1 A common haplotype lowers PU.1 expression in myeloid cells and delays onset of

- 2 Alzheimer's disease
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82 Abstract

- A genome-wide survival analysis of 14,406 Alzheimer's disease (AD) cases and 25,849 controls
- 84 identified eight previously reported AD risk loci and fourteen novel loci associated with age at
- 85 onset. LD score regression of 220 cell types implicated regulation of myeloid gene expression in
- AD risk. In particular, the minor allele of rs1057233 (G), within the previously
- 87 reported *CELF1* AD risk locus, showed association with delayed AD onset and lower expression
- of *SPI1* in monocytes and macrophages. *SPI1* encodes PU.1, a transcription factor critical for
- 89 myeloid cell development and function. AD heritability is enriched within the PU.1 cistrome,
- 90 implicating a myeloid PU.1 target gene network in AD. Finally, experimentally altered PU.1
- 91 levels affect the expression of mouse orthologs of many AD risk genes and the phagocytic
- 92 activity of mouse microglial cells. Our results suggest that lower SPI1 expression reduces AD
- 93 risk by regulating myeloid gene expression and cell function.

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AD is the most prevalent form of dementia. While genome-wide association studies (GWAS)

- have identified more than twenty AD risk $loci^{1-5}$, the associated disease genes and mechanisms
- remain largely unclear. To better understand these genetic associations, AD-related phenotypes
 can be leveraged. For example, few studies^{6,7} have investigated the genetic basis of age at onset
- of AD (AAO). To date, *APOE* remains the only locus repeatedly associated with $AAO^{8,9}$, but
- 101 *PICALM* and *BIN1* have also been reported to affect $AAO^{6,10,11}$. Further, we have previously
- 102 used CSF biomarkers to demonstrate that *APOE* genotype is strongly associated with these
- 103 disease-relevant endophenotypes^{12,13}.
- 104
- 105 Identifying causal genes and mechanisms underlying disease-associated loci requires integrative
- analyses of expression and epigenetic datasets in disease-relevant cell types¹⁴. Recent genetic
- 107 and molecular evidence has highlighted the role of myeloid cells in AD pathogenesis. At the
- 108 genetic level, GWAS and sequencing studies have found associations between AD and genes
- 109 expressed in myeloid cells, including *TREM2*, *ABCA7*, and *CD33*^{1,2,5,15–17}. At the epigenetic level,
- 110 genes expressed in myeloid cells display abnormal patterns of chromatin modification in AD
- 111 mouse models and human samples¹⁸⁻²⁰. Further, AD-risk alleles are polarized for *cis*-expression
- 112 quantitative trait locus (*cis*-eQTL) effects in monocytes²¹. Herein, we show that AD heritability
- 113 is enriched in functional annotations for cells of the myeloid and B-lymphoid lineage, suggesting
- 114 that integrative analyses of AD loci with myeloid-specific expression and epigenetic datasets will
- 115 uncover novel AD genes and mechanisms related to the function of these cell types.
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117 In this study, we conducted a large-scale genome-wide survival analysis and subsequent

- 118 endophenotype association analysis to uncover loci associated with AAO-defined survival
- 119 (AAOS) in AD cases and non-demented elderly controls. We discovered an AAOS- and CSF
- 120 A β_{42} -associated SNP, rs1057233, in the previously reported *CELF1* AD risk locus. *Cis*-eQTL
- 121 analyses revealed a highly significant association of the protective rs1057233^G allele with
- reduced *SPI1* expression in human myeloid cells. *SPI1* encodes PU.1, a transcription factor
- 123 critical for myeloid and B-lymphoid cell development and function, that binds to the cis-
- 124 regulatory elements of several AD-associated genes in these cells. Moreover, we show that AD
- heritability is enriched in PU.1 ChIP-Seq binding sites in human myeloid cells across the
- 126 genome, implicating a myeloid PU.1 target gene network in the etiology of AD. To validate
- 127 these bioinformatic analyses, we show that experimentally altered PU.1 levels are correlated with
- 128 phagocytic activity of mouse microglial cells and the expression of multiple genes involved in
- 129 diverse biological processes of myeloid cells. This evidence collectively shows that lower SPI1
- 130 expression may reduce AD risk by modulating myeloid cell gene expression and function.

131 **Results**

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133 Genome-wide survival analysis

134 For the genome-wide survival analysis, we used 14,406 AD case and 25,849 control samples 135 from the IGAP consortium (Table 1a). 8,253,925 SNPs passed quality control and were included 136 for meta-analysis across all cohorts (Supplementary Table 1), which showed little evidence of 137 genomic inflation ($\lambda = 1.026$). Four loci showed genome-wide significant associations (P < 5x10⁻ ⁸) with AAOS: *BIN1* (P=7.6x10⁻¹³), *MS4A* (P=5.1x10⁻¹¹), *PICALM* (P=4.3x10⁻¹⁴), and *APOE* (P=1.2x10⁻⁶⁷) (**Supplementary Fig. 1**). While SNPs within *BIN1*⁶, *PICALM*^{6,10}, and *APOE*^{6,8–} 138 139 ^{10,22} loci have previously been shown to be associated with AAO, this is the first time that the 140 141 MS4A locus is reported to be associated with an AAO-related phenotype. The minor allele of 142 rs7930318 near MS4A4A is associated with delayed AAO. Four other AD risk loci previously reported in the IGAP GWAS¹ showed associations that reached suggestive significance (P < P143 $1.0x10^{-5}$): CR1 (P=1.2x10^{-6}), SP11/CELF1 (P=5.4x10^{-6}), SORL1 (P=1.8x10^{-7}), and FERMT2 144 145 $(P=1.0x10^{-5})$. The direction of effects were concordant with the previous IGAP GWAS logistic regression analysis for AD risk¹ at all suggestive loci: AD risk-increasing alleles were all 146 147 associated with a hazard ratio above 1 and earlier AAO, whereas AD risk-decreasing alleles were 148 all associated with a hazard ratio below 1 and later AAO (**Table 1b, Supplementary Table 2**). 149 We also identified 14 novel loci that reached suggestive significance in the survival analysis, 3 of which (rs116341973, rs1625716, and rs11074412) were nominally associated with AD risk 150 151 (Bonferroni-corrected threshold: $P=0.05/22=2.27\times10^{-3}$) in the IGAP GWAS (Table 1b, 152 Supplementary Fig. 2, 3).

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154 **Cerebrospinal fluid biomarkers associations**

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156 To further validate the 22 loci with at least suggestive associations to AAOS, we examined their 157 associations with CSF biomarkers, including total tau, phosphorylated tau₁₈₁, and A β_{42} in a dataset of 3,646 Caucasians extended from our previous report¹² (Table 2). Two SNPs showed 158 associations that reached the Bonferroni-corrected threshold ($P < 2.27 \times 10^{-3}$). Rs4803758 near 159 160 APOE showed the most significant associations with levels of CSF phosphorylated tau₁₈₁ 161 $(P=3.75 \times 10^{-4})$ and CSF A β_{42} $(P=3.12 \times 10^{-5})$, whereas rs1057233 in the SPI1/CELF1 locus was significantly associated with CSF A β_{42} (P=8.24x10⁻⁴). Of note, a SNP adjacent to VLDLR, 162 rs7867518, showed the most significant association with CSF total tau (P= 3.02×10^{-3}), but failed 163 164 to pass the Bonferroni-corrected threshold. The protective and deleterious effects in the survival analysis of these three SNPs were concordant with directionalities of their CSF biomarker 165

associations; for example, the protective rs1057233^G allele was associated with higher CSF A β_{42} 166

- levels and the risk rs1057233^A allele was associated with lower CSF A β_{42} levels. 167
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169 **Cis-eQTL** associations and colocalization analysis

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171 Multiple disease-associated GWAS SNPs have been identified as cis-eQTLs of disease genes in

disease-relevant tissues/cell types²³. We investigated *cis*-eQTL effects of the 22 AAOS-172

- associated SNPs and their tagging SNPs ($\mathbb{R}^2 \ge 0.8$, listed in **Supplementary Table 3**) in the 173
- 174 BRAINEAC dataset. We identified 4 significant associations (Bonferroni-corrected threshold:
- 175 P=0.05/292,000 probes = 1.7×10^{-7}): rs1057233 was associated with *MTCH2* expression in the
- cerebellum (P= 1.20×10^{-9}); rs7445192 was associated with SRA1 expression averaged across 176

- brain regions (P= 7.0×10^{-9} , 1.6×10^{-7} for two probes respectively), and rs2093761 was associated with *CR1/CR1L* expression in white matter (P= 1.30×10^{-7} , **Supplementary Table 4**). Further
- analysis using the GTEx dataset²⁴ identified 50 unique, associated snp-gene pairs across 44
- 180 tissues, including 11 snp-gene pairs in various brain regions (Supplementary Table 5).
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- 182 Recently, genetic and molecular evidence has implicated myeloid cells in the etiology of AD,
- 182 including our finding that AD risk alleles are enriched for *cis*-eQTL effects in monocytes but not
- CD4+ T-lymphocytes²¹. To extend this finding and identify relevant cell types in AD, we used
- 185 stratified LD score regression to estimate enrichment of AD heritability (measured by summary
- statistics from IGAP GWAS¹) partitioned by 220 cell type–specific functional annotations as
- described by Finucane et al.²⁵. We found a significant enrichment of AD heritability in
- 188 hematopoietic cells of the myeloid and B-lymphoid lineage (e.g., 14.49 fold enrichment,
- 189 $P=3.49 \times 10^{-5}$ in monocytes/CD14 enhancers/H3K4me1 and 12.33 fold enrichment, $P=1.41 \times 10^{-6}$
- 190 in B-cells/CD19 enhancers/H3K4me1). In contrast schizophrenia (SCZ) heritability was not
- 191 enriched in hematopoietic cells (1.24 fold enrichment, P=0.53, as measured by summary
- 192 statistics from the Psychiatric Genomics Consortium [PGC] GWAS²⁶) but was significantly
- enriched in brain (18.61 fold enrichment, $P=1.38 \times 10^{-4}$ in fetal brain promoters/H3K4me3,
- 194 **Supplementary Table 6**). These results suggest that myeloid cells specifically modulate AD
- 195 susceptibility.
- 196

197 Based on these observations, we hypothesized that cis-eQTL effects of some AD-associated 198 alleles may be specific to myeloid cells and thus not easily detectable in *cis*-eQTL datasets 199 obtained from brain homogenates where myeloid cells (microglia and other brain-resident 200 macrophages) represent a minor fraction of the tissue. Therefore, we analyzed *cis*-eQTL effects 201 of the AAOS-associated SNPs and their tagging SNPs in human cis-eQTL datasets composed of 202 738 monocyte and 593 macrophage samples from the Cardiogenics consortium²⁷. We identified 203 14 genes with *cis*-eQTLs significantly associated with these SNPs (Table 3). Notably, the 204 protective rs1057233^G allele, located within the 3' UTR of *SPI1*, was strongly associated with lower expression of SPI1 in both monocytes ($P=1.50\times10^{-105}$) and macrophages ($P=6.41\times10^{-87}$) 205 (Fig. 1a, 1b, 2a). This allele was also associated with lower expression of *MYBPC3* (monocytes: 206 $P=5.58\times10^{-23}$; macrophages: $P=4.99\times10^{-51}$), higher expression of *CELF1* in monocytes 207 $(P=3.95\times10^{-8})$ and lower NUP160 expression in macrophages $(P=5.35\times10^{-22})$. Each of these 208 genes lies within the SPI1/CELF1 locus, suggesting complex regulation of gene expression in 209 210 this region. Within the MS4A locus, which contains many gene family members, the minor allele 211 (C) of rs7930318 was consistently associated with lower expression of MS4A4A in monocytes $(P=8.20\times10^{-28})$ and MS4A6A in monocytes $(P=4.90\times10^{-23})$ and macrophages $(P=1.25\times10^{-9})$, Fig. 212

- **1b**). Among the novel AAOS-associated loci, rs5750677 was significantly associated with lower
- expression of *SUN2* in both monocytes ($P=3.66\times10^{-58}$) and macrophages ($P=3.15\times10^{-36}$),
- rs10919252 was associated with lower expression of *SELL* in monocytes ($P=7.33 \times 10^{-35}$), and
- rs1625716 was associated with lower expression of *CISD1* in macrophages (P= 5.98×10^{-23} , **Table** 3).
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- 219 We then sought evidence of replication in an independent dataset of primary CD14+ human
- 220 monocytes from 432 individuals²⁸. We replicated *cis*-eQTL associations with expression of *SPI1*,
- 221 MYBPC3, MS4A4A, MS4A6A, and SELL (Bonferroni-corrected threshold: P=0.05/15421 probes
- $222 = 3.24 \times 10^{-6}$). We found strong evidence for the association between rs1057233 and *SPI1*

expression (P= 6.39×10^{-102}) as well as *MYBPC3* expression (P= 5.95×10^{-33} , **Supplementary** 223 **Table 7**). Rs1530914 and rs7929589, both in high LD with rs7930318 ($R^2 = 0.99$ and 0.87, 224 respectively), were associated with expression of MS4A4A and MS4A6A (P= 3.60×10^{-8} , 6.37×10^{-7} 225 226 ¹⁵), respectively. Finally, rs2272918, tagging rs10919252, was significantly associated with expression of SELL ($P=8.43 \times 10^{-16}$). Interestingly, the minor allele of all of these SNPs showed 227 protective effects in both AD risk and survival analyses, as well as lower expression of the 228 229 associated genes. Further, SPI1, MS4A4A, MS4A6A, and SELL are specifically expressed in microglia based on RNA-Seq data²⁹⁻³¹ (Fig. 2b, Supplementary Fig. 4). However, 230 *MYBPC3*/Mybpc3 (a myosin binding protein expressed at high levels in cardiac muscle cells) is 231 either not expressed or expressed at low levels in human and mouse microglia. respectively. 232 233 Amongst all genes probed, MYBPC3 (ILMN 1781184) expression is the most highly and 234 significantly correlated with SPI1 (ILMN 1696463) expression in both Cardiogenics datasets 235 (Spearman's rho = 0.54, gval = 0.00 in monocytes and Spearman's rho = 0.42, gval = 0.00 in 236 macrophages) suggesting that low levels of MYBPC3 expression in human myeloid cells are 237 possibly due to leaky transcription driven by the adjacent highly expressed SPI1 gene. 238 We performed the coloc test³² to determine whether AAOS-associated SNPs co-localize with 239 240 myeloid *cis*-eQTLs at the SPI1/CELF1, MS4A and SELL loci. These analyses (Supplementary 241 Table 8) highlighted SPI1 at the SPI1/CELF1 locus as the strongest and most consistent 242 colocalization target, and the only gene where the AD survival and gene expression association 243 signals are likely (posterior probability ≥ 0.8) driven by the same causal genetic variant, in both 244 monocytes and macrophages (PP.H4.abf of 0.85 and 0.83, respectively). MYBPC3 in the 245 SPI1/CELF1 locus and MS4A6A in the MS4A locus also showed evidence of colocalization in 246 both myeloid cell types albeit not surviving posterior probability cutoff in one of them. MS4A4A 247 and MS4A6E in the MS4A locus showed evidence of co-localization only in monocytes, while

- 248 *SELL* did not show evidence of colocalization.
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In light of the strong *cis*-eQTL effects and colocalization results described above, we decided to focus subsequent analyses on *SPI1* as the strongest candidate gene underlying the disease association in myeloid cells.

