# RESEARCH

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# Should you hold onto the treadmill handrails or not? Cortical evidence at different walking speeds

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# Abstract

**Background** Treadmill-based gait training is part of rehabilitation programs focused on walking abilities. The use of handrails embedded in treadmill systems is debated, and current literature only explores the issue from a behavioral perspective.

**Methods** We examined the cortical correlates of treadmill walking in healthy participants using functional nearinfrared spectroscopy. We investigated whether the utilization of treadmill handrails at varying walking speeds could affect cortical activation associated with the task, and we evaluated potential differences in task-based functional connectivity across the various walking conditions.

**Results** Significant differences in cortical activation were found between the two walking speeds (3 and 5 km/h) in the unsupported condition; these differences were reduced when using the handrails. Specifically, cortical activation was significantly higher when the participants swung their arms freely while walking at a speed of 5 compared to 3 km/h in several Brodmann's Areas (BA): left BA10, BA3 and BA39, and right BA10, BA9, BA8, BA3, and BA40. No significant differences were found when participants were holding onto the handrails. A significant difference was found in the left BA40 between the two speeds, regardless of whether the participants were holding onto the handrails. Furthermore, at the higher speed and without the use of handrails, a wider pattern of task-based functional connectivity was observed, with significantly stronger connectivity between the left BA10 and BA40.

**Conclusions** We suggest that speed and handrails use play a role in walking cortical activity patterns, therefore they are key ingredients to take into account when planning a rehabilitation program.

Keywords Functional near-infrared spectroscopy, Haptic contact, Treadmill, Walking speed

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# Background

Gait abnormalities during old age and as a result of neurological diseases are very debilitating and can increase the risk of falls [1], negatively affect independence and quality of life [2], and increase health care costs [3]. For this reason, walking abilities are often considered a primary focus for rehabilitation programs.

To create controlled setups in rehabilitation, several studies recommend treadmill-based gait training paradigms [4], and body weight support systems are allowed in order to minimize the delay in starting gait training for neurological patients and to increase safety without the use of walking aids [5]. The use of handrails embedded in treadmill systems helps to stabilize the body by increasing afferent somatosensory signals through haptic contact with the handrails [6–8].

Some controversial results have been reported in the literature on the use of treadmill handrails during rehabilitation. First of all, it should be considered that holding the hands onto the handrails of the treadmill might not imply a representative walking pattern, in terms of an ecological perspective, since it encourages bad posture and prevents the natural stride [9-11]. It has been reported that supporting on the handrails lightens the workload since it requires less muscular activation without resulting in substantial neuromuscular re-organization. In fact, it increases the base of support, resulting in greater stability, reduces uncertainty leading to a better balance, and improves ability to generate corrective forces to compensate for perturbations [12]. Also, handrail use during treadmill walking in a split-belt adaptation training reduced locomotor learning in healthy young subjects, suggesting that this balance support may ease, or alter the task demand [6].

It has been shown that the effect of gait rehabilitation can be improved by holding handrails [13], especially when participants used a firm rather than a light touch on the handrails [12]. It should be noted, however, that Bello and colleagues attributed the improvements seen during the rehabilitation of patients with Parkinson's disease to the belts used in combination with the treadmill, instead of the handrails themselves [14].

Nevertheless, all these studies explored the issue from a behavioral perspective. To our knowledge, the effects of holding handrails during treadmill walking have never been investigated with neuroimaging techniques.

In general, in order to propose effective rehabilitation paradigms, it is necessary to reach a better understanding of the mechanisms underlying the gait under various conditions [15]. Walking has long been regarded as predominantly automatic process, however functional magnetic resonance imaging (fMRI) studies based on motor imagery of gait have demonstrated a cortical control even during simple walking processes in healthy elderly, pathological subjects, as well as healthy young individuals [16–18]. The areas mainly involved in gait are the prefrontal cortex, supplementary motor, premotor and primary motor areas, sensorimotor areas; their activity has been found to be modulated by task demand [17, 19]. Bakker and colleagues asked their participants to (visually) imagine a normal gait or a precision gait over a narrower path, finding an increased cortical activity in cortical structures outside primary motor regions during the harder task, thus emphasizing greater cortical activity when an increased postural control is required [16].

Portable neuroimaging techniques, such as functional near-infrared spectroscopy (fNIRS), led to identify cortical activation patterns and locomotor networks involved in walking, providing new insight into cortical control of actual human locomotion [20–22]. In fact, this technique made it possible to study walking during its actual performance and to modulate the difficulty of the task [19], the somatosensory feedback from different peripheral stimuli [23], or to assess the difference between walking and running [24].

In this vein, we investigated the cortical correlates of treadmill walking by means of fNIRS in a group of healthy participants. We were interested in understanding whether the use of treadmill handrails, at different walking speeds, could modulate cortical activation related to the task. Specifically, we carried on an fNIRS study while walking on a treadmill at two different speeds (3 and 5 km/h - lower or equal with respect to the spontaneous walking speed of young healthy subjects [25]), with or without holding onto the handrails. Furthermore, one published study based on fMRI showed that individuals with faster gait speed have stronger resting-state functional connectivity (FC) within the frontoparietal control network, and that gait variability is correlated with between-network functional connectivity [26]. As a step forward, here using fNIRS we were able to assess possible differences in task-based FC among the task conditions during walking to better understand how task performance modulated the connectivity between cortical regions, providing a more comprehensive view of cortical function beyond isolated regional activity.

