ORIGINAL COMMUNICATION



Effect of cerebral small vessel disease on the integrity of cholinergic system in mild cognitive impairment patients: a longitudinal study

Tiantian Qiu¹ · Hui Hong² · Qingze Zeng² · Xiaopei Xu² · Yanyan Wang³ · Lixin Zhu¹ · Lige Zhang¹ · Kaicheng Li² · Shouping Dai¹ · Xiaodong Li¹ · Fei Xie⁴ · Yusong Zhang¹ · Xiao Luo² · for the Alzheimer's Disease Neuroimaging Initiative

Received: 13 November 2023 / Revised: 22 January 2024 / Accepted: 22 January 2024 / Published online: 21 February 2024 © The Author(s) 2024

Abstract

We aimed to investigate the effect of cerebral small vessel disease (SVD) on cholinergic system integrity in mild cognitive impairment (MCI) patients. Nucleus basalis of Meynert (NBM) volume and cholinergic pathways integrity was evaluated at baseline, 1-, 2-, and 4-year follow-ups in 40 cognitively unimpaired (CU) participants, 29 MCI patients without SVD, and 23 MCI patients with SVD. We compared cholinergic markers among three groups and examined their associations with SVD burden in MCI patients. We used linear mixed models to assess longitudinal changes in cholinergic markers over time among groups. Mediation analysis was employed to investigate the mediating role of cholinergic system degeneration between SVD and cognitive impairment. Increased mean diffusivity (MD) in medial and lateral pathways was observed in MCI patients with SVD compared to those without SVD and CU participants. Both MCI groups showed decreased NBM volume compared to CU participants, while there was no significant difference between the two MCI groups. Longitudinally, compared to CU participants, MCI patients with SVD displayed a more rapid change in MD in both pathways, but not in NBM volume. Furthermore, SVD burden was associated with cholinergic pathway disruption and its faster rate of change in MCI patients. However, mediation analyses showed that cholinergic pathways did not mediate significant indirect effects of SVD burden on cognitive impairment. Our findings suggest that SVD could accelerate the degeneration of cholinergic pathways in MCI patients. However, they do not provide evidence to support that SVD could contribute to cognitive impairment through cholinergic system injury.

Keywords Cerebral small vessel disease · Cholinergic system · Nucleus basalis of Meynert · Alzheimer's disease · Magnetic resonance imaging

Abbreviations		
Αβ	Amyloid beta	
AChE	Acetylcholinesterase	
AD	Alzheimer's disease	
– ADNI	Alzheimer's disease neuroimaging initiative	
ANOVA	One-way analysis of variance	
ANTs	Advanced normalization tools	
AVLT	Auditory verbal learning test	
BF	Basal forebrain	
CAT	Computational anatomy toolbox	
CDR	Clinical dementia rating	
CHIPS	Cholinergic pathways hyperintensities scale	
CSF	Cerebrospinal fluid	
CU	Cognitively unimpaired	
DTI	Diffusion tensor imaging	
FLAIR	Fluid-attenuated inversion recovery	
FLIRT	FMRIB's linear image registration tool	
	Abbreviat Aβ AChE AD ADNI ANOVA ANTs AVLT BF CAT CDR CHIPS CSF CU DTI FLAIR FLIRT	

FODs	Fiber-orientation distributions
GM	Gray matter
LST	Lesion segmentation tool
LPA	Lesion prediction algorithm
MCI	Mild cognitive impairment
MD	Mean diffusivity
MMSE	Mini-mental state examination
MRI	Magnetic resonance imaging
NBM	Nucleus basalis of Meynert
PET	Positron emission tomography
ROIs	Regions of interest
SE-EPI	Spin echo pulse sequence
	echo-planar-imaging
SPM	Statistical parametric mapping
SS3T-CSD	Single-shell, 3-tissue constrained spherical
	deconvolution
SUVR	Standardized uptake value ratio
SVD	Small vessel disease
SVF	Semantic verbal fluency
TE	Echo time
TIV	Total intracranial volume
TMT	Trail making test
TR	Repetition time
WM	White matter
WMH	White matter hyperintensities

Introduction

Alzheimer's disease (AD) is the most common cause of dementia in the elderly and involves multiple pathological processes. In addition to well-established amyloid accumulation, cerebral small vessel disease (SVD) has also been a crucial factor influencing the development of AD [1]. Notably, the presence of both amyloid and SVD pathologies has been suggested to be associated with more severe cognitive dysfunction and a faster rate of cognitive decline in patients with mild cognitive impairment (MCI) and AD [2–4], as well as early conversion from MCI to AD [5, 6]. However, the mechanism underlying the effect of SVD on AD progression remains incompletely understood.

Cholinergic deficits play a critical role in the pathogenesis of AD [7, 8]. Early post mortem studies have illustrated that patients with AD experience a significant loss of basal forebrain (BF) cholinergic neurons, particularly in the nucleus basalis of Meynert (NBM) [9, 10]. In vivo imaging studies further support the findings that patients with MCI exhibit a reduction in NBM volume compared to healthy controls, with even more pronounced reductions in AD patients [11–13]. Cholinergic deficits in AD not only involved in cholinergic NBM neurons but also fibers projecting from the NBM to cortical areas. An autopsy study utilizing cholinergic markers identified two major cholinergic pathways, namely the medial and lateral pathways [14]. Further, recent studies have effectively tracked the two cholinergic white matter (WM) pathways in vivo using neuroimaging analysis techniques [15] and have found that the integrity of these pathways is compromised in individuals with subjective cognitive decline, MCI and AD, which is associated with cognitive decline [16–18].

The relationship between SVD and cholinergic deficits has been previously investigated. In subjects without dementia, increased severity of SVD burden is associated with lower cortical acetylcholinesterase (AChE) activity [19]. Patients with vascular dementia have shown decreased acetylcholine levels and reduced AChE activity in cerebrospinal fluid (CSF) [20, 21], and cholinergic therapies could improve cognition functions [22]. Furthermore, losses of cholinergic pathways assessed using the cholinergic pathways hyperintensities scale (CHIPS) were associated with vascular cognitive dysfunction [23, 24]. However, although several studies have demonstrated the associations between SVD and some cholinergic markers (e.g., cerebral AChE activity [25] and substantia innominate/BF volume [26, 27]) in AD, these findings are inconsistent and inadequate. Whether and how SVD impacts the integrity of the cholinergic NBM and WM pathways in AD progression remains to be clarified.

