# Package 'httrpathway'

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Type Package

Title Pathway Scoring and Concentration Response for HTTr data

Version 1.1.0

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#### **Description**

This package generates pathway (signature) scores with associated concentration response modeling; it also contains some important plotting functions. This package contains functions required to create input files (log2-fold change, or (l2fc) matrices) and run the signature/pathway based concentration-

response calculations. Another R project (httranalysis) contains a series of post-calculation analyses that are problem-specific. To run all of the calculations, use the function driver(). This version has also included gene-level concentration-response modeling

This package required a set of directories to be at the same level as the httrpathway folder ../input - various input files

../input/chemicals - collections of chemical information, not used in the standard calculations ../input/signatures -

the signature data, inluding the catalog (an Excel file) and the lists of genes per signature ../input/fcdata - where the l2fc data goes. See the functions buildFCMAT1 and buildFC-MAT2 for more information. These functions may need to be customized-for the source of your data

../output - where all of the output goes [not clear if the subfolders are created on demand] There are a series of data sets / objects that are names and carried around:

- \* dataset this is the name of the data set being used. It corresponds to an experiment and the name ususally contains the cell type, the type of normalization, the time, media, etc. All input and output files will contain this dataset name
- \* sigcatalog This is the name of the signature catalog. This is an excel file that lives in ../in-put/signatures. This file contains one row per signature and contains matching annotations such as the super\_target
- \* sigset One always uses a subset of the total set of signtures, indicated by haveing a value of 1 in the sigset column at the right hand of the signature catalog

### Imports stats,

stringr, grDevices, graphics, utils, methods, data.table, 2 R topics documented:

future.apply,	
future,	
GSVA,	
moments,	
numDeriv,	
openxlsx,	
parallel,	
RColorBrewer,	
reshape2,	
data.table,	
openxlsx,	
e1071,	
tidyverse	
<b>License</b> MIT + file LICENSE	
Encoding UTF-8	
LazyData true	
RoxygenNote 7.1.1	
Suggests knitr,	
rmarkdown	
VignetteBuilder knitr	

# ${\sf R}$ topics documented:

auc
baseline_gene_counts
bioplanet_builder
buildFCMAT1.fromDB
buildFCMAT2.fromDB
buildFCMAT2.fromDB.refchems
buildSampleMap
buildStudyChemicalMap
calcDEG
concatDESeq2Files
cutoffCalc
cutoffCalc.inner.emperical
cutoffCalc.inner.fc
cutoffCalcEmpirical
driver
$exportDSSToxSample \dots \dots$
$export Signature Cutoffs \ . \ . \ . \ . \ . \ . \ . \ . \ . \ $
export_mongo_httr_well
fixSuperTarget
geneBaseMeanDist
geneConcResp
geneConcRespPlot
$gene Conc Resp Plot Wrapper \ . \ . \ . \ . \ . \ . \ . \ . \ . \ $
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	signatureScoreCoreGSVA	
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### Description

Compute AUC for an ROC curve.

### Usage

```
auc(tpr, fpr)
```

### **Arguments**

tpr Vector of true positive rates.

fpr Vector of false positive rates.

### **Details**

Uses trapezoid rule numerical integration to approximate AUC. Will be more accurate with more fine-grained inputs.

### Value

AUC

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#### **Examples**

```
auc(c(0,.5,1), c(0,.5,1)) auc(c(0,1,1), c(0,.5,1))
```

```
baseline_gene_counts
```

Gene the baseline gene counts for the cell atlas project

### Description

Gene the baseline gene counts for the cell atlas project

### Usage

```
baseline_gene_counts(
  db = "httr_cell_atlas",
  dir = "../input/rawdata/cellatlas/"
)
```

#### **Arguments**

db The name of the Mongo database

dir The directory where the data will be stored

This functions takes files created by export\_mongo\_httr\_well() \* httr\_cell\_atlas

\* httr\_tox21\_cpp2

```
bioplanet_builder BioPlanet Builder
```

### Description

Converts BioPlanet data into usable pathway data.

#### Usage

```
bioplanet_builder(
  pathfile = "../input/processed_pathway_data/bioplanet_pathway.csv",
  catfile = "../input/processed_pathway_data/bioplanet_pathway_category.csv",
  pwayout = "../input/processed_pathway_data/bioplanet_PATHWAYS.RData",
  pdataout = "../input/processed_pathway_data/PATHWAY_LIST_bioplanet.RData")
```

#### **Arguments**

```
pathfile File name of bioplanet_pathway.csv.
catfile File name of bioplanet_pathway_category.csv.
pwayout File name of bioplanet_PATHWAYS.RData
```

pdataout File name of

buildFCMAT1.fromDB 5

#### **Details**

This function shows how BioPlanet data was converted to usable pathway files. As BioPlanet is updated, this function will have to be updated. It requires two downloaded .csv files with location specified by pathfile and catfile. It saves usable pathway files with location specified by pwayout and pdataout to disk.

#### Value

No output.

```
buildFCMAT1.fromDB Build the FCMAT1 data set
```

#### **Description**

version to start with Logan's database export The difference between this version and the original is that there are extra columns The function just changes one column name and writes the file to a standard name and place

#### Usage

```
buildFCMAT1.fromDB(
  dataset = "mcf7_ph1_pe1_normal_block_123_excludePG",
  dir = "../input/fcdata/new_versions/",

  infile = "httr_mcf7_ph1_bl123_FCmat1_meanncnt0_5-plateteffect_1-shrinkage_nc
  pg.filter.file = "httr_mcf7_ph1_flagged_pg_block_123_exclude.xlsx",
  do.load = T
)
```

### **Arguments**

```
dataset The name to give to the data set

dir The directory from which to read all of the raw files

infile The nae of the input file

pg.filter.file
An optional file to use in filtering out bad plate groups

do.load If TRUE, read the large input data file into memory
```

#### Value

A file with the FCMAT1 data is written to "../input/fcdata/FCMAT1\_",dataset,".RData"

buildFCMAT2.fromDB Transpose and filter the fold change matrix FCMAT1 in long format into a gene x sample format.

