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Excessive White Matter Hyperintensity Increases Susceptibility to Poor Functional Outcomes After Acute Ischemic Stroke

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Objective: To personalize the prognostication of post-stroke outcome using MRI-detected cerebrovascular pathology, we sought to investigate the association between the excessive white matter hyperintensity (WMH) burden unaccounted for by the traditional stroke risk profile of individual patients and their long-term functional outcomes after a stroke.

Methods: We included 890 patients who survived after an acute ischemic stroke from the MRI-Genetics Interface Exploration (MRI-GENIE) study, for whom data on vascular risk factors (VRFs), including age, sex, atrial fibrillation, diabetes mellitus, hypertension, coronary artery disease, smoking, prior stroke history, as well as acute stroke severity, 3- to 6-month modified Rankin Scale score (mRS), WMH, and brain volumes, were available. We defined the unaccounted WMH (uWMH) burden *via* modeling of expected WMH burden based on the VRF profile of each individual patient. The association of uWMH and mRS score was analyzed by linear regression analysis. The odds ratios of patients who achieved full functional independence (mRS < 2) in between trichotomized uWMH burden groups were calculated by pair-wise comparisons.

Results: The expected WMH volume was estimated with respect to known VRFs. The uWMH burden was associated with a long-term functional outcome ($\beta = 0.104$, $p < 0.01$). Excessive uWMH burden significantly reduced the odds of achieving full functional independence after a stroke compared to the low and average uWMH burden [OR = 0.4, 95% CI: (0.25, 0.63), $p < 0.01$ and OR = 0.61, 95% CI: (0.42, 0.87), $p < 0.01$, respectively].

Conclusion: The excessive amount of uWMH burden unaccounted for by the traditional VRF profile was associated with worse post-stroke functional outcomes. Further studies are needed to evaluate a lifetime brain injury reflected in WMH unrelated to the VRF profile of a patient as an important factor for stroke recovery and a plausible indicator of brain health.

Keywords: white matter hyperintensity, stroke, brain health, brain vulnerability, post-stroke outcomes, functional independence, functional outcome after acute stroke, acute ischemic stroke

INTRODUCTION

The ability of the brain to recover after an acute ischemic stroke (AIS) is linked to the pre-stroke burden of white matter hyperintensity (WMH), a neuroradiological biomarker of brain health (1–6). However, there is a significant variability in functional outcomes after AIS in association with WMH burden.

It has not been fully characterized taking into consideration multiple clinical characteristics, such as age, sex, and other vascular risk factors (VRFs), that comprise a “traditional” stroke risk profile. Because those characteristics might be associated with stroke outcomes and also with accumulating WMH burden, quantifying the WMH burden effect on functional outcomes independent of clinical characteristics is challenging (2, 7–14).

In addition to and compounded by age, a VRF profile is linked to overall brain health as reflected in the WMH burden—for example, an older patient with a history of hypertension is likely to have a larger WMH volume and less likely to achieve functional independence after AIS (2, 15). Prior studies using standard multiple regression models had a limited success in characterizing and quantifying an independent association between conventionally measured WMH volume and post-stroke outcome because the effects of confounding VRFs to the association of WMH and post-stroke outcomes were not explicitly accounted for (1, 2, 8, 9, 11, 12, 14, 15).

In this study, we hypothesized that the excessive portion of WMH burden unaccounted for by the clinical characteristics of an individual patient was an important indicator of brain health: i.e., the unaccounted WMH (uWMH) burden would show the clear association of the lifelong chronic brain damage independent of the VRF profile of a patient and the post-stroke functional outcomes, especially in achieving full functional independence after stroke. To test this hypothesis, we first defined the uWMH burden given the VRF profiles of patients to extrinsically quantify the portion of WMH burden that was independent of the VRF profiles. We then analyzed the uWMH association with post-stroke functional outcomes leveraging a large international multi-site cohort study for AIS, the MRI-Genetics Interface Exploration (MRI-GENIE), for the analyses and validation (16, 17).

METHODS

Standard Protocol Approvals, Registrations, and Patient Consents

The image and clinical data were acquired from the MRI-GENIE study (16). The MRI-GENIE study is a large international cohort study of 19 sites, contributing 6,600 AIS patients with phenotypic, radiographic, and genotypic data. Patients were recruited in a hospital-based setting through Stroke Genetic Network (SiGN). The informed and written consent forms, including sharing of de-identified demographic, clinical phenotypic, and imaging data, were obtained from all patients or their legally authorized representative (18, 19). Each site received the approval of their internal review board.

