

## New insights into the genetic etiology of Alzheimer's disease and related dementias

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# New insights into the genetic etiology of Alzheimer's disease and related dementias

**Characterization of the genetic landscape of Alzheimer's disease (AD) and related dementias (ADD) provides a unique opportunity for a better understanding of the associated pathophysiological processes. We performed a two-stage genome-wide association study totaling 111,326 clinically diagnosed/'proxy' AD cases and 677,663 controls. We found 75 risk loci, of which 42 were new at the time of analysis. Pathway enrichment analyses confirmed the involvement of amyloid/tau pathways and highlighted microglia implication. Gene prioritization in the new loci identified 31 genes that were suggestive of new genetically associated processes, including the tumor necrosis factor alpha pathway through the linear ubiquitin chain assembly complex. We also built a new genetic risk score associated with the risk of future AD/dementia or progression from mild cognitive impairment to AD/dementia. The improvement in prediction led to a 1.6- to 1.9-fold increase in AD risk from the lowest to the highest decile, in addition to effects of age and the *APOE*  $\epsilon$ 4 allele.**

AD is the most common form of dementia. The heritability is high, estimated to be between 60% and 80%<sup>1</sup>. This strong genetic component provides an opportunity to determine the pathophysiological processes in AD and to identify new biological features, new prognostic/diagnostic markers and new therapeutic targets through translational genomics. Characterizing the genetic risk factors in AD is therefore a major objective; with the advent of high-throughput genomic techniques, a large number of putative AD-associated loci/genes have been reported<sup>2</sup>. However, much of the underlying heritability remains unexplained. Hence, increasing the sample size of genome-wide association studies (GWASs) is an obvious solution that has already been used to characterize new genetic risk factors in other common, complex diseases (e.g., diabetes).

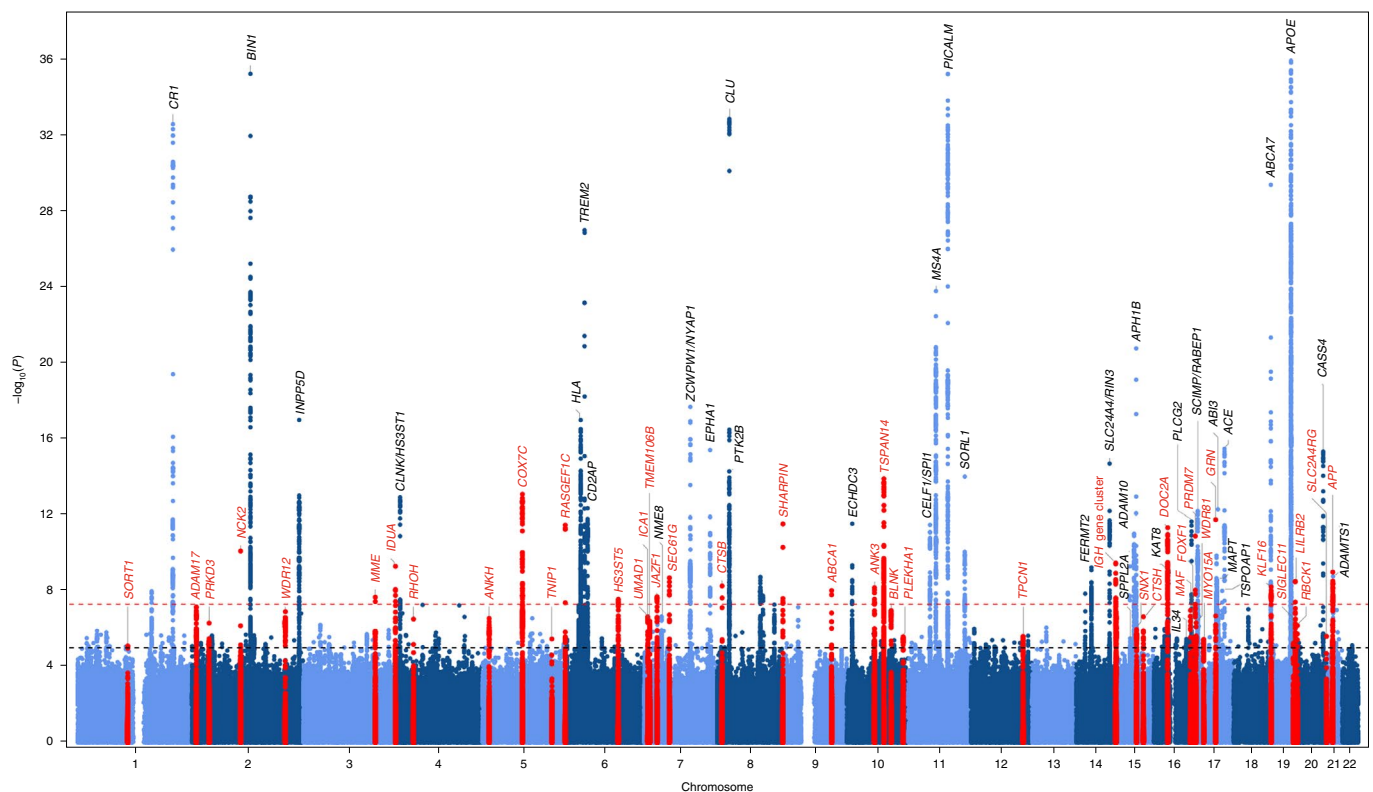
## GWAS meta-analysis

The European Alzheimer & Dementia Biobank (EADB) consortium brings together the various European GWAS consortia already working on AD. A new dataset of 20,464 clinically diagnosed AD cases and 22,244 controls has been collated from 15 European countries. The EADB GWAS results were meta-analyzed with a proxy-AD GWASs of the UK Biobank (UKBB) dataset. The UKBB's proxy-AD designation is based on questionnaire data in which individuals are asked whether their parents had dementia. This method has been used successfully in the past<sup>3</sup> but is less specific than a clinical or pathological diagnosis of AD; hence, we will refer to these cases as proxy AD and related dementia (proxy-ADD). EADB stage I (GWAS meta-analysis) was based on 39,106 clinically diagnosed AD cases, 46,828 proxy-ADD cases (as defined in the Supplementary Note), 401,577 controls (Supplementary Tables 1 and 2) and 21,101,114 variants that passed our quality control (Fig. 1; see Supplementary Fig. 1 for the quantile–quantile plot and genomic inflation factors). We selected all variants with a *P* value below  $1 \times 10^{-5}$  in stage I. We defined nonoverlapping regions around these variants, excluded the region corresponding to *APOE* and examined the remaining variants in a large follow-up sample that included AD cases and controls from the ADGC, FinnGen and CHARGE consortia (stage II; 25,392 AD cases and 276,086 controls). A signal was considered as significant on the genome-wide level if it (1) was nominally associated ( $P \leq 0.05$ ) in stage II, (2) had the same direction of association in the stage I and II analyses and (3) was associated with the ADD risk with

$P \leq 5 \times 10^{-8}$  in the stage I and stage II meta-analysis. Furthermore, we applied a PLINK clumping procedure<sup>4</sup> to define potential independent hits within the stage I results (Methods). After validation by conditional analyses (Supplementary Note and Supplementary Tables 3 and 4), this approach enabled us to define 39 signals in 33 loci already known to be associated with the risk of developing ADD<sup>3,5–10</sup> and identify 42 loci defined as new at the time of analysis (Tables 1 and 2, Supplementary Table 5 and Supplementary Figs. 2–29). Of the 42 new loci, 17 had  $P \leq 5 \times 10^{-8}$  in stage I and 25 were associated with  $P \leq 5 \times 10^{-8}$  after follow-up (stage I and stage II meta-analysis, including the ADGC, CHARGE and FinnGen data). We also identified 6 loci with  $P \leq 5 \times 10^{-8}$  in the stage I and stage II analysis but with  $P > 0.05$  in stage II (Supplementary Table 6). It is noteworthy that the magnitude of the associations in stage I did not change substantially if we restricted the analysis to clinically diagnosed AD cases (Supplementary Table 7 and Supplementary Fig. 30). Similarly, none of the signals observed appeared to be especially driven by the UKBB data (Supplementary Table 7 and Supplementary Figs. 2–29). Nine of these loci (*APP*, *CCDC6*, *GRN*, *LILRB2*, *NCK2*, *TNIP1*, *TMEM106B*, *TSPAN14* and *SHARPIN*) were recently reported in three articles using part of the GWAS data included in our study<sup>11–13</sup>. We also generated a detailed analysis of the human leukocyte antigen (*HLA*) locus on the basis of the clinically diagnosed AD cases (Supplementary Tables 8 and 9, Supplementary Figs. 31 and 32 and Supplementary Note).

## Genetic overlap with other neurodegenerative diseases

We tested the association of the lead variants within our new loci with the risk of developing other neurodegenerative diseases or AD-related disorders (Supplementary Fig. 33 and Supplementary Tables 10–12). We also performed more precise colocalization analyses (using Coloc R package, <https://cran.r-project.org/web/packages/coloc/index.html>) for five loci known to be associated with Parkinson's disease (*IDUA* and *CTSB*), types of frontotemporal dementia (*TMEM106B* and *GRN*) and amyotrophic lateral sclerosis (*TNIP1*) (Supplementary Tables 13 and 14). The *IDUA* signal for Parkinson's disease was independent of the signal in ADD (coloc posterior probability (PP)<sub>3</sub> = 99.9%), but we were not able to determine whether the *CTSB* signals colocalized. The *TMEM106B* and *GRN* signals in frontotemporal lobar degeneration with TAR DNA-binding protein (TDP-43) inclusions (frontotemporal lobar



**Fig. 1 | Manhattan plot of the stage I results.** *P* values are two-sided raw *P* values derived from a fixed-effect meta-analysis. Variants with a *P* value below  $1 \times 10^{-36}$  are not shown. Loci with a genome-wide significant signal are annotated (known loci in black and new loci in red). Variants in new loci are highlighted in red. The red dotted line represents the genome-wide significance level ( $P = 5 \times 10^{-8}$ ), and the black dotted line represents the suggestive significance level ( $P = 1 \times 10^{-5}$ ).

degeneration TDP) probably share causal variants with ADD (coloc PP4 = 99.8% and coloc PP4 = 80.1%, respectively). Lastly, we were not able to determine whether the *TNIP1* signals colocalized for ADD and amyotrophic lateral sclerosis.

### Pathway analyses

Next, we sought to perform a pathway enrichment analysis on the stage I association results to gain better biological understanding of this newly expanded genetic landscape for ADD. Ninety-three gene sets were still statistically significant after correction for multiple testing ( $q \leq 0.05$ ; Methods and Supplementary Table 15). As described previously, the most significant gene sets are related to amyloid and tau<sup>5</sup>; other significant gene sets are related to lipids, endocytosis and immunity (including macrophage and microglial cell activation). When restricting this analysis to the meta-analysis based on the clinically diagnosed AD cases, 54 gene sets were significant ( $q \leq 0.05$ ). Of these 54 gene sets, 33 reached  $q \leq 0.05$  in the stage I analysis and all reached  $P \leq 0.05$ . This indicates that the inclusion of proxy-ADD cases does not cause disease-relevant biological information to be missed and underlines the additional power of this type of analysis.

We next performed a single-cell expression enrichment analysis by using the average gene expression per nucleus (Av. Exp.) data in the human Allen Brain Atlas (49,495 nuclei from 8 human brains). Only the microglial expression reached a high level of significance ( $P = 1.7 \times 10^{-8}$ ; Supplementary Table 16); greater expression corresponded to a more significant association with ADD. After adjusting for microglial Av. Exp., the remaining associations became nonsignificant; this indicates that microglial Av. Exp. drives all the other cell-type associations. These results were observed whatever the brain region studied (Supplementary Table 16). A similar result

was observed using a mouse single-cell dataset<sup>14</sup> (Supplementary Table 17 and Supplementary Note).

Lastly, we looked at whether the relationship between an elevated microglia Av. Exp. and a genetic association with the ADD risk was specific to particular biological processes (Supplementary Table 18) by analyzing the interaction between microglia Av. Exp. and pathway membership in MAGMA<sup>15</sup>. Of the five most significant interaction signals ( $q \leq 10^{-3}$ ), two were directly associated with endocytosis processes (GO:0006898 and GO:0031623); this suggested a functional relationship between microglia and endocytosis, which is known to be involved in phagocytosis (Supplementary Table 18). It is noteworthy that we also detected an interaction between GO:1902991 (regulation of amyloid precursor protein (APP) catabolic process) and the gene expression level in microglia ( $q = 1.4 \times 10^{-3}$ ; Supplementary Table 18). Even though these data suggest a functional relationship between microglia and APP/amyloid beta (A $\beta$ ) peptide pathways, this observation reinforces the likely involvement of microglial endocytosis in AD, a mechanism that is also strongly involved in APP metabolism<sup>16</sup>. Of note, there are overall similarities in the interaction effects of human and mouse microglia expression with genes in biological pathways of relevance to the AD genetic risk (Supplementary Table 18 and Supplementary Note).