### Description

Transpose and filter the fold change matrix FCMAT1 in long format into a gene x sample format.

#### Usage

```
buildFCMAT2.fromDB(
  dataset = "mcf7_ph1_pe1_normal_block_123_excludePG",
  time = 24,
  media = "DMEM",
  dir = "../input/fcdata/",
  method = "gene",
  do.read = T
)
```

### **Arguments**

dataset	The name to give to the data set
time	The time in hours that the chemical dosing was run
media	THe name of the media used
dir	The directory from which to read all of the raw files
method	Either "gene" or "probe"
do.read	If TRUE, read in the FCMAT1 file and place in a global.

### Value

Global variables are created for the FC matrix (FCMAT2), the SE matrix (SEMAT2) and the chemical dictionary (CHEM\_DICT) which translates form the sample key (sample\_id\_conc\_time) to the individual components

```
buildFCMAT2.fromDB.refchems
```

Transpose and filter the fold change matrix FCMAT1 in long format into a gene x sample format. This is the method to use when there are conc-response profiles of refchems

### Description

Transpose and filter the fold change matrix FCMAT1 in long format into a gene x sample format. This is the method to use when there are conc-response profiles of refchems

buildSampleMap 7

#### Usage

```
buildFCMAT2.fromDB.refchems(
  dataset = "heparg2d_toxcast_pfas_pel_normal",
  time = 24,
  media = "DMEM",
  dir = "../input/fcdata/",
  method = "gene",
  do.read = F,
  do.prep = F
)
```

#### **Arguments**

dataset
time
The name to give to the data set
time
The time in hours that the chemical dosing was run
media
THe name of the media used
dir
The directory from which to read all of the raw files
method
Either "gene" or "probe"
do.read
If TRUE, read in the FCMAT1 file and place in a global.

#### Value

Global variables are created for the FC matrix (FCMAT2), the SE matrix (SEMAT2) and the chemical dictionary (CHEM\_DICT) which translates form the sample key (sample\_id\_conc\_time) to the individual components

buildSampleMap

Generate the sample\_key x sample x DSSTox file

#### **Description**

Generate the sample\_key x sample x DSSTox file

### Usage

```
buildSampleMap(
  dataset = "DMEM_6hr_pilot_normal_pe_1",
  dsstox.file = "../input/DSSTox/DSSTox_sample_map.xlsx",
  dir = "../input/fcdata/",
  outfile = "../input/chemicals/HTTr_pilot_sample_map.xlsx",
  do.read = F
)
```

#### **Arguments**

```
dataset

dsstox.file

dir

Directory where the FCMAT1 files lives

outfile

Name of the output file

do.read

Name of the input FCMAT1 files
```

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```
buildStudyChemicalMap
```

Build a catalog of the chemicals in a dataset

### Description

Build a catalog of the chemicals in a dataset

### Usage

```
buildStudyChemicalMap(dataset = "DMEM_6hr_screen_normal_pe_1")
```

### **Arguments**

dataset

The name of the HTTr dataset

#### Value

No output.

calcDEG

Calculate the relative variability of genes to get the DEGs

### **Description**

Calculate the relative variability of genes to get the DEGs

### Usage

```
calcDEG(
  dataset = "mcf7_ph1_pe1_normal_good_pg",
  dir = "../input/fcdata/",
  do.read = T
)
```

### **Arguments**

dataset The name to give to the data set

dir The directory from which to read all of the raw filesatalog file

do.read If TRUE, read in the HTTr data file

concatDESeq2Files 9

```
concatDESeq2Files Concatenate the input DESeq2 files
```

### **Description**

Concatenate the input DESeq2 files

### Usage

```
concatDESeq2Files(
  dataset = "DMEM_6hr_screen_normal_pe_1",

  indir = "../input/httr_mcf7_screen/meanncnt0_5-plateteffect_0-shrinkage_norm
  outdir = "../input/httr_mcf7_screen/"
)
```

### **Arguments**

dataset The name of the HTTr dataset indir The director to read from outdir The directory to write to

cutoffCalc

Calculate the signature-wise cutoffs based on the analytical method which does not break any correlations between genes

### Description

Calculate the signature-wise cutoffs based on the analytical method which does not break any correlations between genes

```
cutoffCalc(
 basedir = "../input/fcdata/",
 dataset = "heparg2d_toxcast_pfas_pe1_normal_refchems",
 sigcatalog = "signatureDB_master_catalog 2021-05-10",
 sigset = "screen_large",
 method = "fc",
 pval = 0.05,
  seed = 12345,
 nlowconc = 2,
 mc.cores = 1,
 dtxsid.exclude = NULL,
 do.load = T,
 do.cov = T,
 do.compare = F,
 to.file = F,
  verbose = F
)
```

basedir Directory that holds FCMAT2 and CHEM\_DICT files.

dataset Name of actual dataset to base cutoff on. signature catalog to use

sigset THe signature set

method The scoring method, either fc or gsea
pval The p-value for the baseline distribution

seed Random seed.

nlowconc Only include the lowest nlowconc concentrations for each chemical

mc.cores NUmber of coresto use when running parallel

dtxsid.exclude

dtxsids to exclude, default NULL

do.load If TRUE, reload the FCMAT2 matrix, signature catalog and chemical dictionary,

and store in globals

do.cov If TRUE, calculate the covariance matrix and store in a global

do.compare If TRUE, compare the cutoffs with those from the original method with no gene-

gene correlation

to.file If TRUE, and do.compare=TRUE, send a plot of the comparison to a file

verbose If TRUE, write a line for each signature to show progress.

#### Value

No output.

cutoffCalc.inner.emperical

Inner function for the cutoff calculation

### Description

Inner function for the cutoff calculation

#### Usage

