# 1 Human-specific enrichment of schizophrenia risk-genes in callosal neurons of the

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# developing neocortex

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# 39 Summary

#### 40

41 Human genetic studies have provided a wealth of information on genetic risk factors 42 associated with neuropsychiatric diseases. However, whether different brain cell types are 43 differentially affected in disease states and when in their development and maturation 44 alterations occur is still poorly understood. Here we generated a longitudinal 45 transcriptional map of excitatory projection neuron (PN) and inhibitory interneuron (IN) 46 subtypes of the cerebral cortex, across a timeline of mouse embryonic and postnatal 47 development, as well as fetal human cortex and human cortical organoids. We found that 48 three types of gene signatures uniquely defined each cortical neuronal subtype: dynamic 49 (developmental), adult (terminal), and constitutive (stable), with individual neuronal 50 subtypes varying in the degree of similarity of their signatures between species. In 51 particular, human callosal projection neurons (CPN) displayed the greatest species 52 divergence, with molecular signatures highly enriched for non-coding, human-specific 53 RNAs. Evaluating the association of neuronal class-specific signatures with 54 neuropsychiatric disease risk genes using linkage disequilibrium score regression showed 55 that schizophrenia risk genes were enriched in CPN identity signatures from human but 56 not mouse cortex. Human cortical organoids confirmed the association with excitatory 57 projection neurons. The data indicate that risk gene enrichment is both species- and cell 58 type-specific. Our study reveals molecular determinants of cortical neuron diversification 59 and identifies human callosal projection neurons as the most species-divergent population 60 and a potentially vulnerable neuronal class in schizophrenia.

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#### 71 Introduction

Large-scale human genetic studies of neurodevelopmental and neuropsychiatric disorders, such as Autism Spectrum Disorders [ASD], Bipolar Disorder [BD], and Schizophrenia [SCZ], have implicated hundreds of loci, including a variety of genes involved in neuronal development and function<sup>1-10</sup>. To date, the specific neuronal subtypes affected by these genetic variants are still poorly defined.

77 Comparing transcriptional profiles of neuronal subtypes with disease-enriched 78 gene sets can potentially provide information on cell-type susceptibility; this approach 79 has already begun to indicate links between individual disorders and cortical neurons, including associations of SCZ and BD with excitatory pyramidal neurons<sup>11,12</sup>. However, 80 81 these experiments have to date largely relied on broadly-defined cell classes, with little 82 subtype resolution. For example, most studies have not attempted to parse the diversity of 83 cortical pyramidal excitatory cells, instead reporting broad pan-neuronal or pan-84 pyramidal associations. In addition, these experiments have largely examined adult cell 85 types, or a limited set of developmental timepoints, which presents a limitation as the set 86 of genes that are distinctive to a cell type and therefore important to its identity may change over development<sup>13,14</sup>. Finally, the gene sets specific for individual neuronal 87 subtypes may differ between species<sup>15</sup>, thus requiring direct study of human neurons. 88

89 Here, we generated a high-resolution transcriptional map of multiple subtypes of 90 both cortical excitatory projection neurons (PNs) and inhibitory interneurons (INs) over 91 development, including embryonic and postnatal mouse neocortex, human fetal cortex, 92 and human cortical organoids. We identify developmental, terminal, and stable molecular 93 signatures for each of the major PN and IN subtypes in the mouse, and developmental 94 signatures for the homologous human PNs classes. Notably, we find that expression of 95 PN-subclass gene signatures diverges between the two species, with callosal projection neurons, the most evolutionarily recent PN class<sup>16</sup>, showing the greatest divergence. 96 97 Leveraging these molecular signatures to identify neuronal types susceptible to genetic 98 risk factors for various neuropsychiatric diseases, we show that polygenic risk for SCZ is 99 significantly enriched in signature genes of the CPN class in human fetal cortex. This enrichment was specific to human CPNs, suggesting that SCZ risk genes may havespecies-specific effects on neurodevelopment.

- 102
- 103 **Results**

# Molecular signatures with distinct temporal dynamics collectively define pyramidal neuron and interneuron subtype identity in the neocortex

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In order to trace the dynamic molecular signatures of individual neuron classes, we profiled the major subtypes of cortical excitatory and inhibitory neurons at six different time points along a timeline spanning phases of neuronal development from early postmitotic fate decisions and neuronal migration to synaptic integration and circuit maturation.

112 We first transcriptionally profiled the three major subtypes of excitatory PNs, 113 corticothalamic PNs (CThPNs) of layer 6, subcerebral PNs (ScPNs) of layer 5, and CPNs 114 of both deep and upper layers, in the mouse cortex (Figure 1A and Table S1). To 115 simultaneously and systematically purify multiple PN subtypes from the same sample, we employed an optimized version of the MARIS technique<sup>17,18</sup>, where the combinatorial 116 expression of three transcription factors, BCL11B, TLE4, and SATB2<sup>19-22</sup>, is used to 117 118 isolate the three major cortical PN subtypes. Although this approach requires pre-defining 119 the target cell populations, it allows deeper sequencing compared to single-cell RNA sequencing. We FACS-purified ScPNs as BCL11B<sup>high</sup>/TLE4<sup>low</sup>/SATB2<sup>-</sup>, CThPNs as 120 BCL11B<sup>low</sup>/TLE4<sup>high</sup>/SATB2<sup>-</sup>, and CPNs as BCL11B<sup>-</sup>/TLE4<sup>-</sup>/SATB2<sup>+</sup> from the mouse 121 122 somatosensory cortex at six different time points (E16.5, E18.5, P1, P3, P7, and P30, n≥3 123 per stage, 48 FACS-purified and transcriptionally profiled samples) (Figure 1A and 124 Figure S1A-C) (Table S1).

To begin to explore the transcriptional and temporal dynamics defining PN diversity, we visualized the overall variation in the dataset using dimensionality reduction by Multidimensional Scaling (MDS) on average gene expression between the PN subtypes along their development. This showed that sample dissimilarity was primarily driven by time (Dimension 1) and neuronal identity (Dimension 2) (Figure 1B).

Consistent with their known expression patterns *in vivo*, we observed increased expression of *Bcl11b*, *Tle4*, and *Satb2* in ScPNs, CThPNs, and CPNs, respectively, while markers of other cell types (e.g., oligodendrocytes, endothelial cells, interneurons, astrocytes) showed negligible expression (31 out of 39 genes had FPKM < 2.5), thus validating the specificity of our FACS-purification strategy (Figure S1G-L).

135 We considered both time and neuronal subtype identity to determine 136 differentially-expressed genes between all pairwise comparison (DEGs; Figure S1d-f, 137 see Methods for criteria). We then analyzed the resulting dataset to extract 138 developmental, stable, and terminal molecular signatures uniquely identifying ScPNs, 139 CThPNs, and CPNs (Figure 1C-D,F and Figure S4A). To discover developmental 140 signatures, we applied stringent criteria to filter out transcriptional changes reflecting the 141 asynchronous maturation of cortical PNs (see Methods), retaining transcripts whose level 142 of expression was enriched in only one subtype for at least two consecutive time points 143 (1,008 genes, Table S2). Clustering the resulting set using partitioning around medoids 144 (PAM, k-medoids) identified seven clusters of genes with distinct temporal and subtype-145 specific expression patterns, corresponding to early, mid, and late stages of development 146 of each neuronal class (Figure 1C-D and Figure S2A). These clusters contained both 147 established (e.g, Ntng2 and Inhba for CPNs; Wnt7b and Kcnab1 for CThPNs; Lum, Pex5l, and Grik2 for ScPNs)<sup>23-25</sup>, and novel (e.g., Fstl4, Nr1d2, Cadps2 for CPNs; Ssrt2, 148 149 Lig2 and Fap for CThPNs; Tox2, Coll2a1, for ScPNs) subtype-specific markers (Figure 150 1D and Figure S2A and Table S3). Gene ontology analysis of the developmental 151 signatures for each PN class revealed expected enrichment of developmental processes 152 such as axonogenesis in early- to mid-developmental signatures, and synaptic maturation 153 and function in late-developmental signatures (Figure 1E, Figure S2B, and Table S4).

We next examined this gene set to identify *stable* signatures for PN subtypes, i.e., genes consistently enriched in a single PN class at all time points, regardless of developmental stage. For both CPNs and CThPNs, stable signature genes included novel coding transcripts and unmapped loci (*Lcorl, Shank2 and 6530402F18Rik*), as well as canonical markers already known to be involved in PN development (i.e., *Cux1, Hspb3, Foxp2, Tbr1*)<sup>18,26</sup> (Figure 1F, Figure S2C, and Table S5).

160 Finally, we identified terminal signatures, which we strictly defined as subtype-161 specific transcripts whose enrichment emerged exclusively at P30, after definitive 162 transcriptional identity is established, and in only one neuronal subtype (Figure S4A and 163 Table S5). We identified 136 subtype-specific terminal signature genes, which included 164 genes associated with processes such as dendritic spine development and plasticity (e.g., *Baiap2l2* in ScPNs)<sup>27</sup>, synaptic connection and trans-synaptic signaling (e.g., *Teneurin* 165 166 and *Tcap* in CPNs), and neuro-immune response (e.g., *Ill1ra1* in CThPNs) (Figure S4A 167 and Table S4). The subtype-specific expression pattern of these genes was consistent 168 with single-cell resolution data from mature cortical subtypes in the Allen Mouse Cell Types Database<sup>28</sup> (Figure S4C). These results show that the molecular class identity of 169 170 terminally-differentiated neurons is defined largely by the genes used to execute their 171 functional properties.

172 All PN types wire into a local cortical microcircuitry with distinct classes of cortical inhibitory interneurons  $(INs)^{29}$ . Because INs display a high degree of cellular, 173 molecular and functional diversity $^{30,31}$ , we sought to also define the molecular signatures 174 175 of cortical IN populations through time. Cortical interneurons derive from two main 176 germinal zones, the medial ganglionic eminence (MGE), and the caudal ganglionic eminence (CGE) <sup>30</sup>. We used genetically-labeled mouse lines to isolate MGE-derived 177 178 (Lhx6-GFP) and CGE-derived (5Ht3aR-GFP) cortical INs from the somatosensory cortex 179 at the same developmental stages used for PNs, as well as SST-dtTomato and VIP-180 tdTomato reporter lines to isolate mature somatostatin (SST) and vasoactive intestinal 181 polypeptide (VIP) IN subtypes at P30 ( $n \ge 3$  per stage, Table S1, 35 libraries, Figure 1G). 182 As for PNs, dimensionality reduction using MDS indicated that sample dissimilarity was 183 primarily driven by time (Dimension 1) and neuronal type (Dimension 2) (Figure 1H).

From this dataset, we performed pairwise differential gene expression analysis across all developmental stages (filtering criteria in Methods, Figure S3a, see Methods) and extracted *developmental, terminal*, and *stable* signatures using the same approach described for PNs (Figure 1I-J,L, Figure S3C, and Table S2-3,5). Divergence between the two cardinal IN subclasses (Lhx6- and 5Ht3aR-lineage) was evident from the earliest stages of development (Figure 1G, Figure S3B-C, and see Methods). In contrast to PNs, 190 however, IN developmental signatures (1,789 genes, Table S2) included a large fraction 191 of genes stably enriched in one population alone (Figure 1L and Figure S3E), confirming 192 that the two cardinal subdivisions (5Ht3aR and LHX6) follow largely non-overlapping 193 identity programs from the earliest stages of development. GO analysis revealed 194 processes appropriate for each developmental stage for both IN subdivisions. 195 Interestingly, late signature genes of Lhx6-positive INs displayed specific enrichment for 196 genes involved in synaptic transmission, while signatures of 5HT3aR-positive INs were 197 enriched for axonogenesis genes (Table S4).