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254 Conditional and SMR analysis of the SPI1/CELF1 locus

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256 The AAOS-association landscape shows that highly associated SNPs at the SPI1/CELF1 locus span multiple genes (Fig. 1a). In the previous IGAP GWAS¹, rs10838725 showed the strongest 257 association at this locus (P= 6.7×10^{-6} , 1.1×10^{-8} vs. rs1057233; P= 5.4×10^{-6} , 5.9×10^{-7} in IGAP stage 258 259 I, stage I and II combined, respectively). Rs10838725 is located in the intron of CELF1, which was assigned as the putative causal gene at this locus¹ based on proximity to the index SNP, a 260 criterion that has often proven to be erroneous¹⁴. In our survival analysis, however, rs10838725 261 262 showed weak association (P=0.12, HR=1.02, 95% CI=0.99-1.05) whereas rs1057233, located in the 3'UTR of a neighboring gene, SPI1, showed the strongest association (**Table 1**, $P=5.4\times10^{-6}$). 263 264 The two SNPs exhibit only moderate linkage disequilibrium in the ADGC subset of the IGAP 265 GWAS (R²=0.21, D'=0.96). Applying conditional logistic regression analysis of AD risk in the 266 ADGC dataset, we found that rs1057233 remained significantly associated with AD after adjusting for rs10838725 ($P=3.2x10^{-4}$), whereas rs10838725 showed no evidence of association 267

after adjusting for rs1057233 (P=0.66). This suggests that rs1057233 is in stronger LD with the AD risk causal variant.

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271 The association landscape in the AD survival analysis highly resembles that of SPI1 cis-eQTL analysis in myeloid cells (Fig. 1a). We reasoned that the associations of rs1057233 with AD-272 273 related phenotypes may be explained by the regulation of SPI1 expression in myeloid cells, and 274 that conditional analysis of the *cis*-eQTL signal could help us further dissect this complex locus. 275 Therefore, we conducted conditional cis-eQTL analyses in both Cardiogenics datasets as we did 276 above using rs1057233 (the top SNP for AD survival) and rs10838725 (the top SNP for AD risk). 277 In addition, we also examined rs10838698 (a SNP in high LD with rs1057233 that was directly 278 genotyped in the Cardiogenics dataset) and rs1377416, a SNP in high LD with rs10838725 279 proposed to be a functional variant in an enhancer near SPI1 that is active in human myeloid cells and in the brain of a mouse model of AD^{19} . It should be noted that rs1057233 is a functional 280 281 variant that has been shown to directly affect SPI1 expression by changing the target sequence and binding of miR-569³³. Rs1057233 and rs10838698 remained significantly associated with 282 283 SPI1 expression when adjusting for either of the other two SNPs in both monocytes and 284 macrophages ($P < 8.33 \times 10^{-3}$). However, conditioning for either of these two SNPs abolished the 285 associations of rs1377416 and rs10838725 with SPI1 expression (Supplementary Table 9). 286 Thus, the functional variant(s) mediating the effect on SPI1 expression and AD risk likely 287 reside(s) in the LD block that includes rs1057233 and rs10838698 but not rs10838725 and 288 rs1377416 (Supplementary Fig. 5).

289

Using HaploReg³⁴ to annotate the top AAOS-associated SNP (rs1057233) and its tagging SNPs ($R^2 \ge 0.8$, **Supplementary Table 3**), we identified multiple SNPs (e.g, rs10838699 and rs7928163) in tight LD with rs1057233 that changed the predicted DNA binding motif of SPI1 (PU.1), raising the possibility of altered self-regulation associated with the minor allele. Based on these results, one or more of these or other SNPs in very high LD with rs1057233, could explain the observed associations with *SPI1* expression and AD-related phenotypes.

296

297 We also conducted Summary-data-based Mendelian Randomization (SMR) and Heterogeneity In

298 Dependent Instruments (HEIDI) tests²³ to prioritize likely causal genes and variants by

299 integrating summary statistics from our AAOS GWAS and the Cardiogenics study

300 (Supplementary Table 10). SMR/HEIDI analysis was performed for the *SPI1/CELF1* locus

301 using rs1057233, rs10838698, rs10838699, rs7928163, rs10838725 and rs1377416 as candidate

302 causal variants. In both monocytes and macrophages, *SPI1* was consistently identified as the 303 most likely gene whose expression levels are associated with AD survival because of

304 causality/pleiotropy at the same underlying causal variant (rs1057233, rs10838698, rs10838699,

305 or rs7928163 in the same LD block) (SMR P < 4.90E-04, Bonferroni-corrected threshold for 6

Solution in the same ED block) (SMR $\Gamma < 4.50E-04$, Bollettoin-concerct differential for 0 306 SNPs tested against 17 probes and HEIDI P ≥ 0.05 , **Supplementary Fig. 6**). Neither conditional

analysis nor SMR/HEIDI analysis could definitively identify a single functional variant among

308 this set of 4 SNPs in high LD. Functional analyses will be necessary to determine which SNPs in

309 this LD block directly affects SPI1 expression. Overall, rs1057233 and tagging SNPs are

associated with AD risk and survival, and CSF A β_{42} . The strong *cis*-eQTL effects and

311 colocalization results point to SPI1 as the most likely candidate gene underlying the disease

312 association at the *SPI1/CELF1* locus.

314

315 SPI1 (PU.1) cistrome and functional analysis in myeloid cells

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317 SPI1 encodes PU.1, a transcription factor essential for the development and function of myeloid 318 cells. We hypothesize that it may modulate AD risk by regulating the transcription of ADassociated genes expressed in microglia and/or other myeloid cell types. First, we tested AD-319 associated genes for evidence of expression in human microglia²⁹ as well as presence of PU.1 320 321 binding peaks in *cis*-regulatory elements of these genes using ChIP-Seq datasets obtained from human monocytes and macrophages³⁵. We specifically investigated 112 AD-associated genes, 322 including the 104 genes located within IGAP GWAS loci³⁶ and APOE, APP, TREM2 and 323 324 TREML2, TYROBP, TRIP4, CD33, and PLD3. Among these genes, 75 had evidence of gene expression in human brain microglial cells, 60 of which also had evidence of association with 325 PU.1 binding sites in human blood myeloid cells³⁵ (Supplementary Table 11). Further 326 327 examination of PU.1 binding peaks and chromatin marks/states in human monocytes confirmed 328 that PU.1 is bound to *cis*-regulatory elements of many AD-associated genes, including ABCA7, 329 CD33, MS4A4A, MS4A6A, PILRA, PILRB, TREM2, TREML2, and TYROBP (as well as SPI1 330 itself, but notably not APOE) (Fig. 2c, Supplementary Fig. 7). Together, these results suggest 331 that PU.1 may regulate the expression of multiple AD-associated genes in myeloid cells. 332 333 To further support that PU.1 target genes expressed in myeloid cells may be associated with AD risk, we used stratified LD score regression²⁵ to estimate enrichment of AD heritability (as 334 335 measured by summary statistics from the IGAP GWAS¹) partitioned on the PU.1 cistrome, as profiled by ChIP-Seq in human monocytes and macrophages³⁵. We found a significant 336 enrichment of AD heritability in both monocytes (47.58 fold enrichment, $P=6.94 \times 10^{-3}$) and 337 macrophages (53.88 fold enrichment, $P=1.65 \times 10^{-3}$), but not SCZ heritability [as measured by 338 339 summary statistics from the PGC GWAS²⁶] (Supplementary Table 12). Thus, the contribution 340 of the myeloid PU.1 target gene network to disease susceptibility is specific to AD. However, 341 since PU.1 is a key myeloid transcription factor that regulates the expression of a large number

342 of genes in myeloid cells, the enrichment of AD risk alleles in PU.1 binding sites could simply 343 reflect an enrichment of AD GWAS associations for genes that are expressed in myeloid cells

344 rather than specifically among PU.1 target genes. To attempt to address this issue, we performed

- 345 stratified LD score regression of AD heritability partitioned by functional annotations obtained
- 346 from SPI1 (marking the PU.1 cistrome) and POLR2AphosphoS5 (marking actively transcribed 347 genes) ChIP-Seq experiments, performed in duplicate, using a human myeloid cell line (HL60)

by the ENCODE Consortium³⁷. We observed a significant enrichment for SPI1 (PU.1) (34.58 348

fold enrichment, $P=1.31 \times 10^{-3}$ in first replicate; 58.12 fold enrichment, $P=4.95 \times 10^{-3}$ in second 349

350 replicate) much stronger than that for POLR2AphosphoS5 (15.78 fold enrichment, P=1.71x10⁻²

in first replicate; 16.34 fold enrichment, $P=1.25 \times 10^{-1}$ in second replicate), consistent with our 351

- 352 hypothesis (Supplementary Table 12).
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354 PU.1 target genes are implicated in various biological processes of myeloid cells that may

355 modulate AD risk. For example, a microglial gene network for pathogen phagocytosis has been

previously implicated in the etiology of AD¹⁸. We modulated levels of PU.1 by Spi1 cDNA 356

357 overexpression or shRNA knock-down in BV2 mouse microglial cells, and used zymosan

358 bioparticles labeled with pHrodo (a pH-sensitive dye that emits a fluorescent signal when

359 internalized in acidic vesicles during phagocytosis) to measure pathogen engulfment. Analysis of

360 zymosan uptake by flow cytometry revealed that phagocytic activity is augmented in BV2 cells

- 361 overexpressing PU.1 (**Fig. 3a**), while knock-down of PU.1 resulted in decreased phagocytic
- activity (**Fig. 3a**). We confirmed overexpression and knock-down of PU.1 expression levels by
- 363 western blotting and qPCR (**Fig. 3**). Phagocytic activity was not changed in untransfected cells
- when analyzed by flow cytometry (**Supplementary Fig. 8d, 8e, 8f, 8g**). These data suggest that
- 365 modulation of PU.1 expression levels significant changes microglial phagocytic activity in
- 366 response to fungal targets (mimicked by zymosan).
- 367

368 To further explore the functional impact of variation in SPI1 expression, we performed qPCR to

- 369 test whether differential *Spi1* expression in BV2 cells can modulate expression of genes thought
- to play important roles in AD pathogenesis and/or microglial cell function (Fig. 3,
- 371 **Supplementary Fig. 9**, **Supplementary Table 13, 14**). We found that levels of some of these
- 372 genes were affected in opposing directions by overexpression and knock-down of *Spil* (Fig. 4a),
- 373 while other genes were affected only by overexpression (Fig. 4b) or knock-down (Fig. 4c) or not
- affected at all (**Supplementary Fig. 9**). After knock-down of *Spi1* in BV2 cells, expression of
- 375 *Cd33*, *Tyrobp*, *Ms4a4a* and *Ms4a6d* decreased and expression of *Apoe* and *Clu/ApoJ* increased
- 376 (Fig. 4a, 4c). These data demonstrate that multiple microglial genes, some already implicated in
- AD, are selectively perturbed by altered expression of *Spi1*.
- 379 **Discussion**
- 380

381 By performing a large-scale genome-wide survival analysis, we discovered multiple loci

- associated with AAOS (**Table 1**). The four genome-wide significantly associated loci, *BIN1* (P=7.6x10⁻¹³), *MS4A* (P=5.1x10⁻¹¹), *PICALM* (P=4.3x10⁻¹⁴), and *APOE* (P=1.2x10⁻⁶⁷), have been
- 383 (P=7.6x10⁻¹³), *MS4A* (P=5.1x10⁻¹¹), *PICALM* (P=4.3x10⁻¹⁴), and *APOE* (P=1.2x10⁻⁶⁷), have been 384 previously reported to be associated with AD risk¹. Notably, this is the first study showing that
- the *MS4A* locus is associated with AAOS. The most significantly AAOS-associated SNP at this
- locus, rs7930318, shows a protective effect (HR = 0.93, 95% CI = 0.90-.95) in the survival
- analysis, consistent with the previous IGAP GWAS logistic regression analysis for AD risk (OR
- 388 = 0.90, 95% CI = 0.87-.93).
- 389
- 390 By combining AAOS and CSF biomarker GWAS results, we provide evidence of AD
- association at additional loci (**Table 2**). In particular, rs7867518 at the *VLDLR* locus shows
- 392 suggestive associations with both AAOS ($P=9.1x10^{-6}$) and CSF tau ($P=3.03x10^{-3}$). An adjacent
- 393 SNP (rs2034764) in the neighboring gene, *KCNV2*, has been previously reported to have
- suggestive association with AAO^{22} . VLDLR is a receptor for lipoproteins containing $APOE^{38}$
- and CLU/APOJ³⁹, another AD risk gene. Additionally, the VLDLR-5-repeat allele was found to
- be associated with dementia³⁸. This genetic and biochemical evidence suggests *VLDLR* may be
- 397 linked to AD.
- 398
- 399 Cis-eQTL analyses of AAOS-associated SNPs revealed limited associations when using data
- 400 from brain tissue homogenates, yet identified multiple candidate genes when using data from
- 401 myeloid cells, the top candidate causal cell types for AD based on the stratified LD score
- 402 regression analysis of AD heritability presented here. This calls attention to careful selection of
- 403 relevant cell types in eQTL studies of disease associations. In particular, by conducting *cis*-eQTL
- 404 analyses using monocyte and macrophage datasets, we discovered associations of AAOS-
- 405 associated SNPs with the expression of SELL, SPI1, MYBPC3, NUP160, MS4A4A, MS4A6A and

SUN2 (Table 3). Furthermore, we replicated the *cis*-eOTL associations of rs1057233 with SPI1,

MYBPC3, rs7930318 with MS4A4A, MS4A6A and rs2272918 with SELL in an independent

408 monocyte dataset. We further showed that SPI1 myeloid cis-eOTLs and AAOS-associated SNPs 409 are not likely to be colocalized by chance and thus may be in the causal path to AD (Fig. 1). 410 Notably, the minor allele of rs1057233 (G) is suggestively associated with lower AD risk $(P=5.4x10^{-6}, 5.9x10^{-7} \text{ in IGAP stage I, stage I and II combined, respectively})^1$, later AAO 411 $(P=8.4 \times 10^{-6})$ and significantly associated with higher CSF AB₄₂ (P=4.11x10⁻⁴), which likely 412 reflects decreased Aß aggregation and β-amyloid deposition in the brain. Furthermore, it is 413 strongly associated with lower SPI1 expression in human monocytes ($P=1.50 \times 10^{-105}$) and 414 macrophages ($P=6.41 \times 10^{-87}$, **Table 3**). 415 416 Colocalization analyses using coloc³² and SMR/HEIDI²³ support the hypothesis that the same 417 causal SNP(s) influence SPI1 expression and AD risk. However, neither conditional nor 418 419 SMR/HEIDI analyses were able to pin-point an individual SNP; both approaches identified an 420 LD block tagged by rs1057233, in which one or more SNPs may individually or in combination influence both SPI1 expression and AD risk. rs1057233 changes the target sequence and binding 421 of miR-569³³, and its tagging SNPs alter binding motifs of transcription factors including PU.1 422 423 itself (Supplementary Table 3 and Supplementary Fig. 7d). rs1377416, is located in a 424 predicted enhancer in the vicinity of SPI1 and altered enhancer activity when assayed in vitro using a reporter construct transfected in BV2 cells¹⁹. However, rs1057233 remained significantly 425 426 associated with AD after conditioning for either rs1377416 ($P=1.2\times10^{-3}$) or the previously reported IGAP GWAS top SNP rs10838725 (P= 3.2×10^{-4}) in the ADGC dataset. Further, the *cis*-427 428 eQTL association between rs1057233 and SPI1 expression remained significant after 429 conditioning for either of these SNPs, whereas conditioning for rs1057233 abolished their *cis*-430 eQTL associations with SPI1 (Supplementary Table 9). Thus, rs1057233 and its tagging SNPs 431 likely represent the underlying disease locus and may modulate AD risk through variation in 432 SPI1 expression. Interestingly, rs1057233 was previously found to be associated with systemic lupus erythematosus³³, body mass index⁴⁰ and proinsulin levels⁴¹ and may contribute to the 433 connection between AD, immune cell dysfunction, obesity and diabetes. 434 435 436 PU.1 binds to *cis*-regulatory elements of several AD-associated genes expressed in human 437 myeloid cells, including ABCA7, CD33, MS4A4A, MS4A6A, TREM2, and TYROBP (Fig. 1e, 438 Supplementary Fig. 7). Further, PU.1 binds to active enhancers of Trem2 and Tyrobp in ChIP-Seq experiments using mouse BV2 cells⁴² or bone marrow-derived mouse macrophages⁴³. PU.1 439 is required for the development and function of myeloid and B-lymphoid cells^{44,45}. In particular, 440 441 PU.1 expression is dynamically and tightly controlled during haematopoiesis to direct the 442 specification of CD34+ hematopoietic stem and progenitor cells toward the myeloid and B-443 lymphoid lineage by progressively partitioning into CD14+ monocytes/macrophages, CD15+ neutrophils, and CD19+ B cells⁴⁶, which are the cell types highlighted by our stratified LD score 444 445 regression analysis. Given its selective expression in microglia in the brain (Fig. 2b), PU.1 may 446 modify microglial cell function through transcriptional regulation of target genes that act as 447 downstream modulators of AD susceptibility, as evidenced by the significant enrichment of AD

448 heritability partitioned on the PU.1 cistrome in human myeloid cells (**Supplementary Table 12**).