It has been reported that, during comfortable walking, lower extremity muscle activity had a strong correlation with cortical activation [27]. Therefore, we expected to find differences in cortical activation between the two walking speeds in the unsupported condition. Given that walking with handrails can lighten the workload of walking requiring less muscular activation [12], we hypothesized that this condition would be associated with a reduced brain resource demand and that the use of the handrails could mitigate the differences in cortical activity due to the walking speed.

# **Materials and methods**

## Participants

Twenty-four healthy, right-handed volunteers were included in this study (age =  $27.0 \pm 6.3$  years, 13 females). None of them had a history of orthopedic or neurological disease and none had previously trained in treadmill walking or running. Those who regularly train on the treadmill were excluded from recruitment. All the participants were naïve to the specific purpose of the study and provided written informed consent to participate. The study was approved by the University Ethics Committee (CERA), Genoa, Italy (N. 2023/44). The work described has been carried out in accordance with The Code of Ethics of the World Medical Association (Declaration of Helsinki) for experiments involving humans.

#### **Experimental protocol**

Participants were asked to perform different locomotor tasks on a treadmill (Technogym, Italy), and cortical activation elicited by the tasks was assessed through fNIRS. A box-car design was implemented, with 30 s of walking (differently depending on the specific task condition) and 30 s of rest in an upright position (Fig. 1).

Before the acquisition session, participants familiarized with the task - hence the speed and the holding conditions - that would follow by walking on the treadmill at 3 km/h and 5 km/h, both with and without holding onto the handrails. Then, task conditions were four: in two conditions, they walked with a spontaneous swing of the arms, and the speed of the treadmill was set at 3 km/h or at 5 km/h (V3 no-HOLD and V5 no-HOLD conditions, respectively); in the other two conditions, participants were asked to repeat the two conditions leaning on the handrails of the treadmill while walking at 3 km/h or at 5 km/h (V3\_HOLD and V5\_HOLD conditions, respectively). During the rest periods, participants remained in an upright position on the treadmill, with their arms along the body or with their hands on the handrails, according to the previous task condition (no-HOLD or HOLD, respectively). Notably, the rest period allowed the hemodynamic signal to return to baseline.

Each condition was repeated eight times, and the order of the conditions was randomized by a custom script created with OpenSesame version 3.2.7 [28], which played a *start* audio signal at the beginning of the task and a *stop* audio signal at the end of the 30 s walk. Moreover, using the PsychoPy backend [29] of OpenSesame, the



**Fig. 1** Experimental protocol. A box-car design was implemented, with 30 s of walking on a treadmill and 30 s of rest in an upright position. Walking was performed in four different randomized conditions: the speed of the treadmill was set at 3 km/h or at 5 km/h, and participants kept their hands on the handrails (V3\_HOLD and V5\_HOLD respectively) or walked with a spontaneous swing of the arms (V3\_no-HOLD and V5\_no-HOLD respectively). During the rest period, participants kept their arms along the body or their hands on the handrails, depending on the related task condition. Each trial was repeated eight times

Lab Streaming Layer protocol [30] was implemented in order to indicate the beginning of each block over the fNIRS recording and enable off-line analysis of the different conditions, separately.

At the end of each condition, participants were asked to rate their perceived levels of fatigue and task difficulty using a Visual Analog Scale (VAS). The VAS scale ranged from 0 to 10, where 0 indicated "no fatigue" or "no difficulty" and 10 represented "extreme fatigue" or "extreme difficulty". This approach allowed us to gather subjective feedback on the exertion and complexity associated with each condition, providing additional insights into participants' experiences during the task.

The entire experimental protocol lasted 32 min.

#### fNIRS data acquisition

Cortical hemodynamic activity was estimated by means of fNIRS, using a portable, multichannel NIRS system (NIRSport 2, NIRx Medical Technologies, Berlin, Germany) to allow for the calculation of changes in the concentration of oxyhemoglobin (HbO) and deoxyhemoglobin (HbR). Pairs of sources and detectors operating at two continuous wavelengths of near-infrared light (760 nm and 850 nm) generated measurement channels. All single-tip optodes were placed on a soft black tissue cap (EasyCap, Germany) worn by the participant, with different cap sizes used according to own head circumference. Sixteen sources and 16 detectors were arranged to form 44 standard channels (3 cm) covering the prefrontal, frontal, sensorimotor and parietal areas (Table 1). In addition, 8 short-separation (SS) channels (8 mm) were used to isolate and remove the extracerebral signals, which include blood pressure weaves, Mayer waves, respiration and cardiac cycles and can be seen as the noise in the signal of the long channels [31]. The sampling frequency was set at 8.7 Hz.