198 Terminal signatures of interneurons emerged at later stages, by P30, when 199 distinctive molecular features of each IN subtype have appeared (such as *Crhb4*, *Htr1a*, 200 and *Oprm1* for SST-INs and *Tac2*, *Frem1*, and *Npy1r* for VIP-INs). These remained 201 enriched in the adult cortex (Figure S4B, D, Allen Mouse Cell Types Database<sup>28</sup> and 202 Table S5). This observation supports a late specification of IN subtypes, likely following 203 recognition and pairing with their PN partners and integration into the cortical local 204 circuit.

All together, these data indicate that transcriptional signatures that define individual neuron class identity in the neocortex are mostly composed of genes that change expression over development, rather than invariant signatures. The fact that cell identity signatures are mostly dynamic indicates that no single time point exemplifies a cell type, highlighting the need to include more complete timelines of development and maturation to comprehensively capture signatures of cell identity.

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# 212 Molecular diversity of ScPNs in distinct functional areas

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The cerebral cortex is divided into multiple functional areas<sup>32,33</sup>. To begin to examine whether the signatures we identified might describe individual PN types across multiple regions of the cortex, we took ScPNs of layer Vb as a test case and compared them across areas. For ScPNs, the only stable signature gene (i.e., differentially expressed at all ages) was *Tcerg1l*, a previously identified ScPN marker<sup>18,25</sup>. We therefore employed a tamoxifen-inducible *Tcerg1l*-CRE driver mouse line<sup>34</sup> crossed to a Sun1:GFP nuclear reporter<sup>35</sup> to label and isolate mature layer V ScPNs across different functional areas. We FACS-isolated and profiled *Tcerg1l*–lineage nuclei from P56 *Tcerg1l*/Sun1:GFP mice ( $n \ge 4$  replicates per cortical region, each representing a pool of 5-6 mice) from motor (M), somatosensory (SS), auditory (AUD) and visual cortex (VIS), each sampled at 1 or 2 defined anterior-posterior (AP) levels, and performed singlenucleus RNA sequencing (snRNA-seq) (Figure 2 A-B, Figure S5).

We first confirmed that the sorted nuclei expressed the ScPN late-developmental signature; as expected, the majority of the nuclei recovered expressed this signature (Figure 2B and Figure S5D). This line also labels a small number of CPNs and GABAergic interneurons, which we correctly detected in our dataset (*RorB*+-CPNs, 8.8%, and GABAergic interneurons, 11.7%); these cells were excluded from further analysis (Figure S5D).

We then assessed the degree of consistency of the ScPN late-developmental signature among all ScPN nuclei isolated from the primary somatosensory cortical area, and found that it was comparable across all nuclei (Figure 2C, Figure S5E). Moreover, this signature was equivalently expressed at different AP levels and in all functional primary areas sampled (Figure S5F), indicating that it represents a core molecular feature of ScPN identity across multiple areas of the mature brain.

238 In addition to this shared signature, we found that each functional area displayed a 239 unique molecular identity, with ScPN nuclei clustering according to their anatomical 240 location (Figure 2J-M and Figure S5H). We found 14 gene modules (see Methods) that 241 varied between ScPNs of different cortical functional areas (e.g., motor cortex ScPNs 242 differentially express *Lmo4*, *Socs2*, *Mgat4c*, and *Gpc5*), and 18 gene modules that varied 243 over both functional area and AP position (Figure 2L and Table S6). The data highlights 244 an additional level of molecular heterogeneity of the ScPN population in the adult brain, 245 both between different areas and between different AP positions within the same area.

The findings indicate that the core molecular programs that define the latedevelopmental stages of neuronal subtype-specific identity continue to be broadly active in the adult cortex, but that area-specific signatures are also present.

# 250 Cross-species comparison reveals that human callosal projection neurons display 251 the greatest transcriptional divergence

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The cerebral cortex has diverged substantially during primate evolution, including molecular differences between corresponding cell types in different species<sup>15,36,37</sup>. Although a number of reports have profiled adult human pyramidal neurons to disentangle their transcriptional and epigenetic heterogeneity<sup>38-40</sup>, the molecular signatures of developing human PN subtypes are poorly defined. These are needed to investigate linkage to human disease, to allow cross-species comparative analysis, and for validation of the class identity of PN subtypes generated *in vitro*<sup>41</sup>.

260 We therefore sought to define the molecular identity of PN types from the human 261 fetal cortex. We applied the same experimental approach used for murine tissues to 262 FACS-isolate and transcriptionally profile three molecularly distinct excitatory 263 populations from the human developing cortex at six gestational stages (gestational week 264 [GW]16, 17, 18, 19, 20 and 21,  $n \ge 2$  per stage; Figure 3A-B, Figure S6A and Table S1), 265 based on the subtype-specific expression of the three TFs BCL11B, TLE4, and SATB2 266 3C-D; Figure S6B-C, and Table S1). This dataset embodies ground-truth (Figure 267 information on pre-defined cortical PN diversity through human mid-gestation.

268 Dataset visualization using MDS showed that during the sampled developmental window, the three neuronal populations clustered based on their identity, with CPNs 269 (SATB2<sup>high</sup>/BCL11B<sup>low</sup>/TLE4<sup>low</sup>) distinctly segregated from the two corticofugal 270 (CFuPNs) populations (Figure 3E), and CThPNs (*TLE4*<sup>high</sup>/*BCL11B*<sup>low</sup>/*SATB2*<sup>-</sup>) separated 271 272 from ScPNs (BCL11B<sup>high</sup>/TLE4<sup>low</sup>/SATB2<sup>-</sup>), although they were less resolved from each 273 other than their murine counterparts. We confirmed the expression of genes known to be 274 PN subtype-specific, while expression of glial, oligodendrocyte and non-neuronal 275 markers were virtually absent, validating our isolation approach (Figure S6E-J). Of note, 276 contrary to the mouse neurons, human samples did not show a clear separation based on 277 gestational age, suggesting that, consistent with the prolonged length of human brain 278 development, the selected six-week time window may only cover limited developmental 279 progression within each neuronal subtype (Figure 3E).

280 We identified subtype-specific signatures using criteria similar to those used to 281 define developmental signatures in our mouse analysis, omitting the requirement for 282 specific enrichment in two consecutive time points, as time was not a major driver of 283 variation in this dataset. This identified 2,299 DEG; PAM clustering identified multiple 284 gene clusters with distinct subtype expression patterns, including clusters specific for 285 putative (p) pCThPNs, pScPNs, pCPNs, and corticofugal projection neurons (pCFuPNs) 286 (Figure 3F,H) (Table S7). These signatures contained both known markers of the 287 homologous murine PN subtypes (e.g., CUX2 and LHX2 for pCPNs, NFIA and PAPPA2 288 for pCThPNs, and TCERG1L and S100A10 for pScPNs), as well as genes with human-289 specific expression (Figure 3H), which we validated using two single cell transcriptomic datasets of human fetal cortex<sup>42,43</sup> (Figure 3I and Figure S7A-B, see Methods). Using our 290 291 gene signatures, we were able to identify pScPN and pCThPN populations in these 292 datasets, as well as the previously annotated upper-layer PNs (Figure 3L and Figure 293 S7A). For all PN subtypes, a subset of the signature genes identified in our fetal dataset 294 also retained subtype-specific expression in the adult human cortex, as assessed by *in situ* hybridization (Figure S8A)<sup>44</sup> and spatial transcriptomics of human dorsolateral pre-295 frontal cortex (DPFC)<sup>45</sup> (Figure S8B) (LPL and NTNG2 for CPNs, HS3ST2 and 296 297 COL24a1 for ScPNs, and PP1R1B and ST18 for CThPNs, respectively).

These data indicate that during mid-gestation, human PN subtype signatures already comprise genes that define their adult identity. Although human late-fetal and postnatal molecular PN development is yet to be mapped, the persistent subtype-specific expression of fetal signature genes in the adult suggests the existence of stable signatures for human cortical PN classes.

To investigate the phylogenic conservation of PN molecular identity between mouse and human, we next compared their respective PN signature gene sets. We identified 1803 genes with a corresponding ortholog in the other species, while 577 genes in the human signatures had no mouse ortholog, mainly non-coding RNAs or annotated pseudogenes (Table S8). Notably, 60.3% of those genes belonged to the human CPN signatures, while 39.7% were found in the ScPN and CThPN signatures. The human CPN

signature was correspondingly the most enriched for human-specific genes (56% of CPN
signature genes, 43% of ScPN, 43% of CThPN, 31% of CFuPN).

311 Extending this analysis to other members of the primate clade (including Apes, 312 Old World Monkeys, New World Monkeys, and Promisians) showed that over 90% of 313 the genes not shared with mouse (i.e., Nlgn4x, Diras3 and Zim2) were not conserved in 314 other primates and are exclusively present in the human genome (Figure 4A). CPNs 315 evolved relatively recently compared to the other cortical PN subtypes and have 316 undergone a disproportionately large population expansion from mouse to human<sup>16</sup>. Our data suggest that many of the genes that define the molecular identity of this neuronal 317 318 class in humans are of an evolutionarily recent origin.

319 Next, we systematically performed cross-species comparison between 320 transcriptional signatures of mouse and human cortical PNs during development (Figure 321 4 B-C and Figure S9A). We first applied MDS on all PN samples from both species using 322 the genes from the orthologous signature gene lists, which revealed sample separation 323 based primarily on molecular identity (Figure S9A). To address the degree of homology 324 of the signature sets and identify conserved and human-specific developmental pathways, 325 we directly quantified the percentage of developmental signature genes shared between 326 the two species. For each human subtype, approximately 20% of signature genes were 327 shared with the mouse counterpart (20.5% for CPN, 16.4% for ScPN, 19% for CThPN), 328 while 7-18% of the mouse developmental signature genes were shared with the 329 corresponding human neuronal subtype (18% for CPN, 7% for ScPN, 8% for CThPN), 330 suggesting a limited conservation of subtype-specific gene programs between the two 331 species (Figure 4B).

To assess whether this low overlap might stem from differences in the developmental stage of the human samples compared to the mouse, we computed Pearson correlation coefficients on the orthologous genes. This analysis showed that human PN subtypes isolated from midgestation cortex (GW16-21) are transcriptionally more similar to PN subtypes from P1 mouse cortex (Figure 4C). The correlation to the P1 mouse samples was consistent across all PN classes, indicating that, although human fetal cortex development spans a longer period than in mice, it also occurs earlier relative

to birth. This may reflect molecular events which unfold postnatally in mice but occurduring fetal stages in human cortical development.

341 Given this specific correlation between human midgestation and the murine P1 342 stage, we focused on this stage for further comparative analysis. We sought to investigate 343 the degree of overlap of cellular features, molecular pathways, and biological processes 344 shared among the two species at this specific stage, by employing an established pipeline for pathway enrichment (PE) analysis<sup>46</sup>. We examined the genes with orthologs in both 345 346 species and determined P1-enriched DEGs for each PN type (Table S8, see Methods). PE 347 analysis on these genes identified a dense core of nodes (enriched gene ontology terms) 348 and edges (common genes among nodes) in support of shared pathways underlying 349 multiple developmental processes (Figure 4D). This indicates that human and mouse 350 PNs rely on different genes (as shown by their divergent signatures) to execute similar 351 biological functions at this stage. However, our approach also revealed species-specific 352 enrichment for some terms: cell communication for human CPN signatures and 353 extracellular matrix for human ScPN signatures (Table S9, Figure 4D). This suggests the 354 formation of a cellular environment unique to human corticogenesis.

