1	Phospholipase D3 contributes to Alzheimer's disease risk via disruption of A $\beta$ clearance
2	and microglia response to amyloid plaques
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#### 36 Abstract

37

38 Alzheimer's disease (AD) is characterized by the accumulation of amyloid- $\beta$  (A $\beta$ ) plaques and 39 neurofibrillary tangles in the brain. AD is also the result of complex genetic architecture that can 40 be leveraged to understand pathways central to disease processes. We have previously 41 identified coding variants in the phospholipase D3 (PLD3) gene that double the late-onset AD 42 risk. However, the mechanism by which PLD3 impacts AD risk is unknown. One AD risk variant, 43 PLD3 p.A442A, disrupts a splicing enhancer-binding site and reduces PLD3 splicing in human 44 brains. Using differentiated induced pluripotent stem cells from a PLD3 p.A442A carrier and 45 CRISPR-reverted, isogenic control, we show that PLD3 p.A442A cortical neurons exhibit a 46 PLD3 splicing defect and a significant increase in AB42 and AB40, both of which are corrected 47 upon reversion of the risk allele in isogenic control neurons. Thus, PLD3 p.A442A is sufficient to 48 alter *PLD3* splicing and A $\beta$  metabolism. While the normal function of PLD3 is poorly understood, 49 PLD3 is highly expressed in neurons and brain regions most susceptible to amyloid pathology. 50 *PLD3* expression is significantly lower in AD brains than controls, suggesting that PLD3 may 51 play a role in sporadic AD. Thus, we sought to determine whether PLD3 contributes to AB 52 accumulation in AD. In a mouse model of amyloid accumulation, loss of *Pld3* increases 53 interstitial fluid (ISF) Aβ and reduces Aβ turnover. AAV-mediated overexpression of PLD3 in the 54 hippocampus decreased ISF AB levels and accelerated AB turnover. To determine whether 55 PLD3-mediated reduction of ISF Aß impacts amyloid accumulation, we measured amyloid 56 plaque abundance and size after significant A $\beta$  deposition. We found that in the absence of 57 Pld3, amyloid plagues were less compact and more diffuse. Additionally, we observed reduced 58 recruitment of microglia to amyloid plaques in the absence of Pld3. PLD3 may impact amyloid 59 accumulation and AD risk through disrupted microglia function as PLD3 is enriched in disease 60 associated microglia in human brains. Together, our findings demonstrate that PLD3 regulates

- 61 Aβ clearance through cell-autonomous and non-cell-autonomous pathways in a manner that
- 62 likely contributes to AD risk.

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## 66 Introduction

67

Alzheimer's disease (AD) is pathologically defined by neuronal loss and the
accumulation of amyloid-β (Aβ) plaques and neurofibrillary tangles in the brain. Genetic,
biochemical, and neuropathologic data suggest that Aβ aggregation is central to initiating AD
pathogenesis [1]. Rare mutations in *APP*, *PSEN1*, and *PSEN2* cause dominantly inherited AD.
Late-onset AD (LOAD) also has a strong genetic component [2]. Identifying novel loci that affect
LOAD risk is critical to our understanding of the underlying etiology of AD and novel therapeutic
pathways.

75 The genetic architecture that underlies LOAD is complex [2]. Large-scale genomic 76 studies have led to the identification of novel genes and risk loci that contribute to AD [2, 3]. 77 Whole exome sequencing of densely affected LOAD families has revealed a rare genetic variant 78 within PLD3 (p.V232M) that perfectly segregated with disease in two independent families and 79 doubled AD risk in seven independent case-control series (4,998 AD cases/6,356 controls; 80 OR=2.10, p=2.93×10<sup>-5</sup>) [4]. Gene-based analyses indicated that multiple variants in PLD3 81 increase AD risk in European (EA) and African American (AA) populations (e.g.: p.M6R, 82 p.V232M, p.A442A; EA: OR=2.75, p=1.44x10<sup>-11</sup>; AA: OR=5.48, p=1.40x10<sup>-3</sup>) [4]. 83 PLD3 is a non-classical member of the phospholipase D (PLD) family of enzymes, with 84 no known function [5-7]. PLD3 is expressed in pyramidal neurons within the brain, and in AD 85 brains, PLD3 co-localizes with amyloid plagues [8, 9]. Common variants in PLD3 are associated 86 with CSF Aβ levels, an AD biomarker [10]. In vitro, PLD3 expression is correlated with 87 extracellular Aβ levels: Pld3 silencing is associated with increased Aβ levels, and PLD3 88 overexpression is associated with reduced A $\beta$  levels [4]. Thus, PLD3 may play a broader role in 89 LOAD. 90 Here, we sought to define the contribution of *PLD3* risk variants to AD-related

91 phenotypes in human stem cell models and the role of PLD3 in amyloid pathology in mouse

92	models. We found that a <i>PLD3</i> risk variant is sufficient to increase A $\beta$ levels in stem cell-derived
93	neurons. In animal models of amyloid accumulation, <i>Pld3</i> silencing reduces A $\beta$ turnover and
94	alters the composition of amyloid plaques. In the absence of Pld3, microglia recruitment to
95	plaques is attenuated. Together, this study suggests that PLD3 contributes AD pathogenesis via
96	A $\beta$ clearance through cell-autonomous and non-cell-autonomous pathways.
97	
98	Materials and Methods
99	Patient Consent
100	Skin biopsies were collected following written informed consent from the donor. The
101	Washington University School of Medicine Institutional Review Board and Ethics Committee
102	approved the informed consent (IRB 201104178, 201306108). The consent allows for the use of
103	tissue by all parties, commercial and academic, for research but not for human therapy.
104	
105	Dermal Fibroblast Isolation
106	Dermal fibroblasts were isolated from skin biopsies obtained from the Knight Alzheimer
107	Disease Research Center (ADRC) research participants. Briefly, skin biopsies were collected by
108	surgical punch and stored in Fibroblast Growth Media (Lonza). To isolate dermal fibroblasts
109	from a skin biopsy, the biopsies were rinsed with PBS and cut lengthwise with dissecting
110	scissors. The resulting tissue sections were then plated into a dry 24-well tissue culture-treated
111	plate (approximately 6-12 sections). After removing excess PBS from the wells, 300ul of
112	fibroblast growth media (Lonza) was carefully added and tissue was incubated at $37^\circ$ C and $5\%$
113	CO <sub>2</sub> . After 24 hours, tissue was supplemented with 1mL fibroblast growth media and media
114	changes were repeated every 3-4 days. Fibroblast cells migrated from the tissue within two
115	weeks of culture. Dermal fibroblasts were maintained in fibroblast growth media (Lonza)
116	supplemented with penicillin/streptomycin.

117

# 118 iPSC Generation, Characterization, and Maintenance

119	Human fibroblasts (F13504) were transduced with non-integrating Sendai virus carrying
120	the four factors required for reprogramming: OCT3/4, SOX2, KLF4, and cMYC [11, 12]. Cells
121	showing morphological evidence of reprogramming were selected by manual dissection.
122	Human iPSCs were cultured using feeder-free conditions (Matrigel, BD Biosciences,
123	Franklin Lakes, NJ, USA). Human iPSCs were thawed (1-2 x 10 <sup>6</sup> cells/mL), diluted in
124	DMEM/F12, and centrifuged at 750 rpm for 3 minutes. The resulting iPSC pellet was then
125	diluted in mTeSR1 supplemented with Rock inhibitor (Y-27632; $10\mu$ M final). IPSC were
126	subsequently cultured in 37°C, 5% CO $_2$ with daily medium changes (mTesR1, STEMCELL
127	Technologies, Vancouver, BC, CA).
128	All iPSC lines were characterized using standard methods [11]. Each line was analyzed
129	for pluripotency markers (OCT4A, SOX2, SSEA4, TRA1-80) by immunocytochemistry (ICC)
130	(Invitrogen A24881) and quantitative PCR (qPCR); for chromosomal abnormalities by
131	karyotyping; and for PLD3 variant status by Sanger sequencing (Supplemental Figure 1).
132	
133	Genome editing
134	We used CRISPR/Cas9 to generate isogenic control lines for the PLD3 p.A442A iPSC
135	as previously described [13]. The p3s-Cas9HC Cas9 expression plasmid (Addgene 43945) and
136	CRISPR reagents (Addgene plasmid 43860) were used [14]. Guide RNAs were designed to
137	overlap with the allele to be modified and have at least 3bp of mismatch to any other gene in the
138	human genome. The activity of the guide was validated using a mismatch detection assay to
139	determine non-homologous end-joining efficiency in K562 cells. A correctly edited clone and an
140	unmodified clone were identified, expanded and characterized as described above for

karyotyping and pluripotency markers. Sanger sequencing was performed for the on-target andpredicted off-target sites.

