# ARTICLE Impact of schizophrenia GWAS loci converge onto distinct pathways in cortical interneurons vs glutamatergic neurons during development

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Remarkable advances have been made in schizophrenia (SCZ) GWAS, but gleaning biological insight from these loci is challenging. Genetic influences on gene expression (e.g., eQTLs) are cell type-specific, but most studies that attempt to clarify GWAS loci's influence on gene expression have employed tissues with mixed cell compositions that can obscure cell-specific effects. Furthermore, enriched SCZ heritability in the fetal brain underscores the need to study the impact of SCZ risk loci in specific developing neurons. MGE-derived cortical interneurons (cINs) are consistently affected in SCZ brains and show enriched SCZ heritability in human fetal brains. We identified SCZ GWAS risk genes that are dysregulated in iPSC-derived homogeneous populations of developing SCZ cINs. These SCZ GWAS loci differential expression (DE) genes converge on the PKC pathway. Their disruption results in PKC hyperactivity in developing cINs, leading to arborization deficits. We show that the fine-mapped GWAS locus in the ATP2A2 gene of the PKC pathway harbors enhancer marks by ATACseq and ChIPseq, and regulates ATP2A2 expression. We also generated developing glutamatergic neurons (GNs), another population with enriched SCZ heritability, and confirmed their functionality after transplantation into the mouse brain. Then, we identified SCZ GWAS risk genes that are dysregulated in developing SCZ GNs. GN-specific SCZ GWAS loci DE genes converge on the ion transporter pathway, distinct from those for cINs. Disruption of the pathway gene CACNA1D resulted in deficits of Ca<sup>2+</sup> currents in developing GNs, suggesting compromised neuronal function by GWAS loci pathway deficits during development. This study allows us to identify cell type-specific and developmental stage-specific mechanisms of SCZ risk gene function, and may aid in identifying mechanism-based novel therapeutic targets.

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## INTRODUCTION

SCZ is a highly heritable [1] neurodevelopmental disorder [2] that is characterized by positive symptoms (e.g., hallucinations and delusions), negative symptoms (e.g., apathy, anhedonia), and cognitive symptoms (e.g., memory, executive functions and attention) [3]. Recent large-scale SCZ GWAS have convincingly identified more than 100 risk loci with genome-wide significance [4], opening the way to a deeper understanding of SCZ pathogenic mechanisms by enabling the identification of potentially causal abnormalities encoded in the genome, rather than by-products of the disease pathogenetic cascade. However, gleaning biological insights on how these risk loci affect SCZ risk and pathogenesis is a nontrivial task, since they are often in non-coding regions. Many risk loci are enriched in enhancer regions [4], suggesting their role in gene regulation. Genetic influence on expression (e.g., eQTLs) is cell type-specific and sometimes has opposite effects in different cell types [5, 6], pointing to the importance of using disease-relevant and specific cell populations to clearly understand SCZ risk loci function. The postmortem brain tissues often used to derive eQTLs are heterogeneous cell populations which are likely to mask cell type-specific impacts of genetic loci, and can be confounded by effects from age, illness and treatment. Furthermore, genomic data

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how SCZ risk loci influence gene expression and alter neuronal function to increase SCZ risk. In addition, considering the modest effects of each SCZ GWAS locus, it is imperative to study the pathway that they converge onto to gain more meaningful biological insights into their function.

MGE-type clNs are one of the most substantially affected neural types in SCZ [11–22]. Accordingly, experimental evidence suggests a role for altered GABAergic neurotransmission in SCZ [23]. In particular, PV-expressing clNs regulate gamma oscillation [24, 25], which is important for cognitive function [26] but has been found to be defective in SCZ patients [27]. In addition, GNs are also significantly affected in SCZ, with evidence of altered glutamatergic neurotransmission [28]. Recent genomic analyses showed both clNs and GNs harbor enriched SCZ heritability in fetal brains [29–32], unlike other neuronal subtypes without such enrichments. Thus, to understand the functions of SCZ risk loci, it is imperative to study converging SCZ genetic influence on gene expression in these cell populations during the developmental stage where SCZ heritability is enriched.

The ability to study the critical pathogenic events in the developing human nervous system once seemed unimaginable due to insurmountable ethical and technical barriers. However, recent advances in iPSC technologies offer the possibility of generating SCZ-specific developmental brain cell populations with the same genetic makeup as the patient brains, providing the opportunity to analyze cellular and molecular abnormalities resulting from the SCZ genetic burden [33-37]. Differentiation of human PSCs well recapitulates human embryonic development [31, 38–49] and follows a relevant in vivo developmental timeline [50, 51], enabling us to study early developmental processes of neurons in the gestational stage. This is a critical time period, during which they actively integrate into cortical circuitry [52], the brain becomes more susceptible to environmental challenges [53–55], and many known SCZ risk genes are highly expressed [56-58]. Thus, to gain a deeper understanding of SCZ GWAS risk function during development, we have generated homogeneous populations of developing MGE-type cINs and GNs from human iPSCs. Using wellverified healthy control (HC) vs SCZ clNs [49-51, 59-62], we observed SCZ GWAS loci genes that are dysregulated in developing SCZ cINs converge onto the PKC pathway. Dysregulation of PKC pathway genes resulted in PKC hyperactivity, accompanied by deficits in arborization. Fine-mapped GWAS locus in the ATP2A2 gene of the PKC pathway harbors enhancer marks shown by ATAC-seq and ChIP-seq and regulates ATP2A2 expression. We also generated developing glutamatergic neurons (GNs), another population with enriched SCZ heritability, and confirmed their functionality after transplantation into the mouse brain. Then, we identified SCZ GWAS risk genes that are dysregulated in developing SCZ GNs. Distinct from clNs, GNspecific SCZ GWAS loci DE genes converge onto the ion channel pathway, stressing the need for cell type-specific studies to unravel SCZ GWAS loci function. Disruption of CACNA1D within GWAS loci resulted in reduced Ca<sup>2+</sup> currents in these neurons, suggesting neuronal functional deficits by dysregulation of SCZ GWAS loci DE genes. Understanding cell type-specific and developmental stage-specific mechanisms of SCZ risk loci function will aid in identifying novel therapeutic targets based on the mechanistic insight of disease pathogenesis.

## RESULTS

# SCZ DE genes within SCZ GWAS loci converge onto PKC pathway in developing clNs

Recent large scale SCZ GWAS convincingly identified a large number of SCZ risk loci. However, which loci are operational in

which cells, at what developmental stages and with what impact, still needs to be determined. With the purpose of identifying SCZ risk loci that are active in specific cell types with enriched SCZ heritability during development, first we identified SCZ GWAS loci genes that are dysregulated in homogeneous populations of SCZ developing cINs. Based on previously published RNA-seq analysis [49] on HC vs SCZ developing cINs (Fig. 1A, B and Supplementary Fig. 1), we identified 25 SCZ cIN DE genes within SCZ GWAS loci with genome-wide significance [63] (Fig. 1C and Supplementary Table 1). Analysis of convergence of these SCZ GWAS loci DE genes identified the PKC pathway as the most significantly enriched (Fig. 1C-E, Supplementary Fig. 2 and Supplementary Table 2), followed by RNA processing. All 6 PKC pathway DE genes (marked with red asterisks in Fig. 1C and in red rectangles in Fig. 1D) displayed a direction of change (Fig. 1E, F and [49] for clustered PCDH family members) that is expected to increase PKC activity in SCZ cINs by directly regulating levels of PKC activators,  $Ca^{2+}$  and DAG [64, 65], or via signaling cascades [49, 66, 67] as illustrated in Fig. 1E. Interestingly, PKC hyperactivity has been associated with numerous brain abnormalities [68-86]. We also confirmed the dysregulation of these genes in SCZ cINs by gPCR (Fig. 1G). Each of the 6 PKC genes have 3-7 independent studies that identify them as high confidence SCZ risk genes by various genomic analyses such as fine mapping, eQTL, colocalization, TWAS, ATAC-seq and Hi-C [6, 10, 47, 87-94] as summarized in Supplementary Table 3, giving us confidence to study the pathway on which they converge. Overall, these results suggest convergence of SCZ GWAS loci DE genes onto the PKC pathway in developing cINs.

