# Brain-Hand Function Relationships Based on Level of Grasp Function in Chronic Left-Hemisphere Stroke



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#### Abstract

*Background and Objective.* The biomarkers of hand function may differ based on level of motor impairment after stroke. The objective of this study was to determine the relationship between resting state functional connectivity (RsFC) and unimanual contralesional hand function after stroke and whether brain-behavior relationships differ based on level of grasp function. *Methods.* Sixty-two individuals with chronic, left-hemisphere stroke were separated into three functional levels based on Box and Blocks Test performance with the contralesional hand: Low (moved 0 blocks), Moderate (moved >0% but <90% of blocks relative to the ipsilesional hand), and High (moved  $\ge90\%$  of blocks relative to the ipsilesional hand). *Results.* RsFC in the ipsilesional and interhemispheric motor networks was reduced in the Low group compared to the Moderate and High groups. While interhemispheric RsFC correlated with hand function (grip strength and Stroke Impact Scale Hand) across the sample, contralesional RsFC correlated with hand function in the Low group and no measures of connectivity correlated with hand function in the Moderate and High groups. Linear regression modeling found that contralesional RsFC significantly predicted hand function in the Low group, while no measure correlated with hand function in the High group. Corticospinal tract integrity was the only predictor of hand function for the Moderate group and in an analysis across the entire sample. *Conclusions.* Differences in brain-hand function relationships based on level of motor impairment may have implications for predictive models of treatment response and the development of intervention protocols aimed at improving hand function after stroke.

#### **Keywords**

stroke, hand function, functional connectivity, corticospinal tract

## Introduction

After stroke, changes in brain function and brain structure occur both in the area of the lesion and at remote sites, impacting motor function.<sup>1</sup> Brain-behavior relationships are important in not only determining the neural correlates of motor deficits after stroke but also in defining the mechanisms of treatment-induced changes and developing targets for restorative intervention approaches.<sup>2</sup> The integrity of both functional and structural connections in the motor system have been shown to support skilled movement after stroke<sup>3-7</sup>; however, the biomarkers of motor function may differ based on subgroups.<sup>8</sup>

Recent studies have suggested that the neural correlates of arm and hand function in individuals post-stroke may differ based on level of motor capacity.<sup>6,9,10</sup> While ipsilesional and interhemispheric pathways are thought to support upper extremity movement after stroke,<sup>3-5,11,12</sup> the contralesional hemisphere may play a unique role in movement in individuals with relatively limited movement <sup>1</sup>Department of Exercise Science, University of South Carolina, Columbia, SC, USA

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Jill Campbell Stewart, Department of Exercise Science, University of South Carolina, 921 Assembly Street, Room 301E, Columbia, SC 29208, USA. Email: jcstewar@mailbox.sc.edu ability.<sup>9,13-15</sup> Resting state functional connectivity (RsFC) provides an avenue through which brain function-motor behavior relationships can be explored in individuals post-stroke with a range of motor abilities without the confound of movement performance on activation<sup>16</sup> and has been suggested as a measure for development as a possible motor system biomarker after stroke.<sup>17</sup>

Several studies have found that interhemispheric RsFC correlates with measures that assess a combination of arm and hand impairment or function after stroke.<sup>4,18-20</sup> However, these studies examined brain-behavior relationships in the study population as a whole and not in functional subgroups. Recovery of hand function is of particular interest after stroke as the hand is the primary way an individual interacts with the environment. Measures of unimanual paretic hand impairment and function have shown a relationship with interhemispheric RsFC across the study population after stroke,<sup>4</sup> however, brain-behavior relationships based on level of grasp function were not explored. While previous studies have shown differences in RsFC based on level of hand function, the measure used in those studies to define hand function and stratify individuals combined both unimanual and bimanual tasks, limiting translation to our understanding of unimanual hand function.<sup>21-23</sup> The relationship between RsFC and unimanual paretic hand function based on level of grasp ability has not been explored.

