

## MIT Open Access Articles

### *Insights into Alzheimer's disease from single-cell genomic approaches*

The MIT Faculty has made this article openly available. **Please share** how this access benefits you. Your story matters.

**Citation:** Murdock, Mitchell H and Tsai, Li-Huei. 2023. "Insights into Alzheimer's disease from single-cell genomic approaches." *Nature Neuroscience*, 26 (2).

**As Published:** 10.1038/s41593-022-01222-2

**Publisher:** Springer Science and Business Media LLC

**Persistent URL:** <https://hdl.handle.net/1721.1/150474>

**Version:** Author's final manuscript: final author's manuscript post peer review, without publisher's formatting or copy editing

**Terms of use:** Creative Commons Attribution-Noncommercial-Share Alike



# 1                    **Insights into Alzheimer's disease from single cell genomic approaches**

2                    Mitchell H. Murdock<sup>1</sup>, Li-Huei Tsai<sup>1,\*</sup>

3                    <sup>1</sup>Department of Brain and Cognitive Sciences, The Picower Institute for Learning and Memory,  
4                    Massachusetts Institute of Technology, Cambridge, Massachusetts, 02139, USA.

5                    \*Correspondence to lhtsai@mit.edu.

## 7                    **Abstract**

8 Alzheimer's disease (AD) is an age-related disease pathologically defined by the deposition of amyloid  
9 plaques and neurofibrillary tangles in the brain parenchyma. Single cell profiling reveals Alzheimer's  
10 dementia involves the complex interplay of virtually every major brain cell type. Here, we highlight cell-type  
11 specific molecular perturbations in AD. We discuss how genomic information from single cells expand  
12 existing paradigms of AD pathogenesis and highlight new opportunities for therapeutic interventions.

## 14                    **Introduction**

15 Single cell genomics have defined the complex molecular regulation of major cell types in the mouse<sup>1-4</sup> and  
16 human brain<sup>5,6</sup>. Profiling genetic information from single cells from individuals with various stages of AD  
17 pathology (**Table 1**) uncovers detailed cell-type specific molecular programs in AD (**Figure 1**). Keeping in  
18 mind challenges related to interpreting genomic studies from single cells, such as the common necessity  
19 to profile single nuclei instead of single cells from archived brain tissue (**Box 1**), we argue molecular  
20 disturbances across major cell types converge on common signaling pathways such as lipid handling,  
21 immune response, and metabolic reprogramming (**Figure 2**). Further defining and manipulating core  
22 signaling nodes may generate new opportunities for therapeutic intervention.

24 **Excitatory neurons.** Synaptic alterations and neuronal loss are well-established in AD, and single cell  
25 profiling has revealed molecular programs regulating neuronal dysfunction (**Figure 3**). Several single  
26 nucleus RNA-sequencing (snRNA-seq) studies reveal excitatory neurons from AD patients alter genes  
27 regulating neurotransmitter release, synaptic vesicle recycling, and glutamate metabolism<sup>7-9</sup>. Histological  
28 findings indicate post-synaptic terminals are lost in AD, and several differentially expressed genes relate to

29 post-synaptic scaffolding molecules, glutamate receptor trafficking, and calmodulin signaling<sup>8,9</sup>. Importantly,  
30 in situ hybridization confirms some of these findings, such as the reduced number of excitatory neurons<sup>8</sup>  
31 and the downregulation of *NTNG1*, a gene involved in the regulation of neurite outgrowth<sup>8</sup>. Inhibitory  
32 synapses, which are highly plastic in the adult brain and are thought to enable flexible modulation of stable  
33 excitatory connections<sup>10</sup>, are also reduced in number in AD<sup>11</sup>. These findings are partly reflected in altered  
34 expression of genes critical for inhibitory synapses, such as modulation of some integrin genes<sup>7,8</sup>. The  
35 integrity of myelinated axons is critical for long-range projections, and genes related to neuronal-  
36 oligodendrocyte interactions are modulated in AD neurons, such as upregulation of *LINGO1*<sup>7-9</sup>, a negative  
37 regulator of myelination (a finding repeated across several transcriptomic studies<sup>7-9</sup> and by in situ  
38 hybridization<sup>8</sup>). These transcriptional changes suggest synaptic elements are not simply structurally lost in  
39 AD, but the very molecular machinery governing their integrity are dysregulated.

40

41 Several studies highlight how AD neurons modulate stress related genes<sup>8,12</sup>, particularly genes related to  
42 chaperone mediated protein folding<sup>7-9,13,14</sup> (e.g., *DNAJA1*). Altered genes in AD neurons also relate to  
43 mitochondrial translocase, glucose sensing, and glycolysis (e.g., *SLC2A3*, which encodes a glucose  
44 transporter enriched at synaptic terminals)<sup>8,9</sup>. Synaptic mitochondria are critical for sustained synaptic  
45 efficacy<sup>15,16</sup>, and transcriptional profiles provide insight into metabolic programs disrupted in AD neurons.

46

47 Defining genetic signatures of neurons selectively vulnerable to dysfunction may reveal the molecular logic  
48 governing AD degeneration (**Box 2**). Tau aggregates form neurofibrillary tangles within some neurons, a  
49 canonical pathological hallmark of AD closely associated with neuronal loss. Fluorescence activated cell  
50 sorting (FACS) based on neurons with neurofibrillary tangles reveal synaptic genes are dysregulated in  
51 tangle-bearing neurons compared to non-tangle-bearing neurons from AD individuals<sup>12</sup>. A separate snRNA-  
52 seq study revealed *BAG3*, a master regulator for proteotoxicity-induced signaling, regulates tau  
53 homeostasis<sup>17</sup>. Reducing *BAG3* in primary cortical neurons led to tau accumulation, and *BAG3*  
54 overexpression attenuated tau pathology<sup>17</sup>, suggesting selective vulnerability related to tau metabolism  
55 may be governed in part by *BAG3*. Similarly, the transcription factor RORB is thought to mark a population  
56 of tangle-burdened neurons that modulate genes related to synaptic proteins and neurotransmitter

57 receptors<sup>18</sup>. Thus, RORB may be a marker for selectively vulnerable neurons<sup>18</sup>. Conversely, some neurons  
58 may be preferentially resilient to AD: a subset of individuals harbor extensive amyloid and tau pathology  
59 but do not exhibit dementia<sup>19</sup> and therefore offer a tractable opportunity to interrogate the molecular basis  
60 of resilience to cognitive decline. *MEF2C* is upregulated in excitatory neurons in individuals with high AD  
61 pathology and normal cognition compared to age-matched individuals with high pathology and low  
62 cognition<sup>19</sup>. Impairing *Mef2* in mice causes neuronal hyperexcitability, and *Mef2* overexpression in Tau  
63 P301S mice rescued tauopathy-induced hyperexcitability<sup>19</sup>. These findings suggest properties related to  
64 neuronal firing may explain individual neuronal susceptibility or resilience to degeneration.

65  
66 Risk variants from genome wide-association studies (GWAS) further highlight differential risk to AD (**Box**  
67 **3**). The  $\epsilon 4$  allele of the apolipoprotein E gene (*APOE*) is considered the most highly validated genetic risk  
68 factor for sporadic late-onset AD. While *APOE* is predominantly expressed by astrocytes and microglia<sup>8</sup>,  
69 variable expression of *APOE* among individual neurons suggests some neurons express relatively higher  
70 levels of *APOE*<sup>20</sup>. Increased *APOE* levels were associated with cellular stress and death<sup>20</sup>, suggesting  
71 neuronal *APOE* and *MHC-I* signaling might be an important factor driving differential vulnerability to AD  
72 neurodegeneration. Apolipoproteins are critical for lipid transport, and other lipid related genes modulated  
73 in AD neurons include those related to cholesterol transport (e.g., *NPC1*<sup>8,9</sup>, which encodes a lysosomal  
74 cholesterol transporter whose loss of function is associated with neuronal death<sup>21</sup>) and lipid signaling (e.g.,  
75 *LAMTOR5*, related to endosomal/lysosomal transport<sup>7-9,14</sup>). The findings highlight complex lipid-related  
76 signaling networks disrupted in AD neurons.

77  
78 *Neuronal DNA damage*. DNA damage is well known to occur in AD neurons<sup>22</sup>, and snRNA-seq reveals AD  
79 neurons modulate genes related to DNA repair enzymes<sup>7-9,14</sup> (e.g., *XRCC6*, which is involved in DNA repair  
80 initiation, is downregulated in AD neurons<sup>8</sup>). Moreover, single cell whole genome amplification sequencing  
81 suggests DNA damage in neurons is elevated in neurodegeneration<sup>23</sup>. High DNA damage in human  
82 neurons is enriched in differentially expressed genes of AD individuals<sup>24</sup>, potentially suggesting  
83 dysregulated gene expression in AD neurons may be related to impaired DNA repair. DNA damage may  
84 be part of a switch in cellular states associated with metabolic stress (e.g., upregulation of the DNA damage

85 inducible transcript *DDIT3*<sup>8,9</sup> may be associated with broader program in cellular stress). Neurons burned  
86 with DNA damage also active inflammatory signaling in neurodegeneration<sup>25</sup>. DNA damage is known to  
87 occur at neuronal enhancers and promoters<sup>26</sup>, particularly during learning<sup>27</sup>, and is required for learning-  
88 related immediate early gene expression<sup>27</sup>. Disentangling learning-related DNA damage and aging-related  
89 DNA damage in AD may lead to new insights into the progression of neural circuit disruption in AD.

90

91 *Neurogenesis*. Single cell genomics have generated molecular insight into the progression of new neurons  
92 in the adult brain, including the molecular definition of stem cells and their terminal fates<sup>28-33</sup>, although  
93 common markers for neural progenitors may complicate efforts to define human neurogenesis<sup>34</sup>. Mutations  
94 in *PSEN1* may alter the stem cell niche<sup>35</sup> and some neural stem cells may be particularly affected by amyloid  
95 toxicity<sup>36</sup>, so AD risk genes could potentially alter neurogenesis in the context of AD.

96

97 **Interneurons**. Interneurons critically sculpt synchronized patterns of neural activity, and single cell  
98 transcriptomics provide molecular definitions of interneuron subtypes from mouse<sup>3,37,38</sup> and human<sup>39,40</sup>  
99 brain, which reflect their functional repertoire<sup>41</sup>. Interneurons share transcriptional changes with excitatory  
100 neurons in AD, including genes related to metabolic stress, ion transport, DNA damage, perineuronal net  
101 assembly, and ErbB signaling<sup>7,8,13</sup>. Despite the well-documented functional perturbations of interneuron-  
102 dependent neuronal rhythms in amyloid mouse models<sup>42</sup> and mice with targeted replacement of mouse  
103 *ApoE* with human *APOE4*<sup>43</sup>, transcriptional alterations within distinct interneuron subtypes have evaded  
104 comprehensive characterization in AD<sup>7-9,13,14</sup>. Downregulated genes in AD interneurons include marker  
105 genes for canonical interneuron subtypes, including *SST*, *PVALB*, and *VIP*<sup>7-9</sup>. Interneuron neuropeptides  
106 are thought to regulate inhibitory circuits<sup>44,45</sup> and neurovascular coupling<sup>46</sup>, so impaired interneuron peptide  
107 signaling in AD may broadly impair neuronal signaling in dementia. The loss of canonical markers might  
108 also suggest interneurons lose core aspects of their transcriptional identity, which may reflect global loss  
109 of cellular function (**Box 2**).

110

111 **Microglia.** GWAS findings highlight AD-associated variants in immune related genes (e.g., *TREM2*, *CD33*,  
112 *HLA-DR*)<sup>47</sup>; accordingly, microglia have received a great deal of attention by single cell profiling<sup>48</sup> (**Figure**  
113 **4**).

114

115 *Plaque-associated microglia.* One of the first single cell transcriptomic studies profiling microglia revealed  
116 a distinct subtype in 5XFAD mice, a popular amyloid model harboring five mutations associated with familial  
117 AD. Microglia from the hippocampi of 5XFAD mice were dubbed “disease-associated microglia” (DAM)<sup>49</sup>.  
118 Microglia harboring DAM transcriptional signatures were revealed to localize to amyloid plaques. One study  
119 elegantly sorted microglia from 5XFAD mice according to their levels of plaque labeled with methoxy-X04,  
120 a fluorescent probe that binds to fibrillar  $\beta$ -sheets of amyloid<sup>50</sup>. Interestingly, methoxy-labeled microglia  
121 increased expression of hypoxia-inducible factor *Hif1a*<sup>50</sup>, which may be associated with a broad switch in  
122 metabolic programs in human AD microglia associated with *HIF1* signaling<sup>51</sup>. Studies in 5XFAD mice  
123 indicate plaque-associated microglia upregulate genes related to cell surface receptors (*Trem2*, *Tyrobp*,  
124 *Clec7a*), integrins (*Itgax*), and immune-related pathways (*Csf1*, *Ccl6*)<sup>9,49,50,52</sup>. This transcriptional signature  
125 is partly recapitulated in CKp25<sup>52</sup>, APP-PS1<sup>53</sup>, APP<sup>NL-G-F</sup><sup>54</sup>, Tau P301S, and P301L mice<sup>53</sup> (although genetic  
126 background may drive substantial microglial diversity<sup>55</sup>). While additional studies are needed to clarify the  
127 extent to which mice recapitulate human AD microglia, several studies indicate human AD microglia  
128 modulate genes related to cell migration and phagocytosis<sup>7-9,14</sup>. Collectively, these findings highlight the  
129 transcriptional basis for microglia to cluster around plaques and phagocytose debris<sup>7-9,14</sup>.

