items related to within-synergy movements (part II of FM-UE, “Flexor Synergy” items 3-8),
105 or (c) items related to out-of-synergy movements (parts IV and V of the FM-UE: “Movement combining
106 synergies” and “Movement out of synergy”).

107 Lesion location

108 A large fraction of our participants (34 out of 53) had clinical MRI images available, which enabled us to
109 compare lesion size between subacute and chronic populations. Lesion size was significantly larger in the
110 chronic participants for which images were available compared to subacute patients (56794 ± 21612 voxels
111 for chronic (N = 13) vs. 8613 ± 3072 voxels for subacute (N = 21), $p = 0.047$), in line with lower FM-UE
112 scores in this group (Table 2). Interestingly, in subacute and chronic patients with mild/moderate FM-UE
113 scores ($FM-UE \geq 26$, on which our main behavioral analysis focused), two populations with relatively
114 matched FM-UE scores (46.3 ± 4.4 for the 10 chronic vs. 54.4 ± 2.5 for the 19 subacute patients with available
115 imaging, $p = 0.17$) lesion size was still (marginally) larger in the chronic group (61029 ± 26714 voxels for
116 chronic (N = 10) vs. 9269 ± 3364 voxels for subacute (N = 19), $p = 0.086$), as shown in Figure 2.

117 Reaching Task Details

118 Participants sat on a robotic chair (Kinarm exoskeleton), which provided arm support while allowing for
119 planar motion (Figure 3). The chair was positioned against a screen that occluded vision of the arm but
120 allowed projection of targets, and a cursor indicating hand position, at arm level. Participants made 10-cm
121 reaching point-to-point movements to eight targets arranged at 45° intervals about a start position as shown
122 in Figure 3B. Targets and start position were 1cm in radius, where the cursor was 0.5cm in radius. The start
123 position was defined relative to each participants' shoulder midpoint, and was typically (in 47 out of 53
124 participants) 45 cm from it but could range from 45-50cm to accommodate different sizes and positioning
125 of participants. Upon positioning the cursor on the start position, a cyan target would appear in one of the
126 eight different target positions. Participants were instructed to initiate a movement to the target soon after
127 it appeared. A movement timer would begin as soon as the participant had moved outside the start position.

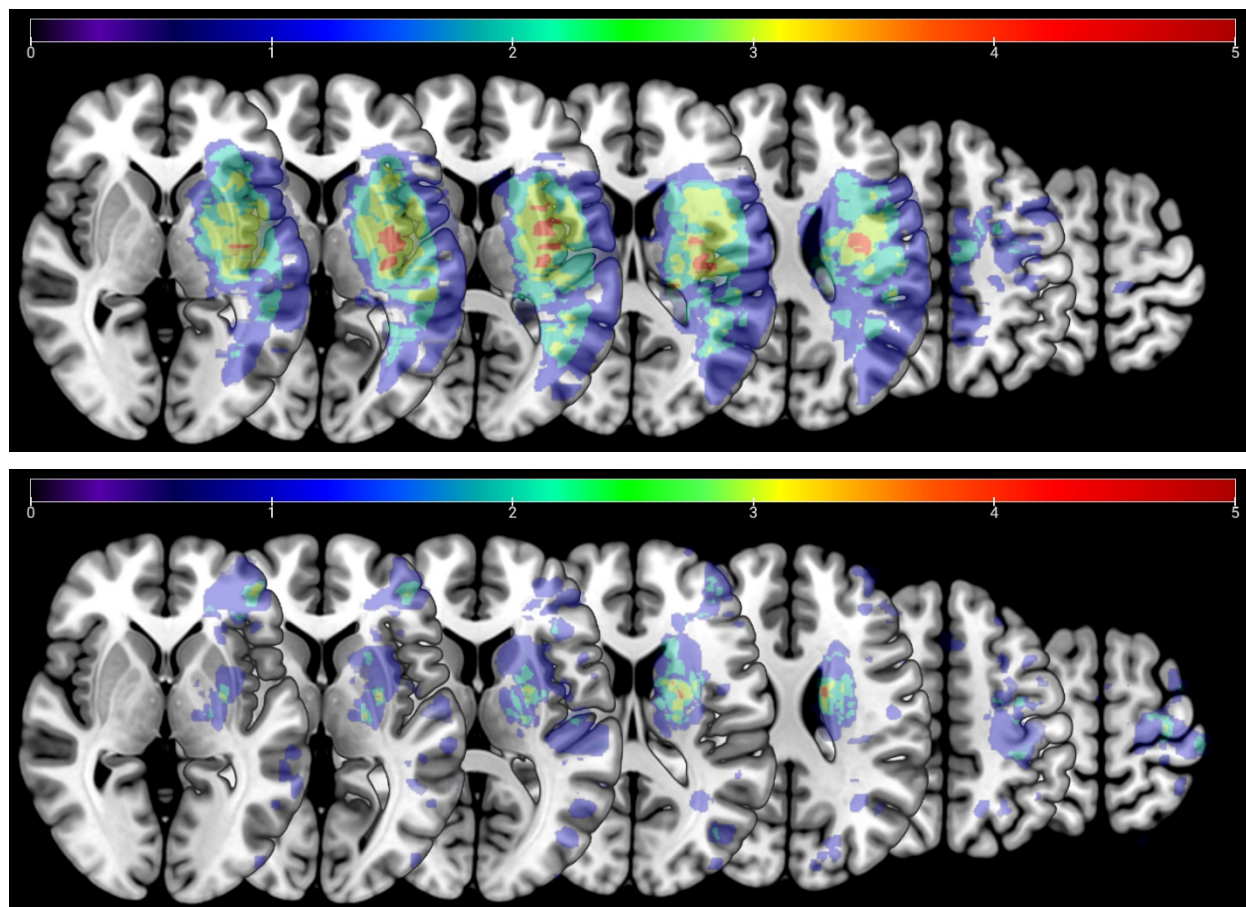


Figure 2: Lesion distribution overlay for chronic (top, N=10) and subacute (bottom, N=19) patients with moderate/mild FM-UE impairment (FM-UE ≥ 26). Averaged lesion distribution mapped to JHU-MNI space, with lesion flipped to one hemisphere. Color bar indicates patient count.

128 The movement would end either when the participant reached the target, or an 800ms timer ran out. Upon
129 movement end, the cursor would freeze momentarily and the target would change color based on the
130 participant's speed. Specifically, it would change to orange if the movement terminated on the target but
131 too quickly (movement time $<200\text{ms}$), or red if the movement failed to reach the target before the 800ms
132 timer ran out. If the cursor reached the target within the desired 200ms to 800ms from onset, and was held
133 inside the target for an additional 500ms, the target would turn green. After an additional 250ms wait time,
134 Kinarm would actively return the arm back to the starting position.