This study aimed to investigate (1) the changes in cholinergic system integrity in MCI patients with and without SVD, and (2) the potential mediating role of cholinergic deficits in the connection between SVD and cognitive impairment. We will achieve these objectives through comprehensive analyses that combines both cross-sectional and longitudinal approaches. Specifically, we focused on two well-established cholinergic markers, namely the NBM volume and mean diffusivity (MD) of WM pathways, which have previously been shown to be sensitive to cholinergic system damage in AD [17]. We hypothesized that MCI patients with SVD would exhibit more severe cholinergic damage than those without SVD. Moreover, SVD may lead to cognitive impairment by accelerating cholinergic deficits.

Methods

Study participants

All data used in the current study were from the Alzheimer's Disease Neuroimaging Initiative (ADNI) database (http://adni.loni.usc.edu/). This ongoing project was launched in 2003 to develop clinical, neuropsychological, and neuroimaging biomarkers for early disease detection and progression monitoring of AD.

ADNI criteria for MCI patients were: (1) subjective memory complaints, either self-reported, reported by a study

partner, or reported by a clinician; (2) objective memory loss defined as scoring below an education adjusted cutoff score on delayed recall of the Wechsler Memory Scale-Logical Memory; (3) a mini-mental state examination (MMSE) score equals to or higher than 24 out of 30; (4) a global clinical dementia rating (CDR) score of 0.5; and (5) general cognitive and functional performance sufficiently preserved so that a diagnosis of dementia could not be made by the site physician at the time of screening. ADNI criteria for cognitively unimpaired (CU) participants were: (1) no report of any cognition complaints; (2) a MMSE score equals to or higher than 24 out of 30; and (3) a CDR score of 0.

Group stratification based on baseline A β levels and SVD severity

The amyloid positron emission tomography (PET) images underwent a standardized preprocessing procedure by the ADNI-PET Core. The standardized uptake value ratio (SUVR) was calculated as the average of the uptake values of the frontal, angular/posterior cingulate, lateral parietal, and temporal cortices divided by the mean uptake values in the cerebellum. As previously described [28], baseline Aβ positivity (A+) was defined by a SUVR \geq 1.11. Following the research framework proposed by Jack et al. [29], MCI patients with A+were included in our study.

The burden of white matter hyperintensities (WMH) was used to reflect SVD severity and was evaluated on baseline T2 fluid-attenuated inversion recovery (FLAIR) images according to the Fazekas et al. criteria [30]. Participants with moderate/severe WMH burden were labeled as V + (indicating vascular brain injury), while those with mild WMH burden were labeled as V - . Consequently, MCI patients with A + were further categorized into A + V + and A + V - groups, while CU participants with A - V - served as the control group. In addition, available neuropsychological tests and magnetic resonance imaging (MRI) data at 1-, 2-, and 4-year follow-ups were collected.

Demographics and cognitive assessment

Demographic information was assessed, including age, sex, education level, and APOE ε 4 status. Participants with one or more ε 4 alleles were identified as APOE ε 4 carriers. To address the potential confounding influence of APOE ε 2/ ε 4, all analyses will be reexamined after excluding participants identified as APOE ε 2/ ε 4 carriers (see Supplementary Material 1). Furthermore, vascular risk factors such as hypertension, hypercholesterolaemia, diabetes, and smoking status were evaluated.

All participants underwent comprehensive neuropsychological tests involving multiple cognitive domains, including memory (Auditory Verbal Learning Test [AVLT] total recall score for trials 1–5 and 30-min delayed recall), attention (Trail Making Test, Part A [TMT-A]), executive function (Trail Making Test, Part B [TMT-B]), and language (semantic verbal fluency [SVF]).

MRI acquisition

All participants underwent whole-brain MRI scans using 3.0 T scanners, according to ADNI protocol. The sequence parameters of T1-weighted inversion recovery spoiled gradient recalled images were as follows: repetition time (TR) = 6.96 ms, echo time (TE) = 2.8 ms, voxel size = $1.01 \times 1.01 \times 1.2$ mm³, matrix size = 256×256 , and flip angle = 11° . Diffusion tensor imaging (DTI) images were acquired using spin echo pulse sequence echo-planar-imaging (SE-EPI) with the following parameters: TR = 9000 ms, voxel size = $2.7 \times 2.7 \times 2.7$ mm³, matrix size = 256×256 , flip angle = 90° , and the number of slices = 59. Each DTI scan consists of 46 separate images: 5 T2-weighted images with no diffusion sensitization (b0 images) and 41 diffusion-weighted images ($b = 1000 \text{ s/mm}^2$). In addition, T2 FLAIR data were obtained only at baseline using an echo-planar imaging sequence with the following parameters: TR = 9000 ms, TE = 90 ms, TI = 2500 ms, number of slices = 42, and slice thickness = 5 mm.

Cholinergic WM pathways analysis

The methods for tracking the cholinergic WM pathways largely followed the procedure described in previous studies [15, 31]. This approach comprised five key steps.

Preprocessing DTI data

We used MRtrix3 (http://www.mrtrix.org) to remove Gibbs ringing and correct for eddy-current, head motion, and bias field. Then, fiber-orientation distributions (FODs) were determined for each participant using Single-Shell, 3-Tissue Constrained Spherical Deconvolution (SS3T-CSD) [32]. The 3-tissue response functions were estimated directly from the diffusion MRI data itself and then averaged to obtain a group average anisotropic single-fiber WM response functions using an unsupervised method [33]. Finally, bias field correction and intensity normalization in the log-domain were performed on the 3-tissue compartments.

Determination of regions of interest masks

Five regions of interest (ROIs) masks for cholinergic tractography—NBM, cingulum, external capsule, brainstem, and anterior commissure—were chosen based on the previous studies [15, 34]. These ROIs were then registered to individual diffusion space using a combination of nonlinear SyN registration algorithm [35] in Advanced Normalization Tools (ANTs, http://stnava.github.io/ANTs/) and FMRIB's Linear Image Registration Tool (FLIRT) [36].