The purpose of this study was to examine the relationship between RsFC and hand function after stroke and to determine whether brain-behavior relationships differed based on level of grasp function. We hypothesized that RsFC between motor regions would correlate with hand function across the sample but that the relationship between RsFC and hand function would differ between functional subgroups. Specifically, we expected RsFC in interhemispheric motor regions to correlate with hand function in individuals with relatively higher levels of grasp function but RsFC in contralesional motor regions to correlate with hand function in individuals with relatively lower levels of grasp function. Finally, given previous work showing relationships between motor function and the integrity of the corticospinal tract and interhemispheric motor pathways after stroke, 3,6,24,25 we explored whether structural measures of these key motor pathways added to or were better than RsFC for the prediction of current hand function.

## Methods

#### Participants

Sixty-two individuals were recruited as part of a larger multi-lab study on brain-behavior relationships in chronic stroke.<sup>26-28</sup> Participants were included if they were monolingual speakers of English, experienced a left-hemisphere ischemic or hemorrhagic stroke  $\geq 6$  months prior to study

inclusion, could follow simple instructions, and could walk 8 m with or without an assistive device but with no physical assistance. Exclusion criteria consisted of contraindications for MRI, clinical history of dementia, alcohol abuse, psychiatric disorder, traumatic brain injury, or extensive visual acuity or visual-spatial problems. All participants provided written informed consent through a protocol approved by the Institutional Review Board at the University of South Carolina that followed the standards of the World Medical Association Declaration of Helsinki.

### Hand Function Assessments

Each participant completed three measures of hand function: Box and Blocks Test (BBT), grip strength, and Stroke Impact Scale (SIS) hand domain. The BBT is a measure of gross hand dexterity with the score representing the number of blocks moved in 1 minute.<sup>29</sup> Three functional subgroups (Low, Moderate, and High) were created based on BBT performance asymmetry scores of the more-impaired, contralesional hand relative to the less-impaired, ipsilesional hand. We chose to use the BBT to create functional subgroups because it focuses on unimanual grasp function, is quick and simple to administer, and has been suggested as a useful tool for stratification after stroke.<sup>30</sup> The Low group consisted of participants who could not move a single block with the contralesional hand (0% with the contralesional hand relative to the ipsilesional hand). The Moderate group consisted of participants who were able to move >0% but <90% of blocks with the contralesional hand compared to the ipsilesional hand. The High group included participants who were able to move  $\geq 90\%$  of blocks with the contralesional hand compared to the ipsilesional hand consistent with data showing that older adults without stroke tend to have symmetrical performance on the BBT.<sup>29</sup> Grip strength was assessed using a handheld dynamometer (mean of three trials). The SIS hand domain is a patient-reported outcome measure that indicates perceived difficulty in completing functional tasks with the more impaired hand with scores that range from 0 (could not do) to 100 (not difficult).<sup>31</sup>

Due to well-described floor and ceiling effects,<sup>32-34</sup> no individual clinical measure provides an index of motor status across a stroke population with a range of motor abilities. In the current study, we included two measures, grip strength and SIS hand domain score, to capture hand function. To reduce the dimensionality of the measures (which were highly correlated: r=.801, P < .001) and to minimize the number of statistical tests, a principal component analysis was performed that included contralesional grip strength and SIS hand domain score to produce a single hand function score for each participant. The first component accounted for 88.5% of the variance in hand function scores and was highly correlated with the individual variables (r=.941 for both grip strength and SIS hand); this component score was used in subsequent analyses.

