# Package 'spiky'

May 16, 2024

Type Package

Title Spike-in calibration for cell-free MeDIP

#### Description

spiky implements methods and model generation for cfMeDIP (cell-free methylated DNA immunoprecipitation) with spike-in controls. CfMeDIP is an enrichment protocol which avoids destructive conversion of scarce template, making it ideal as a ``liquid biopsy," but creating certain challenges in comparing results across specimens, subjects, and experiments. The use of synthetic spike-in standard oligos allows diagnostics performed with cfMeDIP to quantitatively compare samples across subjects, experiments, and time points in both relative and absolute terms.

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URL https://github.com/trichelab/spiky

BugReports https://github.com/trichelab/spiky/issues

License GPL-2

**Depends** Rsamtools, GenomicRanges, R (>= 3.6.0)

Imports stats, scales, bamlss, methods, tools, IRanges, Biostrings, GenomicAlignments, BlandAltmanLeh, GenomeInfoDb, BSgenome, S4Vectors, graphics, ggplot2, utils

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 $add\_frag\_info$ 

decode fragment identifiers for spike-in standards

## **Description**

given a vector of fragment identifiers like 160\_2\_35 or 80b\_1C\_35G-2, encoded typically as length-InBp\_numberOfCpGs\_GCpercent, and optionally a database of spike-in sequences corresponding to those fragments, add those columns to the source data (along with, if present in the database, other metadata such as standard concentrations, GC fraction, etc.) and return i an updated DataFrame.

#### Usage

```
add_frag_info(x, frag_grp = "frag_grp", spike = NULL)
```

# **Arguments**

```
x data.frame with a column of spike information (see above)
frag_grp column name for the spike contig information (frag_grp)
spike optional database of spike-in properties (none)
```

## Value

the data.frame x, augmented with metadata columns

```
data(spike_cram_counts)
data(spike, package="spiky")
spike <- subset(spike, methylated == 1)
add_frag_info(spike_cram_counts, spike=spike)</pre>
```

bam\_to\_bins

| bam_to_bins | create a tiled representation of a genome from the BAM/CRAM file |
|-------------|--|
|             |  |

# Description

This function replaces a bedtools call: bedtools intersect -wao -a fragments.bed -b hg38\_300bp\_windows.bed > data.bed

## Usage

```
bam_to_bins(x, width = 300, param = NULL, which = IRangesList(), ...)
```

#### **Arguments**

| X     | a BAM or CRAM filename (or a BamFile object)                  |
|-------|---|
| width | the width of the bins to tile (default is 300)                |
| param | optional ScanBamParam (whence we attempt to extract which)    |
| which | an optional GRanges restricting the bins to certain locations |
|       | additional arguments to pass on to seqinfo_from_header        |

# **Details**

The idea is to skip the BED creation step for most runs, and just do it once. In order to count reads in bins, we need bins. In order to have bins, we need to know how long the chromosomes are. In order to have a BAM or CRAM file, we need to have those same lengths. This function takes advantage of all of the above to create binned ranges. Note that a very recent branch of Rsamtools is required for CRAM file bins.

#### Value

```
a GRangesList with y-base-pair-wide bins tiled across it
```

#### See Also

```
seqinfo_from_header
```

```
library(Rsamtools)
fl <- system.file("extdata", "ex1.bam", package="Rsamtools", mustWork=TRUE)
bam_to_bins(fl)</pre>
```

bin\_pmol 5

bin\_pmol

Binned estimation of picomoles of DNA present in cfMeDIP assays

# **Description**

Given the results of model\_glm\_pmol and predict\_pmol, adjust the predictions to reflect picomoles of captured DNA overlapping a given bin in the genome.

## Usage

```
bin_pmol(x)
```

#### **Arguments**

X

results from predict\_pmol (a data.frame or GRanges)

#### Value

```
the same object, but with a column `adjusted_pred_con`
```

#### See Also

```
model_glm_pmol predict_pmol
```

# **Examples**

```
data(spike, package="spiky")
data(spike_res, package="spiky")
data(genomic_res,package="spiky")
fit <- model_glm_pmol(covg_to_df(spike_res, spike=spike),spike=spike)
pred <- predict_pmol(fit, genomic_res, ret="df")
bin_pmol(pred)</pre>
```

 ${\tt convertPairedGRtoGR}$ 

Convert Pairs to GRanges

# **Description**

Convert Pairs to GRanges

#### Usage

```
convertPairedGRtoGR(pairs)
```

6 covg\_to\_df

# Arguments

pairs the Pairs object

#### Value

a GRanges

## **Description**

reshape scan\_spiked\_bam results into data.frames for model\_glm\_pmol

#### Usage

```
covg_to_df(spike_gr, spike, meth = TRUE, ID = NULL)
```

# Arguments

spike\_gr GRanges of spike contigs (e.g. output object from scan\_spiked\_bam, scan\_spike\_contigs,

or scan\_spike\_bedpe)

spike spike database (as from data(spike, package="spiky"))

meth only keep methylated spike reads? (TRUE; if FALSE, sum both)

ID an identifier for this sample, if running several (autogenerate)

#### Value

```
a data.frame with columns 'frag_grp', 'id', and 'read_count'
```

#### See Also

```
scan_spiked_bam
```

```
data(spike, package="spiky")
data(spike_res, package="spiky")
subsetted <- covg_to_df(spike_res, spike=spike, meth=TRUE)
summed <- covg_to_df(spike_res, spike=spike, meth=FALSE)
round((summed$read_count - subsetted$read_count) / summed$read_count, 3)</pre>
```

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dedup

spike-in counts for two samples, as a wide data.frame

# Description

A data.frame with spike-in results from control samples in the manuscript. This maps 1:1 onto spike\_read\_counts using reshape2::melt.