### Gene prioritization

We next attempted to identify the genes most likely to be responsible for the association signal with ADD at each new locus. To this end, we studied the downstream effects of ADD-associated variants on molecular phenotypes (i.e., expression, splicing, protein expression, methylation and histone acetylation) in various *cis*-quantitative trait locus (*cis*-QTL) catalogues from AD-relevant tissues, cell types and brain regions. We investigated the genetic

**Table 1 | Summary of association results in the stage I and stage II analysis for known loci with a genome-wide significant signal**

Variant <sup>a</sup>	Chromosome	Position <sup>b</sup>	Gene <sup>c</sup>	Known locus	Minor/major allele	MAF <sup>d</sup>	OR <sup>e</sup>	95% CI	P value
rs679515	1	207577223	CR1	CR1	T/C	0.188	1.13	1.11–1.15	$7.2 \times 10^{-46}$
rs6733839	2	127135234	BIN1	BIN1	T/C	0.389	1.17	1.16–1.19	$6.1 \times 10^{-118}$
rs10933431	2	233117202	INPP5D	INPP5D	G/C	0.234	0.93	0.92–0.95	$3.6 \times 10^{-18}$
rs6846529	4	11023507	CLNK	CLNK/HS3ST1	C/T	0.283	1.07	1.05–1.08	$2.2 \times 10^{-17}$
rs6605556	6	32615322	HLA-DQA1	HLA	G/A	0.161	0.91	0.90–0.93	$7.1 \times 10^{-20}$
rs10947943	6	41036354	UNC5CL	TREM2	A/G	0.142	0.94	0.93–0.96	$1.1 \times 10^{-9}$
rs143332484	6	41161469	TREM2	TREM2	T/C	0.013	1.41	1.32–1.50	$2.8 \times 10^{-25}$
rs75932628	6	41161514	TREM2	TREM2	T/C	0.003	2.39	2.09–2.73	$2.5 \times 10^{-37}$
rs60755019	6	41181270	TREML2	TREM2	G/A	0.004	1.55	1.33–1.80	$2.1 \times 10^{-8}$
rs7767350	6	47517390	CD2AP	CD2AP	T/C	0.271	1.08	1.06–1.09	$7.9 \times 10^{-22}$
rs6966331	7	37844191	EPDR1	NME8	T/C	0.349	0.96	0.94–0.97	$4.6 \times 10^{-10}$
rs7384878	7	100334426	SPDYE3	ZCWPW1/NYAP1	C/T	0.31	0.92	0.91–0.94	$1.1 \times 10^{-26}$
rs11771145	7	143413669	EPHA1	EPHA1	A/G	0.348	0.95	0.93–0.96	$3.3 \times 10^{-14}$
rs73223431	8	27362470	PTK2B	PTK2B	T/C	0.369	1.07	1.06–1.08	$4.0 \times 10^{-22}$
rs11787077	8	27607795	CLU	CLU	T/C	0.392	0.91	0.90–0.92	$1.7 \times 10^{-44}$
rs7912495	10	11676714	USP6NL	ECHDC3	G/A	0.462	1.06	1.05–1.08	$9.7 \times 10^{-19}$
rs10437655	11	47370397	SPI1	CELF1/SPI1	A/G	0.399	1.06	1.04–1.07	$5.3 \times 10^{-14}$
rs1582763	11	60254475	MS4A4A	MS4A	A/G	0.371	0.91	0.90–0.92	$3.7 \times 10^{-42}$
rs3851179	11	86157598	EED	PICALM	T/C	0.358	0.9	0.89–0.92	$3.0 \times 10^{-48}$
rs74685827	11	121482368	SORL1	SORL1	G/T	0.019	1.19	1.13–1.25	$2.8 \times 10^{-11}$
rs11218343	11	121564878	SORL1	SORL1	C/T	0.039	0.84	0.81–0.87	$1.4 \times 10^{-21}$
rs17125924	14	52924962	FERMT2	FERMT2	G/A	0.089	1.1	1.07–1.12	$8.3 \times 10^{-16}$
rs7401792	14	92464917	SLC24A4	SLC24A4/RIN3	G/A	0.371	1.04	1.02–1.05	$4.8 \times 10^{-8}$
rs12590654	14	92472511	SLC24A4	SLC24A4/RIN3	A/G	0.328	0.93	0.92–0.95	$4.2 \times 10^{-21}$
rs8025980	15	50701814	SPPL2A	SPPL2A	G/A	0.345	0.96	0.94–0.97	$1.3 \times 10^{-8}$
rs602602	15	58764824	MINDY2	ADAM10	A/T	0.28	0.94	0.93–0.96	$2.1 \times 10^{-15}$
rs117618017	15	63277703	APH1B	APH1B	T/C	0.144	1.11	1.09–1.13	$2.2 \times 10^{-25}$
rs889555	16	31111250	BCKDK	KAT8	T/C	0.281	0.95	0.94–0.97	$2.0 \times 10^{-11}$
rs4985556	16	70660097	IL34	IL34	A/C	0.115	1.07	1.05–1.09	$6.0 \times 10^{-10}$
rs12446759	16	81739398	PLCG2	PLCG2	G/A	0.403	0.95	0.94–0.96	$1.2 \times 10^{-13}$
rs72824905	16	81908423	PLCG2	PLCG2	G/C	0.008	0.74	0.68–0.81	$8.5 \times 10^{-12}$
rs7225151	17	5233752	SCIMP	SCIMP/RABEP1	A/G	0.124	1.08	1.05–1.10	$4.1 \times 10^{-13}$
rs199515	17	46779275	WNT3	MAPT	G/C	0.219	0.94	0.93–0.96	$9.3 \times 10^{-13}$
rs616338	17	49219935	ABI3	ABI3	T/C	0.012	1.32	1.23–1.42	$2.8 \times 10^{-14}$
rs2526377	17	58332680	TSPOAP1	TSPOAP1	G/A	0.445	0.95	0.94–0.97	$1.6 \times 10^{-12}$
rs4277405	17	63471557	ACE	ACE	C/T	0.384	0.94	0.93–0.95	$8.8 \times 10^{-20}$
rs12151021	19	1050875	ABCA7	ABCA7	A/G	0.336	1.1	1.09–1.12	$1.6 \times 10^{-37}$
rs6014724	20	56423488	CASS4	CASS4	G/A	0.09	0.89	0.87–0.91	$4.1 \times 10^{-21}$
rs2830489	21	26775872	ADAMTS1	ADAMTS1	T/C	0.281	0.95	0.94–0.97	$1.7 \times 10^{-10}$

P values are two-sided raw P values derived from a fixed-effect meta-analysis. CI, confidence interval; OR, odds ratio; MAF, minor allele frequency. <sup>a</sup>Reference single-nucleotide polymorphism (SNP) (rs) number, according to dbSNP build 153. <sup>b</sup>GRCh38 assembly. <sup>c</sup>Nearest protein-coding gene according to GENCODE release 33. <sup>d</sup>Weighted average MAF across all discovery studies. <sup>e</sup>Approximate OR calculated with respect to the minor allele.

colocalization between association signals for the ADD risk and those for the molecular phenotypes and the association between the ADD risk and these phenotypes by integrating *cis*-QTL information into our ADD GWAS. Moreover, we considered the lead variant annotation (the allele frequency, protein-altering effects and nearest protein-coding gene) and a genome-wide, high-content short interfering RNA screen for APP metabolism<sup>17</sup>. Based on this evidence, we developed a systematic gene prioritization strategy

that yielded a total weighted score of between 0 and 100 for each gene (Supplementary Fig. 34 and Supplementary Note). This score was used to compare and prioritize genes in the new loci within 1 Mb upstream and 1 Mb downstream of the lead variants. Genes either were ranked as tier 1 (greater likelihood of being the causal risk gene responsible for the ADD signal) or tier 2 (lower likelihood and the absence of a minimum level of evidence as a causal risk gene) or were not ranked.

**Table 2 | Summary of association results in the stage I and stage II analysis for new loci at the time of analysis with a genome-wide significant signal**

Locus number	Variant <sup>a</sup>	Chromosome	Position <sup>b</sup>	Gene <sup>c</sup>	Minor/major allele	MAF <sup>d</sup>	OR <sup>e</sup>	95% CI	P value
1	rs141749679	1	109345810	<i>SORT1</i>	C/T	0.004	1.38	1.24–1.54	$7.5 \times 10^{-9}$
2	rs72777026	2	9558882	<i>ADAM17</i>	G/A	0.144	1.06	1.04–1.08	$2.7 \times 10^{-8}$
3	rs17020490	2	37304796	<i>PRKD3</i>	C/T	0.145	1.06	1.04–1.08	$3.3 \times 10^{-9}$
4	rs143080277	2	105749599	<i>NCK2</i>	C/T	0.005	1.47	1.33–1.63	$2.1 \times 10^{-13}$
5	rs139643391	2	202878716	<i>WDR12</i>	T/TC	0.131	0.94	0.92–0.96	$1.1 \times 10^{-8}$
6	rs16824536	3	155069722	<i>MME</i>	A/G	0.054	0.92	0.89–0.95	$3.6 \times 10^{-8}$
6	rs61762319	3	155084189	<i>MME</i>	G/A	0.026	1.16	1.11–1.21	$2.2 \times 10^{-11}$
7	rs3822030	4	993555	<i>IDUA</i>	G/T	0.429	0.95	0.94–0.96	$8.3 \times 10^{-12}$
8	rs2245466	4	40197226	<i>RHOH</i>	G/C	0.343	1.05	1.03–1.06	$1.2 \times 10^{-9}$
9	rs112403360	5	14724304	<i>ANKH</i>	A/T	0.073	1.09	1.06–1.12	$2.3 \times 10^{-9}$
10	rs62374257	5	86927378	<i>COX7C</i>	C/T	0.23	1.07	1.05–1.09	$1.4 \times 10^{-15}$
11	rs871269	5	151052827	<i>TNIP1</i>	T/C	0.326	0.96	0.95–0.97	$8.7 \times 10^{-9}$
12	rs113706587	5	180201150	<i>RASGEF1C</i>	A/G	0.11	1.09	1.07–1.12	$2.2 \times 10^{-16}$
13	rs785129	6	114291731	<i>HS3ST5</i>	T/C	0.35	1.04	1.03–1.06	$2.4 \times 10^{-9}$
14	rs6943429	7	7817263	<i>UMAD1</i>	T/C	0.42	1.05	1.03–1.06	$1.0 \times 10^{-10}$
15	rs10952097	7	8204382	<i>ICA1</i>	T/C	0.114	1.07	1.05–1.10	$6.8 \times 10^{-9}$
16	rs13237518	7	12229967	<i>TMEM106B</i>	A/C	0.411	0.96	0.94–0.97	$4.9 \times 10^{-11}$
17	rs1160871	7	28129126	<i>JAZF1</i>	G/GTCTT	0.222	0.95	0.93–0.97	$9.8 \times 10^{-9}$
18	rs76928645	7	54873635	<i>SEC61G</i>	T/C	0.103	0.93	0.91–0.95	$1.6 \times 10^{-10}$
19	rs1065712	8	11844613	<i>CTSB</i>	C/G	0.053	1.09	1.06–1.12	$1.9 \times 10^{-9}$
20	rs34173062	8	144103704	<i>SHARPIN</i>	A/G	0.081	1.13	1.09–1.16	$1.7 \times 10^{-16}$
21	rs1800978	9	104903697	<i>ABCA1</i>	G/C	0.13	1.06	1.04–1.08	$1.6 \times 10^{-9}$
22	rs7068231	10	60025170	<i>ANK3</i>	T/G	0.403	0.95	0.94–0.96	$3.3 \times 10^{-13}$
23	rs6586028	10	80494228	<i>TSPAN14</i>	C/T	0.196	0.93	0.91–0.94	$2.0 \times 10^{-19}$
24	rs6584063	10	96266650	<i>BLNK</i>	G/A	0.043	0.89	0.86–0.92	$6.7 \times 10^{-11}$
25	rs7908662	10	122413396	<i>PLEKHA1</i>	G/A	0.467	0.96	0.95–0.97	$2.6 \times 10^{-9}$
26	rs6489896	12	113281983	<i>TPCN1</i>	C/T	0.076	1.08	1.05–1.10	$1.8 \times 10^{-9}$
27	rs7157106	14	105761758	<i>IGH</i> gene cluster	A/G	0.36	1.05	1.03–1.07	$2.0 \times 10^{-8}$
27	rs10131280	14	106665591	<i>IGH</i> gene cluster	A/G	0.133	0.94	0.92–0.96	$4.3 \times 10^{-10}$
28	rs3848143	15	64131307	<i>SNX1</i>	G/A	0.22	1.05	1.04–1.07	$8.4 \times 10^{-11}$
29	rs12592898	15	78936857	<i>CTSH</i>	A/G	0.133	0.94	0.92–0.96	$4.2 \times 10^{-9}$
30	rs1140239	16	30010081	<i>DOC2A</i>	T/C	0.379	0.94	0.93–0.96	$2.6 \times 10^{-13}$
31	rs450674	16	79574511	<i>MAF</i>	C/T	0.373	0.96	0.95–0.98	$3.2 \times 10^{-8}$
32	rs16941239	16	86420604	<i>FOXF1</i>	A/T	0.029	1.13	1.08–1.17	$1.3 \times 10^{-8}$
33	rs56407236	16	90103687	<i>PRDM7</i>	A/G	0.069	1.11	1.08–1.14	$6.5 \times 10^{-15}$
34	rs35048651	17	1728046	<i>WDR81</i>	T/TGAG	0.214	1.06	1.04–1.08	$7.7 \times 10^{-11}$
35	rs2242595	17	18156140	<i>MYO15A</i>	A/G	0.112	0.94	0.92–0.96	$1.1 \times 10^{-9}$
36	rs5848	17	44352876	<i>GRN</i>	T/C	0.289	1.07	1.06–1.09	$2.4 \times 10^{-20}$
37	rs149080927	19	1854254	<i>KLF16</i>	G/GC	0.48	1.05	1.04–1.07	$5.1 \times 10^{-10}$
38	rs9304690	19	49950060	<i>SIGLEC11</i>	T/C	0.24	1.05	1.03–1.07	$4.7 \times 10^{-9}$
39	rs587709	19	54267597	<i>LILRB2</i>	C/T	0.325	1.05	1.04–1.07	$3.6 \times 10^{-11}$
40	rs1358782	20	413334	<i>RBCK1</i>	A/G	0.246	0.95	0.94–0.97	$1.6 \times 10^{-8}$
41	rs6742	20	63743088	<i>SLC2A4RG</i>	T/C	0.221	0.95	0.93–0.97	$2.6 \times 10^{-9}$
42	rs2154481	21	26101558	<i>APP</i>	C/T	0.476	0.95	0.94–0.97	$1.0 \times 10^{-12}$

