# Package 'polyester'

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Maintainer Alyssa Frazee <alyssa.frazee@gmail.com>, Jeff Leek</alyssa.frazee@gmail.com>
<jtleek@gmail.com></jtleek@gmail.com>
Author Alyssa C. Frazee, Andrew E. Jaffe, Jeffrey T. Leek
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Title Simulate RNA-seq reads
<b>Description</b> This package can be used to simulate RNA-seq reads from differential expression experiments with replicates. The reads can then be aligned and used to perform comparisons of methods for differential expression.
VignetteBuilder knitr
<b>Depends</b> R (>= $3.0.0$ )
Imports Biostrings (>= 2.32.0), IRanges, S4Vectors
Suggests knitr, ballgown
biocViews Sequencing, DifferentialExpression
R topics documented:
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add\_error

add sequencing error to simulated reads

#### **Description**

simulate sequencing error by randomly changing the sequenced nucleotide on some of the reads

## Usage

```
add_error(tFrags, error_rate = 0.005)
```

#### Arguments

tFrags DNAStringSet representing sequencing reads

error\_rate error probability

#### Value

DNAStringSet equivalent to tFrags but with random sequencing errors inserted

## **Examples**

```
require(Biostrings)
  data(srPhiX174)
  set.seed(174)
  srPhiX174_withError = add_error(srPhiX174)
  #error was introduced in, e.g., position 10 of 2nd string in set.
```

count\_transcripts

determine how many transcripts are annotated in a FASTA or GTF file

## **Description**

determine how many transcripts are annotated in a FASTA or GTF file

```
count_transcripts(f, fasta = TRUE, identifier = "transcript_id",
  attrsep = "; ")
```

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#### **Arguments**

f	character, path to a file in FASTA or GTF format
fasta	TRUE if f is a fasta file; FALSE if f is a GTF file

identifier if f is a GTF file, how are transcripts identified in the attributes field (9th column)

of the file? Default transcript\_id.

attrsep if f is a GTF file, how are attributes separated in the attributes field (9th column)

of the file? Default "; ".

## Value

Number of transcripts annotated in f

## **Examples**

```
fastapath = system.file("extdata", "chr22.fa", package="polyester")
count_transcripts(fastapath) #918
```

create\_read\_numbers

Generate a simulated data set based on known model parameters

#### **Description**

Generate a simulated data set based on known model parameters

## Usage

```
create_read_numbers(mu, fit, p0, m = NULL, n = NULL, mod = NULL,
  beta = NULL, seed = NULL)
```

#### **Arguments**

mu	Baseline mean expression for negative binomial model
fit	Fitted relationship between log mean and log size
p0	A vector of the probabilities a count is zero
m	Number of genes/transcripts to simulate (not necessary if mod, beta are specified)
n	Number of samples to simulate (not necessary if mod, beta are specified)
mod	Model matrix you would like to simulate from without an intercept
beta	set of coefficients for the model matrix (must have same number of columns as mod)
seed	optional seed to set (for reproducibility)

#### Value

counts Data matrix with counts for genes in rows and samples in columns

fpkm\_to\_counts

#### Author(s)

Jeff Leek

#### **Examples**

fpkm\_to\_counts

Turn FPKMs from a ballgown object into estimated counts for transcripts

## **Description**

Turn FPKMs from a ballgown object into estimated counts for transcripts

#### **Usage**

```
fpkm_to_counts(bg, mean_rps = 1e+08, threshold = 0)
```

#### **Arguments**

bg ballgown object created from real RNA-seq dataset

mean\_rps This should be the number of reads per sample in total for use in backing out the

FPKM calculations

threshold only estimate parameters from transcripts with mean FPKM measurements larger

than threshold

#### Value

A matrix of counts with the same number of rows and columns as the ballgown object

## Author(s)

Jeff Leek

## **Examples**

```
library(ballgown)
  data(bg)
  countmat = fpkm_to_counts(bg, mean_rps=400000)
```

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generate_fragments generate a set of fragments from a set of transcripts	
--	--

## Description

Convert each sequence in a DNAStringSet to a "fragment" (subsequence)

## Usage

```
generate_fragments(t0bj, fraglen, fragsd = 25)
```

## **Arguments**

t0bj DNAStringSet of sequences from which fragments should be extracted

fraglen Mean fragment length.

fragsd Standard deviation of fragment length. Fragment lengths are drawn from a nor-

mal distribution with mean fraglen and standard deviation fragsd.

