## main

## August 4, 2021

1 Examine if there is an enrichment of sex linked genes within BrainSeq Phase 2 and 3 (case-control; schizophrenia)

```
[1]: import functools
import numpy as np
import pandas as pd
from os import environ
from gtfparse import read_gtf
from scipy.stats import fisher_exact
from statsmodels.stats.multitest import multipletests
[2]: environ['NUMEXPR_MAX_THREADS'] = '32'
```

## 1.1 Load phase 2 results

```
[3]: config = {
    "dlpfc_file": "/ceph/users/jbenja13/phase3_paper/phase2/extract_de/_m/
    →dlpfc_diffExpr_szVctl_full.txt",
    "caud8_file": "/ceph/projects/v4_phase3_paper/analysis/
    →differential_expression/_m/genes/diffExpr_szVctl_full.txt",
    "hippo_file": "/ceph/users/jbenja13/phase3_paper/phase2/extract_de/_m/
    →hippo_diffExpr_szVctl_full.txt",
    'xci_file': '../.../xci_enrichment/_h/xci_status_hg19.txt',
    "gtf_file": '/ceph/genome/human/gencode25/gtf.CHR/_m/gencode.v25.annotation.
    →gtf',
    'cmc_file': '/ceph/projects/v3_phase3_paper/inputs/cmc/_m/
    →CMC_MSSM-Penn-Pitt_DLPFC_mRNA_IlluminaHiSeq2500_gene-adjustedSVA-differentialExpression-inc    →tsv'
}
```

```
[4]: @functools.lru_cache()
    def get_cmc():
        return pd.read_csv(config['cmc_file'], sep='\t')

    @functools.lru_cache()
```

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def get_xci():
         return pd.read_csv(config['xci_file'], sep='\t')
     @functools.lru_cache()
     def get_gtf(gtf_file):
         return read_gtf(gtf_file)
     @functools.lru cache()
     def get_dlpfc():
         return pd.read_csv(config["dlpfc_file"], sep='\t')
     @functools.lru_cache()
     def get_hippo():
         return pd.read_csv(config["hippo_file"], sep='\t')
     @functools.lru_cache()
     def get_caudate():
         return pd.read_csv(config["caud8_file"], sep='\t')
[5]: def gene annotation():
         gtf0 = get_gtf(config["gtf_file"])
         gtf = gtf0[gtf0["feature"] == "gene"]
         return gtf[["gene_id", "gene_name", "seqname", "start", "end", "strand"]]
    1.2 Hippocampus
[6]: hippo = gene_annotation().merge(get_hippo()[(get_hippo()["type"] == 'gene')],
                                     left_on="gene_id", right_on="gencodeID")
    INFO:root:Extracted GTF attributes: ['gene_id', 'gene_type', 'gene_status',
    'gene name', 'level', 'havana_gene', 'transcript_id', 'transcript_type',
    'transcript_status', 'transcript_name', 'transcript_support_level', 'tag',
    'havana transcript', 'exon number', 'exon id', 'ont', 'protein id', 'ccdsid']
[7]: table = [[np.sum((hippo['adj.P.Val']<0.20) & (hippo['seqname'] == 'chrX')),
               np.sum((hippo['adj.P.Val']<0.20) & (hippo['seqname'] != 'chrX'))],</pre>
              [np.sum((hippo['adj.P.Val']>=0.20) & (hippo['seqname'] == 'chrX')),
               np.sum((hippo['adj.P.Val']>=0.20) & (hippo['seqname'] != 'chrX'))]]
     print(table)
     fisher exact(table)
    [[7, 325], [829, 23491]]
[7]: (0.6103256936067551, 0.22311752769934323)
```