Individual tractography

Tractography was performed on all CU participants using tckgen in MRtrix. The NBM ROI mask was designated as the seed mask, while the brainstem and anterior commissure ROI masks were set as exclusion mask. The cingulum and external capsule ROI masks were used to track cholinergic medial and lateral pathways, respectively. Tractography parameters: tractography algorithm: iFOD2; number of generated streamlines: 10,000; all other parameters, such as step size and angle constraints, were set to default values by MRtrix. Subsequently, a B0 template was created based on all CU participants' B0 images using the 'build-template' module in ANTs. Individual cholinergic pathways were then registered to the B0 template space. Finally, only voxels that appeared in a minimum of 50% of the cases were preserved in template creation. The cholinergic WM pathways are shown in Fig. 1.

Individual cholinergic pathway

After acquiring the cholinergic pathway templates, the individual medial and lateral pathways were warped into their respective individual spaces. Manual inspection was conducted to ensure their accuracy in individual space.

Cholinergic pathway integrity evaluation

The average MD index, which has previously been demonstrated to be sensitive to injury of cholinergic pathways [15–17], was utilized to characterize the microstructural properties of the cholinergic WM pathways.

NBM volumes

The methodology for obtaining the NBM volume involved three primary steps.

Fig. 1 Cholinergic WM pathways. The masks of cholinergic medial pathway (**A**) and lateral pathway (**B**) were displayed, respectively

A. Medial pathway

T1 image segmentation

Utilizing the Longitudinal segmentation pipeline in the Computational Anatomy Toolbox (CAT12, http://dbm. neuro.unijena.de/cat/), all T1 images across different time points underwent preprocessing. Specifically, settings optimized for detecting significant changes such as aging or developmental effects were selected within the Longitudinal model option. Modulated GM/WM segmentations were chosen to compensate for spatial normalization effects. Initially, rigid alignment of individual T1 images created an average image, subsequently registered to CAT12's default-defined standard space. Within this standard space, subject-specific tissue probability maps for GM and WM were generated for each time point. Total intracranial volume (TIV) was also obtained from this segmentation process.

NBM mask

NBM mask, initially acquired in MNI space, was registered to CAT12's default-defined standard space. This registration process involved nonlinear SyN registration algorithm in ANTs to align the MNI space T1 images with CAT12's default-defined standard space T1 images. The deformation map obtained from this alignment was then applied to the NBM mask, resulting in the acquisition of CAT12's defaultdefined standard space NBM mask.

NBM volume calculation

The GM probability map obtained in the first step and the NBM mask acquired in the second step were multiplied together to calculate the NBM volume for each participant.

Measurement of WMH volume

Quantitative WMH volumes were also measured on baseline T2 FLAIR images by an automatic segmentation tool (Lesion Segmentation Tool, LST) using a lesion prediction algorithm (LPA) based on Statistical Parametric Mapping software (SPM12, http://www.fil.ion.ucl.ac.uk/spm). The automatically created WMH images were then manually corrected to avoid incorrect segmentation. WMH volumes were automatically extracted by LST. For analysis, WMH





volumes were normalized to the TIV and subsequently logtransformed to meet normal distribution.

Statistical analysis

Statistical analysis was performed using SPSS statistical software (version 26; SPSS, Inc., Chicago, IL) and R studio (version 4.1.3). Results were considered statistically significant at P < 0.05 (two-tailed).

Cross-sectional comparison among groups

Age, years of education, cognitive measures, cerebral Aβ levels, and WMH volume were compared among the CU_{A-V-} , MCI_{A+V-} , and MCI_{A+V+} groups using one-way analysis of variance (ANOVA), followed by post hoc tests with Bonferroni correction for multiple comparisons. The Chi-square test was used for categorical variables, including sex, APOE genotype, and vascular risk factors. After adjusting for age, sex, education, and TIV, the NBM volume and cholinergic pathways MD were compared between groups using ANOVA, followed by pairwise post hoc tests with Bonferroni correction.

Cross-sectional associations between WMH burden and cholinergic deficits and the mediation analysis in MCI patients

We conducted partial correlation analysis to examine the relationship between WMH burden and cholinergic deficits in MCI patients, with age, sex, and education as covariates. To investigate the potential mediating role of cholinergic deficits in the connection between WMH burden and cognitive impairment, we initially conducted partial correlation analyses involving the cholinergic system and cognitive performance. This step was essential as mediation analysis requires the presence of significant associations between WMH burden and the cholinergic system, as well as between the cholinergic system and cognitive performance. Subsequently, upon confirming these significant associations, we employed mediation analysis to determine whether WMH could potentially contribute to cognitive impairment through cholinergic injury in MCI patients using the PRO-CESS macro v3.5 in SPSS. We performed bias-corrected bootstrapping with 5000 replications to estimate the indirect effect. An indirect effect through mediators between the independent and dependent variables is significant if the 95% confidence interval (CI) does not include zero. In this analysis, we considered normalized NBM volume (TIVcorrected), medial pathway MD, and lateral pathway MD as separate mediators, with WMH volume as the independent variable. Different cognitive domains were successively

entered as dependent variables. Age, sex, and education were included as covariates.

Longitudinal changes in cholinergic system among groups

Linear mixed models were used to examine longitudinal changes in cholinergic system. The analyses were performed using the 'lme4' package R studio [37, 38]. We tested the longitudinal changes in cholinergic system among groups. The model included age, sex, education, group (CU_{A-V-} vs. MCI_{A+V-}, CU_{A-V-} vs. MCI_{A+V+}, MCI_{A+V-} vs. MCI_{A+V+}), time (i.e., number of years from baseline), and group×time as fixed effects, while time was modeled as a random effect (random intercepts and slopes) for each participant. We separately analyzed three dependent cholinergic markers including normalized NBM volume, medial pathway MD, and lateral pathway MD.

Mediating effects of cholinergic changes between WMH burden and cognitive changes in MCI patients

To explore the potential mediating role of changes in the cholinergic system in the relationship between WMH burden and cognitive alterations, we conducted partial correlation analyses involving WMH burden and cholinergic changes, as well as cholinergic changes and cognitive changes. After confirming these significant associations, we used mediation analysis to study whether WMH burden contribute to cognitive changes by accelerating cholinergic system degeneration. Baseline WMH burden was considered as independent variable. Slopes of normalized NBM volume change, medial pathway MD and lateral pathway MD were set as mediators separately. Different cognitive domains slopes were successively entered as dependent variables. The measurement of slopes was extracted for each patient using linear mixedeffects regression with random effects of intercept and linear slope (with respect to time). Age, sex, and education were included as covariates.