### Functional impact of PKC pathway SCZ risk loci DE gene dysregulation on developing clNs

To understand the functional impact of PKC pathway DE gene dysregulation, we knocked out ATP2A2 or DGKI using the CRISPR/ CAS9 system (Fig. 2A), since these 2 genes more directly regulate PKC activator level [64, 65]. Analysis of PKC activity in control vs knockout (KO) cINs derived from 6 different subject iPSCs showed that there was significant increase in PKC activity by KO of ATP2A2 or DGKI alone or together (Fig. 2B and Supplementary Fig. 3A). Though the directions of KO impact were same in different lines, the baseline PKC activity and fold increases were different in each line (Supplementary Fig. 3B), showing genetic background dependence of KO impacts. We did not see additive effects by KO of both genes, possibly due to crosstalk between Ca<sup>2+</sup> pathway and DAG pathway, which have been shown to activate each other [95-98]. Since PKC hyperactivity was correlated with various neuronal deficits including arborization deficits [68-86], we examined whether downregulation of PKC pathway SCZ risk loci DE genes can result in compromised arborization of developing cINs. KO of either ATP2A2 or DGKI alone or together significantly reduced neurite length (Fig. 2C and Supplementary Fig. 4A, B). Again, though the directions of KO impact were the same across the different lines, baseline neurite lengths and fold changes were different in each line (Supplementary Fig. 4C). Next we tested whether the arborization deficit resulting from KO of PKC DE genes can be rescued by inhibition of PKC. Thus we treated developing cINs with ATP2A2 and DGKI KO with Go6893, a pan-PKC inhibitor. Treatment of KO cINs with PKC inhibitor restored arborization deficits, showing the deficits were mediated by hyperactive PKC (Fig. 2C). Interestingly, in our previous study, we observed a significant decrease in neurite length in SCZ cINs compared to HC cINs, which was reverted by PKC inhibitor treatment [49]. Overall, these results suggest that dysregulated SCZ risk loci DE genes could result in functional deficits in developing cINs.

# SCZ GWAS loci regulate the expression of ATP2A2 in developing cINs

Next we analyzed the role of SCZ GWAS loci in regulating gene expression levels. To do this, we first examined fine mapping



results from recent large SCZ GWAS. Among fine-mapped loci near PKC DE genes, a single SNP in the ATP2A2 gene intron rs4766428 has an almost perfect probability to be causal [probability of 1 [63] or 0.99 [99]], whereas other PKC GWAS loci have multiple fine mapped SNPs, each with moderate probability (Fig. 3A and Supplementary Table. 4). The SCZ GWAS p-value for this SNP was p = 2.61e-17 [99]. rs4766428 was identified as an

eQTL for ATP2A2 in postmortem hippocampus (Fig. 3A and Supplementary Table. 4). ATAC-seq showed peaks around rs4766428 in developing clNs but not developing GNs (Fig. 3B and Supplementary Table 5), suggesting it is located in an active open chromatin region specifically in clNs but not in GNs. As a reference, when compared with GNs and clNs in human fetal brains [30], our ATAC-seq peaks from iPSC-derived clNs showed a

**Fig. 1 SCZ GWAS loci DE genes converge onto PKC pathway in developing cINs. A** Scheme for analyzing SCZ GWAS loci DE genes in developing cINs. **B** Table of subjects analyzed in RNA-seq study and scheme for generating developing cINs from human iPSCs. HC refers to healthy control subjects and SCZ refers to people with SCZ. SRM: serum replacement media, LDN: 100 nM LDN193189, SB: 10  $\mu$ M SB431542, SAG: 0.1  $\mu$ M Smoothened agonist, and IWP2: 5  $\mu$ M Inhibitor of Wnt production-2. **C** SCZ GWAS loci genes that are differentially expressed in SCZ developing cINs. Genes that can modulate PKC activity was marked using \*. **D** Pathway analysis of SCZ GWAS loci DE genes in cINs. Left panel shows the % gene numbers among total SCZ risk loci DE genes and right panel shows enrichment test using Fisher's exact test in -logP format. **E** Schematic diagram showing the function of SCZ risk loci DE genes in modulating PKC activity. **F** RNA-seq analysis of HC sCZ cINs, showing dysregulation of PKC SCZ risk loci genes. Gene expression is shown as TPM, obtained from Kallisto. Differentially expressed genes, were analyzed by DESeq2 (Wald test for two-sided significance testing, *n* = 28 independent differentiations from 14 HC lines and 14 SCZ lines). Error bars are SEM. **G** qPCR analysis of PKC SCZ risk loci genes in cINs. Data were normalized by *GAPDH* expression and are presented as mean ± SEM. Two-tailed unpaired *t*-tests were used for analysis (*N* = 14 lines for HC and *n* = 14 lines for SCZ; Each data point is averaged from 2 independent differentiations, ATP2A2: *t* = 4.279, df = 26, DGKi: *t* = 2.316, df = 26, RGS6: *t* = 2.149, df = 26).



**Fig. 2 ATP2A2 and DGKI expression regulates PKC activity. A** KO of ATP2A2, DGKI or both analyzed by qPCR. Data were normalized by *GAPDH* expression and are presented as mean  $\pm$  SEM. Repeated measures One-way ANOVA was used for analysis (N = 3 batches), followed by Dunnett's multiple comparisons as a post hoc analysis. **B** Western blot analysis of control, ATP2A2 KO, DGKI KO or both KO clNs. Repeated measures one-way ANOVA was used for analysis (N = 6 lines), followed by Dunnett's multiple comparison as a post hoc analysis (N = 6 lines), followed by Dunnett's multiple comparison as a post hoc analysis of control, ATP2A2 KO, DGKI KO, or both KO clNs. Repeated measures one-way ANOVA was used for analysis (N = 6 lines), followed by Dunnett's multiple comparison as a post hoc analysis. **C** Arborization analysis of control, ATP2A2 KO, DGKI KO, both KO or both KO + Go6983-treated clNs. Left panel: Representative images of arborization analysis of clNs with or without KO (Scale bar = 50 µm). Right panel: quantification of neurite lengths as analyzed using Image J with the Neuron J plugin. Center and error bars show mean  $\pm$  SEM. Data were collected from 6 lines, each line with 10 neurons (N = 60 neurons). Two-Level Hierarchical Linear Mixed Effect Model after log-transformation was used for analysis of neurite length, followed by Dunnett's test as a post hoc analysis.



**Fig. 3 SCZ** risk loci regulate ATP2A2 expression. A ATP2A2 loci with fine mapped SCZ GWAS SNP marked by red dotted lines. GWAS *p*-value in -logP, fine mapping probability and eQTL *p*-value in -logP of this fine mapped SNP were marked by red dots. **B** ATAC-seq in loci surrounding fine mapped SCZ GWAS SNP in clNs shows open chromatin area compared to GNs. **C** ChIP-seq analysis in loci surrounding fine mapped SCZ GWAS SNP shows enhancer marks (overlap of H3K27ac peaks and H3K4me1 peaks). **D** CRISPRa and CRISPRi from SCZ risk loci modulate the expression of ATP2A2, as analyzed by qPCR. Data were normalized by *GAPDH* expression and are presented as mean±SEM. Two-tailed paired *t*-test was used for analysis (n = 8 lines; Each data point is averaged from 3 independent differentiations).

significantly higher level of overlap with fetal clN enhancers than fetal excitatory neuronal enhancers (Fisher's exact test, *p*-value <  $2.2e^{-16}$ , OR = 1.5, 95% Cl = 1.47–1.53), demonstrating their in vivo relevance. We further analyzed enhancer marks around this SNP by ChIP-seq and observed H3K4me1 peaks and H3K27Ac peaks at this locus (Fig. 3C), suggesting that this region may be involved in gene regulation. Consistent with this observation, Haploreg [100] search showed many enhancer epigenetic marks in rs4766428 in many different neural tissues as summarized in Supplementary Table 6. To test the impact of this locus in regulating ATP2A2 expression, we used CRISPRa and CRISPRi assays [101, 102]

(Fig. 3D). When infected along with ATP2A2 risk loci gRNA, CRISPRa significantly increased expression level of ATP2A2, whereas CRISPRi along with ATP2A2 risk loci gRNA significantly reduced ATP2A2 expression (Fig. 3D). These results suggest this fine-mapped locus in the second intron of the ATP2A2 gene is involved in the regulation of ATP2A2 expression.