Data, Clinical Characteristics, and WMH Quantification

Age, sex, atrial fibrillation (AF), diabetes mellitus (DM), hypertension (HTN), coronary artery disease (CAD), smoking (SMK), and prior stroke history (PS) were included as the clinical characteristics of patients. Each vascular risk factor was recorded as a binary variable at hospital admission. The acute stroke severity of a patient was measured according to NIH Stroke Scale (NIHSS) at hospital admission.

T2 FLAIR MR images were obtained within the first 24 h from symptom onset. A more detailed description of the study can be found in previous publications (16, 20). White matter hyperintensity volume (WMHv) was quantified by a previously described automatic WMH segmentation framework (20). The

framework consists of an automatic whole-brain extraction, intensity normalization, and WMH segmentation that leverages a deep neural network specifically for clinical grade T2-FLAIR images. Total brain volume was quantified automatically by a similar previously described framework (21). Both WMH and total brain segmentation results were evaluated, and the quality was controlled by experts and experienced raters. WMHv was adjusted by the total brain volume and log-transformed to correct its skewed distribution. The brain-volume-adjusted and log-transformed WMHv will be denoted as WMHv for simplicity in the rest of this paper.

Out of 6,600 patients, the complete clinical characteristics of 5,822 patients were reported. Acute stroke severity and long-term functional outcome data were available for 1,097 patients out of those 6,015 patients and measured by the acute NIHSS and the 3- to 6-month modified Rankin Scale (mRS) scores, respectively. After the quality control of WMH and total brain segmentation, 924 AIS patients remained. Thirty-four patients who did not survive after stroke at the time of the mRS score evaluation were excluded from the analysis, which resulted in a total of 890 patients. The patient selection and the criteria are summarized in **Figure 1**.