## fNIRS data analysis

For each participant, the fNIRS signal was pre-processed using MATLAB version R2023b (MathWorks, MA, USA) through custom scripts including some of the Homer3 NIRS processing package functions [32]. Channels with low signal-to-noise ratio were discarded (SNR<2). Then, the intensity data of the remaining channels were converted to optical density changes. Motion artifacts were identified by applying the Homer3 function *hmrR*\_ *MotionArtifactByChannel* on changes in optical density data (AMPthresh = 0.5; STDEVthresh = 12; tMotion = 0.5; and tMask = 1 [33–36] and corrected by applying a combination [36, 37] of spline (*p*=0.99) [38, 39] and wavelet (iqr=0.5) [40] motion correction techniques. A bandpass filter (0.01–3 Hz) was applied to remove slow drifts, and high frequencies contribution. Then, with the *hmrR*\_ *StimRejection* function, we assessed the absence of trials containing residual motion artifacts before the calculation of the hemodynamic response function (HRF). An age-dependent differential pathlength factor was computed for each participant [41], and then the HbO and HbR concentration changes were computed through the modified Beer-Lambert law [42].

### Statistical analysis

To calculate the mean HRF for each condition, participant, and channel, a General Linear Model (GLM) was applied. Iterative weighted least squares were used to solve the GLM [43]. A set of a consecutive sequence of gaussian functions with a spacing and standard deviation of 2 s was used as temporal basis functions for HRF [44–46]. The interval for the block average was set from -2 to 45 s from stimulus onset. Baseline-corrected averaging was assessed considering the mean value of the interval between -2 and 0 s with respect to the onset of each walking block as baseline. As an additional regressor in the GLM, the most correlated SS channel was added. The SS channel regression led to the reduction of the physiological noise.

HbO and HbR concentration changes of channels belonging to the same hemisphere and Brodmann's Area (BA) were averaged separately obtaining the signal in eighteen regions of interest (BA3, BA4, BA6, BA7, BA8, BA9, BA10, BA39, and BA40 for both the left and right hemispheres) [47, 48].

The statistical analyses employed an average metric of the hemodynamic responses in the range of 5 to 20 s after stimulus onset for each participant, condition, and BA to avoid gait initiation and to measure activation at steadystate speed.

In order to identify the BAs that were significantly activated during walking in the different conditions, after testing for normality with the Shapiro-Wilk test, the one-sample Wilcoxon signed-rank test was performed to compare the changes in HbO concentration against zero, which represents no change in concentration given that HbO concentration changes were corrected for baseline [44]. Using this procedure, significant HbO concentration changes, indicative of activation elicited by the task, were evaluated for each BA and condition. Bonferroni correction for multiple comparisons was applied considering 18 BAs (Bonferroni adjusted p value threshold: 0.05/18 = 0.0028). The same analysis was conducted for HbR concentration changes.

Then, Friedman's ANOVA was used to analyze HbO concentration changes in the BAs which were found to be active in at least one condition in the group results, across the different within-subjects conditions. To examine where the differences actually occurred, posthoc analysis with Durbin-Conover pairwise comparisons (V5\_no-HOLD vs. V3\_no-HOLD, V5\_HOLD vs.