#### Usage

```
data(dedup)
```

#### **Format**

A data.frame object with

```
frag_grp the encoded spike contig name: basepairs_CpGs_GCpercentread_count_6547 read coverage for this spike in sample 6547read_count_6548 read coverage for this spike in sample 6548
```

#### Source

This data was created using inst/script/loadDedup.R

find\_spike\_contigs

find spike-in seqlevels in an object x, where !is.null(seqinfo(x))

# Description

Find the spike-like contigs in a BAM with both natural and spiked contigs. This started out as glue in some other functions and got refactored out.

#### Usage

```
find_spike_contigs(x, spike)
```

# **Arguments**

x something with seqlevels

spike a DataFrame with spike-in information

#### **Details**

The indices have an attribute "mappings", which is a character vector such that attr(find\_spike\_contigs(x), "mappings") == standardized for all contig names in the CRAM/BAM/whatever, and standardized is the rowname in spike that corresponds to the original contig name.

8 genbank\_mito

## Value

```
indices of which contigs in seqlevels(x) are spike-in contigs
```

#### See Also

```
get_base_name
rename_spike_seqlevels
```

## **Examples**

genbank\_mito

various mitochondrial genomes sometimes used as endogenous spikeins

# Description

A DataFrame with species, genome, accession, and sequence for GenBank mitochondrial genome depositions. No concentration provided; add if needed.

#### Usage

```
data(genbank_mito)
```

#### **Format**

A DataFrame object with

```
species the species whence the record came, as a character stringgenome the genome assembly whence the mtDNA, as a character stringaccession the genbank accession, as a character stringsequence genome sequence, as a DNAStringSet
```

#### **Source**

```
www.ncbi.nlm.nih.gov/genbank/
```

generate\_spike\_fasta 9

#### **Description**

A FASTA reference is *not* always needed, so long as .crai indices are available for all contigs in the CRAM. See spike\_counts for a fast and convenient alternative that extracts spike coverage from index stats. However, spike\_counts has its own issues, and it's better to use fragments.

## Usage

```
generate_spike_fasta(bam, spike, assembly = NULL, fa = "spike_contigs.fa")
```

# **Arguments**

bam a BAM or CRAM file, hopefully with an index spike the spike contig database (mandatory as of 0.9.99)

assembly optional BSgenome or sequinfo with reference contigs (NULL)

fa the filename for the resulting FASTA ("spikes.fa")

#### **Details**

If the contigs in a CRAM have even slightly different names from those in the reference, decoding will fail. In some cases there are multiple names for a given contig (which raises the question of whether to condense them), and thus the same reference sequence decodes multiple contig names.

This function generates an appropriate spike reference for a BAM or CRAM, using BAM/CRAM headers to figure out which references are used for which.

At the moment, CRAM support in Rsamtools only exists in the GitHub branch:

BiocManager::install("Bioconductor/Rsamtools@cram")

Using other versions of Rsamtools will yield an error on CRAM files.

Note that for merged genomic + spike reference BAMs/CRAMs, this function will only attempt to generate a FASTA for the spike contigs, not reference. If your reference contigs are screwed up, talk to your sequencing people, and keep better track of the FASTA reference against which you compress!

#### Value

```
invisibly, a DNAStringSet as exported to `fa`
```

#### See Also

rename\_contigs

10 genomic\_res

#### **Examples**

genomic\_res

A Granges object with genomic coverage from chr21q22, binned every 300bp for the genomic contigs then averaged across the bin. (In other words, the default output of scan\_genomic\_contigs or scan\_genomic\_bedpe, restricted to a small enough set of genomic regions to be practical for examples.) This represents what most users will want to generate from their own genomic BAMs or BEDPEs, and is used repeatedly in downstream examples throughout the package.

## **Description**

A Granges object with genomic coverage from chr21q22, binned every 300bp for the genomic contigs then averaged across the bin. (In other words, the default output of scan\_genomic\_contigs or scan\_genomic\_bedpe, restricted to a small enough set of genomic regions to be practical for examples.) This represents what most users will want to generate from their own genomic BAMs or BEDPEs, and is used repeatedly in downstream examples throughout the package.

## Usage

```
data(genomic_res)
```

#### **Format**

A GRanges of coverage results with one metadata column, coverage

#### Source

Generated using scan\_genomic\_bedpe or scan\_genomic\_contigs on an example bedpe or bam containing chr21q22 contigs.

get\_base\_name 11

get\_base\_name

refactored out of rename\_spikes and rename\_spike\_seqlevels

#### **Description**

A common task between generate\_spike\_fasta, rename\_spikes, and rename\_spike\_seqlevels is to determine what the largest common subset of characters between existing contig names and stored standardized contigs might be. This function eases that task.