135 Participants completed four blocks of 88 movements each (11 to each of the eight different targets),
136 beginning with two blocks with the paretic arm, followed by two blocks with the non-paretic arm. Breaks
137 were given between the blocks as necessary. With the exception of one participant, who did the paretic and
138 non-paretic measurements on different days due to scheduling constraints, the entirety of each session took
139 place on the same day and typically lasted about 45 minutes.

140 **Dynamometry**

141 We measured strength by dynamometry in 25 of our participants (not all of them as it was only later added
142 to the study assessments). Participants sat on a chair, with their trunk straight and their forearm supported
143 on a table in pronation with the elbow at 90 degrees and the shoulder in an open packed position
144 (approximately 60 degrees of abduction and 30 degrees of horizontal adduction) (Bohannon 1990). Using
145 a handheld dynamometer (MicroFet 2, Hoggan Scientific), we measured the maximum effort of four muscle
146 groups: elbow flexors, elbow extensors, shoulder (horizontal) adductors, and shoulder (horizontal)
147 abductors. The average of two trials were taken for each condition. Both the paretic and non-paretic arms
148 were tested, and strength was expressed as a % of the force exerted with the non-paretic arm.

149 **Data Analysis**

150 Analysis was performed using Matlab (Mathworks, Natick MA). Position data were smoothed using an 8th-
151 order, 8 Hz low-pass Butterworth filter, and differentiated to obtain velocity. For the purpose of analysis,
152 we estimated movement onset using a method similar to what described previously in (Cortes et al. 2017):
153 we identified the time of peak speed (first zero-crossing of acceleration that is $>8\text{cm/s}$), and then, going
154 backwards, identified movement onset as the time speed surpassed 2 cm/s. We identified movement end by
155 going forward from the time of peak speed and finding the moment when speed remained $<2\text{cm/s}$ for more
156 than 0.1s.

157 **Data exclusion criteria**

158 On occasion, after setting up a participant on the robotic chair, reaching some of the targets was impossible
159 because of mechanical constraints. We thus excluded these targets from our analysis. This case was rare:

160 targets were excluded in only two out of 53 participants. From the remaining trajectories, we excluded
161 movements in which (i) movement direction at peak speed was $\geq 90^\circ$ away from target direction, (ii) the
162 participant had not moved beyond 30% of the target distance (the criteria used in (Cortes et al. 2017) and
163 previously (Kitago et al. 2015)), or (iii) the movement onset analysis described in the previous paragraph
164 failed to provide an estimate of movement onset. For the second training block that we focus on in this
165 manuscript, these criteria excluded a further 3.72% of patients' movements on the paretic side and 1.30%
166 on the non-paretic side (for healthy controls, the corresponding value was 0.07% for across both sides).

167 Functional Principal Component Analysis

168 To assess the quality of kinematics, we used functional principal component analysis (fPCA), a method
169 which applies principal component analysis to functional data (Goldsmith and Kitago 2016). This data-
170 driven analysis allows trajectories to be evaluated without prior assumptions about which trajectory features
171 ought to be emphasized. Here, we used fPCA to estimate the Mahalanobis distance of patients' trajectories
172 from the reference population of healthy, age-matched controls. For each patient, we averaged these
173 distances into the average squared Mahalanobis distance (AMD^2) for sessions T1 and T2. Details about this
174 analysis have been reported previously (Goldsmith and Kitago 2016).

175 Estimation of baseline value for AMD^2 in controls

176 The functional principal component analysis described above compares patients' trajectories to the
177 population of corresponding trajectories from healthy controls. Because of variability within the reference
178 population itself, AMD^2 scores would be nonzero for controls themselves. To estimate an AMD^2 value for
179 this baseline, we calculated AMD^2 between the trajectories of each control participant compared and the
180 trajectories of all other controls.

181 Statistical comparisons

182 To compare AMD^2 between subacute and chronic patients we used unpaired, 2-tailed t-tests without
183 assuming equal variances (Welch's t-test using the Satterthwaite approximation for effective degrees of
184 freedom); p-values reported in Results were based on these tests. In a secondary, non-parametric analysis,
185 we compared these two groups also using a bootstrap procedure (Efron and Tibshirani 1994) using 10,000
186 permutations within each subgroup, which also yielded significant differences between subacute and
187 chronic patients' AMD^2 .

188 For comparisons within the non-paretic data, we first used an ANOVA to investigate any effect of group
189 (subacute, chronic, controls) since there was no prior expectation either patient group would show reduced
190 reaching dexterity (higher AMD^2) in the first place. After the ANOVA, we used a Tukey-Kramer test for
191 multiple comparisons for post-hoc tests.

Table 1. Patient characteristics at T1. Showing time since stroke, lesion side, age (non-overlapping 5-year range), gender, Fugl-Meyer Assessment for the Upper Extremity (FM-UE, max. 66); Montreal Cognitive assessment (MoCA, max. 30), and Action Research Arm Test (ARAT, max. 57). ►

Time since stroke	Lesion Side	Age (5-y range)	Gender	MoCa	FM-UE	ARAT
Subacute patients						
<i>(days)</i>						
29	R	31-35	M	23	59	55.5
8	L	61-65	F	22	53	39
17	R	66-70	F	23	55	57
15	R	66-70	F	20	56	45
12	R	66-70	M	20	59	45
30	R	21-25	F	27	64	57
57	L	56-60	M	25	33.5	36
17	L	41-45	F	20	53	34.5
8	R	61-65	M	21	52.5	41
57	L	26-30	M	28	61.5	57
19	L	36-40	F	26	58	54
47	R	51-55	M	24	57	56
9	L	61-65	M	19	56	48.5
12	R	81-85	F	22	38	37.5
43	R	71-75	F	27	21	9
47	R	61-65	F	30	63.5	57
6	L	61-65	M	20	65	57
55	R	51-55	M	24	44	37
21	L	51-55	F	22	64.5	57
19	R	91-95	M	27	26	n.d.
70	R	66-70	F	28	59.5	56
47	R	71-75	F	23	45	54
14	L	61-65	F	25	61	55.5
17	R	46-50	M	30	62.5	57
12	L	71-75	F	25	57.5	56.5
58	L	46-50	M	29	15	11
51	R	56-60	M	27	11.5	3

