https://www.ncbi.nlm.nih.gov/geo/query/acc.cgi?acc=GSE4170 (https://www.ncbi.nlm.nih.gov/geo/query/acc.cgi?acc=GSE4170)

GEO has an integrated R script generator, so I installed R for Jupyter on my Mac (I already had R and Jupyter Notebooks, for Python, so it was pretty quick to do so:

- http://www.storybench.org/install-r-jupyter-notebook/ (http://www.storybench.org/install-r-jupyter-notebook/)
- https://medium.com/@kyleake/how-to-install-r-in-jupyter-with-irkernel-in-3-steps-917519326e41 (https://medium.com/@kyleake/how-to-install-r-in-jupyter-with-irkernel-in-3-steps-917519326e41)
- https://stackoverflow.com/questions/39008069/r-and-python-in-one-jupyter-notebook (https://stackoverflow.com/questions/39008069/r-and-python-in-one-jupyter-notebook)
- https://bioconductor.org/packages/release/bioc/html/Biobase.html (https://bioconductor.org/packages/release/bioc/html/Biobase.html)
- https://www.bioconductor.org/packages/release/bioc/html/GEOquery.html (https://www.bioconductor.org/packages/release/bioc/html/GEOquery.html)

First few lines of the GEO2R script, from GEO, involve loading R packages. In terminal, I had to install these packages in my conda environment before they would load here:

```
In [1]: suppressMessages(library(limma))
In [17]: system("conda env list", intern=TRUE)

'# conda environments:' '#' 'base /miniconda3'
    'sbmi5330 /miniconda3/envs/sbmi5330'
    'test-cf-r * /miniconda3/envs/test-cf-r' ''
```

In [19]: system("conda list", intern=TRUE)

'# packages in e	nvironment a	t /miniconda3/envs/test-cf-r:' '#'		
'# Name	Version	Build Channel'		
'_r-mutex	1.0.0	anacondar_1 '		
'appnope	0.1.0	py37_0 '		
'attrs	19.1.0	py37_1 ' 'backcall	0.1.0	py37_0 '
'bleach	3.1.0	py37_0 ' 'bwidget	1.9.11	1 '
'bzip2	1.0.6	h1de35cc_1002 conda-forge'		
'ca-certificates	2019.1.23 0 '			
'cairo	1.14.12	h9d4d9ac_1005 conda-forge'		
'cctools	895	h7512d6f_0 conda-forge		
'certifi	2019.3.9	py37_0 '		
'clang	4.0.1	h662ec87_0 conda-forge'		
'clang_osx-64	4.0.1	h1ce6c1d_11 '		
'clangxx	4.0.1	hc9b4283_0 '		
'clangxx_osx-64	4.0.1	h22b1bf0_11 '		
'compiler-rt	4.0.1	h5487866_0 conda-forge		
'curl	7.64.1	h22ea746_0 conda-forge'		
'dbus	1.13.6	h90a0687_0 '		
'decorator	4.4.0	py37_1 '		
'defusedxml	0.5.0	py37_1 '		
'entrypoints	0.3	py37_0 '		
'expat	2.2.6	h0a44026_0 '		
'fontconfig	2.13.1	h1027ab8_1000 conda-forge		
'freetype	2.10.0	h24853df_0 conda-forge'		
'gettext	0.19.8.1	h46ab8bc_1002 conda-forge		
'gfortran_osx-64	4.8.5	h22b1bf0_8 conda-forge		
'glib	2.56.2	h67dad55_1001 conda-forge'		
'graphite2	1.3.13	h2098e52_1000 conda-forge		
'harfbuzz	1.9.0	h9889186_1001 conda-forge'		
'icu	58.2	h0a44026_1000 conda-forge'		
'ipykernel	5.1.0	py37h39e3cac_0 '		
'ipython	7.4.0	py37h39e3cac_0 '		
'ipython_genutils	0.2.0	py37_0 '		
'ipywidgets	7.4.2	py37_0 ' 'jedi	0.13.3	py37_0 '
'jinja2	2.10	py37_0 '		
'jpeg	9c	h1de35cc_1001 conda-forge'		
'jsonschema	3.0.1	py37_0 '		
'jupyter	1.0.0	py37_7 '		
'jupyter_client	5.2.4	py37_0 '		
'jupyter_console	6.0.0	py37_0 '		
'jupyter_core	4.4.0	py37_0 '		
'krb5	1.16.3	hcfa6398_1001 conda-forge'		
'ld64	274.2	h7c2db76_0 conda-forge'		
'libcurl	7.64.1	h16faf7d_0 conda-forge'		
'libcxx	4.0.1	h579ed51_0 '		
'libcxxabi	4.0.1 hebd6815_0 '			
'libedit 3.1.20170329 hcfe32e1_1001 conda-forge'				
'libffi	3.2.1	h6de7cb9_1006 conda-forge'		