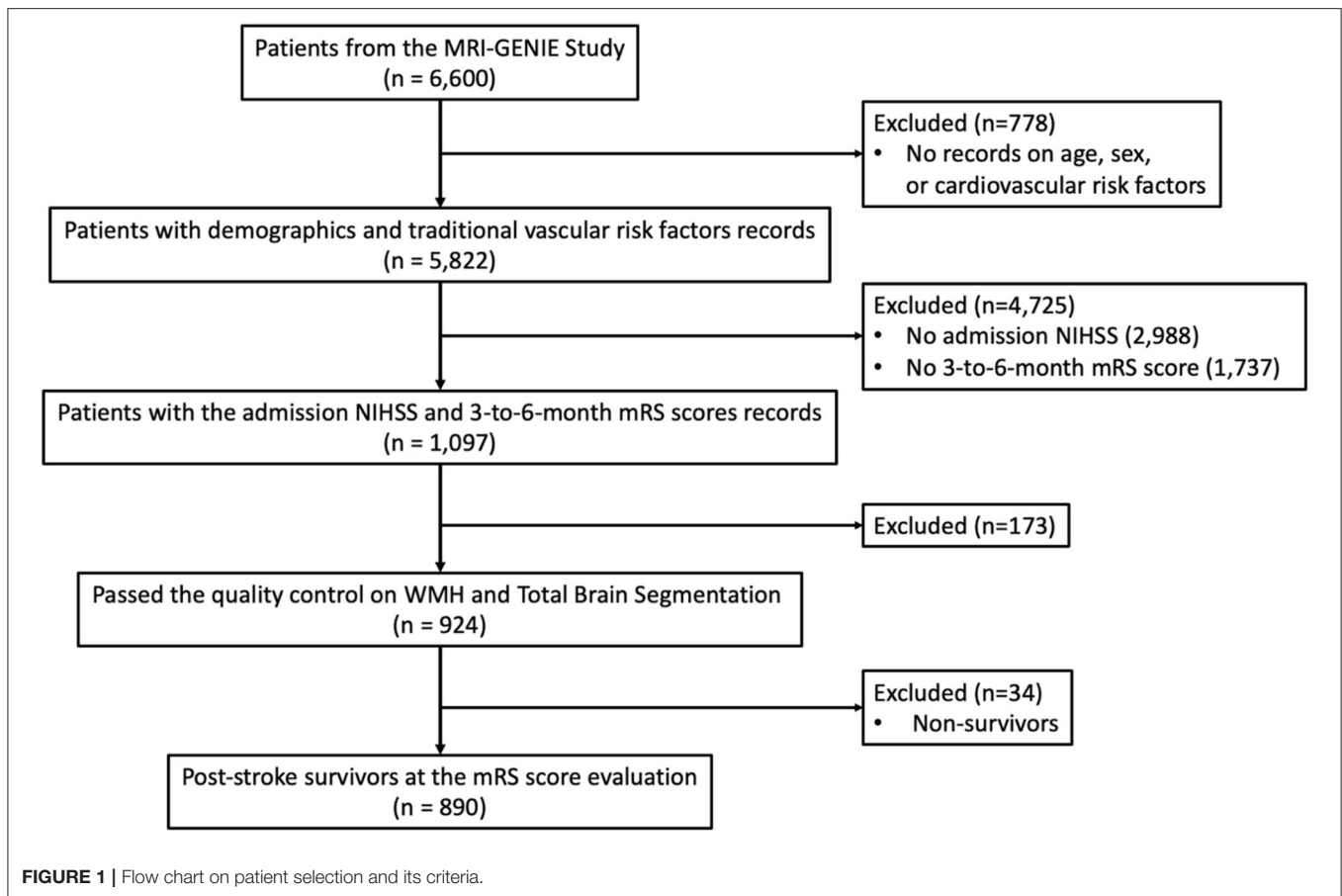
Unaccounted WMH Burden

To measure uWMH independent of the VRF profile of a patient, we first modeled the association of WMH burden and the profile of the patient by multiple log-linear regression. Age, sex, AF, DM, HTN, CAD, SMK, and PS were considered in the analysis as explanatory variables, and WMHv was the target variable. NIHSS was included in the analysis as well to account for the effect of acute stroke severity on functional stroke outcomes for later analyses. The normality of WMHv data of the AIS population with respect to the multiple log-linear regression model was tested by the Shapiro–Wilks test.

The expected burden of WMH with respect to the VRF profile of a patient was calculated as the trend of the multiple log-linear regression model. The uWMH burden measured the amount of WMH burden that was not accounted for by the clinical profile of a patient, i.e., the residual WMH burden of the multiple log-linear regression model—for example, a positive uWMH value indicated that a patient had excessive WMHv than expected from her or his clinical profile, and negative means lower WMHv than expected. The normality of uWMH burden was tested by the Shapiro–Wilks test.

We analyzed the continuous association of uWMH burden and post-stroke functional outcome measured by the 3- to 6-month mRS score using the univariate linear regression model for the continuous association between uWMH burden and post-stroke functional outcomes.

We investigated how uWMH affected the possibility of functional independence after stroke by trichotomized analysis. We trichotomized patients into low, expected, and excessive eWMH burden groups based on uWMH burden. We defined the average group as patients within ± 1 standard deviation from the mean uWMH burden, which resulted in 68% of total patients. The low and excessive uWMH burden groups were



defined as lower and higher 16% of patients of the uWMH burden distribution, respectively.

The dichotomized 3- to 6-month mRS score (mRS excellent: mRS score 0–1, mRS moderate–poor: mRS score 2–6) was used to measure functional independence after AIS. We dichotomized the mRS scores to mRS excellent and mRS moderate–poor to investigate the association of uWMH burden and full functional independence after stroke. We calculated the pair-wise odds ratios of patients who achieved full functional independence for patients between all burden groups (e.g., low vs. expected, low vs. excessive, and expected vs. excessive). The 95% confidence interval and the statistical significance of the odds ratio were calculated by the standard *z*-test to investigate if there was a significant difference between the groups in achieving functional independence after stroke.

We performed the subgroup analysis regarding acute stroke severity by dividing the patients into mild and severe acute stroke severity groups. We divided the patients with respect to their acute NIHSS scores, with a threshold defined as the third quartile (Q3) of the NIHSS scores of the population. We performed the same trichotomized analysis of uWMH burden and investigated the odds ratios of patient who achieved full functional independence, defined as “excellent mRS” (with residual non-disabling symptoms, mRS 1, or symptom-free, mRS 0) between the uWMH burden groups of each acute severity subgroup.

All statistical analyses were performed with Python SciPy 1.5.4 (22), Sci-kit Learn 0.23 (23), and StatsModel 0.12 packages (24).