449

406 407

450 In support of this hypothesis, we also demonstrate that changes in PU.1 expression levels alter

451 phagocytic activity in BV2 mouse microglial cells (Fig. 3, Supplementary Fig. 8). Knock-down

452 of PU.1 expression reduced engulfment of zymosan, whereas overexpression of PU.1 increased

- 453 engulfment of zymosan, a Toll-like receptor 2 (TLR2) agonist that mimics fungal pathogens.
- 454 This is in line with previous data showing decreased uptake of A β_{42} (also a TLR2 agonist) in
- 455 primary microglial cells isolated from adult human brain tissue and transfected with siRNA targeting SPI1⁴⁷. Interestingly, several AD-associated genes (e.g., CD33, TYROBP, TREM2,
- 456 TREML2, CR1, ABCA7, APOE, CLU/APOJ) have been shown to be involved in the phagocytic 457
- 458
- clearance of pathogens or host-derived cellular material (e.g., β -amyloid, apoptotic cells, myelin 459 debris, lipoproteins, etc.), suggesting a strong link between perturbation of microglial
- 460
- phagocytosis and AD pathogenesis. In addition to Cd33, Tyrobp, Apoe and Clu/ApoJ, several 461 genes with roles in phagocytosis are dysregulated by altering *Spil* expression, i.e. *Cd36*, *Fcgrl*,
- 462 P2ry12, Itgam, Cx3cr1, Axl, Ctsb (Fig. 4a, 4b, 4c), suggesting a collective and coordinated effect
- 463 of Spil on the phagocytic activity of BV2 cells.
- 464
- Our genetic analyses show that the protective allele at the MS4A locus is associated with lower 465
- 466 expression of MS4A4A and MS4A6A in human myeloid cells, and the BV2 experiment
- demonstrated that lower expression of Spi1 (which is protective in humans) led to lower 467
- 468 expression of Ms4a4a and Ms4a6d (mouse ortholog of MS4A6A), which are also associated with
- 469 reduced AD risk in humans. Transcriptomic and proteomic analyses of microglial cells suggested
- 470 a microglial homeostatic signature that is perturbed during aging and under pathological
- 471 conditions⁴⁸. It will be valuable to test whether genetically altered *SPI1* levels prime microglia to
- 472 exacerbate or alleviate transcriptional responses that occur during aging or disease development.
- 473 Together with genetic variation in myeloid genes associated with AD as an amplifier, SPI1 may
- 474 be a master regulator capable of tipping the balance toward a neuroprotective or neurotoxic 475 microglial phenotype.
- 476

PU.1 expression levels regulate multiple myeloid/microglial cell functions⁴⁷, including 477

- 478 proliferation, survival and differentiation, that could also modulate AD risk. Indeed, expression
- 479 of *Il34* and *Csf1*, soluble factors that bind to *Csf1r* and required for microglial development and maintenance in vivo⁴⁹, were elevated after knock-down of Spi1, while expression of Csf1r was 480
- 481 reduced (Fig. 4a, 4c). Interestingly, inhibition of Csf1r in a 3xTg-AD mouse model led to a
- 482 reduction in the number of microglia associated with *B*-amyloid plaques and improved
- cognition⁵⁰. These findings suggest the importance of analyzing cell proliferation, survival, 483
- 484 differentiation, and migration phenotypes with differential Spi1 expression, because Spi1 levels
- 485 modulate expression of Ccl2 and Cxcl2 (Fig. 4a), which are MCP1 and MIP2 α proteins that help
- 486 recruitcirculating monocytes and neutrophils to the brain to promote neuroinflammation. In
- 487 addition, knocking down Spil reduced expression of a microgliosis marker Aifl (Iba1) along
- 488 with *Il1b*, Nos2, Ptgs2, Arg1 and Nlrp3 (Fig. 4a, 4c), suggesting that decreased Spi1 expression
- 489 may blunt the pro-inflammatory response of microglial cells to improve disease outcomes.
- 490 Interestingly, expression of *Cx3cr1* and *Ax1* were elevated upon knock-down of *Spi1* (Fig. 4c), 491
- raising the possibility that beneficial effects of changes in *Spil* expression are exerted through 492 modulation of synaptic or neuronal clearance. Further experimental investigation of these
- 493 phenotypes may shed light on the mechanisms of SPI1 modulation of AD risk. Of note,
- 494 overexpression and knock-down of Spil in BV2 cells produce different and often opposite
- 495 changes in expression of the genes profiled here, possibly driving alternative phenotypes that
- 496 may underlie detrimental and protective roles of PU.1.
- 497

- 498 In summary, by combining AD survival and endophenotype GWAS analyses, we replicated and
- 499 discovered multiple genetic loci associated with AAOAAOS. Specifically, we nominate SPI1 as
- 500 the gene responsible for disease association at the previously reported *CELF1* locus. *SPI1*
- 501 encodes PU.1, a transcription factor expressed in microglia and other myeloid cells that directly
- regulates other AD-associated genes expressed in these cell types. Our data suggest that lower
- 503 SPI1 expression reduces risk for AD, suggesting a novel therapeutic approach to the treatment of
- AD. Furthermore, we demonstrate that AAOS-associated SNPs within the MS4A gene cluster
- are associated with eQTLs in myeloid cells for both MS4A4A and MS4A6A. Specifically, the
- allele associated with reduced AD risk is associated with lower MS4A4A and MS4A6A
- 507 expression. This is consistent with the observation that lowering *SPI1* expression, which is
- 508 protective for AD risk, also lowers MS4A4A and MS4A6A expression. These results reinforce the
- 509 emerging genetic and epigenetic association between AD and a network of microglial expressed
- 510 genes^{2,5,17–21}, highlighting the need to dissect their functional mechanisms.
- 511
- 512

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559

560 Author Contributions

- 561 A.M.G., E.M., and K.H. conceived and designed the experiments. K.H., S.C.J., O.H., A.D., M.K.,
- 562 J.C., J.C.L., V.C., C.B., B.G., Y.D., A.M., T.R., A.R., J.L.D., M.V.F, L.I., B.Z., I.B., C.C. and
- 563 E.M. performed data analysis. A.A.P. performed phagocytosis assays, western blotting and
- 564 qPCR validation. S.B., B.P.F., J.B., R.S., V.E.P., R.M., J.L.H., L.A.F., M.A.P., S.S., J.W., P.A.,
- 565 G.D.S., J.S.K.K., K.H., and C.C. provided and processed the data. A.M.G. supervised data
- analysis and functional experiments. K.H., A.A.P., E.M., and A.M.G. wrote and edited the
- 567 manuscript. All authors read and approved the manuscript.
- 568

569 **Competing Financial Interests Statement**

- 570 I.B. is an employee of Regeneron Pharmaceuticals, Inc. A.M.G. is on the scientific advisory
- 571 board for Denali Therapeutics and has served as a consultant for AbbVie and Cognition
- 572 Therapeutics.
- 573
- 574

575 Figure Legends

576

577 Figure 1. Genetic and eQTL fine-mapping of AD. (a) The AD-survival association landscape
578 at the *CELF1/SPI1* locus resembles that of *SPI1* eQTL association in monocytes and
579 macrophages. (b) The AD-survival association landscape resembles that of *MS4A4A/MS4A6A*

580 eQTL association in monocytes and macrophages.

581

Figure 2. *SPI1* (**PU.1**) expression and ChIP-Seq analysis. (a) $Rs1057233^{G}$ is associated with reduced *SPI1* expression in a dosage-dependent manner. (b) The mouse homolog of *SPI1*, *Sfpi1* or *Spi1*, is selectively expressed in microglia and macrophages in mouse brains based on the brain RNA-Seq database^{29–31}. OPCs contain 5% microglial contamination. (c) *SPI1* (PU.1) binds to the promoter and regulatory regions of *CD33*, *MS4A4A*, *MS4A6A*, *TREM2*, and *TREML2* in human CD14+ monocytes based on ChIP-Seq data³⁵.

588

589 Figure 3. PU.1 modulates the phagocytic activity of BV2 microglial cells. (a) Phagocytosis of 590 zymosan labeled with red pHrodo fluorescent dye in BV2 cells with transient overexpression and 591 knock-down of PU.1 was measured by flow cytometry. Cytochalasin D treatment was used as a 592 negative control. Mean phagocytic index \pm SD is shown: pcDNA 0.7373 \pm 0.1772, pcDNA + 1 593 μ M Cyt 0.0236 ± 0.0242, FLAG-PU.1 1.2630 ± 0.2503, shSCR 1.014 ± 0.3656, shA 0.4854 ± 594 0.1209, shB 0.2579 ± 0.06967 , shD 0.2002 ± 0.05168 . F(6.13) = 14.82, pcDNA vs pcDNA + 1 595 µM Cyt P=0.0078, pcDNA vs FLAG-PU.1 P=0.0295, shSCR vs shA P=0.0283, shSCR vs shB 596 P=0.0020, shSCR vs shD P=0.0010, n = 3. (b) BV2 cells were transiently transfected with 597 pcDNA3 (pcDNA) or pcDNA3-FLAG-PU.1 (FLAG-PU.1) and pCMV-GFP as described for 598 phagocytosis assay. Note a shift in mobility of the band for exogenous FLAG-PU.1 in 599 overexpression condition compared to endogenous PU.1 in control. (c) BV2 cells were 600 transiently transfected with shRNA targeting PU.1 (shA, shB and shD) or non-targeting control 601 (shSCR) in pGFP-V-RS vector. GFP⁺ cells were sorted with flow cytometer and analyzed for 602 levels of PU.1 in western blotting in two independent experiments (**b**, **c**). (**d**) Quantification of 603 PU.1 levels in c normalized to β -Actin as a loading control. Values are presented as mean \pm SD: 604 shSCR 100 \pm 2.10, shA 50.34 \pm 9.52, shB 16.03 \pm 14.72, shD 12.13 \pm 10.03. F(3,6) = 70.55, 605 shSCR vs shA P=0.0014, shSCR vs shB P < 0.0001, shSCR vs shD P < 0.0001, n = 2. * P < 0.05, ** P < 0.01, *** P < 0.001, one-way ANOVA with Sidak's post hoc multiple comparisons test 606 between selected groups. 607 608

609 **Figure 4. Genes regulated with differential expression of** *Spi1* **in BV2 microglial cells.** qPCR

analysis in transiently transfected and sorted GFP⁺ BV2 cells with overexpression (FLAG-PU.1)

and knock-down (shB) of *Spi1*. Changes in expression levels are grouped for genes with altered

- 612 levels after overexpression and knock-down of *Spi1* in (**a**) and genes with variable expression in
- 613 BV2 cells either with overexpression (**b**) or knock-down (**c**) of *Spi1*. Values are presented as
- 614 mean \pm SD, n = 4 samples collected independently. * P < 0.05, ** P < 0.01, *** P < 0.001, one-
- 615 way ANOVA with Dunnett's post hoc multiple comparisons test between experimental and 616 control groups, detailed statistical analysis is reported in **Supplementary Table 11**.
- 617
- 618
- 619

620 Tables

а

621**Table 1. Genome-wide survival analysis of Alzheimer's Disease.** (a) Description of Consortia622samples with available phenotype and genotype data included in the genome-wide survival623analysis. AAO: age at onset. AAE: age at last examination. (b) Summary of loci with significant624 $(P < 5x10^{-8})$ or suggestive $(P < 1x10^{-5})$ associations from the genome-wide survival analysis.

625

				Cases				Controls		
Dataset			Ν	Percent	Mean AAO yrs		Ν	Percent	Mean AAE y	
ADCC			8617	women 58.9	(s.d.) 74 2 (8 1)		9765	women 60.1	(s.d.)	
ADGC GERAD			2615	58.9 63.4	74.2 (8.1)		9763 1148	60.1 62.1	77.1 (8.4) 76.5 (7.0)	
EADI case		study	1420	67.2	73.0 (8.5) 72.1 (7.1)		878	61	70.3 (7.0) 72.2 (7.8)	
EADI case			387	61.8		3 (5.6)	5416	61.1	79.3 (5.3)	
-	RGE FH		229	65.5	85.7 (6.3)		1979	54.1	80.7 (7.5)	
	RGE CH		374	69.2	82.2 (5.0)		1675	60.6	81.1 (5.2)	
CHARG			764	73.2	83.1 (6.6)		4988	57.8	81.4 (6.9)	
	otal	••••	14406	61.7	74.8		25849	59.6	79.0	
b										
	Major/			BP		Logistic OR ^b	Logistic	Survival HR	Survival	Hetero geneit
SNP	minor Alleles	MAF	CHR ^a		Closest Gene		P value	(95% CI) ^c	P value	P valu
Previously re	ported ass	ociated le	oci							
rs2093761	G/A	0.2019	1	207786542	CR1	1.16 (1.12-1.20)	2.6x10 ⁻¹⁴	1.07 (1.04-1.10)	1.2x10 ⁻⁶	0.25
rs6431219	C/T	0.4163	2	127862133	BIN1	1.12 (1.09-1.15)	7.6x10 ⁻¹³	1.08 (1.06-1.10)	3.9x10 ⁻¹⁰	0.16
rs1057233	A/G	0.3194	11	47376448	SPI1/CELF1 ^d	0.93 (0.89-0.96)	5.4x10 ⁻⁶	0.94 (0.9197)	8.4x10 ⁻⁶	0.86
rs7930318	T/C	0.4004	11	60033371	MS4A	0.90 (0.87-0.93)	5.1x10 ⁻¹¹	0.93 (0.9095)	2.3x10 ⁻⁹	0.6
rs567075	C/T	0.3097	11	85830157	PICALM 0.88 (0.85-0.9		4.3x10 ⁻¹⁴	0.91 (0.8994)	9.1x10 ⁻¹²	0.74
rs9665907	G/A	0.1133	11	121435470	SORL1 0.88 (0.83-0.93)		1.8x10 ⁻⁷	0.92 (0.8895)	5.5x10 ⁻⁶	0.96
rs17125944	T/C	0.0924	14	53400629	<i>FERMT2</i> 1.13 (1.08-1.18)		1.0x10 ⁻⁵	1.10 (1.06-1.14)	2.3x10 ⁻⁶	0.31
rs4803758	G/T	0.3551	19	45327423	APOE ^e 1.33 (1.30-1.37) 1.2x10 ⁻⁶⁷ 1.21 (1.18-1.23)		7.8x10 ⁻⁵²	0.32		
Novel loci red	aching sug	gestive si	gnificance							
rs10919252	C/G	0.3275	1	169802956	Clorf112	1.04 (1.01-1.08)	1.1x10 ⁻²	1.10 (1.06-1.14)	8.2x10 ⁻⁷	0.92
rs1532244	A/G	0.0925	3	28057905	CMC1	0.95 (0.90-1.01)	6.9x10 ⁻²	0.86 (0.8093)	9.7x10 ⁻⁶	0.99
rs116341973	A/G	0.0227	3	63462893	SYNPR	1.20 (1.09-1.30)	5.4x10 ⁻⁴	1.23 (1.15-1.31)	2.5x10 ⁻⁷	0.62
rs71602496	A/G	0.1453	4	661002	PDE6B	1.02 (0.98-1.06)	3.6x10 ⁻¹	1.08 (1.05-1.11)	5.0x10 ⁻⁶	0.11
rs1689013	T/C	0.2493	4	181048651	LINC00290	1.02 (0.98-1.06)	2.7x10 ⁻¹	1.07 (1.04-1.09)	4.7x10 ⁻⁶	0.31
rs7445192	A/G	0.461	5	140138701	PCDHA1	NA	NA	1.06 (1.03-1.08)	7.9x10 ⁻⁶	0.77
rs12207208	T/C	0.1034	6	40301379	LINC00951	1.07 (1.02-1.20)	1.2x10 ⁻²	1.09 (1.05-1.13)	6.8x10 ⁻⁶	0.78
rs17170228	G/A	0.0623	7	33076314	NT5C3A	1.07 (1.01-1.14)	2.5x10 ⁻²	1.13 (1.08-1.18)	1.0x10 ⁻⁶	0.94
rs2725066	A/T	0.4872	8	4438058	CSMD1	1.03 (1.00-1.06)	7.3x10 ⁻²	1.10 (1.06-1.14)	1.0x10 ⁻⁶	0.6
rs7867518	T/C	0.476	9	2527525	VLDLR	0.97 (0.94-1.00)	6.8x10 ⁻²	0.95 (0.9297)	9.1x10 ⁻⁶	0.79

