# Counterfactual Confounder Adjustment for Single-cell Differential Expression Analysis

# Yongjin Park

# Results

# Cell type annotation



2,648 marker genes

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PsychENCODE's marker gene selection might be imperfect since some "marker" genes are shared by different cell types. However, it has enough discriminatory power. Using this initial dictionary of marker genes, we can start analyzing 10x data, which consist of these three files:

• Sparse count matrix:

## AACCATGTCTGTACGA.1
## AACCGCGTCCGCATAA.1
## AACGTTGGTTCAGGCC.1
## AACTGGTGTACCGGCT.1
## AAGACCTAGTTAACGA.1
## AAGGAGCAGCAATCTC.1
## AAGGAGCTCTGCTGCT.1

```
## %%MatrixMarket matrix coordinate integer general
## 17926 70634 119696200
## 56 1 1
## 139 1 1
## 270 1 1
## 324 1 1
## 375 1 1
## 389 1 1
## 420 1 1
## 557 1 1

• Cell barcode list:
## AAACGGGAGATCCCGC.1
## AAATGCCTCCAATGGT.1
## AACCATGTCAGTGCAT.1
```

• Gene/feature list (these names should exist in the marker file):

## F0538757.2

## SAMD11

## NOC2L

## KLHL17

## PLEKHN1

## PERM1

## HES4

## ISG15

## AGRN

## RNF223



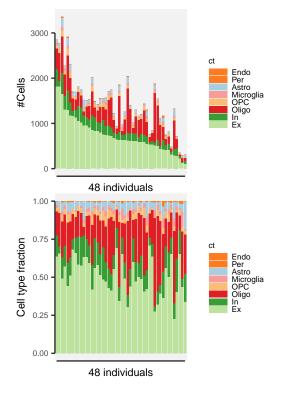
1726 genes present in snRNA-seq

0.4

0.6

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Basic statistics for cell type annotation



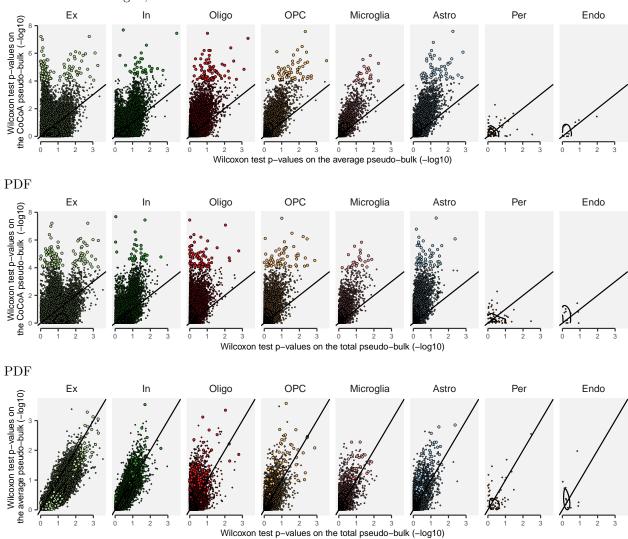
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• 1,472 cells per individual, including 50.9% (N=745  $\pm$  388) cells for Ex, 12.23% (N=179  $\pm$  103) cells for In, 3.54% (N= 54  $\pm$  35) cells for OPC, 0.33% (N= 4  $\pm$  5) cells for Endo, 25.22% (N=380  $\pm$  252) cells for Oligo, 2.61% (N= 36  $\pm$  25) cells for Microglia, 4.95% (N= 71  $\pm$  47) cells for Astro, 0.34% (N= 4  $\pm$  4) cells for Per on average.

# Differential expression analysis

#### CoCoA identified 377 genes are differentially-regulated between different AD conditions

• 377 genes (2.72%) consist of 123 found in Ex, 36 found in In, 86 found in Oligo, 58 found in OPC, 24 found in Microglia, 57 found in Astro



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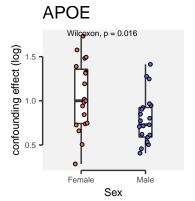
p-value distribution

Why do we find more genes with CoCoA?

Take the examples of Microglia genes

```
## Loading required package: cba
## Loading required package: proxy
##
## Attaching package: 'proxy'
    The following objects are masked from 'package:stats':
##
##
##
           as.dist, dist
##
    The following object is masked from 'package:base':
##
##
           as.matrix
                  msex
               pathoAD
                np_sqrt
covariates
                nft_sqrt
                apoe.e4
   cogn_ep_random_slope
              age_death
                                                                             SUSD6
                                  RPL13A
                                      RPLP1
                                                  CHKA
                                                             MAN2A1
                                                                         SRGN
                              FAU
                                                      EPB41L3
                                                          IGSF21
                                                                     SIPA1L1
                                                                                 ARHGEF2
                                          TPT1
                                                                 RAPGEF1
                                                  genes
                                       p-value
                                                   1e-01 1e-02 1e-03
adjusted expression (log-scal
                                                                                      average expression log(1+x
                                                                                                   Wilcoxon, p = 0.13
                                             total expression log(1+x)
     0.0
     -0.5
    -1.0
                                                                                          0.5
              non–AD
                                                0
                                                                                         0.0
                               AD.
                                                        non-AD
                                                                        AD
                                                                                                   non-AD
               case-control label
                                                        case-control label
                                                                                                   case-control label
```

