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Alzheimer's disease protective allele of *Clusterin* modulates neuronal excitability through lipid-droplet-mediated neuron-glia communication

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Abstract

Background Genome-wide association studies (GWAS) of Alzheimer's disease (AD) have identified a plethora of risk loci. However, the disease variants/genes and the underlying mechanisms have not been extensively studied.

Methods Bulk ATAC-seq was performed in induced pluripotent stem cells (iPSCs) differentiated various brain cell types to identify allele-specific open chromatin (ASoC) SNPs. CRISPR-Cas9 editing generated isogenic pairs, which were then differentiated into glutamatergic neurons (iGlut). Transcriptomic analysis and functional studies of iGlut co-cultured with mouse astrocytes assessed neuronal excitability and lipid droplet formation.

Results We identified a putative causal SNP of *CLU* that impacted neuronal chromatin accessibility to transcription-factor(s), with the AD protective allele upregulating neuronal *CLU* and promoting neuron excitability. And, neuronal *CLU* facilitated neuron-to-glia lipid transfer and astrocytic lipid droplet formation coupled with reactive oxygen species (ROS) accumulation. These changes caused astrocytes to uptake less glutamate thereby altering neuron excitability.

Conclusions For a strong AD-associated locus near *Clusterin (CLU)*, we connected an AD protective allele to a role of neuronal CLU in promoting neuron excitability through lipid-mediated neuron-glia communication. Our study provides insights into how CLU confers resilience to AD through neuron-glia interactions.

Keywords Alzheimer's disease, Clusterin, Protective allele, Lipid droplets, Neuron excitability, Allele-specific open chromatin, Genome-wide association study, IPSC, Neuron-glia lipid transfer

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Background

Alzheimer's disease (AD) is the most common cause of dementia and represents an enormous social and economic burden [1]. Despite years of research on the accumulation of amyloid beta $(A\beta)$ and tau lesions, effective treatments for AD remains elusive. Recent genome-wide association studies (GWAS) have identified more than 75 reproducible AD risk loci [2-7], providing unprecedented opportunities to elucidate novel disease biology that may facilitate the development of more targeted therapeutics. Among the common GWAS-implicated genetic risk factors, the *apolipoprotein E (APOE)* locus is by far the strongest genetic risk factor. The protein coding variant APOE ɛ4 (R112/R158; APOE4) allele increases AD risk while the APOE ɛ2 (C112/C158; APOE2) allele decreases AD risk when compared to the most common allele APOE ɛ3 (C112/R158; APOE3) [8, 9]. Accumulation of $A\beta$ and tau lesions have been central to the postulated pathogenic mechanism underlying the APOE risk locus [8, 9]. More recently, APOE has been implicated in novel molecular and cellular mechanisms related to neuron-glia lipid transfer and astrocytic lipid droplet (LD) accumulation [10-14]. However, for most other AD GWAS loci, the causal disease variant/gene, cell type vulnerability, and the underlying molecular/cellular mechanism remain largely unknown.

A top-ranking AD GWAS risk locus falls near the gene *Clusterin (CLU)* [2–7]. Like APOE, CLU (also known as APOJ) is an abundant apolipoprotein in the brain [15, 16]. As with APOE, CLU has been associated with $A\beta$ deposition and clearance [17–19] and tau pathology [20, 21]. Unlike APOE that is predominantly expressed in glia, CLU is expressed in both glia and neurons [22, 23]. In the brain, CLU-containing lipoproteins are detected in the cerebrospinal fluid, possibly originating from astrocytes, and may play a role in cholesterol recycling processes [16, 24–26]. Although the total lipid content of CLU lipoprotein particles is much lower than the lipid content found in ApoE lipoprotein particles, CLU lipoprotein particles in astrocytes show a remarkable phospholipid enrichment over APOE particles [27]. Plasma CLU has also been shown to confer a protective effect by binding to brain endothelial cells and reducing neuroinflammation in a mouse AD model [28]. Moreover, a recent study suggests that astrocytic CLU protectively promotes excitatory neurotransmission [29]. However, the physiological role of neuronal CLU in lipid transfer and metabolism, as well as its relevance to AD, has not been extensively studied.

Similar to most other GWAS loci, the AD-associated locus near *CLU* has multiple equally AD-associated non-coding SNPs, posing a challenge to delineate the causal variant. The frequently reported AD GWAS risk single

nucleotide polymorphisms (SNPs) of *CLU*, rs11136000 and rs11787077, both have a minor allele frequency of 0.38 in Caucasians and their minor alleles are less frequently observed in AD individuals than in controls with an AD risk odds ratio (OR) of 0.9 [2–7, 30–34].To better understand the disease mechanism of the AD risk locus near *CLU*, it is imperative to identify the AD causative variant and investigate the functional consequences of the AD risk allele in disease-relevant cell types.

We have recently developed an allele-specific open chromatin (ASoC) mapping approach that enables a comparison of differential chromatin accessibility of the two alleles of a heterozygous disease risk variant in a single sample. This allows the identification of the most likely functional disease risk variants that affect chromatin accessibility and gene expression [35, 36]. By using the ASoC approach, we systematically identified functional AD-associated variants in various human induced pluripotent stem cell (iPSC)-derived subtypes of neurons and glial cells [37] and found that among multiple AD risk variants at the CLU locus, only rs1532278 (T/C) was located in an open chromatin region (OCR) in human iPSC-derived neurons. We found that the T allele of the ASoC SNP rs1532278 is a derived allele that is protective from AD. We employed CRISPR-cas9 editing to generate isogenic pairs of iPSCs carrying different alleles of rs1532278, followed by integrative functional genomics, molecular/cellular, and metabolic analyses. We found that the allele T of rs1532278 specifically elevates neuronal CLU expression, which promotes neuron excitability, neuron-to-glia lipid transfer, and LD accumulation in astrocytes. We also show that the elevated astrocytic LDs and reactive oxygen species (ROS) accumulation may contribute to maintenance of neuron excitability by finetuning astrocytic glutamate uptake.

Material and method

iPSC generation and maintenance

Two human iPSC lines, CD05 and CD07 (full IDs: CD0000005 and CD000007), were used for CRISPR/Cas editing. These two iPSC lines were initially derived from cryopreserved lymphocytes (CPLs) using the genome-integration-free Sendai virus method (Cytotune Sendai Virus 2.0; Invitrogen) at the Rutgers University Cell and DNA Repository (RUCDR) (also known as NIMH Stem Cell Center and Infinity Biologix, currently Sampled). The two iPSC lines have been used in our previous ASoC mapping studies [35–37]. The two donors are all healthy control males of European ancestry aged 65 and 59 for lines CD05 and CD07, respectively. The donors were also analysed for copy number variants (CNVs), and none have large CNVs (> 100 kb) [38]. They were heterozygous (T/C) at SNP site rs1532278, and the two iPSC lines

were CRISPR/Cas9-edited to homozygous T/T and C/C. Two to three clones per genotype were obtained. Quality control measures for the unedited and edited iPSC lines included IF staining for pluripotency, mycoplasma contamination test, RNA-seq-based pluripotency test (Pluritest), and eSNP-karyotyping as previously described [35, 36]. The Endeavor Health (formerly NorthShore University HealthSystem) institutional review board (IRB) approved this study.

For iPSC maintenance, cells were cultured using mTeSR Plus media (StemCell Technologies, #100–0276), with medium changes performed every other day, and passaged as clumps every 4–6 days using ReLeSR (StemCell Technologies, #100–0483).

iPSC differentiation into different brain cell types for ASoC mapping

To generate ATAC-seq data and map ASoC SNPs in different brain cell types, we have previously generated human iPSC-derived microglia (iMG) (n = 38 donors) [37], astrocytes (iAst) (n = 18 donors) [37], glutamatergic (iGlut, n = 36) [35–37], GABAergic (iGABA, n = 30) [35–37], and dopaminergic neurons (iDN, n = 39) [35– 37]. The detailed methods for generating these cell types have been previously described [37]. The purity of iMG (TREM2⁺CD45⁺PU1⁺) and iAst (Vimentin⁺/GFAP⁺/ $S100\beta^+)$ is >90% [37]. The purity of iGlut (VGLUT1+/ MAP2⁺), iGABA (GAD1⁺ or GAD2⁺/MAP2⁺) and iDN $(HT^+/MAP2^+)$ is >85% [35, 36]. The transcriptomic (using RNA-seq data) and/or epigenomics (using ATACseq) similarity of each of these iPSC-derived cell types to corresponding brain cell types have been previously confirmed by principal components analyses [35–37].

Bulk ATAC-seq and ASoC SNP calling

ATAC-seq sample preparation was performed as previously described [35, 36]. Briefly, 75,000 viable cells were used for each transposition mixture reaction. Samples were then incubated at 37 °C for 30 min on a thermomixer at 1,000 rpm. The eluted DNA was shipped to the University of Minnesota Genomic Center for library preparation and ATAC-seq. All raw sequence reads generated by Illumina NextSeq were demultiplexed at the University of Minnesota Genomics Center and provided as $2 \times$ 75 bp paired-end FASTQ files (targeting 60 M reads per sample). Only paired-end reads that survived Trimmomatic processing v0.39 (ILLUMINACLIP:NexteraPE-PE. fa:2:30:7, SLIDINGWINDOW:3:18, MINLENGTH:26) were retained. The sequencing reads mapping and the preparation of cell line-specific VCF files for OCR peak and ASoC SNP calling were previously described in detail [37]. All analyzed ATAC-seq samples passed standard QC based on the characteristic nucleosomal periodicity of the insert fragment size distribution and high signalto-noise ratio around transcription start sites (TSS) [37].

For ASoC mapping, GATK (version 4.1.8.1) was used as recommended by the GATK Best Practices (software.broadinstitute.org/Gatk/best-practices/) [39] as described previously in detail [37]. Briefly, from individual VCF genotype files, heterozygous SNP sites with tranche level >99.5% were extracted. Biallelic SNP sites (GT: 0/1) with minimum read depth count (DP) ≥ 20 and minimum reference or alternative allele count ≥ 2 were retained. We then compared the combined allelic counts of each allele of each SNP across all heterozygous samples. The binomial *p*-values (non-hyperbolic) were calculated using the binom.test(x, n, P = 0.5, alternative = "two. sided", conf.level = 0.95) from the R package. Benjamini & Hochberg multiple-testing correction was applied to all qualified SNPs. We called ASoC SNP using FDR value =0.05 as a cut-off. We have previously verified that the ASoC SNP calling is not affected by donor's sex, age or caseness [35, 36]. Based on power calculations [35, 36], we expected to have sufficient power to call ASoC SNPs even for iAst data from the smallest number of donor lines (n = 18).

CRISPR-cas9 editing and Sanger sequencing confirmation

The online tool Benchling (www.benchling.com) was used to design CRISPR guide RNA (gRNA), and the gRNAs with highest off-target score (specificity) were selected (Table S15). The gRNAs were cloned into CROPseq-Guide-Puro vector (Addgene, #86,708) [40]. The gRNA plasmid DNAs, together with the plasmid DNAs of pSpCas9(BB)- 2A-Puro (Addgene, #62,988) [41] and pSUPERIOR.puro-shp53 (Addgene, #38,035) (included to transiently inhibit p53 and increase editing efficiency [42]) were transiently transfected into iPSCs. For transfection, iPSCs were dissociated into single cells using accutase (StemCell, 07920) in a 15 ml centrifuge tube at a density of $4-6 \times 10^{5}/1.8$ ml in the presence of 10 µM ROCK inhibitor (ROCKi, R&D Systems, 1254/1). Lipofectamine stem reagent (Thermo Fisher Scientific, STEM00001) was used for transfections. DNA including pSpCas9(BB) – 2A-Puro (0.5 μ l from 1 μ l/ug stock), CROPseq-Guide-Puro vector (1 µl from 1 µl/ug stock), pSUPERIOR.puro-shp53 vector (1 µl from 1 µl/ug stock) and ssODNs carrying the desired SNP allele (6 µl from 100uM stock) were mixed into 100 µl Opti-MEM media (Thermo Fisher Scientific, 31,985,062) in a 1.5 ml tube. Another 1.5 ml tube was filled with 8 µl Lipofectamine stem reagent and 100 µl Opti-MEM media. The reagents in the two 1.5 ml tubes were combined and added into iPSC single cell suspension, followed by gently mixing and replating into one well of a 6-well plate. Sixteen hours post-transfection, the medium was replaced with

fresh medium containing 0.25 µg/ml puromycin (Thermo Fisher Scientific, A1113802) and 10 µM ROCKi. Fortyeight hours post transfection, the medium was refreshed with the same reagents. Seventy-two hours post transfection, the puromycin-containing medium was removed, and the cells were cultured in fresh medium with 5 μM ROCKi. Half-medium (without ROCKi) change was made every 2-3 days until iPSC colonies were formed. 10-14 days post transfection, iPSC colonies were individually picked into 96-well plates. DNA from a small fraction of cells in each colony was then extracted (Epicentre, QE09050) and used for Sanger sequencing confirmation of accurate editing. Subcloning with at a low density (2–5000 cells on 6-cm dish) was carried out to ensure an iPSC clone was pure. Following successful editing, three predicted top-ranking off-target editing sites were subjected to Sanger sequencing to confirm the absence of off-target editing (Table S15 and Fig. S2 A).

For OCR deletion, up- or downstream gRNAs were cloned into the vector pSpCas9(BB)– 2A-Puro to co-express gRNAs and Cas9. Transfection was conducted as described above. The presence of on-target OCR deletion and the absence of the predicted off-target editing in the selected iPSC clones were confirmed by Sanger sequencing.

Preparation of primary mouse astrocytes

Primary mouse astrocytes were extracted as previously described [43]. Briefly, the brains were harvested from Day 0-2 pups of C57BL/6 J. Their meninges were removed, minced and centrifugated in cold Hanks'balanced salt solution (HBSS buffer, Thermo Fisher Scientific, 88,284). Then, tissue pellets were resuspended, dissociated, and filtered through a cell strainer to generate a single cell suspension. All cells were seeded into T- 75 flasks, maintained in DMEM (Thermo Fisher Scientific, 10,569,016) with 10% FBS (Thermo Fisher Scientific, A5209501). The obtained astrocytes were used within a month (≤ 4 cell passages). All astrocytes used in this study were from the same extraction. For each assay, the astrocytes were recovered from the same liquid nitrogen stock and used with the same cell passages to ensure the consistency.