Time since stroke	Lesion Side	Age (5-y range)	Gender	MoCa	FM-UE	ARAT
Chronic patients						
<i>(months)</i>						
27	R	26-30	F	30	58	44.5
54	R	41-45	M	30	13	3
42	R	66-70	M	27	60	57
27	R	66-70	M	25	13	6
27	L	56-60	M	25	58	54.5
39	R	56-60	M	25	47.5	44
24	R	46-50	M	29	12	3
76	R	61-65	M	28	10	7
11	R	51-55	F	23	62	57
88	R	61-65	F	25	17	3
24	R	56-60	M	20	29.5	5.5
8	R	76-80	M	20	50	43
59	R	46-50	M	22	24	42
20	R	56-60	M	20	17.5	3
72	L	36-40	M	27	60.5	55
58	L	51-55	F	21	9	2
35	R	51-55	M	26	64.5	55.5
7	L	66-70	M	28	64.5	57
7	R	46-50	M	29	27	14
8	R	51-55	F	28	36	14.5
17	R	56-60	F	26	13.5	n.d.
9	R	41-45	F	28	33	25.5
7	L	36-40	M	26	61	57
59	R	56-60	F	23	18.5	3
95	L	66-70	F	27	64	57
103	L	36-40	F	27	48.5	52.5

	Subacute stroke patients	Chronic stroke patients	Controls
N	27	26	17
Age	58.8±16.3	54.6±11.5	57.6±12.4
Gender	13M/14F	16M/10F	8M/9F
Affected Side	11R/16L	7R/19L	n/a
Handedness	24R/1L/2A	24R/2L	15R/1L/1A
FM-UE	50.1±15.6	37.4±21.1	66±0
ARAT	45.1±15.9	30.6 ±23.6	57±0
MoCA	24.3±3.3	25.6±3.1	27.9±1.6
Time Since Stroke	29.5±19.8 days	38.6±29.6 months	n/a

Table 2. Demographics and clinical characteristics of participants. ± indicates standard deviation across participants. FM-UE: Fugl-Meyer Assessment for the Upper Extremity; ARAT: Action Research Arm Test; MoCA: Montreal Cognitive assessment.

192 Results

193 Subacute stroke patients had worse reaching dexterity compared to chronic stroke 194 patients despite matched Fugl-Meyer scores

195 To measure quality of reaching movements, we had participants perform 10cm point-to-point reaching
196 movements to eight different targets on the 2D plane with arm support, using the Kinarm Exoskeleton
197 (Figure 3). Online visual feedback was provided in the form of a cursor and, with the help of color cues,
198 participants were prompted to reach and stop at the target within 200-800ms after movement onset (for
199 details, see Materials and Methods). In each session, a total of 176 movements were performed with each
200 hand (two blocks of 11 reaches to each of the eight targets, with paretic-arm blocks performed first).

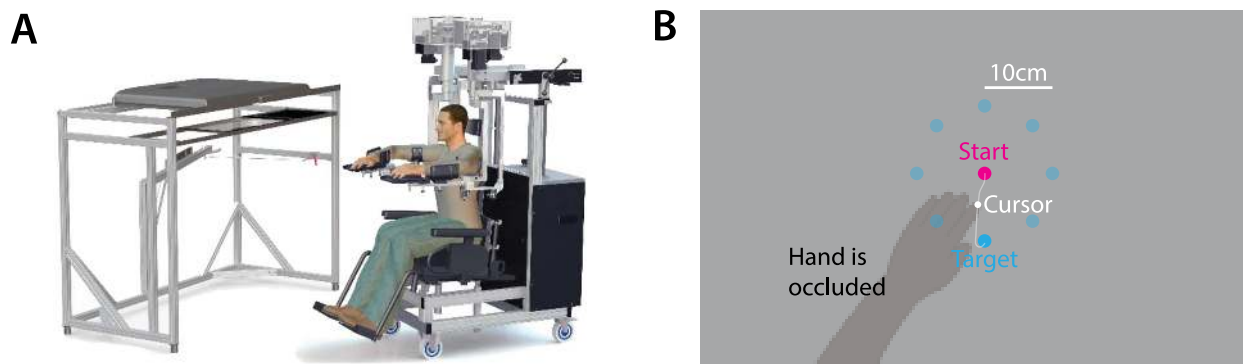


Figure 3. Task design and example trajectories.: Illustration of the experimental apparatus (Kinarm, BKIN Technologies, Kingston, Ontario, figure adapted from (Tyryshkin et al. 2014). **B:** The task: participants had to make point-to-point outwards reaching movements to 8 different targets (cyan) beginning from a starting position (pink). Vision of the hand was occluded; instead, during movement, a cursor was displayed on screen on the plane of the arm.

201 To avoid familiarization effects (see Figure S1), we focused our analysis on the second block (88
202 movements). Examples of participants' trajectories with the paretic arm are shown in Figure 4A. We made
203 two primary observations. First, subacute participants had markedly worse trajectories compared to chronic
204 participants even when matched for FM-UE scores. Second, there was convergence onto the shape of
205 trajectories of the control population as patients' FM-UE scores improved.

206 To formally assess reaching trajectories in stroke patients and generate a scalar comparison metric, we used
207 functional principal component analysis (fPCA), a method which compares patients' movement trajectories
208 to those of a reference population (Kitago et al. 2015; Goldsmith and Kitago 2016; Cortes et al. 2017). In
209 this study, our reference population consisted of a group of 17 age-matched controls (see Table 2).
210 Specifically, fPCA assigns a score to each trajectory produced by the patient, based on how that trajectory's

211 shape differs from the average control trajectory, given the natural variability of control trajectories (for
212 more details see Materials and Methods). This resulting score is a Mahalanobis distance (MD), and can be
213 understood as a generalization of the z-score; it is large when the movement is impaired (i.e. it is dissimilar
214 to the healthy controls used as a reference) and small when the movement is similar to healthy controls.
215 This analysis avoids having to assess many different kinematic variables (e.g. angular error, accuracy, jerk,
216 curvature), and then not knowing how to interpret them when they dissociate (Kitago et al. 2015; Krakauer
217 and Carmichael 2017). As a measure of reaching dexterity for each participant, we calculated these MDs
218 across trials and target directions. We refer to the resultant measure as the *Average Squared Mahalanobis*
219 *distance* (AMD^2) (Cortes et al. 2017).

220 Because AMD^2 estimates the dissimilarity of each trajectory from the average trajectory in the reference
221 population, it will be non-zero even for unimpaired trajectories given the natural variability of movement.
222 Hence, we estimated a baseline value for AMD^2 , denoted by how low the AMD^2 score would be for
223 unimpaired performance, by taking each control participant's trajectories and computing their AMD^2
224 against the trajectories of remaining controls, which yielded an average AMD^2 of 8.13 ± 0.58 (mean \pm SEM
225 across control participants).

