

Bimanual motor skill learning and robotic assistance for chronic hemiparetic stroke: a randomized controlled trial

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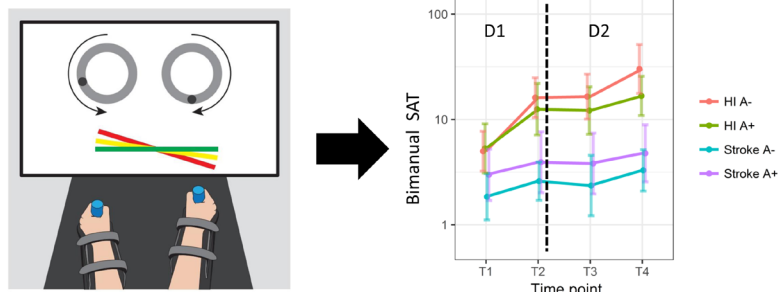
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Graphical Abstract Could robotics enhance bimanual skill learning after stroke?



Abstract

Using robotic devices might improve recovery post-stroke, but the optimal way to apply robotic assistance has yet to be determined. The current study aimed to investigate whether training under the robotic active-assisted mode improves bimanual motor skill learning (biMSkL) more than training under the active mode in stroke patients. Twenty-six healthy individuals (HI) and 23 chronic hemiparetic stroke patients with a detectable lesion on MRI or CT scan, who demonstrated motor deficits in the upper limb, were randomly allocated to two parallel groups. The protocol included a two-day training on a new bimanual cooperative task, LIFT-THE-TRAY, under either the active or active-assisted modes (where assistance decreased in a pre-determined stepwise fashion) with the bimanual version of the REAplan® robotic device. The hypothesis was that the active-assisted mode would result in greater biMSkL than the active mode. The biMSkL was quantified by a speed-accuracy trade-off (SAT) before (T1) and immediately after (T2) training on days 1 and 2 (T3 and T4). The change in SAT after 2 days of training (T4/T1) indicated that both HI and stroke patients learned and retained the bimanual cooperative task. After 2 days of training, the active-assisted mode did not improve biMSkL more than the active mode (T4/T1) in HI nor stroke patients. Whereas HI generalized the learned bimanual skill to different execution speeds in both the active and active-assisted subgroups, the stroke patients generalized the learned skill only in the active subgroup. Taken together, the active-assisted mode, applied in a pre-determined stepwise decreasing fashion, did not improve biMSkL more than the active mode in HI and stroke subjects. Stroke subjects might benefit more from robotic assistance when applied “as-needed.” This study was approved by the local ethical committee (Comité d’éthique médicale, CHU UCL Namur, Mont-Godinne, Yvoir, Belgium; Internal number: 54/2010, EudraCT number: NUB B039201317382) on July 14, 2016 and was registered with ClinicalTrials.gov (Identifier: NCT03974750) on June 5, 2019.

Key Words: bimanual; hemiparesis; motor learning; rehabilitation; robotic; robotic assistance; slacking; stroke retention

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Introduction

The most common deficit after stroke is hemiparesis, i.e., difficulties in controlling contralesional movements (Trombly, 1992). Stroke survivors with a paretic upper limb (UL) have demonstrated deficient coordination in cooperative bimanual tasks (Kantak et al., 2016), which may lead to loss of independence for activities of daily life (ADL). Thus, efficient bilateral UL neurorehabilitation programs are necessary (Veerbeek et al., 2014; Bernhardt et al., 2017; Kantak et al., 2017), based on several premises: (I) since most ADLs are bimanual, neurorehabilitation should involve bimanual exercises. (II) Impairments of the paretic UL cannot predict impairments in bimanual tasks (Lowrey et al., 2014; Kantak et al., 2016) because bimanual tasks are intrinsically more complex. Even if recovering from paretic UL's impairment is necessary, it likely will not be sufficient to recover bimanual ADL "automatically." (III): Simultaneous training of both hands/UL may improve the paretic UL function because of their spatial and temporal coupling (Rossini et al., 2003; Carson, 2005). Among bilateral training options (King et al., 2010; Meng et al., 2017; Raghavan et al., 2017), robotics seems promising (Kwakkel et al., 2008; Gassert and Dietz, 2018; Dehem et al., 2019; Duret et al., 2019).

Robotic devices enable repetitive and intensive practice (Lo et al., 2010; Mehrholz et al., 2012; Abdollahi et al., 2018) that can improve post-stroke motor performance and trigger neuroplastic changes (Buma et al., 2013; Han et al., 2013). Robotic devices usually feature several training modalities, among which: (Basteris et al., 2014) (I) The active mode: the subject performs the full movements freely, and the robotic device measures the subject's performance. (II) The active-assisted mode: the subject initiates the movement, and the robotic device intervenes exclusively under defined conditions (e.g., error). (III) The passive mode: the robotic device performs the movements thoroughly, and the subject is passive (Basteris et al., 2014).

Furthermore, the application of motor learning principles might enhance motor recovery (Kitago and Krakauer, 2013). E.g., the repetition of a motor task leads to lasting improvements in movement accuracy, indicating the acquisition of a motor skill (Willingham, 1998; Shmuelof and Krakauer, 2011; Shmuelof et al., 2012). Learning a motor skill shifts the speed/accuracy trade-off (SAT) and decreases the variability in motor performance between trials (Dayan and Cohen, 2011; Shmuelof et al., 2012). Motor skill learning is also characterized by retention and generalization of the learned motor skill to untrained conditions. Accordingly, several robotic devices have been developed to harness components of motor learning and intensive exercise-based training, including bimanual approaches (Johnson et al., 2000, 2006; Cauraugh and Kim, 2002; Lum et al., 2002, 2004; Hesse et al., 2003a, b; McCombe Waller et al., 2008; Lin et al., 2010; Trlep et al., 2011; Herrnsstadt et al., 2015; Grosmaire and Duret, 2017; Abdollahi et al., 2018).

