# Package 'SCIFER'

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### Description

Approximate deltas to approximate non-linear decline with a linear b-d-process parametrized by the number of death events

### Usage

```
.approximate.delta(lambda, N, t, D)
```

### Arguments

lambda	the division rate
N	the clone size at the start of contraction
t	the time span
D	the number of death events

### Value

the death rate yielding the same number of death events if modeling exponential decay

clonal.combinations 3

```
.clonal.combinations Clonal combinations
```

### Description

Clonal combinations

### Usage

```
.clonal.combinations(clone.ids)
```

### Arguments

clone.ids IDs of daughter clones from the same mother

### Value

All clonal combinations in which a mutation acquired in the mother can end up.

### Description

Dynamics of normal cells and j selected clones

### Usage

```
.clonal_dynamics(N, init, lambda, delta, s, t)
```

### **Arguments**

N	the carrying capacity
init	vector of length $j$ with the initial condition of the system (number of cells per clone)
lambda	cell division rate
delta	differentiation rate
S	vector with selective advantage associated with the j-th driver. Selection is modeled as a reduction of the differentiation rate, so $0 \le s \le 1$
t	the time point of evaluation

#### Value

The system state at time t

```
. \verb| compute_actual_size| | \textit{Compute the final size of the clones from the input parameters}|\\
```

### **Description**

Compute the final size of the clones from the input parameters

### Usage

```
.compute_actual_size(
   t.s,
   mother.daughter,
   N,
   lambda.ss,
   delta.ss,
   lambda.exp,
   delta.exp,
   size,
   t.end
)
```

### Arguments

t.s	vector of length j with the time points at which the selected advantages were
	introduced

mother.daughter

mother-daughter relationships. Matrix with 2 columns encoding mother and

daughter for each pair

N the compartment size

lambda.ss cell division rate during homeostasis delta.ss differentiation rate during homeostasis lambda.exp division rate during initial expansion

delta.exp loss rate during initial expansion

size vector of length j with the input size of the selcted clones. Using exponential

growth approximation, the selective advantage, s will be computed from size. The actual clone sizes will then be computed using the values of s and a clonal

competition model.

t.end the time point of evaluation

### Value

A vector reporting the system state at the final time point for each clone

differentiation.s.p 5

```
. \verb|differentiation.s.p| Cell differentiation|
```

### Description

Simulate differentiation of a stem cell into a progenitor cell

### Usage

```
.differentiation.s.p(tree, nr = 1, type = 2)
```

### Arguments

tree object of class phylo; the current tree. Needs the following additional list ele-

ments: tip.class, specifying the cell type and sel.adv., specifying the selective

advantage of each tip

nr number of reactions to simulate; defaults to 1

type the cell type in which the stem cell differentiates; defaults to 2

#### Value

the updated tree

```
.division.s.p Cell division
```

### **Description**

Simulate division of a cell together with acquisition of neutral and driver mutations

### Usage

```
.division.s.p(
  cell.type,
  tree,
  mut.rate.D = 0,
  s.shape = 1.5,
  s.rate = 35,
  mutation.mode,
  mut.rate,
  symmetric = T,
  nr = 1
)
```

### **Arguments**

cell.type	the cell type that is to divide (1, stem cell; 2, progenitor cell)
tree	object of class phylo; the current tree. Needs the following additional list elements: tip.class, specifying the cell type and sel.adv., specifying the selective advantage of each tip
mut.rate.D	integer; driver mutation rate per cell division
s.shape	shape parameter of the gamma distribution from which the selective advantage of a new driver is drawn
s.rate	rate parameter of the gamma distribution from which the selective advantage of a new driver is drawn
${\it mutation.mode}$	should the number of new mutations be "constant" or "Binomial"ly distributed?
mut.rate	average number of neutral mutations per daughter cell and division
symmetric	is the division a symmetric division (2 new daughter cells) or an asymmetric division (1 daughter cell differentiates); defaults to ${\bf T}$
nr	number of reactions to simulate; defaults to 1

### Value

the updated tree

 $. \\ driver. \\ mutation. \\ acquisition$ 

Driver mutation acquisition

### Description

Simulate the acquisition of new driver mutations in both daughter cells

### Usage

```
.driver.mutation.acquisition(mut.rate.D, s.shape, s.rate)
```

### Arguments

mut.rate.D	integer; driver mutation rate per cell division
s.shape	shape parameter of the gamma distribution from which the selective advantage of a new driver is drawn
s.rate	rate parameter of the gamma distribution from which the selective advantage of a new driver is drawn

### Value

the additional selective advantage acquired during the cell division

.forward\_dynamics 7

 $. \\ forward\_dynamics$ 

Forward dynamics of j clones

### Description

Forward dynamics of j clones

### Usage

```
.forward_dynamics(
   N,
   init.cells,
   lambda.ss,
   delta.ss,
   lambda.exp,
   delta.exp,
   s,
   t.s,
   mother.daughter,
   t,
   resolution = 0.01
```

