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







Nathalie Gerstner^{1,2,3}, Anna S. Fröhlich^{1,2}, Natalie Matosin⁴, Miriam Gagliardi⁵, Michael J. Ziller⁵, Elisabeth B. Binder¹, Janine Knauer-Arloth^{1,3} ¹ Department of Translational Research in Psychiatry, Max Planck Institute of Psychiatry, 80804 Munich, Germany ² International Max Planck Research School for Translational Psychiatry, 80804 Munich, Germany ³ Computational Health Center, Helmholtz Munich, 85764 Neuherberg, Germany ⁴ Faculty of Science, Medicine and Health, University of Wollongong, Wollongong, 2522, Australia ⁵ Department of Psychiatry, University of Münster, Münster, Germany

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.



Methods

- Calculation of polygenic risk scores (PRS) with PRS-CS¹ for multiple psychiatric and stress-related disorders
- Demultiplexing alignment with and CellRanger²
- **Downsampling** of reads with *DropletUtils*³
- Processing of snRNA-seq data with Scanpy⁴, DoubletDetection⁵, sctransform⁶ and scArches⁷
- Processing of snATAC-seq data with ArchR⁸
- Cell-type label transfer with data from *Allen* Brain Atlas9 as reference data and manual refinement
- **Differential analysis** with *DESeq2*¹⁰ on pseudobulk data
- Enrichment analysis with *clusterProfiler*¹¹



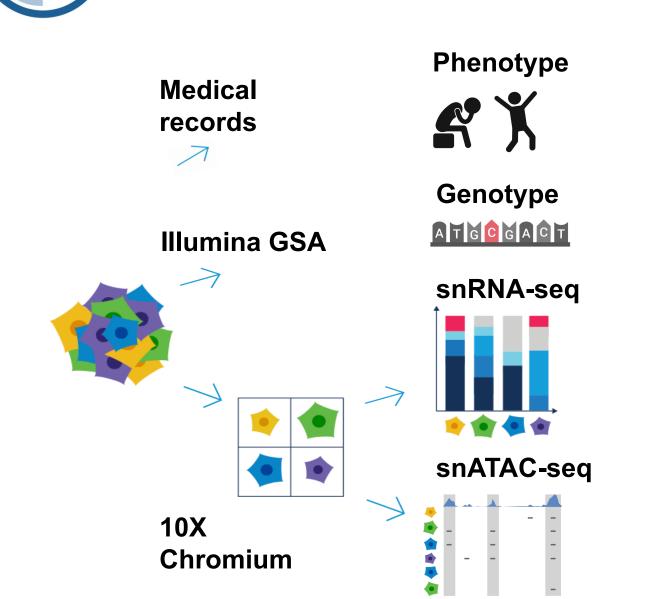


Table 1: Overview of cohort

Figure 1: Overview

of data modalities

	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)

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.