P values are two-sided raw P values derived from a fixed-effect meta-analysis. <sup>a</sup>rs number, according to dbSNP build 153. <sup>b</sup>GRCh38 assembly. <sup>c</sup>Nearest protein-coding gene according to GENCODE release 33. <sup>d</sup>Weighted average MAF across all discovery studies. <sup>e</sup>Approximate OR calculated with respect to the minor allele.



From all newly identified loci, this gene prioritization yielded 31 tier 1 genes and 24 tier 2. The 55 prioritized genes, the details of the analyses and the supporting evidence are summarized in Fig. 2a and the Supplementary Note (Supplementary Tables 19–30 and Supplementary Figs. 35–45). Among the 31 tier 1 genes, we observed that 25 of these genes were the only prioritized gene in their respective locus. For the remaining 6 tier 1 genes, we also found tier 2 genes in their respective locus. We also identified five loci containing several tier 2 prioritized genes. In one of these loci, locus 39 (L39), the tier 2 prioritized gene *LILRB2* had strong additional support from published literature (Supplementary Note). In five loci, our prioritization score did not identify sufficient molecular evidence to prioritize genes with exception of being the nearest gene (L10, L12, L13, L14 and L32). Finally, we excluded the complex IGH cluster (L27) from gene prioritization analyses due to genomic complexity of the telomeric locus as a consequence of known fusion events<sup>18</sup>.

We highlight two examples, L18 and L23. In L18, the lead variant, *rs76928645* (MAF = 10%), is intergenic and is located more than 100 kb downstream or upstream of the two nearest protein-coding genes (*SEC61G* and *EGFR*, respectively). Our gene prioritization analyses suggested that *EGFR* was the only risk gene (Fig. 3). We found that both the lead variant (*rs76928645*) and the other nearby variants in linkage disequilibrium (LD) are significant expression QTLs (eQTLs) for regulating *EGFR* expression downstream. The eQTL signals in brain strongly colocalized with the GWAS signal (with eQTL coloc PP4s of 98.3% in the temporal cortex (TCX) and 99.5% in the dorsolateral prefrontal cortex (DLPFC)). Accordingly, the fine-mapped expression transcriptome-wide association study (eTWAS) associations (Fine-mapping Of CaUsal gene Sets (FOCUS) posterior inclusion probability (PIP) = 1; eTWAS  $P = 6.9 \times 10^{-9}$ , eTWAS  $Z = +5.8$  in the TCX; eTWAS  $P = 3.1 \times 10^{-11}$ , eTWAS  $Z = +6.6$  in the DLPFC) indicated that genetic downregulation of *EGFR* expression is associated with a lower ADD risk (Fig. 3; Supplementary Tables 22, 24 and 26; and Supplementary Figs. 36a, 39 and 41).

In L23, we observed numerous eQTL-GWAS and methylation QTL (mQTL)-GWAS hits for *TSPAN14* that support the hypothesis that increased brain expression of *TSPAN14* is associated with increased ADD risk. We also identified several splice junctions in *TSPAN14* whose genetic regulation signals in lymphoblastoid cell lines (LCLs) and brain colocalized with the ADD association signal. These splice junctions were also associated with ADD risk (Fig. 4, Supplementary Tables 22–28 and Supplementary Figs. 36–42 and 44c). As three of these splice junctions were related to new complex cryptic splicing events that were predicted to result in two cryptic exons not previously described in known *TSPAN14* transcripts (based on GENCODE v38), we designed a long-read single-molecule (Nanopore) sequencing experiment (Supplementary Note) to validate these cryptic exons on a total of 93 complementary DNA (cDNA) samples derived from LCLs, frontal cortex and hippocampus and consequently validated those cryptic exons (Fig. 4). All three of the validated cryptic splicing events occur within the ADAM10-interacting domain of *TSPAN14*. Cryptic exon 1 is at least 45 bp long, and cryptic exon 2 is 118 bp long.

Lastly, we used STRING v11 (ref. <sup>19</sup>) to analyze protein–protein interaction for (1) previously known AD genes from GWASs, (2) our prioritized new genes (tier 1 in Fig. 2a and Supplementary Table 20) and (3) a combination of the two (Supplementary Note). The largest networks contained 14, 8 and 30 proteins, respectively (Supplementary Fig. 46). These networks were larger than would be expected by chance (respectively,  $P < 2 \times 10^{-5}$ ,  $P = 2.8 \times 10^{-3}$  and  $P < 2 \times 10^{-5}$  based on comparison with 50,000 randomly simulated protein lists matched for the number of proteins and the total number of interactions for each protein). Notably, the number of interactions between our prioritized genes and previously known genes is also significantly greater than would be expected ( $P < 1 \times 10^{-4}$ ), indicating that the newly prioritized genes are biologically relevant in AD. No such enrichment ( $P = 0.88$ ) was observed for the remaining genes in the new loci, again highlighting the value of our prioritization approach.

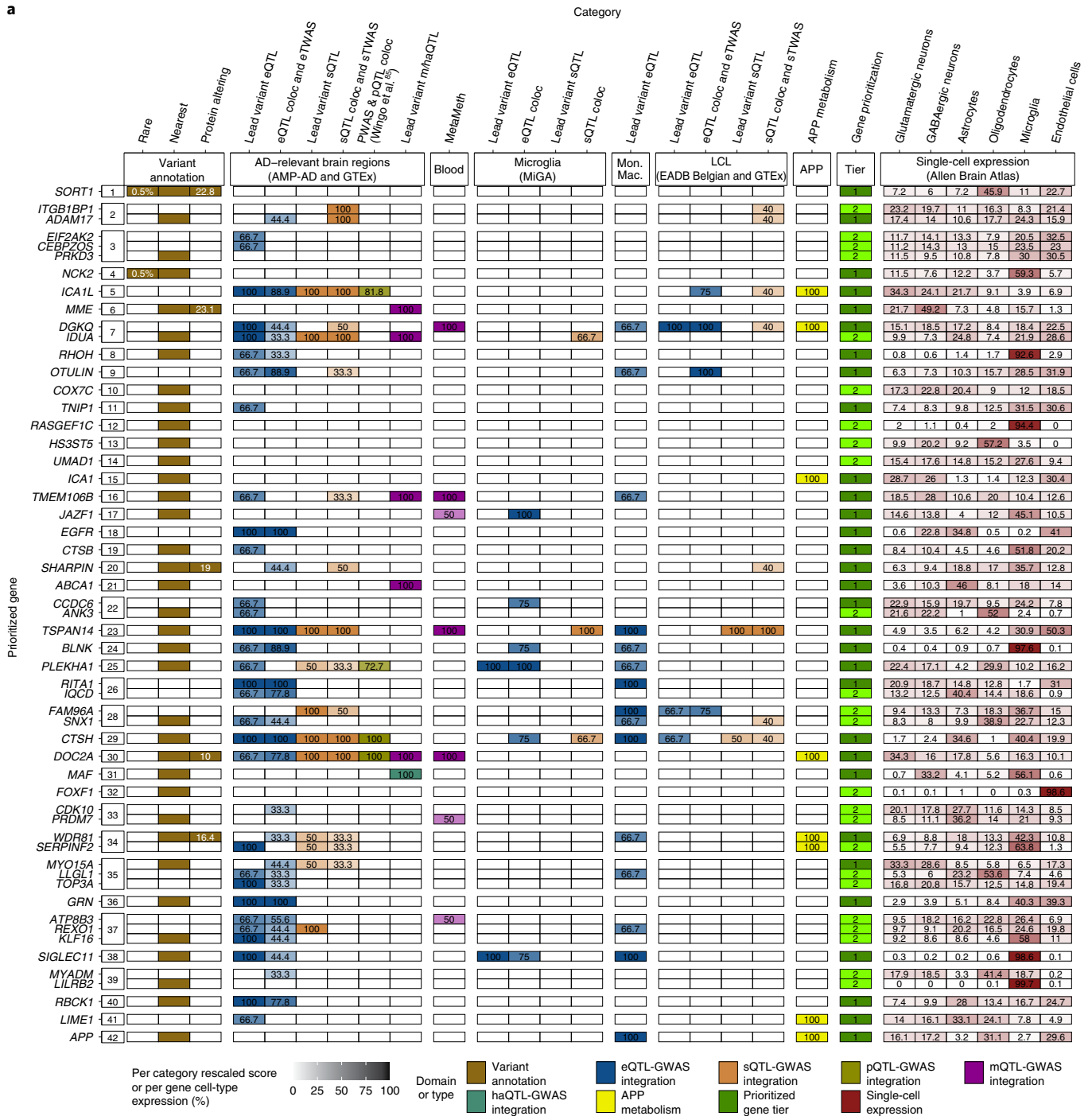
We next performed a pathway enrichment analysis of the tier 1 genes using STRING. We found that several gene sets linked to the immune system remained statistically significant after correction for multiple testing (Fig. 2b and Supplementary Table 31), especially regulation of the tumor necrosis factor (TNF)-mediated signaling pathway (GO:0010803). We report the potential genetic implication of the linear ubiquitin chain assembly complex (LUBAC), which is a major regulator of the aforementioned signaling pathway<sup>20</sup>. Two of the LUBAC's three complements are encoded by the new tier 1 prioritized genes *SHARPIN* and *RBCK1*, and the complex's function is directly regulated by *OTULIN* (also a new tier 1 prioritized gene).

## GRS

We next looked at whether the genetic ADD burden (as measured by a genetic risk score (GRS)) generated from our genome-wide significant variants ( $n = 83$ , excluding *APOE*; Supplementary Table 32) might influence the rate of conversion to AD in (1) individuals from several prospective, population-based cohorts and (2) patients with mild cognitive impairment (MCI) in prospective memory clinic studies (Supplementary Table 33). We used Cox regression models to assess the association after adjustment for age at baseline, sex, the number of *APOE*-ε4 and *APOE*-ε2 alleles, and genetic principal components (PCs).