Glutaminergic neuronal (iGlut) differentiation

iGlut neurons were differentiated from iPSC according to the previous protocols [36, 44] with some modifications. Briefly, on day – 1, iPSCs were dissociated with accutase and placed in 6-well plates at a density of 5×10^5 /well in the presence of 5 μ M ROCKi. On day 0, NGN2 and rtTA lentivirus were added into mTeSR Plus medium with 5 μ M ROCKi to infect iPSCs. On day 1, Neurobasal media (Thermo Fisher Scientific, 21,103,049) containing 1 × B27

supplement (Thermo Fisher Scientific, 17,504,044), $1 \times$ GlutaMax (Thermo Fisher Scientific, 35,050,061), 5 µg/ ml Doxycycline (Dox, Sigma, D9891) and 5 µM ROCKi were used to initiate the differentiation. 1 µg/ml puromycin selection was performed from Day 2 to Day 4. On day 5, the cells were dissociated with accutase, replated into matrigel-coated plates, and maintained in Neurobasal media supplemented with 1× Glutamax, 1× B27, 5 µg/ ml doxycycline, 10 ng/ml BDNF/GDNF/NT- 3 (Pepro Tech, 450–02/450–10/450–3), and 5% FBS. On day 6, the culture medium was refreshed with the same one used on

Culture medium was refreshed with the same one used on Day 5 without FBS, and 1 μ M Ara-C (Millipore-Sigma, C6645) was applied to the medium and kept for two days to ensure the purity of postmitotic neurons. On day 8, Ara-C was withdrawn and the neurons were maintained with one half-medium change every 3 days until they were mature enough for the assays.

For CLU and LDs staining in pure iGlut culture, day- 5 neurons were directly replated onto 12 mm glass coverslips (Neuvitro, GG-12–15-Pre) at 50,000 cells/coverslip. Neurons were maintained on the coverslip until day 25 by refreshing half the medium every three days. For neuron morphology and LD staining in the iGlut-mAst co-culture system, 100,000 astrocytes were first placed onto glass coverslips 24 h before dissociating neurons in 24-well plates with DMEM medium with 10% FBS. Then, day- 8 iGlut neurons were dissociated with accutase, suspended in Neurobasal medium, and seeded on top of the layer of astrocytes at 300,000 cells/well after removing the DMEM medium. On day 9, one-half of the medium was replaced without FBS, and on day 10, all medium were refreshed to remove FBS completely. Thereafter, all medium was refreshed every 3 days until day 30. For ChIP-qPCR and RNA seq purposes, day- 8 iGlut and mAst were dissociated and placed together at appropriate dishes/plates, and the cultures were maintained the same way as iGlut-mAst co-culture described above.

iPSC differentiation into astrocytes (iAst)

iAst were differentiated from iPSC based on the NgN2 method [45] with minor modifications. Briefly, on day -1 and day 0, the same iGlut differentiation procedures were followed. On day 2, a cocktail of SB431542 (10 μ M) (Tocris Bioscience, 1614), XAV939 (2 μ M) (Tocris Bioscience, 3748), LDN193189 (100 nM) (Tocris Bioscience, 6053), Dox (5 μ g/ml) and ROCKi (5 μ M) were added into N2 medium that was constituted with DMEM/F12 (Gibco, 11,320–033), 1× Glutamax, 0.3% Sucrose (Millipore-Sigma, S0389), and 1× N2 supplement B (StemCell Technologies, 07156). On day 3, SB431542 (5 μ M), XAV939 (1 μ M), LDN193189 (50 nM), Dox (5 μ g/ml) and Puromycin (5 μ g/ml) were added into N2 medium to start cell selection. On day 4, the culture medium was refreshed

with N2 medium supplemented with Dox (5 µg/ml) and Puromycin (5 µg/ml). On day 5, all cells were dissociated with Accutase, suspended with Astrocyte medium (SiceneCell, 1801) containing 5 µM ROCKi, and replated onto Matrigel-coated 10-cm dishes. Cells were passaged at 1:2 ratio in Astrocyte medium every 3–4 days. On day 25, the cells were fixed with 4% PFA, permeabilizated with 0.1% Triton X- 100 (Sigma, SLCD3244) and stained with S100 β (Millipore-Sigma, S2532, Mouse, 1:500) and Vimentin (Cell Signaling, D21H3, Rabbit, 1:200) to determine iAst purity (~ 100%).

iGlut morphology and CLU staining

Day- 30 iGlut-mAst co-culture on coverslips were fixed with 4% PFA for 15 min and permeabilized with 0.1% Triton X- 100 for 20 min. The fixed cells were incubated with antibodies again PSD- 95 (NeuroMab, clone K28/43, Mouse, 1:1,000), SYP (Abcam, ab32127, Rabbit, 1:500), and MAP2 (Synaptic System, 188,004, Guinea pig, 1: 1000) overnight at 4 °C. After three washes with PBS, the corresponding secondary antibodies including Donkey anti-Mouse Alexa 488 (Thermo Fisher Scientific, A21202, 1:200), Donkey anti-Rabbit Alexa 594 (Thermo Fisher Scientific, A21207, 1:200), and Goat anti-Guinea Pig Alexa 647 (Thermo Fisher Scientific, A21450, 1:200) were added and further incubated for two hours at room temperature. Nuclei were stained with DAPI (0.5 mg/ ml) for 2 min at room temperature before the coverslips were mounted (Fluorescent Mounting Medium, Millipore-Sigma, F4680). For IF staining of neuron identity, the cultures were stained with HuNu (Millipore-Sigma, MAB1281, Mouse, 1:200), GFAP (DAKO, Z0334, Rabbit, 1:500), and MAP2 (Synaptic System, 188,004, Guinea pig, 1: 1000) antibodies. For iGlut purity quantification assay (Fig. S1D)., the cultures were stained with HuNu (Thermo Fisher Scientific, RBM5 - 346-P1, Rabbit, 1:100), MAP2 (Millipore-Sigma, AB5543, Chicken, 1:5000), vGlut1 (Synaptic System, 135,511, mouse, 1: 100), and Ki67 (Thermo Fisher Scientific, 740008 T, Rat, 1: 500) antibodies. All antibodies were dissolved in PBS with 1% BSA (Thermo Fisher Scientific, 15,260,037) and 0.1% Triton X-100.

For CLU staining in pure culture iGlut, cells were fixed on day 25, permeabilized, and incubated with CLU (Abcam, ab69644, Rabbit, 1:200) and NeuN (Millipore-Sigma, MAB377, Mouse, 1:50) antibodies. NeuN immunostaining was used to visualize perikaryon where most CLU signals were located (in the **Image quantification** section below). All procedures were the same as above.

RNA isolation from cell cultures for qPCR and RNA-seq

Total RNA was extracted using the RNeasy Plus Kit (Qiagen, 74,134). Briefly, all cells were directly lysed in RLT plus buffer, further separated and eluted in RNase-free water. For RNA-seq, all RNA samples were sequenced on the Illumina NovaSeq 2000 platform with paired-end reads (2×150 bp) (Novogene). For qPCR, RNAs were first reversed transcribed to cDNAs using a high-capacity cDNA reverse transcription kit (Applied Biosystems, 4,368,814) and further amplified with TaqMan Universal PCR Master Mix (Applied Biosystems, 4,364,338) on a Roche 480 II instrument. All qPCR primers were listed in Table S15.

Chromatin immunoprecipitation (ChIP) qPCR

ChIP-qPCR assay was performed following the protocol of Magna ChIP A/G Chromatin Immunoprecipitation Kit (Millipore-Sigma, 17-10,085). Briefly, 1% formaldehyde (Thermo Fisher Scientific, 28,908) was directly added into the medium of day- 30 iGlut-mAst co-cultures to crosslinking proteins to DNA. Then, glycine was added to terminate the cross-linking. Cells were harvested in ice-cold PBS, pelleted, sonicated, and immunoprecipitated with 10 µg ISL2 (R and D Systems, AF4244, Sheep) or DRGX antibodies (Bioss, bs- 11827R, Rabbit) and Protein A/G magnetic beads overnight at 4 °C. Protein A/G magnetic beads with TF-binding DNAs were separated on a magnetic stand. TF-DNA complexes were eluted in an elution buffer with proteinase K at 62 °C with 2 h of shaking, followed by a 95 °C incubation for 10 min to denature proteinase K. Lastly, the released DNAs were purified for qPCR. About 2% of sample input after sonication without immunoprecipitation was used to normalize the loading input. Normal sheep IgG (R&D Systems, 5-001-A) or rabbit IgG (Cell Signaling Technology, 2729) were used as negative control to exclude non-specific binding of antibodies. The ChIP-qPCR primers are listed in Table S15.

ISL2 siRNA knockdown

iGlut were directly replated onto a 24-well plate at 500,000 cells/well on Day 5. On day 30, the neurons were transfected either by 50 nM human *ISL2* siRNA (Horizon Discovery Biosciences, L- 016725–00–0005) or 50 nM non-targeting control siRNA (Horizon Discovery Biosciences, D- 001810–10 -05) following the protocol of Lipofectamine RNAiMAX Transfection Reagent (Thermo Fisher Scientific, 13,778,030). 72 h post transfection, RNAs were extracted to quantify *ISL2* and *CLU* mRNA levels by qPCR. The qPCR primers are listed in Table S15.

Enzyme-linked immunosorbent assay (ELISA) assay

For both iGlut pure culture and iGlut-mAst co-culture, the culture medium was completely refreshed on day 26 and further collected on day 30. The conditioned media were centrifuged for 10 min with 3,000 rpm at 4 $^{\circ}$ C to

remove the cell debris. Cells were harvested and protein quantification was performed by the BCA method to normalize the ELISA detection from cell lysis or the supernatant. ELISA quantifications of human CLU (R&D system, DCLU00, specific for human CLU), human A β 1–40 (R&D system, DAB140B), human A β 1–42 (R&D system, DAB142), and mouse CLU (R&D system, MCLU00, specific for mouse CLU) were performed according to the vendors' protocol.

Western blotting

Western blotting was performed as previously described [43]. Briefly, cells were lysed in NP- 40 lysis buffer (Thermo Fisher Scientific, J60766-AK) with proteinase inhibitors (Roche, 04693159001) and phosphatase inhibitors (Roche, 04906845001). The cell lysates were sonicated and denatured in Laemmli Sample Buffer (Bio-Rad, 1,610,747). BCA kit (Thermo Fisher Scientific, 23,225) was used for total protein quantification. The cellular protein extracts were fractioned through 10% homemade SDS-PAGE gels, transferred to a PVDF membranes (Bio-Rad, 1,620,177) and subsequently immunoblotted. The primary antibodies included PSD- 95 (Synaptic System, 124,011, mouse, 1:1,000), SYP (Abcam, ab32127, Rabbit, 1:2,000), and β -actin (Cell Signaling Technology, 3700, 1:5,000). The secondary antibodies included anti-rabbit-HRP (Cell Signaling Technology, 7074, 1:5,000) and antimouse-HRP (Cell Signaling Technology, 7076, 1:5,000). All Western blotting images were quantified using FIJI [46], and specific protein signals were normalized to corresponding β -actin signals in each sample.

Calcium imaging

iGlut were infected with AAV-GCaMP6 m (pAAV.Syn. GCaMP6 m.WPRE.SV40, Addgene, 100,841-AAV9) or AAV-jRCaMP1b (pAAV.Syn.NES-jRCaMP1b.WPRE. SV40, Addgene, 100,851-AAV9) at 10^5 MOI on day 8. The infected neurons were replated together with mAst into a 96-well plate (Curi Bio, ANFS- 0096) on day 9 at a density of 15,000 iGlut and 5,000 mAst per well. On day 35, the time-lapse images were acquired at ~5 Hz for 2 min on a Nikon A1R microscope with sCMOS camera. For quantification, peak detection was performed using the R baseline package, and HDBSCAN was used to screen out the correct clusters.

Multi-Electrode Array (MEA)

An MEA assay was performed according to a previous protocol [36] with slight modification. Briefly, day- 20 iGlut were disassociated with accutase and replated with mAst into 0.1% PEI-coated 24-well MEA plate (Axion BioSystems, M384-tMEA- 24 W) at a density of 150,000 iGlut and 50,000 mAst. Neurobasal medium with $1 \times$

Glutamax, $1 \times B27$, 5 µg/ml doxycycline, 10 ng/ml BDNF/ GDNF/NT- 3, and 5% FBS were used on the first day after replating. In the next two days, half of the medium (300 μ L) was replaced every day with fresh culture medium without FBS. Thereafter, 2/3 culture medium (no FBS) was regularly refreshed every 3 days. The culture medium was completely refreshed a day before the MEA recording. Spontaneous firing was recorded for 15 min, and the last 10 min of recording were used for data analysis. All data files were batch-processed using the Neural Metrics Tool (Axion Biosystems). For data analysis, the burst parameters were set at Poisson Surprise with a minimum surprise of 10 and Adaptive mode, Minimum number of spikes to 40, and Minimum of electrodes to 15%; Active Electrode Criterion was set at 6 spikes/min; Synchrony parameters were set at 20 ms for Synchrony Window and "none" for Synchrony Metrics.

AAV plasmid reconstruction, packaging and infection

To express human CLU, pAAV-hSyn-hCLU-Flag was reconstructed from pAAV-hSyn-eGFP (Addgene, 58,867). First, pAAV-hSyn-eGFP was digested with BamHI and EcoRI to remove the eGFP insert. Then, the backbone DNAs (30 fmol), CLU cDNA fragment (1,400 bp; 60 fmol, synthesized from IDT, Table S15), ssDNA (single strand)-up-linker 60 bp (200 fmol, synthesized from IDT, Table S15), and ssDNA -down-linker 60 bp (200 fmol, synthesized from IDT, Table S15) were assembled using NEBuilder[®] HiFi DNA Assembly Master Mix (New England Biolabs, E2621S). The assembly reaction was then transformed into NEB stable competent E coli (New England Biolabs, C3040H). The transformed bacterial clone with the correct insert was determined by Sanger sequencing of plasmid DNAs, and a correct clone was expanded to prepare the plasmid DNAs for AAV packaging.

