

# Package ‘numbat’

February 23, 2024

**Title** Haplotype-Aware CNV Analysis from scRNA-Seq

**URL** <https://github.com/kharchenkolab/numbat/>,  
<https://kharchenkolab.github.io/numbat/>

**Version** 1.4.0

**Description** A computational method that infers copy number variations (CNVs) in cancer scRNA-seq data and reconstructs the tumor phylogeny. 'numbat' integrates signals from gene expression, allelic ratio, and population haplotype structures to accurately infer allele-specific CNVs in single cells and reconstruct their lineage relationship. 'numbat' can be used to: 1. detect allele-specific copy number variations from single-cells; 2. differentiate tumor versus normal cells in the tumor microenvironment; 3. infer the clonal architecture and evolutionary history of profiled tumors. 'numbat' does not require tumor/normal-paired DNA or genotype data, but operates solely on the donor scRNA-data data (for example, 10x Cell Ranger output). Additional examples and documentations are available at <https://kharchenkolab.github.io/numbat/>. For details on the method please see Gao et al. Nature Biotechnology (2022) <[doi:10.1038/s41587-022-01468-y](https://doi.org/10.1038/s41587-022-01468-y)>.

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---

<i>acen_hg19</i>	<i>centromere regions (hg19)</i>
------------------	----------------------------------

---

**Description**

centromere regions (hg19)

**Usage**

*acen\_hg19*

**Format**

An object of class `tbl_df` (inherits from `tbl`, `data.frame`) with 22 rows and 3 columns.

---

<i>acen_hg38</i>	<i>centromere regions (hg38)</i>
------------------	----------------------------------

---

**Description**

centromere regions (hg38)

**Usage**

*acen\_hg38*

**Format**

An object of class `tbl_df` (inherits from `tbl`, `data.frame`) with 22 rows and 3 columns.

---

aggregate\_counts      *Utility function to make reference gene expression profiles*

---

### Description

Utility function to make reference gene expression profiles

### Usage

```
aggregate_counts(count_mat, annot, normalized = TRUE, verbose = TRUE)
```

### Arguments

count_mat	matrix/dgCMatrix	Gene expression counts
annot	dataframe	Cell annotation with columns "cell" and "group"
normalized	logical	Whether to return normalized expression values
verbose	logical	Verbosity

### Value

matrix Reference gene expression levels

### Examples

```
ref_custom = aggregate_counts(count_mat_ref, annot_ref, verbose = FALSE)
```

---

analyze\_bulk      *Call CNVs in a pseudobulk profile using the Nubat joint HMM*

---

### Description

Call CNVs in a pseudobulk profile using the Nubat joint HMM

### Usage

```
analyze_bulk(
  bulk,
  t = 1e-05,
  gamma = 20,
  theta_min = 0.08,
  logphi_min = 0.25,
  nu = 1,
  min_genes = 10,
  exp_only = FALSE,
  allele_only = FALSE,
```

```

    bal_cnv = TRUE,
    retest = TRUE,
    find_diploid = TRUE,
    diploid_chroms = NULL,
    classify_allele = FALSE,
    run_hmm = TRUE,
    prior = NULL,
    exclude_neu = TRUE,
    phasing = TRUE,
    verbose = TRUE
)

```

### Arguments

bulk	dataframe Pseudobulk profile
t	numeric Transition probability
gamma	numeric Dispersion parameter for the Beta-Binomial allele model
theta_min	numeric Minimum imbalance threshold
logphi_min	numeric Minimum log expression deviation threshold
nu	numeric Phase switch rate
min_genes	integer Minimum number of genes to call an event
exp_only	logical Whether to run expression-only HMM
allele_only	logical Whether to run allele-only HMM
bal_cnv	logical Whether to call balanced amplifications/deletions
retest	logical Whether to retest CNVs after Viterbi decoding
find_diploid	logical Whether to run diploid region identification routine
diploid_chroms	character vector User-given chromosomes that are known to be in diploid state
classify_allele	logical Whether to only classify allele (internal use only)
run_hmm	logical Whether to run HMM (internal use only)
prior	numeric vector Prior probabilities of states (internal use only)
exclude_neu	logical Whether to exclude neutral segments from retesting (internal use only)
phasing	logical Whether to use phasing information (internal use only)
verbose	logical Verbosity

