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# Genome-wide Meta-analysis on the Sense of Smell Among US Older Adults

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**Abstract:** Olfactory dysfunction is common among older adults and affects their safety, nutrition, quality of life, and mortality. More importantly, the decreased sense of smell is an early symptom of neurodegenerative diseases such as Parkinson disease (PD) and Alzheimer disease. However, the genetic determinants for the sense of smell have been poorly investigated. We here performed the first genome-wide meta-analysis on the sense of smell among 6252 US older adults of European descent from the Atherosclerosis Risk in Communities (ARIC) study, the Health, Aging, and Body Composition (Health ABC) study, and the Religious Orders Study and the Rush Memory and Aging Project (ROS/MAP). Genome-wide association study analysis was performed first by individual cohorts and then

meta-analyzed using fixed-effect models with inverse variance weights. Although no SNPs reached genome-wide statistical significance, we identified 13 loci with suggestive evidence for an association with the sense of smell ( $P_{meta} < 1 \times 10^{-5}$ ). Of these, 2 SNPs at chromosome 17q21.31 (rs199443 in *NSF*,  $P = 3.02 \times 10^{-6}$ ; and rs2732614 in *KIAA1267–LRRC37A*,  $P = 6.65 \times 10^{-6}$ ) exhibited *cis* effects on the expression of microtubule-associated protein tau (*MAPT*, 17q21.31) in 447 frontal-cortex samples obtained postmortem and profiled by RNA-seq ( $P < 1 \times 10^{-15}$ ). Gene-based and pathway-enrichment analyses further implicated *MAPT* in regulating the sense of smell in older adults. Similar results were obtained after excluding participants who reported a physician-diagnosed PD or use of PD medications. In

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**Abbreviations:** AD = Alzheimer disease, ARIC = Atherosclerosis Risk in Communities study, B-SIT = Brief Smell Identification Test, eQTL = expression quantitative trait loci, GWAS = genomewide association study, Health ABC = the Health, Aging, and Body Composition study, MAP = the Rush Memory and Aging Project, MMSE = Mini-Mental State Examination, NCS = the ARIC Neuro-Cognitive Study, PD = Parkinson disease, ROS = the Religious Orders Study.

## INTRODUCTION

The human olfactory system provides us a remarkable ability to detect and discriminate odorants, and warns us of spoiled foods or dangerous environments. Olfactory dysfunction may not only result in poorer nutritional status and adverse effects on safety and quality of life, but is associated with higher mortality.<sup>1,2</sup>

The sense of smell decreases with age. Poor sense of smell affects over 20% of US older adults.<sup>3</sup> Previous research suggests that the loss of sense of smell is among the earliest symptoms of neurodegenerative diseases such as Parkinson disease (PD)<sup>4,5</sup> and Alzheimer disease (AD).<sup>6</sup> For PD, this observation is consistent with the Braak hypothesis that Lewy body deposition first affects the olfactory bulb and lower brain stem before spreading into substantia nigra and cortex.<sup>7</sup> Moreover, as the nasal cavity directly interacts with the environment, a dual-hit hypothesis was proposed that environmental neurotoxicants may initiate PD development in the olfactory structures decades before PD clinical diagnosis.<sup>8</sup> Therefore, research on the sense of smell in older adults may lead to a better understanding of the natural history and etiology of PD and potentially for other neurodegenerative diseases.

However, the genetic basis for the loss of the sense of smell is largely unknown. Limited studies have suggested that genetic variations at human olfactory receptors or the *ApoE*  $\epsilon$ 4 allele may contribute to variable olfactory sensitivity and perception.<sup>9,10</sup> Two earlier studies also suggest potential links to regions on chromosome 4q.<sup>11,12</sup>

Here, we report the first ever genome-wide meta-analysis on the sense of smell among 6252 US older adults of European descent from 3 cohorts: the Atherosclerosis Risk in Communities (ARIC) study, the Health, Aging, and Body Composition (Health ABC) study, and the Religious Orders Study and the Rush Memory and Aging Project (ROS/MAP). We further examined suggestive loci with gene-based analyses, pathwayenrichment analyses, as well as expression quantitative trait loci (eQTL) analysis using 447 postmortem prefrontal-cortex tissues. Overall, our results suggest that microtubule-associated protein tau (*MAPT*), a major susceptibility gene for PD<sup>13,14</sup> and possibly for AD,<sup>15</sup> may also play a role in regulating the sense of smell in older adults.

