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Association between methylation of *BIN1* promoter in peripheral blood and preclinical Alzheimer's disease

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Abstract

The bridging integrator 1 (*BIN1*) gene is the second most important susceptibility gene for late-onset Alzheimer's disease (LOAD) after apolipoprotein E (*APOE*) gene. To explore whether the *BIN1* methylation in peripheral blood changed in the early stage of LOAD, we included 814 participants (484 cognitively normal participants [CN] and 330 participants with subjective cognitive decline [SCD]) from the Chinese Alzheimer's Biomarker and LifestylE (CABLE) database. Then we tested associations of methylation of *BIN1* promoter in peripheral blood with the susceptibility for preclinical AD or early changes of cerebrospinal fluid (CSF) AD-related biomarkers. Results showed that SCD participants with significant AD biological characteristics had lower methylation levels of *BIN1* promoter, even after correcting for covariates. Hypomethylation of *BIN1* promoter were associated with decreased CSF Aβ42 (p = 0.0008), as well as increased p-tau/Aβ42 (p = 0.0001) and t-tau/Aβ42 (p < 0.0001) in total participants. Subgroup analysis showed that the above associations only remained in the SCD subgroup. In addition, hypomethylation of *BIN1* promoter was also accompanied by increased CSF p-tau (p = 0.0028) and t-tau (p = 0.0130) in the SCD subgroup, which was independent of CSF Aβ42. Finally, above associations were still significant after correcting single nucleotide polymorphic sites (SNPs) and interaction of *APOE* ε4 status. Our study is the first to find a robust association between hypomethylation of *BIN1* in AD, and may contribute to the discovery of new therapeutic targets for AD.

Introduction

Alzheimer's disease (AD) is a complex, multifactorial neurodegenerative disease and is considered highly heritable¹. Initial studies have identified some classical susceptibility genes, including amyloid precursor protein (*APP*), presenilin genes 1 and 2 (*PSEN1, PSEN2*) for early-onset AD (EOAD), and apolipoprotein E (*APOE*) for lateonset AD (LOAD). Subsequent genome-wide association studies identified a major susceptibility locus for LOAD

on the bridging integrator 1 (*BIN1*) gene^{2–4}, which was located on chromosome 2q14.3 and was currently identified as the second most important susceptibility gene in LOAD after *APOE*⁵. This association between genetic mutations in *BIN1* and AD susceptibility was also verified by our previous study on a large Han Chinese cohort⁶. As an important AD candidate gene, *BIN1* is widely expressed in many tissues and overexpressed *BIN1* has been observed in AD brains. Cellular, animal, and human studies have confirmed that BIN1 proteins have complex interactions with the pathological changes of AD^{7-13} . However, genetic mutations alone do not seem to fully explain the abnormal expression of *BIN1* in patients with AD. Therefore, researchers have focused on epigenetic mechanisms.

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The DNA methylation, as an important form of epigenetic mechanisms, has been suggested to be an important factor in the pathogenesis of AD^{14} . Two large independent autopsy studies showed that there were methylation changes in the *BIN1* of the AD patient's brain, accompanied by high expression of *BIN1*^{15,16}. However, whether the *BIN1* methylation changes were also present in peripheral blood and whether they were associated with early pathology in LOAD patients were still unknown. In addition, our previous study has found that the expression of BIN1 protein in peripheral blood was significantly increased in LOAD patients and was negatively associated with the cognitive level¹⁷, which also aroused our interest in exploring the methylation status of *BIN1* in peripheral blood.

Recently, with the discovery of many biomarkers and the establishment of 2018 National Institute on Aging and Alzheimer's Association (NIAA) research framework, studies of AD were more focused on the earlier stages, for example, the preclinical stage which was more important for the early prevention and intervention¹⁸. Subjective cognitive decline (SCD) in individuals without objective cognitive impairment has been suggested to be the first symptomatic expression of preclinical AD^{19,20}. Therefore, based on a large population without objective cognitive impairment, consisting of completely cognitively normal (CN) and SCD individuals, this study aimed to explore associations of methylation of BIN1 promoter in peripheral blood with the susceptibility for preclinical AD or early changes of cerebrospinal fluid (CSF) AD-related biomarkers. This may help to discover new pathogenic mechanisms or therapeutic targets for AD.