# SCZ DE genes within SCZ GWAS loci converge onto lon transporter pathway in developing GNs

Since SCZ heritability is enriched both in GNs [30, 32] and cINs [29-31] during fetal development, we also sought to find converging SCZ GWAS loci DE gene pathways in developing GNs. To do this, we did RNA-seg analysis on HC vs SCZ developing GNs (Fig. 4A, B, Supplementary Figs. 5-8 and Supplementary Table 7). Immunocytochemistry and cell counting analyses demonstrated the highly homogeneous phenotype of generated GNs, as shown by high expression of relevant genes and low expression of nonrelevant markers (Supplementary Fig. 5). To further confirm functionalities of generated GNs, we transplanted ChR2-GFPexpressing GNs into the prefrontal cortex of Nod Scid Gamma (NSG) mice and analyzed them by electrophysiology. Whole-cell patch-clamp recordings were used to examine neuronal and synaptic properties of grafted human GNs. Nine months after transplantation, grafted cells were identified with green fluorescence in acute brain slices (GFP<sup>+</sup> cells). Grafted cells displayed passive membrane properties of glutamatergic neurons [resting membrane potential (RMP) =  $-75.1 \pm 5.1$  mV; membrane resistance ( $R_m$ ) =  $0.272 \pm 0.045 \text{ G}\Omega$ ; membrane capacitance ( $C_m$ ) = 109 ± 17 pF; average  $\pm$  SEM; n = 6 cells; Supplementary Fig. 6A]. When depolarizing voltage pulses were applied in voltage-clamp mode, all 7 grafted cells showed rapidly desensitizing inward currents and sustained outward currents (Supplementary Fig. 6B, C). This suggests the expression of voltage-gated  $\rm Na^+$  channels and  $\rm K^+$  channels in grafted cells. In current-clamp mode, the injection of depolarizing currents induced action potential (AP) firings in all recorded grafted cells with the AP threshold of  $-49.9 \pm 1.5 \text{ mV}$  and the afterhyperpolarization (AHP) of  $15.8 \pm 2.6$  mV (6 cells; Supplementary Fig. 6D, E). Moreover, all 6 grafted cells displayed spontaneous excitatory postsynaptic currents (sEPSC) at -85 mV in voltage-clamp mode (Fig. 4C top left panel), indicating that they received excitatory inputs from host glutamatergic neurons. Consistently, grafted human GNs contained dendritic spines, postsynaptic sites of excitatory synapses (Fig. 4C top right panel). We then applied blue light illumination to activate ChR2-GFP-expressing grafted cells for glutamate release, which induced excitatory synaptic responses in GFP<sup>-</sup> host neurons in the PFC (Fig. 4C bottom panels). Short pulses of blue light illumination induced excitatory postsynaptic currents (EPSC) in 3 out of 4 host pyramidal neurons at -85 mV in voltageclamp mode. These EPSCs were inhibited by NBQX, an AMPA receptor antagonist, indicating that they were mediated by excitatory neurotransmitter glutamate. Together, these results suggest neuronal properties of human glutamatergic neurons transplanted into the mouse PFC as well as functional synaptic integration of grafted cells into host PFC circuits. After the confirmation of their functionalities, we proceeded to RNA-seq analysis using generated GNs. RNA-seg analysis also confirmed high expression of relevant markers and low expression of non-relevant markers (Supplementary Fig. 8A). Principal component analysis of RNA-seq data showed developing GNs are well separated from developing cINs or iPSCs or fibroblasts, but there was no clear separation between HC GNs and SCZ GNs, as expected from overall mild SCZ phenotypes (Supplementary Fig. 7A). Pair-wise comparison of RNA-seq samples showed high similarity among samples with r<sup>2</sup> > 0.96, suggesting reliable generation of homogeneous populations of developing GNs (Supplementary Fig. 7B). HC GNs and SCZ GNs were highly similar in the pairwise comparison (Supplementary Fig. 7B), again confirming the overall mild phenotype of SCZ GNs. We identified 29 SCZ glutamatergic neuron DE genes within SCZ GWAS loci (Fig. 4D, Supplementary Fig. 7C and Supplementary Table 7). Pathway analysis of these SCZ GWAS loci DE genes using g: Profiler showed that they are enriched for ion channel pathway genes (Fig. 4D, E). Fisher exact analysis p-value for ion channel pathway in GNs was 0.000104 (Supplementary Fig. 8B) whereas that for PKC pathway in GNs was 0.999999, displaying cell type-specific pathway enrichment. On the other hand, Fisher's exact analysis p-value for ion channel pathway in cINs were 0.338145. Among the 6 genes associated with the ion channel pathway, NDUFA4L2 is a mitochondrial electron transport protein, whereas all the others are expressed in the cellular membrane [103, 104], with the possibility of regulating cellular membrane properties of neurons, leading us to focus on these 5 cellular membrane proteins. All 5 ion channel pathway DE genes were downregulated in SCZ developing GNs (Fig. 4F), which was also confirmed by qPCR using 7 HC vs 7 SCZ lines (Fig. 4G). All of SCZ GWAS loci DE genes in developing GNs were not dysregulated in developing cINs nor were SCZ GWAS loci DE genes in developing cINs dysregulated in developing GNs (Supplementary Fig. 9), suggesting the importance to study cell type-specific genetic influence on gene expression. By and large, these results show SCZ risk loci DE genes converge onto ion channel pathway in developing GNs, unlike in the case of developing cINs.

# Functional impact of Ion transporter pathway SCZ risk loci DE gene dysregulation in developing GNs

To understand the functional consequence of ion channel pathway dysregulation in developing GNs, we knocked out CACNA1D within the SCZ risk locus with the most significant SCZ associations among the 5 pathway genes (Fig. 5A and Supplementary Fig. 2C) and analyzed its impact on developing GNs by patch clamp analysis in vitro. KO of CACNA1D resulted in significant decrease of total Ca<sup>2+</sup> currents in developing GNs (Fig. 5B-D and Supplementary Fig. 10D). Significant decrease of total Ca<sup>2+</sup> currents was consistent when analyzed in HC lines and SCZ lines separately (Supplementary Fig. 10A) or analyzed using averages of each line (Supplementary Fig. 10C). We also observed significant decrease in high voltageactivated Ca<sup>2+</sup> currents (Fig. 5D, E and Supplementary Fig. 10), consistent with those that are mediated L-type channels, which are located postsynaptically and involved in regulating neuronal excitability [105]. We also confirmed high voltage-activated Ca<sup>2+</sup> current can be blocked with Nifedipine, a specific L-type Ca2+ channel blocker (Supplementary Fig. 10B). Considering the function of CACNA1D in regulating synaptic plasticity [106, 107], this result suggests suboptimal expression of ion channel genes may result in functional deficits in these neurons. In addition to CACNA1D, two additional GN DE genes identified within SCZ GWAS loci, P2RX4 and P2RX7, are both ATP-dependent cation channels and have preferences for  $Ca^{2+}$ , suggesting the dysregulation of multiple genes that regulate Ca<sup>2+</sup> transport in SCZ developing GNs. This may impact Ca<sup>2+</sup>influx in SCZ developing GNs compared to HC developing GNs. Patch clamp analysis showed that there is a significant decrease of total Ca<sup>2+</sup> currents as well as high voltage-activated Ca<sup>2+</sup> currents in SCZ developing GNs compared to HC GNs (Fig. 5E), which suggests functional deficits produced by converging ion channel pathway genes in SCZ GNs. Overall, this study provides novel mechanistic insights into how the influence of SCZ risk loci converges and alters early neurodevelopmental



processes in human cINs and GNs, which were largely unknown previously.