rs1625716	T/G	0.0643	10	59960083	ІРМК	0.87 (0.80-0.94)	1.0x10 ⁻⁴	0.88 (0.8294)	7.7x10 ⁻⁶	0.95
rs1118069	T/A	0.2805	12	84739181	SLC6A15	0.98 (0.94-1.01)	2.0x10 ⁻¹	0.90 (0.8695)	2.7x10 ⁻⁶	0.8
rs11074412	A/G	0.2087	16	19833001	IQCK	0.94 (0.90-0.98)	1.9x10 ⁻³	0.93 (0.9096)	7.0x10 ⁻⁶	0.48
rs5750677	C/T	0.2885	22	39147715	SUN2	0.97 (0.93-1.00)	5.1x10 ⁻²	0.94 (0.9197)	5.2x10 ⁻⁶	0.51

aBuild 37, assembly hg19. ^bSummary statistics of the logistic regression were obtained from stage 1 of the IGAP GWAS. ^cCalculated with respect to the minor allele. ^dSPII is the nearest gene to rs1057233. The same locus was previously labeled as *CELF1* in the 2013 IGAP GWAS paper¹. ^eThe nearest gene to rs4803758 is *APOE*.

632 Table 2. Summary of CSF biomarker-associations of suggestive and significant AAOS-

633 **associated SNPs.** Associations reaching the significance threshold after Bonferroni correction 634 for multiple testing ($P < 2.27 \times 10^{-3}$) are bolded.

SNP	CHR	Closest gene	Beta _{tau}	P _{tau}	Beta _{ptau}	P _{ptau}	Beta _{ab42}	P _{ab42}			
Previously reported associated loci											
rs2093761	1	CR1	-	>0.05	1.46x10 ⁻²	2.87x10 ⁻²	-	>0.05			
rs6431219	2	BIN1	-	>0.05	-	>0.05	-	>0.05			
rs1057233	11	CELF1	-1.11x10 ⁻²	6.55x10 ⁻²	-1.25x10 ⁻²	2.76x10 ⁻²	1.45x10 ⁻²	8.24x10 ⁻⁴			
rs7930318	11	MS4A	-1.24x10 ⁻²	3.27x10 ⁻²	-	>0.05	-	>0.05			
rs567075	11	PICALM	-1.32x10 ⁻²	3.22×10^{-2}	-1.24x10 ⁻²	3.13x10 ⁻²	9.10x10 ⁻³	3.88x10 ⁻²			
rs9665907	11	SORL1	-1.74x10 ⁻²	4.28x10 ⁻²	-1.94x10 ⁻²	1.57x10 ⁻²	-	>0.05			
rs17125944	14	FERMT2	2.50x10 ⁻²	8.71x10 ⁻³	2.09x10 ⁻²	2.09x10 ⁻²	-1.79x10 ⁻²	8.90x10 ⁻²			
rs4803758	19	APOE	1.61x10 ⁻²	7.42x10 ⁻³	2.01x10 ⁻²	3.75x10 ⁻⁴	-1.79x10 ⁻²	3.12x10 ⁻⁴			
Novel candida	te loci										
rs10919252	1	Clorf112	-	>0.05	-	>0.05	-	>0.05			
rs1532244	3	CMC1	-	>0.05	2.41x10 ⁻²	1.23x10 ⁻²	-	>0.05			
rs116341973	3	SYNPR	-	>0.05	-	>0.05	-	>0.05			
rs71602496	4	PDE6B	-	>0.05	-	>0.05	-	>0.05			
rs1689013	4	LINC00290	-	>0.05	-	>0.05	-	>0.05			
rs7445192	5	PCDHA1	-	>0.05	1.38x10 ⁻²	9.98x10 ⁻³	-	>0.05			
rs12207208	6	LINC00951	-	>0.05	-	>0.05	-	>0.05			
rs17170228	7	NT5C3A	-	>0.05	-	>0.05	-	>0.05			
rs2725066	8	CSMD1	1.20x10 ⁻²	4.53x10 ⁻²	-	>0.05	-	>0.05			
rs7867518	9	VLDLR	-1.58x10 ⁻²	5.83x10 ⁻³	-	>0.05	-	>0.05			
rs1625716	10	IPMK	-	>0.05	-	>0.05	-	>0.05			
rs1118069	12	SLC6A15	-	>0.05	-	>0.05	-1.07x10 ⁻²	1.56x10 ⁻²			
rs11074412	16	IQCK	-	>0.05	-	>0.05	-	>0.05			
rs5750677	22	SUN2	1.30x10 ⁻²	3.55x10 ⁻²	-	>0.05	_	>0.05			

635

637 Table 3. Significant *cis*-eQTL associations of the 22 suggestive and significant AAOS-

638 **associated SNPs.** Significance threshold is determined to be 2.52x10⁻⁶ based on Bonferroni

639 correction for multiple testing. The minor alleles are considered as the effective allele.

				Monocyte		Macroph	age
SNPID	CHR	Probe_Id	Gene	P value	Beta	P value	Beta
rs10919252	1	ILMN_1724422	SELL	7.33x10 ⁻³⁵	-0.65	-	-
rs71602496	4	ILMN_1769751	PIGG	5.19x10 ⁻¹⁰	-0.46	9.11x10 ⁻¹³	-0.58
rs1625716	10	ILMN_2122953	CISD1	5.98x10 ⁻²³	-1.09	7.82x10 ⁻⁸	-0.67
rs1057233	11	ILMN_1696463	SPI1	1.50×10^{-105}	-1.11	6.41x10 ⁻⁸⁷	-1.11
rs1057233	11	ILMN_1781184	МҮВРС3	4.99x10 ⁻⁵¹	-0.83	5.58x10 ⁻²³	-0.62
rs1057233	11	ILMN_1686516	CELF1	3.95x10 ⁻⁸	0.32	-	-
rs1057233	11	ILMN_2382083	CELF1	1.13x10 ⁻⁷	0.31	1.31x10 ⁻⁴	0.25
rs1057233	11	ILMN_1652989	NUP160	1.42x10 ⁻⁵	-0.26	5.35x10 ⁻²²	-0.62
rs7930318	11	ILMN_2370336	MS4A4A	8.20x10 ⁻²⁸	-0.56	-	-
rs7930318	11	ILMN_1721035	MS4A6A	4.90x10 ⁻²³	-0.52	1.25x10 ⁻⁹	-0.35
rs7930318	11	ILMN_1741712	MS4A4A	1.48x10 ⁻¹¹	-0.36	1.54x10 ⁻⁴	-0.22
rs7930318	11	ILMN_2359800	MS4A6A	1.94x10 ⁻¹⁰	-0.34	3.77x10 ⁻⁹	-0.34
rs11074412	16	ILMN_1783712	LOC400506	6.49x10 ⁻¹⁷	0.54	-	-
rs11074412	16	ILMN_2081883	IQCK	-	-	1.22×10^{-12}	-0.52
rs4803758	19	ILMN_2337336	PVRL2	1.52x10 ⁻⁸	0.30	-	
rs5750677	22	ILMN_2099301	SUN2	3.66x10 ⁻⁵⁸	-0.90	3.15x10 ⁻³⁶	-0.80
rs5750677	22	ILMN_1730879	CBY1	1.80x10 ⁻⁹	-0.37	-	-

640

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758 **Online Methods**

- 759 Genome-wide survival association study datasets
- 760 The final meta-analysis dataset consists of samples from the Alzheimer's Disease Genetics
- 761 Consortium (ADGC), Genetic and Environmental Risk in Alzheimer's Disease (GERAD),
- 762 European Alzheimer's Disease Initiative (EADI), and Cohorts for Heart and Aging Research in
- 763 Genomic Epidemiology (CHARGE). The study cohorts consist of case-control and longitudinal
- cohorts. For all studies, 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
- 767 Institutional review boards. Details of ascertainment and diagnostic procedures for each dataset
- extend from details previously described¹⁻⁵ and are documented below:
- 769
- 770 (1) Alzheimer's Disease Genetics Consortium (ADGC)
- The imputed ADGC sample that passed quality control procedures comprised of 8,617 AD cases
- and 9,765 control subjects from GWAS datasets assembled by the Alzheimer's Disease Genetics
- 773 Consortium (ADGC). Details of ascertainment and diagnostic procedures for each data set were
- as previously described².
- 775
- (2) Genetic and Environmental Risk in Alzheimer's Disease (GERAD)

777 Data used in the preparation of this article were obtained from the Genetic and Environmental 778 Risk for Alzheimer's disease (GERAD) Consortium. The imputed GERAD sample comprised 779 3,177 AD cases and 7,277 controls with available age and gender data. A subset of this sample 780 has been used in this study, comprising 2,615 cases and 1,148 elderly screened controls. Cases 781 and elderly screened controls were recruited by the Medical Research Council (MRC) Genetic 782 Resource for AD (Cardiff University; Institute of Psychiatry, London; Cambridge University; 783 Trinity College Dublin), the Alzheimer's Research UK (ARUK) Collaboration (University of 784 Nottingham; University of Manchester; University of Southampton; University of Bristol; 785 Oueen's University Belfast; the Oxford Project to Investigate Memory and Ageing (OPTIMA), 786 Oxford University); Washington University, St Louis, United States; MRC PRION Unit, 787 University College London; London and the South East Region AD project (LASER-AD), University College London; Competence Network of Dementia (CND) and Department of 788 789 Psychiatry, University of Bonn, Germany; the National Institute of Mental Health (NIMH)AD 790 Genetics Initiative. 6,129 population controls were drawn from large existing cohorts with 791 available **GWAS** data. including the 1958 British Birth Cohort (1958BC) 792 (http://www.b58cgene.sgul.ac.uk), the KORA F4 Study and the Heinz Nixdorf Recall Study. All 793 AD cases met criteria for either probable (NINCDS-ADRDA, DSM-IV) or definite (CERAD) 794 AD. All elderly controls were screened for dementia using the MMSE or ADAS-cog, were 795 determined to be free from dementia at neuropathological examination or had a Braak score of 796 2.5 or lower. Genotypes from all cases and 4,617 controls were previously included in the AD 797 GWAS by Harold and colleagues (2009). Genotypes for the remaining 2,660 population controls 798 were obtained from WTCCC2. Imputation of the dataset was performed using IMPUTE2 and the 799 1000 genomes (http://www.1000genomes.org/) Dec2010 reference panel (NCBI build 37.1). The 800 imputed data was then analysed using logistic regression including covariates for country of 801 origin. gender, age and 3 principal components obtained with EIGENSTRAT software based on 802 individual genotypes for the GERAD study participants.

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834

835 (3) European Alzheimer's Disease Initiative (EADI)

All AD cases were ascertained by neurologists from Bordeaux, Dijon, Lille, Montpelier, Paris,

and Rouen, with clinical diagnosis of probable AD established according to the DSM-III-R and

838 National Institute of Neurological and Communication Disorders and Stroke-Alzheimer's

839 Disease and Related Disorders Association (NINCDS-ADRDA) criteria^{51,52}. Controls were

840 recruited from Lille, Rouen, Nantes and from the 3C Study⁵¹. This cohort is a population-based,

841 prospective study of the relationship between vascular factors and dementia. It has been carried

842 out in three French cities: Bordeaux (southwest France), Montpelier (southeast France) and

843 Dijon (central eastern France). A sample of non-institutionalized, subjects over 65 years was

randomly selected from the electoral rolls of each city. Between January 1999 and March 2001,

845 9,686 subjects meeting the inclusion criteria agreed to participate. Following recruitment, 392

subjects withdrew from the study. Thus, 9,294 subjects were finally included in the study (2,104

847 in Bordeaux, 4,931 in Dijon and 2,259 in Montpellier). At 8 years of follow up, 664 individuals

848 suffered from AD with 167 prevalent and 497 incident cases. The other individuals were

considered as controls. 9863 DNA samples that passed DNA quality control were genotyped

850 with Illumina Human 610-Quad BeadChips. Following quality control procedures, a final sample

size of 5,803 3C individuals (387 AD cases and 5,416 controls, cohort dataset) and 2,298 non-3C

- 852 individuals (1,420 AD cases and 878 controls, case-control dataset) was included in this study.
- 853

(4) Cohorts for Heart and Aging Research in Genomic Epidemiology (CHARGE)

Cardiovascular Health Study (CHS): The CHS is a prospective population-based cohort study of risk factors for vascular and metabolic disease that in 1989-90, enrolled adults aged \geq 65 years, at four field centers located in North Carolina, California, Maryland and Pennsylvania. The original predominantly Caucasian cohort of 5,201 persons was recruited from a random sample of people

- 859 on Medicare eligibility lists and an additional 687 African-Americans were enrolled
- subsequently for a total sample of 5,8882. DNA was extracted from blood samples drawn on all
- persons who consented to genetic testing at their baseline examination in 1989-90. In 2007-2008,
 genotyping was performed at the General Clinical Research Center's Phenotyping/Genotyping
- Laboratory at Cedars-Sinai using the Illumina 370CNV Duo ® BeadChip system on 3,980 CHS
- participants who were free of cardiovascular disease (CVD) at baseline. The 1,908 persons
- excluded for prevalent CVD had prevalent coronary heart disease (n=1,195), congestive heart
- failure (n=86), peripheral vascular disease (n=93), valvular heart disease (n=20), stroke (n=166)
- 867 or transient ischemic attack (n=56). Some persons had more than one reason to be excluded and

868 for these individuals only the initial exclusionary event is listed. Because the other cohorts were

- 869 predominantly white, the African American CHS participants were excluded from this analysis 870 to limit errors secondary to population stratification. Among white participants genotyping was
- attempted in 3.397 participants and was successful in 3295 persons. After excluding persons that
- had either died prior to the start of the CHS cognition study in 1992 (see section 3 for details),
- 873 could not be evaluated completely for baseline cognitive status, and persons that had dementia
- other than AD, a sample of 2,049 persons was available. The CHS study protocols were
- approved by the Institutional review boards at the individual participating centers.
- 876 The AD sample for this study included all prevalent cases identified in 1992 and incident events
- 877 identified between 1992 and December 20063. Briefly, persons were examined annually from
- enrollment to 1999. The examination included a 30 minute screening cognitive battery. In 199294 and again, in 1997-99, participants were invited to undergo brain MRI and detailed cognitive
- and neurological assessment as part of the CHS Cognition Study. Persons with prevalent
- and neurological assessment as part of the CHS Cognition Study. Persons with prevalent domentic were identified, and all others were followed until 1000 for the development of
- dementia were identified, and all others were followed until 1999 for the development of incident dementia and AD. Since then, CHS participants at the Maryland and Pennsylvania
- incident dementia and AD. Since then, CHS participants at the Maryland and Pennsylvania
 centers have remained under ongoing dementia surveillance⁵³.