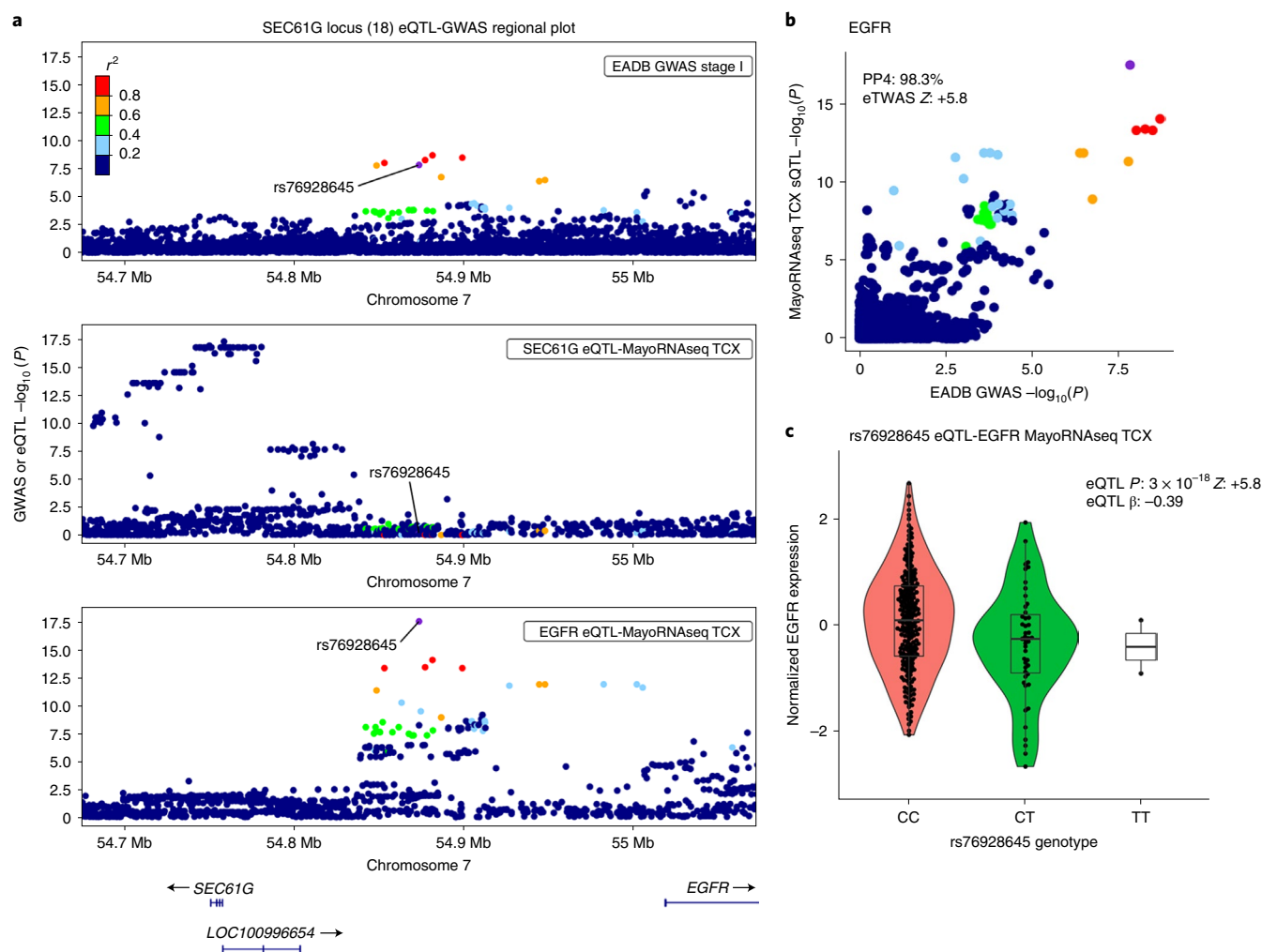
In population-based cohorts with clinically diagnosed AD cases, the GRS was significantly associated with conversion to AD; this was shown in a fixed-effect meta-analysis (hazard ratio (HR) (95%CI) per average risk allele = 1.076 (1.064–1.088),  $P = 9.2 \times 10^{-40}$ ; Fig. 5 and Supplementary Table 34). Likewise, the GRS was significantly associated with AD conversion in patients with MCI (HR = 1.056 (1.040–1.072),  $P = 2.8 \times 10^{-12}$ ; Fig. 5 and Supplementary Table 35). Furthermore, we found that the GRS association increased significantly when the new variants discovered in the present study were added to the previously described variants (Supplementary Table 36) for both population-based studies (HR = 1.052 (1.037–1.068),  $P = 1.5 \times 10^{-11}$ ) and MCI cohorts (HR = 1.034 (1.013–1.055),  $P = 1.4 \times 10^{-3}$ ).

**Fig. 2 | Gene prioritization.** **a**, Summary of weighted scores for each evidence category for the prioritized genes in the 42 new genome-wide-significant loci. Using our gene prioritization method, we considered the genes within 1 Mb of each new lead variant and prioritized a total of 55 genes in 42 new loci at two different confidence levels (31 tier 1 genes and 24 tier 2 genes). The leftmost squares indicate the new locus index number. The different types of evidence are colored according to the seven different domains to which they belonged. Weighted scores for each evidence category are rescaled to a 0–100 scale, and the proportions of mean human brain cell-type-specific expression for each gene are also rescaled to a 0–100 scale; darker colors represent higher scores or higher expression proportions. Tier 1 genes are shown in dark green, and tier 2 genes are shown in light green. Only tier 1 and tier 2 genes are shown for each locus. Supplementary Fig. 35 shows full results. MAFs and CADD (v1.6) PHRED scores for rare and/or protein-altering rare variants are labeled in white within the respective squares. **b**, Pathway enrichment analysis based on the tier 1 gene list. Only the ten strongest associations (according to STRING software) are presented here. coloc, colocalization; eQTL, expression QTL; eTWAS, expression transcriptome-wide association study; GO, Gene Ontology; haQTL, histone acetylation QTL; Mon. Mac., monocytes and macrophages; sTWAS, splicing transcriptome-wide association study; m/haQTL, methylation/histone acetylation QTL; sQTL, splicing QTL; FDR, false discovery rate.



**b**

GO term	Term description	Number of tier 1 genes	Number of genes in pathway	FDR	Matching proteins in the network
GO:0001775	Cell activation	12	1,024	$4.09 \times 10^{-5}$	GRN, CTSH, BLNK, NCK2, DGKQ, EGFR, APP, ADAM17, CTBS, RHOH, TSPAN14, MME
GO:0002376	Immune system process	15	2,370	$2.60 \times 10^{-4}$	GRN, CTSH, BLNK, NCK2, OTULIN, APP, LIME1, ADAM17, TNIP1, CTBS, RBCK1, PLEKHA1, RHOH, TSPAN14, MME
GO:0009966	Regulation of signal transduction	17	3,033	$2.60 \times 10^{-4}$	GRN, CTSH, BLNK, NCK2, DGKQ, EGFR, OTULIN, APP, ADAM17, TNIP1, RBCK1, PLEKHA1, ABCA1, RHOH, SHARPIN, TSPAN14, RITA1
GO:0010646	Regulation of cell communication	18	3,327	$2.60 \times 10^{-4}$	GRN, CTSH, BLNK, NCK2, DGKQ, EGFR, OTULIN, APP, ADAM17, TNIP1, RBCK1, PLEKHA1, ABCA1, RHOH, ICA1, SHARPIN, TSPAN14, RITA1
GO:0023051	Regulation of signaling	18	3,360	$2.60 \times 10^{-4}$	GRN, CTSH, BLNK, NCK2, DGKQ, EGFR, OTULIN, APP, ADAM17, TNIP1, RBCK1, PLEKHA1, ABCA1, RHOH, ICA1, SHARPIN, TSPAN14, RITA1
GO:0045321	Leukocyte activation	10	894	$2.60 \times 10^{-4}$	GRN, CTSH, BLNK, NCK2, APP, ADAM17, CTBS, RHOH, TSPAN14, MME
GO:0048583	Regulation of response to stimulus	19	3,882	$2.60 \times 10^{-4}$	GRN, CTSH, BLNK, NCK2, DGKQ, EGFR, OTULIN, APP, LIME1, ADAM17, TNIP1, RBCK1, PLEKHA1, ABCA1, RHOH, SHARPIN, TSPAN14, SIGLEC11, RITA1
GO:0048584	Positive regulation of response to stimulus	14	2,054	$2.60 \times 10^{-4}$	CTSH, BLNK, NCK2, EGFR, OTULIN, APP, LIME1, ADAM17, TNIP1, RBCK1, PLEKHA1, SHARPIN, TSPAN14
GO:0010803	Regulation of TNF-mediated signaling pathway	4	56	$4.30 \times 10^{-4}$	OTULIN, ADAM17, RBCK1, SHARPIN
GO:0042058	Regulation of EGFR signaling pathway	4	80	$1.50 \times 10^{-3}$	NCK2, EGFR, APP, ADAM17



**Fig. 3 | Regulation of EGFR expression by the ADD-risk-associated and colocalized brain eQTLs within the intergenic SEC61G locus.** **a**, The regional plot of the new SEC61G locus (L18) shows the EADB GWAS stage I ( $n = 487,511$ ) ADD association signal within 200 kb of the intergenic lead variant, rs76928645 (the two closest protein-coding genes, SEC61G and EGFR, are more than 100 kb from the lead variant), together with the eQTLs in the same region identified for SEC61G and EGFR expression separately in the TCX (MayoRNAseq TCX eQTL catalog based on  $n = 259$  individuals). The rs76928645 lead variant is shown in purple, and LD  $r^2$  values (calculated for the EADB Trans-Omics for Precision Medicine (TOPMed) dataset ( $n = 42,140$ ) with respect to the lead variant) are indicated on a color scale. y axis,  $-\log_{10}$  for the GWAS or eQTL  $P$  value; x axis, hg38 genomic position on chromosome 7. **b**, Colocalization between the EGFR eQTL signal (MayoRNAseq TCX,  $n = 259$  individuals) and the EADB GWAS stage I ( $n = 487,511$ ) signal (eQTL coloc PP4 = 98.3%); with the significant eTwas association (eTwas  $P = 6.9 \times 10^{-9}$  and eTwas  $Z = 5.8$ ) and fine-mapped (FOCUS PIP = 1) eTwas association in the same catalog. y axis, eQTL  $-\log_{10}(P)$  value; x axis, GWAS  $-\log_{10}(P)$  value. LD  $r^2$  values and color scales are as in **a**. **c**, The eQTL violin plot shows a significant association (eQTL  $P = 3 \times 10^{-18}$ ) between the rs76928645 lead variant genotype and EGFR expression in the TCX (MayoRNAseq TCX,  $n = 259$  individuals), where the protective allele T is associated with lower EGFR expression (eQTL  $\beta$ ,  $-0.39$ ). Each data point represents a sample whose normalized EGFR expression value is indicated on the y axis, and the rs76928645 genotype information is indicated on the x axis. The lower and upper hinges of the boxes represent the first and third quartiles, the whiskers extend 1.5 times the interquartile range from the hinges and the line represents the median.

Importantly, the results of our meta-analysis suggest that the risk of conversion to AD rises with the number of risk alleles from non-APOE risk variants in the GRS by 1.9-fold in population-based cohorts (HR = 1.93 (1.75–2.13); Fig. 5) and 1.6-fold in MCI cohorts (HR = 1.63 (1.42–1.87); Fig. 6) on top of effects of age and the APOE  $\epsilon 4$  allele. These observations result from the comparison of hypothetical individuals with a GRS value at the first decile of the distribution versus those with a GRS value at the ninth decile (Fig. 6). With regard to APOE, carrying an additional APOE- $\epsilon 4$  allele was associated with a slightly higher increase in the AD risk in population-based cohorts (HR = 2.19 (2.03–2.37)) and MCI cohorts (HR = 1.90 (1.73–2.07)). There was no interaction between the GRS and the number of APOE- $\epsilon 4$  alleles (Supplementary Table 37).

In an MCI cohort setting, this effect of the GRS corresponds to a median AD conversion probability within 3 years of 21.9% in patients with a GRS below the first decile (range, 4.1–34.9%) and 37.5% (range, 10.8–56.2%) in patients with a GRS above the ninth decile. There was a consistent increase in probability between these deciles in all cohorts (median (range), 13.8% (6.6–25.0%); Supplementary Table 38).

