Package 'mSigHdp'

January 11, 2022
Title Mutational signature extraction using hdp (Hierarchical Dirichlet Process)
Version 1.2.1
Description Mutational signature discovery using hierarchichal Dirichlet process mixture modeling. mSigHdp stands for 'mutational signature (discovery using) hierarchical dirichlet processes. This packages uses https://github.com/steverozen/hdpx for the hierarchical Dirichlet process implementation.
License GPL-3
Encoding UTF-8
Language en-US
BuildManual no
biocViews
Roxygen list(markdown = TRUE)
Depends R (>= 4.0)
RoxygenNote 7.1.2
Remotes github::steverozen/hdpx@*release, github::steverozen/ICAMSxtra@*release
Imports hdpx (>= 0.3.8), ICAMS (>= 2.2.4), reshape2, data.table
Suggests ICAMSxtra (>= 0.0.2), testthat, utils
R topics documented:
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AnalyzeAndPlotretval

Evaluate and plot retval from CombinePosteriorChains or CombineChainsAndExtractSigs This function now works for both NR's pipeline and Mo's pipeline

Description

Evaluate and plot retval from CombinePosteriorChains or CombineChainsAndExtractSigs This function now works for both NR's pipeline and Mo's pipeline

Usage

```
AnalyzeAndPlotretval(
  retval,
  input.catalog,
  out.dir = NULL,
  verbose = TRUE,
  overwrite = TRUE,
  diagnostic.plot = TRUE)
```

Arguments

```
retval the output from function CombinePosteriorChains or CombineChainsAndExtractSigs
input.catalog
input catalog matrix or path to file with input catalog

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.
```

 $\hbox{ overwrite out.} \hbox{ dir if it exists, otherwise raise an error.} \\$

diagnostic.plot

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

ChainBurnin 3

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

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

Usage

```
ChainBurnin(
  hdp.state,
  seedNumber = 1,
  burnin = 5000,
  cpiter = 3,
  burnin.verbosity = 0,
  burnin.multiplier = 2,
  burnin.checkpoint = TRUE
)
```

Arguments

hdp.state An hdpState-class object or a list representation of an hdpState-class

object.

seedNumber An integer that is used to generate separate random seeds for the call to dp_activate,

and before the call of hdp_burnin.

burnin Pass to hdp_burnin burnin. The number of burn-in iterations

cpiter Pass to hdp_burnin cpiter. The number of iterations of concentration

parameter sampling to perform after each iteration.

burnin.verbosity

Pass to hdp_burnin verbosity. Verbosity of debugging statements. #'

burnin.multiplier

A checkpoint setting. burnin.multiplier rounds of burnin iterations will be run. After each round, a burn-in chain will be save for checkpoint. A total number of 10,000 iterations is recommended for most analysis. Therefore we set the default of burnin to 1000 and burnin.multiplier to 10. However, number of iterations can be adjusted based on the size of dataset. The dataset with more mutations require longer burn-ins. According to our experience, 50,000 iterations are needed when analyzing all PCAWG7 genomes (2,780 samples). The burnin can be continued from a checkpoint file with ExtendBurnin.

burnin.checkpoint

If TRUE, a checkpoint for burn-in will be created.

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.

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.

Usage

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

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.

CombineChainsAndExtractSigs

Extract components and exposures from multiple posterior sample chains This function returns signatures with high confidence (found in more than 90% #' posterior samples)

Description

Extract components and exposures from multiple posterior sample chains This function returns signatures with high confidence (found in more than 90% #' posterior samples)

Usage

```
CombineChainsAndExtractSigs(
  clean.chlist,
  input.catalog,
  verbose = TRUE,
  high.confidence.prop = 0.9,
  hc.cutoff = 0.1
)
```

Arguments

clean.chlist A list of hdpSampleChain-class objects. Each element is the result of one posterior sample chain.

input.catalog

Input spectra catalog as a matrix or in ICAMS format.

verbose If TRUE then message progress information.

high.confidence.prop

Pass to interpret_components. raw clusters (mutation cluster) found in >= high.confidence.prop proportion of posterior samples are signatures with high confidence.

hc.cutoff

Pass to extract_components_from_clusters. The cutoff of height of hierarchical clustering dendrogram, used in combining raw clusters (mutation clusters) into agreggated clusters.