Beginning in 1988/89, all participants completed the Modified Mini-Mental State Examination

- (3MSE) and the DSST at their annual visits, and the Benton Visual Retention Test (BVRT) from
- 1994 to 1998. The Telephone Interview for Cognitive Status (TICS) was used when participants
- did not come to the clinic. Further information on cognition was obtained from proxies using the
- 888 Informant Questionnaire for Cognitive Decline in the Elderly (IQCODE), and the dementia
- questionnaire (DQ). Symptoms of depression were measured with the modified version of the
- 890 Center for Epidemiology Studies Depression Scale (CES-D). In 1991-94, 3,608 participants had
- an MRI of the brain and this was repeated in 1997-98. The CHS staff also obtained information
- 892 from participants and next-of-kin regarding vision and hearing, the circumstances of the illness,
- 893 history of dementia, functional status, pharmaceutical drug use, and alcohol consumption. Data

on instrumental activities of daily living (IADL), and activities of daily living (ADL) were alsocollected.

- 896 Persons suspected to have cognitive impairment based on the screening tests listed above
- underwent a neuropsychological and a neurological evaluation. The neuropsychological battery
- included the following tests: the American version of the National Reading test (AMNART),
- 899 Raven's Coloured Progressive Matrices, California Verbal Learning Test (CVLT), a modified
- 900 Rey-Osterreith figure, the Boston Naming test, the Verbal fluency test, the Block design test, the
- 901 Trails A and B tests, the Baddeley & Papagno Divided Attention Task, the Stroop, Digit Span
- and Grooved Pegboard Tests. The results of the neuropsychological battery were classified as
- normal or abnormal (>1.5 standard deviations below individuals of comparable age and
- education) based on normative data collected from a sample of 250 unimpaired subjects. The
- 905 neurological exam included a brief mental status examination, as well as a complete examination
- 906 of other systems. The examiner also completed the Unified Parkinson's Disease Rating Scale
- 907 (UPDRS) and the Hachinski Ischemic Scale. After completing the neurological exam, the
- 908 neurologist classified the participant as normal, having mild cognitive impairment (MCI), or 909 dementia.
- 910 International diagnostic guidelines, including the NINCDS-ADRDA criteria for probable and
- 911 possible AD and the ADDTC's State of California criteria for probable and possible vascular
- 912 dementia (VaD) with or without AD, were followed. CHS identified 3 subtypes:
- 913 possible/probable AD without VaD (categorized as pure AD, included in all AD) and mixed AD
- 914 (for cases that met criteria for both AD and VaD, included in all-AD), and, possible/probable
- 915 VaD without AD (excluded from current study).
- 916

917 Framingham Heart Study (FHS): The FHS is a three-generation, single-site, community-based,

- 918 ongoing cohort study that was initiated in 1948. It now comprises three generations of
- participants including the Original cohort followed since $1948 (n=5,209)^{54}$, their Offspring and
- spouses of the offspring (n=5,216) followed since 1971^{55} ; and children from the largest
- 921 Offspring families enrolled in 2000 (Gen 3)⁵⁶. Participants in the Original and Offspring cohorts
- are used in these analyses, but Gen 3 participants were not included since they are young (mean
- age 40±9 years in 2000) and none had developed Alzheimer's Disease (AD). The Original cohort
- enrolled 5,209 men and women who comprised two-thirds of the adult population then residing
- 925 in Framingham, Massachusetts. Survivors continue to receive biennial examinations. The
 926 Offspring cohort comprises 5,124 persons (including 3,514 biological offspring) who have been
- 927 examined approximately once every 4 years. Almost all the FHS Original and Offspring
- participants are white/Caucasian. FHS participants had DNA extracted and provided consent for
- genotyping in the 1990s. All available eligible participants were genotyped at Affymetrix (Santa
- 930 Clara, CA) through an NHLBI funded SNP-Health Association Resource (SHARe) project using
- 931 the Affymetrix GeneChip ® Human Mapping 500K Array Set and 50K Human Gene Focused
- Panel ®. In 272 persons, small amounts of DNA were extracted from stored whole blood and
- required whole genome amplification prior to genotyping. Cell lines were available for most of
- the remaining participants. Genotyping was attempted in 5,293 Original and Offspring cohort
- 935 participants, and 4,425 persons met QC criteria. Failures (call rate <97%, extreme heterozygosity
- or high Mendelian error rate) were largely restricted to persons with whole-genome amplified
 DNA and DNA extracted from stored serum samples. In addition, since the persons with whole
- 937 DNA and DNA extracted from stored serum samples. In addition, since the persons with whol
 938 genome amplified DNA represent a group of survivors who may differ from the others we
- included whole genome amplified status as a covariate in FHS analyses. After exclusion of

prevalent dementia, dementia other than AD, and missing values, a sample of 2,208 participants

941 was available for this project. The FHS component of this study was approved by the

942 Institutional Review Board of the Boston Medical Center.

943 The Original cohort of the FHS has been evaluated biennially since 1948, was screened for 944 prevalent dementia and AD in 1974-76 and has been under surveillance for incident dementia and AD since then^{57–59}. The Offspring have been examined once every 4 years and have been 945 screened for prevalent dementia with a neuropsychological battery and brain MRI^{60,61}. In order to 946 947 be consistent with the sampling frame for the AGES and CHS samples, we excluded FHS 948 subjects with a baseline age <65 yrs at the time of DNA draw which was in the 1990s. To 949 minimize survival biases, Original cohort and Offspring participants who developed dementia 950 prior to the date of DNA draw were treated as prevalent cases, and subsequent events in the 951 Original cohort occurring prior to December 2006 were included in the incident analyses. 952 At each clinic exam, participants receive questionnaires, physical examinations and laboratory 953 testing; between examinations they remain under surveillance (regardless of whether or not they 954 live in the vicinity) via physician referrals, record linkage and annual telephone health history updates. Methods used for dementia screening and follow-up have been previously described^{57,62}. 955 956 Briefly, surviving cohort members who attended biennial examination cycles 14 and 15 (May 957 1975-November 1979) were administered a standardized neuropsychological test battery to 958 establish a dementia-free cohort. Beginning at examination cycle 17 (1982), the MMSE was 959 administered biennially to the cohort. A MMSE score below the education-specific cutoff score, 960 a decline of 3 or more points on subsequent administrations, a decline of more than 5 points 961 compared with any previous examination, or a physician or family referral prompted further in-962 depth testing. The Offspring cohort that was enrolled in 1971 has undergone 8 re-examinations, 963 one approximately every 4 years. Starting at the 2nd Offspring examination, participants were 964 questioned regarding any subjective memory complaints and since the 5th Offspring examination 965 participants have been administered the MMSE at each visit. In addition concurrent with the 7th 966 and 8th Offspring examinations (between 1999 and 2004 and then again between 2005 and 2009) 967 surviving Original cohort and all eligible and consenting Offspring participants have undergone volumetric brain MRI and neuropsychological testing^{60,61}. The neuropsychological test battery 968 969 included the Reading subtest of the Wide Range Achievement Test (WRAT-3), the Logical 970 Memory and the Paired Associates Learning tests from the Wechsler Memory Scale, the Visual 971 Reproduction and Hooper Visual Organization Tests, Trails A and B, the Similarities subtest 972 from the Wechsler Adult Intelligence test, the 30-iterm version of the Boston Naming Test and at 973 the second assessment only, the Digit Span, Controlled Word Association and Clock Drawing 974 Tests. Offspring participants suspected to have cognitive impairment based on their MMSE 975 scores, participant, family or physician referral, hospital records or performance in the 976 neuropsychological test battery described above were referred for more detailed 977 neuropsychological and neurological evaluation. 978 Each participant thus identified underwent baseline neurologic and neuropsychological 979 examinations. Neurologists (trained in geriatric behavioral assessment) supplemented their 980 clinical assessment with a few structured cognitive tests and administered the Clinical Dementia 981 Rating (CDR). Persons were reassessed systematically for the onset of at least mild dementia. A 982 panel consisting of at least 1 neurologist (S.A., P.A.W., or S.S.) and 1 neuropsychologist (R.A.)

983 reviewed all available medical records to arrive at a final determination regarding the presence or

absence of dementia, the date of onset of dementia, and the type of dementia. For this

985 determination, we used data from the neurologist's examination, neuropsychological test

986 performance, Framingham Study records, hospital records, information from primary care 987 physicians, structured family interviews, computed tomography and magnetic resonance imaging 988 records, and autopsy confirmation when available. All individuals identified as having dementia 989 satisfied the DSM-IV criteria, had dementia severity equivalent to a CDR of 1 or greater, and had 990 symptoms of dementia for at least 6 months. All individuals identified as having Alzheimer-991 related dementia met the NINCDS-ADRDA criteria for definite, probable, or possible AD. 992 Vascular Dementia was diagnosed using the ADDTC criteria but the presence of vascular 993 dementia did not disqualify a participant from obtaining a concomitant diagnosis of AD if 994 indicated. The recruitment of Original cohort participants at FHS had occurred long before the 995 DNA collection with the result that the majority of dementia events in the FHS (although 996 ascertained prospectively) were prevalent at the time of DNA collection or these persons had 997 died prior to DNA draw and were thus excluded from analyses of incident disease. Due to the 998 limited number of incident dementia and AD events in the Framingham Offspring only the 999 Original cohort were included in our analyses of incident events.

1000

1001 Rotterdam Study: The Rotterdam Study enrolled inhabitants from a district of Rotterdam 1002 (Ommoord) aged \geq 55 years (N=7,983, virtually all white) at the baseline examination in 1990-93 when blood was drawn for genotyping⁶³. It aims to examine the determinants of disease and 1003 1004 health in the elderly with a focus on neurogeriatric, cardiovascular, bone, and eye disease. All 1005 inhabitants of Ommoord aged \geq 55 years (n = 10,275) were invited and the participation rate was 1006 78%. All participants gave written informed consent to retrieve information from treating 1007 physicians. Baseline measurements were obtained from 1990 to 1993 and consisted of an 1008 interview at home and two visits to the research center for physical examination. Survivors have 1009 been re-examined three times: in 1993-1995, 1997-1999, and 2002-2004. All persons attending 1010 the baseline examination in 1990-93 consented to genotyping and had DNA extracted. This DNA 1011 was genotyped using the Illumina Infinium II HumanHap550chip v3·0 ® array in 2007-2008 1012 according to the manufacturer's protocols. Genotyping was attempted in persons with high-1013 quality extracted DNA (n=6,449). From these 6,449, samples with low call rate (<97.5%, n=209), 1014 with excess autosomal heterozygosity (>0.336, n=21), with sex-mismatch (n=36), or if there 1015 were outliers identified by the IBS clustering analysis (>3 standard deviations from population 1016 mean, n=102 or IBS probabilities >97%, n=129) were excluded from the study population with 1017 some persons meeting more than one exclusion criterion; in total, 5,974 samples were available 1018 with good quality genotyping data, 42 persons were excluded since they did not undergo 1019 cognitive screening at baseline, hence their cognitive status was uncertain. An additional 61 1020 persons were excluded because they suffered from dementia other than AD at baseline. After 1021 exclusion of prevalent dementia, a sample of 5752 persons was available. The Rotterdam Study 1022 (including its brain magnetic resonance imaging (MRI) and neurological components) has been 1023 approved by the institutional review board (Medical Ethics Committee) of the Erasmus Medical 1024 Center and the Netherlands Ministry of Health, Welfare and Sports Participants were screened 1025 for prevalent dementia in 1990-93 using a three-stage process; those free of dementia remained 1026 under surveillance for incident dementia, a determination made using records linkage and 1027 assessment at three subsequent re-examinations. We included all prevalent cases and all incident 1028 events up to 31st December 2007. 1029 Screening was done with the MMSE and GMS organic level for all persons. Screen-positives (MMSE <26 or Geriatric Mental Schedule (GMS) organic level >0) underwent the CAMDEX. 1030

1031 Persons who were suspected of having dementia underwent more extensive neuropsychological

testing. When available, imaging data were used. In addition, all participants have been 1032

- 1033 continuously monitored for major events (including dementia) through automated linkage of the
- 1034 study database with digitized medical records from general practitioners, the Regional Institute
- 1035 for Outpatient Mental Health Care and the municipality. In addition physician files from nursing
- 1036 homes and general practitioner records of participants who moved out of the Ommoord district
- 1037 were reviewed twice a year. For suspected dementia events, additional information (including
- 1038 neuroimaging) was obtained from hospital records and research physicians discussed available
- 1039 information with a neurologist experienced in dementia diagnosis and research to verify all 1040 diagnoses. Dementia was diagnosed in accordance with internationally accepted criteria for
- 1041 dementia (Diagnostic and Statistical Manual of Mental Disorders, Revised Third Edition, DSM-
- 1042 III-R), and AD using the NINCDS-ADRDA criteria for possible, probable and definite AD. The
- 1043 National Institute of Neurological Disorders and Stroke-Association Internationale pour la
- 1044 Recherche et l'Enseignement en Neurosciences (NINDS-AIREN) criteria were used to diagnose
- 1045 vascular dementia. The final diagnosis was determined by a panel of a neurologist,
- 1046 neurophysiologist, and research physician and the diagnoses of AD and VaD were not mutually exclusive.
- 1047
- 1048
- 1049 (5) Power Calculation

1050 To determine the power to detect genetic variants associated with age at onset, we ran analyses 1051 using Proc Power in SAS. The analysis was run using minor allele frequencies ranging from 0.05 1052 to 0.50, OR 1.1 to 1.75 and sample size of 45,000. Other factors, such as genetic heterogeneity 1053 and gene-environment interaction are likely to affect these estimates. Alpha was adjusted to 1054 5×10^{-8} . For variants with a MAF of 0.15, we would have approximately 80% power to detect 1055 effects for OR > 1.23 or < 0.81; for variants with a MAF of 0.3, we would have approximately 1056 80% power to detect effects for OR > 1.18 (or < 0.85).

