# Multi-modal analysis of psychiatric disorders in the human cortex





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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 going to analyze and integrate cell type specific differential expression and chromatin accessibility patterns between cases and controls as well as between donors with high and low genetic risk for psychiatric disorders. Furthermore, allele-specific interested in regulatory and transcriptional effects and cell-type specific regulatory gene networks.

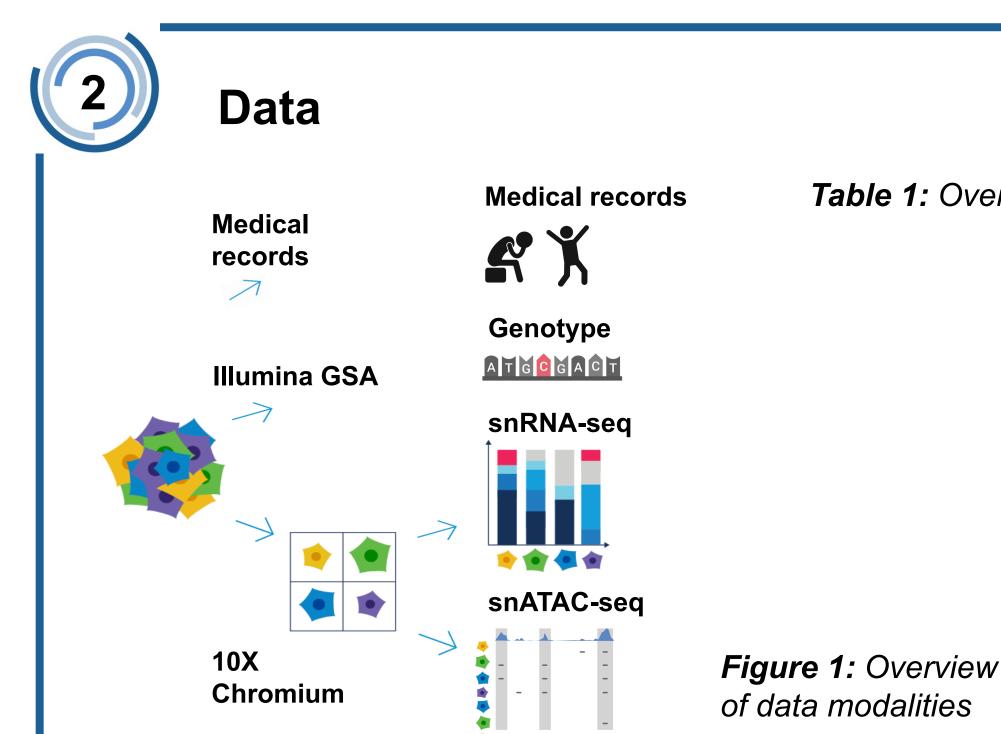


Table 1: Overview of cohort

	Controls (n=35)	Cases (n=57)
Diagnoses	-	SCZ (38), SCA (7), MDD (7), BIP (5)
Sex	13 Female	22 Female
Age (mean ± s.e.m)	55.8 ± 2.3	53.3 ± 1.8
PMI (h) (mean ± s.e.m)	31.8 ± 1.9	35.2 ± 2.2
pH (mean ± s.e.m)	6.66 ± 0.04	$6.57 \pm 0.03$
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.



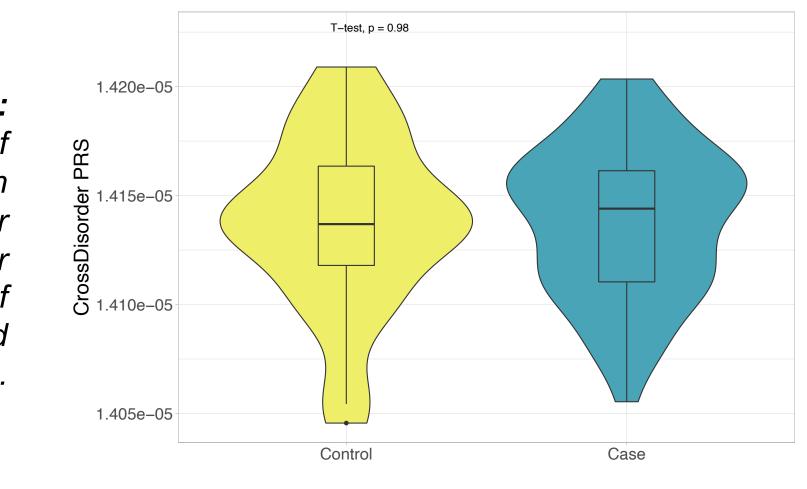
#### Methods

- Calculation of polygenic risk scores (PRS) with PRS-CS<sup>1</sup> multiple on diseases and stress-related traits
- Demultiplexing and alignment with CellRanger<sup>2</sup>
- of with Downsampling reads DropletUtils<sup>3</sup>
- Processing of snRNA-seq data with Scanpy<sup>4</sup>, DoubletDetection<sup>5</sup>, sctransform<sup>6</sup> and scArches<sup>7</sup>
- Processing of snATAC-seq data with ArchR<sup>8</sup>
- Cell-type label transfer with data from Allen Brain Atlas<sup>9</sup> as reference data and manual refinement
- **Differential analysis** with *DESeq2*<sup>10</sup> on pseudobulk data