Value

Invisibly, a list with the following elements:

signature The extracted signature profiles as a matrix; rows are mutation types, columns are signatures with high confidence.

signature.post.samp.number A data frame with two columns. The first column corresponds to each signature in signature and the second columns contains the number of posterior samples that found the raw clusters contributing to the signature.

signature.cdc A numeric data frame. Each column corresponds to the sum of all mutations contributing to each signature in signature

exposureProbs The inferred exposures as a matrix of mutation probabilities; rows are signatures, columns are samples (e.g. tumors). This is similar to signature.cdc but every column was normalized to sum of 1

low.confidence.signature The profiles of signatures extracted with low confidence as a matrix; rows are mutation types, columns are signatures with less than high.confidence.prop of posterior samples

low.confidence.post.samp.number A data frame with two columns. The first column corresponds to each signature in low.confidence.signature and the second column contains the number of posterior samples that found the raw clusters contributing to the signature.

low.confidence.cdc A numeric data frame. Each column corresponds to the sum of all mutations contributing to each signature in low.confidence.signature

extracted.retval A list object returned from codeextract_components_from_clusters.

ComponentDiagnosticPlotting

Generate multiple plots for for a hdpSampleMulti object.

Description

Generate multiple plots for for a hdpSampleMulti object.

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Usage

```
ComponentDiagnosticPlotting(
  retval,
  input.catalog,
  out.dir,
  verbose,
  IS.ICAMS = T
)
```

Arguments

```
retval Return from CombineChainsAndExtractSigs
input.catalog
Input spectra catalog as a matrix or in ICAMS format.

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.

IS.ICAMS If TRUE, then plot diagnostics.hdp.signature.exposure.each.sample.pdf.
```

Details

Generates the plots diagnostics.hdp.signature.exposure.each.sample.pdf, diagnostics.component.distribution.in.posterior diagnostics.likelihood.pdf, diagnostics.numcluster.pdf, diagnostics.signatures.pdf

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

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, and the HDP structure will have one parent node for all tumors.

If TRUE, Sample IDs in input.catalog must have the form sample_type::sample_id.

If a character vector, then its length must be ncol (input.catalog), and each value is the sample type of the corresponding column in input.catalog, e.g. c(rep("Type-A",23), rep("Type-B",10)) for 23 Type-A samples and 10 Type-B samples.

If not FALSE, HDP will have one parent node for each sample type and one grandparent node.

input.catalog

Input spectra catalog as a matrix or in ICAMS format.

GeneratePriorppindex

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

Description

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

Usage

```
GeneratePriorppindex(multi.types, input.catalog, nps)
```

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. \; \texttt{c("SA.Syn.Ovary-AdenoCA", "SA.Syn.Kidney-RCC")}. \\ input.catalog
```

Input spectra catalog as a matrix or in ICAMS format.

nps

Number of prior signatures

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,
  burnin = 5000,
  burnin.multiplier = 2,
  burnin.checkpoint = TRUE,
```

```
post.n = 200,
 post.space = 100,
 post.cpiter = 3,
 post.verbosity = 0,
 CPU.cores = 20,
 num.child.process = 20,
 gamma.alpha = 1,
 gamma.beta = 20,
 gamma0.alpha = gamma.alpha,
 gamma0.beta = gamma.beta,
 checkpoint.chlist = TRUE,
 checkpoint.1.chain = TRUE,
 prior.sigs = NULL,
 prior.pseudoc = NULL,
 posterior.checkpoint = FALSE
)
```

Arguments

input.catalog

Input spectra catalog as a matrix or in ICAMS format.

seedNumber

A random seeds passed to dp_activate.

K.quess

Suggested initial value of the number of clusters. Usually, the number of clusters is two times of the number of extracted 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, and the HDP structure will have one parent node for all tumors.

If TRUE, Sample IDs in input.catalog must have the form $sample_type::sample_id$.

If a character vector, then its length must be <code>ncol(input.catalog)</code>, and each value is the sample type of the corresponding column in <code>input.catalog</code>, e.g. <code>c(rep("Type-A", 23), rep("Type-B", 10))</code> for 23 Type-A samples and 10 Type-B samples.