### Arguments

N	the compartment size
init.cells	vector with the initial condition of the system (number of cells per clone)
lambda.ss	cell division rate during homeostasis
delta.ss	differentiation rate during homeostasis
lambda.exp	division rate during initial expansion
delta.exp	loss rate during initial expansion
S	vector with selective advantages associated with the j-th driver. Selection is modeled as a reduction of the differentiation rate, so $0 <= s <= 1$
t.s	vector of length j with the time points at which the selected advantages were introduced
mother.daughte	r
	mother-daughter relationships. Matrix with 2 columns encoding mother and daughter for each pair
t	the time point of evaluation
resolution	the time resolution of the simulation

### Value

A data.frame reporting the system state in the following order: time, cell count for each clone

8 .initialize.sim.s.p

.get.progeny

Get all subclonal descendants from a given clone

### **Description**

Get all subclonal descendants from a given clone

#### Usage

```
.get.progeny(mother.daughter, id)
```

#### **Arguments**

mother.daughter

mother-daughter relationships. Matrix with 3 columns encoding mother, daugh-

ter and birth-compartment for each pair

id IDs of the clone of interest

#### Value

A vector with the progeny IDs.

.initialize.sim.s.p System initialization

### Description

This function initializes the simulation

### Usage

```
.initialize.sim.s.p()
```

### Arguments

N integer; number of stem cells at homeostasis

NP integer; number of progenitor cells at homeostasis

mut.rate integer; number of mutations per cell division and daugther cell

time.max time of simulation

parms.steady named vector of steady state parameters; must contain lambda.s/lambda.p the

stem and progenitor division rate; delta.s/delta.p the stem and progenitor loss

rate and alpha.s the stem cell differentiation rate

#### Value

returns the state list; initialized with a single stem cell and a single mutation

.loss

.loss *Cell loss* 

### **Description**

Simulate loss of a stem cell or a progenitor cell

### Usage

```
.loss(cell.type, tree, nr = 1)
```

### **Arguments**

cell.type integer; which cell type is dividing? 1, stem cell, 2, progenitor cell

tree object of class phylo; the current tree. Needs the following additional list ele-

ments: tip.class, specifying the cell type and sel.adv., specifying the selective

advantage of each tip

nr number of reactions to simulate; defaults to 1

#### Value

the updated tree

 $. \verb|mutation.acquisition|| Acquisition|| of neutral|| mutations||$ 

### Description

This function simulates the acquisition of new mutations

## Usage

```
.mutation.acquisition(mut.rate, mutation.mode = "Binomial")
```

### **Arguments**

mut.rate integer; average number of mutations per division and daughter cell

mutation.mode character vector; should the number be based on a binomial distribution ("Bi-

nomial") or should a constant number be introduced ("constant"); defaults to

"Binomial".

#### Value

the number of new mutations per daughter cell

10 .props.het

.props.2c	Propensity	function	for	2	compartments	("S"tem	cells	and
	"P"rogenito	rs)						

### Description

This function computes the propensities for a linear, hierarchical system of cell division, death and differentiation

### Usage

```
.props.2c(cell.count, parms)
```

### Arguments

cell.count a vector with cell numbers (S, P)

parms a named parameter vector containing the rates of cell division (lambda.s/lambda.p)

and differentiation (alpha.s) or loss (delta.s/delta.p), where "s" and "p" indicate

stem and progenitor cells, respectively

#### Value

the propensities of the possible reactions

.props.het	Propensity function for "S" tem cells and 2 different mature cells (Type 1 and Type 2)
.props.net	

### Description

This function computes the propensities for a linear, hierarchical system of cell division, death and differentiation

### Usage

```
.props.het(cell.count, parms)
```

#### **Arguments**

cell.count a vector with cell numbers (S, T1, T2)

parms a named parameter vector containing the rates of cell division (lambda.s/lambda.t1/lambda.t2)

and differentiation (alpha.s1/alpha.s2) or loss (delta.s/delta.t1/delta.t2), where

"s" and "t" indicate stem and type (1 or 2) cells, respectively

#### Value

the propensities of the possible reactions

simulate.sampling 11

.simulate.sampling Sample a random subset of a phylogenetic tree

#### **Description**

Sample a random subset of a phylogenetic tree

### Usage

```
.simulate.sampling(tree, sample.size)
```

### Arguments

tree object of class phylo; the current tree. Needs the following additional list ele-

ments: tip.class, specifying the cell type and sel.adv., specifying the selec-

tive advantage of each tip.

sample.size the number of cells to be sampled

#### Value

the updated state list

.simulated.scWGS.data Simulate sampling as in single-cell sequencing by simulating the actual sampling of cells (i.e. it's not the expected value but a sampling instance)