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#### 356 Human fetal CPNs display a specific enrichment for SCZ risk genes

357 To determine whether the subtype-specific molecular maps we built for human 358 and mouse cortical development could be used to assess disease susceptibility in distinct 359 neuronal subtypes and along multiple developmental stages, we employed linkage disequilibrium (LD) score regression<sup>47</sup> in combination with a large panel of GWAS 360 summary statistics for neuropsychiatric diseases and other complex diseases<sup>48</sup>. Several 361 362 non-neuropsychiatric traits were included as controls (Table S10). For each of our mouse 363 developmental and human fetal signature gene sets, we identified a window of 100kb 364 upstream and downstream of the canonical transcriptional start site (TSS) for each gene, 365 and calculated risk association via prior heritability enrichment, as previously described<sup>52</sup>. For mouse, we analyzed the corresponding human orthologs (Table S8). 366

For the mouse datasets, this analysis showed no enrichment in any signature gene set of either PN or IN subclasses, for any of the traits examined. To verify whether individual associations existed when subpopulations of mouse PNs and INs were analyzed individually, we next clustered each of them separately. Again, we did not observe any significant associations. (Figure 5A-B and Figure S10).

By contrast, when we analyzed signature gene sets from the human samples, a significant and specific enrichment for SCZ was detected in one neuron class, CPNs (Figure 5C and Figure S10). These data indicate that developmental signatures of human, but not mouse, CPNs are enriched for genes associated with genetic risk for schizophrenia, unearthing a previously unappreciated species-specific association of this neuropsychiatric disorder with a defined cortical neuronal subtype.

We next tested whether this disease associations held true in a model of human corticogenesis, human cortical organoids<sup>36,49-51</sup>. Because manual annotation using small lists of known marker genes had not previously been able to discriminate between corticofugal subtypes in organoids<sup>49,52</sup>, we first applied our gene signatures from human projection neuron subtypes (CPNs, CFuPNs, CThPNs, and ScPNs) to infer neuronal subtype identity in our previously published single-cell RNAseq dataset of human cortical organoids<sup>52</sup>.

385 We used our human developmental signatures as input to Pathway-Level Information Extractor (PLIER)<sup>53</sup>, a matrix decomposition technique that optimizes latent 386 387 variables using prior biological knowledge to assign each cell a new identity (see 388 Methods). Among the excitatory neurons, we were able to clearly resolve CThPNs and 389 ScPNs in the organoid dataset, as well as the previously-annotated CPNs (Figure 5D-F, 390 Figure S10A-B). We then performed differential gene expression analysis to define the 391 molecular subtype-specific signatures of organoid-derived PN subtypes (Table S10). We 392 validated that these newly annotated ScPNs and CThPNs were enriched for known 393 subtype-specific signature genes (i.e. LMO3, TLE4, PPP1R1B for CThPNs, LDB2, 394 CRYM, ETV1 for ScPNs).

We next investigated whether CPNs produced within human cortical organoids recapitulated the same disease association with SCZ found in endogenous human fetal 397 neurons. We included the DEG sets emerging from our PLIER analysis of organoid PN 398 subtypes (Table S10), or the top 5% of DE genes (by signed t-score ranking) for each subtype, and partitioned heritability analyses to the associated genomic loci<sup>48</sup>. We found 399 400 enrichment for SCZ risk genes in organoid CPNs, consistent with our findings on human 401 fetal CPNs. Of note, organoids also revealed association of SCZ with organoid ScPNs 402 and CThPNs. We also found significant enrichment for BD risk genes in organoid ScPNs 403 and CThPNs, and neuroticism risk genes in organoid CPNs and CThPNs (Figure 5G and 404 Figure S11), possibly reflecting a different maturation stage of the organoid neurons 405 compared to the endogenous ages we tested.

These data identify a species-specific susceptibility of a defined neuronal subtype, callosal projection neurons, for schizophrenia. This association is not observed in mouse neurons and is identifiable during midgestation of the human fetal cerebral cortex, pointing to an early developmental effect that precedes the earliest clinical manifestations of the disease, during late human adolescence<sup>54</sup>.

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# 412 **Discussion**

The emerging wealth of genetic information on neurodevelopmental and neuropsychiatric disorders offers an opportunity to link disease-risk associated genes to the specific cell types and developmental processes they may affect. Due to the diversity of cell types present in the brain and the dynamic nature of their gene expression programs over time, attempting such associations requires a detailed understanding of the transcriptional profiles of different cell classes over multiple developmental stages.

420 Here we present a high-resolution, longitudinal transcriptional atlas encompassing 421 multiple neuronal subtypes of the neocortex in both mouse and human. The data unearths 422 notable features of the molecular programs associated with acquisition of cell type 423 identity and neuronal diversification in the neocortex. For example, it is evident that gene 424 signatures defining neuronal classes vary across time, indicating that the molecular 425 identity of a neuron cannot be defined by its molecular makeup at any one age; rather, 426 each type is represented by a collection of transitional states unfolding as development 427 progresses.

428 Cross-species comparison also highlighted salient features of human brain 429 development. Our finding that mid-gestation human fetal neurons are most similar to P1 430 mouse subtypes, points at accelerated cortical neuron development relative to organismal 431 development in humans. In addition, human PN classes shared only 10-20% of their 432 genes with their mouse counterparts, with long non-coding RNAs and unannotated loci 433 being highly enriched in the human-specific signatures. Beyond supporting a role for non-coding loci in human brain evolution<sup>55, 56</sup>, the data are intriguing in the context of 434 435 human disease. Genomic studies have identified the majority of risk variants associated 436 with SCZ within non-coding regions of the genome, suggesting that they alter risk by changing levels of gene expression or splicing<sup>57</sup>. 437

438 Prior studies on adult cerebral cortex have suggested a common, pan-neuronal and glutamatergic enrichment for SCZ risk variants<sup>1-11,48,58,59</sup>. Our association data, across 439 440 multiple types of neurons in mouse and human neocortex, now show that there is both 441 neuron-type and species-specific enrichment for SCZ-associated variants in signature 442 "core" genes of a single PN subtype of the human fetal cortex: callosal projection 443 neurons. Structural changes in the corpus callosum and reduced spine density in layer II/III neurons have been reported in schizophrenia patients and experimental models<sup>60-62</sup>, 444 445 consistent with this new association. This is also interesting in light of our finding that 446 human CPNs retained the least conservation of molecular signatures compared to mouse, 447 showing the largest enrichment of human-specific molecular features among the neurons 448 sampled.

Collectively, the data point to developing human callosal projection neurons as a
potential target cell for functional investigation of genetic risk factors in SCZ pathology,
and contributes to decode the complex cellular and molecular underpinnings of
schizophrenia.

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# **References**

475	1	Grove, J. et al. Identification of common genetic risk variants for autism spectrum
476	1	disorder. <i>Nat Genet</i> <b>51</b> , 431-444, doi:10.1038/s41588-019-0344-8 (2019).
477	2	Gulsuner, S. <i>et al.</i> Spatial and temporal mapping of de novo mutations in
478	-	schizophrenia to a fetal prefrontal cortical network. <i>Cell</i> <b>154</b> , 518-529,
479		doi:10.1016/j.cell.2013.06.049 (2013).
480	3	Marshall, C. R. <i>et al.</i> Contribution of copy number variants to schizophrenia from
481	-	a genome-wide study of 41,321 subjects. <i>Nat Genet</i> <b>49</b> , 27-35,
482		doi:10.1038/ng.3725 (2017).
483	4	Pardinas, A. F. et al. Common schizophrenia alleles are enriched in mutation-
484		intolerant genes and in regions under strong background selection. <i>Nat Genet</i> 50,
485		381-389, doi:10.1038/s41588-018-0059-2 (2018).
486	5	Parikshak, N. N. et al. Integrative functional genomic analyses implicate specific
487		molecular pathways and circuits in autism. Cell 155, 1008-1021,
488		doi:10.1016/j.cell.2013.10.031 (2013).
489	6	Sandin, S. et al. The Heritability of Autism Spectrum Disorder. JAMA 318, 1182-
490		1184, doi:10.1001/jama.2017.12141 (2017).
491	7	Schizophrenia Working Group of the Psychiatric Genomics, C. Biological
492		insights from 108 schizophrenia-associated genetic loci. Nature 511, 421-427,
493		doi:10.1038/nature13595 (2014).
494	8	Stahl, E. A. et al. Genome-wide association study identifies 30 loci associated
495		with bipolar disorder. Nat Genet 51, 793-803, doi:10.1038/s41588-019-0397-8
496		(2019).
497	9	Takata, A. et al. Integrative Analyses of De Novo Mutations Provide Deeper
498		Biological Insights into Autism Spectrum Disorder. Cell Rep 22, 734-747,
499		doi:10.1016/j.celrep.2017.12.074 (2018).
500	10	Willsey, A. J. et al. Coexpression networks implicate human midfetal deep
501		cortical projection neurons in the pathogenesis of autism. Cell 155, 997-1007,
502		doi:10.1016/j.cell.2013.10.020 (2013).
503	11	Skene, N. G. et al. Genetic identification of brain cell types underlying
504		schizophrenia. Nat Genet 50, 825-833, doi:10.1038/s41588-018-0129-5 (2018).
505	12	Huntley, M. A. et al. Genome-Wide Analysis of Differential Gene Expression and
506		Splicing in Excitatory Neurons and Interneuron Subtypes. J Neurosci 40, 958-
507		973, doi:10.1523/JNEUROSCI.1615-19.2019 (2020).
508	13	Skene, N. G. & Grant, S. G. Identification of Vulnerable Cell Types in Major
509		Brain Disorders Using Single Cell Transcriptomes and Expression Weighted Cell
510	1.4	Type Enrichment. <i>Front Neurosci</i> <b>10</b> , 16, doi:10.3389/fnins.2016.00016 (2016).
511	14	Wang, H., Juma, M. A., Rosemberg, N. & Ulisubisya, M. M. Progressive
512		Pathway to Universal Health Coverage in Tanzania: A Call for Preferential
513		Resource Allocation Targeting the Poor. <i>Health Syst Reform</i> , 1-5,
514	15	doi:10.1080/23288604.2018.1513268 (2018).
515	15	Hodge, R. D. <i>et al.</i> Conserved cell types with divergent features in human versus
516	16	mouse cortex. <i>Nature</i> <b>573</b> , 61-68, doi:10.1038/s41586-019-1506-7 (2019).
517 518	16	Fame, R. M., MacDonald, J. L. & Macklis, J. D. Development, specification, and diversity of collocal projection pourons. <i>Tranda Naurosci</i> <b>34</b> , 41, 50
518 510		diversity of callosal projection neurons. <i>Trends Neurosci</i> <b>34</b> , 41-50, doi:10.1016/j.tins.2010.10.002 (2011)
519		doi:10.1016/j.tins.2010.10.002 (2011).

