

ExCluster package: Robust detection of differentially spliced genes in RNA-seq data

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1 Introduction

This vignette will detail the basic usage of the ExCluster package, both quickly and step-by-step. **IMPORTANT NOTE:** ExCluster will not function with a Windows operating system, and will only install on linux and MacOSX machines. Unfortunately, this package requires Rsubread, which is not available for Windows.

Before proteins may be produced from genes in our DNA, those genes are first transcribed into pre-messenger RNA (pre-mRNA). This pre-mRNA contains introns and exons, from which introns must be removed to produce mature mRNA; this process is called mRNA splicing. However, not all exons need be combined in the mature mRNA – some exons may be spliced out in different combinations. This process is known as alternative splicing, and it allows a single gene encode multiple protein coding transcripts, with roughly 20,000 protein coding genes producing nearly 200,000 protein coding transcripts.

Different cell types within a given organism may express different levels of mRNA transcripts, and may even express entirely different mRNA transcripts. When two different biological conditions, such as two cell types or two tissues, display differential transcript expression patterns, the genes encoding those transcripts are said to be differentially spliced. Indeed, differential regulation of mRNA splicing plays crucial roles in biology, such as regulating organism development, specifying tissue identity, and maintaining cell homeostasis. Aberrant regulation of mRNA splicing has also been observed in many cancers. Thus, having the proper tools to detect differentially spliced genes in RNA-seq datasets is crucial to studying these facets of biology with high-throughput RNA-seq data.

The ExCluster package allows users to detect differentially spliced genes between two conditions of RNA-seq data, and also allows for the visualization of differential exon expression within significantly differentially spliced genes. ExCluster requires at least two biological replicates per condition, and requires exactly two conditions per analysis.

ExCluster has been designed to more robustly detect differentially spliced genes than do previous established differential splicing tools. ExCluster also more accurately tunes statistics, to reduce the number of false positives when using the typical 0.05 FDR cutoff.

2 Quick ExCluster analysis pipeline

This section assumes some familiarity with R and programming in general, and has much less explanation. If you are confused, please read the detailed step-by-step guide for a basic ExCluster analysis. Also, you can refer to the ExCluster manual, which contains details on ExCluster functions and their inputs.

To start, we run `GFF_convert` on our GTF file, saving the GFF file, both of which require file paths to be set to variables:

```
> library(ExCluster)
> GTF_file <- "/path/to/file.gtf"
> GFF_file <- "/path/to/file.ExClust.gff"
> GFF <- GFF_convert(GTF.File=GTF_file, GFF.File=GFF_file)
```

We now have our GFF annotation data frame written out, and stored in the 'GFF' variable. We can now count reads per BAM file – but the described process requires only your BAM files of interest in the `bamDir` and sub-directories. We also name bam files with `sampleNames`. Then we run `processCounts`:

```
> bamDir <- "/path/to/bamDir/"
> bamFiles <- list.files(bamDir,full.names=TRUE, recursive=TRUE,
  pattern="*.bam")
> sampleNames <- c("hESC_cond1_rep1", "hESC_cond1_rep2", "hESC_cond1_rep3",
  "iPSC_cond2_rep1", "iPSC_cond2_rep2", "iPSC_cond2_rep3")
> normCounts <- processCounts(bam.Files=bamFiles, sample.Names=sampleNames,
  annot.GFF=GFF, pairedReads=TRUE)
```

Note: if you are counting paired-end reads, we use `pairedReads=TRUE`. If some or all of your samples are single-end, use `pairedReads=FALSE` (default if unset is `FALSE`). `processCounts` counts reads per exon bin from each BAM file and normalizes them for library size differences – we assign this output to the `normCounts` variable.