Methods

CABLE study

All participants without objective cognitive impairment in our study came from the Chinese Alzheimer's Biomarker and LifestylE (CABLE) database. The CABLE database is an ongoing large independent cohort study initiated in 2017. It aimed to determine the genetic and environmental modifiers of AD biomarkers and their utility in early diagnosis in the northern Chinese Han population^{21,22}. All participants in CABLE were enrolled at Qingdao Municipal Hospital, Shandong Province, China. The exclusion criteria include: (1) central nervous system infection, head trauma, neurodegenerative diseases other than AD (e.g., epilepsy, Parkinson's Disease), or other major neurological disorders; (2) major psychological disorders; (3) severe systemic diseases (e.g., malignant tumors) that may affect CSF or blood levels of AD biomarkers including A β and tau; (4) family history of genetic diseases. All participants underwent clinical and neuropsychological assessments, biochemical tests, as well as blood and CSF sample collection. Comprehensive questionnaire, electronic medical record system, and a laboratory inspection management system were used to collect demographic information, AD risk factor profile, and medical history. Participants were aged between 40 and 90 years and consisted of individuals without objective cognitive impairment and individuals with MCI or AD. Each participant underwent comprehensive clinical, neuropsychological, psychosocial, and psychiatric evaluations to determine their cognitive diagnoses in compliance with the National Institute on Aging-Alzheimer's Association (NIA-AA) workgroup diagnostic criteria^{23–25}. Cognitive state of participants was tested using the China Modified Mini-Mental State Examination (CM-MMSE) and Montreal Cognitive Assessment (MoCA). Basic living ability was assessed by basic Activities of Daily Living score (ADL). Behavioral or psychological symptoms were assessed by Geriatric Depression Scale (GDS), Hamilton Rating Scale for Depression (HAMD), and Hamilton Rating Scale for Anxiety (HAMA). Vascular factors were assessed by Hachinski Inchemic Score (HIS).

The CABLE database was conducted in accordance with the Helsinki declaration, and the research program was approved by the Institutional Ethics Committee of Qingdao Municipal Hospital. Each participant signed an informed consent form.

Study participants

This study included 814 participants who failed to meet the criteria of MCI and AD and were not been detected with objective cognitive impairment. The cognitive state of participants was tested by the CM-MMSE and MoCA. All participants had complete information including age, gender, years of education, CM-MMSE, APOE £4 status, methylation levels of BIN1 promoter, and levels of CSF AD core biomarkers including amyloid- β 42 (A β 42), total tau protein (t-tau), and phosphorylated tau protein (ptau). The peripheral blood cell counts of each participant were also collected (neutrophile granulocyte, lymphocyte, monocyte, eosinophilic granulocyte, and basophilic granulocyte). The SCD was assessed by a Subjective Cognitive Decline Scale (SCDS) which was designed based on SCD-I recommendations^{19,20}. We distinguished participants with SCD accompanied by particular concerns (worries) from those without objective cognitive impairment by the first section of SCDS which included a dichotomous question. Finally, we got 484 CN and 330 SCD participants. Detailed quality control information was shown in additional file 1 and the following sections.

CSF sample collection and measurements

Fasting CSF samples was drawn through a standard operational process of lumbar puncture and processed within two hours after collection. Each specimen was centrifuged at $2000 \times g$ for 10 min, and stored in an

enzyme-free EP (Eppendorf) tube at -80 °C until subsequent assays. The thaw/freezing cycle did not exceed two times. CSF Aβ42, p-tau, and t-tau were determined with the ELISA kit (Innotest β-AMYLOID (1-42), hTAU-Ag, and PHOSPHO-TAU (181p); Fujirebio, Ghent, Belgium). The standards and CSF specimens were analyzed in duplicates, and the means values of the duplicates were used for subsequent statistical analyses. The inter-batch coefficient of variation (CV) was <20% (mean CV: 5.4% for Aβ42, 2.4% for p-tau, and 4.9% for t-tau). The intra-batch CV was <5% (mean CV: 4.5% for A β 42, and 2.5% for ptau, 4.4% for t-tau). All analyses were operated by professional experimenters who were blind to clinical information. Additional file 2 showed that CSF AB42 levels were reduced in APOE £4 carriers and in older people. These results were consistent with those from previous studies²⁶. In addition, there was no difference in interbatch CV between CN and SCD subgroups (Additional file 1D-F).

Based on previous amyloid imaging^{26,27} and neuropathological studies^{28–31}, approximately one-third of older adults without objective cognitive impairment had AD pathology in their brains. Therefore, in this study, CSF biomarker positive participants were defined as having CSF Aβ42 levels in the lower one-third of the distribution of participants (A+: \leq 120.71 pg/mL) or having p-tau (T+: \geq 39.15 pg/mL) or t-tau (*N*+: \geq 184.19 pg/mL) levels in the upper one-third of the distribution. This method for establishing cut-offs was also used in previous studies, yielding reasonable results^{22,32}.