1057

1058 CSF biomarker datasets

1059 CSF samples were obtained from the Knight-ADRC (N=805), ADNI-1 (N=390), ADNI-2 (N=397), the Biomarkers for Older Controls at Risk for Dementia (BIOCARD) (N=184), Mayo 1060

1061 Clinic (N=433), Lund University (Swedish) (N=293), University of Pennsylvania (Penn)

- 1062 (N=164), University of Washington (N=375), The Parkinson's Progression Markers Initiative
- (500) and Saarland University (German) (N=105). 1063
- 1064

Cases were diagnosed with dementia of the Alzheimer's type (DAT) according to the NINCDS-1065 ADRDA²⁰. Control individuals were evaluated using the same criteria and showed no symptoms 1066 1067 of cognitive impairment. All participants provided written informed consent and the ethics committee approved the informed consent procedure (IRB ID #: 201105364). 787 additional 1068 1069 samples with biomarker data used in the analyses were obtained from the ADNI database 1070 (adni.loni.usc.edu). ADNI was launched in 2003 as a public-private partnership, led by Principal 1071 Investigator Michael W. Weiner, MD. The primary goal of ADNI has been to test whether serial 1072 magnetic resonance imaging (MRI), positron emission tomography (PET), other biological 1073 markers, and clinical and neuropsychological assessment can be combined to measure the progression of mild cognitive impairment (MCI) and early Alzheimer's disease (AD). 1074 CSF in all studies was collected in a standardized manner^{12,64–67}. Biomarker measurements 1075 1076 within each study were conducted using internal standards and controls to achieve consistency

1077 and reliability. However, differences in the measured values between studies were observed 1078 which are likely due to differences in the antibodies and technologies used for quantification

- 1079 (standard ELISA with Innotest for Knight-ADRC, UW, Swedish, German, and Mayo versus
- 1080 Luminex with AlzBio3 for ADNI-1, ADNI-2, BIOCARD and Penn), ascertainment and/or
- handling of the CSF after collection. CSF $A\beta_{42}$ and ptau₁₈₁ values were log transformed in order to approximate a normal distribution. Because the CSF biomarker values were measured using
- 1082 to approximate a normal distribution. Because the CSF biomarker values were measured using 1083 two different platforms (standard ELISA with Innotest and Luminex with AlzBio3), we did not
- 1085 two different platforms (standard ELISA with Innotest and Luminex with Al2Bio5), we did i 1084 combine the raw data. For the combined analyses, we standardized the mean of the log-
- 1085 transformed values from each dataset to zero. No significant differences in the transformed and
- 1086 standardized CSF values were found between cohorts. We also performed meta-analyses for the
- 1087 most significant SNPs by combining the P values for each independent dataset using $METAL^{68}$.
- 1088 No major differences were found between the joint-analyses and the meta-analyses.
- 1089
- 1090 Quality Control
- 1091 For survival analysis, we excluded cases with AAO below 60 and cases with prevalent stroke.
- 1092 For CSF analysis, individuals under age 45 years were removed because prior studies have
- 1093 demonstrated that the relationship between CSF A β_{42} levels and age appears to differ in
- 1094 individuals below 45 years vs. those above 45 years⁶⁹. Of the remaining individuals in both
- analyses, we excluded individuals who had > 5% missing genotype rates, who showed a
- 1096 discrepancy between reported sex and sex estimated on the basis of genetic data, or who showed
- 1097 evidence of non-European ancestry based on principal component analysis using PLINK 1.9^{70} .
- 1098 We identified unanticipated duplicates and cryptic relatedness using pair-wise genome-wide
- 1099 estimates of proportion identity by descent (IBD) using PLINK. When duplicate samples or a
- pair of samples with cryptic relatedness was identified, the sample with the lower genotyping
- 1101 call rate was removed. We excluded potentially related individuals so that all remaining
- 1102 individuals have kinship coefficient below 0.05. Finally, we excluded individuals with missing 1103 disease status, age or gender information.
- 1104 To control for genotype quality, we excluded SNPs with missing genotypes in > 5% of
- 1105 individuals in each dataset for survival analysis, and > 2% for CSF association analysis. For the
- 1106 EADI cohort, variants with minor allele frequency < 1%, Hardy-Weinberg P value $< 1x10^{-6}$ and
- 1107 missingness > 2% were removed prior to imputation. Genome-wide genotype imputation was
- performed using IMPUTE2⁷¹ with 1000 Genomes reference haplotypes. We excluded imputed
- 1109 SNPs with an IMPUTE2 quality score < 0.5 for survival analysis. For CSF association, we
- 1110 excluded SNPs with an IMPUTE2 quality score of < 0.3 since the dataset was only used for
- 1111 follow-up. In the ADGC, GERAD, CHARGE, and CSF datasets, we then removed SNPs that
- 1112 failed the Hardy-Weinberg equilibrium in controls calculated based on the imputed best-guess
- 1113 genotypes using a P value threshold of 1×10^{-6} . We excluded SNPs with minor allele frequency \leq
- 1114 0.02. Finally, we excluded SNPs with available statistics in only one consortium dataset in the
- 1115 meta-analysis. The number of filtered samples and SNPs in each of the above steps are recorded 1116 in **Supplementary Table 1**.
- 1117

1118 Genome-wide survival association study

- 1119 We conducted a genome-wide Cox proportional hazards regression⁷² assuming an additive effect
- 1120 from SNP dosage. The Cox proportional hazard regression was implemented in the R survival
- analysis package. We incorporated sex, site and the first three principal components from
- 1122 EIGENSTRAT³⁰ in all our regression models to control for their effects. For EADI, sex and four
- 1123 principal components were included in the model. For the Cox model, the time scale is defined

- as age in years, where age is age at onset for cases and age at last assessment for controls. The
- 1125 formula applied is as followed:

$$h(t|X) = h_0(t)\exp(\sum_{i=1}^{p} \beta_i X_i)$$

where X = (X1, X2, ..., Xp) are the observed values of covariates for subject i. The Cox model has previously been shown to be applicable to case-control datasets without an elevated type 1 error rate nor overestimation in effect sizes^{73,74}. The model assumes log-linearity and proportional hazards. The assumption of log-linearity is common in the additive logistic regression used in a typical GWAS. We validated the assumption of proportional hazards

- 1131 assumed by the Cox model by conducting the Schoenfeld test in the 22 prioritized SNPs. None
- 1132 of the SNPs has a Schoenfeld P value, which is the P value for Pearson product-moment
- 1133 correlation between the scaled Schoenfeld residuals and time, lower than 0.035 (multiple test
- 1134 correction threshold = 0.00227) in any of the 7 cohorts. Further, only 3 out of the 148 P values
- 1135 were less than 0.05, suggesting that the time proportionality assumption is unlikely to be violated
- 1136 in these associations (Supplementary Table 1). Similarly, the Schoenfeld test was conducted for
- all 22 SNP association models on the covariates in the ADGC and GERAD cohort
- 1138 (Supplementary Table 1). We also examined the effect sizes of our candidate SNPs in these
- 1139 cohorts and found consistent effect sizes (Supplementary Fig. 3) in the 3 retrospective case-
- 1140 control cohorts (ADGC, GERAD, EADI case-control) and 4 prospective cohorts (EADI-
- 1141 prospective, CHARGE FHS, CHS and Rotterdam).
- 1142 After the analysis of each dataset, we carried out an inverse-variance meta-analysis on the results
- using METAL²⁶, applying a genomic control to adjust for inflation in each dataset. Of the 751
- suggestive SNPs ($P < 1x10^{-5}$), we found these SNPs to show lower standard errors and
- 1145 confidence intervals with the increasing number of cohorts showing consistent directionalities of
- effect. Particularly, the average standard error for SNPs showing 1 to 7 consistent directionalities ranges from 0.171, 0.109, 0.0744, 0.0346, 0.0234, 0.0173 to 0.01795 (**Supplementary Fig. 1b**).
- Thus, we limited our final analysis to SNPs that showed consistent directionalities of effect in at
- 1149 least 6 out of the 7 datasets included in the meta-analysis. The association graphs of results from
- 1149 least 6 out of the 7 datasets included in the meta-analysis. The association graphs of results included in the meta-analysis. The association graphs of results included in the meta-analysis. The association graphs of results included in the meta-analysis.
- 1150
- 1152 CSF biomarker association analysis
- 1153 For the CSF datasets, we performed multivariate linear regression for CSF $A\beta_{42}$ and tau, and
- 1154 ptau₁₈₁ association adjusting for age, gender, site, and the first three principal components using
- 1155 PLINK.
- 1156
- 1157 *eQTL analysis*
- 1158 We examined the effect of top survival and CSF SNPs on gene expression using published
- 1159 databases. For general brain expression eQTL analysis, we queried the BRAINEAC eQTL data
- 1160 provided by the UK human Brain Expression Consortium (see URLs).
- 1161 We conducted leukocyte-specific analysis using the Cardiogenics dataset²⁷ composed of 738
- 1162 monocytes and 593 macrophages samples. For each probeset imputed SNP pair, a simple linear
- regression was used to analyze the data separately for monocytes and macrophages:

$$y_i = \alpha + \beta x_i + \varepsilon_i, 1 \le i \le n, \varepsilon_i \sim N(0, \sigma^2)$$

- 1164 where i is the subject index, x is the effective allele copy number, and y_i is the covariates-
- adjusted, inverse-normal transformed gene expression. Significance of *cis* (SNP within ±1Mb of

- 1166 the closest transcript end) eOTL effects were quantified with a Wald test on the ordinary Least
- 1167 Squares (OLS) estimator of the coefficient β , obtained with R. The distribution of the Wald test P
- 1168 values under the null hypothesis of no correlation between genotype and gene expression was
- 1169 estimated by rerunning the same analysis on a null dataset obtained by permuting the expression
- samples identifiers. For additional monocyte eOTL analysis, we queried statistics from Fairfax et 1170
- 1171 al.²⁸ to validate findings in the Cardiogenics dataset.
- 1172 For conditional analysis, we performed analysis for SPI1 (probe: ILMN 1696463) against all
- 1173 SNPs within ±2Mb from the closest transcript end, by including the following SNPs effective
- 1174 allele copy numbers as covariates in the linear regression model, one at a time: rs1057233,
- 1175 rs10838698, rs7928163, rs10838699, rs10838725, rs1377416. Significance was again assessed
- 1176 with a two-sided Wald test on the OLS estimator of the coefficient β .
- 1177
- 1178 *Gene expression analysis in human and mouse brain cell types*
- Cell-type specific gene expression in the human and mouse brain was queried from brain RNA-Seq databases described in Zhang et al.^{29,30} and Bennett et al.³¹ and plotted using custom R 1179
- 1180
- scripts (see URLs). The mouse astrocytes-FACS and astrocytes-immunopanned in mouse were 1181
- 1182 collapsed into a single astrocyte cell type.
- 1183
- 1184 Epigenetic analysis in human myeloid cell types
- We utilized HaploReg³⁴ to annotate the regulatory element of the significantly associated SNPs 1185 and their tagging SNPs. The myeloid chromatin marks/states and PU.1 ChIP-Seq data at genetic 1186 1187 loci were further examined through the Washington University Epigenome browser⁷⁶ using the public Roadmap Epigenomics Consortium public tracks hub as well as custom track hubs for 1188
- human monocytes and macrophages (hg19) (see URLs). 1189
- 1190
- 1191 Colocalization (coloc and SMR/HEIDI) analyses
- 1192 Colocalization analysis of genetic variants associated with AD and myeloid gene expression was
- 1193 performed using AAOS GWAS SNP and myeloid (monocyte and macrophage) eOTL datasets 1194 from Cardiogenics as inputs. Overlapping SNPs were retained within the hg19 region
- 1195 chr11:47100000-48100000 for the SPI1/CELF1 locus, chr11:59500000-60500000 for the MS4A
- 1196 locus, and chr1:169300000-170300000 for the SELL locus. Colocalization analysis of AD- and
- 1197 gene expression-associated SNPs was performed using the 'coloc.abf' function in the 'coloc' R
- package (v2.3-1). Default settings were used as prior probability of association: 1×10^{-4} for trait 1 1198
- (gene expression), 1×10^{-4} for trait 2 (AD) and 1×10^{-5} for both traits. SMR/HEIDI (v0.65) analysis 1199
- was performed as described in Zhu et al.²³ and the companion website (see URLs). The ADGC 1200
- 1201 subset of the IGAP GWAS dataset was used to perform the LD calculations.
- 1202
- 1203
- 1204
- 1205 Partitioned heritability analysis using LD score regression
- 1206 We used LDSC (LD SCore, v1.0.0) regression analysis²⁵ to estimate heritability of AD and
- schizophrenia from GWAS summary statistics (excluding the APOE [chr19:45000000-45800000] 1207
- 1208 and MHC/HLA [chr6:28477797-33448354] regions) partitioned by PU.1 ChIP-Seq binding sites
- 1209 in myeloid cells, as described in the companion website (see URLs) and controlling for the 53
- 1210 functional annotation categories of the full baseline model. GWAS summary statistics for AD
- and schizophrenia (SCZ) were downloaded from the IGAP consortium¹ (stage 1 dataset) and the 1211

1212 Psychiatric Genomics Consortium (PGC)²⁶ (pgc.cross.scz dataset), respectively (see URLs).

1213 SPI1 (PU.1) bindings sites were downloaded as filtered and merged ChIP-Seq peaks in BED

1214 format from the ReMap database⁷⁷ (GEO:GSE31621, SPI1, blood monocyte and macrophage

- datasets³⁵). SPI1 (PU.1) and POLR2AphosphoS5 binding sites were downloaded as broad ChIP Seq peaks in BED format from the Encode portal⁷⁸³⁷ (DCC:ENCSR037HRJ; GEO:GSE30567;
- 1216 Seq peaks in BED format from the Encode portal¹²¹⁷ (DCC:ENCSR03/HRJ; GEO:GSE3056/
- HL60 dataset) (see URLs).
- 1219 Phagocytosis assay

1220 BV2 mouse microglial cell line was kindly provided by Marc Diamond (UT Southwestern 1221 Medical Center). BV2 cells were cultured in DMEM (Gibco 11965) supplemented with 5% FBS 1222 (Sigma F4135) and 100 U/ml penicillin-streptomycin (Gibco 15140). Routine testing of cell lines 1223 using MycoAlert PLUS mycoplasma detection kit (Lonza) showed that BV2 cells were negative 1224 for mycoplasma contamination. pcDNA3-FLAG-PU.1 was a gift from Christopher Vakoc⁷⁹ 1225 (Addgene plasmid 66974). pGFP-V-RS with either non-targeting shRNA or PU.1-targeting 1226 shRNAs was purchased from OriGene Technologies (TG502008). The pHrodo red zymosan 1227 conjugate bioparticles from Thermo Fisher (P35364) were used to assess phagocytic activity. For 1228 transient transfections, 200,000 cells were seeded in a 24-well plate. On the next day, cells were 1229 washed with PBS (Gibco 14190) and medium was changed to 400 µl DMEM supplemented with 1230 2% FBS without antibiotic. Transfection mixes of 0.5 µg pcDNA3 or 0.5 µg pcDNA3-FLAG-1231 PU.1 with 0.5 µg pCMV-GFP for overexpression of mouse PU.1 and 1µg pGFP-V-RS-shSCR, -1232 shA, -shB and -shD for knock-down of mouse PU.1 were prepared with 2 µl of Lipofectamine 1233 2000, incubated for 20 min at room temperature and added to each well. After 8 hours of 1234 incubation 1 ml of growth medium was added to each well and plates were incubated for 2 days.