### Value

a pseudobulk profile dataframe with called CNV information

### Examples

```
bulk_analyzed = analyze_bulk(bulk_example, t = 1e-5, find_diploid = FALSE, retest = FALSE)
```

---

annotate_genes	<i>Annotate genes on allele dataframe</i>
----------------	---

---

**Description**

Annotate genes on allele dataframe

**Usage**

```
annotate_genes(df, gtf)
```

**Arguments**

df	dataframe Allele count dataframe
gtf	dataframe Gene gtf

**Value**

dataframe Allele dataframe with gene column

---

annot_ref	<i>example reference cell annotation</i>
-----------	--

---

**Description**

example reference cell annotation

**Usage**

```
annot_ref
```

**Format**

An object of class `data.frame` with 50 rows and 2 columns.

---

bulk_example	<i>example pseudobulk dataframe</i>
--------------	-------------------------------------

---

**Description**

example pseudobulk dataframe

**Usage**

bulk\_example

**Format**

An object of class `tbl_df` (inherits from `tbl`, `data.frame`) with 3935 rows and 83 columns.

---

chrom_sizes_hg19	<i>chromosome sizes (hg19)</i>
------------------	--------------------------------

---

**Description**

chromosome sizes (hg19)

**Usage**

chrom\_sizes\_hg19

**Format**

An object of class `data.table` (inherits from `data.frame`) with 22 rows and 2 columns.

---

chrom_sizes_hg38	<i>chromosome sizes (hg38)</i>
------------------	--------------------------------

---

**Description**

chromosome sizes (hg38)

**Usage**

chrom\_sizes\_hg38

**Format**

An object of class `data.table` (inherits from `data.frame`) with 22 rows and 2 columns.

---

cnv_heatmap	<i>Plot CNV heatmap</i>
-------------	-------------------------

---

**Description**

Plot CNV heatmap

**Usage**

```
cnv_heatmap(
  segs,
  var = "group",
  label_group = TRUE,
  legend = TRUE,
  exclude_gap = TRUE,
  genome = "hg38"
)
```

**Arguments**

segs	dataframe Segments to plot. Need columns "seg_start", "seg_end", "cnv_state"
var	character Column to facet by
label_group	logical Label the groups
legend	logical Display the legend
exclude_gap	logical Whether to mark gap regions
genome	character Genome build, either 'hg38' or 'hg19'

**Value**

ggplot Heatmap of CNVs along the genome

**Examples**

```
p = cnv_heatmap(segs_example)
```

---

count_mat_example	<i>example gene expression count matrix</i>
-------------------	---

---

**Description**

example gene expression count matrix

**Usage**

```
count_mat_example
```



**Format**

An object of class `dgMatrix` with 1024 rows and 173 columns.

---

count_mat_ref	<i>example reference count matrix</i>
---------------	---------------------------------------

---

**Description**

example reference count matrix

**Usage**

```
count_mat_ref
```

**Format**

An object of class `dgMatrix` with 1000 rows and 50 columns.

---

detect_clonal_loh	<i>Call clonal LOH using SNP density. Rcommended for cell lines or tumor samples with no normal cells.</i>
-------------------	--

---

**Description**

Call clonal LOH using SNP density. Rcommended for cell lines or tumor samples with no normal cells.

**Usage**

```
detect_clonal_loh(bulk, t = 1e-05, snp_rate_loh = 5, min_depth = 0)
```

**Arguments**

bulk	dataframe Pseudobulk profile
t	numeric Transition probability
snp_rate_loh	numeric The assumed SNP density in clonal LOH regions
min_depth	integer Minimum coverage to filter SNPs

**Value**

dataframe LOH segments

**Examples**

```
segs_loh = detect_clonal_loh(bulk_example)
```

---

df_allele_example	<i>example allele count dataframe</i>
-------------------	---------------------------------------

---

**Description**

example allele count dataframe

**Usage**

```
df_allele_example
```

**Format**

An object of class `data.frame` with 41167 rows and 11 columns.

---

gaps_hg19	<i>genome gap regions (hg19)</i>
-----------	----------------------------------

---

**Description**

genome gap regions (hg19)

**Usage**

```
gaps_hg19
```

**Format**

An object of class `data.table` (inherits from `data.frame`) with 28 rows and 3 columns.

---

gaps_hg38	<i>genome gap regions (hg38)</i>
-----------	----------------------------------

---

**Description**

genome gap regions (hg38)

**Usage**

```
gaps_hg38
```

**Format**

An object of class `data.table` (inherits from `data.frame`) with 30 rows and 3 columns.