```
cutoffCalc.inner.emperical(signature, pval)
```

### Arguments

signature The name of the signature for which the cutoff is to be calculated

pval The p-value for the baseline distribution

covmat THe covariance matrix

#### Value

vector containing the signature, cutoff, sd, bmed

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```
cutoffCalc.inner.fc
```

Inner function for the cutoff calculation

#### **Description**

Inner function for the cutoff calculation

### Usage

```
cutoffCalc.inner.fc(parent, catalog, allgenes, pval)
```

#### **Arguments**

parent The name of the signature parent for which the cutoff is to be calculated catalog

The signature catalog

allgenes THe list of all the genes in the data set
pval The p-value for the baseline distribution

covmat THe covariance matrix

#### Value

vector containing the parent (signature), cutoff, sd, bmed

```
cutoffCalcEmpirical
```

Calculate the signature-wise cutoffs based on the empirical distributions which does not break any correlations between genes

### Description

Calculate the signature-wise cutoffs based on the empirical distributions which does not break any correlations between genes

```
cutoffCalcEmpirical(
  basedir = "../input/fcdata/",
  dataset = "heparg2d_toxcast_pfas_pel_normal",
  sigset = "screen_large",
  method = "fc",
  pval = 0.05,
  nlowconc = 2,
  mc.cores = 1,
  dtxsid.exclude = NULL,
  do.load = T
```

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#### **Arguments**

basedir Directory that holds FCMAT2 and CHEM\_DICT files. Name of actual dataset to base cutoff on. dataset sigset THe signature set method The scoring method, either fc or gsea The p-value for the baseline distribution pval Only include the lowest nlowconc concentrations for each chemical nlowconc NUmber of cores to use when running parallel mc.cores dtxsid.exclude dtxsids to exclude, default NULL do.load If TRUE, reload the FCMAT2 matrix, signature catalog and chemical dictionary, and store in globals sigcatalog The name of the signature catalog to use do.cov If TRUE, calculate the covariance matrix and store in a global If TRUE, compare the cutoffs with those from the original method with no genedo.compare gene correlation If TRUE, and do.compare=TRUE, send a plot of the comparison to a file to.file If TRUE, write a line for each signature to show progress. verbose

#### Value

No output.

driver

Code to run all signature concentration-response calculations

```
driver(
 dataset = "heparg2d_toxcast_pfas_pel_normal",
  sigcatalog = "signatureDB_master_catalog 2021-05-10",
  sigset = "screen large",
  cutoff.dataset = NULL,
 normfactor = 7500,
 mc.cores = 25,
 bmr_scale = 1.349,
 pval = 0.05,
 nlowconc = 2,
 hccut = 0.95,
  tccut = 1.5,
  plotrange = c(1e-04, 100),
 method = "fc",
  celltype = "HepaRG",
 do.conc.resp = T,
 do.scr.plots = T,
  do.signature.pod = T,
  do.supertarget.boxplot = T,
  do.all = F
)
```

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#### **Arguments**

Name of the data set, produced by buildFCMAT2 dataset

Name of the signature catalog sigcatalog

sigset Name if the signature set. THis corresponds to a column in the signature catalog

cutoff.dataset

This is the data set name to sue when the cutoffs are taken from a different data set than the one currently being analyzed. The reason for doing this is if the current data set is small (small number of chemicals), and so not large enough to get a good estiamte of the underlying noise distribution. All of the other

parameters for both data sets have to be the same

normfactor Normalization factor for the conc-reap plots, default is 7500 Number of cores for parallel processing. Only works under Linux mc.cores

Scaling factor from the NULL SD to BMD, default is 1.349 bmr\_scale

pval Threshold for cutoff distribution confidence interval. Default=0.05 indicates a

95

\itemnlowconcOnly include the lowest nlowconc concentrations for each chemical

\itemhccutThe threshold for signatures to be called a hit, default=0.95,

\itemtccutThe threshold for top/cutoff o be a hit, default =1.5

\itemplotrangeThe concentration range for the conc-resp plots in uM, default is c(0.0001,100),

\itemmethodsignature scoring method in c("fc", "gsva", "gsea"), default is fc

\itemcelltypeName of the cull type, e.g. MCF7

\itemdo.conc.respIf true, run the concentration-response calculations

\itemdo.scr.plotsIf TRUE, generate the signature concentration response plots

\itemdo.signature.podIf TRUE, generate the signature PODs

\itemdo.supertarget.boxplotIf TRUE, generate the super target box plots

\itemdo.allIf TRUE, do all steps from do.build.random to the end

Available data sets \* heparg2d\_toxcast\_pfas\_pe1\_normal \* mcf7\_ph1\_pe1\_normal\_block\_123\_allPC

\* mcf7\_ph1\_pe1\_normal\_block\_123\_excludePG \* u2os\_toxcast\_pfas\_pe1\_normal

\* PFAS\_HepaRG \* PFAS\_U2OS \* u2os\_pilot\_pe1\_normal\_null\_pilot\_lowconc

\* u2os toxcast pfas pe1 normal refchems \* heparg2d toxcast pfas pe1 normal refchems

\* DMEM\_6hr\_pilot\_normal\_pe\_1 - MCF7 pilot

\itemdo.signature.summary.plotif TRUE, generate the summary plots

\itemdo.signature.pod.laneplotIf TRUE, generate the signature lane plots (only useful for small sets of chemicals)

Code to run all signature concentration-response calculations

exportDSSToxSample Generate the sample x DSSTox file

### Description

Generate the sample x DSSTox file

#### Usage

```
exportDSSToxSample(outfile = "../input/DSSTox/DSSTox_sample_map.xlsx")
```

#### **Arguments**

outfile Name of the file to be written

exportSignatureCutoffs

Export the signature-wise cutoffs

### **Description**

Export the signature-wise cutoffs

### Usage

```
exportSignatureCutoffs(
  do.load = F,
  dataset = "heparg2d_toxcast_pfas_pe1_normal",
  sigset = "screen_large",
  method = "fc"
)
```