520	17	Hrvatin, S., Deng, F., O'Donnell, C. W., Gifford, D. K. & Melton, D. A. MARIS:
521		method for analyzing RNA following intracellular sorting. PLoS One 9, e89459,
522		doi:10.1371/journal.pone.0089459 (2014).
523	18	Molyneaux, B. J. et al. DeCoN: genome-wide analysis of in vivo transcriptional
524		dynamics during pyramidal neuron fate selection in neocortex. Neuron 85, 275-
525		288, doi:10.1016/j.neuron.2014.12.024 (2015).
526	19	Alcamo, E. A. et al. Satb2 regulates callosal projection neuron identity in the
527		developing cerebral cortex. Neuron 57, 364-377,
528		doi:10.1016/j.neuron.2007.12.012 (2008).
529	20	Hevner, R. F. et al. Tbr1 regulates differentiation of the preplate and layer 6.
530		Neuron 29, 353-366, doi:10.1016/s0896-6273(01)00211-2 (2001).
531	21	Lodato, S., Shetty, A. S. & Arlotta, P. Cerebral cortex assembly: generating and
532		reprogramming projection neuron diversity. Trends Neurosci 38, 117-125,
533		doi:10.1016/j.tins.2014.11.003 (2015).
534	22	Mancinelli, S. & Lodato, S. Decoding neuronal diversity in the developing
535		cerebral cortex: from single cells to functional networks. <i>Curr Opin Neurobiol</i> <b>53</b> ,
536		146-155, doi:10.1016/j.conb.2018.08.001 (2018).
537	23	Arlotta, P. <i>et al.</i> Neuronal subtype-specific genes that control corticospinal motor
538	-0	neuron development in vivo. <i>Neuron</i> <b>45</b> , 207-221,
539		doi:10.1016/j.neuron.2004.12.036 (2005).
540	24	Greig, L. C., Woodworth, M. B., Galazo, M. J., Padmanabhan, H. & Macklis, J.
541	21	D. Molecular logic of neocortical projection neuron specification, development
542		and diversity. <i>Nat Rev Neurosci</i> 14, 755-769, doi:10.1038/nrn3586 (2013).
543	25	Lodato, S. <i>et al.</i> Gene co-regulation by Fezf2 selects neurotransmitter identity and
544	23	connectivity of corticospinal neurons. <i>Nat Neurosci</i> <b>17</b> , 1046-1054,
545		doi:10.1038/nn.3757 (2014).
545 546	26	Molyneaux, B. J. <i>et al.</i> Novel subtype-specific genes identify distinct
547	20	subpopulations of callosal projection neurons. J Neurosci 29, 12343-12354,
548		doi:10.1523/JNEUROSCI.6108-08.2009 (2009).
549	27	Kang, J., Park, H. & Kim, E. IRSp53/BAIAP2 in dendritic spine development,
550	21	NMDA receptor regulation, and psychiatric disorders. <i>Neuropharmacology</i> <b>100</b> ,
550 551		27-39, doi:10.1016/j.neuropharm.2015.06.019 (2016).
	20	
552	28	Tasic, B. <i>et al.</i> Adult mouse cortical cell taxonomy revealed by single cell transpiratomics. Net Neurosci <b>10</b> , 225, 246, doi:10.1028/np.4216 (2016)
553	20	transcriptomics. <i>Nat Neurosci</i> <b>19</b> , 335-346, doi:10.1038/nn.4216 (2016).
554	29	Tremblay, R., Lee, S. & Rudy, B. GABAergic Interneurons in the Neocortex:
555		From Cellular Properties to Circuits. <i>Neuron</i> <b>91</b> , 260-292,
556	20	doi:10.1016/j.neuron.2016.06.033 (2016).
557	30	Lim, L., Mi, D., Llorca, A. & Marin, O. Development and Functional
558		Diversification of Cortical Interneurons. <i>Neuron</i> <b>100</b> , 294-313,
559	01	doi:10.1016/j.neuron.2018.10.009 (2018).
560	31	Kepecs, A. & Fishell, G. Interneuron cell types are fit to function. <i>Nature</i> <b>505</b> ,
561		318-326, doi:10.1038/nature12983 (2014).
562	32	Felleman, D. J. & Van Essen, D. C. Distributed hierarchical processing in the
563	• -	primate cerebral cortex. <i>Cereb Cortex</i> <b>1</b> , 1-47, doi:10.1093/cercor/1.1.1 (1991).
564	33	O'Leary, D. D., Chou, S. J. & Sahara, S. Area patterning of the mammalian
565		cortex. Neuron 56, 252-269, doi:10.1016/j.neuron.2007.10.010 (2007).

566 567	34	Matho, K. S. Genetic dissection of glutamatergic neuron subpopulations and developmental trajectories in the cerebral cortex. <i>bioRxiv</i> ,
568		doi:10.1101/2020.04.22.054064 (2020).
569 570	35	Chamessian, A. <i>et al.</i> Transcriptional Profiling of Somatostatin Interneurons in the Spinal Dorsal Horn. <i>Sci Rep</i> <b>8</b> , 6809, doi:10.1038/s41598-018-25110-7
571		(2018).
572	36	Arlotta, P. & Pasca, S. P. Cell diversity in the human cerebral cortex: from the
573		embryo to brain organoids. Curr Opin Neurobiol 56, 194-198,
574		doi:10.1016/j.conb.2019.03.001 (2019).
575	37	Florio, M. et al. Evolution and cell-type specificity of human-specific genes
576		preferentially expressed in progenitors of fetal neocortex. <i>Elife</i> 7,
577	• •	doi:10.7554/eLife.32332 (2018).
578	38	Lake, B. B. et al. Neuronal subtypes and diversity revealed by single-nucleus
579		RNA sequencing of the human brain. Science 352, 1586-1590,
580	•	doi:10.1126/science.aaf1204 (2016).
581	39	Lake, B. B. <i>et al.</i> Integrative single-cell analysis of transcriptional and epigenetic
582		states in the human adult brain. <i>Nat Biotechnol</i> <b>36</b> , 70-80, doi:10.1038/nbt.4038
583	10	(2018).
584	40	Amamoto, R. <i>et al.</i> FIN-Seq: transcriptional profiling of specific cell types from
585		frozen archived tissue of the human central nervous system. <i>Nucleic Acids Res</i> 48,
586	4.1	e4, doi:10.1093/nar/gkz968 (2020).
587	41	Pattabiraman, K., Muchnik, S. K. & Sestan, N. The evolution of the human brain
588		and disease susceptibility. <i>Curr Opin Genet Dev</i> <b>65</b> , 91-97,
589	40	doi:10.1016/j.gde.2020.05.004 (2020).
590 591	42	Polioudakis, D. <i>et al.</i> A Single-Cell Transcriptomic Atlas of Human Neocortical
591 592		Development during Mid-gestation. <i>Neuron</i> <b>103</b> , 785-801 e788, doi:10.1016/j.pourop.2010.06.011 (2010)
592 593	43	doi:10.1016/j.neuron.2019.06.011 (2019). Nowakowski, T. J. <i>et al.</i> Spatiotemporal gene expression trajectories reveal
593 594	43	developmental hierarchies of the human cortex. <i>Science</i> <b>358</b> , 1318-1323,
594 595		doi:10.1126/science.aap8809 (2017).
595 596	44	Ding, S. L. <i>et al.</i> Comprehensive cellular-resolution atlas of the adult human
597		brain. J Comp Neurol <b>524</b> , 3127-3481, doi:10.1002/cne.24080 (2016).
598	45	Maynard, K. R. <i>et al.</i> Transcriptome-scale spatial gene expression in the human
599	ч.)	dorsolateral prefrontal cortex. <i>Nat Neurosci</i> <b>24</b> , 425-436, doi:10.1038/s41593-
600		020-00787-0 (2021).
601	46	Reimand, J. <i>et al.</i> Pathway enrichment analysis and visualization of omics data
602	40	using g:Profiler, GSEA, Cytoscape and EnrichmentMap. <i>Nat Protoc</i> 14, 482-517,
603		doi:10.1038/s41596-018-0103-9 (2019).
604	47	Bulik-Sullivan, B. K. <i>et al.</i> LD Score regression distinguishes confounding from
605	.,	polygenicity in genome-wide association studies. <i>Nat Genet</i> <b>47</b> , 291-295,
606		doi:10.1038/ng.3211 (2015).
607	48	Finucane, H. K. <i>et al.</i> Heritability enrichment of specifically expressed genes
608		identifies disease-relevant tissues and cell types. Nat Genet 50, 621-629,
609		doi:10.1038/s41588-018-0081-4 (2018).
610	49	Quadrato, G. & Arlotta, P. Present and future of modeling human brain
611		development in 3D organoids. Curr Opin Cell Biol 49, 47-52,

612		doi:10.1016/j.ceb.2017.11.010 (2017).
613	50	Tambalo, M. & Lodato, S. Brain organoids: Human 3D models to investigate
613 614	50	neuronal circuits assembly, function and dysfunction. <i>Brain Res</i> <b>1746</b> , 147028,
615		doi:10.1016/j.brainres.2020.147028 (2020).
616	51	Benito-Kwiecinski, S. & Lancaster, M. A. Brain Organoids: Human
	51	
617		Neurodevelopment in a Dish. <i>Cold Spring Harb Perspect Biol</i> <b>12</b> ,
618	50	doi:10.1101/cshperspect.a035709 (2020).
619	52	Velasco, S. <i>et al.</i> Individual brain organoids reproducibly form cell diversity of
620		the human cerebral cortex. <i>Nature</i> <b>570</b> , 523-527, doi:10.1038/s41586-019-1289-x
621	50	
622	53	Mao, W., Zaslavsky, E., Hartmann, B. M., Sealfon, S. C. & Chikina, M. Pathway-
623		level information extractor (PLIER) for gene expression data. <i>Nat Methods</i> 16,
624		607-610, doi:10.1038/s41592-019-0456-1 (2019).
625	54	Uhlhaas, P. J. The adolescent brain: implications for the understanding,
626		pathophysiology, and treatment of schizophrenia. Schizophr Bull 37, 480-483,
627		doi:10.1093/schbul/sbr025 (2011).
628	55	Pollard, K. S. et al. An RNA gene expressed during cortical development evolved
629		rapidly in humans. Nature 443, 167-172, doi:10.1038/nature05113 (2006).
630	56	Zimmer-Bensch, G. Emerging Roles of Long Non-Coding RNAs as Drivers of
631		Brain Evolution. Cells 8, doi:10.3390/cells8111399 (2019).
632	57	Finucane, H. K. et al. Partitioning heritability by functional annotation using
633		genome-wide association summary statistics. Nat Genet 47, 1228-1235,
634		doi:10.1038/ng.3404 (2015).
635	58	Hauberg, M. E. et al. Common schizophrenia risk variants are enriched in open
636		chromatin regions of human glutamatergic neurons. Nat Commun 11, 5581,
637		doi:10.1038/s41467-020-19319-2 (2020).
638	59	Watanabe, K., Umicevic Mirkov, M., de Leeuw, C. A., van den Heuvel, M. P. &
639		Posthuma, D. Genetic mapping of cell type specificity for complex traits. <i>Nat</i>
640		Commun 10, 3222, doi:10.1038/s41467-019-11181-1 (2019).
641	60	Shimamoto-Mitsuyama, C. et al. Lipid Pathology of the Corpus Callosum in
642		Schizophrenia and the Potential Role of Abnormal Gene Regulatory Networks
643		with Reduced Microglial Marker Expression. Cereb Cortex 31, 448-462,
644		doi:10.1093/cercor/bhaa236 (2021).
645	61	Ohoshi, Y. et al. Microstructural abnormalities in callosal fibers and their
646	-	relationship with cognitive function in schizophrenia: A tract-specific analysis
647		study. <i>Brain Behav</i> 9, e01357, doi:10.1002/brb3.1357 (2019).
648	62	Rossell, S. L. <i>et al.</i> Corpus callosum area and functioning in schizophrenic
649	02	patients with auditoryverbal hallucinations. Schizophr Res 50, 9-17,
650		doi:10.1016/s0920-9964(00)00070-0 (2001).
651	63	Gong, S. <i>et al.</i> A gene expression atlas of the central nervous system based on
652	05	bacterial artificial chromosomes. <i>Nature</i> <b>425</b> , 917-925, doi:10.1038/nature02033
653		(2003).
654	64	
655	04	Inta, D. <i>et al.</i> Neurogenesis and widespread forebrain migration of distinct GABAergic neurons from the postnatal subventricular zone. <i>Proc Natl Acad Sci</i>
655 656		<i>U S A</i> <b>105</b> , 20994-20999, doi:10.1073/pnas.0807059105 (2008).
	65	
657	65	Lein, E. S. et al. Genome-wide atlas of gene expression in the adult mouse brain.