Although the robotic devices led to improved motor performance, whether robotic assistance can improve bimanual coordination remains controversial. Many studies insist on the importance of active patients participation (Reinkensmeyer et al., 2009; Krishnan et al., 2013; Shirzad and Van der Loos, 2016), i.e., favoring minimal assistance from the robotic device such as the active mode. Other studies have shown that assistance during the training may improve paretic UL function (Colombo et al., 2010; Duret and Hutin, 2013), indicating the potential of the active-assisted mode.

In line with this controversy and to characterize the role of the active-assisted mode of a robotic device in bimanual coordination motor learning, we tested the hypotheses that (I) chronic hemiparetic stroke subjects can learn, retain and

generalize a challenging bimanual cooperative motor skill and that (II) the active-assisted mode applied in a stepwise decreasing fashion improves early bimanual learning more than the active mode in both healthy individuals (HI) and stroke subjects. For this purpose, we used the bimanual version of the robotic device for UL rehabilitation REAplan® (AXINESIS, Wavre, Belgium) that has been used successfully in previous rehabilitation studies (Gilliaux et al., 2014; Dehem et al., 2017).

Subjects and Methods

Subjects

Twenty-six young, healthy individuals (HI) aged 27.4 ± 3.2 years and 23 chronic stroke patients (aged 63.9 ± 11 years) were enrolled from CHU UCL Namur, Mont-Godinne (Neurology Department, Stroke Unit, Yvoir, Namur, Belgium, 5530) through the local stroke and HI databases after they provided written informed consent (**Additional file 1**). The study complied with the *Declaration of Helsinki*, and procedures were approved on July 14, 2016 (Internal number: 54/2010, EudraCT number: NUB B039201317382) by the local ethical committee (Comité d'éthique médicale, CHU UCL Namur, Mont-Godinne) (**Additional file 2**). The study protocol was reported in line with the Consolidated Standards Of Reporting Trials (CONSORT) 2010 guidelines (**Additional Figure 1**). For stroke subjects, the inclusion criteria were 1) having a chronic stroke (> 6 months), 2) being between 18–90 years old, 3) showing a lesion on brain imaging, and 4) demonstrating a motor deficit in the UL. The exclusion criteria were 1) problems in understanding or executing commands of the task, 2) alcohol or drug addiction. For HI, the inclusion criteria were 1) being right-handed and 2) being between 18–90 years old. Exclusion criteria were 1) having a history of neurological problems, 2) alcohol or drug addiction (**Additional file 3**). Twenty of them had an ischemic stroke, while three had a hemorrhagic stroke (**Table 1**).

The National Institutes of Health Stroke Scale (NIHSS) was used to estimate the level of neurological impairments in stroke subjects, and their activity limitation was evaluated with the modified Rankin Scale (mRS) (van Swieten et al., 1988) and the ABILHAND questionnaire (Penta et al., 2001) that assesses specifically residual bimanual capacity. The Box & Blocks test (B&B) (Mathiowetz et al., 1985; Desrosiers et al., 1993) was used to measure the baseline residual unimanual dexterity as well as potential generalization (Rossini et al., 2003; Carson, 2005) from bimanual training to unimanual task performance. The primary outcome measure was the change in SAT (see the Data analysis section).

Bimanual motor skill learning task: LIFT-THE-TRAY

The bimanual task involved circular, in-phase mirror movements of the ULs with 90° of the phase difference between their starting points (**Figure 1**). The robotic arms of the REAplan® (AXINESIS, Wavre, Belgium) simulated two virtual pulleys, each pulley was attached to one end of a virtual horizontal tray displayed on the screen and was controlled by one hand through the corresponding REAplan® handle. Simultaneous, coordinated, 90° out-of-phase (as if one virtual rope was shorter than the other one), rotating movements of both ULs on the two pulleys lifted the tray toward the top of the screen. The participants were told that different interactions with the REAplan® could be experienced during the different parts of the study. They were instructed to go as fast (speed constraint) and as accurately as possible during each block of training. Accuracy was defined as keeping the tray horizontal: with ideally coordinated bimanual movements, the tray should be lifted with zero-degree inclination compared to the horizontal (x) axis. Real-time feedback of accuracy was provided as a color code reflecting the angular deviation from the horizontal axis. As long as