## DISCUSSION

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In this study, we identified converging pathways of SCZ GWAS loci DE genes and observed distinct pathways are affected in cell typespecific manners. Most studies on genetic influences on gene expression have been done using postmortem brain tissues, that are not only confounded by effects from age, illness and treatment but are also composed of quite heterogeneous cell populations and thus unable to reveal the impacts on specific minority populations like clNs. Furthermore, considering genetic influence on gene expression is not only cell type-specific but also **Fig. 4 SCZ GWAS loci DE genes converge onto ion transporter pathway in developing glutamatergic neurons. A** Scheme for analyzing GCZ GWAS loci DE genes in developing glutamatergic neurons. **B** Table of subjects analyzed in RNA-seq study and scheme for generating developing glutamatergic neurons from human iPSCs. **C** Electrophysiological analysis of developing GNs. Top left panel: ChR2-GFP<sup>+</sup> grafted cells receive synaptic inputs from host glutamatergic neurons as recorded in acute brain slices. A representative trace of postsynaptic responses recorded in a GFP<sup>+</sup> grafted cell at -85 mV in voltage-clamp mode. sEPSC trace marked with a dotted square box was magnified in the bottom trace. Top right panel: Confocal microscopic images showing dendrites of ChR2-GFP<sup>+</sup> grafted cells. A dotted area is magnified in the right image, showing dendritic spines. Bottom left panel: blue light illumination induced glutamate release at axon terminals, generating excitatory postsynaptic responses recorded in GFP<sup>-</sup> host neurons (inset). Bottom right panel, representative traces of excitatory postsynaptic currents (EPSC) evoked by photostimulation and recorded in a GFP<sup>-</sup> host neuron. Postsynaptic responses were recorded at -85 mV in voltage-clamp mode (gray and black traces) and induced by photostimulations (36.1 mW/mm<sup>2</sup>, 10 ms duration, blue horizontal line). These EPSCs were blocked inhibited by NBQX (10  $\mu$ M) in the same neuron (blue traces). **D** SCZ GWAS loci DE genes in GNs analyzed by g:Profiler [137]. **F** RNA-seq analysis of HC vs SCZ glutamatergic neurons, showing dysregulation of ion channel pathways mas marked using \*. **E** Pathway analysis of SCZ GWAS loci DE genes in GNs. Data were normalized by *GAPDH* expression and are presented as mean ± SEM. Two-tailed unpaired *t*-test was used for analysis (N = 7 lines).

developmental stage-specific with enriched heritability in the fetal brain [7-10], the fetal tissue-specific influences may not be easily assessed. Recently, there have been studies using fetal brain transcriptomic data to understand genetic influences on expression [87, 91, 108], and this has allowed for identification of fetal stage-specific eQTLs. Still fetal brain tissue is not likely to provide insights into the mechanisms in minor, yet critical, populations like developing cINs. To address these gaps, we have utilized iPSCderived homogeneous populations of developing cINs and GNs and identified SCZ GWAS loci genes that are dysregulated in these cells along with the pathways onto which they converge. This strategy gives the first insights on genetic influences in specific fetal cell populations with enriched SCZ heritability. Though eQTL analysis shows correlation between risk alleles and gene expression levels, it doesn't allow us to determine which genes will be actually significantly dysregulated in disease genetic backgrounds. iPSC-derived fetal neural populations of HC compared to SCZ individuals provide such an opportunity, allowing for the analysis of the actual genes with sufficient effect size to show up as DE in disease samples during development. The observation that tissuespecific eQTLs have greater impact size than general eQTLs [91] also stresses the importance of using specific and homogeneous cell populations to identify these cell type-specific genetic influence with greater impact. Furthermore, these homogeneous developing cell populations also provide a disease-relevant model system where we can perturb the candidate gene expression to assess the functional consequences of disease-relevant gene perturbations.

In this study, we have used bulk analysis of homogeneous culture rather than single cell analysis approaches for cell type-specific studies. Single cell (sc) RNA-seg or scATAC-seg allow us to analyze specific cell types in the mixed cultures but it also has shortcomings that require further development down the road. scRNA-seq usually contains non-zero values for 10-50% expressed genes and low abundance genes can be under-represented [109, 110]. Also, recent studies showed confounder introduced by trypsinization during scRNA-seq sample preparation [111]. Similarly, scATAC-seq shows inherently sparse count matrices with each cell usually sampling only 2-3% peaks out of all peaks accessible in a given cell type [112, 113]. Although there are new bioinformatics methods to mitigate the issue of high noise and sparsity [114, 115], it still remains an area of active development. Thus, single cell analysis approaches and bulk analysis of homogeneous population, as employed in this study, can complement each other. Furthermore, monoculture system provides the opportunity to study cell-intrinsic regulation in the absence of any cell non-autonomous impact. Once cell-intrinsic regulations are identified, we can systematically add specific cell types as a co-culture to analyze specific non-cell autonomous regulations. In addition, in this study, we used the KO approach to address the question of whether the dysregulation of SCZ risk loci DE genes indeed affects functionality of developing cINs or developing GNs, with the purpose of obtaining clearer answers with a stronger impact. This KO approach is not exactly the same as in vivo situations where many genes with smaller impacts converge onto specific pathways; however, we were aiming to mimic functional consequences of converging pathway deficits from 'the dysregulation of many genes with smaller impacts' with pathway deficits from 'the dysregulation of one gene with a larger impact'.

We observed that SCZ GWAS loci genes converge onto the PKC pathway in developing cINs. PKC is a family of serine/threonine kinases that are activated by DAG and Ca2+ and phosphorylate downstream substrate proteins [116]. In the brain, they regulate various neuronal functions such as arborization, neuronal excitability, neurotransmitter release, ion channels, growth and differentiation, apoptosis, and neuronal plasticity [117]. As expected from their critical roles in normal brain function, their dvsregulation, especially their hyperactivity, has been associated with various neurodegenerative disorders [68-71], with some of the deficits reversed by PKC inhibitor treatment [83]. In addition to neurodegenerative disorders, PKC dysregulation has also been observed in psychiatric disorders. Increased PKC expression was reported in bipolar disorders (BD), which was normalized by medications that treat BD such as lithium and valproic acids [72]. Furthermore, PKC inhibitors were successfully used to treat acute mania in bipolar disorders in multiple small scale clinical trials [73-75]. PKC hyperactivity in the prefrontal cortex has been linked to aging- or stress-related working memory deficits, which were reversed by PKC inhibitor treatment [76-78]. These results point to the importance of maintaining proper PKC regulation for normal brain development and function. Various PKC isoforms were shown to regulate the actin cytoskeleton, [118] and thus, overactivation of PKCs results in spine loss and altered spine morphology in vitro [79]. In AD, increased phosphorylation was observed in PKC substrates [80], and abnormal spine formation in AD model mice was reversed by PKC inhibition [81]. PCDHG conditional knockout mice, which exhibit PKC hyperactivity, displayed increased PKC substrate phosphorylation accompanied by severely reduced arborization in cortical neurons, which is reversed by PKC inhibition [82]. PKC hyperactivity has also been shown to be associated with decreased length of basal dendrites of prefrontal cortical neurons and compromised working memory performance in aged rats. Both are reversed by PKC inhibitor treatment [77]. More recently, we have observed dysregulation of various PCDHA and PCDHG family members in SCZ clNs, accompanied by compromised arborization in these neurons that was reversed by PKC inhibitor GO6893 [49]. Recently, PKC activation was shown to reduce synaptic strength via cleavage of neuroligins [119], that hold the synaptic structure together. Taken together, these results all point to the role of a converging SCZ risk loci DE gene pathway in maintaining normal neuronal function.



**Fig. 5 CACNA1D dysregulation impairs Ca<sup>2+</sup> currents in developing glutamatergic neurons. A** CACNA1D KO in developing GNs, analyzed by qPCR. Data were normalized by *GAPDH* expression and are presented as mean  $\pm$  SEM. Repeated measures one-way ANOVA was used for analysis (N = 4 batches), followed by Dunnett's multiple comparisons as a post hoc analysis. **B** Representative image of patched clNs. Scale bar = 10 µm. **C** Illustration of voltage scheme used to analyze total Ca<sup>2+</sup> currents and high voltage-activated Ca<sup>2+</sup> currents. **D** CACNA1D KO in developing GNs dysregulate total Ca<sup>2+</sup> currents and high voltage-activated Ca<sup>2+</sup> currents. **D** CACNA1D KO in developing GNs dysregulate total Ca<sup>2+</sup> currents and high voltage-activated Ca<sup>2+</sup> currents, as analyzed by patch clamp recording in vitro. Two-Level Hierarchical Linear Mixed Effect Model after log transformation was used for analysis (n = 47 cells from 6 Lines for Cas9 group and n = 42 cells from 6 lines). **E** SCZ GNs show compromised total Ca<sup>2+</sup> currents and high voltage-activated Ca<sup>2+</sup> currents, as analyzed by patch clamp recording in vitro. Two-tailed unpaired Kolmogorov–Smirnov test was used for analysis (n = 26 cells for HC and n = 21 cells for SCZ).