### **Description**

Simulate sampling as in single-cell sequencing by simulating the actual sampling of cells (i.e. it's not the expected value but a sampling instance)

### Usage

```
.simulated.scWGS.data(
  clone.sizes,
  expected.mutations,
  ncells = 100,
  min.vaf = 0.05
)
```

### **Arguments**

clone.sizes vector of clone sizes at which cumulative mutation counts were measured expected.mutations

expected number of mutations at each clone size

ncells sequenced cells

#### Value

A vector of simulated VAFs

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.simulated.wgs.data

Simulate read sampling in WGS by Binomial sampling

### **Description**

Simulate read sampling in WGS by Binomial sampling

### Usage

```
.simulated.wgs.data(
  clone.sizes,
  expected.mutations,
  depth = 90,
  sensitivity = T,
  false.negative.per.vaf,
  min.vaf = 0.05
)
```

### **Arguments**

clone.sizes vector of clone sizes at which cumulative mutation counts were measured expected.mutations

expected number of mutations at each clone size

depth sequencing depth

sensitivity logical, if sensitivity of sequencing method should be taken into account in addi-

tion to binomial noise. Requires a specification for false.negative.per.vaf.

false.negative.per.vaf

optional, a matrix with columns corresponding to the measured VAFs and rows corresponding to individual measurements of the false negative rate at this VAF

in addition to binomial noise. Must be provided if sensitivity=T

#### Value

A vector of simulated VAFs

.subset.cell.type

Subset a phylogenetic tree on a particular cell type

### **Description**

Subset a phylogenetic tree on a particular cell type

### Usage

```
.subset.cell.type(tree, cell.type)
```

density.a.b.exact

### **Arguments**

tree object of class phylo; the current tree. Needs the following additional list ele-

ments: tip.class, specifying the cell type and sel.adv., specifying the selec-

tive advantage of each tip.

cell.type cell type of interest

### Value

the updated stat list

density.a.b.exact

Non-critical clone size distribution (exact).

### **Description**

Exact probability to grow from a clone of size "a" to a clone of size "b" within time "t" according to a non-critical birth-death process.

#### Usage

```
## S3 method for class 'a.b.exact'
density(lambda, delta, t, a, b)
```

### Arguments

lambda	proliferation rate
delta	loss rate
t	time
a	clone size at t=0
b	clone size at t=t

### Value

The probability that a clone of size a grows to size "b" within "t".

#### References

Bailey, NTJ (1964). The elements of stochastic processes with applications to the natural sciences, Wiley (New York).

#### **Examples**

```
density.a.b.exact(1, 0, 10, 1, 2)
```

14 Extract.info.from.vcf

Extract.info.from.vcf Extracts information from a vcf file.

#### **Description**

Extracts information from a vcf file.

#### Usage

```
Extract.info.from.vcf(
  vcf,
  info = "readcounts",
  type = "snvs",
  mutationcaller = "Strelka",
  tumor.col.mutect = 10,
  normal.col.mutect = 11,
  sample.col.mpileup = NA,
  tumor.id = NULL
)
```

### **Arguments**

vcf

Mutation information in VCF format represented as a list (as returned by read.vcf from package bedR).

info

Variant information to be retrieved. Possible values are

readcounts returns the number of reference and variant reads for each variant position.

varCounts the number of variant reads (if mutationcaller is 'Strelka' or 'Manta'). depth returns the sequencing depths for each variant position.

VAF returns the variant allele frequency at each variant position.

VAF. control returns the variant allele frequency in the germline control at each variant position.

depth.control returns the sequencing depth in the germline control at each variant position

AA\_change returns the amino acid change at each variant position (only works if vcf-file had been annotated with annovar).

cDNA\_change returns the cDNA change at each variant position (only works if vcf-file had been annotated with annovar).

Exon returns the exon targeted by each variant (only works if vcf-file had been annotated with annovar).

Gene returns the gene targeted by each variant (only works if vcf-file had been annotated with annovar).

annovar\_function returns the consequence of the variant (e.g. "intronic"; only works if vcf-file had been annotated with annovar).

exonic\_function returns the exonic consequence of each variant (e.g. 'non-synonymous SNV'; only works if vcf-file had been annotated with annovar).

svtype type of structural variant at each variant position; only works on output generated with Manta.

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somaticScore the somatic score computed by Manta for each variant; only works on output generated with Manta.

End the end position of a structural variant; only works with output generated by Manta.

type Specify the variant type ("snvs" or "indel", defaults to "snvs"). Ignored if

mutationcaller = "Mutect2" or mutationcaller = "Manta".

mutationcaller The mutation caller that generated the vcf-files. Must be either "Strelka",

"Mutect2", "mpileup" or "Manta". Defaults to "Strelka".

tumor.col.mutect

Column index or name of the tumor information when mutationcaller="Mutect2".

normal.col.mutect

Column index or name of the germline control information when mutationcaller="Mutect2".

tumor . id The name of the tumor sample. Only used if vcf-file was generated with Manta.