Table 1 | Demographic characteristics of stroke patients

No.	Sex	Age (yr)	Time since stroke (yr)	Stroke localization	Type of stroke	Paretic hand	Dominant hand	mRS	NIHSS	ABILHAND Score	B&B			
											Paretic hand (T1)	Non-paretic hand (T1)	Paretic hand (T4)	Non-paretic hand (T4)
P1	F	52	0.5–1	C	Ischemic	Right	Right	3	4	−3.46	1.3	68.7	1.3	67.3
P2	F	28	1–3	C	Ischemic	Right	Right	2	4	−3.41	0	74.7	0	78.7
P3	F	76	>3	SC	Hemorrhagic	Left	Left	4	3	−6.07	0	46	0	48.7
P4	M	78	>3	SC	Hemorrhagic	Right	Right	4	5	−3.83	0	80.7	0	81.3
P5	F	63	>3	SC	Ischemic	Right	Right	4	4	−1.46	0	53.7	0	60.3
P6	M	73	>3	SC	Ischemic	Right	Right	2	2	0.91	0	76.7	0.3	81
P7	F	62	>3	C	Ischemic	Left	Right	3	1	−3.46	0	64.7	0	65
P8	M	50	>3	C	Ischemic	Right	Right	3	4	2.96	41.7	71.3	41.7	75.3
P9	F	53	>3	C	Ischemic	Left	Right	2	6	3.71	40	47.7	43	52.7
P10	M	68	>3	SC	Ischemic	Left	Right	2	4	−2.16	0	57	0	58
P11	F	50	1–3	C	Ischemic	Left	Right	2	6	−6.07	0	61.3	0	65
P12	M	84	1–3	C	Ischemic	Left	Right	3	4	−1.03	27.7	41.3	28	41.3
P13	F	62	>3	C	Hemorrhagic	Left	Right	3	6	−6.01	0	53.3	0	68.3
P14	M	67	>3	SC	Ischemic	Left	Right	3	4	0.67	18	43.7	15	51.3
P15	M	77	>3	SC	Ischemic	Right	Right	2	4	−6.07	0	38	43	0
P16	M	83	>3	C	Ischemic	Left	Right	3	7	−2.7	5	56	3	61.7
P17	F	66	1–3	SC	Ischemic	Left	Right	3	4	2.71	57.7	68	60.7	71.7
P18	M	85	1–3	C	Ischemic	Right	Right	3	4	3.46	0	53	0	55
P19	F	71	>3	C	Ischemic	Right	Right	3	6	0.008	0	61.7	0	68.7
P20	M	63	>3	SC	Ischemic	Right	Right	4	5	0.55	21.7	50	17	57.3
P21	F	57	>3	C	Ischemic	Right	Right	3	8	−4.45	0	44.7	0	55
P22	M	32	>3	C	Ischemic	Right	Right	2	4	−1.98	0	56.7	0	59
P23	M	69	1–3	SC	Ischemic	Left	Right	3	2	1.19	23.7	41.3	25	46.3
Mean± SD		F:11/M:12	63.9±11	C:13/SC:10	I:20/H:3	R:11/L:12	R:22/L:1	2.69±0.5	4.4±1.2	−1.56	10.3±13.7	57±10	12.1±15.3	59.5±11.3

T1: Before training on day 2. T4: after training on day 2. ABILHAND score (logit); B&B: Box & Blocks test (*n* of transferred blocks); C: cortical; F: female; M: male; mRS: modified Rankin Scale; NIHSS: National Institutes of Health Stroke Scale; SC: sub-cortical.

bimanual movements were perfectly coordinated or slightly de-synchronized (i.e., tray angle between 0° and 5° compared to the horizontal axis), the tray remained green. In the case of a moderate bimanual de-synchronization (between 6° and 19°), it turned yellow. If large bimanual de-synchronizations occurred (between 20° and 30°), the tray turned red. The maximum angle of de-synchronization allowed by the virtual wheels was set to 30° (**Additional file 4**).

REApplan®

The current study is the first one carried out with the bimanual version of the REApplan® (AXINESIS, Wavre, Belgium), an end-effector rehabilitation robotic device. Participants made movements in the horizontal plane while holding the two robotic handles. Customized gloves helped the stroke subjects with manual impairments to grasp the handles; the forearms were supported by two gutters to ensure stabilization (**Figure 1**). A large screen located in front of the subject provided online visual feedback. Position sensors of the REApplan® sampled the position of the handles at 80 Hz and recorded it on the controlling PC. Lateral robotic assistance was present during all exercises and for all subjects: it kept each handle on a circular trajectory, giving to the subject the illusion of controlling two “hard” pulleys through fixed forces. Additionally, longitudinal robotic assistance was provided exclusively during the active-assisted mode as an interaction to keep fixed the distance corresponding to the 90° out-of-phase difference between the two pulleys.

Study protocol

The study was a single-blind (i.e. only the subjects were blind to the experimental conditions), parallel-group, randomized clinical trial (RCT, ClinicalTrials.gov ID: NCT02308852). The subjects trained with either the active-assisted or the active robotic modes to learn a complex bimanual motor skill. For stroke subjects, the randomization was performed with minimization software (<http://www.saghaei.net/qminim/>).

Pre-specified randomization criteria (**Table 1**) were encoded in the software, which then determined whether the stroke subject's allocation to the active-assisted or active subgroups. The HI was allocated to the active-assisted or active subgroups in a pseudo-randomized fashion based on inclusion order. In HI, the active-assisted and active subgroups included twelve and fourteen subjects, respectively. Twelve and eleven stroke patients were randomized into the active-assisted and active subgroups, respectively (**Figure 2** and **Additional Figure 1**).

HI and stroke participants followed an identical protocol over two consecutive days (**Figure 2**). Each day (D1, D2) started with four series of exercises called TEST (further explanations below), followed by 20-min of training with either the active or active-assisted robotic modes (parallel-group design) and finished with another identical series of TEST. On D1 and D2, the protocol was identical. Thus, altogether there were four TESTs: T1, the TEST on D1 before training (baseline); T2 on D1 after training; T3 on D2 before training (assessing overnight retention), and finally T4 at on D2 after training. Each TEST included four series of exercises. Each exercise (20 seconds) was repeated five times, separated by a 50-second pause. When the tray reached the top of the screen, it re-appeared at the bottom of the screen with the same tilt angle. In the first series of exercises (free speed), the subjects were asked to perform the task as fast and as accurately as possible, exactly as during the training blocks. Then, they practiced three series of exercises during which a phantom tray ascended on the REApplan® screen with fixed, imposed speeds (i.e., 4, 8, and 12 cm/s, respectively). The participants were instructed to synchronize the ascent of their tray with that of the phantom as much as possible (fixed speed constraint) while attempting to keep the tray horizontal (accuracy constraint). The exercises with imposed speeds aimed to look for a generalization of the bimanual skill. For the stroke subjects, the B&B (Desrosiers et al., 1994) was performed twice, before T1 and after T4 (mean of three trials for each hand, starting with the non-paretic

hand), to assess potential generalization of bimanual skill training to a unimanual task.