130

131 *Lipid metabolism in AD microglia.* *TREM2* acts in microglia as a sensor for a wide array of lipids, and the  
132 R47H variant of *TREM2* is associated with increased risk of AD and enhanced Akt signaling in microglia<sup>56</sup>.  
133 In adipose tissue of non-AD individuals, *TREM2* drives a gene expression program involved in  
134 phagocytosis, lipid catabolism, and energy metabolism<sup>57</sup>, suggesting *TREM2* may broadly regulate lipid-  
135 related metabolic programs in macrophages. In accord with experimental studies highlighting the  
136 importance of lipid sensing and metabolism in microglia, microglial lipid metabolism pathways are broadly  
137 disrupted in AD<sup>7-9</sup>. Interestingly, the DAM phenotype in 5XFAD mice is dependent on *Trem2*<sup>9,49</sup>. Several  
138 findings in mice suggest manipulating microglial lipid pathways regulate pathology. For example, knocking

139 down mouse *ApoE* conferred neuroprotection in APP/PS1 mice<sup>58</sup>, and overexpressing low-density  
140 lipoprotein receptor, which mediates lipid clearance, alleviates pathology when overexpressed in Tau  
141 P301S mice and shifts microglia transcriptional signatures to a homeostatic state<sup>59</sup>. Lipid metabolism is  
142 critical for microglia to rapidly remodel plasma membrane for local brain surveillance and regulate neural  
143 activity, and these findings suggest targeting microglial lipid-related pathways may alleviate AD pathology.

144

145 *Microglial perturbations in neuronal support.* It is increasingly relevant how microglia regulate neuronal  
146 circuits<sup>60,61</sup>. Microglia regulate neural computations in part by complement-mediated synapse elimination<sup>62</sup>,  
147 fractalkine signaling<sup>63</sup>, and purine sensing<sup>60</sup>, and, accordingly, several studies indicate AD microglia  
148 modulate genes related to complement (*C1Q*<sup>7,8</sup>), fractalkine receptors (e.g., *CX3CR1*<sup>8,14</sup>), and purine  
149 receptors (e.g., *P2Y12R*<sup>7</sup>). Thus, neuronal dysfunction in AD may arise in part due in part to alterations in  
150 microglial capacity to sense and control neuronal activity. Perturbations in microglial metabolic state, related  
151 in part to cellular stress and glycolytic shifts, may converge on signaling pathways that impair microglial  
152 capacity to regulate neuronal activity (for example, a model using CRISPR-edited induced pluripotent stem  
153 cells found lipid accumulation induced by APOE4 impairs microglial surveillance of neuronal network  
154 activity<sup>64</sup>). Microglia state may also be associated with distinct GABAergic circuits<sup>65</sup> and pyramidal neuron  
155 subtypes<sup>66</sup>, so future work defining microglial-neuronal crosstalk may reveal the molecular logic of microglia  
156 governing neuronal dysfunction in AD.

157

158 *Vascular function of microglia and macrophages.* Capillary-associated microglia are thought to regulate  
159 blood flow via purinergic signaling<sup>67,68</sup>. Microglia and perivascular macrophages are thought to harbor  
160 distinct ontogeny<sup>69</sup>, and subpopulation of cells marked by high *Mrc1*, a marker of peripheral macrophages<sup>70</sup>,  
161 may represent a transcriptionally distinct population of vascular-associated macrophages<sup>71,72</sup>. Signaling  
162 between vascular-associated microglia/macrophages and vascular cells may influence neurovascular  
163 function in AD. For example, secreted factors from AD microglial might regulate the integrity of endothelial  
164 tight junctions. Chemokines secreted by microglia may influence the inflammatory state of endothelial walls  
165 (which in turn can lead to neutrophil adhesions and capillary stall-induced blood flow reductions<sup>73</sup>). Future

166 studies may further define how vascular-associated macrophages influence vascular permeability and  
167 neurovascular coupling in AD.

168

169 *White matter associated microglia.* Microglia in white matter have a distinct transcriptional state compared  
170 to grey matter microglia<sup>74</sup> and share genes associated with disease-associated microglia (e.g., upregulation  
171 of *APOE*, complement, and lipid metabolism related genes, and downregulation of homeostatic markers)<sup>75</sup>.  
172 Similar transcriptional signatures of white matter microglia are present in 5XFAD and APP<sup>NL-G-F</sup> mice, and  
173 *TREM2* knockout reduces the presence of white matter microglia<sup>75</sup>. The dysfunction of microglia in white  
174 matter may relate to repairing and phagocytosing myelin<sup>76</sup>. Further defining white matter associated  
175 microglia may reveal interventions to promote the health of myelinated axons.

176

177 *State transitions of microglia inflammation.* Morabito et al. performed snATAC-seq and snRNA-seq to define  
178 AD-associated gene-regulatory programs at the epigenomic and transcriptomic levels<sup>77</sup>. Some microglia in  
179 AD had more open binding sites for *SPI1*, which encodes PU.1, a master regulator of myeloid cell  
180 differentiation. PU.1 may act as a transcriptional repressor in late-stage AD microglia<sup>77</sup>, and a complex  
181 network of transcription factors in AD microglia (e.g., *ELF5*, *ETS1*, *ETV5*, *SPIC*)<sup>77</sup> may be involved in  
182 microglia state transitions in AD<sup>77,78</sup>. Indeed, PU.1 expression levels<sup>79</sup> and PU.1-dependent transcriptional  
183 control<sup>53,80</sup> are thought to critical regulate microglial function, such as microglial clearance of amyloid. Single  
184 cell transcriptomics and CRISPRi/a screens might further reveal gene programs modulating microglial  
185 state<sup>81</sup>.

186

187 **Astrocytes.** Astrocytes are involved in neuronal trophic support, extracellular ion homeostasis, and brain  
188 fluid balance. Single cell profiling reveals the molecular heterogeneity of astrocytes<sup>82-85</sup> and astrocytic  
189 perturbations in AD (**Figure 5**).

190

191 *Astrocyte metabolism.* Astrocytes are a central driver of energy homeostasis in the brain. Several snRNA-  
192 seq from human AD cortex reveal AD astrocytes alter genes related to cellular stress and metabolic  
193 reprogramming genes related to cell stress (e.g., *CIRBP*, *CABLES*, *CSRPI*)<sup>7-9</sup>, as well as many genes



194 related to the structural remodeling of the astrocytic cytoskeleton (e.g., *GFAP*)<sup>7-9</sup> and extracellular matrix  
195 (e.g., the versican gene *VCAN* and integrin genes *ITGB8* and *ITGB4*)<sup>7-9</sup>. Upregulation of *GFAP* in AD  
196 astrocytes is also observed across several snRNA-seq datasets from AD patients<sup>7-9</sup> and 5XFAD mouse  
197 hippocampus<sup>86</sup>, which may contribute to clinically relevant biomarkers (**Box 3**). Given that astrocytes  
198 critically respond to and regulate the inflammatory state of the brain following injury and neurodegeneration,  
199 potentially in a region-specific manner<sup>84</sup>, these findings highlight transcriptional underpinnings of astrocytic  
200 metabolic reprogramming in AD.

201  
202 Many dysregulated pathways in AD astrocytes converge on lipid signaling (e.g., *PLCE1*, which encodes a  
203 phospholipase, and apolipoprotein family genes)<sup>7-9</sup>. Genes related to lipid synthesis and transport (e.g.,  
204 *LDLR*)<sup>8</sup> are perturbed in AD astrocytes<sup>7-9</sup>. Metabolic reprogramming in AD astrocytes may contribute to  
205 impaired capacity to regulate neuronal circuits. One study showed that astrocytes break down cytotoxic  
206 fatty acids secreted by hyperactive neurons<sup>87</sup>. Lipid-associated pathways are dysregulated in disease-  
207 associated astrocytes from 5XFAD mouse hippocampus, including those in cholesterol pathways<sup>86</sup>,  
208 recapitulating aspects of AD astrocyte dysfunction in humans related to transport and storage in lipid  
209 droplets, and detoxification of reactive oxygen species (e.g., *SOD2*)<sup>9</sup>. Removing astrocytic *APOE4* in mice  
210 decreases disease-associated transcriptional signatures across multiple cell types and protects against  
211 tau-mediated neurodegeneration<sup>88</sup>. These findings suggest lipid-related signaling networks in astrocytes  
212 may represent a core perturbation in AD.

213  
214 *Dysfunctional synaptic communication in AD astrocytes.* Astrocytes facilitate neurotransmitter shuttling and  
215 synaptic trophic support. Several snRNA-seq from human patients reveal AD astrocytes alter genes related  
216 to glutamate receptor subunits (e.g., *GRIA2*, *GRM3*, *GRID2*)<sup>7,8,13,86</sup>. Gap junctions and potassium handling  
217 in astrocytes critically support neural function, and several snRNA-seq studies from human AD patients  
218 reveal genes related to gap junctions (e.g., upregulation of *GJA1*, which encodes the major astrocytic gap  
219 junction component connexin 43)<sup>8</sup> and ion transporters (e.g., downregulation of *KCNIP4*)<sup>7-9</sup> are  
220 dysregulated in AD astrocytes. Collectively, these transcriptional changes highlight molecular pathways  
221 dysregulated in astrocytes governing extracellular ion homeostasis and neuronal function.

222

223 To gain insight into the molecular basis driving transitions between astrocytic cell states, several groups  
224 have analyzed transcription factor expression profiles. The transcription factor AEBP1, a coactivator of the  
225 master immune signaling regulator NFκB, may regulate AD-related state transitions in astrocytes<sup>7</sup>. The  
226 master lysosomal regulator *TFEB* was upregulated in astrocytes in AD patients<sup>7,8</sup>, and given the importance  
227 of TFEB to lysosomal pathways<sup>89</sup>, dysfunction in intracellular lipid related processes may represent a key  
228 driver of AD related dysfunction<sup>7</sup>. Several genes overlap between AD microglia and astrocytes (e.g., *CTSB*,  
229 *CTSD*, and *APOE*)<sup>90</sup>, potentially suggesting a common glial inflammatory milieu may emerge in AD  
230 including weakened metabolic coordination with neurons<sup>9</sup>. The complex, bidirectional inflammatory milieu  
231 generated by astrocytes and microglia (and shared in part likely is shared by oligodendrocyte related cells),  
232 collectively may regulate neuronal function. Dysfunction in secreted cytokines and lipid related trafficking  
233 may represent a functionally redundant glial response to AD pathology. For example, the metabolic shift in  
234 microglia highlighted above may be shared in part by AD astrocytes, which modulate genes involved in cell  
235 growth and signal transduction. These changes collectively highlight common lipid- and immune-related  
236 signaling pathways shared across major cell types in AD.

237

238 **Oligodendrocytes.** Single cell transcriptomics from mouse<sup>91</sup> and human brain<sup>92,93</sup> reflect the highly  
239 heterogeneous nature of oligodendrocytes. Molecular programs perturbed in AD oligodendrocytes reflect  
240 alterations in the diverse functional repertoire of these cells, including myelination, sensing neural activity,  
241 and immune function<sup>7-9,13,14,18</sup> (**Figure 6**).

242

243 Deficits in white matter volume and myelination rates are well appreciated in AD<sup>94</sup>. Many myelin related  
244 genes are perturbed in AD oligodendrocytes, such as upregulation of *LINGO1*<sup>7,8</sup> (a negative regulator of  
245 myelination, which is also upregulated in AD excitatory neurons) and downregulation of *CNTN2* and  
246 *OPALIN* (genes thought to regulate axon homeostasis)<sup>14</sup>. Genes involved in myelin production are altered  
247 in oligodendrocytes early in AD, including genes for enzymes related to fundamental cellular building blocks  
248 (e.g., *CERS2*<sup>8</sup>, *CARNS1*<sup>7-9</sup>, and *QDPR*<sup>7-9</sup>, which encode genes important for the processing of molecules  
249 important for white matter integrity) and myelination itself (such as *PLP1*, *OLIG1*, and *MBP*)<sup>8</sup>. Several

250 studies from human brain also highlight alterations in genes for lipid transport, including genes related to  
251 apolipoproteins and lipid receptors (e.g., *ABCA6*, *LRP1*, *LDLRAD4*)<sup>7-9</sup>, lysosome function (e.g., *LAMP1*)<sup>8</sup>,  
252 and solute carriers (e.g., *SLC38A2*, *SLC5A11*)<sup>7-9</sup>. These findings highlight cellular pathways related to  
253 biosynthetic processes and lipid handling converge on myelin synthesis, and may explain in part how  
254 oligodendrocyte dysfunction contributes to deficits in the structure and plasticity of myelination in AD.

255

256 Myelination is a highly regulated and dynamic process that may be specific for anatomically distinct neural  
257 circuits<sup>95,96</sup>. The plasticity of myelin may relate to the capacity of oligodendrocytes to sense neural activity,  
258 such as the sensory experience-dependent myelination remodeling on parvalbumin inhibitory interneurons  
259 but not on excitatory callosal projection neurons<sup>97</sup>. snRNA-seq suggests AD oligodendrocytes modulate  
260 genes related to ion channels (e.g., *KCNH8*)<sup>7-9</sup> and glutamate receptor subunits (e.g., *GRM3*,  
261 *GRID2*)<sup>7,8,13,14</sup>. These findings suggest AD oligodendrocytes may exhibit impaired capacity to sense and  
262 regulate neural activity. Memory preservation is thought to require new myelin formation<sup>98</sup>, so impaired  
263 oligodendrocyte capacity to adaptively monitor neural activity and facilitate myelin remodeling may govern  
264 cognitive decline in AD.

