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The *ADAMTS9* gene is associated with cognitive aging in the elderly in a Taiwanese population

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Abstract

Evidence indicates that the pathophysiologic mechanisms associated with insulin resistance may contribute to cognitive aging and Alzheimer's diseases. In this study, we hypothesize that single nucleotide polymorphisms (SNPs) within insulin resistance-associated genes, such as the ADAM metallopeptidase with thrombospondin type 1 motif 9 (ADAMTS9), glucokinase regulator (GCKR), and peroxisome proliferator activated receptor gamma (PPARG) genes, may be linked with cognitive aging independently and/or through complex interactions in an older Taiwanese population. A total of 547 Taiwanese subjects aged over 60 years from the Taiwan Biobank were analyzed. Mini-Mental State Examinations (MMSE) were administered to all subjects, and MMSE scores were used to measure cognitive functions. Our data showed that four SNPs (rs73832338, rs9985304, rs4317088, and rs9831846) in the ADAMTS9 gene were significantly associated with cognitive aging among the subjects (P = $1.5 \times 10^{-6} \sim 0.0002$). This association remained significant after performing Bonferroni correction. Additionally, we found that interactions between the ADAMTS9 rs9985304 and ADAMTS9 rs76346246 SNPs influenced cognitive aging (P < 0.001). However, variants in the GCKR and PPARG genes had no association with cognitive aging in our study. Our study indicates that the ADAMTS9 gene may contribute to susceptibility to cognitive aging independently as well as through SNP-SNP interactions.

Introduction

There is growing evidence that patients with type 2 diabetes (T2D) have an increased risk of developing Alzheimer's disease (AD), as reported in several epidemiologic studies [1, 2]. Furthermore, bioinformatics analysis based on genome wide association study (GWAS) data indicated that it is probable for T2D and AD to share similar genetic etiology and mechanisms [3,



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4]. Insulin resistance is known to be a precursor of T2D because insulin resistance can lead to T2D over time. Therefore, some physiological and pathogenic mechanisms that are associated with insulin resistance may also play a key role in AD [5–8]. Among the genes involved in the development of insulin resistance are the ADAM metallopeptidase with thrombospondin type 1 motif 9 (*ADAMTS9*), glucokinase regulator (*GCKR*), and peroxisome proliferator activated receptor gamma (*PPARG*) genes.

The *ADAMTS9* gene is located on chromosome 3p14.1 and encodes a member of a disintegrin and metalloproteinase with thrombospondin motifs (ADAMTS) protein family that has been implicated in the cleavage of proteoglycans, the control of organ shape during development, and the inhibition of angiogenesis. Boesgaard et al. reported an association of the T2D risk allele (C) of *ADAMTS9* rs4607103 with a decrease in the insulin sensitivity of peripheral tissues [9]. A subsequent study by Trombetta *et al.* indicated that the *ADAMTS9* rs4607103 SNP may contribute to susceptibility to insulin resistance in Italian subjects [10]. The ADAMTS-9 protein encoded by the *ADAMTS9* gene, a member of the ADAMTS protein family, may also play a key role in the physiological and pathological mechanisms of central nervous system disorders involving neuroinflammation in the lesion core and neuroplasticity in surrounding tissues, such as ischemic stroke and spinal cord injury [11–13].

The *GCKR* gene, located on chromosome 2p23.3, encodes a regulatory protein that belongs to the sugar isomerase protein family and inhibits glucokinase in liver and pancreatic islet cells [14]. It has been observed that the glucokinase regulatory protein encoded by the *GCKR* gene is present in adult rat and human brains, including in the ventromedial and arcuate nuclei of the hypothalamus, suggesting its participation in glucose sensing in the central nervous system [15, 16]. Additionally, the *GCKR rs780094* SNP has been linked to predisposition to insulin resistance in Danish [14] and Japanese [17] populations. It has also been suggested that the *GCKR* nt 11216 polymorphism is involved in increased insulin secretion [18].