After the T1 and T3 periods, the participants received 20 minutes of training at the free speed that comprised of 15 blocks of 1 minute separated by 25 seconds of between-block pause. In the active-assisted group, they started the first block with 100% longitudinal assistance helping them to keep the distance between the two handles constant (i.e., imposing optimal bimanual synchronization). Thus, no effort was needed to keep the tray horizontal during this block. During the next 14 blocks, the longitudinal assistance decreased in an imposed, stepwise fashion: 93%, 86%, 79%, 71%, 64%, 57%, 50%, 43%, 36%, 29%, 21%, 14%, 7% and finally 0%. In the active group, the participants performed the 15 training blocks without longitudinal assistance.

Data analysis

The REAplan® sampled the following data at 80 Hz that were stored on a PC for the offline analysis:

Speed: the speed of the tray, in cm/s

Error: the angle of the tray compared to the horizontal axis, in degree

SAT was calculated as: $SAT = \text{speed/error}$, in arbitrary units (a.u.)

The software recorded the exercise number and the percentage of longitudinal assistance provided during each block for the active-assisted mode. Longitudinal assistance was always 0% in the active group.

The data were processed using customized Matlab® (2015b, The MathWorks, Inc, Natick, MA, USA) routines; the mean of the SAT was calculated for each 20-second block of the exercises during the TESTs and each 1-minute block during training.

The primary outcome measure was the change in SAT in exercises with free speed and the three imposed speeds (4, 8, and 12 cm/s) in time (at T2, T3 and T4 compared to T1) in the active vs. active-assisted subgroups, for stroke patients and HI.

Statistical analysis

This is a first-time study with this robot and task, so no pilot data were available to compute a power analysis. The sample size (HI $n = 26$, stroke $n = 23$) is “custom” in the field for such experiments. The R software (The R Foundation, Boston, MA, USA, <https://www.r-project.org/>) including the nlme and ggplot2 packages was used to generate generalized linear mixed models (GLMMs). The distribution of SAT values was asymmetrical, so statistical tests were performed on log-transformed values, and a logarithmic scale was used in the Figures displaying the results. Besides, since a logarithmic scale was used, the geometric mean was calculated using the following formula:

The geometric mean of SAT (T_i): $\sqrt[n]{SAT_1 \times SAT_2 \times \dots \times SAT_n}$

where: $i = 1, 2, 3, 4$; and n = number of the HI or stroke participants

For each group (stroke subjects and HI) and each type of exercise (free speed, 4, 8, and 12 cm/s), we used a generalized linear mixed model (GLMM) with a random intercept for each subject. The $\ln(SAT)$ was the dependent variable, and the independent fixed variables were: time (T1, T2, T3, and T4, considered as a categorical variable), intervention (active or active-assisted mode), and the [time X intervention] interaction. Fixed effect coefficients (β) were then used to compute the fold change (FC) = Re^{β} .

In stroke patients, we counted the number of transferred blocks on the B&B for both paretic and non-paretic hand at T1 and T4. We then calculated the change from T1 to T4 separately for each hand with a 95% confidence interval (CI).

Results

Bimanual motor skill learning

Both the HI ($n = 26$) and chronic stroke subjects ($n = 23$) learned the bimanual cooperative task, as evidenced by the improvement of the SAT in the exercises with free speed over the 2 days (**Table 2** and **Figure 3**). In HI, between T1 and T4, the SAT improved as shown by an FC of 6 and 3 in the active and active-assisted subgroups, respectively. In stroke subjects, the FC between T1 and T4 was 1.8 and 1.6, respectively.

In HI, between T1 and T2 (i.e., on D1), the SAT improved with an FC of 3 and 2 in the active and active-assisted subgroups, respectively. In stroke subjects, the FC was 1.4 and 1.3, respectively. Overall, there was no offline (overnight) improvement from T2 to T3, and both the HI and stroke subjects kept improving on D2 from T3 to T4 (**Table 2** and **Figure 3**).

Generalization

In HI, for both active and active-assisted subgroups, we observed generalization at all three imposed speeds (4, 8, and 12 cm/s) at the three time points (i.e., T2, T3 & T4) compared to T1 (**Table 2** and **Figure 4**). In stroke subjects, for the imposed speed of 8 cm/s, we observed a generalization in the active subgroup with an FC of 1.40 from T1 to T2, and with an FC of 1.72 from T1 to T4. For the imposed speed of 12 cm/s, generalization was observed in the active subgroup only from T1 to T4, with an FC of 1.72. No generalization was observed at the imposed speed of 4 cm/s. In the active-assisted subgroup, generalization was detected exclusively for 8 cm/s from T1 to T3, with an FC of 1.39.

B&B results

In stroke subjects, the number of transferred blocks in unimanual B&B indicated no generalization to this unimanual task from T1 to T4 in the paretic or non-paretic hand in the active-assisted or active subgroups (**Additional Figure 2**).

Effect of the active-assisted mode on bimanual motor skill learning

In stroke subjects, the active-assisted mode did not improve bimanual motor skill learning (biMSkL) compared to the active mode (FC [95% CI]: 0.90 [0.63–1.28] at T4). In HI, the active-assisted mode was even found to halve biMSkL compared to the active mode (0.52 [0.39–0.70] at T4). Furthermore, the active-assisted mode did not improve generalization at imposed speeds compared to the active mode in HI nor stroke subjects (**Table 2**). Finally, the active-assisted mode did not result in better generalization in B&B when compared with the active mode in the paretic hand (−0.02 [−15.0–15.0]) or in non-paretic hand (0.4 [−14.5–15.4]) (**Additional Figure 2** and **Table 1**).

