Drug connectivity mapping and functional analysis reveals therapeutic small molecules that differentially modulate myelination

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32 Abstract

33 Oligodendrocytes are the myelin forming cells of the central nervous system (CNS) and are generated from oligodendrocyte progenitor cells (OPCs). Disruption or loss of 34 oligodendrocytes and myelin has devastating effects on CNS function and integrity, which 35 occurs in diverse neurological disorders, including Multiple Sclerosis (MS), Alzheimer's 36 disease (AD) and neuropsychiatric disorders. Hence, there is a need to develop new 37 therapies that promote oligodendrocyte regeneration and myelin repair. A promising 38 approach is drug repurposing, but most agents have potentially contrasting biological actions 39 depending on the cellular context and their dose-dependent effects on intracellular 40 regulatory pathways. Here, we have used a combined drug connectivity systems biology and 41 neurobiological approach to identify compounds that exert positive and negative effects on 42 oligodendroglia, depending on concentration. Notably, LY294002, a potent inhibitor of 43 44 PI3K/Akt signalling, was the most highly ranked small molecule for both pro- and antioligodendroglial effects. We validated these in silico findings in multiple in vivo and ex vivo 45 neurobiological models and demonstrate that low and high doses of LY294002 have a 46 profoundly bipartite effect on the generation of OPCs and their differentiation into myelinating 47 48 oligodendrocytes. Finally, we employed transcriptional profiling and signalling pathway 49 activity assays to determine cell-specific mechanisms of action of LY294002 on 50 oligodendrocytes and resolve optimal in vivo conditions required to promote myelin repair. 51 These results demonstrate the power of multifactorial neurobiological and *in silico* strategies 52 in determining the therapeutic potential of small molecules in neurodegenerative disorders.

54 Introduction

In the CNS, myelin is produced by oligodendrocytes that are generated from oligodendrocyte 55 56 progenitor cells (OPCs) throughout life (1). During postnatal development, in addition to generating neural progenitors (NP), neural stem cells (NSCs) of the subventricular zone 57 (SVZ) also pass through a number of distinct differentiation stages to generate OPCs, which 58 migrate throughout the forebrain and differentiate into myelinating oligodendrocytes, in 59 response to intrinsic and extracellular cues (2, 3). In the adult brain, a significant population 60 of endogenous OPCs persist throughout the brain and have the function of life-long 61 generation of oligodendrocytes, which is essential for myelination of new connections in 62 63 learning and myelin repair in pathology (4, 5). In addition, the adult SVZ remains an important source of new OPCs to replenish endogenous populations, in particular following 64 pathological demyelination (3, 6). However, long-term repair ultimately fails due to a decline 65 in oligodendrocyte regeneration from both the SVZ (3, 7) and endogenous OPCs (8, 9), 66 which severely impairs repair in numerous neuropathologies, including Multiple Sclerosis 67 (MS) and Alzheimer's disease (AD) (9, 10). Hence, there is a need for new therapies that 68 69 promote OPC regeneration and repair.

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71 Connectivity mapping has been used in multiple clinical areas to connect biology and drug 72 discovery by exploiting transcriptional similarities across treatment conditions and cell states 73 (11). This strategy is a promising and direct approach to regulate neural cells and identify 74 small molecules and transcriptional networks that have the potential to promote regeneration and repair in the CNS (3, 12-14). However, agents identified by these new therapeutic 75 approaches have potentially divergent biological actions depending on their dose- and time-76 77 dependent effects on intracellular regulatory pathways. Thus, determining the cell-specific 78 effects and precise mechanisms of action of small molecules on neural cells is essential for developing therapeutic strategies to promote CNS repair. In the present study, we have 79 identified small molecules with the potential to regulate oligodendrocyte regeneration by 80 utilizing a new comprehensive reference catalogue, LINCS (Library of Integrated Network-81 based Cellular Signatures), which hosts the gene expression phenotypes triggered by small 82 83 molecules assayed at different concentrations across diverse cellular systems 84 (https://clue.io). We identified a wide range of small molecules that targeted multiple regulatory pathways with the potential to both positively and negatively regulate 85 oligodendrocyte differentiation. Significantly, the highest ranking small molecule, LY294002, 86 87 was predicted to have both pro- and anti-oligodendroglial actions. LY294002 is a potent inhibitor of the PI3K/Akt signalling pathway, which is considered essential for 88 89 oligodendrocyte differentiation and myelination (15, 16). We validated the pharmacogenomic 90 findings in multiple in vivo and ex vivo neurobiological models and demonstrate for the first

time that LY294002 has a striking dose-dependent effect on oligodendrocytes, being 91 92 severely destructive at high doses, but greatly stimulating oligodendrocyte generation and myelination at low doses. Furthermore, using whole genome transcriptomics and 93 biochemical assays, we determined the cell-specific differential mechanisms of action of low 94 and high LY294002 in oligodendrocytes. This study identifies striking contrasting effects of 95 small molecules on neural cells depending on their dose-dependent actions on intracellular 96 97 regulatory pathways, which is critical for the development of novel therapeutic strategies using small molecules to promote CNS repair. 98

100 Results

101 Pharmacogenomic screening for small molecules predicted to regulate myelination

102 First, using datasets generated by the authors to profile postnatal and adult NSC and OL lineage cells (3, 13, 17-20), we curated essential landmark genes that can be defined as pro-103 or anti-oligodendrocyte differentiation (Fig. 1A). Next, we interrogated these genes in LINCS 104 (https://clue.io) (11), to identify small molecules that shift the transcriptome of IPSC-derived 105 NSCs (iNSCs) to that of myelinating oligodendrocytes (Fig. 1B). Then, we analysed the 106 small molecule target-genes (TGs) whose expression is significantly modulated in iNSC to 107 either positively or negatively regulate oligodendrocyte differentiation (Fig. 1C, D). Many of 108 109 these TG networks have recognised functions in oligodendrocytes, such as the prooligodendroglial effects of inhibiting GSK3B (21) and anti-oligodendroglial effects of inhibiting 110 mTOR (22). In contrast, the pro-oligodendroglial effect of HDAC inhibition appears counter-111 112 intuitive at first, since HDAC activity is essential for oligodendrocyte lineage progression (23), but transient HDAC inhibition can be neuroprotective and promote OPC plasticity (24. 113 25). Significantly, inhibition of a number of pathways is predicted to have both pro- and anti-114 oligodendrocyte functions, most notably PI3K/Akt/mTOR inhibition (Fig. 1D). Consistent with 115 116 this, the highest ranking pro- and anti-oligodendroglial small molecule was LY294002, a 117 potent inhibitor of PI3K/Akt signalling, with broad kinase activity depending on concentration 118 and cellular context (26). LY294002 exerts opposing transcriptional effects on iNSCs at low concentrations (2 µM, here termed L-LY29) and high concentrations (10 µM, here termed H-119 LY29) (Fig. 1E). The second highest-ranking anti-oligodendroglial small molecule was the 120 specific Akt inhibitor Triciribine (TCN, Fig. 1E), and comparison of the target gene (TG) 121 pathways and biological processes altered by the non-specific PI3K/Akt inhibitor LY294002 122 compared to the specific Akt inhibitor TCN provided insight into the potential mechanisms 123 124 that determine the opposing effects of L- and H-LY29 on oligodendrocytes and myelination, with the "FAK-PI3K-mTOR pathway" being most prominent (Fig. S1). In support of this, 125 meta-analysis of the LINCS-derived TGs closely associated H-LY29 with TCN (Fig. 1F), 126 consistent with the potential anti-oligodendroglial actions of H-LY29 being due to inhibition of 127 PI3K/Akt/mTOR signalling, which is critical for OPC differentiation and myelination (27). In 128 contrast, the pro-oligodendroglial actions of L-LY29 are most closely linked to the effects 129 130 exerted by GSK3 β inhibitors and metformin (Fig. 1F), both of which have been shown to rejuvenate OPC regeneration and promote remyelination (3, 9, 21), together with 131 corticosteroids and the flavonoid epicatechin. Interestingly, L-LY29 is also closely associated 132 133 with perturbation of HDACs (Fig. 1F), which has broad spectrum epigenetic effects that regulate OPC plasticity (25). These analyses identify potential mechanisms that determine 134 135 predicted opposing effects of H- and L-LY29 on oligodendrocytes and myelination

Bipartite concentration-dependent effects of LY294002 on oligodendrocyte development *in vivo*