## **METHODS**

## **Participating Studies**

Details of participating cohorts were published elsewhere. $^{16-19}$  Briefly, the ARIC study is an ongoing longitudinal

study that was established in 1987 to 1989 to investigate risk factors for cardiovascular diseases.<sup>16</sup> The sense of smell was measured as part of the ARIC Neuro-Cognitive Study (NCS) in 2011 to 2013. Of the 6523 participants of ARIC NCS, 4066 were eligible after excluding non-Whites (n = 1563), and participants without valid data on the smell identification test (n = 279) or genome-wide association study (GWAS) genotyping (n = 615). The Health ABC is a prospective study established in 1997 to 1998 to investigate risk factors for disability and functional decline among older adults.<sup>17</sup> The sense of smell was tested among 2537 participants in 1999 to 2000. After excluding self-reported non-Whites (n = 976), participants without valid data on the smell identification test (n = 106)or GWAS (n = 111), 1344 were eligible for analysis. The ROS and MAP studies are longitudinal cohorts established in mid-1990s to investigate aging and AD incidence and progression among adults 65 years or older.<sup>18,19</sup> The sense of smell was measured as part of its clinical evaluation. Our analysis included 1065 Whites after excluding participants without data on genotyping (n = 661) or the sense of smell (n = 644).

# The Smell Identification Tests

All 3 cohorts used validated smell identification tests to examine the sense of smell: the 12-item Sniffin' Sticks screening test (Burghart, Wedel, Germany)<sup>20</sup> in ARIC and the 12-item Brief Smell Identification Test (B-SIT, Sensonics, Haddon Heights, NJ)<sup>21</sup> in the Health ABC and ROS/MAP. Both tests assess participant's sense of smell to correctly identify 12 daily odorants, although the exact odorants were somewhat different. Briefly, participants were instructed to smell each odorant and choose the correct odorant from 4 possible answers in a multiple-choice format. One point was given for each correct answer with a total score from 0 to 12. Both tests have been validated and widely used in clinical and epidemiological studies.<sup>20,21</sup>

All cohorts assessed global cognitive function during the same study visit in which the sense of smell was evaluated. The ARIC and ROS/MAP studies used the Mini-Mental State Examination (MMSE) that has a maximal score of 30, whereas the Health ABC study used the Modified Mini-Mental Status Examination (MMMSE) with a maximal score of 100. Each cohort also determined *ApoE* genotypes by genotyping 2 *ApoE* variants at codons 130 and 176 (formerly 112 and 158) separately.

## Genotyping, Imputation, and Statistical Analysis

GWAS genotyping was performed using the Affymetrix Genome-wide Human SNP array 6.0 in ARIC and ROS/MAP, and Illumina Human1M-Duo BeadChip in Health ABC. Imputation was performed in each cohort using MACH based on HapMap Phase II CEU build 36 reference panel. Prespecified criteria were used for quality control of each cohort.

Each cohort performed its own GWAS analysis following a standardized procedure with ProbABEL<sup>22</sup> or PLINK,<sup>23</sup> using a linear regression model with analysis of allele dosages. The outcome was the natural log of the sense of smell score plus 1 to account for the few participants who had a score of 0. Potential confounders were adjusted for in 2 separate models: first for age, gender, study sites, cognitive function, and the first 2 principal components (PCAs) in Model 1, and then additionally for *ApoE*  $\varepsilon$ 4 allele in Model 2. We further adjusted for *ApoE*  $\varepsilon$ 4 because it is the most important genetic risk factor for AD and predicts poor sense of smell in all participating cohorts.

We performed meta-analysis using a fixed-effect model with inverse variance weights in METAL,<sup>24</sup> after filtering out SNPs with MAF < 1% <sup>25-27</sup> or low imputation quality (r<sup>2</sup> < 0.3). We applied genomic control for each dataset before meta-analysis (e-Methods). We considered *P* value <  $5 \times 10^{-8}$  as genome-wide significant and *P* value between  $1 \times 10^{-5}$  and  $5 \times 10^{-8}$  as suggestive evidence for an association.

We used VEGAS<sup>28</sup> (Versatile Gene-based Association Study) for gene-based analysis and calculated individual gene-wise P values for each gene in relation to the sense of smell, and used binomial test to identity enriched ingenuity canonical pathways (http://www.ingenuity.com; IPA, Ingenuity<sup>®</sup> Systems) based on the results of meta-analysis in Model 2, the enrichment test P values were derived from 10,000 rounds of permutation tests (e-Methods).