Discussion

In this study, both HI and chronic hemiparetic stroke subjects learned and retained a new bimanual cooperative skill with the bimanual version of the REAplan® rehabilitation robot. HI, generalized the bimanual skill learned under an SAT approach to the exercises with imposed speeds, in both the active and active-assisted subgroups. Whereas the stroke subjects in the active subgroup generalized the bimanual skill to the two fastest imposed speeds (8 and 12 cm/s), there was no generalization at the slowest speed (4 cm/s), nor for the stroke subjects in the active-assisted subgroup at any imposed speed.

In contradiction with our hypothesis, the pre-defined, stepwise decrease of robotic assistance in the active-assisted mode did not improve bimanual cooperative skill learning, retention, or generalization in HI or stroke subjects compared to the active mode. In HI, bimanual cooperative

Table 2 | Change in speed/accuracy trade-off (SAT) in healthy individuals (HI) and stroke subjects

Participants	Speed	Robotic assistance	Measure	T1	T2	T3	T4
Healthy	4 cm/s	A ⁻	GM (GSD)	76.63 (1.16)	87.19 (1.04)	88.89 (1.04)	88.33 (1.05)
		A ⁺	GM (GSD)	64.79 (1.44)	83.30 (1.12)	88.43 (1.05)	87.27 (1.06)
		A ⁻	FC [95%CI]	1.00 [ref.]	1.14 [1.02–1.26]	1.16 [1.04–1.29]	1.15 [1.04–1.28]
		A ⁺	FC [95%CI]	1.00 [ref.]	1.29 [1.15–1.44]	1.36 [1.22–1.53]	1.35 [1.20–1.51]
		A ⁺ /A ⁻	FC [95%CI]	1.00 [ref.]	1.13 [0.97–1.32]	1.18 [1.01–1.37]	1.17 [1.00–1.36]
	8 cm/s	A ⁻	GM (GSD)	72.41 (1.16)	83.70 (1.03)	86.79 (1.04)	86.39 (1.05)
		A ⁺	GM (GSD)	67.16 (1.18)	80.16 (1.07)	84.66 (1.06)	84.42 (1.06)
		A ⁻	FC [95%CI]	1.00 [ref.]	1.16 [1.10–1.22]	1.20 [1.14–1.26]	1.19 [1.13–1.26]
		A ⁺	FC [95%CI]	1.00 [ref.]	1.19 [1.13–1.26]	1.26 [1.19–1.33]	1.26 [1.19–1.33]
		A ⁺ /A ⁻	FC [95%CI]	1.00 [ref.]	1.03 [0.96–1.12]	1.05 [0.97–1.14]	1.05 [0.98–1.14]
	12 cm/s	A ⁻	GM (GSD)	70.37 (1.17)	81.04 (1.02)	83.63 (1.04)	84.53 (1.05)
		A ⁺	GM (GSD)	63.38 (1.24)	75.48 (1.09)	80.58 (1.06)	82.49 (1.06)
		A ⁻	FC [95%CI]	1.00 [ref.]	1.15 [1.08–1.22]	1.19 [1.12–1.26]	1.20 [1.13–1.28]
		A ⁺	FC [95%CI]	1.00 [ref.]	1.19 [1.11–1.27]	1.27 [1.19–1.36]	1.30 [1.22–1.39]
		A ⁺ /A ⁻	FC [95%CI]	1.00 [ref.]	1.03 [0.95–1.13]	1.07 [0.98–1.17]	1.08 [0.99–1.19]
	Free	A ⁻	GM (GSD)	5.00 (1.55)	16.12 (1.55)	16.50 (1.63)	30.22 (1.71)
		A ⁺	GM (GSD)	5.32 (1.71)	12.52 (1.76)	12.16 (1.68)	16.74 (1.53)
		A ⁻	FC [95%CI]	1.00 [ref.]	3.23 [2.64–3.95]	3.30 [2.70–4.04]	6.05 [4.94–7.40]
		A ⁺	FC [95%CI]	1.00 [ref.]	2.35 [1.89–2.93]	2.29 [1.84–2.84]	3.15 [2.53–3.91]
		A ⁺ /A ⁻	FC [95%CI]	1.00 [ref.]	0.73 [0.54–0.98]	0.69 [0.51–0.93]	0.52 [0.39–0.70]
Stroke	4 cm/s	A ⁻	GM (GSD)	22.69 (1.65)	29.98 (1.56)	30.96 (1.84)	30.34 (1.84)
		A ⁺	GM (GSD)	17.13 (1.82)	19.52 (2.56)	21.00 (2.59)	21.64 (2.60)
		A ⁻	FC [95%CI]	1.00 [ref.]	1.32 [0.96–1.81]	1.36 [0.99–1.87]	1.34 [0.97–1.84]
		A ⁺	FC [95%CI]	1.00 [ref.]	1.14 [0.85–1.52]	1.23 [0.92–1.64]	1.26 [0.95–1.69]
		A ⁺ /A ⁻	FC [95%CI]	1.00 [ref.]	0.86 [0.56–1.33]	0.90 [0.58–1.38]	0.94 [0.61–1.45]
	8 cm/s	A ⁻	GM (GSD)	17.66 (1.71)	24.76 (1.97)	27.95 (1.79)	30.30 (1.74)
		A ⁺	GM (GSD)	16.41 (1.96)	17.16 (2.11)	22.77 (2.16)	20.79 (2.47)
		A ⁻	FC [95%CI]	1.00 [ref.]	1.40 [1.02–1.92]	1.58 [1.16–2.17]	1.72 [1.25–2.35]
		A ⁺	FC [95%CI]	1.00 [ref.]	1.05 [0.79–1.39]	1.39 [1.04–1.85]	1.27 [0.95–1.69]
		A ⁺ /A ⁻	FC [95%CI]	1.00 [ref.]	0.75 [0.49–1.14]	0.88 [0.57–1.34]	0.74 [0.48–1.13]
	12 cm/s	A ⁻	GM (GSD)	14.95 (1.76)	19.95 (1.80)	24.84 (1.92)	25.76 (1.90)
		A ⁺	GM (GSD)	19.86 (1.57)	15.58 (2.48)	20.66 (2.25)	19.07 (2.55)
		A ⁻	FC [95%CI]	1.00 [ref.]	1.33 [0.98–1.81]	1.66 [1.22–2.25]	1.72 [1.27–2.34]
		A ⁺	FC [95%CI]	1.00 [ref.]	0.78 [0.59–1.04]	1.04 [0.79–1.37]	0.96 [0.73–1.27]
		A ⁺ /A ⁻	FC [95%CI]	1.00 [ref.]	0.59 [0.39–0.89]	0.63 [0.41–0.95]	0.56 [0.37–0.84]
	Free	A ⁻	GM (GSD)	1.85 (1.66)	2.60 (1.52)	2.36 (1.94)	3.29 (1.57)
		A ⁺	GM (GSD)	2.98 (1.75)	3.92 (1.95)	3.82 (1.95)	4.77 (1.87)
		A ⁻	FC [95%CI]	1.00 [ref.]	1.41 [1.09–1.82]	1.28 [0.99–1.65]	1.78 [1.38–2.30]
		A ⁺	FC [95%CI]	1.00 [ref.]	1.32 [1.03–1.69]	1.28 [1.00–1.64]	1.60 [1.25–2.05]
		A ⁺ /A ⁻	FC [95%CI]	1.00 [ref.]	0.94 [0.65–1.34]	1.00 [0.70–1.43]	0.90 [0.63–1.28]