```
[8]: table = [[np.sum((hippo['adj.P.Val']<0.20) & (hippo['t']<0) & (hippo['seqname']_
      np.sum((hippo['adj.P.Val']<0.20) & (hippo['t']<0) & (hippo['seqname']
      \rightarrow!= 'chrX'))],
              [np.sum((hippo['adj.P.Val']>=0.20) \& (hippo['t']<0) \&_{\sqcup}
      np.sum((hippo['adj.P.Val']>=0.20) & (hippo['t']<0) &
      print(table)
     fisher_exact(table)
     [[4, 167], [461, 12220]]
[8]: (0.6349123878057334, 0.5330876730005754)
[9]: table = [[np.sum((hippo['adj.P.Val']<0.20) & (hippo['t']>0) & (hippo['seqname']
      np.sum((hippo['adj.P.Val']<0.20) & (hippo['t']>0) & (hippo['seqname']
      \rightarrow!= 'chrX'))],
              [np.sum((hippo['adj.P.Val']>=0.20) & (hippo['t']>0) & \square
      np.sum((hippo['adj.P.Val']>=0.20) & (hippo['t']>0) &
      print(table)
     fisher_exact(table)
     [[3, 158], [368, 11271]]
[9]: (0.5815389378095762, 0.493689880575509)
    1.3 DLPFC
[10]: dlpfc = gene_annotation().merge(get_dlpfc()[(get_dlpfc()["type"] == 'gene')],
                                   left_on="gene_id", right_on="gencodeID")
[11]: table = [[np.sum((dlpfc['adj.P.Val']<0.05) & (dlpfc['seqname'] == 'chrX')),
              np.sum((dlpfc['adj.P.Val']<0.05) & (dlpfc['seqname'] != 'chrX'))],</pre>
              [np.sum((dlpfc['adj.P.Val']>=0.05) & (dlpfc['seqname'] == 'chrX')),
              np.sum((dlpfc['adj.P.Val']>=0.05) & (dlpfc['seqname'] != 'chrX'))]]
     print(table)
     fisher exact(table)
     [[10, 235], [826, 23581]]
[11]: (1.2148266446860028, 0.47891981920788795)
[12]: table = [[np.sum((dlpfc['adj.P.Val']<0.05) & (dlpfc['t']<0) & (dlpfc['seqname']__
```

```
np.sum((dlpfc['adj.P.Val']<0.05) & (dlpfc['t']<0) & (dlpfc['seqname']__
      [np.sum((dlpfc['adj.P.Val']>=0.05) & (dlpfc['t']<0) &__
      np.sum((dlpfc['adj.P.Val']>=0.05) & (dlpfc['t']<0) \&
      print(table)
     fisher exact(table)
    [[2, 140], [423, 12642]]
[12]: (0.4269503546099291, 0.3337250489445369)
[13]: table = [[np.sum((dlpfc['adj.P.Val']<0.05) & (dlpfc['t']>0) & (dlpfc['seqname']
      np.sum((dlpfc['adj.P.Val']<0.05) & (dlpfc['t']>0) & (dlpfc['seqname']
      \rightarrow!= 'chrX'))],
             [np.sum((dlpfc['adj.P.Val']>=0.05) & (dlpfc['t']>0) &__
      np.sum((dlpfc['adj.P.Val']>=0.05) & (dlpfc['t']>0) \&
      print(table)
     fisher exact(table)
    [[8, 95], [403, 10939]]
[13]: (2.2858038396238736, 0.03174889585949236)
    1.4 Caudate nucleus
[14]: caudate = gene_annotation().merge(get_caudate(), left_on="gene_id",__
      [15]: table = [[np.sum((caudate['adj.P.Val']<0.05) & (caudate['seqname'] == 'chrX')),
             np.sum((caudate['adj.P.Val']<0.05) & (caudate['seqname'] != 'chrX'))],</pre>
             [np.sum((caudate['adj.P.Val']>=0.05) & (caudate['seqname'] == 'chrX')),
             np.sum((caudate['adj.P.Val']>=0.05) & (caudate['segname'] !=___
     print(table)
     fisher_exact(table)
    [[101, 2595], [653, 19609]]
[15]: (1.1687625218717819, 0.1506223372700362)
[16]: table = [[np.sum((caudate['adj.P.Val']<0.05) & (caudate['t']<0) &__
```