To explore the functional relevance of top SNPs from the GWAS analysis, we applied the publicly available data from the RegulomeDB (http://regulomedb.org/)<sup>29</sup> (e-Methods). We then generated RNA expression data using frozen postmortem dorsolateral prefrontal cortex (DLPFC) brain tissue from 447 ROS/MAP participants to define the biological consequence of the risk variants of identified SNPs (e-Methods).

## Ethical Aspects

Individual study protocols were approved by relevant institutional review boards and all study participants provided written consent.

## RESULTS

Table 1 presents characteristics of study participants. As expected, the sense of smell decreased with age and was lower in men than women. Further, higher cognitive score was associated with better sense of smell, whereas the *ApoE*  $\varepsilon$ 4 allele was related to poorer sense of smell. These population characteristics were similarly associated with the sense of smell across cohorts (Table S1, http://links.lww.com/MD/A526). Although these studies used different screening tests of smell identification, the distributions of the sense of smell scores were

comparable across cohorts (Figure S1, http://links.lww.com/ MD/A526).

The Q–Q plots for Model 1 showed relatively low genomic inflation factors (overall  $\lambda = 0.996$ ), suggesting minimal population stratification (Figure S2, http://links.lww.com/MD/A526). Although no SNP reached genome-wide significance, 35 SNPs had a suggestive association with the sense of smell ( $P_{\text{meta}} < 1 \times 10^{-5}$ , Figure 1A). We examined LD among these SNPs and identified 19 SNPs that either had the lowest *P* value in each LD block ( $r^2 \ge 0.8$ ) or were potentially functional as annotated in the RegulombDB (Tables S2 and S3, http://links.lww.com/MD/A526). Among these, 3 SNPs were predicted as eQTLs in frontal-cortex and cerebellum tissues in the RegulomeDB: rs199443 (*NSF*,  $P_{\text{meta}} = 4.01 \times 10^{-6}$ ), rs2075650 (*TOMM40*,  $P_{\text{meta}} = 4.24 \times 10^{-6}$ ). The rs199443 and rs2732614 were *cis*-eQTLs for *MAPT* in both frontal-cortex and cerebellum tissues,<sup>30</sup> while rs2075650 was *cis*-eQTL for *TOMM40* in lymphoblastoid cells.<sup>31</sup>

In the meta-analysis of Model 2 that further adjusted for ApoE  $\varepsilon$ 4, the Q–Q plot also showed a relatively low genomic inflation factor with an overall  $\lambda$  of 0.996 (Figure S2, http:// links.lww.com/MD/A526). As shown in Table 2 and Figure 1B, 13 SNPs had suggestive associations with the sense of smell  $(P_{\text{meta}} < 1 \times 10^{-5})$ , Figure S3, http://links.lww.com/MD/A526); another 47 SNPs were in LD ( $r^2 > 0.8$ ) with these 13 SNPs (Table S4, http://links.lww.com/MD/A526). Ten of these 13 SNPs overlapped with those from Model 1, including the 2 annotated eQTLs at chromosome 17: rs199443  $(P_{\text{meta}} = 3.02 \times 10^{-6})$  and rs2732614  $(P_{\text{meta}} = 6.65 \times 10^{-6})$ . In contrast, the signal for rs2075650 at TOMM40 was drastically diminished ( $P_{\text{meta}} = 0.09$ ) after adjustment for ApoE  $\epsilon$ 4. For these 13 SNPs, we also repeated the meta-analyses using random-effect model and observed similar results. For example, the  $P_{\text{meta}}$  was  $3.73 \times 10^{-6}$  for rs199443 and  $8.25 \times 10^{-6}$  for rs2732614 under the random-effect model.

We conducted gene-based analysis using VEGAS<sup>28</sup> to identify genes that harbor multiple association signals based on  $P_{\text{meta}}$  values from the model that adjusted for *ApoE*. The

TABLE 1. Population Characteristics of Parti	cipating Cohorts		
	ARIC	Health ABC	ROS/MAP
Ν	3843	1344	1065
Age at assessment (y), mean $\pm$ SD	$75.87 \pm 5.19$	$75.70 \pm 2.81$	$81.52\pm6.85$
Men, %	44.05	52.98	27.51
Smell identification score, mean $\pm$ SD	$9.50 \pm 2.31$	$10.52 \pm 2.12$	$8.62\pm2.51$
Overall cognitive function			
MMSE, mean $\pm$ SD	$27.91 \pm 2.25$	NA	$27.54 \pm 3.05$
MMMSE, mean $\pm$ SD	NA	$92.89 \pm 5.96$	NA
APOE genotypes (%)			
22	25 (0.68)	9 (0.68)	6 (0.62)
23	495 (13.48)	167 (12.63)	146 (15.19)
24	81 (2.21)	22 (1.66)	16 (1.66)
33	2230 (60.73)	827 (62.56)	597 (62.16)
34	787 (21.43)	280 (21.18)	180 (18.73)
44	54 (1.47)	17 (1.29)	16 (1.66)