On the other hand, SCZ GWAS loci DE genes converge onto ion channel pathways in developing GNs. CACNA1D is an L-type voltage-dependent Ca<sup>2+</sup> channel that plays important roles in neuronal development, neuronal firing and synaptic plasticity [120] and thus its dysregulation was associated with various psychiatric disorders such as ASD, SCZ, BD and intellectual disability [120, 121]. CACNA1D KO results in decreased neuronal survival, decreased neurite outgrowth [122], impaired neurogenesis [123] and decreased firing frequency [124], depending on the cell types affected, resulting in cognitive deficits in these animals [122, 123]. Thus, it is conceivable that dysregulation of CACNA1D and thus defects in Ca<sup>2+</sup> influx in GNs during development could result in dysfunctional neuronal development. In addition to CACNA1D, P2RX4 and P2RX7 are also involved in Ca<sup>2+</sup> transport. P2RX7 is an ATP binding Ca<sup>2+</sup> channel that is expressed at the presynaptic terminal, and is known to regulate synaptic transmission [125] and regulate axonal growth [126]. P2RX4 has also been shown to regulate  $Ca^{2+}$  influx [127, 128]. P2RX4 KO resulted in reduced long-term potentiation (LTP), indicating its role in synaptic plasticity [129]. Regulation of  $Ca^{2+}$  influx overall plays a critical role in neuronal development and function such as dendritic growth and dendritic spine formation [130], neuronal migration [131, 132], transcriptional regulation [133], synaptic plasticity [134] and neuronal survival/degeneration [135, 136]. Thus it is conceivable that suboptimal Ca<sup>2+</sup> transport by converging SCZ GWAS loci DE genes in developing GNs would compromise their normal development and function.

In summary, we have shown converging influences of SCZ GWAS loci in specific developing cell types with enriched SCZ heritability. In the next phase of our study, this study can be expanded to other specific cell types with enriched SCZ heritability such as microglia [29]. Further understanding of tissue-specific, developmental stage-specific mechanism of SCZ GWAS loci function, either by bulk analysis of homogeneous cell types or single cell analysis approaches of mixed cells, or both, will aid the effort to identify novel therapeutic targets even preventive ones, based on neurobiological understanding of disease pathogenesis mechanism.

#### MATERIAL AND METHODS Differentiation of iPSCs

Generation of iPSCs were described in our previous publications [49, 59]. Male SCZ patient samples with age from 21-51 years old as well as age and gender-matched HC samples were used in this study as summarized in Figs. 1, 4, Supplementary Tables 7 and 8. Human fibroblasts were obtained from the laboratories of Dr. Bruce Cohen (McLean Hospital), Dr. Daniel Weinberger (Lieber Institute for Brain Development), and Dr. Judith Rapoport (National Institute of Mental Health). These study protocols were approved by the McLean Hospital/Partners Healthcare Institutional Review Board (IRB) and New York Medical College IRB. All procedures were performed in accordance with IRB's guidelines and all human samples were obtained with informed consents. We have complied with all relevant ethical regulations. All non-McLean cohorts of iPSCs have been deposited to the NRGR biorepository. McLean cohorts of iPSCs will be available upon approval from the McLean Hospital/Partners Healthcare IRB. iPSC lines were validated by immunocytochemistry in our previous study [49]. All cell lines are routinely tested for mycoplasma contamination. Cell lines used in this study were verified to be mycoplasma negative before undertaking any experiment with them.

Thawed human iPSCs were maintained on Matrigel (BD, San Hose, CA) coated plates with Essential 8 (E8) media (Invitrogen, Carlsbad, CA). For differentiation, iPSCs were trypsinized and grown as floating spheres in low adherent flasks in KSR media (DMEM, 15% knockout serum replacement, 2 mM L-glutamine and 10  $\mu$ M  $\beta$ -mercaptoethanol (all from Invitrogen) from day 0 to day 14. For neuroectoderm induction, cells were treated with LDN193189 (100 nM, Stemgent, Cambridge, MA) from day 0 to day 14 and SB431542 (10  $\mu$ M, Tocris Cookson, Ellisville, MO) from day 0 to day 7. For MGE phenotype induction, media was supplemented with IWP2 (5  $\mu$ M, EMD Millipore, Billerica, MA) from day 0 to day 7 and SAG (0.1  $\mu$ M, EMD

Millipore) from d0 to d21. From day 14, cells were grown in N2AA media (DMEM-F12 with N2-supplement (1:200, Invitrogen) and 200 µM ascorbic acid (AA, Sigma, St. Louis, MO). FGF8 (100 ng/ml, Peprotech, Rocky Hill, NJ) was added from day 14 to day 21 to induce the MGE phenotype at the expense of the CGE phenotype [50]. N2AA media was supplemented with 10 ng/ml glial cell derived neurotrophic factor (GDNF, Peprotech) and 10 ng/ml brain derived neurotrophic factor (GDNF, Peprotech) from day 21. After 8 weeks of differentiation, clN spheres were trypsinized in the presence of 0.1M trehalose (Sigma) and then plated on polyornithine (PLO; 15 mg/ml; Sigma)- and fibronectin (FN; 1 mg/ml; Sigma)-coated plates in B27GB media (DMEM-F12 media with B27 supplement (1:100, Invitrogen), 10 ng/ml GDNF and 10 ng/ml BDNF).

For Glutamatergic neuron differentiation, iPSCs were trypsinized and grown as floating spheres in low adherent flasks in Neuronal induction media (DMEM-F12 with 15% knockout serum replacement, 1% MEM-NEAA, 100  $\mu$ M  $\beta$ -mercaptoethanol (all from Invitrogen),100 nM LDN193189 (Stemgent), 10  $\mu$ M SB431542 (Tocris Cookson) and 2  $\mu$ M IWP2 (ApexBio)) from day 0 to day 10. From day 11, cells were grown in Neuronal differentiation media (DMEM-F12 with 0.25% N2, 0.5% MEM-NEAA, 50  $\mu$ M  $\beta$ -mercaptoethanol (all from Invitrogen) and N21 MAX (R&D systems, Minneapolis, MN), until the spheres were trypsinized in the presence of 0.1M trehalose (Sigma) and plated on PLO/FN-coated plates in B27GB media after 8 weeks' differentiation for analysis.

## Subcloning to generate lentiviral vectors

Oligonucleotides to generate lentiviral (LV) vectors that express KO guide RNAs (gRNAs) as described in Supplementary Table 9 were synthesized by Thermo Fisher Scientific (Thermo Fisher, Waltham, MA, USA), and subcloned into lentiCRISPR v2 plasmid, a gift from Feng Zhang (Addgene plasmid # 52961), to obtain KO LV vectors (pLenti-U6 promoter-KO gRNA-EF1a-Cas9-P2A-Puro). For CRISPRi/CRSPRa assays, the gRNA in ATP2A2 SCZ GWAS loci was selected using BE-Designer tool (http://www.rgenome.net/be-designer/). The synthesized oligonucleotides for gRNA were subcloned into LentiGuide-Crimson plasmid (Addgene plasmid #217910) to obtain ATP2A2 SCZ GWAS loci gRNA plasmid (pLenti-U6 promoter-ATP2A2 gRNA-EF1a-Crimson).

### Lentivirus package and infection

The 2nd generation lentiviral packaging plasmid (psPAX2, Addgene plasmid # 12260) and VSV-G envelope expressing plasmid (pMD2.G, Addgene plasmid # 12259), gifts from Didier Trono, were used to package the LV. These two packaging plasmids along with LV backbone plasmids were transfected to Lenti-HEK293T cells with polyethylenimine (PEI, Polyscience, Warrington, PA). Supernatants containing LVs were collected and concentrated using Lenti-X<sup>TM</sup> Concentrator (TaKaRa, San Jose, CA) according to the manufacturer's instruction. Aliquots of the concentrated LVs were kept at -80 degree for later use.