If not FALSE, HDP will have one parent node for each sample type and one grandparent node.

verbose

If TRUE then message progress information.

burnin

Pass to ${\tt hdp_burnin}$ burnin. The number of burn-in iterations

burnin.multiplier

A checkpoint setting. burnin.multiplier rounds of burnin iterations will be run. After each round, a burn-in chain will be save for checkpoint. A total number of 10,000 iterations is recommended for most analysis. Therefore we set the default of burnin to 1000 and burnin.multiplier to 10. However, number of iterations can be adjusted based on the size of dataset. The dataset with more mutations require longer burn-ins. According to our experience, 50,000 iterations are needed when analyzing all PCAWG7 genomes (2,780 samples). The burnin can be continued from a checkpoint file with ExtendBurnin.

burnin.checkpoint

If TRUE, a checkpoint for burn-in will be created.

post.n

Pass to $hdp_posterior_sample$ n. The number of posterior samples to collect

post.space Pass to hdp_posterior_sample space. The number of iterations between collected samples.

post.cpiter Pass to hdp_posterior_sample and hdp_burnin cpiter.The number of iterations of concentration parameter sampling to perform after each iteration

post.verbosity

Pass to hdp_posterior_sample verbosity. Verbosity of debugging statements. No need to change unless for development purpose

CPU.cores Number of CPUs to use; this should be no more than num.child.process. num.child.process

Number of posterior sampling chains; can set to 1 for testing. We recommend 20 for real data analysis

Shape parameter of the gamma distribution prior for the Dirichlet process concentration parameters; in this function the gamma distributions for all Dirichlet processes, except possibly the top level process, are the same.

Inverse scale parameter (rate parameter) of the gamma distribution prior for the Dirichlet process concentration parameters; in this function the gamma distributions for all Dirichlet processes, except possibly the top level process, are the same.

We recommend gamma.alpha = 1 and gamma.beta = 20 for single-base-substitution signatures extraction; gamma.alpha = 1 and gamma.beta = 50 for doublet-base-substitution/INDEL signature extraction

gamma0.alpha See figure B.1 from Nicola Robert's thesis. The shape parameter (α_0) of the gamma distribution priors for the Dirichlet process concentration parameters (γ_0) for G_0 .

gamma 0 . beta See figure B.1 from Nicola Robert's thesis. Inverse scale parameter (rate parameter, β_0) of the gamma distribution priors for the Dirichlet process concentration parameters (γ_0) for G_0 .

checkpoint.chlist

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

checkpoint.1.chain

If TRUE checkpoint the sample chain to current working directory, in a file called sample.chain.seed_number.Rdata.

prior.sigs A matrix containing prior signatures.

prior.pseudoc

A numeric list. Pesudo counts of each prior signature. Recommended is 1000. In practice, it may be advisable to put lower weights on prior signatures that you do not expect to be present in your dataset, or even exclude some priors entirely.

posterior.checkpoint

If TRUE checkpoint the posterior sampling after every 10 posterior samples collected

Value

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

```
PlotSamplesHighSigExp
```

Plot hdp signature exposure in each sample. This function returns the plot of top 5 samples with the highest exposure to a signature. Each spectrum's title is in the form of: SampleName(Proportion of Signature Assginment) This function is here because it is specific for signature extraction application.

Description

Plot hdp signature exposure in each sample. This function returns the plot of top 5 samples with the highest exposure to a signature. Each spectrum's title is in the form of: SampleName(Proportion of Signature Assginment) This function is here because it is specific for signature extraction application.