The *PPARG* gene is located on chromosome 3p25.2 and encodes the peroxisome proliferator activated receptor (PPAR) gamma protein, which functions in adipocyte differentiation and glucose homeostasis [19, 20]. In several studies, the *PPARG* rs1801282 SNP was identified to be associated with insulin sensitivity [21–23] and cognitive impairment [24]. It has also been demonstrated that variants (including rs2972164, rs11128598, rs17793951, rs1151996, rs1175541, and rs3856806) in the *PPARG* gene were likely to influence insulin sensitivity in a Mexican population [25]. Moreover, it has been observed that PPAR gamma agonists generated short-term favorable effects in patients with early AD and mild cognitive impairment, because they might regulate in-vitro processing of the amyloid precursor protein, which plays a central role in the pathophysiology of AD [26].

Based on the aforementioned considerations, it was speculated that insulin resistance and its relevant genes may play a key role in the development of cognitive aging. Thus, we hypothesized that insulin resistance-associated genes, namely the *ADAMTS9*, *GCKR*, and *PPARG* genes, may be linked with cognitive aging. To our knowledge, the influence of these genes on cognitive aging is sparse in terms of human data. Therefore, we conducted an association study to weigh the relationships between susceptibility to cognitive aging and SNPs within the *ADAMTS9*, *GCKR*, and *PPARG* genes. We also assessed the potential SNP-SNP effects of these associations on cognitive aging.

Materials and methods

Study population

This study incorporated Taiwanese subjects from the Taiwan Biobank, which gathered information and specimens from participants in recruitment centers across Taiwan [27–30]. The study cohort consisted of 547 participants. Inclusion criteria were individuals who were aged 60 years or over and self-reported as being of Taiwanese Han Chinese ancestry [29]. Participants with a history of cancer were excluded [29]. In addition, we excluded participants with T2D because the investigated genes have been related to T2D [9, 17, 25]. Ethical approval for the study was granted by the Institutional Review Board of the Taiwan Biobank before conducting the study (approval number: 201506095RINC). Each subject signed the approved informed consent form. All experiments were performed in accordance with relevant guidelines and regulations. Education was defined based on whether or not high school was attended.

Cognitive assessment

Global cognitive assessment was performed using the 30-point Mini-Mental State Examination (MMSE), which includes questions based on the five domains of orientation, registration, attention and calculation, recall, and language. We analyzed MMSE as a continuous outcome, as well as according to categories based on previously defined MMSE thresholds [31]: MMSE score ≥ 24 (normal) and MMSE score < 24 (cognitive impairment).

Genotyping

DNA was isolated from blood samples using a QIAamp DNA blood kit following the manufacturer's instructions (Qiagen, Valencia, CA, USA). The quality of the isolated genomic DNA was evaluated using agarose gel electrophoresis, and the quantity was determined by spectrophotometry [32, 33]. SNP genotyping was carried out using the custom Taiwan BioBank chips and run on the Axiom Genome-Wide Array Plate System (Affymetrix, Santa Clara, CA, USA). The SNP panel covered 141 SNPs from the following three genes, namely the *ADAMTS9*, *GCKR*, and *PPARG* genes (S1 Table). Eleven SNPs were excluded from further analyses due to failure to achieve Hardy-Weinberg equilibrium (P < 0.05) or due to a genotyping call rate < 0.95. The genotyping results, including minor allele frequencies, P values for Hardy-Weinberg equilibrium, and genotyping call rates are shown in S1 Table. Additionally, tag SNPs were identified by PLINK [34] with a linkage disequilibrium (LD) value of $r^2 = 0.8$ as a threshold.

Statistical analysis

In this study, we weighed the association of the investigated SNP with MMSE scores by a general linear model using age, gender, and education as covariates [35]. The genotype frequencies were assessed for Hardy-Weinberg equilibrium using a χ^2 goodness-of-fit test with 1 degree of freedom (i.e. the number of genotypes minus the number of alleles). Multiple testing was adjusted for by using the Bonferroni correction. The criterion for significance was set at P < 0.05 for all tests. Data are presented as the mean ± standard deviation.