The pharmacogenomic analysis identified LY294002 as a potentially potent modulator of 139 oligodendrogenesis and predicted differential effects of low and high concentrations. We 140 tested this in vivo by direct injection of agents into the cerebrospinal fluid (CSF) of 141 anesthetised mice for three days, commencing at postnatal day (P8) and analysing brains at 142 P11, as described previously (21). These ages correspond to the main period of 143 oligodendrocyte differentiation and myelination in the corpus callosum and dorsal cortex, 144 after which the numbers of OPCs decline sharply by half with a concomitant doubling in 145 newly formed myelinating oligodendrocytes (MYOLs) (21, 28). First, we determined the in 146 vivo concentration-dependent effects of LY294002 and TCN (Fig. S2); TCN was selected 147 because it is a selective small molecule inhibitor of Akt, but does not inhibit PI3K, the direct 148 upstream activator of Akt (29, 30), whereas LY294002 is a potent inhibitor of PI3K, the 149 upstream activator of Akt, but also has broad kinase activity (26). As predicted from the 150 LINCS analysis, low doses of LY2940002 ($\leq 2 \mu$ M) and high doses of LY294002 ($\geq 10 \mu$ M) 151 had contrasting pro- and anti-oligodendroglial effects in the corpus callosum, whereas TCN 152 153 was anti-oligodendroglial at all concentrations tested (Fig. S2). Based on these dose-154 response experiments, we performed a detailed in vivo analysis of the effects of 2 µM 155 LY294002 (L-LY29) and 20 µM LY294002 (H-LY29), compared with 1.3 µM TCN on OPC, 156 MYOL and myelination (Fig. 2). Immunolabelling for PDGFRa and the cell proliferation marker PCNA demonstrate that L-LY29 increased the number of OPCs in cell cycle and 157 doubled their number overall, in both the corpus callosum and dorsal cortex (Fig. 2A, B, E, 158 F). In contrast, H-LY29 significantly reduced OPC numbers and proliferation (Fig. 2C, E, F), 159 whereas TCN did not decrease OPC numbers (Fig. 2D, E, F), suggesting the negative 160 effects of H-LY29 on OPCs are not mediated by PI3K/Akt signalling, but involve other 161 mechanisms, such as ERK1/2, which is almost completely ablated by H-LY29 (Fig. S2G). 162 Equivalent pro-oligodendroglial effects of L-LY29 were observed in MYOLs, with a greater 163 than doubling of the number of PLP+ MYOL in the corpus callosum, compared to controls 164 (Fig. 2G, H; Fig. S2A). Increased numbers of MYOLs were mirrored by a striking increase in 165 the extent of MBP immunolabelling (Fig. 2Gii, Hii), quantified by the MBP+ myelin index, a 166 167 measure of myelination (Fig. 2K), and increased corpus callosum thickness (Fig. 2L). In contrast, both H-LY29 and TCN halved the numbers of DsRed+ MYOLs (Fig. 2I, J; Fig. 168 S2A), and axonal myelination and corpus callosum thickness were markedly decreased (Fig. 169 170 2K, L); these quantitative data correspond to 400% more MYOL and MBP immunolabelling in L-LY29 compared to H-LY29 or TCN. In addition, MYOLs appeared normal in L-LY29 171 compared to controls, but with increased numbers of cells and myelin sheaths (Fig. 2Gii, 172 173 Hii), whereas MYOLs were atrophied in H-LY29 and TCN and exhibited abnormal appearing 174 oval somata (Fig. 2lii, Jii). Due to their lower density, individual MYOLs are more clearly 175 distinguished in the cortex, where they are evidently atrophied and support far fewer myelin sheaths in H-LY29 compared to L-LY29 and controls (Fig. 2M, N, O). Immunolabelling for 176 APC and MBP, which are expressed sequentially in differentiating oligodendrocytes, showed 177 L-LY29 significantly increased the density of both APC+/MBP- 'immature' oligodendrocytes 178 (imOL) and APC+/MBP+ MYOL (Fig. 2P, Q), whereas the main effect of H-LY29 and TCN 179 was to impair the differentiation of APC+/MBP+ MYOL (Fig. 2Q), consistent with evidence 180 that Akt is required at the onset of oligodendrocyte terminal differentiation (31). The results 181 fully validate the pharmacogenomic analysis and demonstrate that LY294002 exerts a 182 profound bipartite concentration-dependent effect on oligodendrocyte lineage cells, with high 183 LY294002 having an anti-oligodendroglial action comparable to inhibition of PI3K/Akt 184 signalling by TCN, whereas low LY294002 massively increased the generation of OPCs and 185 promoted differentiation of myelinating oligodendrocytes by unresolved mechanisms. 186

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188 LY294002 and TCN regulate oligodendrocyte generation from NSC of the dorsal SVZ

189 The results above demonstrate that LY294002 regulates the development of forebrain 190 MYOL, which are generated from OPCs that migrate from the dorsal SVZ and are derived 191 from spatially defined pools of NSCs (2, 32). We therefore examined the effects of 192 LY294002 on NSC and oligodendroglenesis in the dorsal SVZ, as characterised previously (32, 33). NSCs were identified as GFAP+ cells with a radial morphology adjacent to the 193 ventricular surface, either as proliferating NSC (GFAP+/EdU+) or non-proliferating NSC 194 (GFAP+/EdU-) (Fig. 3A, D). Newly generated pre-OPCs/TAPs (transiently amplifying 195 progenitors) were identified by their co-expression of Ascl1 and Olig2 (Olig2+/Ascl1+), whilst 196 OPCs were identified as Olig2+/Ascl1- (Fig. 3B, C, E). Quantification demonstrates that 197 GFAP+/EdU+ and GFAP+/EdU- NSCs were significantly decreased by all three treatments 198 (Fig. 3D), but in addition H-LY29 and TCN treatment severely disrupted NSC morphology 199 (Fig. 3A) and almost completely abolished their proliferation (Fig. 3A, D). In contrast, newly 200 formed oligodendroglial lineage cells exhibited differential responses to treatments 201 compared to controls (Fig. 3Bi, Ci, E), whereby TAPs (Olig2+/Ascl1+) and OPCs 202 (Olig2+/Ascl1-) were markedly increased by L-LY29 (Fig. 3Bii, Cii, E), whereas both 203 populations were significantly reduced by H-LY29 (Fig. 3Biii, Ciii, E), whilst TCN significantly 204 decreased TAPs (Fig. 3Biv, E), but had no significant effect on OPC generation (Fig. 3Civ, 205 E). In addition, quantification of definitive OPC pools in the dorsal SVZ, using 206 207 immunostaining for PDGFR α and PCNA (as illustrated in Fig. 2A-F), demonstrates their population is more than doubled by L-LY29, whereas they are significantly reduced in H-208 209 LY29 and not significantly altered by TCN (Fig. 3F). Overall, these data indicate that low 210 LY294002 drives the generation of oligodendroglial cells from NSCs of the dorsal SVZ and promotes the expansion of newly formed OPC, whereas high hoses of LY294002 and TCNalmost completely ablate oligodendrogenesis.

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214 LY294002 regulates oligodendrocyte generation in developing white matter

Our results demonstrate that LY294002 regulates the generation of oligodendrocytes from 215 the dorsal SVZ. Importantly, endogenous OPCs are a further major source of myelinating 216 oligodendrocytes in the developing and adult brain and are potential targets of small 217 molecules (21). To distinguish between the effects of LY294002 on NSCs and endogenous 218 OPCs, we therefore examined the effects of LY294002 ex vivo in the optic nerve, a typical 219 white matter tract that contains endogenous OPCs, but not NSCs (13, 21), together with the 220 cerebellar slices, using P10-12 SOX10-EGFP reporter mice to identify all oligodendroglial 221 222 cells (OPC/MYOL), as described previously (13, 34). In the optic nerve, LY294002 displayed strict dose-dependent effects, with L-LY29 increasing Sox10+ cells and H-LY29 almost 223 224 completely ablating oligodendrocytes (Fig. S3A); the pro-oligodendroglial effects of L-LY29 225 were confirmed in the cerebellar slice, which also enabled gPCR analysis of oligodendroglial 226 transcripts, confirming marked increases in Sox10 and Mbp (Fig. S3B). In the optic nerve 227 and cerebellar slice, OPCs are the sole source of newly generated oligodendrocytes and these results verify that L- and H-LY-29 have a striking bipartite effect on endogenous 228 229 OPCs, as observed in the forebrain and predicted by pharmacogenomics.

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Transcriptomic profiling of LY294002-responsive signalling pathways that regulate oligodendroglial lineage progression

The adult optic nerve is an excellent model for systems biological analysis of the 233 mechanisms of action of small molecules on glial cells, since it does not contain neuronal 234 235 nuclei and mRNA transcripts isolated from optic nerves are glial, with insignificant levels from other cells, such as endothelium (13, 34). We therefore used a combined 236 237 neurobiological and transcriptomic analysis of adult mouse optic nerve to determine the 238 effects of LY294002 on oligodendrocyte lineage cells (Fig. 4, SFig. 4). First, we verified that 239 L- and H-LY29 have a bipartite effect on oligodendrocytes in adult white matter, with L-LY29 240 significantly increasing both Sox10+ OPC/MYOL and PLP+ MYOL, whilst H-LY29 significantly decreased Sox10+ OPC/MYOL, but not PLP+ MYOL (Fig. S4A-D). Notably, H-241 LY29 markedly inhibited Akt phosphorylation (Fig. S4E), and its negative effect on Sox10+ 242 cells are consistent with PI3K/Akt signalling being essential in OPCs (31, 35, 36), whereas 243 the lack of effect of H-LY29 on PLP+ MYOL suggests PI3K/Akt signalling is less important in 244 adult oligodendrocytes. In contrast, the pro-oligodendroglial effects of L-LY29 are at odds 245 with it acting via PI3K/Akt signalling. To resolve this, we performed a differential 246 247 transcriptomic analysis of optic nerves treated with L-LY29, compared to controls or H-LY29 248 (Fig. S4F-H). Consistent with the striking bipartite effects of L- and H-LY29, only a relatively 249 small number (85) of genes were common to both treatment groups (Fig. S4H; Tables S1), and STRING and GO analysis highlighted networks and BPs associated with development 250 as being common to L- and H-LY29, with *lgf1* representing a common core hallmark (Fig. 251 S4J). In comparison, differential analysis identified the genes that were regulated by L-LY29 252 (Fig. S4H), and using the webtool Enrichr the key L-LY29-responsive gene pathways were 253 identified as 'Focal Adhesion', 'Wnt Signaling' and 'FAK-PI3K-mTOR signalling', while BPs 254 induced by L-LY29 included 'Regulation of cell migration', 'Retrograde vesicle-mediated 255 transport' 'protein phosphorylation and 'Mitotic cell cycle phase transition' (Fig. 4A). To 256 257 elucidate the oligodendrocyte-specific L-LY29-responsive transcriptional networks, we interrogated our curated expression profiles of OPC- and MYOL-enriched genes (Fig. S4H; 258 see Materials and Methods for details), which are visualised in a NESTED network for 259 exploring the BPs leading to pro-oligodendroglial effects of L-LY29 (Fig. 4B, C). The most 260 significant L-LY29-responsive OPC pathways are associated with cell cycle and 261 differentiation, together with metabolism, nervous system development (p<6.42e-46), 262 Neurogenesis (p<1.07e-37) and Cell morphogenesis (p<1.97e-31). Critical L-LY29-263 responsive signalling mediators in OPCs are Egfr and Fzd1/2, with associated key 264 265 transcriptional regulators Stat3 and Tcf4, indicating key roles of EGFR and Wnt signalling in 266 mediating the pronounced effects of L-LY29 on OPCs, consistent with published evidence 267 (21, 32, 33, 37, 38). GO analysis of L-LY29-responsive MYOL genes identified the most prominent biological processes as "Cell Differentiation" (Fig. 4C; Red, p<3.68e-08; PPI< 268 1.54e-12) and "Cellular Protein Metabolic Process" (Fig. 4C; Blue, p<2.55e-05), with central 269 roles for *Rhoa* and *AnIn* (Anillin), which have established roles in regulating the expression 270 of major myelin proteins (39, 40). Network analysis demonstrates that Rhoa is at the core of 271 a number of key signalling networks (Fig. 4C; Red, p<3.68e-08; PPI< 1.54e-12), including 272 known pro-oligodendroglial mediators Fgfr1 (28) and Erbb3 (27). The latter regulates 273 oligodendrocytes via RAF-MAPK and PI3K/Akt, both of which were identified by 274 pharmacogenomics as key potential targets for controlling oligodendrogenesis (Fig. S1) and 275 are shown to be directly regulated by LY294002 (Fig. S2). These analyses identify stage-276 specific signalling pathways by which L-LY29 mediates the observed profound 277 278 neurobiological effects on oligodendrocytes, with key roles for EGFR and Wnt signalling in massively expanding OPCs and FGFR1 and ERBB signalling in promoting myelination. 279