For ApoE, numbers do not add up to total due to missing values. ARIC = the Atherosclerosis Risk in Communities study, Health ABC = the Health, Aging, and Body Composition study, APOE = Apolipoprotein E, MMSE = Mini-Mental State Examination, range of possible score 0 to 30, MMMSE = Modified Mini Mental Status Examination, range of possible score 0 to 100, ROS/MAP = the Religious Orders Study and the Rush Memory and Aging Project, SD = standard deviation.



**FIGURE 1.** Manhattan plots of the genome-wide meta-analysis on the sense of smell. The red line indicates the genome-wide significance threshold  $(5 \times 10^{-8})$  and the blue line indicates the suggestive threshold  $(1 \times 10^{-5})$ . (A) Model 1 adjusted for age, gender, study center, cognitive function, and the first 2 principal components; (B) Model 2 further adjusted for *ApoE*  $\epsilon$ 4 allele.

SNPs were mapped to 17,693 genes. No genes were statistically significant after Bonferroni correction ( $P < 2.8 \times 10^{-6} = 0.05/17,693$ ). Genes with  $P < 1.0 \times 10^{-3}$  were listed in Table S5, http://links.lww.com/MD/A526. Interestingly, *MAPT* ( $P_{\text{gene}} = 9.4 \times 10^{-5}$ ) was among the top genes identified in this analysis along with nearby *LRRC37A* ( $P_{\text{gene}} = 2.9 \times 10^{-5}$ ) and *NSF* ( $P_{\text{gene}} = 1.4 \times 10^{-5}$ ), all located on chromosome 17. *LRRC37A* and *NSF* each harbor 1 of the 2 annotated eQTLs (rs2732614 and rs199443, respectively) whereas the expression of *MAPT* is regulated by both SNPs in brain tissues.<sup>30</sup>

We further conducted 2 pathway enrichment analyses (top 10 identified pathways listed in Table S6, http://links.lww.com/MD/A526). The first analysis was based on results from Model 2 and we observed 21 significantly enriched canonical pathways with the permutation P < 0.05. These include the CDK5 and p38 MAPK signaling pathways both of which are implicated in neurodegeneration and *MAPT* is a member of both pathways. The second analysis were based on the 164 genes with  $P_{\text{gene}} < 0.01$  identified by VEGAS. This analysis identified 113 enriched canonical pathways with the permutation P < 0.05. The CDK5 signaling pathway was again identified as 1 of the top ranked pathways.

We further examined *MAPT* expression using RNA-seq data of 447 postmortem frontal-cortex tissues from the ROS/MAP study in order to define the biological consequence of the risk variants of rs2732614 and rs199443. We found strong correlations between genotypes of the risk allele (C allele for both rs2732614 and rs199443) and higher expression level of *MAPT* ( $P < 10^{-15}$ , Figure 2); however, we observed no significant correlation between these 2 SNPs and the expression levels of *NSF* or *LRRC37A* (rs2732614: P = 0.62 for *NSF* and 0.54 for *LRRC37A*; rs199443: P = 0.79 for *NSF* and 0.11 for *LRRC37A*).

As *MAPT* is 1 of the most important susceptibility genes for PD, we further performed a sensitivity analysis for the 13 SNPs

identified in Model 2 by removing potential PD cases based on self-reported physician diagnosis or use of PD medications (90 in ARIC, 14 in Health ABC, and 12 in ROS/MAP) and obtained similar results (Table S7, http://links.lww.com/MD/A526).

