

Multi-modal analysis of psychiatric disorders in the human cortex on a cell-type level

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Research Goals

The project aims to identify **key genes and regulatory elements** that drive **psychiatric disorders** in cortical cell types of the human brain. We are analyzing and integrating cell type specific **differential expression and chromatin accessibility** patterns between cases and controls. Furthermore, we are interested in dysregulations related to the **genetic risk for psychiatric disorders**.

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Data

Medical records

Phenotype

Genotype

snRNA-seq

snATAC-seq

10X Chromium

Table 1: Overview of cohort

	Controls (n=35)	Cases (n=57)
Diagnoses	-	SCZ (38), SCA (7), MDD (7), BIP (5)
Sex	13f/22m	22f/35m
Age (mean ± s.d.)	55.83 ± 13.56	53.32 ± 13.73
PMI (h) (mean ± s.d.)	31.80 ± 11.30	35.18 ± 16.58
pH (mean ± s.d.)	6.66 ± 0.24	6.57 ± 0.23
Cause of death	Accident (1), Natural (33), Unknown (1)	Accident (3), Natural (36), Suicide (16), Unknown (2)

Figure 1: Overview of data modalities

The dataset contains **phenotype, genotype, single nuclei transcriptomic (snRNA-seq)** and open chromatin (**snATAC-seq**) data from the **postmortem orbitofrontal cortex** tissue of **92 donors**.

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Methods

- Calculation of **polygenic risk scores (PRS)** with PRS-CS¹ for multiple psychiatric and stress-related disorders
- Demultiplexing and **alignment** with *Cell Ranger*²
- Downsampling** of reads with *DropletUtils*³
- Processing of snRNA-seq** data with *Scanpy*⁴, *DoubletDetection*⁵, *sctransform*⁶ and *scArches*⁷
- Processing of snATAC-seq** data with *ArchR*⁸
- Cell-type label transfer with data from *Allen Brain Atlas*⁹ as **reference data** and manual refinement
- Differential analysis** with *DESeq2*¹⁰ on pseudobulk data
- Enrichment analysis** with *clusterProfiler*¹¹

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Gene expression and chromatin accessibility at the resolution of single cells

snRNA-seq

snATAC-seq

Cell type

- Astro_FB
- Astro_PP
- Endothelial
- Exc_L2-3
- Exc_L3-5
- Exc_L4-6_1
- Exc_L4-6_2
- Exc_L4-6_3
- Exc_L5-6
- Exc_L5-6_HTR2C
- In_LAMP5
- In_PVALB_Ba
- In_PVALB_Ch
- In_RELN
- In_SST
- In_VIP
- Microglia
- Oligodendrocyte
- OPC

Figure 2: UMAP representation of snRNA-seq and snATAC-seq data.

The **snRNA-seq** data consists of gene expression values for **26.195 genes** across **787.046 cells** originating from 87 individuals. Cells were assigned to **19 distinct cell types** that cover the major cell types of the prefrontal cortex and the different neuronal layers. The **snATAC-seq** data consists of fragments from accessible chromatin across **399.439 cells** originating from 90 donors. Cells were assigned to **15 distinct cell types** - neuronal subtypes present in the RNA-seq data are missing.

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Differential gene expression between cases and controls

A

B Upregulated KEGG pathways

Downregulated KEGG pathways

Figure 3: Differentially expressed (DE) genes across cortical cell types. A. DE genes plotted with fold change on y-axis and p-value indicated by dot size. B. KEGG pathways enriched for up- and downregulated genes in different cell types. Color scale represents the $-\log_{10}$ -transformed FDR values. Annotation colors represent a grouping of pathways.

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Differential chromatin accessibility between cases and controls

Analysis of differential accessibility (DA) was performed on gene scores⁸ combining the chromatin accessibility of regulatory elements in the gene region.

Figure 4: Results of a DA analysis for genes identified as DE in cortical cell types. DA genes plotted with fold change on y-axis and p-value indicated by dot size. Color indicates the significance of DA in the respective cell type.

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Differential analysis between individuals with high and low polygenic risk

A

B

C

Figure 5: Polygenic risk-modulated differential gene regulation. A. PRS based on Cross-Disorder GWAS study¹² for cases and controls. B. DE genes for PRS based on different GWAS studies^{12,13,14,15,16}. C. Genome track visualizing the ATAC-seq signal in the region of *INO80E* – a DE and DA gene for schizophrenia PRS. Signal is shown separately for high and low PRS.

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Conclusion

- High number of DE genes between cases and controls in excitatory neurons across multiple layers and oligodendrocytes. DA detectable for only few of these genes.
- Upregulation of genes encoding ribosomal proteins in oligodendrocytes.
- Unique pattern of dysregulated pathways in microglia.

References

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