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Validation of systems biology characterization of cell-specific L-LY29-responsive signalling mechanisms

Finally, we performed a validation of the cellular effects predicted by LINCS (SFig. 1) compared to the cellular effects resolved experimentally (Fig. 4, Fig. S4), by interrogating L-

LY29-responsive oligodendroglial genes against the LINCS-derived TG pathways and BPs 285 286 (Fig. 5A). Significantly, LINCS genes enriched in both L-LY29-responsive OPC and MYOL genes were associated with the pathway 'Focal Adhesion-PI3K-Akt-mTOR-signaling', which 287 is a key target for pro-oligodendroglial small molecules (Fig. S1). Next, we constructed cell-288 specific L-LY29-responsive signalling networks in OPCs and MYOLs, using Cytoscape 289 ClueGO (Fig. 5B, C; see Materials and Methods for details). Importantly, the results confirm 290 that pathway terms "Focal Adhesion-PI3K-Akt-mTOR-signaling" and "Focal Adhesion" were 291 both downregulated by L-LY29 in OPCs and MYOLs (Fig. 5B, C). Focal adhesion signal 292 transduction is complex and exerts opposing roles on oligodendrocyte maturation (41), 293 whereas signalling networks emanating from PI3K/Akt and affecting signalling by PTEN, 294 GSK3ß and mTOR were particularly evident in the effects of L-LY29 on OPCs and are 295 known to be inhibitory in OPCs (21, 42). To test the predicted impact of L-LY29 on 296 PI3K/Akt/mTOR signalling, we performed multiplex immunoassays of cerebellar slices 297 treated with L-LY29, which significantly reduced phosphorylation of Akt, mTOR, Pten, 298 299 p70S6, and Bad (Fig. 5D; p<0.05). Thus, these analyses identify stage-specific signalling pathways by which L-LY29 mediates the observed profound neurobiological effects on 300 oligodendrocytes and comprehensively validate the LINCS generated catalogue of small 301 302 molecules that have the potential to promote oligodendrocyte regeneration and myelination.

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305 Discussion

306 Connectivity mapping holds considerable potential in the search for new therapies that 307 promote repair in multiple neuropathologies (3, 13). However, it is important to determine the potentially contrasting biological actions of drugs depending on the cellular context and their 308 potential dose-dependent effects on intracellular regulatory pathways. Here, using next 309 generation drug connectivity mapping LINCs (https://clue.io) (11), we have identified small 310 molecules that have marked dose-dependent effects on oligodendrocytes in the CNS. 311 Surprisingly, LINCS analysis identified the small molecule kinase inhibitor LY294002 as the 312 highest ranking agent predicted to have both pro- and anti-oligodenroglial effects, depending 313 on dose, which we fully validated in multiple neurobiological in vivo and ex vivo models. 314 Moreover, analysis of LY294002-responsive genes identified the cell-specific mechanisms of 315 action of low and high doses of LY294002 on oligodendrocyte lineage cells. The results 316 317 demonstrate that a combined drug connectivity mapping and neurobiological strategy is a promising and direct approach to identify small molecules and transcriptional networks that 318 have the potential to promote regeneration and repair in the CNS. 319

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321 A notable advantage of drug connectivity mapping is the opportunity it provides to identify 322 target gene networks of small molecules and streamline the design of pre-clinical 323 experiments. In the present study, after mapping transcriptional drug responses in iPSC-324 NSCs onto an oligodendroglial differentiation axis, our meta-analysis of LINCs data revealed that the PI3K/Akt inhibitor LY294002 was predicted to have dose-dependent pro- or anti-325 oligodendroglial actions. High LY294002 was predicted to cause oligodendrocyte demise via 326 signalling networks and BPs also regulated by the specific Akt inhibitor TCN, e.g. Notch 327 signalling (Fig. S1). As predicted by our connectivity mapping, both H-LY29 and TCN were 328 329 confirmed to negatively affected oligodendrocyte lineage progression in vivo and ex vivo, in support of their effects on PI3k/Akt/mTOR signalling (16, 43, 44). In contrast, L-LY29 330 upregulated essential drivers of oligodendrogenesis and differentiation, including Wnt 331 signalling (32, 33). These findings were verified in vivo in the SVZ and H-LY29 and TCN 332 were shown to perturb common signalling networks in the SVZ that control specification of 333 OPC from NSC, consisting with Akt signalling in dorsal NSC/TAPs directing survival, 334 335 proliferation, and self-renewal (45).

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The dorsal SVZ niche during postnatal development expresses over 50 distinct signalling ligands, which are derived from multiple cellular sources within and in the vicinity of the dorsal SVZ, and affect the activity of multiple intracellular pathways, influencing cell fate choices such as survival, self-renewal and commitment to differentiate (*3*). Interestingly, our 341 in vivo data reveals complex effects of L-LY29 on multiple stages of oligodendroglial lineage 342 commitment and progression. The observed depletion of proliferating NSCs, accompanied 343 by a dramatic increase in their immediate oligodendrocyte-committed progeny (TAPs), point to a rapid effect of L-LY29 to promote commitment and progression along the 344 oligodendrocyte lineage, consistent with upregulation of cell cycle activity and Wnt signaling 345 (32, 33), as predicted by the LINCs TG analysis (Fig. S1A). Importantly, our ex vivo data 346 from optic nerve and cerebellar white matter tracts devoid of NSCs and TAPs supported our 347 in vivo analyses and demonstrate that L-LY29 promotes OL generation from both the SVZ 348 and endogenous OPCs by triggering a cascade of pro-oligodendrogenic signalling networks, 349 consistent with its broad kinase activity and the pleiotropy of downstream effects of 350 PI3K/Akt/mTOR signalling. LY294002 reversibly inhibits PI3K, but depending on dose can 351 also bind to numerous other proteins (26), including the bromodomain proteins BRD2-4 are 352 expressed along the entire oligodendroglial lineage and has the potential to promote 353 oligodendroglial differentiation (46, 47). Intriguingly, alterations in GO terms "cell adhesion", 354 355 "PTEN signalling", "Wnt signalling" and "cytoskeletal arrangements" are amongst the most 356 significant transcriptional changes upon partial Brd protein blockade in NSCs (48). These data are matched by the major terms predicted and confirmed by our validatory 357 358 transcriptomic experiments following exposure of optic nerve to L-LY29, lending support to 359 the possibility that targeting Brd proteins could represent a strategy for promoting myelin 360 repair (49).

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362 In summary, the extensive datasets hosted by the LINCs consortium, comprising gene expression profiles generated using a diverse set of target cells under a broad set of 363 364 conditions, provide unparalleled access to the multidimensional interactions emerging when assessing drug-gene interactions at whole-genome levels. Using LINCs, we identified a 365 366 range of small solutes that have the potential to regulate oligodendrocytes by targeting 367 diverse intracellular signalling pathways. We comprehensively validated our drug networking 368 strategy in multiple in vivo and ex vivo models, using diverse techniques to analyse the dose-dependent effects of LY294002, including lineage progression characterization, 369 transcriptomics and signalling pathway assays. Our results demonstrated a key role for 370 371 PI3K/Akt/mTOR signalling in regulating oligodendrocyte generation, as predicted by our analysis of the LINCS dataset, and in support of genetic studies using OPC-specific 372 conditional knockout of mTOR, PTEN and GSK3β (42). However, conventional genetic 373 approaches to target specific aspects of intracellular regulatory pathways often yield 374 contradictory findings and cannot resolve dose-dependent effects, which is essential for the 375 development of new therapies (22, 44, 50). In contrast, our demonstration of drastically 376

- 377 bipartite dose-dependent effects of the PI3K inhibitor LY294002 highlights the power of our
- 378 pharmacological targeting approach to resolve complex cell-specific signalling networks that
- 379 is not possible by conventional genetic techniques. These techniques offer unprecedented
- 380 opportunities to gain insights into hard-to-predict context-specific mechanisms of action of
- 381 small molecules to promote regeneration and repair in multiple neuropathologies.

382 Materials and Methods

383 Curation of oligodendroglial hallmark genes from previous studies

384 Our previous in silico screening for therapeutic agents capable of altering developmental myelination was performed by using the first generation of drug connectivity mapping (3, 51). 385 The Library of Integrated Network-based Cellular Signatures ((LINCS) (11) (https://clue.io), 386 consists of larger and cell-specific resource, comprising 1.3 million expression profiles 387 obtained from over 90 cell lines/IPSC-derived cells, of which the IPSC-NSC drug-induced 388 expression profiles were interrogated. Oligodendrogenesis-associated signatures were 389 compiled using previously generated bulk and single-cell transcriptomic postnatal and adult 390 OL lineage datasets (17, 18, 52), together with previously curated 'pro-oligodendrogenesis' 391 signatures (3). Genes deemed significantly differentially expressed during OL differentiation 392 in these datasets (<5% FDR; >1.8 FC) were standardized into Boolean values while genes 393 commonly expressed within these datasets were removed. The resulting list of 1170 genes 394 comprised the essential landmark genes which define the later stages in the OL lineage as 395 positive values, whereas those in the negative ranges are expressed in dorsal NSCs/TAPs 396 397 and in the earliest stages of OLs (3, 13, 17-20).