```
np.sum((caudate['adj.P.Val']<0.05) & (caudate['t']<0) &
      [np.sum((caudate['adj.P.Val']>=0.05) & (caudate['t']<0) &__
     np.sum((caudate['adj.P.Val']>=0.05) & (caudate['t']<0) &
     print(table)
     fisher exact(table)
    [[49, 1348], [332, 10329]]
[16]: (1.1309056701583784, 0.416285160776556)
[17]: table = [[np.sum((caudate['adj.P.Val']<0.05) & (caudate['t']>0) &<sub>11</sub>
     np.sum((caudate['adj.P.Val']<0.05) & (caudate['t']>0) &
     [np.sum((caudate['adj.P.Val']>=0.05) & (caudate['t']>0) &__
     np.sum((caudate['adj.P.Val']>=0.05) & (caudate['t']>0) &
     print(table)
     fisher exact(table)
    [[52, 1247], [321, 9280]]
[17]: (1.2055350286169673, 0.2223566468113563)
    1.5 CMC DLPFC (SVA)
[18]: annot = gene_annotation()
     annot["genes"] = annot.gene_id.str.replace("\\..*", "", regex=True)
     cmc = annot.merge(get_cmc(), on="genes")
[19]: table = [[np.sum((cmc['adj.P.Val']<0.05) & (cmc['seqname'] == 'chrX')),
             np.sum((cmc['adj.P.Val']<0.05) & (cmc['seqname'] != 'chrX'))],</pre>
             [np.sum((cmc['adj.P.Val']>=0.05) & (cmc['seqname'] == 'chrX')),
             np.sum((cmc['adj.P.Val']>=0.05) & (cmc['seqname'] != 'chrX'))]]
     print(table)
     fisher_exact(table)
    [[13, 401], [546, 15026]]
[19]: (0.8921743260895381, 0.7869905606431027)
[20]: table = [[np.sum((cmc['adj.P.Val']<0.05) & (cmc['t']<0) & (cmc['seqname'] ==__
```

```
np.sum((cmc['adj.P.Val']<0.05) & (cmc['t']<0) & (cmc['seqname'] !=_{\sqcup}
      [np.sum((cmc['adj.P.Val']>=0.05) & (cmc['t']<0) & (cmc['seqname'] ==__</pre>
      np.sum((cmc['adj.P.Val']>=0.05) & (cmc['t']<0) & (cmc['seqname'] !=__
      print(table)
     fisher exact(table)
     [[4, 225], [284, 8140]]
[20]: (0.5095461658841941, 0.2578853679103255)
[21]: table = [[np.sum((cmc['adj.P.Val']<0.05) & (cmc['t']>0) & (cmc['seqname'] ==__
      np.sum((cmc['adj.P.Val']<0.05) & (cmc['t']>0) & (cmc['seqname'] !=__
      [np.sum((cmc['adj.P.Val']>=0.05) & (cmc['t']>0) & (cmc['seqname'] ==__
      np.sum((cmc['adj.P.Val']>=0.05) & (cmc['t']>0) & (cmc['seqname'] !=__
      print(table)
     fisher_exact(table)
     [[9, 176], [262, 6886]]
[21]: (1.3439885496183206, 0.4247922107896491)
[22]: setA = set(dlpfc[(dlpfc['adj.P.Val']<0.05) & (dlpfc['t']>0) & (dlpfc['seqname']
      setA
[22]: {'CHRDL1',
      'CXorf40B',
      'EFHC2',
      'FHL1',
      'GABRQ',
      'MAMLD1',
      'PABPC5-AS1',
      'SLC16A2'}
[23]: setB = set(cmc[(cmc['adj.P.Val']<0.05) & (cmc['t']>0) & (cmc['seqname'] ==__
      setB
[23]: {'.',
      'ARHGAP6',
      'CHRDL1',
```

```
'CXorf57',
'IL13RA2',
'SLC16A2',
'SPRY3',
'SYTL5',
'TENM1'}

[24]: setA & setB

[24]: {'CHRDL1', 'SLC16A2'}
```