Now we can set up to run `ExCluster`, which requires condition numbers, and we should give it an `outDir` and `fileName` to write files to. We also want to plot our significant results, so we use `plot.Results=TRUE`. We do all of this as follows:

```

> condNums <- c(1,1,1,2,2,2)
> outDir <- "/path/to/ExClustResults/"
> fileName <- "hESC_vs_iPSC_ExClust_Results"
> ExClustResults <- ExCluster(exonCounts=normCounts, cond.Nums=condNums,
  annot.GFF=GFF, out.Dir=outDir, result.Filename=fileName,
  CombineExons=TRUE, plot.Results=TRUE)

```

This will run for several hours, and will output the results to the `ExClustResults` variable, as well as write those same results to `outDir/hESC_vs_iPSC_ExClust_Results.txt`. Additionally, all significantly differentially expressed genes will have their exon bin \log_2 FC means and variances plotted in a sub-folder of `outDir`.

The only additional note is the `CombineExons=TRUE` argument. Some exons are co-expressed always within a given gene, and can therefore be combined into a 'super-exon'. This increases the power of `ExCluster` and reduces computation time greatly. However, it may miss aberrant splicing events. If you suspect aberrant splicing, you can use `CombineExons=FALSE` (also `FALSE` by default if unset), and run the longer multi-hour `ExCluster` analysis.

This concludes the quick run explanation.

3 Detailed ExCluster pipeline explanation

This Vignette assumes that you have successfully installed `ExCluster` in R, using `Bioconductor`. If you have not yet installed `ExCluster` with `Bioconductor`, please try to run the following – when it asks you if you want to update [a/s/n] packages, type 'n' and hit enter:

```

> source("https://bioconductor.org/biocLite.R")
> biocLite("ExCluster")

```

If you have trouble installing `ExCluster`, please check that `bioconductor` installs properly and loads other packages. If only `ExCluster` has issues, please contact the package maintainer. Please also remember that `ExCluster` will not install properly on Windows, as it relies on the `Rsubread` package.

With `ExCluster` installed, we must now load the R package as follows:

```

> library(ExCluster)

```

The next step in the `ExCluster` pipeline is to take a GTF genome annotation file, and flatten it into a GFF file, containing non-overlapping exon bins. This is done using the

function `GFF_convert`. GTF files may be obtained from sources such as Ensembl, GENCODE, RefSeq, and UCSC. We strongly recommend using GENCODE GTF files, as they were used to test and develop ExCluster. Within the Stanford and Perkins labs, we have also had more successful bioinformatics analyses in general with GENCODE annotations. However, any GTF file from the above should work, so long as chromosome identifiers include 'chr'. This is important to note when using Ensembl GTF files, which come in two versions: those with chromosome identifiers of '1', '2', '3', etc., and those with identifiers of 'chr1', 'chr2', 'chr3', etc. – only the latter GTF files are confirmed to work properly with the ExCluster pipeline.

Before we run `GFF_convert`, we must specify the GTF file location, and we should also specify a GFF file location to write the output to. Saving GFF files is not necessary, as the GFF annotations can be carried through the pipeline if conducted in a single session. However, saving GFF files is good practice, in case data needs to be re-analyzed later on. Once a GFF file has been created, it may be re-used in future analyses.

We therefore set up variables to run the `GFF_convert` function as follows:

```
> GTF_file <- "/path/to/file.gtf"
> GFF_file <- "/path/to/file.ExClust.gff"
```

Experienced programmers and R users will understand what the above placeholder filepaths mean. If you are confused about the above example, I will use a more specific example: My username on MacOS is 'matanner', and my GFF file is called 'gencode.v23.annotation.gff'. The full path to my GTF file is:

```
/Users/matanner/Documents/gencode.v23.annotation.gtf
```

Now that our `GTF_file` and `GFF_file` variables are correctly set, we can run `GFF_convert`:

```
> GFF <- GFF_convert(GTF.File=GTF_file, GFF.File=GFF_file)
```

Once this last command is run, it will both assign the GFF annotation data frame to the `GFF` variable, and write out your GFF data frame to the `GFF_file` location. If you do not wish to write out GFF files, simply do not specify the `GFF.File` argument, which by default does not write out data.