143

144 Cortical neuron differentiation

145 IPSCs were differentiated into neuronal cells using a two-step approach as previously

described [13]. IPSCs were plated at a density of 65,000 cells per well in neural induction media

147 (STEMCELL Technologies) in a 96-well v-bottom plate to form highly uniform neural aggregates

and, after five days, transferred onto culture plates. The resulting neural rosettes were then

149 isolated by enzymatic selection (Neural Rosette Selection Reagent; STEMCELL Technologies)

150 and cultured as neural progenitor cells (NPCs). NPCs were differentiated in planar culture in

151 neuronal maturation medium (neurobasal medium supplemented with B27, GDNF, BDNF,

152 cAMP). Neurons typically arise within one week after plating, identified using

153 immunocytochemistry for β-tubulin III (Tuj1). The cells continued to mature and were analyzed
154 at six weeks.

155

156 Immunocytochemistry

157 IPSC-derived neurons were grown on PLO/laminin-coated 8-well chamber slides (Millipore). Culture media was aspirated, and cells were then washed and fixed with 4% paraformaldehyde (Sigma). After several washes, cells were permeabilized with 0.1% Triton X-100 in PBS. Cells were then blocked in 0.1% bovine serum albumin (BSA; Sigma) and treated with primary (Tuj1) and secondary antibodies diluted in 0.1% BSA. Immunostained cells were then imaged (Nikon Eclipse 80i fluorescent microscope).

163

164 Transcriptomics and Digital Deconvolution

165 RNA was extracted from iPSC-derived neurons from *PLD3* p.A442A vs. the isogenic
 166 controls using Tissue Lyser LT and RNeasy Mini Kit (Qiagen, Hilden, Germany). RNA-seq

paired-end reads with read lengths of 2 × 150 bp were generated using Illumina HiSeq 4000
with a mean coverage of 80 million reads per sample. FastQC was applied to perform quality
control and aligned to human GRCh37 primary assembly using Star (ver 2.5.2b). We applied
Salmon transcript expression quantification (ver 0.7.2) to infer the gene expression. To estimate
the relative proportion of major brain cell types in the dish, digital deconvolution was performed
as previously described using a reference marker panel [15].

- 173
- 174 PLD3 Splicing Assay
- 175 RNA was extracted from cell lysates with an RNeasy kit (Qiagen) according to the
- 176 manufacturer's protocol. Extracted RNA (10ug) was converted to cDNA by PCR using the High-
- 177 Capacity cDNA Reverse Transcriptase kit (ABI). SYBR-green primers were designed using
- 178 Primer Express software, Version 3 (ABI). Real-time PCR assays were used to quantify *PLD3*
- 179 exon 7 (forward primer: GCAGCTCCATCCATCAACT; reverse:
- 180 CTTGGTTGTAGCGGGTGTCA), exon 8 (forward primer: CTCAACGTGGTGGACAATGC;
- 181 reverse: AGTGGGCAGGTAGTTCATGACA), exon 9 (forward primer:
- 182 ACGAGCGTGGCGTCAAG; reverse: CATGGATGGCTCCGAGTGT), exon 10 (forward primer:
- 183 GGTCCCCGCGGATGA; reverse: GGTTGACACGGGCATATGG) and exon 11 (forward primer:
- 184 GCTGCTGGTGACGCAGAAT; reverse: AGTCCCAGTCCCTCAGGAAAA). Each qPCR
- 185 analysis included technical replicates and biological triplicates. Real-time data were analyzed
- using the comparative Ct method. Only samples with a standard error of <15% were analyzed.
- 187 The Ct values for exon 11 were normalized with the Ct value for exons 7-10. The relative exon
- 188 11 levels for the iPSC-derived neurons from *PLD3* p.A442A vs. the isogenic control were
- 189 compared using a Tukey's t-test.
- 190
- 191 *Aβ Measurements*

Conditioned medium was collected from neurons after six weeks in culture and
centrifuged at 3,000xg at 4°C for 10 minutes to remove cell debris. The levels of Aβ42 and
Aβ40 were measured in cell culture media by sandwich ELISA as described by the
manufacturer (Life Technologies). To account for variability in transfection efficiency between
experiments, ELISA values were obtained (pg/mL) and corrected for total intracellular protein
(ug/mL). Statistical difference was measured using an unpaired Student's t-test.

198

## 199 PLD3 expression in AD and neuropathology free human brains

200 Laser microdissected neurons from AD and control brains were previously reported and 201 deposited as GSE5281 [38]. Brain samples were analyzed from 47 individuals of European 202 descent clinically and neuropathologically confirmed AD cases or controls. The 33 AD samples 203 were 54.5% female with a mean age of 79.9 years (range 73–86.8) and an average postmortem 204 interval (PMI) of 2.5 hours. The 14 control brains were 28.6% female with a mean age of 79.8 205 years (range 70.1–88.9). Samples were obtained from the entorhinal cortex, hippocampus, 206 medial temporal gyrus, posterior cingulate, superior frontal gyrus, and primary visual cortex. 207 RNA expression was measured using an Affymetrix GeneChip for gene expression. The log-208 transformed expression values were analyzed with brain region, age, and sex as covariates to 209 analyze RNA expression.

Gene expression was analyzed in a second, independent, publicly available dataset of the temporal cortex of 76 control and 80 AD brains (syn6090813). Differential gene expression comparing controls v. AD was performed using a "Simple Model", multi-variable linear regression analyses were conducted in R, using normalized gene expression measures including sex, age-at-death, RNA integrity number, brain tissue source, and flowcell as covariates [16]. Statistical difference was measured using an unpaired Student's t-test.

216

## 217 Single nuclei RNAseq in human brains

218 Human parietal cortices were processed to isolate nuclei, and the nuclei were then 219 sequenced using the 10X Chromium single cell Reagent Kit v3, with 10,000 cells per sample 220 and 50,000 reads per cell for each of the 74 samples as previously described [17, 18]. The 221 CellRanger (v3.0.2 10XGenomics) software was used to align the sequences and quantify gene 222 expression. We used the GRCh38 (3.0.0) reference to prepare a pre-mRNA reference. Filtering 223 and QC were done using the Seurat package (3.0.1) on each subject individually. After the 224 Uniform Manifold Approximation and Projection (UMAP) analysis was performed with the top 14 225 PCs, we then used Seurat FindNeighbors and FindClusters functions to identify unique cell 226 states or subclusters. Samples included in the subsequent analyses are summarized in 227 Supplemental Table 1. To identify associations between cell-type transcriptional state and 228 disease status or genetic strata (control, sporadic AD (sAD), TREM2), we applied linear 229 regression models to test the cell state compositions of each subject. The proportions were 230 normalized using a cube root transformation and were corrected by sex and age of death. 231 Differentially expressed genes among the individual cell states were identified using a linear 232 mixed model that corrected for sex and subject. To determine if there was unique functionality 233 or potentially altered expression levels associated with disease/genetic carriers in the alternative 234 cell states, we employed linear mixed model that predicted the expression level of each gene. 235 modeled as zero-inflated negative binomial distributions and corrected for sex and age of death. 236 Donors were modeled as random variables as previously described [17]. Data can be publicly 237 accessed at http://ngi.pub/SNARE.