#### MRI Acquisition

MRI data was collected within 2 days of motor behavioral testing on a 3T Siemens scanner; 48 participants completed the MRI session on a Trio and 14 participants completed the MRI after update to the Prisma configuration. Data collected on the Prisma was distributed across subgroups with 3 participants (25%), 8 participants (31%), and 3 participants (13%) in the Low, Moderate, and High groups, respectively. Resting state fMRI was collected with eves closed using a 12-channel head coil and echo planar imaging sequence for 6 minutes on the Trio (N=48; TR=1850 milliseconds, TE=30 milliseconds, 34 axial slices, 3 mm thick with 20% gap,  $3.25 \times 3.25$  mm in plane, 196 volumes,  $208 \times 208$  mm FOV,  $64 \times 64$  mm matrix size), while the Prisma acquisition used a 20-channel head/neck coil and multiband sequence (MB factor=2) for 10 or 11 minutes (N=14; TR=1650 milliseconds, TE=35 milliseconds, 50 axial slices, 2mm thick with 20% gap,  $2.4 \times 2.4$  mm in plane, 370 or 427 volumes,  $216 \times 216$  mm FOV,  $90 \times 90$  mm matrix size). Diffusion weighted images were acquired using echo planar imaging to estimate the fractional anisotropy (FA) of motor pathways; two sequences were acquired in opposite phase encoding directions (for 47 participants: Trio, TR=4987 milliseconds, TE = 79.2 milliseconds, 50 axial slices, 2.3 mm<sup>3</sup> voxel size; for 1 participant: Trio, TR=6100 milliseconds, TE = 101 milliseconds, 45 axial slices, 2.7 mm<sup>3</sup> voxel size; for 14 participants: Prisma, TR = 5250 milliseconds, TE = 80 milliseconds, 80 axial slices, 1.5 mm<sup>3</sup> voxel size). Each sequence included 36 volumes with noncollinear diffusion directions at a *b*-value of  $1000 \text{ seconds/mm}^2$  and 5 or 7 volumes with b-value of 0. Finally, high resolution T1-weighted (TR = 2250 milliseconds, TE = 4.52/4.15 milliseconds, 1 mm<sup>3</sup> voxel size) and T2-weighted images  $(TR = 2800 \text{ milliseconds}, TE = 402 \text{ milliseconds}, 1 \text{ mm}^3$ voxel size) were acquired for each participant.

## **MRI** Processing

Stroke lesions were manually outlined on the T2 image which was then coregistered to the T1 image. T1-weighted images were normalized into standard MNI space utilizing enantiomorphic unified segmentation-normalization routines as part of SPM 12<sup>35</sup> (Wellcome Department of Cognitive Neurology, London, UK), which also applied a lesion-mask cost function.<sup>36</sup> Resting state fMRI data was pre-processed using a published, custom approach (NiiStat; https://github.com/neurolabusc/NiiStat) that utilizes processes from SPM 12 and FSL (FMRIB Center, Oxford, UK).<sup>37</sup> Briefly, images were realigned and unwarped, slice time corrected (except for participants with multiband

sequence images), normalized and smoothed (Gaussian kernel FWHM=6mm). Regressors were added for the mean signal from white matter and six head motion parameters, and linear, quadratic, and cubic trends, followed by the application of a bandpass filter (0.01-0.1 Hz). Next, an independent component analysis was performed to identify and remove lesion-driven artifacts.<sup>37</sup> After pre-processing, the brain was segmented utilizing a probabilistic John Hopkins University (JHU) atlas<sup>38</sup> included in the Niistat package, and the mean BOLD signal was correlated between a set of a priori regions of interest (ROIs) in both the lesioned and nonlesioned hemispheres: primary motor cortex (M1, precentral gyrus), primary sensory cortex (S1, postcentral gyrus), premotor cortex (PM, posterior section of the middle frontal gyrus), and supplementary motor area (SMA, posterior section of the superior frontal gyrus) (Supplemental Figure 1). Connectivity between these cortical ROIs have been shown to be related to hand movement after stroke during task-based fMRI.<sup>39-41</sup> Three motor networks were investigated: ipsilesional (connections between all ipsilesional regions), contralesional (connections between all contralesional regions), and interhemispheric (connections between homologous regions). Correlation coefficients (r) between each ROI pair were calculated and transformed to Fisher's Z scores for statistical analysis.

Diffusion images were undistorted using FSL's TOPUP and Eddy tools<sup>42,43</sup> and excess skull was removed. Voxelwise maps of FA were created using the FSL dtifit tool. The skull-stripped (based on segmentation estimates) T1 image was nonlinearly normalized (using SPM12's "old normalization" function) to match the undistorted FA images. FA was extracted from two JHU ROIs that represent pathways shown to support movement after stroke: the corticospinal tract (CST; ROI in the brainstem) and the body of the corpus callosum.<sup>3,6,10,24,25</sup> For the CST, an FA ratio (FA lesioned hemisphere/FA nonlesioned hemisphere) was calculated to determine relative integrity of the lesioned side compared to the nonlesioned side for each individual.