#### Value

DNAStringSet consisting of one randomly selected subsequence per element of t0bj.

## **Examples**

```
library(Biostrings)
  data(srPhiX174)
  set.seed(174)
  srPhiX174_fragments = generate_fragments(srPhiX174, fraglen=15, fragsd=3)
  srPhiX174_fragments
  srPhiX174
```

getAttributeField extract a specific field of the "attributes" column of a data frame created from a GTF/GFF file

#### **Description**

extract a specific field of the "attributes" column of a data frame created from a GTF/GFF file

```
getAttributeField(x, field, attrsep = "; ")
```

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## **Arguments**

X	vector representing the "attributes" column of GTF/GFF file
field	name of the field you want to extract from the "attributes" column
attrsep	separator for the fields in the attributes column. Defaults to '; ', the separator for GTF files outputted by Cufflinks.
	O 11 mes outputted by Cummiss.

#### Value

vector of nucleotide positions included in the transcript

#### Author(s)

Wolfgang Huber, in the davidTiling package (LGPL license)

#### See Also

http://useast.ensembl.org/info/website/upload/gff.html, for specifics of the GFF/GTF
file format.

## **Examples**

```
library(ballgown)
  gtfPath = system.file(extdata, annot.gtf.gz, package=ballgown)
  gffdata = gffRead(gtfPath)
  gffdata$transcriptID = getAttributeField(gffdata$attributes,
    field = "transcript_id")
```

get\_params

Estimate zero-inflated negative binomial parameters from a real dataset

## **Description**

This function estimates the parameters of a zero inflated negative binomial distribution based on a real count data set based on the method of moments. The function also returns a spline fit of log mean to log size which can be used when generating new simulated data.

## Usage

```
get_params(counts, threshold = NULL)
```

## Arguments

counts A matrix of counts. If you want to simulate from a ballgown object, see fpkm\_to\_counts

threshold Only estimate parameters from transcripts with row means greater than thresh-

old

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#### Value

p0 A vector of probabilities that the count will be zero, one for each gene/transcript. mu The estimated negative binomial mean by method of moments for the non-zero counts size The estimated negative binomial size by method of moments for the non-zero counts fit A fit relating log mean to log size for use in simulating new data.

#### Author(s)

Jeff Leek

## **Examples**

```
library(ballgown)
  data(bg)
  countmat = fpkm_to_counts(bg, mean_rps=400000)
  params = get_params(countmat)
```

get\_reads

get sequencing reads from fragments

## **Description**

simulate the sequencing process by returning the sequence of one or both ends of provided fragments

#### Usage

```
get_reads(tFrags, readlen, paired = TRUE)
```

## **Arguments**

tFrags DNAStringSet representing fragments

readlen Read length.

paired If FALSE, return only the first readlen bases of each element of tFrags in the

result; if TRUE, also return last readlen bases.

#### Value

DNAStringSet representing simulated RNA-seq reads

#### See Also

```
simulate_experiment, simulate_experiment_countmat
```

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#### **Examples**

```
library(Biostrings)
  data(srPhiX174)
  set.seed(174)
  srPhiX174_reads = get_reads(srPhiX174, readlen=15, paired=FALSE)
  srPhiX174_reads
# set of single-end, 15bp reads, treating srPhiX174 as the fragments
```

gtf\_dataframe

data frame (in gtf-inspired format) for chromosome 22, hg19

## **Description**

In the data frame gtf\_dataframe, each row corresponds to an exon / coding sequence / start codon / stop codon, and the columns correspond to standard GTF columns denoting annotated genomic features. See http://www.ensembl.org/info/website/upload/gff.html.