265

266 *Oligodendroglial immune and vascular functions.* Studies in mice reveal antigen processing and  
267 presentation capabilities of oligodendrocytes<sup>92,99</sup>, and AD oligodendrocytes modulate genes related to  
268 MHC-I and MHC-II<sup>8</sup>. Many other immune pathways are perturbed in AD, including interferon response and  
269 inflammation (e.g., *CD63* and *IRF2*, which are involved in the activation of immune cells)<sup>13</sup>.  
270 Oligodendrocytes display major transcriptomic alterations in 5XFAD mice<sup>100</sup>. Reactive oligodendrocytes  
271 marked by *Serpina3n+ C4b+* in plaque bearing regions of 5XFAD mice are thought to emerge in a TREM2-  
272 dependent manner<sup>9</sup>. Oligodendrocytes may also respond to<sup>101</sup> and participate in<sup>102</sup> blood-brain barrier  
273 integrity by secreting growth factors that regulate vascular cell function (e.g., PDGF signaling, which is  
274 thought to regulate vascular function, is dysregulated AD oligodendrocytes<sup>8</sup>). Oligodendrocytes also  
275 support extracellular matrix remodeling, a critical factor in remyelination, and AD oligodendrocytes  
276 modulate genes related to collagens, laminins, and chondrotins<sup>8</sup>. Some of these changes may reflect injury

277 related to white matter injury, a common clinical finding in AD. Collectively, these findings highlight  
278 heterogeneous molecular programs adopted by AD oligodendrocytes.

279

280 *Oligodendrocyte precursor cells (OPCs)*. OPCs are distributed throughout grey and white matter. snRNA-  
281 seq reveals heterogeneous subtypes of OPCs in mouse<sup>91,103,104</sup> and in the human cortex<sup>105,106</sup>. OPCs  
282 regulate neural activity and harbor immune and vascular related function, and snRNA-seq reflects  
283 alterations in OPC state perturbations in these processes. For example, several snRNA-seq studies from  
284 human subjects indicate AD OPCs downregulate genes for ion channels (e.g., *KCNIP1*, *CACNA1D*)<sup>7,8</sup>, and  
285 may alter genes encoding neurotransmitter receptors (e.g., *GALR1*)<sup>7,8</sup>, glutamate receptors (e.g., *GRIA2*)<sup>9</sup>,  
286 and synaptic genes (e.g., *SNAP25*)<sup>8</sup>. Like oligodendrocytes, OPCs are thought to dynamically sense and  
287 modulate neural activity<sup>107</sup>. Transcriptional findings highlighting OPC modulation of genes related to voltage  
288 gated ion channels suggest OPCs may harbor altered capacity to sense neural networks, which may  
289 explain in part dysfunction in adaptive myelination and neuronal integrity in AD. OPCs modulate immune  
290 related genes (e.g., *IFIT1*)<sup>13</sup>, highlighting a potential role for inflammation and immune mechanisms in OPC  
291 mediated dysfunction in AD. Oligodendrocyte differentiation is partly dependent on *OLIG1*, which is  
292 upregulated in AD OPCs<sup>8</sup>, supporting a role for alterations in the dynamic reprogramming of OPC fate that  
293 may be responsible for oligodendrocyte alterations in AD. OPCs with DNA damage may alter their  
294 differentiation programs, and, notably, amyloid itself is thought to induce senescence in OPCs, which can  
295 be reversed by senolytic treatment<sup>108</sup>.

296

297 **Vascular cells.** Alterations in vascular function critical contribute to brain homeostasis, and reduced blood  
298 flow may emerge early in AD<sup>109</sup>. snRNA-seq has provided molecular definitions of functionally distinct  
299 vascular cells in mouse<sup>71,110–113</sup> and human brain<sup>114–117</sup>. These studies suggest vascular cells in AD have  
300 altered immune signaling, neurovascular coupling, and permeability<sup>14,116</sup>.

301

302 Brain endothelial cells control the movement of ions, molecules, and cells between the blood and the  
303 parenchyma, a constellation of properties collectively referred to as the blood brain barrier (BBB)<sup>118</sup>.

304 snRNA-seq from AD patients reveal transcriptional perturbations in many BBB processes, including

305 alterations in tight junctions (e.g., *CLDN5*), solute transporters (e.g., *SLC2A1*), and adhesion  
306 molecules<sup>14,116</sup>. In endothelial cells of APP/PS1 mice, mNat1, a regulator of insulin sensitivity, was found to  
307 govern endothelial cell necroptosis<sup>119</sup>.

308

309 Pericytes reside in the basement membrane and wrap around capillaries. Pericytes express genes involved  
310 in actomyosin contraction<sup>71</sup>, consistent with functional evidence suggesting pericyte contractility controls  
311 vascular dynamics (e.g., by controlling blood flow at capillary junctions<sup>120</sup> and regulating basal capillary  
312 diameters<sup>121</sup>), which may contribute to AD related hypoperfusion<sup>122</sup>. Human hippocampal pericytes from  
313 *APOE4* carriers elevate expression of *NFAT*, and modulating *NFAT* through calcineurin signaling reduces  
314 *APOE* expression and ameliorates amyloid deposition *NFAT*<sup>123</sup>. Mice with targeted expression of *APOE4*  
315 in vascular mural cells modulate the transcriptome of many cells, particularly astrocytes<sup>124</sup>. Collectively,  
316 these studies provide transcriptomic evidence for observations related to pericyte dysfunction in vascular  
317 dysfunction in AD related to neurovascular coupling and BBB integrity.

318

### 319 **Future Directions**

320 Single cell profiling reveals cell-type specific alterations in AD, and highlights core signaling pathways that  
321 are dysfunctional across cell types. Combining genetic information with other metrics of cellular functions  
322 will enhance our understanding of AD alterations in distinct cell types (**Figure 7**). For example, preserving  
323 anatomical information using spatial transcriptomics may generate insight into the anatomical progression  
324 of AD and define distinct neuronal projections susceptible to AD dysfunction. Expanding patient samples  
325 to resolve contributions from sex, race/ethnicity<sup>125,126</sup>, genetic risk variants, and factors such as education,  
326 sleep, and exercise habits, will further enhance our understanding of the cellular phenotypes driving  
327 memory decline in AD patients. Existing datasets must be integrated and made easily shareable to expand  
328 the heterogeneity of AD response and to define concordant gene expression changes across studies.  
329 Further defining how human molecular signatures are recapitulated in mouse models and cell culture  
330 preparations will lead to new experimental opportunities to dissect disease mechanisms.

331

332 Further characterizing distinct neuronal microcircuits and cell types that become dysfunctional in AD—and  
333 defining which cell states contribute to CSF and plasma biomarkers—may lead to new frameworks to define  
334 cellular substrates of AD progression. By identifying vulnerable cell types and the molecular programs that  
335 give rise to them, therapeutic interventions might reverse aberrant cellular trajectories. While many  
336 transcriptional alterations cell type specific, these changes ultimately might converge on shared signaling  
337 pathways across cell types that might represent targets for new therapeutic strategies.

338

### 339 **Conclusion**

340 Single cell profiling facilitates a nuanced portrait of the diverse cellular processes perturbed in the AD brain.  
341 These varied molecular programs help explain the divergence between healthy aging and cognitive decline,  
342 and highlight cell-type specific molecular programs involved in AD. Core signaling modules are disrupted  
343 across multiple cell types, and manipulating disrupted cellular states will pave the way for new therapeutic  
344 opportunities.

345 **Acknowledgements**

346 We are grateful to Hansruedi Mathys, Manolis Kellis and all members of his lab, and all members of the  
347 Tsai lab for insightful discussions. We thank the following individuals for valuable discussions and helpful  
348 feedback on this manuscript: Matheus Victor, Jay Penney, Emily Niederst, Leyla Akay, Djuna von Maydell,  
349 Ping-Chieh Pao, Lorenzo Bozzelli, Adele Bubnys, Gwyneth Welch, Dong-Shin Park, and Julia Maeve  
350 Bonner. L-H.T. acknowledges NIH R01AT011460-01 and NIH R37-NS051874-2. We thank the JPB  
351 Foundation, the Belfer Neurodegeneration Consortium, the Glenn Foundation for Medical Research, the  
352 Cure Alzheimer's Fund and the Alana Foundation. We gratefully acknowledge generous support from the  
353 following individuals and institutions: Robert A. and Renee Belfer, the Ko Hahn family, the Carol and Gene  
354 Ludwig Family Foundation, the Halis Family Foundation, Lester A. Gimpelson, the Dolby family, Jay L. and  
355 Carroll D. Miller, David B. Emmes, the Marc Haas Foundation.

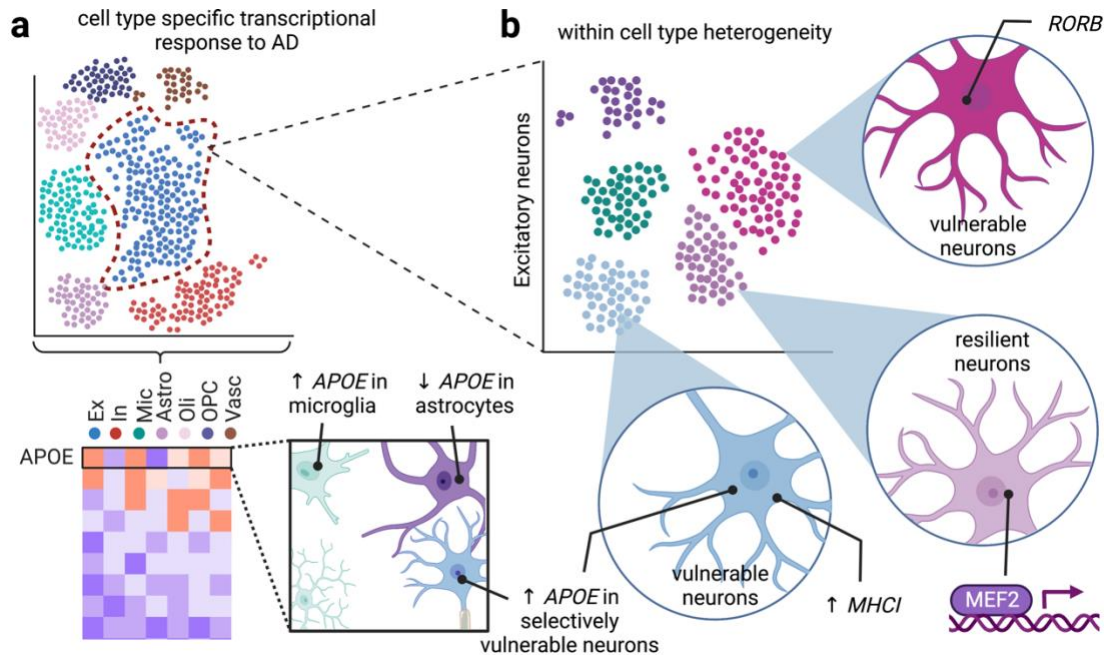
356  
357 All figures were created with BioRender.

358  
359 **Author contributions**

360 M.H.M. and L-H.T. conceived the original idea and wrote the paper.

361  
362 **Competing interests**

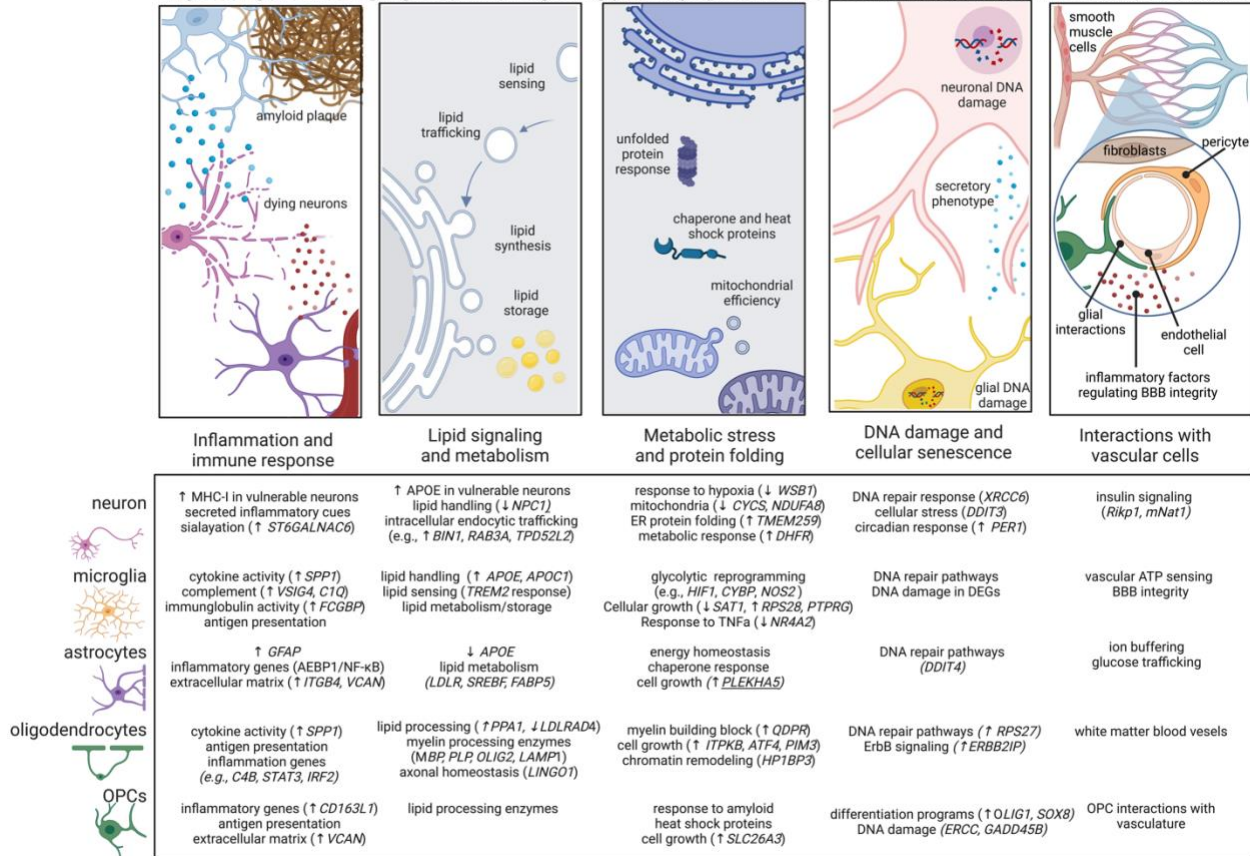
363 The authors declare no competing interests related to this project.