Usage

```
PlotSamplesHighSigExp(
  retval,
  hdpsample,
  input.catalog,
  col_comp = NULL,
  incl_numdata_plot = F,
  ylab_numdata = "Number of data items",
  ylab_exp = "Component exposure",
  leg.title = "Component",
  cex.names = 0.6,
  cex.axis = 0.7,
  mar = c(4, 4, 2, 0.5),
  oma = c(1.5, 1.5, 1, 1)
)
```

Arguments

```
An object return from extract_ccc_from_hdp
retval
hdpsample
                 A hdpSampleChain-class or hdpSampleMulti-class object includ-
                 ing output from extract_components_from_clusters
input.catalog
                 Input spectra catalog as a matrix or in ICAMS format.
                 Colours of each component, from 0 to the max number. If NULL, default colors
col_comp
                 will be used
incl_numdata_plot
                 Logical - should an upper barplot indicating the number of data items per DP be
                 included? (Default TRUE)
ylab_numdata Vertical axis label for numdata plot
                 Vertical exis label for exposure plot
ylab_exp
leg.title
                 Legend title
cex.names
                 Expansion factor for bar labels (dpnames) in exposure plot
                 Expansion factor for vertical-axis annotation
cex.axis
```

12 PrepInit

mar	See ?par
oma	See ?par
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 = TRUE,
  K.guess,
  gamma.alpha = 1,
  gamma.beta = 1,
  gamma0.alpha = gamma.alpha,
  gamma0.beta = gamma.beta
)
```

Arguments

multi.types A logical scalar or a character vector.

If FALSE, The HDP analysis will regard all input spectra as one tumor type, and the HDP structure will have one parent node for all tumors.

If TRUE, Sample IDs in input.catalog must have the form $sample_type::sample_id$.

If a character vector, then its length must be ncol (input.catalog), and each value is the sample type of the corresponding column in input.catalog, e.g. c(rep("Type-A",23),rep("Type-B",10)) for 23 Type-A samples and 10 Type-B samples.

If not FALSE, HDP will have one parent node for each sample type and one grandparent node.

input.catalog

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 clusters. Usually, the number of clusters

is two times of the number of extracted signatures. Passed to dp_activate

as initcc.

gamma.alpha Shape parameter of the gamma distribution prior for the Dirichlet process con-

centration parameters; in this function the gamma distributions for all Dirichlet

processes, except possibly the top level process, are the same.

gamma .beta Inverse scale parameter (rate parameter) of the gamma distribution prior for the

Dirichlet process concentration parameters; in this function the gamma distributions for all Dirichlet processes, except possibly the top level process, are the

same.

We recommend gamma.alpha = 1 and gamma.beta = 20 for single-base-substitution signatures extraction; gamma.alpha = 1 and gamma.beta = 50 for doublet-base-substitution/INDEL signature extraction

gamma0.alpha See figure B.1 from Nicola Robert's thesis. The shape parameter (α_0) of the gamma distribution priors for the Dirichlet process concentration parameters (γ_0) for G_0 .

gamma 0 . beta See figure B.1 from Nicola Robert's thesis. Inverse scale parameter (rate parameter, β_0) of the gamma distribution priors for the Dirichlet process concentration parameters (γ_0) for G_0 .

PriorSetupAndActivate

Generate an HDP Gibbs sampling chain from a spectra catalog.

Description

Generate an HDP Gibbs sampling chain from a spectra catalog.

Usage

```
PriorSetupAndActivate(
   prior.sigs,
   prior.pseudoc,
   gamma.alpha = 1,
   gamma.beta = 1,
   K.guess,
   gamma0.alpha = gamma.alpha,
   gamma0.beta = gamma.beta,
   multi.types = F,
   input.catalog,
   verbose = TRUE,
   seedNumber = 1
)
```

Arguments

K.guess

prior.sigs A matrix containing prior signatures.
prior.pseudoc

A numeric list. Pesudo counts of each prior signature. Recommended is 1000. In practice, it may be advisable to put lower weights on prior signatures that you do not expect to be present in your dataset, or even exclude some priors entirely.

Shape parameter of the gamma distribution prior for the Dirichlet process concentration parameters; in this function the gamma distributions for all Dirichlet processes, except possibly the top level process, are the same.

Inverse scale parameter (rate parameter) of the gamma distribution prior for the Dirichlet process concentration parameters; in this function the gamma distributions for all Dirichlet processes, except possibly the top level process, are the same.

Suggested initial value of the number of signatures, passed to $dp_activate$ as initcc.

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gamma 0. alpha See figure B.1 from Nicola Robert's thesis. The shape parameter (α_0) of the gamma distribution priors for the Dirichlet process concentration parameters (γ_0) for G_0 . gamma0.beta See figure B.1 from Nicola Robert's thesis. Inverse scale parameter (rate parameter, β_0) of the gamma distribution priors for the Dirichlet process concentration parameters (γ_0) for G_0 . 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"). input.catalog Input spectra catalog as a matrix or in ICAMS format. If TRUE then message progress information. verbose

Value

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

A random seeds passed to dp_activate.

RunHdpxParallel

seedNumber

Extract mutational signatures and optionally generate diagnostic plots to help understand the results: e.g. the stability each extracted signature and the tumors that drive the extraction of each signature.

Description

Extract mutational signatures and optionally generate diagnostic plots to help understand the results: e.g. the stability each extracted signature and the tumors that drive the extraction of each signature.

Usage