238

239 Mouse Models

Animal care and surgical procedures were approved by the Animal Studies Committee
 of Washington University School of Medicine in accordance with guidelines of the United States
 National Institutes of Health. APPswe/PS1ΔE9 transgenic mice (APP/PS1; The Jackson

Laboratory; 034829) [19] of both sexes were used in this study. APP/PS1 mice were maintained
on a C57bl6;C3B6 mixed background.

245 Pld3-KO mice were generated using CRISPR/Cas9 technology. gRNAs were designed 246 to target an early conserved exon (mPld3.g19; TGCTGTGAGCACCGGCAAGGNGG). Guide 247 activity was assessed in mouse neuroblastoma cells (N2A) using a T7E1 mismatch detection 248 assay as previously described [13]. RNA was injected into the pronuclei of fertilized, viable 249 murine oocytes isolated from a set of C57BI/6xCBA (hybrid) female mice. Founders were 250 identified using mPLD3 screening primers SM406.Cel.F 5' CATGGGCACTGTATCCCATCT 3' 251 and SM406.Cel.R 5' AGGACACAAAAACGTCACCCT 3', which generated a parental band 252 (575bp) and fragments (307 and 268bp). Subsequent generations were backcrossed to 253 C57BI/6;C3B6 (Supplemental Figure 2). 254 APP/PS1 mice were crossed with the Pld3-KO mice to generate APP/PS1xPld3<sup>+/-</sup>. 255 APP/PS1xPld3<sup>+/-</sup> were crossed to obtain APP/PS1xPld3-KO (APP/PS1xPld3<sup>-/-</sup>) mice and 256 APP/PS1xPld3-WT (APP/PS1xPld3<sup>+/+</sup>) littermates. Animals of both sexes were used in the 257 study. 258 259 Intracranial AAV-mediated expression of PLD3 and shPLD3 260 Adeno-associated virus (AAV8) particles were generated that express AAV-CMV-261 hPLD3-WT-GFP, AAV-CMV-GFP (control), AAV-U6-shPLD3-GFP, and AAV-U6-shScrambled-262 GFP (control). Viral particles were injected into the hippocampus of APP/PS1 mice of both 263 sexes to produce widespread transduction in hippocampal neurons as previously described [20, 264 21]. Two uL of AAV particles (1.5 X 10<sup>12</sup> vg/ml) were stereotaxically injected bilateral 265 hippocampi (2µl over 10 minutes) in 3-month-old APP/PS1 transgenic mice (prior to plaque 266 appearance) [22, 23]. Virus is detectable at least 4-5 months post-injection [21, 24]. 267

268 In Vivo Microdialysis

269 Prior to plaque accumulation (5 months of age) and two months post AAV8-injection. 270 hippocampal ISF Aβ levels were quantified using microdialysis in APP/PS1 mice as previously 271 described [25, 26]. The use of a 38-kDa MWCO semi-permeable membrane allows for 272 molecules smaller than this cut-off to diffuse into the probe. The probe was flushed with 273 perfusion buffer at a constant rate (1.0µl/minute) and collected into a refrigerated fraction 274 collector, and then assayed by sandwich ELISA ( $A\beta_{x-40}$ ). A mouse monoclonal anti- $A\beta_{40}$  capture 275 antibody (mHJ2) made in-house was used in conjunction with a biotinylated central domain 276 detection antibody (mHJ5.1) and streptavidin-poly-HRP-40 (Fitzgerald Industries, Acton, 277 MA)[27]. During microdialysis, mice were housed in cages that permit free movement and ad-278 libitum food/water, while ISF AB was sampled. Baseline levels of ISF AB were sampled every 60 279 minutes between hours 5-12 (after the microdialysis probe insertion) and averaged to determine 280 the baseline ISF A $\beta$  levels in each mouse. At hour 12, mice were administered the  $\gamma$ -secretase 281 inhibitor Compound E (20mg/kg), intraperitoneally, which enabled us to determine the 282 elimination half-life of ISF Aβ [28]. Aβ half-life was calculated using first-order kinetics. 283 Microdialysis was performed with sham and littermate controls. Statistical difference was 284 measured using an unpaired Student's t-test. 285 To evaluate the impact of *Pld3* on A $\beta$  kinetics, APP/PS1x*Pld3*-WT and APP/PS1x*Pld3*-286 KO mice were implanted at one-month post-injection with a microdialysis probe with a 38-kDa 287 MWCO probe, and ISF was collected as described above. After 12 hours, y-secretase inhibitor 288 LY411575 (3mg/kg in 50:50PBS:PEG400) was administered intraperitoneally to define the 289 elimination half-life of ISF AB. AB half-life was calculated as described above. Microdialysis was 290 performed with sham and littermate controls. Statistical difference was measured using an 291 unpaired Student's t-test. 292

293 Brain Tissue Preparation

294 APP/PS1xPld3-WT and APP/PS1xPld3-KO mice were anesthetized with sodium 295 pentobarbital and perfused with 0.3% heparin in PBS at nine months of age. Brains were 296 dissected and cut into two hemispheres. The right hemisphere was snap-frozen on dry ice and 297 stored at 80°C for biochemical analyses. The left hemisphere was fixed in 4% 298 paraformaldehyde for 24 hours, followed by 30% sucrose in PBS at 4°C. Coronal sections (50 299 um) were cut on a freezing-sliding microtome. Collected slices were stored in cryoprotectant 300 solution (0.2 M phosphate-buffered saline, 30% sucrose, and 30% ethylene glycol) at -20°C. 301 302 Immunohistochemistry 303 APP/PS1xPld3-WT and APP/PS1xPld3-KO brains were cut into 50µm sections from the 304 rostral anterior commissure to the caudal hippocampus. Brains sections (n=20 mice per group) 305 were incubated in 0.3% H<sub>2</sub>O<sub>2</sub> in Tris-buffered saline (TBS) for 10 minutes and blocked in 3% 306 milk in TBS-X for 30 minutes. Tissue was incubated in HJ3.4B antibody (anti-AB-1-13: 2.4 307 µg/ml; a generous gift from the Holtzman lab) overnight [29]. Sections are then incubated in 308 Vectastain ABC elite solution in TBS (1:400) for 1 hour before incubating in 3.3'-309 Diaminobenzidine (DAB) solution. Sections were then mounted onto slides with Cytoseal 310 (Thermo Scientific 8312-4). A Nanozoomer Digital Scanner (Hamamatsu Photonics) was used 311 to create high-resolution digital images for the HJ3.4-stained brain slices. Total plague 312 coverage, total plaque count, and average plaque size were analyzed using NIH ImageJ 313 software. Total plague coverage was expressed as a percentage of the total area for each slice 314 and averaged across the three slices per animal. Plague count was expressed as the plague 315 count per nm<sup>2</sup> averaged across the three slices per animal. Plague size was expressed in  $\mu m^2$ 316 averaged across all three slices for each mouse. Both the hippocampus and cortex were 317 analyzed separately for each slice. Statistical difference for plague size, percentage of total

318 area, and plaque count per square millimeter was measured using an unpaired Student's t-test.