#### Statistical Analyses

All statistical analyses were performed in SPSS 28 (IBM Corp., Armonk, NY). ROIs were grouped into an interhemispheric network (connections between four homologous pairs), ipsilesional network (six connections between ROIs in the ipsilesional hemisphere), and contralesional network (six connections between ROIs in the contralesional hemisphere). Separate one-way multiple analysis of variances were performed on each of these networks to determine if connectivity between motor regions differed between subgroups (Low, Moderate, High). Total lesion volume (mm<sup>3</sup>) was found to significantly differ across subgroups (Table 1) and significantly correlate with individual ROI lesion volume across the population (r=.271-.806; all P < .034);

Table I.	Participant	Demographics	; by	<sup>,</sup> Subgroup.
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	Low	Moderate	High
N	12	26	24
Age (y)	59.4 (43-77)	58.9 (37-76)	61.6 (48-80)
Sex	I0M/2F	I 8M/8F	14M/10F
Hand dominance (prior to stroke)	IIR/IL	24R/2L	22R/2L
Months post-stroke	80.4 (10-284)	49.2 (9-185)	45.8 (10-201)
BBT paretic hand	0.00 (0-0)	31.3 (2-66)	53.3 (36-83)
BBT non-paretic hand	46.3 (18-66)	52.7 (36-74)	53.5 (29-80)
Grip strength (kg)	3.2 <sup>‡</sup> (0.0-15.3)	25.9 <sup>‡</sup> (3.0-61.3)	36.2 <sup>‡</sup> (12.0-58.3)
SIS hand domain	6.5 <sup>‡</sup> (0-15)	60.6 <sup>‡</sup> (0-100)	84.4 <sup>‡</sup> (35-100)
Lesion volume (cc)	189.2 <sup>*,†</sup> (0.8-365.4)	87.4* (0.4-340.2)	88.3 <sup>†</sup> (0.2-234.6)
CST FA ratio	0.67*.† (0.46-0.88)	0.87* (0.57-1.10)	0.92 <sup>†</sup> (0.70-1.03)
CC body FA	0.257 (0.058-0.477)	0.347 (0.060-0.531)	0.368 (0.127-0.556)
Interhemispheric network connectivity	0.304*,† (-0.297912)	0.679* (0.216-0.862)	0.764 <sup>†</sup> (0.423-0.928)
Ipsilesional network connectivity	0.438 (0.103-0.765)	0.486 (0.103-0.731)	0.564 (0.229-0.796)
Contralesional network connectivity	0.591 (0.325-0.778)	0.523 (0.060-0.709)	0.573 (0.327-0.806)

Values represent subgroup mean (range).

BBT, Box and Blocks Test; SIS, Stroke Impact Scale; CC, corpus callosum; CST, corticospinal tract; FA, fractional anisotropy; M, male; F, female; R, right; L, left. CST FA ratio, lesioned hemisphere FA/non-lesioned hemisphere FA.

\*P<.01 for difference between Low and Moderate subgroups.

 $^{\dagger}P$  < .01 for difference between Low and High subgroups.

P < .01 for difference between all subgroups.

thus, lesion volume was included as a covariate. Effects size was reported using partial eta squared ( $\eta^2$ ; .01-.059=small effect; .06-.139=medium effect;  $\geq$ .14=large effect).<sup>44</sup> Significant differences between groups (P < .05) were investigated further to determine the location of differences with a least significant difference post-hoc test using a corrected *P*-value (.05/number of connections in the model: P < .0125 for the interhemispheric network, P < .008 for the ipsilesional and contralesional networks).

To examine the relationship between RsFC and hand function score, RsFC was averaged between the ROI pairs to produce a mean interhemispheric, ipsilesional, and contralesional value for each participant, similar to previous studies in stroke.<sup>4,19,45</sup> Pearson's correlations with 95% confidence intervals (CI) were run to examine the relationship between mean interhemispheric, ipsilesional, and contralesional RsFC and the hand function score for the Low, Moderate, and High subgroups, as well as across the whole population; a corrected P < .0167 was used to determine significance (.05/3 networks).