```
RunHdpxParallel(
  input.catalog,
  seedNumber = 123,
  K.guess,
  multi.types = TRUE,
  verbose = TRUE,
  burnin = 1000,
  burnin.multiplier = 10,
  burnin.checkpoint = FALSE,
  post.n = 200,
  post.space = 100,
  post.cpiter = 3,
  post.verbosity = 0,
```

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```
CPU.cores = 20,
 num.child.process = 20,
 high.confidence.prop = 0.9,
 hc.cutoff = 0.1,
 overwrite = TRUE,
 out.dir = NULL,
 gamma.alpha = 1,
 gamma.beta = 20,
 gamma0.alpha = gamma.alpha,
 gamma0.beta = gamma.beta,
 checkpoint.chlist = TRUE,
 checkpoint.1.chain = TRUE,
 prior.sigs = NULL,
 prior.pseudoc = NULL,
 posterior.checkpoint = FALSE
)
```

Arguments

input.catalog

Input spectra catalog as a matrix or in ICAMS format.

seedNumber

A random seeds passed to dp_activate.

K.quess

Suggested initial value of the number of clusters. Usually, the number of clusters is two times of the number of extracted 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, and the HDP structure will have one parent node for all tumors.

If TRUE, Sample IDs in input.catalog must have the form sample_type::sample_id.

If a character vector, then its length must be ncol (input.catalog), and each value is the sample type of the corresponding column in input.catalog, e.g. c(rep("Type-A", 23), rep("Type-B", 10)) for 23 Type-A samples and 10 Type-B samples.

If not FALSE, HDP will have one parent node for each sample type and one grandparent node.

verbose

If TRUE then message progress information.

burnin

Pass to hdp burnin burnin. The number of burn-in iterations burnin.multiplier

> A checkpoint setting. burnin.multiplier rounds of burnin iterations will be run. After each round, a burn-in chain will be save for checkpoint. A total number of 10,000 iterations is recommended for most analysis. Therefore we set the default of burnin to 1000 and burnin.multiplier to 10. However, number of iterations can be adjusted based on the size of dataset. The dataset with more mutations require longer burn-ins. According to our experience, 50,000 iterations are needed when analyzing all PCAWG7 genomes (2,780 samples). The burnin can be continued from a checkpoint file with ExtendBurnin.

burnin.checkpoint

If TRUE, a checkpoint for burn-in will be created.

Pass to hdp_posterior_sample n. The number of posterior samples to colpost.n

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post.space Pass to hdp_posterior_sample space. The number of iterations between collected samples.

post.cpiter Pass to hdp_posterior_sample and hdp_burnin cpiter. The number of iterations of concentration parameter sampling to perform after each iteration

post.verbosity

Pass to hdp_posterior_sample verbosity. Verbosity of debugging statements. No need to change unless for development purpose

CPU.cores Number of CPUs to use; this should be no more than num.child.process. num.child.process

Number of posterior sampling chains; can set to 1 for testing. We recommend 20 for real data analysis

high.confidence.prop

Pass to interpret_components. raw clusters (mutation cluster) found in >= high.confidence.prop proportion of posterior samples are signatures with high confidence.

hc.cutoff Pass to extract_components_from_clusters. The cutoff of height of hierarchical clustering dendrogram, used in combining raw clusters (mutation clusters) into agreggated clusters.

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.

Shape parameter of the gamma distribution prior for the Dirichlet process concentration parameters; in this function the gamma distributions for all Dirichlet processes, except possibly the top level process, are the same.