#### Usage

```
get_base_name(contig_names, sep = "_")
```

# Arguments

contig\_names the names of contigs

sep separator character in contig names ("\_")

#### Value

a vector of elements 1:3 from each contig name

# **Examples**

get\_binned\_coverage

tabulate read coverage in predefined bins

# Description

refactored out of scan\_spiked\_bam

#### Usage

```
get_binned_coverage(bins, covg)
```

# **Arguments**

bins the GRanges with bins

covg the coverage result (an RleList)

12 get\_merged\_gr

#### Value

```
a GRanges of summarized coverage
```

#### See Also

```
get_spiked_coverage
scan_spiked_bam
```

#### **Examples**

get\_merged\_gr

get a GRanges of (by default, standard) chromosomes from seqinfo

# **Description**

refactored from scan\_spiked\_bam to clarify information flow

#### Usage

```
get_merged_gr(si, spike, standard = TRUE)
```

## **Arguments**

si seqinfo, usually from a BAM/CRAM file with spike contigs spike database of spike-in standard sequence features (spike) standard trim to standard chromosomes? (TRUE)

#### **Details**

By default, get\_merged\_gr will return a GRanges with "standardized" genomic and spike contig names (i.e. genomic chr1-22, X, Y, M, and the canonical spike names in data(spike, package="spiky")).

The constraint to "standard" chromosomes on genomic contigs can be removed by setting standard to FALSE in the function arguments.

get\_spiked\_coverage 13

## Value

```
GRanges with two genomes: the organism assembly and "spike"
```

# **Examples**

 ${\tt get\_spiked\_coverage}$ 

tabulate coverage across assembly and spike contig subset in natural order

# **Description**

FIXME: this is wicked slow, ask Herve if a faster version exists

## Usage

```
get_spiked_coverage(bf, bp, gr)
```

## Arguments

bf the BamFile object

bp the ScanBamParam object

gr the GRanges with sorted seqlevels

## **Details**

Refactored from scan\_spiked\_bam, this is a very simple wrapper

## Value

a list of Rles

# See Also

```
scan_spiked_bam
coverage
```

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#### **Examples**

get\_spike\_depth

get the (max, median, or mean) coverage for spike-in contigs from a BAM/CRAM

#### **Description**

get the (max, median, or mean) coverage for spike-in contigs from a BAM/CRAM

#### Usage

```
get_spike_depth(covg, spike_gr = NULL, spike = NULL, how = c("max", "mean"))
```

## **Arguments**

covg the coverage RleList

spike\_gr the spike-in GRanges (default: figure out from seqinfo)
spike information about the spikes (default: load spike)
how how to summarize the per-spike coverage (max)

#### Value

a GRanges with summarized coverage and features for each

kmax 15

```
bamMapqFilter(bp) <- 20

covg <- get_spiked_coverage(sb, bp=bp, gr=mgr)
get_spike_depth(covg, spike_gr=mgr, spike=spike)</pre>
```

kmax

simple contig kmer comparisons

# Description

simple contig kmer comparisons

# Usage

```
kmax(km, normalize = TRUE)
```

# **Arguments**

km kmer summary

normalize normalize (divide by row sums)? (TRUE)

#### Value

the most common kmers for each contig, across all contigs

```
data(genbank_mito, package="spiky")
mtk6 <- kmers(genbank_mito, k=6)
rownames(mtk6) <- paste0(rownames(mtk6), "_MT")
kmax(mtk6)

data(phage, package="spiky")
phk6 <- kmers(phage, k=6)
kmax(phk6, normalize=FALSE)

stopifnot(identical(colnames(phk6), colnames(mtk6)))
k6 <- rbind(mtk6, phk6)
kmax(k6)</pre>
```

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kmers

oligonucleotideFrequency, but less letters and more convenient.

## **Description**

oligonucleotideFrequency, but less letters and more convenient.

# Usage

```
kmers(x, k = 6)
```

# **Arguments**

x BSgenome, DFrame with sequence column, or DNAStringSet

k the length of the kmers (default is 6)

## **Details**

The companion kmax function finds the maximum frequency kmer for each contig and plots all of them together for comparison purposes.

#### Value

```
a matrix of contigs (rows) by kmer frequencies (columns)
```

#### See Also

kmax

```
data(genbank_mito, package="spiky")
mtk6 <- kmers(genbank_mito, k=6)
kmax(mtk6)

data(phage, package="spiky")
phk6 <- kmers(phage, k=6)
kmax(phk6)</pre>
```

methylation\_specificity

```
methylation_specificity
```

compute methylation specificity for spike-in standards

## **Description**

In a cfMeDIP experiment, the yield of methylated fragments should be >95% (ideally 98-99%) due to the nature of the assay.