---

get_bulk	<i>Aggregate single-cell data into combined bulk expression and allele profile</i>
----------	--

---

**Description**

Aggregate single-cell data into combined bulk expression and allele profile

**Usage**

```
get_bulk(  
  count_mat,  
  lambdas_ref,  
  df_allele,  
  gtf,  
  subset = NULL,  
  min_depth = 0,  
  nu = 1,  
  segs_loh = NULL,  
  verbose = TRUE  
)
```

**Arguments**

count_mat	dgCMatrix Gene expression counts
lambdas_ref	matrix Reference expression profiles
df_allele	dataframe Single-cell allele counts
gtf	dataframe Transcript gtf
subset	vector Subset of cells to aggregate
min_depth	integer Minimum coverage to filter SNPs
nu	numeric Phase switch rate
segs_loh	dataframe Segments with clonal LOH to be excluded
verbose	logical Verbosity

**Value**

dataframe Pseudobulk gene expression and allele profile

**Examples**

```
bulk_example = get_bulk(  
  count_mat = count_mat_example,  
  lambdas_ref = ref_hca,  
  df_allele = df_allele_example,  
  gtf = gtf_hg38)
```

---

get_gtree	<i>Get a tidygraph tree with simplified mutational history.</i>
-----------	---

---

**Description**

Specify either `max_cost` or `n_cut`. `max_cost` works similarly as `h` and `n_cut` works similarly as `k` in `stats::cutree`. The top-level normal diploid clone is always included.

**Usage**

```
get_gtree(tree, P, n_cut = 0, max_cost = 0)
```

**Arguments**

<code>tree</code>	phylo Single-cell phylogenetic tree
<code>P</code>	matrix Genotype probability matrix
<code>n_cut</code>	integer Number of cuts on the phylogeny to define subclones
<code>max_cost</code>	numeric Likelihood threshold to collapse internal branches

**Value**

`tbl_graph` Phylogeny annotated with branch lengths and mutation events

---

gexp_roll_example	<i>example smoothed gene expression dataframe</i>
-------------------	---

---

**Description**

example smoothed gene expression dataframe

**Usage**

```
gexp_roll_example
```

**Format**

An object of class `data.frame` with 10 rows and 2000 columns.

---

gtf_hg19	<i>gene model (hg19)</i>
----------	--------------------------

---

**Description**

gene model (hg19)

**Usage**

gtf\_hg19

**Format**

An object of class `data.table` (inherits from `data.frame`) with 26841 rows and 5 columns.

---

gtf_hg38	<i>gene model (hg38)</i>
----------	--------------------------

---

**Description**

gene model (hg38)

**Usage**

gtf\_hg38

**Format**

An object of class `data.table` (inherits from `data.frame`) with 26807 rows and 5 columns.

---

gtf_mm10	<i>gene model (mm10)</i>
----------	--------------------------

---

**Description**

gene model (mm10)

**Usage**

gtf\_mm10

**Format**

An object of class `data.table` (inherits from `data.frame`) with 30336 rows and 5 columns.

---

hc_example	<i>example hclust tree</i>
------------	----------------------------

---

**Description**

example hclust tree

**Usage**

hc\_example

**Format**

An object of class hclust of length 7.

---

joint_post_example	<i>example joint single-cell cnv posterior dataframe</i>
--------------------	--

---

**Description**

example joint single-cell cnv posterior dataframe

**Usage**

joint\_post\_example

**Format**

An object of class data.table (inherits from data.frame) with 3806 rows and 71 columns.

---

mut_graph_example	<i>example mutation graph</i>
-------------------	-------------------------------

---

**Description**

example mutation graph

**Usage**

mut\_graph\_example

**Format**

An object of class igraph of length 5.