## DISCUSSION

To the best of our knowledge, this is the first genome-wide meta-analysis on the sense of smell among older adults. The study population includes 3 well-characterized aging cohorts with objective measurements for smell identification. Although no SNP reached genome-wide significance, the preponderance of the evidence suggests *MAPT* as a potential susceptibility locus for poor sense of smell. This is particular interesting because *MAPT* is 1 of the most important susceptibility genes for late-onset sporadic PD<sup>13,14</sup> and possibly for AD.<sup>15</sup>

Smell impairment is common among older adults, particularly in patients with neurodegenerative diseases. More importantly, recent data suggest that decreased sense of smell may precede the clinical onset of both PD<sup>4,5</sup> and AD.<sup>6</sup> For example, in the Honolulu Asia Aging Study, individuals in the lowest quartile of the sense of smell score were 5 times more likely to develop PD in the next 4 years than those in the highest quartile<sup>5</sup>; further poor sense of smell was associated with higher prevalence of incidental Lewy bodies in postmortem brains, a condition that may represent prodromal PD.32 Similar observations have also been made for both mild cognitive impairment and AD.<sup>6,33</sup> Therefore, the declining sense of smell in older adults may indicate underlying neurodegenerative processes. Characterizing the genetic and environmental determinants for the sense of smell in the context of aging may provide targets for intervention with enormous potential translational impact.

The human *MAPT* locus has long been associated with the risk for PD.<sup>13,14</sup> A recent meta-analysis of GWAS data further

TABLE 2. To	p Ranke	ed SNPs ( $P_{ m meta}$ < 1 $ imes$ 10 $^{-5}$	) From the Ge	nome-Wide Meta	-Analysi	s on th	ie Sense o	of Smell in Mo	odel 2				
SNP	Chr.	Gene	Position	Score in RegulomeDB*	A1	A2	MAF	$\mathbf{Direction}^{\dagger}$	$I^{2}, \ \%$	P for Cochran Q	Effect Size <sup>‡</sup>	SE	Ρ
rs3751196	12	STAB2	102681632	S	A	IJ	0.06	   	63.2	0.1	-0.07	0.01	$3.39  imes 10^{-7}$
rs12229599	12	STAB2	102678505	7	Τ	U	0.04	   	62.9	0.1	-0.08	0.02	$4.51  imes 10^{-7}$
rs17252438	13	PCDH9	66458613	7	Τ	U	0.06	++++	7.4	0.3	0.05	0.01	$2.56 imes 10^{-6}$
rs199443	17	NSF	42174733	1f	Τ	U	0.20	++++	0.0	0.6	0.03	0.01	$3.02 imes10^{-6}$
rs6052484	20	ADRA1D	4208610	7	A	IJ	0.26	   	51.3	0.1	-0.03	0.01	$3.45  imes 10^{-6}$
rs2251885	6	PRG-3	102833365	9	V	IJ	0.37	++++	0.0	0.7	0.02	0.01	$5.79 imes10^{-6}$
rs2732614	17	KIAA1267–LRRC37	41719986	la	Τ	U	0.20	++++	0.0	0.8	0.03	0.01	$6.65  imes 10^{-6}$
rs9321099	9	C6orf1	128243832	5	V	Τ	0.09	   	0.0	0.6	-0.04	0.01	$6.96  imes 10^{-6}$
rs4865875	5	ESM1	54153200	5	Τ	U	0.09	++++	52.6	0.1	0.04	0.01	$7.58  imes 10^{-6}$
rs605843	11	NCAM1	112630444	5	Τ	U	0.25	++++	0.0	0.9	0.03	0.01	$7.97 imes10^{-6}$
rs2245691	6	PRG-3	102767101	9	Τ	U	0.32	   	0.0	0.6	-0.03	0.01	$8.02  imes 10^{-6}$
rs2732613	17	KIAA1267–LRRC37	41720606	9	A	U	0.20	   	0.0	0.7	-0.03	0.01	$9.10  imes 10^{-6}$
rs4715057	9	C6orf1	48061760	5	A	IJ	0.017	+++++	33.6	0.2	0.11	0.03	$9.67  imes 10^{-6}$
Adjusted fo *Score: the linked to expre evidence'' for †The directi	r age, ger functiona sssion of : an associ on of effe	ider, study center, cognitive l annotation score from the R a gene target "; categories 2 i ation. This is especially noti eation the order of the Ather.	function, ApoE g egulomeDB; low and 3 as "likely" able for category osclerosis Risk ii	genotype, and the fir er score indicates str and ''less likely to 1 as it is the only v 1 Communities study	st 2 princ onger ev affect bir ariable ir	cipal col idence f nding," ncluded alth AB	mponents. or a variant respectivel in the moc C Study, a	Chr = Chromos to be functiona y; categories 4 lel explicitly tie nd the Religiou	ome, MAF and MAF and MAF and MAF and the factor of the factor of the the factor of the	= minor allele fre 1 variants are def nimal binding evi status. udy and the Rush	equency, SF ined as 'lih idence''; an	E = standa cely to aff d categor nd Agins	rd error. ect binding and y 7 as ''lack of c Project.