- 1235 Then the medium was replaced with 500 μ l of fresh medium, and 25 μ g of bioparticles were
- added to cells for 3 hour incubation. Bioparticles uptake was verified with a fluorescent
 microscope; then the cells were collected with trypsin (Gibco #25200), washed with PBS once
- 1238 and re-suspended in 500 µl PBS with 1% BSA. Cells were kept on ice and phagocytic activity
- 1239 was analyzed on an LSR II flow cytometer (BD Biosciences). At least 30,000 events were
- 1240 collected in each experiment, gated on FSC-A/SSC-A and further on FSC-A/FSC-W dot plot to 1241 analyze populations of viable single cells. Data were quantified using FCS Express 5 (De Novo
- 1241 analyze populations of viable single cens. Data were quantified using FCS Express 5 (De Novo 1242 Software) and GraphPad Prism 7 (GraphPad Software). Cells pretreated with 2 µM Cytochalasin
- 1243 D for 30 minutes before and during the uptake of bioparticles were used as a negative control.
- 1244 The population of $GFP^+/pHrodo^+$ cells in each condition was used to quantify the phagocytic
- index: percentage of pHrodo⁺ cells in GFP⁺ gated population x geometric mean pHrodo intensity $/10^6$; and represented as phagocytic activity. Three independent experiments were performed with two technical replicates without randomization of sample processing, n = 3. Researcher was
- not blinded to the samples identification. Differences between the means of preselected groups
 were analyzed with one-way ANOVA and Sidak's post hoc multiple comparisons test between
 selected groups, with a single pooled variance. Values of Cytochalasin D-treated cells were
- excluded from the statistical analysis. Adjusted P values for each comparison are reported, non-
- 1252 significant differences are not reported.
- 1253
- 1254 Western blotting
- 1255 BV2 cells transiently transfected as described for the phagocytosis assay were collected with
- 1256 trypsin after 48 hours of incubation, washed with PBS and re-suspended in PBS with 1% BSA.
- 1257 Cells from the same treatment were pooled and sorted on FACSARIA III (BD Biosciences) into

GFP⁺ and GFP⁻ populations, pelleted at 2,000 rpm and lysed in RIPA buffer (50 mM Tris-HCl 1258 pH 7.4, 150 mM NaCl, 1% NP-40, 0.5% sodium deoxycholate, 0.1% SDS and Complete 1259 1260 protease inhibitor tablets (Roche)) with one freeze-thaw cycle and 1 hour incubation on ice. 1261 Protein concentration was quantified using the BCA kit (Thermo Fisher #23225). Equal amounts 1262 of protein were separated by electrophoresis in Bolt 4 - 12% Bis-Tris Plus gels with MOPS SDS 1263 running buffer and transferred using the iBlot 2 nitrocellulose transfer stack. Membranes were 1264 blocked and probed with antibodies against PU.1 (Cell Signaling #2266) and β -Actin (Sigma #A5441) in 3% non-fat dry milk in TBS / 0.1% Tween-20 buffer. Secondary antibody staining 1265 was visualized using WesternBright ECL HRP Substrate Kit (Advansta K-12045) and 1266 1267 ChemiDoc XRS+ (BioRad). Images were quantified using ImageJ (NIH) and GraphPad Prism 7 1268 (GraphPad Software). Two independent experiments were performed without randomization of 1269 sample processing, n = 2. Researcher was not blinded to the samples identification. Differences 1270 between every group mean were analyzed with one-way ANOVA and Sidak's post hoc multiple 1271 variance test between selected groups, with a single pooled variance. Adjusted P values for each 1272 comparison are reported.

1273

1274 *Quantitative PCR*

1275 Sorted GFP⁺ BV2 cells after overexpression or knock-down of PU.1 were collected as described 1276 for western blotting. Cell pellets were lysed in QIAzol reagent and RNA was isolated with 1277 RNAeasy Mini kit according to the manufacturer's instructions (Oiagen) including the Dnase 1278 treatment step with RNase-free DNase set (Qiagen). Quantities of RNA were measured using 1279 Nanodrop 8000 (Thermo Scientific) and reverse transcription was performed with 1-2 ug of total 1280 RNA using High-Capacity RNA-to-cDNA kit (Thermo Fisher Scientific). qPCR was performed 1281 on OuantStudio 7 Flex Real-Time PCR System (Thermo Fisher Scientific) using Power SYBR 1282 Green Master Mix (Applied Biosystems) with one-step PCR protocol. 3 ng of cDNA was used for all genes except Ms4a4a when 24 ng of cDNA was used in a 10 µl reaction volume. Primers 1283 1284 were from PrimerBank⁸⁰ or designed using Primer-BLAST program (NCBI) and are listed in 1285 Supplementary Table 14. Ct values were averaged from two technical replicates for each gene. 1286 Geometric mean of average Ct for the housekeeping genes GAPDH, B2M and ACTB was used as a reference that was subtracted from the average Ct for a gene of interest (dCt). Gene expression 1287 levels were log transformed (2^{-dCt}) and related to the combined mean values of pcDNA3 and 1288 1289 pGFP-V-RS-shSCR control samples in each sort giving relative expression for each gene of 1290 interest. Data were visualized in GraphPad Prism 7 (GraphPad Software). Four independent 1291 experiments were performed without randomization of sample processing, n = 4. Researcher was 1292 not blinded to the sample identity. Differences between means were analyzed using one-way 1293 ANOVA and Dunnett's post hoc multiple comparisons test between experimental and control 1294 groups, with a single pooled variance. Adjusted P values for each comparison are reported in 1295 Supplementary Table 13.

1296

1297 Data availability

1298 Summary statistics for the genome-wide survival analyses are posted on the NIA Genetics of

- 1299 Alzheimer's Disease Data Storage (NIAGADS, see URLs).
- 1300
- 1301 *Code availability*
- 1302 Codes for analyses are available at a public GitHub repository
- 1303 (https://github.com/kuanlinhuang/AD_SPI1_project).

1304 URLs

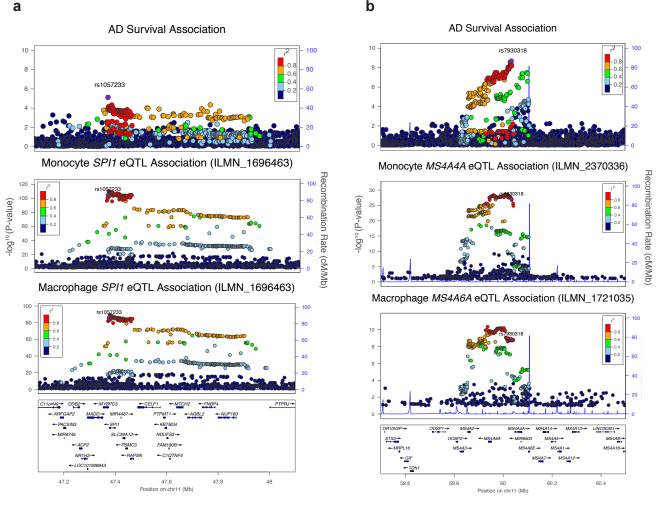
- 1305 BRAINEAC, http://caprica.genetics.kcl.ac.uk/BRAINEAC; LDSC software,
- 1306 http://www.github.com/bulik/ldsc; baseline and cell type group annotations,
- 1307 <u>http://data.broadinstitute.org/alkesgroup/LDSCORE/;</u> stratified LD score regression companion
- 1308 website, <u>https://github.com/bulik/ldsc/wiki/Partitioned-Heritability; SMR/HEIDI software and</u>
- 1309 companion website, http://cnsgenomics.com/software/smr; Brain RNA-Seq,
- 1310 http://web.stanford.edu/group/barres_lab/brainseq2/brainseq2.html; WashU EpiGenome Browser,
- 1311 http://epigenomegateway.wustl.edu/browser; custom tracks for human monocytes and
- 1312 macrophages, <u>http://www.ag-rehli.de/TrackHubs/hub_MOMAC.txt;</u> International Genomics of
- 1313 Alzheimer's Project (IGAP)
- 1314 <u>http://web.pasteur-lille.fr/en/recherche/u744/igap/igap_download.php;</u> Psychiatric Genomics
- 1315 Consortium (PGC) https://www.med.unc.edu/pgc/results-and-downloads; ReMap database
- 1316 http://tagc.univ-mrs.fr/remap; Encode portal https://www.encodeproject.org/; NIAGADS,
- 1317 https://www.niagads.org.
- 1318

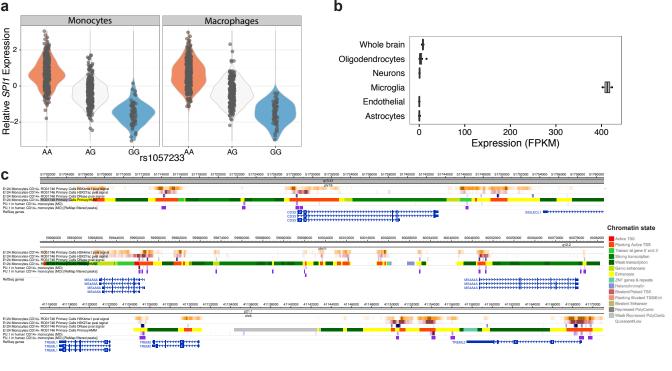
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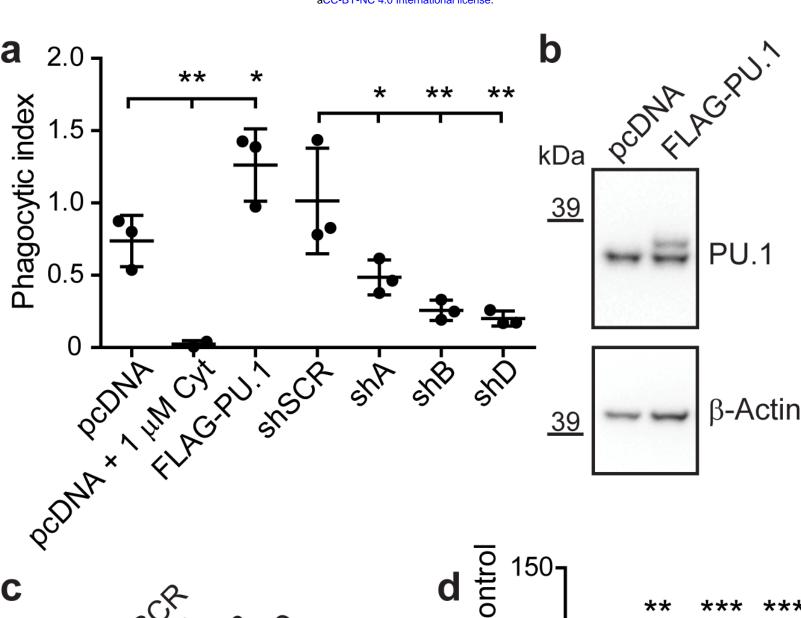
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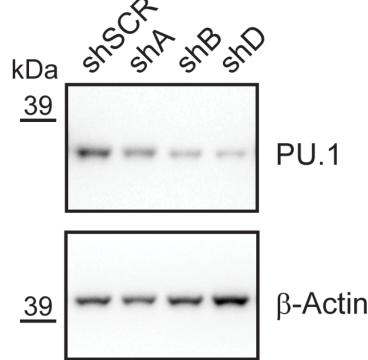
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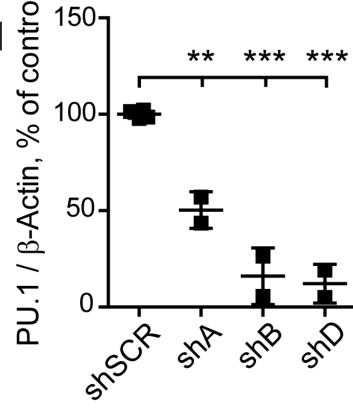


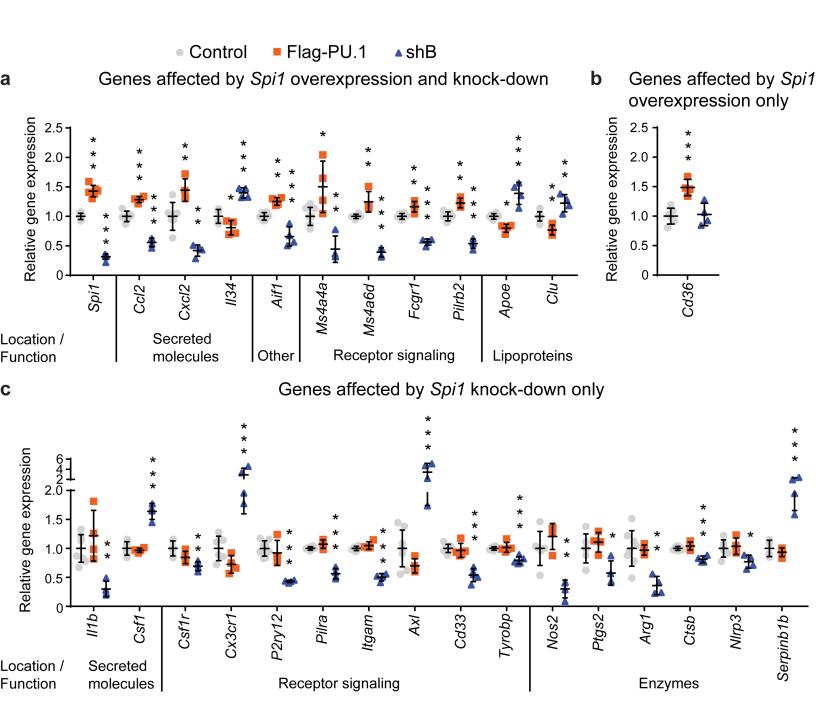


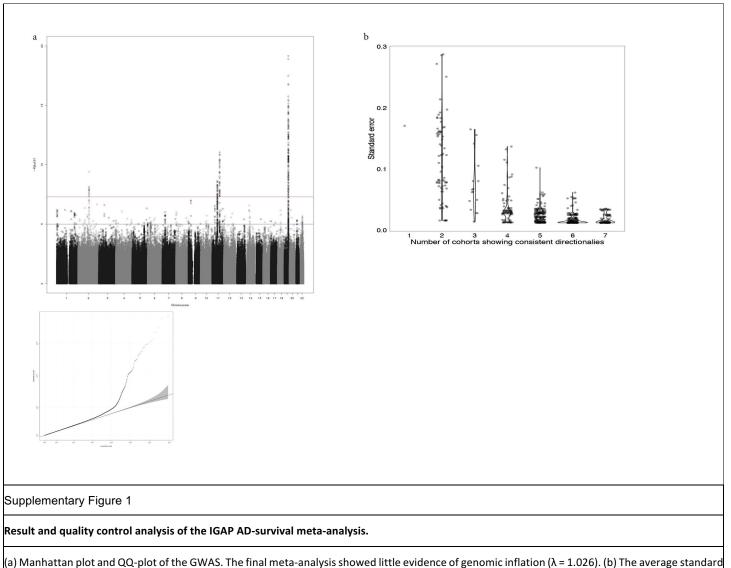
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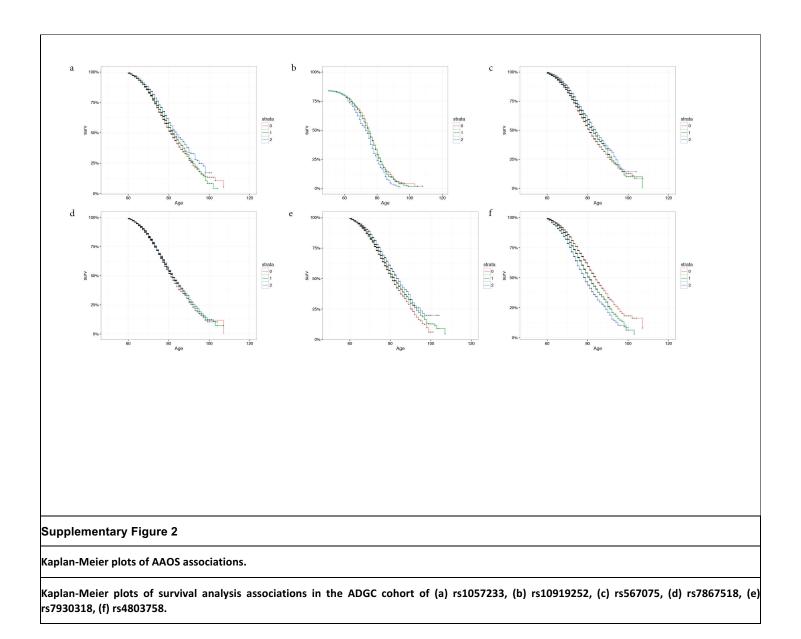








error versus the number of cohorts with consistent directionalities of effect sizes.