Recombinant AAVs were packaged in HEK 293 T cells (ATCC, CRL- 3216) following a previous protocol [47] with minor modifications. HEK 293 T cells were transfected with pAAV-hSyn-hCLU-Flag/pAAV-hSyn-eGFP, pUCmini-iCAP-PHP.eB (Addgene, 103,005) and pAd-DeltaF6 (Addgene, 112,867) by PEI (Polysciences, 23,966) at 90% confluence. Seventy-two hours post-transfection, all cells were harvested and pelleted. AAVs were further extracted from cell pellets by AAV extraction kit (Takara, 6675) and titrated using qPCR approaches (primers are listed in Table S15).

iGlut were infected with AAV-eGFP or AAV-hCLU at 10⁵ MOI on day 8. For calcium imaging, iGlut were infected with AAV-jRCaMP1b at 10⁵ MOI on the next day. Between day 10 and day 12, iGlut were co-cultured with mAst or alone, following the above-described iGlut differentiation procedures. Immunostaining with

Anti-Flag (Proteintech, 20,543–1-AP, Rabbit,1:200) and MAP2 antibody was used to determine the infection efficiency of AAV-hCLU on day 30 for iGlut-mAst co-culture and on day 25 for iGlut pure culture.

Lipid droplet (LD) staining

For pure iGlut cultures, Day- 25 cells were fixed with 4% PFA, washed with PBS, and permeabilized using digitonin (Cell Signaling Technology, #16,359, ~0.01%) for 5 min at room temperature. The cells were then stained overnight with NeuN antibody (1:50). After the corresponding secondary antibody incubation, LipidTox (Thermo Fisher Scientific, H34476, 1:300) was applied for 2 h at room temperature. LipidTox was dissolved in PBS with 1 mg/ml DAPI. After staining, a one-time quick wash (~ 2 s) with PBS was applied before mounting the slides. The images were taken immediately after mounting on a Nikon ECLIPSE TE2000-U microscope.

For iGlut-mAst co-culture, day- 30 cells were fixed with 4% PFA, washed by PBS, and digitonin (~ 0.01%) permeabilized for 5-20 min at room temperature. Cells were then stained using antibodies against MAP2 (Synaptic System, 188,004, Guinea pig,1: 1000), GFAP (DAKO, Z0334, Rabbit, 1:500) and/or Anti-Flag (Proteintech, 20,543-1-AP, Rabbit,1:200) that were dissolved in PBS with 1% BSA. The corresponding secondary antibodies were dissolved in the same buffer to stain the cell for 2 h at room temperature. After three washes with PBS, LipidTox (1:300) or BODIPY 493/503 (Thermo Fisher Scientific, D3922, 2 μ g/ml) were used to stain LDs at room temperature. The staining time was 30 min for LipidTox and 10 min for Bodipy 493/503. Both dyes were dissolved in PBS with DAPI (1 mg/ml). Bodipy 493/503 stocks were prepared in DMSO at 1 mg/ml. Cells were quickly washed (~ 2 s) once with PBS for LipidTox staining before mounting. Three quick washes (~ 2 s) with PBS were applied for BODIPY 493/503 staining [48].

Lipid transfer assay

The lipid transfer assay was performed as previously described [10, 49] with minor modifications. Briefly, following the iGlut differentiation protocol, day- 5 iGlut were replated into 24-well plates at 500,000/well and maintained until day 30. The mAst were replated into 24-well plates with Matrigel-precoated coverslips at 15,000/well and maintained for 3 days. Day- 30 iGlut were prelabeled by 2.5 μ M Red C12 (BODIPY 558/568, Thermo Fisher Scientific, D3835) by adding Red C12 directly into culture medium and incubated for 18 h. iGlut were then washed twice with pre-warmed DPBS and rested for one hour in culture medium in a 37 °C incubator. mAst cells on coverslips and iGlut neurons in culture wells were washed twice with pre-warmed DPBS.

Pre-warmed HBSS (Thermo Fisher Scientific, 14,175,095) containing 2 mM CaCl₂ and 10 mM HEPES was added to the wells with neurons. A parafilm separator, cut to suitable size and with the center removed to form a ring, was placed above the neurons. Coverslips carrying mAst were placed face-down onto the neurons, creating a sandwich structure. The assembled cultures were then incubated at 37 °C for 4 h. After incubation, coverslips with mAst were removed, fixed and stained with Bodipy 493/503.

To confirm the lipid transfer ability of neuronal CLU within this lipid transfer system, Day- 5 iGlut (CD05, C/C) were seeded onto coverslips after replating (0.5 M/ coverslip) and infected with AAV-hCLU-Flag at MOI of 10^5 on Day 8. From Day 26 to Day 28, these iGlut coverslips were co-cultured with mAst coverslips (prepared as described earlier in this section) using Parafilm separators. To rule out any effects of gravity, iGlut coverslips were tested in both top and bottom positions. After co-culture, all cells were fixed, permeabilized, and stained with appropriate antibodies. Flag antibody and Bodipy 493/503 were used to assess the colocalization of CLU and LDs in mAst, while MAP2 and GFAP staining were conducted to confirm cell identities (Fig. S7).

Assay for comparing CLU mRNA, intracellular, and extracellular protein levels

For the T/T and C/C groups, Day- 10 non-proliferating iGlut cells from the CD05 line (following Ara-C treatment) were seeded either alone (0.45 M/well) or co-cultured with mAst (0.15 M/well) in 24-well plates. The cells were maintained overnight in iGlut culture medium containing 5% FBS (Neurobasal medium supplemented with B27, Glutamax, BDNF, GDNF, and NT3). The next day, the medium was carefully but completely replaced with iGlut culture medium without FBS. A separate group for pure mAst cultures was seeded at the same density and maintained in DMEM medium with 10% FBS (Fig. S6).

For hCLU overexpression groups, iGlut cells (CD05 C/C line) were first infected with AAV-eGFP or AAV-hCLU at at 10^5 MOI on day 8. On Day 10, the cells were replated into 24-well plates, either alone or co-cultured with mAst, following the same protocol described above (Fig. S6).

For all groups, cell mRNA, protein, and medium supernatant were collected on Day 30 according to the corresponding protocols described above.

Ketone body and lactate assay

Day- 5 iGlut were directly seeded into 12-transwell (Corning, 3460, 0.4 μ m pore) at 1 × 10⁶ cells/well and cultured until day 15. mAst were seeded into the insert of 12-transwell at 200,000 cells/insert on day 13, placed into the unused wells and rested for two days in DMEM

medium with 10% FBS. Then, the culture medium in the mAst insert was replaced with the iGlut culture medium (Neurobasal medium with B27, Glutamax, BDNF, GNDF, and NT3). The mAst insert was then transferred into the wells with day- 15 iGlut for 14 days of co-culture with medium change every 3 days. Then, the insert with mAst were taken out and washed three times with PBS. Next, the mAst insert was incubated in 5 times diluted DMEM medium (Thermo Fisher Scientific, 10,566,016, supplemented with Glutmax) to reach 5 mM glucose condition, without FBS and sodium pyruvate for 24 h. The supernatants were then collected at 6 and 24 h to measure the concentration of β -hydroxybutyrate (a ketone body, Promega, JE9500) and Lactate (Promega, J5021). iGlut and mAst were also collected with NP- 40 lysis buffer to determine the protein concentration using the BCA method for normalization. Data were normalized to protein concentrations of iGlut and mAst.

CellRox staining

Day- 8 iGlut and mAst were replated into 24-well plates with Matrigel-precoated coverslips at a density of 30,000/ well for neurons and 10,000/well for astrocytes. iGlut/ mAst were maintained in the culture medium until day 30, following the iGlut-mAst co-culture protocol described above. For CellRox staining, CellRox Deep Red (Thermo Fisher Scientific, C10422) was added to the culture medium (5 μ M final concentration) and incubated for 30 min at 37 °C. After incubation, cells were fixed with 4% PFA, and processed with and without digitonin permeabilization (Fig. S8 A) to determine whether Cell-Rox Deep Red signals can survive with this gentle permeabilization, and further stained with MAP2.

Glutamate uptake assay

Day- 5 iGlut were directly seeded into 24-transwell (Corning, 3413, 0.4 µm pore) at 500,000 cells/well and cultured until day 15. mAst were seeded on the insert of 24-transwell at 40,000 cells/insert on day 13, placed into the unused wells and rested for two days in DMEM medium with 10% FBS. Then, the culture medium in the mAst insert was replaced with iGlut culture medium (Neurobasal medium with B27, Glutamax, BDNF, GNDF, and NT3). The mAst insert was then transferred into the wells with day- 15 iGlut for 14 days of co-culture with medium change every 3 days. Then, the insert with mAst were taken out, washed once with HBSS buffer (Thermo Fisher Scientific, 14,175,095) without calcium and magnesium, and incubated in the same buffer at 37 °C for 30 min. mAst insert was incubated in HBSS buffer (Thermo Fisher Scientific, 14,025,092) with 100 µM glutamate, calcium and magnesium for 3 h. The supernatants were then collected to measure glutamate concentration using the glutamate assay kit (Abcam, Ab83389). iGlut and mAst were also collected with NP- 40 lysis buffer to determine the protein concentration using the BCA method for normalization purpose. Data were normalized to protein concentrations of iGlut and mAst.

For antioxidant AD4 treatment, iGlut were co-cultured with mAst on trans-well dishes. On day 14, all medium in cultured wells and inserts was replaced with fresh medium containing AD4 (1.5 mM final concentration) for 24 h, after which the inserts with mAst were removed for glutamate uptake assay as described above.

CLU immunodepleting assay

Day- 5 iGlut were replated into 12-well at 100,000 cells/ well and maintained following the protocol described above. On day 27, the medium was refreshed with iGlut culture media. On day 30, the supernatants were collected and centrifuged at 3,000 rpm for 10 min at 4°C to remove cell debris, and then frozen and stored at -80° C until use. CLU antibody (Santa Cruz, sc- 166907) was conjugated to magnetic beads (Thermo Fisher Scientific, 14311D) at 8 µg of antibody per mg of beads following the manufacturer's protocol. 2 mg of antibody coupled with beads were added into 1 ml day- 30 supernatant (16 µg antibody per ml of medium) and incubated at 4 °C for 24 h. The beads were then captured on a magnetic stand, the supernatants were filtered through 0.2 µm syringe filters (Basix, 13,100,106) (CLU immunodepleted medium), and the CLU level was confirmed measured by ELISA. The conditioned medium (CM) was prepared by combining fresh DMEM medium with 10% FBS and CLU immunodepleted medium at a 1:3 ratio. For assaying the function of mAst, mAsts were seeded into 96-well plates at 40,000 cells/well 2 days before adding the CM. On day 1, the mAst culture medium was completely refreshed with CM (200 μ l) and maintained until day 7 with one media change on day 4. On day 7, all CM were removed and washed with HBSS buffer (Thermo Fisher Scientific, 14,175,095) to start the glutamate uptake assay as described above. The assay data were normalized to the protein concentration of mAst from the corresponding wells.

Image quantification

Neuron morphology (MAP2 staining): All confocal z stacks (20 × objective lens) were first processed using FIJI [46] to generate maximum intensity projections. Then, neuron branches and soma were segmented by ilastik [50]. The branch length and the number of neurons (soma number) were analyzed by Cellprofiler [51] as previously described [43, 52]. *The effectiveness test of neuron differentiation (MAP2 and vGlut1 staining)*: All confocal z stacks (40 × objective lens) were first projected

with maximum intensities. The number of MAP2- and vGlut1-positive soma, as well as HuNu-positive human cells, was analyzed by CellProfiler. SYP and PSD- 95 *puncta*: All confocal z stacks (63 × oil immersion objective lens) were first projected with maximum intensities. ROIs of MAP2 positive dendrites were chosen uniformly from the secondary branches with $\sim 50-100 \ \mu m$ length by FIJI [46]. The identical fluorescence intensity thresholds were applied to different images to identify SYP and PSD95 positive puncta. SYP- and PSD95- positive objects within the MAP2 mask were analyzed. For density measurements, the number of SYP or PSD95 objects was divided by the length of MAP2 (per unit was set as 10 µm) in an ROI; for area measurements, the total area of SYP and PSD95 objects were divided by the area of MAP2 in an ROI. Cellprofiler was used for all quantifications. CLU intensity: NeuN staining was used to generate a mask of soma after setting a proper intensity threshold to encircle the majority of CLU positive signals. The mean intensity of CLU signals within the NeuN mask was quantified in the 3D model of Cellprofiler. *LipidTox staining in iGlut pure culture*: NeuN staining was used to generate a soma mask by setting an appropriate intensity threshold to exclude signals originating from dead cells. A uniform and appropriate threshold was then applied to LipidTox signals across all groups, and the volume of LipidTox signals was calculated using the 3D model in CellProfiler. For cell counting, all confocal z-stacks (captured with a $63 \times oil$ immersion objective lens) were first z-projected using maximum intensity in FIJI. The NeuN signals were reused to create a 2D mask, and DAPI signals within this 2D mask were selected and quantified after applying an appropriate identification in 2D model of CellProfiler. Red C12 staining in mAst: All confocal z stacks (20 × objective lens) were z projected with maximum intensity in FIJI. A uniform and proper threshold was set for Red C12 signals across different groups, and the area of Red C12 signals was calculated in Cellprofiler. The corresponding co-culture iGlut were also harvested to measure their protein concentration (by BCA kit) for normalization purposes. LipidTox staining in iGlut-mAst co-culture: All channels in confocal z stacks (20 \times objective lens) were split by FIJI without any projection. Then, proper thresholds were set for both LipidTox and MAP2 signals. MAP2 staining was used to generate a 3D mask in Cellprofiler. LipidTox staining within MAP2 3D mask was identified as neuronal LDs, and non-overlapping staining was considered as astrocytic LDs. All the assayed LDs volumes were normalized by the corresponding number of cells identified by Cellprofiler. The MAP2 and GFAP volumes were also calculated after proper thresholding in the 3D model of Cellprofiler to measure the neuron-occupied areas.

CellRox staining: Since all CellRox signals were located in mAst, their signal volumes were calculated without any separation in the 3D model of Cellprofiler after proper thresholding ($20 \times objective lens$). The number of mAst was also quantified to normalize CellRox signals.

