Package 'mSigHdp'

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ActivateAndBurnin AnalyzeAndPlotretval ChainsDiagnosticPlot CleanChlist CombinePosteriorChains ExtendBurnin GenerateAverageCluster Generateppindex MultipleSetupAndPosterior ParallelPosteriorafterBurnin PrepInit

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Description

Prepare an hdpState-class object and run the Gibbs sampling burnin.

Usage

```
ActivateAndBurnin(
  input.catalog,
  seedNumber = 1,
  K.guess,
  multi.types = FALSE,
  verbose = TRUE,
  burnin = 4000,
  cpiter = 3,
  burnin.verbosity = 0,
  gamma.alpha = 1,
  gamma.beta = 1
)
```

Arguments

```
input.catalog
                 Input spectra catalog as a matrix or in ICAMS format.
seedNumber
                 An integer that is used to generate separate random seeds for the call to dp_activate,
                 and before the call of hdp_burnin.
K.guess
                 Suggested initial value of the number of signatures, passed to dp_activate
                 as initcc.
                 A logical scalar or a character vector. If FALSE, The HDP analysis will regard
multi.types
                 all input spectra as one tumor type.
                 If TRUE, the HDP analysis will infer tumor types based on the string before "::"
                 in their names. e.g. tumor type for "SA.Syn.Ovary-AdenoCA::S.500" would be
                 "SA.Syn.Ovary-AdenoCA"
                 If multi.types is a character vector, then it should be of the same length as
                 the number of columns in input.catalog, and each value is the name of the
                 tumor type of the corresponding column in input.catalog.
                 e.g. c("SA.Syn.Ovary-AdenoCA", "SA.Syn.Kidney-RCC").
verbose
                 If TRUE then message progress information.
burnin
                 Pass to hdp_burnin burnin.
                 Pass to hdp_burnin cpiter.
cpiter
```

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```
burnin.verbosity
```

Pass to hdp_burnin verbosity.

gamma.alpha Shape parameter

Shape parameter of gamma distribution from which the Dirichlet process concentration parameters are drawn; in this function the gamma distributions for all

Dirichlet processes are the same.

gamma . beta Inverse scale parameter (rate parameter) of gamma distribution from which the

Dirichlet process concentration parameters are drawn; in this function the gamma

distributions for all Dirichlet processes are the same.

Value

A list with 2 elements:

hdplist A list representation of an hdpState-class object.

likelihood A numeric vector with the likelihood at each iteration.

AnalyzeAndPlotretval

Evaluate and plot retval from CombinePosteriorChains

Description

Evaluate and plot retval from CombinePosteriorChains

Usage

```
AnalyzeAndPlotretval(
  retval,
  out.dir = NULL,
  ground.truth.sig = NULL,
  ground.truth.exp = NULL,
  verbose = TRUE,
  overwrite = TRUE,
  diagnostic.plot = TRUE
)
```

Arguments

retval the output from function CombinePosteriorChains

out.dir Directory that will be created for the output; if overwrite is FALSE then

abort if out.dir already exits.

ground.truth.sig

Optional. Either a string with the path to file with ground truth signatures or and ICAMS catalog with the ground truth signatures. These are the signatures used to construct the ground truth spectra.

ground.truth.exp

Optional. Ground truth exposure matrix or path to file with ground truth exposures. If NULL skip checks that need this information.

verbose If TRUE then message progress information.

overwrite If TRUE overwrite out.dir if it exists, otherwise raise an error.

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diagnostic.plot

If TRUE plot diagnostic plot. This is optional because there are cases having error

ChainsDiagnosticPlot

Diagnostic plot for a hdpSampleMulti object

Description

Diagnostic plot for a hdpSampleMulti object

Usage