319

### 320 X-34 Plaque Staining

321 To evaluate X-34 positive plaque burden, frozen coronal brain sections (50 µm) were 322 mounted on Superfrost Plus slides, permeabilized with 0.25% Triton X-100 in PBS for 30 323 minutes and stained with X-34 (0.01mM; Sigma SML1954) dissolved in 40% ethanol in PBS, pH 324 10 for 20 min. The tissue was then washed with 40% ethanol in PBS and mounted with 325 Fluoromount G mounting medium. Slides were imaged using Cytation7 (BioTek) and guantified 326 using NIH ImageJ software. A Cytation7 cell imaging multi-modal imager was used to create 327 high-resolution images of the X-34 scanned brain sections. Total plague coverage, total plague 328 count, and average plaque size were analyzed using NIH ImageJ software. Total plaque 329 coverage was expressed as a percentage of the total area for each section and averaged 330 across three sections per animal. Plague count was expressed as the plague count per square 331 millimeter averaged across the three sections per animal. Plague size was expressed in square 332 microns averaged across all three sections for each mouse. Both the hippocampus and cortex 333 were analyzed separately for each section. Statistical difference for plaque size, percentage of 334 total area, and plaque count per square millimeter was measured using an unpaired Student's t-335 test.

336

337 Immunofluorescence

338 Coronal brain sections (50µm) were permeabilized in 0.25% Triton X-100 for 30 min at 339 room temperature. Slices were then stained with X-34 (0.001 mM; Sigma SML1954) dissolved 340 in 40% ethanol in PBS for 20 min and blocked in 3% BSA/3% Normal Donkey serum in 0.1% 341 Triton X-100 in PBS. X-34-stained samples were immunostained with antibodies HJ3.4 342 (2.4ug/mL; α-Aβ1-13) or Iba1 (Abcam ab5076) and CD68 (BioRad MCA1957) at 4°C overnight. 343 Three slices per animal were stained. Secondary antibodies of Alexa Fluor 488-conjugated 344 donkey anti-rat IgG, Alexa Fluor 647-conjugated donkey anti-goat, and Alexa Fluor 647 donkey 345 anti-mouse (Invitrogen). Slides were mounted with Fluoromount G mounting media. High

resolution 40x images were obtained using the Zeiss LSM 880 Confocal microscope with Airyscan. Z-stacks were analyzed using NIH ImageJ software, where max projection images (those with the highest signal intensity) were selected for each fluorescent channel. The Iba1 and CD68 signals were quantified within 15µm of the X-34-positive plaques. Iba1 and CD68 colocalization was also quantified. An outlier analysis was run using the ROUT method with a Q-value of 1%. Three outliers were removed from the APP/PS1x*Pld3*-KO mice in the Iba1 analysis. Statistical difference was measured using an unpaired Student's t-test.

353 To quantify HJ3.4 and X-34 colocalization, Z-stacks were analyzed using NIH ImageJ 354 software, where max projection images were selected for each fluorescent channel. Plague 355 composition was quantified by measuring the percentage of HJ3.4 staining within X-34-positive 356 areas. Nonfibrillar plaque area was normalized to the total X-34 area. A ROUT outlier analysis 357 with a Q-value of 1% was run for each of these quantifications. No outliers were removed from 358 the analysis of percent area. Four outliers were excluded in the APP/PS1xPld3-WT mice, and 359 three outliers were excluded in the APP/PS1xPld3-KO mice in the nonfibrillar plaque area 360 analysis. Statistical difference was measured using an unpaired Student's t-test.

361

#### 362 **Results**

363 AD risk variant PLD3 p.A442A is sufficient to alter PLD3 splicing and Aβ levels

Three highly conserved, rare variants in *PLD3* increase AD risk: p.M6R, p.V232M, and p.A442A [4]. *PLD3* p.A442A (G>A) was associated with increased AD risk in four independent case-control datasets (p=3.78×10-7; OR=2.12) [4]. *PLD3* p.A442A was predicted to modify a splicing enhancer-binding site, SRSF1, *in silico* [4]. In the brains of *PLD3* p.A442A carriers, total *PLD3* and exon 11-containing transcript expression were reduced compared to controls [4]. However, these association studies did not allow us to attribute the causality of the risk variant to the phenotype.

371 Here, we coupled genome-editing with stem cell models to determine whether PLD3 372 p.A442A is sufficient to alter PLD3 splicing and phenocopy AD-related phenotypes. Primary 373 dermal fibroblasts were obtained from a patient carrying a single copy of the PLD3 p.A442A 374 variant. Fibroblasts were de-differentiated into induced pluripotent stem cells using non-375 integrating Sendai virus. The resulting iPSC were characterized for pluripotency markers, the 376 presence of the *PLD3* p.A442A variant, and chromosomal integrity (Supplemental Figure 1). To 377 determine the causality of PLD3 p.A442A on AD-related phenotypes, we used CRISPR/Cas9 to 378 correct the A allele to G (wild-type) (Figure 1A) [13]. PLD3 p.A442A and isogenic controls (PLD3 379 WT) were then differentiated into cortical neurons using a growth factor-mediated approach as 380 previously described (Figure 1A) [13], where they illustrated a similar capacity to form Tuj1-381 positive neurons (Figure 1B). To further verify the similarity between the cells in their capacity to 382 form neurons, we estimated the relative proportion of neurons in the cultures using bulk 383 transcriptomics and deconvolution methods that include all the major brain cell types [15]. We 384 found that differentiated cultures from PLD3 p.A442A and isogenic controls exhibited a similar 385 enrichment of neurons (~95%; Figure 1C). These findings are consistent with a variant that 386 impacts a late-onset disease, where we would not predict a significant developmental defect. 387 Having demonstrated that PLD3 p.A442A and isogenic controls share a similar capacity 388 to form neurons, we next asked whether the PLD3 p.A442A variant was sufficient to alter PLD3 389 splicing in a manner consistent with our prior observations in human brains from PLD3 p.A442A 390 carriers [4]. RNA isolated from neurons expressing PLD3 p.A442A and isogenic controls was 391 converted to cDNA, and PLD3 exons 7, 8, 9, 10, and 11 were amplified and quantified. We 392 found that PLD3 exons are significantly reduced in the PLD3 p.A442A neurons, which is 393 restored upon correction of the variant allele to WT (Figure 1D). To determine whether PLD3 394 p.A442A neurons exhibit changes in A $\beta$ , which would be consistent with a variant that impacts 395 amyloid plaque deposition, we measured extracellular A $\beta$  by sandwich ELISA in the media of 396 PLD3 p.A442A and isogenic control neurons. After correcting for total protein, we observed a

397 significant increase in Aβ42 and Aβ40 in media from neurons expressing *PLD3* p.A442A (Figure
398 1E and 1F) without changing the Aβ42/40 ratio (Figure 1G) when compared to isogenic controls.
399 Together, these findings illustrate that in nearly identical, isogenic neurons, the presence of the
400 *PLD3* p.A442A is sufficient to alter *PLD3* transcripts and extracellular Aβ levels.

401

## 402 PLD3 expression is altered in LOAD brains

403 Having demonstrated that the AD risk variant in PLD3 (PLD3 p.A442A) was sufficient to 404 alter PLD3 transcripts and Aß levels, we sought to determine whether PLD3 is altered in LOAD. 405 We examined PLD3 expression in laser-captured microdissected neurons across multiple brain 406 regions from AD cases and neuropathology-free controls. *PLD3* expression was significantly 407 lower in AD brains compared with control brains in the entorhinal cortex, hippocampus, medial 408 temporal gyrus, and superior frontal gyrus (Figure 2), regions that exhibit amyloid and tau 409 pathology. Interestingly, *PLD3* expression was unaltered in the primary visual cortex, which is 410 largely spared of AD pathology (Figure 2) [30]. PLD3 expression was also significantly reduced 411 in an independent cohort of temporal cortices isolated from AD and control brains ( $\beta$ =-0.36; 412  $p=3.23\times10^{-4}$ ) [16]. These findings are consistent with prior reports of reduced *PLD3* expression 413 in LOAD brains [4].