Ch	Source	Detector	х	Y	Z	Laterality	Lobe	Anatomical location	BA
1	CP1	C1	-27	-36	71	Left	Parietal	Postcentral Gyrus	3
2	C3	C1	-42	-20	62	Left	Frontal	Precentral Gyrus	4
3	FC1	FC3	-38	12	55	Left	Frontal	Middle Frontal Gyrus	6
4	FC1	FCz	-13	12	67	Left	Frontal	Superior Frontal Gyrus	6
5	FC1	C1	-26	-5	68	Left	Frontal	Superior Frontal Gyrus	6
6	C3	FC3	-50	-3	50	Left	Frontal	Precentral Gyrus	6
7	Cz	C1	-17	-20	74	Left	Frontal	Precentral Gyrus	6
8	CP1	P1	-24	-62	62	Left	Parietal	Superior Parietal Lobule	7
9	CP1	CPz	-16	-50	72	Left	Parietal	Postcentral Gyrus	7
10	P3	P1	-32	-73	47	Left	Parietal	Superior Parietal Lobule	7
11	Pz	P1	-13	-73	56	Left	Parietal	Superior Parietal Lobule	7
12	FC1	F1	-23	26	56	Left	Frontal	Superior Frontal Gyrus	8
13	F3	F1	-31	39	41	Left	Frontal	Middle Frontal Gyrus	9
14	F3	FC3	-45	25	41	Left	Frontal	Middle Frontal Gyrus	9
15	Fz	F1	-9	41	50	Left	Frontal	Superior Frontal Gyrus	9
16	Fpz	Fp1	-12	67	0	Left	Frontal	Medial Frontal Gyrus	10
17	AF3	Fp1	-24	63	9	Left	Frontal	Middle Frontal Gyrus	10
18	AF3	AFz	-12	62	23	Left	Frontal	Superior Frontal Gyrus	10
19	AF3	F1	-23	52	32	Left	Frontal	Superior Frontal Gyrus	10
20	P3	CP3	-46	-61	46	Left	Parietal	Inferior Parietal Lobule	39
21	C3	CP3	-52	-34	52	Left	Parietal	Postcentral Gyrus	40
22	CP1	CP3	-39	-48	60	Left	Parietal	Inferior Parietal Lobule	40
23	CP2	C2	27	-35	71	Right	Parietal	Postcentral Gyrus	3
24	C4	C2	42	-21	62	Right	Frontal	Precentral Gyrus	4
25	Cz	C2	17	-21	75	Right	Frontal	Precentral Gyrus	6
26	FC2	FCz	14	13	66	Right	Frontal	Superior Frontal Gyrus	6
27	FC2	FC4	39	12	54	Right	Frontal	Middle Frontal Gyrus	6
28	FC2	C2	27	-4	68	Right	Frontal	Superior Frontal Gyrus	6
29	C4	FC4	52	-4	48	Right	Frontal	Precentral Gyrus	6
30	Pz	P2	15	-73	57	Right	Parietal	Superior Parietal Lobule	7
31	P4	P2	33	-74	48	Right	Parietal	Superior Parietal Lobule	7
32	CP2	CPz	17	-50	73	Right	Parietal	Postcentral Gyrus	7
33	CP2	P2	25	-62	63	Right	Parietal	Superior Parietal Lobule	7
34	FC2	F2	24	26	55	Right	Frontal	Superior Frontal Gyrus	8
35	Fz	F2	10	41	50	Right	Frontal	Superior Frontal Gyrus	9
36	F4	F2	30	40	41	Right	Frontal	Middle Frontal Gyrus	9
37	F4	FC4	44	25	40	Right	Frontal	Middle Frontal Gyrus	9
38	Fpz	Fp2	13	67	0	Right	Frontal	Medial Frontal Gyrus	10
39	AF4	AFz	13	61	24	Right	Frontal	Superior Frontal Gyrus	10
40	AF4	Fp2	25	63	9	Right	Frontal	Middle Frontal Gyrus	10
41	AF4	F2	22	52	33	Right	Frontal	Superior Frontal Gyrus	10
42	P4	CP4	46	-62	47	Right	Parietal	Inferior Parietal Lobule	39
43	CP2	CP4	39	-49	60	Right	Parietal	Postcentral Gyrus	40
44	C4	CP4	52	-35	52	Right	Parietal	Postcentral Gyrus	40

**Table 1** List of standard fNIRS channels and their correspondence to Brodmann's areas: source and detector positions according to the standard 10–10 EEG system; channel MNI coordinates (mm), anatomical description, and number of underlying BA

V3\_HOLD, V5\_no-HOLD vs. V5\_HOLD, V3\_no-HOLD vs. V3\_HOLD) was conducted with a Bonferroni correction for multiple comparisons, resulting in a significance level set at p < 0.0125. As a measure of effect size, Kendall's W and rank correlation coefficient r were reported for Friedman's ANOVA and Durbin-Conover test, respectively.

Statistical analysis was conducted with Jamovi (version 2.3.21.0 [Computer Software] retrieved from https://www.jamovi.org). Data are reported as median (interquartile range).

In addition, correlation matrices were built based on Spearman's pairwise correlation coefficients between all the analyzed BAs, for each task condition separately, to

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calculate BA-to-BA task-based FC. Then, the resulting four FC matrices per subject were compared at a nodewise level; for each node, we converted the correlation coefficients using the Fisher's r to Z transformation [49] and we tested whether the correlation coefficients were statistically different across the various conditions (with the same approach described in [50]). Since this analysis involved all the possible combinations between each BA, the resulting statistical values of the comparisons between the correlation coefficients were corrected with Bonferroni method (Bonferroni adjusted p value threshold: 0.05/153 = 0.00033).

# Results

#### Visual analog scale

Overall, participants did not report the task as difficult or fatiguing. VAS scores for both fatigue and task difficulty remained low across all conditions (Difficulty median scores with interquartile ranges (IQR):  $V5_HOLD = 0[0-$ 1];  $V5_{no-HOLD} = 0[0-1]; V3_{HOLD} = 0[0-0]$ and  $V3_no-HOLD = 0[0-0];$ Effort median scores with interquartile ranges (IQR):  $V5_HOLD = 1[0-1];$ V5 no-HOLD = 1[0-1];V3 HOLD = 0[0-1]and  $V3_no-HOLD = 0[0-0.5]).$ 

# **Cortical activity**

Figure 2; Table 2 show the BAs which were found to be significantly active in the different task conditions (p < 0.0028). Specifically, the task in the V5\_no-HOLD condition elicited activation in the left BA10, BA8, BA6, BA3, BA39 and BA40 and the right BA10, BA9, BA8 and BA40. In the V3\_no-HOLD condition, the right BA10, BA9 and BA6 were significantly active. When participants were holding onto the treadmill handrails, walking at 5 km/h (V5\_HOLD) induced significant activation of the left BA10 and BA40 and the right BA10, BA9 and BA3; whilst walking at 3 km/h (V3\_HOLD) induced significantly activation of the left BA3 and the right BA10.