We can now move forward and set up our exon bin read counting with the `processCounts` function. For this we need BAM files with two different conditions, and at least two biological replicates per condition. If you are new to analyzing RNA-seq data, and you only have raw fastq files, you will need to align your fastq files to obtain BAM files. This can be done with many programs, such as TopHat2, HISAT2, STAR, and BWA, among others. We recommend HISAT2 as an aligner, as ExCluster was tested with HISAT2

output – although HISAT2 only writes SAM files, which must be converted to BAM files with SAMtools.

Assuming you have your RNA-seq data aligned and in BAM file format, it is helpful if the exact BAM files you want to analyze are in a single folder (different sub-folders are okay). The most important point for this example is to have only your bam files of interest in your bamDir and its sub-folders. Assuming this is the case, we specify our BAM file paths into the 'bamFiles' variable, as follows:

```
> bamDir <- "/path/to/bamDir/"
> bamFiles <- list.files(bamDir, full.names=TRUE, recursive=TRUE,
  pattern="*.bam")
> print(bamFiles)
```

The last command should list your bamFiles if the process worked correctly. You should see exactly your BAM file paths of interest. If you have too many BAM files, or are missing BAM files, you may need to manually specify the paths in your bamFiles array. Please consult section 4 (after this section) for alternate ways to specify the bamFiles variable. If you see no BAM file paths printed out, you need to re-check and ensure you provided the exactly correct path to the folder containing your BAM files (folder and file paths are case sensitive).

With your BAMfiles correctly specified, we must now assign sample names to each bam file, in precise order. Sometimes BAM files will be named 'accepted_hits.bam', such as outputs from TopHat2. For this reason we specify exactly what we want each sample (BAM file) to be called in the exon bin count table. We specify sample names in the sampleNames variable. These names should not contain spaces – instead of spaces, use underscores `_`. It also helps to name your samples by condition name and number, and replicate number. For example, if we are comparing human embryonic stem cells (hESCs) to induced pluripotent stem cells (iPSCs), and we have 3 replicates per condition, we can name our samples as follows:

```
> sampleNames <- c("hESC_cond1_rep1", "hESC_cond1_rep2",
  "hESC_cond1_rep3", "iPSC_cond2_rep1", "iPSC_cond2_rep2",
  "iPSC_cond2_rep3")
```

This naming convention is helpful, because it clearly indicates both the name of the condition, and which condition is which number (which determines the direction of exon fold changes). It also unambiguously identifies replicates. Again, we must verify that this order of sample names matches the order of the bamFiles array, or we will have improperly named samples and thus an improper analysis.

With our setup complete, we can now run the `processCounts` function – let us assume we are counting paired-end read data, so we also specify `pairedReads=TRUE`:

```
> normCounts <- processCounts(bam.Files=bamFiles,  
  sample.Names=sampleNames, annot.GFF=GFF, pairedReads=TRUE)
```

Again, you will notice that we specified the `pairedReads=TRUE` argument, which is important when conducting `ExCluster` analyses on paired-end data. Unfortunately, `ExCluster` cannot currently accomodate mixed sample types. In other words, if some of your BAM files are paired-end, and some are single-end, we cannot specify different counting types. If some or all of your samples are single-end, you can set the `pairedReads=FALSE` argument. This is OK, as `processCounts` also normalizes library sizes, which should factor out much of the library size differences between the paired-end and single-end data.