Blood sample collection and measurement

Blood samples of all the participants were drawn after at least a 12-h fasting period. QIAamp[®] DNA Blood Mini Kit (250) was used to extract DNA from blood samples. And the extracted DNA was separated and stored in an enzyme free EP tube at -80 °C until *APOE* genotyping was completed in this study. Two specific loci (rs7412 and rs429358) of *APOE* were genotyped using the SNaPshot SNP assay. The peripheral blood cell composition was measured at the central laboratory of the Qingdao Municipal Hospital by an automated analytical platform (Sysmex XN-2800, Japan).

The DNA methylation levels assay

The DNA methylation levels of CpG sites were determined by MethylTarget sequencing (Genesky Biotechnologies Inc., Shanghai, China), a method using nextgeneration sequencing-based multiple targeted CpG methylation analysis^{33,34}. Primer design and validation were performed by Methylation Primer software on bisulfate-converted DNA. Six regions (BIN1_01–06) from CpG islands of *BIN1* gene were selected and sequenced (see additional file 3). Primer sets were designed to flank each targeted CpG site in 100–300 nucleotide regions. Genomic DNA was extracted from frozen samples using Genomic Tip-500 columns (Qiangen, Valencia, CA, USA) and bisulfate-converted using the EZ DNA MethylationTM-GOLD Kit (Zymo Research, CA, USA) according to the manufacturer's protocols. After PCR amplification (Hot-StarTaq polymerase kit, TAKARA, Tokyo, Japan) and library construction, samples were sequenced (Illumina HiSeq Benchtop Sequencer, CA, USA) using the paired-end sequencing protocol according to the manufacturer's guidelines³⁵. All analyses were operated by professional experimenters who were blind to clinical information.

In each sample, the percentage of sequences whose sequencing quality reaches Q30 value was higher than 90%. After calling methylation, we obtained the bisulfate conversion rate for each sample, and the samples with bisulfate conversion rate <99% were filtered out. After calculating the average coverage as well as the missing rate for each sample, the samples with average coverage <30-flod and/or with missing rate >0.01 were further filtered out. In our study, there was no difference in bisulfate conversion rate or sequence quality between CN and SCD subgroups (Additional file 1 B, C).

Statistical analysis

The data were shown in the form of mean ± SD (standard deviation) or proportions of them. The outlier values which are situated outside three SD were excluded prior to subsequent analyses. The Shapiro-Wilk test was used to test normality for continuous variables. Mann-Whitney U test (for continuous variables) or Chisquare test (for categorical variables) were used for the comparison between groups. Pearson's correlation coefficients were used to test the correlation between methylation levels of BIN1 promoter and age. The area under the receiver operating characteristic curve (AUROC) was used to test the discriminatory efficacy of methylation levels. The methylation level of BIN1 promoter was standardized by z-scale in logistic regression model to test its associations with preclinical AD susceptibility. All CSF variables were log10-transformed to ensure normality of data and were standardized by z-scale for comparison. Multiple linear regression models were used to test the associations between methylation levels of BIN1 promoter and CSF biomarkers. All regression analyses were adjusted for age, gender, education, APOE ε4 status, and quality control variables including CV for CSF Aβ42, p-tau, and t-tau. Moreover, the interaction between APOE £4 status and methylation levels were additionally added into multiple linear regression models when explored the influences of APOE £4 status. The multicollinearity was assessed using tolerance, variance inflation factor (VIF), and Pearson's correlation coefficients. No multicollinearity existed in each model of current study. Bonferroni correction was used for multiple comparisons. Statistical analyses were conducted using R, version 3.5.1. A two-tailed p < 0.05 was considered significant.

Results

Characteristics of participants

The participants' characteristics were presented in Table 1. After strict quality control we analyzed data from 814 participants of the CABLE cohort, including 484 CN and 330 SCD participants. The average age of participants was 61.47 years; the average level of education was 9.91 years, 331 (40.66%) participants were female; and 122 (14.99%) participants were *APOE* ε 4 carriers. No significant difference was found in gender distribution or level of education between two subgroups (p > 0.05). In comparison with CN subgroup, the SCD participants were older (p < 0.0001). As predicted, frequency of positive *APOE* ε 4 status showed an increasing trend in SCD subgroup (CN: 13.84%, SCD: 16.67%), although not statistically significant.

As for cognitive levels, we did not find significant cognitive difference between CN and SCD subgroups (CM-MMSE: p = 0.2533). As for CSF biomarkers, SCD subgroup had lower levels of A β 42 (p = 0.0004) and higher levels of p-tau/A β 42 (p < 0.0001) and t-tau/A β 42 (p < 0.0001) compared with CN subgroup. No significant difference was found in levels of CSF p-tau (p = 0.1727) and t-tau (p = 0.0710) between two subgroups.

In addition, there was no significant difference in methylation level of *BIN1* promoter between different

genders (p = 0.0741) and different *APOE* ϵ 4 status (p = 0.2891), and no correlation was found between methylation levels of *BIN1* promoter and age (p = 0.4445).