Then, differences in cortical activation among the different task conditions were assessed (Table 3). There was a statistically significant difference in HbO concentration changes depending on task condition in the following BAs: left BA10 ( $\chi^2$  [3] = 10.1, p = 0.018, W = 0.14), BA8 ( $\chi^2$  [3] = 9.15, p = 0.027, W = 0.13), BA3 ( $\chi^2$  [3] = 9.75, p = 0.021, W = 0.14), BA39 ( $\chi^2$  [3] = 14.8, p = 0.002, W = 0.21) and BA40 ( $\chi^2$  [3] = 21.8, p < 0.001, W = 0.30), and right BA10 ( $\chi^2$  [3] = 9.65, p = 0.022, W = 0.13), BA9 ( $\chi^2$  [3] = 13.1, p = 0.004, W = 0.18), BA8 ( $\chi^2$  [3] = 11.8, p = 0.008, W = 0.16), BA3 ( $\chi^2$  [3] = 10.8, p = 0.013, W = 0.15) and BA40 ( $\chi^2$  [3] = 11.4, p = 0.010, W = 0.16).

As illustrated in Fig. 3, post-hoc analysis showed that HbO concentration change in the left BA10 in the no-HOLD condition was significantly higher when speed was 5 km/h with respect to 3 km/h (V5\_no-HOLD vs.

V3\_no-HOLD: 181.0 nM (182.4) vs. 55.7 nM (271.4), p = 0.011, r = 0.53; no difference was found either between the two speeds in the HOLD condition or between the two holding conditions when considering the two speeds separately. Analogous results were found in the left BA3 (V5\_no-HOLD vs. V3\_no-HOLD: 184.0 nM (223.5) vs. 51.1 nM (149.8), p = 0.002, r = 0.65) and BA39 (V5 no-HOLD vs. V3 no-HOLD: 86.9 nM (136.7) vs. 27.9 nM (142.3), p < 0.001, r = 0.75). Furthermore, HbO concentration change in the left BA40 in the no-HOLD condition was significantly higher when speed was 5 km/h with respect to 3 km/h (V5\_no-HOLD vs. V3\_no-HOLD: 122.0 nM (249.0) vs. 90.1 nM (159.2), p = 0.002, r = 0.64); also, a similar significant difference between the two speeds was found in the HOLD condition (V5\_HOLD vs. V3\_HOLD: 142.0 nM (157.8) vs. 23.2 nM (131.1), p < 0.001, r = 0.91). No difference between the two holding conditions was found when considering the two speeds separately.

Considering HbO concentration changes in the left BA8, no statistical comparison survived.

From the analysis of HbO concentration changes in the right hemisphere, cortical activation in the no-HOLD condition was significantly higher when speed was 5 km/h with respect to 3 km/h in the following BAs: right BA10 (V5\_no-HOLD vs. V3\_no-HOLD: 210.0 nM (205) vs. 89.0 nM (229.7), p=0.009, r=0.55), BA9 (V5\_no-HOLD vs. V3\_no-HOLD: 143.0 nM (178.8) vs. 88.2 nM (80.8), *p* = 0.001, *r* = 0.69), BA8 (V5\_no-HOLD vs. V3\_no-HOLD: 148.0 nM (270.3) vs. 79.1 nM (159.8), p<0.001, r=0.71), BA3 (V5\_no-HOLD vs. V3\_no-HOLD: 119.0 nM (229.4) vs. 37.4 nM (160.4), *p* = 0.008, *r* = 0.56), BA40 (V5\_no-HOLD vs. V3\_no-HOLD: 132.0 nM (150.1) vs. 42.6 nM (114.1), p < 0.001, r = 0.71); no differences in these BAs were found either between the two speeds in the HOLD condition or between the two holding conditions was found when considering the two speeds separately.

When assessing the HbR concentration changes, no BA survived the Wilcoxon signed-rank test against zero with Bonferroni correction, so no further statistical analyses were performed on these data.

#### Task-based functional connectivity

We assessed pairwise task-related FC considering all the analyzed BAs. As can be seen in Fig. 4, in general, higher FC was found in the no-HOLD conditions compared to the HOLD conditions.

Spearman's correlation coefficient for each couple of BAs is reported in a color-coded scale ranging from blue to yellow, only for those BA-to-BA correlations resulted to be statistically significant. White square indicates autocorrelation, grey square indicates non-significant correlation between the two BAs.



3 4 6

10

no-HOLD

L BA10

HOLD

39 40



Fig. 2 Brodmann's areas which resulted to be significantly activated by walking in at least one task condition, displayed on a representative brain template, and their hemodynamic responses. The solid and dashed lines represent the concentrations of HbO and HbR, respectively, in the different task conditions: no-HOLD (left panel) and HOLD (right panel) at 3 km/h (blue lines) and 5 km/h (red lines). Vertical bars represent the end of the task block

In details, in the V5\_no-HOLD condition strong correlations were found at the intra-hemispheric level, in the left hemisphere more than in the right hemisphere, identifying a frontoparietal network (L-BA10, L-BA9, L-BA8  $\leftrightarrow$  L-BA7, L-BA39, L-BA40) and a sensorimotor network (L-BA3  $\leftrightarrow$  L-BA6) in the left hemisphere, and two networks, i.e., sensorimotor (R-BA3  $\leftrightarrow$  R-BA4, R-BA6) and parietal-associative (R-BA7  $\leftrightarrow$  R-BA39) in the right hemisphere. Moderate inter-hemispheric FC was found among fronto-parietal cortical areas.