To investigate SNP-SNP interactions, we leveraged the generalized multifactor dimensionality reduction (GMDR) method [36]. We tested two-way up to three-way interactions using 10-fold cross-validation. The GMDR software provided some output parameters, including the testing accuracy and empirical P values, to assess each selected interaction. Moreover, we provided age, gender, and education as covariates for SNP-SNP interaction models in our interaction analyses. Permutation testing obtained empirical P values of prediction accuracy as a benchmark based on 1,000 shuffles.

Results

Table 1 describes the demographic and clinical characteristics of the study population, which included 547 subjects. The median MMSE score was 27 and the interquartile range was 25–29.

Characteristic	Overall
No. of subjects, n	547
Mean age ± SD, years	64.1±3.0
Female, %	50.63
Less than high school graduate, n	214
MMSE score, median (IQR)	27 (25–29)
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Table 1. Demographic and clinical characteristics of Taiwanese study subjects.

IQR = interquartile range, MMSE = Mini-Mental State Examination, SD = standard deviation. Data are presented as mean ± standard deviation.

All participants self-reported as being of Taiwanese Han Chinese ancestry.

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First, we investigated the association between cognitive aging and three insulin resistancerelated genes, namely the *ADAMTS9*, *GCKR*, and *PPARG* genes. Based on LD, we filtered SNPs and selected 96 tag SNPs (S2 Table). Among the 96 tag SNPs assessed in this study (S3 Table), there were 16 tag SNPs in the *ADAMTS9* and *PPARG* genes showing evidence of association (P < 0.05) with MMSE scores (Table 2).

Furthermore, as shown in Table 2, the association with MMSE scores persisted with significance after applying Bonferroni correction (P < 0.05/96 = 0.0005) for four key SNPs in the *ADAMTS9* gene: rs73832338 (dominant model: P = 0.0002), rs9985304 (additive model: $P = 1.4 \times 10^{-5}$; recessive model: $P = 4.5 \times 10^{-5}$), rs4317088 (additive model: $P = 1.5 \times 10^{-6}$; recessive model: $P = 3.7 \times 10^{-5}$; dominant model: P = 0.0002), and rs9831846 (additive model: $P = 2.2 \times 10^{-5}$; recessive model: P = 0.0002). In addition, the rs9985304, rs4688490, rs6802863, and rs7636925 SNPs of the *ADAMTS9* gene were found to be in strong LD ($r^2 > 0.8$) to each

Table 2. L	inear regression models of associations between the MMSE scores a	and 16 tag SNPs within the ADAMTS9 and PPARG genes, v	which
have an ev	/idence of association (P < 0.05).		