Methylation levels of *BIN1* promoter in different diagnostic groups

In a clinical diagnostic construct (Fig. 1A), SCD subgroup showed significantly lower methylation levels of *BIN1* promoter compared with CN subgroup ($p = 8.47 \times$ 10^{-6}). In an ATN biological construct, the A+ subgroup had significantly lower methylation levels of BIN1 promoter than the A- subgroup (p = 0.0060) (Fig. 1D-F). Then, according to the pathological changes in the ATN framework, we resulted three different biomarker group combinations including stage 0, stage 1, stage 2 (Fig. 1B). Specifically, participants with three negative CSF biomarkers (A-T-N-) were classified as the stage 0 subgroup. Participants with positive A β 42 as well as negative p-tau and t-tau (A+T-N-) were classified as the stage 1 subgroup. Participants with positive A β 42 as well as positive p-tau or t-tau (A+T+N-, A+T-N+, A+T+N+) were classified as the stage 2 subgroup. The methylation levels of BIN1 promoter showed a gradually decreasing trend from stage 0 to stage 2. The stage 2 subgroup had significantly lower methylation levels than the stage 0 subgroup (p = 0.0079). Furthermore, in a diagnostic structure combining clinical diagnosis and biomarkers (Fig. 1C), SCD participants with A+(SCD+) had much lower methylation levels of BIN1 promoter than CN participants without significant AB42 pathological changes (CN–) (*p* < 0.0001).

Variable	CN	SCD	Total	p
N	484	330	814	_
Age (year) mean (SD)	60.01 (10.47)	64.08 (9.88)	61.47 (10.06)	<0.0001#
Gender (Female/Male)	185/299	146/184	331/483	0.1002 [£]
Education (year) mean (SD)	9.96 (4.43)	9.84 (4.38)	9.91 (4.41)	0.7892#
APOE E4 carriers N (+/-, +/+)	67 (66, 1)	55 (50, 5)	122 (116, 6)	0.3134 [£]
CM-MMSE mean (SD)	27.85 (2.36)	27.78 (2.21)	27.82 (2.29)	0.2533 [#]
CSF Aβ42 (pg/mL) mean (SD)	195.79 (128.60)	168.19 (94.06)	184.60 (116.58)	0.0004#
CSF p-tau (pg/mL) mean (SD)	37.02 (9.74)	38.44 (11.12)	37.59 (10.34)	0.1727#
CSF t-tau (pg/mL) mean (SD)	172.40 (79.36)	187.34 (103.06)	178.46 (89.96)	0.0710#
CSF p-tau/Aβ42 mean (SD)	0.23 (0.10)	0.27 (0.12)	0.25 (0.11)	<0.0001#
CSF t-tau/Aβ42 mean (SD)	1.06 (0.63)	1.31 (0.92)	1.16 (0.77)	<0.0001 [#]

Table 1 Characteristics of participants from CABLE database.

CN cognitively normal participants, *SCD* participants with subjective cognitive decline, *APOE* apolipoprotein E gene, *CSF* cerebrospinal fluid, *Aβ* amyloid-β, *p-tau* phosphorylated tau protein, *t-tau* total tau protein, *CM-MMSE* China-Modified Mini-Mental State Examination, *SD* standard deviation. Bold indicated that the results were statistically significant.

[#]Intergroup comparisons were tested by Mann–Whitney U test.

[£]Intergroup comparisons were tested by Chisquare test.

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Fig. 1 Methylation levels of *BIN1* **promoter in different diagnostic groups. A** Methylation levels of *BIN1* promoter in a clinical diagnostic construct. CN (N = 484): cognitively normal individuals; SCD (N = 330): individuals with subjective cognitive decline; **B** methylation levels of *BIN1* promoter in an ATN biological construct. Stage 0: A-T-N- (N = 290), Stage 1: A+T-N- (N = 189), Stage 2: A+T+N- (N = 12), A+T-N+ (N = 18), A+T+N+ (N = 54); **C** methylation levels of *BIN1* promoter in a diagnostic structure combining clinical diagnosis and biomarkers. CN- (N = 343): cognitively normal individuals with negative CSF A β 42 [A-]; CN+(N = 141): cognitively normal individuals with positive CSF A β 42 [A-]; SCD- (N = 194): individuals with subjective cognitive decline and negative CSF A β 42 [A-]; SCD+ (N = 136): individuals with subjective cognitive decline and positive CSF A β 42 [A-]; CD+ (N = 136): individuals with subjective cognitive decline and positive CSF A β 42 [A-]; D-F Methylation levels of *BIN1* promoter in A or T or N construct, respectively. **G**-L Methylation levels of different regions on *BIN1* promoter. BIN1 bridging integrator 1 gene promoter. All integroup comparisons were tested by Kruskall–Wallis test and Wilcoxon test.