The biMSKL was quantified by a speed-accuracy trade-off before (T1) and immediately after (T2) training on days 1 and 2 (T3 and T4). At T1, the geometric mean (GM) and geometric standard deviation (GSD) are given. The fold change (FC, mean and [95 % CI]) of SAT in HI and stroke subjects at T2, T3 and T4 relative to their baseline (T1) in the active (A⁻) and the active-assisted (A⁺) subgroups, and the comparison between them (A⁺/A⁻), were calculated with a generalized linear mixed model for each speed. a.u.: Arbitrary units.

motor learning even deteriorated in the active-assisted subgroup compared to the active subgroup. Chemuturi and colleagues (Chemuturi et al., 2013) showed that during a unimanual reaching task, when the active-assisted mode of a robotic device was adjusted to the individual’s need (i.e., “assistance-as-needed”), it improved motor performance in HI. Accordingly, one possible explanation for the lack of effect of active-assisted mode in our study might be that the robotic assistance was applied as a fixed, stepwise, decrease rather than assistance-as-needed. Theoretically, because the robotic assistance decreased at each training block, the HI should have progressively relied less on it. However, the active-assisted mode might have induced slacking, i.e., naturalistic trends to reduce efforts when the error is small and thus to rely “too heavily” on robotic assistance (Kahn et al., 2006a; Reinkensmeyer et al., 2012). Another explanation could be that the active-assisted mode might improve biMSKL in HI only when the task is very complex (Li et al., 2013). Our bimanual task, LIFT-THE-TRAY, might have been too easy for HI

(e.g., with a potential ceiling effect). Finally, although review papers have demonstrated that robot-assisted therapies are beneficial for UL neurorehabilitation after stroke (Kwakkel et al., 2008; Gassert and Dietz, 2018), the effect of the active-assisted mode on motor skill learning in HI requires more studies to compare this model with other robotic modes.

In stroke subjects, bimanual priming rehabilitation with active-passive bimanual movement therapy (APBT) (Stinear and Byblow, 2004) and bimanual motor training with Bilateral Upper Limb Trainer (Sampson et al., 2012) result in improvements of UL performances and evidenced by the improvements in UL Fugl Meyer Assessment (FMA-UL). Given that “conventional” bilateral arm training approaches have shown promising results in neurorehabilitation (Cauraugh and Kim, 2002; McCombe Waller et al., 2008; Lin et al., 2010), several robotic devices such as the Bi-Manu-track (Hesse et al., 2003a), mirror-image motion enabler (Johnson et al., 2000, 2006; Lum et al., 2004), and the bimanual wearable robotic device (Herrnstadt et al., 2015) were designed

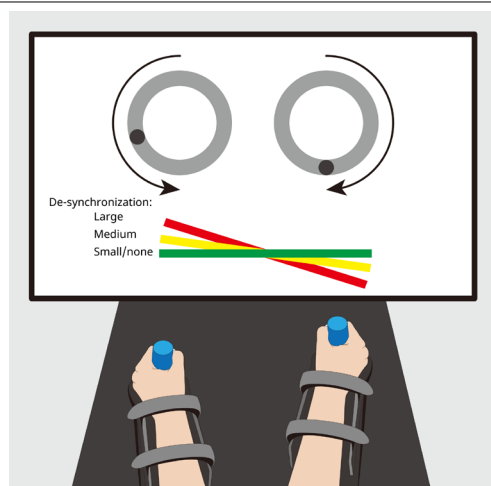


Figure 1 | The bimanual cooperative task "LIFT-THE-TRAY."