226 Consistent with the trajectory shapes shown in Figure 4A, AMD^2 scores indicated impaired trajectory
227 kinematics for stroke patients compared to controls (average \pm SEM AMD^2 for all patients: 61.4 ± 7.5 ; for all
228 controls: 8.13 ± 0.58). Interestingly, however, subacute patients tended to show markedly worse kinematics
229 than chronic patients despite similar or higher FM-UE scores, as illustrated in Figure 4B. Because very few
230 participants in the subacute stage had low FM-UE scores, resulting in a higher average FM-UE for the
231 subacute group compared to the chronic group (on average, FM-UE of 50.1 ± 3.0 for the subacute vs.
232 37.4 ± 4.1 for the chronic group, see Figure 4B), we performed additional analysis on participants with
233 moderate and mild impairment (FM-UE ≥ 26 , the cut-off is based on previous work (P. W. Duncan, Lai, and
234 Keighley 2000; Krakauer and Carmichael 2017)). For these patients (24 subacute and 16 chronic), despite
235 matched FM-UE (54.3 ± 2.1 for the subacute vs. 51.5 ± 3.3 , mean \pm SEM for the chronic patients, respectively,
236 $p = 0.47$), trajectory abnormalities were substantially greater in the subacute group (AMD^2 of 60.6 ± 10.4
237 vs. 21.5 ± 4.2 , $p = 0.0016$, Figure 5). These two groups were significantly different ($p = 0.0028$) even when
238 the subacute participant with the highest AMD^2 (174.9, Figure 5, right) was excluded as potential outlier;
239 they were also clearly different in a secondary, non-parametric analysis using bootstrap (Figure S2). We
240 also considered whether this AMD^2 difference between subacute and chronic patients could be due to FM-
241 UE capturing different types of abnormality in each group. In other words, in spite of similar overall FM-
242 UE scores, could there be systematic differences in subcomponents of the FM-UE between subacute and
243 chronic patients? We thus isolated and compared (a) the part of the FM-UE focusing on movement of the

244 proximal arm (see Materials and Methods) and (b) the part of the FM-UE focusing on out-of-synergy
245 movement between these two subgroups (subacute vs. chronic mild/moderate patients). We found no
246 significant differences (proximal part: 30.8 ± 1.0 vs. 29.7 ± 1.6 for subacute vs. chronic, $p=0.57$; out-of-
247 synergy part: 10.2 ± 0.5 vs. 9.7 ± 0.8 for subacute vs. chronic, $p=0.60$), ruling out that AMD^2 differences
248 could be explained by differences in the distribution of abnormality within the FM-UE for each group.

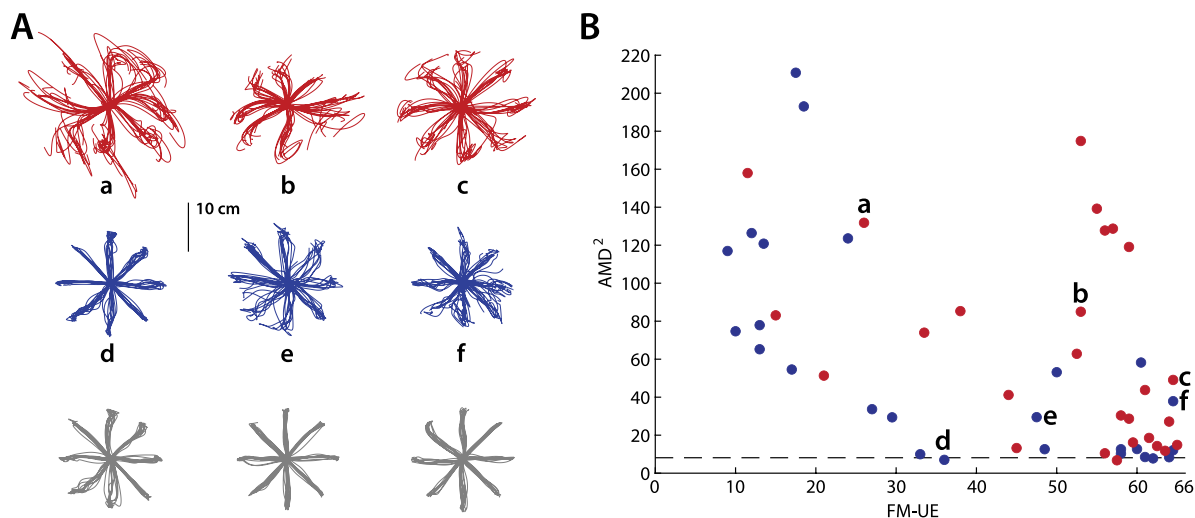


Figure 4. Subacute patients had worse kinematics compared to chronic patients for similar Fugl-Meyer scores. *A: Exemplar movement trajectories, using the paretic arm, for three subacute patients (red), three chronic patients (blue), and three controls (gray). B: Scatter plot of kinematic abnormality (AMD^2) vs. FM-UE for the subacute (red) and chronic (blue) groups. Note the higher AMD^2 for subacute patients, especially the ones with moderately and mildly impaired FM-UE (≥ 26). The lowercase letters (a-f) point to the corresponding trajectories on the panel A. The black dashed line indicates baseline calculated based on control data.*

249 The difference in arm dexterity in spite of matched FM-UE that we observed, suggests that impaired arm
250 dexterity (a negative sign) is dissociable from abnormal synergies (a positive sign on which FM-UE is
251 based) – one is not causing the other. This failure on part of the FM-UE to capture differences in the quality
252 of motor control during the subacute recovery stage further suggests that additional assessments may be
253 needed to capture the full spectrum of the post-stroke motor control phenotype; and/or recovery of motor
254 control within the subacute stage may lag behind corresponding improvements in FM-UE.

255 In addition to failing to capture motor control differences between the subacute and chronic groups, the
256 FM-UE was a relatively poor predictor of kinematic deficits overall: while FM-UE accounted for a small
257 fraction of the differences in AMD^2 scores across the entire patient population ($R^2 = 0.27$, $p = 0.00007$),
258 this relationship appeared mostly driven by chronic patients with greater impairment ($FM-UE < 26$) and

259 large kinematic deficits (Figure 4B, blue dots towards the left; there was no significant relationship when
260 only patients with mild/moderate impairment [$FM-UE \geq 26$] were examined, $R^2 = 0.04$, $p = 0.24$). However,
261 very low FM-UE scores could be attributable to damage that is extensive enough to separately lead to both
262 an abnormal synergy and loss of dexterity, without meaning that loss of dexterity was specifically due to
263 the abnormal synergy. Moreover, very low FM-UE scores imply substantial abnormality even for within-
264 synergy movements, reducing the metric's specificity as an indicator of the strength of abnormal synergies.