Further analysis of different *BIN1* promoter regions showed that the above differential methylation levels between CN and SCD subgroups only existed in the BIN1_01 region ($p = 1.63 \times 10^{-5}$), but not in other regions (BIN1_02-06) (Fig. 1G–L). In support of this result, some nearby differential methylation CpG sites were found in BIN1_01 region (Additional file 4).

The above analyses found differential methylation levels of *BIN1* promoter between different diagnostic groups. However, we could also see that these methylation levels in different diagnostic groups showed a high degree of overlap, which indicated a low discriminatory efficacy (AUROC [CN vs. SCD]: 0.5918; AUROC [CN– vs. SCD+]: 0.6448) (Additional file 5).

The results of logistic regression analysis

Then, after adjusting for age, gender, education, and *APOE*ε4 status, we further tested the associations between methylation levels of *BIN1* promoter and preclinical AD susceptibility in logistic regression models. Results still showed that lower methylation levels of *BIN1* promoter were associated with SCD or SCD+ (p < 0.05) (Fig. 2).

Associations between methylation levels of *BIN1* promoter and CSF AD core biomarkers in total participants

Table 2 shows the results on associations between methylation levels of *BIN1* promoter and CSF AD core biomarkers in total participants. Lower methylation levels of *BIN1* promoter were significantly associated with decreased levels of CSF A β 42 (β = 20.1268, p = 0.0008) as well as increased levels of CSF p-tau/A β 42 (β = -23.8708, p = 0.0001) and t-tau/A β 42 (β = -24.5219, p < 0.0001). No association of methylation levels was found with t-tau or p-tau.

As for different regions on *BIN1* promoter, the above associations only existed in the BIN1_01 region but not other five regions (BIN1_02–06) (Additional file 6).

Associations between methylation levels of *BIN1* promoter and CSF AD core biomarkers in different diagnostic subgroups

In the subgroup analysis of different diagnostic groups, those associations between methylation levels of *BIN1* promoter and A β -related biomarkers still remained significant in SCD subgroup (A β 42, *p* = 0.0006; p-tau/A β 42,

Variable	Total		CN		SCD	
	β	p	β	p	β	p
BIN1						
CSF Aβ42	20.1268	0.0008	9.5133	0.2527	30.1634	0.0006
CSF p-tau	-6.6890	0.2600	12.8908	0.1118	-26.9626	0.0028
CSF t-tau	-8.5145	0.1446	5.6175	0.4820	-22.1300	0.0130
CSF p-tau/Aβ42	-23.8708	0.0001	-4.4539	0.5910	-43.3853	<0.0001
CSF t-tau/Aβ42	-24.5219	<0.0001	-4.2688	0.6043	-41.8846	<0.0001
BIN1_01						
CSF Aβ42	2.2962	0.0006	1.1389	0.2169	3.4004	0.0005
CSF p-tau	-0.8155	0.2190	1.3984	0.1200	-3.1768	0.0017
CSF t-tau	-0.9745	0.1347	0.6449	0.4669	-2.5874	0.0096
CSF p-tau/Aβ42	-2.7395	<0.0001	-0.5862	0.5237	-4.9754	<0.0001
CSF t-tau/Aβ42	-2.7966	<0.0001	-0.5222	0.5676	-4.8110	<0.0001

 Table 2
 Associations between methylation levels of BIN1 promoter and CSF biomarkers in total and different diagnostic subgroups.

Bold indicated that the results were statistically significant.

Multiple linear regression models were used to test the associations between methylation levels of BIN1 promoter and CSF biomarkers, adjusting for age, gender, education, and APOE ɛ4 status.

CN cognitively normal participants, *SCD* participants with subjective cognitive decline, *CSF* cerebrospinal fluid, *Aβ* amyloid-*β*, *p*-tau phosphorylated tau protein, *t*-tau total tau protein, *BIN1* bridging integrator 1 gene promoter, *BIN1_01* 01 region of bridging integrator 1 gene promoter.

p < 0.0001; t-tau/A β 42, p < 0.0001) but not in CN subgroup. In addition, lower methylation levels of *BIN1* promoter were also associated with increased CSF p-tau ($\beta = -26.9626$, p = 0.0028) and t-tau ($\beta = -22.1300$, p =0.0130) in SCD subgroup, while these associations were not found in CN subgroup (Table 2).

Similarly, as for different regions on *BIN1* promoter, these associations found in the SCD subgroup only existed in the BIN1_01 region (Table 2, Fig. 3A–J) but not in other five regions (BIN1_02–06) (Additional file 6). In addition, on BIN1_01 region, methylation levels of some nearby CpG sites, which have been found to be associated with the preclinical AD susceptibility in above analyses, were also found to be associated with CSF AD core biomarkers. Those associations were much more significant in SCD subgroup (Fig. 3K).