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Interrogating the LINCs-database for small molecule acquisition and defining their mechanisms of action on OL lineage cells

401 The LINCs resource L1000FWD (https://amp.pharm.mssm.edu/l1000fwd/#) was used to process expression signatures to query the IPSC-NPC datasets. The R package g:profiler 402 via RStudio was used to convert mouse gene symbols to human. The following link contains 403 profiles 404 the final expression and derived small molecules: https://amp.pharm.mssm.edu/l1000fwd/result/5e638d9763095f00340d5b7e. A number of 405 small molecules (each tested in triplicate) within the database have been tested under more 406 than one dose/duration condition, thus enabling the dissection of potential concentration-407 dependent and temporal effects. Duplicates within the top 25 for the pro-oligodendroglial or 408 top 15 anti-correlating (i.e. predicted to inhibit differentiation) small molecules were pooled, 409 averaged and ranked according to the combined pvalues/Z-scores using the R package 410 ggplot2. IPSC-NPC data were downloaded from the L1000FWD resource and tsne 411 412 coordinates used to construct a geom dot plot via ggplot2, illustrating differences in the transcriptional impact of exposure to the selected small molecules. The R code provided in 413 414 the resource (https://amp.pharm.mssm.edu/l1000fwd/api_page) was adapted for extracting 415 small molecule target-genes (TGs) in the positive and negative ranges (i.e. increased or decreased upon drug stimulation) among those relevant to the OL lineage/input expression 416 profiles. The TGs for the lower concentration of LY294002 (3.3 µm and 0.37 µm) and the 417 418 higher concentrations (10 µm, 3 datasets), were merged. TGs for Triciribine were derived 419 from the one available dataset. Next, the TGs were processed for pathway analysis using an 420 R interface of the webtool Enrichr (53) (https://cran.r-project.org/web/packages/enrichR/) 421 modified to derive pathways from the extracted small molecule TG lists and visualised using ggplots. The upregulated pathways were maintained in the positive ranges of the combined 422 423 scoring of pvalues/z-score, whilst for downregulated pathways, values were converted to 424 negative ranges. Pathway terms were shortened to fit within plots and their entire listings, together with raw transcriptomic datasets and output files used in this manuscript will be 425 placed in github (https://github.com/kasumaz) upon acceptance. Files are made available 426 during revision via a cloud drive: https://uni-duesseldorf.sciebo.de/s/7OYQaSbmHTSThy9 427

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429 In Vivo Procedures

All animal handling and experimental procedures were conducted in agreement with 430 431 institutional and regional/national guidelines and the Home Office Animals Scientific Procedures Act (1986) and following approval by the local relevant committees. Animals 432 433 were housed under standard feeding and lighting conditions. Experiments were performed 434 on the wildtype strain C57/BL6 and on transgenic mouse lines in which fluorescent reporters 435 DsRed or enhanced green fluorescent protein (EGFP) are under control of the 436 oligodendroglial-specific promoters; proteolipid protein 1 (PLP) or Sox10 as characterised 437 previously (28). Unless stated, all materials were purchased from Sigma-Aldrich. In vivo experiments were performed on mice aged between postnatal day (P)8 and P11. All 438 procedures were in accordance with the . Mice were either perfused or e killed humanely by 439 cervical dislocation and brains removed rapidly and submerged into ice-cold fixative. Mice 440 aged P8 were treated by intraventricular injections into the lateral ventricle daily for 3 days, 441 and brains sampled at P11 following the final injection. Concentration of injected small 442 molecules into the lateral ventricle were calculated and corrected based on previous 443 444 spectrophotometry of a GSK3β inhibitor's bioavailability over time (21). Mice were deeply anaesthetised with isofluorane and differing concentrations of LY294002 (Sigma-Aldrich), 445 dissolved in sterile DMSO, sterile-filtered and co-administered with sterile saline delivered 446 into the cerebrospinal fluid (CSF) of the lateral ventricle using a Hamilton syringe, at a point 447 2 mm from the midline along the Bregma, and to a depth of 2 mm. EdU 448 449 (5-ethynyl-2'-deoxyuridine) was given as done previously at ages P9 and P10 (32) (32).

450

451 Immunohistochemistry

Brains were immersion fixed in 4% paraformaldehyde (PFA) in phosphate buffered saline (PBS), either for 3h at room temperature (RT), or overnight at 4°C. Following fixation, brains were washed in PBS and 50 µm thick coronal sections were serially collected using a vibratome (*28*). Following washes in PBS, a blocking and permeabilization was performed by 456 incubation for 2h at RT or overnight at 4°C in 10% normal goat serum (NGS; Biosera) in 457 0.3% triton-X-100 in phosphate buffered saline (PBST). Sections were then incubated for 3 h at RT with agitation, or overnight at 4°C, in primary antibodies diluted in NGS: rabbit anti-458 PDGFRα (1:400, gift from Prof Stallcup); goat anti-PDGFRα (1:200, R&D Systems; mouse 459 anti-APC (CC1; 1:300, Millipore); rabbit anti-GFAP (1:300, DAKO); mouse anti-PCNA 460 (1:400, Sigma-Aldrich) mouse anti-Ascl1 (1:200, BD Biosciences); rabbit anti-Olig2 (1:400, 461 Millipore). After washes in PBST, sections were incubated for 2h at RT or overnight at 4°C in 462 the dark with the appropriate secondary antibodies conjugated with Alexafluor 488, 568 or 463 405 (1:500, Molecular Probes). Primary antibodies of different origin were diluted together in 464 blocking buffer and co-dilutions of the appropriate secondary antibodies were used. Control 465 experiments were performed using appropriate blocking peptides where available or 466 otherwise by omission of the primary antibody. For PCNA, antigen retrieval was performed 467 by pre-treating sections with PBST and NP-40 1% for 20 min to permeabilize the sections, 468 and following brief washes in PBS, sections were immersed in pre-boiled citric acid and 469 470 heated in a commercial microwave pressure cooker at full power for 30 sec for 2 cycles. After final washes in PBS, tissues were mounted on poly-lysine-coated glass slides with 471 472 Vectashield mounting medium (Vector Laboratories) and sealed with coverslips. Images 473 were acquired using an LSM 5 Pascal Axioskop2 or LSM 710 meta confocal microscope 474 (Zeiss). Fluorescence was visualized at 488 nm (green), 568 nm (red) and 405 nm (blue) 475 using argon, HeNe1 and diode lasers respectively, using an x40 oil immersion lens with high numerical aperture (1.3 nm). Optic nerves were immersion fixed in 4% paraformaldehyde 476 (PFA) in phosphate-buffered saline (PBS) for 1 h at RT and following washes in PBS were 477 whole-mounted on microscope slides in VectaShield (VectorLabs). 478

479

480 Optic nerve tissue and organotypic cerebellar slice cultures

481 Organotypic cultures of mouse optic nerves were performed as described previously (13) and cerebellar slice cultures were prepared using tissue isolated from mice aged postnatal 482 day P10-12 as previously described (54). Optic nerves were removed with the retina intact 483 and cerebellar slices were placed immediately in ice-chilled oxygenated artificial (a)CSF 484 composed of: NaCl 133 mM, KCl 3 mM, CaCl2 1.5 mM, NaH2PO4 1.2 mM, HEPES buffer 485 486 10 mM pH 7.3, 0.5% penicillin and streptomycin (Invitrogen). For optic nerves, n = 6 optic nerves from 3 mice were used per experimental group for confocal microscopy analysis, and 487 12 nerves from 6 mice were used for transcriptomic analysis, according to power 488 489 calculations ensuring sample sizes were adequate to detect statistical differences. For prepa ring cerebellar slices, brain was rapidly removed and placed in oxygenated ice cold slicing 490 491 solution containing (in mM) 25.95 NaHCO3, 1.39 NaH2PO4, 10 glucose, 124 NaCl, 2.95 492 KCI, 10 MgCl2, 2 CaCl2, 1 MgSO4, 1000 units/mL penicillin/streptomycin) and 300 µm 493 parasagittal slices were cut using a vibrating microtome 5100 mz (Campden Instruments 494 LTD). Slices were then analysed under the dissecting microscope to ensure maintenance of 495 normal cytoarchitecture. Isolated tissues were carefully cleaned of the arachnoid membrane and any attached peripheral/CNS tissue, then washed in aCSF and placed on semiporous 496 497 culture membrane inserts (Millipore $0.4 \,\mu$ m). The medium (1 ml) for maintaining optic nerves consisted of 25% horse serum, 49% OptiMEM, 25% Hanks's balanced salt solution, 0.5% 498 25 mM glucose, 0.5% penicillin and streptomycin and for cerebellar slices comprised 50% 499 MEM (Eagle) with Glutamax-1, 25% EBSS, 25% horse serum, 130 mM glucose and 1% 500 penicillin-streptomycin (all from GIBCO/Invitrogen). Tissue were maintained ex vivo at 37 °C 501 502 in 95%O2/5% CO2 for 3 days. LY29 was added directly to the culture medium using the concentrations and duration as stated in the main text and vehicle DMSO used as control. 503 After 3 days for the optic nerve or 7 days for cerebellar slices, tissues were prepared for 504 505 confocal imaging, RNA extraction or western blot.

506

507 Cell counts, confocal microscopy and image analysis

508 All experiments were conducted in triplicates and no samples were excluded; due to the 509 study design animals were not blindly selected for group allocation, but all outcome 510 measurements were subsequently conducted blindly, and all samples were included. 511 Periventricular sections containing the lateral ventricle were analysed (>3 sections per brain) using homogenous quantification procedures (55); counts of OLs and OPC numbers in 512 untreated controls confirmed that there were no significant differences between sections 513 taken in this area (21). Images were captured using a Zeiss LSM Meta 5.1 or Zeiss LSM 7.1 514 meta confocal microscope and processed with the latest Zeiss ZEN software (black edition), 515 maintaining the acquisition parameters constant to allow comparison between samples. 516 Coronal brain sections were used throughout and cell counts performed in the dorsal SVZ, 517 518 corpus callosum and cerebral cortex on orthogonally projected confocal z-stacks, of 230 µm2 x 230 µm2 in the x-y-plane, and 30 µm in the z-plane. 1 Hemisphere was used for 519 quantification and the other hemisphere for capturing representative images. For 520 extracellular markers, a nuclear counterstain (DAPI (Invitrogen) or Propidium Iodide (Sigma-521 522 Aldrich) was applied to aid quantification.

523

For analysis of optic nerve cultures, cells expressing either the Sox10-EGFP or PLP-DsRed reporter were visualised at 488nm or 546nm respectively using an argon laser. Images were captured on a Zeiss LSM 710 meta-confocal microscope using a x20 Plan-NEOFLUAR 20 objective with a numerical aperture of 0.50. Images were captured maintaining the acquisition parameters constant between samples. Each nerve counted as a single sample and the total number of cells was counted midway along the length of the optic nerve in a 530 single field of view (FOV), comprising a constant volume of 200 µm × 200 µm in the x-y-531 plane and 25 µm in the z-plane, commencing 15 µm below the pial surface. For all comparisons, the significance level was set to 5%; due to the explorative nature of this 532 study, no adjustment was made to the significance level. Cell counts are expressed as mean 533 number of cells per FOV±standard error of the mean (SEM). There were six nerves from 534 three mice in each experimental group and statistical analysis was performed as follows. 535 Measurement of a myelin index was performed on sections from PLP-DsRed mice (21), 536 providing a reliable readout of myelinated sheaths through a z-plane. Confocal micrographs 537 captured with an x40 objective from every 5h confocal section in a series of 30 (n=7 sections 538 of 30 µm thickness) were analysed. The myelin index score presented is the total number of 539 DsRed+ myelin sheaths in a 30 µm thickness from an individual nerve. GraphPad Prism v6 540 for multiple variables, using either Dunnett's Multiple Comparisons test, or one-way analysis 541 of variance (ANOVA) followed by Bonferroni's posthoc test, and for two variable using 542 543 unpaired t-tests (referred to as t-test) was applied.