#### **Arguments**

do.load If TRUE, load hte large data file
dataset The name of the HTTr data set to use
sigset The name of the signature set to use
method The scoring method to use

```
export_mongo_httr_well
```

Get the raw counts from the Mongo database

### **Description**

Get the raw counts from the Mongo database

```
export_mongo_httr_well(
  db = "httr_cell_atlas",
  collection = "httr_well_trt",
  dir = "../input/rawdata/cellatlas/"
)
```

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### **Arguments**

db	The name of the Mongo database
collection	THe name of the collection to export
dir	The directory where the data will be stored
	Collections * httr_cell_atlas * httr_tox21_cpp2

fixSuperTarget

Replace the super\_target values in the signature output file with ones from a new catalog

### **Description**

Replace the super\_target values in the signature output file with ones from a new catalog

### Usage

```
fixSuperTarget(
  do.read = T,
  dataset = "PFAS_U2OS",
  sigcatalog = "signatureDB_master_catalog 2021-05-10",
  sigset = "screen_large",
  method = "fc"
)
```

### **Arguments**

do.read If TRUE, read in FCMAT2 to a global dataset The L2fc matrix data set signature catalog file signet The name of the signature set to use method The scoring method

geneBaseMeanDist

get the base mean distribution for each gene

### **Description**

get the base mean distribution for each gene

```
geneBaseMeanDist(
  to.file = F,
  do.read = F,
  dataset = "DMEM_6hr_screen_normal_pe_1"
)
```

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#### **Arguments**

to.file	If TRUE, plot to a file
do.read	If TRUE, read the input file into memory
dataset	The name of the dataset

#### Value

No output.

#### **Description**

Wrapper that performs concentration response modeling for gene or probe l2fc's

### Usage

#### **Arguments**

```
dataset String that identifies data set.

mc.cores Number of parallel cores to use.

to.file If TRUE, results are written to an RData file, otherwise they are returned.

pval P-value cutoff between 0 and 1.

aicc If aicc = T, corrected AIC is used insstead of first order (regular) AIC.

fitmodels Vector of models names to be used. Default is all of them.
```

#### **Details**

Loads an FCMAT2 and CHEM\_DICT corresponding to given dataset. FCMAT should be chem/conc by gene or chem/conc by probe. Uses two lowest concentration of each column to estimate noise cutoff (as opposed to signature CR). Also, doesn't currently contain a plotting option.

### Value

If to.file = F, data frame containing results; otherwise, nothing.

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geneConcRespPlot

Pathway Concentration Response Plot

### **Description**

Plots a concentration response curve for one sample/signature combination.

### Usage

```
geneConcRespPlot(row, plotrange = c(0.001, 100))
```

#### **Arguments**

row

Named list containing:

- conc conc string separated by I's
- resp response string separated by I's
- · method scoring method determines plot bounds
- proper\_name chemical name for plot title
- cutoff noise cutoff
- bmr baseline median response; level at which bmd is calculated
- er fitted error term for plotting error bars
- a, tp, b, ga, p, la, q other model parameters for fit curve
- fit\_method curve fit method
- bmd, bmdl, bmdu bmd, bmd lower bound, and bmd upper bound
- ac50, acc curve value at 50
- top curve top
- time, signature\_signature\_class, signature\_size other identifiers

Other elements are ignored.

plotrange

The x-range of the plot as a vector of 2 elements, this can be changed for special cases, but defaults to 0.001 to 100

#### **Details**

row is one row of PATHWAY\_CR, the signatureConcResp output.

#### Value

No output.

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```
geneConcRespPlotWrapper
```

Wrapper for all of the conc-response plotting o genes

### Description

Wrapper for all of the conc-response plotting o genes

### Usage

```
geneConcRespPlotWrapper(
  dataset,
  mc.cores = 20,
  do.load = T,
  to.file = F,
  pval = 0.05,
  plotrange = c(le-04, 100),
  onefile = T,
  chemfile = "../input/PFAS/Immuntox chemical evidence.xlsx"
)
```

### **Arguments**

dataset	Name of the data set.
mc.cores	Number of cores to parallelize with.
do.load	If TRUE, load the SIGNATURE_CR file, otherwiseassume that it is in memory
to.file	to.file = T saves the output to a file; otherwise it's returned.
pval	Desired cutoff p-value.
plotrange	The x-range of the plot as a vector of 2 elements, this can be changed for special cases, but defaults to 0.001 to 100
onefile	If TRUE, put all plots into one file, instead of one filer per chemical
chemfile	A file of chemicals to use. If NULL, plot all chemicals

GSEA

My Gene Set Enrichment Analysis

### Description

Performs tweaked version of single sample GSEA.

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#### Usage

```
GSEA(
   X,
   geneSets,
   min.sz = 1,
   max.sz = Inf,
   alpha = 0.25,
   verbose = T,
   useranks = T
)
```

### Arguments

X	Transposed FCMAT2; i.e a gene by sample matrix of l2fc's including rownames and colnames. Equivalent to expr in gsva.
geneSets	Named list of signature definitions. Each element is a vector of gene names. Each element name is a signature name. E quivalent to gset.idx.list in gsva.
min.sz	Minimum signature size (deprecated).
max.sz	Maximum signature size (deprecated)
alpha	Power of R to use. Higher alpha will upweight more extreme ranks relative to middle ranks.
verbose	verbose = T prints gene set length message.
useranks	useranks = T uses ranks as in ssGSEA, while useranks = F uses the bare fold changes instead.

### **Details**

Based on the GSVA ssGSEA code. Main changes are: NAs are now handled correctly and rank is now centered on zero instead of beginning at one. Since signature sizes are undercounted here due to missing values, they are assessed more accurately in signatureScoreCoreGSEA and limits are enforced after scoring.

### Value

Outputs signature by sample matrix of signature scores.

### Examples

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pg\_id.to.sample\_id get the mapping between the plate groups and the samples

### **Description**

version to start with Logan's database export The difference between this version and the original is that there are extra columns The function just changes one column name and writes the file to a standard name and place

#### Usage