---

Numbat	<i>Numbat R6 class</i>
--------	------------------------

---

**Description**

Used to allow users to plot results

**Value**

a new 'Numbat' object

**Public fields**

label character Sample name  
gtf dataframe Transcript annotation  
joint\_post dataframe Joint posterior  
exp\_post dataframe Expression posterior  
allele\_post dataframe Allele posetrior  
bulk\_subtrees dataframe Bulk profiles of lineage subtrees  
bulk\_clones dataframe Bulk profiles of clones  
segs\_consensus dataframe Consensus segments  
tree\_post list Tree posterior  
mut\_graph igraph Mutation history graph  
gtree tbl\_graph Single-cell phylogeny  
clone\_post dataframe Clone posteriors  
gexp\_roll\_wide matrix Smoothed expression of single cells  
P matrix Genotype probability matrix  
treeML matrix Maximum likelihood tree as phylo object  
hc hclust Initial hierarchical clustering

**Methods****Public methods:**

- `Numbat$new()`
- `Numbat$plot_phylo_heatmap()`
- `Numbat$plot_exp_roll()`
- `Numbat$plot_mut_history()`
- `Numbat$plot_sc_tree()`
- `Numbat$plot_consensus()`
- `Numbat$plot_clone_profile()`
- `Numbat$cutree()`

- `Numbat$clone()`

**Method** `new()`: initialize Numbat class

*Usage:*

```
Numbat$new(out_dir, i = 2, gtf = gtf_hg38, verbose = TRUE)
```

*Arguments:*

`out_dir` character string Output directory

`i` integer Get results from which iteration (default=2)

`gtf` dataframe Transcript gtf (default=gtf\_hg38)

`verbose` logical Whether to output verbose results (default=TRUE)

*Returns:* a new 'Numbat' object

**Method** `plot_phylo_heatmap()`: Plot the single-cell CNV calls in a heatmap and the corresponding phylogeny

*Usage:*

```
Numbat$plot_phylo_heatmap(...)
```

*Arguments:*

... additional parameters passed to `plot_phylo_heatmap()`

**Method** `plot_exp_roll()`: Plot window-smoothed expression profiles

*Usage:*

```
Numbat$plot_exp_roll(k = 3, n_sample = 300, ...)
```

*Arguments:*

`k` integer Number of clusters

`n_sample` integer Number of cells to subsample

... additional parameters passed to `plot_exp_roll()`

**Method** `plot_mut_history()`: Plot the mutation history of the tumor

*Usage:*

```
Numbat$plot_mut_history(...)
```

*Arguments:*

... additional parameters passed to `plot_mut_history()`

**Method** `plot_sc_tree()`: Plot the single cell phylogeny

*Usage:*

```
Numbat$plot_sc_tree(...)
```

*Arguments:*

... additional parameters passed to `plot_sc_tree()`

**Method** `plot_consensus()`: Plot consensus segments

*Usage:*

```
Numbat$plot_consensus(...)
```



*Arguments:*

... additional parameters passed to plot\_sc\_tree()

**Method** plot\_clone\_profile(): Plot clone cnv profiles

*Usage:*

```
Numbat$plot_clone_profile(...)
```

*Arguments:*

... additional parameters passed to plot\_clone\_profile()

**Method** cutree(): Re-define subclones on the phylogeny.

*Usage:*

```
Numbat$cutree(max_cost = 0, n_cut = 0)
```

*Arguments:*

max\_cost numeric Likelihood threshold to collapse internal branches

n\_cut integer Number of cuts on the phylogeny to define subclones

**Method** clone(): The objects of this class are cloneable with this method.

*Usage:*

```
Numbat$clone(deep = FALSE)
```

*Arguments:*

deep Whether to make a deep clone.

---

phylogeny\_example      *example single-cell phylogeny*

---

**Description**

example single-cell phylogeny

**Usage**

phylogeny\_example

**Format**

An object of class tbl\_graph (inherits from igraph) of length 345.

---

plot_bulks	<i>Plot a group of pseudobulk HMM profiles</i>
------------	--

---

**Description**

Plot a group of pseudobulk HMM profiles

**Usage**

```
plot_bulks(bulks, ..., ncol = 1, title = TRUE, title_size = 8)
```

**Arguments**

bulks	dataframe Pseudobulk profiles annotated with "sample" column
...	additional parameters passed to plot_psbulk()
ncol	integer Number of columns
title	logical Whether to add titles to individual plots
title_size	numeric Size of titles

**Value**

a ggplot object

**Examples**

```
p = plot_bulks(bulk_example)
```

---

plot_consensus	<i>Plot consensus CNVs</i>
----------------	----------------------------

---

**Description**

Plot consensus CNVs

**Usage**

```
plot_consensus(segs)
```

**Arguments**

segs	dataframe Consensus segments
------	------------------------------

**Value**

ggplot object

**Examples**

```
p = plot_consensus(segs_example)
```

---

plot_exp_roll	<i>Plot single-cell smoothed expression magnitude heatmap</i>
---------------	---