#### Genetic risk for psychiatric diseases

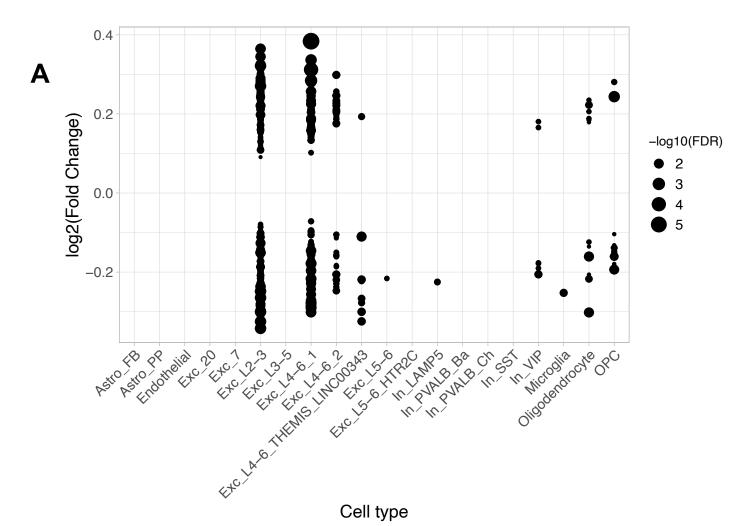
Polygenic risk scores (PRS) calculated for multiple diseases and stress-related traits are not always correlated with diagnoses for psychiatric disorders. It is therefore important to not only identify molecular differences between cases and controls, but also individuals with high and low genetic risk.

Figure 2: Distribution of PRS based on cross disorder GWAS<sup>11</sup> for groups of controls and cases.





### Differential gene expression between cases and controls



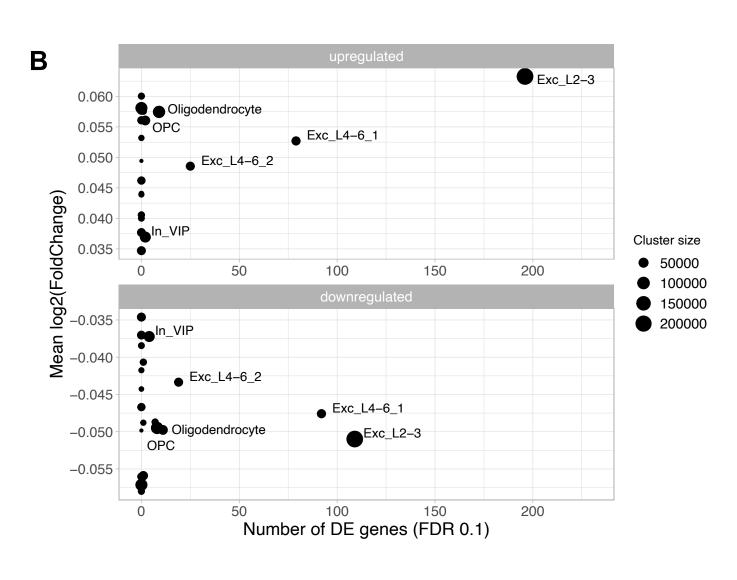


Figure 4: Differentially expressed (DE) genes across cortical cell types. A. DE genes plotted with fold change on y-axis and p-value indicated by dot size. B. Mean fold change of all genes plotted against the number of DE genes per cell cluster. Dot size indicates cluster size.

