

# Package ‘PFExpTools’

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httr,  
magrittr,  
stringr

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**Description** This package contains a large number of miscellaneous functions for the processing and analysis of Plasmodium falciparum gene expression data. This functionality is largely for use on transcriptional time courses; however, there is quite a bit of functionality for single time point studies as well. This contains the necessary code to determine transcriptional staging to a reference time course, and generate cyclical regression covariates for further analysis. This package encompasses multiple workflows. One is the processing, imputation and smoothing of transcriptional time courses, and the other is the processing, staging and covariate generation for single time point transcriptional analysis.

**License** GPL-3

**Encoding** UTF-8

**LazyData** true

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**Suggests** knitr,  
rmarkdown

**VignetteBuilder** knitr

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aliasChange	<i>aliasChange</i>
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## Description

This function performs the alias based gene renaming; called by nameChange

## Usage

```
aliasChange(platdata, aliases)
```

## Arguments

platdata	see nameChange
aliases	see nameChange
platcols	see nameChange

## Value

see nameChange

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blastChange	<i>blastChange</i>
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**Description**

This function is...elaborate. It requires blast be installed and be in your PATH. This function takes your platform data file and your annotated transcriptome file and actually creates a blast database, searches all probes against it, and identifies hits that are unique and maximal (depending on your match and secondary match parameters.) It's called from nameChange.

**Usage**

```
blastChange(platdata, platform, transcripts, match, secmatch)
```

**Arguments**

platdata	see nameChange
platform	curated data from nameChange
transcripts	see nameChange
match	see nameChange
secmatch	see nameChange

**Value**

see nameChange

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CRCgeneration	<i>CRCgeneration</i>
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**Description**

CRCgeneration

**Usage**

```
CRCgeneration(stages)
```

**Arguments**

stages	This is a single column matrix; row names are sample names, and the column contains the calculated IDC location for each sample (in hpi)
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**Value**

This function returns a 3 column matrix; the first column contains the provided location in hpi, and the additional columns contain the calculated x and y covariates, respectively.

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curateExpdata	<i>curateExpdata</i>
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### Description

This function will take the name lists generated by nameChange and apply them to an expression data set. The function will process locally downloaded GEO expression files, or even just accept a GEO accession number and do the work for you.

### Usage

```
curateExpdata(expname, namelist, local = F, pct = 0.8, pullmeta = F)
```

### Arguments

expname	This is the name of your data set; if local is T, it is a GEO file (any type containing exp data). If local is F, this can be a GEO accession number.
namelist	This is a name list file as generated by nameChange.
local	This is a logical variable; if T, the function looks for a local file. If F, the function uses the expname as a GEO accession number and attempts to download the data.
pct	This is the cutoff for gene data; if a gene has expression values for less than this percentage of samples, it is excluded.
pullmeta	This allows you to get the metadata for the samples from the GSE file; default is false.

### Value

Returns an expression frame containing genes as rows and samples as columns. If pullmeta = T, will be a list with the first entry being the expression frame and the second being the metadata from a GSE file.

---

ffimpute	<i>ffimpute</i>
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### Description

This function imputes timepoints using the Fourier Transform; strongly recommend using another option here, as this is INCREDIBLY specific to a 2 hr timecourse over 56 hr

### Usage

```
ffimpute(expdata, times)
```

### Arguments

expdata	An expression matrix with genes as rows and samples as columns
times	A matrix with row names as samples and one column containing sampling times

**Value**

This function returns an expression matrix containing both the measured and imputed timepoints

---

FFTphase	<i>FFTphase</i>
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**Description**

This function calculates peak phase for each gene in a time course using the Fourier Transform.

**Usage**

```
FFTphase(expdata, times)
```

**Arguments**

expdata	see peakPhase
times	see peakPhase

**Value**

see peakPhase

---

flattenAlias	<i>flattenAlias</i>
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**Description**

The alias file from PlasmoDB is unwieldy and awful. Here is a function for flattening it for easier find and replace. Called in aliasChange, you don't need to use this for anything.

**Usage**

```
flattenAlias(aliasfilename)
```

**Arguments**

aliasfilename	File name of alias file obtained from PlasmoDB.
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**Value**

Data frame with two columns; first column is old identifiers, and second column is their mapping to the most recent name (per the alias file)

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fullCurate

*fullCurate*


---

## Description

Are you feeling really, spectacularly lazy? This is the function for you. If you know the GEO accession number of your expression set and the columns necessary for nameChange, this function will do the entire curation for you in one call.