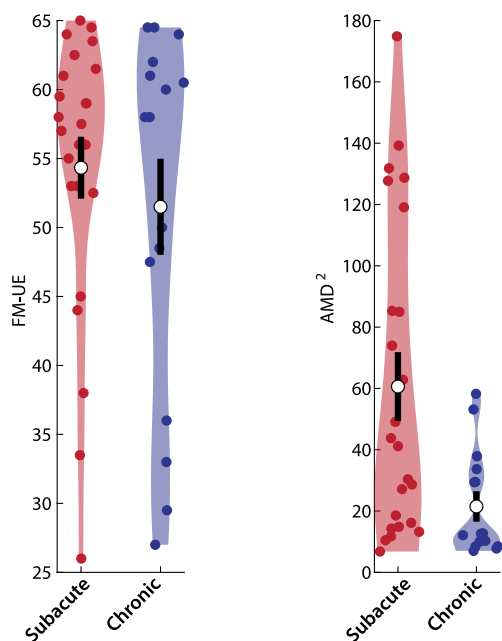


Figure 5. Subacute patients have worse kinematics compared to chronic patients in spite of matched Fugl-Meyer scores. Violin plots of the average FM-UE (left) and AMD^2 (right) for chronic and subacute patients with moderate/mild ($FM-UE \geq 26$) impairment. Note how, for this FM range, where both subacute and chronic patients were adequately represented, we found much worse motor control (higher AMD^2) for subacute patients compared chronic patients, despite matched FM-UE. White circles indicate mean values and thick black lines indicate mean \pm SEM.

265 **As patients progressed through the subacute stage, the relationship between**
266 **abnormal synergies and reaching dexterity increasingly resembled that of the chronic**
267 **group**

268 If the differences in kinematics between subacute and chronic patients matched for FM-UE were indeed
269 due to time post-stroke, we would expect that, given time, the kinematics/FM-UE relationship for the
270 subacute group would generally converge towards the kinematics/FM-UE relationship seen in the chronic
271 group. To examine this, we tested for changes in both FM-UE and AMD^2 in the subset of patients who
272 completed the one-month follow-up (T2) session, and had been classified as moderate/high FMS (≥ 26)
273 during the main (T1) session –14 patients in each group. We saw that, indeed, the relationship between
274 AMD^2 and FM-UE in the subacute group in the one-month follow-up (T2 session) tended to approach the
275 relationship observed for chronic patients, with the most kinematically impaired subacute patients
276 drastically reducing their AMD^2 (illustrated by the long downward-facing red arrows in Figure 6A). On
277 average, subacute patients improved both their FM-UE (59.6 ± 1.1 vs. 63.2 ± 0.7 , $p = 0.0010$) and their
278 kinematics (AMD^2 of 61.8 ± 15.1 vs. 29.7 ± 5.1 , $p = 0.023$). Changes in AMD^2 between T1 and T2 might

279 appear statistically weaker when tested using parametric tests due to lack of normality in the distribution of
280 AMD^2 ; a non-parametric comparison using bootstrap suggested a more clear difference ($p = 0.0008$). In
281 contrast, chronic patients improved neither FM-UE nor kinematics (50.1 ± 3.6 vs. 50.1 ± 3.8 , $p = 1.00$ for FM-
282 UE and 23.4 ± 4.6 vs. 21.2 ± 4.7 , $p = 0.64$ for AMD^2 [$p = 0.29$ using bootstrap]), as illustrated in Figure 6B.
283 We note that the lack of improvement in kinematics for the chronic group suggests no effect of savings or
284 additional practice in the point-to-point reaching task (aside from a familiarization effect, illustrated in
285 Figure S1), meaning that the changes in AMD^2 we see in the subacute group represent improvements in
286 reaching dexterity rather than motor learning.

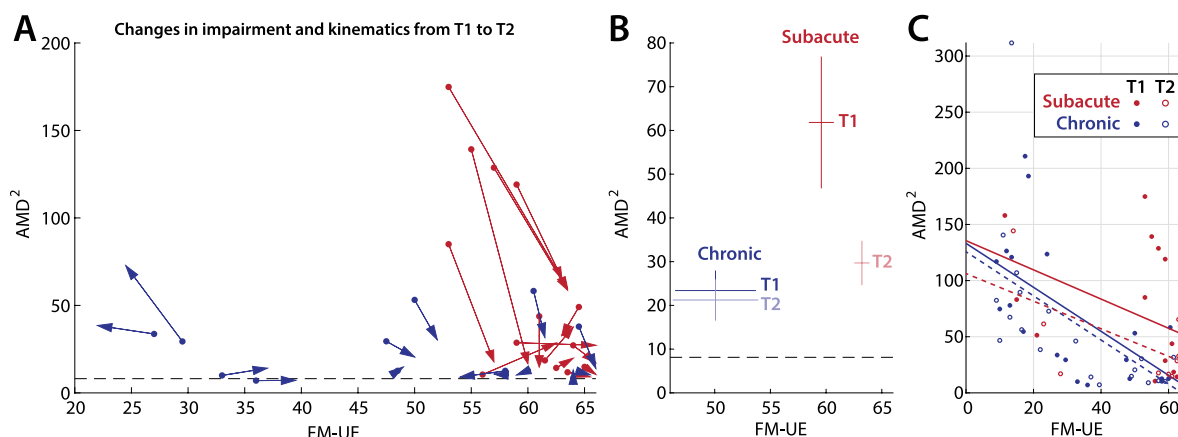


Figure 6. Changes in kinematics and FM-UE as recovery progresses. *A: Individual changes in kinematic abnormalities (AMD^2) and FM-UE between the main session (T1, dots) and the one-month follow-up (T2, tip of arrowpoints). B: Subject averages for these two groups. Errorbars indicate SEM. In both A and B, patients were only included if (a) they completed both T1 and T2 sessions, and (b) were classified in the moderate/mild group during T1. C: Linear fits of the FM-UE vs. AMD^2 relationship for both subacute and chronic groups for both T1 and T2. In T2, the FM-UE / AMD^2 for the subacute group becomes more similar to the chronic group.*

287 In addition, we compared data from participants which completed both the T1 and T2 sessions regardless
288 of FM-UE (a total of 17 subacute and 23 chronic) and investigated whether a stronger AMD^2 /FM-UE
289 relationship emerges among subacute patients in T2 compared to T1. Indeed, subacute participants showed
290 a tighter FM vs. AMD^2 relationship in T2 ($R^2=0.38$, $p = 0.0089$) compared to T1 ($R^2 = 0.17$, $p = 0.10$),
291 more similar to the strength of the same relationship for chronic participants, which was strong in both T2
292 ($R^2=0.38$, $p = 0.0016$) and T1 ($R^2=0.45$, $p = 0.00042$), as shown in Figure 6C. This provides further evidence
293 that the differences we observed between subacute and chronic groups in T1 were indeed due to time after
294 stroke.