RESULTS

Population Analysis

The population characteristics of the included patients are summarized in the first column of **Table 1**. The multiple log-linear regression model of WMHv with respect to all included clinical characteristics (age, sex, AF, HTN, DM, CAD, PS, and NIHSS) represented an expected WMHv, \hat{Y}_{WMHv} , of a patient with respect to the VRF profile of the patient. The regression coefficients of the multiple log-linear regression model are summarized in **Table 2**. The multiple log-linear model explained 43.3% of the total variation of WMHv ($R^2 = 0.433$). The uWMH burden was not correlated with any included clinical characteristics: i.e., the correlation coefficients of the uWMH burden to all included clinical characteristics were 0. The uWMH burden passed the normality test by the Shapiro–Wilks test ($p < 0.001$). The uWMH burden showed a significant association with continuous functional outcomes (3-month to 6-month mRS score: 0–5) in the univariate linear regression model $\beta = 0.104$, $p < 0.01$.

The second to the fourth columns of **Table 1** summarize the population characteristics of the low, expected, and excessive uWMH burden groups. The averages of the uWMH burden of

TABLE 1 | Population clinical characteristics of total acute ischemic stroke patients from the MRI-GENIE study and those included the analysis with available admission NIHSS, 3- to 6-month mRS scores and WMHv, and the low, expected, and excessive uWMH burden groups.

	Total (n = 5,822)	Total included in the analysis (n = 890)	Low (n = 140)	Expected (n = 599)	Excessive (n = 151)
Age, average (SD)	61.3 (15.2)	63.7 (15.0)	61.6 (14.1)	64.1 (15.5)	64.2 (13.9)
Sex, n (%)	2,416 (41.5%)	379 (42.6%)	59 (42.1%)	251 (41.9%)	69 (45.7%)
HTN, n (%)	3,849 (66.1%)	541 (60.8%)	88 (62.9%)	355 (59.3%)	98 (64.9%)
DM, n (%)	1,480 (25.4%)	180 (20.2%)	24 (17.1%)	131 (21.9%)	25 (16.6%)
AF, n (%)	741 (12.7%)	140 (15.7%)	19 (13.6%)	98 (16.4%)	23 (15.2%)
CAD, n (%)	1,021 (17.5%)	140 (15.7%)	13 (9.3%)	105 (17.5%)	22 (14.6%)
SMK, n (%)	3,342 (57.4%)	475 (53.4%)	70 (50.0%)	331 (55.3%)	74 (49.0%)
PS, n (%)	749 (12.9%)	85 (9.6%)	13 (9.3%)	59 (9.8%)	13 (8.6%)
NIHSS, median (IQR)	N/A	3 (5)	3 (4)	3 (6)	3 (5)
uWMH, avg (std)	N/A	0 (1.1)	-1.8 (0.5)	0.0 (0.6)	1.6 (0.4)

TABLE 2 | The regression coefficients of individual univariate and multiple log-linear regression analyses that modeled the associations of age, sex, VRFs, and NIHSS with WMHv.

Y = WMHv	Age	Sex	HTN	AF	CAD	DM	SMK	PS	NIHSS	β_0
Regression coefficients	0.06	-0.19	0.33	-0.01	-0.1	0.27	0.30	0.33	0.01	-9.82
p	<0.01	0.01	<0.01	0.96	0.4	<0.01	<0.01	0.01	0.08	<0.01

TABLE 3 | The odds ratios of patients who achieved full functional independence (mRS excellent: mRS scores 0–1) of the excessive uWMH burden groups to the low (excessive/low) and expected (excessive/expected) groups and of the expected group to the low (expected/low) group.

Population	Excessive/low	Excessive/expected	Expected/low
OR	0.39	0.6	0.65
p, 95% CI	<0.01 (0.25, 0.63)	<0.01 (0.42, 0.87)	0.03 (0.44, 0.96)

low, expected, and excessive eWMH burden groups were -1.8, 0.0, and 1.6, respectively.

The ratios of patients who achieved full functional independence (mRS excellent: mRS score 0–1) in the low, expected, and excessive uWMH burden groups were 65.7, 55.6, and 43%, respectively. The odds ratios of the mRS excellent patients between the uWMH burden groups are summarized in **Table 3**. Patients in the excessive uWMH burden groups were less likely to achieve full functional independence after AIS than the expected and excessive uWMH burden groups. The odds ratios of the excessive uWMH group with respect to the expected and low uWMH burden groups were 0.604 ($p < 0.01$) and 0.394 ($p < 0.01$), respectively. The odds ratio of the expected uWMH burden group with respect to the low group was 0.653 ($p = 0.03$). **Figure 2A** shows the distributions of mRS scores of the low, expected, and excessive uWMH burden groups. The distribution of mRS scores of the excessive uWMH burden groups was consistently shifted toward worse mRS scores compared to the lower uWMH groups.