#### Usage

```
methylation_specificity(spike_gr, spike)
```

## **Arguments**

spike\_gr GRanges of spike contigs (e.g. output object from scan\_spiked\_bam, scan\_spike\_contigs,

or scan\_spike\_bedpe)

spike spike contig database, if needed (e.g. data(spike))

#### Value

list with median and mean coverage across spike contigs

#### **Examples**

```
data(genomic_res)
data(spike_res)
data(spike, package="spiky")
methylation_specificity(spike_res, spike=spike)
```

model\_bam\_standards

Build a Bayesian additive model from spike-ins to correct bias in \*-seq

## **Description**

Build a Bayesian additive model from spike-ins to correct bias in \*-seq

# Usage

```
model_bam_standards(x, conc = NULL, fm = NULL, ...)
```

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#### Arguments

```
x data with assorted feature information (GCfrac, CpGs, etc)
conc concentration for each spike (must be provided!)

fm model formula (conc ~ read_count + fraglen + GCfrac + CpGs_3)
... other arguments to pass to bamlss
```

#### Value

```
the model fit for the data
```

#### **Examples**

model\_glm\_pmol

Build a generalized linear model from spike-ins to correct bias in cfMeDIP

## **Description**

formerly '2020\_model\_glm\_fmol'. Note that everything in x can be had from a BAM/CRAM with spike contigs named as frag\_grp (len\_CpGs\_GC) in the index and in fact that is what scan\_spiked\_bam now does.

## Usage

```
model_glm_pmol(x, spike, conc = NULL, ...)
```

#### **Arguments**

```
x data w/frag_grp, id, and read_count; or scan_spiked_bam result
spike spike database, e.g. data(spike, package='spiky')
conc concentration for each spike (will be referenced if NULL)
... other arguments to pass to glm (e.g. family)
```

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## Value

```
the model fit for the data
```

# **Examples**

```
data(spike, package="spiky")
data(spike_read_counts, package="spiky")
fit1 <- model_glm_pmol(spike_read_counts, spike=spike)
data(spike_res) # scan_spiked_bam result
fit2 <- model_glm_pmol(spike_res, spike=spike)</pre>
```

parse\_spike\_UMI

parse out the forward and reverse UMIs and contig for a BED/BAM

# **Description**

parse out the forward and reverse UMIs and contig for a BED/BAM

# Usage

```
parse_spike_UMI(UMI, pos = NULL, seqs = NULL)
```

# Arguments

UMI a vector of UMIs

pos optional vector of positions (else all are set to 1)

seqs optional vector of read sequences (else widths default to 96)

#### Value

a GRanges

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phage

lambda and phiX phage sequences, sometimes used as spike-ins

# Description

A DataFrame with sequence, methylated, CpGs, GCfrac, and OECpG for phages

#### Usage

```
data(phage)
```

## **Format**

A DataFrame object with

sequence genome sequence, as a DNAStringSet

methylated whether CpGs are methylated, as an integer

CpGs the number of CpGs in the phage genome, as an integer

GCfrac the GC fraction of the phage genome, as a numeric

**OECpG** the observed / expected CpG fraction, as a numeric

#### **Source**

www.ncbi.nlm.nih.gov/genbank/

predict\_pmol

predict picomoles of DNA from a fit and read counts (coverage)

# Description

FIXME: this could be made MUCH faster by precomputing CpG/GC stats per bin

#### Usage

```
predict_pmol(
   fit,
   genomic_gr,
   bsgenome = NULL,
   ret = c("gr", "df"),
   slide = FALSE
)
```

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# Arguments

| fit        | result of model_glm_pmol    |
|------------|-----------------------------|
| genomic_gr | the genomic data / new data |

bsgenome BSgenome name (if null, will guess from genomic\_gr)
ret return a data.frame ("df") or GRanges ("gr")? ("gr")

slide compute a sliding window estimate for GCfrac (1/3 width)?

#### **Details**

Using GRanges as the return value is (perhaps counterintuitively) *much* faster than the data.frame, since the sequence of the bins gets converted from a BSgenome representation to characters in the latter (it is implied by the bin start, stop, and genome when left as a GRanges).

#### Value

```
object with read count, fraglen, GC%, CpG**(1/3), and concentration
```

## **Examples**

```
data(spike_res)
data(genomic_res)
data(spike, package="spiky")
fit <- model_glm_pmol(covg_to_df(spike_res, spike=spike),spike=spike)
preddf <- predict_pmol(fit, genomic_res, ret="df")
pred <- predict_pmol(fit, genomic_res, ret="gr")
bin_pmol(pred)</pre>
```

process\_spikes

QC, QA, and processing for a new spike database

#### **Description**

Sequence feature verification: never trust anyone, least of all yourself.

# Usage

```
process_spikes(fasta, methylated = 0, ...)
```

#### **Arguments**

```
fasta fasta file (or GRanges or DataFrame) w/spike sequences methylated whether CpGs in each are methylated (0 or 1, default 0) additional arguments, e.g. kernels (currently unused)
```

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#### **Details**

GCfrac is the GC content of spikes as a proportion instead of a percent. OECpG is (observed/expected) CpGs (expectation is 25% of GC dinucleotides).