RNA-seq data analysis

Raw FASTQ sequencing reads were trimmed by trim galore and mapped to a concatenated reference genome of human (GRCh38) and mouse (GRCm39) by using Salmon (v0.11.3). All mapped transcripts (310,359, human and mouse) were further filtered based on the criterion that \geq 75% of samples must express a transcript. Filtered human (40,162) and mouse (32,476) transcripts were analyzed for differential expression (DE) between genotypes (TT vs. CC) by using EdgeR (v4.0.16) with quasi-likelihood negative binomial generalized log-linear model. The ratio of human and mouse read counts generated from HISAT2 (v2.1.0) alignment for each sample was used as a correction factor to balance the cellular composition variance of human and mouse cells in iGlutmAst co-culture. Counts per million (CPM) values of all the filtered transcripts were used for PCA analysis. Transcripts showing significant DE were identified with FDR <0.05, and the top-ranked transcripts were used to represent genes [53]. Enrichr [54] was used to perform GO (Gene Ontology) and Wiki pathway enrichment analyses with a statistical significance cut-off of adjusted p value <0.05. For human CLU in-silico qPCR verification, consistent with experimental qPCR, exon 3 for both hCLU and hGAPDH was chosen as the targeted reference sequences, and the read counts, generated from HISAT2, against them were calculated (Figure. S6 F).

Statistical analyses

Two-tailed unpaired Student's t-test or Mann–Whitney test (if the data are not normally distributed) were used to test the differences between two groups (TT vs.CC, or vehicle vs. treatment). For the test of three groups (AAV-CLU overexpression assay), one-way ANOVA followed by a post hoc Tukey's test was used to determine significance between groups. The data were analyzed by R 4.1.1 or GraphPad Prism 9. The statistical significance cut-off was 0.05.

Results

AD protective allele of rs1532278 elevates *CLU* expression through enhanced ISL2 binding

To study the mechanism underlying the strong AD risk variants near *CLU*, we employed an approach that we recently developed to identify a putatively functional disease causal variant showing ASoC [35, 36]. Using ATAC-seq (assay for transposase-accessible chromatin with

sequencing) in iPSC-derived glutamatergic (iGlut), dopaminergic (iDA), GABAergic (iGABA) neurons, astrocytes (iAst), and microglia (iMG) from 39 donors as well as ASoC data [35–37], we compared the chromatin accessibilities (quantified as ATAC-seq reads) of the two alleles of each heterozygous SNP to identify AD risk SNPs that also showed ASoC (also see Method) as described [35-37]. We screened for ASoC for multiple nearby genomewide significant (GWS) SNPs that were in strong linkage disequilibrium ($r^2 > 0.9$) with the GWS AD index risk SNP rs11787077 [7, 55] (Fig. 1A and B,Table S1). We found that only rs1532278 (T/C) mapped to a strong ATAC-seq peak (i.e., OCR) and also showed a significant ASoC score in iGlut (false discovery rate, FDR < 0.033) and iDA (FDR <0.048) neurons but not in iGABA or iAst (Fig. 1B and C,Table S1). Note that rs1532278 also showed ASoC in iMG (FDR < 0.031) but the SNP-flanking OCR in iMG is minimal compared to neuronal OCRs (Fig. 1B). In support of its functionality, we found that rs1532278 is in strong linkage disequilibrium with a brain cortex expression quantitative trait loci (eQTL) SNP rs11787077 ($r^2 > 0.98$) whose T allele is associated with increased CLU expression [55] (Table S2). The minor allele T of rs1532278 is a human-specific allele that is less prevalent in AD cases than in controls in GWAS (OR =0.905, P= 3.2 ×10⁻³³) (Fig. S1 A) [7]. Hence, this suggested that this allele might be functional and protective against AD and warranted further investigation.

We have previously shown that ASoC often reflects differential allelic chromatin accessibility to transcription factor (TF) binding, thereby affecting gene expression [35, 36]. The ASoC SNP rs1532278 is in intron 3 of *CLU* (Fig. 1D). By using JASPAR (a database of TF binding profiles) to predict TF binding, we found that the AD protective allele T of rs1532278 is within the TF binding motifs for *ISL2* and *DRGX* (Fig. 1C), which are known to be expressed in postmitotic neurons (Fig. S2 C) [56, 57] and in our iGlut (Fig. S1B). Interestingly, the more common and ancestral allele C of rs1532278 is predicted to disrupt the binding of these TFs. Hence, we postulated the neuronal ASoC SNP rs1532278 to be a functional AD risk variant affecting TF binding with the high-affinity allele T likely increasing CLU expression in neurons.

To test this hypothesis, we used CRISPR/Cas9 to edit rs1532278 in two iPSC donor lines (denoted as CD05 and CD07, both homozygous for APOE3) from C/T to T/T or C/C, respectively (Fig. 1D,S1 C-D, and S2 A-B). We then differentiated these iPSC lines into iGlut, a neural subtype that showed a more significant ASoC score than iDA (Fig. 1B and C,Table S1), and cultured the cells with or without mouse primary astrocytes (mAst) for functional characterizations (Fig. 1A and D). We used mAst instead of human astrocytes to distinguish the source of CLU since it is expressed by both cell types. We first tested whether the SNPs had differential allelic binding to ISL2 and DRGX as predicted (Fig. 1C), using chromatin immunoprecipitation qPCR (ChIP-qPCR) (Fig. 1E). We compared the TF binding differences within the 120 bp SNP-flanking region between the two isogenic pairs in iGlut pure cultures. We found that the two alleles of rs1532278 showed significantly differential chromatin accessibility to ISL2 (Fig. 1F), but not to *DRGX* (Fig. S1E), with allele C only retaining 20-30% of ISL2 binding capacity of allele T (Fig. 1F). To further validate whether ISL2-binding regulated CLU expression, we knocked down (KD) ISL2

⁽See figure on next page.)

Fig. 1 AD risk SNP rs1532278 shows allele-specific open chromatin (ASoC) and cis-regulates CLU expression in iGlut. A Schematic research design. ATAC-seg was performed to identify OCRs and GWAS risk SNPs that showed ASoC in iPSC Glutaminergic (iGlut), GABAergic (iGABA), and dopaminergic (iDA) neurons, and microglia (iMG) and astrocytes (iAst), which is followed by transcription factor (TF) binding prediction to confirm putative functional AD risk SNP, CRIPSR-cas9 SNP editing, and functional assays in cells. B ASoC mapping identifies intronic rs1532278 as a putatively functional SNP among several other GWAS risk SNPs equivalently associated with AD at the CLU locus. Note that rs1532278 is the only SNP within the neuronal OCR with a stronger OCR peak in iGlut. C T and C alleles of rs1532278 show differential allelic ATAC-seq reads (i.e., ASoC) in iGlut. The bottom panel shows the two most conserved TF binding motifs at the SNP site. **D** Schematic CLU gene structure near rs1532278 (upper panel) and a diagram showing CRISPR-Cas9 editing of rs1532278 in two iPSC lines (CD05 and CD07; T/C) to covert T/C lines to isogenic T/T and C/C lines (middle panel, representative Sanger sequencing result from CD07 line). Representative images of iGlut (CD07 line) of all three genotypes are also shown (bottom panel); MAP2 and HuNu (human nuclear antigen) staining shows the morphology of iGlut and neuron purity in iGlut-mAst co-cultures. E-F ISL2 ChIP-qPCR on day 30 iGlut-mAst co-cultures. n = 3 biological replicates from one clone per line of one independent differentiation. G-H ISL2 siRNA knockdown in day- 30 pure iGlut (T/T) cultures. Samples of 72 h post-siRNA transfection were used for gPCR. n = 3 biological replicates from one clone per line of one independent differentiation. I Neuronal CLU mRNA level in isogenic iGlut-mAst co-cultures of different genotype of rs1532278 (human-specific CLU qPCR assay was used). n = 6 biological replicates per group (2–3 clones per line and 2–3 biological replicates for each clone) from two independent differentiations of each line. J Secreted CLU (sCLU) detected by ELISA from the supernatant of iGlut-mAst co-cultures. n = 4 biological replicates per group (2 clones per line and 2 biological replicates per clone) from two independent differentiations of each line. K-L Immunofluorescence staining of CLU in day 25 pure iGlut cultures. n = 6–7 coverslips per group (In total: 2 clones per line and 3–4 coverslips for each clone and 3–5 images per coverslip; shown are example images of CD05) from two independent differentiations of each line. Data, mean ± SEM. * p < 0.05, ** p < 0.01, *** p < 0.001, and **** p < 0.0001. Scale bars are indicated in each image



Fig. 1 (See legend on previous page.)

in iGlut neurons in both alleles (Fig. 1Gand S1 F). We found that ~50% KD of *ISL2* yielded ~20% downregulation of *CLU* only in T/T allele carriers (Fig. 1H) and had no effect on *C/C* carriers (Fig. S1G). These data indicate that the AD protective allele of rs1532278 has stronger chromatin accessibility to *ISL2* binding, thereby likely increasing *CLU* expression.

We next examined whether rs1532278 could indeed alter *CLU* expression. Culturing iGlut neurons with or without mAst for 30 days, we found that *CLU* mRNA expression was about 40–50% lower in the *C/C* neurons versus the T/T neurons (Fig. 1Iand S1H), and the neuronal CLU changes did not affect mouse astrocytic *CLU* expression in the co-culture system (Fig. S1 J). Using three sets of qPCR primers near the SNP site that covered all major transcript isoforms of CLU, we further confirmed that rs1532278 similarly affected these major CLU isoforms (Fig. S1 K and L). Since CLU is predominantly secreted (> 90%) [58], we further measured the levels of the human neuron-secreted CLU protein (sCLU) in the iGlut/mAst co-cultures using an ELISA. Consistent with the allelic effect of rs1532278 on CLU mRNA levels, we found that the allele T was associated with higher levels of sCLU in the media (Fig. 1Jand S1I). Although sCLU is the predominant form, we also detected intracellular CLU in iGlut by immunostaining, with the T allele being associated with higher expression (Fig. 1K-Land S1 N), although to a lesser extent than the mRNA level or sCLU levels (Fig. 1I and J). Finally, since rs1532278 is ~25 kb upstream of Scavenger Receptor Class A Member 3 (SCARA3) (Fig. S1 K), a gene with a plausible role in AD [59], we also investigated whether rs1532278 could cis-regulate SCARA3 expression in iGlut. However, we found no significant difference in mRNA expression between the two groups of isogenic neurons with the alleles T and C (Fig. S1M), suggesting that the functional effect of rs1532278 is restricted to CLU. Altogether, these data show that rs1532278 exerts a *cis*-regulatory effect on *CLU* expression, and the protective T allele is associated with elevated CLU expression.

Astrocytes exhibit a relatively high expression of CLU [22, 23], but our ATAC-seq data did not show obvious OCRs or ASoC at the rs1532278 site (Fig. 1Band Table S1). We thus tested CLU's expression in our iAst. We differentiated the CRISPR-engineered isogenic pair of iPSCs carrying T/T or C/C alleles (Fig. 1D) into iAst [45] to compare the allelic effect of rs1532278 on *CLU* expression (Fig. S2D and E). Consistent with our ASoC data, we found no difference in *CLU* expression between these isogenic pairs, confirming that rs1532278 is not a functional SNP in astrocytes in this iPSC experimental system (Fig. S2E). Altogether, these findings show that the AD

risk SNP rs1532278 is a neuronal functional ASoC SNP at the *CLU* locus, and the protective T allele is associated with higher *CLU* expression in excitatory neurons.

iGlut carrying the AD protective allele of rs1532278 are more mature and active

A recent study showed that astrocytic CLU can promote excitatory synaptic transmission [29]. Given our observed neuronal effect of the AD protective allele rs1532278 on CLU expression in iGlut, we investigated whether the AD protective allele of CLU and its associated higher CLU expression have functional effects on neuronal properties. We first immunostained neurons from our iGlut/ mAst co-cultures (day- 30) using antibodies against MAP2 (microtubular associated protein 2, a neuronal cytoskeletal protein), SYP (synaptophysin, a presynaptic marker), and PSD95 (also known as DLG4, a postsynaptic maker) to analyze the impacts of T/T (protective) versus C/C (risk) alleles on dendritic branching and synapse morphology (Fig. 2A-E,Fig. S3 A). We found that iGlut with the T/T alleles had more dendritic branches (Fig. 2A and B). We also found significantly higher SYP puncta density (Fig. 2C and D) in T/T iGlut compared with C/C iGlut, but no differences for PSD95. The immunofluorescence staining results for SYP and PSD95 were further confirmed by Western blot (WB) analysis (Fig. 2E and F). The iGlut monocultures without mAst gave similar results (Fig. S3B and C). The neuronal morphometric differences between T/T and C/C iGlut suggested T/T iGlut may exhibit an augmented presynaptic function.

Next, we performed calcium imaging and multielectrode array (MEA) analyses for iGlut/mAst cocultures to examine the effect of the AD-protective CLU allele on neuronal electrophysiological properties. We observed a higher neuron calcium transmission (or firing frequency) for the T/T versus the C/C iGlut (Fig. 2H and G). Concordantly, we found that neurons with T/T alleles showed an elevated weighted mean

⁽See figure on next page.)

Fig. 2 iGlut carrying the AD protective allele of rs1532278 at the CLU locus are more morphologically complex and functionally active. **A** MAP2 staining for analyzing iGlut dendritic branches in day- 30 iGlut-mAst co-cultures. **B** Quantification of total branch length per cell (by Cellprofiler). n = 8-9 coverslips per group (2 clones per line, 4–5 coverslips per clone, and 3–5 images per coverslip) from two independent differentiations of each line. **C** MAP2, SYP, and PSD- 95 staining for assaying synaptic puncta. **D** Quantification of SYP and PSD- 95 puncta density per 10 µm. n = 15-17 neurons per group (1–2 neuron per coverslips, 5–6 coverslips per clone, and 2 clones per line) from two independent differentiations of each line. **E**–**F** Western blotting for measuring PSD- 95 and SYP levels in day- 30 iGlut-mAst co-cultures. n = 4 biological replicates per group (2 clones per line and 2 biological replicates per clone) from two independent differentiations of each line. **E**–**F** Western blotting for measuring PSD- 95 and SYP levels in day- 30 iGlut-mAst co-cultures. n = 4 biological replicates per group (2 clones per line and 2 biological replicates per clone) from two independent differentiations of each line. **G** Calcium imaging shows high firing frequency with T/T iGlut in co-cultures. Left panel, heatmaps of neuron firing peaks in calcium imaging assay during 120 s of recording (representative image from 1,000 cells of CD05); Right panels, quantification of neuron firing frequency. The number of neurons assayed is shown in the violin plot (2–3 clones per line with 6 biological replicates per clone) from two independent differentiations of each line). **H** Representative roster blot of MEA from the CD07 line (a segment of 200 s is shown). **I** Weighted mean firing rate in MEA. n = 9-12 biological replicates per group (2–3 clones per line and 3–4 biological replicates per clone) from two independent differentiations of each line. Violin plots are shown with data median and interquartile range or bo



Fig. 2 (See legend on previous page.)

calcium spike rate and more frequent network bursts in MEA (Fig. 2I,Fig. S3D). We also observed stronger neuronal network synchronicity in MEA for T/T alleles (Fig. S3E). These findings suggest that the AD protective allele of *CLU* is associated with more neuronal excitation. Given that neuronal hypoactivation is a notable characteristic of late-stage AD [60], our findings suggested that the AD protective allele of *CLU* may confer resilience to AD by promoting synaptic maturity and neuronal activity.