### Gene expression and chromatin accessibility at the resolution of single cells

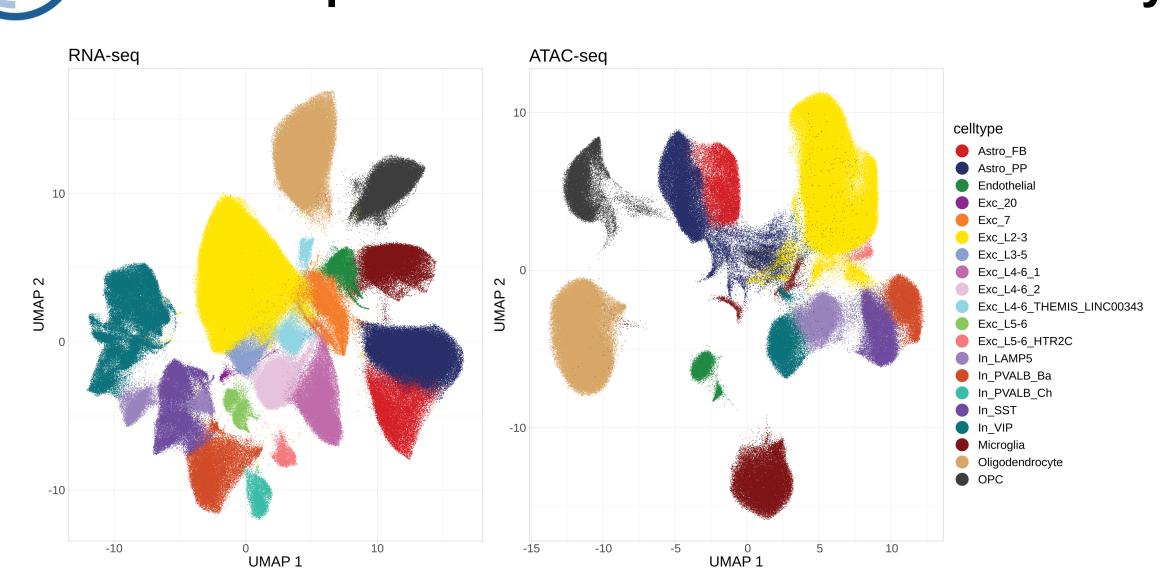


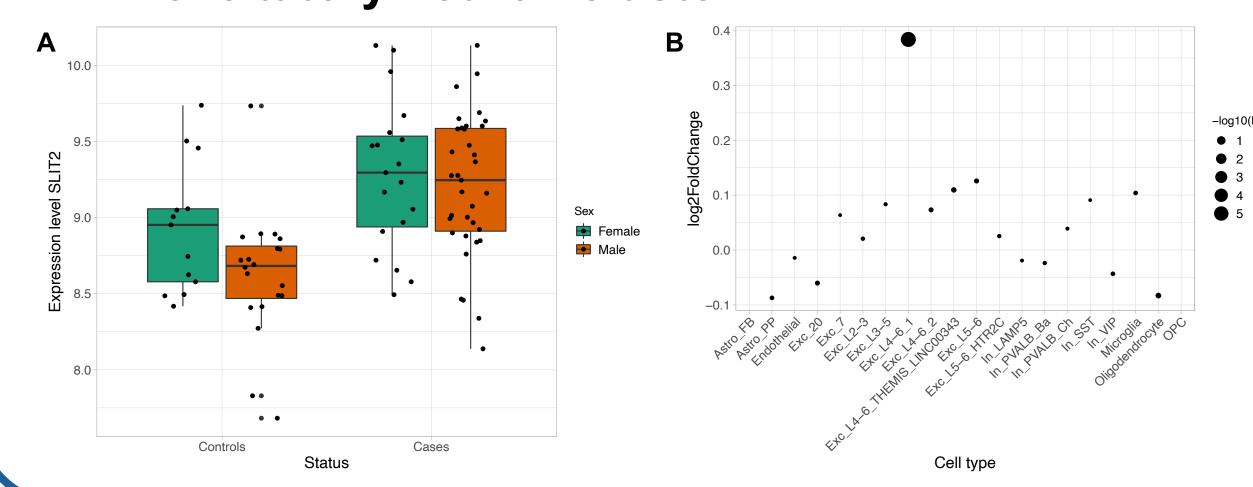
Figure 3: UMAP representation of snRNA-seq and snATAC-seq data.

The **snRNA-seq data** consists of gene expression values for 26.195 genes across 813.095 cells originating from 87 individuals. Cells were assigned to 20 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 459.678 cells originating from 91. Cells were assigned to 12 distinct cell types - neuronal subtypes present in the RNA-seq data are missing.



### Upregulation of Slit2 in deep layer excitatory neuron cluster



Slit2 is a glycoprotein of the Slit family that plays a highly conserved role in axon guidance and neuronal migration. It was previously shown that Slit2 overexpression causes depression-/anxiety-like behaviour in adult mice<sup>12</sup>. *Slit2* is one of the genes with the strongest differential expression in the Exc\_L4-6\_1 cluster.

Figure 5: Upregulation of Slit2 gene in deep layer excitatory neuron cluster. A. Expression levels of Slit2 in cases and controls. Colour indicates sex of donor. B. Fold Change of Slit2 per cell type.



#### **Outlook**

The analyses plan include the differential analysis of gene expression and chromatin accessibility between cases and controls and genetic risk exposures. We are planning to analyze allele specific effects in the different cell types. Gene regulatory networks will be inferred for the different cortical cell types.

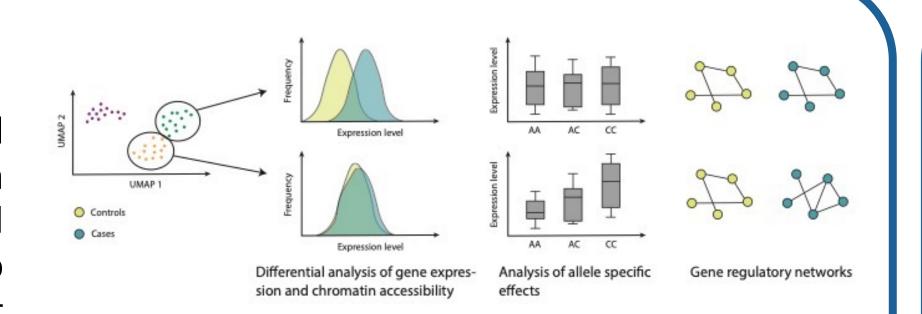


Figure 6: Analyses steps planned to perform.

## References

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