#### **Format**

data frame, 9 columns, 17769 rows

#### **Source**

Illumina iGenomes, hg19, 6 March 2013 version: http://ccb.jhu.edu/software/tophat/igenomes.shtml.

NΒ

Draw nonzero negative binomial random numbers

## **Description**

Draw nonzero negative binomial random numbers

## Usage

```
NB(basemeans, size, seed = NULL)
```

## Arguments

basemeans vector of means, one per draw

size vector of size parameters (controlling the mean/variance relationship); one per

draw

seed optional seed to set before drawing

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#### Value

vector of negative binomial draws from specified distributions, where any zero draw is replaced with a 1. Length of return vector is equal to length(basemeans).

## **Examples**

```
## Not run:
    randomNBs = NB(c(100, 4, 29), size=c(50, 2, 4), seed=21)
    randomNBs # 115, 5, 15
## End(Not run)
```

polyester

Polyester: simulating RNA-seq reads including differential expression

## **Description**

Polyester is an R package designed to simulate an RNA sequencing experiment. Given a set of annotated transcripts, polyester will simulate the steps of an RNA-seq experiment (fragmentation, reverse-complementing, and sequencing) and produce files containing simulated RNA-seq reads. Simulated reads can be analyzed using any of several downstream analysis tools.

#### **Details**

A single function call produces RNA-seq reads in FASTA format from a case/control experiment including biological replicates. Differential expression between cases and controls can be set by the user, facilitating comparisons of statistical differential expression methods for RNA-seq data. See detailed documentation for simulate\_experiment and simulate\_experiment\_countmat.

See the vignette by typing browseVignettes("polyester") in the R prompt.

#### Author(s)

Andrew Jaffe, Alyssa Frazee, Jeff Leek

#### References

Alyssa C Frazee, Geo Pertea, Andrew E Jaffe, Ben Langmead, Steven L Salzberg, Jeffrey T Leek (2014). Flexible isoform-level differential expression analysis with Ballgown. BioRxiv preprint: http://biorxiv.org/content/early/2014/03/30/003665.

seq\_gtf

reverse\_complement

reverse-complement some fragments

## Description

randomly reverse-complement half of the sequences in a DNAStringSet

## Usage

```
reverse_complement(tObj, seed = NULL)
```

## **Arguments**

t0bj DNAStringSet representing sequences.

seed optional seed to set before randomly selecting the sequences to be reverse-

complemented.

#### Value

DNAStringSet that is the same as t0bj, but with about half the sequences reverse-complemented.

## Examples

```
library(Biostrings)
  data(srPhiX174)
  srPhiX174_halfrc = reverse_complement(srPhiX174, seed=174)
```

seq\_gtf

Get transcript sequences from GTF file and sequence info

## **Description**

Given a GTF file (for transcript structure) and DNA sequences, return a DNAStringSet of transcript sequences

```
seq_gtf(gtf, seqs, exononly = TRUE, idfield = "transcript_id",
  attrsep = "; ")
```

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## **Arguments**

gtf	one of path to GTF file, or data frame representing a canonical GTF file.
seqs	one of path to folder containing one FASTA file (.fa extension) for each chromosome in gtf, or named DNAStringSet containing one DNAString per chromosome in gtf, representing its sequence. In the latter case, names(seqs) should contain the same entries as the seqnames (first) column of gtf.
exononly	if TRUE (as it is by default), only create transcript sequences from the features labeled exon in gtf. $ \\$
idfield	in the attributes column of gtf, what is the name of the field identifying transcripts? Should be character. Default "transcript_id".
attrsep	in the attributes column of gtf, how are attributes separated? Default "; ".