As an auxiliary analysis, we conducted the same analyses with all patients, including 34 post-stroke non-survivors (mRS

= 6). The results did not change substantially by including non-survivors. The uWMH burden showed a significant association with functional outcomes (3-month to 6-month mRS score: 0–6) in the univariate regression model, $\beta = 0.091$, $p = 0.036$. The odds ratios between the low, expected, and excessive uWMH burden groups did not change substantially from the analysis with post-stroke survivors only. The detailed results are reported in **Supplementary Tables 1–3** in the **Supplementary Materials**.

Acute Stroke Severity Subgroup Analysis

The third quartile of the NIHSS scores of the population was seven. The median NIHSS scores of the mild (NIHSS <7) and severe (NIHSS ≥7) acute stroke severity subgroups were 2 and 11, respectively. The overall population characteristics of the acute stroke severity subgroups are summarized in **Table 4**.

In the mild acute stroke severity subgroup, the ratios of mRS excellent patients in the low, expected, and excessive uWMH burden groups were 71, 65.2, and 52.3%, respectively. The odds ratios of the mRS excellent patients in the excessive uWMH burden group with respect to the low and expected uWMH burden groups were 0.446 ($p < 0.01$) and 0.585 ($p = 0.01$), respectively. The odds ratio of the expected uWMH burden group compared to the low uWMH burden group was 0.763 ($p = 0.25$).

In the severe acute stroke severity subgroup, the ratios of mRS excellent patients in the low, expected, and excessive uWMH burden groups were 48.5, 27.2, and 17.5%, respectively. The odds ratios of the mRS excellent patients in the excessive and expected uWMH burden groups with respect to the low uWMH burden group were 0.225 ($p < 0.01$) and 0.396 ($p = 0.02$). The odds ratio of the excessive uWMH burden group compared to the expected uWMH burden group was 0.569 ($p = 0.21$). The odds ratios of