414

#### 415 Pld3 regulates Aβ in APP/PS1 mice

416 *PLD3* expression is reduced in brains from *PLD3* p.A442A carriers and in LOAD brains 417 (Figure 2) [4], and overexpression or silencing of PLD3 in mouse neuroblastoma cells leads to 418 inverse changes in A $\beta$  levels [4]. Thus, we sought to determine whether modulating *PLD3* 419 expression is sufficient to alter A $\beta$  *in vivo*. In mice, A $\beta$  is primarily generated in neurons and 420 released into the ISF, where it can be cleared by extracellular proteolysis, transported into CSF 421 or across the blood-brain barrier, or by cellular uptake and degradation. The steady-state level 422 of ISF A $\beta$ , thus, reflects these production and degradation/clearance mechanisms. We

423 hypothesized that reducing endogenous *Pld3* expression, as observed in human AD brains, 424 would elevate ISF Aβ levels. To address this hypothesis, 3-month-old APP/PS1 mice were 425 injected with AAV8 particles containing shPld3 or shScrambled (control) and evaluated at five 426 months of age by in vivo microdialysis (Figure 3A). At five months of age, shPld3 was sufficient 427 to significantly reduce endogenous *Pld3* transcript level in the hippocampus compared with 428 scrambled controls by 28% (Figure 3B). This modest reduction of *Pld3* did not alter steady-state 429 ISF Aβ levels (Figure 3C and 3D; p=0.27). Next, to test the impact of Pld3 silencing on the Aβ 430 elimination rate (half-life), AB levels were monitored after treatment with a v-secretase inhibitor 431 (Figure 3C). The secretase inhibitor rapidly blocks A $\beta$  generation within minutes, then ISF is 432 sampled hourly to calculate the rate of elimination of existing A $\beta$ . Silencing of *Pld3* resulted in a 433 135% increase in Aβ elimination half-life (Figure 3C and 3E; p=0.0025). Thus, PLD3 is likely 434 involved in A $\beta$  clearance.

435 The striking impact of a modest *Pld3* decrease in A $\beta$  levels in the APP/PS1 mice led us 436 to investigate the impact of a global knockout of *Pld3* on A $\beta$  (Figure 3F). Global *Pld3* knockout 437 mice were generated using CRISPR/Cas9. A guideRNA targeting an early, highly conserved 438 exon was validated in vitro and injected into murine oocytes (see Methods; Supplemental Figure 439 2). Founders were established and backcrossed to C57BI/6;C3B6 prior to breeding with 440 APP/PS1 mice (Supplemental Figure 3C). Consistent with prior reports, *Pld3* KO mice were 441 viable and did not exhibit gross defects [9, 31]. Pld3-deficient APP/PS1 mice exhibited a 35% 442 increase in steady-state ISF Aβ at four months of age (Figure 3G-3I). In agreement with the 443 AAV-mediated knockdown, Pld3-deficient APP/PS1 mice exhibited a 49% increase in Aß 444 elimination half-life following the administration of a  $\gamma$ -secretase inhibitor (Figure 3G and 3I). 445 Thus, *Pld3* reduction in the brain is sufficient to reduce the turnover of ISF Aβ. 446 In vitro overexpression of PLD3 was sufficient to reduce extracellular A $\beta$  [4]. Thus, we

asked whether overexpression of *hPLD3* in APP/PS1 mice could rescue the ISF Aβ phenotype
(Figure 3A). The hippocampus of APP/PS1 mice was bilaterally injected with AAV8 particles

containing hPLD3 or GFP (control) at three months of age, and two months later, ISF Aβ was
measured by microdialysis (Figure 3A). Overexpression of *hPLD3* significantly reduced steadystate levels of ISF Aβ and Aβ elimination half-life by approximately 25% (Figure 3J-M). Taken
together, our findings illustrate that PLD3 expression regulates Aβ turnover in APP/PS1 mice.

....

# 454 *Pld3-deficiency alters plaque composition*

455 Impairment in protein clearance has been implicated in amyloid plaque accumulation 456 and AD pathogenesis [32, 33]. Aß aggregation in the extracellular space (ISF) into soluble 457 oligomers or insoluble amyloid plagues is a critical driver of AD pathogenesis, and conversion of 458 monomeric A $\beta$  into these aggregates is facilitated at higher concentrations [34]. Thus, we 459 sought to determine whether increased ISF Aß in four months old APP/PS1xPld3-KO mice 460 could impact amyloid plaque pathology in older animals (Figure 4A). To assess plaque 461 pathology, APP/PS1xPld3-KO mice were sacrificed at nine months of age, and brain sections 462 were co-stained with HJ3.4 (total A $\beta$ ) and X-34 ( $\beta$ -sheet rich dense cores; Figure 4B). Plaque 463 composition was then analyzed as the percent of X-34 stain within HJ3.4-positive plaques 464 (termed: fibrillar plagues) and the extent of HJ3.4-positivity outside X-34 plagues (termed: Non-465 fibrillar plaque area). In APP/PS1xPld3-KO mice, the percentage of fibrillar plaques was 466 significantly reduced compared with APP/PS1xPld3-WT mice (Figure 4C). Conversely, the non-467 fibrillar plaque area was significantly increased compared with APP/PS1xPld3-WT mice (Figure 468 4D). In complementary analyses, we found that A $\beta$  plague size was significantly increased in 469 the cortex of APP/PS1xPld3-KO compared with APP/PS1xPld3-WT mice (Supplemental Figure 470 3) without a change in the overall plague burden as defined by the percentage area of HJ3.4-471 positive immunostaining (e.g., plaque density). X-34 staining remained unchanged in the 472 absence of Pld3 (Supplemental Figure 4). Thus, Pld3 KO impacts plague composition, shifting 473 the pathology to a less fibrillar structure [35].

474

### 475 Pld3 deficiency impact microglial recruitment to amyloid plaques

476 The absence of *Pld3* in the APP/PS1 mice resulted in more non-fibrillar plaques. This 477 shift in plague composition is similar with findings from Trem2- and ApoE-deficient APP/PS1 478 mice [36-39]. Loss of these AD risk genes also significantly reduced microglial recruitment to the 479 amyloid plagues [36-39]. Thus, we hypothesized that the loss of Pld3 may alter the microglial 480 response in APP/PS1 mice. To test this hypothesis, fixed brain tissue from the APP/PS1xPld3-481 KO and APP/PS1xPld3-WT mice were stained for total microglia (Iba1), activated microglia 482 (CD68), and dense core A $\beta$  plagues (X-34) (Figure 5A). The amount of activated microglia as a 483 percentage of total microglia was similar between APP/PS1xPld3-KO and APP/PS1xPld3-WT 484 mice (Figure 5D). However, APP/PS1xPld3-KO mice exhibited a significant reduction in the 485 recruitment of microglia around the X-34-positive plagues (Figure 5B). No significant change 486 was observed in the amount of CD68-positive, activated microglia around the X-34-positive 487 (Figure 5C and 5D). Pld3 deficient APP/PS1 mice also exhibited a significant increase in 488 expression of microglia genes associated with neurodegeneration including Trem2, Tyrobp, 489 Ctsd, and Cst7 (Table 1) without a corresponding change in homeostatic microglia genes (Table 490 1). Thus, loss of *Pld3* impacts microglia function in response to amyloid plagues.