295 **Motor control deficits in the non-paretic arm were worse in the subacute compared to**
296 **the chronic period**

297 Finally, we analyzed trajectories in the non-paretic arm. While less pronounced than deficits in the paretic
298 arm, both subacute and chronic patients had higher non-paretic AMD² scores compared to controls
299 (20.80±3.74 and 14.68±1.48 vs. 8.12±0.58 for the subacute, chronic, and controls, respectively, see Figure
300 7). An ANOVA revealed a significant effect of group ($p = 0.0094$). Post-hoc analyses showed that subacute
301 patients had significantly greater AMD² compared to controls ($p = 0.0070$) but not compared to chronic
302 patients ($p = 0.21$). While chronic patients showed higher AMD² than controls, this difference was not
303 significant either ($p = 0.25$) – p -values obtained using the Tukey-Kramer test for multiple comparisons. This
304 shows a clear deficit in motor control of the non-paretic arm at least early after stroke, mirroring previous
305 results demonstrating reaching deficits in the non-paretic arm (Winstein and Pohl 1995; Haaland et al. 2004;
306 Cortes et al. 2017). This finding suggests that loss of reaching dexterity after stroke is not restricted to the
307 contralesional side, and may be captured by high-sensitivity assays like our simple reaching task and
308 associated fPCA analysis.

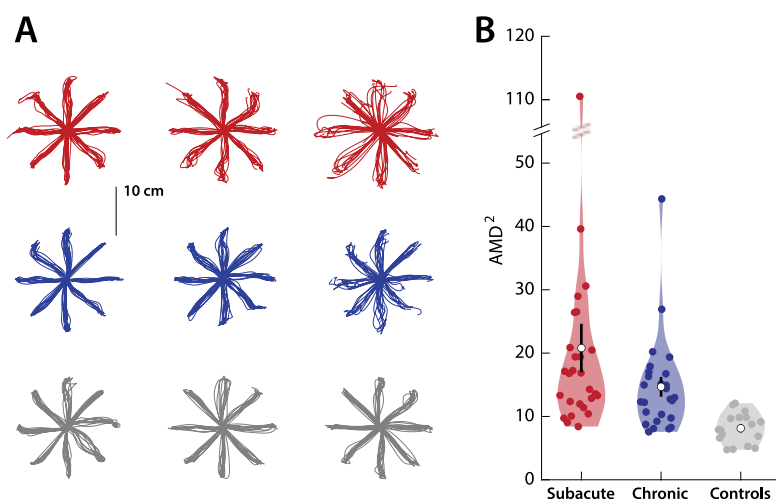


Figure 7. Kinematic abnormalities in the non-paretic arm. Subacute participants showed worse kinematics (higher AMD²) with their non-paretic arm compared to chronic participants and controls. **A:** example trajectories (same participants as in Figure 3B); **B:** Violin plots of the AMD² for each group. White circles indicate mean values, thick black lines indicate mean ± SEM.

309 **Contributions of strength to the Fugl-Meyer score do not explain dissociation with**
310 **reaching dexterity**

311 Our findings suggest a dissociation between abnormal synergies, assessed through the FM-UE scale, and
312 arm dexterity, assessed through kinematics. However, while FM-UE is a synergy-based measure, it may
313 also reflect weakness – for example, we have previously found a strong correspondence between FM-UE
314 improvement and recovery of strength (Cortes et al. 2017). Could the FM-UE vs. dexterity dissociation in
315 our data instead reflect a strength/dexterity dissociation, as has been shown in earlier work (Ada et al.
316 1996)?

317 To assess the contribution of strength to our findings, we measured patients' horizontal shoulder adduction/
318 abduction and elbow flexion/ extension strength. As dynamometry was only later added to the study
319 assessments, it was not performed in all participants. In a subset of 17 participants (11 subacute and six
320 chronic) plus an additional eight of our early participants (who were enrolled in a different study and were
321 all at the chronic stage at the time of the measurement), we examined the relationship between FM-UE
322 scores and strength at each joint (total of 25 participants). With the exception of horizontal shoulder
323 adduction, strength correlated with FM-UE (see Figure 8). In particular, not only elbow extension strongly
324 correlated with FM-UE ($R^2 = 0.68$, $p = 4 \times 10^{-7}$), but elbow flexion also did ($R^2 = 0.39$, $p = 0.0009$). The
325 latter relationship was present even when we examined only the FM items strictly related to out-of-synergy
326 movements (out-of-synergy FM-UE vs. elbow flexor strength: $R^2 = 0.35$, $p = 0.0019$). As elbow flexor
327 strength correlated almost as well as elbow extensor strength did to the part of FM-UE that evaluates
328 movements *out* of flexor synergy, we find it unlikely that strength increases at the elbow are the cause of
329 the ability to move out of synergy; rather, the correlations suggest a recovery process that is common for
330 strength and synergies. We also found that elbow extensor strength correlated – even better than elbow
331 flexor strength did – to the part of FM-UE that evaluates movements *within* flexor synergy ($R^2 = 0.51$, $p =$
332 0.00007). Similarly, we find it unlikely that increased extension strength is the cause of the ability to move
333 *within* flexor synergy; instead suggesting a common recovery process.

334 These findings indicate that there is indeed a dissociation between synergy and arm dexterity rather than
335 only a dissociation between strength and arm dexterity. Importantly, previous work has shown a strong
336 correlation between FM-UE and measures of synergy abnormality measured through EMG (Bourbonnais
337 et al. 1989; Dewald et al. 1995). This reinforces our conclusion that the findings here substantially reflect
338 a dissociation between the presence of synergies and loss of dexterity. Future work may corroborate this
339 using EMG, for example.