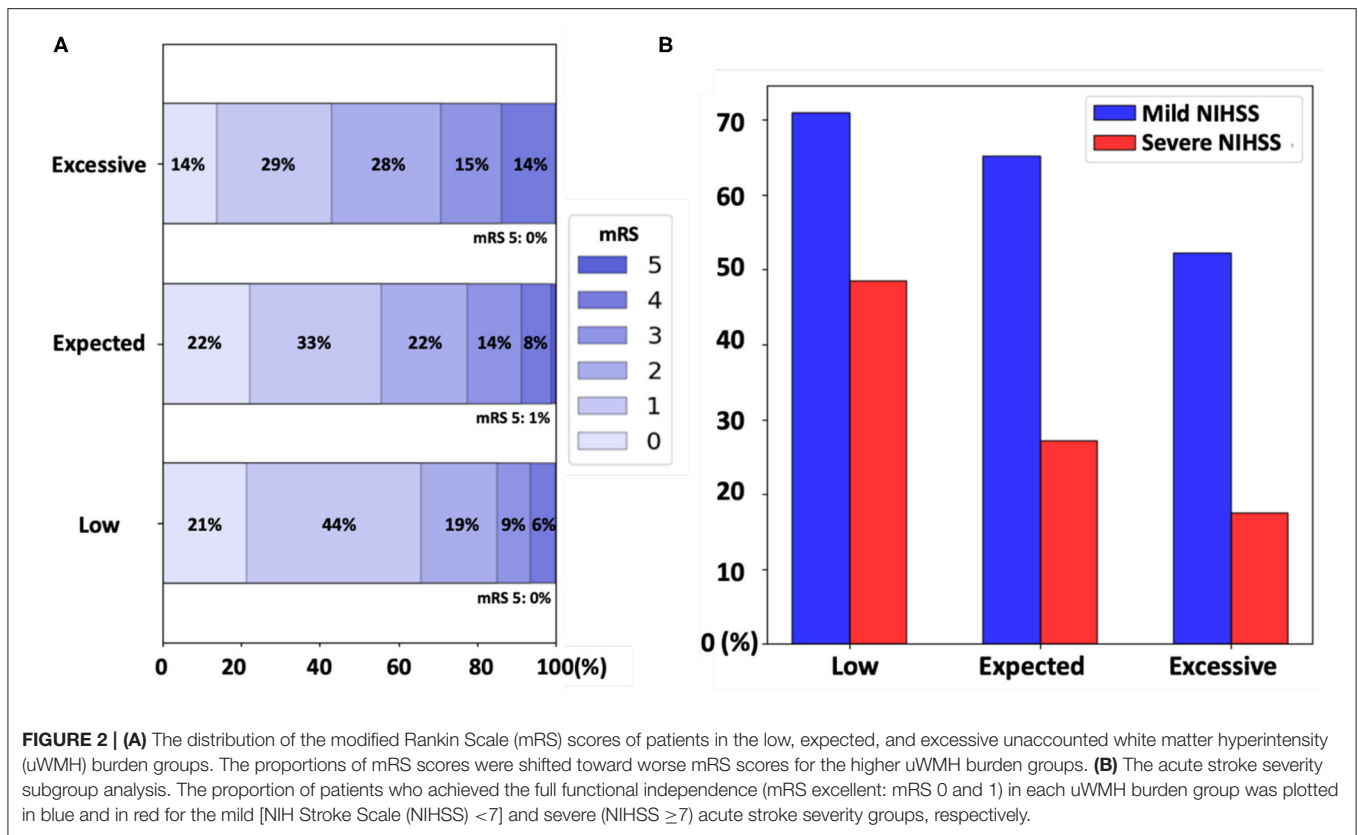


FIGURE 2 | (A) The distribution of the modified Rankin Scale (mRS) scores of patients in the low, expected, and excessive unaccounted white matter hyperintensity (uWMH) burden groups. The proportions of mRS scores were shifted toward worse mRS scores for the higher uWMH burden groups. **(B)** The acute stroke severity subgroup analysis. The proportion of patients who achieved the full functional independence (mRS excellent: mRS 0 and 1) in each uWMH burden group was plotted in blue and in red for the mild [NIH Stroke Scale (NIHSS) <7] and severe (NIHSS ≥7) acute stroke severity groups, respectively.

TABLE 4 | Population clinical characteristics of acute ischemic stroke patients in the mild acute stroke severity group (mild, NIHSS < 7) and severe stroke severity group (severe, NIHSS ≥ 7).

	Mild (n = 666)	Severe (n = 224)
Age, average (SD)	63.4 (15.2)	64.6 (14.3)
Sex, n (%)	273 (41.0%)	106 (47.3%)
HTN, n (%)	408 (61.3%)	133 (59.4%)
DM, n (%)	134 (20.1%)	46 (20.5%)
AF, n (%)	86 (12.9%)	54 (24.1%)
CAD, n (%)	95 (14.3%)	45 (20.1%)
SMK, n (%)	367 (55.1%)	108 (48.2%)
PS, n (%)	63 (9.5%)	22 (9.8%)
NIHSS, median (IQR)	2 (3)	11 (7)
uWMH, average (SD)	0.0 (1.1)	0.0 (1.1)

TABLE 5 | Acute stroke severity subgroup analysis.

Acute stroke severity group		Excessive/low	Excessive/expected	Expected/low
Mild (n = 666)	OR	0.45	0.58	0.76
	p, 95% CI	<0.01 (0.26, 0.78)	0.01 (0.38, 0.89)	0.25 (0.48, 1.21)
Severe (n = 224)	OR	0.23	0.57	0.40
	p, 95% CI	<0.01 (0.08, 0.65)	0.21 (0.23, 1.39)	0.02 (0.18, 0.86)

The odds ratios of patients who achieved full functional independence (mRS excellent: mRS scores 0–1) of the excessive uWMH burden groups to the low (excessive/low) and expected (excessive/expected) groups and of the expected group to the low (expected/low) group in the mild acute stroke severity group (mild, NIHSS < 7) and the severe acute stroke severity group (severe, NIHSS ≥ 7).

the subgroup analysis are summarized in **Table 5** and visualized in **Figure 2B**.

We also conducted an auxiliary analysis with all patients, including the post-stroke non-survivors for the subgroup analysis. The odds ratios and p-values between the low, expected, and excessive uWMH burden groups were not changed substantially for both mild and severe acute stroke severity patients. The detailed results are summarized in **Supplementary Tables 4, 5** in the **Supplementary Materials**.