Mediation analyses

Furthermore, we explored the potential mediation role of CSF A β 42 in the associations between methylation levels of *BIN1* promoter and tau-related biomarkers (CSF p-tau or t-tau) in SCD subgroup. To do so, we repeated the analysis of tau-related biomarkers by further controlling for CSF A β 42 changes. Results showed that those methylation associations with tau-related biomarkers remained significant after controlling for A β 42 (p < 0.05).

Influences of genetic factors on associations between methylation levels of *BIN1* promoter and preclinical AD susceptibility or pathological changes

To clarify the influence of *APOE* gene on the above associations, we performed two analyses. Firstly, we added the interaction between APOE £4 status and methylation levels into multiple linear regression models. Results showed that methylation levels of BIN1 promoter were still significantly associated with CSF A β 42, p-tau/A β 42, and t-tau/A β 42 in these models. Though the interaction (BIN1×APOE) was not significantly associated with the changes of CSF Aβ42, ttau, and t-tau/A β 42 (p > 0.01), it had moderate influences on the level of CSF p-tau (p = 0.0195) and p-tau/ A β 42 (p = 0.0857) (Table 3). Secondly, the subgroup analysis of APOE ɛ4 status showed that associations of methylation levels with CSF Aβ42, p-tau/Aβ42, and ttau/A β 42 were significant for both APOE ϵ 4 carriers and non-carriers (Fig. 4). Interestingly, as shown in Fig. 4, the effects of methylation levels on these three CSF biomarkers (Aβ42, p-tau/Aβ42, t-tau/Aβ42) seemed to be more obvious in APOE ɛ4 carriers, though these differences did not reach statistical significance in above interaction analysis probably because of the limited number of APOE ɛ4 carriers. Moreover, a negative association of methylation levels with CSF p-tau was found only in the APOE ɛ4 carriers but not non-carriers.



tau protein, t-tau total tau protein, BIN1_01 the 01 region of bridging integrator 1 gene promoter. **A–J** Methylation levels of BIN_01 region on *BIN1* promoter were associated with CSF AD biomarkers in SCD subgroup, but not in CN subgroup. **K** Methylation levels of some nearby CpG sites on BIN1_01 region were associated with CSF AD biomarkers in SCD subgroup, but not in CN subgroup. Multiple linear regression models were used to examine the associations between methylation levels of *BIN1* promoter and CSF biomarkers, adjusting for age, gender, education and *APOE* ε4 status.

In addition to the *APOE* gene, some single nucleotide polymorphic sites (SNPs) in *BIN1* promoter may also affect the above associations. Therefore, we screened out two SNPs whose minor allele frequency was higher than 0.05 (rs58402148: 0.13; rs17014923: 0.10). Though we did not find their associations with preclinical AD susceptibility and CSF AD core biomarkers (p > 0.05), they showed significant associations with methylation levels of *BIN1* promoter (p < 0.0001) (Additional file 7). Then we added those two SNPs into regression models. Results showed that the associations of methylation levels of *BIN1* promoter with preclinical AD susceptibility (CN vs. SCD: p = 0.0002; CN- vs. SCD+: p < 0.0001) or CSF biomarkers changes (Table 4) remained significant.

Sensitivity analyses

Given that peripheral blood cell composition and storage time of samples might affect methylation differences between individuals, we further recalculated the above results after additionally adjusting peripheral blood cell composition (neutrophile granulocyte, lymphocyte, monocyte, eosinophilic granulocyte, and basophilic granulocyte) and storage time of samples. These results did not change significantly (Additional file 8).

Variable	Model1 (BIN1)				Model2 (BIN1_01)			
	BIN1		BIN1×APOE		BIN1_01		BIN1_01×APOE	
	β	p	β	p	β	p	β	p
CSF Aβ42	18.5643	0.0038	10.9614	0.5008	2.1285	0.0029	10.6084	0.5142
CSF p-tau	-1.2903	0.8391	-37.9497	0.0195	-0.2277	0.7479	-37.2680	0.0216
CSF t-tau	-5.7126	0.3614	-19.6861	0.2176	-0.6670	0.3394	-19.4800	0.2220
CSF p-tau/Aβ42	-19.8966	0.0018	-27.8422	0.0857	-2.3084	0.0011	-27.2482	0.0921
CSF t-tau/Aβ42	-20.9574	0.0009	-24.9688	0.1202	-2.4083	0.0006	-24.5243	0.1265

Table 3 Associations between methylation levels of *BIN1* promoter and CSF biomarkers after adjusting interactions between methylation and *APOE* ε4 status.

Bold indicated that the results were statistically significant.