---

**Description**

Plot single-cell smoothed expression magnitude heatmap

**Usage**

```
plot_exp_roll(
  gexp_roll_wide,
  hc,
  k,
  gtf,
  lim = 0.8,
  n_sample = 300,
  reverse = TRUE,
  plot_tree = TRUE
)
```

**Arguments**

gexp_roll_wide	matrix Cell x gene smoothed expression magnitudes
hc	hclust Hierarchical clustering result
k	integer Number of clusters
gtf	dataframe Transcript GTF
lim	numeric Limit for expression magnitudes
n_sample	integer Number of cells to subsample
reverse	logical Whether to reverse the cell order
plot_tree	logical Whether to plot the dendrogram

**Value**

ggplot A single-cell heatmap of window-smoothed expression CNV signals

**Examples**

```
p = plot_exp_roll(gexp_roll_example, gtf = gtf_hg38, hc = hc_example, k = 3)
```

---

plot\_mut\_history      *Plot mutational history*

---

### Description

Plot mutational history

### Usage

```
plot_mut_history(
  G,
  clone_post = NULL,
  edge_label_size = 4,
  node_label_size = 6,
  node_size = 10,
  arrow_size = 2,
  show_clone_size = TRUE,
  show_distance = TRUE,
  legend = TRUE,
  edge_label = TRUE,
  node_label = TRUE,
  horizontal = TRUE,
  pal = NULL
)
```

### Arguments

G	igraph Mutation history graph
clone_post	dataframe Clone assignment posteriors
edge_label_size	numeric Size of edge label
node_label_size	numeric Size of node label
node_size	numeric Size of nodes
arrow_size	numeric Size of arrows
show_clone_size	logical Whether to show clone size
show_distance	logical Whether to show evolutionary distance between clones
legend	logical Whether to show legend
edge_label	logical Whether to label edges
node_label	logical Whether to label nodes
horizontal	logical Whether to use horizontal layout
pal	named vector Node colors

**Value**

ggplot object

**Examples**

```
p = plot_mut_history(mut_graph_example)
```

---

plot_phylo_heatmap	<i>Plot single-cell CNV calls along with the clonal phylogeny</i>
--------------------	---

---

**Description**

Plot single-cell CNV calls along with the clonal phylogeny

**Usage**

```
plot_phylo_heatmap(  
  gtree,  
  joint_post,  
  segs_consensus,  
  clone_post = NULL,  
  p_min = 0.9,  
  annot = NULL,  
  pal_annot = NULL,  
  annot_title = "Annotation",  
  annot_scale = NULL,  
  clone_dict = NULL,  
  clone_bar = TRUE,  
  clone_stack = TRUE,  
  pal_clone = NULL,  
  clone_title = "Genotype",  
  clone_legend = TRUE,  
  line_width = 0.1,  
  tree_height = 1,  
  branch_width = 0.2,  
  tip_length = 0.2,  
  annot_bar_width = 0.25,  
  clone_bar_width = 0.25,  
  bar_label_size = 7,  
  tvn_line = TRUE,  
  clone_line = FALSE,  
  exclude_gap = FALSE,  
  root_edge = TRUE,  
  raster = FALSE,  
  show_phylo = TRUE  
)
```

**Arguments**

gtree	tbl_graph	The single-cell phylogeny
joint_post	dataframe	Joint single cell CNV posteriors
segs_consensus	dataframe	Consensus segment dataframe
clone_post	dataframe	Clone assignment posteriors
p_min	numeric	Probability threshold to display CNV calls
annot	dataframe	Cell annotations, dataframe with 'cell' and additional annotation columns
pal_annot	named vector	Colors for cell annotations
annot_title	character	Legend title for the annotation bar
annot_scale	ggplot scale	Color scale for the annotation bar
clone_dict	named vector	Clone annotations, mapping from cell name to clones
clone_bar	logical	Whether to display clone bar plot
clone_stack	character	Whether to plot clone assignment probabilities as stacked bar
pal_clone	named vector	Clone colors
clone_title	character	Legend title for the clone bar
clone_legend	logical	Whether to display the clone legend
line_width	numeric	Line width for CNV heatmap
tree_height	numeric	Relative height of the phylogeny plot
branch_width	numeric	Line width in the phylogeny
tip_length	numeric	Length of tips in the phylogeny
annot_bar_width	numeric	Width of annotation bar
clone_bar_width	numeric	Width of clone genotype bar
bar_label_size	numeric	Size of sidebar text labels
tvn_line	logical	Whether to draw line separating tumor and normal cells
clone_line	logical	Whether to display borders for clones in the heatmap
exclude_gap	logical	Whether to mark gap regions
root_edge	logical	Whether to plot root edge
raster	logical	Whether to raster images
show_phylo	logical	Whether to display phylogeny on y axis