The result of the above R command should give you a library size normalized exon bin count matrix, which is stored in the `normCounts` variable. To check this data frame, you should use `ncols()` and `nrows()` and have a number of columns equal to your number of BAM files, and roughly 500-600 thousand rows for human data. You should also sum your columns with `apply()`, and see millions of reads per column. These checks can be checked as follows:

```
> ncols(normCounts)  
> nrows(normCounts)  
> apply(normCounts,2,sum)
```

Assuming your `normCounts` read count data frame has counted properly, you may now proceed with the main function of this package, `ExCluster`! As before, we must set up some variables before we run our function. We must assign unique condition identifiers to the `condNums` variable, which correspond in exact order to your condition 1 and condition 2 samples in `normCounts` and `bamFiles`. For example, if your first 3 samples are condition 1, and your last 3 samples are condition 2, you could set up `condNums` as follows:

```
> condNums <- c(1,1,1,2,2,2)
```

If you have alternating samples in your `normCounts` data frame, you would use the following command:

```
> condNums <- c(1,2,1,2,1,2)
```

If you have more than two conditions, please only run `ExCluster` with 2 conditions at once. To compare multiple conditions, you will have to run `ExCluster` several times. Once you have ensured the correct columns in `normCounts` have been given the correct

condition numbers in `condNums`, we must specify a directory and file name to write out our `ExCluster` results. Writing out results is not absolutely necessary, but it is strongly advised. The `ExCluster` function can take hours to run, and therefore failing to save data could result in data loss, and the need to re-run the multi-hour analysis again. We specify an output folder and file name as follows:

```
> outDir <- "/Users/username/path/to/ExClustResults/"
> fileName <- "hESC_vs_iPSC_ExClust_Results"
```

Note, when you specify the `fileName` variable string, you need not include the file extension. By default, `ExCluster` will add `'txt'` as a file extension, and write a tab delimited file. We can now run the `ExCluster` function as follows, assigning the `ExCluster` results to the `ExClustResults` variable:

```
> ExClustResults <- ExCluster(exonCounts=normCounts, cond.Nums=condNums,
  annot.GFF=GFF, out.Dir=outDir, result.Filename=fileName,
  CombineExons=TRUE, plot.Results=TRUE)
```

You will notice that we specified two extra parameters: `CombineExons` and `plot.Results`. Both arguments must be set as logical `TRUE` or `FALSE` values. Anything else will likely throw an error, and `ExCluster` may fail. If they are not set when running `ExCluster`, both `CombineExons` and `plot.Results` default to `FALSE`.

Very briefly, some exons are always co-expressed together in transcripts. These exons can therefore be combined into 'super-exons', based on GFF transcript definitions. This increases the read depth of these exons and reduces their variance, giving more powerful statistical resolution. It also decreases the number of exons bins analyzed per gene, which greatly cuts down on computation time. HOWEVER, this may cause aberrant splicing events to become missed. If you suspect aberrant splicing may occur in your biological paradigm, MAKE SURE `CombineExons=FALSE`! However, if you are conducting a standard analysis where no aberrant splicing should occur, `CombineExons=TRUE` will result in greater power and faster computation completion.

The `plotExonlog2FC` function may be called from within `ExCluster` to save extra lines of commands to the pipeline – this is done by setting `plot.Results=TRUE`. Here, all genes equal to or less than an FDR cutoff will be called significant, and plotted in a sub-folder of the `ExCluster` results directory (`outDir`). By default the `FDR.cutoff = 0.05`, however you may specify as low as `FDR.cutoff=0.01` and as high as `FDR.cutoff=0.2` as an extra argument when running `ExCluster`. You may also run `plotExonlog2FC` on its own. See the manual for more details.

This concludes the step-by-step, detailed explanation of the `ExCluster` pipeline.

4 Custom bamFiles variable assignment

Assuming that you cannot have all of your BAM files exclusively within a given folder, you can manually set your bamFiles array by entering the paths to your BAM files one by one. This is done as follows:

```
> bamFiles <- c("/path/to/cond1_rep1.bam",
  "/path/to/cond1_rep2.bam",
  "/path/to/cond1_rep3.bam",
  "/path/to/cond2_rep1.bam",
  "/path/to/cond2_rep2.bam",
  "/path/to/cond2_rep3.bam")
```

Just as a reminder, if my username is 'matanner' on a Mac OS system, the full path to my first BAM file might be `"/Users/matanner/Documents/iPSC_RNAseq/hESC_cond1_rep2.bam"`

In this way, you must specify the exact filepath of each BAM file, and ensure that file path is valid. Although slow, this method offers greater control over your analysis.