Neuronal CLU mediates the effect of the AD protective allele of rs1532278 on neuronal excitability

To validate whether the enhanced neural excitability in iGlut carrying the AD protective allele of rs1532278 was due to the increased expression of CLU, we used CRISPR/Cas9 to introduce a~ 200 bp homologous deletion in the OCR flanking rs1532278 without disrupting the flanking exons in both iPSC lines (Fig. 3A, Fig. S4 A). We then differentiated these OCR-deleted (OCRdel) iPSCs into iGlut and cultured them with or without mAst. We found that the homozygous OCR deletion significantly reduced both CLU mRNA and sCLU protein levels compared to the non-edited T/C lines, regardless of the presence of mAst in the culture (Fig. 3B,Fig. S4B-D). Consistent with reduced CLU expression being detrimental to neuron physiology, SYP levels were reduced in the OCR-del iGlut (Fig. 3C and D,Fig. S4E and F). Neuronal excitability was also impaired in iGlut carrying the OCR-del, as evidenced by decreased neuron calcium spike (firing) frequency in the calcium imaging experiment (Fig. 3E) and reduced weighted mean firing rate (Fig. 3F), number of bursts, and synchronicity in the MEA experiment (Fig. S4G and H). These results supported that the OCR flanking the ASoC SNP rs1532278 contained an enhancer sequence (Fig. 1B) that modulated CLU expression, thereby altering neuronal excitability.

To further confirm that neuronal excitability was modulated by CLU, we infected neurons with AAV-*CLU* (human) virus to rescue *CLU* expression in iGlut derived from an iPSC line (CD07) homozygous for the rs1532278-flanking OCR-del. We examined SYP levels using WB and assayed neuronal excitability using calcium imaging and MEA experiments in AAV-infected neurons co-cultured with mAst (Fig. 3G-J,Fig. S4I-K). We found that restoration of *CLU* expression rescued SYP levels (Fig. 3H) and neuronal excitability in iGlut infected with AAV-*CLU*, as evidenced by the increased firing frequency in calcium imaging, higher weighted mean firing rate, more frequent network bursts, and better synchronicity compared to the control (AAV-eGFP) group (Fig. 3I-J,Fig. S4 K). Hence, our data indicated that neuronal CLU mediated the effect of the AD protective allele of rs1532278 on neuronal excitability.

Transcriptomic analysis supports an enhanced neuronal excitation and altered neuron-astrocytic lipid metabolism by the AD protective allele of rs1532278

To gain insights into the underlying molecular mechanisms that functionally link the AD protective allele T of rs1532278 with neuronal excitability, we conducted RNA-seq of iGlut/mAst co-cultures of the isogenic CRISPR-edited iPSC lines homozygous for the AD protective allele T vs. risk allele C. We bioinformatically separated the RNA-seq reads of iGlut (human origin) and mAst (mouse origin) using the Salmon program (Fig. 4A) [61]. To confirm the validity of the human iGlut RNAseq reads, we evaluated the transcriptomic similarity of the iGlut to that from our previous scRNA-seq data of iGlut from the same iPSC lines [36] and the scRNA-seq data of different cell types of postmortem brain [23]. We found a moderate to strong positive correlation between the expression of our co-cultured iGlut and of previous scRNA-seq datasets (r = 0.49-0.64), supporting the validity of our bioinformatically separated RNA-seq reads of iGlut and mAst (Fig. S5 A and Table S3). Furthermore, principal components analysis (PCA) of all the iGlut (n = 40,162 transcripts) and mAst (n = 32,476 transcripts) samples with different alleles of rs1532278 showed that RNA-seq samples were clearly grouped by rs1532278 genotypes (Fig. S5B), suggesting a pronounced transcriptional difference in iGlut homozygous for the AD protective allele T vs. risk allele C of rs1532278. Interestingly, mAst also exhibited transcriptomic differences based

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Fig. 3 Neuronal CLU mediates the AD protective allele effect of rs1532278 on neuron excitability. **A** Schematic diagram of the rs1532278-flanking OCR deletion by CRISPR-Cas9. **B** *CLU* mRNA level (n = 6 biological replicates per group, 2 clones per line, and 3 biological replicates for each clone from two independent differentiations of each line) and sCLU level (n = 4 biological replicates per group, 2 clones per line, and 2 biological replicates for each clone from two independent differentiations of each line) in day- 30 iGlut-mAst co-culture. **C-D** Western blotting detected SYP levels in day- 30 iGlut-mAst co-cultures. n = 4 biological replicates per group (2 clones per line and 2 biological replicates for each clone) from two independent differentiations of each line) in day- 30 iGlut-mAst co-cultures. n = 4 biological replicates per group (2 clones per line and 2 biological replicates for each clone) from two independent differentiations of each line. **E** Fire frequency analysis of calcium imaging assay. The indicated number of neurons is from 2 clones of each line. **G** The schematic diagram illustrates CLU overexpression in iGlut. AAV-hCLU, hCLU-Flag cDNA was inserted into the vector to replace the eGFP sequence in AAV-eGFP. AAV Virus infected neurons on day 8, followed by replating neurons with mAst on day 12. For the calcium imaging assay, the jRCaMP1b virus was introduced on day 9. **H** Western blotting for SYP in day- 30 iGlut-mAst co-cultures. n = 3 biological replicates per group (all from one clone of the CD07 line) from one independent differentiation. **I** Calcium transmission frequency. The number of neurons from 5 biological replicates per group from one clone of line CD07 from two independent differentiation. **Y** weighted mean firing rate in MEA. n = 3 biological replicates per group from one clone of line CD07 in from one independent differentiation. **Y** weighted mean firing rate in MEA. n = 3 biological replicates per group from one clone of line CD07 in from one independent



on their exposure to T/T iGlut or C/C iGlut, suggesting allele-specific neuron-glia interactions.

We next analyzed for differential expression (DE) of genes in iGlut and mAst between the isogenic pairs of cocultures (T/T vs. C/C) (Fig. 4B,Tables S4 and 5). For iGlut homozygous for the AD protective allele T, we identified 1,456 upregulated and 741 downregulated genes (FDR <0.05) (Fig. 4B). Wiki pathway analysis [62] of the topranking DE genes (P < 0.001) further showed that 49 gene pathways were significantly enriched in the upregulated gene sets (Fig. 4C,Table S4), and 14 in the downregulated gene sets (adjusted P value < 0.05) (Table S5).

The synaptic vesicle pathway was among those upregulated, including the presynaptic gene SYP whose expression in T/T iGlut was relatively higher than that of C/C as evidenced by immunofluorescence staining and WB analysis (Fig. 2C-F). In addition, we also found synapse, axon and neuron projection, and development related pathways enriched in both up- and downregulated genes (Fig. 4E,Fig. S5D, Tables S10 and S11). Unexpectedly, we found that the upregulated genes were enriched for AD related pathways including the APP secretase genes, PSEN1 and BACE1 (Table S6), which prompted us to measure the secreted A β levels, including A β (1–40) and A β (1–42), in our iGlut/mAst co-cultures by ELISA. We found increased levels of both $A\beta$ peptides in the culture media of T/T iGlut/mAst compared C/C iGlut/mAst cocultures (Fig. S5 C), which may be a result of an enhanced neuronal activity as previously reported [63, 64]. These results provided mechanistic insight into how the AD protective allele T of CLU increases neuronal excitation (Fig. 2G-I).

Interestingly, we found that the most enriched gene pathways are related to fatty acid (FA) and cholesterol biosynthesis (Fig. 4C and D, Table S6). The notable upregulated genes in T/T neurons included *HMGCR* (*3-Hydroxy- 3-Methylglutaryl-CoA Reductase*; 3rd most upregulated; $\log_2FC = 0.89$, FDR = 1.20 × 10⁻¹⁰) that encodes a rate-limiting enzyme for cholesterol synthesis, and *SCD* (24 th most upregulated; $\log_2FC = 0.70$, FDR = 8.13 × 10⁻⁸) that encodes *Stearoyl-CoA Desaturase* that is involved in FA biosynthesis. Moreover, energy metabolism pathways such as metabolic reprogramming, glycolysis, gluconeogenesis, and oxidative phosphorylation were among the top-ranked enriched Wiki pathways (Table S6). Gene Oncology (GO) analysis showed consistent results with Wiki pathway analysis: the top 25 enriched GO terms (biological processes) were strongly enriched for genes involved in lipid/cholesterol synthesis (Fig. 4Eand Table S10).

Although enhanced neuronal excitability tends to require more energy consumption [65], neurons cannot sufficiently catabolize FAs as an energy source. Hence, neurons typically transfer FAs to surrounding astrocytes for catabolism, providing energy to neurons [49, 66, 67]. We thus examined whether the elevated neuronal CLU in T/T iGlut might have transcriptional effects on lipid metabolism in the co-cultured mAst. Our DE analysis identified a total of 1,167 upregulated and 596 downregulated genes in mAst (FDR < 0.05) (Fig. 4B). Wiki pathway analysis of the top-ranking DE genes (p < 0.001) further identified 31 significant pathways enriched in the upregulated gene sets (Fig. 4F,Table S8), and 29 in the downregulated gene sets in mAst (adjusted p value < 0.05) (Table S9). Interestingly, the most enriched Wiki gene pathways, which were also supported by GO enrichment analysis, were those related to energy metabolism (Fig. 4F and G,Tables S8 and S12), e.g., FAs β-oxidation/degradation, oxidative stress, peroxisome proliferator-activated receptor (PPAR) signaling pathways, and glycolysis (Fig. 4F,Tables S8 and S12). FAs β -oxidation is recognized as a primary source of reactive oxygen species (ROS) and is commonly linked to oxidative stress [68], and a homeostatic balance of cellular ROS level has been considered essential for maintaining normal cellular physiological function [69]. It is noteworthy that PPAR signaling pathways play a crucial role in systemic cell metabolism and energy homeostasis [70], and one of the proteins in this pathway, ACSBG1 (Acyl-CoA Synthetase Bubblegum Family Member 1), enables long-chain FA-CoA ligase activity and very long-chain FA (VLCFA)-CoA ligase activity (MGI:2,385,656) and ACSBG1 was the secondmost upregulated (log₂FC = 0.46, FDR = 3.39×10^{-8}) gene in mAst co-cultured with T/T iGlut (Fig. 4B).

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Fig. 4 Transcriptomic analysis of iGlut-mAst co-cultures highlights the involvement of lipid metabolism. **A** Schematic diagram for RNA-seq data processing pipeline to separate sequencing reads of human and mouse origins. (*n* = 9 biological replicates per group from two independent differentiations of each line, 2–3 biological replicates per clone, 2 clones per line, and 2 lines in total). **B** Volcano plots show DE genes in iGlut (left) and the co-cultured mAst (right) with highlighted genes. Log₂FC was based on a comparison of T/T vs. C/C cultures. **C** Wiki pathway analysis of upregulated gene sets in iGlut. **D** The Cnet plot depicts the enriched fatty-acid biosynthesis pathways and the upregulated genes. **E** GO-term (biological process) enrichment in significantly upregulated gene sets in iGlut. Red star, lipid biosynthesis pathways; black star, energy metabolism pathways; blue star, neuron-morphology related pathway. **F** Wiki pathway analysis of the significantly upregulated gene sets in mAst. **G** GO-term (biological process) enrichment in significantly upregulated gene sets in mAst. Red star, fatty acids metabolism-related pathways; black star, metabolism-related pathways



Fig. 4 (See legend on previous page.)

Peroxisomes are indeed a source of ROS in glia and provide energy to neurons through β -oxidation of VLCFA [71, 72]. Independent from, but positively coupled with FAs β -oxidation in astrocytes, glycolysis also provides energy to neurons [73–75]. It is thus conceivable that these processes in mAst are protective by providing more energy reserve for neuronal function. Taken together, our transcriptomic analyses of the iGlut/mAst co-cultures provide not only mechanistic support for the effects of the AD protective allele of rs1532278 at the *CLU* locus on enhanced neuron excitability, but also unravel potential roles of neuron-glia lipid transfer and metabolism in mediating the effects of this allele.

Neuronal CLU augments neuron-glia lipid transfer and reduces neural LD accumulation

Following the interesting lead of the transcriptional effects of the AD protective allele on gene pathways related to lipid synthesis and metabolism in iGlut/mAst co-cultures, we hypothesized that the T/T iGlut and its associated increases in neuronal CLU production may promote LD formation in neurons and/or mAst to serve as energy storage [76, 77]. We first stained T/T or C/CiGlut for LDs using the neutral lipid dye LipidTox in the absence of mAst. Despite the upregulated lipids and cholesterol synthesis genes in T/T iGlut (Fig. 4C-E), we surprisingly observed that iGlut with this AD protective allele and higher CLU expression had fewer LDs compared with AD risk alleles C/C (Fig. 5A and B). To further validate this observation, we overexpressed *CLU* using AAV in iGlut (C/C at rs1532278). We found that similar to T/T iGlut which have high expression of CLU compared to C/C iGlut, the AAV-CLU group also showed reduced LDs (Fig. 5C and D).