```
pg_id.to.sample_id(
  do.load = F,
  dataset = "mcf7_ph1_pe1_normal_block_123_allPG",
  dir = "../input/fcdata/"
)
```

### **Arguments**

do.load if T, load the initial file
dataset The name to give to the data set

dir The directory from which to read all of the raw files

#### Value

A mapping the sampels to the plate groups f

plotouter Plot Outer

### **Description**

Calls signatureConcResp plotting function.

### Usage

```
plotouter(proper_name, SIGNATURE_CR, foldname, plotrange = c(0.001, 100))
```

#### **Arguments**

proper\_name Chemical name to be used in file name.

SIGNATURE\_CR Dataframe output of signatureConcResp\_pval.

foldname Folder name for output file.

plotrange The x-range of the plot as a vector of 2 elements, this can be changed for special cases, but defaults to 0.001 to 100

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#### **Details**

Calls signatureConcResp plotting function for one chemical and every signature. Saves a single pdf to disk for the given chemical containing every signature CR plot.

#### Value

No output.

plotouterGene

Plot Outer

### **Description**

Calls signatureConcResp plotting function.

### Usage

```
plotouterGene(proper_name, GENE_CR, foldname, plotrange = c(0.001, 100))
```

### Arguments

proper\_name Chemical name to be used in file name.

GENE\_CR Dataframe output of geneConcResp\_pval.

foldname Folder name for output file.

plotrange The x-range of the plot as a vector of 2 elements, this can be changed for special

cases, but defaults to 0.001 to 100

#### **Details**

Calls signatureConcResp plotting function for one chemical and every signature. Saves a single pdf to disk for the given chemical containing every signature CR plot.

### Value

No output.

podLaneplot Build lane plots by chemical list and signature class, across the datasets

### **Description**

Build lane plots by chemical list and signature class, across the datasets

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#### Usage

```
podLaneplot(
   to.file = F,
   dataset = "DMEM_6hr_pilot_normal_pe_1",
   sigset = "pilot_large_all_100CMAP",
   method = "gsea",
   hccut = 0.9,
   plot.signature_min = F,
   bmd.mode = "percent"
)
```

### **Arguments**

to.file If TRUE, write plots to a file

dataset The data set to use

sigset THe signature set to use

method Scoring method

hccut Exclude rows with hitcall less than this value

bmd.mode percent or abs

plot.signature.min

If TRUE, plot the minimum signature

```
printCurrentFunction
```

Print the name of the current function

### Description

Print the name of the current function

### Usage

```
printCurrentFunction(comment.string = NA)
```

### **Arguments**

```
comment.string
```

An optinal string to be printed

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R2

R Squared

### Description

Calculate coefficient of determination.

### Usage

```
R2(y, pred)
```

### Arguments

y Vector of actual values.

pred Vector of corresponding predicted values.

#### **Details**

Note that order matters: R2(x,y) != R2(y,x) in general.

### Value

Coefficient of determination.

### **Examples**

```
R2(c(1:10), c(1:10*.8))
R2(c(1:10*.8), c(1:10))
```

RMSE

Root-mean-square-error

### Description

Computes root-mean-square-error between two vectors.

### Usage

```
RMSE(x, y)
```

### Arguments

x First vector.y Second vector.

### Value

**RMSE** 

### **Examples**

```
RMSE(1:3, c(1,3,5))
```

24 runAllSignatureCR

runAllSignatureCR Run All Pathway Concentration Response (P-Value)

#### **Description**

Driver for signature scoring and concentration response (CR).

### Usage

### **Arguments**

dataset Name of data set. sigset Name of signature set. cutoff.dataset

This is the data set name to sue when the cutoffs are taken from a different data set than the one currently being analyzed. The reason for doing this is if the current data set is small (small number of chemicals), and so not large enough to get a good estiamte of the underlying noise distribution. All of the other parameters for both data sets have to be the same

signature catalog Name of the signature catalog

method Pathway scoring method in c("fc", "gsva", "gsea")

bmr\_scale bmr scaling factor. Default = 1.349

normfactor Factor to scale the native units up by to get onto a reasonable plotting value (~

-1 to 1)

minsigsize Minimum signature size.

pval P-value to use for noise estimation.

nlowconc Only include the lowest nlowconc concentrations for each chemical

mc.cores Vector with two values: number of cores to use for signature scoring and number

of cores to use for CR. CR can usually handle the maximum number, but gsva

scoring might require a smaller number to avoid memory overflow.

fitmodels Vector of model names to run conc/resp with. "cnst" should always be chosen.

#### **Details**

Signature scores are written to disk in output/signature\_score\_summary/. Signature cutoffs are written to disk in output/signature\_cutoff/. CR results are written to disk in output/signature\_conc\_resp\_summary/.

#### Value

```
No output.
```

remove gnls from default set

```
signatureCatalogLoader
```

Merge the up and down halves of the pathway data

### Description

Merge the up and down halves of the pathway data

### Usage

```
signatureCatalogLoader(
   sigset = "wgcna",
   sigcatalog = "signatureDB_wgcna_mcf7_ph1_pe1_normal_good_pg_MCF7_12_10_catalog)
```

### Arguments

```
sigset Name of the signature set.
sigcatlog Name of the catalog file
```

### Value

the trimmed signature table

```
signatureConcResp Pathway Concentration Response (P-value)
```

### Description

Performs signature concentration response using p-value based cutoffs.

26 signatureConcResp

#### **Usage**