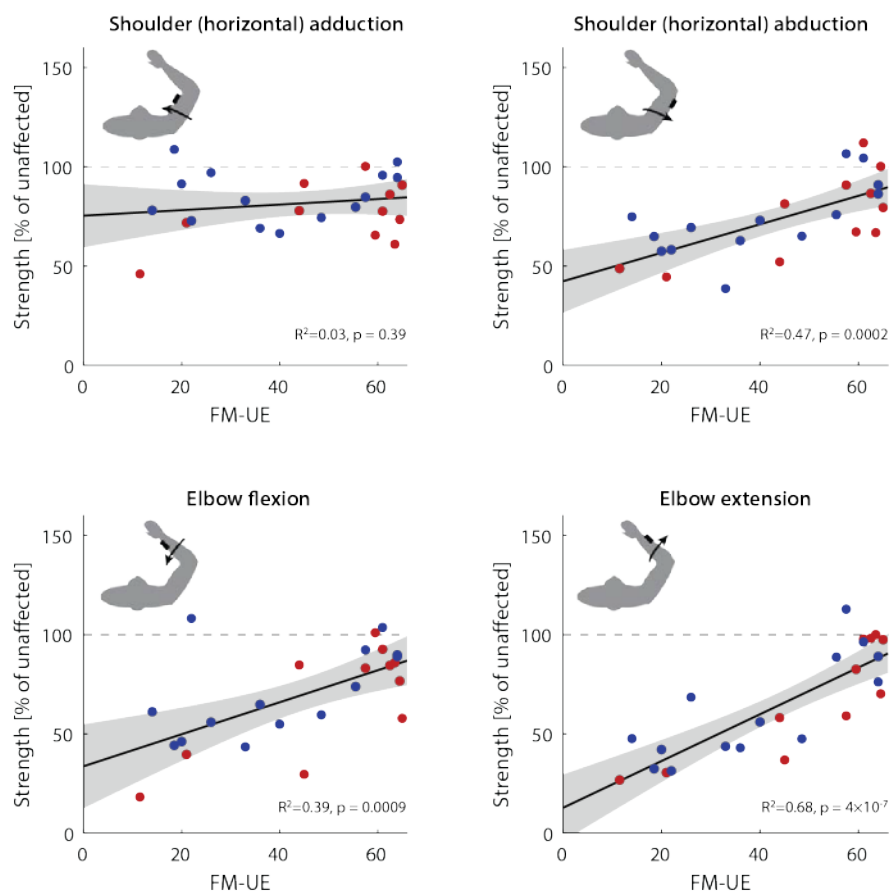


Figure 8. Relationship of weakness and FM-UE. Comparing strength (expressed as a % of non-paretic strength) with each patients' FM-UE scores revealed strong correlations between FM-UE and shoulder abduction strength, elbow flexion strength, and elbow extension strength, but not shoulder adduction strength (which was relatively high across the whole patient population). For each panel, each dot represents a patient (red: subacute; blue: chronic, at the time of examination), whereas the solid black line indicates linear fit across all patients (with shaded area indicating the corresponding confidence interval).

340 Discussion

341 Significance of our findings for assessing post-stroke motor impairment

342 Here we sought to dissect the hemiparesis phenotype into its constituent components. Given the prevalence
343 and impact of hemiparesis, it is important to assess specific post-stroke motor impairments with quantitative
344 metrics to enable clinicians to reliably characterize the initial deficit, and to predict and track recovery. This
345 knowledge may help optimize rehabilitation (P. W. Duncan et al. 1992; C. Stinear 2010; C. M. Stinear et
346 al. 2017) and also enable researchers to compare the effectiveness of different experimental treatments and
347 interventions to enhance recovery. The FM is widely used in tracking post-stroke motor recovery, in fact it
348 is the *de facto* impairment measure from the ICF used for studies and trials (Cortes et al. 2017; P. W.
349 Duncan et al. 1992; Rabadi and Rabadi 2006; Chollet et al. 2011; Crisostomo et al. 1988; Francisco et al.
350 1998; Kwakkel et al. 2016; Van der Lee et al. 1999; Fasoli et al. 2003; Lo et al. 2010; Lum et al. 2002; P.
351 Duncan et al. 2003; Feys Hilde M. et al. 1998). Here, however, we have shown that FM-UE might miss one
352 of the components of hemiparesis - reaching dexterity loss – even though it might well capture weakness
353 and abnormal synergies. Our findings, showing a poor correspondence between these two types of
354 impairment, suggest the need for more careful matching between the rehabilitation intervention being tested
355 in clinical studies and the chosen primary outcome measure: hemiparesis – or upper motor neuron syndrome
356 – is too vague a term as it lumps weakness, synergies, and dexterity loss.

357 Why would FM-UE not be that suitable for assessing reaching dexterity deficits? Recent work has shown
358 that reaching dexterity in stroke patients is improved with weight support; conversely, without weight
359 support dexterity might be masked by weakness and abnormal synergies. Beer and colleagues (Beer et al.
360 2004) found that external arm support allowed for significantly greater peak torques when moving to distal
361 targets requiring elbow extension and/or shoulder flexion, i.e. arm support facilitated movements that
362 required breaking out of flexor synergy. At the same time, there was little, if any, effect of external arm
363 support for movements to proximal targets, that involved elbow flexion and shoulder extension. A
364 subsequent study by the same group also found that, while providing arm support allows for greater range
365 and speed of elbow extension (Beer et al. 2007), this improvement was independent of reduced shoulder
366 strength or elbow flexor/extensor strength imbalance. This suggested that abnormal synergies – and not
367 merely weakness per se – were the sign alleviated by arm support. This finding mirrored earlier results for
368 3D movements (Zackowski et al. 2004), which showed a critical effect of synergy intrusion in the absence
369 of weight support. Thus, tasks which require the patient to make multi-joint movements in 3D without
370 support, like most of the test components of the FM-UE, will primarily reflect weakness and synergies,
371 masking residual dexterity.

372 **Potential mechanisms behind differences in motor control between the subacute and** 373 **chronic patients**

374 Here, our data showed a clear dissociation between the FM-UE score and the quality of planar reaches. It
375 still needs to be explained, however, why the dissociation took the *specific* form it did: it is not merely that
376 FM scores are poor predictors of the quality of reaching, but there was a clear bias whereby planar reaches
377 were substantially worse in the subacute as compared to the chronic group in patients with matched FM-
378 UE scores. A potential explanation for this discrepancy may be that the residual corticospinal tract needs
379 time and practice to reach its maximal level of potential performance. Thus, improvements in negative signs
380 might lag improvements in positive ones. This explanation, however, appears to contradict our previous
381 work showing that recovery of planar kinematics occurs over the first five weeks post-stroke and then
382 plateaus (Cortes et al. 2017). We considered the potential explanation that at least some of the patients in
383 the sub-acute group were still within this five-week window and therefore had not yet reached their full
384 recovery. We reasoned that this could still be the case despite the fact that, overall, this group would be less
385 impaired than the chronic group with respect to the FM-UE because they have matched scores and yet could
386 only be expected to improve further. Indeed, the sub-acute patients with the highest AMD² scores on T1
387 tended to improve drastically on T2, as illustrated in Figure 6A.

388 **The Fugl-Meyer assessment, abnormal synergies and weakness**

389 In this study, we relied on FM-UE as a measure of abnormalities in muscle synergy. As we mention in the
390 introduction, FM-UE was designed to capture the stages of post-stroke recovery described by (Twitchell
391 1951) and (Brunnstrom 1966), a prominent feature of which is the intrusion of abnormal synergies. In turn,
392 this made the scale a strong indicator of synergy abnormality. In line with this idea, the degree of synergy
393 abnormality assessed through EMG was found to strongly (negatively) correlate with FM-UE scores across
394 patients (Bourbonnais et al. 1989; Dewald et al. 1995). Nevertheless, future studies could corroborate our
395 findings with EMG.

396 In addition, here we also found that FM-UE scores also correlate with weakness, in line with our previous
397 work suggesting that FM-UE recovery mirrors strength recovery (Cortes et al. 2017). This relationship was
398 present not only for elbow extension strength but also for elbow flexion strength (Figure 8); it would be
399 unlikely to have a causal relationship between increased flexion strength and ability to move out of flexor
400 synergy. This observation is consistent with previous findings in which increased extensor reach was
401 observed when arm support was given: externally-provided arm support is orthogonal to extensor (or flexor)
402 strength (Sukal, Ellis, and Dewald 2007). Instead, ours and previous findings suggest that the FM-UE /
403 weakness correlation might indicate a shared substrate between abnormal synergies and weakness.