544

545 Western blot

546 P9 pups were bilaterally intraventricularly injected with LY29 as described above. 45 mins 547 following injection, pups were sacrificed by cervical dislocation and tissue rapidly 548 microdissected and flash frozen in lysis buffer in liquid nitrogen for storage at -80°C. Tissue from several pups was pooled to yield individual samples used for later molecular assays. 549 Corpus callosum or optic nerve tissue were centrifuged at 4000 x g to obtain tissue pellets 550 and proteins extracted with lysis buffer as described previously (21). After centrifugation for 551 15 min at 10,000 x g and 4°C, supernatant was transferred to Ultrafree MC centrifugal spin 552 columns (Millipore) for separation and concentration of protein extracts above 15 KDa and 553 Bradford protein assay applied for determination of protein content. For protein analysis, 554 555 samples were then solubilised and denatured in Lamelli sample buffer (Biorad) with βmercaptoethanol (Sigma-Aldrich) for 5 min at 95 °C and were placed on ice until loading. 15 556 µg were loaded onto the gel with Lamelli sample buffer. Solubilised, denatured proteins were 557 then separated via SDS-PAGE and transferred to a PVDF membrane (GE Healthcare, 558 Amersham). Blots were preincubated in a blocking solution of 5% BSA in 0.2% TBST (0.1 M 559 560 Tris base, 0.1% Tween 20, pH 7.4) for 1 hr at RT, incubated with primary antibodies overnight at 4°C and after washing, with a horseradish peroxidase-conjugated anti-rabbit 561 antibody (1:10,000–1:25,000; Pierce Biotechnology). Primary antibodies were all obtained 562 563 from Cell Signaling and used in concentrations of 1:500 for phosphor-forms and 1:2000 for total forms of protein. Protein bands were detected by adding SuperSignal West Pico 564 Chemiluminescent Substrate (Pierce) by exposing the blot in a Stella detector (Raytest). 565 566 Densitometry analysis was performed with NIH software and by normalizing the band intensities to total Akt or total Erk1/2 values and significance assessed using one-wayanalysis of variance (ANOVA) followed by Bonferroni's posthoc test.

569

570 **RNA extraction and qPCR**

RNA extraction from cerebellar slices was performed by placing them in 500 µL of ice-chilled 571 Trizol. 180 µg of total RNA from each sample were converted to single stranded cDNA using 572 the SuperScript® VILOTM cDNA Synthesis Kit (Invitrogen-Life Technologies) following 573 manufacturer instructions. Subsequently, cDNA was added to a mixture of FastStart 574 Essential DNA Probes Master and of FAM dye-labelled primers following manufacturer's 575 instructions. Samples were run using a Roche Lyghtcycler 96 (Roche) instrument. Reaction 576 consisted of pre-incubation at 95°C for 600 seconds followed by 45 cycles of two step 577 amplification of 95 °C for 10 seconds and 60°C for 30 seconds. Data normalisation to the 578 579 housekeeping gene Gapdh. Primer sequences: Mbp: 5'ATTCACCGAGGAGAGGCTGGAA'3 3'TGTGTGCTTGGAGTCTGTCACC'5; Apc: 5'GTGGACTGTGAGATGTATGGGC'3 / 580 / 581 3'CACAAGTGCTCTCATGCAGCCT'5; Sox10: 5'AGTACCCGCACCTGCACA'3'; / 3'GAAGGGGCGCTTGTCACT'5; Cspg4/NG2: 5'GAGGTCTTGGTGAACTTCACCC'3 582 / 583 3'GACAGTAGGAGACCGATGGTGT'5; Gapdh: 5'TTGATGGCAACAATCTCCAC'3 1 584 3'CGTCCCGTAGACAAATGGT'5. Relative gene expression levels were determined using 585 the 2 $\Delta\Delta$ -CT method (33). Primers were designed by Primer Express 1.5 software and synthesized by Eurofins MG. Gene expression data are presented as mean and the 586 standard error of the mean (+SEM), and samples were compared for significance via t-test 587 using GraphPad Prism v3.02 software. 588

589

590 Whole genome transcriptome analysis

591 Complete details are provided in a recent study from the authors as identical procedures were followed for preparation of RNA for Affymetrix GeneChip Mouse Genome 430 (13). 592 Downstream quality control steps and data analysis of produced .CEL image and .CHP 593 image files were performed using Affymetrix GeneChip Operating Software. Agilent 594 GeneSpring GX 12 software was used to normalise the datasets using the MAS-5 algorithm 595 and further statistical analyses. GeneSpring was used to generate hierarchical clustering 596 597 and the meta-analysis profiles of oligodendroglia-specific (OPC and MYOL) signatures from published databases (17, 56). Gene Ontology analysis was performed 598 usina ConsensusPathDB, String V10.5 and STITCH db, described in detail previously (13). Data 599 600 are available via the link provided (https://uni-duesseldorf.sciebo.de/s/32r6pWUwjpVG5Z7) until acceptance and raw data are made available in the Github repository. 601

604 Bioplex immunoassay

Cerebellar slices of 300 µm thickness were isolated from P11 wild type mice C57BL/6 strain 605 and incubated for 3d as previously described. After 3d, slices were washed in ice-cold cell 606 wash buffer and lysed according to the manufacturer's instructions. Total protein content 607 608 was determined via BCA assay and samples and cell lysate controls were diluted to 10 µg/well (50 µL) in lysis buffer to ensure a constant sample input across all samples. Briefly, 609 samples blank (detection antibody) were loaded in duplicates in a 96-flat bottom well plate 610 611 (Biorad) with previously diluted custom-made premixed fluorescent beads, which allowed the 612 simultaneous quantification of phosphorylation levels in 7 analytes, and incubated for 15-18h 613 at RT under constant shaking. After washings in wash buffer, samples were incubated in detection antibody for 30 minutes, washed again prior to incubation in Streptavidin-PE for 614 10minutes. All incubations were performed at RT, under constant shaking and covered from 615 616 light to protect the light-sensitive beads. Resuspended beads were then transferred to the 617 Bio-plex Suspension Array system (BioRad) for quantification of phosphoproteins fluorescence intensity and results were expressed as mean fluorescence intensity (MFI). 618 Further analysis was performed manually for excluding subtract blank MFI values 619 620 (background) for each analyte from each sample. Statistical significance was calculated with GraphPad Prism 6. 621

622

623 Supplementary Materials

Fig. S1: Prediction of the cellular effects of LINCS-derived small molecules onoligodendrocyte lineage cells.

626

Fig. S2: Concentration-dependent effects of LY294002 (LY-29) and Triciribine on stagespecific oligodendroglia in the corpus callosum and cortex.

Fig. S3: LY294002 regulates oligodendroglial cells in the postnatal optic nerve and
cerebellar slices ex vivo.

632

Fig. S4: Concentration-dependent effects of LY29 on adult optic nerve oligodendroglia andwhole genome profiling for revealing genes regulated by LY29.

635

Tables S1: Concentration-dependency of LY294002 on transcriptome alterations in adult
optic nerve. Related to Fig. S4L. Tables can be visualised at the cloud link: https://uniduesseldorf.sciebo.de/s/L27W5LaxL515JdT

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Tables S2: Meta-analysis of L-LY294002 on OPC and MYOL enriched expression
signatures. Related to Fig. S4L. Tables can be visualised at the cloud link: https://uniduesseldorf.sciebo.de/s/oaCiiS0VVheergd

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645 References:

- K. M. Young, K. Psachoulia, R. B. Tripathi, S.-J. Dunn, L. Cossell, D. Attwell, K. Tohyama, W. D.
 Richardson, Oligodendrocyte dynamics in the healthy adult CNS: evidence for myelin
 remodeling. *Neuron* 77, 873-885 (2013)10.1016/j.neuron.2013.01.006).
- 648 remodeling. *Neuron* 77, 873-885 (2013)10.1016/J.neuron.2013.01.006).
 649 2. K. Azim, B. Berninger, O. Raineteau, Mosaic Subventricular Origins of Forebrain
- 650 Oligodendrogenesis. *Front Neurosci* **10**, 107 (2016)10.3389/fnins.2016.00107).
- 651 3. K. Azim, D. Angonin, G. Marcy, F. Pieropan, A. Rivera, V. Donega, C. Cantu, G. Williams, B.
- 652 Berninger, A. M. Butt, O. Raineteau, Pharmacogenomic identification of small molecules for 653 lineage specific manipulation of subventricular zone germinal activity. *PLoS Biol* **15**, 654 e2000698 (2017); published online EpubMar (10.1371/journal.pbio.2000698).
- E. G. Hughes, J. L. Orthmann-Murphy, A. J. Langseth, D. E. Bergles, Myelin remodeling
 through experience-dependent oligodendrogenesis in the adult somatosensory cortex. *Nat Neurosci* 21, 696-706 (2018); published online EpubMay (10.1038/s41593-018-0121-5).
- 5. F. C. Ortiz, C. Habermacher, M. Graciarena, P.-Y. Houry, A. Nishiyama, B. Nait Oumesmar, M.
 659 C. Angulo, Neuronal activity in vivo enhances functional myelin repair. *JCl Insight* 4, (2019);
 660 published online Epub05/02/ (10.1172/jci.insight.123434).
- 6. Y. L. Xing, P. T. Röth, J. A. S. Stratton, B. H. A. Chuang, J. Danne, S. L. Ellis, S. W. Ng, T. J.
 Kilpatrick, T. D. Merson, Adult neural precursor cells from the subventricular zone contribute
 significantly to oligodendrocyte regeneration and remyelination. *The Journal of neuroscience : the official journal of the Society for Neuroscience* **34**, 14128-14146
 (2014)10.1523/JNEUROSCI.3491-13.2014).
- 666 7. M. Segel, B. Neumann, M. F. E. Hill, I. P. Weber, C. Viscomi, C. Zhao, A. Young, C. C. Agley, A.
 667 A. Constant C. A. Constant A. Charman, C. Halmmitt, D. H. Bawittah, K. Franze, B. J. M.
- J. Thompson, G. A. Gonzalez, A. Sharma, S. Holmqvist, D. H. Rowitch, K. Franze, R. J. M.
 Franklin, K. J. Chalut, Niche stiffness underlies the ageing of central nervous system
 progenitor cells. *Nature* 573, 130-134 (2019); published online EpubSep (10.1038/s41586019-1484-9).
- F. J. Sim, C. Zhao, J. Penderis, R. J. Franklin, The age-related decrease in CNS remyelination
 efficiency is attributable to an impairment of both oligodendrocyte progenitor recruitment
 and differentiation. *The Journal of neuroscience : the official journal of the Society for Neuroscience* 22, 2451-2459 (2002); published online EpubApr 1 (20026217).
- B. Neumann, R. Baror, C. Zhao, M. Segel, S. Dietmann, K. S. Rawji, S. Foerster, C. R. McClain,
 K. Chalut, P. van Wijngaarden, R. J. M. Franklin, Metformin Restores CNS Remyelination
 Capacity by Rejuvenating Aged Stem Cells. *Cell stem cell* 25, 473-485.e478 (2019); published
 online EpubOct 3 (10.1016/j.stem.2019.08.015).
- 10. I. Vanzulli, M. Papanikolaou, I. C. De-La-Rocha, F. Pieropan, A. D. Rivera, D. Gomez-Nicola, A.
 Verkhratsky, J. J. Rodríguez, A. M. Butt, Disruption of oligodendrocyte progenitor cells is an
 early sign of pathology in the triple transgenic mouse model of Alzheimer's disease. *Neurobiology of Aging* 94, 130-139 (2020); published online Epub2020/10/01/
 (https://doi.org/10.1016/j.neurobiolaging.2020.05.016).
- 684 11. A. Subramanian, R. Narayan, S. M. Corsello, D. D. Peck, T. E. Natoli, X. Lu, J. Gould, J. F. Davis, 685 A. A. Tubelli, J. K. Asiedu, D. L. Lahr, J. E. Hirschman, Z. Liu, M. Donahue, B. Julian, M. Khan, D. Wadden, I. C. Smith, D. Lam, A. Liberzon, C. Toder, M. Bagul, M. Orzechowski, O. M. 686 687 Enache, F. Piccioni, S. A. Johnson, N. J. Lyons, A. H. Berger, A. F. Shamji, A. N. Brooks, A. Vrcic, C. Flynn, J. Rosains, D. Y. Takeda, R. Hu, D. Davison, J. Lamb, K. Ardlie, L. Hogstrom, P. 688 Greenside, N. S. Gray, P. A. Clemons, S. Silver, X. Wu, W. N. Zhao, W. Read-Button, X. Wu, S. 689 690 J. Haggarty, L. V. Ronco, J. S. Boehm, S. L. Schreiber, J. G. Doench, J. A. Bittker, D. E. Root, B. 691 Wong, T. R. Golub, A Next Generation Connectivity Map: L1000 Platform and the First 692 1,000,000 Profiles. Cell 171, 1437-1452 e1417 (2017); published online EpubNov 30 693 (10.1016/j.cell.2017.10.049).