```
ChainsDiagnosticPlot(retval, out.dir, verbose)
```

Arguments

retval

output from CombinePosteriorChains.A list with the following elements:

signature The extracted signature profiles as a matrix; rows are mutation types, columns are samples (e.g. tumors).

exposure The inferred exposures as a matrix of mutation counts; rows are signatures, columns are samples (e.g. tumors).

multi.chains A hdpSampleMulti-class object. This object has the method chains which returns a list of hdpSampleChain-class objects. Each of these sample chains objects has a method final_hdpState (actually the methods seems to be just hdp) that returns the hdpState from which it was generated.

out.dir

Directory that will be created for the output; if overwrite is FALSE then

abort if out.dir already exits.

verbose

If TRUE then message progress information.

CleanChlist

If the job of Gibbs sampling from MultipleSetupAndPosterior has an error caught by R, the corresponding element of chlist has class try-error. If the job is stopped with, e.g. a segfault, the chlist element is NULL.

Description

If the job of Gibbs sampling from MultipleSetupAndPosterior has an error caught by R, the corresponding element of chlist has class try-error. If the job is stopped with, e.g. a segfault, the chlist element is NULL.

```
CleanChlist(chlist, verbose = FALSE)
```

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Arguments

chlist A list of hdpSampleChain-class objects.

verbose If TRUE then message progress information.

Value

Invisibly, the clean, non-error chlist This is a list of hdpSampleChain-class objects.

CombinePosteriorChains

Extract components and exposures from multiple posterior sample chains

Description

Extract components and exposures from multiple posterior sample chains

Usage

```
CombinePosteriorChains(
  clean.chlist,
  input.catalog,
  multi.types,
  cluster.method = "kmedians",
  verbose = TRUE,
  cos.merge = 0.9,
  categ.CI = 0.95,
  exposure.CI = 0.95,
  min.sample = 1
)
```

Arguments

 $\verb|clean.chlist| It collects the output of multiple independent hdp_posterior calls.$

input.catalog

Input spectra catalog as a matrix or in ICAMS format.

multi.types

A logical scalar or a character vector. If FALSE, The HDP analysis will regard all input spectra as one tumor type.

If TRUE, the HDP analysis will infer tumor types based on the string before "::" in their names. e.g. tumor type for "SA.Syn.Ovary-AdenoCA::S.500" would be "SA.Syn.Ovary-AdenoCA"

If multi.types is a character vector, then it should be of the same length as the number of columns in input.catalog, and each value is the name of the tumor type of the corresponding column in input.catalog.

e.g. c("SA.Syn.Ovary-AdenoCA", "SA.Syn.Kidney-RCC").

cluster.method

A kccaFamily object input for flexclust package

verbose If TRUE then message progress information.

ExtendBurnin

cos.merge	The cosine similarity threshold for merging raw clusters from the posterior sam-
	pling chains into "components" i.e. signatures; passed to hdp_extract_components.
categ.CI	A numeric object between 0 and 1. The level of confidence interval used in step
	4 of hdp_merge_and_extract_components
exposure.CI	A numeric object between 0 and 1. The level of confidence interval used in step
	5 of hdp_merge_and_extract_components
min.sample	A "component" (i.e. signature) must have at least this many samples; passed to
	hdp extract components.

Value

Invisibly, a list with the following elements:

signature The extracted signature profiles as a matrix; rows are mutation types, columns are samples (e.g. tumors).

exposure The inferred exposures as a matrix of mutation counts; rows are signatures, columns are samples (e.g. tumors).

multi.chains A hdpSampleMulti-class object. This object has the method chains which returns a list of hdpSampleChain-class objects. Each of these sample chains objects has a method final_hdpState (actually the methods seems to be just hdp) that returns the hdpState from which it was generated.

sum_raw_clusters_after_cos_merge A matrix containing aggregated spectra of raw clusters after
cosine similarity merge step in hdp_merge_and_extract_components

sum_raw_clusters_after_nonzero_categ A matrix containing aggregated spectra of raw clusters after non-zero category selecting step in hdp_merge_and_extract_components

ExtendBurnin	Extend Burn in iteration for a list representation of an
	$\begin{tabular}{ll} hdpState-class \it object. \it This list is an \it output from hdp_burnin\\ \it or Activate and Burnin. \end{tabular}$

Description

Extend Burn in iteration for a list representation of an hdpState-class object. This list is an output from hdp_burnin or ActivateandBurnin.

Usage