364  
 365 **Figure 1: Overview of central advantages of single cell approaches for the study of AD.** Single cell  
 366 approaches highlight cell type and cell subtype specific vulnerability to disease. **(a)** *Cell type specific*  
 367 *responses to disease.* Bulk quantifications of gene expression report population averages, which belie  
 368 changes from specific cell populations that may drive distinct pathological responses. For example, snRNA-  
 369 seq revealed that *APOE* is downregulated in AD astrocytes but upregulated in microglia<sup>7,8</sup> and some  
 370 neurons<sup>20</sup>. **(b)** *Cell subtype responses to disease.* Bulk profiling based on cell type markers might mask  
 371 within-cell type heterogeneity, such as layer-specific neurons, non-myelinating oligodendrocytes. In  
 372 contrast, single cell profiling unmasks differential vulnerabilities to AD within distinct subsets of major cell  
 373 types. For example, neurons selectively vulnerable to AD neurodegeneration are marked by *RORB*<sup>18</sup> and  
 374 elevated *APOE*/*MHC-I* signaling<sup>20</sup>, and neurons resilient to AD pathology are enriched in *MEF2*<sup>19</sup>.  
 375



Single cell genomics highlight common signaling pathways perturbed across multiple cell types in Alzheimer's disease



**Figure 2. Shared cellular pathways disturbed in AD as revealed by single cell genomics.**

Differentially expressed genes across cell types are related to shared signaling motifs. Identifying common disrupted pathways may uncover core nodes of perturbation and lead to new therapeutic interventions related to multiple cells. Below we highlight common cellular pathways that are disrupted across multiple cell types in AD. Arrows denote transcriptional directions from prefrontal cortex<sup>8</sup> (up arrow means up in AD compared to non-AD) and with a focus on genes showing concordant expression changes from other datasets and brain regions as highlighted in the text.

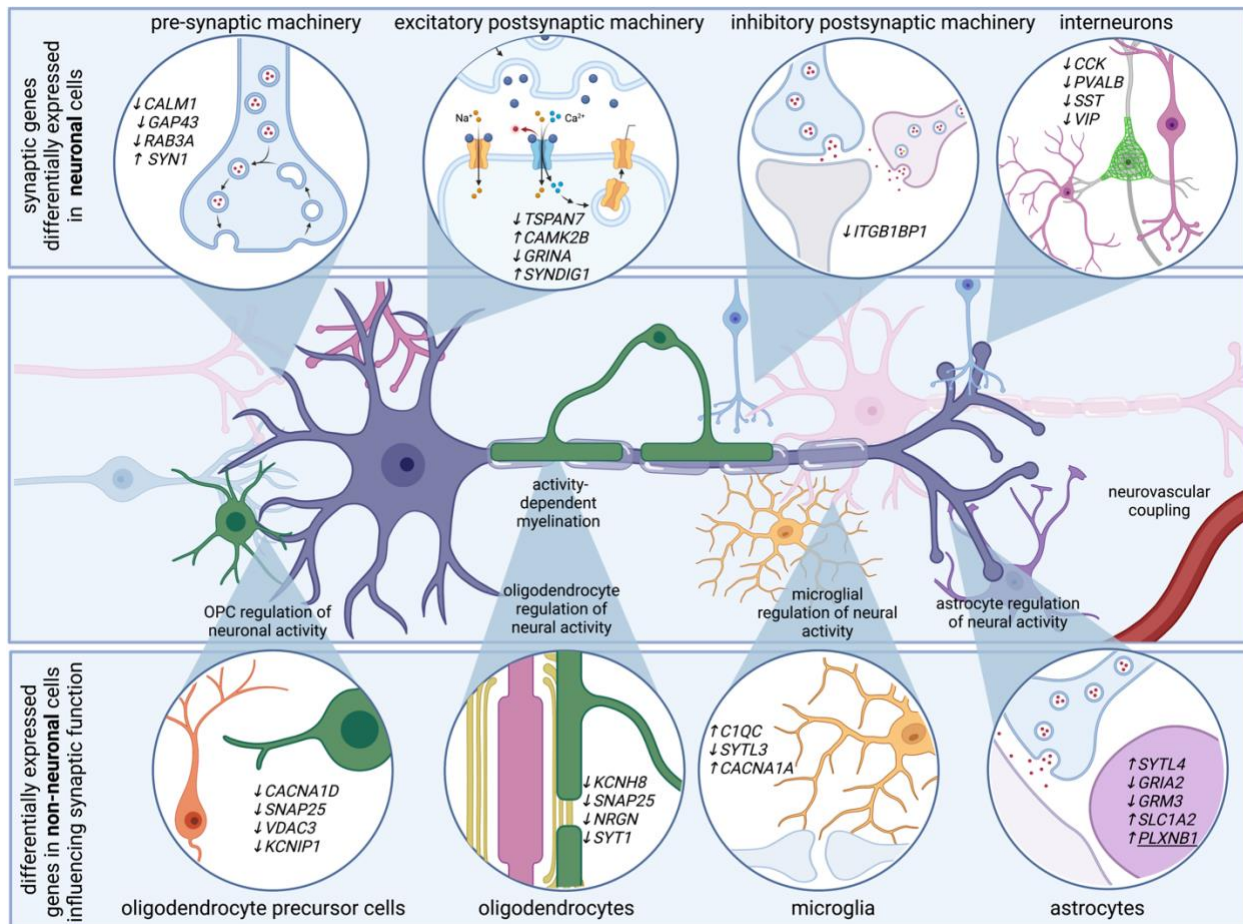
•**Immune signaling.** Nearly every cell type generates immune responses in AD, including transcriptional responses related to cytokine, chemokine, and MHC signaling. MHC signaling may related to synaptic plasticity and the unfolded protein response. The low-grade AD-related inflammation in every cell type associated with AD may be associated with metabolic reprogramming.

•**Lipid handling.** Lipid signaling is crucial for many cell functions, such as sensing and shuttling lipid species and to accommodate the dynamic remodeling of plasma membrane required for the structural plasticity of dendritic spines, microglial processes, astrocytic endfeet, and nodes of Ranvier. Perturbed lipid signaling in many brain cell types in AD, underscore the importance of lipid signaling and metabolism.

•**Unfolded protein response.** Nearly every major cell type modulates protein misfolding pathways and integrated stress responses, and, related, mitochondrial function, highlighting energetic disruptions in AD cells. These findings suggest the milieu of the AD brain affects unfolded protein response and cellular stress even in cells not directly burdened by pathology.

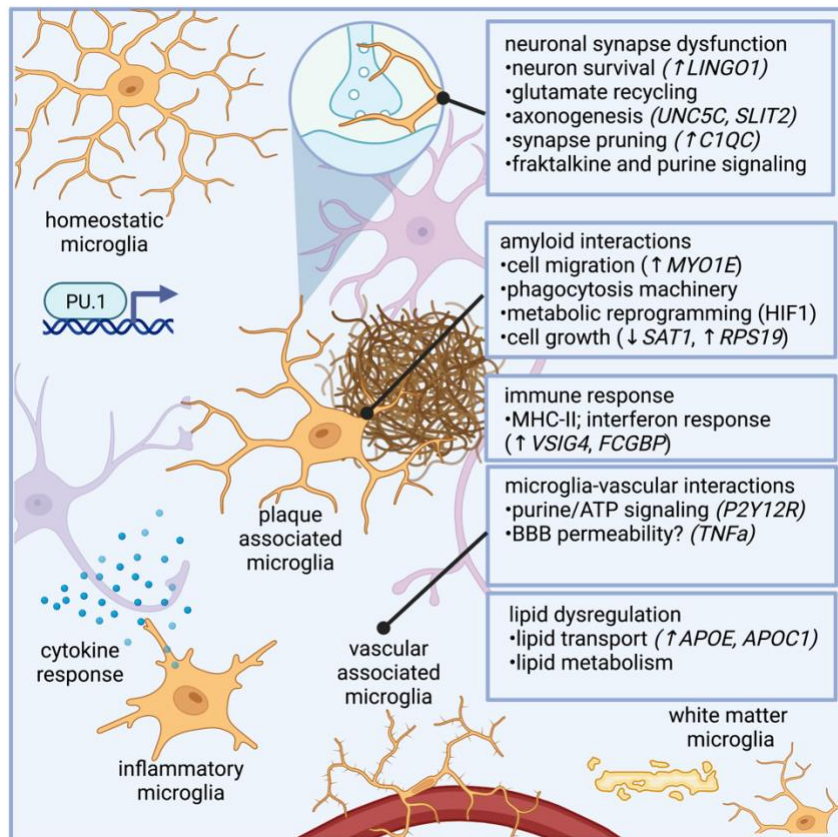
•**DNA damage and cellular senescence.** DNA damage in neurons is associated with aging and is elevated in neurodegeneration<sup>23</sup>, DNA damage is essential for the expression of learning related immediate early gene expression<sup>27</sup>. Many cells in AD have impaired DNA repair enzyme pathways, potentially suggesting senescent state and loss of core cellular functions.

•**Vascular interactions.** Recent studies are beginning to profile the complex network of vascular cells in AD. Existing datasets highlight signaling pathways perturbed across multiple brain cell types relating to neurovascular coupling and BBB dysfunction in AD, including the cell-type specific secretion of inflammatory molecules known to regulate vascular cells.



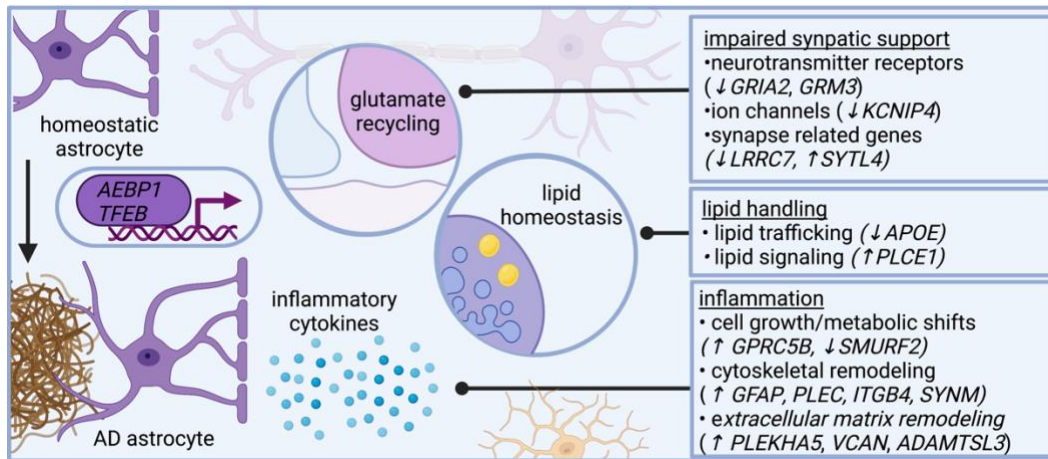
404  
405  
406  
407  
408  
409  
410  
411  
412  
413  
414  
415  
416  
417  
418  
419  
420

**Figure 3. Single cell genomics reveal cell type specific perturbations in sensing and regulating neural activity in AD.** Neurons account for the vast majority of differentially expressed genes in AD. Genes related to pre-synaptic, post-synaptic, and inhibitory synaptic machinery emerge in single transcriptomes of AD neurons. For example, AD neurons upregulate *SYN1*, a gene that encodes synapsin 1, critical for synaptic vesicle function, and downregulate *TSPAN7*, which encodes a tetraspanin thought to regulate post-synaptic dendritic spine structure. Transcriptional programs associated with altered electrical properties may be associated with neuronal vulnerability to AD. Additionally, non-neuronal cells modulate genes that are involved in synaptic function. For example, genes related to synaptotagmin related genes are differentially expressed in astrocytes, oligodendrocytes, oligodendrocyte precursor cells, and microglia. Several differentially expressed genes in non-neuronal cells converge on pathways that ultimately influence neuronal function, such as genes related to synaptic pruning and activity-dependent ion channels. For example, voltage gated ion channels, which might help non-neuronal cells sense neuronal activity, are also modulated in multiple cell types. These highlight how many brain cell types are involved in sensing and regulating neural activity, and suggest neural circuit dysfunction in AD is likely the consequence of multi-cellular signaling cascades.