**Value**

ggplot panel

**Examples**

```
p = plot_phylo_heatmap(
  gtree = phylogeny_example,
  joint_post = joint_post_example,
  segs_consensus = segs_example)
```

---

plot_psbulk	<i>Plot a pseudobulk HMM profile</i>
-------------	--------------------------------------

---

### Description

Plot a pseudobulk HMM profile

### Usage

```
plot_psbulk(
  bulk,
  use_pos = TRUE,
  allele_only = FALSE,
  min_LLRL = 5,
  min_depth = 8,
  exp_limit = 2,
  phi_mle = TRUE,
  theta_roll = FALSE,
  dot_size = 0.8,
  dot_alpha = 0.5,
  legend = TRUE,
  exclude_gap = TRUE,
  genome = "hg38",
  text_size = 10,
  raster = FALSE
)
```

### Arguments

bulk	dataframe Pseudobulk profile
use_pos	logical Use marker position instead of index as x coordinate
allele_only	logical Only plot alleles
min_LLRL	numeric LLR threshold for event filtering
min_depth	numeric Minimum coverage depth for a SNP to be plotted
exp_limit	numeric Expression logFC axis limit
phi_mle	logical Whether to plot estimates of segmental expression fold change
theta_roll	logical Whether to plot rolling estimates of allele imbalance
dot_size	numeric Size of marker dots
dot_alpha	numeric Transparency of the marker dots
legend	logical Whether to show legend
exclude_gap	logical Whether to mark gap regions and centromeres
genome	character Genome build, either 'hg38' or 'hg19'
text_size	numeric Size of text in the plot
raster	logical Whether to raster images

**Value**

ggplot Plot of pseudobulk HMM profile

**Examples**

```
p = plot_psbulk(bulk_example)
```

---

<code>plot_sc_tree</code>	<i>Plot single-cell smoothed expression magnitude heatmap</i>
---------------------------	---

---

**Description**

Plot single-cell smoothed expression magnitude heatmap

**Usage**

```
plot_sc_tree(  
  gtree,  
  label_mut = TRUE,  
  label_size = 3,  
  dot_size = 2,  
  branch_width = 0.5,  
  tip = TRUE,  
  tip_length = 0.5,  
  pal_clone = NULL  
)
```

**Arguments**

<code>gtree</code>	<code>tbl_graph</code> The single-cell phylogeny
<code>label_mut</code>	logical Whether to label mutations
<code>label_size</code>	numeric Size of mutation labels
<code>dot_size</code>	numeric Size of mutation nodes
<code>branch_width</code>	numeric Width of branches in tree
<code>tip</code>	logical Whether to plot tip point
<code>tip_length</code>	numeric Length of the tips
<code>pal_clone</code>	named vector Clone colors

**Value**

ggplot A single-cell phylogeny with mutation history labeled

**Examples**

```
p = plot_sc_tree(phylogeny_example)
```



---

pre\_likelihood\_hmm      *HMM object for unit tests*

---

**Description**

HMM object for unit tests

**Usage**

pre\_likelihood\_hmm

**Format**

An object of class `list` of length 10.

---

ref\_hca      *reference expression magnitudes from HCA*

---

**Description**

reference expression magnitudes from HCA

**Usage**

ref\_hca

**Format**

An object of class `matrix` (inherits from `array`) with 24756 rows and 12 columns.

---

ref\_hca\_counts      *reference expression counts from HCA*

---

**Description**

reference expression counts from HCA

**Usage**

ref\_hca\_counts

**Format**

An object of class `matrix` (inherits from `array`) with 24857 rows and 12 columns.