E. J. R. Fletcher, A. D. Jamieson, G. Williams, P. Doherty, S. Duty, Targeted repositioning
identifies drugs that increase fibroblast growth factor 20 production and protect against 6hydroxydopamine-induced nigral cell loss in rats. *Scientific reports* 9, 8336 (2019); published
online EpubJun 6 (10.1038/s41598-019-44803-1

698 10.1038/s41598-019-44803-1 [pii]).

- A. D. Rivera, A. M. Butt, Astrocytes are direct cellular targets of lithium treatment: novel
 roles for lysyl oxidase and peroxisome-proliferator activated receptor-gamma as astroglial
 targets of lithium. *Translational psychiatry* 9, 211 (2019); published online EpubSep 2
 (10.1038/s41398-019-0542-2).
- A. Lipponen, J. Paananen, N. Puhakka, A. Pitkanen, Analysis of Post-Traumatic Brain Injury
 Gene Expression Signature Reveals Tubulins, Nfe2l2, Nfkb, Cd44, and S100a4 as Treatment
 Targets. *Scientific reports* 6, 31570 (2016); published online EpubAug 17 (srep31570 [pii]

706 10.1038/srep31570).

- 707 15. G. S. Vemuri, F. A. McMorris, Oligodendrocytes and their precursors require
 708 phosphatidylinositol 3-kinase signaling for survival. *Development* 122, 2529-2537 (1996);
 709 published online EpubAug (
- 710 16. C. Norrmen, U. Suter, Akt/mTOR signalling in myelination. *Biochemical Society transactions*711 **41**, 944-950 (2013); published online EpubAug (10.1042/BST20130046).
- 17. K. Azim, R. Akkermann, M. Cantone, J. Vera, J. J. Jadasz, P. Kury, Transcriptional Profiling of
 Ligand Expression in Cell Specific Populations of the Adult Mouse Forebrain That Regulates
 Neurogenesis. *Frontiers in neuroscience* 12, 220 (2018)10.3389/fnins.2018.00220).
- 18. K. Azim, A. Hurtado-Chong, B. Fischer, N. Kumar, S. Zweifel, V. Taylor, O. Raineteau,
 Transcriptional Hallmarks of Heterogeneous Neural Stem Cell Niches of the Subventricular
 Zone. *Stem Cells* 33, 2232-2242 (2015); published online EpubJul (10.1002/stem.2017).
- K. Azim, F. Calzolari, M. Cantone, R. Akkermann, J. Vera, H.-P. Hartung, O. Basak, A. M. Butt,
 P. Küry, Dissecting the Transcriptional Landscapes Orchestrating Oligodendrocyte
 Specification from the Adult Subventricular Zone by Single Cell Sequencing. (manuscript in
 revision).
- M. Cantone, M. Kuspert, S. Reiprich, X. Lai, M. Eberhardt, P. Gottle, F. Beyer, K. Azim, P. Kury,
 M. Wegner, J. Vera, A gene regulatory architecture that controls region-independent
 dynamics of oligodendrocyte differentiation. *Glia*, (2019); published online EpubFeb 7
 (10.1002/glia.23569).
- 726 21. K. Azim, A. M. Butt, GSK3beta negatively regulates oligodendrocyte differentiation and
 727 myelination in vivo. *GLIA* 59, 540-553 (2011); published online EpubApr
 728 (10.1002/glia.21122).
- T. L. Wood, K. K. Bercury, S. E. Cifelli, L. E. Mursch, J. Min, J. Dai, W. B. Macklin, mTOR: a link
 from the extracellular milieu to transcriptional regulation of oligodendrocyte development. *ASN neuro* 5, e00108 (2013); published online EpubMar 19 (10.1042/AN20120092).
- M. Marin-Husstege, M. Muggironi, A. Liu, P. Casaccia-Bonnefil, Histone deacetylase activity is
 necessary for oligodendrocyte lineage progression. *The Journal of neuroscience : the official journal of the Society for Neuroscience* 22, 10333-10345 (2002)10.1523/JNEUROSCI.22-2310333.2002).
- 73624.A. Gregath, Q. R. Lu, Epigenetic modifications—insight into oligodendrocyte lineage737progression, regeneration, and disease. *FEBS Letters* **592**, 1063-1078 (2018); published738online Epub2018/04/01 (10.1002/1873-3468.12999).
- C. A. Lyssiotis, J. Walker, C. Wu, T. Kondo, P. G. Schultz, X. Wu, Inhibition of histone
 deacetylase activity induces developmental plasticity in oligodendrocyte precursor cells. *Proceedings of the National Academy of Sciences* **104**, 14982
- 742 (2007)10.1073/pnas.0707044104).

743 26. S. I. Gharbi, M. J. Zvelebil, S. J. Shuttleworth, T. Hancox, N. Saghir, J. F. Timms, M. D. Waterfield, Exploring the specificity of the PI3K family inhibitor LY294002. Biochem J 404, 15-744 745 21 (2007); published online EpubMay 15 (10.1042/BJ20061489). 746 A. Ishii, M. Furusho, W. Macklin, R. Bansal, Independent and cooperative roles of the 27. 747 Mek/ERK1/2-MAPK and PI3K/Akt/mTOR pathways during developmental myelination and in 748 adulthood. Glia 67, 1277-1295 (2019)10.1002/glia.23602). 749 28. K. Azim, O. Raineteau, A. M. Butt, Intraventricular injection of FGF-2 promotes generation of 750 oligodendrocyte-lineage cells in the postnatal and adult forebrain. GLIA 60, 1977-1990 751 (2012); published online EpubDec (10.1002/glia.22413). 752 N. Berndt, H. Yang, B. Trinczek, S. Betzi, Z. Zhang, B. Wu, N. J. Lawrence, M. Pellecchia, E. 29. 753 Schönbrunn, J. Q. Cheng, S. M. Sebti, The Akt activation inhibitor TCN-P inhibits Akt 754 phosphorylation by binding to the PH domain of Akt and blocking its recruitment to the 755 plasma membrane. Cell Death Differ 17, 1795-1804 (2010)10.1038/cdd.2010.63). 756 30. L. Yang, H. C. Dan, M. Sun, Q. Liu, X.-m. Sun, R. I. Feldman, A. D. Hamilton, M. Polokoff, S. V. 757 Nicosia, M. Herlyn, S. M. Sebti, J. Q. Cheng, Akt/Protein Kinase B Signaling Inhibitor-2, a 758 Selective Small Molecule Inhibitor of Akt Signaling with Antitumor Activity in Cancer Cells 759 Overexpressing Akt. Cancer Research 64, 4394 (2004)10.1158/0008-5472.CAN-04-0343). 760 31. A. I. Flores, S. P. Narayanan, E. N. Morse, H. E. Shick, X. Yin, G. Kidd, R. L. Avila, D. A. Kirschner, W. B. Macklin, Constitutively active Akt induces enhanced myelination in the CNS. 761 762 J Neurosci 28, 7174-7183 (2008); published online EpubJul 9 (10.1523/JNEUROSCI.0150-763 08.2008). 764 32. K. Azim, B. Fischer, A. Hurtado-Chong, K. Draganova, C. Cantu, M. Zemke, L. Sommer, A. Butt, 765 O. Raineteau, Persistent Wnt/beta-catenin signaling determines dorsalization of the postnatal subventricular zone and neural stem cell specification into oligodendrocytes and 766 767 glutamatergic neurons. Stem Cells 32, 1301-1312 (2014); published online EpubMay 768 (10.1002/stem.1639). 769 33. K. Azim, A. Rivera, O. Raineteau, A. M. Butt, GSK3beta regulates oligodendrogenesis in the 770 dorsal microdomain of the subventricular zone via Wnt-beta-catenin signaling. GLIA 62, 778-771 779 (2014); published online EpubMay (10.1002/glia.22641). 772 34. M. G. Salter, R. Fern, NMDA receptors are expressed in developing oligodendrocyte 773 processes and mediate injury. Nature 438, 1167-1171 (2005); published online EpubDec 22 774 (10.1038/nature04301). W. A. Tyler, N. Gangoli, P. Gokina, H. A. Kim, M. Covey, S. W. Levison, T. L. Wood, Activation 775 35. 776 of the mammalian target of rapamycin (mTOR) is essential for oligodendrocyte 777 differentiation. J Neurosci 29, 6367-6378 (2009); published online EpubMay 13 778 (10.1523/JNEUROSCI.0234-09.2009). 779 36. J. K. Ness, N. E. Mitchell, T. L. Wood, IGF-I and NT-3 signaling pathways in developing 780 oligodendrocytes: differential regulation and activation of receptors and the downstream 781 effector Akt. Dev Neurosci 24, 437-445 (2002). 782 37. A. Y. Galvez-Contreras, A. Quiñones-Hinojosa, O. Gonzalez-Perez, The role of EGFR and ErbB 783 family related proteins in the oligodendrocyte specification in germinal niches of the adult 784 mammalian brain. Front Cell Neurosci 7, 258-258 (2013)10.3389/fncel.2013.00258). 785 38. A. Aguirre, J. L. Dupree, J. M. Mangin, V. Gallo, A functional role for EGFR signaling in 786 myelination and remyelination. Nat Neurosci 10, 990-1002 (2007); published online EpubAug 787 (10.1038/nn1938). 788 39. M. S. Erwig, J. Patzig, A. M. Steyer, P. Dibaj, M. Heilmann, I. Heilmann, R. B. Jung, K. Kusch, 789 W. Mobius, O. Jahn, K. A. Nave, H. B. Werner, Anillin facilitates septin assembly to prevent 790 pathological outfoldings of central nervous system myelin. *eLife* 8, (2019); published online 791 EpubJan 23 (10.7554/eLife.43888).