#### Value

DNAStringSet containing transcript sequences, with names corresponding to idfield in gtf

#### References

```
http://www.ensembl.org/info/website/upload/gff.html
```

## **Examples**

```
library(Biostrings)
  load(url(http://biostat.jhsph.edu/~afrazee/chr22seq.rda))
  data(gtf_dataframe)
  chr22_processed = seq_gtf(gtf_dataframe, chr22seq)
```

simulate\_experiment

simulate RNA-seq experiment using negative binomial model

## **Description**

create FASTA files containing RNA-seq reads simulated from provided transcripts, with optional differential expression between two groups

```
simulate_experiment(fasta = NULL, gtf = NULL, seqpath = NULL,
  num_reps = 10, fraglen = 250, fragsd = 25, readlen = 100,
  error_rate = 0.005, paired = TRUE, reads_per_transcript = 300,
  fold_changes, size = NULL, outdir = ".", write_info = TRUE,
  transcriptid = NULL, seed = NULL, ...)
```

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#### **Arguments**

fasta path to FASTA file containing transcripts from which to simulate reads. See

details.

gtf path to GTF file containing transcript structures from which reads should be

simulated. See details.

segpath path to folder containing one FASTA file (.fa extension) for each chromosome

in gtf. See details.

num\_reps How many biological replicates should be in each group? If num\_reps is a

single integer, num\_reps replicates will be simulated in each group. Otherwise, num\_reps can be a length-2 vector, where num\_reps[1] and num\_reps[2] repli-

cates will be simulated in each of the two groups.

fraglen Mean RNA fragment length. Sequences will be read off the end(s) of these

fragments.

fragsd Standard deviation of fragment lengths.

readlen Read length.

error\_rate Sequencing error rate. Must be between 0 and 1. A uniform error model is

assumed.

paired If TRUE, paired-end reads are simulated; else single-end reads are simulated.

reads\_per\_transcript

seed

baseline mean number of reads to simulate from each transcript. Can be an integer, in which case this many reads are simulated from each transcript, or an

integer vector whose length matches the number of transcripts in fasta.

fold\_changes Vector of multiplicative fold changes between groups, one entry per transcript

in fasta. A fold change > 1 means the transcript is overexpressed in the first num\_reps (or num\_reps[1]) samples. Fold change < 1 means transcript is overexpressed in the last num\_reps (or num\_reps[2]) samples. The change is in the

mean number of reads generated from the transcript, between groups.

size the negative binomial size parameter (see NegBinomial) for the number of

reads drawn per transcript. If left blank, defaults to reads\_per\_transcript / 3. Negative binomial variance is mean + mean^2 / size. Can either be left at default, a vector of the same length as number of transcripts in fasta, if the two groups should have the same size parameters, or a list with 2 elements, each of which is a vector with length equal to the number of transcripts in fasta, which represent the size parameters for each transcript in groups 1 and 2, respectively.

outdir character, path to folder where simulated reads should be written, with \*no\*

slash at the end. By default, reads are written to current working directory.

write\_info If TRUE, write a file matching transcript IDs to differential expression status into

the file outdir/sim\_info.txt.

transcriptid optional vector of transcript IDs to be written into sim\_info.txt and used as

transcript identifiers in the fasta files. Defaults to names(readDNAStringSet(fasta)). This option is useful if default names are very long or contain special characters.

Optional seed to set before simulating reads, for reproducibility.

... additional arguments to pass to seq\_gtf if using gtf and seqpath

#### **Details**

Reads can either be simulated from a FASTA file of transcripts (provided with the fasta argument) or from a GTF file plus DNA sequences (provided with the gtf and seqpath arguments). Simulating from a GTF file and DNA sequences may be a bit slower: it took about 6 minutes to parse the GTF/sequence files for chromosomes 1-22, X, and Y in hg19.

#### Value

No return, but simulated reads and a simulation info file are written to outdir.