Gene expression and chromatin accessibility at the resolution of single cells

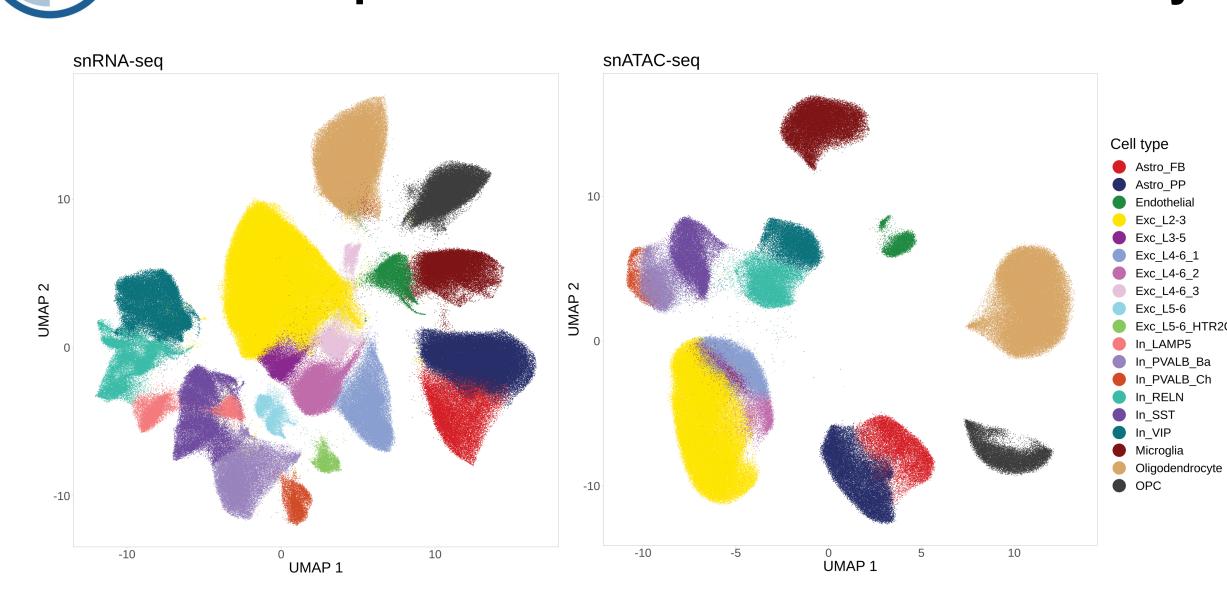


Figure 2: UMAP representation of snRNA-seq and snATAC-seq data.

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.

Differential gene expression between cases and controls

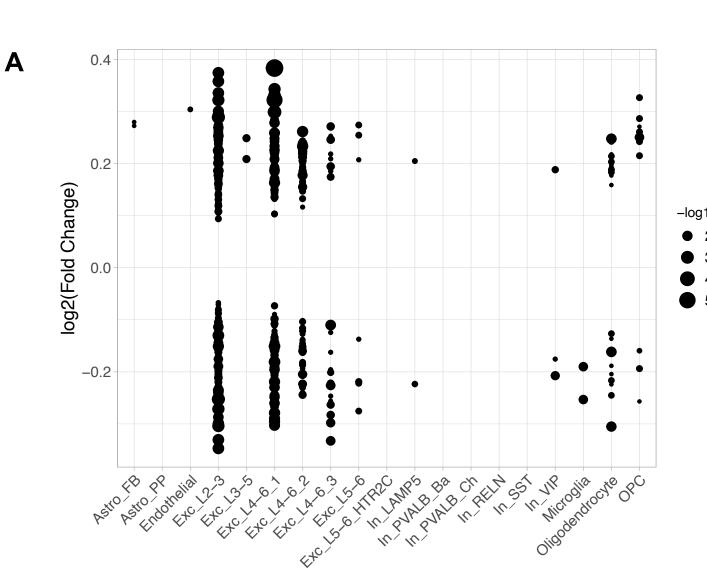
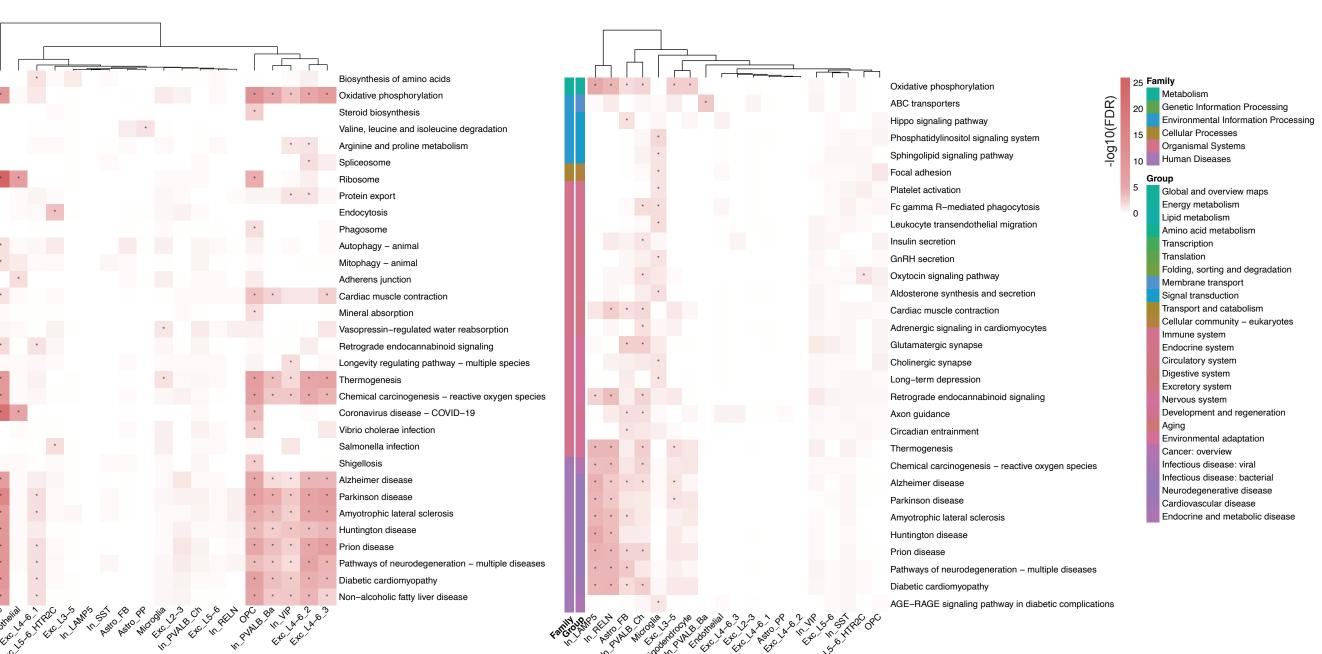