To better define the GRS discriminative ability regarding AD conversion, we assessed the improvements in three indices of predictive performance after adding the GRS to a Cox model containing age, sex, PCs and the number of APOE- $\epsilon 4$  and APOE- $\epsilon 2$  alleles as covariates (Supplementary Tables 34 and 35). We found a small but consistent increase in the discrimination between AD converters and nonconverters, as indicated by the concordance index (C-index) in



population-based cohorts ( $\Delta_{5\text{years}}\text{-C-index}_{\text{fixed-effects}} = 0.002$  (0.0004–0.004)) and MCI cohorts ( $\Delta_{3\text{years}}\text{-C-index}_{\text{fixed-effects}} = 0.007$  (0.001–0.012)). This finding was further supported by small-to-moderate increases in the continuous NRI (net reclassification improvement) index in population-based cohorts ( $\text{NRI}_{5\text{year-fixed-effects}} = 0.248$  (0.159–0.336)) and MCI cohorts ( $\text{NRI}_{3\text{year-fixed-effects}} = 0.232$  (0.140–0.325)); this indicates that the risk assignment is more appropriate to individuals when the GRS is taken into account<sup>21</sup>. Furthermore, an increase in the index of prediction accuracy (IPA) was observed in all of the population-based cohorts (average  $\Delta_{5\text{years}}\text{-IPA}_{\text{fixed-effects}} = 0.29\%$  (0.23%–0.35%)) and all but one of the MCI cohorts (average  $\Delta_{3\text{years}}\text{-IPA}_{\text{fixed-effects}} = 1.53\%$  (1.31%–1.76%)), indicating an overall improvement in predictive performance. As expected, the amount of improvement in this index varied greatly from one cohort to another, given its dependency on incidence rates. The value of adding the new genetic variants was emphasized by the fact that effect sizes (as measured by the indices of predictive ability) were lower when only previously known AD risk variants were included in the GRS (Supplementary Table 39).

The results were similar when we (1) computed indices for other follow-up time points, (2) applied a random effects meta-analysis, (3) considered conversion to all-cause-dementia as the outcome and (4) excluded the Framingham Heart Study (FHS), as it was part of the stage II of the GWAS from which ORs for PRS computation were extracted (Supplementary Tables 34–44 and Supplementary Fig. 47).

## Discussion

Our meta-analysis combined a large, new case–control study with previous GWASs. We identified 75 independent loci for ADD; 33 had been reported previously, and 42 correspond to new signals at the time of this analysis. The prioritized genes and their potential impact on the pathophysiology of AD are described in the Supplementary Note.

Our pathway enrichment analyses removed ambiguities concerning the involvement of tau-binding proteins and APP/A $\beta$  peptide metabolism in late-onset AD processes at a much higher level than had been described previously<sup>5</sup>. It is noteworthy that new genetic risk factors are often first evaluated in the context of known pathways; many new research approaches were developed to systematically characterize putative links among APP metabolism, tau function and ADD genetic risk factors<sup>22,23</sup>. This approach can lead to circular reasoning and thus artificial enrichment in specific processes. However, we implicate *ADAM17*, a gene whose protein product is known to carry  $\alpha$ -secretase activity as *ADAM10* (ref. <sup>24</sup>). This observation suggests that the nonamyloidogenic pathway for APP metabolism might be deregulated in AD. In addition to *APP*, we also identified six highly plausible prioritized (tier 1) genes (*ICA1L*, *DGKQ*, *ICA1*, *DOC2A*, *WDR81* and *LIME1*) that are likely to modulate the metabolism of APP.

These pathway enrichment analyses also confirmed the involvement of innate immunity and microglial activation in ADD (Supplementary Table 15). Our single-cell expression enrichment analysis also highlighted genes expressed in microglia (Supplementary Tables 16 and 17). Indeed, three of our prioritized (tier 1) genes (*RHOH*, *BLNK* and *SIGLEC11*) and two of our tier 2 genes (*LILRB2* and *RASGE1FC*) appeared to be mainly expressed in microglia (>90% relative to the total expression summed across cell types; Fig. 2a and Supplementary Table 45). Importantly, *SIGLEC11* and *LILRB2* have already been linked to A $\beta$  peptides/amyloid plaques<sup>25,26</sup>.

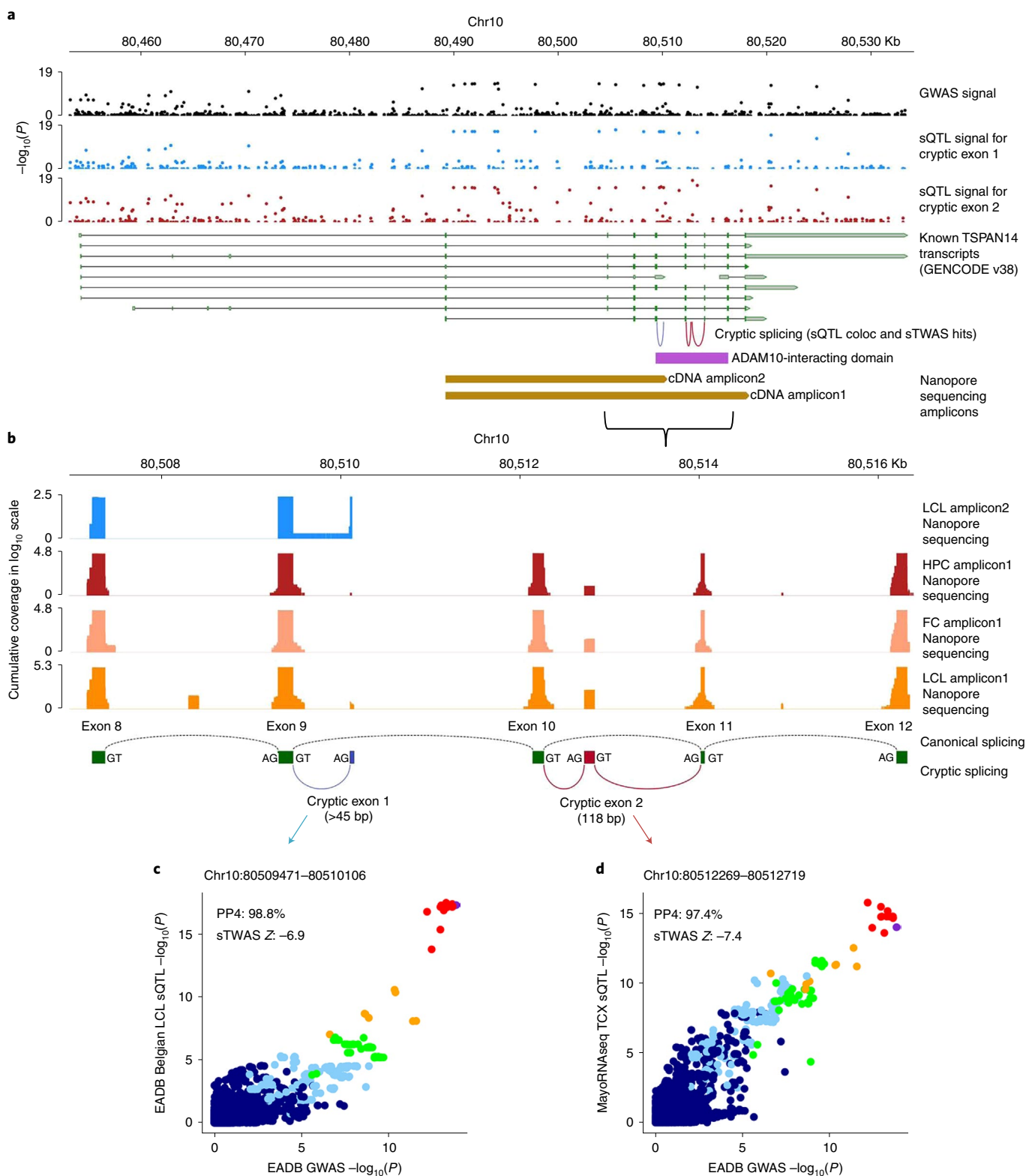
Here, we also provide genetic evidence of the LUBAC's potential implication in ADD. Two of the LUBAC's three complements are encoded by *SHARPIN* and *RBCK1*, and the LUBAC is regulated by *OTULIN*; all three genes were found to be high-confidence, prioritized risk genes in our study. The LUBAC is the only E3 ligase known to form linear ubiquitin chains de novo through ubiquitin's N-terminal methionine. The complex has mostly been studied in the context of inflammation, innate immunity and defense against intracellular pathogens. For instance, the LUBAC is reportedly essential for NLRP3 inflammasome activation<sup>27</sup> and thus acts as a key innate immune regulator<sup>28</sup>. In turn, the NLRP3 inflammasome is essential for the development and progression of A $\beta$  pathology in mice<sup>29</sup> and may drive tau pathology through A $\beta$ -induced microglial activation<sup>30</sup>. The LUBAC is also reportedly involved in autophagy, and linear ubiquitin chain modifications of TDP-43-positive neuronal cytoplasmic inclusions have been described as potential inducers of autophagic clearance<sup>31</sup>. Lastly, the LUBAC has been studied as a regulator of TNF- $\alpha$  signaling in particular<sup>20</sup>.

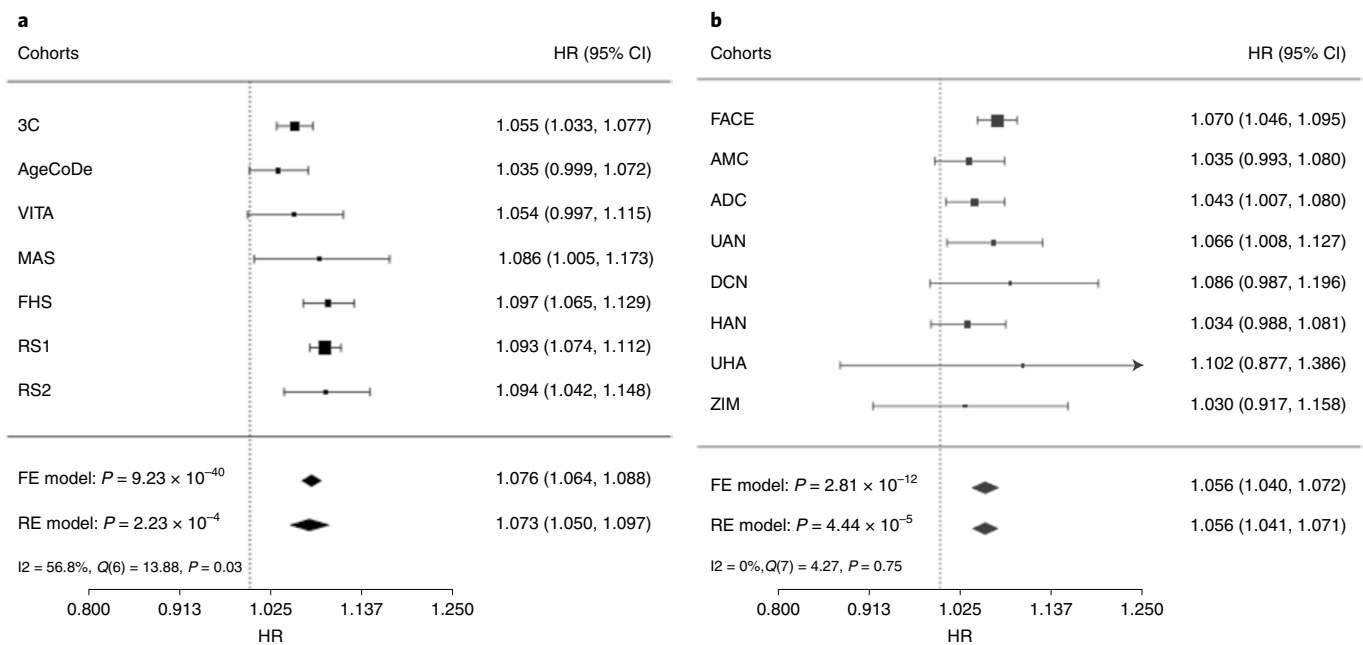
Interestingly, the TNF- $\alpha$  signaling pathway was also flagged by other genetic findings in our study (Supplementary Fig. 48). For example, *ADAM17* (also known as TNF- $\alpha$ -converting enzyme) is of pivotal importance in the activation of TNF- $\alpha$  signaling<sup>32</sup>. For *TNIP1*, its gene product (TNF- $\alpha$ -induced protein 3-interacting protein 1) is involved in the inhibition of the TNF- $\alpha$  signaling pathway and nuclear factor  $\kappa$ B activation/translocation<sup>33</sup>. Additional signal related to TNF- $\alpha$  is the one found at *SPPL2A* (one of the 33 confirmed loci). The protein encoded by *SPPL2A* is involved in non-canonical shedding of TNF- $\alpha$ <sup>34</sup>, and *PGRN* has been described as a TNF receptor ligand and an antagonist of TNF- $\alpha$  signaling<sup>35</sup>. Several lines of evidence had linked the inhibition of TNF- $\alpha$  signaling with reduction of both A $\beta$  and tau pathologies in vivo<sup>36,37</sup>. Although a potential inflammatory connection has been suggested for TNF- $\alpha$  through the activation of NLRP3 inflammasome<sup>38</sup>, the TNF- $\alpha$  signaling pathway is also involved in many other brain physiological functions (e.g., synaptic plasticity in neurons) and pathophysiological processes (e.g., synapse loss) in the brain<sup>39</sup>. Furthermore, the involvement of the TNF- $\alpha$  signaling pathway and the LUBAC might be important in cell types other than microglia in AD. It is important