Lastly, linear regression modeling was performed to examine which variable or variables best predicted current hand function across all participants as well as for each functional subgroup. Possible predictors included demographic variables (age, months post-stroke), total lesion volume, functional connectivity (interhemispheric, ipsilesional, contralesional RsFC), and motor pathway FA (CST FA ratio, corpus callosum body FA). Variables that at least weakly correlated with hand function (P < .05) were entered into a forward stepwise model (P < .05 to enter, P > .1 to leave); all final models were inspected for collinearity (variance inflation factor <10).

## Results

Sixty-two individuals with chronic stroke were included: 12 in the Low group, 26 in the Moderate group, and 24 in the High group (Table 1). The three groups did not significantly differ in age or months-post stroke but did differ in lesion volume, CST FA ratio, grip strength, and SIS hand domain score. Stroke lesions were cortical and subcortical along the middle cerebral artery territory in the left hemisphere (Figure 1). Resting-state functional connectivity (RsFC) between all regions in the interhemispheric, ipsilesional, and contralesional motor networks across all participants is shown in Supplemental Figure 2.

# Interhemispheric and Intrahemispheric RsFC Based on Level of Grasp Function

Interhemispheric RsFC between homologous motor regions differed between functional subgroups (P=.016,  $\eta^2$ =.154; Figure 2). Specifically, the Low group had significantly lower interhemispheric RsFC between homologous M1 and S1 compared to the Moderate group (P<.008). The Low group also had significantly lower interhemispheric RsFC between homologous M1, S1, and PM ROIs compared to the High group (P<.002). No significant differences were found between the Moderate and High groups for any interhemispheric connections. Ipsilesional RsFC also differed between



Figure 1. Summary mask of stroke lesions by functional subgroup (Low, Moderate, High). Color represents the number of participants with a lesion in that voxel.

functional subgroups (P=.004,  $\eta^2$ =.228). Specifically, the Low group had significantly lower RsFC than the High group for two connections (P<.006): PM-SMA and M1-SMA. Contralesional RsFC did not significantly differ between functional subgroups (P=.288,  $\eta^2$ =.120).

# Relationship Between RsFC and Hand Function Based on Level of Grasp Function

Across all participants, mean interhemispheric connectivity was found to significantly correlate with the hand function score (r=.466, 95% CI: 0.245-0.641; P<.001) but ipsilesional (r=.179, 95% CI: -0.074-0.411; P=.163) and contralesional (r=.018, 95% CI: -0.233-0.267; P=.889)

connectivity did not. In the Low group, mean contralesional connectivity significantly correlated with the hand function score (r=.752, 95% CI: 0.314-0.926; P=.005); mean ipsilesional connectivity also showed a positive relationship with hand function (r=.584, 95% CI: 0.015-0.867; P=.046) but this relationship did not reach the corrected significance level (Figure 3). In the Moderate group, interhemispheric connectivity showed a positive correlation with hand function score (r=.276, 95% CI: -0.125-0.599; P=.172) but this relationship was not statistically significant; ipsilesional and contralesional connectivity did not correlate with hand function in this group. In the High group, hand function did not significantly correlate with mean functional connectivity in the interhemispheric, ipsilesional or



**Figure 2.** Mean resting state functional connectivity for the ipsilesional, interhemispheric, and contralesional motor networks for the Low Group (A-C), Moderate Group (D-F) and High Group (H-I).

Values represent mean r values  $\pm$  standard deviation (before Fisher's Z transformation).

Abbreviations: MI, primary motor cortex; PM, premotor cortex; SMA, supplementary motor area; SI, primary sensory cortex.

<sup>+</sup>Significantly different from the High group (P<.006).

<sup>#</sup>Signifcantly different from the High Group (P < .002).

\*Significantly different from the Moderate group (P < .008).



**Figure 3.** Relationship between hand function score (first principal component of contralesional grip strength and Stroke Impact Scale Hand domain) and mean ipsilesional (A), interhemispheric (B), and contralesional (C) resting state functional connectivity (Fisher's Z score) by functional subgroups (Low, Moderate, High). r=correlation coefficient in each subgroup. \*P<.0167.

Table 2. Significant Predictors of Hand Function Across all Groups and by Subgroup.