								A	dditive r	nodel	Re	cessive	model	Don	ninant m	nodel
Gene	CHR	SNP	A1	A2	MAF	BETA	SE	Р	BETA	SE	Р	BETA	SE	Р		
ADAMTS9	3	rs17070967	С	Т	0.077	-0.04	0.70	0.9574	0.05	1.41	0.9716	-0.72	0.32	0.0264		
		rs1561988	Α	G	0.496	-0.42	0.17	0.0138	-0.78	0.28	0.0054	-0.33	0.28	0.2316		
		rs1014640	Т	С	0.441	-0.51	0.17	0.0034	-1.00	0.30	0.0010	-0.31	0.26	0.2344		
		rs17071042	С	Α	0.076	0.59	0.99	0.5527	1.29	1.99	0.5170	-0.66	0.33	0.0448		
		rs3935273	Т	С	0.218	-0.31	0.31	0.3097	-0.42	0.61	0.4918	-0.58	0.25	0.0185		
		rs76346246	С	Т	0.070	0.03	1.40	0.9818	0.18	2.81	0.9499	-0.96	0.34	0.0047		
		rs60073432	Α	G	0.251	0.29	0.24	0.2344	0.33	0.48	0.4860	0.57	0.24	0.0184		
		rs73832338	Т	С	0.207	1.01	0.31	0.0012	1.78	0.62	0.0042	0.93	0.25	0.0002		
		rs9985304	Α	G	0.427	-0.74	0.17	1.4 x 10 ^{−5}	-1.22	0.30	4.5 x 10 ^{−5}	-0.74	0.26	0.0040		
		rs4317088	С	Т	0.490	-0.82	0.17	1.5 x 10 ^{−6}	-1.15	0.28	3.7 x 10 ^{−5}	-1.03	0.28	0.0002		
		rs6445420	С	Т	0.083	-1.45	0.63	0.0221	-2.87	1.26	0.0232	-0.39	0.35	0.2595		
		rs9831846	С	Т	0.484	-0.71	0.17	2.2 x 10 ⁻⁵	-1.03	0.27	0.0002	-0.88	0.27	0.0013		
		rs7646362	Α	G	0.046	0.83	1.40	0.5556	1.72	2.82	0.5408	-0.93	0.44	0.0353		
		rs75581931	Α	G	0.224	-0.68	0.31	0.0289	-1.32	0.61	0.0314	-0.22	0.24	0.3670		
		rs80118777	G	Т	0.150	-1.03	0.50	0.0397	-2.03	1.00	0.0424	-0.22	0.26	0.4000		
PPARG	3	rs78287138	Т	С	0.142	0.38	0.43	0.3703	0.62	0.86	0.4693	0.57	0.26	0.0314		

A1 = minor allele, A2 = major allele, BETA = Beta coefficients, Chr = chromosome, HWE = Hardy–Weinberg equilibrium, MAF = minor allele frequency, MMSE = Mini-Mental State Examination, SE = standard error.

Analysis was obtained after adjustment for covariates including age, gender, and education. P values of < 0.0005 are shown in bold.

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Table 3.	SNP-SNP interaction models identified by	the GMDR method with ad	ljustment for age, gen-
der, and	education.		

Best interaction model	Testing accuracy (%)	P value
ADAMTS9 rs9985304, ADAMTS9 rs76346246	68.72	< 0.001
ADAMTS9 rs4317088, ADAMTS9 rs4566532, ADAMTS9 rs7642530	67.40	< 0.001

GMDR = generalized multifactor dimensionality reduction.

P value was based on 1,000 permutations. Analysis was obtained after adjustment for covariates including age, gender, and education. P values of < 0.05 are shown in bold.

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other (S2 Table). The *ADAMTS9* rs4317088 SNP was also in strong LD with the rs6784609, rs6802863, and rs9835360 SNPs (S2 Table).

Next, we employed categorized MMSE scores as an outcome (normal: MMSE score ≥ 24 ; cognitive impairment: MMSE score < 24) for SNP-SNP interaction analysis. The GMDR analysis was used to assess the impacts of combinations between the 96 tag SNPs in cognitive aging, including age, gender, and education as covariates. Table 3 summarizes the results obtained from GMDR analysis for two-way up to three-way SNP-SNP interaction models with covariate adjustment. As shown in Table 3, there was a significant two-way model involving *ADAMTS9* rs9985304 and *ADAMTS9* rs76346246 (P < 0.001), indicating a potential SNP-SNP interaction between *ADAMTS9* rs9985304 and *ADAMTS9* rs76346246 in influencing cognitive aging. Similarly, there was a significant three-way SNP-SNP interaction model involving *ADAMTS9* rs4317088, *ADAMTS9* rs4566532, and *ADAMTS9* rs7642530 (P < 0.001) in influencing cognitive aging.

We further utilized multivariable logistic regression analysis with adjustment for age, gender, and education to assess the two-way *ADAMTS9* rs9985304 and *ADAMTS9* rs76346246 interaction models selected by the GMDR method (Table 4). Our analysis revealed that carriers with the AA genotype of *ADAMTS9* rs9985304 and the C allele of *ADAMTS9* rs76346246 had a 0.11-fold increased risk for cognitive aging, compared to those with the G allele of *ADAMTS9* rs9985304 and the TT genotype of *ADAMTS9* rs76346246 (Table 4). Carriers with the G allele of *ADAMTS9* rs9985304 and the C allele of *ADAMTS9* rs76346246 also had a 0.37-fold increased risk for cognitive aging, compared to those with the G allele of *ADAMTS9*

Table 4. Multivariable logistic regression analysis for the ADAMTS9 rs9985304 and ADAMTS9
rs76346246 interaction model.