658		Nature 445, 168-176, doi:10.1038/nature05453 (2007).
659	66	Lu, J., Delli-Bovi, L. C., Hecht, J., Folkerth, R. & Sheen, V. L. Generation of
660		neural stem cells from discarded human fetal cortical tissue. J Vis Exp,
661		doi:10.3791/2681 (2011).
662	67	Dobin, A. et al. STAR: ultrafast universal RNA-seq aligner. Bioinformatics 29,
663		15-21, doi:10.1093/bioinformatics/bts635 (2013).
664	68	Finak, G. et al. MAST: a flexible statistical framework for assessing
665		transcriptional changes and characterizing heterogeneity in single-cell RNA
666		sequencing data. Genome Biol 16, 278, doi:10.1186/s13059-015-0844-5 (2015).
667	69	Shannon, P. et al. Cytoscape: a software environment for integrated models of
668		biomolecular interaction networks. Genome Res 13, 2498-2504,
669		doi:10.1101/gr.1239303 (2003).
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#### 673 Figure Legends

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# 675 Figure 1: FACS-Purification and transcriptional profiling of mouse cortical PN and

676 **IN subtypes along embryonic and postnatal development.** A) Schematic diagram of 677 samples collection. CPNs (green), ScPNs (red), and CThPNs (violet) were 678 simultaneously isolated from dissected somatosensory cortices across six developmental 679 stages from E16 to P30. Representative images of immunofluorescence for SATB2 (CPN 680 marker, green), BCL11B (ScPN marker, red), and TLE4 (CThPN marker, violet) on 681 mouse cerebral cortex sections at P7. Details on biological replicates, library sample size, 682 quality and RNA sequencing parameters are reported in Table S1. B) Dimensionality 683 reduction by multidimensional scaling (MDS) of the average gene expression shows that 684 PN sample dissimilarity is primarily driven by time (Dimension 1) and identity 685 (Dimension 2). C) Line plots of average gene expression illustrating cluster association 686 with distinct subtype identities and developmental stages. PN subtype-specific 687 developmental signatures - obtained as explained in detail in the Methods - were 688 classified in early, mid, and late, reflecting the time-specific expression dynamic along 689 development. Differentially expressed signature genes of PN subtypes are reported in 690 Table S2. Clusters 1, 5, and 7 identify early developmental signatures for CPNs, CThPNs 691 and ScPNs, respectively; cluster 2 represents CPN mid-developmental signature genes; 692 clusters 3, 6, and 4 represent CPN-, CThPN, and ScPN- late developmental signatures, 693 respectively. Gene clusters are reported in Table S3. D) Heatmap showing expression 694 pattern of PN subtype-specific developmental signature genes (5 top-ranked/cluster genes 695 are shown). E) Cnet plots displaying gene concept network analysis for GO terms 696 enriched in CPN- (green square), ScPN- (red square), and CThPN- (violet square) 697 subtype specific late-developmental signatures. Gene Ontology (GO) analysis reveals 698 enrichment of genes associated with circuit establishment and maintenance. Statistical 699 details and full description of GO terms is reported in Table S4. F) z-scores expression 700 heatmap of PN subtype-specific stable signatures. G) Schematic overview of purification 701 strategy of 5HT3aR- (pink) and Lhx6- (light green) expressing cortical INs. 702 Representative images of P7 cerebral cortex from genetically labeled 5HT3aR-GFP and 703 Lhx6-EGFP mouse IN reporter lines. H) Dimensionality reduction by multidimensional 704 scaling (MDS) of average gene expression shows that IN sample dissimilarity is 705 primarily driven by time (Dimension 1) and class identity (Dimension 2). I) Line plots of 706 average gene expression illustrating cluster association with distinct subtype identities 707 and developmental stages. Early, mid, and late developmental signatures reflected the 708 expression dynamics along development. IN subtype-specific developmental signatures -709 obtained as explained in detail in the Methods - were classified in early, mid, and late, 710 reflecting the time-specific expression dynamic along development. Differentially 711 expressed signature genes of IN subtypes are reported in Table S2. Clusters 1 and 4 712 identify early-development signatures for 5HT3aR and Lhx6, respectively; cluster 2 713 represents 5HT3aR mid-developmental signature genes; clusters 3 and 5 represent late 714 developmental signatures of 5HT3aR and Lhx6, respectively. Gene clusters are reported 715 in Table S3. J) Heatmap showing expression pattern of IN subtype-specific 716 developmental signature genes (5 top-ranked/cluster genes are shown). K) Cnet plots 717 displaying gene concept network analysis for GO terms enriched in 5HT3aR- (pink 718 square) and Lhx6- (light green square) subtype specific late-developmental signatures. 719 Enrichment of genes associated with axonal development (5HT3aR) and synaptic 720 transmission (Lhx6) were found. Statistical details and full description of GO terms is 721 reported in Table S4. L) z-scores expression heatmap of IN subtype-specific stable 722 signatures.

Abbreviations: E, embryonic day; P, postnatal day; CPN, Callosal Projection Neurons;
ScPN, Subcerebral Projection Neurons; CThPN, CorticoThalamic Projection Neurons;
IN, Interneurons; SST, Somatostatin; VIP, Vasointestinal peptide. Scale bars: 250µm.

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727 Figure 2: ScPN molecular diversity across functional areas and along the anterior-728 A) Schematic diagram of experimental posterior axis. design. Tcerg11-729 CreERT2/Sun1:GFP mice were injected with Tamoxifen at P7 and corteces analyzed at 730 P56. Representative images of double immunofluorescence of BCL11B (red) and SATB2 731 (violet) showing colocalization with GFP-expressing cells (proxy for Tcergll-732 CreERT2/Sun1:GFP). Scale bars: 250µm. Zoom-in inset: scale bar: 100µm. B) Uniform 733 Manifold Approximation and Projection (UMAP) plots of Tcerg11-GFP expressing nuclei 734 isolated by FACS confirming that the majority of the recovered nuclei in all the areas are

735 ScPNs, while a smaller fraction also contains CPNs and CthPNs, as well as INs. C) 736 UMAP of computationally extracted ScPNs from B) (only SS area), showing a 737 homogenous enrichment of late ScPN signature genes among nuclei isolated from 738 somatosensory cortex. D) UMAP of ScPNs in distinct functional areas of the cerebral 739 cortex. E) Heatmap of area-specific expression modules derived from differential gene 740 expression analysis of ScPNs between cortical functional areas. F) Representative violin 741 plots of ScPN signature genes of motor (red), somatosensory (blue), visual (green) and 742 auditory (yellow) areas. Differentially expressed signature genes of ScPN across areas are 743 reported in Table S6. G) UMAP of ScPNs in distinct anterior-posterior levels of 744 different cortical areas. H) Heatmap of AP level-specific expression modules derived 745 from differential gene expression analysis of ScPNs between distinct rostro-caudal 746 locations. I) Representative violin plots of ScPN signature genes of motor (red/pink), 747 somatosensory (blue/light blue), visual (green) and auditory (yellow) areas. Differentially 748 expressed signature genes of ScPN across AP levels are reported in Table S6.

Abbreviations: Mo, Motor; SS, Somatosensory; AUS, Auditory; VIS, Visual; CPN,
Callosal Projection Neurons; ScPN, Subcerebral Projection Neurons; CThPN,
CorticoThalamic Projection Neurons; AP, anterior-posterior.

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753 3: Identification, FACS-isolation, and transcriptional profiling of PN Figure 754 subtypes from human fetal cortices at midgestation. A) Schematic of sample 755 collection. **B**) Representative images of human fetal cortical sections isolated from GW16756 and immunostained for SATB2 (labeling pCPNs in green), BCL11B (marker of ScPNs in 757 red), and TLE4 (labeling CThPNs in violet). Arrows indicate pScPNs expressing high 758 levels of BCL11B and low levels of SATB2, while arrowheads represent pCThPNs 759 expressing high levels of TLE4 and low levels of BCL11B. Scale bars: 250µm. Zoom-in 760 inset: scale bar: 100µm. C) FACS-isolation gating strategy of molecularly identified 761 human cortical populations. **D**) Representative FACS plots identifying pCPNs (BCL11B<sup>-</sup> (BCL11B<sup>high</sup>/TLE4<sup>low</sup>/SATB2<sup>-</sup>), 762  $/TLE4 / SATB2^+$ ), pScPNs and pCThPNs 763 (BCL11B<sup>low</sup>/TLE4<sup>high</sup>/SATB2<sup>-</sup>). Details on biological replicates, library sample size, 764 quality and RNA sequencing parameters are reported in Table S1. E) Dimensionality 765 reduction by multidimensional scaling (MDS) of average gene expression shows that the 766 samples dissimilarity is driven by identity in the first two dimensions, clearly separating 767 pCPNs (represented in green) from pCFuPN in the first dimension and to a lesser degree 768 CThPN (represented in violet) and pScPN (represented in red) in the first dimension. The 769 second dimension shows a less evident trend in sample separation by time. F) Line plots 770 representing the expression profile of *Tle4*, *Satb2*, and *Bcl11b* transcripts. Gene 771 expression is in accordance with sample identity and consistent over time. G) Line plots 772 of average gene expression illustrating cluster association with distinct subtype identities 773 and developmental stages. PN subtype-specific signatures - obtained as explained in 774 detail in the Methods - are reported in Table S2. Clusters 1 and 2 represent pCFuPN 775 signatures, with genes highly expressed in both pScPN (red line) and pCThPN (violet 776 line), while depleted in pCPN (green line); Clusters 3, 4, and 5 were representing genes 777 enriched in pCPN; Clusters 6 and 7 pCThPN genes; and Clusters 8 and 9 genes enriched 778 in pScPN. Gene clusters are reported in Table S3. H) z-score heatmap representing the 779 expression pattern of human subtype-specific developmental signature genes at different 780 ages (5 top-ranked/cluster genes are shown). I) UMAP of a subset of human fetal cortex cells from the previously published single cell study<sup>43</sup>. J) Re-annotation of dataset in (I) 781 782 using our subtype-specific signatures (identified in G). Subpopulation of pScPNs and 783 pCThPNs, previously annotated as "CFuPN", are now clearly mapped and indicated with 784 arrows.

Abbreviations: GW, gestational week; pCPN, putative Callosal Projection Neurons; pScPN, putative Subcerebral Projection Neurons; pCThPN, putative CorticoThalamic Projection Neurons; pCFuPNs, putative Corticofugal Projection Neurons; Im CPN, immature CPN.

789

**Figure 4: Interspecies comparison of human and mouse subtype-specific PN signature genes. A)** Occurrence of the human-specific (no ortholog in mouse) signature genes in the various primate clades. Assignment of the 577 human-specific signature genes (Table S8) to a primate clade, based on the primate genome(s) in which an ortholog was found in the present analysis (BioMart database). Clades are specified in top panel. The color-coding indicates the degree of conservation among species in each clade: the number reported in blue represents the frequency of genes that are present both in human 797 and the given primate species; the number in violet represents the frequency of genes 798 present in multiple primate genomes within the prosimian and simian groups. **B**) Upset 799 plot representing gene set intersection between human and mouse ortholog subtype-800 specific signature genes. Only a subset of identified signature genes for projection neuron 801 populations intersect, while the majority of projection neuron signature genes do not 802 intersect. C) Pearson's correlation of gene expression of subtype-specific ortholog 803 signatures in human and mouse at the different sampled ages. Highest correlation 804 between samples of corresponding subtype across species was observed at P1. D) G-805 profiler based enrichment analysis of human signature and mouse DEG at P1, and 806 network visualization of shared and species-specific enriched terms by Cytoscape 807 analysis (see Methods). Statistical details and enrichment term description is reported in 808 Table S9.

Abbreviations: GW, gestational week; E, embryonic day; pCPN, putative Callosal
Projection Neurons; pScPN, putative Subcerebral Projection Neurons; pCThPN, putative
CorticoThalamic Projection Neurons; pCFuPNs, putative Corticofugal Projection
Neurons; Im CPN, immature CPN; FDR, false discovery rate.