The bimanual task was implemented on the bimanual version of the REAplan®. The subjects were instructed to lift the tray as quickly and accurately (i.e., keeping the tray horizontal) as possible by turning two virtual pulleys (illustrated by the light grey circles) through cyclical, in-phase movements. There was a 90-degree phase difference between the starting points of the virtual pulleys, illustrated by the dark grey dots. The forearms were supported by gutters, and the robotic handles were adapted to the residual grasp of the stroke subjects. The color of the tray provided real-time feedback of the tray orientation's accuracy (angle from the horizontal line 0°–5°: green, 6°–19°: yellow, 20°–30°: red, maximal deviation allowed: 30°).

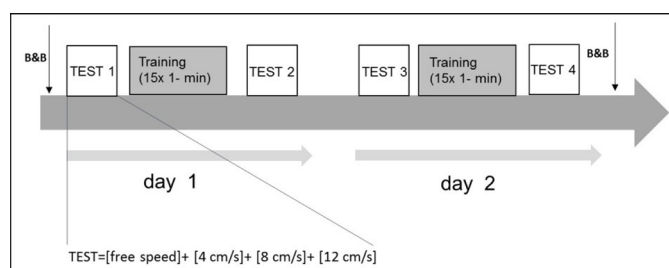


Figure 2 | Study protocol.

The protocol consisted of two consecutive days. D1 started with a series of TEST at free speed and with three imposed speeds (4, 8, and 12 cm/s). Then, the subjects trained for 15 minutes with the active-assisted mode or active mode, according to the randomization. After a short pause, training was followed by another, identical, series of TEST. D2 was identical to D1. Before starting TEST 1 and after finishing TEST 4, unimanual hand dexterity was evaluated using the Box & Blocks test (B&B), only in stroke subjects.

to offer bilateral training. E.g., three weeks of 15-minute additional training with the active-assisted mode of the Bi-Manu-Track reduced spasticity in 8 out of 12 stroke subjects (Hesse et al., 2003b). However, the improvements in motor control scores (impairment) did not translate into functional task improvements (activity limitation). Using the mirror-image motion enabler, the effect of bimanual robot-assisted training with conventional training in 27 chronic stroke subjects were compared (Lum et al., 2002). Compared to conventional therapy, twenty-four sessions of bilateral training with the mirror-image motion enabler resulted in larger improvements in the UL Fugl Meyer Assessment and in the reaching magnitude. Using a Haptic Master Robot, Trlep et al. (2011) trained four hemiparetic chronic stroke subjects on a bimanual tracking task requiring coordination between the hands, which improved bimanual motor performance as well as force production in the paretic UL. On the other hand, motor training, both with and without robotics, resulted in the same improvements of UL function in stroke subjects quantified with the Arm Motor Ability Test and UL Fugl Meyer Assessment (McCabe et al., 2015). Along the same line, in chronic stroke subjects, twenty-four sessions of reaching

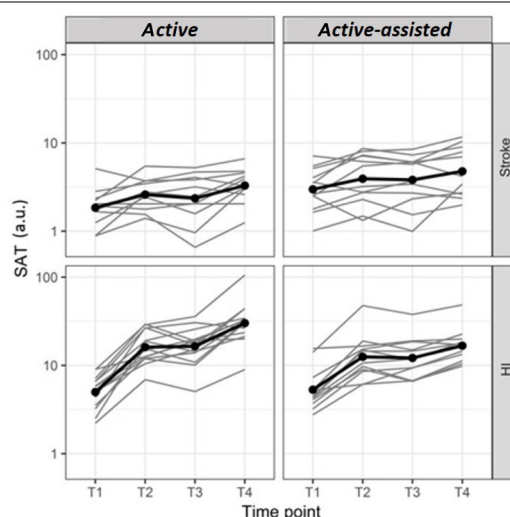


Figure 3 | Evolution of SAT in free speed TESTs on D1 and D2.

The bimanual SAT was expressed in arbitrary units (a.u.) and displayed on a logarithmic scale at four time points: on day 1 before (T1, baseline) and after training (T2), on day 2 before (T3) and after training (T4), in stroke subjects and healthy individuals (HI) in both the active and active-assisted subgroups. Thin grey lines: individuals, thick black lines: mean of the groups. Both the HI and chronic stroke subjects improved on LIFT-THE-TRAY on D1, retained overall the improvements overnight, and kept improving on D2, showing learning of the bimanual cooperative task. SAT: Speed/Accuracy trade-off.

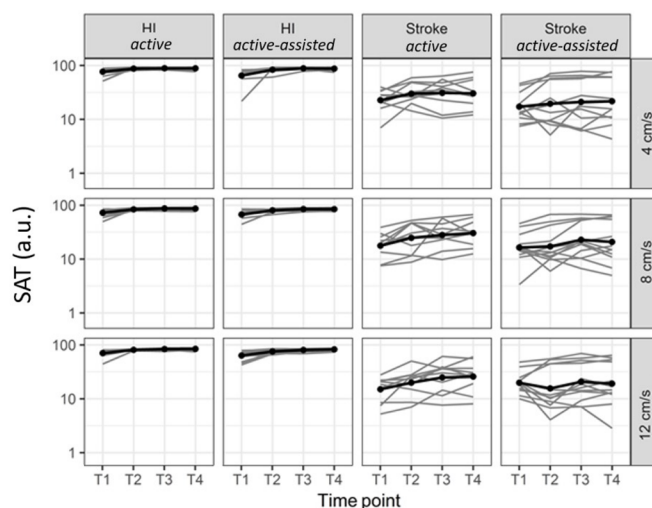


Figure 4 | Generalization: SAT evolution from T1 to T4 (imposed speeds: 4, 8, and 12 cm/s).