'libgfortran	3.0.1	0 conda-forge'		
'libiconv	1.15	h01d97ff_1005 conda-forge'		
'libpng	1.6.36	ha441bb4_1000 conda-forge		
'libsodium	1.0.16	h3efe00b_0 '		
'libssh2	1.8.2	hcdc9a53_1 conda-forge'		
'libtiff	4.0.10	h79f4b77_1001 conda-forge'		
'libxml2	2.9.8	hf14e9c8_1005 conda-forge'		
'llvm	4.0.1	hc748206_0 conda-forge		
'llvm-lto-tapi	4.0.1	h6701bc3_0 conda-forge'		
'llvm-openmp	4.0.1	hcfea43d_1 '		
'make	4.2.1	h1de35cc_2004 conda-forge'		
'markupsafe	1.1.1	py37h1de35cc_0 '		
'mistune	0.8.4	py37h1de35cc_0 '		
'nbconvert	5.4.1	py37_3 '		
'nbformat	4.4.0	py37_0 '		
'ncurses	6.1	h0a44026_1002 conda-forge'		
'notebook	5.7.6	py37_0 '		
'openssl	1.1.1b	h1de35cc_1 '		
'pandoc	2.2.3.2	0 '		
pandocfilters	1.4.2	py37_1 '		
'pango	1.40.14	h57a785b_1003 conda-forge		
'parso	0.3.4	py37_0 '		
'pcre	8.41	h0a44026_1003 conda-forge'		
'pexpect	4.6.0	py37_0 '		
'pickleshare	0.7.5	py37_0 '		
'pip	19.0.3	py37_0 '		
'pixman	0.34.0	h1de35cc_1003 conda-forge		
'prometheus_client 0.6.0 py37_0 '				
'prompt_toolkit	2.0.9	py37_0 '		
'ptyprocess	0.6.0	py37_0 '		
'pygments	2.3.1	py37_0 '		
'pyqt	5.9.2	py37h655552a_2 '		
'pyrsistent	0.14.11	py37h1de35cc_0 '		
'python	3.7.2	haf84260_0 '		
'python-dateutil	2.8.0	py37_0 '		
'pyzmq	17.1.2	py37h1de35cc_0 '		
'qt	5.9.7	h468cd18_1 '		
'qtconsole	4.4.3	py37_0 '		
'r-assertthat	0.2.0	r351hf348343_0 '		
'r-base	3.5.1	he1ce5cd_1005 conda-forge'		
'r-base64enc	0.1_3	r351h6402f54_4 '		
'r-bh	1.66.0_1	r351hf348343_0 '		
'r-bindr	0.1.1	r351hf348343_0 '		
'r-bindrcpp	0.2.2	r351h32998d9_0 '		
'r-cli	1.0.0	r351h6115d3f_0 '		
'r-crayon	1.3.4	r351hf348343_0 '		
'r-curl	3.2	r351h6402f54_0 '		
'r-digest	0.6.15	r351h6402f54_0 '		
'r-dplyr	0.7.6	r351h32998d9_0 '		

```
'r-evaluate
                    0.11
                                r351hf348343 0 '
'r-fansi
                  0.2.3
                              r351h6402f54 0 '
'r-glue
                  1.3.0
                              r351h6402f54_0 '
'r-htmltools
                    0.3.6
                                r351h32998d9_0 '
'r-httr
                 1.3.1
                             r351hf348343_0 '
'r-irdisplay
                   0.5.0
                               r351hf348343_0 '
'r-irkernel
                   0.8.12
                                    r351_0 '
'r-jsonlite
                  1.5
                              r351h6402f54 0 '
'r-magrittr
                   1.5
                               r351hf348343 4 '
                               r351h6402f54_0 '
'r-mime
                   0.5
'r-openssl
                    1.0.2
                                r351h46e59ec_1 '
                                  r351h32998d9 0 '
'r-pbdzmq
                     0.3 3
'r-pillar
                 1.3.0
                              r351hf348343 0 '
'r-pkgconfig
                    2.0.1
                                 r351hf348343_0 '
                               r351hf348343 0 '
'r-plogr
                  0.2.0
'r-purrr
                  0.2.5
                              r351h6402f54 0 '
                 2.2.2
'r-r6
                             r351hf348343_0 '
'r-rcpp
                  0.12.18
                                r351h32998d9_0 '
                               r351hf348343 0 '
'r-repr
                  0.15.0
'r-rlang
                  0.2.1
                              r351h6402f54 0 '
'r-stringi
                  1.2.4
                              r351h32998d9_0 '
                  1.3.1
'r-stringr
                               r351hf348343 0 '
'r-tibble
                  1.4.2
                              r351h6402f54_0 '