491

#### 492 A role for PLD3 in microglia

Given the association of *Pld3* loss with altered microglia function in mouse models, we sought to determine whether *PLD3* is altered in microglia in human brains. Nuclei were isolated and sequenced from frozen AD and age-matched control brains (Figure 6A)[17, 18]. AD brains were further classified based on the presence of *TREM2* risk variants (named: TREM2). Unsupervised clustering of the brain nuclei revealed 15 cell-type specific clusters that correspond to the major cell-types found in the brain [17]. We isolated microglia from other cells and reexamined the alternative transcriptional states that we further classified into nine

500 subclusters (Figure 6B). PLD3 expression was significantly overexpressed in Mic.1 and reduced Mic.2 microglia subclusters compared to all microglia clusters (Figure 6B; p=2.71×10-5 and 501 502 2.27×10-6, respectively; Supplemental Table 2). In contrast, homeostatic microglia (Mic.0) did 503 not show differential expression of PLD3 (Figure 6B; p=0.52; Supplemental Table 2). Microglia 504 in Mic.1 have an expression signature consistent with microglia associated with 505 neurodegeneration (e.g. disease associated or activated response microglia) [40-42], while 506 Mic.2 clusters are enriched among TREM2 variant carriers and exhibit upregulated resting state 507 microglia markers with minimal elevation of genes associated with activated microglia [17]. 508 To understand how PLD3 expression changes in microglia with disease, we examined 509 control, sporadic AD and TREM2 risk variant carriers. PLD3 expression was significantly 510 reduced in homeostatic microglia in sporadic AD brains and TREM2 risk variants compared to 511 controls (Figure 6C; p=1.04×10-3 and p=2.46×10-2, respectively; Supplemental Table 3). PLD3 512 expression was further dysregulated in disease associated Mic.1 cluster in TREM2 risk variant 513 carriers compared with controls (Figure 6D; p=4.13×10-3; Supplemental Table 3). 514 To further clarify the relationship between PLD3 and microglia function, we analyzed

515 PLD3 expression in single cell RNAseg data obtained from human iPSC expressing inducible 516 CRISPRi machinery that were transduced with 81 sgRNAs and differentiated into iTF-Microglia 517 (Figure 6E) [43]. Unsupervised clustering analyses revealed nine distinct microglia subclusters 518 (Figure 6E), representing distinct transcriptional states. Among these subclusters, PLD3 was 519 significantly overexpressed in clusters 1, 2, and 3 and significantly reduced in clusters 4, 5, 7, 520 and 9 (Figure 6F and 6G; Supplemental Table 4). Clusters 1-3 correspond with interferon-521 induced gene activation states [43], while clusters 4-9 are enriched for genes associated with 522 chemokine/cytokine activation states [43]. Cluster 3, where PLD3 is significantly elevated, is 523 enriched in SPP1 expression, a marker of disease associated microglia [43]. Additionally,

cluster 7, where *PLD3* is significantly reduced, is enriched in markers of microglia proliferation
[43]. Together, these data support a role for PLD3 in microglia activation in health and disease.

527 **Discussion** 

528 In this study, we sought to understand the contribution of PLD3 to pathways that 529 promote AD pathology. We demonstrate that the AD risk variant, PLD3 p.A442A, is sufficient to 530 alter PLD3 splicing and Aβ levels in iPSC-derived neurons in a manner consistent with similar 531 findings in AD brains [4]. Additionally, we describe a role for PLD3 in LOAD, whereby modifying 532 PLD3 expression in APP/PS1 mice is sufficient to regulate Aβ turnover in the ISF. The observed 533 reduced ISF Aβ turnover, in turn, leads to a change in amyloid plagues in aged animals. We 534 observed that loss of *Pld3* in APP/PS1 mice results in a shift in plague composition to a more 535 nonfibrillar structure. This altered plaque composition is accompanied by impaired microglial 536 recruitment to the plaques, consistent with prior reports from Trem2 deficient mice. In human 537 brains, *PLD3* is enriched in disease associated microglia and expression is altered in AD brains. 538 Together, these results suggest that PLD3 plays cell-autonomous and non-cell autonomous 539 roles in AD pathogenesis.

540 Deciphering the contribution of risk variants and pathogenic mutations to AD 541 pathogenesis has led to groundbreaking discoveries of Aβ metabolism, synaptic function, and 542 immune function to AD and revealed novel therapeutic targets [44]. Emerging sequencing 543 technologies in increasingly larger cohorts have revealed the contribution of rare variants to AD 544 risk [44, 45]. Nevertheless, resolving the contribution of rare variants to disease can be 545 challenging when relying on association studies and autopsy brain tissue that captures a 546 snapshot of disease.

547 Here, patient-derived cell culture models represent a tractable, human platform that 548 recapitulates disease-specific phenotypes and when coupled with genome engineering, allows

for the study of genotype x phenotype relationships. This study demonstrates that iPSC-derived
 neurons are highly informative and recapitulate early pathogenic events in AD.

551 In this study, we used genome editing technology to molecularly pinpoint the contribution 552 of the A allele to PLD3 and AD-related phenotypes. While we cannot exclude the possibility that 553 genomic factors beyond PLD3 p.A442A contribute to the risk profile in the iPSC donor line used 554 in this study, we can attribute the defect in PLD3 splicing and the increase in A $\beta$  levels to this 555 synonymous variant. The increase in both Aβ42 and Aβ40 is consistent with the effects of other 556 known pathogenic mutations, including APP KM670/671NL [46, 47]. The absence of an effect of 557 *PLD3* p.A442A on the A $\beta$ 42/40 ratio suggests that A $\beta$  recycling and trafficking. This is 558 consistent with recently reported functions of PLD3 as a type II membrane protein functioning in 559 endosomes and lysosomes, the primary site of APP cleavage [48, 49]. Together, these human 560 stem cell findings suggest a role for PLD3 p.A442A in altering APP/AB recycling and trafficking 561 in a manner that elevates total AB levels.

562 PLD3 p.A442A was predicted to disrupt a splicing enhancer-binding site [4]. We observe 563 defective *PLD3* splicing in iPSC-derived neurons from a *PLD3* p.A442A carrier, which replicates 564 the observations in brains from *PLD3* p.A442A carriers [4]. We go on to demonstrate that 565 correcting the risk allele with CRISPR/Cas9 is sufficient to restore the splicing defect. The 566 functional impact of distinct PLD3 isoforms remains unknown; however, as the functional roles 567 of PLD3 are resolved, this will be an important area to explore.

We show that PLD3 is a major regulator of ISF Aβ turnover *in vivo*. Hippocampal reduction of endogenous *Pld3* in adulthood via AAV8-mediated knockdown or global knockout of *Pld3* in the background of APP/PS1 mice resulted in a strong increase in ISF Aβ half-life, suggesting that Aβ is turned over more slowly in the absence of *Pld3*. Aβ clearance mechanisms have been proposed to drive LOAD [33]. Following secretion from presynaptic neurons, Aβ is either taken up and degraded in the lysosomes of post-synaptic neurons, taken

574 up and degraded in the lysosomes of glial cells, degraded by extracellular proteases, is 575 transported to CSF, or transcytosed across the blood-brain barrier (BBB). Amyloid accumulation 576 occurs in an AB concentration-dependent manner [34]; thus, dysregulation of ISF AB clearance 577 drives amyloid accumulation and AD pathogenesis. Neurons from Pld3 KO mice exhibit 578 lysosomes with increased density and size [31]. PLD3 is enriched in lysosomes surrounding 579 amyloid plagues in human AD brains and mouse models of amyloid accumulation [9]. Thus, 580 *Pld3* may regulate ISF A $\beta$  through lysosome-mediated clearance mechanisms in neurons or 581 other glial cells.

582 The absence of *Pld3* in APP/PS1 mice led to a shift in the composition of amyloid 583 plaques to being more diffuse and less fibrillar. While amyloid plaques may adopt a series of 584 morphologies and architecture, a major structure is characterized by a dense "fibrillar" core of 585 Aß surrounded by more diffuse "non-fibrillar" of Aß deposits [50]. Non-fibrillar Aß is proposed to 586 contribute to its higher toxicity, possible because either its structure is more toxic or they serve 587 as a reservoir for more diffusible Aß oligomers [35, 51]. Thus, a PLD3-mediated shift to more 588 non-fibrillar plaques is consistent with more toxic effects given the same amount of overall AB 589 deposition. Silencing AD risk genes, including Trem2 and ApoE, result in a similar shift of 590 plaque composition shift in APP/PS1 mice [36, 37, 39]. Thus, modeling the reduction of PLD3 591 observed in PLD3 p.A442A carriers, and LOAD brains in an animal model of amyloid 592 accumulation leads to a phenotype consistent with a gene that exacerbates disease.