## Usage

```
fullCurate(
  GSE,
  platcols = c(1, 2),
  method = "blast",
  aliases = "current",
  transcripts = "current",
  match = 130,
  secmatch = 60,
  pct = 0.8,
  pullmeta = T
)
```

## Arguments

GSE	This is the GSE accession number.
platcols	These are the columns necessary for the nameChange function; see nameChange for details.
method	These are the available methods for name changes; see nameChange for details.
aliases	IF method is 'aliases', list the alias file name or 'current' for a PlasmoDB download. See nameChange for details.
transcripts	If method is 'transcripts', this is the transcriptome fasta file, or if 'current' it will download the most recent file.
match	see curateExpData.
secmatch	See curateExpData.
pct	See curateExpData.
pullmeta	See curateExpData.

## Value

See curateExpData.

---

getAverages	<i>GetAverages This function will get the average expression of all genes across a reference time course. Note: the reference time course should be evenly samples across a single IDC.</i>
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**Description**

GetAverages This function will get the average expression of all genes across a reference time course. Note: the reference time course should be evenly samples across a single IDC.

**Usage**

```
getAverages(reftc)
```

**Arguments**

reftc	This is a reference time course to average; this must be a numeric matrix with genes as rows and samples as columns.
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**Value**

This function returns a matrix with row names as gene names and a single column containing the average expression across the reference time course.

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LogTransform	<i>LogTransform</i>
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**Description**

If your microarray data isn't log2 ratio transformed, use this. This will take your expression data and log2 ratio normalize it to a set of gene averages you provide.

**Usage**

```
LogTransform(newdata, refavg)
```

**Arguments**

newdata	This is the data to be normalized; this must be a numeric matrix with rows as genes and columns as samples.
refavg	This is the list of gene averages across a time course; must be a data frame with 1 column, with row names as genes.

**Value**

This function returns a matrix in an identical format to newdata, with all cells being log2 ratio transformed.

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lSmooth

*lSmooth*


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### Description

This function will loess smooth a time course, first demonstrated on P. fal time courses by Bozdech et al 2003

### Usage

```
lSmooth(expdata, time, smoothvalue = 0.3)
```

### Arguments

expdata	Expression data matrix, with columns as samples and rows as genes
time	matrix with one column; names are samples and column contains sample time
smoothvalue	loess smoothing value; default is 0.3

---

nameChange

*nameChange*


---

### Description

This function takes a platform or a file from GEO (a cut and paste from the full table view, really), and identifies the new genome assembly name for each probe using one of a few methods. This function is a wrapper for subfunctions that carry out each method. Now, there's little consistency to the way the files are organized on GEO- platform naming conventions are loose to non-existent, so you'll have to go have a look at the platform manually and make some decisions on what method will work best. This function will use the working directory as a storage unit for any files downloaded from PlasmoDB and any BLAST databases built for this process.

### Usage

```
nameChange(
  platform,
  platcols = c(1, 2),
  method = "swap",
  aliases = NA,
  transcripts = NA,
  match = 130,
  secmatch = 60
)
```



**Arguments**

platform	This can be a platform accession number OR a filename for a platform. If a file, a simple cut/paste in to a txt file will work here (it's tab delimited by default).
platcols	This one is a bit complex so settle in. This must be a vector with a length of two. The first entry is the column name for the probe/feature name. This can be ID, GeneID, ProbeID, it's completely inconsistent among platforms and you need to manually determine this. The second entry depends on method. For "swap", it is the column representing GeneDB version 3 gene identifiers (if present). For the "alias" file, it must be the old GeneDB gene identifier. For the "blast" method, it must be the probe sequence.
method	There are 3 methods here; "swap" just takes the new gene name from the platform file (least accurate), "alias" will find new names based on the current PlasmoDB assembly file (not bad), "blast" will take a provided Annotated Transcripts file from PlasmoDB, blast each probe against it, and only keep probes that meet the bitscore criteria (default is 130 for perfect hit and 60 for minimal secondary hits- this is based on probe length, and you may want to research bit scores for the platform in question).
aliases	This is the filename of the "alias" file downloaded from PlasmoDB. Alternately, if you're feeling spectacularly lazy, you can set this to 'current' and the function will do all the heavy lifting for you.
transcripts	The fasta file containing the annotated transcripts; this can be obtained from PlasmoDB. Alternately, if you're feeling spectacularly lazy, you can set this to 'current' and the function will do all the heavy lifting for you.
match	The bitscore for a perfect primary match; only necessary if "blast" is selected, default is 130.
secmatch	The maximum bitscore for secondary probe alignments; only necessary if "blast" is selected, default is 60.

**Value**

This returns a data frame with two columns; first column is the original IDs, and second column is the corresponding new ID.