- A. J. Piekny, M. Glotzer, Anillin is a scaffold protein that links RhoA, actin, and myosin during
 cytokinesis. *Current biology : CB* 18, 30-36 (2008); published online EpubJan 8
 (10.1016/j.cub.2007.11.068).
- A. D. Lafrenaye, B. Fuss, Focal adhesion kinase can play unique and opposing roles in
 regulating the morphology of differentiating oligodendrocytes. *J Neurochem* **115**, 269-282;
 published online EpubOct (JNC6926 [pii]
- 798 10.1111/j.1471-4159.2010.06926.x).
- 42. E. Gonzalez-Fernandez, H. K. Jeong, M. Fukaya, H. Kim, R. R. Khawaja, I. N. Srivastava, A.
 Waisman, Y. J. Son, S. H. Kang, PTEN negatively regulates the cell lineage progression from
 NG2(+) glial progenitor to oligodendrocyte via mTOR-independent signaling. *eLife* 7;
 published online EpubFeb 20 (10.7554/eLife.32021
- 803 32021 [pii]).
- 80443.J. M. Gaesser, S. L. Fyffe-Maricich, Intracellular signaling pathway regulation of myelination805and remyelination in the CNS. *Exp Neurol* **283**, 501-511 (2016); published online EpubSep806(10.1016/j.expneurol.2016.03.008).
- 807
 44.
 G. Figlia, D. Gerber, U. Suter, Myelination and mTOR. *Glia* **66**, 693-707 (2018); published

 808
 online EpubApr (10.1002/glia.23273).
- A. D. Sinor, L. Lillien, Akt-1 expression level regulates CNS precursors. *J Neurosci* 24, 85318541 (2004); published online EpubSep 29 (10.1523/JNEUROSCI.1470-04.2004).
- 46. M. Gacias, G. Gerona-Navarro, A. N. Plotnikov, G. Zhang, L. Zeng, J. Kaur, G. Moy, E.
 Rusinova, Y. Rodriguez, B. Matikainen, A. Vincek, J. Joshua, P. Casaccia, M. M. Zhou, Selective
 chemical modulation of gene transcription favors oligodendrocyte lineage progression. *Chemistry & biology* 21, 841-854 (2014); published online EpubJul 17
 (10.1016/i chembiol 2014.05.009)
- 815 (10.1016/j.chembiol.2014.05.009).
- A. Dittmann, T. Werner, C. W. Chung, M. M. Savitski, M. Falth Savitski, P. Grandi, C. Hopf, M.
 Lindon, G. Neubauer, R. K. Prinjha, M. Bantscheff, G. Drewes, The commonly used PI3-kinase
 probe LY294002 is an inhibitor of BET bromodomains. *ACS chemical biology* 9, 495-502
 (2014); published online EpubFeb 21 (10.1021/cb400789e).
- 48. J. Li, J. Ma, G. Meng, H. Lin, S. Wu, J. Wang, J. Luo, X. Xu, D. Tough, M. Lindon, I. Rioja, J.
 Zhao, H. Mei, R. Prinjha, Z. Zhong, BET bromodomain inhibition promotes neurogenesis
 while inhibiting gliogenesis in neural progenitor cells. *Stem cell research* 17, 212-221 (2016);
 published online EpubSep (10.1016/j.scr.2016.07.006).
- 82449.A. Ntranos, P. Casaccia, Bromodomains: Translating the words of lysine acetylation into825myelin injury and repair. Neurosci Lett 625, 4-10 (2016); published online EpubJun 20826(10.1016/j.neulet.2015.10.015).
- 50. T. L. Wood, K. K. Bercury, S. E. Cifelli, L. E. Mursch, J. Min, J. Dai, W. B. Macklin, mTOR: a link
 from the extracellular milieu to transcriptional regulation of oligodendrocyte development.
 ASN neuro 5, e00108; published online EpubMar 19 (AN20120092 [pii]
- 830 10.1042/AN20120092).
- S1. G. Williams, A searchable cross-platform gene expression database reveals connections
 between drug treatments and disease. *BMC genomics* 13, 12 (2012)10.1186/1471-2164-1312).
- 52. O. Basak, T. G. Krieger, M. J. Muraro, K. Wiebrands, D. E. Stange, J. Frias-Aldeguer, N. C.
 Rivron, M. van de Wetering, J. H. van Es, A. van Oudenaarden, B. D. Simons, H. Clevers, Troy+
 brain stem cells cycle through quiescence and regulate their number by sensing niche
 occupancy. *Proc Natl Acad Sci U S A* **115**, E610-E619 (2018); published online EpubJan 23
 (10.1073/pnas.1715911114).
- 839 53. M. V. Kuleshov, M. R. Jones, A. D. Rouillard, N. F. Fernandez, Q. Duan, Z. Wang, S. Koplev, S.
 840 L. Jenkins, K. M. Jagodnik, A. Lachmann, M. G. McDermott, C. D. Monteiro, G. W. Gundersen,

841 A. Ma'ayan, Enrichr: a comprehensive gene set enrichment analysis web server 2016 update. Nucleic acids research 44, W90-97 (2016); published online EpubJul 8 (10.1093/nar/gkw377). 842 54. M. M. A. de Almeida, F. Pieropan, L. de Mattos Oliveira, M. C. Dos Santos Junior, J. M. David, 843 844 J. P. David, V. D. A. da Silva, C. Dos Santos Souza, S. L. Costa, A. M. Butt, The flavonoid agathisflavone modulates the microglial neuroinflammatory response and enhances 845 846 remyelination. Pharmacological research 159, 104997 (2020); published online EpubJun 11 847 (10.1016/j.phrs.2020.104997). 848 55. K. Azim, R. Fiorelli, S. Zweifel, A. Hurtado-Chong, K. Yoshikawa, L. Slomianka, O. Raineteau, 3-849 dimensional examination of the adult mouse subventricular zone reveals lineage-specific microdomains. PLoS ONE 7, e49087 (2012)10.1371/journal.pone.0049087). 850

56. J. D. Cahoy, B. Emery, A. Kaushal, L. C. Foo, J. L. Zamanian, K. S. Christopherson, Y. Xing, J. L.
Lubischer, P. A. Krieg, S. A. Krupenko, W. J. Thompson, B. A. Barres, A transcriptome
database for astrocytes, neurons, and oligodendrocytes: a new resource for understanding
brain development and function. *J Neurosci* 28, 264-278 (2008); published online EpubJan 2
(10.1523/JNEUROSCI.4178-07.2008).



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868 Authors' contributions

FP was responsible for the conceptualization, data curation, formal analysis, methodology, supervision. AR contributed to writing, validation, data curation and data analysis. GW carried out data curation, analysis, investigation validation, and methodology. FC was responsible for writing and data analysis. AB was responsible for funding acquisition, project administration, writing, methodology, supervision and validation. KA for funding acquisition, investigation, data curation, methodology, project administration, supervision, validation and writing.

876 Competing interests

877 The authors have declared no competing or financial interests.

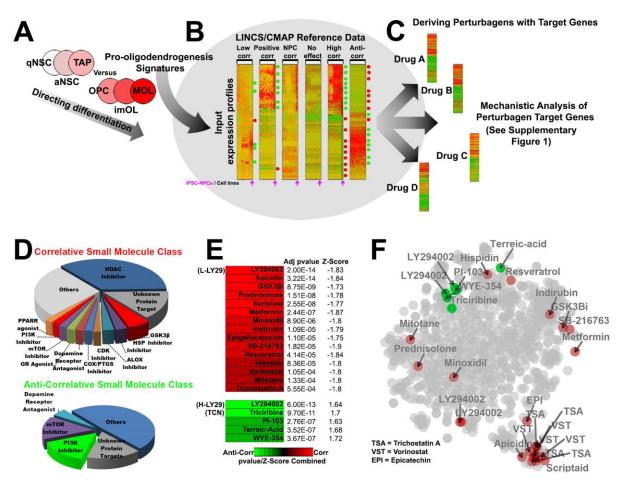
878 Data and materials availability

879 Scripts developed for the first time, Cytoscape files, bulk transcriptomic datasets, gene lists 880 and raw data's of this study will be placed in Github upon acceptance and a temporary link 881 provided in the methods section.

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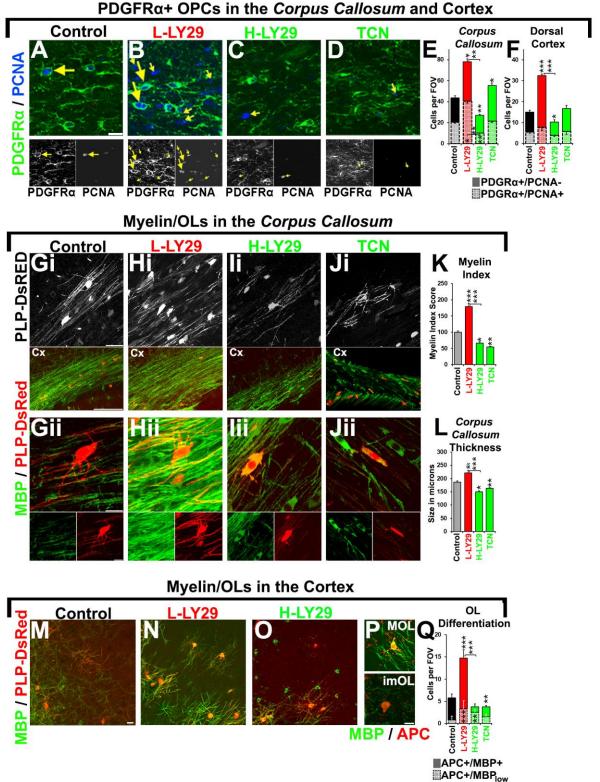
887 Figure and Legends

- Fig. 1: Querying the LINCS database for small molecules modulating oligodendroglia
- and insights into their cellular mechanisms of action.