5 Running ExCluster "toy dataset" examples to test package functionality

The ExCluster package contains a small dataset for 3 genes, with 4 BAM files split evenly between two conditions. This toy dataset also includes sub-sampled GTF and GFF files, as well as various ExCluster results objects. If you are having trouble executing ExCluster functions, or simply wish to test the functionality of the package, you may use the following examples to test each function:

First we test the GFF_convert function, which takes a GTF file input and flattens it into a GFF file. We run the code as follows:

```
> library(ExCluster)
> # load the sub-sampled GTF file path from the ExCluster package
> GTF_file <- system.file("extdata", "sub_gen.v23.gtf", package = "ExCluster")
> # now run GTF_file without assigning a GFF_file to write out, assigning the results to the GFF object
> GFF <- GFF_convert(GTF.File=GTF_file)
```

Next we can run the processCounts function on the small BAM file dataset as follows:

```
> library(ExCluster)
> # specify the path to the ExCluster package
> ExClust_Path <- system.file(package="ExCluster")
> # now find the bam files within that folder
```



```

> bamFiles <- list.files(ExClust_Path,recursive=TRUE,pattern="*.bam",full.names=TRUE)
> # now grab the path to the sub-sampled example GFF file
> GFF_file <- system.file("extdata","sub_gen.v23.ExClust.gff",package="ExCluster")
> # assign sample names (only 2 replicates per condition in this example)
> sampleNames <- c("iPSC_cond1_rep1","iPSC_cond1_rep2","iPSC_cond2_rep1","iPSC_cond2_rep2")
> # now run processCounts, with pairedReads=TRUE because we are counting paired-end data
> normCounts <- processCounts(bam.Files=bamFiles, sample.Names=sampleNames, GFF.File=GFF_file, pairedReads=TRUE)

```

```

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Rsubread 1.28.1

```

```

//===== featureCounts setting =====\\
||
||      Input files : 4 BAM files
||      P /home/matanner/R/x86_64-pc-linux-gnu-libra ...
||      P /home/matanner/R/x86_64-pc-linux-gnu-libra ...
||      P /home/matanner/R/x86_64-pc-linux-gnu-libra ...
||      P /home/matanner/R/x86_64-pc-linux-gnu-libra ...
||
||      Dir for temp files : .
||      Threads : 1
||      Level : meta-feature level
||      Paired-end : yes
||      Strand specific : stranded
||      Multimapping reads : not counted
||      Multi-overlapping reads : counted
||      Min overlapping bases : 1
||
||      Chimeric reads : counted
||      Both ends mapped : not required
||
||
||===== http://subread.sourceforge.net/ =====\\

```

```

//===== Running =====\\
||
||      Load annotation file ./Rsubread_UserProvidedAnnotation_pid5599 ...
||      Features : 19
||      Meta-features : 19
||      Chromosomes/contigs : 1
||
||      Process BAM file /home/matanner/R/x86_64-pc-linux-gnu-library/3.4/ExCl ...
||      Paired-end reads are included.
||      Assign fragments (read pairs) to features...
||
||      WARNING: reads from the same pair were found not adjacent to each
||      other in the input (due to read sorting by location or
||      reporting of multi-mapping read pairs).
||
||      Read re-ordering is performed.
||
||      Total fragments : 920
||      Successfully assigned fragments : 389 (42.3%)
||      Running time : 0.00 minutes
||
||      Process BAM file /home/matanner/R/x86_64-pc-linux-gnu-library/3.4/ExCl ...
||      Paired-end reads are included.
||      Assign fragments (read pairs) to features...
||
||      WARNING: reads from the same pair were found not adjacent to each