Group	Predictors	Beta value	Adjusted $R^2$	F statistic	P value for F	
All groups	CST FA ratio	.595*	.343	32.854	<.001	
Low group	Mean contralesional RsFC	.752*	.523	13.048	.005	
Moderate group High group	CST FA ratio None	.437*	.157	5.661	.026	

Abbreviations: RsFC, resting state functional connectivity; CST FA, corticospinal tract fractional anisotropy. \*P<.05.

contralesional network ( $|r| \le .254$ ,  $P \ge .231$ ). Exploratory correlations between individual measures and RsFC are reported in Supplemental Table 1.

# Predictors of Cross-Sectional Hand Function Based on Level of Grasp Function

Across all participants, mean interhemispheric RsFC, CST FA ratio (r=.595, 95% CI: 0.405-0.735; P<.001) and months post-stroke (r=-.265, 95% CI: -0.483-0.017; P=.037) were entered as variables into the stepwise regression model. Only CST FA ratio was found to be a significant predictor of hand function in this model (Table 2;  $R^2$ =.343, P<.001). For the Low group, both ipsilesional and contralesional RsFC were entered into the model; no other variables showed a correlation with hand function. Only contralesional RsFC remained in the model and was found to be a significant predictor of hand function ( $R^2$ =.523, P=.005). For the Moderate group, CST FA ratio (r=.437, 95% CI: 0.060-0.705; P=.026) was the only variable entered into the regression model and was a significant predictor of hand function ( $R^2$ =.157). For the High group, no variable was found to show a correlation with hand function (all P > .05); therefore, no regression model was generated for this subgroup.

## Discussion

This study investigated brain-hand function relationships based on level of grasp function in individuals with lefthemisphere stroke. Overall, individuals with less functional grasp ability had lower RsFC in ipsilesional and interhemispheric motor networks. While interhemispheric RsFC correlated with hand function across the whole sample similar to previous studies,<sup>4,18-20</sup> differences in the relationship between RsFC and hand function were found based on level of grasp function. While the Low subgroup showed a positive relationship between contralesional RsFC and hand function, no measure of motor system RsFC signifcantly correlated with hand function in the Moderate or High subgroups. CST FA ratio also contributed to the prediction of cross-sectional hand function for the whole sample and in the Moderate subgroup. Differences in brain-hand function relationships based on level of motor function may have implications for predictive models of treatment response and the development of intervention protocols aimed at improving hand function after stroke.

To our knowledge, this is the first study to investigate the relationship between RsFC and unimanual hand function based on level of functional grasp ability. In the current study, the Low function group that had very limited grasp function (could not pick up and move one block) had lower functional connectivity in ipsilesional and interhemispheric motor connections but not contralesional connections compared to groups with some remaining unimanual ability to grasp and transport a block. Previous studies have shown both increased and decreased functional connectivity between groups of individuals poststroke with varied levels of hand function.<sup>21-23</sup> However, in those studies, the stratification of subjects into functional levels included only two categories based on both unimanual and bimanual hand function: a "completely paralyzed" group that was unable to use the more-impaired hand even as a stabilizer during a bimanual task (eg, not able to stabilize a paper to allow the less-impaired hand to use scissors) and a "partially paralyzed" group that included individuals with a wide range of hand ability levels (from only being able to use the more-impaired hand as a stabilizer to being able to manipulate objects with the more-impaired hand). Our three subgroups were created based on the ability to grip, transport, and release a block with the more-impaired hand only, and were therefore focused solely on unimanual grasp function. As such, the current study provides novel data on functional brain connectivity across a range of levels of unimanual hand motor function in individuals with chronic stroke.

Relationships between upper extremity motor function and RsFC have been shown in previous studies, with interhemispheric connectivity often showing a positive correlation with motor function.4,18-20 We found a similar relationship between interhemispheric RsFC and unimanual hand function when analyzing participants across groups. However, the relationship betweeen RsFC and hand function differed when subgroups were investigated. In the Low group, contralesional RsFC positively correlated with hand function (higher functional connectivity corresponded to greater hand function). This finding is in line with research suggesting that the contralesional hemisphere plays an important role in supporting movement in individuals with relatively severe motor impairment.<sup>9,14,15,46</sup> Engagement of contralesional motor regions may support movement through alternative pathways (eg, reticulospinal) in individuals with severe motor impairment who have significant damage to the ipsilesional CST.47,48 In the High