Multiple linear regression models were used to test the associations between methylation levels of BIN1 promoter and CSF biomarkers, adjusting for age, gender, education, APOE ɛ4 status, and interaction between methylation and APOE ɛ4 status.

CSF cerebrospinal fluid, Aβ amyloid-β, p-tau phosphorylated tau protein, t-tau total tau protein, APOE apolipoprotein E gene, BIN1 bridging integrator 1 gene promoter, BIN1_01 01 region of bridging integrator 1 gene promoter.

Discussion

This study was the first to systematically explore the associations of methylation of *BIN1* promoter in peripheral blood with preclinical AD susceptibility and early pathological changes of CSF AD core biomarkers in a large cohort of participants without objective cognitive impairment. The main finding of our study was that hypomethylation of *BIN1* promoter might increase the risk of preclinical AD and be associated with more severe pathological changes of CSF AD core biomarkers in elderly adults without objective cognitive impairment. This finding was novel and potentially important. It provided new evidence for the involvement of *BIN1* gene in the pathogenesis of AD, suggesting *BIN1* may be a new therapeutic target for the treatment of AD.

Firstly, consistent with previous studies^{36,37}, our analysis of the participant characteristics showed that though the SCD participants in our study did not have an objective cognitive impairment, they had obvious changes in CSF AD core biomarkers (especially A β -related biomarkers). These results suggested that, in our study, SCD participants had preclinical AD characteristics²⁰.

Then we found that SCD participants, especially the SCD participants with obvious A β -related pathologic changes, had lower methylation levels of *BIN1* promoter compared with controls, which indicated that hypomethylation of *BIN1* promoter might increase the risk of preclinical AD. Consistent with our results, a recent study of differential methylation in peripheral blood between cognitively normal people and patients with AD or MCI found some differentially methylated loci near *BIN1* gene³⁸. Moreover, two large independent autopsy studies on human brain tissues, published separately in the *Nature Neuroscience* and *JAMA Neurology*, found that

methylation in *BIN1* gene was associated with pathologic diagnosis of AD, even in individuals without objective cognitive impairment^{15,16}. Therefore, all these evidences in both human peripheral blood and brain tissues showed that methylation in *BIN1* gene was associated with the susceptibility of preclinical AD.

Generally speaking, altered DNA methylation (especially in promoters) may lead to changes in gene expression. In fact, as for human brain tissue, both *BIN1* mRNA^{15,16,39,40} and protein^{40,41} levels were altered in AD patients. As for human peripheral blood, our previous study in a northern Han Chinese population observed a marked increase in *BIN1* mRNA and protein levels in AD patients, as well as a strong negative association between BIN1 protein levels and cognitive level¹⁷. Overall, both brain and peripheral blood evidences suggested that the expression of the *BIN1* gene changed, indirectly supporting hypothesis that altered methylation of *BIN1* may contribute to the occurrence and development of AD by regulating the expression of RNA or protein.

To further clarify the association between the methylation status of *BIN1* promoter in peripheral blood and preclinical AD, the associations between methylation of *BIN1* promoter and early pathological changes were explored in participants, especially in SCD individuals. We found that hypomethylation of *BIN1* promoter was associated with early pathological changes in preclinical AD, which is consistent with previous studies on brain tissue showing that methylation at some CpG sites in *BIN1* was associated with A β load and tau tangle density^{15,16}. In addition, studies on the interaction between BIN1 protein and AD pathology also supported the involvement of *BIN1* in early pathological changes of AD. Specifically, as for A β -related pathology, BIN1 protein



education.

was thought to be involved in endocytosis, which could serve as a pathway that leads to APP production and release^{7,8}. Super-resolution microscopy and immunogold electron microscopy analyses highlighted the presence of BIN1 protein in proximity to amyloid fibrils at the edges of amyloid deposits, which revealed that the aberrant accumulation of BIN1 protein was a feature associated with AD amyloid pathology¹⁰. As for tau-related pathology, besides affecting the endocytosis of tau protein⁹, BIN1 protein can also directly bind to a prolinerich domain in tau by SH3 domain, suggesting that increased expression of BIN1 protein exacerbates taurelated pathology^{11,13}. Moreover, BIN1 protein was also directly involved in modulating tau-related actin dynamics¹². Overall, from the above studies, it was not difficult to see that BIN1 protein was involved in the pathological changes of AD and the mechanisms of its influences on A β and tau pathology were significantly different. Consistent with these differences in mechanisms, results in our study and previous brain tissue studies¹⁶ all showed that the associations between methylation status of *BIN1* and tau pathology was not completely dependent on A β pathology. In other words, these results suggested that methylation of *BIN1* might have independent effects on these two molecular processes.