Inverse scale parameter (rate parameter) of the gamma distribution prior for the Dirichlet process concentration parameters; in this function the gamma distributions for all Dirichlet processes, except possibly the top level process, are the same.

We recommend gamma.alpha = 1 and gamma.beta = 20 for single-base-substitution signatures extraction; gamma.alpha = 1 and gamma.beta = 50 for doublet-base-substitution/INDEL signature extraction

gamma 0.alpha See figure B.1 from Nicola Robert's thesis. The shape parameter (α_0) of the gamma distribution priors for the Dirichlet process concentration parameters (γ_0) for G_0 .

gamma 0 . beta See figure B.1 from Nicola Robert's thesis. Inverse scale parameter (rate parameter, β_0) of the gamma distribution priors for the Dirichlet process concentration parameters (γ_0) for G_0 .

checkpoint.chlist

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

checkpoint.1.chain

If TRUE checkpoint the sample chain to current working directory, in a file called sample.chain.seed_number.Rdata.

prior.sigs A matrix containing prior signatures. prior.pseudoc

A numeric list. Pesudo counts of each prior signature. Recommended is 1000. In practice, it may be advisable to put lower weights on prior signatures that you do not expect to be present in your dataset, or even exclude some priors entirely.

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```
posterior.checkpoint
```

If TRUE checkpoint the posterior sampling after every 10 posterior samples collected

Value

Invisibly, a list with the following elements:

signature The extracted signature profiles as a matrix; rows are mutation types, columns are signatures with high confidence.

signature.post.samp.number A data frame with two columns. The first column corresponds to each signature in signature and the second columns contains the number of posterior samples that found the raw clusters contributing to the signature.

signature.cdc A numeric data frame. Each column corresponds to the sum of all mutations contributing to each signature in signature

exposureProbs The inferred exposures as a matrix of mutation probabilities; rows are signatures, columns are samples (e.g. tumors). This is similar to signature.cdc but every column was normalized to sum of 1

low.confidence.signature The profiles of signatures extracted with low confidence as a matrix; rows are mutation types, columns are signatures with less than high.confidence.prop of posterior samples

low.confidence.post.samp.number A data frame with two columns. The first column corresponds to each signature in low.confidence.signature and the second column contains the number of posterior samples that found the raw clusters contributing to the signature.

low.confidence.cdc A numeric data frame. Each column corresponds to the sum of all mutations contributing to each signature in low.confidence.signature

extracted.retval A list object returned from codeextract_components_from_clusters.

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,
  gamma0.alpha = gamma.alpha,
  gamma0.beta = gamma.beta
)
```

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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 clusters. Usually, the number of clusters

is two times of the number of extracted 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, and

the HDP structure will have one parent node for all tumors.

If TRUE, Sample IDs in input.catalog must have the form sample_type::sample_id.

If a character vector, then its length must be ncol (input.catalog), and each value is the sample type of the corresponding column in input.catalog, e.g. c (rep ("Type-A", 23), rep ("Type-B", 10)) for 23 Type-A sam-

ples and 10 Type-B samples.

If not FALSE, HDP will have one parent node for each sample type and one

grandparent node.

verbose If TRUE then message progress information.

gamma .alpha Shape parameter of the gamma distribution prior for the Dirichlet process con-

centration parameters; in this function the gamma distributions for all Dirichlet

processes, except possibly the top level process, are the same.

gamma .beta Inverse scale parameter (rate parameter) of the gamma distribution prior for the

Dirichlet process concentration parameters; in this function the gamma distributions for all Dirichlet processes, except possibly the top level process, are the

same.

We recommend gamma.alpha = 1 and gamma.beta = 20 for single-base-substitution signatures extraction; gamma.alpha = 1 and gamma.beta = 50 for doublet-base-

substitution/INDEL signature extraction

gamma 0.alpha See figure B.1 from Nicola Robert's thesis. The shape parameter (α_0) of the

gamma distribution priors for the Dirichlet process concentration parameters

 (γ_0) for G_0 .