#### Value

a DataFrame suitable for downstream processing

#### See Also

kmers

## **Examples**

```
data(spike)
spikes <- system.file("extdata", "spikes.fa", package="spiky", mustWork=TRUE)
spikemeth <- spike$methylated
process_spikes(spikes, spikemeth)

data(phage)
phages <- system.file("extdata", "phages.fa", package="spiky", mustWork=TRUE)
identical(process_spikes(phage), phage)
identical(phage, process_spikes(phage))

data(genbank_mito)
(mt <- process_spikes(genbank_mito)) # see also genbank_mito.R
gb_mito <- system.file("extdata", "genbank_mito.R", package="spiky")</pre>
```

read\_bedpe

read a BEDPE file into Pairs of GRanges (as if a GAlignmentPairs or similar)

# **Description**

read a BEDPE file into Pairs of GRanges (as if a GAlignmentPairs or similar)

## Usage

```
read_bedpe(
   x,
   ...,
   stranded = FALSE,
   fraglen = TRUE,
   optional = FALSE,
   keep = FALSE
)
```

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# **Arguments**

x a Tabixed BEDPE file, or a TabixFile of one

. . . additional arguments to pass to scanTabix internally

stranded Is the data stranded? (FALSE)

fraglen compute the fragment length? (TRUE)

optional scan the optional columns (name, score, strand1)? (FALSE)

keep keep additional columns? (FALSE)

#### **Details**

```
BEDPE import in R is a shambles. This is a bandaid on a GSW.
    See the \href{https://bedtools.readthedocs.io/en/latest/content/general-usage.html#bedpe-fo
         In short, for a pair of ranges 1 and 2, we have fields
         chrom1, start1, end1, chrom2, start2, end2, and (optionally)
         name, score, strand1, strand2, plus any other user defined
         fields that may be included (these are not yet supported
         by read_bedpe). For example, two valid BEDPE lines are:
                                             bedpe_example1
         chr1
               100
                     200
                                 5000
                                       5100
         chr9
               900
                    5000
                           chr9 3000
                                       3800
                                             bedpe_example2
                                                             99
```

#### Value

a Pairs of GRanges, perhaps with \$score or \$fraglen

# See Also

bedpe\_covg

# **Examples**

```
## Not run:
bedpe <- "GSM5067076_2020_A64_bedpe.bed.gz"
WT1_hg38 <- GRanges("chr11", IRanges(32387775, 32435564), "-")
read_bedpe(bedpe, param=WT1_hg38)
## End(Not run)</pre>
```

rename\_spikes

for BAM/CRAM files with renamed contigs, we need to rename spike rows

# Description

This function does that.

#### Usage

```
rename_spikes(x, spike)
```

# **Arguments**

x a BAM/CRAM file, hopefully with an index

spike a DataFrame where spike\$sequence is a DNAStringSet

#### Value

```
a DataFrame with renamed contigs (rows)
```

#### See Also

```
generate_spike_fasta
```

```
rename_spike_seqlevels
```

for spike-in contigs in GRanges, match to standardized spike seqlevels

## **Description**

This function is essentially the opposite of rename\_spikes, except that it works well on GRanges/GAlignments from or for merged genome+spike BAMs. If spike contigs are found, it will assign genome='spike' to those, while changing the seqlevels to standardized names that match rownames(spike).

## Usage

```
rename_spike_seqlevels(x, spike = NULL)
```

# Arguments

x something with seqlevels (GRanges, GAlignments, Seqinfo...)
spike a DataFrame where spike\$sequence is a DNAStringSet (or NULL)

#### Value

x, but with standardized spike seqlevels and genomes

#### See Also

rename\_spikes

scan\_genomic\_bedpe 25

scan\_genomic\_bedpe

Scan genomic BEDPE

## **Description**

Scan genomic BEDPE

#### Usage

```
scan_genomic_bedpe(
  bedpe,
  bin = TRUE,
  binwidth = 300L,
  bins = NULL,
  standard = TRUE,
  genome = "hg38"
)
```

## **Arguments**

bedpe the BEDPE file path, or output from read\_bedpe()

bin Bin reads? (TRUE)

binwidth width of the bins for chromosomal tiling (300)

bins a pre-tiled GRanges for binning coverage (NULL)

standard restrict non-spike contigs to "standard" chromosomes? (TRUE)

genome Name of genome (default hg38)

# Value

```
a GRanges with coverage
```

```
fl <- system.file("extdata", "example_chr21\_bedpe.bed.gz", package="spiky", mustWork=TRUE) \\ scan\_genomic\_bedpe(fl) \# will warn user about spike contigs
```

```
scan_genomic_contigs scan genomic contigs in a BAM/CRAM file
```

# **Description**

The default workflow for spiky is roughly as follows:

#### Usage

```
scan_genomic_contigs(
  bam,
  spike,
  param = NULL,
  bin = TRUE,
  binwidth = 300L,
  bins = NULL,
  standard = TRUE,
  genome = "hg38",
  ...
)
```

# **Arguments**

```
the BAM or CRAM filename, or a vector of them
bam
                  the spike-in reference database (e.g. data(spike))
spike
                  a ScanBamParam object specifying which reads to count (NULL)
param
                  Bin reads? (TRUE)
bin
                  width of the bins for chromosomal tiling (300)
binwidth
bins
                  a pre-tiled GRanges for binning coverage (NULL)
standard
                  restrict non-spike contigs to "standard" chromosomes? (TRUE)
                  Name of genome (default hg38)
genome
                  additional arguments to pass to scanBamFlag()
. . .
```

#### **Details**

- 1. Identify and quantify the spike-in contigs in an experiment.
- 2. Fit a model for sequence-based abundance artifacts using the spike-ins.
- 3. Quantify raw fragment abundance on genomic contigs, and adjust per step 2.

scan\_genomic\_contigs addresses the first half of step 3. The assumption is that anything which isn't a spike contig, is a genomic contig. This isn't necessarily true, so the user can also supply a ScanBamParam object for the param argument and restrict scanning to whatever contigs they wish, which also allows for non-default MAPQ, pairing, and quality filters.