implicated MAPT as a susceptibility locus for late onset sporadic AD.<sup>15</sup> The human MAPT encodes the microtubule-associated protein tau. It is notable that tau-related pathology was found in the bulbar component of the anterior olfactory nucleus only in patients of neurodegenerative disorders with marked loss of the sense of smell, such as AD, PD, and Lewy body dementia.34,35 Experimental studies further suggest that overexpression of tau may contribute to olfactory dysfunction in vivo.<sup>36,37</sup> These findings indicate that overexpression or abnormal aggregation of tau may represent a common mechanism between olfactory dysfunction and several neurodegenerative diseases.

The genomic architecture in the region spanning MAPT is highly complex. It covers  $\sim 1.8$  Mb block of LD encompassing not only MAPT but also several other genes that have been linked to neurodegenerative diseases, such as STH (Saitohin) and NSF (N-ethylmaleimide sensitive factor). We, however, in the RNA-seq data of 447 postmortem frontal-cortex tissues, found that rs2732614 and rs199443 had statistically significant *cis* effects on the expression of MAPT ( $P < 10^{-15}$ ), but not on NSF or LRRC37A. Additional gene-based and pathway-enrichment analyses also showed the potential of MAPT as a candidate susceptibility gene for poor sense of smell. Although our study provides fairly consistent evidence that MAPT may be a candidate susceptibility locus for the sense of smell in older adults of European descent, fine-scale mapping of this LD block with next generation sequencing will be necessary to identify potential causal locus.

ApoE ɛ4 is the most important genetic risk factor for lateonset sporadic AD<sup>38</sup> and has been linked to olfactory dysfunction in several studies.9 The present study confirms that the ApoE ɛ4 allele is a risk factor for poor smell identification even after accounting for cognitive function. In our initial analysis, we also identified an intronic SNP in TOMM40 (rs2075650) in association with the sense of smell; but this signal was extinguished after adjustment for the ApoE ɛ4 allele. Although the mechanisms are yet unknown, preliminary studies showed that ApoE was expressed at high levels in various types of cells in the olfactory epithelium and its underlying lamina propria, and that ApoE might play a critical role in olfactory nerve regeneration in mice.<sup>39,40</sup> Furthermore, experimental studies suggest that in contrast to the ApoE  $\varepsilon$ 2 and  $\varepsilon$ 3 alleles, the ApoE  $\varepsilon$ 4 fails to promote neurite outgrowth in olfactory epithelium cultures, which may lead to olfactory dysfunction in AD.41

The main limitation of the current study was the lack of independent confirmation of GWAS signals. GWAS analysis often requires very large sample size to obtain adequate power to detect modest effects of underlying variants in complex diseases. However, few large population-based studies of older adults have both the sense of smell and GWAS data. We were able to identify data from 3 well-established cohorts with similar population characteristics and data collection. We chose to combine our samples for SNP discovery rather than set up the conventional 2-stage design to maximize power to detect signals. We did, however, follow up suggestive signals with functional and expression analyses. Finally, the determinants for the sense of smell are likely complex<sup>42,43</sup> and our study was conducted among old White adults, therefore the results should be interpreted in this context. Further studies are needed to confirm our findings and to examine whether they could be generalized to other populations.

In conclusion, we report the results of the first comprehensive GWAS analysis to understand the genetic basis for the sense of smell in older adults of European ancestry. We provide

score +1) per allele change.

<sup>‡</sup> Effect size in ln(smell



**FIGURE 2.** Expression quantitative trait loci analysis for MAPT in 447 human frontal cortex samples. These plots illustrate a dose relationship between allele load at rs199443 (A) and rs2732614 (B) and expression of *MAPT*; the *P* values were  $2.22 \times 10^{-16}$  and  $4.44 \times 10^{-16}$ , respectively. For rs2732614, genotype data were imputed using MACH which provides an estimated dosage of imputed genotype. The dosage ranges from 0 to 2, with 0 as no copy of the reference allele (C allele) and 2 as 2 copies of the reference allele. MAPT = microtubule-associated protein tau.

novel evidence that the *MAPT* locus may regulate the sense of smell in older adults. This finding warrants independent confirmation and further mechanistic investigations into how *MAPT* region contributes to the loss of the sense of smell and the development of related neurodegenerative diseases.

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