Two-way interaction model	OR	95% CI	P value ^b
ADAMTS9 rs9985304 (GG+AG genotype) with ADAMTS9 rs76346246 (TT genotype) ^a	1		
ADAMTS9 rs9985304 (AA genotype) with ADAMTS9 rs76346246 (CC +CT genotype)	0.11	0.03–0.36	0.0003
ADAMTS9 rs9985304 (GG+AG genotype) with ADAMTS9 rs76346246 (CC+CT genotype)	0.37	0.17–0.79	0.0105
ADAMTS9 rs9985304 (AA genotype) with ADAMTS9 rs76346246 (TT genotype)	0.20	0.11–0.37	3.4 x 10 ⁻⁷

CI = confidence interval, OR = odds ratio.

^a Reference.

^b Versus reference.

Analysis was obtained after adjustment for covariates including age, gender, and education. P values of < 0.05 are shown in bold.

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rs9985304 and the TT genotype of *ADAMTS9* rs76346246 (Table 4). Finally, carriers with the AA genotype of *ADAMTS9* rs9985304 and the TT genotype of *ADAMTS9* rs76346246 had a 0.2-fold increased risk for cognitive aging, compared to those with the G allele of *ADAMTS9* rs9985304 and the TT genotype of *ADAMTS9* rs76346246 (Table 4).

To further study the association of SNP-age interactions with cognitive measures, we employed categorized MMSE scores as an outcome and utilized multivariable logistic regression analysis with adjustment for gender and education (Table 5). To stratify the data by age, two groups were defined using the median of age (Group I: individuals with age ≤ 64 years; Group II: individuals with age > 64 years). Our analysis revealed that the Group I subjects with the G allele of *ADAMTS9* rs9985304 had a 6.51-fold increased risk for cognitive aging, compared to those with the AG genotype of *ADAMTS9* rs9985304 had a 2.67-fold increased risk for cognitive aging, compared to the Group II subjects with the GG+AG genotypes of *ADAMTS9* rs9985304 had a 2.67-fold increased risk for cognitive aging, compared to the Group I subjects with the AA genotype of *ADAMTS9* rs9985304 (Table 5). Our analysis also implicated the interaction effect between *ADAMTS9* rs73832338 and age (P = 0.0016), between *ADAMTS9* rs4317088 and age (P = 1.7 x 10⁻⁵ or 0.0276), and between *ADAMTS9* rs9831846 and age (P = 0.0019), as shown in Table 5.