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peakPhase	<i>peakPhase</i>
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**Description**

peakPhase

**Usage**

```
peakPhase(expdata, times, method = "poly")
```

**Arguments**

expdata	This must be an expression matrix, with rows as genes and columns as samples. Sample names (column names) must match sample names in the "times" parameter.
times	This must be a matrix with one column; the column is actual sampling time, and the row names are the sample names.
method	This allows the user to choose the method for peak time determination; current options are "poly"(default), "sin", "spline", and "FFT". Note, FFT will only work on evenly sampled time courses (or evenly imputed time courses).

**Value**

This function returns a data frame with a single column; the row names are the gene names, and the column contains the time at which the gene is calculated to express maximally.

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polyPhase	<i>polyPhase</i>
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**Description**

This is a sub function that calculates peak expression by 6th order polynomial fit. Accessed through peakPhase.

**Usage**

```
polyPhase(expdata, times)
```

**Arguments**

expdata	see peakPhase
times	see peakPhase

**Value**

see peakPhase

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remLowCoverage	<i>remLowCoverage</i>
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**Description**

Removes any gene from the expression dataset that does not have values in a minimum percentage of samples.

**Usage**

```
remLowCoverage(expdata, mincov, faillist = F)
```

**Arguments**

expdata	This is a matrix containing expression values' rows must be genes and columns must be samples.
mincov	This is the minimum percent coverage; probes must appear in at least this percentage of samples to pass QC.
faillist	Default is FALSE; if TRUE, function returns a list containing both the curated expression matrix and a list of genes that failed QC.

**Value**

This function returns an expression matrix with the genes that do not pass QC removed.

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sinPhase	<i>sinPhase</i>
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**Description**

This is a sub function that calculates peak expression by sin fitting. Accessed through peakPhase.

**Usage**

```
sinPhase(expdata, times)
```

**Arguments**

expdata	see peakPhase
times	see peakPhase

**Value**

see peakPhase

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splineCourse	<i>splineCourse</i>
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**Description**

This function takes an existing time course and uses spline interpolation to create an imputed time course with the desired resolution.

**Usage**

```
splineCourse(expdata, times, fulltimes = 1:48)
```

**Arguments**

expdata	Actual expression data; a matrix with genes as rows and time course samples as columns. In order from earliest to latest.
times	The actual sample times for the expression matrix.
fulltimes	A vector containing the times desired; for example, an hourly time course over a single IDC would be 1:48.

**Value**

Returns an expression matrix expanded with additional columns to contain samples at the desired times.

---

splinePhase	<i>splinePhase</i>
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**Description**

This function fits a spline to the expression data and determines the time at which each gene is maximally expressed. Called by peakPhase.

**Usage**

```
splinePhase(expdata, times)
```

**Arguments**

expdata	see peakPhase
times	see peakPhase

**Value**

see peakPhase

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stagingByTranscription	<i>stagingByTranscription</i>
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**Description**

This function compares each whole transcriptome sample to every time point in the provided reference time course, and identifies the best time point fit. Correlation is determined by the Pearson method.

**Usage**

```
stagingByTranscription(
  samples,
  reference,
  subset = NA,
  cortable = F,
  heatmap = T,
  start = 1
)
```

**Arguments**

samples	A matrix of expression samples, with rows as genes and columns as samples. This is the set that will be tested.
reference	A reference expression time course, with rows as genes and columns as samples.
subset	The default is to use all genes in common between the two sets; if a subset is desired, provide this as vector of gene names in the subset.
cortable	If the full matrix of correlation values is desired, set to TRUE; default is FALSE.
heatmap	A simple correlation heatmap will be generated as default. Set to false to skip.
start	What hour the reference course starts at- default is 1hpi

**Value**

Default return is a matrix with one column; rows are samples and values are the time point of maximum correlation. The function will also plot a simple heatmap by default. If cortable is set to TRUE, the function will return a list; the first entry is the simple time point matrix, and the second entry is the full correlation matrix.

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swapChange

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*swapChange*


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**Description**

This function simply pulls the new ORF and probe ID and creates a renaming file from that; I swear this wasn't there before, but now that we have the new GeneIDs listed might as well build a function to rename based on them. This function is called by nameChange.

**Usage**

```
swapChange(platdata)
```

**Arguments**

platdata	see nameChange
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**Value**

see nameChange

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`tcImpute`*tcImpute*

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**Description**

This function calls the bnstruct package "knn.impute" function to perform k nearest neighbor imputation on a time course to fill in missing data.

**Usage**

```
tcImpute(expdata, neighbors = 5)
```

**Arguments**

<code>expdata</code>	This is an expression matrix with rows as genes and columns as samples in a time course. Time points missing data should be inserted as columns in the correct place containing NAs.
<code>neighbors</code>	This is the number of neighbors used in determining value.

**Value**

This function returns the expression matrix with blank columns filled with imputed values.

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