For ATP2A2, DGKi or CACNA1D KOs, neurons were infected with LVs (MOI = 10) expressing Cas9 and KO gRNA (pLenti-U6 promoter-KO gRNA-EF1 $\alpha$ -Cas9-P2A-Puro). After 24 hours' infection, puromycin (1 µg/ml, InvivoGen, San Diego, CA) was added to the culture for one week to remove non-infected cells. Cells infected with LVs that express Cas9 only (pLenti-U6 promoter-EF1 $\alpha$ -Cas9-P2A-Puro) were used as a negative control.

For the ATP2A2 CRISPRi/CRSPRa assay [138], cINs were infected with LVs expressing dCas9-VPR or dCas9-KRAB fusion proteins (lenti-EF1a-dCas9-VPR-Puro or lenti-EF1a-dCas9-KRAB-Puro) along with LVs expressing ATP2A2 SCZ GWAS loci gRNA (pLenti-U6-ATP2A2 gRNA-EF1a-Crimson). Puromycin was added to the culture for a week to select infected cells. Survived cells were also confirmed for Crimson expression. Lenti-EF1a-dCas9-VPR-Puro (Addgene plasmid # 99372) were gifts from Kristen Brennand.

### **RNA purification and qPCR analysis**

RNA samples were isolated using a TRIzol-reagent (Invitrogen) and 300 ng of the total RNA was used for cDNA synthesis using the Oligo(dT)<sub>12-18</sub> primer (Gene Link, Hawthorne, NY), Recombinant RNAse Inhibitor (Takara, Japan), 0.5 mM dNTP mix (Thermo Scientific), 5 mM DTT (Invitrogen), RevertAid H minus RT (Thermo Scientific), and 5X Reaction Buffer (Thermo Scientific) in SimpliAmp<sup>TM</sup> Thermal Cycler (Applied Biosystems, Waltham, MA). The real time PCRs were performed using the QuantStudio 3 Real-Time PCR System (ThermoFisher), with 40 cycles of denaturation (95 °C for 15 s), annealing (55 °C for 30 s), and extension (72 °C for 30 s). Primer sequences are listed in Supplementary Table 9.

#### RNA-seq analysis

For RNA-seq, RNA quality was examined by the 2100 Bioanalyzer or 4200 TapeStation (Agilent Technologies, Santa Clara, CA) and RNA concentration was determined using the Qubit Fluorometric Quantitation (Thermo Fisher). Stranded cDNA libraries were prepared using the TruSeq Stranded LT mRNA kit (Illumina, San Diego, CA) in accordance with the manufacturer's protocol using the poly-adenylated RNA isolation. Sequencing of paired-end reads (75 bp  $\times$  2) was performed on the NextSeq 550 system. Raw sequence reads were de-multiplexed and trimmed for adapters by using the Illumina bcl2fastq conversion software (v2.19). Sequence reads of each sample were pseudo-aligned to the human hg38 reference transcriptome and the gene transcript abundances were quantified by using Kallisto (v.0.46.1). Differential expression of genes and transcripts were achieved by using DESeg2 (v.1.26.0) in R Studio packages (v.1.2.1335 with R v.3.6.1) with a cut off criteria of adj p < 0.01. The Kallisto-Sleuth and Kallisto-DESeq2 workflows are based upon a previous publication [139]. For quantification, we used TPM (Transcripts Per Kilobase Million) as a measure of transcript abundance. For pair-wise comparisons, Pearson correlation was conducted in R Studio with DESeq2 normalized results. Pathways used for enrichment analysis by Fisher's exact test is summarized in Supplementary Tables 1 and 11. Pathway analysis of SCZ GWAS DE genes in GNs were done using g:Profiler portal (https://biit. cs.ut.ee/gprofiler/gost). The RNA-seq data were deposited at the NCBI Gene Expression Omnibus (GEO; https://www.ncbi.nlm.nih.gov/geo/) and the accession numbers are GSE121376 for cINs and GSE184102 for GNs.

#### Western blot

cINs infected with ATP2A2 or DGKI KO LVs were washed twice with ice-cold PBS and lysed with RIPA buffer (Thermo Fisher) containing protease inhibitor cocktail (bimake, Houston, TX) and phosphatase inhibitor cocktail (Santa Cruz Biotechnology, Dallas, TX). Protein concentration of cell lysate was determined by BCA protein assay kit (Thermo Fisher). The samples were run on 10% Precast Polyacrylamide Gels (Bio-rad, Hercules, CA) and then transferred to PVDF membrane (EMD Millipore). The PVDF membrane was blocked with 5% BSA (Cat#9048-46-8, Research Products International, Mount Prospect, IL) and incubated with antibody recognizing Phospho-PKC substrate (1:3000, Cell Signal Technology) and GAPDH (1:5000, Santa Cruz), respectively, at 4 °C overnight, followed by incubation with HRPconjugated secondary antibody (1:10000, Vector) for 1 hour at room temperature. Detection was done using Super Signal West Pico Chemiluminescent Substrate (Pierce) and IBright FL1500 Imaging System (Thermo Fisher). Band intensities were quantified using Image J software (Version 1.51p, NIH, Bethesda, MD).

#### Immunocytochemistry/Cell counting/Arborization analysis

cINs and GNs on coverslips were fixed using 4% paraformaldehyde (PFA, Electron Microscopy Sciences, Hatfield, PA) for 10 min, washed with PBS and used for staining. The brain sections perfused with 4% formaldehyde and cryoprotected in the 30% sucrose (Thermo Fisher) overnight at 4°C were cryosectioned at 40 µm using a Leica CM1850 cryostat (Leica Biosystem, Buffalo Grove, IL, USA). Fixed cells or brain sections were incubated with blocking/permeabilization buffer (PBS with 10% normal serum and 0.1% Triton X-100) for 10 min. The samples were then incubated in primary antibodies in antibody dilution buffer (PBS containing 2% normal serum) overnight at 4 °C. The detailed information of the antibodies used are as follows; GAD1 (sc7512, 1:1,000, Santa Cruz), SOX6 (AB5805, 1:1,000, Millipore, validated in ref. [49]), VGLUT1 (AB5905, 1:1,000, Millipore), GABA (A0310, 1:1,000, Sigma), b-Tubulin III (560381, 1:1,000, BD Bioscience), OLIG2 (AB9610, 1:1,000, Millipore, validated in ref. [49]), GFAP (73240, 1:1,000, UC Davis/NIH NeuroMab), CHAT (AB153, 1:1,000, Chemicon, validated in ref. [49]), TH (P40101-150, 1:1,000, Pel-Freez, validated in ref. [49]) and VIP (20077, 1:1,000, IMMUNOSTAR, validated in ref. [49]) as listed in Supplementary Table 10. After washing with PBS, cells were incubated with fluorescently labeled secondary antibodies and DAPI (Invitrogen) in antibody dilution buffer for 1 h at room temperature. Following the PBS wash, the samples were mounted with Fluoromount-G (SouthernBiotech, Birmingham, AL, USA). Fluorescent images were taken by the EVOS FL Auto microscope (Life Technologies, Carlsbad, CA) and Leica SPE Confocal Laser Scanning Microscopes (Leica microsystems, Wetzlar, Germany).

For cell counting analysis, Image J software (Version 1.51p, NIH, Bethesda, MD) was used to count the cell number using the multi point function. The experimenters were blind to the sample ID during data collection. Percentages of cells positive for each marker were quantified in relation to DAPI-stained nuclei from three independent differentiations, with a total of at least 500 cells counted for each line.

For arborization analysis, cINs plated onto the PLO/FN-coated coverslips were infected with a limiting titer (MOI = 0.001) of LV-UbiC-GFP virus [140] to label cells only scarcely, in addition to the KO LVs described above. After one week's selection in Puromycin to remove non-infected cells, the images of GFP<sup>+</sup> cells were collected by the EVOS microscope. The arborization of each GFP<sup>+</sup> cell was analyzed using Image J software with the Neuron J plugin to get parameters of total neurite lengths.