#### Value

The requested information for each variant position.

get\_matrix\_from\_tree Get a binary mutation matrix from a phylogenetic tree

### Description

Get a binary mutation matrix from a phylogenetic tree

#### Usage

```
get_matrix_from_tree(tree)
```

### **Arguments**

tree

object of class phylo; the current tree. Needs the following additional list elements: tip.class, specifying the cell type and sel.adv., specifying the selective advantage of each tip.

### Value

a matrix with rows corresponding to mutations and columns to cells; entries are binaries of 0 or 1, indicating, respectively, absence or presence of the mutation.

get\_vaf\_from\_tree

get\_mutations\_per\_tip Compute the number of mutations per tip cell in a phylogenetic tree

### **Description**

Compute the number of mutations per tip cell in a phylogenetic tree

### Usage

```
get_mutations_per_tip(tree)
```

#### **Arguments**

tree

object of class phylo; the current tree. Needs the following additional list elements: tip.class, specifying the cell type and sel.adv., specifying the selective advantage of each tip.

#### Value

a vector of mutation counts

get\_vaf\_from\_tree

Compute the VAF of a mutation in the population from a phylogenetic tree

### Description

Compute the VAF of a mutation in the population from a phylogenetic tree

### Usage

```
get_vaf_from_tree(tree)
```

### **Arguments**

tree

object of class phylo; the current tree. Needs the following additional list elements: tip.class, specifying the cell type and sel.adv., specifying the selective advantage of each tip.

### Value

a vector of VAFs

gillespie.sim.s.p 17

```
gillespie.sim.s.p Tree simulation
```

### Description

Simulate the phylogenetic tree of a physiological population that grows in 2 regimes: initial exponential expansion and subsequent homeostasis. The function can simuate stem cells only or stem and progenitor cells

### Usage

```
gillespie.sim.s.p(
  parms.exp,
  parms.steady,
  time.max = 50,
  time.samples = c(0, 5, 25, 50),
  N = 1000,
  NP = 10000,
  report.at.f = NA,
  mut.rate = 3,
  mutation.mode = "Binomial",
  driver.mode = "random",
  t.driver = NA,
  mut.rate.D = 0,
  s.shape = 1.5,
  s.rate = 35,
  tau = 1
)
```

### **Arguments**

parms.exp	expansion parameters, vector that must contain lambda.s (stem cell division rate), lambda.p (progenitor cell division rate), alpha.s (stem cell differentiation rate), delta.s (stem cell loss rate), delta.p (progenitor cell differentiation rate)
parms.steady	same as parms.exp, but for the homeostatic phase
time.max	maximal simulation time
time.samples	time points at which simulation results are stored
N	number of stem cells during homeostasis
NP	number of progenitor cells during homeostasis
report.at.f	frequency of a selected clone at which the simulation should be stopped. Defaults to NA - don't stop at a certain frequency.
mut.rate	average number of mutation per division and daughter cell
mutation.mode	should mutations be "constant" or "Binomial"ly distributed?
driver.mode	string; "fixed_time" if driver is acquired at a fixed time point, "random", if driver is randomly acquired governed by the parameters mu_D and s
t.driver	integer, the time point at which the driver is acquired if mode is "fixed_time"
mut.rate.D	integer; driver mutation rate per cell division

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s.shape	shape parameter of the gamma distribution from which the selective advantage of a new driver is drawn. If the function is run with driver.mode="fixed", the selective advantage is not randomyl drawn but computed as s.shape/d.rate.
s.rate	rate parameter of the gamma distribution from which the selective advantage of a new driver is drawn
tau	tau leaping parameter: how many steps should be merged during homeostasis? Defaults to 1, no leaping.

#### Value

a list of state.lists at the desired time samples

```
gillespie.sim.s.t1.t2 Tree simulation
```

### **Description**

Simulate the phylogenetic tree of a physiological population that grows in 2 regimes: initial exponential expansion and subsequent homeostasis. The function can simuate stem cells only or stem and progenitor cells

#### Usage

```
gillespie.sim.s.t1.t2(
  parms.exp,
  parms.steady,
  time.max = 50,
  time.samples = c(0, 5, 25, 50),
  N = 1000,
  NT1 = 8000,
  NT2 = 2000,
  report.at.f = NA,
  mut.rate = 3,
  mutation.mode = "Binomial",
  driver.mode = "random",
  t.driver = NA,
  mother = NULL,
  mut.rate.D = 0,
  s.shape = 1.5,
  s.rate = 35,
  tau = 1
)
```