813 814

815 5: Linkage Disequilibrium Regression score for GWAS hits of Figure 816 neurodevelopmental and neuropsychiatric disorders in human and mouse cortical 817 neuron signatures. Genetic correlations (estimated by LD Score Regression) between mouse (A, B) and human (C) neuronal subtype-specific signature genes and Height, 818 819 Coronary Artery Disease (CAD), Autism Spectrum Disorder (ASD), Schizophrenia 820 (SCZ), Bipolar Disorder (BD). <sup>\*</sup> represents significant genetic correlation. (**D-F**) 821 Computationally extracted PN subtypes form the 3 month organoids dataset previously published<sup>52</sup> were re-annotated using the PLIER algorithm which employed our signature 822 823 gene sets (E-F). (G) Genetic correlations (estimated by LD Score Regression) between 824 5% top expressing genes of cortical organoid subtypes at 3 mo in vitro and Height, 825 Coronary Artery Disease (CAD), Autism Spectrum Disorder (ASD), Schizophrenia 826 (SCZ), Bipolar Disorder (BD).

\* represents significant genetic correlation. 5% top expressed genes and sum statistics of
disease traits are listed in Table S10.

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- 829 Abbreviations: pCPN, putative Callosal Projection Neurons; pScPN, putative Subcerebral
- 830 Projection Neurons; pCThPN, putative CorticoThalamic Projection Neurons; pCFuPNs,
- 831 putative Corticofugal Projection Neurons; Im CPN, immature CPN.

#### 832 Methods

#### 833 Animals.

834 All animals were handled according to protocols approved by the Institutional Animal 835 Care and Use Committee (IACUC) of Harvard University. All mice were maintained in 836 standard housing conditions on a 12-h light/dark cycle with food and water ad libitum. 837 No more than four adult animals were housed per cage. Both females and males were 838 included in the study. Time pregnant CD1 females have been purchased at Charles River 839 Laboratories and embryonic and postnatal litters have been collected at the desired time 840 points (E16, E18, P1, P3, P7, P30). All the transgenic mouse lines used in this study 841 were imported and housed in our Animal Facility: Vip-IRES-cre (Jax Stock No 010908); 842 Sst-IRES-cre (Jax Stock No 018973); Lhx6-GFP (Lhx6-EGFP)BP221Gsat)<sup>63</sup>; 5HT3aR- $GFP^{64}$  kindly provided by Hanna Monyer; and Tcerg11-2A-CreER<sup>34</sup>, kindly provided by 843 844 Joshua Huang, was crossed with nuclear reporter line SUN1-sfGFP-myc-pA (Jax Stock. 845 021039). 846 Sequences of PCR primers employed to genotype reporter mouse lines are as follows: for 847 5HT3aR-GFP we used a common Forward (FW) primer 848 GCAAGATGTGACCAAGCCACCTATTT and Reverse (RV) as

849 TGAACTTGTGGCCGTTTACGTCG for the mutant and 850 CAGCCCTCAGCCCTTTGAGACTTAAG to detect the wt; for Lhx6-GFP: FW 851 GCTGAAGCACTGCACGCCGTAGG and RV GTTTGTCGGGACCTTCTTCA; For 852 SST-Tom: TCTGAAAGACTTGCGTTTGG FW for the wt, 853 FW TGGTTTGTCCAAACTCATCAA to detect the transgenic, and 854 GGGCCAGGAGTTAAGGAAGA as a common RV primer; For VIP-IRES-Cre and 855 Tcerg11-2A-CreER GTCCAATTTACTGACCGTACACC and 856 GTTATTCGGATCATCAGCTACACC.

857

858 **Tissue samples**.

859 <u>Mouse samples</u>

For each biological replicate of the bulk sequencing experiment, the somatosensory
cortex was dissected from one litter of mouse embryos or pups (six to ten pups per litter)
or from 8-10 littermates P30 mice. For single-cell analysis, we pooled cortical regions

863 (motor, somatosensory, auditory, visual) at distinct anterior-posterior locations (A-P). 5-6

864 Tcerg11-2A-CreER P56 mice, previously injected intraperitoneally with a single dose of

- 865 Tamoxifen ( $100 \square \mu$ l at  $5 \square mg \square ml^{-1}$ ) at P7. The Allen Mouse Brain framework version 3
- 866  $ontology^{65}$  was used to define cortical primary areas.
- 867

# 868 <u>Human fetal samples</u>

De-identified human fetal tissue samples (GW16-GW21) were obtained from ABR upon
patient consent in strict observance of the legal and institutional ethical regulations.
Protocols were approved by the Harvard Institutional Review Board. Fetal cortices were
microdissected on ice in HibernateA and dissociated into single cell suspension as
previously described<sup>66</sup>.

874

# 875 Tissue processing for cell and nuclei sorting.

876 Enzymatic (Papain; Worthington Biochemical Corporation) and mechanical digestion 877 were used to dissociate cortex into single cell suspension, following manufacturer's 878 protocol. Briefly, tissue samples were cut into small pieces and placed in a vial 879 containing a pre-warmed solution of Papain and triturated following manufacturer 880 protocol. After removing the dissociation media, cells were resuspended in PBS and 881 processed for intracellular staining and FACS-sorting<sup>18</sup>. Somatosensory corteces obtained 882 from P30 mice were dissociated into single cell suspension by enzymatic and mechanical 883 digestion using the Papain dissociation kit, according to the manufacturer's protocol 884 (Worthington, cat. #LK003153). For nuclei preparation, somatosensory, motor, auditory 885 and visual cortex from wild-type animals at P56 was dissected and dissociated. Each 886 library was made from tissue pooled from at least 8 animals, and a balanced sex ratio was 887 used. Tissue dissociation was performed as previously described, and live cells were 888 isolated by FACS sorting as DAPI-negative, Vybrant DyeCycle Ruby (Thermo Fisher)-889 positive events. Libraries were prepared using the 10x Genomics Chromium Single Cell 890 3' kit v2 (10x Genomics) according to the manufacturer's protocol.

891

# 892 FACS-purification of mouse and human cortical projection neurons.

The protocol for intracellular staining and RNA isolation was previously described<sup>18</sup>. 893 894 Single cell suspension was centrifuged for 5 minutes at 250g. Cell pellet was resuspended 895 in 4% paraformaldehyde (Electron Microscopy Science), 0.1% saponin, and 1:25 RNasin 896 in PBS (2x10<sup>7</sup> cells/ml) and incubated at 4°C for 30 minutes. Cells were pelleted at 897 3000g for 30 minutes, washed twice with wash buffer (0.1% saponin, 0.2% BSA, 1:100 898 RNasin in PBS), resuspended in primary antibody (0.1% saponin, 1% BSA, 1:20 RNasin 899 in PBS), and incubated for 30 minutes at 4°C. Cells were then washed twice, incubated in 900 secondary antibody for 30 minutes, washed twice more, and resuspended in PBS with 0.5% 901 BSA and 1:40 RNasin for FACS purification on a BD FACS Aria II into PBS with 0.5% 902 BSA and 1:40 RNasin. RNase free BSA was from Gemini Bio-Products. Primary 903 antibodies were mouse anti-ISATB2 1:250 (Abcam), rat anti-CTIP2 1:500 (Abcam), and rabbit anti TLE4 1:2000 (gift from S. Stifani)<sup>30</sup>. Secondary antibodies were goat anti-904 905 mouse A488, goat anti-rat A546, and goat anti-rabbit A647 at 1:1000 (Molecular Probes). 906 Appropriate gates for FACS were set based on relative levels of SATB2, CTIP2, and 907 TLE4 expression to isolate CPN, ScPN, and CThPN, as previously described<sup>18</sup>.

908

# 909 FACS-isolation of mouse interneuron classes.

910 Single cell suspensions obtained from somatosensory cortices isolated from interneuron 911 reporter lines (Vip-IRES-cre; Sst-IRES-cre; Lhx6-GFP; 5HT3aR-GFP) were analyzed by 912 FACS and interneuron classes were FACS-purified based on the expression of the 913 reporter gene. Appropriate gates on FACS were set based on wild type cortex, which do 914 not express the reporter gene.

915

# 916 FACS-isolation of mouse cortical nuclei.

917 Single nuclei suspensions obtained from primary cortices isolated from *Tcerg1l*-2A918 CreER P56 mice were analyzed by FACS and Tomato positive neurons isolated.
919 Appropriate gates on FACS were set based on wild type cortex, which do not express the
920 reporter gene.

#### 922 Immunohistochemistry.

923 Mice were anesthetized and transcardially perfused with ice-cold PBS followed by ice-924 cold 4% paraformaldehyde in PBS. Dissected brains were post-fixed overnight in 4% paraformaldehyde at 4 °C, and stored in PBS-Azide 0.0025%. Brains were processed as 925 previously described<sup>23,30</sup>. Vibratome brain slices were incubated with blocking media (8% 926 927 goat serum, 3% BSA, 0.3% Triton in PBS) for 1hr, then with primary antibodies 928 overnight at 4°C. Secondary antibodies were applied with 1:800 dilution in the blocking 929 media and incubated for 2hr at room temperature, after washes. DAPI staining was 930 performed for 3 mins before mounting with Fluoromount G (Invitrogen, #00-4958-02). 931 The antibodies: Chicken anti-GFP antibody (ab16901, 1:500; Millipore), Mouse anti-932 Satb2 (ab51502, 1:50; Abcam), Rat anti-Ctip2 (ab18465, 1:100, Abcam), Rabbit anti-933 Tle4 (a kind gift from Stefano Stifani). Appropriate secondary antibodies were from the 934 Molecular Probes Alexa Series. All images were acquired using a Nikon Eclips 90i 935 fluorescence microscope and analysed with Volocity v6.0.1 software. Confocal images 936 were obtained using an LSM 700 inverted confocal microscope (Zeiss) and analysed with 937 a Zen Blue/Black 2012 Imgae-processing software.

938

# 939 RNA extraction, library preparation, and sequencing.

940 RNA was extracted from molecularly identified PN subtypes using the RecoverAll Total 941 Nuclear Isolation Kit (Thermo Fisher Scientific) following manufacturer's instruction 942 except for crosslinking reversion, which was performed by incubating the nuclear pellet 943 in Digestion Buffer and Protease mixture (100  $\mu$ l buffer and 4  $\mu$ l protease) for 3 h at 50°C. 944 Isolated interneuron subtypes were subjected to RNA extraction with Trizol, following 945 manufacturer's protocol. RNA was quantified using Nanodrop and Qubit and quality 946 assessed by Agilent 2100 Bioanalyzer. Purified RNA served as input for the cDNA 947 library preparation with SMART-Seq v.4 Ultra Low Input RNA kit (Takara Bio, Kusatsu, 948 Japan) and Nextera XT DNA Library Prep Kit (Illumina, San Diego, CA, USA) 949 according to the manufacturer's protocol. The cDNA library fragment size was 950 determined by the BioAnalyzer 2100 HS DNA Assay (Agilent, Santa Clara, CA, USA). 951 The libraries were sequenced as paired-end reads on HiSeq 2500 or NextSeq 500 to retrieve  $1.02 \times 10^8$  mapped reads. For single nuclei RNA sequencing, libraries were 952

953 prepared using the Chromium Single Cell 3' Reagent Kit v2 (10x Genomics). Briefly,

FACS-purified nuclei were loaded into a channel of the Chromium single cell 3' Chip,
following manufacturer's protocol, and partitioned into droplets in the Chromium
Controller, before library construction. Libraries were then deep-sequenced to
approximately 50,000 reads/nucleus.

958

# 959 Computational analysis.

960 Computational analysis was performed using R package version 3. More specifically, we 961 used v. 3.4.4 for the analysis of bulk sequencing, v. 3.6.1 for the analysis of single cell 962 sequencing, and v3.6.0 for the analysis of single nuclei sequencing.