Results

Demographic and clinical data

A total of 40 CU_{A-V-} participants, 29 MCI_{A+V-} patients, and 23 MCI_{A+V+} patients were included. The demographic characteristics, cognitive performance, cerebral A β levels, and WMH volume at baseline were summarized in Table 1. The MCI_{A+V+} group (77.61±4.70) was significantly older than the CU_{A-V-} group (71.85±6.10, P=0.004) and MCI_{A+V-} group (72.36±8.25, P=0.016). There were no significant differences in sex and education level among groups. The frequency of APOE ε 4 carriers

Table 1	Demographics	and clinical	characteristics at	baseline
---------	--------------	--------------	--------------------	----------

Characteristics	$CU_{A-V-}(n=40)$	$MCI_{A+V-} (n=29)$	$MCI_{A+V+} (n=23)$	<i>F</i> -value/ χ^2 -value	P-value
Demographics					
Age, years	71.85 (6.10)	72.36 (8.25)	77.61 (4.70) ^{ab}	6.21	0.003
Sex (F/M)	19/21	14/15	6/17	3.34	0.188
Education, years	16.75 (2.64)	15.17 (2.55)	15.74 (3.12)	2.93	0.059
APOE ε 4 carriers, n (%)	10 (25%)	21 (72.4%) ^a	16 (69.6%) ^a	19.32	< 0.001
Vascular risk factors, n (%)					
Hypertension	21 (52.5%)	13 (44.8%)	18 (78.3%) ^b	6.30	0.043
Hypercholesterolaemia	18 (45.0%)	11 (37.9%)	13 (56.5%)	1.80	0.407
Diabetes	6 (15.0%)	1 (3.4%)	6 (26.1%)	5.46	0.065
Current or past smoking	6 (15.0%)	4 (13.8%)	5 (21.7%)	0.68	0.711
Cognitive performance					
MMSE	28.78 (1.67)	27.07 (1.85) ^a	27.65 (1.56) ^a	8.93	< 0.001
AVLT trials 1-5	48.40 (11.11)	30.48 (7.61) ^a	31.13 (8.87) ^a	38.357	< 0.001
AVLT delayed recall	8.15 (4.28)	2.31 (2.70) ^a	3.61 (3.10) ^a	25.518	< 0.001
Log-transformed TMT-A	1.49 (0.17)	1.54 (0.12)	1.69 (0.17) ^{ab}	11.46	< 0.001
Log-transformed TMT-B	1.86 (0.18)	1.95 (0.21)	2.12 (0.21) ^{ab}	12.53	< 0.001
SVF (animal)	20.60 (5.42)	$16.24 (4.32)^{a}$	$16.04(5.81)^{a}$	8.26	< 0.001
Neuroimaging					
Cerebral A ^β levels	1.02 (0.05)	1.38 (0.17) ^a	1.44 (0.16) ^a	105.02	< 0.001
Log-transformed WMH vol- ume (TIV corrected)	-2.76 (0.40)	-2.65 (0.30)	-2.08 (0.21) ^{ab}	32.11	< 0.001

Values are expressed as mean (standard deviation), number of participants

 $A\beta$ amyloid beta; AVLT auditory verbal learning test; CU cognitively unimpaired; MCI mild cognitive impairment; MMSE mini-mental state examination; SVF semantic verbal fluency; TIV total intracranial volume; TMT trail making test; WMH white matter hyperintensities

^aCompared to CU_{A-V-} group, P < 0.05

^bCompared to MCI_{A+V-} group, P<0.05

was significantly higher in both MCI groups in comparison to the CU_{A-V-} group. Hypertension was more prevalent in the MCI_{A+V+} group compared to the MCI_{A+V-} group, while there were no significant differences for other risk factors. Both MCI groups had lower scores than the CU_{A-V-} group in MMSE (MCI_{A+V-}: P < 0.001, MCI_{A+V+}: P = 0.041), AVLT trials 1–5 (MCI_{A+V-}: P < 0.001, MCI_{A+V+}: P < 0.001), AVLT delayed recall (MCI_{A+V-}: P < 0.001, MCI_{A+V+}: P < 0.001), and SVF (MCI_{A+V-}: P = 0.003, MCI_{A+V+}: P = 0.004). Furthermore, the MCI_{A+V+} group had lower scores than the MCI_{A+V-} and CU_{A-V-} groups in TMT-A (MCI_{A+V-}: P = 0.005, CU_{A-V-}: P < 0.001) and TMT-B (MCI_{A+V-}: P = 0.009, CU_{A-V-}: P < 0.001).

In addition, detailed information on the longitudinal changes of cognitive performance among groups can be found in Supplementary Material 2. Briefly, both MCI groups exhibited an accelerated longitudinal decline on most cognitive measures compared to the CU_{A-V-} group. Moreover, the MCI_{A+V+} group further showed faster cognitive decline in TMT-B than the MCI_{A+V-} group.

Comparison of baseline NBM volume and WM pathways MD among groups

After adjusting for age, sex, education, and TIV, both the MCI_{A+V+} and MCI_{A+V-} groups showed reduced NBM volume compared to the CU_{A-V-} group at baseline (P < 0.001 for both MCI groups), However, there was no significant difference in NBM volume between the two MCI groups (Fig. 2A).

The MCI_{A+V+} group showed increased MD in the medial and lateral pathways compared to the MCI_{A+V-} group (both pathways: P = 0.003) and CU_{A-V-} group (both pathways: P < 0.001) after adjusting for age, sex, education, and TIV. There was no significant difference in MD of the two pathways between the MCI_{A+V-} and CU_{A-V-} groups (Fig. 2B, C).

Baseline associations between WMH burden and cholinergic markers as well as mediation analysis in MCI patients

As shown in Fig. 3, WMH volume had significant associations with MD in cholinergic pathways (medial pathway:



Fig.2 Comparison of baseline integrity of NBM and WM pathways among groups. The normalized NBM volume (**A**), medial pathway MD (**B**), and lateral pathway MD (**C**) were compared between CU_{A-V-} , MCI_{A+V-} , and MCI_{A+V+} groups. *P*-values result from post

hoc tests with Bonferroni correction for multiple comparisons. *P*-values for all comparisons not shown are > 0.05. *CU* cognitively unimpaired; *MCI* mild cognitive impairment; *MD* mean diffusivity; *NBM* nucleus basalis of Meynert

r=0.444, P=0.001; lateral pathway: r=0.526, P<0.001), but not with normalized NBM volume (r=-0.206, P=0.156). The correlations between cholinergic deficits and cognitive impairment were present in Supplementary Material 3. In the mediation analysis, the lateral pathway MD did not act as a mediator for the impact of WMH burden on TMT-B (indirect effect = 0.094, 95%CI [-0.019, 0.22]), although the total effect of WMH burden on TMT-B was significant (total effect = 0.24, P = 0.023).