In prior studies where gene silencing in amyloid mice led to a change in plaque
formation and composition, a role for an altered microglial response to amyloid plaques was
implicated [36, 37, 39]. APP/PS1x*Pld3*-KO and APP/PS1x*Pld3*-WT mice exhibited a similar
abundance of Iba1 positive microglia. Yet, recruitment of Iba1-positive microglia to X-34-positive
plaques was significantly reduced in APP/PS1x*Pld3*-KO mice compared to APP/PS1x*Pld3*-WT
mice. This could suggest a role for PLD3 in recruiting microglia to surround and alter Aβ

599 structure and limit Aβ-induced toxicity similar to mechanisms described for TREM2 [36]. In mice, 600 *Pld3* mRNA is expressed in microglia [52]. Microglia isolated from amyloid mouse models 601 (APP<sup>NL-F-G</sup>) reveal an activation state enriched for MHC class II, tissue repair genes, and 602 enrichment of AD risk genes, including *Pld3* [42]. Thus, loss of *Pld3* in the global knockout may 603 impact the molecular identity of microglia, which impairs the recruitment and responsiveness of 604 the glia to plaques.

605 In human microglia, PLD3 plays a role in microglia that is disrupted in AD. Microglia 606 maintain distinct transcriptional states that likely reflect functional changes due to environmental 607 stimuli [53]. We demonstrate that PLD3 expression is enriched in disease associated microglia 608 (Brain Mic.1 and iTF-Microglia cluster 3) and depleted in population of microglia that are found 609 in TREM2 risk variant carriers (Brain Mic.2). Mic.2 reflect a dampened activation state, distinct 610 from homeostatic microglia (Mic.0) with an upregulation of resting state microglia markers 611 (TMEM119, P2RY13, MED12L) and modest elevation of activated markers (ABCA1, C5AR1, 612 and CD83) [17]. This finding along with the observation that PLD3 expression is reduced in 613 disease associated microglia (Mic.1) in TREM2 risk variant carriers suggests a potential 614 interaction between these AD risk genes. These results also support the parallels between our 615 mouse model findings and those in Trem2 deficient mice. In addition to association with disease 616 associated microglia, PLD3 and TREM2 have also been implicated in lysosomal function [9, 31, 617 38, 48, 49].

Overall, we observed a modest impact on amyloid plaque pathology in APP/PS1x*Pld3*-KO mice. The modest impact is highly consistent with PLD3 as a disease modifier rather than a fully penetrant, causative mutation. Alternatively, this could reflect redundant mechanisms for mouse Pld3.

Here, we demonstrate a therapeutic potential for PLD3. *hPLD3* overexpression by AAV8
in APP/PS1 mice resulted in a significant decrease in ISF Aβ levels and accelerated Aβ
turnover. *PLD3* levels are significantly reduced in AD brains, and *PLD3* expression is positively
correlated with cognition in humans and mouse models [9]. Thus, by promoting Aβ turnover
and facilitating the microglial response to amyloid plaques, *PLD3* occupies a crucial role in brain
health.

628

#### 629 Disclosures

630 D.M.H. co-founded and is on the scientific advisory board of C2N Diagnostics. D.M.H. is on the 631 scientific advisory board of Denali and Cajal Neuroscience and consults for Genentech and 632 Alector. CC has received research support from: Biogen, EISAI, Alector and Parabon. The 633 funders of the study had no role in the collection, analysis, or interpretation of data; in the writing 634 of the report; or in the decision to submit the paper for publication. CC is a member of the 635 advisory board of Vivid genetics, Halia Therapeutics and ADx Healthcare. AMG is on the 636 scientific advisory boards of Genentech and Muna Therapeutics. M. K. has filed a patent 637 application related to CRISPRi and CRISPRa screening (PCT/US15/40449) and serves on the 638 Scientific Advisory Board of Engine Biosciences, Casma Therapeutics, and Cajal Neuroscience, 639 and is an advisor to Modulo Bio and Recursion Therapeutics. The remaining authors have no 640 disclosures.

641

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658

659

# 660 Table 1: Differential microglia gene expression in APP/PS1xPld3-KO compared with

661 APP/PS1xPld3-WT brains

Gene	Log2FoldChange	p-value
Trem2	0.48	1.07E-03
Tyrobp	0.57	1.06E-03
Ctsd	0.25	4.18E-03
Cst7	0.56	2.91E-02
Cd68	0.35	6.27E-02
Aif1	0.33	1.08E-01
Tmem119	0.04	6.49E-01
P2ry12	0.05	5.99E-01

662

## 663 Figure Legends

#### 664 Figure 1: iPSC-neurons expressing *PLD3* p.A442A phenocopy splicing defects observed

- 665 in human brains A. Fibroblasts from a *PLD3* p.A442A variant carrier were reprogrammed into
- 666 induced pluripotent stem cells (iPSCs). CRISPR-Cas9 technology was used to generate an
- isogenic control line. IPSCs were then differentiated into cortical neurons (see Methods).
- 668 Downstream assays were performed after 42 days in culture. B. iPSC-derived neurons stained
- 669 with Tuj1 illustrate a similar capacity of p.A442A and isogenic controls (PLD3 WT) to form
- 670 neurons. C. Digital deconvolution of iPSC-derived neurons from transcriptomic data illustrates a
- 671 similar enrichment of neurons in *PLD3* p.A442A and isogenic controls (*PLD3* WT). D.
- 672 Expression of *PLD3* exon 11 compared to *PLD3* exons 7, 8, 9, and 10. E-G. Sandwich ELISA of
- 673 media from iPSC-derived neurons (pg/mL) and corrected for total protein measured by BCA
- 674 (pg/μg). Aβ42 (E), Aβ40 (F), Aβ42/40 (G). Graphs represent mean ± SEM. \*<0.05,
- 675 \*\*\*\*<0.00005. Analyzed by two-tailed Student's *t* test.
- 676

## 677 Figure 2: *PLD3* expression is significantly reduced in brain regions vulnerable to AD

678 **pathology.** Laser capture of microdissected neurons from the brains of neuropathology

679 confirmed control and AD brains [54]. Quantification of *PLD3* expression in laser microdissected

neurons isolated from AD and control brains. The graph represents mean ± SEM. \*p<0.05.

681 Analyzed by two-tailed Student's *t* test.

682

Figure 3: Bi-directional expression of *Pld3* alters Aβ turnover *in vivo*. A-E. The impact of *Pld3* silencing on ISF Aβ. A. Diagram of the experimental timeline: APP/PS1 mice were injected
with shScramble shPld3 (compared to *shScram* control)-containing AAV8 particles at three

686 months of age and were evaluated by *in vivo* microdialysis at five months of age. *shScramble* (n=7) and shPld3 (n=6). B. Knockdown of endogenous Pld3. C. Aβ levels in ISF sampled over 687 688 14 hours in shScram, and shPld3 injected APP/PS1 mice. D. Steady-state levels of ISF Aβ. E. 689 Elimination half-life of ISF AB. F-I. The impact of Pld3 KO on ISF AB. F. Diagram outlining the 690 experimental timeline: APP/PS1xPld3-WT and APP/PS1xPld3-KO mice were evaluated by in 691 vivo microdialysis at four months of age. APP/PS1xPld3-WT (n=10), APP/PS1xPld3-KO (n=14). 692 G. Aß levels in ISF sampled over 14 hours in APP/PS1xPld3-WT and APP/PS1xPld3-KO mice. 693 H. Steady-state levels of ISF AB. I. Elimination half-life of ISF AB. J-M. APP/PS1 mice were 694 injected with hPLD3 (compared to GFP control)-containing AAV8 particles at three months of 695 age and were evaluated by *in vivo* microdialysis at five months of age. GFP (n=7), hPLD3 (n=8). 696 J. Overexpression of hPLD3. K. Aß levels in ISF sampled over 14 hours in GFP and hPLD3 697 injected APP/PS1 mice. L. Steady-state levels of ISF Aβ. M. Elimination half-life of ISF Aβ. 698 Graphs represent mean ± SEM. \*<0.05, \*\*\*<0.0005. Analyzed by two-tailed Student's *t* test.