```
ExtendBurnin(hdplist, seedNumber = 1, burnin = 4000, cpiter = 3, verbosity = 0)
```

Arguments

hdplist	A list representation of an hdpState-class object
seedNumber	A random seed for setting the environment of hdp_burnin.
burnin	Pass to hdp_posterior burnin.
cpiter	Pass to hdp_posterior cpiter.
verbosity	Pass to hdp_posterior verbosity.

Value

A list with hdp object after burn-in iteration and likelihood of iteration

GenerateAverageCluster

Generate average pattern of clusters of each posterior chain from combined list of multiple posterior sample chains

Description

Generate average pattern of clusters of each posterior chain from combined list of multiple posterior sample chains

Usage

```
GenerateAverageCluster(clean.chlist)
```

Arguments

clean.chlist A list of multiple (or one) posterior sample chains.

Value

A list of matrices containing the average pattern of clusters within each posterior chain and a list of matrices containing the sum of each cluster in each posterior chain

Generateppindex

Generate index for a HDP structure and num.tumor.types for other functions

Description

Generate index for a HDP structure and num.tumor.types for other functions

Usage

```
Generateppindex(multi.types, input.catalog)
```

Arguments

multi.types

A logical scalar or a character vector. If FALSE, The HDP analysis will regard all input spectra as one tumor type.

If TRUE, the HDP analysis will infer tumor types based on the string before "::" in their names. e.g. tumor type for "SA.Syn.Ovary-AdenoCA::S.500" would be "SA.Syn.Ovary-AdenoCA"

If multi.types is a character vector, then it should be of the same length as the number of columns in input.catalog, and each value is the name of the tumor type of the corresponding column in input.catalog.

```
e.g. c("SA.Syn.Ovary-AdenoCA", "SA.Syn.Kidney-RCC").
```

input.catalog

Input spectra catalog as a matrix or in ICAMS format.

MultipleSetupAndPosterior

Activate hierarchical Dirichlet processes and run posterior sampling in parallel.

Description

Activate hierarchical Dirichlet processes and run posterior sampling in parallel.

Usage

```
MultipleSetupAndPosterior(
  input.catalog,
  seedNumber = 1,
  K.guess,
  multi.types = FALSE,
  verbose = TRUE,
  post.burnin = 4000,
  post.n = 50,
  post.space = 50,
  post.cpiter = 3,
  post.verbosity = 0,
  CPU.cores = 1,
  num.child.process = 4,
  gamma.alpha = 1,
  gamma.beta = 1,
  checkpoint.chlist = TRUE
)
```

Arguments

```
input.catalog
```

Input spectra catalog as a matrix or in ICAMS format.

seedNumber A random seeds passed to dp_activate.

K. guess Suggested initial value of the number of signatures, passed to dp_activate

as initcc.

multi.types A logical scalar or a character vector. If FALSE, The HDP analysis will regard

all input spectra as one tumor type.

If TRUE, the HDP analysis will infer tumor types based on the string before "::" in their names. e.g. tumor type for "SA.Syn.Ovary-AdenoCA::S.500" would be

"SA.Syn.Ovary-AdenoCA"

If multi.types is a character vector, then it should be of the same length as the number of columns in input.catalog, and each value is the name of the

tumor type of the corresponding column in input.catalog.

e.g. c("SA.Syn.Ovary-AdenoCA", "SA.Syn.Kidney-RCC").

verbose If TRUE then message progress information.

post.burnin Pass to hdp_posterior burnin.

post.n Pass to hdp_posterior n.

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```
post.space
                 Pass to hdp posterior space.
post.cpiter
                 Pass to hdp_posterior cpiter.
post.verbosity
                 Pass to hdp_posterior verbosity.
CPU.cores
                 Number of CPUs to use; there is no point in making this larger than num.child.process.
num.child.process
                 Number of posterior sampling chains; can set to 1 for testing.
                 Shape parameter of gamma distribution from which the Dirichlet process con-
gamma.alpha
                 centration parameters are drawn; in this function the gamma distributions for all
                 Dirichlet processes are the same.
                 Inverse scale parameter (rate parameter) of gamma distribution from which the
gamma.beta
                 Dirichlet process concentration parameters are drawn; in this function the gamma
                 distributions for all Dirichlet processes are the same.
checkpoint.chlist
                 If TRUE, checkpoint the (unclean) chlist to "initial.chlist.Rdata" in the current
                 working directory. and checkpoint the clean chlist to "clean.chlist.Rdata" in the
                 current working directory.
```