The bimanual SAT was expressed in arbitrary units (a.u.) and displayed on a logarithmic scale at four time points: on day 1 before (T1, baseline) and after training (T2), on day 2 before (T3) and after training (T4), in stroke subjects and healthy individuals (HI) in both the active and active-assisted subgroups. Thin lines: individuals, thick lines: mean of the groups. In healthy individuals (HI), for both active and active-assisted subgroups, generalization was found at all three imposed speeds and time points. SAT: Speed/Accuracy trade-off.

training with either active or active-assisted mode resulted in similar improvements in UL' velocity and range of motions (Kahn et al., 2006b), raising the question of whether training with robotic devices results in greater improvements of UL function compared to non-robotic interventions. In line with this concern, review papers have reported no effect (Norouzi-Gheidari et al., 2012; Rodgers et al., 2019) or a small effect (Kwakkel et al., 2008; Ferreira et al., 2018) of robot-assisted therapy on motor control recovery, possibly because of defective methods or insufficient length of treatment (Ferreira et al., 2018). Therefore, the potentially superior effect of training with robotic devices compared to "conventional" neurorehabilitation is still controversial and requires further

studies.

In our study, the active-assisted mode, applied in an imposed, stepwise, decreasing manner did not improve biMSKL in chronic hemiparetic stroke subjects compared to the active mode. Krishnan and colleagues demonstrated that twelve sessions of gait training with minimal robotic assistance improved the speed of walking as well as the lower extremity FMA scores in a chronic stroke subject more significantly compared to a full robotic assistance condition (Krishnan et al., 2013). Training involving the active participation of stroke subjects may thus be more beneficial in reducing functional impairments (Krishnan et al., 2013). In line with this study, it has been suggested that in the context of motor recovery, tasks need to be minimally assisted (Emken et al., 2007; Casadio et al., 2009), and “assistance as needed” might be beneficial for stroke subjects (Casadio et al., 2009), in order to avoid slacking (Kahn et al., 2006a; Reinkensmeyer et al., 2012). In contrast with “assistance as needed,” in our study, the level of robotic assistance in the active-assisted mode decreased steadily block after block in an imposed manner, irrespective of the individual’s need, which failed to show effectiveness. Hence, the optimum strategy for using robotic active-assisted modes in stroke subjects might be “assistance as needed” rather than imposed levels of (stepwise decreasing) assistance.

Finally, despite the retention of the bimanual cooperative skill, the 2-day training with the active or active-assisted modes did not generalize to improved unimanual hand dexterity in chronic stroke subjects, as demonstrated by the stability of the B&B scores. In a previous study, we demonstrated that 30 minutes of training with another complex bimanual cooperative task resulted in significant improvements of hand dexterity quantified by the B&B scores (Doost et al., 2019). Several elements might explain this difference. First, the setups were quite different (REAplan® robotic device versus a custom-made system with two computer mice). Second, the tasks were also different, with cyclical, out-of-phase, rotating cooperative movements in the LIFT-THE-TRAY task versus very asymmetrical cooperative movements in the bimanual CIRCUIT task involving the navigation of a (bimanually controlled) cursor within a complex circuit displayed on the screen (Doost et al., 2019). It is also possible that more extended training with LIFT-THE-TRAY is necessary to improve hand dexterity in stroke subjects.

In conclusion, both HI and chronic hemiparetic stroke subjects learned and retained a complex bimanual cooperative motor task implemented in the bimanual version of the REAplan® neurorehabilitation robot. The generalization to different imposed speeds occurred in HI training with either the active or the active-assisted mode. However, in stroke subjects, generalization occurred exclusively and inconstantly under the active mode. Finally, the active-assisted mode did not improve bimanual cooperative motor skill learning in stroke subjects nor HI compared to the active mode. Further studies with longer training sessions, with long term retention testing, and with the robotic assistance applied “as needed” customized to the stroke subject’s need and their level of recovery rather than a fixed, stepwise schedule are necessary to investigate whether the active-assisted mode applied “as needed” can improve biMSKL more than the active mode in HI and stroke subjects.

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Author contributions: YV and MYD conceived the bimanual task and designed study protocol; AD, JS, DG and BH developed the software of the bimanual task (LIFT-THE-TRAY) implemented it in the REAplan® environment; PL and YV recruited the stroke subjects; MYD, AR, and YV recruited the healthy individuals; MYD acquired the data; MYD, AD and BH extracted and processed the data; BB performed the statistical analyses; YV and MYD drafted the manuscript; all the authors corrected and improved the manuscript.

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Institutional review board statement: The study complied with the Declaration of Helsinki, and procedures were approved on July 14, 2016 (Internal number: 54/2010, EudraCT number: NUB B039201317382) by the local ethical committee (Comité d’éthique médicale, CHU UCL Namur, Mont-Godinne, Yvoir, Belgium).

Declaration of patient consent: The authors certify that they have obtained all appropriate patient consent forms. In the forms the patients have given their consent for their images and other clinical information to be reported in the journal. The patients understand that their names and initials will not be published and due efforts will be made to conceal their identity, but anonymity cannot be guaranteed.

Reporting statement: This study followed the CONSolidated Standards Of Reporting Trials (CONSORT) statement.

Biostatistics statement: The statistical methods of this study were reviewed by the biostatistician of the CHU UCL Namur, Mont-Godinne (UCLouvain) in Belgium.

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Additional files:

Additional file 1: Model consent form (French).

Additional file 2: Ethical approval documentation (French).

Additional file 3: Stroke subjects screening.

Additional file 4: Supplementary information about the bimanual motor skill learning task, LIFT-THE-TRAY.

Additional Figure 1: CONSORT flowchart.

Additional Figure 2: Box and Blocks Test (B&B).

Additional Table 1: Evolution of The Box & Blocks test scores.

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