```
signatureConcResp(
 dataset,
 sigset,
 cutoff.dataset,
 sigcatalog,
 method,
 bmr_scale = 1.349,
 mc.cores = 1,
 pval = 0.05,
 nlowconc = 2,
 aicc = F,
 minsigsize = 10,
 fitmodels = c("cnst", "hill", "qnls", "poly1", "poly2", "pow", "exp2", "exp3",
    "exp4", "exp5")
)
```

#### **Arguments**

dataset Name of the data set. sigset Name of the signature set. cutoff.dataset

> This is the data set name to sue when the cutoffs are taken from a different data set than the one currently being analyzed. The reason for doing this is if the current data set is small (small number of chemicals), and so not large enough to get a good estiamte of the underlying noise distribution. All of the other

parameters for both data sets have to be the same

Pathway scoring method in c("fc", "gsva", "gsea") method

bmr\_scale bmr scaling factor. Default = 1.349 mc.cores Number of cores to parallelize with.

pval Desired cutoff p-value.

nlowconc Only include the lowest nlowconc concentrations for each chemical

aicc aicc = T uses corrected AIC to choose winning method; otherwise regular AIC.

Minimum allowed signature size. Sample/signature combinations with less than minsigsize

this number of non-missing 12fc's will be discarded.

Vector of model names to use. Probably should include "cnst". fitmodels

#### **Details**

dataset should have already been scored using signatureScore and the given sigset and method. This function prepares signatureScore output for CR processing, calls signatureConcRespCore\_pval, formats the output, saves it to disk

### Value

If to file = T, nothing. If to file = F, dataframe with signature CR output.

```
signatureConcRespFilter
```

Filter the conc-response data for just the most potent results and plot the conc-response curves if desired

### **Description**

Filter the conc-response data for just the most potent results and plot the conc-response curves if desired

### Usage

```
signatureConcRespFilter(
  to.file = F,
  do.plot = F,
  do.load = T,
  hccut = 0.9,
  tccut = 1.5,
  dataset = "heparg2d_toxcast_pfas_pel_normal",
  sigset = "screen_large",
  method = "fc",
  do.pfas = F
```

### **Arguments**

```
If TRUE, send plots to a file
to.file
do.plot
                  If TRUE do the plotting
                  If TRUE, load the data file
do.load
hccut
                  Exclude rows with hitcall below this value
                  Exclude rows with top_over_cutoff below this value
tccut
                  Dataset to use
dataset
sigset
                  Signature set to use
                  signature scoring method in c("fc", "gsva", "gsea")
method
do.pfas=F
                  Error bars are \exp(er)*qt(.025,4) = \exp(er)*2.7765
```

```
\verb|signatureConcRespPlot|\\
```

Pathway Concentration Response Plot

### **Description**

Plots a concentration response curve for one sample/signature combination.

```
signatureConcRespPlot(row, plotrange = c(0.001, 100))
```

row

Named list containing:

- conc conc string separated by I's
- resp response string separated by I's
- method scoring method determines plot bounds
- proper\_name chemical name for plot title
- cutoff noise cutoff
- bmr baseline median response; level at which bmd is calculated
- er fitted error term for plotting error bars
- a, tp, b, ga, p, la, q other model parameters for fit curve
- fit\_method curve fit method
- bmd, bmdl, bmdu bmd, bmd lower bound, and bmd upper bound
- ac50, acc curve value at 50
- top curve top
- time, signature\_signature\_class, signature\_size other identifiers

Other elements are ignored.

plotrange

The x-range of the plot as a vector of 2 elements, this can be changed for special cases, but defaults to 0.001 to 100

### **Details**

row is one row of PATHWAY\_CR, the signatureConcResp output.

#### Value

No output.

```
signatureConcRespPlotWrapper
```

Wrapper for all of the conc-response plotting

### Description

Wrapper for all of the conc-response plotting

```
signatureConcRespPlotWrapper(
    sigset,
    dataset,
    sigcatalog,
    method,
    bmr_scale = 1.349,
    mc.cores = 20,
    do.load = T,
    pval = 0.05,
    plotrange = c(1e-04, 100)
)
```

sigset	Name of the signature set.
dataset	Name of the data set.
sigcatalog	Name of the signature catalog
method	Pathway scoring method in c("fc", "gsva", "gsea")
bmr_scale	bmr scaling factor. Default = 1.349
mc.cores	Number of cores to parallelize with.
do.load	If TRUE, load the SIGNATURE_CR file, otherwiseassume that it is in memory to file to file = T saves the output to a file; otherwise it's returned.
pval	Desired cutoff p-value.
plotrange	The x-range of the plot as a vector of 2 elements, this can be changed for special cases, but defaults to 0.001 to 100

signatureConcRespToZ

Convert the conc-response data to a z score

### Description

Convert the conc-response data to a z score

### Usage

```
signatureConcRespToZ(
  do.load = T,
  mc.cores = 2,
  dataset = "heparg2d_toxcast_pfas_pel_normal",
  sigset = "screen_large",
  method = "fc",
  celltype = "HepaRG",
  hccut = 0.95,
  tccut = 1.5
)
```

### Arguments

do.load	If TRUE, load hte large HTTr data set
mc.cores	NUmber of cores to use in multi-core mode=2,
dataset	Name of the HTTr data set being used
sigset	Name of the signature set used
method	Scoring method used
celltype	name of cell type ebing used
hccut	Exclude signature rows with hitcall less than this value
tccut	Exclude signature rows with top_over_cutoff less than this value

signaturePOD

Calculate PODs at the signature level

### **Description**

Calculate PODs at the signature level

### Usage

```
signaturePOD(
  do.load = F,
  sigset = "screen_large",
  dataset = "PFAS_U2OS",
  method = "fc",
  bmr_scale = 1.349,
  hccut = 0.95
)
```

#### **Arguments**

```
sigset Name of signature set.

dataset Name of data set.