Value

Invisibly, the clean chlist (output of CleanChlist). This is a list of hdpSampleChain-class objects.

ParallelPosteriorafterBurnin

Generate an HDP Gibbs sampling chain from a spectra catalog.

Description

Generate an HDP Gibbs sampling chain from a spectra catalog.

```
ParallelPosteriorafterBurnin(
  retval,
  seedNumber = 1,
  verbose = TRUE,
  post.burnin = 4000,
  post.n = 50,
  post.space = 50,
  post.cpiter = 3,
  post.verbosity = 0,
  num.child.process = 2,
  CPU.cores = 2
)
```

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Arguments

A list object containing hdplist after burn-in iteration and likelihood from BurninIteration. retval Pass to hdp_posterior seedNumber verbose If TRUE then message progress information. Pass to hdp_posterior burnin. This can be set to a small number post.burnin Pass to hdp_posterior n. post.n post.space Pass to hdp_posterior space. post.cpiter Pass to hdp_posterior cpiter. post.verbosity Pass to hdp_posterior verbosity. num.child.process Number of posterior sampling chains; can set to 1 for testing. Number of CPUs to use; there is no point in making this larger than num.child.process. CPU.cores

Value

Invisibly, an hdpSampleChain-class object as returned from hdp_posterior.

PrepInit Initialize hdp object Allocate process index for hdp initialization. Prepare for hdp_init

Description

Initialize hdp object Allocate process index for hdp initialization. Prepare for hdp_init

Usage

```
PrepInit(
  multi.types,
  input.catalog,
  verbose,
  K.guess,
  gamma.alpha = 1,
  gamma.beta = 1
)
```

Arguments

multi.types

A logical scalar or a character vector. If FALSE, The HDP analysis will regard all input spectra as one tumor type.

If TRUE, the HDP analysis will infer tumor types based on the string before "::" in their names. e.g. tumor type for "SA.Syn.Ovary-AdenoCA::S.500" would be "SA.Syn.Ovary-AdenoCA"

If multi.types is a character vector, then it should be of the same length as the number of columns in input.catalog, and each value is the name of the tumor type of the corresponding column in input.catalog.

```
e.g. c("SA.Syn.Ovary-AdenoCA", "SA.Syn.Kidney-RCC").
```

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input.catalo	g
	Input spectra catalog as a matrix or in ICAMS format.
verbose	If TRUE then message progress information.
K.guess	Suggested initial value of the number of signatures, passed to ${\tt dp_activate}$ as initco.
gamma.alpha	Shape parameter of gamma distribution from which the Dirichlet process concentration parameters are drawn; in this function the gamma distributions for all Dirichlet processes are the same.
gamma.beta	Inverse scale parameter (rate parameter) of gamma distribution from which the Dirichlet process concentration parameters are drawn; in this function the gamma distributions for all Dirichlet processes are the same.

RunHdpParallel

Extract mutational signatures and optionally compare them to existing signatures and exposures.