 ${\tt gamma0.beta} \quad See \ figure \ B.1 \ from \ Nicola \ Robert's \ thesis. \ Inverse \ scale \ parameter \ (rate \ parameter)$

eter, β_0) of the gamma distribution priors for the Dirichlet process concentration

parameters (γ_0) for G_0 .

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.

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Usage

```
SetupAndPosterior(
 input.catalog,
  seedNumber = 1,
 K.quess,
 multi.types = FALSE,
  verbose = TRUE,
 burnin = 5000,
  post.n = 50,
  post.space = 50,
 post.cpiter = 3,
 post.verbosity = 0,
  gamma.alpha = 1,
  gamma.beta = 20,
  gamma0.alpha = gamma.alpha,
  gamma0.beta = gamma.beta,
  checkpoint.1.chain = TRUE,
 burnin.multiplier = 2,
 burnin.checkpoint = TRUE,
 prior.sigs = NULL,
 prior.pseudoc = NULL,
  posterior.checkpoint = F
```

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 clusters. Usually, the number of clusters

is two times of the number of extracted signatures. Passed to dp_activate

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multi.types A logical scalar or a character vector.

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If TRUE, Sample IDs in input.catalog must have the form $sample_type::sample_id$.

If a character vector, then its length must be ncol (input.catalog), and each value is the sample type of the corresponding column in input.catalog, e.g. c(rep("Type-A", 23), rep("Type-B", 10)) for 23 Type-A sam-

ples and 10 Type-B samples.

If not FALSE, HDP will have one parent node for each sample type and one

grandparent node.

verbose If TRUE then message progress information.

burnin Pass to hdp_burnin burnin. The number of burn-in iterations

post.n Pass to hdp_posterior_sample n.The number of posterior samples to col-

lect.

post.space Pass to hdp_posterior_sample space. The number of iterations be-

tween collected samples.

post.cpiter Pass to hdp_posterior_sample and hdp_burnin cpiter. The number

of iterations of concentration parameter sampling to perform after each iteration

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post.verbosity

Pass to hdp_posterior_sample verbosity. Verbosity of debugging statements. No need to change unless for development purpose

gamma.alpha

Shape parameter of the gamma distribution prior for the Dirichlet process concentration parameters; in this function the gamma distributions for all Dirichlet processes, except possibly the top level process, are the same.

gamma.beta

Inverse scale parameter (rate parameter) of the gamma distribution prior for the Dirichlet process concentration parameters; in this function the gamma distributions for all Dirichlet processes, except possibly the top level process, are the same.

We recommend gamma.alpha = 1 and gamma.beta = 20 for single-base-substitution signatures extraction; gamma.alpha = 1 and gamma.beta = 50 for doublet-basesubstitution/INDEL signature extraction

gamma 0. alpha See figure B.1 from Nicola Robert's thesis. The shape parameter (α_0) of the gamma distribution priors for the Dirichlet process concentration parameters (γ_0) for G_0 .

gamma0.beta

See figure B.1 from Nicola Robert's thesis. Inverse scale parameter (rate parameter, β_0) of the gamma distribution priors for the Dirichlet process concentration parameters (γ_0) for G_0 .

checkpoint.1.chain

If TRUE checkpoint the sample chain to current working directory, in a file called sample.chain.seed_number.Rdata.

burnin.multiplier

A checkpoint setting. burnin.multiplier rounds of burnin iterations will be run. After each round, a burn-in chain will be save for checkpoint. A total number of 10,000 iterations is recommended for most analysis. Therefore we set the default of burnin to 1000 and burnin.multiplier to 10. However, number of iterations can be adjusted based on the size of dataset. The dataset with more mutations require longer burn-ins. According to our experience, 50,000 iterations are needed when analyzing all PCAWG7 genomes (2,780 samples). The burnin can be continued from a checkpoint file with ExtendBurnin.

burnin.checkpoint

If TRUE, a checkpoint for burn-in will be created.

A matrix containing prior signatures. prior.sigs

prior.pseudoc

A numeric list. Pesudo counts of each prior signature. Recommended is 1000. In practice, it may be advisable to put lower weights on prior signatures that you do not expect to be present in your dataset, or even exclude some priors entirely.

posterior.checkpoint

If TRUE checkpoint the posterior sampling after every 10 posterior samples collected

Value

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

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