In the V5\_HOLD condition, a spread and moderate intra-hemispheric FC was observed in the left hemisphere; in the right hemisphere, FC was reduced and revealed a frontal network (R-BA10, R-BA9, R-BA8  $\leftrightarrow$  R-BA6) and a parietal network (R-BA7  $\leftrightarrow$  R-BA39). At the inter-hemispheric level, FC was similar to the corresponding no-HOLD condition.

	V5_no-H	IOLD	V3_no-H	OLD	V5_HOL	D	V3_HOL	D
	w	р	w	р	w	р	w	р
L-BA10	279	< 0.001*	235	0.014	272	< 0.001*	231	0.019
L-BA9	242	0.007	200	0.160	239	0.010	201	0.152
L-BA8	278	< 0.001*	166	0.663	252	0.003	211	0.084
L-BA6	273	< 0 0.001*	249	0.004	240	0.009	207	0.107
L-BA4	229	0.023	145	0.900	235	0.014	212	0.079
L-BA3	279	< 0.001*	200	0.160	248	0.004	270	< 0.001*
L-BA7	214	0.069	174	0.509	196	0.197	102	0.178
L-BA39	266	< 0.001*	200	0.160	233	0.018	150	1.000
L-BA40	258	0.001*	214	0.069	273	< 0.001*	192	0.241
R-BA10	296	< 0.001*	278	< 0.001*	299	< 0.001*	267	< 0.001*
R-BA9	283	< 0.001*	273	< 0.001*	296	< 0.001*	245	0.005
R-BA8	253	0.002*	227	0.027	241	0.008	226	0.029
R-BA6	245	0.005	254	0.002*	247	0.004	238	0.011
R-BA4	200	0.160	190	0.264	244	0.006	180	0.406
R-BA3	251	0.003	212	0.079	276	< 0.001*	212	0.079
R-BA7	222	0.039	169	0.603	223	0.037	165	0.684
R-BA39	205	0.121	174	0.509	205	0.121	137	0.726
R-BA40	270	< 0.001*	205	0.121	221	0.042	223	0.037

**Table 2** Left (L) and right (R) Brodmann's areas significantly active in the different task conditions (one-sample Wilcoxon signed-rank test versus 0, Bonferroni correction resulting in *p* < 0.0028). \* indicates statistical significance

**Table 3** Comparisons of the active Brodmann's areas across the different task conditions (Friedman's ANOVA with significance level at p = 0.05 and Durbin-Conover pairwise comparisons with Bonferroni-adjusted p = 0.0125). \* indicates statistical significance. n.s. indicates a non-significant contrast, consequently to the result of Friedman's ANOVA not reaching statistical significance

BA	χ² (3)	р	V5_no-HOLD vs. V3_no-HOLD	V5_HOLD vs. V3_HOLD	V5_no-HOLD vs. V5_HOLD	V3_no-HOLD vs. V3_HOLD
L-BA10	10.1	0.018*	0.011*	0.048	0.445	0.860
L-BA8	9.15	0.027*	0.016	0.050	0.726	0.907
L-BA6	5.15	0.161	n.s.	n.s.	n.s.	n.s.
L-BA3	9.75	0.021*	0.002*	0.907	0.293	0.029
L-BA39	14.8	0.002*	<0.001*	0.053	0.181	0.714
L-BA40	21.8	< 0.001*	0.002*	<0.001*	0.696	0.362
R-BA10	9.65	0.022*	0.009*	0.082	0.907	0.413
R-BA9	13.1	0.004*	0.001*	0.057	0.630	0.336
R-BA8	11.8	0.008*	<0.001*	0.285	0.124	0.405
R-BA6	5.25	0.154	n.s.	n.s.	n.s.	n.s.
R-BA3	10.8	0.013*	0.008*	0.047	0.813	0.345
R-BA40	11.4	0.010*	<0.001*	0.553	0.046	0.406

Examining BA-to-BA FC in the V3\_no-HOLD condition, FC was found to be reduced than in the V5\_no-HOLD condition, with moderate correlation between motor cortical areas (L-BA4  $\leftrightarrow$  L-BA6). In the right hemisphere, fronto-parietal cortical areas showed strong or moderate correlation (R-BA9  $\leftrightarrow$  R-BA3, R-BA4, R-BA6, R-BA7, R-BA39, R-BA40). In contrast, a comparable analysis of FC when participants were walking at 3 km/h holding onto the treadmill handrails (V3\_HOLD) did not identify any connectivity in the prefrontal and parietal cortical areas, but a cluster of FC was identified in the sensorimotor cortical areas (L-BA4  $\leftrightarrow$  L-BA3, L-BA6; R-BA3  $\leftrightarrow$  R-BA4). Considering inter-hemispheric FC, one small cluster of strong FC was found in the prefrontal cortical areas (L-BA10  $\leftrightarrow$  R-BA10). In addition, a

moderate FC was observed among sensorimotor areas of the two hemispheres.