Description

Extract mutational signatures and optionally compare them to existing signatures and exposures.

```
RunHdpParallel(
  input.catalog,
  seedNumber = 1,
  K.guess,
  multi.types = FALSE,
  verbose = TRUE,
  post.burnin = 4000,
  post.n = 50,
  post.space = 50,
  post.cpiter = 3,
  post.verbosity = 0,
  CPU.cores = 1,
  num.child.process = 4,
  cos.merge = 0.9,
  min.sample = 1,
  categ.CI = 0.95,
  exposure.CI = 0.95,
  cluster.method = "kmedians",
  ground.truth.sig = NULL,
  ground.truth.exp = NULL,
  overwrite = TRUE,
  out.dir = NULL,
  gamma.alpha = 1,
  gamma.beta = 1,
  checkpoint.chlist = TRUE
)
```

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Arguments

input.catalog

Input spectra catalog as a matrix or in ICAMS format.

seedNumber A random seeds passed to dp_activate.

K. guess Suggested initial value of the number of signatures, passed to dp_activate

as initcc.

multi.types A logical scalar or a character vector. If FALSE, The HDP analysis will regard

all input spectra as one tumor type.

If TRUE, the HDP analysis will infer tumor types based on the string before "::" in their names. e.g. tumor type for "SA.Syn.Ovary-AdenoCA::S.500" would be

"SA.Syn.Ovary-AdenoCA"

If ${\tt multi.types}$ is a character vector, then it should be of the same length as the number of columns in ${\tt input.catalog}$, and each value is the name of the

tumor type of the corresponding column in input.catalog.

e.g. c("SA.Syn.Ovary-AdenoCA", "SA.Syn.Kidney-RCC").

verbose If TRUE then message progress information.

post.burnin Pass to hdp_posterior burnin.

post.n Pass to hdp_posterior n.

 $\verb"post.space" Pass to hdp_posterior space.$

post.cpiter Pass to hdp_posterior cpiter.

post.verbosity

Pass to hdp_posterior verbosity.

CPU.cores Number of CPUs to use; there is no point in making this larger than num.child.process.

num.child.process

Number of posterior sampling chains; can set to 1 for testing.

cos .merge The cosine similarity threshold for merging raw clusters from the posterior sam-

pling chains into "components" i.e. signatures; passed to hdp_extract_components.

min.sample A "component" (i.e. signature) must have at least this many samples; passed to

hdp_extract_components.

categ.CI A numeric object between 0 and 1. The level of confidence interval used in step

4 of hdp_merge_and_extract_components

exposure.CI A numeric object between 0 and 1. The level of confidence interval used in step

5 of hdp_merge_and_extract_components

cluster.method

A kccaFamily object input for flexclust package

ground.truth.sig

Optional. Either a string with the path to file with ground truth signatures or and ICAMS catalog with the ground truth signatures. These are the signatures used to construct the ground truth spectra.

ground.truth.exp

Optional. Ground truth exposure matrix or path to file with ground truth exposures. If NULL skip checks that need this information.

overwrite If TRUE overwrite out.dir if it exists, otherwise raise an error.

out.dir Directory that will be created for the output; if overwrite is FALSE then

abort if out . dir already exits.

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Shape parameter of gamma distribution from which the Dirichlet process concentration parameters are drawn; in this function the gamma distributions for all Dirichlet processes are the same.

Dirichlet process concentration parameters are drawn; in this function the gamma distributions for all Dirichlet processes are the same.

checkpoint.chlist

If TRUE, checkpoint the (unclean) chlist to "initial.chlist.Rdata" in the current working directory. and checkpoint the clean chlist to "clean.chlist.Rdata" in the current working directory.

Value

Invisibly, a list with the following elements:

signature The extracted signature profiles as a matrix; rows are mutation types, columns are samples (e.g. tumors).

exposure The inferred exposures as a matrix of mutation counts; rows are signatures, columns are samples (e.g. tumors).

multi.chains A hdpSampleMulti-class object. This object has the method chains which returns a list of hdpSampleChain-class objects. Each of these sample chains objects has a method final_hdpState (actually the methods seems to be just hdp) that returns the hdpState from which it was generated.