#### **Arguments**

```
expansion parameters, vector that must contain lambda.s (stem cell division rate), lambda.t1 (type 1 cell division rate), lambda.t2 (type 2 cell division rate), alpha.s1 (stem cell differentiation rate into type 1 cells), alpha.s2 (stem cell division rate into type 2 cells), delta.s (stem cell loss rate), delta.t1 (type 1 cell differentiation rate) as parms.steady as parms.exp, but for the homeostatic phase
```

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time.max	maximal simulation time
time.samples	time points at which simulation results are stored
N	number of stem cells during homeostasis
NT1	number of type 1 cells during homeostasis
NT2	number of type 2 cells during homeostasis
report.at.f	frequency of a selected clone at which the simulation should be stopped. Defaults to NA - don't stop at a certain frequency.
mut.rate	average number of mutation per division and daughter cell
${\it mutation.mode}$	should mutations be "constant" or "Binomial"ly distributed?
driver.mode	string; "fixed_time" if driver is acquired at a fixed time point, "random", if driver is randomly acquired governed by the parameters mu_D and s
t.driver	integer vector, the time $point(s)$ at which the driver is acquired if mode is "fixed_time"
mother	integer vector containing the mother clone of each daughter clone; will be ignored if driver.mode is "random".
mut.rate.D	integer; driver mutation rate per cell division
s.shape	shape parameter of the gamma distribution from which the selective advantage of a new driver is drawn; if driver.mode== "fixed_time" and t.driver is a vector of multiple events, s.shape must be a vector of equal length as t.driver
s.rate	rate parameter of the gamma distribution from which the selective advantage of a new driver is drawn; if driver.mode== "fixed_time" and t.driver is a vector of multiple events, s.shape must be a vector of equal length as t.driver
tau	tau leaping parameter: how many steps should be merged during homeostasis? Defaults to 1, no leaping.

### Value

a list of state.lists at the desired time samples

histogram.drift Computes the expected histogram of variants in a clone of interest at time t, given a VAF histogram at time zero

### Description

Computes the expected histogram of variants in a clone of interest at time t, given a VAF histogram at time zero

### Usage

```
histogram.drift(
  lower.bins.1,
  n.muts,
  bin.p1 = 1,
  bin.p2,
  lower.bins.2,
  N,
  lambda,
  delta,
  t
)
```

20 mutational.burden

### **Arguments**

lower.bins.1 vector of bin sizes of the histogram at t0 n.muts vector of mutation counts per bin at t0

bin.p1 vector of probabilities that the variants in each bin will remain in the clone of

interest

bin.p2 as bin.p1 but for the upper border of the bin

lower.bins.2 vector of clone sizes at t

N the number of cells in the system

lambda the division rate delta the loss rate

t the time point of evaluation

#### Value

The cumulative VAF histogram at time t

mutational.burden *Mutation* 

Mutation accumulation during exponential expansion followed by homeostasis.

### Usage

```
mutational.burden(
   mu,
   N,
   lambda.exp,
   delta.exp,
   lambda.ss,
   t.end,
   b,
   accuracy.a = 0.05,
   phase = "both"
)
```

### Arguments

mu mutation rate per cell division

N population size

lambda.exp proliferation rate during expansion

delta.exp loss rate during expansion

lambda.ss proliferation and loss rate during homeostasis

t.end end point (starting from homeostasis)

b minimal clone size of interest. Number or vector.

accuracy.a

step size in which mutations accumulated during expansion are evaluated (evaluation runs between 5 and 100\

\itemphasereturn variants from "both" phases, or from "expansion" or "homeostasis" only

This function returns the approximate number of mutations in clones of at least b cells, by first computing the distribution at the transition time within intervals, then averaging the fate of each interval during homeostasis and adding newly acquired mutations.

Mutation accumulation during exponential expansion followed by homeostasis.

mutational.burden.general

Mutation accumulation during exponential expansion followed by second phase of either expansion, homeostasis or decline

### Usage

```
mutational.burden.general(
    mu,
    N.1,
    lambda.1,
    delta.1,
    lambda.2,
    delta.2 = NULL,
    t.end,
    b,
    accuracy.a = 0.05,
    phase = "both"
)
```

### **Arguments**

mu mutation rate per cell division population size after first phase N.1 lambda.1 proliferation rate during initial expansion delta.1 loss rate during initial expansion lambda.2 proliferation rate during second phase delta.2 loss rate during second phase t.end end point (starting after initial expansion) minimal clone size of interest. Number or vector. accuracy.a

step size in which mutations accumulated during expansion are evaluated (evaluation runs between 5 and 100)

\itemphasereturn variants from "both" phases, or from "first" or "second" only This function returns the approximate number of mutations in clones of at least b cells, by first computing the distribution at the transition time within intervals, then averaging the fate of each interval during homeostasis and adding newly acquired mutations.