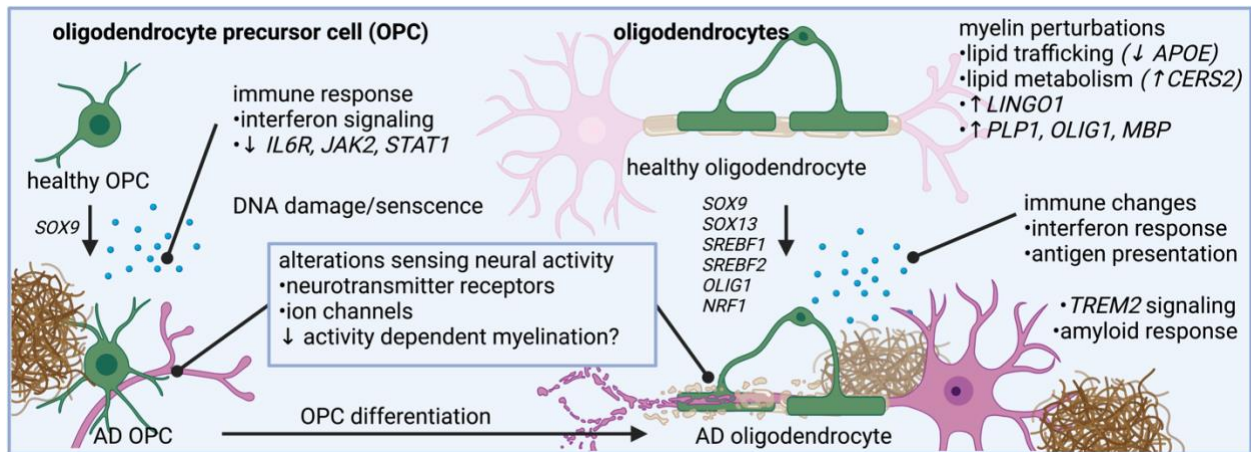
421  
 422 **Figure 4: Molecular programs adopted in AD microglia revealed by single cell genomics.** Microglia  
 423 dysfunction in AD modulate genes related to synapse function, phagocytosis, and immune response.  
 424 Microglia regulate genes involved in myelination, such as *LINGO1*, a negative regulator of myelination, as  
 425 well as genes involved in axonogenesis (e.g., *UNC5C* and *SLIT2*). AD microglia also modulate complement  
 426 related genes, such as *C1QC*, which regulate synaptic pruning. Microglia harbor properties associated with  
 427 phagocytosis, and microglial response to amyloid has been well characterized, and genes in AD microglia  
 428 potentially related to amyloid response include those related to microglial plaque clustering phenotypes,  
 429 such as cell migration (e.g., *MYO1E*, which encodes a gene related to myosin), as well as genes involved  
 430 in metabolic reprogramming and cell growth (e.g., *SAT1*, which encodes an acetyltransferase, and *RPS19*,  
 431 a ribosomal subunit). As the innate immune cells of the brain, microglia are intimately involved in immune  
 432 response, and several differentially expressed genes in AD microglia are involved in immune response,  
 433 such as *VSIG4* and *FCGBP*, genes involved in immunoglobulin response. *TREM2* is a lipid receptor that is  
 434 thought to govern microglia transitions to disease-associated states<sup>9,49</sup>. Subtypes of microglia that regulate  
 435 plaques are marked by *Hif1a* in 5XFAD mice, which is associated with metabolic reprogramming in human  
 436 AD microglia.  
 437





438  
 439 **Figure 5. Molecular programs adopted in AD astrocytes revealed by single cell genomics.** Several  
 440 lines of evidence suggest astrocytes in AD become inflammatory and impair neural circuit function,  
 441 including plaque-associated barriers, and modulating lipid-related signaling networks. Single cell  
 442 genomics shed additional insight on these pathways and reveals astrocytes in AD modulate genes  
 443 related to neurotransmitter recycling, inflammatory response, and lipid metabolism. AD dysregulates  
 444 astrocytic genes involved in neurotransmitter receptors (such as *GRIA2* and *GRM3*, which encode  
 445 subunits of glutamate receptors), ion channels (such as *KCNIP4*, which encodes a protein that interacts  
 446 with voltage-gated potassium channels), and even genes involved in synapses (such as *LRRC7*, which  
 447 encodes a component of the post synaptic density of excitatory synapses, and *SYTL4*, which encodes a  
 448 synaptotagmin). AD astrocytes also modulate genes involved in lipid metabolism, including *APOE* and  
 449 *PLCE1*, which encodes a phospholipase. Several astrocytic genes differentially expressed in AD relate to  
 450 cytoskeletal remodeling, including *GFAP* (which encodes an intermediate filament), *PLEC* (which  
 451 encodes plectin, a protein that interacts with intermediate filaments), *SYNM* (which encodes another  
 452 intermediate filament), and *ITGB4* (which encodes an integrin). AD astrocytes modify genes involved in  
 453 cell growth, such as *SMURF2* (a member of the SMAD family important for cell growth). Collectively,  
 454 these transcriptional changes highlight signaling pathways altered in AD astrocytes.  
 455

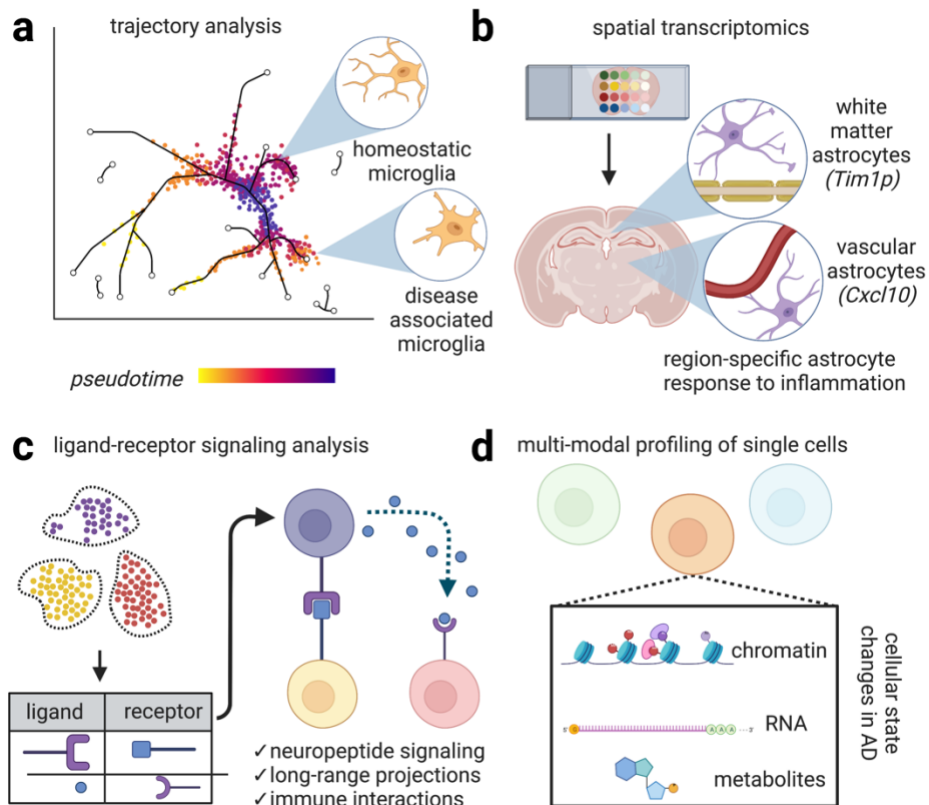
456



457  
458  
459  
460  
461  
462

**Figure 6. Molecular programs adopted in AD oligodendroglia revealed by single cell genomics.**

Oligodendrocytes in AD have altered pathways related to myelin synthesis, lipid trafficking, lipid metabolism, and immune related changes. Oligodendrocyte precursor cells also changes expression of genes related to neurotransmitter sensing and immune response.



464  
465  
466  
467  
468  
469  
470  
471  
472  
473  
474  
475  
476  
477  
478  
479  
480  
481  
482  
483  
484  
485  
486  
487

### Figure 7. Emerging methods to interrogate single cell profiles in AD.

Emerging methods in single cell profiling will enhance our understanding of the distinct cellular signaling networks perturbed in AD. **(a)** Genetic analysis of single cells potentially enables the construction of dynamical cellular models according to “pseudotime,” a quantitative measure of biological progression through a cellular process. Applying these models to AD potentially enables the trajectory of distinct cell types adopting new transcriptional states relating to disease progression, progression of microglia from homeostatic states to disease-associated states<sup>52</sup>. **(b)** Spatial transcriptomics is an umbrella term referring to techniques that combine mRNA readouts with spatial information. For example, one study revealed reactive subsets of astrocytes occupy distinct anatomical locations, such one astrocyte population lining white matter tracts that express the matrix metalloprotease inhibitor *Tim1p*, which has been shown to be involved in amyloid response and has been shown to drive oligodendrocyte production and myelination and another astrocyte population marked by the cytokine *Cxcl10*+ adjacent to blood vessels<sup>84</sup>. Preserving spatial information while performing single cell profiling will likely further enhance our understanding of the molecular mechanisms driving AD. **(c)** Ligand-receptor signaling involves predicting signaling interactions based on ligand/receptor databases. This analysis has revealed, for example, dense peptidergic intracortical signaling networks<sup>44</sup>. Expanding our understanding of cellular physical and signaling interactions between brain cells with enhanced methods of examining these interaction networks will undoubtedly yield important insight into the progression of signaling networks in AD. **(d)** Multi-modal profiling of single cells to simultaneously chromatin, RNA, and potentially metabolites are emerging methods. These studies have revealed additional levels of regulation in distinct cell types in AD<sup>77</sup>. Combined with enhanced sequencing depth, these methods will generate a richer portrait of cellular function in neurodegeneration.

488  
489

Table 1. Single-cell transcriptomic and epigenetic datasets from post-mortem AD tissue.

◆ signifies particularly noteworthy study

Study	Data ID	Patient cohort	Brain region	Sequencing strategy	Total nuclei
◆ Mathys <sup>8</sup>	syn18485175	48	PFC (BA10)	snRNA-seq	80,660
Davila <sup>13</sup>	N/A	112	Hippocampus	snRNA-seq	489,558
			Entorhinal cortex		
◆ Grubman <sup>7</sup>	GSE138852	12	Entorhinal cortex	snRNA-seq	13,214
◆ Leng <sup>18</sup>	GSE147528	10	Caudal entorhinal cortex	snRNA-seq	42,528
			Superior frontal gyrus	snRNA-seq	63,608
Zhou <sup>9</sup>	syn21125841	32	Dorsolateral prefrontal cortex	snRNA-seq	66,311
Lau <sup>14</sup>	GSE157827	21	PFC (BA6, BA8, and BA9)	snRNA-seq	169,496
Otero-Garcia <sup>12</sup>	GSE129308	8	Prefrontal cortex (BA9)	AT8 and MAP2 FACS	63,110
Alsema <sup>127</sup>	GSE146639	27	superior parietal lobe superior frontal gyrus	CD11/CD45 FACS; bc-Smart-seq2	
Marinero <sup>128</sup>	N/A	12	PFC (BA9)	FACS neurons and glia; snRNA-seq	89,325
◆ Yang <sup>116</sup>	GSE163577	17	hippocampus	Vascular enriched fraction then snRNA- seq	143,793
		8	superior frontal cortex		
Gerrits <sup>129</sup>	GSE148822	18	occipitotemporal cortex and fusiform gyrus	NEUN/OLIG2 FACS, then snRNA- seq	482,472 nuclei
Del-Aguila <sup>130</sup>	<a href="http://ngi.pub/snu">http://ngi.pub/snu</a> cIRNA-seq/	3	Parietal lobe	snRNA-seq	26,331
Olah <sup>131</sup>		14	dorsolateral prefrontal cortex	CD11b+/CD45+, snRNA-seq	16,242
		3	TNC		
◆ Morabito <sup>77</sup>	syn3219045	20	PFC	snATAC-seq and snRNA-seq	191,890
Xu <sup>132</sup>	GSE181279	5	PBMCs	CD45 selection, then TCR-seq	36,849
Gate <sup>133</sup>	GSE134578	18	peripheral CD8+ TEMRA; CSF cells	TCR-seq	21,267
Smith <sup>134</sup>	GSE160936	12	entorhinal and somatosensory cortex	NEUN-/SOX10-	52,706 astrocytes and 27,592 microglia

490

491 Box 1. Considerations related to interpreting single cell data for the study of Alzheimer's disease.  
492

493 *AD classification.* Assigning AD status is nontrivial because some individuals bearing AD pathology are  
494 cognitively normal, while some individuals clinically diagnosed with AD are found to not harbor AD  
495 pathology<sup>19</sup>. Variants in genetic risk factors such as APOE or TREM2<sup>9</sup> generate pleiotropic molecular  
496 effects. These factors underscore the importance of considering AD classification in profiling patient  
497 samples and interpreting single cell data.  
498

499 *Patient selection.* Sex is a critical consideration in patient selection, as sex-specific AD associations have  
500 emerged in single cell profiling<sup>8</sup>. Additionally, racial and ethnic factors may be associated with differential  
501 AD risk<sup>125,126</sup>, but these potential differences driving AD susceptibility are poorly understood at the single  
502 cell level. Many other confounds, including education, diet, sleep patterns, and exercise habits are known  
503 to generate epidemiological effects on AD risk and therefore may affect conclusions from single cell  
504 profiling—and may confer a tractable opportunity to define underpinnings of AD vulnerability.  
505

506 *Brain region.* The anatomical routes AD pathology progresses through the brain are incompletely  
507 understood. Single cell studies are beginning to unravel this complexity by examining multiple brain regions,  
508 and spatial transcriptomics is facilitating insight into brain-wide transcriptional modules associated with AD  
509 dysfunction.  
510