Figure 3: Differentially expressed (DE) genes across cortical cell types. A. DE genes plotted with fold change on y-axis and p-value indicated by dot size. B. KEGG pathways enriched for up- and downregulated genes in different cell types. Color represents the -log10transformed FDR values. Annotation colors represent a grouping of pathways.

Upregulated KEGG pathways



Downregulated KEGG pathways

Conclusion

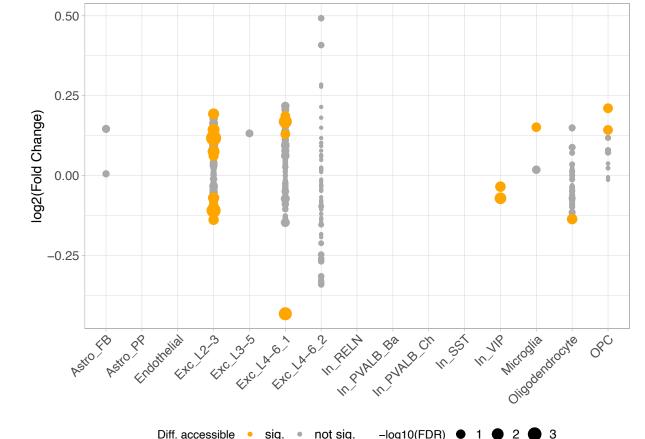
- High number of DE genes between cases and controls in excitatory neurons across multiple layers and oligodendrocytes. DA detectable for only few of these genes.
- Upregulation of genes encoding ribosomal proteins in oligodendrocytes.
- Unique pattern of dysregulated pathways in microglia.

Differential chromatin accessibility

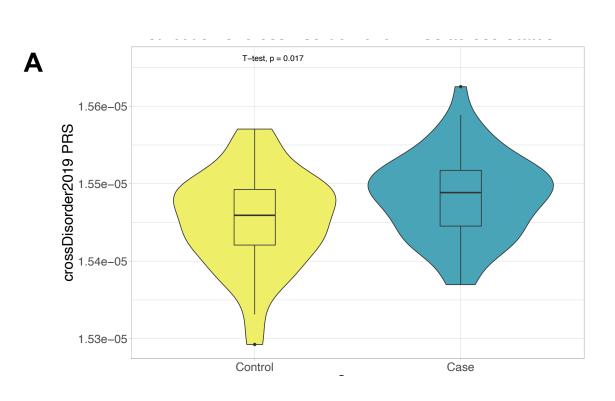
between cases and controls

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.



Differential analysis between individuals with high and low polygenic risk



Dissection of the effects of genetic risk on gene expression and chromatin accessibility using PRS. Differential analysis was performed between upper and lower tail of PRS distribution.

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. 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.