Mutation accumulation during exponential expansion followed by second phase of either expansion, homeostasis or decline

mutational.burden.multiclone

Mutation accumulation during exponential expansion followed by homeostasis.

### Description

Mutation accumulation during exponential expansion followed by homeostasis.

### Usage

```
mutational.burden.multiclone(
   mu,
   N,
   lambda.exp,
   delta.exp,
   lambda.ss,
   t.end,
   t.s,
   s,
   mother.daughter,
   b,
   min.clone.size = 0.05,
   accuracy.a = 0.05,
   return.mode = "bulk"
)
```

### Arguments

mu	mutation rate per cell division
N	population size
lambda.exp	proliferation rate during expansion
delta.exp	loss rate during expansion
lambda.ss	proliferation and loss rate during homeostasis
t.end	end point (starting from homeostasis)
t.s	vector of time points at which selective advantages are acquired.
S	vector of selective advantages associated with driver mutations
mother.daughter	
	a matrix containing the mother (1st column) - daughter (2nd column) relationships between the subclones
b	minimal clone size of interest. Number or vector.
return.mode	should the mutation spectrum be returned for the bulk or per_clone? In the latter, a matrix is returned where mutations acquired in particular clones are

returned row-wise. Default bulk.

#### Value

This function returns an approximation by first computing the distribution at the transition time within intervals, then averaging the fate of each interval during homeostasis and adding newly acquired mutations in a scenario with 2 nested clonal selections (clone starts growing at t.s >t.ss and grows with a selective advantage s; clone 2 starts. Returns the number of mutations present in at least b cells

mutational.burden.selection.expansion

Mutation accumulation during exponential expansion with clonal selection.

### **Description**

Mutation accumulation during exponential expansion with clonal selection.

### Usage

```
mutational.burden.selection.expansion(mu, lambda, delta, s, t.s, t.end, b)
```

### **Arguments**

mu	mutation rate per cell division
lambda	proliferation rate
delta	loss rate
s	selective advantage
t.s	time point at which selective advantage is acquired.
t.end	end point
b	minimal clone size of interest. Number or vector.
N	population size

### Value

This function returns an approximation by first computing the distribution at the transition time within intervals, then averaging the fate of each interval during homeostasis and adding newly acquired mutations in a scenario where a subpopulation is under positive selection. Returns the number of mutations present in at least b cells.

mutational.burden.with.selection

Mutation accumulation during exponential expansion followed by homeostasis with clonal selection.

### Usage

```
mutational.burden.with.selection(
   mu,
   N,
   lambda.exp,
   delta.exp,
   lambda.ss,
   t.end,
   t.s,
   s,
   b,
   accuracy.a = 0.05,
   min.clone.size = 0.05
)
```

#### **Arguments**

mu mutation rate per cell division

N population size

lambda.exp proliferation rate during expansion

delta.exp loss rate during expansion

lambda.ss proliferation and loss rate during homeostasis

t.end end point (starting from homeostasis)

t.s time point at which selective advantage is acquired.

s selective advantage

b minimal clone size of interest. Number or vector.

accuracy.a step size in which mutations accumulated during expansion are evaluated be-

tween 5 and 100\

\itemmin.clone.sizethe lower detection limit for selected clones

This function returns an approximation by first computing the distribution at the transition time within intervals, then averaging the fate of each interval during homeostasis and adding newly acquired mutations in a scenario where a subpopulation is under positive selection. Returns the number of mutations present in at least b cells.

Mutation accumulation during exponential expansion followed by homeostasis with clonal selection.

```
mutational.burden.with.selection.no.size.compensation

Mutation accumulation during exponential expansion followed by a second phase with clonal selection.
```

### Usage

```
mutational.burden.with.selection.no.size.compensation(
   mu,
   N,
   lambda.exp,
   delta.exp,
   lambda.ss,
   t.end,
   t.s,
   s,
   b,
   accuracy.a = 0.05,
   min.clone.size = 0.05
)
```

#### **Arguments**

mu	mutation rate per cell division
N	population size during homeostasis in absence of CH
lambda.exp	proliferation rate during expansion
delta.exp	loss rate during expansion
lambda.ss	proliferation and loss rate during homeostasis
t.end	end point (starting from homeostasis)
t.s	time point at which selective advantage is acquired.
S	selective advantage
b	minimal clone size of interest. Number or vector.
accuracy.a	step size in which mutations accumulated during expansion are evaluated between 5 and 100\ $$

\itemmin.clone.sizethe lower detection limit for selected clones

This function returns an approximation by first computing the distribution at the transition time within intervals, then averaging the fate of each interval during homeostasis and adding newly acquired mutations in a scenario where a subpopulation is under positive selection. Returns the number of mutations present in at least b cells.

Mutation accumulation during exponential expansion followed by a second phase with clonal selection.