CLU encodes an apolipoprotein, APOJ, which may have a similar lipid transferring functions as APOE [49, 78]. Previous studies have shown APOE function to directly impact the transfer of lipids from neurons to astrocytes where the lipids are incorporated into glial LDs [10, 49, 67]. Hence, we reasoned that more CLU expression from T/T iGlut may promote this process of lipid transfer from neurons to glia. We conducted a lipid transfer assay [10, 48] by first pre-labeling iGlut with a fluorescently labeled FA probe (Red C12) and then co-culturing these Red C12-loaded iGlut with mAst in the same well without direct physical neural-glia contact (Fig. 5E). This system allows the neuronally sourced Red C12 to be transferred to mAst upon the induction of stress where they are incorporated into LDs [10, 49, 79]. We observed a significant increase of the Red C12 positive LDs in mAst cocultured with T/T iGlut compared to mAst co-cultured with C/C iGlut (Fig. 5F and G). We also further validated that overexpressed CLU facilitated Red C12 transfer from iGlut to mAst (Fig. 5H-I). Culturing with T/T iGlut did not affect Apoe expression in mAst (Fig. 4B), suggesting that the increase of the Red C12 in mAst was unlikely attributed to the effect of APOE and likely to be partly explained by the elevated neuronal CLU expression mediated by the AD protective allele. These data may explain the lack of neuronal LD in the T/T iGlut (Fig. 5A and B) as more lipids may have been expelled from these iGlut due to high CLU expression, leading to very few neuronal LDs but many astrocytic LDs. Notably, neurons have a limited ability to catabolize FAs, and the LD accumulation in neurons is usually considered detrimental to neuronal function [49, 66]. These data indicate a CLUmediated neural protective mechanism of the T allele of the AD associated SNP rs1532278.

To corroborate that neuronal CLU can associate with lipid particles and carry lipids from neurons to astrocytes, we first infected iGlut with AAV to overexpress Flag-tagged CLU and co-cultured these AAV-infected iGlut with mAst with (Fig. 5J) and without (Fig. S7 A) physical contact. We then stained for LDs with the neutral lipid dye BODIPY (BD493/503) in mAst (GFAP +) to examine the co-localization of LDs with neuronally

Fig. 5 Neuronal CLU facilitates neuron-to-astrocyte lipid transfer. **A-B** Lipid droplet (LD) staining by LipidTox in day 25 iGlut pure cultures (T/T vs. C/C). n = 6-7 coverslips per group (2 clones per line, 3–4 coverslips for each clone with 4–5 images per coverslip) from two independent differentiations of each line. Representative images in (A) from CD07 line. **C-D** LipidTox staining of Day 25 iGlut pure cultures after AAV-CLU overexpression. n = 5-6 coverslips per group (one clone from CD05 with genotype C/C, and 4–5 images of each coverslip) from two independent differentiations. Representative images in (C) from CD07 line. **E** The schematic diagram for the Red C12 lipid transfer assay. **F-G** Red C12 and LDs (BD493/503) signals in mAst. n = 7-8 coverslips per group (mAst co-cultured with 2 clones per line, 3–5 coverslips for each clone with 4–6 images from each coverslip) from two independent differentiations of each line. Representative images in (F) from CD05 line. **H-I** A Red C12 transfer assay was performed in the CLU overexpression system. iGlut were first infected with either AAV-eGFP or AAV-hCLU, as in (C). Red C12 was applied to the iGlut on Day 30, and its transfer to mAst was analyzed using the same procedures outlined in (E). n = 6 coverslips per group (mAst co-cultured with 4–5 images from each coverslip) from two independent differentiations. **J** The schematic diagram for overexpression of CLU tagged with Flag. **K** Co-localization of neuron secreted and AAV-derived CLU (Flag +) and LDs (BD493/503 +) in mAst from day- 30 iGlut-mAst cocultures after AAV-hCLU infection (same experimental approach as Fig. 3G). Representative images from CD07 line. All statistical graphs depict mean ± SEM. Scale bars are indicated in corresponding image. * p < 0.05, ** p < 0.01, **** p < 0.001, **** p < 0.001

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sourced CLU. We found that the Flag-tagged neuronal CLU was able to enter mAst and co-localize with BD493/503 positive LDs across all co-culture conditions (Fig. 5K,Fig. S7 A-E), regardless the co-culture pattern of iGlut-mAst. These results support a previously unappreciated role of neural CLU in neuron-to-glia lipid transfer. Further, these data are consistent with the idea that reducing neural LD accumulation is neuroprotective and that higher CLU expression associated the protective rs1532278 allele is promoting neuron-glia interactions in the context of LD accumulation.

Neuronal CLU promotes LD formation and energy preservation in mAst

We next examined whether total LD amount was altered in mAst as a result of the increased neuronal CLU when co-cultured with iGlut carrying the AD protective T/T allele (Fig. 6Aand S8 A). We first quantified the relative LD distributions in iGlut versus mAst in the co-cultures. We initially stained the co-cultured cells with LipidTox and identified iGlut versus mAst using the neuronal marker MAP2 (Fig. 6Aand S8 A). We found that while iGlut occupied $\sim 40\%$ – 50% of the immunostaining region (MAP2 volume/[MAP2 + GFAP volumes]), neural LDs only accounted for $\sim 5\%$ – 10% of the total LDs (Fig. 6A). The vast majority of LDs were found in mAst $(\sim 90\% - 95\%)$ (Fig. 6A), consistent with neural-to-glia lipid transfer being augmented by neuronal CLU (Fig. 5E-G) and with previous reports in which LDs in vivo, or in the presence of glial cells, are predominantly present in glia [67, 80-82]. Next, we compared the allelic effect of the AD risk SNP rs1532278 on LDs in iGlut/mAst cocultures. We found that T/T iGlut caused a significant increase in total LDs, predominantly within the mAst, compared to C/C iGlut (Fig. 6B and C). This finding was further confirmed when staining with another neutral lipid dye, BODIPY (BD493/503) (Fig. S8B). Moreover, CLU overexpression by AAV in iGlut, followed by co-culture with mAst, also showed an elevation of LDs within mAst (Fig. 6D and E), demonstrating that the increase in total astrocytic LDs was due to a higher expression of CLU.

LD-accumulated astrocytes show increased energy production and ROS level and reduced glutamate uptake

As a lipid storage depot, LDs can protect the cell from lipotoxicity and provide energy support [83, 84]. In the brain, Neurons do not catabolize FAs well and often transfer them to surrounding astrocytes under varying conditions, where FAs are stored as LDs and later metabolized to replenish the brain's energy supply playing a physiological role [49, 74-77]. As we observed increased LD formation in mAst co-cultured with iGlut carrying the protective T allele or overexpressing CLU (Fig. 6B-E) and our transcriptomic analyses identified enriched gene pathways related to FAs β-oxidation in the T/T iGlut (Fig. 4F and G), we next examined whether the elevated LD level in mAst co-cultured with T/T iGlut was accompanied with increased FAs β -oxidation. FAs β -oxidation is known to produce ketone bodies (KB) as a neuronal energy source while generating ROS [85] (Fig. 7A). We next employed a commonly used transwell system [10, 74, 75] to examine KB specifically released from mAst, where we co-cultured iGlut homozygous for T or C alleles with mAst for 14 days. Subsequently, we took out the mAst to detect KB levels (β-hydroxybutyrate) after 6 and 24 h in fresh medium (Fig. 7B). We found mAst co-cultured with T/T iGlut exhibited higher KB levels at both time points, suggesting more FAs were catabolized to ketone to likely support the higher energy demands of T/T iGlut (Fig. 7C). Moreover, because lactate is a well-established neuronal energy substrate derived from glycolysis that is coupled with FA β -oxidation in astrocytes [72, 74, 75] and because it was transcriptionally enriched in mAst cocultured with T/T iGlut (Fig. 4F and G), we also assayed the lactate release from the mAst in the same transwell system (Fig. 7B) and observed an increase in lactate levels in mAst co-cultured with T/T iGlut (Fig. 7D). Taken together, these results suggest the increased expression of neural CLU caused by the T allele along with the higher neuronal activity of T/T iGlut leads to elevated levels of

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Fig. 6 The AD protective allele of rs1532278 at the CLU locus in iGlut induces LD accumulation in co-cultured mAst. **A** LD staining in iGlut-mAst co-cultures by LipidTox (Example images of C/C CD07 co-cultures). LDs were categorized by neuronal (MAP2 +) or astrocytic (i.e., not neuronal) and quantification was shown in the right panels. Neuronal LDs, LDs in iGlut relative to total LD volume. The proportion of the image area occupied by iGlut was calculated as MAP2 volume divided by the total of GFAP and MAP2 volume. n = 173 images from LipidTox staining in all iGlut-mAst co-cultures (Fig. 6B and C, Fig. 58 C and S8D). **B-C** LDs staining and quantification by LipidTox in day- 30 iGlut-mAst co-cultures. n = 10-12 coverslips per group (2 clones per line, 4–6 coverslips for each clone with 3–5 images per coverslip, and shown are example images of CD07) from 2–3 independent differentiations of each line. **D-E** LDs level (LipidTox staining) in mAst in day- 30 iGlut-mAst co-culture after CLU overexpression. LDs, LipidTox +; neurons, MAP2 +; astrocytes, GFAP +. n = 6 coverslips per group (one clone of CD05 C/C line, and 6 coverslips per group with 5–6 images from each coverslip) from two independent differentiations. Violin plots are shown with data median and interquartile range. Other data, mean ±SEM. Scale bars are indicated in corresponding image. * p < 0.05, ** p < 0.01, *** p < 0.001



Fig. 6 (See legend on previous page.)

astrocytic LDs, likely serving as energy storage and protecting against neuronal oxidative damage [67, 79].

Since FA β -oxidation also generates ROS (Fig. 7A), we employed CellROX staining to directly visualize ROS levels within iGlut/mAst co-cultures and used neuronal MAP2 staining to distinguish neuronal from astrocytic CellROX signals. We observed that almost all CellROX signals were detected in mAst but not in iGlut (Fig. 7E and F,Fig. S9 A and B), indicating a much lower neuronal ROS level when co-cultured with mAst. Secondly, we found that mAst co-cultured with T/T iGlut gave rise to significantly higher CellROX signals than when cultured with isogenic C/C iGlut (Fig. 7E and F,Fig. S9 A and B). Although the AD protective allele of rs1532278 at the CLU locus may promote neuronal excitability independently from facilitating the astrocytic LD formation, it is also plausible that these two processes are intrinsically coupled. In fact, astrocytes are also known to play an important role in maintaining glutamate homeostasis and coordinating neuronal excitation in the brain [86], while ROS have been shown to reduce glutamate uptake in AD fibroblasts [87]. We thus hypothesized that the neuronal CLU-induced LD accumulation and ROS production in the co-cultured mAst may reduce glutamate uptake by astrocytes and thus promote neuron excitability. To test this hypothesis, we employed a commonly used transwell system [10], where we co-cultured iGlut homozygous for the T or C alleles with mAst for 14 days. Subsequently, we removed the inserts with mAst to conduct a glutamate uptake assay (Fig. 7G). We found that T/T iGlut/ mAst co-cultures had a ~ 20% higher amount of residual glutamate in the culture media compared to C/C iGlut/ mAst co-cultures (Fig. 7G). To determine whether the

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reduction of glutamate uptake of mAst was attributed to higher ROS level in the mAst co-cultured with T/T iGlut, we applied an antioxidant, NACA (N-acetylcysteine amide), to reduce ROS in the iGlut/mAst transwell cocultures and assayed the glutamate uptake. We found that ROS inhibition significantly enhanced glutamate uptake of mAst co-cultured with T/T iGlut and to a lesser extent for mAst co-cultured with C/C iGlut (Fig. 7H). These results suggest that the glutamate uptake function of mAst is reduced through LD-enhanced ROS production when co-cultured with iGlut carrying the AD protective allele, possibly to sustain neuron excitability.

To further determine the role of CLU in mediating glutamate uptake, we carried out a CLU-immunodepletion assay. We collected supernatant from day- 30 iGlut and immunodepleted CLU protein/lipoparticles from the supernatant of T/T or C/C iGlut (Fig. 7I,Fig. S9 C). Subsequently, we reconstituted conditioned medium (CM) by adding fresh DMEM full medium, which is needed for maintaining mAst, into the immunodepleted supernatant. We then measured glutamate levels in mAst cultured with this CLU-depleted CM for seven days vs. mAst grown in non-CLU depleted CM (Fig. 7I). We observed that in normal CM, mAst treated with CM of T/T iGlut exhibited higher residual glutamate compared to those treated with C/C iGlut CM (i.e., T/T showed less glutamate uptake). However, with CLU depletion (anti-Clu), the glutamate uptake function of mAst co-cultured with T/T iGlut was at a similar level compared to the mAst co-cultured with C/C iGlut (Fig. 7I). These results indicate that sCLU produced from iGlut, which facilitates neuron-to-glia lipid transfer, is a key player in mediating the protective allelic effect of CLU on the glutamate

Fig. 7 Astrocytes co-cultured with iGlut carrying the AD protective allele show increased energy production and ROS level and reduced glutamate uptake. A The schematic diagram depicts the FA β oxidation process of astrocytes, where they produce KB (ketone body) and ROS; the glycolysis is further facilitated by ROS and generates Lac (lactate); both KB and Lac are further transferred to surrounding neurons as the energy source. B the schematic diagram depicts the transwell co-culture system to measure KB and Lac release from mAst. C-D The amount of ketone body (β-hydroxybutyrate) and Lactate released from mAst at different time points in the transwell co-culture system. n = 6 biological replicates per group (2 clones per line and 3 biological replicates for each clone) from two independent differentiations of each line. E-F CellROX staining in iGlut-mAst co-cultures. n = 5-6 coverslips per group (2 clones per line, 2-3 coverslips for each clone with 2-5 images per coverslip, shown are example images of CD07) from two independent differentiations of each line. G Neural allelic effect on mAst glutamate uptake diagram showing the transwell coculture system for glutamate uptake assay in mAst (upper panel) and the quantification (down panel). n = 6 biological replicates per group (2 clones per line, 3 biological replicates for each clone) from two independent differentiations of each line. H The schematic diagram (upper panel) shows the test for whether ROS inhibition can affect glutamate uptake in mAst in the transwell co-culture system; quantification of glutamate uptake assay after ROS inhibition in mAst. n = 6 biological replicates per group (2 clones per line, 3 biological replicates for each clone) from two independent differentiations of each line. I CLU immunodepletion assay confirms the role of CLU in glutamate uptake by mAst. Up panel, the diagram of the CLU immunodepletion assay; bottom-left panel, the culturing and assay timeline; bottom-right panel, the quantification of residual glutamate in glutamate uptake assay. n = 7 biological replicates per group from two independent assays (the supernatant was all from one clone in CD07 line). Note the similar levels of residual glutamate of the C/C group with CLU-depletion (C/C; IgG) and the T/T group upon CLU-depletion (T/T; Anti-CLU). J A graphic model of how the AD protective allele promotes neural CLU expression, subsequently facilitating neuron-glia lipid transfer and fine-tuning mAst glutamate uptake, thereby maintaining neuronal excitability. All statistical graphs depict mean \pm SEM. Scale bars are indicated in corresponding image. * p < 0.05, ** p < 0.01, *** p < 0.001, and **** p < 0.0001



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uptake function by mAst. Taken together, these results suggest that elevated level of LDs coupled with ROS production in astrocytes co-cultured with T/T iGlut may promote neuronal excitability by fine tuning astrocytic glutamate uptake and/or export (Fig. 7J).