511 *Single cell preparations.* Archived brain tissue often suffers from compromised structural integrity,  
512 complicating efforts to purify whole cells, so most studies of human tissue rely on nuclei purification<sup>135</sup>.  
513 However, single nuclei preparations of microglia may not capture many AD-associated microglial genes  
514 that are observed in single soma preparations<sup>136</sup>, and cytoplasmic mRNA may be lost in many other cell  
515 types. Additionally, debris related to single cell preparations following nuclei purification can complicate  
516 downstream analyses; while sorting nuclei by FACS prior to loading cells may remove some debris, stress-  
517 associated artifacts from cell sorting may confound some analyses.  
518

519 *Tissue preparation.* Enzymatic dissociation induces stress-related transcriptional changes in microglia, and  
520 a cocktail of transcription/translation inhibitors (actinomycin D, anisomycin, and triptolide) are thought to  
521 prevent dissociation related transcriptional responses<sup>137</sup>. Differences in single cell preparations between  
522 experimenters may further bias the enrichment of certain cell types, which may explain differences in  
523 proportions in brain cell types across datasets. Furthermore, some cell types evade certain preparations.  
524 For example, many vascular cells resist single cell dissociation protocols, which may account for their low  
525 yields in most datasets, and strainer-based methods to capture intact blood vessels helps enrich vascular  
526 segments for single cell analysis<sup>116</sup>.  
527

528 *Computational analysis.* Quality filtering, such as metrics of cell health (e.g., number of mitochondrial genes  
529 in nuclei datasets) and feature selection (e.g., number of genes detected, which can be a proxy for  
530 doublets), can affect downstream conclusions. Additionally, clustering resolution to define cell types can be  
531 highly dependent on individual experiments, and individual clustering algorithms can require user-defined  
532 parameters. Differential gene expression analysis is also highly variable, reinforcing the importance of  
533 biological validation. As sample sizes increase, batch correction and data integration across multiple  
534 datasets presents several statistical challenges. Thus, harmonizing single cell datasets may be essential  
535 to generate biological insight across analytical methods and tissue preparation protocols.  
536

537 *Genomic programs and biological function.* AD-specific transcriptional differences may not reflect biological  
538 differences, partly because gene transcripts may not generate differences in protein levels owing to multiple  
539 levels of regulation. Furthermore, non-genomic programs may account for many aspects of AD dysfunction,  
540 including post-translational modifications and mRNA regulation, such as regulation of local protein  
541 synthesis in distinct cellular compartments and cell types, which may not be captured by single cell profiling.  
542



543  
544  
545  
546  
547  
548  
549  
550  
551  
552  
553  
554  
555  
556  
557  
558  
559  
560  
561  
562  
563  
564  
565  
566  
567  
568  
569  
570  
571  
572  
573  
574  
575  
576  
577  
578

Box 2. Cellular identity, cell states, and disease-associated molecular programs

Classifying cell types requires multiple levels of characterization to correlate transcriptional and epigenomic profiles of cellular identity with functional and developmental state<sup>138</sup>. In the study of AD, single cell genomics have provided a great deal of insight into transcriptional alterations in major brain cell types, but how these transcriptional profiles correlate with functional state in AD progression are incompletely understood. Sub-clustering analysis within major cell types often reveals transcriptionally distinct subtypes of cells within the AD brain that may be associated with AD pathology and cognitive dysfunction. Given the functional plasticity of cells, these sub-clusters may represent functionally distinct cell states that emerge in disease. Nevertheless, even neurons not burdened by tau pathology<sup>18</sup> and microglia not directly phagocytosing amyloid plaque<sup>50</sup> modulate genes related to cellular stress and protein folding in AD. These findings highlight the heterogeneity of disease-related molecular programs across and within cell types.

Disease-related molecular signatures may reflect cells sampling a distinct space of their cell identity, and the plasticity of these cell states may reflect the capacity for disease-modifying treatments to return cells to a homeostatic equilibrium. For example, the transcription factor PU.1 is thought to govern aspects of microglial state in AD<sup>77,79</sup>, and modulating PU.1 can alter microglial gene expression<sup>139</sup> in a potentially therapeutically useful manner. Similarly, genes related to neuronal hyperactivity may relate to vulnerability or resilience to degeneration, and targeting neuronal hyperactivity using levetiracetam, an anti-epileptic agent which reduces hyperactivity and improves memory in APP/PS1 mice<sup>140</sup>, may provide benefit for some AD patients<sup>141</sup>. Other efforts have identified molecular regulators of disease-associated states in astrocytes<sup>77,86</sup> and oligodendrocytes<sup>77</sup>. Further defining the molecular regulators of cellular states—and interrogating how therapeutic intervention might target state-related pathways—may advance the treatment of AD.

Single cell transcriptomics reveal downregulation of cell-type specific marker genes for some cell types. For example, microglia, interneurons, and endothelial cells downregulate canonical markers in AD. Impairment of signaling pathways directly encoded by these marker genes may influence neuronal circuits (such as reduced fractalkine and purine signaling in microglia<sup>67,68</sup>, or reduced neuropeptide signaling in interneurons<sup>46</sup>). More broadly, loss of marker genes may indicate the very transcriptional programs governing the identity of distinct cell types is lost in AD, potentially leading to cellular senescence. Accordingly, senolytic treatment, which ameliorates pathology and cognitive impairment in APP/PS1 mice<sup>108</sup> may represent a therapeutic strategy for the treatment of AD<sup>142</sup>.

579  
580  
581  
582  
583  
584  
585  
586  
587  
588  
589  
590  
591  
592  
593  
594  
595  
596  
597  
598  
599  
600  
601  
602  
603  
604  
605  
606  
607  
608  
609  
610  
611  
612  
613  
614  
615  
616  
617  
618  
619  
620  
621  
622  
623  
624  
625

Box 3. Single cell genetics, GWAS risk variants, and AD biomarkers.

Genome-wide association studies (GWAS) have highlighted genetic variants associated with sporadic, late-onset Alzheimer's disease<sup>47,143,144</sup>. Genomic information from single cells facilitates biological insight captured from GWAS studies in several ways:

- Single cell approaches help define which cell types highly express AD risk genes. For example, compared to other brain cell types, microglia are thought to express relatively higher levels of the risk variants *TREM2* and *CD33*<sup>58,145</sup>. The observation that expression of AD risk genes are enriched in immune cells has contributed to the hypothesis that immune mechanisms may play causal roles in AD<sup>47</sup>.

- Distinct cell types differentially modulate the expression of AD risk genes<sup>144</sup>. For example, the risk gene *CNTNAP2*, a neuroxin family gene involved in cell adhesion, is upregulated in late-pathology AD neurons<sup>8</sup> but downregulated in astrocytes<sup>7,8</sup>; *BIN1* is upregulated only in AD excitatory neurons<sup>7,8</sup>; *APOE* is upregulated in microglia<sup>7-9</sup> and vulnerable populations of neurons<sup>20</sup> but downregulated in astrocytes<sup>7-9</sup>. The gene products of these risk variants likely affect many cellular processes in AD. Manipulations of risk variants within certain cells types, such as selective removal of neuronal *APOE4*<sup>146</sup> or astrocytic *APOE4*<sup>88</sup> in mice, highlight how cell type specific expression of risk gene variants governs signaling alterations in AD.

- Mutations in one gene can modify the expression and function of many other genes across many cell types. For example, individuals harboring *APOE4*<sup>123</sup> and *TREM2 R47H*<sup>9</sup> mutations carry differential expression for many genes across many cell types. Single genetic variants, such as 5XFAD mice lacking *Ccr7*<sup>147</sup> or *Trem2*<sup>9</sup>, and *APOE4*-knock in mice<sup>88,148</sup>, generate widespread transcriptional variations in many cell types. Collectively, these findings underscore how single genetic perturbations vastly alter many cell types. Recent *in vitro* studies enable the perturbation of AD risk factors in distinct cell types, such as *APOE* genotype in distinct vascular<sup>123</sup> and glial<sup>149</sup> cell types, which further illustrate how risk variants affect distinct cell types. Single cell studies also suggest highlight expression of genes upstream of GWAS genes. For example, AD astrocytes upregulate of *TFEB*, which is upstream of ten GWAS loci, and which might control astrocytic disease-state transition<sup>7</sup>.

Single cell genomics also generate insight into cell-type specific contributions to AD biomarkers. For example, *CHI3L1*, which encodes chitinase-like protein, a candidate cerebrospinal fluid (CSF) biomarker for preclinical AD, is upregulated in AD microglia<sup>9</sup>. Similarly, AD microglia upregulate *SORL1*<sup>9</sup> and *A2M*<sup>9</sup>, which encode CSF biomarkers, and downregulate *FTH1*<sup>9</sup>, a serum marker. These findings highlight the potentially causal roles of immune mechanisms in AD. AD neurons downregulate *NEFL* and *BDNF*<sup>7,8</sup>, which encode plasma biomarkers. Glial fibrillary acidic protein (GFAP), another biomarker, is upregulated in astrocytes from AD patients<sup>7,8</sup> and 5XFAD mice<sup>50</sup>. These findings showcase how single cell approaches define cell states potentially responsible for AD biomarkers, which may facilitate efforts to define cellular substrates driving distinct clinically distinct subtypes and pathological stages of AD.

Collectively, the overlap between risk variants and single cell genomics provide insight into cell types and signaling pathways that may govern AD progression. Further defining how genetic risk interface with non-genetic factors may further reveal signaling nodes governing AD pathogenesis, potentially informing new therapeutic approaches.

626  
627  
628  
629  
630  
631  
632  
633  
634  
635  
636  
637  
638  
639  
640  
641  
642  
643  
644  
645  
646  
647  
648  
649  
650  
651  
652  
653  
654  
655  
656  
657  
658  
659  
660  
661  
662  
663  
664  
665  
666  
667  
668  
669  
670  
671  
672  
673  
674  
675  
676  
677  
678  
679  
680

References:

1. Yao, Z. *et al.* A transcriptomic and epigenomic cell atlas of the mouse primary motor cortex. *Nature* **598**, 103–110 (2021).
2. Zeisel, A. *et al.* Molecular Architecture of the Mouse Nervous System. *Cell* **174**, 999–1014.e22 (2018).
3. Tasic, B. *et al.* Shared and distinct transcriptomic cell types across neocortical areas. *Nature* **563**, 72–78 (2018).
4. Saunders, A. *et al.* Molecular Diversity and Specializations among the Cells of the Adult Mouse Brain. *Cell* **174**, 1015–1030.e16 (2018).
5. Lake, B. B. *et al.* Neuronal subtypes and diversity revealed by single-nucleus RNA sequencing of the human brain. *Science* **352**, 1586–1590 (2016).
6. Zhong, S. *et al.* A single-cell RNA-seq survey of the developmental landscape of the human prefrontal cortex. *Nature* **555**, 524–528 (2018).
7. Grubman, A. *et al.* A single-cell atlas of entorhinal cortex from individuals with Alzheimer's disease reveals cell-type-specific gene expression regulation. *Nat Neurosci* **22**, 2087–2097 (2019).
8. Mathys, H. *et al.* Single-cell transcriptomic analysis of Alzheimer's disease. *Nature* **570**, 332–337 (2019).
9. Zhou, Y. *et al.* Human and mouse single-nucleus transcriptomics reveal TREM2-dependent and TREM2-independent cellular responses in Alzheimer's disease. *Nat Med* **26**, 131–142 (2020).
10. Villa, K. L. *et al.* Inhibitory synapses are repeatedly assembled and removed at persistent sites in vivo. *Neuron* **89**, 756–769 (2016).
11. Kurucu, H. *et al.* Inhibitory synapse loss and accumulation of amyloid beta in inhibitory presynaptic terminals in Alzheimer's disease. *European Journal of Neurology* **n/a**.
12. Otero-Garcia, M. *et al.* Molecular signatures underlying neurofibrillary tangle susceptibility in Alzheimer's disease. *Neuron* **0**, (2022).
13. Davila-Velderrain, J. *et al.* Single-cell anatomical analysis of human hippocampus and entorhinal cortex uncovers early-stage molecular pathology in Alzheimer's disease. 2021.07.01.450715 <https://www.biorxiv.org/content/10.1101/2021.07.01.450715v1> (2021) doi:10.1101/2021.07.01.450715.
14. Lau, S.-F., Cao, H., Fu, A. K. Y. & Ip, N. Y. Single-nucleus transcriptome analysis reveals dysregulation of angiogenic endothelial cells and neuroprotective glia in Alzheimer's disease. *PNAS* **117**, 25800–25809 (2020).
15. Li, S. & Sheng, Z.-H. Energy matters: presynaptic metabolism and the maintenance of synaptic transmission. *Nat Rev Neurosci* 1–19 (2021) doi:10.1038/s41583-021-00535-8.
16. Cheng, X.-T., Huang, N. & Sheng, Z.-H. Programming axonal mitochondrial maintenance and bioenergetics in neurodegeneration and regeneration. *Neuron* **110**, 1899–1923 (2022).
17. Fu, H. *et al.* A tau homeostasis signature is linked with the cellular and regional vulnerability of excitatory neurons to tau pathology. *Nat Neurosci* **22**, 47–56 (2019).
18. Leng, K. *et al.* Molecular characterization of selectively vulnerable neurons in Alzheimer's disease. *Nat Neurosci* **24**, 276–287 (2021).
19. Barker, S. J. *et al.* MEF2 is a key regulator of cognitive potential and confers resilience to neurodegeneration. *Science Translational Medicine* **13**, eabd7695.
20. Zalocusky, K. A. *et al.* Neuronal ApoE upregulates MHC-I expression to drive selective neurodegeneration in Alzheimer's disease. *Nat Neurosci* **24**, 786–798 (2021).
21. Tiscione, S. A. *et al.* IP3R-driven increases in mitochondrial Ca<sup>2+</sup> promote neuronal death in NPC disease. *PNAS* **118**, (2021).
22. Welch, G. & Tsai, L.-H. Mechanisms of DNA damage-mediated neurotoxicity in neurodegenerative disease. *EMBO Rep* **23**, e54217 (2022).
23. Lodato, M. A. *et al.* Aging and neurodegeneration are associated with increased mutations in single human neurons. *Science* **359**, 555–559 (2018).
24. Zhu, Q., Niu, Y., Gundry, M. & Zong, C. Single-cell damagenome profiling unveils vulnerable genes and functional pathways in human genome toward DNA damage. *Science Advances* **7**, eabf3329.
25. Welch, G. M. *et al.* Neurons burdened by DNA double-strand breaks incite microglia activation through antiviral-like signaling in neurodegeneration. *Sci Adv* **8**, eabo4662 (2022).
26. Wu, W. *et al.* Neuronal enhancers are hotspots for DNA single-strand break repair. *Nature* **593**, 440–444 (2021).

