# **S1 Appendix. Curation Protocol**

This document contains the protocol for reproducing the curation work described in the manuscript entitled "Experiment level curation of transcriptional regulatory interactions in neurodevelopment" by Chu et al. Part 1 describes the steps to assemble the corpus of candidate papers, by exploiting other resources of direct transcriptional regulatory interactions (DTRIs) and performing PubMed searches. The result of this is a large spreadsheet containing records of candidate papers that can be readily examined by curators. Part 2 includes descriptions of the annotations and the associated instructions for manually extracting these annotations from the research article in question.

### **Part 1: Candidate Papers Corpus Assembly**

Sourcing candidate papers from external resources essentially entails generating a list of transcription factors (TFs) and PubMed ID mappings. The idea is to triage candidate papers that are likely to contain experimental evidence of DTRIs involving the annotated TF. To do this, first obtain the records of DTRIs from the target database in question (For example: TRRUST: (1,2), TFactS: (3), TFe: (4), etc). In most cases, each DTRI record would contain identifiers for the TF and target genes, usually as gene symbols, as well as a corresponding PubMed ID identifying the source article. Some resources will contain records that are outside the scope of this curation effort, which should be filtered out. For example, both OReganno (5–7) and HTRIdb (8) explicitly contain results from high-throughput studies. InnateDB (9,10) also contains proteinprotein interactions and long non-coding RNA to target gene interactions that do not fit our definition of DTRIs. Next, to avoid ambiguity, all genes in this curation are to be indexed by Entrez IDs. To map the gene symbols or Ensembl IDs to Entrez IDs, use the gene annotations from NCBI for either human

(https://www.ncbi.nlm.nih.gov/gene/?term=human%5Borganism%5D) or mouse (https://www.ncbi.nlm.nih.gov/gene/?term=mouse%5Borganism%5D). First, use the official HGNC or MGI gene symbols to map the Entrez IDs, and then by gene aliases. Drop the records with symbols that could not be mapped unambiguously. Finally, retain only unique TF to PubMed mappings. Repeat these steps for the different resources and then concatenate the results. Finally, add an additional column to keep track of the Entrez ID of the human ortholog to facilitate analysis. The resulting data table of candidate papers should have 5 columns, as shown in Table 1.







Next, use the Gene Ontology (GO) and SFARI annotations to prioritize TFs relevant to neurodevelopment for curation. To produce the list of TFs, take the union set of all the TFs included in the external resources and the set of sequence specific TFs identified by Lambert et al. (11) (http://humantfs.ccbr.utoronto.ca/). Note that many external DTRI resources include co-TFs that do not have DNA binding domains. This is consistent with our definition of direct DTRIs where the TFs may associate with cis-regulatory elements (cREs) by interacting with other TFs or complexes. Once this set of TFs is assembled, obtain the set of human and mouse genes annotated with the neurodevelopment GO term (GO:0007417) from AmiGO (12,13) (http://amigo.geneontology.org/amigo). Similarly, obtain the set of genes annotated with Autism Spectrum Disorder (ASD) and Intellectual Disability (ID) associations in the SFARI database (14) (https://gene.sfari.org/). Join these tables to generate a list of TFs annotated with 7 columns, as shown in Table 2. These annotations can then be used to inform curation priority.

Column	Details	
TF Symbol	Example:	PAX6 Description: Symbol of the TF gene.
TF Entrez ID	Example:	5080

Table 2. Column descriptions of the TFs table



To expand the set of candidate papers, perform an independent PubMed search for each TF. Specifically, attach the following search string: "(((regulatory sequences, nucleic acid[MeSH Terms]) OR (transcription, genetic[MeSH Terms]) OR (intracellular signaling peptides and proteins[MeSH Terms]) OR (gene expression regulation[MeSH Terms])) AND ((Chromatin Immunoprecipitation[MeSH Terms]) OR (Electrophoretic Mobility Shift Assay[MeSH Terms])))" with the symbol of each TF gene, and use the E-Utilities API (15)

(https://www.ncbi.nlm.nih.gov/books/NBK25501/) to perform the series of PubMed queries. Once ready, concatenate the results to construct a spreadsheet with the columns detailed in Table 1, making it compatible with the table of candidate papers retrieved from other DTRI resources. As such, the two sets would then be combined to form a master corpus of candidate papers. Once all the PubMed IDs are available, consider making additional queries to obtain and attach the paper titles and/or abstracts directly in the spreadsheet to facilitate curation.