963

# 964 Quality control and data processing for bulk sequencing.

965 RNA-Seq reds were mapped using  $STAR/2.5.0^{67}$  with the following settings:

966 --outFilterType BySJout --outFilterMultimapNmax 20 --outFilterMismatchNmax 999

967 --outFilterMismatchNoverReadLmax 0.04 --alignIntronMin 20 --alignIntronMax
968 1000000 --alignMatesGapMax 1000000 --alignSJoverhangMin 8 -969 alignSJDBoverhangMin 1 --sjdbScore 1 --quantMode GeneCounts

970 Against the GRCh38 or mm10 genome respectively using Gencode based gene 971 annotation version 24 for human and 16M for mouse. Raw gene level quantification from 972 STAR was used for all further analyses and Input to DESeq. Technical replicates were 973 merged and afterwards conditional quantile normalization from cqn R package version 974 1.24.0 was applied to all three data sets, correcting for effects of sequencing depth, gene 975 length and GC content. GC content information was obtained from ENSEMBL, using 976 homo sapiens data set version 83 and mus musculus data set version 91. Gene length was 977 defined as the average length of all listed transcripts for each gene, based on the gencode 978 ENSEMBL transcript annotations version 24 for human and version M16 for mouse. 979 Subsequently, batch effects introduced by flow cell association were corrected for with 980 ComBat from sva package version 3.26.0 in both projection data sets. ComBat was not 981 applied to mouse interneurons because sequencing flow cell and conditions of interest 982 were confounded for this data set. In order to validate sample identity and quality, 983 dimensional reduction and further analyses were implemented. Principal component 984 analysis was conducted based on the prcomp function from stats package version 3.4.4 985 and used to check the first components explaining the majority of the observed variance 986 for outlier samples. To further support the sample selection process, classical 987 multidimensional scaling based on stats cmdscale function was used. Results for two 988 different distance metrics were evaluated, euclidean distance and centered Pearson. 989 Additional sample identity confirmation was attained through clustering of the 990 dissimilarity matrices based on hclust and ward.D2 criterion for agglomeration. Lastly, 991 samples were validated by checking the expression of a previously established set of 992 known subtype marker genes. The final curated data sets encompassed 48 samples for 993 human projections, 43 for mouse projections and 31 for mouse interneurons.

994

#### 995 Gene signature set definition.

996 Differential expression was tested for with the DESeq2 package v. 1.18.1. Normalization 997 factors were derived from conditional quantile normalization and added to the DESeq2 998 object, correcting for transcript length, sequencing depth and gc content. For mouse and 999 human projection neuron data sets, flowcell identity was considered as a covariate in the 1000 design formula. The batch distribution of the mouse interneuron samples did not allow 1001 for inclusion of flow cell information in the design formula for this data set. The 1002 significance threshold for adjusted p values was set to 0.01. Subsequently, the resulting 1003 list of differentially expressed genes was filtered, using an empirical approach to identify 1004 meaningful parameters to pinpoint cell type specific marker genes. To that end, reference 1005 lists of known marker genes for projection and interneurons were used to define 1006 thresholds on normalized gene expression, filtering based on average log2 fold change 1007 and cell type specificity (defined as entropy). Thresholds were chosen so that the marker 1008 genes present in our preliminary lists were retained in the final sets as well. The results 1009 are listed in Table 2. Resulting signature genes were then clustred using PAM (pam() 1010 function from R package cluster v. 2.1.0). The input was defined as the average gene 1011 expression per subtype and age for each gene retained after filtering. Optimal k were 1012 determined using gap statistics as implemented in clusgap version 2.1.0. Genes resulting 1013 from human (k 23), mouse projection (k 7) and the two different lists of mouse 1014 interneuron genes (k 18 for 5HT3aR vs Lhx6 and k 24 for all four subtypes at P30) were 1015 all clustered separately. To each of the resulting clusters a subtype identity was assigned. 1016 Different clusters assigned to the same subtype showed different temporal expression 1017 patterns.

1018 Two strategies were implemented to merge the clusters to obtain the final gene sets. First, 1019 all clusters of the same subtype were merged together to obtain "subtype sets". Second, 1020 all clusters within a subtype were clustered hierarchically (centered Pearson) using the 1021 overall average expression of all genes within a cluster for each subtype and age. All 1022 clusters derived from the same data set were merged according to the same distance 1023 cutoff. This second strategy was not applied to the mouse projection clusters, because 1024 they were already bigger in size than the clusters derived from the other two data sets 1025 where the chosen k were generally larger. Instead, all 7 clusters were treated as individual 1026 gene sets in the disease association analysis. All mouse derived sets were mapped to 1027 one2one human orthologues. The results are listed in Table 3.

1028

#### 1029 Single-nuclei RNA sequence analysis.

1030 Single-nuclei RNA-seq reads were aligned to mm10 pre-mRNA reference, and gene 1031 expression matrix was obtained using CellRanger software v3.1.0 with the default 1032 parameters. R v3.6.0 and Seurat package v3.1.2 was used to perform downstream 1033 analyses. During the analysis, cells from the piriform region were removed, in order to 1034 focus our study on the ScPNs. Low-quality cells (with percent mitochondrial gene 1035 expression (percent.mt) >0.5%) were removed from the analyses. SCTransform was 1036 performed to normalize and scale the gene expression matrix. During the SCTransform, 1037 the number of UMIs per cell and percent.mt were treated as variables to regress out. 1038 Since we want to remove sex effects linked to the presence of chromosomes, X and Y 1039 chromosome genes were removed from the list of variable genes identified. The resulting 1040 list of variable genes was used to perform the principal component analysis. Using the 1041 top 30 principal components (ordered by the fraction of the total variance explained) and 1042 Louvain clustering algorithm (FindClusters function in Seurat with resolution set to 0.7), 1043 16 different cell clusters were identified. This dimension of 30 PCs is further reduced to 1044 two Uniform Manifold Approximation and Projection (UMAP) dimensions (RunUMAP

1045 function in Seurat with dims parameter set to top 30 PCs) for visualizations. Using

1046 known marker genes (listed in Table: Markers), clusters were classified into four broad

- 1047 cell types: ScPN, upper layer CPN, inhibitory neurons and low quality.
- 1048

# 1049 Markers

ScPN	UL CPN	Inhibitory Neurons
Fezf2	Rorb	Synpr
Parm1	Cux1	Sst
Tcerg11	Cux2	Gad1
Bcl11b		Gad2

1050

# 1051 Finding area-specific markers of ScPN.

1052 ScPNs were selected from the broad cell type annotation, and were processed separately 1053 by applying the same workflow described above with percent.mt cutoff of 0.2%. Treating 1054 brain slice/functional area annotations as cell clustering, differentially enriched genes for each section were identified using MAST v1.10.0<sup>68</sup> (using FindAllMarkers function with 1055 1056 test.use parameter set to MAST, latent variable set to the number of UMIs and percent.mt, 1057 min.pct set to 0.3). To group DEGs together by their patterns of expression, we first 1058 computed the average expression of these genes in each brain slice/functional area (using 1059 the AverageExpression function in Seurat). Z-scores were then computed to find enriched 1060 or depleted genes in each region. To group differentially expressed genes into groups 1061 based on their expression pattern, K-means clustering (Hartigan-Wong algorithm 1062 implemented in R base package named stats) was used. The number of clusters was 1063 determined by benchmarking several peaks from the gap statistics result (obtained from 1064 clusGap function in cluster package v2.0.8 with parameters K.max=20 and B=60).

1065

# 1066 **Organoid cell type re-annotation**

1067 We took the dataset produced in Velasco et al.,  $2019^{52}$  to test the performance of our gene 1068 signatures to accurately identify subtypes of PNs. To do so, we selected cells labeled as

1069 CPNs and CFuPNs according to the published annotation and processed only those cells. 1070 Normalized count matrix containing the selected cells was taken from the published 1071 dataset and processed using Seurat package in R using the default parameters unless 1072 otherwise specified. Variable genes were found using FindVariableFeatures function, and 1073 the ScaleData function was used to scale the dataset. Principal component analysis was 1074 performed using RunPCA function on the scaled data, and the top 18 PCs were chosen 1075 based on an elbow plot generated using ElbowPlot function. RunUMAP function was 1076 used on the top PCs to visualize the variation in cells. As the original authors did, 1077 Harmony (version 1.0) was used to remove the batch effect among different cell lines and 1078 replicates. The dataset contained HUES66 and PGP1 cell lines, and PGP1 line had two 1079 replicates. To identify specific PN subtypes (CPN, CThPN and SCPN) in this processed organoid dataset using our signatures gene lists, we applied PLIER (PLIER function from 1080 1081 PLIER package version 0.99.0) specifying our signature lists as the prior knowledge 1082 (gene sets). Among the resulting latent variables that align to the prior knowledge, only 1083 the ones with AUC > 0.5 and p value < 0.005 were considered in the reannotation. The 1084 new annotation of each cell was chosen by the latent variable with the highest cell 1085 loading.

1086

# 1087 Validation of human cell type signature genes in a published dataset.

1088 We validated our curated human gene modules with a previously published dataset Nowakowsky et al., 2017<sup>43</sup>. This scRNA-seq dataset was processed from the downloaded 1089 1090 gene count matrix, using a similar downstream pipeline as specified in the single-nuclei 1091 RNA sequence analysis. Note that percent.mt was not used to filter out the cells and 1092 when scaling the dataset, because the original authors had already removed mitochondrial 1093 genes by only keeping genes expressed in at least 30 cells. Using our gene signature 1094 modules curated for each neuronal subtype of interest (CPN, CfuPN, CThPN and ScPN), 1095 we calculated gene signature scores to identify clusters expressing these modules at high 1096 levels. AddModuleScore() function from Seurat was used to compute gene signature 1097 scores, setting the control parameter to 30. Based on our cell cluster definition and the 1098 module scores, we applied cluster-based re-annotation strategy, where cell type 1099 annotations were reassigned if cells from a specific cluster showed enrichment with one of our modules. Enriched clusters were determined by looking at both the overall modulescores in clusters and the expression of individual genes.

1102

#### 1103 **Ortholog identification.**

1104 Human orthologs for mouse genes were obtained based on the mus musculus gene data 1105 set from ENSEMBL version 91 and biomaRt package version 2.34.2. Genes of mouse 1106 homology types (one to many; many to many) mapping were excluded and only "one-to-1107 one" orthologs were considered for downstream analyses. Mitochondrial genes were 1108 excluded resulting in a total set of orthologs encompassing 15,974 genes. 6,336 of those 1109 genes were found to be differentially expressed both in human and in mouse projection 1110 neurons. 1,804 orthologs passed gene list filtering in at least one species and were thus 1111 identified as potential signatures and 302 of those passed in both species, with 234 of 1112 them being included in the final signature sets. 165 of those were assigned to the same 1113 neuronal subtype signature in both species and consequently identified as convergent 1114 signatures.

1115

# 1116 Interspecies comparison analysis.

1117 Raw counts for 48 human and 43 mouse samples were combined by retaining expression 1118 values for 15,974 ENSEMBL human mouse orthologs. Based on the combined count data, 1119 a DESeqDataSet object was created. Neuronal subtype and age were considered in the 1120 design formula as a joint variable in addition to the sequencing flow cells. Conditional 1121 quantile normalization was applied to remove the effect of GC content, and gene length 1122 was modelled as a smooth function to account for the lengths effect on gene count. The 1123 results were set as normalization factors before estimating size factors and dispersions 1124 and fitting a negative binomial GLM with DESeq2. A blinded variance stabilizing 1125 transformation (VST) was computed for the 15,966 genes that did converge in the 1126 previous step. ComBat from sva package version 3.26.0 was run to correct for batch 1127 covariate flow cell on the basis of a parametric empirical Bayes framework. Biological 1128 replicates were summarized by their mean transformed and corrected expression values. 1129 For classical metric multidimensional scaling (MDS), analyses were implemented with R 1130 package stats version 3.4.4. Distance matrices were computed with amap version 0.8-16

1131 choosing centered Pearson (1-corr(x,y)) as the distance metric. Supplementary Figure 9 1132 shows MDS for all 15,966 orthologs and for the subset of 1,803 orthologs that were 1133 identified as potential signatures in at least one species. Correlation maps were created on 1134 Pearson correlated data, Figure 4 c) shows the results of correlation analysis for 302 1135 genes that were identified as potential neuronal projection signatures both in human and 1136 in mouse.