---

`run_numbat`*Run workflow to decompose tumor subclones*

---

**Description**

Run workflow to decompose tumor subclones

**Usage**

```
run_numbat(  
  count_mat,  
  lambdas_ref,  
  df_allele,  
  genome = "hg38",  
  out_dir = tempdir(),  
  max_iter = 2,  
  max_nni = 100,  
  t = 1e-05,  
  gamma = 20,  
  min_LLRR = 5,  
  alpha = 1e-04,  
  eps = 1e-05,  
  max_entropy = 0.5,  
  init_k = 3,  
  min_cells = 50,  
  tau = 0.3,  
  nu = 1,  
  max_cost = ncol(count_mat) * tau,  
  n_cut = 0,  
  min_depth = 0,  
  common_diploid = TRUE,  
  min_overlap = 0.45,  
  ncores = 1,  
  ncores_nni = ncores,  
  random_init = FALSE,  
  segs_loh = NULL,  
  call_clonal_loh = FALSE,  
  verbose = TRUE,  
  diploid_chroms = NULL,  
  segs_consensus_fix = NULL,  
  use_loh = NULL,  
  min_genes = 10,  
  skip_nj = FALSE,  
  multi_allelic = TRUE,  
  p_multi = 1 - alpha,  
  plot = TRUE,  
  check_convergence = FALSE,
```

```

    exclude_neu = TRUE
  )

```

### Arguments

count_mat	dgCMatrix Raw count matrices where rownames are genes and column names are cells
lambdas_ref	matrix Either a named vector with gene names as names and normalized expression as values, or a matrix where rownames are genes and columns are pseudobulk names
df_allele	dataframe Allele counts per cell, produced by preprocess_allele
genome	character Genome version (hg38, hg19, or mm10)
out_dir	string Output directory
max_iter	integer Maximum number of iterations to run the phylogeny optimization
max_nni	integer Maximum number of iterations to run NNI in the ML phylogeny inference
t	numeric Transition probability
gamma	numeric Dispersion parameter for the Beta-Binomial allele model
min_LLRR	numeric Minimum LLR to filter CNVs
alpha	numeric P value cutoff for diploid finding
eps	numeric Convergence threshold for ML tree search
max_entropy	numeric Entropy threshold to filter CNVs
init_k	integer Number of clusters in the initial clustering
min_cells	integer Minimum number of cells to run HMM on
tau	numeric Factor to determine max_cost as a function of the number of cells (0-1)
nu	numeric Phase switch rate
max_cost	numeric Likelihood threshold to collapse internal branches
n_cut	integer Number of cuts on the phylogeny to define subclones
min_depth	integer Minimum allele depth
common_diploid	logical Whether to find common diploid regions in a group of pseudobulks
min_overlap	numeric Minimum CNV overlap threshold
ncores	integer Number of threads to use
ncores_nni	integer Number of threads to use for NNI
random_init	logical Whether to initiate phylogeny using a random tree (internal use only)
segs_loh	dataframe Segments of clonal LOH to be excluded
call_clonal_loh	logical Whether to call segments with clonal LOH
verbose	logical Verbosity
diploid_chroms	vector Known diploid chromosomes

segs_consensus_fix	dataframe	Pre-determined segmentation of consensus CNVs
use_loh	logical	Whether to include LOH regions in the expression baseline
min_genes	integer	Minimum number of genes to call a segment
skip_nj	logical	Whether to skip NJ tree construction and only use UPGMA
multi_allelic	logical	Whether to call multi-allelic CNVs
p_multi	numeric	P value cutoff for calling multi-allelic CNVs
plot	logical	Whether to plot results
check_convergence	logical	Whether to terminate iterations based on consensus CNV convergence
exclude_neu	logical	Whether to exclude neutral segments from CNV retesting (internal use only)

**Value**

a status code

---

segs_example	<i>example CNV segments dataframe</i>
--------------	---------------------------------------

---

**Description**

example CNV segments dataframe

**Usage**

```
segs_example
```

**Format**

An object of class `data.table` (inherits from `data.frame`) with 27 rows and 30 columns.

---

upgma	<i>UPGMA and WPGMA clustering</i>
-------	-----------------------------------

---

**Description**

UPGMA and WPGMA clustering

**Usage**

```
upgma(D, method = "average", ...)
```

**Arguments**

D	A distance matrix.
method	The agglomeration method to be used. This should be (an unambiguous abbreviation of) one of "ward", "single", "complete", "average", "mcquitty", "median" or "centroid". The default is "average".
...	Further arguments passed to or from other methods.

---

vcf_meta	<i>example VCF header</i>
----------	---------------------------

---

**Description**

example VCF header

**Usage**

vcf\_meta

**Format**

An object of class character of length 65.

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