DISCUSSION

In this study, we analyzed the association of uWMH, i.e., the amount of WMH burden that is not explained by the traditional VRFs of a patient, and post-stroke functional outcome. Our results showed that, in stroke survivors, uWMH was significantly associated with the 3–6 months of functional outcomes. Furthermore, our population analysis showed that patients with higher uWMH burden were less likely to achieve full functional independence (mRS < 2) than patients with lower uWMH burden, while their clinical characteristics were similar. Our study supports the previous suggestions that WMH

severity implicates more than the effects of demographics and traditional VRFs and shows the clear association of the uWMH burden and complete post-stroke functional recovery, with the uWMH burden emerging as a new independent variable to utilize in future analyses of post-stroke functional outcomes (25).

The consistent results of the trichotomized analysis with respect to the uWMH burden on the entire population showed that excessive uWMH burden was linked to less probability of achieving full functional independence and the opposite for low uWMH. The mean uWMH burden of patients in the low uWMH burden group was negative; thus, patients in the low uWMH group had lower WMH severity than expected from their demographics and traditional VRF profiles. This might indicate that those patients who were more resilient to a lifelong, chronic damage to the brain (as measured by WMH severity) were more likely to achieve full functional independence after stroke than those with similar VRF profiles but unexpectedly excessive uWMH. The consistent finding that patients in the excessive uWMH burden group were less likely to achieve full functional independence compared to those in the other groups also supports this interpretation.

The subgroup analysis based on acute stroke severity showed that the uWMH burden was linked to full functional independence for patients with both mild and severe acute stroke severity. Because our patient population had milder acute stroke severity (*median NIHSS* = 3) than a typical clinical scenario of mixed mild and severe strokes, separate subgroup analyses, including mild acute (*median NIHSS* = 2) and severe (*median NIHSS* = 11) strokes, provided additional information on the uWMH association with full functional independence after stroke (mRS 0–1). The results were consistent with the overall population analysis; excessive uWMH burden in these subgroups resulted in a decreased probability of achieving full functional independence and the opposite for low uWMH.

In the severe stroke subgroup, patients with low uWMH showed significantly greater odds of achieving full functional independence after stroke than any others. In the mild stroke group, the odds of achieving full functional independence by patients with excessive uWMH was significantly lower compared to other groups. These findings might indicate that a patient with the brain resilient to chronic cerebrovascular injury is more robust to achieve full functional recovery even after severe stroke, while a patient with a vulnerable brain (as reflected by excessive uWMH) is more susceptible to post-stroke disability even after a mild stroke (as shown in **Figure 2B**). The additional finding to highlight with regard to these data is that the probability of achieving full functional independence post-stroke (mRS 0–1) in mild stroke patients with excessive uWMH and the probability of those with low uWMH burden and severe stroke were similar at 52.3 and 48.5%, respectively (**Table 5** and **Figure 2B**). We interpret these data as potential evidence of the strong effect by uWMH on the functional outcome in patients with different levels of acute stroke severity. The excessive uWMH burden was more predictive on lower functional outcomes for those with mild stroke severity and, on

the other hand, the low uWMH burden was more protective on achieving functional independence for those with severe stroke severity.

The uWMH burden was not correlated with any of the other included clinical characteristics. This was expected since uWMH represent residuals of the multiple log-linear regression model with respect to the clinical characteristics. The multiple log-linear regression modeling of WMHv and the other clinical characteristics and the definition of the uWMH burden as the residual of the model can be interpreted as the adjustment of the effects of the demographics and traditional VRF profile of a patient to the WMHv. The uWMH burden analysis enabled the explicit exploration of the association between WMH severity and post-stroke functional outcomes, free of the traditional VRF patient profile effect (26). We only included the univariate linear regression analysis for the uWMH association with the continuous post-stroke functional outcome because the uWMH burden was not correlated with the included clinical factors.

There are several limitations of our study that are worth considering for further investigations. The clinical characteristics that were considered in this analysis were not exhaustive of all known factors associated with WMH and stroke outcomes. WMH accumulation depends on many factors: normal aging (27), VRF aggregation, blood–brain barrier disruption (28), amyloid and tau accumulation (29), hyperlipidemia (8, 14), hyperhomocysteinemia (30), and genetics (31). Because the uWMH burden captured the effects of the demographics and traditional VRFs in a stroke cohort by modeling, it might have captured the effect of unmeasured risk factors, including the aforementioned VRFs, stroke etiologies, or genetics. The binary representations of the traditional VRFs may have undermined their effects on the WMH burden. The additional information on a time-based load of VRFs may improve the estimation of the expected WMH burden based on the clinical characteristics of the patients and the quantification of the unaccounted WMH burden. The education and personal lifestyle of a patient that may also be related to the WMH accumulation will improve the personalized analysis on the association of the WMH burden and functional stroke outcomes. The other possible risk factors will need to be investigated further by other studies that specifically focus on non-traditional risk factors for WMH and that may explain the remaining unexplained variance of functional outcomes in this study.