SNP-age interaction model	OR	95% CI	P value ^b		
(a) <i>ADAMTS9</i> rs73832338					
ADAMTS9 rs73832338 (CC genotype) with Age ≤ 64 years old ^a	1				
ADAMTS9 rs73832338 (CC genotype) with Age > 64 years old	0.76	0.45–1.28	0.3014		
ADAMTS9 rs73832338 (TT+TC genotype) with Age \leq 64 years old	4.90	1.82–13.16	0.0016		
ADAMTS9 rs73832338 (TT+TC genotype) with Age > 64 years old	1.30	0.67–2.55	0.4408		
(b) ADAMTS9 rs9985304					
ADAMTS9 rs9985304 (AA genotype) with Age \leq 64 years old ^a	1				
ADAMTS9 rs99853048 (AA genotype) with Age > 64 years old	1.18	0.50-2.75	0.7063		
ADAMTS9 rs9985304 (GG+AG genotype) with Age \leq 64 years old	6.51	3.08–13.73	8.8 x 10 ⁻⁷		
ADAMTS9 rs9985304 (GG+AG genotype) with Age > 64 years old	2.67	1.35–5.26	0.0045		
(c) <i>ADAMTS9</i> rs4317088					
ADAMTS9 rs4317088 (CC genotype) with Age \leq 64 years old ^a	1				
ADAMTS9 rs4317088 (CC genotype) with Age > 64 years old	0.86	0.40–1.86	0.7098		
ADAMTS9 rs4317088 (TT+TC genotype) with Age \leq 64 years old	4.86	2.36-9.98	1.7 x 10 ⁻⁵		
ADAMTS9 rs4317088 (TT+TC genotype) with Age > 64 years old	2.05	1.08–3.88	0.0276		
(d) ADAMTS9 rs9831846					
ADAMTS9 rs9831846 (CC genotype) with Age \leq 64 years old ^a	1				
ADAMTS9 rs9831846 (CC genotype) with Age > 64 years old	0.71	0.33–1.56	0.3967		
ADAMTS9 rs9831846 (TT+TC genotype) with Age \leq 64 years old	3.11	1.52-6.39	0.0019		
ADAMTS9 rs9831846 (TT+TC genotype) with Age > 64 years old	1.65	0.85–3.21	0.1385		

Table 5. Multivariable logistic regression analysis of SNP-age interaction models for four key SI	NPs
within the ADAMTS9 gene.	

CI = confidence interval, OR = odds ratio.

^a Reference.

^b Versus reference.

Analysis was obtained after adjustment for covariates including gender and education. P values of < 0.05 are shown in bold.

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Discussion

Our study is the first to date to track down whether the main effects of 96 tag SNPs in three insulin resistance-associated genes, namely the *ADAMTS9*, *GCKR*, and *PPARG* genes, are significantly associated with the risk of cognitive aging independently and/or through SNP-SNP interactions among old Taiwanese individuals. Here, we report for the first time that the *ADAMTS9* gene may play a key role in the modulation of cognitive aging for the elderly in a Taiwanese population. Notably, the significant association of four key SNPs in the *ADAMTS9* gene with MMSE scores persisted after correcting for multiple testing (P < 0.0005). Additionally, our data revealed that SNP-SNP interactions between SNPs of the *ADAMTS9* gene may contribute to the etiology of cognitive aging.

To our knowledge, our results are the first to raise the possibility that four key SNPs (rs73832338, rs9985304, rs4317088, and rs9831846) within the ADAMTS9 gene may contribute to susceptibility to cognitive aging. Intriguingly, significant associations between these four key SNPs and MMSE scores persisted even after applying Bonferroni correction. According to the aforementioned hypothesis, we speculated that the insulin resistance-relevant genes may be associated with cognitive aging because insulin resistance is considered a risk factor for cognitive aging and AD [3–5]. Not only is insulin a primary contributor for normal brain functioning, but insulin abnormalities also increase the risk for neurodegenerative disorders such as cognitive aging, age-related memory impairment, and AD [6, 7]. Along with our findings, evidence has been reported for an association of the ADAMTS9 gene with insulin sensitivity, insulin resistance, and T2D [9, 10, 37]. A growing body of evidence further indicates that the ADAMTS-9 protein, which is encoded by the ADAMTS9 gene, may be involved in physiological conditions and pathological disease states in central nervous system injuries such as ischemic stroke and spinal cord injury [11–13]. In an animal study, Reid et al. suggested that an increased synthesis of the ADAMTS-9 protein was modulated in response to injured neurons in brain tissue after transient middle cerebral artery occlusion [11]. Similarly, in another animal study, Demircan et al. found that ADAMTS-9 expression levels in the mouse spinal cord were upregulated following injury [12]. The ADAMTS9 rs6795735 SNP was also associated with age-related macular degeneration, which typically occurs in older individuals, in a genome-wide association study [38]. It should be noted that the minor allele frequencies of these four key SNPs vary considerably between different ethnic populations (S4 Table). For example, the A allele frequency of ADAMTS9 rs9985304 ranges from 42.73% in the present Taiwanese population, 64.29% in British subjects, 47.12% in Japanese subjects, 51.64% in African American subjects, to 52.43% in Han Chinese subjects.