Fig. 3 Baseline associations between WMH burden and cholinergic markers as well as mediation analysis in MCI patients. Scatter plots graphs of relationship between: WMH volume and normalized NBM volume (A); WMH volume and medial pathway MD (B); WMH volume and lateral pathway MD (C) in MCI patients. Mediation analysis showed that lateral pathway MD did not mediate the relationship between WMH burden and TMT-B (D). a = regression coefficient for

WMH burden and lateral pathway MD; b = regression coefficient for lateral pathway MD and TMT-B, adjusted for the effect of WMH burden; c' = the direct effect for WMH burden and TMT-B; c = the total effect. An indirect effect is significant if the 95% CI does not include zero. *CI* confidence interval; *MD* mean diffusivity; *NBM* nucleus basalis of Meynert; *TMT-B* Trail making test, part B; *WMH* white matter hyperintensities

Longitudinal changes in NBM volume and WM pathways MD among groups

Normalized NBM volume decreased over time in the three groups (P < 0.001). However, there was no significant difference in the rate of normalized NBM volume change between the MCI_{A+V+} and CU_{A-V-} groups (P=0.141), the MCI_{A+V-} and CU_{A-V-} groups (P=0.141), and the MCI_{A+V+} and MCI_{A+V-} groups (P=0.921) (Fig. 4A).

Both MCI groups exhibited an increase in MD of medial and lateral pathways over time (both pathways: P < 0.001). The MCI_{A+V+} group further displayed a faster longitudinal MD increase in both medial and lateral pathways compared to CU_{A-V-} group (medial pathway: P=0.003; lateral pathway: P=0.038). In addition, the MCI_{A+V-} group also showed faster longitudinal change in medial pathway MD compared to CU_{A-V-} group (P=0.024). However, we did not find significant difference in longitudinal change in lateral pathway MD between the MCI_{A+V-} groups (P=0.085), or bilateral pathways MD between the MCI_{A+V+} and MCI_{A+V-} groups (medial pathway: P=0.151; lateral pathway: P=0.316) (Fig. 4B, C). Further details are available in Supplementary Material 4.

Mediation analysis of longitudinal cholinergic system changes between WMH burden and cognitive changes in MCI patients

The detailed relationships between WMH burden and longitudinal changes in cholinergic markers and cognitive performance were present in Supplementary Material 5. In the mediation analysis, the change in medial pathway MD did not act as a mediator for the impact of WMH burden on the changes observed in TMT-A (indirect effect = 0.0015, 95%CI [-0.0021, 0.0049], Fig. 5A) and TMT-B (indirect effect = 0.0053, 95%CI [-0.0004, 0.012], Fig. 5B). Furthermore, the change in lateral pathway MD also did not serve as a mediator for the effect of WMH burden on the change observed in TMT-B (indirect effect = 0.0034, 95%CI [-0.0018, 0.009], Fig. 5C). However, we found that WMH burden was significantly correlated with the rate of change in both cholinergic pathways. Besides, WMH burden had significant total or direct effects on the longitudinal change in TMT-A and TMT-B. See details in Fig. 5.

Discussion

We investigated the effect of SVD on cholinergic system in MCI patients and its contribution to cognitive impairment through cholinergic degeneration. Our main findings are (1) MCI patients with SVD showed disrupted integrity in cholinergic medial and lateral pathways compared to those without SVD and CU participants. Furthermore, SVD burden was associated with the disruption of cholinergic pathways across all MCI patients. (2) Longitudinally, SVD burden could accelerate the degeneration of cholinergic pathways. (3) However, we found no differences in baseline NBM volume or its rate of change over time between MCI patients with and without SVD. (4) Additionally, our study, by cross-sectional and longitudinal mediation analysis, did not support the role of SVD in cognitive impairment through cholinergic system degeneration.

Our findings revealed that MCI patients with SVD had reduced integrity of both cholinergic pathways at baseline compared to those without SVD and CU participants.



Fig.4 Longitudinal changes of NBM volume and WM pathways integrity. The longitudinal evolutionary trajectories of cholinergic markers in the CU_{A-V-} (blue), MCI_{A+V-} (yellow), and MCI_{A+V+} (gray) groups (**A**–**C**). The thin lines represent the changes in individual cholinergic markers over time, and the corresponding thick

lines represent the estimated average cholinergic markers changes of the three groups. The timepoint on the X-axis refers to the year. CU cognitively unimpaired; MCI mild cognitive impairment; MD mean diffusivity; NBM nucleus basalis of Meynert



Fig. 5 Mediation analysis of longitudinal cholinergic changes between WMH burden and cognitive changes in MCI patients. Mediation analysis showed that the change in medial pathway MD did not mediate the relationship between WMH burden and changes in TMT-A (**A**) and TMT-B (**B**). In addition, the change in lateral pathway MD also did not mediate the relationship between WMH burden and change in TMT-B (**C**). a=regression coefficient for WMH bur-

den and cholinergic pathway MD change; b=regression coefficient for cholinergic pathway MD change and cognitive change, adjusted for the effect of WMH burden; c'=the direct effect for WMH burden and cognitive change; c=the total effect. An indirect effect is significant if the 95% CI does not include zero. *MD* mean diffusivity; *TMT-A* trail making test, part A; *TMT-B* trail making test, part B; *WMH* white matter hyperintensities

Moreover, their decline in pathway integrity over time was faster than that of CU participants. These results suggest that SVD not only disrupts the integrity of cholinergic pathways in MCI patients, but also accelerates cholinergic degeneration over time. Damaged integrity of cholinergic pathways has been observed in subcortical vascular cognitive impairment [39], which supports our results. Moreover, our crosssectional and longitudinal correlation analyses showed significant associations between increased WMH burden and cholinergic pathway disruption. One possible explanation is that WM lesions may directly destroy the integrity of cholinergic projections, which are mostly unmyelinated, and therefore susceptible to WM damage [14]. Our findings align with prior research reporting a negative association between WMH burden and cholinergic pathways integrity in both cognitively normal individuals [15] and patients with vascular cognitive impairment [39]. Moreover, several studies have indicated that degradation of the cholinergic projections caused by WMH may contributed to cognitive dysfunction in AD [24, 40]. Interestingly, Cedres et al. [41] further demonstrated that WMH burden is a more critical factor than AD pathologies such as Aβ42/40 ratio and phosphorylated tau levels in CSF in contributing to the degeneration of cholinergic pathways in cognitively unimpaired individuals. Together, these findings emphasize the role of SVD in the degeneration of cholinergic WM pathways.