'r-tidyr
                  0.8.1
                              r351h32998d9 0 '
'r-tidyselect
                    0.2.4
                                r351h32998d9 0 '
                              r351h6402f54 0 '
'r-utf8
                  1.1.4
'r-uuid
                  0.1 2
                               r351h6402f54 4 '
                   7.0
'readline
                               hcfe32e1 1001 conda-forge'
'send2trash
                     1.5.0
                                      py37 0 '
'setuptools
                    40.8.0
                                      py37_0 '
'sip
                 4.19.8
                              py37h0a44026 0 '
'six
                                   py37 0 '
                 1.12.0
'sglite
                  3.26.0
                                 ha441bb4 0 '
'terminado
                    0.8.1
                                      py37 1 '
'testpath
                   0.4.2
                                    py37 0 '
'tk
                 8.6.9
                             ha441bb4_1001
                                               conda-forge'
                  2.10
'tktable
                                 h1de35cc 0 '
'tornado
                   6.0.2
                                py37h1de35cc 0 '
'traitlets
                  4.3.2
                                   py37 0 ' 'wcwidth
                                                                  0.1.7
                                                                                    py37 0 '
'webencodings
                       0.5.1
                                        py37_1 '
'wheel
                   0.33.1
                                    py37 0 '
                         3.4.2
'widgetsnbextension
                                          py37 0 '
                 5.2.4
                              h1de35cc 1001
                                                conda-forge'
'XZ
'zeromq
                    4.2.5
                                  h0a44026 1 '
'zlib
                 1.2.11
                              h1de35cc 1004 conda-forge'
```

```
In [22]: %R installed.packages()
        Error in parse(text = x, srcfile = src): <text>:1:1: unexpected input
         1: %R installed.packages()
         Traceback:
In [18]:
         suppressMessages(library(GEOquery))
        Error in library(GEOquery): there is no package called 'GEOquery'
         Traceback:
         1. suppressMessages(library(GEOquery))
         withCallingHandlers(expr, message = function(c) invokeRestart("muffl
        eMessage"))
         3. library(GEOquery)
         4. stop(txt, domain = NA)
 In [6]: # Version info: R 3.2.3, Biobase 2.30.0, GEOquery 2.40.0, limma 3.26.8
         # R scripts generated Thu Mar 28 01:28:39 EDT 2019
         Differential expression analysis with limma
         suppressMessages(library(Biobase))
         suppressMessages(library("GEOquery"))
         suppressMessages(library(limma))
        Error in library("GEOquery"): there is no package called 'GEOquery'
        Traceback:
         1. suppressMessages(library("GEOquery"))
         withCallingHandlers(expr, message = function(c) invokeRestart("muffl
         eMessage"))
         3. library("GEOquery")
         4. stop(txt, domain = NA)
 In [ ]: # load series and platform data from GEO
         gset <- getGEO("GSE4170", GSEMatrix =TRUE, AnnotGPL=TRUE) #Radich 2006</pre>
         if (length(gset) > 1) idx <- grep("GPL2029", attr(gset, "names")) else i</pre>
         dx < -1
         gset <- gset[[idx]]
```