#### **Examples**

```
## simulate a few reads from chromosome 22

fastapath = system.file("extdata", "chr22.fa", package="polyester")
numtx = count_transcripts(fastapath)
set.seed(4)
fold_changes = sample(c(0.5, 1, 2), size=numtx,
    prob=c(0.05, 0.9, 0.05), replace=TRUE)
library(Biostrings)
# remove quotes from transcript IDs:
tNames = gsub("", "", names(readDNAStringSet(fastapath)))
simulate_experiment(fastapath, reads_per_transcript=10,
    fold_changes=fold_changes, outdir=simulated_reads,
    transcriptid=tNames, seed=12)
```

#### Description

create FASTA files containing RNA-seq reads simulated from provided transcripts, with optional differential expression between two groups (designated via read count matrix)

```
simulate_experiment_countmat(fasta = NULL, gtf = NULL, seqpath = NULL,
readmat, outdir = ".", fraglen = 250, fragsd = 25, readlen = 100,
error_rate = 0.005, paired = TRUE, seed = NULL, ...)
```

#### **Arguments**

fasta	path to FASTA file containing transcripts from which to simulate reads. See details.
gtf	path to GTF file containing transcript structures from which reads should be simulated. See details.
seqpath	path to folder containing one FASTA file ( $\ldotp$ fa extension) for each chromosome in gtf. See details.
readmat	matrix with rows representing transcripts and columns representing samples. Entry i,j specifies how many reads to simulate from transcript i for sample j.
outdir	character, path to folder where simulated reads should be written, without a slash at the end of the folder name. By default, reads written to the working directory.
fraglen	Mean RNA fragment length. Sequences will be read off the end(s) of these fragments.
fragsd	Standard deviation of fragment lengths.
readlen	Read length
error_rate	Sequencing error rate. Must be between 0 and 1. A uniform error model is assumed.
paired	If TRUE, paired-end reads are simulated; else single-end reads are simulated.
seed	Optional seed to set before simulating reads, for reproducibility.
	Further arguments to pass to seq_gtf, if gtf is not NULL.

## **Details**

Reads can either be simulated from a FASTA file of transcripts (provided with the fasta argument) or from a GTF file plus DNA sequences (provided with the gtf and seqpath arguments). Simulating from a GTF file and DNA sequences may be a bit slower: it took about 6 minutes to parse the GTF/sequence files for chromosomes 1-22, X, and Y in hg19.

## Value

No return, but simulated reads are written to outdir.

## **Examples**

```
fastapath = system.file("extdata", "chr22.fa", package="polyester")
numtx = count_transcripts(fastapath)
readmat = matrix(20, ncol=10, nrow=numtx)
readmat[1:30, 1:5] = 40

simulate_experiment_countmat(fasta=fastapath,
    readmat=readmat, outdir=simulated_reads_2, seed=5)
```

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write_reads write sequencing reads to disk
--

## **Description**

given a DNAStringSet representing simulated sequencing reads, write FASTA files to disk representing the simulated reads.

## Usage

```
write_reads(reads, fname, readlen, paired = TRUE)
```

#### **Arguments**

reads DNAStringSet representing sequencing reads

fname file path/prefix specifying where sequencing reads should be written. Should

not contain ".fasta" (this is appended automatically).

readlen maximum length of the reads in reads.

paired If TRUE, reads are assumed to be in pairs: i.e., read 1 and read 2 in reads are

the left and right mate (respectively) of a read pair; same with read 3 and read 4, etc. The odd-numbered reads are written to fname\_1.fasta and the even-numbered reads are written to fname\_2.fasta. If FALSE, reads are assumed to

be single-end and just one file, fname. fasta, is written.

#### **Details**

The get\_reads function returns a DNAStringSet object representing sequencing reads that can be directly passed to write\_reads. If output other than that from get\_reads is used and paired is TRUE, make sure reads is ordered properly (i.e., that mate pairs appear together and that the left mate appears first).

#### Value

No return, but FASTA file(s) containing the sequences in reads are written to fname.fasta (if paired is FALSE) or fname\_1.fasta and fname\_2.fasta if paired is TRUE.

#### See Also

```
get_reads
```

## **Examples**

```
library(Biostrings)
  data(srPhiX174) # pretend srPhiX174 represents a DNAStringSet of *reads*
  readlen = unique(width(srPhiX174)) #35
  write_reads(srPhiX174, fname=./srPhiX174, readlen=readlen, paired=FALSE)
```

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