Discussion

Both APOE and CLU encode apolipoproteins and are associated with AD risk. However, compared to APOE, the functional connection of CLU with AD pathogenesis has been heretofore obscure. The challenge is determining the disease causal variants among multiple AD risk SNPs at the *CLU* locus that are in the noncoding portion of the genome as opposed to the APOE4 risk allele which is a protein-coding SNP. Here, leveraging a systematic mapping for functional noncoding AD risk variants that alter chromatin accessibility (i.e., showing ASoC) in iPSC-derived neurons and glial cells [37] (Table S1), we identified rs1582273 (T/C) as a neuronal functional AD-associated variant. Further CRISPR/Cas9 editing of rs1582273 in iPSC-derived neurons showed that the AD protective allele T of rs1582273 specifically increased CLU expression in excitatory neurons (iGlut). We also found that elevated neuronal CLU helps promote neuronal excitability, neuron-to-glia lipid transfer, and lipid storage in the form of LDs within astrocytes. The accumulation of astrocytic LDs was associated with increased astrocytic ROS that reduced glutamate uptake, likely contributing to maintaining neuronal excitability. Our iPSC-based cellular modeling provides a mechanistic link between AD risk variants of CLU with CLU-mediated protective effects on neuron-glia communication to maintain homeostasis of lipid metabolism, energy consumption, and neuronal excitability.

Previous studies have primarily focused on astrocytic CLU due to its higher expression in astrocytes than in neurons [29, 88, 89]. We found that the AD-associated rs1582273 of CLU is a neuronal functional SNP (ASoC), with its AD protective allele T *cis*-upregulating *CLU* expression specifically in iGlut (Fig. 1). This is consistent with another reported AD protective allele T of rs11136000 which also increases CLU expression. However, given the absence of OCR peaks at the SNP rs11136000 site and the strong linkage disequilibrium between rs11136000 with other AD risk SNPs including rs1582273 ($r^2 = 0.98$) that we identified as having functional consequences [30-33] (Table. S1), we cautiously postulate that rs11136000 is unlikely to be functional although a functional validation in a larger sample may be warranted. A recent study suggested that rs1582273 may function in astrocytes [90], whereas we show that rs1582273 functions in neurons (iGlut) using SNP editing by CRISPR-Cas9 and ASoC mapping by ATAC-seq (Fig. 1, Fig. S2D). However, we acknowledge that although brain cortex eQTL data does support the functionality of rs1582273 (Table S2), we do not have supporting evidence to show neuron-specific function of this SNP in the brain. Furthermore, despite the absence of OCR peak at rs1582273 in iAst, we acknowledge the smaller sample size for iAst (n = 18) in our ASoC mapping and cannot completely rule out the functionality of rs1582273 in Ast. Hence, we cannot exclude the possibility of rs1582273 having functional consequences in other cell types vulnerable to AD risk in vivo. Nonetheless, our study strongly suggests that rs1582273 impacts neurons by altering expression at the *CLU* locus.

How does the elevated neuronal CLU promote neuronal excitation that is beneficial? CLU secreted from astrocytes has been reported to promote excitatory synaptic transmission in mice [29]. CLU levels are positively correlated to synaptophysin expression [91] and neurite growth [92] in different models. In iGlut, we also observed that elevated CLU levels led to more elaborate dendrites and increased presynaptic sites (Fig. 2A and B). Such enhancement of neural structural maturity by CLU may promote neuron firing and synchronization. Although shorter neurites may exhibit lower cell capacitance and faster kinetics for neuron firing in certain AD models [93, 94], longer neurites with enhanced synaptic density can feasibly amplify synaptic input signals and facilitate neuron firing. Importantly, we found that the enhanced neuronal activity by CLU correlated with enhanced neural CLU-mediated lipid transfer and LD metabolism when the neurons were co-cultured with astrocytes (Fig. 5 and 6). Furthermore, LD accumulation in mAst is accompanied by increased ROS accumulation that inhibits glutamate uptake (see below). As for the protective role of such CLU-mediated neuron excitability, we note that despite it being seemingly inconsistent with the commonly perceived clinical feature of neuron hyperexcitability in patients at early stages of AD, neuron hypoexcitability at a later stage is a common characteristic of neurodegeneration [95, 96]. In this regard, maintaining an appropriate level of neuronal excitability is pivotal for brain health, and hence potentially beneficial at a later stages of AD. The protective effect of CLU may also partly be mediated by astrocytes, where we observed an upregulation of GSH metabolism (Fig. S9D and Table S8), which may serve as a compensatory mechanism in mAst to counter excess ROS production and maintain cellular health. GSH, a key intracellular antioxidant that neutralizes ROS and reduces oxidative stress [88], can be transferred from astrocytes to neurons, offering protection against oxidative damage [75]. In addition, to definitively rule out the possibility that CLU originating from mAst could be influenced by iGlut CLU

levels and thereby complicate our findings, we conducted an assay to measure the mRNA expression, extracellular levels, and intracellular levels of both human CLU and mouse CLU across iGlut-mAst co-cultures and iGlut and mAst mono-cultures in the SNP isogenic pair and CLU overexpression system (Fig. S6 A-B). We did not observe any significant changes in mAst CLU levels under either the SNP isogenic pair or CLU overexpression conditions, indicating that hCLU from iGlut cells does not influence mCLU levels in mAst cells. This also suggests that astrocytic CLU doesn't compensate for neuronal CLU to maintain a specific level. Given that our system is a purely in vitro cell culture setup, it's plausible that cellular compensatory mechanisms (from mAst) are unlikely to be involved.

In the periphery, CLU collaborates with APOA-I and APOE to form HDL, facilitating lipids transport in the liver [97]. CLU deficiency has been shown to result in lipid accumulation in the mouse kidney [98], and CLU has also been suggested to protect against atherosclerosis through its lipid transport function [99]. Here, we show that neuronal CLU promotes neuron-to-astrocyte lipid transfer and storage of neuronal lipids in the form of glial LDs. Along with elevated CLU by the AD protective allele, transfer of neuronal FAs to surrounding mAst is facilitated, resulting in LD storage in mAst (Fig. 6A-C, Fig. S8B). The elevated LDs in mAst co-cultured with T/T iGlut could stem from either increased FA biosynthesis in iGlut coupled with augmented neuronal CLU-mediated neuron-to-glia lipid transfer (Figs. 4C-E and 5E-G) and/ or from reduced LD degradation in mAst. To this end, we noted that our transcriptomic data revealed that the lysosome was the top-ranking downregulated GO term (Cellular Component) in mAst (Fig. S9E and Table S14), suggesting that reduced lysosomal function may help maintain the level of LDs in a beneficial range. Interestingly, in contrast to the downregulation of lysosomal genes in mAst, genes related to lysosome and autophagy function in iGlut carrying the AD protective allele were upregulated (Fig. S9E, Tables S12 and S13). Since the lysosome and autophagy pathways are crucial for regulating lipophagy, which breaks down LDs and maintains LD balance [66], an enhanced LD catabolism may also contribute to FA production in iGlut carrying the AD protective allele, which may synergistically contribute to LD formation in mAst. Neuronal FAs can also be transferred to microglia and impact microglial [79, 100]. For instance, tau-burdened neurons have inactivated AMPK, increased unsaturated FAs transfer to microglia, which leads to defective phagocytosis and a pro-inflammatory status of microglia [100]. Furthermore, these dysfunctional microglia further exacerbate the neuropathology [14]. Interestingly, neurons with physiologically higher excitation (as in our case) consume more energy, which could induce a status of mild energy stress. This, in turn, activates AMPK [101] and may help dampen the detrimental process. Nonetheless, this intriguing hypothesis merits further exploration in future studies. Finally, it is noteworthy that although our data suggest neuron-toastrocyte lipid transfer likely plays a major role in LD accumulation observed predominantly in astrocytes when co-cultured with neurons, future study is needed to quantify LDs across different co-culture combinations (e.g., iGlut monocultures, iGlut-mAst co-cultures, and mAst monocultures, ideally with iAst from different CLU risk SNP genotypes) to better define the relative contribution of astrocyte-produced LDs vs. neuron-transferred LDs. Along the same line, while our data support a role for lipid transfer, they do not exclude the possibility that astrocytes differentially accumulate LDs depending on the co-cultured neuronal genotype, i.e., neuronal CLU may also influence astrocyte-intrinsic lipid metabolism, as reflected in LD levels.

Astrocytes catabolize FAs from LDs through β -oxidation to release energy, a process coupled with production of ROS [66, 67]. In support of the beneficial effect of the AD protective allele T on preserving LDs as an energy source, we found that more FAs were catabolized to ketones and there was an elevated lactate release in mAst co-cultured with T/T iGlut (Fig. 7A-D). Obviously, excess ROS, either generated from mitochondria or from peroxisomal β-oxidation of VLCFAs, can be detrimental and cause cellular stress [69]. Notably, neurons that are more active have been documented to generate more peroxidated FAs to mitigate ROS [49, 76, 77], which is supported by our transcriptomic data (Fig. 4C-E, Tables S6 and S10). However, low levels of ROS can also be beneficial, for example, by promoting longevity [102–104]. In fact, our observed increase of lactate release as an energy source in mAst co-cultured with T/T iGlut (Fig. 7D) may also be partially attributed to astrocytic ROS [74, 75]. Moreover, maintaining a proper level of ROS in astrocytes may be important to excite neurons by reducing astrocytic glutamate uptake. In support of this protective role for ROS, we observed reduced glutamate uptake of mAst co-cultured with T/T iGlut through elevated neuronal CLU (Fig. 7G), which was reversed by ROS inhibition in mAst (Fig. 7H). Interestingly, the role of ROS appears to be conserved in fibroblasts, where it also has been demonstrated to reduce glutamate uptake [87]. Finally, our transcriptomic data also show a remarkable upregulation of the GSH metabolism (Fig. S9D, Table S5 and S8) that can neutralize ROS [105], suggesting a possible ROS-feedback mechanism in LD accumulated mAst to maintain ROS homeostasis. Therefore, the AD protective allele of *CLU* and the elevated neuronal CLU

may manifest beneficial effects in multiple ways involving lipid-mediated neuron-glia communication (Fig. 7J).

Conclusion

Our study using the iPSC-derived neurons co-cultured with mAst as a cellular model provides in vitro evidence of the protective effects of rs1582273 at the CLU locus. We acknowledge limitations of using iPSC-derived neurons (and other brain cell types) in modeling neurodegenerative disorders like AD; for instance, the iPSCderived neurons are often not mature (compared to adult brain neurons) and do not retain the epigenomic memory related to aging. Thus, our findings from iPSC models warrant future confirmation using in vivo models. Nonetheless, our iPSC-derived neurons co-cultured with mAst, in combination with CRISPR/Cas9-SNP editing, provide a unique tractable model that enables us to reliably tie this AD protective allele to its neuronal function in mediating neuron-glia communication. Furthermore, the observed effect of the AD protective allele on neuronal CLU expression is partly supported by the brain cortex eQTL showing the association of T allele with an increased *CLU* expression [55] (Table S2) and by the observed protective effect of CLU on neuronal excitation in a previous study using a mouse model [29]. We provide strong supportive evidence from our assays based on neuronal network activity, astrocytic LD accumulation, and ROS production regarding the beneficial neuronal excitation promoted by the AD protective allele. In sum, our results provide a mechanistic link between the AD protective allele and a previously unappreciated role of neuronal CLU in mediating astrocytic LD accumulation and ROS production. This study underscores the importance of CLU-mediated complex interplay between this genetic risk factor, lipid metabolism, and neuron-glia communication in AD pathology. A better understanding of these mechanisms may offer insight into targeted therapeutic approaches for AD and other neurodegenerative conditions.

Abbreviations

GWAS	Genome-wide association studies
AD	Alzheimer's disease
CLU	Clusterin
iPSC	Induced pluripotent stem cell
ROS	Reactive oxygen species
SNPs	Single nucleotide polymorphisms
APOE	Apolipoprotein E
ASoC	Allele-specific open chromatin
OCR	Open chromatin region
iGlut	IPSC differentiation into Glutaminergic neurons
iDA	IPSC differentiation into dopaminergic neurons
igaba	IPSC differentiation into GABAergic neurons
iMG	IPSC differentiation into microglia
iAst	IPSC differentiation into astrocytes
eQTL	Expression quantitative trait loci

mAst Mouse astrocyte

Supplementary Information

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Additional file 1. Figure S1: Bioinformatic and experimental validation of the regulatory effect of rs1532278 on TF-binding and CLU expression, related to Fig. 1. (A) Multiz alignment and phyloP conservation (470 mammals) around rs1532278 (from UCSC hg38 genome browser). (B) JASPAR predicted TF binding sites at rs1532278 and TF expression levels in iGlut (10/23 predicted TFs can be detected by RNA seq). CPM, counts per million reads. (C) Representative images (CD07 line) of iGlut of all three genotypes are also shown, related to Fig. 1D (bottom panel); GFAP and HuNu (human nuclear antigen) staining shows specificity of HuNu and MAP2 staining for iGlut in iGlut-mAst co-cultures. (D) No difference of iGlut differentiation efficiency were found between T/T and CC carriers in iGlut-mAst co-cultures, and none proliferating cells were observed in these neurons indicated by negative staining of Ki67. HuNu +, human cells. n=5 coverslips per group from one differentiation of both CD05 and CD07 lines (2-3 clones per line, one coverslip per clone and 4-5 images per coverslip). (E) DRGX ChIP-qPCR for iGlut-mAst co-cultures of CD07 line on day 30. n=3 biological replicates per group (one clone with 3 biological replicates from the CD07 line) from one independent differentiation. (F-G) ISL2 siRNA knockdown in day-30 pure iGlut (C/C) cultures. Samples of 72 hours post-siRNA transfection were used for gPCR. n=3 biological replicates from one clone per line in one independent differentiation. (H) CLU mRNA levels in iGlut pure cultures. n=6 biological replicates per group (2-3 clones per line and 2-3 biological replicates for each clone) from two independent differentiations of each line (I) sCLU levels detected by ELISA from the supernatant of iGlut pure cultures, n=4 biological replicates per group (2 clones per line and 2 biological replicates for each clone) from two independent differentiations of each line. (J) CLU mRNA levels of mAst in iGlut-mAst co-cultures. n=4 biological replicates per group (2 clones per line and 2 biological replicates for each clone) from two independent differentiations of each line. (K) Three gPCR primer sets that can capture the majority of CLU transcript isoforms (14/17) are used in (L) to detect CLU mRNA levels. Only iGlut-mAst co-cultures of the CD07 line was used. n=6 biological replicates per group (3 biological replicates per clone for 2 clones) from two independent differentiations. (M) rs1532278 did not alter the expression of SCARA3, a CLU-adjacent gene, in iGlut (or when co-cultured with mAst) of the isogenic pairs of both CD05 and CD07 lines. n=10 biological replicates per group (2 biological replicates per clone and 2-3 clones per line) from two independent differentiations of both CD05 and CD07 lines. (N) Representative images (CD05 line) of CLU staining, related to Figure 1K and 1L. Data = mean±SEM. * p<0.05, ** p< 0.01, *** p< 0.001, and **** p< 0.0001.