In addition, we observed reduced NBM volume in both MCI groups compared to the CU group at baseline. Cholinergic degeneration, which includes neuronal loss [9, 10] to morphological changes in the NBM, has been extensively documented in patients with MCI, AD [11, 34, 42] and mixed AD and vascular pathologies [43], which supports our findings. However, our study did not find a significant difference in baseline NBM volume between MCI patients with and without SVD or in its rate of change over time. Our correlation analysis also demonstrated no association between NBM volume and WMH burden. Previous studies have documented that NBM volume is not reduced in patients with vascular cognitive impairment when compared to healthy elderly participants [39, 43]. More recently, Kindler et al. further reported no significant correlation between CHIPS score and NBM volume in AD patients [27]. However, only a few studies have shown significant association between WMH burden and NBM volume in individuals with normal cognition [15] and subtle cognitive impairment [31], which could be attributed to the retrograde degeneration of the NBM from WMH strategically damaging cholinergic projections [44]. A possible explanation for the discrepancy could be that the significant association between WMH burden and NBM degeneration may be stronger in normal cognition and subtle cognitive impairment but weaken or disappear when apparent cognitive impairment occurs.

The mediation analyses showed significant total or direct effects of SVD burden on attention and executive functions across all MCI patients. Our data are in line with previous studies that reported significant associations between SVD and cognitive decline, particularly in the attention and executive functions [45, 46]. Unexpectedly, we did not find an indirect effect of cholinergic pathway deficits between SVD burden and cognitive impairment. A possible explanation could due to the small sample size in our study which make it difficult to capture the mediating role of cholinergic pathway between SVD and cognitive changes. Furthermore, it is likely that the participants in our study were highly educated. Previous research has shown that a higher level of education represents greater cognitive reserve, which may attenuate the negative impact of SVD on cognition [47]. Additionally, cholinergic activity can be upregulated in MCI patients with a higher education level, which appears to have a compensatory effect [48, 49]. Therefore, they may have influenced our exploration of the relationship between SVD, cholinergic system integrity, and cognitive changes.

There are several limitations of our study that should be noted. Firstly, participants in the ADNI database are highly educated, which may introduce selection bias and limit the generalizability of our findings. In addition, the relatively small sample size was constrained by the requirement for complete clinical, MRI, and PET data. Therefore, repeating this work in a population-based cohort with a larger sample size may provide better insight into the impact of SVD on cholinergic system in AD. Secondly, participants were not age-matched, with MCI patients with SVD being older than other groups. However, we accounted for the age effect in our analyses. Thirdly, we used WMH as the SVD index to explore the influence of SVD on cholinergic system. Notably, other components of SVD, such as lacunes, microbleeds, and perivascular spaces, may have different etiologies. Future studies could assess the contribution of a composite SVD index or other components to cholinergic degeneration. Finally, despite employing a longitudinal design, the follow-up period was limited to 48 months. Future studies with extended follow-up durations are required to explore the influence of SVD on cholinergic system changes in AD.

Conclusions

In summary, our findings provide important evidence for the influence of SVD on cholinergic system disruptions and highlight the value of WM pathways microstructure in revealing cholinergic deficits in MCI patients with mixed amyloid and vascular pathologies. Future studies require large sample sizes and population-based cohorts to explore the role of SVD on cognitive impairment through cholinergic system degeneration in AD.

Supplementary Information The online version contains supplementary material available at https://doi.org/10.1007/s00415-024-12218-2.

Acknowledgements Not applicable.

Author contributions TTQ and HH designed the study and wrote the manuscript. QZZ, XPX, YYW, and LXZ contributed to the data collection. LGZ, KCL, and SPD performed the data analysis. XDL, FX, YSZ, and XL interpreted the data. All authors read and approved the final manuscript.

Funding Data collection and sharing for this project were funded by the ADNI (National Institutes of Health Grant No. U01 AG024904) and DOD ADNI (Department of Defense Award No. W81XWH-12-2-0012). This study was also supported by the Natural Science Foundation of Shandong Province (Grant No. ZR2023QH085), and the National Natural Science Foundation of China (Grant No. 82271936 and 82202090).

Availability of data and materials Data used in preparation of this article were obtained from the Alzheimer's disease Neuroimaging Initiative (ADNI) database (http://www.loni.usc.edu). As such, the investigators within the ADNI contributed to the design and implementation of ADNI and/or provided data but did not participate in analysis or writing of this report. A complete listing of ADNI investigators can be found

at: http://adni.loni.usc.edu/wpcontent/uploads/how_to_apply/ADNI_Acknowledgement_List.pdf.

Declarations

Conflicts of interest The authors declare that they have no competing interests.

Ethics approval All procedures performed in studies involving human participants were in accordance with the ethical standards of the institutional and/or national research committee and with the 1964 Helsinki Declaration and its later amendments or comparable ethical standards.

Consent to participate Written informed consent was obtained from all participants and/or authorized representatives.

Open Access This article is licensed under a Creative Commons Attribution 4.0 International License, which permits use, sharing, adaptation, distribution and reproduction in any medium or format, as long as you give appropriate credit to the original author(s) and the source, provide a link to the Creative Commons licence, and indicate if changes were made. The images or other third party material in this article are included in the article's Creative Commons licence, unless indicated otherwise in a credit line to the material. If material is not included in the article's Creative Commons licence and your intended use is not permitted by statutory regulation or exceeds the permitted use, you will need to obtain permission directly from the copyright holder. To view a copy of this licence, visit http://creativecommons.org/licenses/by/4.0/.