### ATAC-seq analysis

Library generation and sequencing. ATAC-seq reactions were performed using an established protocol [141] with minor modifications. Media was removed and replaced with 200 µl of 1X Trypsin and 100 mM trehalose. Tubes were incubated at 37 °C for 10 min, after which dissociation was performed by gentle pipetting. Trypsin was neutralized by the addition of 200 µl DMEM +10% FBS containing 0.5 µl turbo DNase and samples incubated for an additional 20 min at 37 °C. Cells were then centrifuged at  $300 \times g$  for 10 min at 4 °C and pellets resuspended in 250 µl PBS + 5% BSA. DAPI (Thermo Fisher) was added to the cells and viable (DAPI-) cells sorted on a FACSAria flow cytometer (BD Biosciences). Following FACS, cell concentrations and viability were confirmed using a Countess automated cell counter (Life technologies) and, where available, 75,000 cells were carried forward for the ATAC-seq reactions. Cells were centrifuged at 300 imesg for 10 min at 4 °C and, following removal of the supernatant, pellets were resuspended in lysis buffer (10 mM Tris-Cl pH7.4, 10 mM NaCl, 3 mM MgCl, 0.1% IGEPAL CA630) by pipetting 20 times. Following resuspension, samples were centrifuged at  $500 \times q$  for 10 min at 4 °C. Pellets were resuspended in transposase reaction mix (25  $\mu$ L 2 $\times$  TD Buffer (Illumina Cat #FC-121-1030) 2.5 µL Tn5 Transposase (Illumina Cat #FC-121-1030) and 22.5 µL Nuclease Free H<sub>2</sub>O) on ice. Reactions were incubated at 37 °C for 30 min before being purified using the MinElute Reaction Cleanup kit (Qiagen Cat #28204). Following purification, library fragments were amplified using the Nextera index kit (Illumina Cat #FC-121-1011) as previously described [141]. Library quality was assessed on a Tapestation instrument using D5000 ScreenTapes (Agilent technologies Cat# 5067-5588). Following amplification, libraries were resolved on 2% agarose gels and fragments ranging in size from 100 to 1000 bp were excised and purified (Qiagen Minelute Gel Extraction Kit – Qiagen Cat#28604). Before sequencing, library fragment sizes estimated using Tapestation D5000 ScreenTapes (Agilent technologies Cat# 5067-5588) and libraries guantified by quantitative PCR (KAPA Biosystems Cat#KK4873). Finally, libraries were sequenced on the NovaSeq6000 platform (Illumina) obtaining 2×50 paired-end reads.

*Read mapping.* Raw sequencing paired-end files were aligned by STAR (v2.7.0.e) (Dobin et al. 2013) to the hg38 reference genome with the pseudoautosomal region masked on chromosome Y using the following parameters: -alignIntronMax 1 -out FilterMismatchNmax 100 -alignEnd-sType EndToEnd -out FilterScoreMinOverLread 0.3 -out FilterMatchNminOverLread 0.3. This yielded for each sample a BAM file of mapped paired-end reads sorted by genomic coordinates. From these BAM-files, we removed reads that were mapped to multiple loci or to the mitochondrial genome using samtools (v0.1.19) [142] as well as the duplicated reads coverage files (bedGraph) were generated by genomeCoverageBed from BEDTools (v2.25.0) (Quinlan and Hall 2010) and converted to the indexed binary format files (bigWig) using bedGraphToBigWig.

*Quality control.* To perform quality control, we collected the following metrics for all samples: the total number of initial reads; the number of uniquely mapped reads; the fraction of reads that were uniquely mapped; further mappability-related metrics from the STAR aligner; GC content, insert and duplication metrics from Picard; the rate of reads mapping to the mitochondrial genome; the PCR bottleneck coefficient (PBC), which approximates library complexity as uniquely mapped non-redundant reads divided by the number uniquely mapped reads; the relative strand cross-correlation coefficient (RSC) and the normalized strand cross-correlation coefficient (RSC), which are metrics that use cross-correlation of stranded read density profiles to evaluate the sample quality independently of peak calling; and, finally, the fraction of reads in peaks (FRiP), which is the fraction of reads that fall in peaks. To calculate FRiP, we called peaks for each BAM file with MACS2 [143] using the following parameters: -keep-dup

all -shift -100 -extsize 200 -nomodel. Then, per-sample peaks were merged across all samples, retaining only peaks found in at least 2 samples. Subsequently, we used featureCounts from Rsubread package to calculate the fraction of reads that overlap consensus peaks. The main quality metrics are provided in Supplementary Table 5. All samples exceeded our quality controls thresholds, i.e., having more than 5 million paired-end reads (mean = 38.4 million, min = 16.8 million), mappability over 50% (mean = 83.2%, min = 50.5%), and FRiP over 5% (mean = 26.2%, min = 9.0%).

To compare regulatory landscape of iPSC-derived cINs within in vivo cell types, we compared ATAC-seq peaks of iPSC-derived cINs with ATAC-seq peaks from GNs and cINs sorted from the fetal cortex [30]. We used the findOverlap function in the GenomicRanges package to overlap iPSC-derived cIN ATAC-seq peaks with fetal excitatory and inhibitory neuronal ATAC-seq peaks. We then compared the proportion of fetal inhibitory neuronal peaks that overlap with cIN peaks with the proportion of fetal excitatory neuronal peaks that overlap with cIN peaks using a Fisher's exact test.

Those samples were visually inspected in IGV. The data from this study have been submitted to the NCBI Gene Expression Omnibus (GEO; https://www.ncbi.nlm.nih.gov/geo/) under accession number GSE184165.

#### **ChIP-seq analysis**

 $5 \times 10^{6}$  clNs were used for ChIP experiment using the Pierce Magnetic ChIP Kit (Cat #26157, Thermo Fisher) according to the manufacturer's instruction. In brief, cells were fixed in 1% formaldehyde at room temperature for 15 min, followed by addition of Glycine. After 5 minutes' incubation at room temperature, cells were washed twice with ice-cold PBS. Cells were scraped in ice-cold PBS supplemented with protease inhibitor cocktail, followed by centrifugation and resuspension in extraction buffer to lyse the cell membrane and collect nuclei. After centrifugation, obtained nuclei were resuspended with MNase digestion buffer and incubated in a 37 °C water bath for 15 min. After centrifugation, nuclei were resuspended with immunoprecipitation buffer containing protease inhibitors and phosphatase inhibitors. After sonication on ice, samples were incubated with either anti-H3K4me1 (Cat #710795, Thermo Fisher) or Anti- H3K27Ac antibody (ab4729, Abcam) overnight at 4 °C with rotation. The next day, magnetic beads were added to each sample and incubated for 2 h at 4 °C. After washing three times, DNAs were recovered in elution solution.

The purified DNAs were converted to small fragments using the NEBNext Ultra II FS Enzyme Mix (NEBNext Ultra II FS DNA library Prep Kit, New England Biolabs) at 37 °C for 10 min and 65 °C for 30 min. The target DNA with biotin labeling was pulled down using Streptavidin Dynabeads M270 (Invitrogen), washed once with Tween buffer (5 mM Tris-HCl, pH 8, 0.5 mM EDTA, 1M NaCl, 0.05% Tween-20) and three times with no-Tween buffer. The biotin-labeled DNA was then ligated to an adaptor with index (TruSeg Stranded Total RNA Kit, Illumina) at 20 °C for 15 min, washed twice with the no-Tween buffer, and PCR amplified (98 °C 30 s; 15 cycles of 98 °C 10 s, 60 °C 30 s and 72 °C 30 s; and at final 72 °C 5 min). The PCR product was purified with 0.8 volume of AMPure XP beads (Beckman Coulter), quantified with Qubit 2.0 fluorometer (Invitrogen), and loaded onto NextSeq 550 (Illumina) with its High Output reagents for 75 bp × 2 pairedend sequencing. The fastg files obtained from sequencing were aligned/ mapped to the human reference genome GRCh38 using Bowtie2 [144], and further subjected to peak calling using MACS2 [145]. ChIP-seq data was submitted to the NCBI Gene Expression Omnibus (GEO; https://www. ncbi.nlm.nih.gov/geo/) with the accession number GSE186738.