method Pathway scoring method in c("fc", "gsva", "gsea")

bmr_scale bmr scaling factor. Default = 1.349

hccut Remove rows with hitcall less than this value

do.laod If TRUE, load the input data into memory
```

signaturePOD.BMRcompare

Compare the PODs with different BMR values

### Description

Compare the PODs with different BMR values

```
signaturePOD.BMRcompare(
  to.file = F,
  dataset = "mcf7_ph1_pe1_normal_block_123",
  sigset = "screen_large",
  method = "fc",
  bmr_scale = 1,
  hccut = 0.9
)
```

signaturePODsummary 31

### **Arguments**

to.file	If TRUE, write plots to a file
dataset	Name of data set.
sigset	Name of signature set.
method	Pathway scoring method
bmr_scale	bmr scaling factor. Default = $1.349$
hccut	Remove rows with hitcall less than this value

```
signaturePODsummary
```

Summarize the POD overlap with ToxCast

### **Description**

Summarize the POD overlap with ToxCast

### Usage

```
signaturePODsummary(
  sigset = "pilot_large_all_100CMAP",
  dataset = "DMEM_6hr_pilot_normal_pe_1",
  method = "gsea"
)
```

### Arguments

sigset THe name of the signature set
dataset Name of the HTTr data set
method THe signature scoring method

signatureScore

Signature Score

### Description

Computes and saves signature scores.

```
signatureScore(
  FCMAT2,
  CHEM_DICT,
  sigset,
  sigcatalog,
  dataset,
  method,
  normfactor = 7500,
  mc.cores = 1,
  minsigsize = 10
)
```

FCMAT2	Sample by gene matrix of log2(fold change)'s. Rownames are sample keys and colnames are genes.
CHEM_DICT	Dataframe with one row per sample key and seven columns: sample_key, sample_id, conc, time, casrn, name, dtxsid.
sigset	Name of signature set.
sigcatalog	Name of the signature catalog file
dataset	Name of data set.
method	Signature scoring method in c("fc", "gsva", "gsea")
normfactor	Value passed of the plotting code to scale the y values
mc.cores	Number of cores to use.
minsigsize	Minimum allowed signature size BEFORE accounting for missing values.

### **Details**

signatureScore is a driver for various scoring methods. The three that are currently available are "gsva", "gsea", "fc", and "gsea\_norank" (a version of gsea that uses fold changes instead of ranks as weights). Deprecated methods include the Fisher method and gsvae (gsva with empirical cdfs). Beware running out of memory on large runs with gsva, Linux, and many cores. Signature size is counted according to number of genes in the signature that are also in the column names of FC-MAT2. However, each method performs a more rigorous size count internally that accounts for missing values and adds this to the output. This minsigsize is enforced when running signatureConcResp\_pval.

#### Value

No output.

```
\verb|signatureScoreCoreFC|
```

Signature Score Core - FC

### **Description**

Computes fold change signature scores.

```
signatureScoreCoreFC(
  fcdata,
  sigset,
  dataset,
  chem_dict,
  signature_data,
  ngenemax = NULL,
  verbose = F
)
```

fcdata	Sample by gene matrix of log2(fold change)'s. Rownames are sample keys and colnames are genes.	
sigset	Name of signature set.	
dataset	Name of data set.	
chem_dict	Dataframe with one row per sample key and seven columns: sample_key, sample_id, conc, time, casrn, name, dtxsid.	
signature_data		
	Named ist of gene name vectors. Each element is one signature, defined by the genes it contains.	
ngenemax	If ngene is not NULL, then tonly the most extreme n genes of the signature will be used for the "in" set	
verbose	If TRUE, weite extra diagnostic output	

#### **Details**

This fast implementation of fold change signature scores uses matrix multiplication. The score is simply: mean(fold change of genes in signature) - mean(fold change of genes outside signature).

### Value

Dataframe with one row per chemical/conc/signature combination. Columns are: sample\_id, dtxsid, casrn, name, time, conc, sigset, signature, size (signature size accounting for missing values), mean\_fc\_scaled\_in, mean\_fc\_scaled\_out, signature\_score.

```
signatureScoreCoreGSEA
```

Signature Score Core - GSEA

### **Description**

Computes signature scores for gsea.

```
signatureScoreCoreGSEA(
    sk.list,
    method = "gsea",
    normfactor = 7500,
    sigset,
    dataset,
    fcmat,
    chem_dict,
    signature_data,
    mc.cores = 1,
    normalization = T,
    useranks = T
)
```

sk.list	Sample keys to use; should correspond to fcmat rownames.	
method	Method name to use in file output. "gsea" or "gsea_norank"	
sigset	Name of signature set.	
dataset	Name of data set.	
fcmat	Sample by gene matrix of $\log 2 (\text{fold change})$ 's. Rownames are sample keys and colnames are genes.	
chem_dict	Dataframe with one row per sample key and seven columns: sample_key, sample_id, conc, time, casrn, name, dtxsid.	
signature_data		
	Named ist of gene name vectors. Each element is one signature, defined by the genes it contains.	
mc.cores	Number of cores to use. Parallelization is performed by gsva itself.	
normalization		
	normalization = T normalizes final scores.	
useranks	useranks = T uses score ranks for weighting; otherwise, fold changes are used for weights.	

### **Details**

This function is a parallelized wrapper for gsea, which does the actual scoring. gsea method uses ranks and normalization, while gsea\_norank method does not use ranks or normalization. Normalization divides final scores by difference between max and min score. Without normalization, scores from individual samples have no impact on each other. Final signaturescoremat is written to disk.

### Value

No output.

```
\verb|signatureScoreCoreGSVA| \\
```

Signature Score Core - GSVA

### Description

Computes GSVA signature scores.