Remarkably, we further inferred the epistatic effects between *ADAMTS9* rs9985304 and *ADAMTS9* rs76346246 on influencing cognitive aging by using the GMDR approach. To our knowledge, there is no prior implication because no other study has been conducted to weigh SNP-SNP interactions between these SNPs. Our analysis implicated that the interaction effect between *ADAMTS9* rs9985304 and *ADAMTS9* rs76346246 on cognitive aging yielded an OR value of 0.11 when we compared individuals carrying the AA genotype of *ADAMTS9* rs9985304 and the TT genotype of *ADAMTS9* rs76346246. Similarly, this interaction effect yielded an OR value of 0.37 when we compared individuals carrying the AA genotype of *ADAMTS9* rs9985304 and the G allele of *ADAMTS9* rs76346246 with those carrying the G allele of *ADAMTS9* rs9985304 and the TT genotype of *ADAMTS9* rs76346246. It also yielded an OR value of 0.2 when we compared individuals carrying the AA genotype of *ADAMTS9* rs9985304 and the TT genotype of *ADAMTS9* rs76346246 with those carrying the G allele of *ADAMTS9* rs9985304 and the TT genotype of *ADAMTS9* rs76346246. It also yielded an OR value of 0.2 when we compared individuals carrying the AA genotype of *ADAMTS9* rs9985304 and the TT genotype of *ADAMTS9* rs76346246. The

biological effects of synergy between *ADAMTS9* rs9985304 and *ADAMTS9* rs76346246 on cognitive aging remain to be elucidated. It should be pointed out that the C allele frequency of *ADAMTS9* rs76346246 differs noticeably between various ethnic populations, ranging from 7.02% in the present Taiwanese population, 0.00% in British subjects, 7.69% in Japanese subjects, 0.82% in African American subjects, to 9.71% in Han Chinese subjects as shown in public data from the 1000 Genomes Project (S4 Table).

Among the strengths of our study is having access to a large Taiwanese cohort such as the Taiwan Biobank [27–30] to explore the role of insulin resistance-associated genes in relation to cognitive aging. On the other hand, a main weakness is that our findings require prospective clinical trials to gauge whether the present observations are sustained in varied ethnic groups [39–41]. While all study subjects self-reported as being of Taiwanese Han Chinese ancestry, this study may also fail to detect potential population stratification, because it is difficult to collect a large sample with a homogeneous genetic background due to logistical and ethical reasons [29]. Further studies with other ethnic populations are envisioned to build up a thorough evaluation of the association and interactions of the investigated variants with cognitive aging [42–44].

Conclusions

In conclusion, we conducted an extensive analysis of the association of cognitive aging with insulin resistance-associated genes, namely the *ADAMTS9*, *GCKR*, and *PPARG* genes in older Taiwanese adults. We also examined the influence of SNP-SNP interactions in these genes on cognitive aging. Overall, the results from the current study, if replicated in independent and statistically well-powered studies, suggest the impacts of the *ADAMTS9* gene on the prevalence of cognitive aging independently and/or through complex SNP-SNP interactions. Independent replication studies with a much larger number of participants will likely demonstrate further insights into the role of the *ADAMTS9* gene pinpointed in this study.

Supporting information

S1 Table. Genotyping results for 141 SNPs in three insulin resistance-related genes including the *ADAMTS9*, *GCKR*, and *PPARG* genes. (DOC)

S2 Table. 96 tag SNPs in three insulin resistance-related genes including the *ADAMTS9*, *GCKR*, and *PPARG* genes. (DOC)

S3 Table. Linear regression models of associations between the MMSE scores and 96 tag SNPs in three insulin resistance-related genes including the *ADAMTS9*, *GCKR*, and *PPARG* genes.

(DOC)

S4 Table. MAF in various ethnic populations for five tag SNPs in the *ADAMTS9* gene. (DOC)

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