When comparing the different FC patterns observed during the different conditions, a visual inspection strongly suggested an influence dictated by task condition. In particular, there was a striking difference between the FC pattern observed in the V5\_no-HOLD condition vs. the V3\_HOLD condition. Indeed, among all the statistical comparisons of the different FC matrices across the conditions, only the node between L-BA10 and L-BA40 survived the Bonferroni correction (Z score = 3.49, p = 0.00023). Crucially, the correlation value between L-BA10 and L-BA40 was close to zero in the V3\_HOLD condition, whereas it was extremely high (r = 0.80) in the V5\_no-HOLD condition.



Fig. 3 Changes in Oxy-hemoglobin concentration ([HbO]) in the different task conditions, in the Brodmann's areas showing statistically significant differences across conditions. The vertical bars represent the minimum and maximum values, the box illustrates the interquartile range, and the horizontal line inside the box indicates the median. \* indicates statistical significance

# Discussion

The use of handrails in treadmill systems is a debated topic in the rehabilitation field, though so far it has only been explored from a behavioral perspective. We tried to give new hints in this framework, by conducting an fNIRS study in healthy volunteers walking on the treadmill. We found significant differences in cortical activation between two walking speeds (3-5 km/h) in the unsupported condition (not holding onto the handrails); the use of handrails (holding onto the handrails) canceled these differences, except for the left BA 40.



Fig. 4 Correlation matrices representing pairwise BA-to-BA task-based functional connectivity

Generally, the premotor, sensorimotor, and associative areas are the main cortical regions involved during walking, working together in a complex system to regulate gait and maintain balance [51-54].

In this study we found a large network including prefrontal and parietal cortical areas. Interestingly, the pattern of activation was different across the several conditions under investigation. By a contrast analysis, we compared the cortical activations at the speed of 5 km/h between the HOLD and no-HOLD conditions, and the cortical activations at the speed of 3 km/h between the same conditions. We observed no significant differences between the two holding conditions, considering the two speeds separately. We could interpret these results in terms of similar cortical activation patterns, at both high and low speeds, when holding or not holding onto the treadmill handrails. Although the contrast analysis showed no significant results, we could observe that the cortical activation at the speed of 3 km/h in the two holding conditions had a common prefrontal cortical area (right BA10), but the activation pattern was slightly larger in the no-HOLD condition. This difference between the two holding conditions was exacerbated by speed: a wider activation of fronto-parietal areas was observed at the higher speed (5 km/h) in the unsupported compared to the supported condition. In this regard, the comparison between the cortical activations at the two different speeds (3 km/h vs. 5 km/h) in the unsupported condition confirmed this observation. Specifically, cortical activation was significantly higher when the participants walked with a spontaneous swing of the arms at a speed of 5 km/h compared to 3 km/h in the following Brodmann's areas: left BA10, BA3, and BA39, and right BA10, BA9, BA8, BA3, and BA40. In the same cortical areas, no significant differences were found when participants were holding onto the handrails. These findings indicate that the more the speed increases, the more the cortical activation increases, and different areas are activated between the two conditions. Previously, it has been shown that the prefrontal and premotor cortices are involved in adapting to locomotor speed on the treadmill [24]. Further, the change in the left prefrontal cortex activation is associated with walking speed, being influenced by the participant's gait capacity at high walking speed [55].

However, when we compared the cortical activations in the two speeds in the supported condition only one difference remained, consisting in a higher activation of the left BA40 at the higher speed. The left inferior parietal cortex (left BA40) is involved in the cortical frontoparietal attention network [56].

The negligible modulation induced by speed in the supported condition is related to a generally reduced activity pattern, probably because keeping the hands on the treadmill handrails facilitates the task, regardless of speed. In the supported condition, the cortical activation pattern at the higher speed closely resembles that at the lower speed, with no significant differences between the speed conditions. Crucially, the reduced activation of the fronto-parietal areas in the supported condition contrasts with the unsupported condition, where those areas were clearly recruited at the higher speed. In the control of voluntary movement, these areas are related to attention and task complexity. During walking, the broader activation of the supplementary motor and premotor regions have been found to be related to variability of gait parameters [57]. This involvement could be regarded as indirect evidence that walking requires increased attention for the effort to match the target speed by modulating the gait parameters. Cortical activity is proportional to the difficulty in controlling dynamic balance rather than to the need to walk fast. This would also have implications for the use of endurance training methods, which should be performed without hand support, when possible, if more areas need to be recruited.

Furthermore, at higher speed and without the use of handrails, a wider pattern of task-based functional connectivity was observed, with significantly stronger connectivity between the left BA10 and left BA40. The former could have a role when increased cognitive control is required during walking at higher speed and without support, as evidenced in usual walking in patients with Parkinson's disease who need cognitive resources even in simple tasks [58]. The stronger connectivity between the left BA10 and the left BA40 supports the idea that walking requires considerable cognitive input, enriched by information from associative areas. Indeed, it has been shown that gait and cognitive activity share a frontoparietal network, and gait speed is significantly linked to functional connectivity within the frontoparietal network [26].

