# ClusterMouseAutism

#### Introduction

This project is an interactive web application coded in R for clustering mouse models of autism using neuroanatomical data. It makes use of the Shiny web application framework (a package in R). The app presents data from a research paper published in Nature Neuroscience (reference) entitled (reference).

#### Workflow

The app can be accessed in many ways. Options include:

- 1. Launching the app locally, assuming you have R installed
- download the app folder from GitHub
- launch R in the terminal or launch RStudio
- from within R, load the Shiny package and set your working directory to the folder *containing* the app folder you just downloaded:
  - setwd(insert folder containing app folder you just downloaded)
- launch the app with:
  - runApp(appDir = 'ClusterMouseAutism', launch.browser = TRUE, display.mode = 'normal'), which will launch the app in your default browser
- 2. Launch the app directly from GitHub
- use this command:
  - runGitHub(repo='ClusterMouseAutism', username='jeffbruce')
- this option distorts the style of the app for whatever reason
- 3. Access the app through the web
- the app is currently hosted on a private Shiny server which resides on a Linux virtual machine
- the app can be accessed by visiting the following site:

## **Dependencies**

- R packages:
  - shiny
  - gplots

#### Development Notes and Rationales

There's probably no point in giving the option to cluster by just 1 dimension, despite the option of doing so in the heatmap call, because the dimensions are clustered independently. The dendrograms don't make the plot significantly more difficult to read or anything.

#### Inspirations

- Devium Web (reference)
- Radiant (reference)

### TO DO

### Fix Bugs

- make the row/column dendrogram labels actually line up with the rows/columns
  - WAIT
  - maybe this bug doesn't exist on all browsers / displays
- verify that effect size calculations / data are correct
  - ask Jacob for original alleffects code
- heatmap doesn't immediately show up when you launch the app
  - WAIT
  - only resizing the window or clicking Recalculate makes the heatmap show the heatmap on the second page always shows
  - maybe wait on this bug until I've launched it to see if it exists in the launch version

### Lower Priority Issues

- ensure that the dendrogram lengths make sense
- improve y-axis scaling for bar plot
- "Warning: Stacking not well defined when ymin != 0"
- "Error in mousedata[isolate(input strains), input select BoxStrainRegion]"
- "ymax not defined: adjusting position using y instead"
  - only occurs for boxplots tried setting the ymax but it didn't work
  - the number of errors output multiplies by the number of subplots

#### Add Hosting

- bug Fernando about configuring VNC to allow me to launch graphical applications from the vm
- figure out how to host the app on a Linux server here
- 3 (4?) options:
  - can host on Github so R users can run the app directly from the R command line
  - can host on Shiny's public servers (shinyapps.io)
    - \* only professional version (\$3000 a year) offers custom domains, authentication of users, and free version only allows 10 applications, 50 active hours per month
  - can use a private ShinyServer hosted on a Linux server (there is a free version and a professional version)
    - \* main differences between free and (\$10000) paid version is that paid version allows multiple R processes per app, provides admin dashboard with performance data, and supports SSL/authentication
  - apparently the Shiny library comes with a web server, and is designed to only host one app at a time – maybe if we're only hosting one app then this would be easiest?
    - \* can this be done on a virtual machine? how to change the domain name?

#### Add New Features

- upgraded plots
  - upgraded violin plot to also include IQR and median which is standard in many violin plots?
  - bootstrapped violin plot (in general, page with bootstrapped means / effect sizes?)
  - change dot plot / bar plot to have standard error instead of standard deviation?
  - I need to understand bootstrapping better (more specifically, the conditions under which it fails)
- speed up bootstrapping somehow?
- show statistical tests?
- demonstrate bootstrapping on a separate Shiny page
- plot dashed line on effect size plot showing associated .05 p value?
- allow clustering by different methods by changing hclustfun? (e.g. Ward's, single-linkage, complete-linkage, top-down K-means?)
  - was this investigated in the paper to see if you could cluster the strains/regions into more meaningful groups with different clustering methods?
- allow other users to view/download the summary data?
- sort by a specific column or row and list correlations on side instead of dendrograms?
  - might be possible by supplying an argument to reorderfun
  - could be more interpretable by others
  - use pvclust to plot the actual appropriateness of the clusters
  - this doesn't seem very useful because you can infer the most similar strain directly from the length of the dendrogram branch
- provide user with a control to select groups of regions according to common attributes (gene models that affect the synapse, white matter / social perception & autonomic regulation, etc.)
- replace collaborator pdf summaries of scanned brains with generic Shiny app
- relate Shiny app to genetic information of the mouse models?
- add confidence of analysis as you change the number of strains / regions to cluster on?
- instead of weighting each brain region equally, allow user to add in their own weighting system, for example, where each region gets a weight corresponding to its size, or proportion of different cell types, etc.
  - but, total brain size isn't predictive on its own of autism so size isn't necessarily an interesting thing to cluster on
- group mouse models by differences in connectivity?
  - any papers that do this or groups working on this?
  - are we working on this with DTI data?
- any methods for combining multimodal data (neuroanatomical, genetic, behavioural) to subtype these models?
  - use something like PCA to predetermine how many clusters there might be?
- upgrade to heatmap.3 over heatmap.2?
  - what are the differences between these functions?
- in general, would be useful if more stats and code were on the micewiki
  - seems like people might be wasting time trying to find code templates in their own libraries, leading to sub-optimal ways of sharing code
  - i wonder if you can associate github repos to higher level repos for given users, so a lab can then search a collection of repos for the specific plot or function that they need

- given a dendrogram, can one break it out into an optimal number of clusters?
  - the length of a branch represents how similar the two rows/columns are
- best papers on the reliability of methods at MICe (there's that one MICe paper claiming that you need x number of subjects to maintain a given confidence level, which I need to read)

## Theoretical Quandaries Effect size calculation

• why always normalize by the wildtype group and not vice versa? basically the variance of one of the groups is ignored, which seems inappropriate to me.

### Bootstrapping in the paper

- used to determine the consistency of the clustering in the paper
- bootstrapped and calculated how often regions / groups were connected with each other
  - what does 'connected' mean here?
- what does this sentence mean: "Different group assumptions (+/- 1) and connection thresholds (+/-5%) were tested and the results were consistent"
- pvclust assesses clustering uncertainty via multiscale bootstrap resampling
- the hierarchical clustering method used was 'complete', and the distance metric was 'correlation' which used the Pearson method
- an alpha < 0.10 was used to determine the clusters

#### Verification of clusters section

• not exactly sure what's going on this paragraph