#### **Part 2: Manual Curation Guide**

The remainder of this document describes the steps to extract and record experimental evidence of DTRIs from individual research articles. Here, we define a DTRI to be a transcriptional regulatory interaction where the TF protein first binds (either directly or indirectly through a co-binding partner) to a cRE that lies near the target gene, and consequently influences the level of its transcription. This is in contrast with "indirect regulation" where multiple DTRIs act in series (for example: Pax6 > Neurog2 > Sox2, where the relationships between Pax6 and Sox2 would be considered "indirect"). Importantly, we will curate only low-throughput reports of DTRIs at the individual experiment level. Each experiment will be represented by an independent record in the resulting database, annotated with attributes that are specific to that experiment. Further, consistent with our focus on mammalian neurodevelopment, this curation will only record experiments performed in humans or mice.

The first step of curation is to identify the low-throughput experiments that lend support to DTRIs. Specifically, we are interested in three types of experiments: 1. TF perturbation, 2. TF-DNA binding, and 3. TF-reporter assays. In order for a TF to directly regulate a target gene, the TF protein must bind to a regulatory site near the target gene's TSS. However, while TF-DNA association is necessary, it is insufficient to cause regulation. Therefore, to establish a DTRI, it must also be demonstrated that the binding can activate the corresponding cRE and influence the target gene's level of transcription. As such, the three types of experiments taken together can provide stronger evidence for direct transcriptional regulation.

In a TF perturbation experiment, an induced change in the expression of the regulator gene is shown to lead to a change in the expression of the target gene. This usually involves perturbing the TF expression followed by measuring target gene expression. For example, Sun et al. looked at the difference in Neurog2 expression between Pax6-null and wild type mouse forebrains using RT-PCR (16). Note that different perturbation and measurement strategies may be used. TF-DNA binding experiments measure the interaction between the TF protein and the TFBS in question. This could be shown using a ChIP experiment or an electromobility shift assay (EMSA). For example, in the same study, Sun et al. used a ChIP assay to examine the binding of the Pax6 protein near the target gene Neurog2. Finally, TF-reporter experiments provide experimental evidence that the TF regulator activates the TFBS. This is usually performed by measuring the activity of a reporter assay that is driven by the corresponding TFBS in the presence or absence of the TF protein. For example, Scardigli et al. co-electroporated a reporter construct containing the E1 enhancer with a Pax6 expression vector into chick embryos (17). They found that ectopic expression of Pax6 drove the expression of the reporter gene, in comparison to the control.

The curation process largely involves going through the full text of candidate papers for a given TF, and possibly supplementary materials, reviewing each one to identify the set of experiments reported, and creating entries in the curation sheets to document the

experimental details. Before delving deeply into a paper, it is often useful to triage papers by reading only the title and the abstract. By doing this, it may be apparent whether the paper contains support for one or more DTRIs using low-throughput experimental evidence. For example, the title or the abstract may indicate that only high-throughput evidence is reported. In that case, it would be safe to mark the paper as "examined" and carry on. Once a paper is determined to be likely to contain low-throughput experiment evidence, get the full text and identify the experiments performed. The experiments are often laid out in the results section though it may be necessary to also look at the methods and/or the supplementary materials to extract the relevant details. In favour of efficiency and thoroughness, curate all experiments reported by the paper under inspection, even if it involves a different TF than expected.

In total, there are 4 curation spreadsheets. The rows correspond to individual experiments and the columns contain the various attributes to be recorded. The first spreadsheet is the master curation sheet containing basic information for all experiments, regardless of the type of experiment (Table 3). Each experiment will have an additional entry in one of the other 3 curation sheets based on the type of assay. A unique identifier should be assigned to each experiment at the time of curation so that entries could be mapped across tables. Controlled vocabularies are used for all recorded attributes to simplify the curation process. Refer to the curation tables below for instructions on how to record each attribute.



Table 3. Column descriptions of the master curation sheet





# Table 4. Column descriptions of the TF perturbation details curation sheet











Table 6. Column descriptions of the TF-reporter details curation sheet



## **Citations**

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