- 681 27. Madabhushi, R. *et al.* Activity-Induced DNA Breaks Govern the Expression of Neuronal Early-  
682 Response Genes. *Cell* **161**, 1592–1605 (2015).
- 683 28. Habib, N. *et al.* Div-Seq: Single-nucleus RNA-Seq reveals dynamics of rare adult newborn  
684 neurons. *Science* **353**, 925–928 (2016).
- 685 29. Hochgerner, H., Zeisel, A., Lönnerberg, P. & Linnarsson, S. Conserved properties of dentate  
686 gyrus neurogenesis across postnatal development revealed by single-cell RNA sequencing. *Nat*  
687 *Neurosci* **21**, 290–299 (2018).
- 688 30. Durante, M. A. *et al.* Single-cell analysis of olfactory neurogenesis and differentiation in adult  
689 humans. *Nat Neurosci* **23**, 323–326 (2020).
- 690 31. Rohrback, S. *et al.* Submegabase copy number variations arise during cerebral cortical  
691 neurogenesis as revealed by single-cell whole-genome sequencing. *PNAS* **115**, 10804–10809 (2018).
- 692 32. Ayhan, F. *et al.* Resolving cellular and molecular diversity along the hippocampal anterior-to-  
693 posterior axis in humans. *Neuron* **109**, 2091–2105.e6 (2021).
- 694 33. Zhou, Y. *et al.* Molecular landscapes of human hippocampal immature neurons across lifespan.  
695 *Nature* **607**, 527–533 (2022).
- 696 34. Franjic, D. *et al.* Transcriptomic taxonomy and neurogenic trajectories of adult human, macaque,  
697 and pig hippocampal and entorhinal cells. *Neuron* (2021) doi:10.1016/j.neuron.2021.10.036.
- 698 35. Arber, C. *et al.* Familial Alzheimer's Disease Mutations in PSEN1 Lead to Premature Human  
699 Stem Cell Neurogenesis. *Cell Reports* **34**, (2021).
- 700 36. Cosacak, M. I. *et al.* Single-Cell Transcriptomics Analyses of Neural Stem Cell Heterogeneity and  
701 Contextual Plasticity in a Zebrafish Brain Model of Amyloid Toxicity. *Cell Reports* **27**, 1307–1318.e3  
702 (2019).
- 703 37. Mi, D. *et al.* Early emergence of cortical interneuron diversity in the mouse embryo. *Science* **360**,  
704 81–85 (2018).
- 705 38. Tasic, B. *et al.* Adult mouse cortical cell taxonomy revealed by single cell transcriptomics. *Nat*  
706 *Neurosci* **19**, 335–346 (2016).
- 707 39. Krienen, F. M. *et al.* Innovations present in the primate interneuron repertoire. *Nature* **586**, 262–  
708 269 (2020).
- 709 40. Yu, Y. *et al.* Interneuron origin and molecular diversity in the human fetal brain. *Nat Neurosci* **24**,  
710 1745–1756 (2021).
- 711 41. Bugeon, S. *et al.* A transcriptomic axis predicts state modulation of cortical interneurons. *Nature*  
712 **607**, 330–338 (2022).
- 713 42. Martinez-Losa, M. *et al.* Nav1.1-Overexpressing Interneuron Transplants Restore Brain Rhythms  
714 and Cognition in a Mouse Model of Alzheimer's Disease. *Neuron* **98**, 75–89.e5 (2018).
- 715 43. Nuriel, T. *et al.* Neuronal hyperactivity due to loss of inhibitory tone in APOE4 mice lacking  
716 Alzheimer's disease-like pathology. *Nat Commun* **8**, 1464 (2017).
- 717 44. Smith, S. J. *et al.* Single-cell transcriptomic evidence for dense intracortical neuropeptide  
718 networks. *eLife* **8**, e47889 (2019).
- 719 45. Zhong, W. *et al.* The neuropeptide landscape of human prefrontal cortex. *Proceedings of the*  
720 *National Academy of Sciences* **119**, e2123146119 (2022).
- 721 46. Cauli, B. *et al.* Cortical GABA Interneurons in Neurovascular Coupling: Relays for Subcortical  
722 Vasoactive Pathways. *J. Neurosci.* **24**, 8940–8949 (2004).
- 723 47. Jansen, I. E. *et al.* Genome-wide meta-analysis identifies new loci and functional pathways  
724 influencing Alzheimer's disease risk. *Nat Genet* **51**, 404–413 (2019).
- 725 48. Chen, Y. & Colonna, M. Microglia in Alzheimer's disease at single-cell level. Are there common  
726 patterns in humans and mice? *Journal of Experimental Medicine* **218**, (2021).
- 727 49. Keren-Shaul, H. *et al.* A Unique Microglia Type Associated with Restricting Development of  
728 Alzheimer's Disease. *Cell* **169**, 1276–1290.e17 (2017).
- 729 50. Grubman, A. *et al.* Transcriptional signature in microglia associated with A $\beta$  plaque phagocytosis.  
730 *Nat Commun* **12**, 3015 (2021).
- 731 51. March-Diaz, R. *et al.* Hypoxia compromises the mitochondrial metabolism of Alzheimer's disease  
732 microglia via HIF1. *Nat Aging* **1**, 385–399 (2021).
- 733 52. Mathys, H. *et al.* Temporal Tracking of Microglia Activation in Neurodegeneration at Single-Cell  
734 Resolution. *Cell Rep* **21**, 366–380 (2017).

- 735 53. Friedman, B. A. *et al.* Diverse Brain Myeloid Expression Profiles Reveal Distinct Microglial  
736 Activation States and Aspects of Alzheimer's Disease Not Evident in Mouse Models. *Cell Reports* **22**,  
737 832–847 (2018).
- 738 54. Sala Frigerio, C. *et al.* The Major Risk Factors for Alzheimer's Disease: Age, Sex, and Genes  
739 Modulate the Microglia Response to A $\beta$  Plaques. *Cell Reports* **27**, 1293-1306.e6 (2019).
- 740 55. Yang, H. S. *et al.* Natural genetic variation determines microglia heterogeneity in wild-derived  
741 mouse models of Alzheimer's disease. *Cell Reports* **34**, 108739 (2021).
- 742 56. Sayed, F. A. *et al.* AD-linked R47H-TREM2 mutation induces disease-enhancing microglial states  
743 via AKT hyperactivation. *Science Translational Medicine* (2021) doi:10.1126/scitranslmed.abe3947.
- 744 57. Jaitin, D. A. *et al.* Lipid-Associated Macrophages Control Metabolic Homeostasis in a Trem2-  
745 Dependent Manner. *Cell* **178**, 686-698.e14 (2019).
- 746 58. Krasemann, S. *et al.* The TREM2-APOE Pathway Drives the Transcriptional Phenotype of  
747 Dysfunctional Microglia in Neurodegenerative Diseases. *Immunity* **47**, 566-581.e9 (2017).
- 748 59. Shi, Y. *et al.* Overexpressing low-density lipoprotein receptor reduces tau-associated  
749 neurodegeneration in relation to apoE-linked mechanisms. *Neuron* **109**, 2413-2426.e7 (2021).
- 750 60. Badimon, A. *et al.* Negative feedback control of neuronal activity by microglia. *Nature* **586**, 417–  
751 423 (2020).
- 752 61. Merlini, M. *et al.* Microglial Gi-dependent dynamics regulate brain network hyperexcitability. *Nat*  
753 *Neurosci* **24**, 19–23 (2021).
- 754 62. Hong, S. *et al.* Complement and microglia mediate early synapse loss in Alzheimer mouse  
755 models. *Science* **352**, 712–716 (2016).
- 756 63. Gunner, G. *et al.* Sensory lesioning induces microglial synapse elimination via ADAM10 and  
757 fractalkine signaling. *Nat Neurosci* **22**, 1075–1088 (2019).
- 758 64. Victor, M. B. *et al.* Lipid accumulation induced by APOE4 impairs microglial surveillance of  
759 neuronal-network activity. *Cell Stem Cell* **29**, 1197-1212.e8 (2022).
- 760 65. Favuzzi, E. *et al.* GABA-receptive microglia selectively sculpt developing inhibitory circuits. *Cell*  
761 **184**, 4048-4063.e32 (2021).
- 762 66. Stogsdill, J. A. *et al.* Pyramidal neuron subtype diversity governs microglia states in the  
763 neocortex. *Nature* 1–7 (2022) doi:10.1038/s41586-022-05056-7.
- 764 67. Bisht, K. *et al.* Capillary-associated microglia regulate vascular structure and function through  
765 PANX1-P2RY12 coupling in mice. *Nat Commun* **12**, 5289 (2021).
- 766 68. Császár, E. *et al.* Microglia modulate blood flow, neurovascular coupling, and hypoperfusion via  
767 purinergic actions. *Journal of Experimental Medicine* **219**, e20211071 (2022).
- 768 69. Masuda, T. *et al.* Specification of CNS macrophage subsets occurs postnatally in defined niches.  
769 *Nature* **604**, 740–748 (2022).
- 770 70. Munro, D. A. D., Movahedi, K. & Priller, J. Macrophage compartmentalization in the brain and  
771 cerebrospinal fluid system. *Science Immunology* **7**, eabk0391 (2022).
- 772 71. Vanlandewijck, M. *et al.* A molecular atlas of cell types and zonation in the brain vasculature.  
773 *Nature* **554**, 475–480 (2018).
- 774 72. Van Hove, H. *et al.* A single-cell atlas of mouse brain macrophages reveals unique transcriptional  
775 identities shaped by ontogeny and tissue environment. *Nat Neurosci* **22**, 1021–1035 (2019).
- 776 73. Hernández, J. C. C. *et al.* Neutrophil adhesion in brain capillaries reduces cortical blood flow and  
777 impairs memory function in Alzheimer's disease mouse models. *Nature Neuroscience* **22**, 413 (2019).
- 778 74. Sankowski, R. *et al.* Mapping microglia states in the human brain through the integration of high-  
779 dimensional techniques. *Nat Neurosci* **22**, 2098–2110 (2019).
- 780 75. Safaiyan, S. *et al.* White matter aging drives microglial diversity. *Neuron* **109**, 1100-1117.e10  
781 (2021).
- 782 76. Hughes, A. N. & Appel, B. Microglia phagocytose myelin sheaths to modify developmental  
783 myelination. *Nat Neurosci* **23**, 1055–1066 (2020).
- 784 77. Morabito, S. *et al.* Single-nucleus chromatin accessibility and transcriptomic characterization of  
785 Alzheimer's disease. *Nat Genet* **53**, 1143–1155 (2021).
- 786 78. Novikova, G. *et al.* Integration of Alzheimer's disease genetics and myeloid genomics identifies  
787 disease risk regulatory elements and genes. *Nat Commun* **12**, 1610 (2021).
- 788 79. Huang, K. *et al.* A common haplotype lowers PU.1 expression in myeloid cells and delays onset  
789 of Alzheimer's disease. *Nat Neurosci* **20**, 1052–1061 (2017).