In the web tool, marked the first 21 of 119 samples. The first 6 were labeled "cd" group, the next 15 labeled "ap" group. A third group, "bc" was created by not used for any samples.

The tool limits users to only 10 groups, because it encodes them as single digit integers:

Apply log transformation to the data: The GEO database accepts a variety of data value types, including logged and unlogged data. Limma expects data values to be in log space. To address this, GEO2R has an auto-detect feature that checks the values of selected Samples and automatically performs a log2 transformation on values determined not to be in log space. Alternatively, the user can select Yes to force log2 transformation, or No to override the auto-detect feature. The auto-detect feature only considers Sample values that have been assigned to a group, and applies the transformation in an all-or-none fashion.

```
In [ ]: # log2 transform
         ex <- exprs(gset)</pre>
         qx < -as.numeric(quantile(ex, c(0., 0.25, 0.5, 0.75, 0.99, 1.0), na.rm=T
         ))
         LogC <- (qx[5] > 100)
                    (qx[6]-qx[1] > 50 \&\& qx[2] > 0)
                    (qx[2] > 0 \& qx[2] < 1 \& qx[4] > 1 \& qx[4] < 2)
         if (LogC) \{ ex[which(ex \le 0)] \le NaN \}
           exprs(gset) <- log2(ex) }</pre>
         # set up the data and proceed with analysis
         sml <- paste("G", sml, sep="")</pre>
                                           # set group names
         fl <- as.factor(sml)</pre>
         gset$description <- fl</pre>
         design <- model.matrix(~ description + 0, gset)</pre>
         colnames(design) <- levels(fl)</pre>
         fit <- lmFit(gset, design)</pre>
         cont.matrix <- makeContrasts(G1-G0, levels=design)</pre>
         fit2 <- contrasts.fit(fit, cont.matrix)</pre>
         fit2 <- eBayes(fit2, 0.01)</pre>
         tT <- topTable(fit2, adjust="fdr", sort.by="B", number=250)
         #tT <- subset(tT, select=c("ID", "adj.P.Val", "P.Value", "F", "Gene.symbo
         1", "Gene.title"))
         #reselected columns, to include gene id and GO function ...
         tT <- subset(tT, select=c("ID", "adj.P.Val", "P.Value", "F", "Gene.symbol",
         "Gene.title", "Gene.ID", "GO.Function"))
         write.table(tT, file=stdout(), row.names=F, sep="\t")
```

Used a 2nd tab on the GEO2R tool to create a box plot. I think it added a 2nd half to the script for this plot as a result:

```
# Boxplot for selected GEO samples
       library(Biobase)
       library(GEOquery)
       # load series and platform data from GEO
       gset <- getGEO("GSE4170", GSEMatrix =TRUE, getGPL=FALSE)</pre>
       if (length(gset) > 1) idx <- grep("GPL2029", attr(gset, "names")) else i</pre>
       dx < -1
       gset <- gset[[idx]]</pre>
       # group names for all samples in a series
       sml < -c()
       for (i in 1:nchar(gsms)) { sml[i] <- substr(gsms,i,i) }</pre>
       sml <- paste("G", sml, sep="") set group names</pre>
       # eliminate samples marked as "X"
       sel <- which(sml != "X")</pre>
       sml <- sml[sel]</pre>
       gset <- gset[ ,sel]</pre>
       # order samples by group
       ex <- exprs(gset)[ , order(sml)]</pre>
       sml <- sml[order(sml)]</pre>
       fl <- as.factor(sml)</pre>
       labels <- c("cd", "ap", "bc")</pre>
       # set parameters and draw the plot
       palette(c("#dfeaf4","#f4dfdf","#f2cb98", "#AABBCC"))
       dev.new(width=4+dim(gset)[[2]]/5, height=6)
       par(mar=c(2+round(max(nchar(sampleNames(gset)))/2),4,2,1))
       title <- paste ("GSE4170", '/', annotation(gset), " selected samples", s
       boxplot(ex, boxwex=0.6, notch=T, main=title, outline=FALSE, las=2, col=f
       1)
       legend("topleft", labels, fill=palette(), bty="n")
```