26 mutations.noncritical.bd

```
\verb| mutations.during.steady.state|\\
```

Neutral mutation accumulation during steady state.

### Description

Neutral mutation accumulation during steady state.

### Usage

```
mutations.during.steady.state(lambda, N, mu, n.min, t.end)
```

### Arguments

lambda	proliferation rate
N	population size
	•

mu mutation rate per cell division

n.min minimal clone sizet.end time at end point

#### Value

The number of mutations that were acquired during steady state and are present in at least n.min cells.

```
mutations.noncritical.bd
```

Mutation accumulation in a growing tissue

### Description

Expected number of neutral mutations that are present in at least n.min cells at t.end in an exponentially growing or contracting tissue.

### Usage

```
mutations.noncritical.bd(
  lambda,
  delta,
  t.end,
  mu,
  n.min,
  N0 = 1,
  N = N,
  mode = "approx"
)
```

p.a.b 27

#### **Arguments**

lambda	proliferation rate
delta	loss rate
t.end	time
mu	mutation rate per cell division
n.min	minimal clone size at t.end; can be a value or a vector
NØ	initial population size
N	final population size
mode	if "approx" the sum is approximated by integration. If "exact" the sum is exactly computed for clone sizes between 1 and 10 but beyond that also approximated.

#### **Details**

The expected number of mutations present in at least number of mutations present in at least number of mutations 
$$M(n_{\min}) = \sum_{n_{\min}}^{N} \mu \lambda \int_{0}^{t} e^{(\lambda - \delta)(t - t')} P(1, n_{\min}, t - t') dt', \text{ which is approximated to } M(n_{\min}) \approx \mu \lambda \int_{0}^{t} e^{(\lambda - \delta)(t - t')} \frac{P(1, N, t - t') - P(1, n_{\min}, t - t')}{\log y(t - t')} dt',$$
 where  $y(t) = \frac{\lambda e^{(\lambda - \delta)t} - \lambda}{\lambda e^{(\lambda - \delta)t} - \delta}$ , if mode=="approx" or if  $n_{\min} \leq 10$ 

### Value

The expected number of mutations present in at least n.min cells at t.end in an exponentially growing tissue. The function assumes that mutations are continuously acquired at a constant rate.

#### References

Bailey, NTJ (1964). The elements of stochastic processes with applications to the natural sciences, Wiley (New York).

p.a.b	Clone size distribution in a noncritical birth-death process (approxi-
	mate).

### Description

Probability of a clone of size "a" to grow to size "b" within "t" according to a noncritical linear birth-death process.

### Usage

```
p.a.b(lambda, delta, t, a, b, mode = "cumulative", approx = "highnumbers")
```

28 p.ss

#### **Arguments**

lambda	proliferation rate
delta	loss rate
t	time
a	clone size at t=0
b	clone size at t=t
mode	"density" if density distribution is to be returned , "cumulative" if cumulative distribution is to be returned. Defaults to "cumulative" $\ \ \ \ \ \ \ \ \ \ \ \ \ \ \ \ \ \ \$
approx	Approximation to be used. Defaults to "highnumbers"; i.e. the distribution is approximated with a gamma distribution if a and b are large.

#### **Details**

If approx="highnumbers", the function is approximated with a  $\Gamma$ -distribution if a+b>100 and mode="density" or if a+b>10 and mode="cumulative". The  $\Gamma$ -distribution is parametrized with  $shape=\mu^2/\sigma, scale=\sigma/\mu,$  where  $\mu=ae^{(\lambda-\delta)t}, \sigma=a\frac{\lambda+\delta}{\lambda-\delta}e^{(\lambda-\delta)t}(e^{(\lambda-\delta)t}-1)$ 

### Value

The probability of growing from size a to size b within t. The Function switches between the exact solution and an approximate solution according to a parametrized gamma distribution.

#### References

Bailey, NTJ (1964). The elements of stochastic processes with applications to the natural sciences, Wiley (New York).

p.ss

Clone size distribution in a critical b-d process.

### **Description**

Function to compute the probability to grow from a to b in a critical b-d process using automatic switching between exact and approximate solution.

### Usage

```
p.ss(lambda, a, b, t)
```

#### **Arguments**

lambda	proliferation rate
а	clone size at t=0
b	clone size at t=t; single value or vector
t	time

### **Details**

The function automatically switches between the exact solution and an approximation with a parametrized  $\Gamma$ -distribution at a cutoff criterion of a\*p\*(1-p)>=9&b\*p\*(1-p)>=9

p.ss.approx 29

#### Value

The probability to grow from a to b within t

p.ss.approx	Approximate solution to grow from a clone of size a to a clone of size b within t in a critical birth-death process using gamma distribution
	1

### Description

Approximate solution to grow from a clone of size a to a clone of size b within t in a critical birth-death process using gamma distribution

### Usage

```
p.ss.approx(lambda, a, b, t, mode = "density")
```

### Arguments

lambda	proliferation rate
а	clone size at t=0
b	clone size at t=t
t	time
mode	either 'density' if density distribution is to be returned or 'cumulative'.

