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# R version 3.2.2 (2015-08-14)
# November 6, 2016. Mallory B. Lai.
# Reviewed by: TODO (Mallory B. Lai) : Find reviewer to proofread
# Practice using compcodeR package for simulating differential gene expression
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source("https://bioconductor.org/biocLite.R")
biocLite("compcodeR")
library(compcodeR)
library(baySeq)
library(edgeR)
library(data.table)
if(require("parallel")) cl <- makeCluster(8) else cl <- NULL</pre>
##### Generate simulated data. #####
# Generate synthetic data.
sim <- generateSyntheticData(dataset = "D1", n.vars = 12500,</pre>
                                   samples.per.cond = 5, n.diffexp = 1250,
                                   repl.id = 1, seqdepth = 1e7,
                                   fraction.upregulated = 0.5,
                                   between.group.diffdisp = FALSE,
                                   filter.threshold.total = 1,
                                   filter.threshold.mediancpm = 0,
                                   fraction.non.overdispersed = 0,
                                   output.file = "simD1.rds")
# Note: sim@variable.annotations holds list of differentially expressed genes.
# Store differentially expressed count matrix in a "simGenes" matrix.
simGenes <- sim@count.matrix</pre>
# Store gene annotations in "varAnnotations" matrix.
varAnnotations <- sim@variable.annotations</pre>
# Store sample annotations in "sampAnnotations" matrix.
sampAnnotations <- sim@sample.annotations</pre>
##### baySeq analysis #####
# Create count data object.
countData <- new('countData', data = simGenes, replicates = sampAnnotations$condition,</pre>
                 groups = list(NDE = rep(1, length(sampAnnotations$condition)),
                               DE = sampAnnotations$condition))
# Get libsizes.
libsizes(countData) <- getLibsizes(countData, estimationType = 'QL', cl=cl)</pre>
# Get priors.
countData <- getPriors.NB(countData, samplesize =12500,</pre>
                                  equalDispersions = TRUE, estimation = 'QL', cl = cl)
# Get likelihoods.
countData <- getLikelihoods(countData, cl=cl, verbose = FALSE)</pre>
##### Compare results #####
# Find the top counts for differentially expressed genes.
de <- topCounts(countData, group = "DE", FDR = .05, number = 1300)
# Convert the top counts matrix into a data table, keeping only the rownames,
# Likelihood, False Discovery Rate, and Ordering.
de <- data.table(rownames(de), de$Likelihood, de$FDR.DE, de$ordering)
# Rename the columns appropriately.
colnames(de) <- c("Gene", "Likelihood", "FDR", "Ordering")</pre>
# Set a key on the de datatable for gene name.
setkey(de, Gene)
# Convert the variable annotations for Up-and-Downregulated genes into a datatable.
deAnnotations <- data.table(sim@variable.annotations$upregulation,</pre>
                     sim@variable.annotations$downregulation,
                     rownames(sim@variable.annotations))
# Rename the columns appropriately.
colnames(deAnnotations) <- c("Upregulated", "Downregulated", "Gene")</pre>
# Set a key on the deAnnotations datatable for gene name.
setkey(deAnnotations, Gene)
# Align gene annotations with differentially expressed genes with a table join.
shared <- deAnnotations[detab]</pre>
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compcodeR.R

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# of differentially expressed genes.
dim(de)[1]/(sim@info.parameters$n.diffexp)
# Calculate the proportion of differentially expressed genes that
# were correctly identified as being up or downregulated.
(sum(shared$Upregulated==1 & shared$Ordering=="2>1")+
 sum(shared$Downregulated==1 & shared$Ordering=="1>2"))/dim(shared)[1]
# Calculate the proportion of correctly identified differentially expressed genes
# to the actual number of differentially expressed genes.
(sum(shared$Upregulated==1 & shared$Ordering=="2>1")+
 \verb|sum(shared$Downregulated==1 \& shared$Ordering=="1>2"))/(sim@info.parameters$n.diffexp)|
#### Now loop it. ####
##### Generate simulated data. #####
# Create a matrix to store results and name the columns.
resultsMatrix <- matrix(data = NA, nrow = 50, ncol = 7)
colnames(resultsMatrix) <- c("Simulation", "NumberOfGenes", "DEgenes", "Upregulated",
                          "TopCounts/DE", "Correct/TopCounts", "Correct/DE")
for (i in 1:100)
# Store simulation number in results matrix.
resultsMatrix[i, 1] <- i
# Create bounded random values for synthetic data.
nv <- sample(c(8000:12500), 1) # Number of genes.