We could hypothesize that the higher activity elicited by treadmill walking in fronto-parietal areas in the V5\_no-HOLD condition and the associated stronger frontoparietal connectivity in the left hemisphere are fundamental for inducing neuroplasticity phenomena. This is supported by previous studies indicating that higher neural activation is associated with early plasticity related to motor learning [59], and greater task complexity could be beneficial in inducing motor plasticity in younger adults [59–61]. Indeed, non-fatiguing conventional locomotor exercise decreases intracortical inhibition and/or increases intracortical facilitation [62], whilst exercise with higher workload, that our V5 condition might be like, could activate wider neural networks and shape neuroplasticity.

In a rehabilitation perspective it has been reported that holding onto the handrails while walking or running on the treadmill reduces the benefits of a workout [9-12]: the use of handrails forces an unnatural walking. On the other hand, patients feel more confident on the treadmill using them, especially if they report medical conditions that interfere with balance. Previous studies suggest that support can improve the safety and stability limit of the center of mass [63, 64]. However, they cannot assess whether these methods induce adaptive changes taking place in the central nervous system.

Nevertheless, an important goal of neurological rehabilitation from a neural perspective is to design exercises stimulating cortical activity and connectivity in regions typically involved in healthy gait, but that can be affected or associated with the site of lesions [65, 66]. The goal of rehabilitation is in fact to provide active exercises capable of inducing improvement in the capacity and quality of movement, and at the same time to induce brain functional reorganization. This study shows that cortical activity in healthy individuals is modulated by varying walking speed, especially when not holding onto the treadmill handrails. Additionally, stronger connectivity is associated with increased speed and the absence of support. Our results indicate that walking speed, and whether holding the treadmill handrail should be considered when planning a treatment to increase cortical activity in regions of interest.

Based on the present results, we propose that, when possible, the handrails should be used only when getting onto and off of the treadmill and when it is starting the movement, but not during walking. At the same time, walking speed should be set close to the maximum gait capacity.

A limitation of this study is the absence of behavioral data to correlate with the hemodynamic responses or to assess the workload associated with the different walking speeds. However, it is worth noting that walking at 3 and 5 km/h is not a demanding task for healthy subjects, therefore behavioral differences between these conditions were not of interest in this study. Nonetheless, this could be relevant for patients with lower limb disability, for whom a speed of 5 km/h could already represent a challenging task, potentially leading to observable differences in behavioral and metabolic aspects.

Further studies need to investigate the cortical correlates of speed and the use of handrails during treadmill walking in a population of patients with neurological diseases affecting gait and balance.

#### Conclusions

We demonstrated that walking speed and the use of treadmill handrails influence walking cortical activity patterns, therefore they are key ingredients to take into account when planning a rehabilitation program. It would be advisable not to use the handrails, or gradually reduce their use, in order to keep the body upright and not leaning. Also, the speed should be set as high as possible, gradually increasing it on the basis of individual's performance. We suggest that the effects of walking speed and handrails use on cortical activation levels can significantly contribute to the induction of neural plasticity in the context of repeated intervention sessions. This phenomenon is essential for optimizing therapeutic effects, promoting neurophysiological adaptations that can improve motor function and facilitate recovery. Therefore, modulation of these variables during rehabilitation sessions may represent a strategic approach to maximize clinical outcomes.

#### Abbreviations

- BA Brodmann's Area
- FC Functional connectivity
- fNIRS functional near-infrared spectroscopy
- HbO Oxyhemoglobin
- HbR Deoxyhemoglobin
- HRF Hemodynamic response function
- SS Short-separation

#### Author contributions

MoBi: Methodology; Investigation; Writing - Original Draft; Visualization. Cl: Methodology; Software; Writing - Review & Editing; Visualization. DC: Conceptualization; Writing - Original Draft; Funding acquisition. SC: Methodology; Formal analysis; Writing - Review & Editing. AB: Formal analysis; Writing - Review & Editing. LP: Investigation; Writing - Review & Editing; Visualization. AT: Conceptualization; Writing - Review & Editing. MB: Conceptualization; Methodology; Formal analysis; Writing - Original Draft; Supervision. LB: Conceptualization; Methodology; Formal analysis; Investigation; Writing - Original Draft; Supervision; Funding acquisition.

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#### Data availability

The data supporting the findings of this study are not publicly available at present due to the terms of the ongoing grant. However, data may be made available upon reasonable request to the corresponding author at the conclusion of the grant period, after evaluation of possible need to submit a formal project outline or the requirements for co-authorship.

#### Declarations

#### Ethics approval and consent to participate

The study was approved by the University Ethics Committee (CERA), Genoa, Italy (N. 2023/44). The work described has been carried out in accordance with The Code of Ethics of the World Medical Association (Declaration of Helsinki) for experiments involving humans. All participants provided informed consent to participate in the study.

#### **Consent for publication**

Not applicable.

#### **Competing interests**

The authors declare no competing interests.

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