If multiple BAM or CRAM filenames are provided, all indices will be checked before attempting to run through any of the files.

## Value

a CompressedGRangesList with bin- and spike-level coverage

#### See Also

```
Rsamtools::ScanBamParam
```

# **Examples**

```
scan_methylation_specificity
```

tabulate methylation specificity for multiple spike-in BAM/CRAM files

#### **Description**

Methylation specificity is here defined as methylated\_spike\_covg/spike\_covg

## Usage

```
scan_methylation_specificity(files, spike, sep = "_")
```

## **Arguments**

```
files a vector of BAM/CRAM file names

spike a spike-in database

sep the separator for spike-in contig names ("_")
```

#### Value

```
a matrix with columns "mean" and "median"
```

28 scan\_spiked\_bam

#### **Examples**

## **Description**

Note: behind the scenes, this is being refactored into scan\_spike\_contigs and scan\_genomic\_contigs. Once that is done, perhaps before release, the default workflow will switch to

#### Usage

```
scan_spiked_bam(
  bam,
  spike,
  mapq = 20,
  binwidth = 300L,
  bins = NULL,
  how = c("max", "mean"),
  dupe = FALSE,
  paired = TRUE,
  standard = TRUE,
  ...
)
```

#### **Arguments**

bam the BAM file spike the spike-in reference database (e.g. data(spike)) minimum mapq value to count a pair (20) mapq binwidth width of the bins for chromosomal tiling (300) bins a pre-tiled GRanges for binning coverage (NULL) how to record spike read coverage (max or mean)? (max) how unique (FALSE), duplicte (TRUE), or all (NA) reads? (FALSE) dupe paired restrict coverage to that from properly paired reads? (TRUE) restrict non-spike contigs to "standard" chromosomes? (TRUE) standard additional arguments to pass to scanBamFlag()

scan\_spiked\_bam 29

#### **Details**

- 1. scan spike contigs and count fragments per contig or per bin.
- 2. fit the appropriate model for adjusting genomic contigs based on spikes.
- 3. scan and adjust binned fragment tallies along genomic contigs per above.

This approach decouples binning schemes from model generation (using spikes) and model-based adjustment (using genomic fragment counts), decreasing code complexity while increasing the opportunities for caching & parallelization.

For a more realistic example (not run), one might do something like:

data(spike, package="spiky"); bam <- "2021\_ctl.hg38\_withSpikes.bam"; ssb\_res <- scan\_spiked\_bam(bam, mapq=20, spike=spike);

An extract from the resulting ssb\_res object is available via

```
data(ssb_res, package="spiky");
```

The full ssb\_res is a GRangesList object with 300bp-binned coverage on the standard (chr1-22, chrX, chrY, chrM) chromosomes (as determined by the GenomeInfoDb::standardChromosomes() function against the assembly defined in the BAM or CRAM file, by default; if desired, a user can scan all genomic contigs by setting standard=FALSE when calling the function). By default, the mean base-level coverage of genomic bins is reported, and the maximum spike-level coverage is reported, though this can also be adjusted as needed. The results then inform the reliability of measurements from replicate samples in multiple labs, as well as the adjusted quantitative coverage in each bin once the absolute quantity of captured cell-free methylated DNA has been fit by model\_glm\_pmol and predict\_pmol. In some sense, this function converts BAMs/CRAMs into usable data structures for high-throughput standardized cfMeDIP experiments.

The data extract used in other examples is the same as the full version, with the sole difference being that genomic bins are limited to chr22.

# Value

```
a CompressedGRangesList with bin- and spike-level coverage
```

#### See Also

```
GenomeInfoDb::keepStandardChromosomes
```

Rsamtools::ScanBamParam

30 scan\_spike\_contigs

scan\_spike\_bedpe Sc

Scan spikes BEDPE

# Description

Scan spikes BEDPE

# Usage

```
scan_spike_bedpe(bedpe, spike, how = "max")
```

## **Arguments**

bedpe the BEDPE file path, or output from read\_bedpe()
spike information about the spikes (default: load spike)
how how to summarize the per-spike coverage (max)

#### Value

a GRanges with coverage

#### **Examples**

```
data(spike, package="spiky")
fl <- system.file("extdata", "example_spike_bedpe.bed.gz", package="spiky",mustWork=TRUE)
scan_spike_bedpe(fl,spike=spike) # will warn user about spike contigs</pre>
```

scan\_spike\_contigs

pretty much what it says: scan spike contigs from a BAM or CRAM file

#### **Description**

default workflow is

#### **Usage**

```
scan_spike_contigs(bam, spike, how = "max", param = NULL, mc.cores = 16, ...)
```

# **Arguments**

bam the BAM or CRAM filename, or a vector of such filenames

spike the spike-in reference database (e.g. data(spike)) how how to summarize the per-spike coverage (max)

param a ScanBamParam object, or NULL (will default to MAPQ=20 etc)

mc.cores Number of cores to run on (default 16)

. . . additional arguments to pass to scanBamFlag()

31 scan\_spike\_counts

#### **Details**

- 1. scan spike contigs and count fragments per contig or per bin.
- 2. fit the appropriate model for adjusting genomic contigs based on spikes.
- 3. scan and adjust binned fragment tallies along genomic contigs per above.

scan\_spike\_contigs implements step 1.