**Fig. 4 | Focus on *TSPAN14* locus.** **a**, Splicing QTL (sQTL)-GWAS integration results. Known *TSPAN14* transcripts (GENCODE v38; green, coding sequences; gray, noncoding) plotted with  $-\log_{10}(P)$  for (1) EADB GWAS stage I ( $n = 487,511$ ) signal (black), (2) sQTL signal for chr10:80509471–80510106 junction (supporting cryptic exon 1) in the EADB Belgian LCL sQTL catalog ( $n = 70$  individuals, blue) and (3) sQTL signal for chr10:80512269–80512719 junction in the MayoRNAseq TCX sQTL catalog ( $n = 259$  individuals, red); hg38 genomic position is shown above. LCL and brain-based sQTL coloc and sTAS analyses associate ADD risk with these junctions that suggest cryptic splicing within ADAM10-interacting domain of *TSPAN14* (magenta), which was predicted to result in two cryptic exons. **b**, Long-read sequencing validation of *TSPAN14* cryptic exons. Nanopore sequencing results (Supplementary Note) in the zoomed-in region of chr10:80506973–80516400 (cumulative coverage in  $\log_{10}$  scale). Pooled LCL cDNA sample sequenced for cDNA Amplicon2 shown in blue. cDNA Amplicon1 was sequenced on biologically independent hippocampal (HPC;  $n = 16$ , red), frontal cortex (FC;  $n = 18$ , pink) and LCL ( $n = 59$ , orange) cDNA samples. Green, canonical exons (8–12); dotted black lines, canonical splicing; blue, cryptic exon 1 (>45 bp); red, cryptic exon 2 (118 bp). All annotated junctions use canonical splice donor (GT) and acceptor (AG) sites. **c,d**, sQTL-GWAS colocalization plots for chr10:80509471–80510106 (supporting cryptic exon 1) in the EADB Belgian LCL sQTL catalog ( $n = 70$  individuals) (**c**) and chr10:80512269–80512719 (supporting cryptic exon 2) in the MayoRNAseq TCX sQTL catalog ( $n = 259$  individuals) (**d**). sQTL signals for the two junctions colocalize with ADD signal (PP4s of 98.8% and 97.4%, respectively), and sTAS associates with increased preference for the cryptic splicing with decreased ADD risk (sTAS  $P = 6.28 \times 10^{-12}$  and  $1.6 \times 10^{-13}$ , sTAS  $Z = -6.9$  and  $-7.4$ , respectively). y axis, sQTL  $-\log_{10}(P)$ ; x axis, EADB GWAS stage I  $-\log_{10}(P)$ . LD  $r^2$  values calculated within EADB-TOPMed dataset ( $n = 42,140$ ) based on the lead variant rs6586028 (purple) are indicated on a color scale.

to note that six of our prioritized (tier 1) genes (*ICA1L*, *EGFR*, *RITA1*, *MYO15A*, *LIME1* and *APP*) are expressed at a low level in microglia (<10%, relative to the total expression summed across cell types; Supplementary Table 45), emphasizing that ADD results from complex crosstalk between different cell types in the brain<sup>23,40</sup>. It is also noteworthy that the EGFR pathway is known to interact with the TNF- $\alpha$  signaling pathway<sup>41</sup>, which suggests interplay between the two signaling pathways during the ADD development.

A better understanding of the etiology of ADD might also result from the observation that the risks of developing ADD and frontotemporal dementia are associated with the same causal variants in *GRN* and *TMEM106B*. This association might be due to the misclassification of clinical diagnosis of AD and the presence of proxy-ADD cases in the UKBB. However, *GRN* and *TMEM106B* have also been linked to brain health and many other neurodegenerative diseases. For instance, *GRN* and *TMEM106B* are reportedly potential genetic





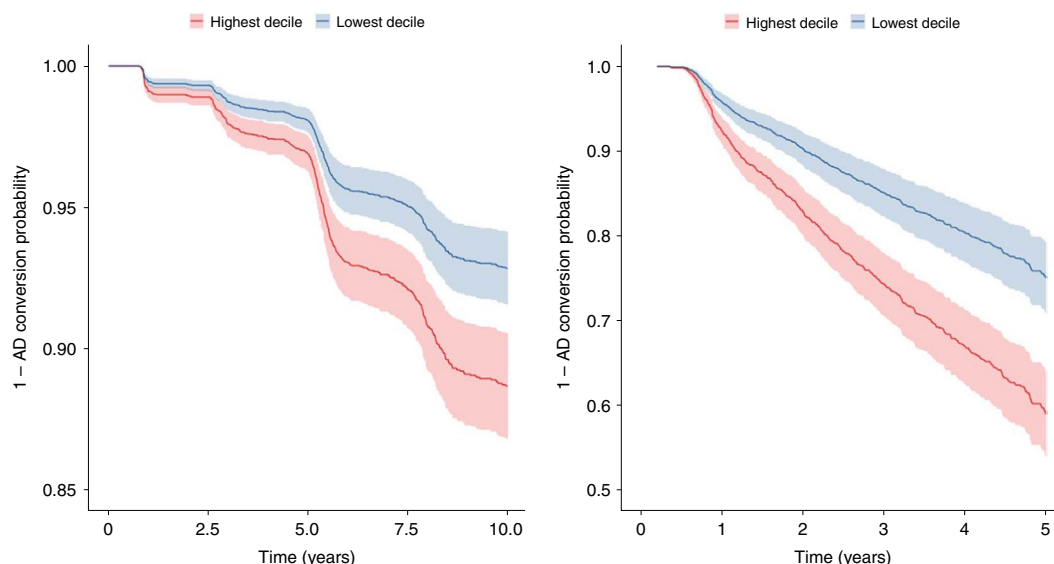
**Fig. 5 | Association between the GRS and the risk of progression to AD. a, b**, Meta-analysis results of the association between the GRS and the risk of progression to AD in population-based cohorts ( $n=17,545$  independent samples) (**a**) and MCI cohorts ( $n=4,114$  independent samples) (**b**). Data are presented as HR together with 95% CIs derived from Cox regression analyses for each individual cohort. HRs indicate the effect of the GRS as the increment in the AD risk associated with each additional average risk allele in the GRS. Null hypothesis testing is based on a meta-analysis of individual cohort effects using fixed effects (FE) and random effects (RE) models. Resulting HRs and 95% CIs and the respective Z test and associated two-sided  $P$  value are shown at the bottom of the figure. Heterogeneity between cohorts is indicated by the  $I^2$  index together with the respective Cochran's  $Q$  statistic (distributed as  $\chi^2$  statistic), associated degrees of freedom and  $P$  value. 3C, Three-City Study; AgeCoDe, German study on aging cognition and dementia; AMC, additional, independent memory clinic cohort from Fundacio ACE; DCN, German Dementia Competence Network study; FACE, Fundacio ACE memory clinic cohort; FHS, Framingham Heart Study; HAN, BALTAZAR multicenter prospective memory clinic study; MAS, Sydney Memory and Ageing Study; RS1, Rotterdam Study first cohort; RS2, Rotterdam Study second cohort; VITA, Vienna Transdanube Aging study; UAN, memory clinic cohort from the Hospital Network Antwerp; UHA, University of Halle memory clinic cohort; ZIM, Heidelberg/Mannheim memory clinic sample.

risk factors for differential aging in the cerebral cortex<sup>42</sup> and cognitive impairment in amyotrophic lateral sclerosis<sup>43</sup> and Parkinson's disease<sup>44,45</sup>. Lastly, both *GRN* and *TMEM106B* have already been associated with neuropathological features of AD<sup>46–48</sup>. Taken as a whole, these data may thus emphasize a potential continuum between neurodegenerative diseases in which common pathological mechanisms are driven by *GRN* and *TMEM106B*. Interestingly, both *GRN* and *TMEM106B* are reported to be involved in defective endosome/lysosome trafficking/function<sup>49,50</sup>, a defect that is also observed in AD.

By applying a GRS derived from all the genome-wide-significant variants discovered in this study, we identified an association with the risk of incident AD in prospective population-based cohorts and with the risk of progression over time from MCI to AD (Fig. 5 and Supplementary Table 33). In patients with MCI, previous associations of AD risk with a GRS built on previously known genetic AD risk variants has been inconsistent<sup>51</sup>. It is important to note that the GRS has an impact on the AD risk in addition to that of age and that the GRS's effect is independent of *APOE* status. With a view to translating genetic findings into preventive measures and personalized medicine, we also sought to provide the GRS's added value for risk prediction by calculating the discriminative capacity through three different indices. Overall, the indices suggested that the effect size for the association between the GRS and AD was small but significant. Despite this modest effect, the inclusion of the GRS into the predictive model consistently improved the assignment of the risk of progression, as expressed by the net reclassification improvement (NRI) index<sup>21</sup>. Importantly, the cumulative improvements in risk prediction (due to inclusion of the new variants in the GRS) led

to a 1.6- to 1.9-fold increase in the AD risk from the lowest to the highest decile, in addition to the effects of age and *APOE* status. We also showed that in addition to known risk variants, the new risk variants identified in the present study are significantly associated with progression to AD. The results of future GWASs are expected to further improve AD-risk prediction. Hence, the GRS will help to sharpen the threshold that differentiates between people at risk of progressing to dementia and those who are not.

A recent study estimated that fewer than 100 causal common variants may explain the entire AD risk<sup>32</sup>; if that estimate is correct, then our study might have already characterized a large proportion of this genetic component due to common variants. However, several reasons strongly underscore the need for additional efforts to fully characterize the still-missing AD genetic component. First, it is probable that additional, yet-unknown loci bear common variants modulating the risk for AD. Second, identification of rare variants with very low frequencies is a major challenge for genetic studies, because available samples with sequencing data in AD are underpowered. Notably, almost all the genes with rare variants associated with AD risk also present common variants associated with AD risk (i.e., *TREM2*, *SORL1*, *ABCA7*, *ABCA1*, *PLCγ2* and *ADAM10*)<sup>53</sup>. Third, gene–gene and gene–environment interactions have not yet been studied in detail. Hence, by increasing the GWAS sample size and improving imputation panels, conventional and (above all) more complex analyses will have more statistical power and should enable the characterization of associations with rare/structural variants. Lastly, higher-powered GWASs of multiethnicity populations will be particularly welcome for characterizing potential new genetic risk factors, improving fine-mapping approaches and developing



**Fig. 6 | Risk of progression to AD according to the GRS. a,b**, Representative plots of the progression to AD over 10 years in the population-based 3C study (**a**) and the progression from MCI to AD over 5 years in the Fundació ACE cohort (**b**). The figures show the probabilities of conversion (survival probabilities) to AD (y axes) for a hypothetical participant with average covariates (mean values for age and PCs, and the mode for sex and *APOE*) and GRS at the first (lowest) decile (in blue) or a GRS at the ninth (highest) decile (red). The shaded regions correspond to the 95% CI.

specific GRSs (because GRSs developed with European-ancestry populations are known to be less effective with other ancestries).

In conclusion, we have validated 33 previous loci, doubled the total number of genetic loci associated with the ADD risk, expanded our current knowledge of the pathophysiology of ADD, identified new opportunities for the development of GRSs and gene-specific treatments and opened up a pathway to translational genomics and personalized medicine.