```

```

||         other in the input (due to read sorting by location or ||
||         reporting of multi-mapping read pairs).                ||
||                                                                 ||
|| Read re-ordering is performed.                                  ||
||                                                                 ||
|| Total fragments : 619                                           ||
|| Successfully assigned fragments : 197 (31.8%)                   ||
|| Running time : 0.00 minutes                                     ||
||                                                                 ||
|| Process BAM file /home/matanner/R/x86_64-pc-linux-gnu-library/3.4/ExCl ... ||
|| Paired-end reads are included.                                  ||
|| Assign fragments (read pairs) to features...                   ||
||                                                                 ||
|| WARNING: reads from the same pair were found not adjacent to each ||
||         other in the input (due to read sorting by location or ||
||         reporting of multi-mapping read pairs).                ||
||                                                                 ||
|| Read re-ordering is performed.                                  ||
||                                                                 ||
|| Total fragments : 960                                           ||
|| Successfully assigned fragments : 158 (16.5%)                   ||
|| Running time : 0.00 minutes                                     ||
||                                                                 ||
|| Process BAM file /home/matanner/R/x86_64-pc-linux-gnu-library/3.4/ExCl ... ||
|| Paired-end reads are included.                                  ||
|| Assign fragments (read pairs) to features...                   ||
||                                                                 ||
|| WARNING: reads from the same pair were found not adjacent to each ||
||         other in the input (due to read sorting by location or ||
||         reporting of multi-mapping read pairs).                ||
||                                                                 ||
|| Read re-ordering is performed.                                  ||
||                                                                 ||
|| Total fragments : 920                                           ||
|| Successfully assigned fragments : 138 (15.0%)                   ||
|| Running time : 0.00 minutes                                     ||
||                                                                 ||
|| Read assignment finished.                                       ||
||                                                                 ||
||\===== http://subread.sourceforge.net/ =====//

```

Running library size normalization...

The main function of the package, ExCluster, can be tested with the following code:

```

> library(ExCluster)
> # specify the path to the normCounts file in the ExCluster package
> countsPath<- system.file("extdata","normCounts.txt",package="ExCluster")
> # now read in the normCounts.txt file
> normCounts <- read.table(file=countsPath,header=TRUE,row.names=1,stringsAsFactors=FALSE)
> # now grab the path to the sub-sampled example GFF file
> GFF_file <- system.file("extdata","sub_gen.v23.ExClust.gff",package="ExCluster")
> # assign condition numbers to your samples (we have 4 samples, 2 replicates per condition)
> condNums <- c(1,1,2,2)
> # now we run ExCluster, assigning its output to the ExClustResults variable
> # we are not writing out the ExClustResults table, nor are we plotting exons
> # we also use CombineExons=TRUE, since we are conducting a standard analysis
> ExClust_Results <- ExCluster(exonCounts=normCounts,cond.Nums=condNums,GFF.File=GFF_file,CombineExons=TRUE)

Initializing ...

```

Reading in data ...
Combining common exons ...
Pre-processing data ...
Running main ExCluster module (very long) ...
Running statistical tests ...
Final ExCluster data organization & output ...

Lastly, we can test the exon log2FC plotting function plotExonlog2FC as follows:

```
> library(ExCluster)
> # grab the file path to sub-sampled results from an ExCluster function analysis
> ExClust_respath <- system.file("extdata", "sub_ExClust_results.txt", package="ExCluster")
> # load this data into R
> ExClust_Results <- read.table(file=ExClust_respath, sep="\t", header=TRUE, row.names=1, stringsAsFactors=FALSE)
> # now we must specify a directory to write images to
> outDir <- paste(system.file(package="ExCluster"), "/extdata/Images/", sep="")
> # now we can run our exon log2FC plotting function
> plotExonlog2FC(results.Data=ExClust_Results, out.Dir=outDir)
```

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