Figure S2. Quality control of the CRISPR/Cas9-edited iPSC lines, related to Fig. 1.(A) Sanger sequencing of top off-target sites (Benchling prediction) with 2 and 3 mismatched sites with gRNA in one clone of the edited alleles in both CD05 and CD07 lines. Note no off-target editing was found. (B) eSNP-karyotyping using RNA-seq data of iGlut of the two isogenic pairs of CRISPR-edited lines (CD05 and CD07; only the iPSC clones used for cellular functional assays were analyzed). Left panel, moving average of the SNP allelic ratio (RNA-seg reads of each allele) along the genome; right panel, stretches of SNP heterozygosity of all common SNPs for each chromosome. Note that no chromosomal abnormalities were found. (C) CLU, ISL2, and DRGX expression in postmortem brain transcriptomic dataset hub (https://cellxgene.cziscience.com/). (D-E) CLU mRNA Levels in iAst differentiated from the isogenic pairs of CRSIPR/Cas9-edited iPSC lines (for donor lines CD05 and CD07). Representative immunofluorescence staining (CD05 line) of S100^β and vimentin shows the identity and purity of astrocytes. n=10 biological replicates per group (2-3 clones per line and 2 replicates per clone) from two independent differentiations of both CD05 and CD07 lines. Data, mean±SEM.

Figure S3. Synaptic and electrophysiological properties of iGlut carrying TT or C/C alleles of rs1532278 at the CLU locus, related to Fig. 2. (A) Quantification of SYP and PSD-95 puncta density. n=15-17 neurons per group (1-2 neuron per coverslips, 5-6 coverslips per clone, and 2 clones per line) from two independent differentiations of each line. (B-C) Western blotting shows PSD-95 and SYP levels in day-30 iGlut pure cultures. n=4 biological replicates per group (2 clones per line and 2 biological replicates per clone) from two independent differentiations of each line. (D-E) Number of bursts and synchronicity analysis in MEA. AUNCC: Area Under Normalization Cross-Correlation. n=9-12 biological replicates per group (2-3 clones per line and 3-4 biological replicates per clone) from two independent differentiations of each line. Data, mean±SEM. * p<0.05, ** p<0.01, *** p<0.001, and **** p<0.0001.

Figure S4. Characterization of neurons carrying the rs1532278-flanking OCR deletion or with exogenous CLU overexpression, related to Fig. 3. (A) Sanger sequencing traces the CRISPR/Cas9-engineered homozygous OCR deletion (representative result of the CD07 line). (B) CLU mRNA levels (n=6 biological replicates per group from two independent differentiations, 2 clones per line, and 3 biological replicates for each clone) and sCLU levels (n=4 biological replicates per group from two independent differentiations, 2 clones per line, and 2 biological replicates for each clone) in iGlut pure co-cultures. (C) Immunofluorescence staining of neuronal CLU in iGlut pure cultures on days 23-25. (D) Quantification of CLU staining shown in panel (C). n=7 coverslips per group (2 clones per line, 3-4 coverslips for each clone, and 3-5 images per coverslip; shown are example images of CD05) from two independent differentiations of each line. (E-F) Western-blot for SYP in day-30 iGlut-mAst co-cultures. n=4 biological replicates per group (2 clones per line, and 2 biological replicates for each clone) from two independent differentiations of each line. (G-H) Number of neuron network bursts and synchronicity analysis in MEA. AUNCC: Area Under Normalization Cross-Correlation. n=5-10 biological replicates per group (2 clones per line and 2-5 biological replicates per clone) from two independent differentiations of each line (I) Immunofluorescence staining (CD07 line) of MAP2 and CLU (Flag tag) to determine AAV-hCLU transduction efficiency (~100%). (J) qPCR to confirm CLU overexpression. n=3 biological replicates per group from one clone of CD07 line in one independent differentiation. (K) Number of network bursts and synchronicity analysis in MEA. AUNCC: Area Under Normalization Cross-Correlation. n=3 biological replicates per group (all from one clone of line CD07) in one independent differentiation. Data, mean±SEM. Scale bars are indicated in corresponding images. * p<0.05, ** p< 0.01, *** p< 0.001, and **** p< 0.0001.

Figure S5. Transcriptomic analysis of iGlut-mAst co-cultures and validation, related to Fig. 4. (A) Correlation analysis Salmon sorted iGlut data set to our previous published single-cell data sets iGlut (CD05 and CD07) and others published single cell data sets in postmortem brain with various cell types including ex-neuron, ih-neuron, microglia, astrocyte, oligodendrocytes, and OPC. Ast: astrocyte, ex: excitatory neuron, ih: inhibitory neuron, mic, microglia, Oli: oligodendrocyte, and OPC: oligodendrocyte progenitor cell. (B) MDS (Multidimensional scaling) analysis of all transcripts in iGlut and mAst, which are expressed in ≥75% of samples. n=9 biological replicates per group from two independent differentiations of each line, 2-3 biological replicates per clone, 2 clones per line, and 2 lines in total, (C) ELISA quantification of $A\beta$ in the supernatants of iGlut-mAst co-cultures and iGlut pure cultures. n=4 biological replicates per group (2 clones per line and 2 replicates for each clone) from two independent differentiations of each line. (D) GO Biological process enrichment in significantly downregulated gene sets in iGlut. Blue stars indicate neuron morphology-related pathways. (E) Confirmation of SYP, PSD-95, and CLU expression levels in iGlut in RNA seg analysis. (F) Confirmation of human CLU expression levels by using in-silico qPCR approach to exclude mouse CLU reads interference. Violin plots showed data with median and interquartile range, and all other statistical graphs showed data with mean \pm SEM. * p<0.05, ** p< 0.01, *** p< 0.001, and **** p< 0.0001.

Figure S6. The assessment of the Impact of mouse CLU on human CLU expression in iGlut-mAst co-culture system (related to Figures 1, 3, 4, and 6) and the Analysis Procedure of LipidTox staining in iGlut pure cultures (related to Fig. 5).(A-B) The mRNA expression levels, extracellular (secreted) levels, and intracellular levels of both hCLU and mCLU were analyzed across iGlut-mAst co-cultures and iGlut and mAst mono-cultures in the SNP isogenic pair (A) and CLU overexpression assays (B). To ensure comparability among different cultures, iGlut cells in both mono- and co-cultures were seeded, collected, and processed simultaneously, with the same approach applied to mAst mono- and co-cultures. n=3 biological replicates per group from one clone of CD05 line in one independent differentiation, and C/C of CD05 line was used in CLU overexpression

assay. (C) The representative images from CD07 line showing LipidTox and NeuN co-staining analysis. NeuN signals were utilized to create a mask using the CellProfiler program, which excluded any contaminated signals from dead cells in both LipidTox and DAPI staining. The LipidTox signals were then quantified, and cell numbers were determined based on DAPI signals. Data, mean±SEM. Scale bars are indicated in corresponding images. * p<0.05, ** p< 0.01, *** p< 0.001, and **** p< 0.0001. Figure S7. Validation of neuronal CLU as a lipid shuttle in lipid transfer system, related to Fig. 5. (A) A schematic diagram illustrating the experimental setup: Flag-tagged CLU was overexpressed in iGlut using AAV (refer to Fig. 3G), followed by co-culture with mAst in the lipid transfer system (refer to Fig. 5E). Specifically, Day-5 iGlut were seeded on coverslips and infected with AAV-hCLU-Flag at a multiplicity of infection (MOI) of 10⁵ on Day 8. From Day 26 to Day 28, iGlut were co-cultured with mAst pre-seeded on separate coverslips (positioned above with Parafilm separators). GFAP staining was performed to confirm mAst identity, while Flag and MAP2 staining verified successful AAV infection. Representative images from CD05 line. (B) Co-staining of BD493/563 and Flag in mAst was conducted to confirm the co-localization of neuronal CLU and lipid droplets (LDs) in mAst. (C) Validation of 2nd antibody (against Flag antibody) specificity in mAst from experiment (A). (D) Exclusion of gravity effects was tested by reversing the system in (A), placing the mAst coverslip at the bottom and the iGlut coverslip at the top. Representative images from CD05 line. (E) Validation of Flag antibody specificity in only mAst culture.

Figure S8. Neuronal CLU facilitates lipid transfer to astrocytes and LD accumulation, related to Fig. 6. (A) The process of cell segmentation in iGlut-mAst co-cultures, related to Fig. 6A. (B) LDs staining and quantification by BD493/503 in day-30 iGlut-mAst co-cultures. n=5-6 coverslips per group (2 clones per line, 2-3 coverslips for each clone with 4-6 images per coverslip, and shown are example images of CD07) from one independent differentiation of each line. Violin plots are shown with data median and interquartile range. Other data, mean±SEM. Scale bars are indicated in corresponding images. * p<0.05, ** p<0.01, *** p<0.001.

Figure S9. Transcriptomic data provide mechanistic support to lipid accumulation and ROS homeostasis in mAst, related to Figs. 6 and 7.(A) Digitonin permeabilization (~0.01%) does not affect CellROX staining (representative images from CD05 co-cultures). (B) iGlut cell numbers in CellRox Staining. n=25-29 images per group (2 clones per line, 2-3 coverslips for each clone with 2-5 images per coverslip) from two independent differentiations of each line. (E) ELISA measurement of CLU level from supernatant after immunodepletion, related to Fig. 7C. n=3 technical replicates per group, all from one supernatant collection of CD07 line. (D) A Sankey plot depicts glutathione metabolism and oxidative stress related pathways in mAst from Wiki pathway analysis (E) Lysosome and autophagy related GO items are enriched in DE gene lists of iGlut and mAst. Violin plots are shown with data median and interguartile range. Other data, mean±SEM. Scale bars are indicated in corresponding images. * *p*<0.05, ** *p*< 0.01, *** *p*< 0.001, and **** *p*< 0.0001.

Figure S10. Raw images for all western blot.

Additional file 2. Table S1. ASoC SNPs that are in linkage disequilibrium with AD GWAS index risk SNP rs11787077 at CLU locus, related to Fig. 1. Table S2. Brain eQTL SNPs for CLU, related to Figs. 1 and S3. Table S3. Transcriptomic correlation between different cell types,

related to Fig. S6 A.

Table S4. Differentially expressed genes in iGlut (T/T vs. C/C lines), related to Fig. 4B.

Table S5. Differentially expressed genes in mAst (co-cultured with T/T vs. C/C iGlut), related to Fig. 4B.

Table S6. Upregulated WikiPathways in iGlut (T/T vs. C/C lines), related to Figs. 4C and 4D.

Table S7. Downregulated WikiPathways in iGlut (T/T vs. C/C lines), related to Fig. 4.

Table S8. Upregulated WikiPathways in mAst (co-cultured with T/T vs. C/C iGlut), related to Fig. 4 F.

Table S9. Downregulated WikiPathways in mAst (co-cultured with T/T vs. C/C iGlut), related to Fig. 4.

Table S10. Upregulated GO terms (biological process) in iGlut (T/T vs. C/C lines), related to Fig. 4E.

Table S11. Downregulated GO terms (biological process) in iGlut (T/T vs. C/C lines), related to Fig. S6D.

Table S12. Upregulated GO terms (biological process) in mAst (co-cultured with T/T vs. C/C iGlut), related to Fig. 4G.

Table S13. Upregulated GO terms (cellular component) in iGlut (T/T vs. C/C lines), related to Fig. S8 A.

Table S14. Downregulated GO terms (cellular component) in mAst (cocultured with T/T vs. C/C iGlut), related to Fig. S8 A.

Table S15. gRNA sequences, qPCR primers and AAV plasmid construct information, related to Method Part.

Table S16. ApoE genotypes of CD05 and CD07 Lines determined by SAMtools package and "mpileup" founction in R program, related to Fig. 1

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Authors' contributions

X.Z. designed and performed experiments and wrote the manuscript. Y.L. analyzed RNA-seq data, calcium imaging, and wrote the manuscript. S.Z. analyzed calcium imaging, RNA-seq, and ATAC-seq data, and wrote the manuscript. H.Z. and A.K. performed iPSC differentiation and helped with neuron differentiation. A.S., M.J.M., and L.D.G. helped with data interpretation and edited the manuscript. Z.P.P. helped with data interpretation and neuron differentiation. A.R.S., H.J.B., and G.T. helped with data interpretation and wrote the manuscript. J.D. designed and supervised the study and wrote the manuscript.

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Data availability

iGlut-mAst co-culture RNA-seq data are available in Gene Expression Omnibus under accession code GSE269153. Two sets of ATAC-seq data for iMG, iAst, iGlut, iGABA, and iDA neurons are accessible at Gene Expression Omnibus under accession code GSE263804 and GSE188941. All codes used in the analyses are accessible at https://zenodo.org/records/11568090.

Declarations

Ethics approval and consent to participate

Any data derived from human cells and tissue, and mouse experiments were approved by Endeavor Health (formerly NorthShore University HealthSystem) institutional review board (IRB).

Consent for publication

Not applicable.

Competing interests

The authors declare no competing interests.

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