1137

# 1138 Functional annotation and Enrichment Map pathway analysis visualization.

1139 Pathway enrichment analysis was carried out by searching for enriched gene-sets (e.g. 1140 pathways, molecular functional categories, biological processes) in the human signature 1141 gene set versus the murine DEGs at P1 for each neuronal subtype by mapping functional 1142 information from pathways annotation collection (updated version April 2019) using 1143 gProfiler. The collection comprises Gene Ontology annotations (Biological Process, 1144 Cellular Component, Molecular Function) as well as Reactome, Panther Pathway, 1145 Msigdb C2 and Wikipathways terms. The resulting enrichment results were visualized 1146 with the Enrichment Map plugin for the Cytoscape network visualization and analysis 1147 software. We loaded gProfiler results using a FDR cut-off of 0.05. In these maps, each 1148 gene set is symbolized by a node in the network. Node size corresponds to the number of 1149 genes comprising the gene-set. The enrichment scores for the gene-set are represented by 1150 the node's color intensity (green for CPN, red for ScPN, violet for CThPN and yellow for 1151 CFuPN). The color of the node upper hemisphere indicates the enrichment score for 1152 mouse gene sets, and the lower hemisphere indicates the score for human gene sets. To 1153 intuitively identify redundancies between gene sets, the nodes are connected with edges if 1154 their contents overlap by more than 50%. The thickness of the edge corresponds to the 1155 size of the overlap. The edge belonging to human dataset were represented in dark gray, 1156 those corresponding to mouse dataset were represented in light gray. We used version 1.1.0 of the Enrichment Map software in Cytoscape  $3.8.0^{69}$ . 1157

1158

#### 1159 Gene ontology and functional enrichment analysis.

From curated lists of genes, enriched biological pathways and molecular functions were identified using enrichGO function from an R package clusterProfiler (v3.14.3). We queried different databases for different organisms by setting OrgDb parameter (org.Hs.eg.db for human dataset and org.Mm.eg.db for mouse dataset, respectively) and reported only the significant terms and pathways by setting pvalueCutoff=0.05. Background list of genes were prepared for each dataset to include all the genes that are expressed in the dataset.

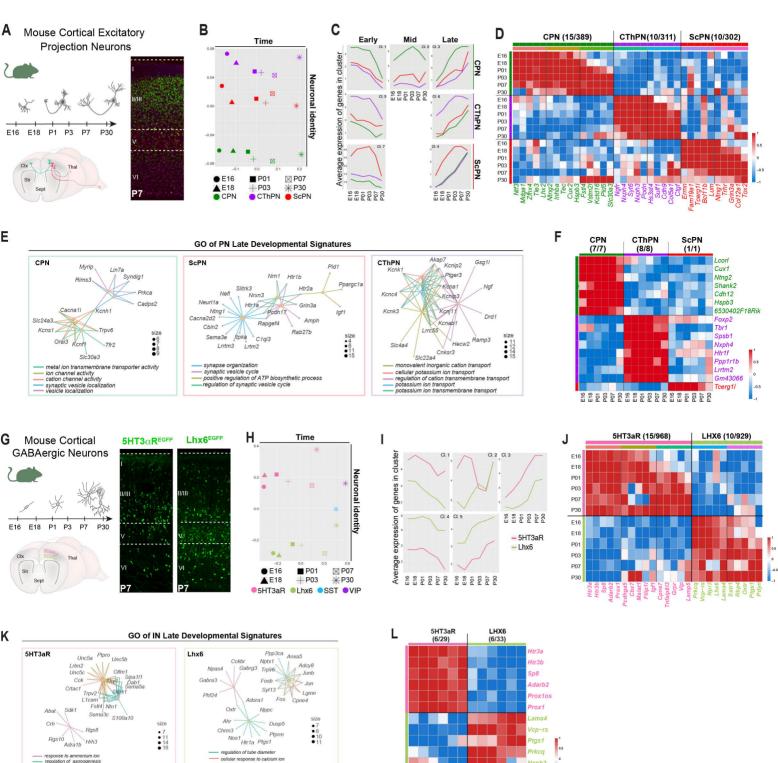
1167

# 1168 LDscore regression and partition heritability analysis.

1169 Human gene coordinates corresponding to different cell types and cell type clusters 1170 (categories) were overlapped using bedtools (Version: v2.27.1-1-gb87c465) with the 1171 SNPs in the .bim file used for the computation of LD scores (1000 Genomes Phase 3 1172 downloaded from https://data.broadinstitute.org/alkesgroup/LDSCORE/), the resulting 1173 annotation files were used to calculate the annotation specific LD scores separately for 1174 each category using LD Score Regression (LDSC) Version 1.0.0. To asses each 1175 category's contribution to h^2, a cell type specific analysis was performed for multiple 1176 disease traits, including Schizophrenia, Autism, Bipolar Disorder, Coronary Artery 1177 Disease (Table S 10) using their corresponding GWAS summary statistics (obtained here: 1178 https://data.broadinstitute.org/alkesgroup/LDSCORE/) and a modified baseline model 1179 v1.1 which contains 52 categories. To that end, we followed the CTS workflow according 1180 the software recommendations. This modification was done to add an extra category as a control (similar to the Finucane et al. 2018<sup>48</sup>) that included all analyzed genes in our 1181 1182 RNA-seq. After adjusting each category's p-value together with the baseline model 52+1 1183 categories to account for multiple testing, significant heritability enrichment was 1184 determined using FDR < 0.05.

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axon development axonogenesis ved in diffe

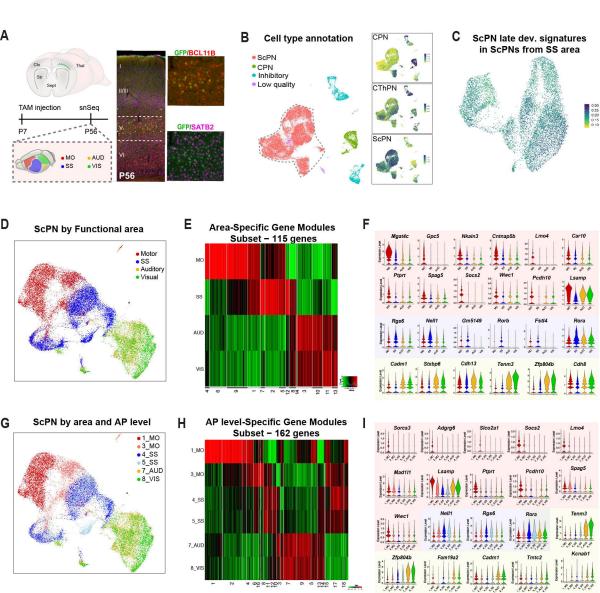


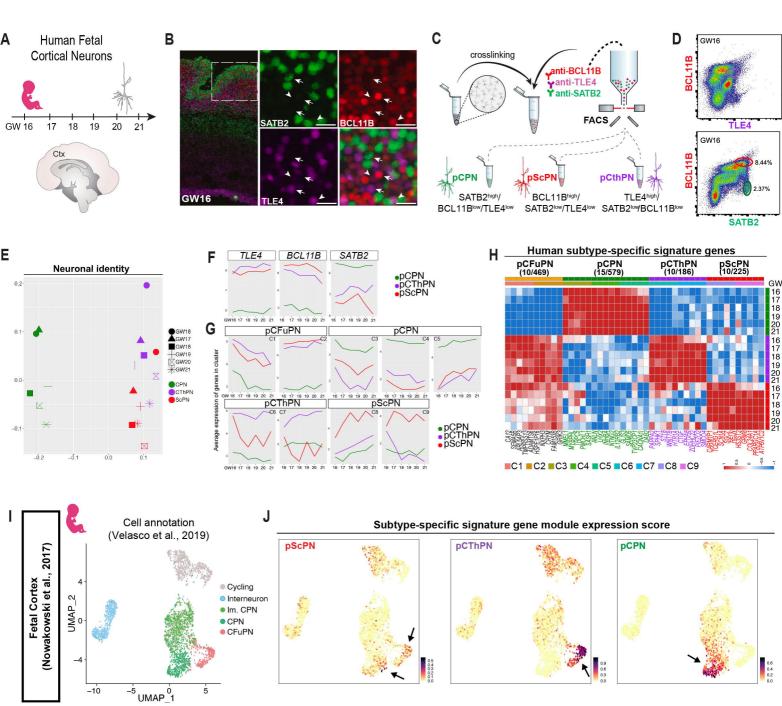
E16 E16 P01 P01 P03 P03 P03 P03 P01 P01

response to calcium ion

cellular response to metal ion

synaptic transmission, GABAergio





Node size mapping

Node borde

color OCPN

OScPN

OCThPN

Edge colo

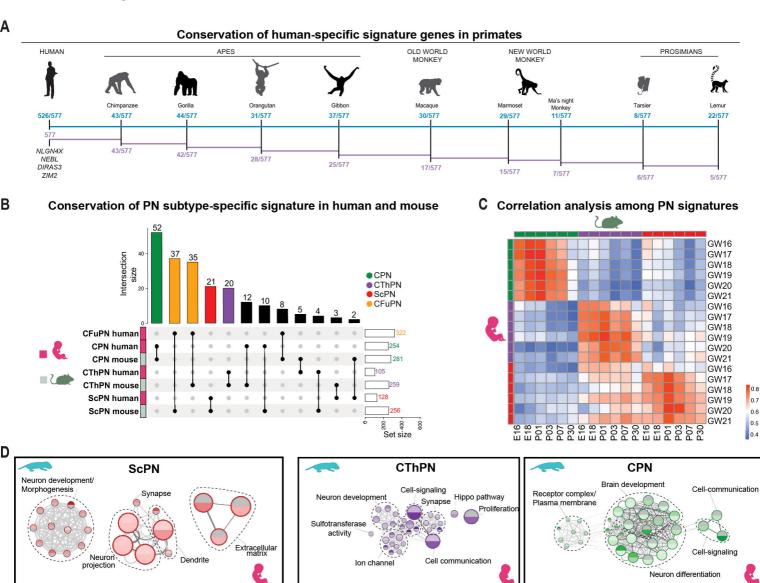
mapping

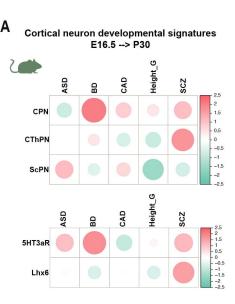
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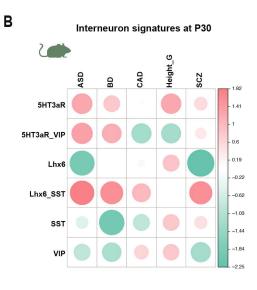
Edge width mapping

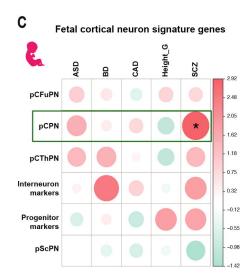
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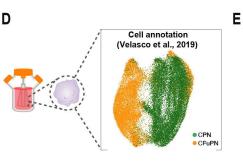
Node fill color mapping

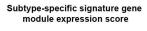


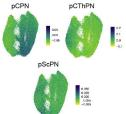
















CPN OThPN OScPN