The post-stroke treatment information of patients was not included in the analysis because the information was not available in our study. The post-stroke treatment information will enable a stratified analysis on patients who received post-stroke treatments and those did not, with a careful assessment on the heterogeneity of post-stroke treatments and their complications. The cognitive decline of a patient will also provide an important insight on the interaction between the WMH burden and functional outcomes that can be investigated further.

Patients in the low uWMH burden group were slightly younger than the expected and excessive uWMH burden groups.

Patients in the low uWMH burden groups were also less likely to have DM, AF, CAD, and smoking than the expected uWMH groups. Although the differences were not large, it might have affected the results. However, patients in the excessive uWMH burden group also had less proportions of having histories of DM, AF, CAD, and smoking, which might suggest that the differences were caused by the relatively small sample sizes of the low and excessive uWMH burden groups. It is worth to note that categorizing patients with respect to WMHv would have resulted in larger differences in clinical characteristic distribution across the groups and further complicated the interpretation on the association of WMH severity and post-stroke outcomes.

Being focused on explaining functional outcomes, our analysis does not expand to the predictive capacity of the uWMH burden for post-stroke functional outcomes. Our analysis was also not validated with an independent cohort because of the availability. The strong association of the uWMH burden with post-stroke functional outcomes suggests that the uWMH burden could be of benefit for future clinical prediction models of functional outcomes. We do not suggest the uWMH burden as the strongest predictor of post-stroke functional outcomes. As shown in the subgroup analysis regarding the acute stroke severity, the acute NIHSS was a stronger predictor of post-stroke functional outcomes. However, the subgroup analysis also showed that the uWMH burden could complement the prediction of functional outcomes with the admission NIHSS. This will be an interesting research direction to investigate further regarding the predictive capability of the uWMH burden, combined with other risk factors including the acute stroke severity, by using predictive modeling (e.g., logistic regression, decision forests, deep learning models, etc.). The predictive power of the uWMH burden and its association to functional outcomes will be benefited from cross-validation across multiple datasets and also from validation with a dataset from an independent cohort.

To enable the analysis of WMHv with the largest possible number of image data, we used the automatic segmentation framework to obtain WMHv. Although the WMH segmentation masks were validated quantitatively and qualitatively, we did not have access to old and new stroke lesion outlines and could hence not comprehensively account for either one (20). It is therefore possible that stroke infarcts with WMH similarity might have led to some inaccuracies in WMH delineation. This effect might be especially pronounced in patients with a high acute stroke severity and larger, or multiple, old and new stroke infarcts. However, in view of a median NIHSS of only three, the median size of stroke infarcts is expected to be small, as is their impact on WMHv estimation.

Lastly, WMHv and whole-brain volume were quantified by a scalar abstract measure—volume. Future studies should investigate how high-dimensional brain features, such as WMH, in relation to different white matter subregions and brain anatomical structures (e.g., white matter, striatal complex, and ventricle), are associated with functional post-stroke outcomes.

CONCLUSION

The excessive burden of WMH that was not accounted for by the demographics and traditional VRFs of each individual patient is associated with post-stroke functional outcomes, especially with full functional independence after stroke. Our analysis suggests that a lifetime injury to the white matter that is not explained by traditional VRF profile is an important factor for stroke recovery and a plausible indicator of brain health. In the future, an individual risk profile of an AIS patient and its relationship to WMH should be considered in a personalized approach to post-stroke outcome prediction.

DATA AVAILABILITY STATEMENT

The original contributions presented in the study are included in the article/**Supplementary Material**, further inquiries can be directed to the corresponding author/s.

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SH, A-KG, MS, and NR contributed to conception and design of the study. SH performed statistical analysis and drafted the manuscript. SH, AB, MB, PR, and NR analyzed and reviewed the analysis and data. All authors did major roles in the acquisition of data, contributed to manuscript revision, read, and approved the submitted version.

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Conflict of Interest: AR was employed by Centogene AG, Germany.

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