## PDF

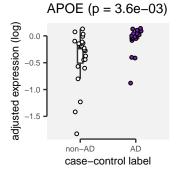


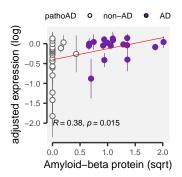
pathoAD o non-AD o

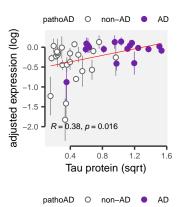
pathoAD o non-AD o AD

pathoAD o non-AD o AD

PDF

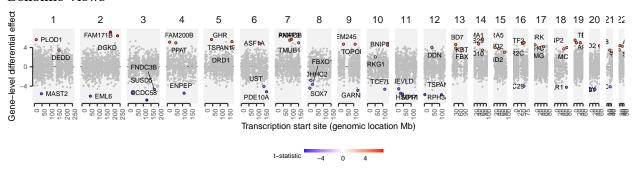






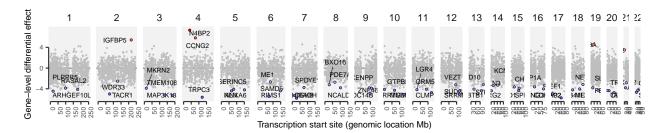
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#### Genomic views



 $\mathbf{E}\mathbf{x}$ 

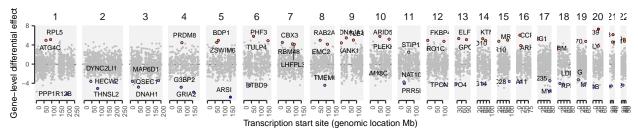
Ex top genes



t-statistic \_5.0 -2.5 0.0 2.5 5.0

In

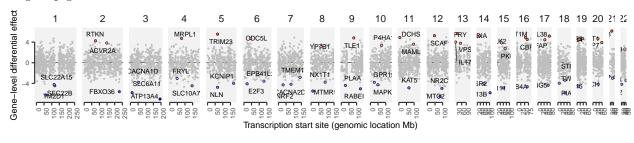
### In top genes



t-statistic 4 0 4

Oligo

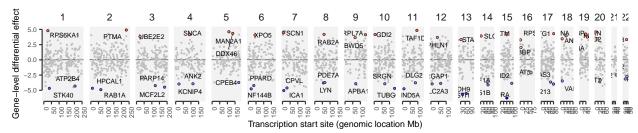
#### Oligo top genes



t-statistic -6 -3 0 3

OPC

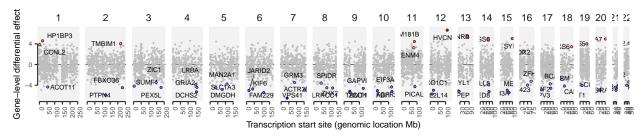
#### OPC top genes



t-statistic \_5.0 -2.5 0.0 2.5

Microglia

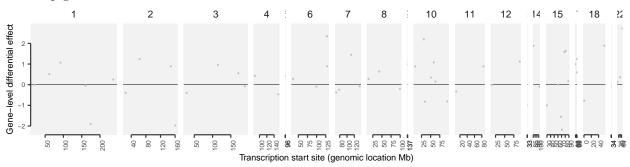
Microglia top genes



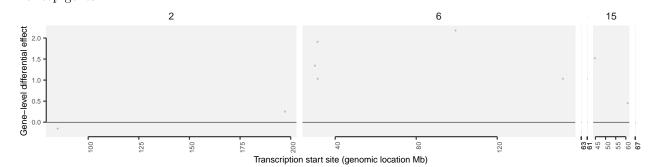
t-statistic <sub>-6</sub> <sub>-3</sub> <sub>0</sub> <sub>3</sub> <sub>6</sub>

## Astro

## Astro top genes

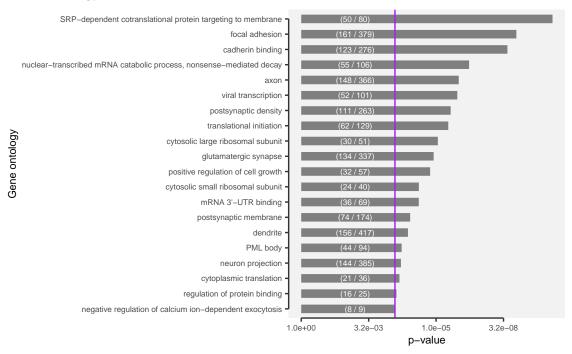


Per Per top genes



Endo top genes

# Gene ontology enrichment



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