References

- Attems J, Jellinger KA (2014) The overlap between vascular disease and Alzheimer's disease–lessons from pathology. BMC Med 12:206
- Lee MJ, Seo SW, Na DL, Kim C, Park JH, Kim GH, Kim CH, Noh Y, Cho H, Kim HJ et al (2014) Synergistic effects of ischemia and β-amyloid burden on cognitive decline in patients with subcortical vascular mild cognitive impairment. JAMA Psychiat 71:412–422
- Bangen KJ, Thomas KR, Weigand AJ, Sanchez DL, Delano-Wood L, Edmonds EC, Carmichael OT, Schwarz CG, Brickman AM, Bondi MW (2020) Pattern of regional white matter hyperintensity volume in mild cognitive impairment subtypes and associations with decline in daily functioning. Neurobiol Aging 86:134–142
- 4. Garnier-Crussard A, Bougacha S, Wirth M, Dautricourt S, Sherif S, Landeau B, Gonneaud J, De Flores R, de la Sayette V, Vivien D et al (2022) White matter hyperintensity topography in Alzheimer's disease and links to cognition. Alzheimer's Dementia 18:422–433
- Tosto G, Zimmerman ME, Hamilton JL, Carmichael OT, Brickman AM (2015) The effect of white matter hyperintensities on neurodegeneration in mild cognitive impairment. Alzheimer's Dementia 11:1510–1519
- Wang YL, Chen W, Cai WJ, Hu H, Xu W, Wang ZT, Cao XP, Tan L, Yu JT (2020) Associations of white matter hyperintensities with cognitive decline: a longitudinal study. J Alzheimer's Dis JAD 73:759–768
- Ferreira-Vieira TH, Guimaraes IM, Silva FR, Ribeiro FM (2016) Alzheimer's disease: targeting the cholinergic system. Curr Neuropharmacol 14:101–115
- Hampel H, Mesulam MM, Cuello AC, Farlow MR, Giacobini E, Grossberg GT, Khachaturian AS, Vergallo A, Cavedo E, Snyder

PJ et al (2018) The cholinergic system in the pathophysiology and treatment of Alzheimer's disease. Brain J Neurol 141:1917–1933

- Whitehouse PJ, Price DL, Clark AW, Coyle JT, DeLong MR (1981) Alzheimer disease: evidence for selective loss of cholinergic neurons in the nucleus basalis. Ann Neurol 10:122–126
- Whitehouse PJ, Price DL, Struble RG, Clark AW, Coyle JT, Delon MR (1982) Alzheimer's disease and senile dementia: loss of neurons in the basal forebrain. Science (New York, NY) 215:1237–1239
- Grothe M, Heinsen H, Teipel SJ (2012) Atrophy of the cholinergic Basal forebrain over the adult age range and in early stages of Alzheimer's disease. Biol Psychiat 71:805–813
- Cantero JL, Zaborszky L, Atienza M (2017) Volume loss of the nucleus basalis of Meynert is associated with atrophy of innervated regions in mild cognitive impairment. Cerebral Cortex (New York, NY: 1991) 27:3881–3889
- Herdick M, Dyrba M, Fritz HJ, Altenstein S, Ballarini T, Brosseron F, Buerger K, Can Cetindag A, Dechent P, Dobisch L et al (2020) Multimodal MRI analysis of basal forebrain structure and function across the Alzheimer's disease spectrum. NeuroImage Clin 28:102495
- Selden NR, Gitelman DR, Salamon-Murayama N, Parrish TB, Mesulam MM (1998) Trajectories of cholinergic pathways within the cerebral hemispheres of the human brain. Brain J Neurol 121(Pt 12):2249–2257
- 15. Nemy M, Cedres N, Grothe MJ, Muehlboeck JS, Lindberg O, Nedelska Z, Stepankova O, Vyslouzilova L, Eriksdotter M, Barroso J et al (2020) Cholinergic white matter pathways make a stronger contribution to attention and memory in normal aging than cerebrovascular health and nucleus basalis of Meynert. Neuroimage 211:116607
- Schumacher J, Ray NJ, Hamilton CA, Donaghy PC, Firbank M, Roberts G, Allan L, Durcan R, Barnett N, O'Brien JT et al (2022) Cholinergic white matter pathways in dementia with Lewy bodies and Alzheimer's disease. Brain J Neurol 145:1773–1784
- Nemy M, Dyrba M, Brosseron F, Buerger K, Dechent P, Dobisch L, Ewers M, Fliessbach K, Glanz W, Goerss D et al (2023) Cholinergic white matter pathways along the Alzheimer's disease continuum. Brain J Neurol 146:2075–2088
- Schumacher J, Ray NJ, Hamilton CA, Bergamino M, Donaghy PC, Firbank M, Watson R, Roberts G, Allan L, Barnett N et al (2023) Free water imaging of the cholinergic system in dementia with Lewy bodies and Alzheimer's disease. Alzheimer's Dementia 19:4549–4563
- Bohnen NI, Müller ML, Kuwabara H, Constantine GM, Studenski SA (2009) Age-associated leukoaraiosis and cortical cholinergic deafferentation. Neurology 72:1411–1416
- 20. Jia JP, Jia JM, Zhou WD, Xu M, Chu CB, Yan X, Sun YX (2004) Differential acetylcholine and choline concentrations in the cerebrospinal fluid of patients with Alzheimer's disease and vascular dementia. Chin Med J 117:1161–1164
- Wallin A, Sjögren M, Blennow K, Davidsson P (2003) Decreased cerebrospinal fluid acetylcholinesterase in patients with subcortical ischemic vascular dementia. Dement Geriatr Cogn Disord 16:200–207
- 22. Erkinjuntti T, Kurz A, Gauthier S, Bullock R, Lilienfeld S, Damaraju CV (2002) Efficacy of galantamine in probable vascular dementia and Alzheimer's disease combined with cerebrovascular disease: a randomised trial. Lancet (Lond, Engl) 359:1283–1290
- Kim HJ, Moon WJ, Han SH (2013) Differential cholinergic pathway involvement in Alzheimer's disease and subcortical ischemic vascular dementia. J Alzheimer's Dis JAD 35:129–136
- 24. Park HE, Park IS, Oh YS, Yang DW, Lee KS, Choi HS, Ahn KJ, Kim JS (2015) Subcortical whiter matter hyperintensities within the cholinergic pathways of patients with dementia and parkinsonism. J Neurol Sci 353:44–48