If multiple BAM or CRAM filenames are provided, all indices will be checked before attempting to run through any of the files.

#### Value

a CompressedGRangesList with bin- and spike-level coverage

#### See Also

```
Rsamtools::ScanBamParam
```

#### **Examples**

```
library(GenomicRanges)
data(spike, package="spiky")
sb <- system.file("extdata", "example.spike.bam", package="spiky",</pre>
                  mustWork=TRUE) # switch to a CRAM
res <- scan_spike_contigs(sb, spike=spike) # use default ScanBamParam
summary(res)
```

scan\_spike\_counts

run spike\_counts on BAM/CRAM files and shape the results for model\_glm\_pmol

# **Description**

Typically one will want to fit a correction model to multiple samples. This function eases this task by merging the output of spike\_counts into a data.frame that model\_glm\_pmol can directly fit.

#### **Usage**

```
scan_spike_counts(files, spike, methylated = 1, sep = "_")
```

#### **Arguments**

files a vector of BAM/CRAM file names

spike a spike-in database

methylated a logical (0/1) to include only methylated fragments

the separator for spike-in contig names ("\_") sep

seqinfo\_from\_header

## Value

```
a data.frame with columns "frag_grp", "id", and "read_count"
```

## **Examples**

 $\begin{array}{lll} {\sf seqinfo\_from\_header} & {\it create \ seqinfo\ (and \ thus \ a \ standard \ chromosome \ filter) \ from \ a \ BAM} \\ & {\it header} \end{array}$ 

# Description

create seqinfo (and thus a standard chromosome filter) from a BAM header

# Usage

```
seqinfo_from_header(x, gen = NA, std = FALSE, ret = c("si", "gr"))
```

# Arguments

| x   | the BAM file or its header                                   |
|-----|--|
| gen | genome of the BAM file, if known (NULL; autodetect)          |
| std | standard chromosomes only? (FALSE; will be empty if spikes)  |
| ret | return Seqinfo ("si", the default) or GRanges ("gr")? ("si") |

#### **Details**

Setting std=TRUE on a spike-in BAM will produce an empty result.

# Value

```
Seqinfo object or GRanges (or `as(seqinfo, "GRanges")`)
```

spike 33

#### **Examples**

```
library(Rsamtools)
fl <- system.file("extdata", "ex1.bam", package="Rsamtools", mustWork=TRUE)

hdr <- scanBamHeader(BamFile(fl))
si <- seqinfo_from_header(hdr)
gr <- seqinfo_from_header(fl, ret="gr")
stopifnot(identical(gr, as(si, "GRanges")))

std_si <- seqinfo_from_header(fl, std=TRUE)
seqlevels(std_si)

# for comparison with below
data(spike, package="spiky")
spike

sp <- system.file("extdata", "example.spike.bam", package="spiky")
sp_gr <- seqinfo_from_header(sp, ret="gr")
sp_gr</pre>
```

spike

spike-in contig properties for Sam's cfMeDIP spikes

## Description

A DataFrame with sequence, concentration, and other properties of Sam's synthetic cfMeDIP spike-in controls. The row names redudantly encode some of these properties, such as the number of CpGs in the spike-in sequence.

#### Usage

```
data(spike)
```

#### **Format**

A DataFrame object with

```
sequence contig sequence, as a DNAStringSet
methylated are the CpGs in this spike-in methylated? 0 or 1
CpGs number of CpG dinucleotides in the spike, from 1 to 16
fmol femtomolar concentration of the spike-in for standard mix
molmass molar mass of spike-in sequence
```

#### Source

```
https://doi.org/10.1101/2021.02.12.430289
```

spike\_counts

```
spike_bland_altman_plot
```

Bland-Altman plot for cfMeDIP spike standards

## **Description**

Bland-Altman plot for cfMeDIP spike standards

#### Usage

```
spike_bland_altman_plot(fit)
```

#### **Arguments**

fit

a model fit, from predict\_pmol (?)

#### Value

a ggplot2 object

## **Examples**

```
data(spike_res)
data(spike, package="spiky")
fit <- model_glm_pmol(covg_to_df(spike_res, spike=spike), spike=spike)
ba_plot <- spike_bland_altman_plot(fit)</pre>
```

spike\_counts

use the index of a spiked BAM/CRAM file for spike contig coverage

# Description

It dawned on me one day that we don't even have to bother reading the file if we have an index for a spiked BAM/CRAM result, since any fragments that map properly to the spike contigs are generated from synthetic templates. This function takes an index and a spike database (usually a DataFrame) as inputs and provides a rough coverage estimate over "rehabilitated" contig names (i.e., canonicalized contigs mapping to the database) as its output.

spike\_cram\_counts 35

#### Usage

```
spike_counts(
  bam,
  spike,
  sep = "_",
  ref = "spike",
  verbose = FALSE,
  dump_idx = FALSE
)
```

#### **Arguments**

```
the BAM or CRAM file (MUST HAVE AN INDEX)
spike a data.frame, DataFrame, or similar with spikes
sep separator character in contig names ("_")
ref reference name for spike genome ("spike")
verbose be verbose? (FALSE)
dump_idx dump the renamed idxstats to aggregate? (FALSE)
```

#### **Details**

The argument spike has no default since we are attempting to refactor the spike-in databases into their own data packages and allow more general use.