group, motor system RsFC did not correlate with unimanual hand function. Individuals in this group showed little deficit on performance measures (BBT, grip strength) but reported continued difficulty in completing functional tasks with the more impaired hand (SIS). In previous studies in older adults without stroke, higher sensorimotor network RsFC has been associated with better hand performance (ie, faster motor speed, stronger grip strength).<sup>49,50</sup> While it is not entirely clear why we did not find a relationship between RsFC and hand function in this subgroup, hand function in individuals with mild impairment may be related to connectivity in other networks, such as frontal-parietal or prefrontal networks,<sup>51,52</sup> or require measurement of hand dexterity (eg, precision grip) to examine brain-hand function relationships. The current study did not include an agematched control group without stroke which could inform the brain-behavior relationships found, especially in the High group. Overall, the results of the current study suggest that level of hand function should be considered in future studies on brain-motor behavior relationships and how these relationships are predictive of or change in response to treatment after stroke.

Previous studies have investigated whether measures of RsFC or white matter pathway integrity best predict crosssectional arm motor function after stroke with conflicting results; some studies reported that brain structure was a more robust biomarker of motor status post-stroke, while others have found that both structural pathway integrity and RsFC are distinct but important predictors.<sup>45,53,54</sup> These studies primarily focused on interhemispheric RsFC and CST integrity and did not look at subgroups based on level of grasp function. In the current study, CST FA ratio best predicted unimanual hand function across all groups, despite the fact that interhemispheric RsFC was also found to correlate with hand function across all groups.

Residual integrity of the descending CST has frequently been reported to correlate with upper extremity impairment and function after stroke.3,5,25,55 The findings of the current study are consistent with this previous work and suggest that some level of structural integrity of the CST is needed for motor cortical regions to drive hand movement. Two previous studies that included both a measure of CST integrity and a measure of interhemispheric RsFC also found that CST integrity was a stronger predictor of upper extremity impairment when assessed in individuals with chronic stroke with a range of severity levels.45,54 In the Moderate group, only CST FA ratio was a significant predictor of hand function, while in the Low group, only contralesional RsFC was a significant predictor, suggesting that the ability of measures of brain function and brain structure to predict motor function may vary based on functional level. Previous work has suggested that biomarkers of arm motor impairment and function may vary based on functional subgroups.<sup>6,10,56</sup> The results of the current study suggest that

level of grasp function may be an important factor in determining the appropriate biomarker(s) for unimanual hand function in chronic stroke.

Level of functional grasp ability was determined based on performance on the BBT test with the contralesional hand relative to the ipsilesional hand. We chose to use the BBT because it focused on grasp function, is quick and simple to administer, and has been suggested as a useful tool in defining hand function level after stroke.<sup>30</sup> Contralesional grip strength (a measure of hand impairment) was then combined with a patient-reported measure of perceived difficulty (SIS Hand) to provide an overall measure of hand function for examination of brain-behavior relationships. Performance on the BBT was correlated with both grip strength (r=.786, P<.001) and SIS Hand score (r = .875, P < .001), suggesting these two measures provided some insight into overall grasp function. Using a combination of these measures allowed us to assess hand function across a sample with a range of functional levels. This approach did lead to overlap in the combined measure of hand function (first principal component) between severity groups that were based on grasp function alone (BBT asymmetry performance) (see Figure 3). While positively correlated, grip strength and self-reported perceived difficulty of hand function still provide some degree of unique information from hand grasp ability, which may have contributed to the observed overlap. For example, an individual who moved a relatively small number of blocks on the BBT (eg, <10) might have similar grip strength and SIS Hand score to an individual who was unable to move one block. While the best approach for stratification of individuals in stroke studies (ie, clinical presentation vs measures of brain function or structure) remains unknown, our approach provided a way to categorize individuals based on unimanual hand function using a measure (BBT) that is accessible in a variety of clinical environments. Future larger studies should explore optimal measures and approaches for stratification based on hand function after stroke.