### Value

The approximate probability to grow from a to b within t.

p.ss.exact	Exact solution to grow from a clone of size a to a clone of size b within
	t in a critical birth-death process

### **Description**

Exact solution to grow from a clone of size a to a clone of size b within t in a critical birth-death process

### Usage

```
p.ss.exact(lambda, a, b, t)
```

### Arguments

lambda	proliferation rate
а	clone size at t=0
b	clone size at t=t
t	time

### Value

The probability to growth from a to b within t.

30 simulated.data

```
probability.this.combination
```

Probability of a variant present in a given bin size ends up in a particular combination of selected daughters if a driver is acquired in a random cell of the mother clone

### **Description**

Probability of a variant present in a given bin size ends up in a particular combination of selected daughters if a driver is acquired in a random cell of the mother clone

#### Usage

```
probability.this.combination(
  bin.size,
  clone.size.mother,
  n.daughters.present,
  n.daughters.absent
)
```

### **Arguments**

```
bin.size vector of bin sizes the variant are present in clone.size.mother
the size of the mother clone
n.daughters.present
the number of daughters the variant ends up in
n.daughters.absent
the number of daughters the variant does not end up in
```

### Value

Computes the probability that a given variant that is present in bin.size cells of the mother clone ends up in n.daughters.present daughter clones, but not in the remaining n.daughters.absent if the cells giving rise to the selected daughters are randomly sampled.

simulated.data

Wrapper function to simulate sequencing either by bulk WGS or by scWGS

### **Description**

Wrapper function to simulate sequencing either by bulk WGS or by scWGS

#### Usage

```
simulated.data(
   seqtype,
   clone.sizes,
   expected.mutations,
   depth = 90,
   ncells = 100,
   sensitivity = T,
   false.negative.per.vaf,
   min.vaf = 0.05
)
```

#### **Arguments**

seqtype string, specifying the sequencing method. Must be either "bulk" or "sc" clone.sizes vector of clone sizes at which cumulative mutation counts were measured expected.mutations

expected number of mutations at each clone size

depth sequencing depth, only specify for bulk WGS

ncells the number of sequenced cells, only specify if seqtype=="sc".

sensitivity logical, if sensitivity of sequencing method should be taken into account in addi-

tion to binomial noise. Requires a specification for false.negative.per.vaf.

false.negative.per.vaf

optional, a matrix with columns corresponding to the measured VAFs and rows corresponding to individual measurements of the false negative rate at this VAF

in addition to binomial noise.

min.vaf the minimal VAF to return

#### Value

A vector of simulated VAFs

```
simulate_vaf_upon_sequencing
```

Simulate the measured VAF after sequencing

### **Description**

Simulate the measured VAF after sequencing

#### Usage

```
simulate_vaf_upon_sequencing(vaf, depth)
```

#### **Arguments**

vaf a vector of true VAFs in the population

depth average coverage in sequencing

32 snvs

#### Value

a vector of simulated VAFs after sequencing

snvs

SNV data from individual A1

### **Description**

Exemplary SNV data from individual A1 of the study Körber et al., Detecting and quantifying clonal selection in somatic mosaicism. The dataset is a list object, containing variant information in vcf format.

#### Usage

snvs

#### **Format**

snvs:

A list containing a data frame with 447 rows and 45 columns:

Chr Chromosome

Start, End Start and end position of the variant

Ref, Alt Reference and alternative base par

VAF, Depth, varCounts Variant allele frequency, read depth and number of variant reads

VAF.control Variant allele frequency in the control data set

Func.refGene Annovar annotation of the functional change (e.g., exonic, intergentic)

**GeneDetail.refGene** Annovar annotation of the gene ID.

**ExonicFunc.refGene** Annovar annotation of the exonic change in the gene (e.g. nonsynonymous)

Gene.refGene Annovar annotation of the gene symbol

AAChange.refGene Annovar annotation of the amino acid substitution

avsnp150 dbSNP identifier

ExAC\_ALL, ExAC\_AFR, ExAC\_AMR, ExAC\_EAS, ExAC\_FIN, ExAC\_NFE, ExAC\_OTH, ExAC\_SAS exome aggregation consortium information

AF, AF\_popmax, AF\_male, AF\_female, AF\_raw, AF\_afr, AF\_sas, AF\_amr, AF\_eas, AF\_nfe, AF\_fin, AF\_asj, A GnomAD annotated population-wide allele frequencies

CLINALLELEID, CLNDN, CLNDISDB, CLNREVSTAT, CLNSIG Clinvar annotation

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