Variable	Total		CN		SCD	
	β	p	β	p	β	p
BIN1						
CSF Aβ42	28.9148	0.0001	15.3313	0.1312	45.5261	<0.0001
CSF p-tau	-13.2467	0.0708	1.9133	0.8457	-29.2024	0.0103
CSF t-tau	-11.5700	0.1090	4.4243	0.6501	-27.7005	0.0143
CSF p-tau/Aβ42	-36.2108	<0.0001	-15.9422	0.1145	-59.0300	<0.0001
CSF t-tau/Aβ42	-34.9525	<0.0001	-11.6603	0.2461	-58.1587	<0.0001
BIN1_01						
CSF Aβ42	3.2062	0.0001	1.7765	0.1099	4.9218	0.0001
CSF p-tau	-1.5151	0.0600	0.2198	0.8382	-3.4143	0.0062
CSF t-tau	-1.2881	0.1050	0.5215	0.6250	-3.1605	0.0107
CSF p-tau/Aβ42	-4.0228	<0.0001	-1.8270	0.0983	-6.5380	<0.0001
CSF t-tau/Aβ42	-3.8733	<0.0001	-1.3162	0.2314	-6.4468	<0.0001

Table 4 Associations between methylation levels of BIN1 promoter and CSF biomarkers after adjusting SNPs.

Bold indicated that the results were statistically significant.

Multiple linear regression models were used to test the associations between methylation levels of BIN1 promoter and CSF biomarkers, adjusting for age, gender, education, APOE ε4 status and two SNPs (rs58402148; rs17014923).

CN cognitively normal participants, SCD participants with subjective cognitive decline, CSF cerebrospinal fluid, Aβ amyloid-β, p-tau phosphorylated tau protein, t-tau total tau protein, BIN1 bridging integrator 1 gene promoter, BIN1_01 01 region of bridging integrator 1 gene promoter.

From the above analyses, we have got significant associations of BIN1 promoter methylation status and susceptibility with preclinical AD or early pathological changes of CSF AD biomarkers. However, it was important to note that a variety of other genetic factors may affect or mediate those associations. For example, some SNPs in BIN1 have been reported to show replicable associations with the susceptibility $^{2-4}$ or biomarkers⁴² of LOAD in different independent populations, including a large northern Han Chinese population⁶. Therefore, we explored the influences of SNPs and APOE ε4 status (the primary risk gene of LOAD) on those associations. Results showed that those associations in peripheral blood were not entirely dependent on genetic factors. This independence was also seen in several previous studies on human brain tissue¹⁵. In addition, some studies have shown the presence of tissue or cell heterogeneities in the expression of BIN140,43. Such heterogeneities in expression also indirectly suggested the presence of epigenetic regulation rather than simple genetic mutations, due to the plasticity of the epigenome. However, it was worth noting that a modest effect of interaction between APOE ɛ4 status and methylation levels was also found in our study, especially for the CSF p-tau levels. These results indicated that APOE E4 status and methylation levels of BIN1 promoter might contribute to early pathological changes of AD independently or jointly.

This was the first study to systematically explore the associations between methylation status of *BIN1* promoter in peripheral blood and preclinical AD in a large Han Chinese population. However, there were still some potential limitations in our study. Firstly, this was a cross-sectional study and results still need to be tested in larger longitudinal cohorts. Secondly, associations between methylation status of *BIN1* promoter and expression of *BIN1* gene in peripheral blood still need to be further explored in the future.

In summary, our study was the first to find a robust association of hypomethylation of *BIN1* promoter in peripheral blood with preclinical AD. Though the underlying mechanisms were not entirely clear, these robust results still provide new evidence for the involvement of *BIN1* methylation in the occurrence and development of AD. It is worth noting that our results suggest that these influences of *BIN1* hypomethylation on AD pathology might occur at a very early stage, which is more important for early intervention and prevention of AD. Furthermore, because methylation is more plastic than gene mutation, future studies in this direction will be more likely to find feasible and effective therapeutic targets for AD.

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Author contributions

H.H., Lan Tan, Y.-L.B., and J.-T.Y. did the manuscript preparation and drafting. H.H., L. T., Y.-L.B., X.W., X.-N.S., X.-H.H., Y.-H.M., and J.-T.Y. did the clinical assessments and data acquisition. L.T. and J.-T.Y. did the clinical diagnosis. H.H., L.T., Y.-L.B., X.W., X.-N.S., X.-H.H., Y.-H.M., Q.D., and J.-T.Y. did the data analysis and interpretation. J.-T.Y. is responsible for the study conception and design. All authors have contributed to the manuscript revising and editing critically for important intellectual content and given final approval of the version and agreed to be accountable for all aspects of the work presented here.

Data availability

The datasets used and/or analysed during the current study are available from the corresponding author on reasonable request.

Conflict of interest

The authors declare that they have no conflict of interest.

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