SetupAndActivate

Generate an HDP Gibbs sampling chain from a spectra catalog.

Description

Generate an HDP Gibbs sampling chain from a spectra catalog.

Usage

```
SetupAndActivate(
  input.catalog,
  seedNumber = 1,
  K.guess,
  multi.types = FALSE,
  verbose = TRUE,
  gamma.alpha = 1,
  gamma.beta = 1
)
```

Arguments

```
input.catalog
```

Input spectra catalog as a matrix or in ICAMS format.

seedNumber A random seeds passed to dp_activate.

K.guess Suggested initial value of the number of signatures, passed to dp_activate as initco.

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multi.types A logical scalar or a character vector. If FALSE, The HDP analysis will regard all input spectra as one tumor type.

If TRUE, the HDP analysis will infer tumor types based on the string before "::" in their names. e.g. tumor type for "SA.Syn.Ovary-AdenoCA::S.500" would be "SA.Syn.Ovary-AdenoCA"

If multi.types is a character vector, then it should be of the same length as the number of columns in input.catalog, and each value is the name of the tumor type of the corresponding column in input.catalog.

e.g. c("SA.Syn.Ovary-AdenoCA", "SA.Syn.Kidney-RCC").

verbose If TRUE then message progress information.

gamma.alpha Shape parameter of gamma distribution from which the Dirichlet process concentration parameters are drawn; in this function the gamma distributions for all

Dirichlet processes are the same.

gamma .beta Inverse scale parameter (rate parameter) of gamma distribution from which the

 $Dirichlet\ process\ concentration\ parameters\ are\ drawn;\ in\ this\ function\ the\ gamma$

distributions for all Dirichlet processes are the same.

Value

Invisibly, an hdpState-class object as returned from dp_activate.

SetupAndPosterior Generate an HDP Gibbs sampling chain from a spectra catalog.

Description

Generate an HDP Gibbs sampling chain from a spectra catalog.

```
SetupAndPosterior(
  input.catalog,
  seedNumber = 1,
  K.guess,
  multi.types = FALSE,
  verbose = TRUE,
  post.burnin = 4000,
  post.n = 50,
  post.space = 50,
  post.cpiter = 3,
  post.verbosity = 0,
  gamma.alpha = 1,
  gamma.beta = 1)
```

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Arguments

input.catalog

Input spectra catalog as a matrix or in ICAMS format.

seedNumber Ara

A random seeds passed to dp activate.

K.guess

Suggested initial value of the number of signatures, passed to dp_activate

as initcc.

multi.types

A logical scalar or a character vector. If FALSE, The HDP analysis will regard

all input spectra as one tumor type.

If TRUE, the HDP analysis will infer tumor types based on the string before "::" in their names. e.g. tumor type for "SA.Syn.Ovary-AdenoCA::S.500" would be

"SA.Syn.Ovary-AdenoCA"

If ${\tt multi.types}$ is a character vector, then it should be of the same length as the number of columns in ${\tt input.catalog}$, and each value is the name of the

tumor type of the corresponding column in input.catalog.

 $e.g. \verb| c("SA.Syn.Ovary-AdenoCA", "SA.Syn.Kidney-RCC")|.$

verbose If TRUE then message progress information.

Pass to hdp_posterior burnin.

post.burnin

ass to hap_posterior burning

post.n

Pass to hdp_posterior n.

post.space

Pass to hdp_posterior space.

Pass to hdp_posterior cpiter.

post.cpiter

gamma.alpha

Shape parameter of gamma distribution from which the Dirichlet process con-

centration parameters are drawn; in this function the gamma distributions for all

Dirichlet processes are the same.

gamma.beta

Inverse scale parameter (rate parameter) of gamma distribution from which the Dirichlet process concentration parameters are drawn; in this function the gamma

distributions for all Dirichlet processes are the same.

Value

Invisibly, an hdpSampleChain-class object as returned from hdp_posterior.

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