{\tt n.d} \leftarrow {\tt runif(1, .05, .3)} \ \# \ {\tt Number of differentially expressed genes (DE genes).}
up <- runif(1, .45, .65) # Fraction of upregulated genes.
# Store number of genes and DE genes in results matrix.
resultsMatrix[i, 2] \leftarrow nv
resultsMatrix[i, 3] <- floor(nv*n.d)</pre>
resultsMatrix[i, 4] <- up
# Generate synthetic data.
sim <- generateSyntheticData(dataset = "D1", n.vars = nv,</pre>
                          samples.per.cond = 5, n.diffexp = n.d*nv,
                          repl.id = 1, seqdepth = 1e7,
                          fraction.upregulated = up,
                         between.group.diffdisp = FALSE,
                          filter.threshold.total = 1,
                          filter.threshold.mediancpm = 0,
                          fraction.non.overdispersed = 0,
                          output.file = "simD1.rds")
# Note: sim@variable.annotations holds list of differentially expressed genes.
# Store differentially expressed count matrix in a "simGenes" matrix.
simGenes <- sim@count.matrix
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varAnnotations <- sim@variable.annotations</pre>
# Store sample annotations in "sampAnnotations" matrix.
sampAnnotations <- sim@sample.annotations</pre>
##### baySeq analysis #####
# Create count data object.
countData <- new('countData', data = simGenes, replicates = sampAnnotations$condition,</pre>
               groups = list(NDE = rep(1, length(sampAnnotations$condition)),
                           DE = sampAnnotations$condition))
# Get libsizes.
libsizes(countData) <- getLibsizes(countData, estimationType = 'edgeR', cl=cl)</pre>
# Specify prior density to be zero-inflated negative binomial distribution.
densityFunction(countData) <- ZINBDensity</pre>
# Get priors.
countData <- getPriors.NB(countData, cl = cl)</pre>
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Calculate the proportion of top counts compared to actual number

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# Get likelihoods.
countData <- getLikelihoods(countData, cl=cl, verbose = FALSE)</pre>
##### Compare results #####
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de <- topCounts(countData, group = "DE", FDR = .05, number = 1300)
# Convert the top counts matrix into a data table, keeping only the rownames,
# Likelihood, False Discovery Rate, and Ordering.
de <- data.table(rownames(de), de$Likelihood, de$FDR.DE, de$ordering)</pre>
# Rename the columns appropriately.
colnames(de) <- c("Gene", "Likelihood", "FDR", "Ordering")</pre>
# Set a key on the de datatable for gene name.
setkey(de, Gene)
# Convert the variable annotations for Up-and-Downregulated genes into a datatable.
deAnnotations <- data.table(sim@variable.annotations$upregulation,
                             sim@variable.annotations$downregulation,
                             rownames(sim@variable.annotations))
# Rename the columns appropriately.
colnames(deAnnotations) <- c("Upregulated", "Downregulated", "Gene")</pre>
\# Set a key on the deAnnotations datatable for gene name.
setkey(deAnnotations, Gene)
# Align gene annotations with differentially expressed genes with a table join.
shared <- deAnnotations[de]</pre>
# Calculate the proportion of top counts compared to actual number
\# of differentially expressed genes.
resultsMatrix[i, 5] <- dim(de)[1]/(sim@info.parameters$n.diffexp)</pre>
# Calculate the proportion of differentially expressed genes that
# were correctly identified as being up or downregulated.
resultsMatrix[i, 6] <- (sum(shared$Upregulated==1 & shared$Ordering=="2>1")+
 sum(shared$Downregulated==1 & shared$Ordering=="1>2"))/dim(shared)[1]
# Calculate the proportion of correctly identified differentially expressed genes
# to the actual number of differentially expressed genes.
resultsMatrix[i, 7] <- (sum(shared$Upregulated==1 & shared$Ordering=="2>1")+
  sum(shared$Downregulated==1 & shared$Ordering=="1>2"))/(sim@info.parameters$n.diffexp)
write.csv(resultsMatrix,
          file = "C:/Users/Mallory/Documents/GitHub/Homework-Repo/compcodebaySeqZINBout2.csv")
```