```
signatureScoreCoreGSVA(
    sk.list,
    sigset = "FILTERED",
    dataset,
    fcmat,
    chem_dict,
    signature_data,
    mc.cores = 1
)
```

signatureScoreMerge 35

#### **Arguments**

sk.list Sample keys to use; should correspond to fcmat rownames.

sigset Name of signature set.

dataset Name of data set.

fcmat Sample by gene matrix of log2(fold change)'s. Rownames are sample keys and

colnames are genes.

chem\_dict Dataframe with one row per sample key and seven columns: sample\_key, sam-

ple\_id, conc, time, casrn, name, dtxsid.

signature\_data

Named ist of gene name vectors. Each element is one signature, defined by the

genes it contains.

mc.cores Number of cores to use. Parallelization is performed by gsva itself.

#### **Details**

This function is a wrapper for GSVA with Gaussian cdf kernels. signaturescoremat output is saved directly to disk.

#### Value

No output.

signatureScoreMerge

Merge the up and down halves of the pathway data

#### **Description**

Merge the up and down halves of the pathway data

#### Usage

```
signatureScoreMerge(sigset, sigcatalog, dataset, method)
```

### **Arguments**

 $\label{eq:normalized} \textit{Name of the signature set.}$ 

 ${\tt dataset} \qquad \qquad {\tt Name \ of \ the \ data \ set.}$ 

method Pathway scoring method in c("fc", "gsva", "gsea")

sigcatlog Name of the catalog file

#### Value

nothing

36 superTargetBoxplot

 $superTargetBoxplot \ \textit{Generate chemical-wise boxplot of the BMD distributions by super\_target}$ 

### **Description**

Generate chemical-wise boxplot of the BMD distributions by super\_target

### Usage

```
superTargetBoxplot(
   to.file = T,
   do.load = T,
   dataset = "mcf7_ph1_pe1_normal_block_123_allPG",
   sigcatalog = "signatureDB_master_catalog 2021-04-24",
   sigset = "screen_large",
   method = "fc",
   celltype = "MCF7",
   hccut = 0.95,
   tccut = 1.5,
   cutoff = 5,
   minconc = 0.001,
   maxconc = 100
)
```

### Arguments

to.file	If TRUE, send the plots to a file
do.load	If TRUE, load hte large HTTr data set into memory
dataset	Name of the HTTr data set
sigcatalog	Name of the signature catalog to use
sigset	Name of the signature set
method	Scoring method
celltype	Name of the cell type
hccut	Exclude rows in the data set with hitcall less than this value
tccut	Exclude rows in the data set with top_over_cutoff less than this value
cutoff	The minimum number of signatures hat have to be active in a super target for the super target to be considered active. Default is 5
minconc	Minimum concentration used in the plots
maxconc	Maximum concentration used in the plots After running this, run the following superTargetPODplot superTargetStats

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 $\begin{array}{c} {\tt superTargetPODplot} \ \textit{Generate chemical-wise boxplot of the BMD distributions by su-per\_target} \\ \end{array}$ 

### Description

Generate chemical-wise boxplot of the BMD distributions by super\_target

### Usage

```
superTargetPODplot(
  to.file = F,
  dataset = "heparg2d_toxcast_pfas_pel_normal_refchems",
  sigset = "screen_large",
  method = "fc",
  celltype = "HepaRG",
  hccut = 0.95,
  tcut = 1.5,
  cutoff = 5
)
```

### Arguments

to.file	If TRUE, send the plots to a file
dataset	Name of the HTTr data set
sigset	Name of the signature set
method	Scoring method
celltype	Name of the cell type
hccut	Exclude rows in the data set with hitcall less than this value
tccut	Exclude rows in the data set with top_over_cutoff less than this value
cutoff	The minimum number of signatures hat have to be active in a super target for the super target to be considered active. Default is 5

superTargetStats Generate hit statistics by super\_target

### Description

Generate hit statistics by super\_target

TxT

#### Usage

```
superTargetStats(
  do.load = F,
  dataset = "heparg2d_toxcast_pfas_pel_normal_refchems",
  sigset = "pilot_tiny",
  method = "fc",
  celltype = "HepaRG",
  hccut = 0.95,
  tccut = 1.5,
  cutoff = 5
)
```

### **Arguments**

do.load If TRUE, Load the large input data file Name of the HTTr data set dataset sigset Name of the signature set Scoring method method Name of the cell type celltype Exclude rows in the data set with hitcall less than this value hccut Exclude rows in the data set with top\_over\_cutoff less than this value tccut cutoff The minimum number of signatures hat have to be active in a super target for

. .

the super target to be considered active. Default is 5

TxT Calc

Calculate several statistics on a 2 x 2 matrix

### **Description**

Calculate several statistics on a 2 x 2 matrix

### Usage

```
TxT(tp, fp, fn, tn, do.p = TRUE, rowname = NA)
```

### **Arguments**

tp	number of true positives
fp	number of false positives
fn	number of false negatives
tn	number of true negatives

do.p if TRUE, calcualte an exact p-value

rowname if not NA, adda column to the output with this rowname

Returns: a list of the results a: TP b: FP c: FN d: TN sens: sensitivity spec: specificity ba: Balanced Accuracy accuracy: Accuracy relative.risk: Relative Risk odds.ratio: Odds Ratio or.ci.lwr: lower confidence interval of the Odds

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Ratio or.ci.upr: upper confidence interval of the Odds Ratio ppv: Positive Predictive Value npv: Negative Predictive Value p.value: Chi-squared p-value F1: 2TP/(2TP+FP+FN)

sval: All of the results as a tab-delimited string title: the title of the results as a tab-delimited string mat: The results as a 1-row data frame @export

WRMSE

Weighted Root-mean-square-error

### **Description**

Computes root-mean-square error with weighted average.

### Usage

```
WRMSE(x, y, w)
```

### **Arguments**

x First vector of numbers.

y Second vector of numbers.

w Vector of weights.

### **Details**

x,y,w should all be the same length. Order of x and y won't change output.

#### Value

Weighted RMSE.

### **Examples**

```
WRMSE(1:3, c(1,3,5), 1:3)
```

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