404 The shared substrate hypothesis would fit with observations that abnormal synergies are mitigated when
405 weakness is itself mitigated through arm support (Beer et al. 2004; 2007; Sukal, Ellis, and Dewald 2007).
406 A potential explanation is that damage to the (contralateral) corticospinal tract (CST) after stroke may lead
407 to increased reliance on the (ipsilateral) reticulospinal tract (RST), providing some strength at the expense
408 of abnormal synergies (McPherson et al. 2018). In support of this theory, it was shown that corticospinal
409 lesions in macaques led to increased responsivity in reticulospinal pathways which innervated forearm
410 flexor muscles (Zaaimi et al. 2012); moreover it was recently shown that strength training in monkeys
411 involves adaptations in the reticulospinal, but not the corticospinal tract (Glover and Baker 2020). This
412 previous work, together with our findings, thus suggests an anatomical and physiological dissociation
413 (corticospinal vs. reticulospinal) that may map onto the behavioral dissociation (positive vs. negative signs).
414 This theory, however, raises an apparent paradox: if upregulation of the RST increases both strength and
415 abnormal synergies, then how do patients proceed to recover from synergies without concomitant loss of
416 strength? There are a few possible non-mutually exclusive answers to this question that relate to recovery
417 of CST function. First, as the CST becomes able to provide some strength, reliance on the RST may be
418 reduced. Second, the RST might be unable to provide strength for some muscles, which instead may rely
419 on CST recovery: for example, CST integrity may be necessary for strength in the FDI, a distal muscle but
420 not the biceps (Schambra et al. 2019). Studies in monkeys using spike-triggered averaging have found that
421 ipsilateral RST projections led to facilitation in the biceps but suppression in the triceps (Davidson and
422 Buford 2004; Davidson, Schieber, and Buford 2007); thus, the (contralateral) CST – which can facilitate
423 *either* flexors or extensors (Cheney, Fetz, and Mewes 1991)– may be necessary for control of extensor
424 muscles, which is needed to break out of the flexor synergy. Third, given that both CST and RST converge
425 upon spinal interneurons (Riddle, Edgley, and Baker 2009; Riddle and Baker 2010), the CST might directly
426 regulate RST (Schepens and Drew 2006). Thus, CST recovery may restore its regulatory effect upon the
427 RST, reducing abnormal synergies but maintaining strength.

428 **Limitations**

429 Our comparison of kinematics between subacute and chronic groups focused on patients with moderate and
430 mild impairment based on their FM-UE score. This was due to the very low number of subacute participants
431 with low FM-UE scores, which prevented reliable comparisons with the corresponding part of the chronic
432 group: we were able to recruit only 3 subacute patients with a FM-UE of <26 compared to 10 chronic
433 patients in the same subgroup. We interpret this difference as the result of the difficulty of recruiting patients
434 in the subacute stage after stroke. Both eligible subacute and chronic patients were recruited irrespective of
435 their FM-UE score (within the 10-64 range). However, a subacute patient with high impairment will be
436 likely to spend more time in the hospital and in rehabilitation, thus less likely to have time on research

437 participation before the subacute time window expires. Moreover, increased impairment itself might make
438 them less likely to be interested in joining in the first place, given that they may need more time to adjust.
439 Hence, our observation in this study and others is that subacute patients who are able and eager to participate
440 will tend to be less impaired in the first place.

441 However, we would not expect that the difference in kinematics between the subacute and chronic groups
442 seen for moderate- and mild-impairment patients would also manifest in highly impaired patients. First,
443 patients with high impairment would show difficulty with kinematics regardless of their recovery stage:
444 lower and lower FM-UE scores would amount to impairment closer and closer to complete lack of
445 movement. For example, a plegic patient would have a FM-UE score very close to zero, and being unable
446 to move at all, they would have a complete deficit in their kinematics in our task, regardless of time after
447 stroke. Second, the very fact that the FM-UE score failed to capture a good part of motor control deficits,
448 specifically during the subacute stage, paired with the assumption that the subacute patients who
449 participated may have had less *overall* impairment, suggests that subacute patients with low FM-UE may
450 tend to fare better in components of impairment not well-captured by the FM-UE (one of which is motor
451 control). Finally, there seems to be a difference how severe vs. moderate/mild patients recover: in contrast
452 to moderate/mild patients, a fraction of severe patients may not recover much at all, and thus show less
453 improvement as they advance to the chronic stage (Nakayama et al. 1994; Jørgensen et al. 1995; Krakauer
454 and Carmichael 2017). While this observation was derived by comparing more general impairment scales
455 (and FM-UE itself), it might also hold for movement kinematics as well.

456 We also note two more limitations. First, we did not formally examine patients' sensory deficits, which
457 could be a component of further study. Second, here we examined kinematics in 2D with full arm support.
458 Fully evaluating post-stroke motor control, however, would need to examine kinematics in all three
459 dimensions. 3D movement control may contain features not prominent in horizontal planar movement, such
460 as the engagement of more muscles, a wider range of joint configurations, and dealing with the effects of
461 weight bearing. For the latter part, especially, it may be worthwhile to systematically examine the
462 relationship between FM-UE and kinematics under intermediate amounts of arm support rather than either
463 full or none in order to properly map the interplay between synergies, strength, and kinematics.

464 **Conclusion**

465 Here we show that there is a dissociation between loss of reaching dexterity and presence of abnormal
466 muscle synergies in the contralesional arm after stroke; two prominent and characteristic signs of
467 hemiparesis. To dissect these two signs, we designed a reaching task in which we isolated arm dexterity
468 from synergy by providing weight support, and we separately assessed abnormal synergies using the Fugl-
469 Meyer score for the Upper Extremity (FM-UE). Across patients, abnormal muscle synergies were not

470 correlated with loss of arm dexterity. Critically, there was a large difference in dexterity deficits between
471 subacute and chronic patients matched for similar levels of abnormal synergy: patients in the chronic stage
472 had more normal planar reaching trajectories even with worse FM-UE scores. These dissociations suggest
473 that abnormal synergies and dexterity deficits reflect distinct components of hemiparesis, perhaps
474 attributable to damage to separable systems. Finally, we found that FM-UE scores correlated with arm
475 weakness. This suggests that both synergies and weakness are independent of arm dexterity loss. In short,
476 our findings suggest that recovery from hemiparesis does not proceed uniformly across its components.
477 Stroke rehabilitation should be tailored for each patient based on their specific component deficits; a form
478 of behavioral precision medicine.

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