Differences in brain-behavior relationships based on level of grasp function may have implications for stroke rehabilitation trials. Previous studies have reported differences in the neural correlates of upper extremity function based on motor severity using measures that include both arm and hand movement<sup>6,56</sup>; our findings extend this work by showing differences in the neural correlates of hand function based on level of unimanual hand movement ability. The choice of a brain-based biomarker to understand arm motor status, arm motor recovery, or treatment response may be impacted by level of motor ability.<sup>17</sup> Additionally, degree of motor impairment may be an appropriate stratification approach when designing rehabilitation trials, especially those aimed at brain repair.<sup>8</sup> The development, implementation, and assessment of intervention approaches aimed at improving hand function should consider differences in brain-behavior relationships based on functional subgroups.

A limitation of this work is that the data was acquired with two scanners. Tools such as ComBat<sup>57</sup> can harmonize data to minimize variance and potential bias. However, the method requires at least two scans per scanner to estimate scanner effects, and these tools require that that sample size and covariates are balanced and controlled for across scanners to develop an unbiased estimate of scanner effects.<sup>57</sup> Given our small sample size, we did not harmonize our data. As we note, groups were relatively well distributed across instruments, minimizing bias concerns. However, these differences are likely to have increased some of the variance in our data, reducing our statistical power. Therefore, while we have confidence in the positive effects we report, caution should be exercised in interpreting null results.

This was a cross-sectional study in individuals with chronic, left-hemisphere stroke who were mostly righthand dominant. Due to differences in the role each hemisphere plays in the control of skilled upper extremity motor tasks,<sup>58-60</sup> the results of the current study may not generalize to persons with right-hemisphere stroke. Also, given the small number of individuals who were left-hand dominant (N=5) and our overall subgroup sample size, we were not able to examine the effect of pre-stroke hand dominance. Additionally, RsFC has been shown to change over time after the stroke event<sup>61,62</sup>; the brain-behavior relationships shown in the current study may be different in the acute and subacute stages of recovery. Future studies could investigate the neural correlates of hand function based on level of grasp ability in earlier stages of recovery, prestroke hand dominance, and in individuals with righthemisphere stroke. Second, recent studies have suggested that stroke lesion topography may impact structural and functional connectivity and their interaction.63 However, our sample size did not provide sufficient power to investigate lesion factors within the hand function subgroups. Future studies could investigate this factor with a larger sample in each subgroup. Third, a small number of participants reported experiencing a previous stroke or transient ischemic attack (N=6; Low group=1, Moderate group=2, High group = 3). Individual variation in conditions such as previous stroke frequency and presence of diffuse white matter disease could affect the brain-behavior relationships reported here. Further studies could investigate how these factors influence the relationship between hand function and RsFC post-stroke. Finally, our approach to the creation of functional subgroups was based on BBT asymmetry performance with the contralesional hand relative to the ipsilesional hand. This approach defined a functional group with a small sample size (Low Group: N=12) which may have limited our correlation and regression analyses. Further investigation is needed to define brain function-motor behavior relationships in individuals with this level of hand function post-stroke. Furthermore, the number of subgroups (ie, 3), clinical measure (BBT), and cut-off values used to determine subgroups in the current study may not be optimal. The best approach for defining subgroups based on level of grasp function should be investigated in future studies.

In conclusion, motor system RsFC in individuals with chronic left hemisphere stroke varied between groups based on level of unimanual grasp function; individuals with low levels of hand function had reduced ipsilesional and interhemispheric motor system connectivity when compared to individuals with greater residual hand motor ability. While CST FA ratio predicted cross-sectional hand function across the whole population, the neural correlates of hand function varied by functional subgroups. CST FA ratio correlated with hand function in individuals with moderate levels of hand function whereas contralesional RsFC correlated with hand function in individuals with limited hand function. Differences in brain-hand function relationships based on level of motor impairment may have implications for predictive models of treatment response and the development of intervention protocols aimed at improving hand function after stroke.

#### **Author Contributions**

**Elizabeth Rizor:** Conceptualization; Formal analysis; Methodology; Visualization; Writing – original draft.

**Julius Fridriksson:** Funding acquisition; Investigation; Methodology; Resources; Supervision; Writing – review & editing.

**Denise Peters:** Formal analysis; Investigation; Methodology; Writing – review & editing.

**Chris Rorden:** Data curation; Methodology; Software; Writing – review & editing.

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