- 790 80. Cao, H. *et al.* Association of SPI1 Haplotypes with Altered SPI1 Gene Expression and  
791 Alzheimer's Disease Risk. *J Alzheimers Dis* **86**, 1861–1873.
- 792 81. Dräger, N. M. *et al.* A CRISPRi/a platform in human iPSC-derived microglia uncovers regulators  
793 of disease states. *Nat Neurosci* 1–14 (2022) doi:10.1038/s41593-022-01131-4.
- 794 82. Batiuk, M. Y. *et al.* Identification of region-specific astrocyte subtypes at single cell resolution. *Nat*  
795 *Commun* **11**, 1220 (2020).
- 796 83. Bayraktar, O. A. *et al.* Astrocyte layers in the mammalian cerebral cortex revealed by a single-cell  
797 in situ transcriptomic map. *Nat Neurosci* **23**, 500–509 (2020).
- 798 84. Hasel, P., Rose, I. V. L., Sadick, J. S., Kim, R. D. & Liddelow, S. A. Neuroinflammatory astrocyte  
799 subtypes in the mouse brain. *Nat Neurosci* **24**, 1475–1487 (2021).
- 800 85. Escartin, C. *et al.* Reactive astrocyte nomenclature, definitions, and future directions. *Nat*  
801 *Neurosci* **24**, 312–325 (2021).
- 802 86. Habib, N. *et al.* Disease-associated astrocytes in Alzheimer's disease and aging. *Nat Neurosci*  
803 **23**, 701–706 (2020).
- 804 87. Ioannou, M. S. *et al.* Neuron-Astrocyte Metabolic Coupling Protects against Activity-Induced Fatty  
805 Acid Toxicity. *Cell* **177**, 1522-1535.e14 (2019).
- 806 88. Wang, C. *et al.* Selective removal of astrocytic APOE4 strongly protects against tau-mediated  
807 neurodegeneration and decreases synaptic phagocytosis by microglia. *Neuron* **109**, 1657-1674.e7  
808 (2021).
- 809 89. Ballabio, A. & Bonifacino, J. S. Lysosomes as dynamic regulators of cell and organismal  
810 homeostasis. *Nat Rev Mol Cell Biol* **21**, 101–118 (2020).
- 811 90. Xu, Y., Kong, J. & Hu, P. Computational Drug Repurposing for Alzheimer's Disease Using Risk  
812 Genes From GWAS and Single-Cell RNA Sequencing Studies. *Frontiers in Pharmacology* **12**, 1614  
813 (2021).
- 814 91. Marques, S. *et al.* Oligodendrocyte heterogeneity in the mouse juvenile and adult central nervous  
815 system. *Science* **352**, 1326–1329 (2016).
- 816 92. Falcão, A. M. *et al.* Disease-specific oligodendrocyte lineage cells arise in multiple sclerosis. *Nat*  
817 *Med* **24**, 1837–1844 (2018).
- 818 93. Jäkel, S. *et al.* Altered human oligodendrocyte heterogeneity in multiple sclerosis. *Nature* **566**,  
819 543–547 (2019).
- 820 94. Chen, J.-F. *et al.* Enhancing myelin renewal reverses cognitive dysfunction in a murine model of  
821 Alzheimer's disease. *Neuron* **109**, 2292-2307.e5 (2021).
- 822 95. Bonetto, G., Belin, D. & Káradóttir, R. T. Myelin: A gatekeeper of activity-dependent circuit  
823 plasticity? *Science* **374**, eaba6905.
- 824 96. de Faria, O. *et al.* Periods of synchronized myelin changes shape brain function and plasticity.  
825 *Nat Neurosci* **24**, 1508–1521 (2021).
- 826 97. Yang, S. M., Michel, K., Jokhi, V., Nedivi, E. & Arlotta, P. Neuron class-specific responses  
827 govern adaptive myelin remodeling in the neocortex. *Science* (2020) doi:10.1126/science.abd2109.
- 828 98. Pan, S., Mayoral, S. R., Choi, H. S., Chan, J. R. & Kheirbek, M. A. Preservation of a remote fear  
829 memory requires new myelin formation. *Nat Neurosci* **23**, 487–499 (2020).
- 830 99. Kirby, L. *et al.* Oligodendrocyte precursor cells present antigen and are cytotoxic targets in  
831 inflammatory demyelination. *Nat Commun* **10**, 3887 (2019).
- 832 100. Kenigsbuch, M. *et al.* A shared disease-associated oligodendrocyte signature among multiple  
833 CNS pathologies. *Nat Neurosci* **25**, 876–886 (2022).
- 834 101. Arai, K. & Lo, E. H. An Oligovascular Niche: Cerebral Endothelial Cells Promote the Survival and  
835 Proliferation of Oligodendrocyte Precursor Cells. *J Neurosci* **29**, 4351–4355 (2009).
- 836 102. Pham, L.-D. D. *et al.* Crosstalk between oligodendrocytes and cerebral endothelium contributes  
837 to vascular remodeling after white matter injury. *Glia* **60**, 875–881 (2012).
- 838 103. Marques, S. *et al.* Transcriptional Convergence of Oligodendrocyte Lineage Progenitors during  
839 Development. *Developmental Cell* **46**, 504-517.e7 (2018).
- 840 104. Beiter, R. M. *et al.* Evidence for oligodendrocyte progenitor cell heterogeneity in the adult mouse  
841 brain. *Sci Rep* **12**, 12921 (2022).
- 842 105. Huang, W. *et al.* Origins and Proliferative States of Human Oligodendrocyte Precursor Cells. *Cell*  
843 **182**, 594-608.e11 (2020).
- 844 106. Fu, Y. *et al.* Heterogeneity of glial progenitor cells during the neurogenesis-to-gliogenesis switch  
845 in the developing human cerebral cortex. *Cell Reports* **34**, 108788 (2021).

- 846 107. Káradóttir, R., Hamilton, N. B., Bakiri, Y. & Attwell, D. Spiking and nonspiking classes of  
847 oligodendrocyte precursor glia in CNS white matter. *Nat Neurosci* **11**, 450–456 (2008).
- 848 108. Zhang, P. *et al.* Senolytic therapy alleviates A $\beta$ -associated oligodendrocyte progenitor cell  
849 senescence and cognitive deficits in an Alzheimer's disease model. *Nat Neurosci* **22**, 719–728 (2019).
- 850 109. Zhang, H. *et al.* Cerebral blood flow in mild cognitive impairment and Alzheimer's disease: A  
851 systematic review and meta-analysis. *Ageing Research Reviews* **71**, 101450 (2021).
- 852 110. Chen, M. B. *et al.* Brain Endothelial Cells Are Exquisite Sensors of Age-Related Circulatory Cues.  
853 *Cell Reports* **30**, 4418-4432.e4 (2020).
- 854 111. Kalucka, J. *et al.* Single-Cell Transcriptome Atlas of Murine Endothelial Cells. *Cell* **180**, 764-  
855 779.e20 (2020).
- 856 112. Yousef, H. *et al.* Aged blood impairs hippocampal neural precursor activity and activates  
857 microglia via brain endothelial cell VCAM1. *Nat Med* **25**, 988–1000 (2019).
- 858 113. Zhao, L. *et al.* Pharmacologically reversible zonation-dependent endothelial cell transcriptomic  
859 changes with neurodegenerative disease associations in the aged brain. *Nat Commun* **11**, 4413  
860 (2020).
- 861 114. Wälchli, T. *et al.* *Molecular atlas of the human brain vasculature at the single-cell level.*  
862 2021.10.18.464715 <https://www.biorxiv.org/content/10.1101/2021.10.18.464715v1> (2021)  
863 doi:10.1101/2021.10.18.464715.
- 864 115. Sun, N. *et al.* Single-cell multi-region dissection of brain vasculature in Alzheimer's Disease.  
865 2022.02.09.479797 Preprint at <https://doi.org/10.1101/2022.02.09.479797> (2022).
- 866 116. Yang, A. C. *et al.* A human brain vascular atlas reveals diverse mediators of Alzheimer's risk.  
867 *Nature* 1–8 (2022) doi:10.1038/s41586-021-04369-3.
- 868 117. Winkler, E. A. *et al.* A single-cell atlas of the normal and malformed human brain vasculature.  
869 *Science* **375**, eabi7377 (2022).
- 870 118. Profaci, C. P., Munji, R. N., Pulido, R. S. & Daneman, R. The blood–brain barrier in health and  
871 disease: Important unanswered questions. *J Exp Med* **217**, e20190062 (2020).
- 872 119. Zou, C. *et al.* Reduction of mNAT1/hNAT2 Contributes to Cerebral Endothelial Necroptosis and  
873 A $\beta$  Accumulation in Alzheimer's Disease. *Cell Reports* **33**, 108447 (2020).
- 874 120. Gonzales, A. L. *et al.* Contractile pericytes determine the direction of blood flow at capillary  
875 junctions. *PNAS* **117**, 27022–27033 (2020).
- 876 121. Hartmann, D. A. *et al.* Brain capillary pericytes exert a substantial but slow influence on blood  
877 flow. *Nat Neurosci* **24**, 633–645 (2021).
- 878 122. Nortley, R. *et al.* Amyloid  $\beta$  oligomers constrict human capillaries in Alzheimer's disease via  
879 signaling to pericytes. *Science* **365**, (2019).
- 880 123. Blanchard, J. W. *et al.* Reconstruction of the human blood–brain barrier in vitro reveals a  
881 pathogenic mechanism of APOE4 in pericytes. *Nat Med* **26**, 952–963 (2020).
- 882 124. Yamazaki, Y. *et al.* Vascular ApoE4 Impairs Behavior by Modulating Gliovascular Function.  
883 *Neuron* **109**, 438-447.e6 (2021).
- 884 125. Barnes, L. L. Alzheimer disease in African American individuals: increased incidence or not  
885 enough data? *Nat Rev Neurol* **18**, 56–62 (2022).
- 886 126. Vila-Castelar, C., Fox-Fuller, J. T., Guzmán-Vélez, E., Schoemaker, D. & Quiroz, Y. T. A cultural  
887 approach to dementia — insights from US Latino and other minoritized groups. *Nat Rev Neurol* **18**,  
888 307–314 (2022).
- 889 127. Alsema, A. M. *et al.* Profiling Microglia From Alzheimer's Disease Donors and Non-demented  
890 Elderly in Acute Human Postmortem Cortical Tissue. *Frontiers in Molecular Neuroscience* **13**, 134  
891 (2020).
- 892 128. Marinaro, F. *et al.* *Molecular and cellular pathology of monogenic Alzheimer's disease at single*  
893 *cell resolution.* 2020.07.14.202317 <https://www.biorxiv.org/content/10.1101/2020.07.14.202317v1>  
894 (2020) doi:10.1101/2020.07.14.202317.
- 895 129. Gerrits, E. *et al.* Distinct amyloid- $\beta$  and tau-associated microglia profiles in Alzheimer's disease.  
896 *Acta Neuropathol* **141**, 681–696 (2021).
- 897 130. Del-Aguila, J. L. *et al.* A single-nuclei RNA sequencing study of Mendelian and sporadic AD in the  
898 human brain. *Alzheimer's Research & Therapy* **11**, 71 (2019).
- 899 131. Olah, M. *et al.* Single cell RNA sequencing of human microglia uncovers a subset associated with  
900 Alzheimer's disease. *Nat Commun* **11**, 6129 (2020).

- 901 132. Xu, H. & Jia, J. Single-Cell RNA Sequencing of Peripheral Blood Reveals Immune Cell  
902 Signatures in Alzheimer's Disease. *Frontiers in Immunology* **12**, 2727 (2021).
- 903 133. Gate, D. *et al.* Clonally expanded CD8 T cells patrol the cerebrospinal fluid in Alzheimer's  
904 disease. *Nature* **577**, 399–404 (2020).
- 905 134. Smith, A. M. *et al.* Diverse human astrocyte and microglial transcriptional responses to  
906 Alzheimer's pathology. *Acta Neuropathol* **143**, 75–91 (2022).
- 907 135. Krishnaswami, S. R. *et al.* Using single nuclei for RNA-seq to capture the transcriptome of  
908 postmortem neurons. *Nat Protoc* **11**, 499–524 (2016).
- 909 136. Thrupp, N. *et al.* Single-Nucleus RNA-Seq Is Not Suitable for Detection of Microglial Activation  
910 Genes in Humans. *Cell Rep* **32**, 108189 (2020).
- 911 137. Marsh, S. E. *et al.* Dissection of artifactual and confounding glial signatures by single-cell  
912 sequencing of mouse and human brain. *Nat Neurosci* **25**, 306–316 (2022).
- 913 138. Zeng, H. What is a cell type and how to define it? *Cell* **185**, 2739–2755 (2022).
- 914 139. Rustenhoven, J. *et al.* PU.1 regulates Alzheimer's disease-associated genes in primary human  
915 microglia. *Molecular Neurodegeneration* **13**, 44 (2018).
- 916 140. Sanchez, P. E. *et al.* Levetiracetam suppresses neuronal network dysfunction and reverses  
917 synaptic and cognitive deficits in an Alzheimer's disease model. *Proceedings of the National Academy*  
918 *of Sciences* **109**, E2895–E2903 (2012).
- 919 141. Vossel, K. *et al.* Effect of Levetiracetam on Cognition in Patients With Alzheimer Disease With  
920 and Without Epileptiform Activity: A Randomized Clinical Trial. *JAMA Neurology* **78**, 1345–1354  
921 (2021).
- 922 142. Gonzales, M. M. *et al.* Senolytic Therapy to Modulate the Progression of Alzheimer's Disease  
923 (SToMP-AD): A Pilot Clinical Trial. *J Prev Alzheimers Dis* **9**, 22–29 (2022).
- 924 143. Wightman, D. P. *et al.* A genome-wide association study with 1,126,563 individuals identifies new  
925 risk loci for Alzheimer's disease. *Nat Genet* **53**, 1276–1282 (2021).
- 926 144. Bellenguez, C. *et al.* New insights into the genetic etiology of Alzheimer's disease and related  
927 dementias. *Nat Genet* **54**, 412–436 (2022).
- 928 145. Hammond, T. R. *et al.* Single-Cell RNA Sequencing of Microglia throughout the Mouse Lifespan  
929 and in the Injured Brain Reveals Complex Cell-State Changes. *Immunity* **50**, 253–271.e6 (2019).
- 930 146. Grone, B. P. *et al.* Early and lifelong effects of APOE4 on neuronal gene expression networks  
931 relevant to Alzheimer's disease. 2022.06.16.496371 Preprint at  
932 <https://doi.org/10.1101/2022.06.16.496371> (2022).
- 933 147. Da Mesquita, S. *et al.* Aging-associated deficit in CCR7 is linked to worsened glymphatic function,  
934 cognition, neuroinflammation, and  $\beta$ -amyloid pathology. *Science Advances* **7**, eabe4601.
- 935 148. Taubes, A. *et al.* Experimental and real-world evidence supporting the computational repurposing  
936 of bumetanide for APOE4-related Alzheimer's disease. *Nat Aging* **1**, 932–947 (2021).
- 937 149. Lin, Y.-T. *et al.* APOE4 Causes Widespread Molecular and Cellular Alterations Associated with  
938 Alzheimer's Disease Phenotypes in Human iPSC-Derived Brain Cell Types. *Neuron* **98**, 1141–1154.e7  
939 (2018).
- 940