#### Value

```
a GRanges of spike-in contig read counts
```

# **Examples**

 $spike\_cram\_counts$ 

spike-in counts, as a long data.frame

# Description

A data.frame with spike-in results from CRAM files (generated from scan\_spike\_counts(CRAMs, spike=spike))

#### Usage

```
data(spike_cram_counts)
```

36 spike\_read\_counts

#### **Format**

A data.frame object with

```
frag_grp the encoded spike contig name: basepairs_CpGs_GCpercent
id subject from whom cfMeDIP spike reads (column 3) were counted
read_count read coverage for this spike in this subject (column 2)
```

#### **Source**

Generated from scan\_spike\_counts(CRAMs, spike=spike) using example CRAMs containing spike contigs

spike\_read\_counts

spike-in counts, as a long data.frame

# Description

A data.frame with spike-in results from control samples in the manuscript. This maps 1:1 onto dedup using reshape2::melt.

#### Usage

```
data(spike_read_counts)
```

#### **Format**

A data.frame object with

frag\_grp the encoded spike contig name: basepairs\_CpGs\_GCpercentid subject from whom cfMeDIP spike reads (column 3) were countedread\_count read coverage for this spike in this subject (column 2)

# Source

This data was created using inst/script/loadDedup.R

spike\_res 37

spike\_res

A Granges object with spike-in sequence coverage, and summarized for each spike contig as (the default) max coverage. (In other words, the default output of scan\_spike\_contigs or scan\_spike\_bedpe) This represents what most users will want to generate from their own spike-in BAMs or BEDPEs, and is used repeatedly in downstream examples throughout the package.

## **Description**

A Granges object with spike-in sequence coverage, and summarized for each spike contig as (the default) max coverage. (In other words, the default output of scan\_spike\_contigs or scan\_spike\_bedpe) This represents what most users will want to generate from their own spike-in BAMs or BEDPEs, and is used repeatedly in downstream examples throughout the package.

# Usage

```
data(spike_res)
```

#### **Format**

A GRanges of coverage results with one metadata column, coverage

#### **Source**

Generated using scan\_spike\_bedpe or scan\_spike\_contigs on an example bedpe or bam containing spike contigs.

spiky-methods

A handful of methods that I've always felt were missing

#### **Description**

Particularly, simple methods to plot coverage results.

#### **Usage**

```
## S4 method for signature 'Rle,ANY'
plot(x, y, ...)
## S4 method for signature 'SimpleRleList,ANY'
plot(x, y, ...)
```

38 ssb\_res

#### Arguments

x an Rle or RleList, usually

y not usedan Rle or RleList, usually

... other params such as ylim passed to barplot

#### **Details**

```
selectMethod("plot", "Rle") and also selectMethod("plot", "RleList") too.
```

#### Value

invisibly, the plot details

ssb\_res

scan\_spiked\_bam results from a merged cfMeDIP CRAM file (chr22 and spikes)

# Description

A CompressedGRangesList object with genomic (chr22) and spikes coverage, binned every 300bp for the genomic contigs then averaged across the bin, and summarized for each spike contig as (the default) max coverage. (In other words, the default output of scan\_spiked\_bam, restricted to a small enough set of genomic regions to be practical for examples.) This represents what most users will want to generate from their own merged BAMs or CRAMs, and is used repeatedly in downstream examples throughout the package.

## Usage

```
data(ssb_res)
```

## Format

A CompressedGRangesList of coverage results, containing

**genomic** a GRanges with one metadata column, coverage **spikes** a GRanges with one metadata column, coverage

#### **Source**

Generated using scan\_spiked\_bam on an example bam containing chr22 and spike contigs.

testGR 39

testGR

a test GRanges with UMI'ed genomic sequences used as controls

# **Description**

Sources and overlap widths of various read sequences in a test CRAM.

# Usage

```
data(testGR)
```

#### **Format**

A GRanges object with an mcols() DataFrame containing

UMI1 the unique molecular identifier on the forward read

UMI2 the unique molecular identifier on the reverse read

seq the sequence of the fragment

name the name of the fragment

score whether the fragment passes filters (always 1)

#### **Source**

Generated using inst/script/loadTest.R

tile\_bins

Tile the assembly-based contigs of a merged assembly/spike GRanges.

## **Description**

refactored out of scan\_spiked\_bam for more explicit information flow

## Usage

```
tile_bins(gr, binwidth = 300L)
```

#### **Arguments**

gr the GRanges

binwidth bin width to tile (default is 300)

#### Value

```
a GRanges of bins
```

40 tile\_bins

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