- Richter N, Michel A, Onur OA, Kracht L, Dietlein M, Tittgemeyer M, Neumaier B, Fink GR, Kukolja J (2017) White matter lesions and the cholinergic deficit in aging and mild cognitive impairment. Neurobiol Aging 53:27–35
- 26. Jaswal G, Swardfager W, Gao F-q, Nestor SM, Ganda A, Cogo-Moreira H, Sahlas DJ, Stuss DT, Moody A, Black SE (2018) Reduced substantia innominata volume mediates contributions of microvascular and macrovascular disease to cognitive deficits in Alzheimer's disease. Neurobiol Aging 66:23–31
- 27. Kindler C, Upadhyay N, Bendella Z, Dorn F, Keil VC, Petzold GC (2023) Independent and additive contribution of white matter hyperintensities and Alzheimer's disease pathology to basal forebrain cholinergic system degeneration. NeuroImage Clin 39:103477
- Landau SM, Mintun MA, Joshi AD, Koeppe RA, Petersen RC, Aisen PS, Weiner MW, Jagust WJ (2012) Amyloid deposition, hypometabolism, and longitudinal cognitive decline. Ann Neurol 72:578–586
- 29. Jack CR Jr, Bennett DA, Blennow K, Carrillo MC, Dunn B, Haeberlein SB, Holtzman DM, Jagust W, Jessen F, Karlawish J et al (2018) NIA-AA research framework: toward a biological definition of Alzheimer's disease. Alzheimer's Dementia 14:535–562
- Fazekas F, Chawluk JB, Alavi A, Hurtig HI, Zimmerman RA (1987) MR signal abnormalities at 1.5 T in Alzheimer's dementia and normal aging. AJR Am J Roentgenol 149:351–356
- 31. Qiu T, Hong H, Zeng Q, Luo X, Wang X, Xu X, Xie F, Li X, Li K, Huang P et al (2023) Degeneration of cholinergic white matter pathways and nucleus basalis of Meynert in individuals with objective subtle cognitive impairment. Neurobiol Aging 132:198–208
- 32. Dhollander T, Connelly A (2016) A novel iterative approach to reap the benefits of multi-tissue CSD from just single-shell (+b=0) diffusion MRI data. In: Singapore: 24th international society of magnetic resonance in medicine, p 3010.
- 33. Dhollander T, Raffelt D, Connelly A (2016) Unsupervised 3-tissue response function estimation from single-shell or multishell diffusion MR data without a co-registered T1 image. In: Proceedings of ISMRM workshop on breaking the barriers of diffusion MRI, Lisbon, Portugal, p 5
- 34. Kilimann I, Grothe M, Heinsen H, Alho EJ, Grinberg L, Amaro E Jr, Dos Santos GA, da Silva RE, Mitchell AJ, Frisoni GB et al (2014) Subregional basal forebrain atrophy in Alzheimer's disease: a multicenter study. J Alzheimer's Dis JAD 40:687–700
- 35. Avants BB, Epstein CL, Grossman M, Gee JC (2008) Symmetric diffeomorphic image registration with cross-correlation: evaluating automated labeling of elderly and neurodegenerative brain. Med Image Anal 12:26–41
- 36. Ashburner J, Friston K (2007) Non-linear registration: statistical parametric mapping. Academic Press, New York, NY
- Bates D, Mächler M, Bolker B, Walker S (2015) Fitting linear mixed-effects models using lme4. J Stat Softw 67:1–48
- Team RC, Team R (2005) A language and environment for statistical computing. R Foundation for Statistical Computing, Austria
- 39. Liu Q, Zhu Z, Teipel SJ, Yang J, Xing Y, Tang Y, Jia J (2017) White matter damage in the cholinergic system contributes to cognitive impairment in subcortical vascular cognitive impairment, no dementia. Front Aging Neurosci 9:47
- 40. McNeely AA, Ramirez J, Nestor SM, Zhao J, Gao F, Kiss A, Stuss DT, Black SE (2015) Cholinergic subcortical hyperintensities in Alzheimer's disease patients from the Sunnybrook Dementia Study: relationships with cognitive dysfunction and hippocampal atrophy. J Alzheimer's Dis JAD 43:785–796
- 41. Cedres N, Ferreira D, Nemy M, Machado A, Pereira JB, Shams S, Wahlund LO, Zettergren A, Stepankova O, Vyslouzilova L et al

(2022) Association of cerebrovascular and Alzheimer disease biomarkers with cholinergic white matter degeneration in cognitively unimpaired individuals. Neurology 99:e1619–e1629

- 42. Grothe MJ, Schuster C, Bauer F, Heinsen H, Prudlo J, Teipel SJ (2014) Atrophy of the cholinergic basal forebrain in dementia with Lewy bodies and Alzheimer's disease dementia. J Neurol 261:1939–1948
- Jung S, Zarow C, Mack WJ, Zheng L, Vinters HV, Ellis WG, Lyness SA, Chui HC (2012) Preservation of neurons of the nucleus basalis in subcortical ischemic vascular disease. Arch Neurol 69:879–886
- Román GC, Kalaria RN (2006) Vascular determinants of cholinergic deficits in Alzheimer disease and vascular dementia. Neurobiol Aging 27:1769–1785
- 45. Kloppenborg RP, Nederkoorn PJ, Geerlings MI, van den Berg E (2014) Presence and progression of white matter hyperintensities and cognition: a meta-analysis. Neurology 82:2127–2138
- 46. Hamilton OKL, Backhouse EV, Janssen E, Jochems ACC, Maher C, Ritakari TE, Stevenson AJ, Xia L, Deary IJ, Wardlaw JM

(2021) Cognitive impairment in sporadic cerebral small vessel disease: A systematic review and meta-analysis. Alzheimer's Dementia 17:665–685

- Pinter D, Enzinger C, Fazekas F (2015) Cerebral small vessel disease, cognitive reserve and cognitive dysfunction. J Neurol 262:2411–2419
- Kim MJ, Lee KM, Son YD, Jeon HA, Kim YB, Cho ZH (2012) Increased basal forebrain metabolism in mild cognitive impairment: an evidence for brain reserve in incipient dementia. J Alzheimer's Dis JAD 32:927–938
- Nicolas B, Alessandra D, Daniela P, Osman R, Sara T, Giovanni BF, Valentina G (2020) Basal forebrain metabolism in Alzheimer's disease continuum: relationship with education. Neurobiol Aging 87:70–77