#### Whole-cell patch-clamp recording in brain slices

HC iPSC L9-derived developing GNs infected with ChR2-GFP expressing lentivirus (Addgene #20945) were transplanted into prefrontal cortex of NSG mice at the following coordinate (AP: +1.9 mm, L: +0.4 mm, V:1.2). Nine months post transplantation, the neuronal and synaptic properties of human GNs were examined with whole-cell patch-clamp recording in brain slices. Acute brain slices containing the PFC were prepared using a vibrating microtome. After recovery, brain slices were placed in the recording chamber and continuously perfused at the rate of 1 mL per minute with the artificial cerebrospinal fluid (130 mM NaCl, 2.5 mM KCl, 2.5 mM CaCl<sub>2</sub>, 1 mM MgSO<sub>4</sub>, 1.25 mM NaH<sub>2</sub>PO<sub>4</sub>, 26 mM NaHCO<sub>3</sub>, and 10 mM glucose with 95% O<sub>2</sub> and 5% CO<sub>2</sub>). Whole-cell patch-clamp recording the 30–32 °C using a Multiclamp 700B amplifier, a Digidata 1550A digitizer, and Clampex 10 software (Molecular Devices). The patch electrodes (2.5–3.5 M\Omega resistance) were filled with solution containing 150

mM K-gluconate, 5 mM NaCl, 1 mM MgCl<sub>2</sub>, 10 mM HEPES, 0.2 EGTA, 2 mM MgATP, and 0.5 mM NaGTP (290 mOsm, adjusted to pH 7.3 with KOH). Liquid junction potential of 15.5 mV was corrected. The resting membrane potential was estimated as the average membrane potential recorded without current injection or withdrawal in current-clamp mode. To calculate membrane resistance  $(R_m)$  and membrane capacitance  $(C_m)$  of grafted human interneurons, we applied hyperpolarizing voltage pulses (-5 mV, 50 ms-long) from the holding voltage of -85 mV and recorded currents in voltage-clamp mode with a sampling rate of 100 kHz in grafted cells. The peak amplitude of the transient capacitive current (Ipeak) was used to estimate apparent access resistance ( $R_a$ ) using the equation,  $R_a =$  $-5 \text{ mV/l}_{peak}$ . Steady-state current ( $l_{ss}$ ) is the average current from the baseline for the last 5 ms of voltage pulse and was used to calculate membrane resistance ( $R_{\rm m}$ ) using the equation,  $R_{\rm m} = (-5 \text{ mV}/l_{ss}) - R_{\rm a}$ . Transient capacitive current was fitted with a double exponential function,  $I(t) = I_f \exp(-t/\tau_f) + I_s \exp(-t/\tau_s)$ , where  $I_f/\tau_f$  and  $I_s/\tau_s$  are fast and slow components of peak amplitudes and decay time constants of transient capacitive current. The weighted mean decay time constant ( $\tau_w$ ) was calculated from the equation,  $\tau_w = \tau_f [I_f/(I_f + I_s)] + \tau_s [I_s/(I_f + I_s)]$  and then was used to calculate membrane capacitance ( $C_{\rm m}$ ) from the equation,  $C_{\rm m}$  $= \tau_{w} \times (R_{a} + R_{m})/(R_{a} \times R_{m})$ . Whole-cell membrane capacitance ( $C_{m}$ ) was compensated with the amplifier. Series (access) resistance was not compensated. The membrane potential was held at approximately -85 mV in current-clamp mode, and square pulses of depolarizing currents (0-300 pA with the increment of 50 pA, 0.5 s duration) were applied. The first APs induced by depolarizing current injection near threshold was used to calculate afterhyperpolarization. Spontaneous EPSC (sEPSC) were recorded in grafted cells at -85 mV in voltage-clamp mode. Blue collimated light-emitting diode (LED) with 470 nm peak wavelength (M470L2, Thorlabs) was used for photostimulation of grafted interneurons expressing ChR2-GFP. Brain slices in the recording chamber were illuminated through a 40× water-immersion objective lens (Olympus LUMPLFLN 40XW) and a 450-490 nm filter (Chroma). Illumination area was 0.17 mm<sup>2</sup> and was centered at the cell patched for recording. NBQX disodium salt was purchased from Tocris Bioscience (Cat. No. 1044). Offline analysis of electrophysiological data was performed using Clampfit 10 program (Molecular Devices).

## Ca<sup>2+</sup> currents analysis of iPSC-derived GNs

After 3 months' differentiation, human GNs on PLO/FN-coated glass coverslips were used for electrophygiological experiments. Microelectrodes were pulled from standard-wall borosilicate glass with a flaming/ brown micropipette puller (P-97, Sutter Instruments). Patch pipettes with a tip resistance of 4–5 MO when they were filled with internal solution. GNs on coverslips were transferred to the recording chamber which was perfused with B27GB media added with 3 mM CsCl2 and 0.0005 mM TTX. The internal pipette solution contained 20 U/ml phosphocreatine kinase, 100 mM CsMeSO3, 10 mM EGTA, 1 mM CaC12, 10 mM HEPES, 2 mM MgATP, 0.1 mM leupeptin, and 20mM phosphocreatine. Electrophysiological signals were recorded from the cultured GNs which typically showed neuronal dendritic processes as illustrated in the Fig. 5B. Total Ca<sup>2-</sup> currents and high voltage-activated Ca<sup>2+</sup> currents were recorded using whole-cell patch clamp in voltage-clamp mode. Electric signals were filtered at 10 kH and digitized at 3 kHz with Axon DigiData 1550 (Molecular Devices, California) that was controlled with a MultiClamp 700B (Molecular Devices) and run by Clampex (v10). After establishing a whole-cell configuration, the membrane potential was clamped at -70 mV. Electrophysiological data were analyzed initially with Clampfit (v10) (Molecular Devices). Analyzed data were further processed and presented with Igor (v6) and presented with CorelDraw (2021) (Corel, Ottawa, Canada) programs.

#### Statistics

All statistical analyses were performed using GraphPad Prism8 (GraphPad Software, La Jolla, CA), and SAS statistical software (9.4, SAS Institute, Cary, NC). For each figure, the statistical test was justified as appropriate, meeting the assumption of the tests as summarized in Supplementary Table 14. The normal distribution of data was tested using the Shapiro–Wilks test. Data with significant Shapiro–Wilks tests were analyzed after log-transformation or using non-parametric tests as indicated in Supplementary Table 14. We tested equal variance with the *F*-test, and if there was any significant difference, we used the *t*-test with Welch's correction. To compare the difference between two means, a two-tailed paired or unpaired *t*-test was used as shown in Supplementary Table 14. To

handle clustering and covariance among correlated samples [146, 147], a mixed effect model was used as summarized in Supplementary Table 14. For the comparison of group means for more than 2 groups, one-way ANOVA or Two-Level Hierarchical Linear Mixed Effect Model were used depending on data clustering, and if there was significant difference, posthoc analysis was performed using Dunnett's multiple comparisons. *P*-values < 0.05 were considered to be statistically significant. Experimental cohorts were chosen based on our selection criteria (Caucasian male patients treated with Clozapine vs. age- and gender-matched Caucasian male healthy controls) without randomization to reduce variation caused by age, ethnicity and gender. Blinding was used during cell counting and arborization analysis. No data was excluded and no statistical method was used to pre-determine the sample sizes.

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## **AUTHOR CONTRIBUTIONS**

DL, AZ, AM, HN, G-HP, YQ, JB, JFF, PR, XZ, PS, J-HC and SC designed the experiments. DL, AZ, AM, HN, G-HP, YQ and JMP differentiated cortical interneurons and analyzed them by qPCR and immunocytochemistry. DL, JSP and FS performed arborization analysis. DL, AZ and JF performed synapse analysis. DL, AZ, OO and CA did Western blot analysis. JTC reviewed data interpretation and manuscript contents. ES provided SCZ GWAS fine mapping data. JB, JFF, PR and HW did ATAC-seq analysis. J-HC did patch clamp analysis in brain slices. XZ and PS did patch clamp analysis in culture. CY and WH did RNA-seq and ChiP-seq analysis. H-YK performed statistical analysis. DL, JB, JFF, PR, XZ, PKS, HW, J-HC and SC wrote the manuscript. PR, J-HC, HW and SC supported this study financially.

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### **COMPETING INTERESTS**

The authors declare no competing interests.

## **ADDITIONAL INFORMATION**

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