(A,B) Transcriptional signatures of early and late OL lineage stages are used to query the 890 891 LINCS database, which contains drug-induced expression profiles for over 20,000 small molecules assayed in over 90 cells lines. To focus on the most OL-relevant data, only LINCS 892 datasets comprising IPSCs-NSCs were queried. (C) Matching small molecule target genes 893 (TGs) are extracted for subsequent mechanistic investigations. (D) The broader mechanisms 894 of action/target proteins of the highest ranked small molecules. (E) Heatmap output of the 895 top ranking small molecules predicted to enhance (red) or inhibit (green) myelination, sorted 896 by their adjusted (adj) pvalues, coloured by their combined pvalue/z-score (correlation in 897 input profiles with the profiles induced by IPSCs-NSCs within the database). Small 898 molecules tested are abbreviated in brackets. (F) tSNE plot illustrating the 899 distance/similarities in TGs induced by top ranking oligodendroglial perturbing small 900 molecules. Note the distance between LY-294002 TGs (LY-29) for the higher (green) and 901 902 lower (red) concentrations.

Fig. 2: Concentration-dependent effects of LINCS-derived small molecules on 903 oligodendroglia in the periventricular forebrain. 904



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Transgenic PLP-DsRed and wildtype P8 mice treated with saline/DMSO as controls, LY-29 906 and TCN by infusion into the lateral ventricle for 3 days and analysed at P11. 907

Immunostaining done for PDGFRa for OPCs, PCNA for cells in S-phase and MBP for 908 myelin. (A-F) Examination/quantification of OPCs in the corpus callosum and cortex and 909 their cell cycle states and quantifications in E. Arrows exemplify PDGFRa+/PCNA+ OPCs 910 and small arrows are PDGFR α -/PCNA+ pre-OPC. Scale bars = 20 μ m. (**G-L**) Top panels, 911 middle and lower panels with captions show respectively single z-planes of PLP-DsRed+ 912 myelin sheaths/MYOL, overview of the corpus callosum via MBP immunostainings and 913 higher power cropped confocal sections. Morphologies of OLs induced by L-LY-29 914 supported further myelin sheaths compared to controls, but OLs appeared abnormal and did 915 not support myelin sheaths in H-LY-29 and TCN. Scale bars = 20 µm in top panels, 150 µm 916 in the corpus callosum overviews and 10 µm in Gii. (M-Q) Determination of imOLs and 917 MYOLs densities in the cortex where individual stages of OL units are resolvable as 918 exemplified in P and quantified in Q (n = 4). Flattened confocal z-sections are of 20 μ m 919 thickness. Scale bar = 20 µm in M and 10 µm in P. In histograms of (E) to (Q), data are 920 mean + SEM guantifications in each region in a constant volume in the case of cell counts 921 922 (fields of view: FOV); n≥4 animals and each n number represents 3 brain averaged per mouse (***p<0.001, **, p <.01, *, p <.05; t-test). Quantification of myelin index in K or 923 corpus callosum thickness in L are averaged numbers from n = 4 mice (3-4 brain sections 924 925 per mice) per condition with error bars in SEM. Bonferroni's posthoc test used to reveal 926 statistically significant differences between the two concentrations of LY-29 and controls.

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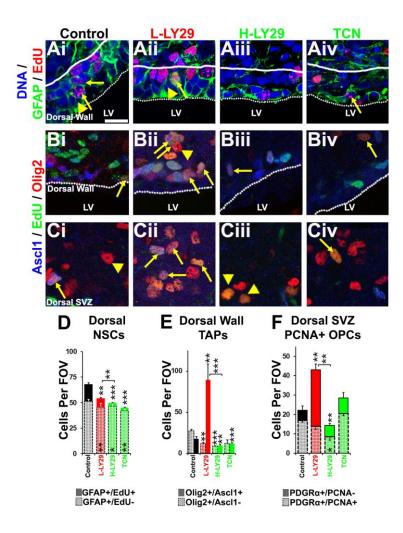
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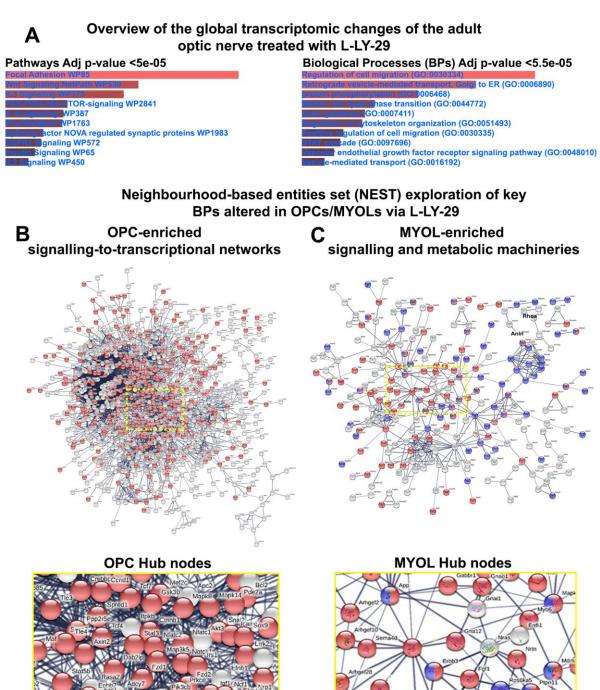
938 Fig. 3: LINCS-derived small molecules differentially modulate oligodendrogenesis.



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P8 wildtype mice were treated with control (saline/DMSO), LY-29 or TCN by infusion into the 940 lateral ventricle for 3 days and periventricular/SVZ tissue analysed at P11. EdU was given at 941 P9 and P10 by i.p. injections for aiding lineage progression/proliferative cell quantifications in 942 the SVZ. Scale bar = 20 μ ms. (A) GFAP (and staining for EdU for cells that cycled during 943 treatment) for identification of NSCs adjacent to the dorsal ventricular wall. Arrows and 944 arrowheads exemplify NSCs which cycled during treatment and remained guiescent, 945 946 respectively. Scale bar = 20 microns for micrographs A-C. (B,C) Ascl1 and Olig2 for 947 immunolabelling of TAPs and OL lineage cells, respectively, and cells examined directly 948 close to the dorsal wall in B and 70 micron space between the ependymal layer and developing corpus callosum. Arrows and arrowheads exemplify TAPs committed to the 949 950 oligodendrocytes and OPCs, respectively (Ascl1-/EdU+/Olig2+). (D to F) Quantification of dorsal NSCs (D), TAPs (E) and OPCs (E) in the dorsal SVZ tissue and data are mean + 951 SEM in a constant volume (fields of view: FOV); $n \ge 4$ animals (***p<0.001, **, p < .01, *, p 952 <.05 t-test/ANOVA where appropriate). 953

- 954 Fig. 4: Unravelling of the L-LY29 induced genes in the adult optic nerve and resolving
- 955 **OPC/MYOL cellular networks.**

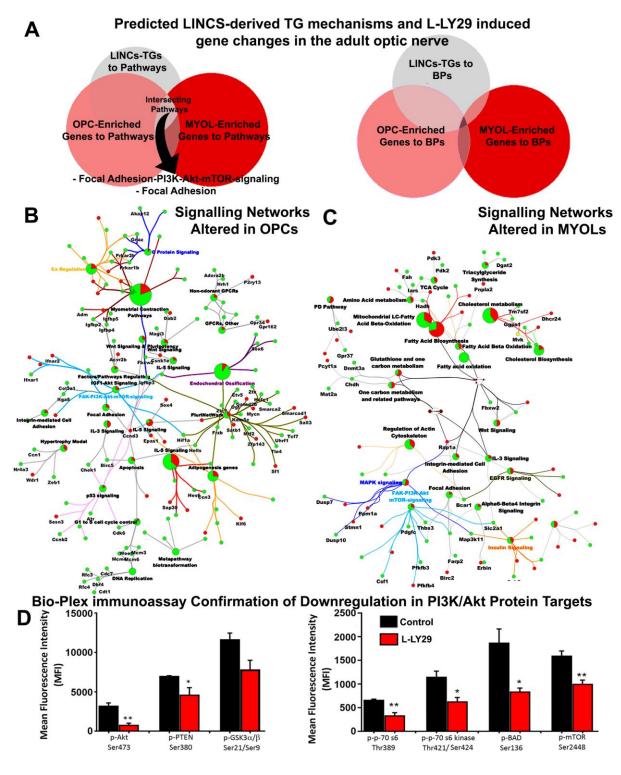


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(A) Significantly differentially expressed transcripts induced by (see also Fig S4H) L-LY29 in
the adult optic nerve were inspected for signalling pathways and BP alterations, using the
webtool enrichr. The top 10 are presented and ranked by their adjusted (Adj) p-values. (B,C)
Neighbourhood-based entities set analysis (NEST) of OPC- and MYOL-enriched genes

961 identified by STRING networks for predicted protein–protein interactions (circled in red).
962 Central nodes were cropped and expanded to highlight the essential upstream factors
963 regulated by L-LY29 and nodes are coloured as per key BPs (see corresponding results
964 section for the BPs represented in coloured nodes).

- 986 Fig. 5: Validation and confirmation of signalling network alterations caused by L-LY29
- 987 by phosphoprotein immunoassay.



(A) Comparison of LINCS-derived TGs processed by Enrichr to identify signalling pathway
 and BP alterations at two OL lineage stages (OPC-enriched profiles and MYOL-enriched
 profiles) following L-LY29 treatment of the optic nerve. (B,C) Cluego signalling pathway
 networks of changes in defined stages of OL differentiation. Nodes in red or green represent

those that are respectively upregulated or downregulated upon L-LY29. (**D**) Cerebellar slices from P11 mice were maintained in culture for 3 DIV in control medium or medium containing 0.5 μM LY29 and phosphoproteins were assessed by Bio-Plex immunoassay. Data are mean + SEM (n=3 per each group) fluorescence intensity (MFI). phospho-Akt (Ser473), phospho-PTEN (Ser380) and phospho-GSKα/β (Ser21/Ser9); *p<0.05, **p<0.01, two-tailed unpaired t-test.