699

#### 700 Figure 4: Loss of *Pld3* alters plaque composition in APP/PS1 mouse cortex. A.

701 Experimental timeline. APP/PS1xPld3-WT (n=20), APP/PS1xPld3-KO (n=15). B.

702 Representative confocal images of mouse cortex co-stained with HJ3.4 (total Aβ) and X-34 (β-

sheet rich dense cores). C-D. Quantification of the plaque composition. C. Percent of X-34

within a HJ3.4-positive area. D. Area HJ3.4 outside of X-34-positive area (nonfibrillar area). The

total area of X-34 normalized signal microns. Graphs represent mean ± SEM. \*\*, p=0.0010; \*\*\*,

p=0.0003. Analyzed by two-tailed Student's *t* test with a ROUT outlier analysis (Q=1%).

707

Figure 5: Loss of *Pld3* alters the microglial response to Aβ pathology. A. Representative
 images of APP/PS1x*Pld3*-WT and APP/PS1x*Pld3*-KO mice co-stained with Iba1 (total

microglia), CD68 (activated microglia), and X-34 (β-sheet-rich dense cores). APP/PS1x*Pld3*-WT (n=20), APP/PS1x*Pld3*-KO (n=19). B. Quantification of Iba1 localization within 15 µm of the X-34+ dense core plaques (\*, p=0.03). C. Quantification of CD68 localization within 15 µm of the dense plaques. D. Quantification of Iba1 and CD68 colocalization. Graphs represent mean  $\pm$ SEM. Analyzed by two-tailed Student's *t* test with a ROUT outlier analysis (Q=1%).

715

716 Figure 6: PLD3 is enriched in specific microglia states in human brains. A. Diagram of the 717 study design for human brain sequencing. B. UMAP plot depicting segregation of human brain 718 microglia into nine major subclusters, left. Bar plot of the log2 fold change of PLD3 by microglia 719 subcluster, right. \*, p<0.05. C-D. Violin plot of PLD3 expression from control (CO), sporadic AD 720 (sAD), and TREM2 risk variant carriers in homeostatic (Mic.0; C) and disease associated (Mic.1; 721 D). E-G. Single cell RNAseg data obtained iTF-Microglia CROP-seg described previously [43]. 722 E. UMAP plot reveals 9 microglia clusters. F. Diagram of study design for iTF-Microglia, left. 723 UMAP plot of PLD3 expression, right. Cells are colored by the PLD3 expression levels. G. Bar 724 plot of the log2 fold change of PLD3 by microglia subcluster. \*, p<0.05. 725

# 726 Supplemental Figure Legends

- 727 Supplemental Figure 1: Characterization of the *PLD3* p.A442A iPSC-derived neurons. A.
- 728 Representative images of PLD3 p.A442A and the corrected WT iPSCs stained for NANOG,
- 729 OCT4, SOX2, SSEA4, and TRA1-80. B. qPCR from known markers of pluripotency. C.
- 730 Karyotype. D. Sanger sequencing.
- 731

732 Supplemental Figure 2: Generation of a *Pld3*-deficient amyloid mouse model. A. Mismatch

- detection assay. B. RNA activity validation. C. Breeding scheme for the *Pld3*-deficient mouse
- with APP/PS1 mutant mice to develop a transgenic APP/PS1xPld3-KO mouse line along with
- 735 APP/PS1x*Pld3*-WT littermate controls.

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### 737 Supplemental Figure 3: Loss of *Pld3* significantly increases plaque size without changing

738 plaque area. A. Representative images of mice brain cross-sections stained for total Aβ (HJ3.4)

vith arrows specifying plaques (open arrows for WT; closed arrows for KO). APP/PS1xPld3-WT

740 (n=20), APP/PS1x*Pld3*-KO (n=20). B-C. Quantification of average plaque size in the cortex (B)

and hippocampus (C). D-E. Quantification of average plaque count per mm<sup>2</sup> in the cortex (D)

and the hippocampus (E). F-G. Quantification of the plaque burden by the percentage of the

total area for the cortex (F) and the hippocampus (G). Graphs represent mean ± SEM. \*,

744 p>0.05.

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## 746 Supplemental Figure 4: Loss of *Pld3* does not change dense core plaques. A.

747 Representative images of mice brain cross sections stained with X-34 with arrows specifying

- 748 plaques (open arrows for WT; closed arrows for KO). APP/PS1xPld3-WT (n=20),
- 749 APP/PS1xPld3-KO (n=20). B-C. Quantification of average plaque size in the cortex (B) and
- hippocampus (C). D-E. Quantification of average plaque count per mm<sup>2</sup> in the cortex (D) and
- hippocampus (E). F-G. The quantification of the plaque burden by the percentage of the total
- area for the cortex (F) and hippocampus (G). Graphs represent mean ± SEM.

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# **Supplemental Figure 4**



# **Supplemental Tables**

Supplement	al Table 1: Huma	ın brain demogra			
	Total Number	Sex (% male)	Mean Age at Death (years)	APOE4	Mean Postmortem Interval (years)
Controls	9	33%	90	11%	10.9
sAD	31	45%	81	54%	11.9

Supplemental Table 2: PLD3 expression in human brain microglia							
Cluster Name	LogFC	z-score	p-value	BH corrected p-value			
Mic.0	-0.0262225	-0.6410652	5.21E-01	7.32E-01			
Mic.1	0.1800801	4.19659881	2.71E-05	2.86E-04			
Mic.2	-0.2949385	-4.7275062	2.27E-06	1.26E-04			
Mic.3	-0.1519921	-1.274392	2.03E-01	5.14E-01			
Mic.4	-0.1953743	-1.718988	8.56E-02	2.51E-01			
Mic.5	0.1829342	1.98158159	4.75E-02	1.75E-01			
Mic.6	0.20610645	1.89898926	5.76E-02	1.96E-01			
Mic.7	-0.2146737	-1.3839443	1.66E-01	4.50E-01			
Mic.8	-0.0345632	-0.1138777	9.09E-01	9.99E-01			

Supplemental Table 3: PLD3 expression within microglia subclusters by disease status							
Comparison	LogFC	z-score	p-value	BH corrected p-value	Subcluster		
sAD vs CO	-0.4017806	-3.2799941	1.04E-03	1.43E-01	Mic.0		
TREM2 vs CO	-0.2766865	-2.247029	2.46E-02	3.91E-01	Mic.0		
sAD vs CO	-0.3455155	-1.8251283	6.80E-02	1.00E+00	Mic.1		
TREM2 vs CO	-0.4217827	-2.8679334	4.13E-03	3.21E-01	Mic.1		

Supplemental Table 4: PLD3 expression in iTF-Microglia CROP-Seq						
Cluster Name	Estimate	Std. Error	z value	Pr(> z )		
cluster 1	1.163684751	0.079301251	14.67422936	9.43E-49		
cluster 2	0.673908846	0.041847298	16.10399883	2.39E-58		
cluster 3	0.679645559	0.12978185	5.236830561	1.63E-07		
cluster 4	-0.511168775	0.081414971	-6.278559975	3.42E-10		
cluster 5	-0.966514606	0.105007855	-9.204212437	3.44E-20		
cluster 6	0.178261422	0.050290361	3.544643891	3.93E-04		
cluster 7	-0.696815579	0.075041761	-9.285703981	1.61E-20		
cluster 8	0.277388403	0.093662032	2.961588568	3.06E-03		
cluster 9	-1.155055839	0.051935689	-22.24011787	1.41E-109		