### Online content

Any methods, additional references, Nature Research reporting summaries, source data, extended data, supplementary information, acknowledgements, peer review information; details of author contributions and competing interests; and statements of data and code availability are available at <https://doi.org/10.1038/s41588-022-01024-z>.

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## Methods

**Samples.** All of our stage I meta-analysis samples came from the following consortia/datasets: EADB, GR@ACE, EADI, GERAD/PERADES, DemGene, Bonn, the Rotterdam study, the CCHS study, NxG and the UKBB. In the UKBB, individuals who did not report dementia or any family history of dementia were used as controls; the analysis included 2,447 diagnosed cases, 46,828 proxy cases of dementia and 338,440 controls. All individuals included in stage I are of European ancestry; demographic data on these case-control studies are summarized in Supplementary Table 1, and more detailed descriptions are available in the Supplementary Note. Stage II samples are from the ADGC, CHARGE and FinnGen consortia (Supplementary Table 1 and Supplementary Note) and are described in detail elsewhere<sup>5,6,9,10,54–56</sup>. Written informed consent was obtained from study participants or, for those with substantial cognitive impairment, a caregiver, legal guardian or other proxy. Study protocols for all cohorts were reviewed and approved by the appropriate institutional review boards.

**Quality control and imputation.** A standard quality control was performed on variants and samples from all datasets individually. The samples were then imputed with the TOPMed reference panel<sup>57,58</sup>. The Haplotype Reference Consortium (HRC) panel<sup>59</sup> was also used for some datasets (Supplementary Table 2). For the UKBB, we used the provided imputed data generated from a combination of the 1000 Genomes, HRC and UK10K reference panels (Supplementary Note).

**Stage I analyses.** Tests of the association between clinical or proxy-ADD status and autosomal genetic variants were conducted separately in each dataset by using logistic regression and an additive genetic model, as implemented in SNPTEST 2.5.4-beta3 (ref. <sup>60</sup>) or PLINK v1.90 (ref. <sup>4</sup>). However, a logistic mixed model (as implemented in SAIGE v0.36.4 (ref. <sup>61</sup>)) was considered for the UKBB data. We analyzed the genotype probabilities in SNPTEST (using the newml method) and dosages in PLINK and SAIGE. Analyses were adjusted for PCs and genotyping centers, when necessary (Supplementary Table 2). For the UKBB dataset, only variants with a MAF above 0.01% and a minor allele count (MAC) above 3 were analyzed, and effect sizes and standard errors were corrected by a factor of two, because proxy cases were analyzed. This approach is appropriate for variants with a moderate-to-high frequency and a small effect size. For all datasets, we filtered out duplicated variants and variants with (1) missing data on the effect size, standard error or *P* value; (2) an absolute effect size above 5; (3) an imputation quality below 0.3; and (4) a value below 20 for the product of the MAC and the imputation quality (MAC-info score). For datasets not imputed with the TOPMed reference panel, we also excluded (1) variants for which conversion of position or alleles from the GRCh37 assembly to the GRCh38 assembly was not possible or problematic or (2) variants with very large difference of frequency between the TOPMed reference panel and the reference panels used to perform imputation.

Results were then combined across studies in a fixed-effect meta-analysis with an inverse-variance weighted approach, as implemented in METAL v2011-03-25 software<sup>62</sup>. We filtered out (1) variants with a heterogeneity *P* value below  $5 \times 10^{-8}$ , (2) variants analyzed in less than 20% of the total number of cases and (3) variants with frequency amplitude above 0.4 (defined as the difference between the maximum and minimum frequencies across all the studies). We also excluded variants not analyzed in the EADB-TOPMed dataset.

The genomic inflation factor lambda was computed with the GenABEL 1.8-0 R package<sup>63</sup> and a median approach after exclusion of the *APOE* region (44–46 Mb on chromosome 19 in GRCh38). The LD score regression intercept was computed with LDSC v1.0.1 software using the ‘baselineLD’ LD scores built from 1000 Genomes phase 3 (ref. <sup>64</sup>). The analysis was restricted to HapMap 3 variants and excluded multiallelic variants, variants without an rs ID and variants in the *APOE* region.

**Definition of associated loci.** A region of  $\pm 500$  kb was defined around each variant with a stage I *P* value below  $1 \times 10^{-5}$ . These regions were then merged (using bedtools v2.27.0 software; <https://bedtools.readthedocs.io/en/latest/>) to define nonoverlapping regions. The region corresponding to the *APOE* locus was excluded. We then used the PLINK clumping procedure to define independent hits in each region. An iterative clumping procedure was applied to all variants with a stage I *P* value below  $1 \times 10^{-5}$ , starting with the variant with the lowest *P* value (referred to as the index variant). Variants with a stage I *P* value below  $1 \times 10^{-5}$ , located within 500 kb of this index variant and in LD with the index variant ( $r^2$  above 0.001) were assigned to the index variant's clump. The clumping procedure was then applied until all the variants had been clumped. LD in the EADB-TOPMed dataset was computed using high-quality (probability  $\geq 0.8$ ) imputed genotypes.

**Stage II analyses.** Variants with a stage I *P* value below  $1 \times 10^{-5}$  were followed up (Supplementary Note). Results were combined across all stage I and II studies in a fixed-effect meta-analysis with an inverse variance weighted approach, as implemented in METAL. In each clump, we then reported the variants with positive follow-up results (i.e., the same direction of effect in stage I and stage II, and a stage II *P* value below 0.05) and the lowest *P* value in the meta-analysis. Those variants were considered to be associated at the genome-wide significance

level if they had a *P* value below  $5 \times 10^{-8}$  in the stage I and II meta-analysis. However, we excluded the chr6:32657066:G:A variant, because its frequency amplitude was high.

**Pathway analysis.** A total of 10,271 gene sets were considered for analysis (Supplementary Note). Gene set enrichment analyses were performed in MAGMA v1.08 (refs. <sup>65,66</sup>), with correction for the number of variants in each gene, LD between variants and LD between genes. LD was computed from the EADB-TOPMed dataset using high-quality (probability  $\geq 0.9$ ) imputed genotypes. The measure of pathway enrichment was the MAGMA ‘competitive’ test (in which the association statistic for genes in the pathway is compared with those for all other protein-coding genes), as recommended by De Leeuw et al.<sup>67</sup>. We used the ‘mean’ test statistic, which uses the sum of  $-\log(\text{variant } P \text{ value})$  across all genes. The primary analysis assigned variants to genes if they lay within the gene boundaries, although a secondary analysis used a window of 35 kb upstream and 10 kb downstream to assign variants to genes (as in Kunkle et al.<sup>5</sup>). The primary analysis included all variants with an imputation quality above 0.8. We used *q* values<sup>68</sup> to account for multiple testing.

**Expression in various cell types.** The expression of genes was assigned to specific cell classes of the adult brain, as described previously<sup>69</sup>. Briefly, middle temporal gyrus single-nucleus transcriptomes from the Allen Brain Atlas dataset (49,555 total nuclei derived from 8 human tissue donors aged 24–66 years) were used to annotate and select six main cell classes using Seurat 3.1.1 (ref. <sup>70</sup>): glutamatergic neurons, GABAergic neurons, astrocytes, oligodendrocytes, microglia and endothelial cells. Enrichment analyses were performed by using the mean gene expression per nucleus for each cell type relative to the total expression summed across cell types as a quantitative covariate in a MAGMA gene property analysis.

**Functional interpretation of GWAS signals and gene prioritization.** To prioritize candidate genes in the new loci, we systematically searched for evidence for these genes in seven different domains: (1) variant annotation, (2) eQTL-GWAS integration, (3) sQTL-GWAS integration, (4) protein QTL (pQTL)-GWAS integration, (5) mQTL-GWAS integration, (6) histone acetylation QTL (haQTL)-GWAS integration and (7) APP metabolism. On the basis of this evidence, we then defined a gene prioritization score of between 0 and 100 for each candidate gene (Supplementary Fig. 34). Detailed information on the domains, categories (e.g., the tissue or cell type for QTL-GWAS integration domains) and subcategories (for the type of evidence) is given in Supplementary Table 19. A brief summary of how evidence was assessed in each domain is provided below, together with a detailed description of the gene prioritization strategy.

**Candidate genes.** We considered protein-coding candidate genes within a  $\pm 1$ -Mb window of the new lead variants. The genes in overlapping loci (i.e., L28, L30 and L37) were assigned to their respective loci based on proximity to the lead variants, and the distal genes were not considered for gene prioritization in the investigated loci. Moreover, we did not perform gene prioritization in the complex IGH gene cluster locus (L27), as this telomeric region contains complex splicing events (spanning a high number of IGH genes) that probably result from known fusion events<sup>18</sup>.

**The variant annotation domain.** In this domain, we determined whether the candidate gene was the nearest protein-coding gene to the lead variant and/or whether the lead variant was a rare variant (MAF < 1%) and/or protein-altering variant of the investigated candidate gene.

**Molecular QTL-GWAS integration domains.** To study the downstream effects of new ADD-associated variants on molecular phenotypes (i.e., expression, splicing, protein expression, methylation and histone acetylation) in various AD-relevant tissues, cell types and brain regions, molecular *cis*-QTL information (i.e., the genetic variants that regulate these molecular phenotypes) was integrated with the stage I ADD GWAS results in genetic colocalization analyses, TWASs and a genetically driven DNA methylation scan. These molecular QTLs include eQTLs, sQTLs, pQTLs, mQTLs and haQTLs. We mapped and prepared eQTL/sQTL catalogs in AD-relevant bulk brain regions from AMP-AD cohorts<sup>51–74</sup> and in LCLs from the EADB Belgian cohort. We used additional eQTL/sQTL information in AD-relevant bulk brain regions from GTEx<sup>75</sup> and microglia from the MiGA study<sup>76</sup>. Furthermore, eQTLs in monocytes and macrophages from various datasets<sup>77–82</sup> (as prepared by eQTL Catalogue<sup>83</sup>) were included in the analyses. Data on pQTLs<sup>84</sup>, mQTLs<sup>85</sup> and haQTLs<sup>85</sup> were available for DLPCF. Using each molecular QTL catalogue, the effect of the lead variants was queried and significant associations were reported. Moreover, genetic colocalization studies were conducted by comparing ADD association signals with the eQTL/sQTL signals from AMP-AD bulk brain, MiGA microglia and EADB LCL cohorts. We also conducted eTWASs and splicing TWASs (sTWAS) of the ADD risk, along with fine mapping of the eTWAS results. To this end, we trained functional expression and splicing reference panels based on the AMP-AD bulk brain and EADB LCL cohorts, and we leveraged precalculated reference panel weights<sup>86</sup> for the GTEx dataset<sup>75</sup> in tissues and cells of interest. Lastly, for the mQTL-GWAS integration



domain, we also tested for associations between ADD and genetically driven DNA methylation (MetaMeth analysis) in blood (with blood–brain methylation correlation estimates obtained from BECON<sup>87</sup>) using the procedures described by Freytag et al.<sup>88</sup> and Barbeira et al.<sup>89</sup>. A detailed description of the datasets and methods used for each of these analyses is given in the Supplementary Note.

**APP metabolism domain.** We assessed the functional impact of gene underexpression on APP metabolism for all candidate genes based on a genome-wide high-content short interfering RNA screen<sup>17</sup> (Supplementary Note).

**Gene prioritization score.** We computed a gene prioritization score for each candidate gene as the weighted sum of the evidence identified in the seven domains. We specified a weight for each type of evidence, as detailed in Supplementary Table 19. For the molecular QTL–GWAS integration domains, we gave more weight to replicated hits (i.e., evidence in several datasets) than to single hits. We also gave more weight to hits observed in brain (the bulk brain and microglia datasets) than to hits observed in other tissues/cell types (LCLs, monocytes, macrophages and blood). To avoid score inflation, several specific rules were applied: (1) for the results of sQTL- and mQTL-based analyses, multiple splice junctions or CpGs annotated for the same genes were aggregated prior to weighting due to correlated data; (2) if we observed a fine-mapped eTAS association for a gene, its other significant (but not fine-mapped) eTAS associations were not considered; (3) for genes having several significant CpGs (prior to aggregation) in MetaMeth analyses, the associated CpGs with a low (<75% percentile) blood–brain methylation correlation estimate were not considered if the gene also had associated CpGs with a high (≥75% percentile) blood–brain methylation correlation estimate.