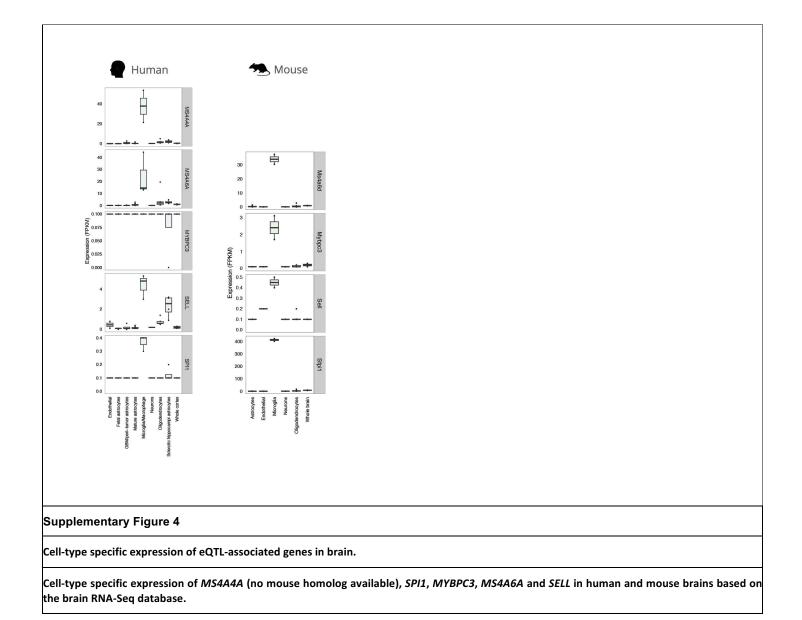


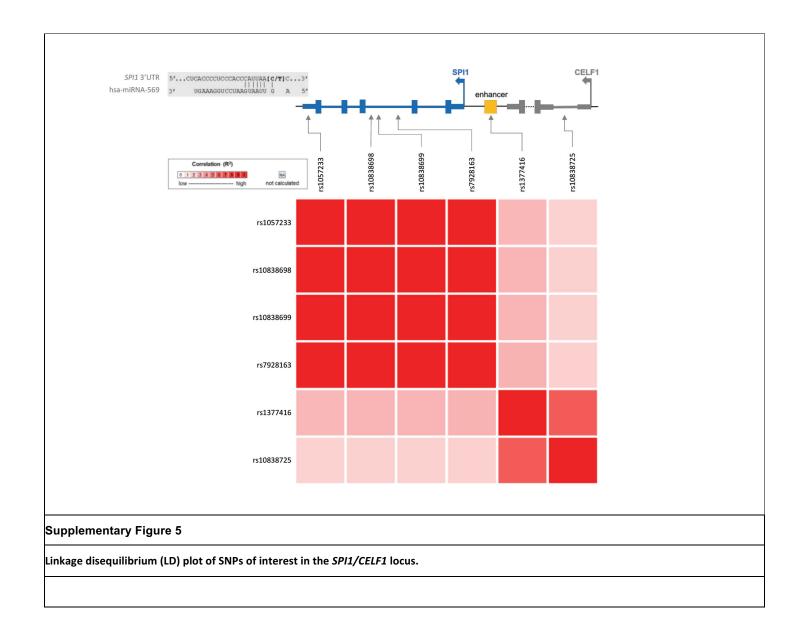
	rs1057233			b	rs10919252			c	rs567075		
Cohort	Hazard Ratio (95% CI)	P value		Cohort	Hazard Ratio (95% CI)	P value		Cohort	Hazard Ratio (95% CI)	P value	
ADGC	0.91 (0.88-0.94)	8.5e-09	-	GERAD	1.12 (1.06-1.18)	0.00014		ADGC	0.9 (0.87-0.93)	4e-11	•
EADI case-control	0.93 (0.86-1.01)	0.097		EADI case-control	1.12 (1.03-1.21)	0.00532		GERAD	0.92 (0.87-0.98)	0.0079	
EADI longitudinal	0.97 (0.83-1.12)	0.649		EADI longitudinal	1.08 (0.93-1.25)	0.30926		EADI case-control	0.91 (0.84-0.99)	0.0266	
CHARGE FHS	0.93 (0.76-1.14)	0,489		CHARGE FHS	1.11 (0.92–1.33)	0.28585		EADI longitudinal	1.01 (0.87-1.18)	0.8677	
					Contraction of the second second			CHARGE FHS	0.93 (0.76-1.15)	0.5022	
CHARGE CHS	0.91 (0.77-1.07)	0.258	• • • • •	CHARGE CHS	1.04 (0.89-1.22)	0.59691		CHARGE CHS	0.99 (0.85-1.15)	0.8462	· · · · · · · · ·
CHARGE Rotterdam	0.87 (0.78-0.98)	0.019		CHARGE Rotterdam	1.06 (0.95-1.18)	0.28705		CHARGE Rotterdam	0.94 (0.84-1.05)	0.2453	
			0.71	1.5			0.71 1.5				0.71 1.5
	rs7867518			e	rs7930318			f	rs4803758		
Cohort	Hazard Ratio (95% CI)	P value		Cohort	Hazard Ratio (95% CI)	P value		Cohort	Hazard Ratio (95% CI)	P value	
ADGC	0.96 (0.93-0.99)	0.0079	-	ADGC	0.9 (0.87-0.93)	8.1e-12	•	ADGC	1.25 (1.21-1.29)	< 2e-16	
GERAD	0.96 (0.91-1.01)	0.1426		GERAD	0.94 (0.88-0.99)	0.023		GERAD	1.26 (1.19-1.33)	< 2e-16	
	0.89 (0.83-0.96)	0.0037		EADI case-control	0.96 (0.89-1.03)	0.263		EADI case-control	1.21 (1.12-1.31)	9.5e-07	
EADI case-control	0.03 (0.00-0.30)			CADI Is a situational	0.96 (0.83-1.11)	0.550		EADI longitudinal	1.24 (1.07-1.44)	0.0049	
EADI case-control EADI longitudinal	0.92 (0.8–1.06)	0.2473		EADI longitudinal	()						
		0.2473 0.9684		CHARGE FHS	0.96 (0.8–1.16)	0.688		CHARGE FHS	1.14 (0.92-1.41)	0.2444	· · · · · · · · · · · · · · · · · · ·
EADI longitudinal	0.92 (0.8–1.06)			•		0.688 0.646		CHARGE FHS CHARGE CHS	1.14 (0.92–1.41) 1.05 (0.9–1.23)	0.2444 0.5266	

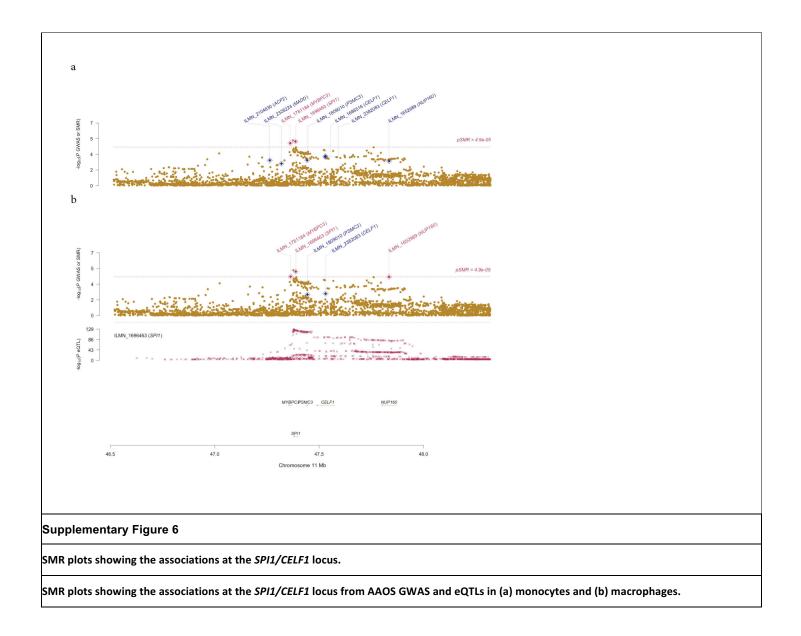
Supplementary Figure 3

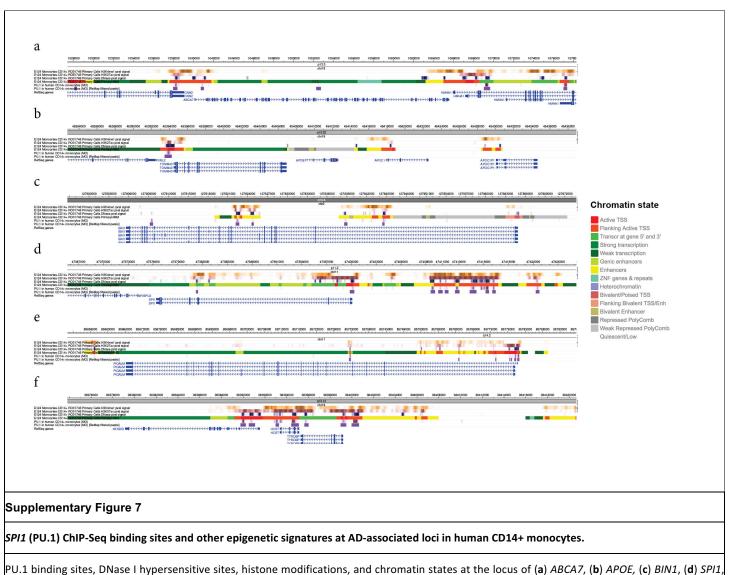
Forest plots of AAOS associations.

Forest plots of survival analysis associations across IGAP cohorts of (a) rs1057233, (b) rs10919252, (c) rs567075, (d) rs7867518, (e) rs7930318, (f) rs4803758.

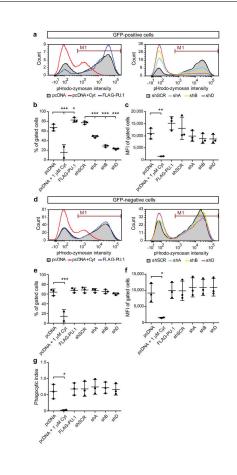








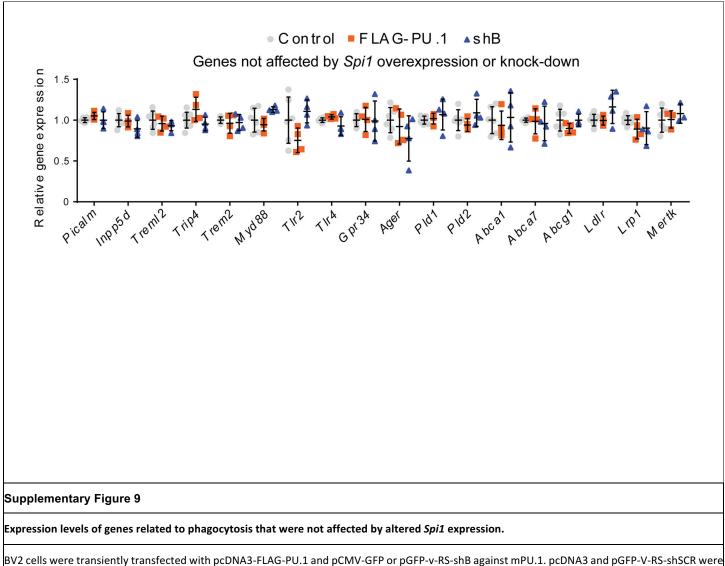
(e) PICALM, and (f) TYROBP.



Supplementary Figure 8

Analysis of phagocytosis in BV2 microglial cells.

(a) Flow cytometry histograms of BV2 cells transfected with pcDNA3 (pcDNA) or pcDNA3-FLAG-PU.1 (FLAG-PU.1) with pCMV-GFP for overexpression and scrambled shRNA (shSCR) or PU.1-targeted shRNA (shA, shB and shD) in pGFP-V-RS vector for knock-down of PU.1 after 3 hours of incubation with red pHrodo-labeled zymosan. Cells were gated on GFP+ populations. (b) Flow cytometry analysis of number of gated cells in a presented as mean ± SD, pcDNA 67.03 ± 6.883, pcDNA + 1 μ M Cyt 15.64 ± 16.24, FLAG-PU.1 82.71 ± 4.74, shSCR 77.17 ± 3.115, shA 48.63 ± 2.285, shB 28.92 ± 2.495, shD 22.76 \pm 1.595. pcDNA vs pcDNA + 1 μ M Cvt P < 0.0001, pcDNA vs FLAG-PU.1 P = 0.0306, shSCR vs shA P = 0.0002, shSCR vs shB P < 0.0001, shSCR vs shD P < 0.0001. F(6,13) = 58.68, n = 3. (c) Flow cytometry analysis of geometric mean fluorescent pHrodo intensity in a presented as mean ± SD, pcDNA 10952 ± 2206, pcDNA + 1 μM Cyt 1533 ± 47, FLAG-PU.1 15226 ± 2701, shSCR 13129 ± 4617, shA 9937 ± 2168, shB 8872 ± 2019, shD 8754 ± 1856. pcDNA vs pcDNA + 1 1M Cyt P = 0.0092. F(6,13) = 6.228, n = 3. (d) Flow cytometry histograms of BV2 cells transfected as in (a) and gated on GFP- populations. (e) Flow cytometry analysis of number of gated cells in d presented as mean \pm SD, pcDNA 63.92 \pm 6.575, pcDNA + 1 μ M Cyt 14.21 ± 13.66, FLAG-PU.1 67.54 ± 4.826, shSCR 68.31 ± 5.784, shA 67.27 ± 4.144, shB 65.19 ± 4.268, shD 60.3 ± 2.181. pcDNA vs pcDNA + 1 μM Cyt P < 0.0001. F(6,13) = 22.53, n = 3. (f) Flow cytometry analysis of geometric mean fluorescent pHrodo intensity in d presented as mean ± SD, pcDNA 9186 ± 2863, pcDNA + 1 μM Cyt 1545 ± 147, FLAG-PU.1 9931 ± 2458, shSCR 9849 ± 3012, shA 10903 ± 2949, shB 10912 ± 2494, shD 10934 ± 2685 pcDNA vs pcDNA + 1 μM Cyt P = 0.0367. F(6,13) = 3.473, n = 3. (g) Phagocytic index of BV2 GFP- cells analyzed in (e) and (f) presented as mean ± SD pcDNA 0.5954 ± 0.2223, pcDNA + 1 μM Cyt 0.0209 ± 0.0189, FLAG-PU.1 0.6745 ± 0.188, shSCR 0.6765 ± 0.2274, shA 0.7382 ± 0.2255, shB 0.7131 ± 0.1742, shD 0.6612 \pm 0.1748. pcDNA vs pcDNA + 1 μ M Cyt P = 0.0331. F(6,13) = 3.53, n = 3. Cytochalasin D treatment in all figures was used as a negative control for phagocytosis. * P < 0.05, ** P < 0.01, *** P < 0.001, repeated measures one-way ANOVA with Sidak's post hoc multiple comparisons test.



BV2 cells were transiently transfected with pcDNA3-FLAG-PU.1 and pCMV-GFP or pGFP-v-RS-shB against mPU.1. pcDNA3 and pGFP-V-RS-shSCR were used as controls. RNA was extracted from sorted GFP⁺ cells and used for qPCR validation of expression levels for genes of interest. Values are presented as mean ± SD, n = 4 samples collected independently.