**Gene prioritization strategy.** After obtaining a total weighted score per gene, we ranked genes per locus according to their prioritization scores and compared the relative score differences between the highest ranked gene and other genes in the investigated locus. If this relative difference was at least 20% and the gene prioritization score for the highest ranked gene was ≥4, then we classified this gene as a tier 1 prioritized gene in the investigated locus (i.e., a greater likelihood of being the true risk gene responsible for the ADD signal). If this absolute threshold was not met, then the highest ranked gene was classified as a tier 2 prioritized gene (i.e., a lower level of confidence and absence of the minimum level of evidence for a true risk gene). Furthermore, other genes in a locus harboring a tier 1 gene were classified as tier 2 prioritized genes if the relative score difference versus the highest ranked (tier 1) gene was between 20% and 50%. Lastly, when the relative score difference between the highest ranked gene and other genes in the same locus was <20%, then both the highest ranked gene and all genes with a score difference <20% were classified as tier 2 prioritized genes in the investigated locus; based on the current evidence, it is difficult to prioritize two or more similarly scored genes. The gene prioritization strategy is summarized in Supplementary Fig. 34. Detailed descriptions and discussions of prioritized genes and tier levels in each investigated new locus can be found in the Supplementary Note.

**GRS analysis.** Eight longitudinal MCI cohorts and seven population-based studies were included in the analysis and are fully described in the Supplementary Note and Supplementary Table 33. The GRSs were calculated as previously described<sup>90</sup>. Briefly, we considered variants with genome-wide significant evidence of association with ADD in our study. We did not include any APOE variants in the GRS. Variants were directly genotyped or imputed ( $R^2 \geq 0.3$ ). Imputation was performed using the HRC panel<sup>59</sup> for subcohorts from the Rotterdam study and the TOPMed panel for the other cohorts<sup>57</sup>. For HRC-imputed data, LD proxies were considered for variants that were not available in this reference panel. The GRS was calculated as the weighted average of the number of risk-increasing alleles for each variant, using dosages. Weights were based on the respective log(OR) obtained in stage II. The GRS was then multiplied by the number of included variants. Thus, the HR measured the effect of carrying one additional average risk allele.

To assess whether the new variants in this study contribute to the risk of conversion to AD (in addition to known AD genes), we calculated two GRSs: one based solely on variants known before this study (GRS<sub>known</sub>,  $n = 39$ ; Table 1) and another based on variants identified in the present study (GRS<sub>novel</sub>,  $n = 44$ ; Table 2). These GRSs were calculated in the same way as the GRS encompassing all the variants.

The association between the GRS and the risk of progression to dementia in individuals from population-based cohorts or patients with MCI from memory clinics was tested statistically using Cox proportional hazards models. The models were adjusted for age, sex, the first four PCs (to correct for potential population stratification) and the number of APOE-ε4 and APOE-ε2 alleles (assuming an additive effect). In the FHS study, the generation was used as an additional covariate. In the 3C study, the analysis was adjusted for age, sex, the number of APOE alleles, the two first PCs and center. The PCs used were generated for each cohort, using the same variants as in the case/control study's PC analysis. The number of APOE-ε4 alleles was obtained from direct genotyping or, if missing, the genotypes (with probability >0.8) derived from the TOPMed imputations. The interaction between the GRS and the number of APOE-ε4 alleles was tested on

the multiplicative scale. In the primary analysis, conversion to AD was used as the outcome (conversions to non-AD dementias were coded as being censored at time of conversion), but analyses were repeated using all-cause dementia as the outcome.

To quantify the effect size of the potential association between the GRS and conversion to dementia regarding predictive performance, we computed three different indices measuring different aspects of the predictive performance of the GRS in our prospective, longitudinal cohort studies<sup>91</sup>: the continuous version of the C-index<sup>92,93</sup>, the continuous NRI<sup>94</sup> and IPA<sup>95</sup> (Supplementary Note). For all indices, we provide point estimates and 95% CIs.

In the main analysis, indices were computed at the time point for which all cohorts in a specific setting (i.e., population-based studies or memory clinics, respectively) provided follow-up observations (that is 5 years for population-based cohorts and 3 years for MCI cohorts). In a sensitivity analysis, indices for longer or shorter follow-up periods were also derived (that is 3 years and 10 years for population-based cohorts and 5 years for MCI cohorts). Standard errors for indices were derived by non-parametric bootstrapping with 1,000 samples.

To determine the average effect of the GRS across the various cohorts examined, individual cohort results were subjected to both inverse-variance weighted meta-analyses (primary analyses) and random effects meta-analysis (Supplementary Note). To facilitate comparisons of results for different time points, cohorts with longer follow-up periods were meta-analyzed separately. Furthermore, two memory clinic cohorts with a limited sample size ( $N < 50$ ) were excluded to assess their impact on the final meta-analysis results. Meta-analyses were performed using the 'metafor' (3.0.2) R package<sup>96</sup>.

To further illustrate the clinical relevance of the GRS, we pooled computed GRSs across four population-based cohorts (3C, AgeCoDe, VITA and MAS) and computed deciles of the GRS distribution for use as a common reference for all cohorts. We then computed the increase in risk when augmenting the GRS value from the first decile (GRS = 50.76) to the ninth decile (GRS = 59.74) of the distribution. To represent this risk increase in the HR, we rescaled the HR derived from our meta-analyses results using the equation  $e^{\log(HR) * (GRS_{9thdecile} - GRS_{1stdecile})}$ . Importantly, this approach yields exactly the same results as transforming the GRS so that a one unit increment corresponds to the increase from the lowest decile to the highest decile.

Furthermore, we approximated the probability of conversion to AD at 3 and 5 years in memory clinic patients with MCI by using Cox models implemented in the 'PredictCox' function from the 'riskRegression' (2020.12.8) R package<sup>97</sup>. We did not derive AD conversion probabilities for two cohorts with very small sample sizes ( $N < 50$ ). Predicted AD conversion probabilities were derived and averaged for all patients in each of the groups formed by the decile of the GRS distribution in each cohort. The difference between the groups with the highest and lowest GRSs was computed in each cohort. We report the median (range) results in each group formed by the GRS deciles.

**Reporting Summary.** Further information on research design is available in the Nature Research Reporting Summary linked to this article.

## Data Availability

Genome-wide summary statistics have been deposited to the European Bioinformatics Institute GWAS Catalog (<https://www.ebi.ac.uk/gwas/>) under accession no. GCST90027158.

The significant eQTLs/sQTLs mapped and eTAS/sTAS functional reference panel weights generated for this study (in AD-relevant bulk brain regions from AMP-AD cohorts and in LCLs from the EADB Belgian cohort) are publicly available at <https://doi.org/10.5281/zenodo.5745927> and <https://doi.org/10.5281/zenodo.5745929>.

Anonymized aligned reads of the amplicon-based long-read Nanopore cDNA sequencing experiment conducted for the TSPAN14 splicing analysis are available through the European Nucleotide Archive under accession PRJEB49234.

Moreover, the following data used in the gene prioritization are publicly available: AMP-AD rnaSeqReprocessing Study (<https://www.synapse.org/#!Synapse:syn9702085>);

MayoRNAseq whole-genome sequencing variant call formats (WGS VCFs) (<https://www.synapse.org/#!Synapse:syn11724002>);

ROSMAP WGS VCFs (<https://www.synapse.org/#!Synapse:syn11724057>);

MSBB WGS VCFs (<https://www.synapse.org/#!Synapse:syn11723899>);

eQTLGen (<https://www.eqtlgen.org/>);

eQTL Catalogue database (<https://www.ebi.ac.uk/eqtl/>);

Brain xQTL serve (<http://mostafavilab.stat.ubc.ca/xqtl/>);

GTEx v8 eQTL and sQTL catalogs (<https://www.gtexportal.org/>);

GTEx v8 expression and splicing prediction models (<http://predictdb.org/>);

MiGA eQTLs (<https://doi.org/10.5281/zenodo.4118605>);

MiGA sQTLs (<https://doi.org/10.5281/zenodo.4118403>);

MiGA meta-analysis (<https://doi.org/10.5281/zenodo.4118676>); and

Wingo et al.<sup>84</sup> pQTL data (<https://www.synapse.org/#!Synapse:syn23627957>).

## Code availability

We used publicly available software for all analyses. The software are listed in the Supplementary Note with their appropriate citations and/or URLs.



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### Competing interests

H. Hampel is an employee of Eisai. The present article was initiated and prepared as part of his academic position at Sorbonne University (Paris, France), and it reflects entirely

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### Additional information

**Supplementary information** The online version contains supplementary material available at <https://doi.org/10.1038/s41588-022-01024-z>.

**Correspondence and requests for materials** should be addressed to Céline Bellenguez or Jean-Charles Lambert.

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bcftools 1.9  
bwa 0.7.17  
coloc 4.0.4  
Eagle 2.4; 2.0.5  
EIGENSOFT 7.2.1  
EIGENSTRAT  
Enhanced FastQTL 2.184\_gtex  
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GWAF 2.2  
GWASTools 1.30.1  
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LDSC 1.0.1  
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 Leafcutter 0.2.9  
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 METAL v2011-03-25  
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 Minimac 3 and 4-1.0.2  
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 RegTools 0.5.1  
 RNASeQC 2.3.5  
 R package GenABEL 1.8-0  
 R package haplo.stats 1.8.6  
 R package ieugwasr 0.1.5  
 R package metafor 3.0.2  
 R package pec 2020.11.17  
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Genome-wide summary statistics have been deposited to the European Bioinformatics Institute GWAS Catalog (<https://www.ebi.ac.uk/gwas/>) under accession no. GCST90027158.

The significant e/sQTLs mapped and e/sTAS functional reference panel weights generated for this study (in AD-relevant bulk brain regions from AMP-AD cohorts and in LCLs from the EADB Belgian cohort) are publicly available at <https://doi.org/10.5281/zenodo.5745927> and <https://doi.org/10.5281/zenodo.5745929>.

Anonymized aligned reads of the amplicon-based long-read nanopore cDNA sequencing experiment conducted for the TSPAN14 splicing analysis are available through ENA under accession PRJEB49234.

Moreover, the following data used in the gene prioritization are publicly available:

AMP-AD rnaSeqReprocessing Study: <https://www.synapse.org/#!Synapse:syn9702085>

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## Life sciences study design

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Sample size	Raw data used in this study was collected by the EADB consortia and summary statistics were recruited by external sources used for meta-analysis. Sample size was not pre-determined and was chosen based on all known available cohorts with relevant data collected to date, after quality control steps were performed in each cohort (described in detail in Supplementary Information) in particular to avoid any sample duplications. The sample size was calculated as the number of individuals summed across all studies in the meta-analysis, N=487,511.
Data exclusions	We excluded samples and variants based on standard quality control procedures for GWAS ( Samples: Heterozygosity and missingness, Population outliers, Sex-check, Relatedness, Possibly problematic chips batch; Variants: Missingness and Hardy-Weinberg equilibrium, Frequency checks, Ambiguous variants, Duplicated variants). Complete details of our quality control procedures are provided in the methods and supplementary information section of the manuscript.
Replication	The meta-analysis strategy includes replication by default, as it weights the reported test statistics by the evidence of association across multiple samples. Further, SNP-based replication was carried out for the top GWAS association signals in an independent sample (N= 25,392 Alzheimer's disease cases and 276,086 controls; see Methods and supplementary information).
Randomization	Samples were randomized by case and control status on plates during genotyping at their independent study sites.
Blinding	genotyping was done blind without knowing the status of the individuals. The analysts were not blinded to the status of the individuals because QC procedures require knowing case and control status.

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## Human research participants

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Population characteristics	We used multiple independent sets of participants in this study. We adjusted the analysis for principal components. Sample sizes, age and gender characteristics for our sample can be found per cohort and overall in Supplementary Tables 1 and Supplementary Information.
Recruitment	Participants from case-control studies were primarily recruited from clinics, nursing homes, disease registries, and hospitals, with controls being drawn from various ongoing studies and screened to exclude dementia/cognitive decline (see description of the samples in the supplementary information). Cases were recruited according to clinical diagnosis and defined as probable AD cases with a potential risk of misdiagnosis (estimated between 10 and 20% in the literature). Controls included in the study were free of cognitive decline but a large part of them did not have any follow-up with the possibility that they developed dementia years later. The UK Biobank recruited adult volunteers from national health registration records. UK Biobank participants are healthier than the general population, but since the data used in this study referred to parental diagnoses, the impact of selection bias should be minor.

## Ethics oversight

Written informed consent was obtained from study participants or, for those with substantial cognitive impairment, from a caregiver, legal guardian, or other proxy, and the study protocols for all populations were reviewed and approved by the appropriate local Institutional review boards (see description of the samples in the supplementary information).

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